Package 'insight'

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Type Package

Title Easy Access to Model Information for Various Model Objects

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Description A tool to provide an easy, intuitive and consistent access to information contained in various R models, like model formulas, model terms, information about random effects, data that was used to fit the model or data from response variables. 'insight' mainly revolves around two types of functions: Functions that find (the names of) information, starting with 'find_', and functions that get the underlying data, starting with 'get_'. The package has a consistent syntax and works with many different model objects, where otherwise functions to access these information are missing.

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URL https://easystats.github.io/insight/

BugReports https://github.com/easystats/insight/issues

Depends R (>= 3.6)

Imports methods, stats, utils

Suggests AER, afex, aod, ape, BayesFactor, bayestestR, bbmle, bdsmatrix, betareg, bife, biglm, BH, blavaan (>= 0.5-5), blme, boot, brms, broom, car, carData, censReg, cgam, clubSandwich, cobalt, coxme, cplm, crch, curl, datawizard, dbarts, effectsize, emmeans, epiR, estimatr, feisr, fixest (>= 0.11.2), fungible, fwb, gam, gamlss, gamlss.data, gamm4, gbm, gee, geepack, geoR, GLMMadaptive, glmmTMB (>= 1.1.10), glmtoolbox, gmnl, grDevices, gt, httptest2, httr2, interp, ivreg, JM, knitr, lavaan, lavaSearch2, lfe, lme4, lmerTest, lmtest, logistf, logitr, marginaleffects (>= 0.26.0), MASS, Matrix, mclogit, mclust, MCMCglmm, merTools, metaBMA, metadat, metafor, metaplus, mgcv, mice (>= 3.17.0), mlogit, mmrm, modelbased (>= 0.9.0), multgee, MuMIn, nestedLogit, nlme, nnet, nonnest2, ordinal, panelr, parameters, parsnip, pbkrtest, performance,

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all_models_equal

Checks if all objects are models of same class

Description

Small helper that checks if all objects are supported (regression) model objects and of same class.

Usage

```
all_models_equal(..., verbose = FALSE)
all_models_same_class(..., verbose = FALSE)
```

Arguments

... A list of objects.

verbose Toggle off warnings.

Value

A logical, TRUE if x are all supported model objects of same class.

```
data(mtcars)
data(sleepstudy, package = "lme4")

m1 <- lm(mpg ~ wt + cyl + vs, data = mtcars)
m2 <- lm(mpg ~ wt + cyl, data = mtcars)
m3 <- lme4::lmer(Reaction ~ Days + (1 | Subject), data = sleepstudy)
m4 <- glm(formula = vs ~ wt, family = binomial(), data = mtcars)

all_models_same_class(m1, m2)
all_models_same_class(m1, m2, m3)
all_models_same_class(m1, m4, m2, m3, verbose = TRUE)
all_models_same_class(m1, m4, mtcars, m2, m3, verbose = TRUE)</pre>
```

apply_table_theme

Data frame and Tables Pretty Formatting

Description

Function to export data frames into tables, which can be printed to the console, or displayed in markdown or HTML format (and thereby, exported to other formats like Word or PDF). The table width is automatically adjusted to fit into the width of the display device (e.g., width of console). Use the table_width argument to control this behaviour.

Usage

```
apply_table_theme(out, x, theme = "default", sub_header_positions = NULL)
export_table(
  х,
  sep = " | "
 header = "-".
  cross = NULL,
  empty_line = NULL,
 digits = 2,
 protect_integers = TRUE,
 missing = "",
 width = NULL,
  format = NULL,
  title = NULL,
  caption = title,
  subtitle = NULL,
  footer = NULL,
  column_names = NULL,
  align = NULL,
 by = NULL,
  zap\_small = FALSE,
  table_width = "auto",
  remove_duplicates = FALSE,
  verbose = TRUE,
)
```

Arguments

out A tinytable object.

x A data frame. May also be a list of data frames, to export multiple data frames into multiple tables.

theme The theme to apply to the table. One of "default", "grid", "striped", "bootstrap", "void", "tabular", or "darklines".

sub_header_positions

A vector of row positions to apply a border to. Currently particular for internal

use of other easystats packages.

sep Column separator.

header Header separator. Can be NULL.

cross Character that is used where separator and header lines cross.

empty_line Separator used for empty lines. If NULL, line remains empty (i.e. filled with

whitespaces).

digits Number of digits for rounding or significant figures. May also be "signif" to

return significant figures or "scientific" to return scientific notation. Control the number of digits by adding the value as suffix, e.g. digits = "scientific4" to have scientific notation with 4 decimal places, or digits = "signif5" for 5

significant figures (see also signif()).

protect_integers

Should integers be kept as integers (i.e., without decimals)?

missing Value by which NA values are replaced. By default, an empty string (i.e. "") is

returned for NA.

width Refers to the width of columns (with numeric values). Can be either NULL,

a number or a named numeric vector. If NULL, the width for each column is adjusted to the minimum required width. If a number, columns with numeric values will have the minimum width specified in width. If a named numeric vector, value names are matched against column names, and for each match, the specified width is used (see 'Examples'). Only applies to text-format (see

format).

format Name of output-format, as string. If NULL (or "text"), returned output is used

for basic printing. Can be one of NULL (the default) resp. "text" for plain text, "markdown" (or "md") for markdown and "html" for HTML output. A special option is "tt", which creates a tinytable::tt() object, where the output format is dependent on the context where the table is used, i.e. it can be markdown format when export_table() is used in markdown files, or LaTex

format when creating PDFs etc.

title, caption, subtitle

Table title (same as caption) and subtitle, as strings. If NULL, no title or subtitle is printed, unless it is stored as attributes (table_title, or its alias table_caption, and table_subtitle). If x is a list of data frames, caption may be a list of ta-

ble captions, one for each table.

footer Table footer, as string. For markdown-formatted tables, table footers, due to the

limitation in markdown rendering, are actually just a new text line under the table. If x is a list of data frames, footer may be a list of table captions, one for

each table.

column_names Character vector of names that will be used as column names in the table. Must

either be of same length as columns in the table, or a named vector, where names (LHS) indicate old column names, and values (RHS) are used as new column

names.

align

Column alignment. For markdown-formatted tables, the default align = NULL will right-align numeric columns, while all other columns will be left-aligned. If format = "html", the default is left-align first column and center all remaining. May be a string to indicate alignment rules for the complete table, like "left", "right", "center" or "firstleft" (to left-align first column, center remaining); or a string with abbreviated alignment characters, where the length of the string must equal the number of columns. For instance, align = "lccrl" would left-align the first column, center the second and third, right-align column four and left-align the fifth column.

by

Name of column(s) in x that indicates grouping for tables. When format = "html", by is passed down to gt::gt(groupname_col = by). For markdown and text format, x is internally split into a list of data frames.

zap_small

Logical, if TRUE, small values are rounded after digits decimal places. If FALSE, values with more decimal places than digits are printed in scientific notation.

table_width

Numeric,"auto", NULL or Inf, indicating the width of the complete table.

- If table_width = "auto" (default) and the table is wider than the current width (i.e. line length) of the console (or any other source for textual output, like markdown files), the table is split into multiple parts.
- Else, if table_width is numeric and table rows are larger than table_width, the table is split into multiple parts. For each new table, the first column is repeated for better orientation.
- Use NULL or Inf to turn off automatic splitting of the table.
- options(easystats_table_width = <value>) can be used to set a default width for tables.

remove_duplicates

Logical, if TRUE and table is split into multiple parts, duplicated ("empty") rows will be removed. If FALSE, empty rows will be preserved. Only applies when table_width is *not* NULL (or Inf) *and* table is split into multiple parts.

verbose

Toggle messages and warnings.

. . .

Arguments passed to tinytable::tt() and tinytable::style_tt() when format = "tt".

Value

If format = "text" (or NULL), a formatted character string is returned. format = "markdown" (or "md") returns a character string of class knitr_kable, which renders nicely in markdown files. format = "html" returns an gt object (created by the **gt** package), which - by default - is displayed in the IDE's viewer pane or default browser. This object can be further modified with the various gt-functions.

Note

The values for caption, subtitle and footer can also be provided as attributes of x, e.g. if caption = NULL and x has attribute table_caption, the value for this attribute will be used as table caption. table_subtitle is the attribute for subtitle, and table_footer for footer.

See Also

Vignettes Formatting, printing and exporting tables and Formatting model parameters.

```
export_table(head(iris))
export_table(head(iris), cross = "+")
export_table(head(iris), sep = " ", header = "*", digits = 1)
# split longer tables
export_table(head(iris), table_width = 30)
# group (split) tables by variables
export_table(head(mtcars, 8), by = "cyl")
# colored footers
data(iris)
x <- as.data.frame(iris[1:5, ])</pre>
attr(x, "table_footer") <- c("This is a yellow footer line.", "yellow")</pre>
export_table(x)
attr(x, "table_footer") <- list(</pre>
  c("\nA yellow line", "yellow"),
  c("\nAnd a red line", "red"),
  c("\nAnd a blue line", "blue")
)
export_table(x)
attr(x, "table_footer") <- list(</pre>
  c("Without the ", "yellow"),
  c("new-line character ", "red"),
  c("we can have multiple colors per line.", "blue")
export_table(x)
# rename column names
export_table(x, column_names = letters[1:5])
export_table(x, column_names = c(Species = "a"))
# column-width
d <- data.frame(</pre>
  x = c(1, 2, 3),
  y = c(100, 200, 300),
  z = c(10000, 20000, 30000)
export_table(d)
export_table(d, width = 8)
export_table(d, width = c(x = 5, z = 10))
export_table(d, width = c(x = 5, y = 5, z = 10), align = "lcr")
```

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check_if_installed

Checking if needed package is installed

Description

Checking if needed package is installed

Usage

```
check_if_installed(
  package,
  reason = "for this function to work",
  stop = TRUE,
  minimum_version = NULL,
  quietly = FALSE,
  prompt = interactive(),
  ...
)
```

Arguments

package A character vector naming the package(s), whose installation needs to be checked

in any of the libraries.

reason A phrase describing why the package is needed. The default is a generic de-

scription.

stop Logical that decides whether the function should stop if the needed package is

not installed.

minimum_version

A character vector, representing the minimum package version that is required for each package. Should be of same length as package. If NULL, will automatically check the DESCRIPTION file for the correct minimum version. If using minimum_version with more than one package, NA should be used instead of

NULL for packages where a specific version is not necessary.

quietly Logical, if TRUE, invisibly returns a vector of logicals (TRUE for each installed

package, FALSE otherwise), and does not stop or throw a warning. If quietly = TRUE, arguments stop and prompt are ignored. Use this argument to internally

check for package dependencies without stopping or warnings.

prompt If TRUE, will prompt the user to install needed package(s). Ignored if quietly =

TRUE.

... Currently ignored

Value

If stop = TRUE, and package is not yet installed, the function stops and throws an error. Else, a named logical vector is returned, indicating which of the packages are installed, and which not.

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Examples

```
check_if_installed("insight")
try(check_if_installed("datawizard", stop = FALSE))
try(check_if_installed("rstanarm", stop = FALSE))
try(check_if_installed("nonexistent_package", stop = FALSE))
try(check_if_installed("insight", minimum_version = "99.8.7"))
try(check_if_installed(c("nonexistent", "also_not_here"), stop = FALSE))
try(check_if_installed(c("datawizard", "rstanarm"), stop = FALSE))
try(check_if_installed(c("datawizard", "rstanarm"),
    minimum_version = c(NA, "2.21.1"), stop = FALSE
))
```

clean_names

Get clean names of model terms

Description

This function "cleans" names of model terms (or a character vector with such names) by removing patterns like log() or as.factor() etc.

Usage

```
clean_names(x, ...)
## S3 method for class 'character'
clean_names(x, include_names = FALSE, ...)
```

Arguments

x A fitted model, or a character vector.

... Currently not used.

Value

The "cleaned" variable names as character vector, i.e. pattern like s() for splines or log() are removed from the model terms.

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Note

Typically, this method is intended to work on character vectors, in order to remove patterns that obscure the variable names. For convenience reasons it is also possible to call clean_names() also on a model object. If x is a regression model, this function is (almost) equal to calling find_variables(). The main difference is that clean_names() always returns a character vector, while find_variables() returns a list of character vectors, unless flatten = TRUE. See 'Examples'.

Examples

```
# example from ?stats::glm
counts <- c(18, 17, 15, 20, 10, 20, 25, 13, 12)
outcome <- as.numeric(gl(3, 1, 9))</pre>
treatment \leftarrow gl(3, 3)
m <- glm(counts ~ log(outcome) + as.factor(treatment), family = poisson())</pre>
clean_names(m)
# difference "clean_names()" and "find_variables()"
data(cbpp, package = "lme4")
m <- lme4::glmer(</pre>
  cbind(incidence, size - incidence) ~ period + (1 | herd),
  data = cbpp,
  family = binomial
)
clean_names(m)
find_variables(m)
find_variables(m, flatten = TRUE)
```

clean_parameters

Get clean names of model parameters

Description

This function "cleans" names of model parameters by removing patterns like "r_" or "b[]" (mostly applicable to Stan models) and adding columns with information to which group or component parameters belong (i.e. fixed or random, count or zero-inflated...)

The main purpose of this function is to easily filter and select model parameters, in particular of but not limited to - posterior samples from Stan models, depending on certain characteristics. This might be useful when only selective results should be reported or results from all parameters should be filtered to return only certain results (see print_parameters()).

Usage

```
clean_parameters(x, ...)
```

color_if

Arguments

x A fitted model.

... Currently not used.

Details

The Effects column indicate if a parameter is a *fixed* or *random* effect. The Component column refers to special model components like *conditional*, *zero_inflated*, or *dispersion*. For models from package **brms**, the various distributional parameters are also included in this column. For models with random effects, the Group column indicates the grouping factor of the random effects. For multivariate response models from **brms** or **rstanarm**, an additional *Response* column is included, to indicate which parameters belong to which response formula. Furthermore, *Cleaned_Parameter* column is returned that contains "human readable" parameter names (which are mostly identical to Parameter, except for for models from **brms** or **rstanarm**, or for specific terms like smooth- or spline-terms).

Value

A data frame with "cleaned" parameter names and information on effects, component and group where parameters belong to. To be consistent across different models, the returned data frame always has at least four columns Parameter, Effects, Component and Cleaned_Parameter. See 'Details'.

Examples

```
model <- download_model("brms_zi_2")
clean_parameters(model)</pre>
```

color_if

Color-formatting for data columns based on condition

Description

Convenient function that formats columns in data frames with color codes, where the color is chosen based on certain conditions. Columns are then printed in color in the console.

Usage

```
color_if(
   x,
   columns,
   predicate = `>`,
   value = 0,
   color_if = "green",
```

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```
color_else = "red",
  digits = 2
)

colour_if(
    x,
    columns,
    predicate = `>`,
    value = 0,
    colour_if = "green",
    colour_else = "red",
    digits = 2
)
```

Arguments

A data frame

columns Character vector with column names of x that should be formatted.

predicate A function that takes columns and value as input and which should return TRUE

or FALSE, based on if the condition (in comparison with value) is met.

value The comparator. May be used in conjunction with predicate to quickly set

up a function which compares elements in colums to value. May be ignored when predicate is a function that internally computes other comparisons. See

'Examples'.

color_if, colour_if

Character vector, indicating the color code used to format values in x that meet the condition of predicate and value. May be one of "red", "yellow", "green", "blue", "violet", "cyan" or "grey". Formatting is also possible

with "bold" or "italic".

color_else, colour_else

See color_if, but only for conditions that are *not* met.

digits Digits for rounded values.

Details

The predicate-function simply works like this: which(predicate(x[, columns], value))

Value

x, where columns matched by predicate are wrapped into color codes.

```
# all values in Sepal.Length larger than 5 in green, all remaining in red
x <- color_if(iris[1:10, ], columns = "Sepal.Length", predicate = `>`, value = 5)
x
cat(x$Sepal.Length)
```

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```
# all levels "setosa" in Species in green, all remaining in red
x <- color_if(iris, columns = "Species", predicate = `==`, value = "setosa")
cat(x$Species)

# own function, argument "value" not needed here
p <- function(x, y) {
    x >= 4.9 & x <= 5.1
}
# all values in Sepal.Length between 4.9 and 5.1 in green, all remaining in red
x <- color_if(iris[1:10, ], columns = "Sepal.Length", predicate = p)
cat(x$Sepal.Length)</pre>
```

compact_character

Remove empty strings from character

Description

Remove empty strings from character

Usage

```
compact_character(x)
```

Arguments

Х

A single character or a vector of characters.

Value

A character or a character vector with empty strings removed.

Examples

```
compact_character(c("x", "y", NA))
compact_character(c("x", "NULL", "", "y"))
```

compact_list

Remove empty elements from lists

Description

Remove empty elements from lists

Usage

```
compact_list(x, remove_na = FALSE)
```

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Arguments

x A list or vector.

remove_na Logical to decide if NAs should be removed.

Examples

```
compact_list(list(NULL, 1, c(NA, NA)))
compact_list(c(1, NA, NA))
compact_list(c(1, NA, NA), remove_na = TRUE)
```

display

Generic export of data frames into formatted tables

Description

display() is a generic function to export data frames into various table formats (like plain text, markdown, ...). print_md() usually is a convenient wrapper for display(format = "markdown"). Similar, print_html() is a shortcut for display(format = "html"). See the documentation for the specific objects' classes.

Usage

```
display(object, ...)
print_md(x, ...)

print_html(x, ...)

## S3 method for class 'data.frame'
display(object, format = "markdown", ...)

## S3 method for class 'data.frame'
print_md(x, ...)

## S3 method for class 'data.frame'
print_html(x, ...)
```

Arguments

object, x A data frame.

... Arguments passed to other methods.

format

String, indicating the output format. Can be "markdown" or "html". A special option is "tt", which creates a tinytable::tt() object, where the output format is dependent on the context where the table is used, i.e. it can be markdown format when export_table() is used in markdown files, or LaTex format when creating PDFs etc.

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Value

Depending on format, either an object of class gt_tbl, tinytable, or a character vector of class knitr_kable.

Examples

```
display(iris[1:5, ], format = "html")
```

download_model

Download circus models

Description

Downloads pre-compiled models from the *circus*-repository. The *circus*-repository contains a variety of fitted models to help the systematic testing of other packages

Usage

```
download_model(
  name,
  url = "https://raw.github.com/easystats/circus/master/data/",
  extension = ".rda",
  verbose = TRUE
)
```

Arguments

name	Model name.
url	String with the URL from where to download the model data. Optional, and should only be used in case the repository-URL is changing. By default, models are downloaded from https://raw.github.com/easystats/circus/master/data/.
extension	File extension. Default is .rda.
verbose	Toggle messages and warnings.

Details

The code that generated the model is available at the https://easystats.github.io/circus/reference/index.html.

Value

A model from the *circus*-repository, or NULL if model could not be downloaded (e.g., due to server problems).

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References

```
https://easystats.github.io/circus/
```

Examples

```
download_model("aov_1")
try(download_model("non_existent_model"))
```

easystats_columns

Easystats columns

Description

Returns all valid column names that are used or defined across easystats packages as character vector.

Usage

```
easystats_columns(select = "all")
broom_columns(select = "all")
```

Arguments

select

String, indicating which columns to return.

Value

A character vector with all (or selected) column names that are in use across the easystats-ecosystem, or broom-alike column names for broom_columns().

Examples

```
easystats_columns("uncertainty")
```

efc_insight

Sample dataset from the EFC Survey

Description

A sample data set, internally used in tests. Consists of 28 variables from 908 observations. The data set is part of the EUROFAMCARE project, a cross-national survey on informal caregiving in Europe. Useful when testing on "real-life" data sets, including random missing values. This data set also has value and variable label attributes.

ellipsis_info

ellipsis_info

Gather information about objects in ellipsis (dot dot dot)

Description

Provides information regarding the models entered in an ellipsis. It detects whether all are models, regressions, nested regressions etc., assigning different classes to the list of objects.

Usage

```
ellipsis_info(objects, ...)
## Default S3 method:
ellipsis_info(..., only_models = TRUE, verbose = TRUE)
```

Arguments

objects, ... Arbitrary number of objects. May also be a list of model objects.

only_models Only keep supported models (default to TRUE).

verbose Toggle warnings.

Value

The list with objects that were passed to the function, including additional information as attributes (e.g. if models have same response or are nested).

```
m1 <- lm(Sepal.Length ~ Petal.Width + Species, data = iris)
m2 <- lm(Sepal.Length ~ Species, data = iris)
m3 <- lm(Sepal.Length ~ Petal.Width, data = iris)
m4 <- lm(Sepal.Length ~ 1, data = iris)
m5 <- lm(Petal.Width ~ 1, data = iris)
objects <- ellipsis_info(m1, m2, m3, m4)
class(objects)
objects <- ellipsis_info(m1, m2, m4)
attributes(objects)$is_nested
objects <- ellipsis_info(m1, m2, m5)
attributes(objects)$same_response</pre>
```

20 find_algorithm

find_algorithm

Find sampling algorithm and optimizers

Description

Returns information on the sampling or estimation algorithm as well as optimization functions, or for Bayesian model information on chains, iterations and warmup-samples.

Usage

```
find_algorithm(x, ...)
```

Arguments

x A fitted model.

... Currently not used.

Value

A list with elements depending on the model.

For frequentist models:

- algorithm, for instance "OLS" or "ML"
- optimizer, name of optimizing function, only applies to specific models (like gam)

For frequentist mixed models:

- algorithm, for instance "REML" or "ML"
- optimizer, name of optimizing function

For Bayesian models:

- algorithm, the algorithm
- chains, number of chains
- iterations, number of iterations per chain
- warmup, number of warmups per chain

```
data(sleepstudy, package = "lme4")
m <- lme4::lmer(Reaction ~ Days + (1 | Subject), data = sleepstudy)
find_algorithm(m)

data(sleepstudy, package = "lme4")
m <- suppressWarnings(rstanarm::stan_lmer(
    Reaction ~ Days + (1 | Subject),</pre>
```

find_auxiliary 21

```
data = sleepstudy,
  refresh = 0
))
find_algorithm(m)
```

find_auxiliary

Find auxiliary (distributional) parameters from models

Description

Returns the names of all auxiliary / distributional parameters from brms-models, like dispersion, sigma, kappa, phi, or beta...

Usage

```
find_auxiliary(x, ...)
## Default S3 method:
find_auxiliary(x, verbose = TRUE, ...)
```

Arguments

x A model of class brmsfit.... Currently not used.verbose Toggle warnings.

Value

The names of all available auxiliary parameters used in the model, or NULL if no auxiliary parameters were found.

find_formula

Find model formula

Description

Returns the formula(s) for the different parts of a model (like fixed or random effects, zero-inflated component, ...). formula_ok() checks if a model formula has valid syntax regarding writing TRUE instead of T inside poly() and that no data names are used (i.e. no data\$variable, but rather variable).

find_formula

Usage

```
find_formula(x, ...)

formula_ok(
    x,
    checks = "all",
    action = "warning",
    prefix_msg = NULL,
    verbose = TRUE,
    ...
)

## Default S3 method:
find_formula(x, verbose = TRUE, ...)

## S3 method for class 'nestedLogit'
find_formula(x, dichotomies = FALSE, verbose = TRUE, ...)
```

Arguments

x A fitted model.

... Currently not used.

checks

Indicates what kind of checks are conducted when checking the formula notation. Currently, four different formula specification that can result in unexpected behaviour of downstream-functions are checked. checks can be one or more of:

- "dollar": Check if formula contains data name with "\$", e.g. mtcars\$am.
- "T": Check if formula contains poly-term with "raw=T", e.g. poly(x, 2, raw=T). In this case, all.vars() returns T as variable, which is not intended.
- "index": Check if formula contains indexed data frames as response variable (e.g., df[, 5] ~ x).
- "name": Check if syntactically invalid variable names were used and quoted in backticks.
- "all": Checks all of the above mentioned options.

action Should a message, warning or error be given for an invalid formula? Must be

one of "message", "warning" (default) or "error".

prefix_msg Optional string that will be added to the warning/error message. This can be

used to add additional information, e.g. about the specific function that was

calling formula_ok() and failed.

verbose Toggle warnings.

dichotomies Logical, if model is a nestedLogit objects, returns the formulas for the di-

chotomies.

Value

A list of formulas that describe the model. For simple models, only one list-element, conditional, is returned. For more complex models, the returned list may have following elements:

find formula 23

• conditional, the "fixed effects" part from the model (in the context of fixed-effects or instrumental variable regression, also called *regressors*). One exception are DirichletRegModel models from **DirichletReg**, which has two or three components, depending on model.

- random, the "random effects" part from the model (or the id for gee-models and similar)
- zero_inflated, the "fixed effects" part from the zero-inflation component of the model. for models from *brms*, this component is named zi.
- zero_inflated_random, the "random effects" part from the zero-inflation component of the model; for models from *brms*, this component is named zi_random.
- dispersion, the dispersion formula
- instruments, for fixed-effects or instrumental variable regressions like ivreg::ivreg(), lfe::felm() or plm::plm(), the instrumental variables
- cluster, for fixed-effects regressions like lfe::felm(), the cluster specification
- correlation, for models with correlation-component like nlme::gls(), the formula that describes the correlation structure
- scale, for distributional models such as mgcv::gaulss() family fitted with mgcv::gam(), the formula that describes the scale parameter
- slopes, for fixed-effects individual-slope models like feisr::feis(), the formula for the slope parameters
- precision, for DirichletRegModel models from **DirichletReg**, when parametrization (i.e. model) is "alternative".
- bidrange, for models of class oohbchoice (from package **DCchoice**), which indicates the right-hand side of the bar (the bid-range).

For models from package brms, distributional parameters are also included.

Note

For models of class lme or gls the correlation-component is only returned, when it is explicitly defined as named argument (form), e.g. corAR1(form = ~1 | Mare)

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
find_formula(m)

m <- lme4::lmer(Sepal.Length ~ Sepal.Width + (1 | Species), data = iris)
f <- find_formula(m)
f
format(f)</pre>
```

24 find_interactions

find_interactions

Find interaction terms from models

Description

Returns all lowest to highest order interaction terms from a model.

Usage

```
find_interactions(x, component = "all", flatten = FALSE)
```

Arguments

Χ

A fitted model.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

flatten

Logical, if TRUE, the values are returned as character vector, not as list. Duplicated values are removed.

Value

A list of character vectors that represent the interaction terms. Depending on component, the returned list has following elements (or NULL, if model has no interaction term):

- conditional, interaction terms that belong to the "fixed effects" terms from the model
- zero_inflated, interaction terms that belong to the "fixed effects" terms from the zero-inflation component of the model
- instruments, for fixed-effects regressions like ivreg, felm or plm, interaction terms that belong to the instrumental variables

find_interactions 25

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the model. Will only have an effect for models with more than just the conditional model component.
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects - depending on the effects argument - but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

- mhurdle: "infrequent_purchase", "ip", and "auxiliary"
- BGGM: "correlation" and "intercept"
- BFBayesFactor, glmx: "extra"
- averaging: "conditional" and "full"
- mjoint: "survival"
- mfx: "precision", "marginal"
- betareg, DirichletRegModel: "precision"
- mvord: "thresholds" and "correlation"
- clm2: "scale"
- selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

26 find_offset

Examples

```
data(mtcars)

m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
find_interactions(m)

m <- lm(mpg ~ wt * cyl + vs * hp * gear + carb, data = mtcars)
find_interactions(m)</pre>
```

find_offset

Find possible offset terms in a model

Description

Returns a character vector with the name(s) of offset terms.

Usage

```
find_offset(x, as_term = FALSE)
```

Arguments

x A fitted model.

as_term

Logical, if TRUE, the offset is returned as term, including possible transformations, like log(variable). If FALSE (default), only the variable name is returned.

Value

A character vector with the name(s) of offset terms.

```
# Generate some zero-inflated data
set.seed(123)
N <- 100 # Samples
x <- runif(N, 0, 10) # Predictor
off <- rgamma(N, 3, 2) # Offset variable
yhat <- -1 + x * 0.5 + log(off) # Prediction on log scale
dat <- data.frame(y = NA, x, logOff = log(off), raw_off = off)
dat$y <- rpois(N, exp(yhat)) # Poisson process
dat$y <- ifelse(rbinom(N, 1, 0.3), 0, dat$y) # Zero-inflation process

m1 <- pscl::zeroinfl(y ~ offset(logOff) + x | 1, data = dat, dist = "poisson")
find_offset(m1)

m2 <- pscl::zeroinfl(
    y ~ offset(log(raw_off)) + x | 1,
    data = dat,</pre>
```

27 find_parameters

```
dist = "poisson"
find_offset(m2)
find_offset(m2, as_term = TRUE)
m3 <- pscl::zeroinfl(y ~ x | 1, data = dat, offset = logOff, dist = "poisson")
find_offset(m3)
```

find_parameters

Find names of model parameters

Description

Returns the names of model parameters, like they typically appear in the summary() output. For Bayesian models, the parameter names equal the column names of the posterior samples after coercion from as.data.frame(). See the documentation for your object's class:

- Bayesian models (rstanarm, brms, MCMCglmm, ...)
- Generalized additive models (mgcv, VGAM, ...)
- Marginal effects models (mfx)
- Estimated marginal means (emmeans)
- Mixed models (lme4, glmmTMB, GLMMadaptive, ...)
- Zero-inflated and hurdle models (pscl, ...)
- Models with special components (betareg, MuMIn, ...)

Usage

```
find_parameters(x, ...)
## Default S3 method:
find_parameters(x, flatten = FALSE, verbose = TRUE, ...)
```

Arguments

A fitted model. Х Currently not used. Logical, if TRUE, the values are returned as character vector, not as list. Dupliflatten

cated values are removed.

Toggle messages and warnings. verbose

Value

A list of parameter names. For simple models, only one list-element, conditional, is returned.

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Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the
 model. Will only have an effect for models with more than just the conditional model component
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

- mhurdle: "infrequent_purchase", "ip", and "auxiliary"
- BGGM: "correlation" and "intercept"
- BFBayesFactor, glmx: "extra"
- averaging: "conditional" and "full"
- mjoint: "survival"
- mfx: "precision", "marginal"
- betareg, DirichletRegModel: "precision"
- mvord: "thresholds" and "correlation"
- clm2: "scale"
- selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Parameters, Variables, Predictors and Terms

There are four functions that return information about the variables in a model: find_predictors(), find_variables(), find_terms() and find_parameters(). There are some differences between those functions, which are explained using following model. Note that some, but not all of those functions return information about the *dependent* and *independent* variables. In this example, we only show the differences for the independent variables.

```
model <- lm(mpg ~ factor(gear), data = mtcars)</pre>
```

- find_terms(model) returns the model terms, i.e. how the variables were used in the model, e.g. applying transformations like factor(), poly() etc. find_terms() may return a variable name multiple times in case of multiple transformations. The return value would be "factor(gear)".
- find_parameters(model) returns the names of the model parameters (coefficients). The return value would be "(Intercept)", "factor(gear)4" and "factor(gear)5".
- find_variables() returns the original variable names. find_variables() returns each variable name only once. The return value would be "gear".
- find_predictors() is comparable to find_variables() and also returns the original variable names, but excluded the *dependent* (response) variables. The return value would be "gear".

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
find_parameters(m)</pre>
```

find_parameters.averaging

Find model parameters from models with special components

Description

Returns the names of model parameters, like they typically appear in the summary() output.

Usage

```
## S3 method for class 'averaging'
find_parameters(x, component = "conditional", flatten = FALSE, ...)
```

Arguments

x A fitted model.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

flatten

Logical, if TRUE, the values are returned as character vector, not as list. Duplicated values are removed.

... Currently not used.

Value

A list of parameter names. The returned list may have following elements, usually requested via the component argument:

- conditional, the "fixed effects" part from the model.
- full, parameters from the full model.
- precision for models of class betareg.
- survival for model of class mjoint.
- extra for models of class glmx.

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the
 model. Will only have an effect for models with more than just the conditional model component
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.

- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

```
• mhurdle: "infrequent_purchase", "ip", and "auxiliary"
```

• BGGM: "correlation" and "intercept"

```
• BFBayesFactor, glmx: "extra"
```

• averaging: "conditional" and "full"

```
• mjoint: "survival"
```

• mfx: "precision", "marginal"

• betareg, DirichletRegModel: "precision"

• mvord: "thresholds" and "correlation"

• clm2: "scale"

• selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

```
data("GasolineYield", package = "betareg")
m <- betareg::betareg(yield ~ batch + temp, data = GasolineYield)
find_parameters(m)
find_parameters(m, component = "precision")</pre>
```

find_parameters.betamfx

Find names of model parameters from marginal effects models

Description

Returns the names of model parameters, like they typically appear in the summary() output.

Usage

```
## S3 method for class 'betamfx'
find_parameters(x, component = "all", flatten = FALSE, ...)
```

Arguments

Х

A fitted model.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

flatten

Logical, if TRUE, the values are returned as character vector, not as list. Duplicated values are removed.

... Currently not used.

Value

A list of parameter names. The returned list may have following elements:

- conditional, the "fixed effects" part from the model.
- marginal, the marginal effects.
- precision, the precision parameter.

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the model. Will only have an effect for models with more than just the conditional model component.
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects - depending on the effects argument - but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

- mhurdle: "infrequent_purchase", "ip", and "auxiliary"
- BGGM: "correlation" and "intercept"
- BFBayesFactor, glmx: "extra"
- averaging: "conditional" and "full"
- mjoint: "survival"
- mfx: "precision", "marginal"
- betareg, DirichletRegModel: "precision"
- mvord: "thresholds" and "correlation"
- clm2: "scale"
- selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
find_parameters(m)</pre>
```

find_parameters.BGGM Find names of model parameters from Bayesian models

Description

Returns the names of model parameters, like they typically appear in the summary() output. For Bayesian models, the parameter names equal the column names of the posterior samples after coercion from as.data.frame().

Usage

```
## S3 method for class 'BGGM'
find_parameters(x, component = "correlation", flatten = FALSE, ...)

## S3 method for class 'brmsfit'
find_parameters(
    x,
    effects = "all",
    component = "all",
    flatten = FALSE,
    parameters = NULL,
    ...
)
```

Arguments

A fitted model.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).

• For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

flatten

Logical, if TRUE, the values are returned as character vector, not as list. Duplicated values are removed.

. . .

Currently not used.

effects

Should variables for fixed effects ("fixed"), random effects ("random") or both ("all") be returned? Only applies to mixed models. May be abbreviated.

For models of from packages **brms** or **rstanarm** there are additional options:

- "fixed" returns fixed effects.
- "random_variance" return random effects parameters (variance and correlation components, e.g. those parameters that start with sd_ or cor_).
- "grouplevel" returns random effects group level estimates, i.e. those parameters that start with r_.
- "random" returns both "random_variance" and "grouplevel".
- "all" returns fixed effects and random effects variances.
- "full" returns all parameters.

parameters

Regular expression pattern that describes the parameters that should be returned.

Value

A list of parameter names. For simple models, only one list-element, conditional, is returned. For more complex models, the returned list may have following elements:

- conditional, the "fixed effects" part from the model
- random, the "random effects" part from the model
- zero_inflated, the "fixed effects" part from the zero-inflation component of the model. For **brms**, this is named zi.
- zero_inflated_random, the "random effects" part from the zero-inflation component of the model. For **brms**, this is named zi_random.
- smooth_terms, the smooth parameters

Furthermore, some models, especially from **brms**, can also return other auxiliary (distributional) parameters. These may be one of the following:

- sigma, the residual standard deviation (auxiliary parameter)
- dispersion, the dispersion parameters (auxiliary parameter)
- beta, the beta parameter (auxiliary parameter)
- and any pre-defined or arbitrary distributional parameter for models from package **brms**, like mu, ndt, kappa, etc.

Models of class **BGGM** additionally can return the elements correlation and intercept.

Models of class **BFBayesFactor** additionally can return the element extra.

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
find_parameters(m)</pre>
```

find_parameters.emmGrid

Find model parameters from estimated marginal means objects

Description

Returns the parameter names from a model.

Usage

```
## S3 method for class 'emmGrid'
find_parameters(x, flatten = FALSE, merge_parameters = FALSE, ...)
```

Arguments

x A fitted model.

flatten Logical, if TRUE, the values are returned as character vector, not as list. Dupli-

cated values are removed.

merge_parameters

Logical, if TRUE and x has multiple columns for parameter names (like emmGrid objects may have), these are merged into a single parameter column, with pa-

rameters names and values as values.

... Currently not used.

Value

A list of parameter names. For simple models, only one list-element, conditional, is returned.

```
data(mtcars)
model <- lm(mpg ~ wt * factor(cyl), data = mtcars)
emm <- emmeans(model, c("wt", "cyl"))
find_parameters(emm)</pre>
```

find_parameters.gamlss

Find names of model parameters from generalized additive models

Description

Returns the names of model parameters, like they typically appear in the summary() output.

Usage

```
## S3 method for class 'gamlss'
find_parameters(x, flatten = FALSE, ...)
## S3 method for class 'gam'
find_parameters(x, component = "all", flatten = FALSE, ...)
```

Arguments

x A fitted model.

flatten

Logical, if TRUE, the values are returned as character vector, not as list. Duplicated values are removed.

. . .

Currently not used.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Value

A list of parameter names. The returned list may have following elements:

- conditional, the "fixed effects" part from the model.
- smooth_terms, the smooth parameters.

Examples

```
data(mtcars)
m <- mgcv::gam(mpg ~ s(hp) + gear, data = mtcars)
find_parameters(m)</pre>
```

find_parameters.glmmTMB

Find names of model parameters from mixed models

Description

Returns the names of model parameters, like they typically appear in the summary() output.

Usage

```
## S3 method for class 'glmmTMB'
find_parameters(x, effects = "all", component = "all", flatten = FALSE, ...)
```

Arguments

Χ

A fitted model.

effects

Should variables for fixed effects ("fixed"), random effects ("random") or both ("all") be returned? Only applies to mixed models. May be abbreviated.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

flatten

Logical, if TRUE, the values are returned as character vector, not as list. Duplicated values are removed.

... Currently not used.

Value

A list of parameter names. The returned list may have following elements, usually returned based on the combination of the effects and component arguments:

- conditional, the "fixed effects" part from the model.
- random, the "random effects" part from the model.
- zero_inflated, the "fixed effects" part from the zero-inflation component of the model.
- zero_inflated_random, the "random effects" part from the zero-inflation component of the model.
- dispersion, the dispersion parameters (auxiliary parameter)
- dispersion_random, the "random effects" part from the dispersion parameters (auxiliary parameter)
- nonlinear, the parameters from the nonlinear formula.

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the
 model. Will only have an effect for models with more than just the conditional model component.
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

• mhurdle: "infrequent_purchase", "ip", and "auxiliary"

```
BGGM: "correlation" and "intercept"
BFBayesFactor, glmx: "extra"
averaging: "conditional" and "full"
mjoint: "survival"
mfx: "precision", "marginal"
betareg, DirichletRegModel: "precision"
mvord: "thresholds" and "correlation"
clm2: "scale"
selection: "selection", "outcome", and "auxiliary"
```

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data(sleepstudy, package = "lme4")
m <- lme4::lmer(
   Reaction ~ Days + (1 + Days | Subject),
   data = sleepstudy
)
find_parameters(m)</pre>
```

find_parameters.zeroinfl

Find names of model parameters from zero-inflated models

Description

Returns the names of model parameters, like they typically appear in the summary() output.

Usage

```
## S3 method for class 'zeroinfl'
find_parameters(x, component = "all", flatten = FALSE, ...)
```

Arguments

^

component

A fitted model.

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called

fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

flatten

Logical, if TRUE, the values are returned as character vector, not as list. Duplicated values are removed.

... Currently not used.

Value

A list of parameter names. The returned list may have following elements:

- conditional, the "fixed effects" part from the model.
- zero_inflated, the "fixed effects" part from the zero-inflation component of the model.
- Special models are mhurdle, which also can have the components infrequent_purchase, ip, and auxiliary.

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the model. Will only have an effect for models with more than just the conditional model component.
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.

• "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.

- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

```
mhurdle: "infrequent_purchase", "ip", and "auxiliary"
BGGM: "correlation" and "intercept"
BFBayesFactor, glmx: "extra"
averaging: "conditional" and "full"
mjoint: "survival"
mfx: "precision", "marginal"
betareg, DirichletRegModel: "precision"
mvord: "thresholds" and "correlation"
clm2: "scale"
selection: "selection", "outcome", and "auxiliary"
```

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data(bioChemists, package = "pscl")
m <- pscl::zeroinfl(
   art ~ fem + mar + kid5 + ment | kid5 + phd,
   data = bioChemists
)
find_parameters(m)</pre>
```

find_predictors

Find names of model predictors

Description

Returns the names of the predictor variables for the different parts of a model (like fixed or random effects, zero-inflated component, ...). Unlike find_parameters(), the names from find_predictors() match the original variable names from the data that was used to fit the model.

Usage

```
find_predictors(x, ...)
## Default S3 method:
find_predictors(
    x,
    effects = "fixed",
    component = "all",
    flatten = FALSE,
    verbose = TRUE,
    ...
)
```

Arguments

x A fitted model.

... Currently not used.

effects Should varia

Should variables for fixed effects ("fixed"), random effects ("random") or both ("all") be returned? Only applies to mixed models. May be abbreviated.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

flatten

Logical, if TRUE, the values are returned as character vector, not as list. Duplicated values are removed.

verbose

Toggle warnings.

Value

A list of character vectors that represent the name(s) of the predictor variables. Depending on the combination of the arguments effects and component, the returned list can have following elements:

• conditional, the "fixed effects" terms from the model

- random, the "random effects" terms from the model
- zero_inflated, the "fixed effects" terms from the zero-inflation component of the model. For models from **brms**, this is named zi.
- zero_inflated_random, the "random effects" terms from the zero-inflation component of the model. For models from **brms**, this is named zi_random.
- dispersion, the dispersion terms
- instruments, for fixed-effects regressions like ivreg, felm or plm, the instrumental variables
- correlation, for models with correlation-component like gls, the variables used to describe the correlation structure
- nonlinear, for non-linear models (like models of class nlmerMod or nls), the staring estimates for the nonlinear parameters
- smooth_terms returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms)

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the
 model. Will only have an effect for models with more than just the conditional model component.
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

• mhurdle: "infrequent_purchase", "ip", and "auxiliary"

```
BGGM: "correlation" and "intercept"
BFBayesFactor, glmx: "extra"
averaging: "conditional" and "full"
mjoint: "survival"
mfx: "precision", "marginal"
betareg, DirichletRegModel: "precision"
mvord: "thresholds" and "correlation"
clm2: "scale"
selection: "selection", "outcome", and "auxiliary"
```

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Parameters, Variables, Predictors and Terms

There are four functions that return information about the variables in a model: find_predictors(), find_variables(), find_terms() and find_parameters(). There are some differences between those functions, which are explained using following model. Note that some, but not all of those functions return information about the *dependent* and *independent* variables. In this example, we only show the differences for the independent variables.

```
model <- lm(mpg ~ factor(gear), data = mtcars)</pre>
```

- find_terms(model) returns the model terms, i.e. how the variables were used in the model, e.g. applying transformations like factor(), poly() etc. find_terms() may return a variable name multiple times in case of multiple transformations. The return value would be "factor(gear)".
- find_parameters(model) returns the names of the model parameters (coefficients). The return value would be "(Intercept)", "factor(gear)4" and "factor(gear)5".
- find_variables() returns the original variable names. find_variables() returns each variable name only once. The return value would be "gear".
- find_predictors() is comparable to find_variables() and also returns the original variable names, but excluded the *dependent* (response) variables. The return value would be "gear".

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
find_predictors(m)</pre>
```

46 find_random

find_random

Find names of random effects

Description

Return the name of the grouping factors from mixed effects models.

Usage

```
find_random(x, split_nested = FALSE, flatten = FALSE)
```

Arguments

x A fitted mixed model.

split_nested Logical, if TRUE, terms from nested random effects will be returned as separated

elements, not as single string with colon. See 'Examples'.

flatten Logical, if TRUE, the values are returned as character vector, not as list. Dupli-

cated values are removed.

Value

A list of character vectors that represent the name(s) of the random effects (grouping factors). Depending on the model, the returned list has following elements:

- random, the "random effects" terms from the conditional part of model
- zero_inflated_random, the "random effects" terms from the zero-inflation component of the model. For **brms**, this is named zi_random.
- dispersion_random, the "random effects" terms from the dispersion component of the model

Models of class brmsfit may also contain elements for auxiliary parameters.

```
data(sleepstudy, package = "lme4")
sleepstudy$mygrp <- sample(1:5, size = 180, replace = TRUE)
sleepstudy$mysubgrp <- NA
for (i in 1:5) {
    filter_group <- sleepstudy$mygrp == i
    sleepstudy$mysubgrp[filter_group] <-
        sample(1:30, size = sum(filter_group), replace = TRUE)
}
m <- lme4::lmer(
    Reaction ~ Days + (1 | mygrp / mysubgrp) + (1 | Subject),
    data = sleepstudy
)
find_random(m)</pre>
```

find_random_slopes 47

```
find_random(m, split_nested = TRUE)
```

find_random_slopes

Find names of random slopes

Description

Return the name of the random slopes from mixed effects models.

Usage

```
find_random_slopes(x)
```

Arguments

Х

A fitted mixed model.

Value

A list of character vectors with the name(s) of the random slopes, or NULL if model has no random slopes. Depending on the model, the returned list has following elements:

- random, the random slopes from the conditional part of model
- zero_inflated_random, the random slopes from the zero-inflation component of the model. For **brms**, this is named zi_random.
- dispersion_random, the random slopes from the dispersion component of the model

Models of class brmsfit may also contain elements for auxiliary parameters.

```
data(sleepstudy, package = "lme4")
m <- lme4::lmer(Reaction ~ Days + (1 + Days | Subject), data = sleepstudy)
find_random_slopes(m)</pre>
```

48 find_response

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Find name of the response variable

Description

Returns the name(s) of the response variable(s) from a model object.

Usage

```
find_response(x, combine = TRUE, ...)
## S3 method for class 'joint'
find_response(x, combine = TRUE, component = "conditional", ...)
```

Arguments

X	A fitted model.
combine	Logical, if TRUE and the response is a matrix-column, the name of the response matches the notation in formula, and would for instance also contain patterns like "cbind()". Else, the original variable names from the matrix-column are returned. See 'Examples'.
	Currently not used.

Character, if x is a joint model, this argument can be used to specify which component to return. Possible values are "conditional", "survival" or "all".

Value

component

The name(s) of the response variable(s) from x as character vector, or NULL if response variable could not be found.

```
data(cbpp, package = "lme4")
cbpp$trials <- cbpp$size - cbpp$incidence
m <- glm(cbind(incidence, trials) ~ period, data = cbpp, family = binomial)
find_response(m, combine = TRUE)
find_response(m, combine = FALSE)</pre>
```

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find_smooth

Find smooth terms from a model object

Description

Return the names of smooth terms from a model object.

Usage

```
find\_smooth(x, flatten = FALSE)
```

Arguments

x A (gam) model.

flatten Logical, if TRUE, the values are returned as character vector, not as list. Dupli-

cated values are removed.

Value

A character vector with the name(s) of the smooth terms.

Examples

```
data(iris)
model <- mgcv::gam(Petal.Length ~ Petal.Width + s(Sepal.Length), data = iris)
find_smooth(model)</pre>
```

find_statistic

Find statistic for model

Description

Returns the statistic for a regression model (*t*-statistic, *z*-statistic, etc.).

Small helper that checks if a model is a regression model object and return the statistic used.

Usage

```
find_statistic(x, ...)
```

Arguments

x An object.

... Currently not used.

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Value

A character describing the type of statistic. If there is no statistic available with a distribution, NULL will be returned.

Examples

```
# regression model object
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
find_statistic(m)</pre>
```

find_terms

Find all model terms

Description

Returns a list with the names of all terms, including response value and random effects, "as is". This means, on-the-fly tranformations or arithmetic expressions like log(), I(), as.factor() etc. are preserved.

Usage

```
find_terms(x, ...)
## Default S3 method:
find_terms(x, flatten = FALSE, as_term_labels = FALSE, verbose = TRUE, ...)
```

Arguments

X A fitted model.
... Currently not used.

flatten Logical, if TRUE, the values are returned as character vector, not as list. Duplicated values are removed.

as_term_labels Logical, if TRUE, extracts model formula and tries to access the "term.labels" attribute. This should better mimic the terms() behaviour even for those models that do not have such a method, but may be insufficient, e.g. for mixed models. verbose Toggle warnings.

Value

A list with (depending on the model) following elements (character vectors):

- response, the name of the response variable
- conditional, the names of the predictor variables from the *conditional* model (as opposed to the zero-inflated part of a model)
- random, the names of the random effects (grouping factors)

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· zero_inflated, the names of the predictor variables from the zero-inflated part of the model

- zero_inflated_random, the names of the random effects (grouping factors)
- dispersion, the name of the dispersion terms
- instruments, the names of instrumental variables

Returns NULL if no terms could be found (for instance, due to problems in accessing the formula).

Parameters, Variables, Predictors and Terms

There are four functions that return information about the variables in a model: find_predictors(), find_variables(), find_terms() and find_parameters(). There are some differences between those functions, which are explained using following model. Note that some, but not all of those functions return information about the *dependent* and *independent* variables. In this example, we only show the differences for the independent variables.

```
model <- lm(mpg ~ factor(gear), data = mtcars)</pre>
```

- find_terms(model) returns the model terms, i.e. how the variables were used in the model, e.g. applying transformations like factor(), poly() etc. find_terms() may return a variable name multiple times in case of multiple transformations. The return value would be "factor(gear)".
- find_parameters(model) returns the names of the model parameters (coefficients). The return value would be "(Intercept)", "factor(gear)4" and "factor(gear)5".
- find_variables() returns the original variable names. find_variables() returns each variable name only once. The return value would be "gear".
- find_predictors() is comparable to find_variables() and also returns the original variable names, but excluded the *dependent* (response) variables. The return value would be "gear".

Note

The difference to find_variables() is that find_terms() may return a variable multiple times in case of multiple transformations (see examples below), while find_variables() returns each variable name only once.

```
data(sleepstudy, package = "lme4")
m <- suppressWarnings(lme4::lmer(
    log(Reaction) ~ Days + I(Days^2) + (1 + Days + exp(Days) | Subject),
    data = sleepstudy
))
find_terms(m)
# sometimes, it is necessary to retrieve terms from "term.labels" attribute
m <- lm(mpg ~ hp * (am + cyl), data = mtcars)
find_terms(m, as_term_labels = TRUE)</pre>
```

52 find_transformation

find_transformation

Find possible transformation of model variables

Description

This functions checks whether any transformation, such as log- or exp-transforming, was applied to the response variable (dependent variable) in a regression formula. Optionally, all model terms can also be checked for any such transformation. Currently, following patterns are detected: log, log1p, log2, log10, exp, expm1, sqrt, log(y+<number>), log-log, log(y,base=<number>), power (e.g. to 2nd power, like $I(y^2)$), inverse (like 1/y), scale (e.g., y/3), and box-cox (e.g., (y^1) ambda - 1) / lambda).

Usage

```
find_transformation(x, ...)
## Default S3 method:
find_transformation(x, include_all = FALSE, ...)
```

Arguments

A regression model or a character string of the formulation of the (response) variable.
 Currently not used.
 Logical, if TRUE, does not only check the response variable, but all model terms.

Value

A string, with the name of the function of the applied transformation. Returns "identity" for no transformation, and e.g. " $\log(y+3)$ " when a specific values was added to the response variables before log-transforming. For unknown transformations, returns NULL.

```
# identity, no transformation
model <- lm(Sepal.Length ~ Species, data = iris)
find_transformation(model)

# log-transformation
model <- lm(log(Sepal.Length) ~ Species, data = iris)
find_transformation(model)

# log+2
model <- lm(log(Sepal.Length + 2) ~ Species, data = iris)
find_transformation(model)

# find transformation for all model terms
model <- lm(mpg ~ log(wt) + I(gear^2) + exp(am), data = mtcars)</pre>
```

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```
find_transformation(model, include_all = TRUE)
# inverse, response provided as character string
find_transformation("1 / y")
```

find_variables

Find names of all variables

Description

Returns a list with the names of all variables, including response value and random effects.

Usage

```
find_variables(
    x,
    effects = "all",
    component = "all",
    flatten = FALSE,
    verbose = TRUE
)
```

Arguments

Χ

A fitted model.

effects

Should variables for fixed effects ("fixed"), random effects ("random") or both ("all") be returned? Only applies to mixed models. May be abbreviated.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

flatten

Logical, if TRUE, the values are returned as character vector, not as list. Duplicated values are removed.

verbose

Toggle warnings.

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Value

A list with (depending on the model) following elements (character vectors):

- response, the name of the response variable
- conditional, the names of the predictor variables from the *conditional* model (as opposed to the zero-inflated part of a model)
- cluster, the names of cluster or grouping variables
- dispersion, the name of the dispersion terms
- instruments, the names of instrumental variables
- random, the names of the random effects (grouping factors)
- zero_inflated, the names of the predictor variables from the *zero-inflated* part of the model. For **brms**, this is named zi.
- zero_inflated_random, the names of the random effects (grouping factors). For brms, this
 is named zi_random.

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the model. Will only have an effect for models with more than just the conditional model component
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects - depending on the effects argument - but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

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```
• mhurdle: "infrequent_purchase", "ip", and "auxiliary"
```

- BGGM: "correlation" and "intercept"
- BFBayesFactor, glmx: "extra"
- averaging: "conditional" and "full"
- mjoint: "survival"
- mfx: "precision", "marginal"
- betareg, DirichletRegModel: "precision"
- mvord: "thresholds" and "correlation"
- clm2: "scale"
- selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Parameters, Variables, Predictors and Terms

There are four functions that return information about the variables in a model: find_predictors(), find_variables(), find_terms() and find_parameters(). There are some differences between those functions, which are explained using following model. Note that some, but not all of those functions return information about the *dependent* and *independent* variables. In this example, we only show the differences for the independent variables.

```
model <- lm(mpg ~ factor(gear), data = mtcars)</pre>
```

- find_terms(model) returns the model terms, i.e. how the variables were used in the model, e.g. applying transformations like factor(), poly() etc. find_terms() may return a variable name multiple times in case of multiple transformations. The return value would be "factor(gear)".
- find_parameters(model) returns the names of the model parameters (coefficients). The return value would be "(Intercept)", "factor(gear)4" and "factor(gear)5".
- find_variables() returns the original variable names. find_variables() returns each variable name only once. The return value would be "gear".
- find_predictors() is comparable to find_variables() and also returns the original variable names, but excluded the *dependent* (response) variables. The return value would be "gear".

Note

The difference to find_terms() is that find_variables() returns each variable name only once, while find_terms() may return a variable multiple times in case of transformations or when arithmetic expressions were used in the formula.

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Examples

```
data(cbpp, package = "lme4")
data(sleepstudy, package = "lme4")
# some data preparation...
cbpp$trials <- cbpp$size - cbpp$incidence</pre>
sleepstudy$mygrp <- sample(1:5, size = 180, replace = TRUE)</pre>
sleepstudy$mysubgrp <- NA</pre>
for (i in 1:5) {
  filter_group <- sleepstudy$mygrp == i</pre>
  sleepstudy$mysubgrp[filter_group] <-</pre>
    sample(1:30, size = sum(filter_group), replace = TRUE)
}
m1 <- lme4::glmer(</pre>
  cbind(incidence, size - incidence) ~ period + (1 | herd),
  data = cbpp,
  family = binomial
)
find_variables(m1)
m2 <- lme4::lmer(</pre>
  Reaction ~ Days + (1 | mygrp / mysubgrp) + (1 | Subject),
  data = sleepstudy
)
find_variables(m2)
find_variables(m2, flatten = TRUE)
```

find_weights

Find names of model weights

Description

Returns the name of the variable that describes the weights of a model.

Usage

```
find_weights(x, ...)
```

Arguments

x A fitted model.

... Currently not used.

Value

The name of the weighting variable as character vector, or NULL if no weights were specified.

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Examples

```
data(mtcars)
mtcars$weight <- rnorm(nrow(mtcars), 1, .3)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars, weights = weight)
find_weights(m)</pre>
```

fish

Sample data set for count models

Description

A sample data set, used in tests and some examples. Useful for testing count models.

format_bf

Bayes Factor formatting

Description

Bayes Factor formatting

Usage

```
format_bf(
  bf,
  stars = FALSE,
  stars_only = FALSE,
  inferiority_star = "°",
  name = "BF",
  protect_ratio = FALSE,
  na_reference = NA,
  exact = FALSE
)
```

Arguments

bf Bayes Factor.

stars Add significance stars (e.g., p < .001***). For Bayes factors, the thresholds for

"significant" results are values larger than 3, 10, and 30.

stars_only Return only significance stars.

inferiority_star

String, indicating the symbol that is used to indicate inferiority, i.e. when the Bayes Factor is smaller than one third (the thresholds are smaller than one third,

1/10 and 1/30).

name Name prefixing the text. Can be NULL.

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protect_ratio Should values smaller than 1 be represented as ratios?

na_reference How to format missing values (NA).

exact Should very large or very small values be reported with a scientific format (e.g.,

4.24e5), or as truncated values (as "> 1000" and "< 1/1000").

Value

A formatted string.

Examples

```
bfs <- c(0.000045, 0.033, NA, 1557, 3.54)
format_bf(bfs)
format_bf(bfs, exact = TRUE, name = NULL)
format_bf(bfs, stars = TRUE)
format_bf(bfs, protect_ratio = TRUE)
format_bf(bfs, protect_ratio = TRUE, exact = TRUE)
format_bf(bfs, na_reference = 1)</pre>
```

format_capitalize

Capitalizes the first letter in a string

Description

This function converts the first letter in a string into upper case.

Usage

```
format_capitalize(x, verbose = TRUE)
```

Arguments

x A character vector or a factor. The latter is coerced to character. All other objects

are returned unchanged.

verbose Toggle warnings.

Value

x, with first letter capitalized.

```
format_capitalize("hello")
format_capitalize(c("hello", "world"))
unique(format_capitalize(iris$Species))
```

format_ci 59

format_ci

Confidence/Credible Interval (CI) Formatting

Description

Confidence/Credible Interval (CI) Formatting

Usage

```
format_ci(CI_low, ...)

## S3 method for class 'numeric'
format_ci(
    CI_low,
    CI_high,
    ci = 0.95,
    digits = 2,
    brackets = TRUE,
    width = NULL,
    width_low = width,
    width_high = width,
    missing = "",
    zap_small = FALSE,
    ci_string = "CI",
    ...
)
```

Arguments

CI_low	Lower CI bound. Usually a numeric value, but can also be a CI output returned
	have at a tD in which are the name in its answer and any arrange

bayestestR, in which case the remaining arguments are unnecessary.

... Arguments passed to or from other methods.

CI_high Upper CI bound.

ci CI level in percentage.

digits Number of digits for rounding or significant figures. May also be "signif" to

return significant figures or "scientific" to return scientific notation. Control the number of digits by adding the value as suffix, e.g. digits = "scientific4" to have scientific notation with 4 decimal places, or digits = "signif5" for 5

significant figures (see also signif()).

brackets Either a logical, and if TRUE (default), values are encompassed in square brack-

ets. If FALSE or NULL, no brackets are used. Else, a character vector of length

two, indicating the opening and closing brackets.

width Minimum width of the returned string. If not NULL and width is larger than the

string's length, leading whitespaces are added to the string. If width="auto",

width will be set to the length of the longest string.

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Like width, but only applies to the lower or higher confidence interval value.

This can be used when the values for the lower and upper CI are of very different length.

missing

Value by which NA values are replaced. By default, an empty string (i.e. "") is returned for NA.

zap_small

Logical, if TRUE, small values are rounded after digits decimal places. If FALSE, values with more decimal places than digits are printed in scientific notation.

ci_string

String to be used in the output to indicate the type of interval. Default is "CI", but can be changed to "HDI" or anything else, if necessary.

Value

A formatted string.

Examples

```
format_ci(1.20, 3.57, ci = 0.90)
format_ci(1.20, 3.57, ci = NULL)
format_ci(1.20, 3.57, ci = NULL, brackets = FALSE)
format_ci(1.20, 3.57, ci = NULL, brackets = c("(", ")"))
format_ci(c(1.205645, 23.4), c(3.57, -1.35), ci = 0.90)
format_ci(c(1.20, NA, NA), c(3.57, -1.35, NA), ci = 0.90)

# automatic alignment of width, useful for printing multiple CIs in columns x <- format_ci(c(1.205, 23.4, 100.43), c(3.57, -13.35, 9.4))
cat(x, sep = "\n")

x <- format_ci(c(1.205, 23.4, 100.43), c(3.57, -13.35, 9.4), width = "auto")
cat(x, sep = "\n")</pre>
```

format_message

Format messages and warnings

Description

Inserts line breaks into a longer message or warning string. Line length is adjusted to maximum length of the console, if the width can be accessed. By default, new lines are indented by two spaces.

format_alert() is a wrapper that combines formatting a string with a call to message(), warning() or stop(). By default, format_alert() creates a message(). format_warning() and format_error() change the default type of exception to warning() and stop(), respectively.

format_message 61

Usage

```
format_message(
    string,
    ...,
    line_length = 0.9 * getOption("width", 80),
    indent = " "
)

format_alert(
    string,
    ...,
    line_length = 0.9 * getOption("width", 80),
    indent = " ",
    type = "message",
    call = FALSE,
    immediate = FALSE
)

format_warning(..., immediate = FALSE)
```

Arguments

string	A string.
	Further strings that will be concatenated as indented new lines.
line_length	Numeric, the maximum length of a line. The default is 90% of the width of the console window.
indent	Character vector. If further lines are specified in , a user-defined string can be specified to indent subsequent lines. Defaults to " " (two white spaces), hence for each start of the line after the first line, two white space characters are inserted.
type	Type of exception alert to raise. Can be "message" for message(), "warning" for warning(), or "error" for stop().
call	Logical. Indicating if the call should be included in the the error message. This is usually confusing for users when the function producing the warning or error is deep within another function, so the default is FALSE.
immediate	Logical. Indicating if the <i>warning</i> should be printed immediately. Only applies to format_warning() or format_alert() with type = "warning". The default is FALSE.

Details

There is an experimental formatting feature implemented in this function. You can use following tags:

• {.b text} for bold formatting

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- { . i text} to use italic font style
- {.url www.url.com} formats the string as URL (i.e., enclosing URL in < and >, blue color and italic font style)
- {.pkg packagename} formats the text in blue color.

This features has some limitations: it's hard to detect the exact length for each line when the string has multiple lines (after line breaks) and the string contains formatting tags. Thus, it can happen that lines are wrapped at an earlier length than expected. Furthermore, if you have multiple words in a format tag ({ .b one two three}), a line break might occur inside this tag, and the formatting no longer works (messing up the message-string).

Value

For format_message(), a formatted string. For format_alert() and related functions, the requested exception, with the exception formatted using format_message().

```
msg <- format_message("Much too long string for just one line, I guess!",</pre>
  line_length = 15
message(msg)
msg <- format_message("Much too long string for just one line, I guess!",</pre>
  "First new line",
  "Second new line",
  "(both indented)",
  line_length = 30
)
message(msg)
msg <- format_message("Much too long string for just one line, I guess!",</pre>
  "First new line",
  "Second new line"
  "(not indented)",
  line_length = 30,
  indent = ""
)
message(msg)
# Caution, experimental! See 'Details'
msg <- format_message(</pre>
  "This is {.i italic}, visit {.url easystats.github.io/easystats}",
  line_length = 30
message(msg)
# message
format_alert("This is a message.")
format_alert("This is a warning.", type = "message")
```

format_number 63

```
# error
try(format_error("This is an error."))
# warning
format_warning("This is a warning.")
```

 ${\tt format_number}$

Convert number to words

Description

Convert number to words

Usage

```
format_number(x, textual = TRUE, ...)
```

Arguments

```
x Number.textual Return words. If FALSE, will run format_value().... Arguments to be passed to format_value() if textual is FALSE.
```

Value

A formatted string.

Note

The code has been adapted from here https://github.com/ateucher/useful_code/blob/master/R/numbers2words.r

```
format_number(2)
format_number(45)
format_number(324.68765)
```

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format_p

p-values formatting

Description

Format p-values.

Usage

```
format_p(
   p,
   stars = FALSE,
   stars_only = FALSE,
   whitespace = TRUE,
   name = "p",
   missing = "",
   decimal_separator = NULL,
   digits = 3,
   ...
)
```

Arguments

p value or vector of p-values.

stars Add significance stars (e.g., p < .001***). For Bayes factors, the thresholds for

"significant" results are values larger than 3, 10, and 30.

stars_only Return only significance stars.

whitespace Logical, if TRUE (default), preserves whitespaces. Else, all whitespace characters

are removed from the returned string.

name Name prefixing the text. Can be NULL.

wissing Value by which NA values are replaced. By default, an empty string (i.e. "") is

returned for NA.

decimal_separator

Character, if not NULL, will be used as decimal separator.

digits Number of significant digits. May also be "scientific" to return exact p-

values in scientific notation, or "apa" to use an APA 7th edition-style for p-values (equivalent to digits = 3). If "scientific", control the number of digits by adding the value as a suffix, e.g.m digits = "scientific4" to have

scientific notation with 4 decimal places.

... Arguments from other methods.

Value

A formatted string.

format_pd 65

Examples

```
format_p(c(.02, .065, 0, .23))
format_p(c(.02, .065, 0, .23), name = NULL)
format_p(c(.02, .065, 0, .23), stars_only = TRUE)

model <- lm(mpg ~ wt + cyl, data = mtcars)
p <- coef(summary(model))[, 4]
format_p(p, digits = "apa")
format_p(p, digits = "scientific")
format_p(p, digits = "scientific")
```

format_pd

Probability of direction (pd) formatting

Description

Probability of direction (pd) formatting

Usage

```
format_pd(pd, stars = FALSE, stars_only = FALSE, name = "pd")
```

Arguments

pd Probability of direction (pd).

stars Add significance stars (e.g., p < .001***). For Bayes factors, the thresholds for "significant" results are values larger than 3, 10, and 30.

stars_only Return only significance stars.

name Name prefixing the text. Can be NULL.

Value

A formatted string.

```
format_pd(0.12) format_pd(c(0.12, 1, 0.9999, 0.98, 0.995, 0.96), name = NULL) format_pd(c(0.12, 1, 0.9999, 0.98, 0.995, 0.96), stars = TRUE)
```

66 format_string

format_rope

Percentage in ROPE formatting

Description

Percentage in ROPE formatting

Usage

```
format_rope(rope_percentage, name = "in ROPE", digits = 2)
```

Arguments

rope_percentage

Value or vector of percentages in ROPE.

name

Name prefixing the text. Can be NULL.

digits

Number of significant digits. May also be "scientific" to return exact p-values in scientific notation, or "apa" to use an APA 7th edition-style for p-values (equivalent to digits = 3). If "scientific", control the number of digits by adding the value as a suffix, e.g.m digits = "scientific4" to have

scientific notation with 4 decimal places.

Value

A formatted string.

Examples

```
format_rope(c(0.02, 0.12, 0.357, 0))
format_rope(c(0.02, 0.12, 0.357, 0), name = NULL)
```

format_string

String Values Formatting

Description

String Values Formatting

Usage

```
format_string(x, ...)
## S3 method for class 'character'
format_string(x, length = NULL, abbreviate = "...", ...)
```

format_table 67

Arguments

x String value.

... Arguments passed to or from other methods.

length Numeric, maximum length of the returned string. If not NULL, will shorten the

string to a maximum length, however, it will not truncate inside words. I.e. if the string length happens to be inside a word, this word is removed from the returned string, so the returned string has a *maximum* length of length, but

might be shorter.

abbreviate String that will be used as suffix, if x was shortened.

Value

A formatted string.

Examples

```
s <- "This can be considered as very long string!"
# string is shorter than max.length, so returned as is
format_string(s, 60)
# string is shortened to as many words that result in
# a string of maximum 20 chars
format_string(s, 20)</pre>
```

format_table

Parameter table formatting

Description

This functions takes a data frame (usually with model parameters) as input and formats certain columns into a more readable layout (like collapsing separate columns for lower and upper confidence interval values). Furthermore, column names are formatted as well. Note that format_table() converts all columns into character vectors!

Usage

```
format_table(
    x,
    pretty_names = TRUE,
    stars = FALSE,
    stars_only = FALSE,
    digits = 2,
    ci_width = "auto",
    ci_brackets = TRUE,
    ci_digits = digits,
    p_digits = 3,
```

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```
rope_digits = digits,
  ic_digits = 1,
  zap_small = FALSE,
  preserve_attributes = FALSE,
  exact = TRUE,
  use_symbols = getOption("insight_use_symbols", FALSE),
  select = NULL,
  verbose = TRUE,
)
```

Arguments

A data frame of model's parameters, as returned by various functions of the Х easystats-packages. May also be a result from broom::tidy().

Return "pretty" (i.e. more human readable) parameter names. pretty_names

If TRUE, add significance stars (e.g., p < .001***). Can also be a character stars

vector, naming the columns that should include stars for significant values. This is especially useful for Bayesian models, where we might have multiple columns with significant values, e.g. BF for the Bayes factor or pd for the probability of direction. In such cases, use stars = c("pd", "BF") to add stars to both columns, or stars = "BF" to only add stars to the Bayes factor and exclude the pd column. Currently, following columns are recognized: "BF", "pd" and "p".

stars_only If TRUE, return significant stars only (and no p-values).

digits, ci_digits, p_digits, rope_digits, ic_digits

Number of digits for rounding or significant figures. May also be "signif" to return significant figures or "scientific" to return scientific notation. Control the number of digits by adding the value as suffix, e.g. digits = "scientific4" to have scientific notation with 4 decimal places, or digits = "signif5" for 5

significant figures (see also signif()).

Minimum width of the returned string for confidence intervals. If not NULL and ci width width is larger than the string's length, leading whitespaces are added to the

string. If width="auto", width will be set to the length of the longest string.

ci_brackets Logical, if TRUE (default), CI-values are encompassed in square brackets (else

in parentheses).

Logical, if TRUE, small values are rounded after digits decimal places. If zap_small

FALSE, values with more decimal places than digits are printed in scientific notation.

preserve_attributes

Logical, if TRUE, preserves all attributes from the input data frame.

Formatting for Bayes factor columns, in case the provided data frame contains

such a column (i.e. columns named "BF" or "log_BF"). For exact = TRUE, very large or very small values are then either reported with a scientific format (e.g.,

4.24e5), else as truncated values (as "> 1000" and "< 1/1000").

Logical, if TRUE, column names that refer to particular effectsizes (like Phi,

Omega or Epsilon) include the related unicode-character instead of the writ-

exact

use_symbols

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ten name. This only works on Windows for $R \ge 4.2$, and on OS X or Linux for $R \ge 4.0$. It is possible to define a global option for this setting, see 'Note'.

select

Determines which columns are printed and the table layout. There are two options for this argument:

A string expression with layout pattern

select is a string with "tokens" enclosed in braces. These tokens will be replaced by their associated columns, where the selected columns will be collapsed into one column. Following tokens are replaced by the related coefficients or statistics: {estimate}, {se}, {ci} (or {ci_low} and {ci_high}), {p}, {pd} and {stars}. The token {ci} will be replaced by {ci_low}, {ci_high}. Example: select = "{estimate}{stars} ({ci})" It is possible to create multiple columns as well. A | separates values into new cells/columns. Example: select = "{estimate} ({ci}) | {p}".

• A string indicating a pre-defined layout

select can be one of the following string values, to create one of the following pre-defined column layouts:

- "minimal": Estimates, confidence intervals and numeric p-values, in two columns. This is equivalent to select = "{estimate} ({ci})|{p}".
- "short": Estimate, standard errors and numeric p-values, in two columns.
 This is equivalent to select = "{estimate} ({se})|{p}".
- "ci": Estimates and confidence intervals, no asterisks for p-values. This is equivalent to select = "{estimate} ({ci})".
- "se": Estimates and standard errors, no asterisks for p-values. This is equivalent to select = "{estimate} ({se})".
- "ci_p": Estimates, confidence intervals and asterisks for p-values. This is equivalent to select = "{estimate}{stars} ({ci})".
- "se_p": Estimates, standard errors and asterisks for p-values. This is equivalent to select = "{estimate}{stars} ({se})"...

Using select to define columns will re-order columns and remove all columns related to uncertainty (standard errors, confidence intervals), test statistics, and p-values (and similar, like pd or BF for Bayesian models), because these are assumed to be included or intentionally excluded when using select. The new column order will be: Parameter columns first, followed by the "glue" columns, followed by all remaining columns. If further columns should also be placed first, add those as focal_terms attributes to x. I.e., following columns are considers as "parameter columns" and placed first: c(easystats_columns("parameter"), attributes(x)\$focal_terms).

Note: glue-like syntax is still experimental in the case of more complex models (like mixed models) and may not return expected results.

verbose

Toggle messages and warnings.

. . .

Arguments passed to or from other methods.

Value

A data frame. Note that format_table() converts all columns into character vectors!

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Note

options(insight_use_symbols = TRUE) overrides the use_symbols argument and always displays symbols, if possible.

See Also

Vignettes Formatting, printing and exporting tables and Formatting model parameters.

Examples

```
format_table(head(iris), digits = 1)

m <- lm(Sepal.Length ~ Species * Sepal.Width, data = iris)
x <- parameters::model_parameters(m)
as.data.frame(format_table(x))
as.data.frame(format_table(x, p_digits = "scientific"))
# "glue" columns
as.data.frame(format_table(x, select = "minimal"))
as.data.frame(format_table(x, select = "{estimate}{stars}|{p}"))

model <- rstanarm::stan_glm(
    Sepal.Length ~ Species,
    data = iris,
    refresh = 0,
    seed = 123
)
x <- parameters::model_parameters(model, ci = c(0.69, 0.89, 0.95))
as.data.frame(format_table(x))</pre>
```

format_value

Numeric Values Formatting

Description

format_value() converts numeric values into formatted string values, where formatting can be
something like rounding digits, scientific notation etc. format_percent() is a short-cut for format_value(as_percent
= TRUE).

Usage

```
format_value(x, ...)
## S3 method for class 'data.frame'
format_value(
    x,
```

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```
digits = 2,
      protect_integers = FALSE,
      missing = "",
      width = NULL,
      as_percent = FALSE,
      zap_small = FALSE,
      lead_zero = TRUE,
      style_positive = "none",
      style_negative = "hyphen",
      decimal_point = getOption("OutDec"),
    )
    ## S3 method for class 'numeric'
    format_value(
      х,
      digits = 2,
      protect_integers = FALSE,
      missing = "",
      width = NULL,
      as_percent = FALSE,
      zap\_small = FALSE,
      lead_zero = TRUE,
      style_positive = "none",
      style_negative = "hyphen",
      decimal_point = getOption("OutDec"),
    )
    format_percent(x, ...)
Arguments
                     Numeric value.
    Х
                     Arguments passed to or from other methods.
    digits
                     Number of digits for rounding or significant figures. May also be "signif" to
                     return significant figures or "scientific" to return scientific notation. Control
                     the number of digits by adding the value as suffix, e.g. digits = "scientific4"
                     to have scientific notation with 4 decimal places, or digits = "signif5" for 5
                     significant figures (see also signif()).
    protect_integers
                     Should integers be kept as integers (i.e., without decimals)?
                     Value by which NA values are replaced. By default, an empty string (i.e. "") is
    missing
                     returned for NA.
```

Minimum width of the returned string. If not NULL and width is larger than the

string's length, leading whitespaces are added to the string. Logical, if TRUE, value is formatted as percentage value.

width

as_percent

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zap_small Logical, if TRUE, small values are rounded after digits decimal places. If FALSE, values with more decimal places than digits are printed in scientific notation.
 lead_zero Logical, if TRUE (default), includes leading zeros, else leading zeros are dropped.
 style_positive A string that determines the style of positive numbers. May be "none" (default), "plus" to add a plus-sign or "space" to precede the string by a Unicode "figure space", i.e., a space equally as wide as a number or +.
 style_negative A string that determines the style of negative numbers. May be "hyphen" (default), "minus" for a proper Unicode minus symbol or "parens" to wrap the number in parentheses.
 decimal_point Character string containing a single character that is used as decimal point in output conversions.

Value

A formatted string.

Examples

```
format_value(1.20)
format_value(1.2)
format_value(1.2012313)
format_value(c(0.0045, 234, -23))
format_value(c(0.0045, 0.12, 0.34))
format_value(c(0.0045, 0.12, 0.34), as_percent = TRUE)
format_value(c(0.0045, 0.12, 0.34), digits = "scientific")
format_value(c(0.0045, 0.12, 0.34), digits = "scientific2")
format_value(c(0.045, 0.12, 0.34), lead_zero = FALSE)
format_value(c(0.0045, 0.12, 0.34), decimal_point = ",")
# default
format_value(c(0.0045, 0.123, 0.345))
# significant figures
format_value(c(0.0045, 0.123, 0.345), digits = "signif")
format_value(as.factor(c("A", "B", "A")))
format_value(iris$Species)
format_value(3)
format_value(3, protect_integers = TRUE)
format_value(head(iris))
```

get_auxiliary

Get auxiliary parameters from models

Description

Returns the requested auxiliary parameters from models, like dispersion, sigma, or beta...

get_auxiliary 73

Usage

```
get_auxiliary(
    x,
    type = "sigma",
    summary = TRUE,
    centrality = "mean",
    verbose = TRUE,
    ...
)

get_dispersion(x, ...)

## Default S3 method:
get_dispersion(x, ...)
```

Arguments

	A model

type The name of the auxiliary parameter that should be retrieved. "sigma" is avail-

able for most models, "dispersion" for models of class glm, glmerMod or glmmTMB as well as brmsfit. "beta" and other parameters are currently only

returned for brmsfit models. See 'Details'.

summary Logical, indicates whether the full posterior samples (summary = FALSE)) or

the summarized centrality indices of the posterior samples (summary = TRUE))

should be returned as estimates.

centrality Only for models with posterior samples, and when summary = TRUE. In this

case, centrality = "mean" would calculate means of posterior samples for each parameter, while centrality = "median" would use the more robust me-

dian value as measure of central tendency.

verbose Toggle warnings.

... Currently not used.

Details

Currently, only sigma and the dispersion parameter are returned, and only for a limited set of models.

Value

The requested auxiliary parameter, or NULL if this information could not be accessed.

Sigma Parameter

```
See get_sigma().
```

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Dispersion Parameter

There are many different definitions of "dispersion", depending on the context. get_auxiliary() returns the dispersion parameters that usually can be considered as variance-to-mean ratio for generalized (linear) mixed models. Exceptions are models of class glmmTMB, where the dispersion equals σ^2 . In detail, the computation of the dispersion parameter for generalized linear models is the ratio of the sum of the squared working-residuals and the residual degrees of freedom. For mixed models of class glmer, the dispersion parameter is also called ϕ and is the ratio of the sum of the squared Pearson-residuals and the residual degrees of freedom. For models of class glmmTMB, dispersion is σ^2 .

brms-models

For models of class brmsfit, there are different options for the type argument. See a list of supported auxiliary parameters here: find_parameters.BGGM().

Examples

```
# from ?glm
clotting <- data.frame(
    u = c(5, 10, 15, 20, 30, 40, 60, 80, 100),
    lot1 = c(118, 58, 42, 35, 27, 25, 21, 19, 18),
    lot2 = c(69, 35, 26, 21, 18, 16, 13, 12, 12)
)
model <- glm(lot1 ~ log(u), data = clotting, family = Gamma())
get_auxiliary(model, type = "dispersion") # same as summary(model)$dispersion</pre>
```

get_call

Get the model's function call

Description

Returns the model's function call when available.

Usage

```
get_call(x)
```

Arguments

Х

A fitted mixed model.

Value

A function call.

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Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_call(m)

m <- lme4::lmer(Sepal.Length ~ Sepal.Width + (1 | Species), data = iris)
get_call(m)</pre>
```

get_data

Get the data that was used to fit the model

Description

This functions tries to get the data that was used to fit the model and returns it as data frame.

```
get_data(x, ...)
## Default S3 method:
get_data(x, source = "environment", verbose = TRUE, ...)
## S3 method for class 'glmmTMB'
get_data(
 х,
  effects = "all",
  component = "all",
  source = "environment",
  verbose = TRUE,
)
## S3 method for class 'afex_aov'
get_data(x, shape = c("long", "wide"), ...)
## S3 method for class 'rma'
get_data(
 х,
  source = "environment",
  verbose = TRUE,
  include_interval = FALSE,
  transf = NULL,
  transf_args = NULL,
  ci = 0.95,
)
```

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Arguments

x A fitted model.

... Currently not used.

source

String, indicating from where data should be recovered. If source = "environment" (default), data is recovered from the environment (e.g. if the data is in the workspace). This option is usually the fastest way of getting data and ensures that the original variables used for model fitting are returned. Note that always the *current* data is recovered from the environment. Hence, if the data was modified *after* model fitting (e.g., variables were recoded or rows filtered), the returned data may no longer equal the model data. If source = "frame" (or "mf"), the data is taken from the model frame. Any transformed variables are back-transformed, if possible. This option returns the data even if it is not available in the environment, however, in certain edge cases back-transforming to the original data may fail. If source = "environment" fails to recover the data, it tries to extract the data from the model frame; if source = "frame" and data cannot be extracted from the model frame, data will be recovered from the environment. Both ways only returns observations that have no missing data in the variables used for model fitting.

verbose

Toggle messages and warnings.

effects

Should model data for fixed effects ("fixed"), random effects ("random") or both ("all") be returned? Only applies to mixed or gee models.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

shape

Return long or wide data? Only applicable in repeated measures designs.

include_interval

For meta-analysis models, should normal-approximation confidence intervals be added for each response effect size?

transf

For meta-analysis models, if intervals are included, a function applied to each response effect size and its interval.

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transf_args	For meta-analysis models, an optional list of arguments passed to the transf function.
ci	For meta-analysis models, the Confidence Interval (CI) level if include_interval = TRUE. Default to 0.95 (95%).

Value

The data that was used to fit the model.

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the
 model. Will only have an effect for models with more than just the conditional model component.
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

- mhurdle: "infrequent_purchase", "ip", and "auxiliary"
- BGGM: "correlation" and "intercept"
- BFBayesFactor, glmx: "extra"
- averaging: "conditional" and "full"
- mjoint: "survival"
- mfx: "precision", "marginal"

```
betareg, DirichletRegModel: "precision"
mvord: "thresholds" and "correlation"
clm2: "scale"
selection: "selection", "outcome", and "auxiliary"
```

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data(cbpp, package = "lme4")
cbpp$trials <- cbpp$size - cbpp$incidence
m <- glm(cbind(incidence, trials) ~ period, data = cbpp, family = binomial)
head(get_data(m))</pre>
```

get_datagrid

Create a reference grid

Description

Create a reference matrix, useful for visualisation, with evenly spread and combined values. Usually used to generate predictions using get_predicted(). See this vignette for a tutorial on how to create a visualisation matrix using this function.

Alternatively, these can also be used to extract the "grid" columns from objects generated by **emmeans** and **marginaleffects** (see those methods for more info).

```
get_datagrid(x, ...)
## S3 method for class 'data.frame'
get_datagrid(
    x,
    by = "all",
    factors = "reference",
    numerics = "mean",
    length = 10,
    range = "range",
    preserve_range = FALSE,
    protect_integers = TRUE,
    digits = 3,
    reference = x,
    ...
)
```

```
## S3 method for class 'numeric'
get_datagrid(
  х,
  length = 10,
  range = "range",
 protect_integers = TRUE,
 digits = 3,
)
## S3 method for class 'factor'
get_datagrid(x, ...)
## Default S3 method:
get_datagrid(
  Х,
 by = "all",
  factors = "reference",
  numerics = "mean",
  preserve_range = TRUE,
  reference = x,
  include_smooth = TRUE,
  include_random = FALSE,
  include_response = FALSE,
  data = NULL,
 digits = 3,
  verbose = TRUE,
)
```

Arguments

by

x An object from which to construct the reference grid.

Arguments passed to or from other methods (for instance, length or range to control the spread of numeric variables.).

Indicates the *focal predictors* (variables) for the reference grid and at which values focal predictors should be represented. If not specified otherwise, representative values for numeric variables or predictors are evenly distributed from the minimum to the maximum, with a total number of length values covering that range (see 'Examples'). Possible options for by are:

• Select variables only:

- "all", which will include all variables or predictors.
- a character vector of one or more variable or predictor names, like c("Species", "Sepal.Width"), which will create a grid of all combinations of unique values.

Note: If by specifies only variable names, without associated values, the following occurs: factor variables use all their levels, numeric variables

use a range of length equally spaced values between their minimum and maximum, and character variables use all their unique values.

• Select variables and values:

- by can be a list of named elements, indicating focal predictors and their representative values, e.g. by = list(mpg = 10:20), by = list(Sepal.Length = c(2, 4), Species = "setosa"), or by = list(Sepal.Length = seq(2, 5, 0.5)).
- Instead of a list, it is possible to write a string representation, or a character vector of such strings, e.g. by = "mpg = 10:20", by = c("Sepal.Length = c(2, 4)", "Species = 'setosa'"), or by = "Sepal.Length = seq(2, 5, 0.5)". Note the usage of single and double quotes to assign strings within strings.
- In general, any expression after a = will be evaluated as R code, which allows using own functions, e.g.

```
fun <- function(x) x^2
get_datagrid(iris, by = "Sepal.Width = fun(2:5)")</pre>
```

Note: If by specifies variables *with* their associated values, argument length is ignored.

There is a special handling of assignments with *brackets*, i.e. values defined inside [and], which create summaries for *numeric* variables. Following "tokens" that creates pre-defined representative values are possible:

- for mean and -/+ 1 SD around the mean: "x = [sd]"
- for median and -/+ 1 MAD around the median: "x = [mad]"
- for Tukey's five number summary (minimum, lower-hinge, median, upper-hinge, maximum): "x = [fivenum]"
- for quartiles: "x = [quartiles]" (same as "x = [fivenum]", but excluding minimum and maximum)
- for terciles: "x = [terciles]"
- for terciles, *including* minimum and maximum: "x = [terciles2]"
- for a pretty value range: "x = [pretty]"
- for minimum and maximum value: "x = [minmax]"
- for 0 and the maximum value: "x = [zeromax]"
- for a random sample from all values: "x = [sample <number>]", where <number> should be a positive integer, e.g. "x = [sample 15]".

Note: the length argument will be ignored when using brackets-tokens.

The remaining variables not specified in by will be fixed (see also arguments factors and numerics).

factors

Type of summary for factors *not* specified in by. Can be "reference" (set at the reference level), "mode" (set at the most common level) or "all" to keep all levels.

numerics

Type of summary for numeric values *not* specified in by. Can be "all" (will duplicate the grid for all unique values), any function ("mean", "median", ...) or a value (e.g., numerics = 0).

length

Length of numeric target variables selected in by (if no representative values are additionally specified). This arguments controls the number of (equally spread) values that will be taken to represent the continuous (non-integer alike!) variables. A longer length will increase precision, but can also substantially increase the size of the datagrid (especially in case of interactions). If NA, will return all the unique values.

In case of multiple continuous target variables, length can also be a vector of different values (see 'Examples'). In this case, length must be of same length as numeric target variables. If length is a named vector, values are matched against the names of the target variables.

When range = "range" (the default), length is ignored for integer type variables when length is larger than the number of unique values *and* protect_integers is TRUE (default). Set protect_integers = FALSE to create a spread of length number of values from minimum to maximum for integers, including fractions (i.e., to treat integer variables as regular numeric variables).

length is furthermore ignored if "tokens" (in brackets [and]) are used in by, or if representative values are additionally specified in by.

range

Option to control the representative values given in by, if no specific values were provided. Use in combination with the length argument to control the number of values within the specified range. range can be one of the following:

- "range" (default), will use the minimum and maximum of the original data vector as end-points (min and max). For integer variables, the length argument will be ignored, and "range" will only use values that appear in the data. Set protect_integers = FALSE to override this behaviour for integer variables.
- if an interval type is specified, such as "iqr", "ci", "hdi" or "eti", it will spread the values within that range (the default CI width is 95% but this can be changed by adding for instance ci = 0.90.) See IQR() and bayestestR::ci(). This can be useful to have more robust change and skipping extreme values.
- if "sd" or "mad", it will spread by this dispersion index around the mean or the median, respectively. If the length argument is an even number (e.g., 4), it will have one more step on the positive side (i.e., -1, 0, +1, +2). The result is a named vector. See 'Examples.'
- "grid" will create a reference grid that is useful when plotting predictions, by choosing representative values for numeric variables based on their position in the reference grid. If a numeric variable is the first predictor in by, values from minimum to maximum of the same length as indicated in length are generated. For numeric predictors not specified at first in by, mean and -1/+1 SD around the mean are returned. For factors, all levels are returned.
- "pretty" will create a range "pretty" values, using pretty(), where the value in length is used for the n argument in pretty().

range can also be a vector of different values (see 'Examples'). In this case, range must be of same length as numeric target variables. If range is a named vector, values are matched against the names of the target variables.

preserve_range In the case of combinations between numeric variables and factors, setting preserve_range

= TRUE will drop the observations where the value of the numeric variable is originally not present in the range of its factor level. This leads to an unbalanced grid. Also, if you want the minimum and the maximum to closely match the actual ranges, you should increase the length argument.

protect_integers

Defaults to TRUE. Indicates whether integers (whole numbers) should be treated as integers (i.e., prevent adding any in-between round number values), or - if FALSE - as regular numeric variables. Only applies when range = "range" (the default), or if range = "grid" and the first predictor in by is an integer.

digits Number of digits used for rounding numeric values specified in by. E.g., x = [sd]

will round the mean and +-/1 SD in the data grid to digits.

reference The reference vector from which to compute the mean and SD. Used when stan-

dardizing or unstandardizing the grid using effectsize::standardize.

include_smooth If x is a model object, decide whether smooth terms should be included in the

data grid or not.

include_random If x is a mixed model object, decide whether random effect terms should be

included in the data grid or not. If include_random is FALSE, but x is a mixed model with random effects, these will still be included in the returned grid, but set to their "population level" value (e.g., NA for *glmmTMB* or 0 for *merMod*). This ensures that common predict() methods work properly, as these usually

need data with all variables in the model included.

include_response

If x is a model object, decide whether the response variable should be included

in the data grid or not.

data Optional, the data frame that was used to fit the model. Usually, the data is

retrieved via get_data().

verbose Toggle warnings.

Details

Data grids are an (artificial or theoretical) representation of the sample. They consists of predictors of interest (so-called focal predictors), and meaningful values, at which the sample characteristics (focal predictors) should be represented. The focal predictors are selected in by. To select meaningful (or representative) values, either use by, or use a combination of the arguments length and range.

Value

Reference grid data frame.

See Also

get_predicted() to extract predictions, for which the data grid is useful, and see the methods for objects generated by **emmeans** and **marginaleffects** to extract the "grid" columns.

Examples

```
data(iris)
data(mtcars)
# Single variable is of interest; all others are "fixed" -----
# Factors, returns all the levels
get_datagrid(iris, by = "Species")
# Specify an expression
get_datagrid(iris, by = "Species = c('setosa', 'versicolor')")
# Numeric variables, default spread length = 10
get_datagrid(iris, by = "Sepal.Length")
# change length
get_datagrid(iris, by = "Sepal.Length", length = 3)
# change non-targets fixing
get_datagrid(iris[2:150, ],
 by = "Sepal.Length",
 factors = "mode", numerics = "median"
# change min/max of target
get_datagrid(iris, by = "Sepal.Length", range = "ci", ci = 0.90)
# Manually change min/max
get_datagrid(iris, by = "Sepal.Length = c(0, 1)")
# -1 SD, mean and +1 SD
get_datagrid(iris, by = "Sepal.Length = [sd]")
# rounded to 1 digit
get_datagrid(iris, by = "Sepal.Length = [sd]", digits = 1)
# identical to previous line: -1 SD, mean and +1 SD
get_datagrid(iris, by = "Sepal.Length", range = "sd", length = 3)
# quartiles
get_datagrid(iris, by = "Sepal.Length = [quartiles]")
# Standardization and unstandardization
data <- get_datagrid(iris, by = "Sepal.Length", range = "sd", length = 3)</pre>
# It is a named vector (extract names with `names(out$Sepal.Length)`)
data$Sepal.Length
datawizard::standardize(data, select = "Sepal.Length")
# Manually specify values
data <- get_datagrid(iris, by = "Sepal.Length = c(-2, 0, 2)")
datawizard::unstandardize(data, select = "Sepal.Length")
```

```
# Multiple variables are of interest, creating a combination ------
get_datagrid(iris, by = c("Sepal.Length", "Species"), length = 3)
get_datagrid(iris, by = c("Sepal.Length", "Petal.Length"), length = c(3, 2))
get_datagrid(iris, by = c(1, 3), length = 3)
get_datagrid(iris, by = c("Sepal.Length", "Species"), preserve_range = TRUE)
get_datagrid(iris, by = c("Sepal.Length", "Species"), numerics = 0)
get_datagrid(iris, by = c("Sepal.Length = 3", "Species"))
get_datagrid(iris, by = c("Sepal.Length = c(3, 1)", "Species = 'setosa'"))
# specify length individually for each focal predictor
# values are matched by names
get_datagrid(mtcars[1:4], by = c("mpg", "hp"), length = c(hp = 3, mpg = 2))
# Numeric and categorical variables, generating a grid for plots
# default spread when numerics are first: length = 10
get_datagrid(iris, by = c("Sepal.Length", "Species"), range = "grid")
# default spread when numerics are not first: length = 3 (-1 SD, mean and +1 SD)
get_datagrid(iris, by = c("Species", "Sepal.Length"), range = "grid")
# range of values
get_datagrid(iris, by = c("Sepal.Width = 1:5", "Petal.Width = 1:3"))
# With list-style by-argument
get_datagrid(
 iris,
 by = list(Sepal.Length = 1:3, Species = c("setosa", "versicolor"))
)
# Fit a linear regression
model <- lm(Sepal.Length ~ Sepal.Width * Petal.Length, data = iris)</pre>
# Get datagrid of predictors
data <- get_datagrid(model, length = c(20, 3), range = c("range", "sd"))</pre>
# same as: get_datagrid(model, range = "grid", length = 20)
# Add predictions
data$Sepal.Length <- get_predicted(model, data = data)</pre>
# Visualize relationships (each color is at -1 SD, Mean, and + 1 SD of Petal.Length)
plot(data$Sepal.Width, data$Sepal.Length,
 col = data$Petal.Length,
 main = "Relationship at -1 SD, Mean, and + 1 SD of Petal.Length"
)
```

get_datagrid.emmGrid 85

Description

Extract a reference grid from objects created by {emmeans} and {marginaleffects}

Usage

```
## S3 method for class 'emmGrid'
get_datagrid(x, ...)
```

Arguments

```
x An object created by a function such as emmeans::emmeans(), marginaleffects::slopes(), etc.
```

... Currently not used

Details

Note that for {emmeans} inputs the results is a proper grid (all combinations of values are represented), except when a nesting structure is detected. Additionally, when the input is an emm_list object, the function will rbind() the data-grids of all the elements in the input.

For {marginaleffects} inputs, the output may very well be a non-grid result. See examples.

Value

A data. frame with key columns that identify the rows in x.

Examples

```
data("mtcars")
mtcars$cyl <- factor(mtcars$cyl)

mod <- glm(am ~ cyl + hp + wt,
    family = binomial("logit"),
    data = mtcars
)

em1 <- emmeans::emmeans(mod, ~ cyl + hp, at = list(hp = c(100, 150)))
get_datagrid(em1)

contr1 <- emmeans::contrast(em1, method = "consec", by = "hp")
get_datagrid(contr1)

em11 <- emmeans::emmeans(mod, pairwise ~ cyl | hp, at = list(hp = c(100, 150)))</pre>
```

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```
get_datagrid(eml1) # not a "true" grid

mfx1 <- marginaleffects::slopes(mod, variables = "hp")
get_datagrid(mfx1) # not a "true" grid

mfx2 <- marginaleffects::slopes(mod, variables = c("hp", "wt"), by = "am")
get_datagrid(mfx2)

contr2 <- marginaleffects::avg_comparisons(mod)
get_datagrid(contr2) # not a "true" grid</pre>
```

get_deviance

Model Deviance

Description

Returns model deviance (see stats::deviance()).

Usage

```
get_deviance(x, ...)
## Default S3 method:
get_deviance(x, verbose = TRUE, ...)
```

Arguments

x A model.... Not used.

verbose Toggle warnings and messages.

Details

For GLMMs of class glmerMod, glmmTMB or MixMod, the *absolute unconditional* deviance is returned (see 'Details' in ?lme4::merMod-class), i.e. minus twice the log-likelihood. To get the *relative conditional* deviance (relative to a saturated model, conditioned on the conditional modes of random effects), use deviance(). The value returned get_deviance() usually equals the deviance-value from the summary().

Value

The model deviance.

Examples

```
data(mtcars)
x <- lm(mpg ~ cyl, data = mtcars)
get_deviance(x)</pre>
```

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get_df

Extract degrees of freedom

Description

Estimate or extract residual or model-based degrees of freedom from regression models.

Usage

```
get_df(x, ...)
## Default S3 method:
get_df(x, type = "residual", verbose = TRUE, ...)
```

Arguments

A statistical model.

... Currently not used.

type

Type of approximation for the degrees of freedom. Can be one of the following:

- "residual" (aka "analytical") returns the residual degrees of freedom, which usually is what stats::df.residual() returns. If a model object has no method to extract residual degrees of freedom, these are calculated as n-p, i.e. the number of observations minus the number of estimated parameters. If residual degrees of freedom cannot be extracted by either approach, returns Inf.
- "wald" returns residual (aka analytical) degrees of freedom for models with t-statistic, 1 for models with Chi-squared statistic, and Inf for all other models. Also returns Inf if residual degrees of freedom cannot be extracted.
- "normal" always returns Inf.
- "model" returns model-based degrees of freedom, i.e. the number of (estimated) parameters.
- For mixed models, can also be "ml1" (or "m-l-1", approximation of degrees of freedom based on a "m-l-1" heuristic as suggested by *Elff et al.* 2019) or "between-within" (or "betwithin").
- For mixed models of class merMod, type can also be "satterthwaite" or "kenward-roger" (or "kenward"). See 'Details'.

Usually, when degrees of freedom are required to calculate p-values or confidence intervals, type = "wald" is likely to be the best choice in most cases.

verbose

Toggle warnings.

get_df

Details

Degrees of freedom for mixed models

Inferential statistics (like p-values, confidence intervals and standard errors) may be biased in mixed models when the number of clusters is small (even if the sample size of level-1 units is high). In such cases it is recommended to approximate a more accurate number of degrees of freedom for such inferential statistics (see *Li and Redden 2015*).

m-l-1 degrees of freedom

The *m-l-1* heuristic is an approach that uses a t-distribution with fewer degrees of freedom. In particular for repeated measure designs (longitudinal data analysis), the m-l-1 heuristic is likely to be more accurate than simply using the residual or infinite degrees of freedom, because get_df(type = "ml1") returns different degrees of freedom for within-cluster and between-cluster effects. Note that the "m-l-1" heuristic is not applicable (or at least less accurate) for complex multilevel designs, e.g. with cross-classified clusters. In such cases, more accurate approaches like the Kenward-Roger approximation is recommended. However, the "m-l-1" heuristic also applies to generalized mixed models, while approaches like Kenward-Roger or Satterthwaite are limited to linear mixed models only.

Between-within degrees of freedom

The Between-within denominator degrees of freedom approximation is, similar to the "m-l-1" heuristic, recommended in particular for (generalized) linear mixed models with repeated measurements (longitudinal design). get_df(type = "betwithin") implements a heuristic based on the between-within approach, i.e. this type returns different degrees of freedom for within-cluster and between-cluster effects. Note that this implementation does not return exactly the same results as shown in *Li and Redden 2015*, but similar.

Satterthwaite and Kenward-Rogers degrees of freedom

Unlike simpler approximation heuristics like the "m-l-1" rule (type = "ml1"), the Satterthwaite or Kenward-Rogers approximation is also applicable in more complex multilevel designs. However, the "m-l-1" or "between-within" heuristics also apply to generalized mixed models, while approaches like Kenward-Roger or Satterthwaite are limited to linear mixed models only.

References

- Kenward, M. G., & Roger, J. H. (1997). Small sample inference for fixed effects from restricted maximum likelihood. Biometrics, 983-997.
- Satterthwaite FE (1946) An approximate distribution of estimates of variance components. Biometrics Bulletin 2 (6):110–4.
- Elff, M.; Heisig, J.P.; Schaeffer, M.; Shikano, S. (2019). Multilevel Analysis with Few Clusters: Improving Likelihood-based Methods to Provide Unbiased Estimates and Accurate Inference. British Journal of Political Science.
- Li, P., Redden, D. T. (2015). Comparing denominator degrees of freedom approximations for the generalized linear mixed model in analyzing binary outcome in small sample cluster-randomized trials. BMC Medical Research Methodology, 15(1), 38

Examples

```
model <- lm(Sepal.Length ~ Petal.Length * Species, data = iris)</pre>
```

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```
get_df(model) # same as df.residual(model)
get_df(model, type = "model") # same as attr(logLik(model), "df")
```

get_family

A robust alternative to stats::family

Description

A robust and resilient alternative to stats::family. To avoid issues with models like gamm4.

Usage

```
get_family(x, ...)
```

Arguments

x A statistical model.

... Further arguments passed to methods.

Examples

```
data(mtcars)
x <- glm(vs ~ wt, data = mtcars, family = "binomial")
get_family(x)

x <- mgcv::gamm(
   vs ~ am + s(wt),
   random = list(cyl = ~1),
   data = mtcars,
   family = "binomial"
)
get_family(x)</pre>
```

get_intercept

Get the value at the intercept

Description

Returns the value at the intercept (i.e., the intercept parameter), and NA if there isn't one.

```
get_intercept(x, ...)
```

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Arguments

```
x A model.... Not used.
```

Value

The value of the intercept.

Examples

```
get_intercept(lm(Sepal.Length ~ Petal.Width, data = iris))
get_intercept(lm(Sepal.Length ~ 0 + Petal.Width, data = iris))
get_intercept(lme4::lmer(Sepal.Length ~ Sepal.Width + (1 | Species), data = iris))
get_intercept(gamm4::gamm4(Sepal.Length ~ s(Petal.Width), data = iris))
```

get_loglikelihood

Log-Likelihood and Log-Likelihood correction

Description

A robust function to compute the log-likelihood of a model, as well as individual log-likelihoods (for each observation) whenever possible. Can be used as a replacement for stats::logLik() out of the box, as the returned object is of the same class (and it gives the same results by default).

get_loglikelihood_adjustment() can be used to correct the log-likelihood for models with transformed response variables. The adjustment value can be added to the log-likelihood to get the corrected value. This is done automatically in get_loglikelihood() if check_response = TRUE.

```
get_loglikelihood(x, ...)
loglikelihood(x, ...)
get_loglikelihood_adjustment(x)
## S3 method for class 'lm'
get_loglikelihood(
    x,
    estimator = "ML",
    REML = FALSE,
    check_response = FALSE,
```

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```
verbose = TRUE,
...
)
```

Arguments

x A model.

... Passed down to logLik(), if possible.

estimator Corresponds to the different estimators for the standard deviation of the errors. If

estimator="ML" (default), the scaling is done by n (the biased ML estimator), which is then equivalent to using stats::logLik(). If estimator="OLS", it returns the unbiased OLS estimator. estimator="REML" will give same results

as logLik(..., REML=TRUE).

REML Only for linear models. This argument is present for compatibility with stats::logLik().

Setting it to TRUE will overwrite the estimator argument and is thus equivalent to setting estimator="REML". It will give the same results as stats::logLik(..., REML=TRUE). Note that individual log-likelihoods are not available under REML.

check_response Logical, if TRUE, checks if the response variable is transformed (like log() or

sqrt()), and if so, returns a corrected log-likelihood. To get back to the original scale, the likelihood of the model is multiplied by the Jacobian/derivative of the

transformation.

verbose Toggle warnings and messages.

Value

get_loglikelihood() returns an object of class "logLik", also containing the log-likelihoods for each observation as a per_observation attribute (attributes(get_loglikelihood(x))\$per_observation) when possible. The code was partly inspired from the **nonnest2** package.

get_loglikelihood_adjustment() returns the adjustment value to be added to the log-likelihood
to correct for transformed response variables, or NULL if the adjustment could not be computed.

Examples

```
x <- lm(Sepal.Length ~ Petal.Width + Species, data = iris)

get_loglikelihood(x, estimator = "ML") # Equivalent to stats::logLik(x)
get_loglikelihood(x, estimator = "REML") # Equivalent to stats::logLik(x, REML=TRUE)
get_loglikelihood(x, estimator = "OLS")</pre>
```

get_model

Get a model objects that is saved as attribute

Description

This functions tries to get a model object from the object x, where the model object is saved as an (arbitrarily named) attribute. This is useful for example, when a model is fitted and saved as an attribute of a data frame.

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Usage

```
get_model(x, name = "model", element = NULL, ...)
```

Arguments

x An object that contains a model object as an attribute. This could be a data frame

or any other object that has an attribute containing the model.

name The name of the attribute that contains the model object. Defaults to "model".

element String or character vector. If provided, this argument allows you to specify

which element(s) of the model object to return. This can be useful if the model object is a list or has multiple components, and you only want to extract a spe-

cific part.

... Not used.

Value

The object that is stored as an attribute of x with the name name, or the specific element of that object if element is provided. If the attribute or element does not exist, an error is raised.

Examples

```
# Example of using get_model
d <- data.frame(x = rnorm(100), y = rnorm(100))
# fit a model and save it as an attribute
model <- lm(y ~ x, data = d)
attr(d, "model") <- model
# get the model back
get_model(d)
# get the coefficients of the model
get_model(d, element = "coefficients")</pre>
```

get_modelmatrix

Model Matrix

Description

Creates a design matrix from the description. Any character variables are coerced to factors.

Usage

```
get_modelmatrix(x, ...)
```

Arguments

x An object.

... Passed down to other methods (mainly model.matrix()).

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Examples

```
data(mtcars)
model <- lm(am ~ vs, data = mtcars)
get_modelmatrix(model)</pre>
```

get_parameters

Get model parameters

Description

Returns the coefficients (or posterior samples for Bayesian models) from a model. See the documentation for your object's class:

- Bayesian models (rstanarm, brms, MCMCglmm, ...)
- Estimated marginal means (emmeans)
- Generalized additive models (mgcv, VGAM, ...)
- Marginal effects models (mfx)
- Mixed models (lme4, glmmTMB, GLMMadaptive, ...)
- Zero-inflated and hurdle models (pscl, ...)
- Models with special components (betareg, MuMIn, ...)
- Hypothesis tests (htest)

Usage

```
get_parameters(x, ...)
## Default S3 method:
get_parameters(x, verbose = TRUE, ...)
```

Arguments

x A fitted model.... Currently not used.

verbose Toggle messages and warnings.

Details

In most cases when models either return different "effects" (fixed, random) or "components" (conditional, zero-inflated, ...), the arguments effects and component can be used.

get_parameters() is comparable to coef(), however, the coefficients are returned as data frame (with columns for names and point estimates of coefficients). For Bayesian models, the posterior samples of parameters are returned.

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Value

 for non-Bayesian models, a data frame with two columns: the parameter names and the related point estimates.

• for Anova (aov()) with error term, a list of parameters for the conditional and the random effects parameters

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the
 model. Will only have an effect for models with more than just the conditional model component
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects - depending on the effects argument - but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

- mhurdle: "infrequent_purchase", "ip", and "auxiliary"
- BGGM: "correlation" and "intercept"
- BFBayesFactor, glmx: "extra"
- averaging: "conditional" and "full"
- mjoint: "survival"
- mfx: "precision", "marginal"
- betareg, DirichletRegModel: "precision"
- mvord: "thresholds" and "correlation"

get_parameters.betamfx

- clm2: "scale"
- selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_parameters(m)</pre>
```

get_parameters.betamfx

Get model parameters from marginal effects models

Description

Returns the coefficients from a model.

Usage

```
## S3 method for class 'betamfx'
get_parameters(x, component = "all", ...)
```

Arguments

Х

A fitted model.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

... Currently not used.

Value

A data frame with three columns: the parameter names, the related point estimates and the component

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the
 model. Will only have an effect for models with more than just the conditional model component
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

- mhurdle: "infrequent_purchase", "ip", and "auxiliary"
- BGGM: "correlation" and "intercept"
- BFBayesFactor, glmx: "extra"
- averaging: "conditional" and "full"
- mjoint: "survival"
- mfx: "precision", "marginal"
- betareg, DirichletRegModel: "precision"
- mvord: "thresholds" and "correlation"
- clm2: "scale"

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```
• selection: "selection", "outcome", and "auxiliary"
```

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_parameters(m)</pre>
```

get_parameters.betareg

Get model parameters from models with special components

Description

Returns the coefficients from a model.

Usage

```
## S3 method for class 'betareg'
get_parameters(x, component = "all", ...)
```

Arguments

Х

A fitted model.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

... Currently not used.

Value

A data frame with three columns: the parameter names, the related point estimates and the component

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the
 model. Will only have an effect for models with more than just the conditional model component
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

- mhurdle: "infrequent_purchase", "ip", and "auxiliary"
- BGGM: "correlation" and "intercept"
- BFBayesFactor, glmx: "extra"
- averaging: "conditional" and "full"
- mjoint: "survival"
- mfx: "precision", "marginal"
- betareg, DirichletRegModel: "precision"
- mvord: "thresholds" and "correlation"
- clm2: "scale"

get_parameters.BGGM

• **selection**: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data("GasolineYield", package = "betareg")
m <- betareg::betareg(yield ~ batch + temp, data = GasolineYield)
get_parameters(m)
get_parameters(m, component = "precision")</pre>
```

get_parameters.BGGM

Get model parameters from Bayesian models

Description

Returns the coefficients (or posterior samples for Bayesian models) from a model.

```
## S3 method for class 'BGGM'
get_parameters(
  component = "correlation",
  summary = FALSE,
 centrality = "mean",
)
## S3 method for class 'BFBayesFactor'
get_parameters(
 effects = "all",
 component = "all",
  iterations = 4000,
  progress = FALSE,
  verbose = TRUE,
  summary = FALSE,
  centrality = "mean",
)
## S3 method for class 'brmsfit'
get_parameters(
 х,
```

```
effects = "fixed",
  component = "all",
  parameters = NULL,
  summary = FALSE,
  centrality = "mean",
   ...
)
```

Arguments

Χ

A fitted model.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

summary

Logical, indicates whether the full posterior samples (summary = FALSE)) or the summarized centrality indices of the posterior samples (summary = TRUE)) should be returned as estimates.

centrality

Only for models with posterior samples, and when summary = TRUE. In this case, centrality = "mean" would calculate means of posterior samples for each parameter, while centrality = "median" would use the more robust median value as measure of central tendency.

. . .

Currently only used for models of class brmsfit, where a variable argument can be used, which is directly passed to the as.data.frame() method (i.e., as.data.frame(x, variable = variable)).

effects

Should variables for fixed effects ("fixed"), random effects ("random") or both ("all") be returned? Only applies to mixed models. May be abbreviated.

For models of from packages **brms** or **rstanarm** there are additional options:

- "fixed" returns fixed effects.
- "random_variance" return random effects parameters (variance and correlation components, e.g. those parameters that start with sd_ or cor_).
- "grouplevel" returns random effects group level estimates, i.e. those parameters that start with r_.

• "random" returns both "random_variance" and "grouplevel".

• "all" returns fixed effects and random effects variances.

• "full" returns all parameters.

iterations Number of posterior draws.

progress Display progress.

verbose Toggle messages and warnings.

parameters Regular expression pattern that describes the parameters that should be returned.

Details

In most cases when models either return different "effects" (fixed, random) or "components" (conditional, zero-inflated, ...), the arguments effects and component can be used.

Value

The posterior samples from the requested parameters as data frame. If summary = TRUE, returns a data frame with two columns: the parameter names and the related point estimates (based on centrality).

BFBayesFactor Models

Note that for BFBayesFactor models (from the **BayesFactor** package), posteriors are only extracted from the first numerator model (i.e., model[1]). If you want to apply some function foo() to another model stored in the BFBayesFactor object, index it directly, e.g. foo(model[2]), foo(1/model[5]), etc. See also bayestestR::weighted_posteriors().

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the
 model. Will only have an effect for models with more than just the conditional model component.
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.

- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects - depending on the effects argument - but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

```
    mhurdle: "infrequent_purchase", "ip", and "auxiliary"
    BGGM: "correlation" and "intercept"
```

```
• BFBayesFactor, glmx: "extra"
```

```
• averaging: "conditional" and "full"
```

```
• mjoint: "survival"
```

```
• mfx: "precision", "marginal"
```

• betareg, DirichletRegModel: "precision"

```
• mvord: "thresholds" and "correlation"
```

• clm2: "scale"

• selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_parameters(m)</pre>
```

```
get_parameters.emmGrid
```

Get model parameters from estimated marginal means objects

Description

Returns the coefficients from a model.

```
## S3 method for class 'emmGrid'
get_parameters(x, summary = FALSE, merge_parameters = FALSE, ...)
```

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Arguments

x A fitted model.

summary Logical, indicates whether the full posterior samples (summary = FALSE)) or

the summarized centrality indices of the posterior samples (summary = TRUE))

should be returned as estimates.

merge_parameters

Logical, if TRUE and x has multiple columns for parameter names (like emmGrid objects may have), these are merged into a single parameter column, with pa-

rameters names and values as values.

... Currently not used.

Value

A data frame with two columns: the parameter names and the related point estimates.

Note

Note that emmGrid or emm_list objects returned by functions from **emmeans** have a different structure compared to usual regression models. Hence, the Parameter column does not always contain names of *variables*, but may rather contain *values*, e.g. for contrasts. See an example for pairwise comparisons below.

Examples

```
data(mtcars)
model <- lm(mpg ~ wt * factor(cyl), data = mtcars)
emm <- emmeans(model, "cyl")
get_parameters(emm)
emm <- emmeans(model, pairwise ~ cyl)
get_parameters(emm)</pre>
```

get_parameters.gamm

Get model parameters from generalized additive models

Description

Returns the coefficients from a model.

```
## S3 method for class 'gamm'
get_parameters(x, component = "all", ...)
```

Arguments

Χ

A fitted model.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

• • •

Currently not used.

Value

For models with smooth terms or zero-inflation component, a data frame with three columns: the parameter names, the related point estimates and the component.

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the model. Will only have an effect for models with more than just the conditional model component.
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.

- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

```
• mhurdle: "infrequent_purchase", "ip", and "auxiliary"
```

```
• BGGM: "correlation" and "intercept"
```

```
• BFBayesFactor, glmx: "extra"
```

```
• averaging: "conditional" and "full"
```

```
• mjoint: "survival"
```

```
• mfx: "precision", "marginal"
```

• betareg, DirichletRegModel: "precision"

```
• mvord: "thresholds" and "correlation"
```

• clm2: "scale"

• selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_parameters(m)</pre>
```

```
get_parameters.glmmTMB
```

Get model parameters from mixed models

Description

Returns the coefficients from a model.

```
## S3 method for class 'glmmTMB'
get_parameters(x, effects = "fixed", component = "all", ...)
```

Arguments

X

A fitted model.

effects

Should variables for fixed effects ("fixed"), random effects ("random") or both ("all") be returned? Only applies to mixed models. May be abbreviated.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

... Currently not used.

Details

In most cases when models either return different "effects" (fixed, random) or "components" (conditional, zero-inflated, ...), the arguments effects and component can be used. See details in the section *Model Components*.

Value

If effects = "fixed", a data frame with two columns: the parameter names and the related point estimates. If effects = "random", a list of data frames with the random effects (as returned by ranef()), unless the random effects have the same simplified structure as fixed effects (e.g. for models from **MCMCglmm**).

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the model. Will only have an effect for models with more than just the conditional model component.

- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

```
mhurdle: "infrequent_purchase", "ip", and "auxiliary"
BGGM: "correlation" and "intercept"
BFBayesFactor, glmx: "extra"
averaging: "conditional" and "full"
mjoint: "survival"
mfx: "precision", "marginal"
betareg, DirichletRegModel: "precision"
mvord: "thresholds" and "correlation"
clm2: "scale"
selection: "selection", "outcome", and "auxiliary"
```

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data(Salamanders, package = "glmmTMB")
m <- glmmTMB::glmmTMB(
   count ~ mined + (1 | site),
   ziformula = ~mined,
   family = poisson(),
   data = Salamanders
)
get_parameters(m)</pre>
```

get_parameters.htest Get model parameters from htest-objects

Description

Returns the parameters from a hypothesis test.

Usage

```
## S3 method for class 'htest'
get_parameters(x, ...)
```

Arguments

x A fitted model.

... Currently not used.

Value

A data frame with two columns: the parameter names and the related point estimates.

Examples

```
get_parameters(t.test(1:10, y = c(7:20)))
```

```
get_parameters.zeroinfl
```

Get model parameters from zero-inflated and hurdle models

Description

Returns the coefficients from a model.

```
## S3 method for class 'zeroinfl'
get_parameters(x, component = "all", ...)
```

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Arguments

x A fitted model.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

... Currently not used.

Value

For models with smooth terms or zero-inflation component, a data frame with three columns: the parameter names, the related point estimates and the component.

Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the model. Will only have an effect for models with more than just the conditional model component.
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.

"correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.

- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

```
• mhurdle: "infrequent_purchase", "ip", and "auxiliary"
```

```
• BGGM: "correlation" and "intercept"
```

```
• BFBayesFactor, glmx: "extra"
```

```
• averaging: "conditional" and "full"
```

```
• mjoint: "survival"
```

```
• mfx: "precision", "marginal"
```

• betareg, DirichletRegModel: "precision"

```
• mvord: "thresholds" and "correlation"
```

• clm2: "scale"

• selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_parameters(m)</pre>
```

get_predicted

Model predictions (robust) and their confidence intervals

Description

The get_predicted() function is a robust, flexible and user-friendly alternative to base R predict() function. Additional features and advantages include availability of uncertainty intervals (CI), bootstrapping, a more intuitive API and the support of more models than base R's predict() function. However, although the interface are simplified, it is still very important to read the documentation of the arguments. This is because making "predictions" (a lose term for a variety of things) is a non-trivial process, with lots of caveats and complications. Read the 'Details' section for more information.

get_predicted_ci() returns the confidence (or prediction) interval (CI) associated with predictions made by a model. This function can be called separately on a vector of predicted values. get_predicted() usually returns confidence intervals (included as attribute, and accessible via the as.data.frame() method) by default. It is preferred to rely on the get_predicted() function for standard errors and confidence intervals - use get_predicted_ci() only if standard errors and confidence intervals are not available otherwise.

Usage

```
get_predicted(x, ...)
## Default S3 method:
get_predicted(
 х,
  data = NULL,
  predict = "expectation",
  ci = NULL,
  ci_type = "confidence",
  ci_method = NULL,
  dispersion_method = "sd",
  vcov = NULL,
  vcov_args = NULL,
  verbose = TRUE,
)
## S3 method for class 'lm'
get_predicted(
  Х,
  data = NULL,
 predict = "expectation",
  ci = NULL,
  iterations = NULL,
  verbose = TRUE,
)
## S3 method for class 'stanreg'
get_predicted(
  Х,
  data = NULL,
  predict = "expectation",
  iterations = NULL,
  ci = NULL,
  ci_method = NULL,
  include_random = "default",
  include_smooth = TRUE,
  verbose = TRUE,
```

```
)
## S3 method for class 'gam'
get_predicted(
 х,
 data = NULL,
 predict = "expectation",
  ci = NULL,
  include_random = TRUE,
  include_smooth = TRUE,
  iterations = NULL,
  verbose = TRUE,
)
## S3 method for class 'lmerMod'
get_predicted(
 Χ,
 data = NULL,
 predict = "expectation",
  ci = NULL,
  ci_method = NULL,
  include_random = "default",
  iterations = NULL,
  verbose = TRUE,
)
## S3 method for class 'principal'
get_predicted(x, data = NULL, ...)
```

Arguments

data

x A statistical model (can also be a data.frame, in which case the second argument has to be a model).

Other argument to be passed, for instance to the model's predict() method, or get_predicted_ci().

An optional data frame in which to look for variables with which to predict. If omitted, the data used to fit the model is used. Visualization matrices can be generated using get_datagrid().

predict string or NULL

- "link" returns predictions on the model's link-scale (for logistic models, that means the log-odds scale) with a confidence interval (CI). This option should also be used for finite mixture models (currently only family brms::mixture() from package brms), when predicted values of the response for each class is required.
- "expectation" (default) also returns confidence intervals, but this time the

output is on the response scale (for logistic models, that means probabilities).

- "prediction" also gives an output on the response scale, but this time associated with a prediction interval (PI), which is larger than a confidence interval (though it mostly make sense for linear models).
- "classification" is relevant only for binomial, ordinal or mixture models.
 - For binomial models, predict = "classification" will additionally transform the predictions into the original response's type (for instance, to a factor).
 - For ordinal models (e.g., classes clm or multinom), gives the predicted response class membership, defined as highest probability prediction.
 - For finite mixture models (currently only family brms::mixture() from package brms) also returns the predicted response class membership (similar as for ordinal models).
- Other strings are passed directly to the type argument of the predict() method supplied by the modelling package.
- Specifically for models of class brmsfit (package *brms*), the predict argument can be any valid option for the dpar argument, to predict distributional parameters (such as "sigma", "beta", "kappa", "phi" and so on, see ?brms::brmsfamily).
- When predict = NULL, alternative arguments such as type will be captured by the ... ellipsis and passed directly to the predict() method supplied by the modelling package. Note that this might result in conflicts with multiple matching type arguments thus, the recommendation is to use the predict argument for those values.
- Notes: You can see the four options for predictions as on a gradient from "close to the model" to "close to the response data": "link", "expectation", "prediction", "classification". The predict argument modulates two things: the scale of the output and the type of certainty interval. Read more about in the **Details** section below.

The interval level. Default is NULL, to be fast even for larger models. Set the interval level to an explicit value, e.g. 0.95, for 95% CI).

Can be "prediction" or "confidence". Prediction intervals show the range that likely contains the value of a new observation (in what range it would fall), whereas confidence intervals reflect the uncertainty around the estimated parameters (and gives the range of the link; for instance of the regression line in a linear regressions). Prediction intervals account for both the uncertainty in the model's parameters, plus the random variation of the individual values. Thus, prediction intervals are always wider than confidence intervals. Moreover, prediction intervals will not necessarily become narrower as the sample size increases (as they do not reflect only the quality of the fit). This applies mostly for "simple" linear models (like lm), as for other models (e.g., glm), prediction intervals are somewhat useless (for instance, for a binomial model for which the dependent variable is a vector of 1s and 0s, the prediction interval is... [0, 1]).

The method for computing p values and confidence intervals. Possible values depend on model type.

сi

ci_type

ci_method

- NULL uses the default method, which varies based on the model type.
- Most frequentist models: "wald" (default), "residual" or "normal".
- Bayesian models: "quantile" (default), "hdi", "eti", and "spi".
- Mixed effects **lme4** models: "wald" (default), "residual", "normal", "satterthwaite", and "kenward-roger".

See get_df() for details.

dispersion_method

Bootstrap dispersion and Bayesian posterior summary: "sd" or "mad".

vcov

Variance-covariance matrix used to compute uncertainty estimates (e.g., for robust standard errors). This argument accepts a covariance matrix, a function which returns a covariance matrix, or a string which identifies the function to be used to compute the covariance matrix.

- A covariance matrix
- A function which returns a covariance matrix (e.g., stats::vcov())
- A string which indicates the kind of uncertainty estimates to return.
 - Heteroskedasticity-consistent: "HC", "HC0", "HC1", "HC2", "HC3", "HC4", "HC4m", "HC5". See ?sandwich::vcovHC
 - Cluster-robust: "CR", "CR0", "CR1", "CR1p", "CR1S", "CR2", "CR3". See ?clubSandwich::vcovCR
 - Bootstrap: "BS", "xy", "residual", "wild", "mammen", "fractional", "jackknife", "norm", "webb". See ?sandwich::vcovBS
 - Other sandwich package functions: "HAC", "PC", "CL", "OPG", "PL".
 - Kenward-Roger approximation: kenward-roger. See ?pbkrtest::vcovAdj.

One exception are models of class glmgee, which have pre-defined options for the variance-covariance matrix calculation. These are "robust", "df-adjusted", "model", "bias-corrected", and "jackknife". See ?glmtoolbox::vcov.glmgee for details.

vcov_args

List of arguments to be passed to the function identified by the vcov argument. This function is typically supplied by the **sandwich** or **clubSandwich** packages. Please refer to their documentation (e.g., ?sandwich::vcovHAC) to see the list of available arguments. If no estimation type (argument type) is given, the default type for "HC" equals the default from the sandwich package; for type "CR", the default is set to "CR3".

verbose

Toggle warnings.

iterations

For Bayesian models, this corresponds to the number of posterior draws. If NULL, will return all the draws (one for each iteration of the model). For frequentist models, if not NULL, will generate bootstrapped draws, from which bootstrapped CIs will be computed. Iterations can be accessed by running as.data.frame(..., keep_iterations = TRUE) on the output.

include_random If "default", include all random effects in the prediction, unless random effect variables are not in the data. If TRUE, include all random effects in the prediction (in this case, it will be checked if actually all random effect variables are in data). If FALSE, don't take them into account. Can also be a formula to specify which random effects to condition on when predicting (passed to the re.form argument). If include_random = TRUE and data is provided, make sure to include the random effect variables in data as well.

include_smooth For General Additive Models (GAMs). If FALSE, will fix the value of the smooth to its average, so that the predictions are not depending on it. (default), mean(), or bayestestR::map_estimate().

Details

In insight::get_predicted(), the predict argument jointly modulates two separate concepts, the **scale** and the **uncertainty interval**.

Value

The fitted values (i.e. predictions for the response). For Bayesian or bootstrapped models (when iterations!= NULL), iterations (as columns and observations are rows) can be accessed via as.data.frame().

Confidence Interval (CI) vs. Prediction Interval (PI))

- Linear models lm(): For linear models, prediction intervals (predict="prediction") show the range that likely contains the value of a new observation (in what range it is likely to fall), whereas confidence intervals (predict="expectation" or predict="link") reflect the uncertainty around the estimated parameters (and gives the range of uncertainty of the regression line). In general, Prediction Intervals (PIs) account for both the uncertainty in the model's parameters, plus the random variation of the individual values. Thus, prediction intervals are always wider than confidence intervals. Moreover, prediction intervals will not necessarily become narrower as the sample size increases (as they do not reflect only the quality of the fit, but also the variability within the data).
- Generalized Linear models glm(): For binomial models, prediction intervals are somewhat useless (for instance, for a binomial (Bernoulli) model for which the dependent variable is a vector of 1s and 0s, the prediction interval is... [0, 1]).

Link scale vs. Response scale

When users set the predict argument to "expectation", the predictions are returned on the response scale, which is arguably the most convenient way to understand and visualize relationships of interest. When users set the predict argument to "link", predictions are returned on the link scale, and no transformation is applied. For instance, for a logistic regression model, the response scale corresponds to the predicted probabilities, whereas the link-scale makes predictions of log-odds (probabilities on the logit scale). Note that when users select predict = "classification" in binomial models, the get_predicted() function will first calculate predictions as if the user had selected predict = "expectation". Then, it will round the responses in order to return the most likely outcome. For ordinal or mixture models, it returns the predicted class membership, based on the highest probability of classification.

Heteroscedasticity consistent standard errors

The arguments vcov and vcov_args can be used to calculate robust standard errors for confidence intervals of predictions. These arguments, when provided in get_predicted(), are passed down to get_predicted_ci(), thus, see the related documentation there for more details.

Finite mixture models

For finite mixture models (currently, only the mixture() family from package *brms* is supported), use predict = "classification" to predict the class membership. To predict outcome values by class, use predict = "link". Other predict options will return predicted values of the outcome for the full data, not stratified by class membership.

Bayesian and Bootstrapped models and iterations

For predictions based on multiple iterations, for instance in the case of Bayesian models and bootstrapped predictions, the function used to compute the centrality (point-estimate predictions) can be modified via the centrality_function argument. For instance, get_predicted(model, centrality_function = stats::median). The default is mean. Individual draws can be accessed by running iter <- as.data.frame(get_predicted(model)), and their iterations can be reshaped into a long format by bayestestR::reshape_iterations(iter).

See Also

```
get_datagrid()
```

```
data(mtcars)
x \leftarrow lm(mpg \sim cyl + hp, data = mtcars)
predictions <- get_predicted(x, ci = 0.95)</pre>
predictions
# Options and methods -----
get_predicted(x, predict = "prediction")
# Get CI
as.data.frame(predictions)
# Bootstrapped
as.data.frame(get_predicted(x, iterations = 4))
# Same as as.data.frame(..., keep_iterations = FALSE)
summary(get_predicted(x, iterations = 4))
# Different prediction types -----
data(iris)
data <- droplevels(iris[1:100, ])</pre>
# Fit a logistic model
x <- glm(Species ~ Sepal.Length, data = data, family = "binomial")</pre>
# Expectation (default): response scale + CI
pred <- get_predicted(x, predict = "expectation", ci = 0.95)</pre>
head(as.data.frame(pred))
# Prediction: response scale + PI
pred \leftarrow get\_predicted(x, predict = "prediction", ci = 0.95)
```

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```
head(as.data.frame(pred))
# Link: link scale + CI
pred <- get_predicted(x, predict = "link", ci = 0.95)
head(as.data.frame(pred))
# Classification: classification "type" + PI
pred <- get_predicted(x, predict = "classification", ci = 0.95)
head(as.data.frame(pred))</pre>
```

get_predicted_ci

Confidence intervals around predicted values

Description

Confidence intervals around predicted values

Usage

```
get_predicted_ci(x, ...)
## Default S3 method:
get_predicted_ci(
    x,
    predictions = NULL,
    data = NULL,
    se = NULL,
    ci = 0.95,
    ci_type = "confidence",
    ci_method = NULL,
    dispersion_method = "sd",
    vcov = NULL,
    vcov_args = NULL,
    verbose = TRUE,
    ...
)
```

Arguments

A statistical model (can also be a data.frame, in which case the second argument has to be a model).

Other argument to be passed, for instance to the model's predict() method, or get_predicted_ci().

A vector of predicted values (as obtained by stats::fitted(), stats::predict() or get_predicted()).

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data

An optional data frame in which to look for variables with which to predict. If omitted, the data used to fit the model is used. Visualization matrices can be generated using get_datagrid().

se

Numeric vector of standard error of predicted values. If NULL, standard errors are calculated based on the variance-covariance matrix.

ci

The interval level. Default is NULL, to be fast even for larger models. Set the interval level to an explicit value, e.g. 0.95, for 95% CI).

ci_type

Can be "prediction" or "confidence". Prediction intervals show the range that likely contains the value of a new observation (in what range it would fall), whereas confidence intervals reflect the uncertainty around the estimated parameters (and gives the range of the link; for instance of the regression line in a linear regressions). Prediction intervals account for both the uncertainty in the model's parameters, plus the random variation of the individual values. Thus, prediction intervals are always wider than confidence intervals. Moreover, prediction intervals will not necessarily become narrower as the sample size increases (as they do not reflect only the quality of the fit). This applies mostly for "simple" linear models (like 1m), as for other models (e.g., g1m), prediction intervals are somewhat useless (for instance, for a binomial model for which the dependent variable is a vector of 1s and 0s, the prediction interval is... [0, 1]).

ci_method

The method for computing p values and confidence intervals. Possible values depend on model type.

- NULL uses the default method, which varies based on the model type.
- Most frequentist models: "wald" (default), "residual" or "normal".
- Bayesian models: "quantile" (default), "hdi", "eti", and "spi".
- Mixed effects **lme4** models: "wald" (default), "residual", "normal", "satterthwaite", and "kenward-roger".

See get_df() for details.

dispersion_method

Bootstrap dispersion and Bayesian posterior summary: "sd" or "mad".

vcov

Variance-covariance matrix used to compute uncertainty estimates (e.g., for robust standard errors). This argument accepts a covariance matrix, a function which returns a covariance matrix, or a string which identifies the function to be used to compute the covariance matrix.

- A covariance matrix
- A function which returns a covariance matrix (e.g., stats::vcov())
- A string which indicates the kind of uncertainty estimates to return.
 - Heteroskedasticity-consistent: "HC", "HC0", "HC1", "HC2", "HC3", "HC4", "HC4m", "HC5". See ?sandwich::vcovHC
 - Cluster-robust: "CR", "CR0", "CR1", "CR1p", "CR1s", "CR2", "CR3".See ?clubSandwich::vcovCR
 - Bootstrap: "BS", "xy", "residual", "wild", "mammen", "fractional", "jackknife", "norm", "webb". See ?sandwich::vcovBS
 - Other sandwich package functions: "HAC", "PC", "CL", "OPG", "PL".
 - Kenward-Roger approximation: kenward-roger. See ?pbkrtest::vcovAdj.

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One exception are models of class glmgee, which have pre-defined options for the variance-covariance matrix calculation. These are "robust", "df-adjusted", "model", "bias-corrected", and "jackknife". See ?glmtoolbox::vcov.glmgee for details.

vcov_args

List of arguments to be passed to the function identified by the vcov argument. This function is typically supplied by the **sandwich** or **clubSandwich** packages. Please refer to their documentation (e.g., ?sandwich::vcovHAC) to see the list of available arguments. If no estimation type (argument type) is given, the default type for "HC" equals the default from the **sandwich** package; for type "CR", the default is set to "CR3".

verbose

Toggle warnings.

Details

Typically, get_predicted() returns confidence intervals based on the standard errors as returned by the predict()-function, assuming normal distribution (+/- 1.96 * SE) resp. a Student's t-distribution (if degrees of freedom are available). If predict() for a certain class does *not* return standard errors (for example, *merMod*-objects), these are calculated manually, based on following steps: matrix-multiply X by the parameter vector B to get the predictions, then extract the variance-covariance matrix V of the parameters and compute XVX' to get the variance-covariance matrix of the predictions. The square-root of the diagonal of this matrix represent the standard errors of the predictions, which are then multiplied by the critical test-statistic value (e.g., ~1.96 for normal distribution) for the confidence intervals.

If ci_type = "prediction", prediction intervals are calculated. These are wider than confidence intervals, because they also take into account the uncertainty of the model itself. Before taking the square-root of the diagonal of the variance-covariance matrix, get_predicted_ci() adds the residual variance to these values. For mixed models, get_variance_residual() is used, while get_sigma()^2 is used for non-mixed models.

It is preferred to rely on standard errors returned by get_predicted() (i.e. returned by the predict()-function), because these are more accurate than manually calculated standard errors. Use get_predicted_ci() only if standard errors are not available otherwise. An exception are Bayesian models or bootstrapped predictions, where get_predicted_ci() returns quantiles of the posterior distribution or bootstrapped samples of the predictions. These are actually accurate standard errors resp. confidence (or uncertainty) intervals.

```
# Confidence Intervals for Model Predictions
# ------

data(mtcars)

# Linear model
# ------

x <- lm(mpg ~ cyl + hp, data = mtcars)
predictions <- predict(x)
ci_vals <- get_predicted_ci(x, predictions, ci_type = "prediction")
head(ci_vals)
ci_vals <- get_predicted_ci(x, predictions, ci_type = "confidence")</pre>
```

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```
head(ci_vals)
ci_vals \leftarrow get_predicted_ci(x, predictions, ci = c(0.8, 0.9, 0.95))
head(ci_vals)
# Bootstrapped
# -----
predictions <- get_predicted(x, iterations = 500)</pre>
get_predicted_ci(x, predictions)
ci_vals <- get_predicted_ci(x, predictions, ci = c(0.80, 0.95))</pre>
head(ci_vals)
datawizard::reshape_ci(ci_vals)
ci_vals <- get_predicted_ci(x,</pre>
  predictions,
  dispersion_method = "MAD",
  ci_method = "HDI"
)
head(ci_vals)
# Logistic model
x \leftarrow glm(vs \sim wt, data = mtcars, family = "binomial")
predictions <- predict(x, type = "link")</pre>
ci_vals <- get_predicted_ci(x, predictions, ci_type = "prediction")</pre>
head(ci_vals)
ci_vals <- get_predicted_ci(x, predictions, ci_type = "confidence")</pre>
head(ci_vals)
```

get_predictors

Get the data from model predictors

Description

Returns the data from all predictor variables (fixed effects).

Usage

```
get_predictors(x, verbose = TRUE)
```

Arguments

x A fitted model.

verbose Toggle messages and warnings.

Value

The data from all predictor variables, as data frame.

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Examples

```
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
head(get_predictors(m))</pre>
```

get_priors

Get summary of priors used for a model

Description

Provides a summary of the prior distributions used for the parameters in a given model.

Usage

```
get_priors(x, ...)
## S3 method for class 'brmsfit'
get_priors(x, verbose = TRUE, ...)
```

Arguments

x A Bayesian model.... Currently not used.verbose Toggle warnings and messages.

Value

A data frame with a summary of the prior distributions used for the parameters in a given model.

```
library(rstanarm)
model <- stan_glm(Sepal.Width ~ Species * Petal.Length, data = iris)
get_priors(model)</pre>
```

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get_random

Get the data from random effects

Description

Returns the data from all random effects terms.

Usage

```
get_random(x)
```

Arguments

Х

A fitted mixed model.

Value

The data from all random effects terms, as data frame. Or NULL if model has no random effects.

Examples

```
data(sleepstudy)
# prepare some data...
sleepstudy$mygrp <- sample(1:5, size = 180, replace = TRUE)
sleepstudy$mysubgrp <- NA
for (i in 1:5) {
    filter_group <- sleepstudy$mygrp == i
    sleepstudy$mysubgrp[filter_group] <-
        sample(1:30, size = sum(filter_group), replace = TRUE)
}

m <- lmer(
    Reaction ~ Days + (1 | mygrp / mysubgrp) + (1 | Subject),
    data = sleepstudy
)
head(get_random(m))</pre>
```

get_residuals

Extract model residuals

Description

Returns the residuals from regression models.

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Usage

```
get_residuals(x, ...)
## Default S3 method:
get_residuals(x, weighted = FALSE, verbose = TRUE, ...)
```

Arguments

Х	A model.
	Passed down to residuals(), if possible.
weighted	Logical, if TRUE, returns weighted residuals.
verbose	Toggle warnings and messages.

Value

The residuals, or NULL if this information could not be accessed.

Note

This function returns the default type of residuals, i.e. for the response from linear models, the deviance residuals for models of class glm etc. To access different types, pass down the type argument (see 'Examples').

This function is a robust alternative to residuals(), as it works for some special model objects that otherwise do not respond properly to calling residuals().

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_residuals(m)

m <- glm(vs ~ wt + cyl + mpg, data = mtcars, family = binomial())
get_residuals(m) # type = "deviance" by default
get_residuals(m, type = "response")</pre>
```

get_response

Get the values from the response variable

Description

Returns the values the response variable(s) from a model object. If the model is a multivariate response model, a data frame with values from all response variables is returned.

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Usage

```
get_response(x, ...)
## Default S3 method:
get_response(
    x,
    select = NULL,
    as_proportion = TRUE,
    source = "environment",
    verbose = TRUE,
    ...
)

## S3 method for class 'nestedLogit'
get_response(x, dichotomies = FALSE, source = "environment", ...)
```

Arguments

verbose

A fitted model.

... Currently not used.

select Optional name(s) of response variables for which to extract values. Can be used

in case of regression models with multiple response variables.

as_proportion Logical, if TRUE and the response value is a proportion (e.g. y1 / y2), then the

returned response value will be a vector with the result of this proportion. Else,

always a data frame is returned.

source String, indicating from where data should be recovered. If source = "environment"

(default), data is recovered from the environment (e.g. if the data is in the workspace). This option is usually the fastest way of getting data and ensures that the original variables used for model fitting are returned. Note that always the *current* data is recovered from the environment. Hence, if the data was modified *after* model fitting (e.g., variables were recoded or rows filtered), the returned data may no longer equal the model data. If source = "frame" (or "mf"), the data is taken from the model frame. Any transformed variables are back-transformed, if possible. This option returns the data even if it is not available in the environment, however, in certain edge cases back-transforming to the original data may fail. If source = "environment" fails to recover the data, it tries to extract the data from the model frame; if source = "frame" and data cannot be extracted from the model frame, data will be recovered from the environment. Both ways only returns observations that have no missing data in the variables used for model fitting.

variables used for model fitting

Toggle warnings.

dichotomies.

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Value

The values of the response variable, as vector, or a data frame if x has more than one defined response variable.

Examples

```
data(cbpp)
cbpp$trials <- cbpp$size - cbpp$incidence
dat <<- cbpp

m <- glm(cbind(incidence, trials) ~ period, data = dat, family = binomial)
head(get_response(m))
get_response(m, select = "incidence")

data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_response(m)</pre>
```

get_sigma

Get residual standard deviation from models

Description

Returns sigma, which corresponds the estimated standard deviation of the residuals. This function extends the sigma() base R generic for models that don't have implemented it. It also computes the confidence interval (CI), which is stored as an attribute.

Sigma is a key-component of regression models, and part of the so-called auxiliary parameters that are estimated. Indeed, linear models for instance assume that the residuals comes from a normal distribution with mean 0 and standard deviation sigma. See the details section below for more information about its interpretation and calculation.

Usage

```
get_sigma(x, ci = NULL, verbose = TRUE, ...)
```

Arguments

x A model.

ci Scalar, the CI level. The default (NULL) returns no CI.

verbose Toggle messages and warnings.

... For internal use.

Value

The residual standard deviation (sigma), or NULL if this information could not be accessed.

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Interpretation of Sigma

The residual standard deviation, σ , indicates that the predicted outcome will be within +/- σ units of the linear predictor for approximately 68% of the data points (*Gelman, Hill & Vehtari 2020*, p.84). In other words, the residual standard deviation indicates the accuracy for a model to predict scores, thus it can be thought of as "a measure of the average distance each observation falls from its prediction from the model" (*Gelman, Hill & Vehtari 2020, p.168*). σ can be considered as a measure of the unexplained variation in the data, or of the precision of inferences about regression coefficients.

Calculation of Sigma

By default, get_sigma() tries to extract sigma by calling stats::sigma(). If the model-object has no sigma() method, the next step is calculating sigma as square-root of the model-deviance divided by the residual degrees of freedom. Finally, if even this approach fails, and x is a mixed model, the residual standard deviation is accessed using the square-root from get_variance_residual().

References

Gelman, A., Hill, J., & Vehtari, A. (2020). Regression and Other Stories. Cambridge University Press.

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_sigma(m)</pre>
```

get_statistic

Get statistic associated with estimates

Description

Returns the statistic (t, z, ...) for model estimates. In most cases, this is the related column from coef(summary()).

Usage

```
get_statistic(x, ...)
## Default S3 method:
get_statistic(x, column_index = 3, verbose = TRUE, ...)
## S3 method for class 'glmmTMB'
get_statistic(x, component = "all", ...)
## S3 method for class 'emmGrid'
get_statistic(x, ci = 0.95, adjust = "none", merge_parameters = FALSE, ...)
```

get_statistic 127

```
## S3 method for class 'gee'
get_statistic(x, robust = FALSE, ...)
```

Arguments

x A model.

... Currently not used.

column_index

For model objects that have no defined get_statistic() method yet, the default method is called. This method tries to extract the statistic column from coef(summary()), where the index of the column that is being pulled is column_index. Defaults to 3, which is the default statistic column for most models' summary-output.

verbose

Toggle warnings.

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

ci

Confidence Interval (CI) level. Default to 0.95 (95%). Currently only applies to objects of class emmGrid.

adjust

Character value naming the method used to adjust p-values or confidence intervals. See ?emmeans::summary.emmGrid for details.

merge_parameters

Logical, if TRUE and x has multiple columns for parameter names (like emmGrid objects may have), these are merged into a single parameter column, with parameters names and values as values.

robust

Logical, if TRUE, test statistic based on robust standard errors is returned.

Value

A data frame with the model's parameter names and the related test statistic.

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Model components

Possible values for the component argument depend on the model class. Following are valid options:

- "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.
- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the model. Will only have an effect for models with more than just the conditional model component.
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments.
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

- mhurdle: "infrequent_purchase", "ip", and "auxiliary"
- BGGM: "correlation" and "intercept"
- BFBayesFactor, glmx: "extra"
- averaging: "conditional" and "full"
- mjoint: "survival"
- mfx: "precision", "marginal"
- betareg, DirichletRegModel: "precision"
- mvord: "thresholds" and "correlation"
- clm2: "scale"
- selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

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Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_statistic(m)</pre>
```

get_transformation

Return function of transformed response variables

Description

This functions checks whether any transformation, such as log- or exp-transforming, was applied to the response variable (dependent variable) in a regression formula, and returns the related function that was used for transformation. See find_transformation() for an overview of supported transformations that are detected.

Usage

```
get_transformation(x, include_all = FALSE, verbose = TRUE)
```

Arguments

X	A regression model or a character string of the formulation of the (response) variable.
include_all	Logical, if TRUE, does not only check the response variable, but all model terms.
verbose	Logical, if TRUE, prints a warning if the transformation could not be determined.

Value

A list of two functions: \$transformation, the function that was used to transform the response variable; \$inverse, the inverse-function of \$transformation (can be used for "back-transformation"). If no transformation was applied, both list-elements \$transformation and \$inverse just return function(x) x. If transformation is unknown, NULL is returned.

```
# identity, no transformation
model <- lm(Sepal.Length ~ Species, data = iris)
get_transformation(model)

# log-transformation
model <- lm(log(Sepal.Length) ~ Species, data = iris)
get_transformation(model)

# log-function
get_transformation(model)$transformation(0.3)
log(0.3)

# inverse function is exp()</pre>
```

get_varcov

```
get_transformation(model)$inverse(0.3)
exp(0.3)

# get transformations for all model terms
model <- lm(mpg ~ log(wt) + I(gear^2) + exp(am), data = mtcars)
get_transformation(model, include_all = TRUE)</pre>
```

get_varcov

Get variance-covariance matrix from models

Description

Returns the variance-covariance, as retrieved by stats::vcov(), but works for more model objects that probably don't provide a vcov()-method.

Usage

```
get_varcov(x, ...)
## Default S3 method:
get_varcov(x, verbose = TRUE, vcov = NULL, vcov_args = NULL, ...)
## S3 method for class 'glmgee'
get_varcov(x, verbose = TRUE, vcov = "robust", ...)
## S3 method for class 'hurdle'
get_varcov(
  х,
  component = "conditional",
  vcov = NULL,
  vcov_args = NULL,
  verbose = TRUE,
)
## S3 method for class 'aov'
get_varcov(x, complete = FALSE, verbose = TRUE, ...)
## S3 method for class 'mixor'
get_varcov(x, effects = "all", verbose = TRUE, ...)
```

Arguments

```
x A model.... Currently not used.verbose Toggle warnings.
```

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vcov

Variance-covariance matrix used to compute uncertainty estimates (e.g., for robust standard errors). This argument accepts a covariance matrix, a function which returns a covariance matrix, or a string which identifies the function to be used to compute the covariance matrix.

- A covariance matrix
- A function which returns a covariance matrix (e.g., stats::vcov())
- A string which indicates the kind of uncertainty estimates to return.
 - Heteroskedasticity-consistent: "HC", "HC0", "HC1", "HC2", "HC3", "HC4", "HC4m", "HC5". See ?sandwich::vcovHC
 - Cluster-robust: "CR", "CR0", "CR1", "CR1p", "CR1S", "CR2", "CR3".
 See ?clubSandwich::vcovCR
 - Bootstrap: "BS", "xy", "residual", "wild", "mammen", "fractional", "jackknife", "norm", "webb". See ?sandwich::vcovBS
 - Other sandwich package functions: "HAC", "PC", "CL", "OPG", "PL".
 - Kenward-Roger approximation: kenward-roger. See ?pbkrtest::vcovAdj.

One exception are models of class glmgee, which have pre-defined options for the variance-covariance matrix calculation. These are "robust", "df-adjusted", "model", "bias-corrected", and "jackknife". See ?glmtoolbox::vcov.glmgee for details.

vcov_args

List of arguments to be passed to the function identified by the vcov argument. This function is typically supplied by the **sandwich** or **clubSandwich** packages. Please refer to their documentation (e.g., ?sandwich::vcovHAC) to see the list of available arguments. If no estimation type (argument type) is given, the default type for "HC" equals the default from the **sandwich** package; for type "CR", the default is set to "CR3".

component

Should the complete variance-covariance matrix of the model be returned, or only for specific model components only (like count or zero-inflated model parts)? Applies to models with zero-inflated component, or models with precision (e.g. betareg) component. component may be one of "conditional", "zi", "zero-inflated", "dispersion", "precision", or "all". May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. See section *Model components* for details.

complete

Logical, if TRUE, for aov, returns the full variance-covariance matrix.

effects

Should the complete variance-covariance matrix of the model be returned, or only for specific model parameters only? Currently only applies to models of class mixor and MixMod.

Value

The variance-covariance matrix, as matrix-object.

Model components

Possible values for the component argument depend on the model class. Following are valid options:

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• "all": returns all model components, applies to all models, but will only have an effect for models with more than just the conditional model component.

- "conditional": only returns the conditional component, i.e. "fixed effects" terms from the
 model. Will only have an effect for models with more than just the conditional model component
- "smooth_terms": returns smooth terms, only applies to GAMs (or similar models that may contain smooth terms).
- "zero_inflated" (or "zi"): returns the zero-inflation component.
- "dispersion": returns the dispersion model component. This is common for models with zero-inflation or that can model the dispersion parameter.
- "instruments": for instrumental-variable or some fixed effects regression, returns the instruments
- "nonlinear": for non-linear models (like models of class nlmerMod or nls), returns staring estimates for the nonlinear parameters.
- "correlation": for models with correlation-component, like gls, the variables used to describe the correlation structure are returned.
- "location": returns location parameters such as conditional, zero_inflated, smooth_terms, or instruments (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- "distributional" (or "auxiliary"): components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Special models

Some model classes also allow rather uncommon options. These are:

- mhurdle: "infrequent_purchase", "ip", and "auxiliary"
- BGGM: "correlation" and "intercept"
- BFBayesFactor, glmx: "extra"
- averaging: "conditional" and "full"
- mioint: "survival"
- mfx: "precision", "marginal"
- betareg, DirichletRegModel: "precision"
- mvord: "thresholds" and "correlation"
- clm2: "scale"
- selection: "selection", "outcome", and "auxiliary"

For models of class brmsfit (package **brms**), even more options are possible for the component argument, which are not all documented in detail here. It can be any pre-defined or arbitrary distributional parameter, like mu, ndt, kappa, etc.

Note

get_varcov() tries to return the nearest positive definite matrix in case of negative eigenvalues of the variance-covariance matrix. This ensures that it is still possible, for instance, to calculate standard errors of model parameters. A message is shown when the matrix is negative definite and a corrected matrix is returned.

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
get_varcov(m)
# vcov of zero-inflation component from hurdle-model
data("bioChemists", package = "pscl")
mod <- hurdle(art ~ phd + fem | ment, data = bioChemists, dist = "negbin")</pre>
get_varcov(mod, component = "zero_inflated")
# robust vcov of, count component from hurdle-model
data("bioChemists", package = "pscl")
mod <- hurdle(art ~ phd + fem | ment, data = bioChemists, dist = "negbin")</pre>
get_varcov(
  mod,
  component = "conditional",
  vcov = "BS",
  vcov_args = list(R = 50)
)
```

get_variance

Get variance components from random effects models

Description

This function extracts the different variance components of a mixed model and returns the result as list. Functions like get_variance_residual(x) or get_variance_fixed(x) are shortcuts for get_variance(x, component = "residual") etc.

Usage

```
get_variance(x, ...)
## S3 method for class 'merMod'
get_variance(
    x,
    component = "all",
    tolerance = 1e-08,
    null_model = NULL,
    approximation = "lognormal",
    verbose = TRUE,
    ...
)
## S3 method for class 'glmmTMB'
get_variance(
    x,
```

```
component = "all",
 model_component = NULL,
  tolerance = 1e-08,
  null_model = NULL,
  approximation = "lognormal",
  verbose = TRUE,
)
get_variance_residual(x, verbose = TRUE, ...)
get_variance_fixed(x, verbose = TRUE, ...)
get_variance_random(x, verbose = TRUE, tolerance = 1e-08, ...)
get_variance_distribution(x, verbose = TRUE, ...)
get_variance_dispersion(x, verbose = TRUE, ...)
get_variance_intercept(x, verbose = TRUE, ...)
get_variance_slope(x, verbose = TRUE, ...)
get_correlation_slope_intercept(x, verbose = TRUE, ...)
get_correlation_slopes(x, verbose = TRUE, ...)
```

Arguments

x A mixed effects model.

... Currently not used.

component Character value, indicating the variance component that should be returned.

By default, all variance components are returned. Valid options are "all", "fixed", "random", "residual", "distribution", "dispersion", "intercept", "slope", "rho01", and "rho00", which are equivalent to calling the dedicated

functions like get_variance_residual() etc. The distribution-specific ("distribution")

and residual ("residual") variance are the most computational intensive com-

ponents, and hence may take a few seconds to calculate.

tolerance Tolerance for singularity check of random effects, to decide whether to compute

random effect variances or not. Indicates up to which value the convergence result is accepted. The larger tolerance is, the stricter the test will be. See

performance::check_singularity().

null_model Optional, a null-model to be used for the calculation of random effect variances.

If NULL, the null-model is computed internally.

approximation Character string, indicating the approximation method for the distribution-specific

(observation level, or residual) variance. Only applies to non-Gaussian models. Can be "lognormal" (default), "delta" or "trigamma". For binomial models,

the default is the *theoretical* distribution specific variance, however, it can also be "observation_level". See *Nakagawa et al. 2017*, in particular supplement 2, for details.

verbose

Toggle off warnings.

model_component

For models that can have a zero-inflation component, specify for which component variances should be returned. If NULL or "full" (the default), both the conditional and the zero-inflation component are taken into account. If "conditional", only the conditional component is considered.

Details

This function returns different variance components from mixed models, which are needed, for instance, to calculate r-squared measures or the intraclass-correlation coefficient (ICC).

Value

A list with following elements:

- var. fixed, variance attributable to the fixed effects
- var.random, (mean) variance of random effects
- var.residual, residual variance (sum of dispersion and distribution-specific/observation level variance)
- var.distribution, distribution-specific (or observation level) variance
- · var.dispersion, variance due to additive dispersion
- var.intercept, the random-intercept-variance, or between-subject-variance (au_{00})
- var.slope, the random-slope-variance (τ_{11})
- cor.slope_intercept, the random-slope-intercept-correlation (ρ_{01})
- cor.slopes, the correlation between random slopes (ρ_{00})

Fixed effects variance

The fixed effects variance, σ_f^2 , is the variance of the matrix-multiplication $\beta * X$ (parameter vector by model matrix).

Random effects variance

The random effect variance, σ_i^2 , represents the *mean* random effect variance of the model. Since this variance reflects the "average" random effects variance for mixed models, it is also appropriate for models with more complex random effects structures, like random slopes or nested random effects. Details can be found in *Johnson 2014*, in particular equation 10. For simple random-intercept models, the random effects variance equals the random-intercept variance.

Distribution-specific (observation level) variance

The distribution-specific variance, σ_d^2 , is the conditional variance of the response given the predictors, $\forall x \in [y \mid x]$, which depends on the model family.

- Gaussian: For Gaussian models, it is σ^2 (i.e. sigma(model)^2).
- **Bernoulli:** For models with binary outcome, it is $\pi^2/3$ for logit-link, 1 for probit-link, and $\pi^2/6$ for cloglog-links.
- **Binomial:** For other binomial models, the distribution-specific variance for Bernoulli models is used, divided by a weighting factor based on the number of trials and successes.
- **Gamma:** Models from Gamma-families use μ^2 (as obtained from family\$variance()).
- For all other models, the distribution-specific variance is by default based on lognormal approximation, $log(1 + var(x)/\mu^2)$ (see *Nakagawa et al. 2017*). Other approximation methods can be specified with the approximation argument.
- **Zero-inflation models:** The expected variance of a zero-inflated model is computed according to *Zuur et al. 2012*, *p277*.

Variance for the additive overdispersion term

The variance for the additive overdispersion term, σ_e^2 , represents "the excess variation relative to what is expected from a certain distribution" (*Nakagawa et al. 2017*). In (most? many?) cases, this will be \emptyset .

Residual variance

The residual variance, σ_{ϵ}^2 , is simply $\sigma_d^2 + \sigma_e^2$. It is also called *within-subject variance*.

Random intercept variance

The random intercept variance, or *between-subject* variance (τ_{00}), is obtained from VarCorr(). It indicates how much groups or subjects differ from each other, while the residual variance σ_{ϵ}^2 indicates the *within-subject variance*.

Random slope variance

The random slope variance (τ_{11}) is obtained from VarCorr(). This measure is only available for mixed models with random slopes.

Random slope-intercept correlation

The random slope-intercept correlation (ρ_{01}) is obtained from VarCorr(). This measure is only available for mixed models with random intercepts and slopes.

Supported models and model families

This function supports models of class merMod (including models from **blme**), clmm, cpglmm, glmmadmb, glmmTMB, MixMod, lme, mixed, rlmerMod, stanreg, brmsfit or wbm. Support for objects of class MixMod (**GLMMadaptive**), lme (**nlme**) or brmsfit (**brms**) is not fully implemented or tested, and therefore may not work for all models of the aforementioned classes.

The results are validated against the solutions provided by *Nakagawa et al.* (2017), in particular examples shown in the Supplement 2 of the paper. Other model families are validated against results from the **MuMIn** package. This means that the returned variance components should be accurate and reliable for following mixed models or model families:

- Bernoulli (logistic) regression
- Binomial regression (with other than binary outcomes)
- · Poisson and Quasi-Poisson regression
- Negative binomial regression (including nbinom1, nbinom2 and nbinom12 families)
- Gaussian regression (linear models)
- · Gamma regression
- · Tweedie regression
- · Beta regression
- · Ordered beta regression

Following model families are not yet validated, but should work:

- Zero-inflated and hurdle models
- · Beta-binomial regression
- · Compound Poisson regression
- · Generalized Poisson regression
- Log-normal regression
- · Skew-normal regression

Extracting variance components for models with zero-inflation part is not straightforward, because it is not definitely clear how the distribution-specific variance should be calculated. Therefore, it is recommended to carefully inspect the results, and probably validate against other models, e.g. Bayesian models (although results may be only roughly comparable).

Log-normal regressions (e.g. lognormal() family in **glmmTMB** or gaussian("log")) often have a very low fixed effects variance (if they were calculated as suggested by *Nakagawa et al.* 2017). This results in very low ICC or r-squared values, which may not be meaningful (see performance::icc() or performance::r2_nakagawa()).

References

- Johnson, P. C. D. (2014). Extension of Nakagawa & Schielzeth's R2 GLMM to random slopes models. Methods in Ecology and Evolution, 5(9), 944–946. doi:10.1111/2041210X.12225
- Nakagawa, S., Johnson, P. C. D., & Schielzeth, H. (2017). The coefficient of determination R2 and intra-class correlation coefficient from generalized linear mixed-effects models revisited and expanded. Journal of The Royal Society Interface, 14(134), 20170213. doi:10.1098/rsif.2017.0213
- Zuur, A. F., Savel'ev, A. A., & Ieno, E. N. (2012). Zero inflated models and generalized linear mixed models with R. Newburgh, United Kingdom: Highland Statistics.

get_weights

Examples

```
library(lme4)
data(sleepstudy)
m <- lmer(Reaction ~ Days + (1 + Days | Subject), data = sleepstudy)
get_variance(m)
get_variance_fixed(m)
get_variance_residual(m)</pre>
```

get_weights

Get the values from model weights

Description

Returns weighting variable of a model.

Usage

```
get_weights(x, ...)
## Default S3 method:
get_weights(x, remove_na = FALSE, null_as_ones = FALSE, ...)
```

Arguments

x A fitted model.
 ... Currently not used.
 remove_na Logical, if TRUE, removes possible missing values.
 null_as_ones Logical, if TRUE, will return a vector of 1 if no weights were specified in the model (as if the weights were all set to 1).

Value

The weighting variable, or NULL if no weights were specified. If the weighting variable should also be returned (instead of NULL) when all weights are set to 1 (i.e. no weighting), set null_as_ones = TRUE.

```
data(mtcars)
set.seed(123)
mtcars$weight <- rnorm(nrow(mtcars), 1, .3)
# LMs</pre>
```

has_intercept 139

```
m <- lm(mpg ~ wt + cyl + vs, data = mtcars, weights = weight)
get_weights(m)

get_weights(lm(mpg ~ wt, data = mtcars), null_as_ones = TRUE)

# GLMs
m <- glm(vs ~ disp + mpg, data = mtcars, weights = weight, family = quasibinomial)
get_weights(m)
m <- glm(cbind(cyl, gear) ~ mpg, data = mtcars, weights = weight, family = binomial)
get_weights(m)</pre>
```

has_intercept

Checks if model has an intercept

Description

Checks if model has an intercept.

Usage

```
has_intercept(x, verbose = TRUE)
```

Arguments

x A model object.verbose Toggle warnings.

Value

TRUE if x has an intercept, FALSE otherwise.

```
model <- lm(mpg ~ 0 + gear, data = mtcars)
has_intercept(model)

model <- lm(mpg ~ gear, data = mtcars)
has_intercept(model)

model <- lmer(Reaction ~ 0 + Days + (Days | Subject), data = sleepstudy)
has_intercept(model)

model <- lmer(Reaction ~ Days + (Days | Subject), data = sleepstudy)
has_intercept(model)</pre>
```

is_converged

is_bayesian_model

Checks if a model is a Bayesian model

Description

Small helper that checks if a model is a Bayesian model.

Usage

```
is_bayesian_model(x, exclude = NULL)
```

Arguments

x A model object.

exclude Optional character vector, indicating classes that should not be included in the

check. E.g., exclude = "stanreg" would return FALSE for models from pack-

age rstanarm.

Value

A logical, TRUE if x is a Bayesian model.

Examples

```
library(rstanarm)
model <- stan_glm(Sepal.Width ~ Species * Petal.Length, data = iris)
is_bayesian_model(model)</pre>
```

is_converged

Convergence test for mixed effects models

Description

 $is_converged()$ provides an alternative convergence test for merMod-objects.

Usage

```
is_converged(x, tolerance = 0.001, ...)
```

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Arguments

x A model object from class merMod, glmmTMB, glm or _glm.

tolerance Indicates up to which value the convergence result is accepted. The smaller

tolerance is, the stricter the test will be.

... Currently not used.

Value

TRUE if convergence is fine and FALSE if convergence is suspicious. Additionally, the convergence value is returned as attribute.

Convergence and log-likelihood

Convergence problems typically arise when the model hasn't converged to a solution where the log-likelihood has a true maximum. This may result in unreliable and overly complex (or non-estimable) estimates and standard errors.

Inspect model convergence

lme4 performs a convergence-check (see ?lme4::convergence), however, as discussed here and suggested by one of the lme4-authors in this comment, this check can be too strict. is_converged() thus provides an alternative convergence test for merMod-objects.

Resolving convergence issues

Convergence issues are not easy to diagnose. The help page on ?1me4::convergence provides most of the current advice about how to resolve convergence issues. Another clue might be large parameter values, e.g. estimates (on the scale of the linear predictor) larger than 10 in (non-identity link) generalized linear model *might* indicate complete separation, which can be addressed by regularization, e.g. penalized regression or Bayesian regression with appropriate priors on the fixed effects.

Convergence versus Singularity

Note the different meaning between singularity and convergence: singularity indicates an issue with the "true" best estimate, i.e. whether the maximum likelihood estimation for the variance-covariance matrix of the random effects is positive definite or only semi-definite. Convergence is a question of whether we can assume that the numerical optimization has worked correctly or not.

```
data(cbpp)
set.seed(1)
cbpp$x <- rnorm(nrow(cbpp))
cbpp$x2 <- runif(nrow(cbpp))

model <- glmer(
   cbind(incidence, size - incidence) ~ period + x + x2 + (1 + x | herd),
   data = cbpp,</pre>
```

is_empty_object

```
family = binomial()
)

is_converged(model)

model <- glmmTMB(
    Sepal.Length ~ poly(Petal.Width, 4) * poly(Petal.Length, 4) +
        (1 + poly(Petal.Width, 4) | Species),
    data = iris
)

is_converged(model)</pre>
```

is_empty_object

Check if object is empty

Description

Check if object is empty

Usage

```
is_empty_object(x)
```

Arguments

Х

A list, a vector, or a dataframe.

Value

A logical indicating whether the entered object is empty.

```
is_empty_object(c(1, 2, 3, NA))
is_empty_object(list(NULL, c(NA, NA)))
is_empty_object(list(NULL, NA))
```

is_gam_model 143

is_gam_model

Checks if a model is a generalized additive model

Description

Small helper that checks if a model is a generalized additive model.

Usage

```
is_gam_model(x)
```

Arguments

Х

A model object.

Value

A logical, TRUE if x is a generalized additive model *and* has smooth-terms

Note

This function only returns TRUE when the model inherits from a typical GAM model class *and* when smooth terms are present in the model formula. If model has no smooth terms or is not from a typical gam class, FALSE is returned.

Examples

```
data(iris)
model1 <- lm(Petal.Length ~ Petal.Width + Sepal.Length, data = iris)
model2 <- mgcv::gam(Petal.Length ~ Petal.Width + s(Sepal.Length), data = iris)
is_gam_model(model1)
is_gam_model(model2)</pre>
```

is_mixed_model

Checks if a model is a mixed effects model

Description

Small helper that checks if a model is a mixed effects model, i.e. if it the model has random effects.

Usage

```
is_mixed_model(x)
```

is_model is_model

Arguments

Χ

A model object.

Value

A logical, TRUE if x is a mixed model.

Examples

```
data(mtcars)
model <- lm(mpg ~ wt + cyl + vs, data = mtcars)
is_mixed_model(model)

data(sleepstudy, package = "lme4")
model <- lme4::lmer(Reaction ~ Days + (1 | Subject), data = sleepstudy)
is_mixed_model(model)</pre>
```

is_model

Checks if an object is a regression model or statistical test object

Description

Small helper that checks if a model is a regression model or a statistical object. is_regression_model() is stricter and only returns TRUE for regression models, but not for, e.g., htest objects.

Usage

```
is_model(x)
is_regression_model(x)
```

Arguments

Х

An object.

Details

This function returns TRUE if x is a model object.

Value

A logical, TRUE if x is a (supported) model object.

is_model_supported 145

Examples

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
is_model(m)
is_model(mtcars)

test <- t.test(1:10, y = c(7:20))
is_model(test)
is_regression_model(test)</pre>
```

is_model_supported

Checks if a regression model object is supported by the insight package

Description

Small helper that checks if a model is a *supported* (regression) model object. supported_models() prints a list of currently supported model classes.

Usage

```
is_model_supported(x)
supported_models()
```

Arguments

Х

An object.

Details

This function returns TRUE if x is a model object that works with the package's functions. A list of supported models can also be found here: https://github.com/easystats/insight.

Value

A logical, TRUE if x is a (supported) model object.

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
is_model_supported(m)
is_model_supported(mtcars)
# to see all supported models
supported_models()</pre>
```

is_multivariate

is_multivariate

Checks if an object stems from a multivariate response model

Description

Small helper that checks if a model is a multivariate response model, i.e. a model with multiple outcomes.

Usage

```
is_multivariate(x)
```

Arguments

Х

A model object, or an object returned by a function from this package.

Value

A logical, TRUE if either x is a model object and is a multivariate response model, or TRUE if a return value from a function of **insight** is from a multivariate response model.

```
library(rstanarm)
data("pbcLong")
model <- suppressWarnings(stan_mvmer(
    formula = list(
        logBili ~ year + (1 | id),
        albumin ~ sex + year + (year | id)
    ),
    data = pbcLong,
    chains = 1, cores = 1, seed = 12345, iter = 1000,
    show_messages = FALSE, refresh = 0
))

f <- find_formula(model)
is_multivariate(model)
is_multivariate(f)</pre>
```

is_nested_models 147

is_nested_models

Checks whether a list of models are nested models

Description

Checks whether a list of models are nested models, strictly following the order they were passed to the function.

Usage

```
is_nested_models(...)
```

Arguments

... Multiple regression model objects.

Details

The term "nested" here means that all the fixed predictors of a model are contained within the fixed predictors of a larger model (sometimes referred to as the encompassing model). Currently, is_nested_models() ignores random effects parameters.

Value

TRUE if models are nested, FALSE otherwise. If models are nested, also returns two attributes that indicate whether nesting of models is in decreasing or increasing order.

```
m1 <- lm(Sepal.Length ~ Petal.Width + Species, data = iris)
m2 <- lm(Sepal.Length ~ Species, data = iris)
m3 <- lm(Sepal.Length ~ Petal.Width, data = iris)
m4 <- lm(Sepal.Length ~ 1, data = iris)

is_nested_models(m1, m2, m4)
is_nested_models(m4, m2, m1)
is_nested_models(m1, m2, m3)</pre>
```

link_function

is_nullmodel

Checks if model is a null-model (intercept-only)

Description

Checks if model is a null-model (intercept-only), i.e. if the conditional part of the model has no predictors.

Usage

```
is_nullmodel(x)
```

Arguments

Х

A model object.

Value

TRUE if x is a null-model, FALSE otherwise.

Examples

```
model <- lm(mpg ~ 1, data = mtcars)
is_nullmodel(model)

model <- lm(mpg ~ gear, data = mtcars)
is_nullmodel(model)

data(sleepstudy, package = "lme4")
model <- lme4::lmer(Reaction ~ 1 + (Days | Subject), data = sleepstudy)
is_nullmodel(model)

model <- lme4::lmer(Reaction ~ Days + (Days | Subject), data = sleepstudy)
is_nullmodel(model)</pre>
```

link_function

Get link-function from model object

Description

Returns the link-function from a model object.

link_inverse 149

Usage

```
link_function(x, ...)

## S3 method for class 'betamfx'
link_function(x, what = c("mean", "precision"), ...)

## S3 method for class 'gamlss'
link_function(x, what = c("mu", "sigma", "nu", "tau"), ...)

## S3 method for class 'betareg'
link_function(x, what = c("mean", "precision"), ...)

## S3 method for class 'DirichletRegModel'
link_function(x, what = c("mean", "precision"), ...)
```

Arguments

x A fitted model.

... Currently not used.

what For gamlss models, indicates for which distribution parameter the link (in-

verse) function should be returned; for betareg or DirichletRegModel, can

be "mean" or "precision".

Value

A function, describing the link-function from a model-object. For multivariate-response models, a list of functions is returned.

Examples

```
# example from ?stats::glm
counts <- c(18, 17, 15, 20, 10, 20, 25, 13, 12)
outcome <- gl(3, 1, 9)
treatment <- gl(3, 3)
m <- glm(counts ~ outcome + treatment, family = poisson())
link_function(m)(0.3)
# same as
log(0.3)</pre>
```

link_inverse

Get link-inverse function from model object

Description

Returns the link-inverse function from a model object.

model_info

Usage

```
link_inverse(x, ...)
## S3 method for class 'betareg'
link_inverse(x, what = c("mean", "precision"), ...)
## S3 method for class 'DirichletRegModel'
link_inverse(x, what = c("mean", "precision"), ...)
## S3 method for class 'betamfx'
link_inverse(x, what = c("mean", "precision"), ...)
## S3 method for class 'gamlss'
link_inverse(x, what = c("mu", "sigma", "nu", "tau"), ...)
```

Arguments

x A fitted model.

... Currently not used.

what For gamlss models, indicates for which distribution parameter the link (in-

verse) function should be returned; for betareg or DirichletRegModel, can

be "mean" or "precision".

Value

A function, describing the inverse-link function from a model-object. For multivariate-response models, a list of functions is returned.

Examples

```
# example from ?stats::glm
counts <- c(18, 17, 15, 20, 10, 20, 25, 13, 12)
outcome <- gl(3, 1, 9)
treatment <- gl(3, 3)
m <- glm(counts ~ outcome + treatment, family = poisson())
link_inverse(m)(0.3)
# same as
exp(0.3)</pre>
```

model_info

Access information from model objects

Description

Retrieve information from model objects.

model_info 151

Usage

```
model_info(x, ...)
## Default S3 method:
model_info(x, verbose = TRUE, ...)
## S3 method for class 'brmsfit'
model_info(x, response = NULL, ...)
```

Arguments

x A fitted model.... Currently not used.verbose Toggle off warnings.

response If x is a multivariate response model, model_info() returns a list of information

for each response variable. Set response to the number of a specific response variable, or provide the name of the response variable in response, to return the

information for only one response.

Details

model_info() returns a list with information about the model for many different model objects. Following information is returned, where all values starting with is_ are logicals.

Common families and distributions:

- is_bernoulli: special case of binomial models: family is Bernoulli
- is_beta: family is beta
- is_betabinomial: family is beta-binomial
- is_binomial: family is binomial (but not negative binomial)
- is_categorical: family is categorical link
- is_censored: model is a censored model (has a censored response, including survival models)
- is_count: model is a count model (i.e. family is either poisson or negative binomial)
- is_cumulative: family is ordinal or cumulative link
- is_dirichlet: family is dirichlet
- is_exponential: family is exponential (e.g. Gamma or Weibull)
- is_linear: family is gaussian
- is_logit: model has logit link
- is_multinomial: family is multinomial or categorical link
- is_negbin: family is negative binomial
- is_orderedbeta: family is ordered beta
- is_ordinal: family is ordinal or cumulative link

model_info

is_poisson: family is poissonis_probit: model has probit linkis_tweedie: family is tweedie

Special model types:

- is_anova: model is an Anova object
- is_bayesian: model is a Bayesian model
- is_dispersion: model has dispersion component (not only dispersion *parameter*)
- is_gam: model is a generalized additive model
- is_meta: model is a meta-analysis object
- is_mixed: model is a mixed effects model (with random effects)
- is_mixture: model is a finite mixture model (currently only recognized for package *brms*).
- is_multivariate: model is a multivariate response model (currently only works for *brmsfit* and *vglm/vgam* objects)
- is_hurdle: model has zero-inflation component and is a hurdle-model (truncated family distribution)
- is_rtchoice: model is a *brms* decision-making (sequential sampling) model, which models outcomes that consists of two components (reaction times and choice).
- is_survival: model is a survival model
- is_trial: model response contains additional information about the trials
- is_truncated: model is a truncated model (has a truncated response)
- is_wiener: model is a *brms* decision-making (sequential sampling) model with Wiener process (also called drift diffusion model)
- is_zero_inflated: model has zero-inflation component

Hypotheses tests:

- is_binomtest: model is an an object of class htest, returned by binom.test()
- is_chi2test: model is an an object of class htest, returned by chisq.test()
- is_correlation: model is an an object of class htest, returned by cor.test()
- is_ftest: model is an an object of class htest, and test-statistic is an F-statistic.
- is_levenetest: model is an an object of class anova, returned by car::leveneTest().
- is_onewaytest: model is an an object of class htest, returned by oneway.test()
- is_proptest: model is an an object of class htest, returned by prop.test()
- is_ranktest: model is an an object of class htest, returned by cor.test() (if Spearman's rank correlation), wilcox.text() or kruskal.test().
- is_ttest: model is an an object of class htest, returned by t.test()
- is_variancetest: model is an an object of class htest, returned by bartlett.test(), shapiro.test() or car::leveneTest().
- is_xtab: model is an an object of class htest or BFBayesFactor, and test-statistic stems from a contingency table (i.e. chisq.test() or BayesFactor::contingencyTableBF()).

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Other model information:

- link_function: the link-function
- family: name of the distributional family of the model. For some exceptions (like some htest objects), can also be the name of the test.
- n_obs: number of observations
- n_grouplevels: for mixed models, returns names and numbers of random effect groups

Value

A list with information about the model, like family, link-function etc. (see 'Details').

Examples

```
ldose <- rep(0:5, 2)
numdead <- c(1, 4, 9, 13, 18, 20, 0, 2, 6, 10, 12, 16)
sex <- factor(rep(c("M", "F"), c(6, 6)))
SF <- cbind(numdead, numalive = 20 - numdead)
dat <- data.frame(ldose, sex, SF, stringsAsFactors = FALSE)
m <- glm(SF ~ sex * ldose, family = binomial)
# logistic regression
model_info(m)
# t-test
m <- t.test(1:10, y = c(7:20))
model_info(m)</pre>
```

model_name

Name the model

Description

Returns the "name" (class attribute) of a model, possibly including further information.

Usage

```
model_name(x, ...)
## Default S3 method:
model_name(x, include_formula = FALSE, include_call = FALSE, ...)
```

Arguments

```
x A model.
... Currently not used.
include_formula
Should the name include the model's formula.
include_call If TRUE, will return the function call as a name.
```

null_model

Value

A character string of a name (which usually equals the model's class attribute).

Examples

```
m <- lm(Sepal.Length ~ Petal.Width, data = iris)
model_name(m)
model_name(m, include_formula = TRUE)
model_name(m, include_call = TRUE)
model_name(lme4::lmer(Sepal.Length ~ Sepal.Width + (1 | Species), data = iris))</pre>
```

null_model

Compute intercept-only model for regression models

Description

This function computes the null-model (i.e. $(y \sim 1)$) of a model. For mixed models, the null-model takes random effects into account.

Usage

```
null_model(model, ...)
## Default S3 method:
null_model(model, verbose = TRUE, ...)
```

Arguments

model A (mixed effects) model.

... Arguments passed to or from other methods.

verbose Toggle off warnings.

Value

The null-model of x

```
data(sleepstudy)
m <- lmer(Reaction ~ Days + (1 + Days | Subject), data = sleepstudy)
summary(m)
summary(null_model(m))</pre>
```

n_grouplevels 155

n_grouplevels

Count number of random effect levels in a mixed model

Description

Returns the number of group levels of random effects from mixed models.

Usage

```
n_grouplevels(x, ...)
```

Arguments

x A mixed model.

... Additional arguments that can be passed to the function. Currently, you can use data to provide the model data, if available, to avoid retrieving model data multiple times.

Value

The number of group levels in the model.

```
data(sleepstudy, package = "lme4")
set.seed(12345)
sleepstudy$grp <- sample(1:5, size = 180, replace = TRUE)
sleepstudy$subgrp <- NA
for (i in 1:5) {
   filter_group <- sleepstudy$grp == i
    sleepstudy$subgrp[filter_group] <-
        sample(1:30, size = sum(filter_group), replace = TRUE)
}
model <- lme4::lmer(
   Reaction ~ Days + (1 | grp / subgrp) + (1 | Subject),
   data = sleepstudy
)
n_grouplevels(model)</pre>
```

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n_obs

Get number of observations from a model

Description

This method returns the number of observation that were used to fit the model, as numeric value.

Usage

```
n_obs(x, ...)
## S3 method for class 'glm'
n_obs(x, disaggregate = FALSE, ...)
## S3 method for class 'svyolr'
n_obs(x, weighted = FALSE, ...)
## S3 method for class 'afex_aov'
n_obs(x, shape = c("long", "wide"), ...)
## S3 method for class 'stanmvreg'
n_obs(x, select = NULL, ...)
```

Arguments

disaggregate

X	A fitted model.
	Currently not used.

For binomial models with aggregated data, n_obs() returns the number of data rows by default. If disaggregate = TRUE, the total number of trials is returned instead (determined by summing the results of weights() for aggregated data, which will be either the weights input for proportion success response or the row

sums of the response matrix if matrix response, see 'Examples').

weighted For survey designs, returns the weighted sample size.

shape Return long or wide data? Only applicable in repeated measures designs.

select Optional name(s) of response variables for which to extract values. Can be used

in case of regression models with multiple response variables.

Value

The number of observations used to fit the model, or NULL if this information is not available.

```
data(mtcars)
m <- lm(mpg ~ wt + cyl + vs, data = mtcars)
n_obs(m)</pre>
```

157 n_parameters

```
data(cbpp, package = "lme4")
m \leftarrow glm(
  cbind(incidence, size - incidence) ~ period,
  data = cbpp,
  family = binomial(link = "logit")
n_obs(m)
n_obs(m, disaggregate = TRUE)
```

n_parameters

Count number of parameters in a model

Description

Returns the number of parameters (coefficients) of a model.

Usage

```
n_parameters(x, ...)
## Default S3 method:
n_parameters(x, remove_nonestimable = FALSE, ...)
## S3 method for class 'merMod'
n_parameters(x, effects = "fixed", remove_nonestimable = FALSE, ...)
## S3 method for class 'glmmTMB'
n_parameters(
  х,
  effects = "fixed",
  component = "all",
  remove_nonestimable = FALSE,
)
```

Arguments

A statistical model. Х

Arguments passed to or from other methods.

remove_nonestimable

Logical, if TRUE, removes (i.e. does not count) non-estimable parameters (which may occur for models with rank-deficient model matrix).

Should variables for fixed effects ("fixed"), random effects ("random") or both effects ("all") be returned? Only applies to mixed models. May be abbreviated.

object_has_names

component

Which type of parameters to return, such as parameters for the conditional model, the zero-inflated part of the model, the dispersion term, the instrumental variables or marginal effects be returned? Applies to models with zero-inflated and/or dispersion formula, or to models with instrumental variables (so called fixed-effects regressions), or models with marginal effects (from **mfx**). See details in section *Model Components*. May be abbreviated. Note that the *conditional* component also refers to the *count* or *mean* component - names may differ, depending on the modeling package. There are three convenient shortcuts (not applicable to *all* model classes):

- component = "all" returns all possible parameters.
- If component = "location", location parameters such as conditional, zero_inflated, smooth_terms, or instruments are returned (everything that are fixed or random effects depending on the effects argument but no auxiliary parameters).
- For component = "distributional" (or "auxiliary"), components like sigma, dispersion, beta or precision (and other auxiliary parameters) are returned.

Value

The number of parameters in the model.

Note

This function returns the number of parameters for the fixed effects by default, as returned by find_parameters(x, effects = "fixed"). It does not include *all* estimated model parameters, i.e. auxiliary parameters like sigma or dispersion are not counted. To get the number of *all estimated* parameters, use get_df(x, type = "model").

Examples

```
data(iris)
model <- lm(Sepal.Length ~ Sepal.Width * Species, data = iris)
n_parameters(model)</pre>
```

object_has_names

Check names and rownames

Description

object_has_names() checks if specified names are present in the given object. object_has_rownames() checks if rownames are present in a dataframe.

Usage

```
object_has_names(x, names)
object_has_rownames(x)
```

print_color 159

Arguments

x A named object (an atomic vector, a list, a dataframe, etc.).names A single character or a vector of characters.

Value

A logical or a vector of logicals.

Examples

```
# check if specified names are present in the given object
object_has_names(mtcars, "am")
object_has_names(anscombe, c("x1", "z1", "y1"))
object_has_names(list("x" = 1, "y" = 2), c("x", "a"))
# check if a dataframe has rownames
object_has_rownames(mtcars)
```

print_color

Coloured console output

Description

Convenient function that allows coloured output in the console. Mainly implemented to reduce package dependencies.

Usage

```
print_color(text, color)
print_colour(text, colour)
color_text(text, color)
colour_text(text, colour)
color_theme()
```

Arguments

text

The text to print.

color, colour

Character vector, indicating the colour for printing. May be one of "white", "black", "red", "yellow", "green", "blue", "violet", "cyan" or "grey". Bright variants of colors are available by adding the prefix "b" (or "br_" or "bright_"), e.g. "bred" (or "br_red" resp. "bright_red"). Background colors can be set by adding the prefix "bg_" (e.g. "bg_red"). Formatting is also possible with "bold" or "italic".

print_parameters

Details

This function prints text directly to the console using cat(), so no string is returned. color_text(), however, returns only the formatted string, without using cat(). color_theme() either returns "dark" when RStudio is used with dark color scheme, "light" when it's used with light theme, and NULL if the theme could not be detected.

Value

Nothing.

Examples

```
print_color("I'm blue dabedi dabedei", "blue")
```

print_parameters

Prepare summary statistics of model parameters for printing

Description

This function takes a data frame, typically a data frame with information on summaries of model parameters like bayestestR::describe_posterior(), bayestestR::hdi() or parameters::model_parameters(), as input and splits this information into several parts, depending on the model. See details below.

Usage

```
print_parameters(
    x,
    ...,
    by = c("Effects", "Component", "Group", "Response"),
    format = "text",
    parameter_column = "Parameter",
    keep_parameter_column = TRUE,
    remove_empty_column = FALSE,
    titles = NULL,
    subtitles = NULL
)
```

Arguments

bγ

x A fitted model, or a data frame returned by clean_parameters().

One or more objects (data frames), which contain information about the model parameters and related statistics (like confidence intervals, HDI, ROPE, ...).

by should be a character vector with one or more of the following elements: "Effects", "Component", "Response" and "Group". These are the column names returned by clean_parameters(), which is used to extract the information from which the group or component model parameters belong. If NULL, the merged data frame is returned. Else, the data frame is split into a list, split by the values from those columns defined in by.

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format

Name of output-format, as string. If NULL (or "text"), assumed use for output is basic printing. If "markdown", markdown-format is assumed. This only affects the style of title- and table-caption attributes, which are used in export_table().

parameter_column

String, name of the column that contains the parameter names. Usually, for data frames returned by functions the easystats-packages, this will be "Parameter".

keep_parameter_column

Logical, if TRUE, the data frames in the returned list have both a "Cleaned_Parameter" and "Parameter" column. If FALSE, the (unformatted) "Parameter" is removed, and the column with cleaned parameter names ("Cleaned_Parameter") is renamed into "Parameter".

remove_empty_column

Logical, if TRUE, columns with completely empty character values will be removed.

titles, subtitles

By default, the names of the model components (like fixed or random effects, count or zero-inflated model part) are added as attributes "table_title" and "table_subtitle" to each list element returned by print_parameters(). These attributes are then extracted and used as table (sub) titles in export_table(). Use titles and subtitles to override the default attribute values for "table_title" and "table_subtitle". titles and subtitles may be any length from 1 to same length as returned list elements. If titles and subtitles are shorter than existing elements, only the first default attributes are overwritten.

Details

This function prepares data frames that contain information about model parameters for clear printing.

First, x is required, which should either be a model object or a prepared data frame as returned by clean_parameters(). If x is a model, clean_parameters() is called on that model object to get information with which model components the parameters are associated.

Then, ... take one or more data frames that also contain information about parameters from the same model, but also have additional information provided by other methods. For instance, a data frame in ... might be the result of, for instance, bayestestR::describe_posterior(), or parameters::model_parameters(), where we have a) a Parameter column and b) columns with other parameter values (like CI, HDI, test statistic, etc.).

Now we have a data frame with model parameters and information about the association to the different model components, a data frame with model parameters, and some summary statistics. print_parameters() then merges these data frames, so the parameters or statistics of interest are also associated with the different model components. The data frame is split into a list, so for a clear printing. Users can loop over this list and print each component for a better overview. Further, parameter names are "cleaned", if necessary, also for a cleaner print. See also 'Examples'.

Value

A data frame or a list of data frames (if by is not NULL). If a list is returned, the element names reflect the model components where the extracted information in the data frames belong to, e.g.

random.zero_inflated.Intercept: persons. This is the data frame that contains the parameters for the random effects from group-level "persons" from the zero-inflated model component.

Examples

```
library(bayestestR)
model <- download_model("brms_zi_2")
x <- hdi(model, effects = "all", component = "all")

# hdi() returns a data frame; here we use only the
# information on parameter names and HDI values
tmp <- as.data.frame(x)[, 1:4]
tmp

# Based on the "by" argument, we get a list of data frames that
# is split into several parts that reflect the model components.
print_parameters(model, tmp)

# This is the standard print()-method for "bayestestR::hdi"-objects.
# For printing methods, it is easy to print complex summary statistics
# in a clean way to the console by splitting the information into
# different model components.
x</pre>
```

standardize_column_order

Standardize column order

Description

Standardizes order of columns for dataframes and other objects from *easystats* and *broom* ecosystem packages.

Usage

```
standardize_column_order(data, ...)
## S3 method for class 'parameters_model'
standardize_column_order(data, style = "easystats", ...)
```

Arguments

A data frame. In particular, objects from *easystats* package functions like parameters::model_parameter or effectsize::effectsize() are accepted, but also data frames returned by broom::tidy() are valid objects.

.. Currently not used.

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style

Standardization can either be based on the naming conventions from the easystats-project, or on **broom**'s naming scheme.

Value

A data frame, with standardized column order.

Examples

```
# easystats conventions
df1 <- cbind.data.frame(</pre>
 CI_low
             = -2.873,
             = 5.494,
 t
 CI_high
             = -1.088
             = 0.00001,
 Parameter = -1.980,
 CI
             = 0.95,
 df
             = 29.234,
             = "Student's t-test"
 Method
standardize_column_order(df1, style = "easystats")
# broom conventions
df2 <- cbind.data.frame(</pre>
 conf.low = -2.873,
 statistic = 5.494,
 conf.high = -1.088,
            = 0.00001.
 p.value
 estimate = -1.980,
 conf.level = 0.95,
 df
           = 29.234,
            = "Student's t-test"
 method
)
standardize_column_order(df2, style = "broom")
```

standardize_names

Standardize column names

Description

Standardize column names from data frames, in particular objects returned from parameters::model_parameters(), so column names are consistent and the same for any model object.

Usage

```
standardize_names(data, ...)
## S3 method for class 'parameters_model'
```

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```
standardize_names(
  data,
  style = c("easystats", "broom"),
  ignore_estimate = FALSE,
  ...
)
```

Arguments

A data frame. In particular, objects from easystats package functions like parameters::model_parameter or effectsize::effectsize() are accepted, but also data frames returned by broom::tidy() are valid objects.

... Currently not used.

style Standardization can either be based on the naming conventions from the easystats-project, or on broom's naming scheme.

ignore_estimate

Logical, if TRUE, column names like "mean" or "median" will not be converted to "Coefficient" resp. "estimate".

Details

This method is in particular useful for package developers or users who use, e.g., parameters::model_parameters() in their own code or functions to retrieve model parameters for further processing. As model_parameters() returns a data frame with varying column names (depending on the input), accessing the required information is probably not quite straightforward. In such cases, standardize_names() can be used to get consistent, i.e. always the same column names, no matter what kind of model was used in model_parameters().

For style = "broom", column names are renamed to match **broom**'s naming scheme, i.e. Parameter is renamed to term, Coefficient becomes estimate and so on.

For style = "easystats", when data is an object from broom::tidy(), column names are converted from "broom"-style into "easystats"-style.

Value

A data frame, with standardized column names.

```
model <- lm(mpg ~ wt + cyl, data = mtcars)
mp <- model_parameters(model)

as.data.frame(mp)
standardize_names(mp)
standardize_names(mp, style = "broom")</pre>
```

text_remove_backticks 165

```
text_remove_backticks Remove backticks from a string
```

Description

This function removes backticks from a string.

Usage

```
text_remove_backticks(x, ...)
## S3 method for class 'data.frame'
text_remove_backticks(x, column = "Parameter", verbose = FALSE, ...)
```

Arguments

х	A character vector, a data frame or a matrix. If a matrix, backticks are removed from the column and row names, not from values of a character vector.
	Currently not used.
column	If x is a data frame, specify the column of character vectors, where backticks should be removed. If NULL, all character vectors are processed.
verbose	Toggle warnings.

Value

x, where all backticks are removed.

Note

If x is a character vector or data frame, backticks are removed from the elements of that character vector (or character vectors from the data frame.) If x is a matrix, the behaviour slightly differs: in this case, backticks are removed from the column and row names. The reason for this behaviour is that this function mainly serves formatting coefficient names. For vcov() (a matrix), row and column names equal the coefficient names and therefore are manipulated then.

```
# example model
data(iris)
iris$`a m` <- iris$Species
iris$`Sepal Width` <- iris$Sepal.Width
model <- lm(`Sepal Width` ~ Petal.Length + `a m`, data = iris)
# remove backticks from string
names(coef(model))
text_remove_backticks(names(coef(model)))</pre>
```

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```
# remove backticks from character variable in a data frame
# column defaults to "Parameter".
d <- data.frame(
   Parameter = names(coef(model)),
   Estimate = unname(coef(model))
)
d
text_remove_backticks(d)</pre>
```

trim_ws

Small helper functions

Description

Collection of small helper functions. trim_ws() is an efficient function to trim leading and trailing whitespaces from character vectors or strings. n_unique() returns the number of unique values in a vector. has_single_value() is equivalent to n_unique() == 1 but is faster (note the different default for the remove_na argument). safe_deparse() is comparable to deparse1(), i.e. it can safely deparse very long expressions into a single string. safe_deparse_symbol() only deparses a substituted expressions when possible, which can be much faster than deparse(substitute()) for those cases where substitute() returns no valid object name.

Usage

```
trim_ws(x, ...)
## S3 method for class 'data.frame'
trim_ws(x, character_only = TRUE, ...)

n_unique(x, ...)
## Default S3 method:
n_unique(x, remove_na = TRUE, ...)
safe_deparse(x, ...)
safe_deparse_symbol(x)
has_single_value(x, remove_na = FALSE, ...)
```

Arguments

```
    x A (character) vector, or for some functions may also be a data frame.
    ... Currently not used.
    character_only Logical, if TRUE and x is a data frame or list, only processes character vectors.
    remove_na Logical, if missing values should be removed from the input.
```

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Value

• n_unique(): For a vector, n_unique always returns an integer value, even if the input is NULL (the return value will be 0 then). For data frames or lists, n_unique() returns a named numeric vector, with the number of unique values for each element.

- has_single_value(): TRUE if x has only one unique value, FALSE otherwise.
- trim_ws(): A character vector, where trailing and leading white spaces are removed.
- safe_deparse(): A character string of the unevaluated expression or symbol.
- safe_deparse_symbol(): A character string of the unevaluated expression or symbol, if x was a symbol. If x is no symbol (i.e. if is.name(x) would return FALSE), NULL is returned.

Examples

```
trim_ws(" no space! ")
n_unique(iris$Species)
has_single_value(c(1, 1, 2))

# safe_deparse_symbol() compared to deparse(substitute())
safe_deparse_symbol(as.name("test"))
deparse(substitute(as.name("test")))
```

validate_argument

Validate arguments against a given set of options

Description

This is a replacement for match.arg(), however, the error string should be more informative for users. The name of the affected argument is shown, and possible typos as well as remaining valid options. Note that the argument several.ok is always FALSE in validate_argument(), i.e. this function - unlike match.arg() - does *not* allow evaluating several valid options at once.

Usage

```
validate_argument(argument, options)
```

Arguments

argument The bare name of the argument to be validated.

options Valid options, usually a character vector.

Value

argument if it is a valid option, else an error is thrown.

validate_argument

```
foo <- function(test = "small") {
  validate_argument(test, c("small", "medium", "large"))
}
foo("small")
# errors:
# foo("masll")</pre>
```

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