# Package 'Robyn'

July 3, 2025

```
Title Semi-Automated Marketing Mix Modeling (MMM) from Meta Marketing
     Science
Version 3.12.1
Maintainer Bernardo Lares <laresbernardo@gmail.com>
Description Semi-Automated Marketing Mix Modeling (MMM) aiming to reduce hu-
     man bias by means of ridge regression and evolutionary algorithms, enables actionable deci-
     sion making providing a budget allocation and diminishing returns curves and allows ground-
     truth calibration to account for causation.
Depends R (>= 4.0.0)
Imports doParallel, doRNG, dplyr, foreach, ggplot2 (>= 3.4.0),
     ggridges, glmnet, jsonlite, lares, lubridate, nloptr, patchwork
     (>= 1.3.1), prophet, reticulate, stringr, tidyr
Config/reticulate list( packages = list( list(package = ``nevergrad'',
     pip = TRUE))
URL https://github.com/facebookexperimental/Robyn,
     https://facebookexperimental.github.io/Robyn/
BugReports https://github.com/facebookexperimental/Robyn/issues
RoxygenNote 7.3.2
License MIT + file LICENSE
Encoding UTF-8
LazyData true
NeedsCompilation no
Author Gufeng Zhou [aut],
     Bernardo Lares [cre, aut],
     Igor Skokan [aut],
     Leonel Sentana [aut],
     Meta Platforms, Inc. [cph, fnd]
Repository CRAN
Date/Publication 2025-07-02 22:00:11 UTC
```

Type Package

2 adstock\_geometric

# **Contents**

- d-+	ock_geometric Adstocking Transformation (Geometric and Weibull)	
Index		44
	transformations	42
	set_holidays	
	set_default_hyppar	
	saturation_hill	40
	robyn_write	
	robyn_update	
	robyn_train	
	robyn_save	
	robyn_run	
	robyn_response	
	robyn_refresh	
	robyn_outputs	
	robyn_mmm	
	robyn_inputs	
	robyn_converge	
	robyn_clusters	
	robyn_calibrate	
	robyn_allocator	
	Robyn	
	prophet_decomp	8
	hyper_names	- 7
	hyper_limits	7
	dt_simulated_weekly	(
	dt_prophet_holidays	4
	df_curve_reach_freq	4
	adstock_geometric	2

# **Description**

adstock\_geometric() for Geometric Adstocking is the classic one-parametric adstock function. adstock\_weibull() for Weibull Adstocking is a two-parametric adstock function that allows changing decay rate over time, as opposed to the fixed decay rate over time as in Geometric adstock. It has two options, the cumulative density function "CDF" or the probability density function "PDF".

```
adstock_geometric(x, theta)
adstock_weibull(x, shape, scale, windlen = length(x), type = "pdf")
transform_adstock(
```

adstock\_geometric 3

```
x,
adstock,
theta = NULL,
shape = NULL,
scale = NULL,
windlen = length(x)
)
plot_adstock(plot = TRUE)
```

#### **Arguments**

x A numeric vector.

theta Numeric. Theta is the only parameter on Geometric Adstocking and means fixed

decay rate. Assuming TV spend on day 1 is 100€ and theta = 0.7, then day 2 has  $100 \times 0.7 = 70$ € worth of effect carried-over from day 1, day 3 has  $70 \times 0.7 = 49$ € from day 2 etc. Rule-of-thumb for common media genre: TV c(0.3, 0.8),

OOH/Print/ Radio c(0.1, 0.4), digital c(0, 0.3).

shape, scale Numeric. Check "Details" section for more details.

windlen Integer. Length of modelling window. By default, same length as x.

type Character. Accepts "CDF" or "PDF". CDF, or cumulative density function of the

Weibull function allows changing decay rate over time in both C and S shape, while the peak value will always stay at the first period, meaning no lagged effect. PDF, or the probability density function, enables peak value occurring

after the first period when shape >=1, allowing lagged effect.

adstock Character. One of: "geometric", "weibull\_cdf", "weibull\_pdf".

plot Boolean. Do you wish to return the plot?

#### Details

Weibull's CDF (Cumulative Distribution Function) has two parameters, shape & scale, and has flexible decay rate, compared to Geometric adstock with fixed decay rate. The shape parameter controls the shape of the decay curve. Recommended bound is c(0.0001, 2). The larger the shape, the more S-shape. The smaller, the more L-shape. Scale controls the inflexion point of the decay curve. We recommend very conservative bounce of c(0, 0.1), because scale increases the adstock half-life greatly.

Weibull's PDF (Probability Density Function) also shape & scale as parameter and also has flexible decay rate as Weibull CDF. The difference is that Weibull PDF offers lagged effect. When shape > 2, the curve peaks after x = 0 and has NULL slope at x = 0, enabling lagged effect and sharper increase and decrease of adstock, while the scale parameter indicates the limit of the relative position of the peak at x axis; when 1 < shape < 2, the curve peaks after x = 0 and has infinite positive slope at x = 0, enabling lagged effect and slower increase and decrease of adstock, while scale has the same effect as above; when shape = 1, the curve peaks at x = 0 and reduces to exponential decay, while scale controls the inflexion point; when 0 < shape < 1, the curve peaks at x = 0 and has increasing decay, while scale controls the inflexion point. When all possible shapes are relevant, we recommend c(0.0001, 10) as bounds for shape; when only strong lagged effect is of interest, we recommend c(2.0001, 10) as bound for shape. In all

df\_curve\_reach\_freq

cases, we recommend conservative bound of c(0, 0.1) for scale. Due to the great flexibility of Weibull PDF, meaning more freedom in hyperparameter spaces for Nevergrad to explore, it also requires larger iterations to converge.

Run plot\_adstock() to see the difference visually.

#### Value

Numeric values. Transformed values.

#### See Also

```
Other Transformations: saturation_hill(), transformations
```

## **Examples**

```
adstock_geometric(rep(100, 5), theta = 0.5)
adstock_weibull(rep(100, 5), shape = 0.5, scale = 0.5, type = "cdf")
adstock_weibull(rep(100, 5), shape = 0.5, scale = 0.5, type = "pdf")
```

df\_curve\_reach\_freq

Robyn Dataset: Reach & frequency simulated dataset

#### **Description**

A simulated cumulated reach and spend dataset by frequency buckets. The headers must be kept as c("spend\_cumulated", "response\_cumulated", "freq\_bucket").

## Usage

```
data(df_curve_reach_freq)
```

# Format

```
An object of class "data.frame"
```

```
spend_cumulated cumulated spend of paid media
response_cumulated cumulated reach of paid media
freq_bucket Frequency bucket for cumulated reach
```

#### Value

data.frame

Dataframe.

#### See Also

```
Other Dataset: dt_prophet_holidays, dt_simulated_weekly
```

dt\_prophet\_holidays 5

# **Examples**

```
data(df_curve_reach_freq)
head(df_curve_reach_freq)
```

dt\_prophet\_holidays

Robyn Dataset: Holidays by Country

# Description

Contains prophet's "new" default holidays by country. When using own holidays, please keep the header c("ds", "holiday", "country", "year").

# Usage

```
data(dt_prophet_holidays)
```

#### **Format**

```
An object of class "data.frame"

ds Date

holiday Name of celebrated holiday

country Code for the country (Alpha-2)

year Year of ds
```

# Value

data.frame

Dataframe. Contains prophet's default holidays by country.

## See Also

```
Other Dataset: df_curve_reach_freq, dt_simulated_weekly
```

# **Examples**

```
data(dt_prophet_holidays)
head(dt_prophet_holidays)
```

dt\_simulated\_weekly

dt\_simulated\_weekly Robyn Dataset: MMM Demo Data

# Description

Simulated MMM data. Input time series should be daily, weekly or monthly.

# Usage

```
data(dt_simulated_weekly)
```

# **Format**

```
An object of class "data.frame"
```

**DATE** Date

revenue Daily total revenue

tv\_S Television

ooh\_S Out of home

••• ...

#### Value

data.frame

Dataframe. Contains simulated dummy dataset to test and run demo.

# See Also

```
Other Dataset: df_curve_reach_freq, dt_prophet_holidays
```

# **Examples**

```
data(dt_simulated_weekly)
head(dt_simulated_weekly)
```

hyper\_limits 7

hyper_limits	Check hyperparameter limits	
--------------	-----------------------------	--

# **Description**

Reference data.frame that shows the upper and lower bounds valid for each hyperparameter.

# Usage

```
hyper_limits()
```

#### Value

Dataframe. Contains upper and lower bounds for each hyperparameter.

# **Examples**

```
hyper_limits()
```

hyper_names	Get correct hyperparameter names	

## **Description**

Output all hyperparameter names and help specifying the list of hyperparameters that is inserted into robyn\_inputs(hyperparameters = ...)

# Usage

```
hyper_names(adstock, all_media, all_vars = NULL)
```

# Arguments

adstock	Character. Default to InputCollect\$adstock. Accepts "geometric", "weibull_cdf" or "weibull_pdf"
all_media	$Character\ vector.\ Default\ to\ Input Collect \$ all\_media.\ Includes\ Input Collect \$ paid\_media\_spends\ and\ Input Collect \$ organic\_vars.$
all_vars	Used to check the penalties inputs, especially for refreshing models.

#### Value

Character vector. Names of hyper-parameters that should be defined.

# Guide to setup hyperparameters

See section "Hyperparameter interpretation & recommendation" in demo https://github.com/facebookexperimental/Robyn/blo

8 prophet\_decomp

## Helper plots

plot\_adstock(TRUE) Get adstock transformation example plot, helping you understand geometric/theta and weibull/shape/scale transformation

**plot\_saturation(TRUE)** Get saturation curve transformation example plot, helping you understand hill/alpha/gamma transformation

#### **Examples**

```
media <- c("facebook_I", "print_S", "tv_S")</pre>
hyper_names(adstock = "geometric", all_media = media)
hyperparameters <- list(</pre>
 facebook_I_alphas = c(0.5, 3), # example bounds for alpha
 facebook_I_gammas = c(0.3, 1), # example bounds for gamma
 facebook_I_thetas = c(0, 0.3), # example bounds for theta
 print_S_alphas = c(0.5, 3),
 print_S_gammas = c(0.3, 1),
 print_S_thetas = c(0.1, 0.4),
 tv_S_alphas = c(0.5, 3),
 tv_S_gammas = c(0.3, 1),
 tv_S_{thetas} = c(0.3, 0.8)
# Define hyper_names for weibull adstock
hyper_names(adstock = "weibull_pdf", all_media = media)
hyperparameters <- list(</pre>
 facebook_I_alphas = c(0.5, 3), # example bounds for alpha
 facebook_I_gammas = c(0.3, 1), # example bounds for gamma
 facebook_I_shapes = c(0.0001, 2), # example bounds for shape
 facebook_I_scales = c(0, 0.1), # example bounds for scale
 print_S_alphas = c(0.5, 3),
 print_S_gammas = c(0.3, 1),
 print_S_shapes = c(0.0001, 2),
 print_S_scales = c(0, 0.1),
 tv_S_alphas = c(0.5, 3),
 tv_S_gammas = c(0.3, 1),
 tv_S_shapes = c(0.0001, 2),
 tv_S_scales = c(0, 0.1)
)
```

prophet\_decomp

Conduct prophet decomposition

#### **Description**

When prophet\_vars in robyn\_inputs() is specified, this function decomposes trend, season, holiday and weekday from the dependent variable.

prophet\_decomp 9

#### Usage

```
prophet_decomp(
   dt_transform,
   dt_holidays,
   prophet_country,
   prophet_vars,
   prophet_signs,
   factor_vars,
   context_vars,
   organic_vars,
   paid_media_spends,
   paid_media_vars,
   intervalType,
   dayInterval,
   custom_params
)
```

## **Arguments**

 ${\tt dt\_transform} \qquad A \ {\tt data.frame} \ with \ all \ model \ features. \ Must \ contain \ ds \ column \ for \ time \ variable$ 

values and dep\_var column for dependent variable values.

dt\_holidays data.frame. Raw input holiday data. Load standard Prophet holidays using

data("dt\_prophet\_holidays")

context\_vars, paid\_media\_spends, intervalType, dayInterval,

organic\_vars

Character vector. Typically newsletter sendings, push-notifications, social media posts etc. Compared to paid\_media\_vars organic\_vars are often market-

ing activities without clear spends.

paid\_media\_vars

Character vector. Names of the paid media variables' exposure level metrics (impressions, clicks, GRP etc) other than spend. The values on each of these variables must be numeric. These variables are not being used to train the model but to check relationship and recommend to split media channels into sub-channels (e.g. fb\_retargeting, fb\_prospecting, etc.) to gain more variance. paid\_media\_vars must have same order and length as paid\_media\_spends

respectively and is not required.

custom\_params List. Custom parameters passed to prophet()

## Value

A list containing all prophet decomposition output.

10 robyn\_allocator

Robyn

Robyn MMM Project from Meta Marketing Science

### Description

Robyn is an automated Marketing Mix Modeling (MMM) code. It aims to reduce human bias by means of ridge regression and evolutionary algorithms, enables actionable decision making providing a budget allocator and diminishing returns curves and allows ground-truth calibration to account for causation.

#### Author(s)

```
Gufeng Zhou (gufeng@meta.com)
Leonel Sentana (leonelsentana@meta.com)
Igor Skokan (igorskokan@meta.com)
Bernardo Lares (bernardolares@meta.com)
```

#### See Also

Useful links:

- https://github.com/facebookexperimental/Robyn
- https://facebookexperimental.github.io/Robyn/
- Report bugs at https://github.com/facebookexperimental/Robyn/issues

robyn\_allocator

**Budget Allocator** 

# Description

robyn\_allocator() function returns a new split of media variable spends that maximizes the total media response.

```
robyn_allocator(
  robyn_object = NULL,
  select_build = 0,
  InputCollect = NULL,
  OutputCollect = NULL,
  select_model = NULL,
  json_file = NULL,
  scenario = "max_response",
  total_budget = NULL,
```

robyn\_allocator 11

```
target_value = NULL,
  date_range = "all",
  channel_constr_low = NULL,
  channel_constr_up = NULL,
  channel_constr_multiplier = 3,
  optim_algo = "SLSQP_AUGLAG",
 maxeval = 1e+05,
  constr_mode = "eq".
  keep_zero_coefs = FALSE,
  plots = TRUE,
 plot_folder = NULL,
 plot_folder_sub = NULL,
  export = TRUE,
  quiet = FALSE,
  ui = FALSE,
)
## S3 method for class 'robyn_allocator'
print(x, ...)
## S3 method for class 'robyn_allocator'
plot(x, ...)
```

#### **Arguments**

robyn\_object Character or List. Path of the Robyn.RDS object that contains all previous mod-

eling information or the imported list.

select\_build Integer. Default to the latest model build. select\_build = 0 selects the initial

model. select\_build = 1 selects the first refresh model.

InputCollect List. Contains all input parameters for the model. Required when robyn\_object

is not provided.

OutputCollect List. Containing all model result. Required when robyn\_object is not pro-

vided.

select\_model Character. A model SolID. When robyn\_object is provided, select\_model

defaults to the already selected SolID. When robyn\_object is not provided, select\_model must be provided with InputCollect and OutputCollect, and

must be one of OutputCollect\$allSolutions.

json\_file Character. JSON file to import previously exported inputs or recreate a model.

To generate this file, use robyn\_write(). If you didn't export your data in the json file as "raw\_data", dt\_input must be provided; dt\_holidays input is

optional.

scenario Character. Accepted options are: "max\_response", "target\_efficiency".

Scenario "max\_response" answers the question: "What's the potential revenue/conversions lift with the same (or custom) spend level in date\_range and what is the allocation and expected response mix?" Scenario "target\_efficiency"

12 robyn\_allocator

optimizes ROAS or CPA and answers the question: "What's the potential revenue/conversions lift and spend levels based on a target\_value for CPA/ROAS and what is the allocation and expected response mix?" Deprecated scenario: "max\_response\_expected\_spend".

total\_budget Numeric. Total marketing budget for all paid channels for the period in date\_range.

target\_value Numeric. When using the scenario "target\_efficiency", target\_value is the desired ROAS or CPA with no upper spend limit. Default is set to 80% of initial

ROAS or 120% of initial CPA, when "target\_value = NULL".

date\_range Character. Date(s) to apply adstocked transformations and pick mean spends per

channel. Set one of: "all", "last", or "last\_n" (where n is the last N dates available), date (i.e. "2022-03-27"), or date range (i.e. c("2022-01-01", "2022-12-31")).

Default to "all".

channel\_constr\_low, channel\_constr\_up

Numeric vectors. The lower and upper bounds for each paid media variable when maximizing total media response. For example, channel\_constr\_low = 0.7 means minimum spend of the variable is 70 average, using non-zero spend values, within date\_min and date\_max date range. Both constrains must be length 1 (same for all values) OR same length and order as paid\_media\_selected. It's not recommended to 'exaggerate' upper bounds, especially if the new level is way higher than historical level. Lower bound must be >=0.01, and upper bound should be < 5.

channel\_constr\_multiplier

Numeric. Default to 3. For example, if channel\_constr\_low and channel\_constr\_up are 0.8 to 1.2, the range is 0.4. The allocator will also show the optimum solution for a larger constraint range of  $0.4 \times 3 = 1.2$ , or  $0.4 \times 1.6$ , to show the optimization potential to support allocation interpretation and decision.

optim\_algo Character. Default to "SLSQP\_AUGLAG", short for "Sequential Least-Squares

Quadratic Programming" and "Augmented Lagrangian". Alternatively, ""MMA\_AUGLAG", short for "Methods of Moving Asymptotes". More details see the documentation

of NLopt here.

maxeval Integer. The maximum iteration of the global optimization algorithm. Defaults

to 100000.

constr\_mode Character. Options are "eq" or "ineq", indicating constraints with equality or

inequality.

keep\_zero\_coefs

Boolean. By default, zero coefficient (betas) channels will be removed to avoid

spending budget were there is no impact.

plots Boolean. Generate plots?

plot\_folder Character. Path for saving plots and files. Default to robyn\_object and saves

plot in the same directory as robyn\_object.

plot\_folder\_sub

Character. Sub path for saving plots. Will overwrite the default path with times-

tamp or, for refresh and allocator, simply overwrite files.

export Boolean. Export outcomes into local files?

quiet Boolean. Keep messages off?

robyn\_calibrate 13

```
ui Boolean. Save additional outputs for UI usage. List outcome.

... Additional parameters passed to robyn_outputs().

x robyn_allocator() output.
```

#### Value

A list object containing allocator result.

List. Contains optimized allocation results and plots.

# Examples

```
## Not run:
# Having InputCollect and OutputCollect results
AllocatorCollect <- robyn_allocator(</pre>
  InputCollect = InputCollect,
  OutputCollect = OutputCollect,
  select_model = "1_2_3",
  scenario = "max_response",
  channel_constr_low = 0.7,
  channel_constr_up = c(1.2, 1.5, 1.5, 1.5, 1.5),
  channel_constr_multiplier = 4,
  date_range = "last_26",
  export = FALSE
# Print a summary
print(AllocatorCollect)
# Plot the allocator one-pager
plot(AllocatorCollect)
## End(Not run)
```

robyn\_calibrate

Robyn Calibration Function - BETA

# **Description**

robyn\_calibrate() consumes source of truth or proxy data for saturation or adstock curve estimation. This is an experimental feature and can be used independently from Robyn's main model.

```
robyn_calibrate(
  df_curve = NULL,
  curve_type = NULL,
  force_shape = NULL,
  hp_bounds = NULL,
  max_trials = 10,
  max_iters = 2500,
```

robyn\_calibrate

```
loss_min_step_rel = 1e-04,
loss_stop_rel = 0.05,
burn_in_rel = 0.1,
sim_n = 30,
hp_interval = 0.5,
quiet = FALSE,
...
)
```

# **Arguments**

df_curve	data.frame. Requires two columns named spend and response. Recommended sources of truth are Halo R&F or Meta conversion lift.
curve_type	Character. Currently only allows "saturation_reach_hill" and only supports Hill function.
force_shape	Character. Allows $c("c", "s")$ with default NULL that's no shape forcing. It's recommended for offline media to have "c" shape, while for online can be "s" or NULL. Shape forcing only works if hp_bounds is null.
hp_bounds	list. Currently only allows Hill for saturation. Ranges for alpha and gamma are provided as Hill parameters. If NULL, hp_bounds takes on default ranges.
max_trials	integer. Different trials have different starting point and provide diversified sampling paths. Default to $10$ .
max_iters	integer. Loss is minimized while iteration increases. Default to 2500.
loss_min_step_r	rel
	numeric. Default to 0.01 and value is between 0-0.1. 0.01 means the optimisation is considered converged if error minimization is <1 percent of maximal error.
loss_stop_rel	numeric. Default is 0.05 and value is between 0-0.5. 0.05 means 5 percent of the max_iters is used as the length of iterations to calculate the mean error for convergence.
burn_in_rel	numeric. Default to $0.1$ and value is between $0.0.5$ . $0.1$ means $10$ percent of iterations is used as burn-in period.
sim_n	integer. Number of simulation for plotting fitted curve.
hp_interval	numeric. Default to $0.95$ and is between $0.8$ -1. $0.95$ means $2.5$ - $97.5$ percent percentile are used as parameter range for output.
quiet	Boolean. Keep messages off?
	Additional parameters passed to robyn_outputs().

# Value

List. Class: curve\_out. Contains the results of all trials and iterations modeled.

robyn\_clusters 15

#### **Examples**

```
## Not run:
# Dummy input data for Meta spend. This is derived from Halo's reach & frequency data.
# Note that spend and response need to be cumulative metrics.
data("df_curve_reach_freq")

# Using reach saturation from Halo as proxy
curve_out <- robyn_calibrate(
    df_curve = df_curve_reach_freq,
    curve_type = "saturation_reach_hill"
)

# For the simulated reach and frequency dataset, it's recommended to use
# "reach 1+" for gamma lower bound and "reach 10+" for gamma upper bound
facebook_I_gammas <- c(
    curve_out[["curve_collect"]][["reach 1+"]][["hill"]][["gamma_best"]],
    curve_out[["curve_collect"]][["reach 10+"]][["hill"]][["gamma_best"]])
print(facebook_I_gammas)

## End(Not run)</pre>
```

robyn\_clusters

Clustering to Reduce Number of Models based on ROI and Errors

# Description

robyn\_clusters() uses output from robyn\_run(), to reduce the number of models and create bootstrapped confidence interval and help the user pick up the best (lowest combined error) of the most different kinds (clusters) of models.

```
robyn_clusters(
  input,
  dep_var_type,
  cluster_by = "hyperparameters",
  all_media = NULL,
  k = "auto",
  wss_var = 0.06,
  max_clusters = 10,
  limit = 1,
  weights = rep(1, 3),
  dim_red = "PCA",
  quiet = FALSE,
  export = FALSE,
  seed = 123,
  ...
)
```

robyn\_clusters

# Arguments

input	robyn_export()'s output or pareto_aggregated.csv results.
dep_var_type	Character. For dep_var_type 'revenue', ROI is used for clustering. For conversion', CPA is used for clustering.
cluster_by	Character. Any of: "performance" or "hyperparameters".
all_media	$Character\ vector.\ Default\ to\ Input Collect \$ all\_media.\ Includes\ Input Collect \$ paid\_media\_spends\ and\ Input Collect \$ organic\_vars.$
k	Integer. Number of clusters
wss_var	Numeric. Used to pick automatic k value, when k is NULL based on WSS variance while considering limit clusters. Values between (0, 1). Default value could be 0.05 to consider convergence.
max_clusters	Integer. Maximum number of clusters.
limit	Integer. Top N results per cluster. If kept in "auto", will select k as the cluster in which the WSS variance was less than 5%.
weights	Vector, size 3. How much should each error weight? Order: nrmse, decomp.rssd, mape. The highest the value, the closer it will be scaled to origin. Each value will be normalized so they all sum 1.
dim_red	Character. Select dimensionality reduction technique. Pass any of: c("PCA", "tSNE", "all", "none").
quiet	Boolean. Keep quiet? If not, print messages.
export	Export plots into local files?
seed	Numeric. Seed for reproducibility
	Additional parameters passed to lares::clusterKmeans().

# Value

List. Clustering results as labeled data.frames and plots.

# Author(s)

Bernardo Lares (bernardolares@meta.com)

# **Examples**

```
## Not run:
# Having InputCollect and OutputCollect results
cls <- robyn_clusters(
  input = OutputCollect,
  all_media = InputCollect$all_media,
  k = 3, limit = 2,
  weights = c(1, 1, 1.5)
)
## End(Not run)</pre>
```

robyn\_converge 17

robyn_converge	Check Models Convergence
----------------	--------------------------

# **Description**

robyn\_converge() consumes robyn\_run() outputs and calculate convergence status and builds convergence plots. Convergence is calculated by default using the following criteria (having kept the default parameters: sd\_qtref = 3 and med\_lowb = 2):

Criteria #1: Last quantile's standard deviation < first 3 quantiles' mean standard deviation

**Criteria #2:** Last quantile's absolute median < absolute first quantile's absolute median - 2 \* first 3 quantiles' mean standard deviation

Both mentioned criteria have to be satisfied to consider MOO convergence.

# Usage

```
robyn_converge(
  OutputModels,
  n_cuts = 20,
  sd_qtref = 3,
  med_lowb = 2,
  nrmse_win = c(0, 0.998),
  ...
)
```

# **Arguments**

OutputModels	List. Output from robyn_run().
n_cuts	Integer. Default to 20 (5% cuts each).
sd_qtref	Integer. Reference quantile of the error convergence rule for standard deviation (Criteria #1). Defaults to 3.
med_lowb	Integer. Lower bound distance of the error convergence rule for median. (Criteria $\#2$ ). Default to 3.
nrmse_win	Numeric vector. Lower and upper quantiles thresholds to winsorize NRMSE. Set values within $[0,1]$ ; default: $c(0,0.998)$ which is $1/500$ .
	Additional parameters

#### Value

List. Plots and MOO convergence results.

## **Examples**

```
## Not run:
# Having OutputModels results
MOO <- robyn_converge(
   OutputModels,
   n_cuts = 10,
   sd_qtref = 3,
   med_lowb = 3
)
## End(Not run)</pre>
```

robyn\_inputs

Input Data Check & Transformation

# Description

robyn\_inputs() is the function to input all model parameters and check input correctness for the initial model build. It includes the engineering process results that conducts trend, season, holiday & weekday decomposition using Facebook's time-series forecasting library prophet and fit a non-linear model to spend and exposure metrics in case exposure metrics are used in paid\_media\_vars.

```
robyn_inputs(
  dt_input = NULL,
  dep_var = NULL,
  dep_var_type = NULL,
  date_var = "auto",
  paid_media_spends = NULL,
  paid_media_vars = NULL,
  paid_media_signs = NULL,
  organic_vars = NULL,
  organic_signs = NULL,
  context_vars = NULL,
  context_signs = NULL,
  factor_vars = NULL,
  dt_holidays = Robyn::dt_prophet_holidays,
  prophet_vars = NULL,
  prophet_signs = NULL,
  prophet_country = NULL,
  adstock = NULL,
  hyperparameters = NULL,
  window_start = NULL,
 window_end = NULL,
  calibration_input = NULL,
  json_file = NULL,
```

```
InputCollect = NULL,
...
)

## S3 method for class 'robyn_inputs'
print(x, ...)
```

## **Arguments**

dt\_input data.frame. Raw input data. Load simulated dataset using data("dt\_simulated\_weekly")

dep\_var Character. Name of dependent variable. Only one allowed

dep\_var\_type Character. Type of dependent variable as "revenue" or "conversion". Will be

used to calculate ROI or CPI, respectively. Only one allowed and case sensitive.

date\_var Character. Name of date variable. Daily, weekly and monthly data supported.

date\_var must have format "2020-01-01" (YYY-MM-DD). Default to auto-

matic date detection.

paid\_media\_spends

Character vector. Names of the paid media variables. The values on each of these variables must be numeric. Also, paid\_media\_spends must have same order and length as paid\_media\_vars respectively.

paid\_media\_vars

Character vector. Names of the paid media variables' exposure level metrics (impressions, clicks, GRP etc) other than spend. The values on each of these variables must be numeric. These variables are not being used to train the model but to check relationship and recommend to split media channels into sub-channels (e.g. fb\_retargeting, fb\_prospecting, etc.) to gain more variance. paid\_media\_vars must have same order and length as paid\_media\_spends respectively and is not required.

paid\_media\_signs

Character vector. Choose any of c("default", "positive", "negative"). Control the signs of coefficients for paid\_media\_vars. Must have same order and same length as paid\_media\_vars. By default, all values are set to 'positive'.

organic\_vars

Character vector. Typically newsletter sendings, push-notifications, social media posts etc. Compared to paid\_media\_vars organic\_vars are often marketing activities without clear spends.

organic\_signs

Character vector. Choose any of "default", "positive", "negative". Control the signs of coefficients for organic\_vars Must have same order and same length as organic\_vars. By default, all values are set to "positive".

context\_vars

Character vector. Typically competitors, price & promotion, temperature, unemployment rate, etc.

context\_signs

Character vector. Choose any of c("default", "positive", "negative"). Control the signs of coefficients for context\_vars. Must have same order and same length as context\_vars. By default it's set to 'defualt'.

factor\_vars

Character vector. Specify which of the provided variables in organic\_vars or context\_vars should be forced as a factor.

dt\_holidays data.frame. Raw input holiday data. Load standard Prophet holidays using data("dt\_prophet\_holidays")

prophet\_vars Character vector. Include any of "trend", "season", "weekday", "monthly", "holiday" or NULL. Highly recommended to use all for daily data and "trend", "season", "holiday" for weekly and above cadence. Set to NULL to skip prophet's functionality.

prophet\_signs Character vector. Choose any of "default", "positive", "negative". Control the signs of coefficients for prophet\_vars. Must have same order and same length as prophet\_vars. By default, all values are set to "default".

Character. Only one country allowed. Includes national holidays for all countries, whose list can be found loading data("dt\_prophet\_holidays").

Character. Choose any of "geometric", "weibull\_cdf", "weibull\_pdf". Weibull adstock is a two-parametric function and thus more flexible, but takes longer time than the traditional geometric one-parametric function. CDF, or cumulative density function of the Weibull function allows changing decay rate over time in both C and S shape, while the peak value will always stay at the first period, meaning no lagged effect. PDF, or the probability density function, enables peak value occurring after the first period when shape >=1, allowing lagged effect. Run plot\_adstock() to see the difference visually. Time estimation: with geometric adstock, 2000 iterations \* 5 trials on 8 cores, it takes less than 30 minutes. Both Weibull options take up to twice as much time.

List. Contains hyperparameter lower and upper bounds. Names of elements in list must be identical to output of hyper\_names(). To fix hyperparameter values, provide only one value.

Character. Set start and end dates of modelling period. Recommended to not start in the first date in dataset to gain adstock effect from previous periods. Also, columns to rows ratio in the input data to be >=10:1, or in other words at least 10 observations to 1 independent variable. This window will determine the date range of the data period within your dataset you will be using to specifically regress the effects of media, organic and context variables on your dependent variable. We recommend using a full dt\_input dataset with a minimum of 1 year of history, as it will be used in full for the model calculation of trend, seasonality and holidays effects. Whereas the window period will determine how much of the full data set will be used for media, organic and context variables.

data.frame. Optional. Provide experimental results to calibrate. Your input should include the following values for each experiment: channel, liftStartDate, liftEndDate, liftAbs, spend, confidence, metric. You can calibrate any spend or organic variable with a well designed experiment. You can also use experimental results from multiple channels; to do so, provide concatenated channel value, i.e. "channel\_A+channel\_B". Check "Guide for calibration source" section.

Character. JSON file to import previously exported inputs or recreate a model. To generate this file, use robyn\_write(). If you didn't export your data in

prophet\_country

adstock

hyperparameters

window\_start, window\_end

calibration\_input

json\_file

```
the json file as "raw_data", dt_input must be provided; dt_holidays input is optional.

InputCollect Default to NULL. robyn_inputs's output when hyperparameters are not yet set.

Additional parameters passed to prophet functions.

x robyn_inputs() output.
```

#### Value

List. Contains all input parameters and modified results using Robyn:::robyn\_engineering(). This list is ready to be used on other functions like robyn\_run() and print(). Class: robyn\_inputs.

#### **Guide for calibration source**

- 1. We strongly recommend to use experimental and causal results that are considered ground truth to calibrate MMM. Usual experiment types are people-based (e.g. Facebook conversion lift) and geo-based (e.g. Facebook GeoLift).
- 2. Currently, Robyn only accepts point-estimate as calibration input. For example, if 10k\$ spend is tested against a hold-out for channel A, then input the incremental return as point-estimate as the example below.
- 3. The point-estimate has to always match the spend in the variable. For example, if channel A usually has 100k\$ weekly spend and the experimental HO is 70

#### **Examples**

```
# Using dummy simulated data
InputCollect <- robyn_inputs(</pre>
 dt_input = Robyn::dt_simulated_weekly,
 dt_holidays = Robyn::dt_prophet_holidays,
 date_var = "DATE",
 dep_var = "revenue";
 dep_var_type = "revenue",
 prophet_vars = c("trend", "season", "holiday"),
 prophet_country = "DE",
 context_vars = c("competitor_sales_B", "events"),
 paid_media_spends = c("tv_S", "ooh_S", "print_S", "facebook_S", "search_S"),
 paid_media_vars = c("tv_S", "ooh_S", "print_S", "facebook_I", "search_clicks_P"),
 organic_vars = "newsletter",
 factor_vars = "events",
 window_start = "2016-11-23",
 window_end = "2018-08-22",
 adstock = "geometric",
 # To be defined separately
 hyperparameters = NULL,
 calibration_input = NULL
print(InputCollect)
```

22 robyn\_mmm

robyn\_mmm

Core MMM Function

#### **Description**

robyn\_mmm() function activates Nevergrad to generate samples of hyperparameters, conducts media transformation within each loop, fits the Ridge regression, calibrates the model optionally, decomposes responses and collects the result. It's an inner function within robyn\_run().

#### Usage

```
robyn_mmm(
  InputCollect,
  hyper_collect,
  iterations,
  cores,
  nevergrad_algo,
  intercept = TRUE,
  intercept_sign,
  ts_validation = TRUE,
  add_penalty_factor = FALSE,
  objective_weights = NULL,
  dt_hyper_fixed = NULL,
  rssd_zero_penalty = TRUE,
  refresh = FALSE,
  trial = 1L,
  seed = 123L,
  quiet = FALSE,
)
model_decomp(inputs = list())
```

#### **Arguments**

InputCollect List. Contains all input parameters for the model. Required when robyn\_object

is not provided.

hyper\_collect List. Containing hyperparameter bounds. Defaults to InputCollect\$hyperparameters.

iterations Integer. Number of iterations to run.

cores Integer. Default to parallel::detectCores() - 1 (all cores except one). Set

to 1 if you want to turn parallel computing off.

nevergrad\_algo Character. Default to "TwoPointsDE". Options are c("DE", "TwoPointsDE",

"One Plus One", "Double Fast GAD is crete One Plus One", "Discrete One Plus One", "Portfolio Discrete One Plus One", "Naive TBPSA", "cGA", "Random Search").

intercept Boolean. Should intercept(s) be fitted (default=TRUE) or set to zero (FALSE).

23 robyn\_mmm

intercept\_sign Character. Choose one of "non\_negative" (default) or "unconstrained". By default, if intercept is negative, Robyn will drop intercept and refit the model. Consider changing intercept\_sign to "unconstrained" when there are context\_vars with large positive values.

ts\_validation

Boolean. When set to TRUE, Robyn will split data by test, train, and validation partitions to validate the time series. By default the "train\_size" range is set to c(0.5, 0.8), but it can be customized or set to a fixed value using the hyperparameters input. For example, if train\_size = 0.7, validation size and test size will both be 0.15 and 0.15. When ts\_validation = FALSE, nrmse train is the objective function; when ts\_validation = TRUE, nrmse\_val is the objective function.

add\_penalty\_factor

Boolean. Add penalty factor hyperparameters to glmnet's penalty.factor to be optimized by nevergrad. Use with caution, because this feature might add too much hyperparameter space and probably requires more iterations to converge.

objective\_weights

Numeric vector. Default to NULL to give equal weights to all objective functions. Order: NRMSE, DECOMP.RSSD, MAPE (when calibration data is provided). When you are not calibrating, only the first 2 values for objective\_weights must be defined, i.e. set c(2, 1) to give double weight to the 1st (NRMSE). This is an experimental feature. There's no research on optimal weight setting. Subjective weights might strongly bias modeling results.

dt\_hyper\_fixed data.frame or named list. Only provide when loading old model results. It consumes hyperparameters from saved csv pareto\_hyperparameters.csv or JSON file to replicate a model.

rssd\_zero\_penalty

Boolean. When TRUE, the objective function DECOMP.RSSD will penalize models with more 0 media effects additionally. In other words, given the same DECOMP.RSSD score, a model with 50% 0-coef variables will get penalized by DECOMP.RSSD \* 1.5 (larger error), while another model with no 0-coef variables gets un-penalized with DECOMP.RSSD \* 1.

refresh Boolean. Set to TRUE when used in robyn\_refresh().

trial Integer. Which trial are we running? Used to ID each model.

seed Integer. For reproducible results when running nevergrad and clustering. Each

trial will increase the seed by 1 unit (i.e. 10 trials with seed 1 will share 9 results

with 10 trials with seed 2).

quiet Boolean. Keep messages off?

Additional parameters passed to robyn\_outputs().

List. Elements to pass sub-functions inputs

#### Value

List. MMM results with hyperparameters values.

24 robyn\_outputs

robyn\_outputs

Evaluate Models and Output Results into Local Files

# **Description**

Pack robyn\_plots(), robyn\_csv(), and robyn\_clusters() outcomes on robyn\_run() results. When UI=TRUE, enriched OutputModels results with additional plots and objects.

Create a plot to visualize the convergence for each of the datasets when running robyn\_run(), especially useful for when using ts\_validation. As a reference, the closer the test and validation convergence points are, the better, given the time-series wasn't overfitted.

```
robyn_outputs(
  InputCollect,
  OutputModels,
 pareto_fronts = "auto",
  calibration_constraint = 0.1,
  plot_folder = NULL,
  plot_folder_sub = NULL,
  plot_pareto = TRUE,
  csv_out = "pareto",
  clusters = TRUE,
  select_model = "clusters",
  ui = FALSE,
  export = TRUE,
  all_sol_json = FALSE,
  quiet = FALSE,
  refresh = FALSE,
)
## S3 method for class 'robyn_outputs'
print(x, ...)
robyn_csv(
  InputCollect,
 OutputCollect,
  csv_out = NULL,
  export = TRUE,
  calibrated = FALSE
)
pareto_front(xi, yi, pareto_fronts = 1, ...)
robyn_immcarr(
```

robyn\_outputs 25

```
InputCollect,
  OutputCollect,
  solID = NULL,
  start_date = NULL,
  end_date = NULL,
)
robyn_plots(
  InputCollect,
 OutputCollect,
  export = TRUE,
 plot_folder = OutputCollect$plot_folder,
)
robyn_onepagers(
  InputCollect,
  OutputCollect,
  select_model = NULL,
  quiet = FALSE,
  export = TRUE,
  plot_folder = OutputCollect$plot_folder,
 baseline_level = 0,
)
ts_validation(OutputModels, quiet = FALSE, ...)
decomp_plot(
  InputCollect,
 OutputCollect,
  solID = NULL,
  exclude = NULL,
  baseline_level = 0
)
```

# **Arguments**

InputCollect, OutputModels

robyn\_inputs() and robyn\_run() outcomes.

pareto\_fronts

Integer. Number of Pareto fronts for the output. pareto\_fronts = 1 returns the best models trading off NRMSE & DECOMP.RSSD. Increase pareto\_fronts to get more model choices. pareto\_fronts = "auto" selects the min fronts that include at least 100 candidates. To customize this threshold, set value with min\_candidates.

calibration\_constraint

Numeric. Default to 0.1 and allows 0.01-0.1. When calibrating, 0.1 means top 10 selection. Lower calibration\_constraint increases calibration accuracy.

26 robyn\_outputs

plot\_folder Character. Path for saving plots and files. Default to robyn\_object and saves

plot in the same directory as robyn\_object.

plot\_folder\_sub

Character. Sub path for saving plots. Will overwrite the default path with times-

tamp or, for refresh and allocator, simply overwrite files.

plot\_pareto Boolean. Set to FALSE to deactivate plotting and saving model one-pagers. Used

when testing models.

csv\_out Character. Accepts "pareto" or "all". Default to "pareto". Set to "all" will output

all iterations as csv. Set NULL to skip exports into CSVs.

clusters Boolean. Apply robyn\_clusters() to output models?

select\_model Character vector. Which models (by solID) do you wish to plot the one-pagers

and export? Default will take top robyn\_clusters() results.

ui Boolean. Save additional outputs for UI usage. List outcome.

export Boolean. Export outcomes into local files?

all\_sol\_json Logical. Add all pareto solutions to json export?

quiet Boolean. Keep messages off?

refresh Boolean. Refresh mode

.. Additional parameters passed to robyn\_clusters()

x robyn\_outputs() output.

OutputCollect robyn\_run(..., export = FALSE) output.

calibrated Logical

xi, yi Numeric. Coordinates values per observation.

solID Character vector. Model IDs to plot.

start\_date, end\_date

Character/Date. Dates to consider when calculating immediate and carryover

values per channel.

baseline\_level Integer, from 0 to 5. Aggregate baseline variables, depending on the level of

aggregation you need. Default is 0 for no aggregation. 1 for Intercept only. 2 adding trend. 3 adding all prophet decomposition variables. 4. Adding contextual variables. 5 Adding organic variables. Results will be reflected on the

waterfall chart.

exclude Character vector. Manually exclude variables from plot.

#### Value

(Invisible) list. Class: robyn\_outputs. Contains processed results based on robyn\_run() results.

Invisible NULL.

Invisible list with ggplot plots.

Invisible list with patchwork plot(s).

Invisible list with ggplot plots.

robyn\_refresh 27

robyn\_refresh

Build Refresh Model

#### Description

robyn\_refresh() builds updated models based on the previously built models saved in the Robyn.RDS object specified in robyn\_object. For example, when updating the initial build with 4 weeks of new data, robyn\_refresh() consumes the selected model of the initial build, sets lower and upper bounds of hyperparameters for the new build around the selected hyperparameters of the previous build, stabilizes the effect of baseline variables across old and new builds, and regulates the new effect share of media variables towards the latest spend level. It returns the aggregated results with all previous builds for reporting purposes and produces reporting plots.

You must run robyn\_save() to select and save an initial model first, before refreshing.

When should robyn\_refresh() NOT be used: The robyn\_refresh() function is suitable for updating within "reasonable periods". Two situations are considered better to rebuild model instead of refreshing:

- 1. Most data is new: If initial model was trained with 100 weeks worth of data but we add +50 weeks of new data.
- 2. New variables are added: If initial model had less variables than the ones we want to start using on new refresh model.

```
robyn_refresh(
  json_file = NULL,
  robyn_object = NULL,
  dt_input = NULL,
  dt_holidays = Robyn::dt_prophet_holidays,
  refresh_steps = 4,
  refresh_mode = "manual",
  refresh_iters = 1000,
  refresh_trials = 3,
  bounds_freedom = NULL,
  plot_folder = NULL,
  plot_pareto = TRUE,
  version_prompt = FALSE,
  export = TRUE,
  calibration_input = NULL,
  objective_weights = NULL,
)
## S3 method for class 'robyn_refresh'
print(x, ...)
```

28 robyn\_refresh

```
## S3 method for class 'robyn_refresh'
plot(x, ...)
```

## **Arguments**

export

Character. JSON file to import previously exported inputs or recreate a model. json\_file To generate this file, use robyn\_write(). If you didn't export your data in the json file as "raw\_data", dt\_input must be provided; dt\_holidays input is optional. robyn\_object Character or List. Path of the Robyn. RDS object that contains all previous modeling information or the imported list. data.frame. Should include all previous data and newly added data for the redt\_input fresh. dt\_holidays data.frame. Raw input holiday data. Load standard Prophet holidays using data("dt\_prophet\_holidays"). refresh\_steps Integer. It controls how many time units the refresh model build move forward. For example, refresh\_steps = 4 on weekly data means the InputCollect\$window\_start & InputCollect\$window\_end move forward 4 weeks. If refresh\_steps is smaller than the number of newly provided data points, then Robyn would only use the first N steps of the new data. refresh\_mode Character. Options are "auto" and "manual". In auto mode, the robyn\_refresh() function builds refresh models with given refresh\_steps repeatedly until there's no more data available. I manual mode, the robyn\_refresh() only moves forward refresh\_steps only once. "auto" mode has been deprecated when using json\_file input. refresh\_iters Integer. Iterations per refresh. Rule of thumb is, the more new data added, the more iterations needed. More reliable recommendation still needs to be investigated. refresh\_trials Integer. Trials per refresh. Defaults to 5 trials. More reliable recommendation still needs to be investigated. bounds\_freedom Numeric. Percentage of freedom we'd like to allow for the new hyperparameters values compared with the model to be refreshed. If set to NULL (default) the value will be calculated as refresh steps / rollingWindowLength. Applies to all hyperparameters. plot\_folder Character. Path for saving plots and files. Default to robyn\_object and saves plot in the same directory as robyn\_object. Boolean. Set to FALSE to deactivate plotting and saving model one-pagers. Used plot\_pareto when testing models. version\_prompt Logical. If FALSE, the model refresh version will be selected based on the smallest combined error of normalized NRMSE, DECOMP.RSSD, MAPE. If TRUE, a prompt will be presented to the user to select one of the refreshed models (one-pagers and Pareto CSV files will already be generated).

Boolean. Export outcomes into local files?

robyn\_refresh 29

#### calibration\_input

data.frame. Optional. Provide experimental results to calibrate. Your input should include the following values for each experiment: channel, liftStartDate, liftEndDate, liftAbs, spend, confidence, metric. You can calibrate any spend or organic variable with a well designed experiment. You can also use experimental results from multiple channels; to do so, provide concatenated channel value, i.e. "channel\_A+channel\_B". Check "Guide for calibration source" section.

objective\_weights

Numeric vector. Default to NULL to give equal weights to all objective functions. Order: NRMSE, DECOMP.RSSD, MAPE (when calibration data is provided). When you are not calibrating, only the first 2 values for objective\_weights must be defined, i.e. set c(2, 1) to give double weight to the 1st (NRMSE). This is an experimental feature. There's no research on optimal weight setting. Subjective weights might strongly bias modeling results.

... Additional parameters to overwrite original custom parameters passed into initial model.

x robyn\_refresh() output.

#### Value

List. The Robyn object, class robyn\_refresh.

List. Same as robyn\_run() but with refreshed models.

#### **Examples**

```
## Not run:
# Loading dummy data
data("dt_simulated_weekly")
data("dt_prophet_holidays")
# Set the (pre-trained and exported) Robyn model JSON file
json_file <- "~/Robyn_202208081444_init/RobynModel-2_55_4.json"
# Run \code{robyn_refresh()} with 13 weeks cadence in auto mode
Robyn <- robyn_refresh(</pre>
 json_file = json_file,
 dt_input = dt_simulated_weekly,
 dt_holidays = Robyn::dt_prophet_holidays,
 refresh_steps = 13,
 refresh_mode = "auto",
 refresh_iters = 200,
 refresh\_trials = 5
)
# Run \code{robyn_refresh()} with 4 weeks cadence in manual mode
json_file2 <- "~/Robyn_202208081444_init/Robyn_202208090847_rf/RobynModel-1_2_3.json"
Robyn <- robyn_refresh(</pre>
 json_file = json_file2,
 dt_input = dt_simulated_weekly,
 dt_holidays = Robyn::dt_prophet_holidays,
 refresh_steps = 4,
```

30 robyn\_response

```
refresh_mode = "manual",
refresh_iters = 200,
refresh_trials = 5
)
## End(Not run)
```

robyn\_response

Response and Saturation Curves

# Description

robyn\_response() returns the response for a given spend level of a given paid\_media\_vars from a selected model result and selected model build (initial model, refresh model, etc.).

# Usage

```
robyn_response(
   InputCollect = NULL,
   OutputCollect = NULL,
   json_file = NULL,
   select_build = NULL,
   select_model = NULL,
   metric_name = NULL,
   metric_value = NULL,
   date_range = NULL,
   dt_hyppar = NULL,
   dt_coef = NULL,
   quiet = FALSE,
   ...
)
```

# Arguments

InputCollect List. Contains all input parameters for the model. Required when robyn\_object

is not provided.

OutputCollect List. Containing all model result. Required when robyn\_object is not pro-

vided.

json\_file Character. JSON file to import previously exported inputs or recreate a model.

To generate this file, use robyn\_write(). If you didn't export your data in the json file as "raw\_data", dt\_input must be provided; dt\_holidays input is

optional.

select\_build Integer. Default to the latest model build. select\_build = 0 selects the initial

model. select\_build = 1 selects the first refresh model.

robyn\_response 31

select_model	Character. A model SolID. When robyn_object is provided, select_model defaults to the already selected SolID. When robyn_object is not provided, select_model must be provided with InputCollect and OutputCollect, and must be one of OutputCollect\$allSolutions.
metric_name	A character. Selected media variable for the response. Must be one value from paid_media_spends, paid_media_vars or organic_vars
metric_value	Numeric. Desired metric value to return a response for.
date_range	Character. Date(s) to apply adstocked transformations and pick mean spends per channel. Set one of: "all", "last", or "last_n" (where n is the last N dates available), date (i.e. "2022-03-27"), or date range (i.e. c("2022-01-01", "2022-12-31")). Default to "all".
dt_hyppar	A data.frame. When json_file is not provided, use dt_hyppar = OutputCollect\$resultHypParam. It must be provided along select_model, dt_coef and InputCollect.
dt_coef	A data.frame. When json_file is not provided, use dt_coef = OutputCollect\$xDecompAgg. It must be provided along select_model, dt_hyppar and InputCollect.
quiet	Boolean. Keep messages off?
	Additional parameters passed to robyn_outputs().

#### Value

List. Response value and plot. Class: robyn\_response.

# **Examples**

```
## Not run:
# Having InputCollect and OutputCollect objects
## Recreate original saturation curve
Response <- robyn_response(</pre>
  InputCollect = InputCollect,
  OutputCollect = OutputCollect,
  select_model = select_model,
  metric_name = "facebook_S"
Response$plot
## Or you can call a JSON file directly (a bit slower)
# Response <- robyn_response(</pre>
  json_file = "your_json_path.json",
# dt_input = dt_simulated_weekly,
# dt_holidays = dt_prophet_holidays,
  metric_name = "facebook_S"
# )
## Get the "next 100 dollar" marginal response on Spend1
Spend1 <- 20000
Response1 <- robyn_response(</pre>
  InputCollect = InputCollect,
  OutputCollect = OutputCollect,
  select_model = select_model,
```

32 robyn\_response

```
metric_name = "facebook_S",
 metric_value = Spend1, # total budget for date_range
 date_range = "last_1" # last two periods
Response1$plot
Spend2 <- Spend1 + 100
Response2 <- robyn_response(</pre>
 InputCollect = InputCollect,
 OutputCollect = OutputCollect,
 select_model = select_model,
 metric_name = "facebook_S",
 metric_value = Spend2,
 date_range = "last_1"
)
# ROAS for the 100$ from Spend1 level
(Response2$response_total - Response1$response_total) / (Spend2 - Spend1)
## Get response from for a given budget and date_range
Spend3 <- 100000
Response3 <- robyn_response(</pre>
 InputCollect = InputCollect,
 OutputCollect = OutputCollect,
 select_model = select_model,
 metric_name = "facebook_S",
 metric_value = Spend3, # total budget for date_range
 date_range = "last_5" # last 5 periods
Response3$plot
## Example of getting paid media exposure response curves
imps <- 10000000
response_imps <- robyn_response(</pre>
 InputCollect = InputCollect,
 OutputCollect = OutputCollect,
 select_model = select_model,
 metric_name = "facebook_I",
 metric_value = imps
response_imps$response_total / imps * 1000
response_imps$plot
## Example of getting organic media exposure response curves
sendings <- 30000
response_sending <- robyn_response(</pre>
 InputCollect = InputCollect,
 OutputCollect = OutputCollect,
 select_model = select_model,
 metric_name = "newsletter",
 metric_value = sendings
)
# response per 1000 sendings
response_sending$response_total / sendings * 1000
```

33 robyn\_run

```
response_sending$plot
## End(Not run)
```

robyn\_run

Robyn Modelling Function

#### **Description**

robyn\_run() consumes robyn\_input() outputs, runs robyn\_mmm(), and collects all modeling results.

# Usage

```
robyn_run(
  InputCollect = NULL,
  dt_hyper_fixed = NULL,
  json_file = NULL,
  ts_validation = FALSE,
  add_penalty_factor = FALSE,
  refresh = FALSE,
  seed = 123L,
  quiet = FALSE,
  cores = NULL,
  trials = 5,
  iterations = 2000,
  rssd_zero_penalty = TRUE,
  objective_weights = NULL,
  nevergrad_algo = "TwoPointsDE",
  intercept = TRUE,
  intercept_sign = "non_negative",
  lambda_control = NULL,
  outputs = FALSE,
)
## S3 method for class 'robyn_models'
print(x, ...)
```

# Arguments

InputCollect

List. Contains all input parameters for the model. Required when robyn\_object is not provided.

dt\_hyper\_fixed data.frame or named list. Only provide when loading old model results. It consumes hyperparameters from saved csv pareto\_hyperparameters.csv or JSON file to replicate a model.

34 robyn\_run

json\_file

Character. JSON file to import previously exported inputs or recreate a model. To generate this file, use robyn\_write(). If you didn't export your data in the json file as "raw\_data", dt\_input must be provided; dt\_holidays input is optional.

ts\_validation

Boolean. When set to TRUE, Robyn will split data by test, train, and validation partitions to validate the time series. By default the "train\_size" range is set to c(0.5, 0.8), but it can be customized or set to a fixed value using the hyperparameters input. For example, if  $train_size = 0.7$ , validation size and test size will both be 0.15 and 0.15. When  $ts_validation = FALSE$ ,  $train_size = 0.7$ , validation; when  $ts_validation = TRUE$ ,  $train_size = 0.7$ ,

add\_penalty\_factor

Boolean. Add penalty factor hyperparameters to glmnet's penalty.factor to be optimized by nevergrad. Use with caution, because this feature might add too much hyperparameter space and probably requires more iterations to converge.

refresh Boolean. Set to TRUE when used in robyn\_refresh().

seed Integer. For reproducible results when running nevergrad and clustering. Each

trial will increase the seed by 1 unit (i.e. 10 trials with seed 1 will share 9 results

with 10 trials with seed 2).

quiet Boolean. Keep messages off?

cores Integer. Default to parallel::detectCores() - 1 (all cores except one). Set

to 1 if you want to turn parallel computing off.

trials Integer. Recommended 5 for default nevergrad\_algo = "TwoPointsDE".

iterations Integer. Recommended 2000 for default when using nevergrad\_algo = "TwoPointsDE".

rssd\_zero\_penalty

Boolean. When TRUE, the objective function DECOMP.RSSD will penalize models with more 0 media effects additionally. In other words, given the same DECOMP.RSSD score, a model with 50% 0-coef variables will get penalized by DECOMP.RSSD \* 1.5 (larger error), while another model with no 0-coef variables gets un-penalized with DECOMP.RSSD \* 1.

objective\_weights

Numeric vector. Default to NULL to give equal weights to all objective functions. Order: NRMSE, DECOMP.RSSD, MAPE (when calibration data is provided). When you are not calibrating, only the first 2 values for objective\_weights must be defined, i.e. set c(2, 1) to give double weight to the 1st (NRMSE). This is an experimental feature. There's no research on optimal weight setting. Subjective weights might strongly bias modeling results.

 $nevergrad\_algo \quad Character. \ \ Default \ to \ "TwoPointsDE". \ \ Options \ are \ c ("DE", "TwoPointsDE", \ \ )$ 

"OnePlusOne", "DoubleFastGADiscreteOnePlusOne", "DiscreteOnePlusOne", "PortfolioDiscreteOnePlusOne", "NaiveTBPSA", "CGA", "RandomSearch").

intercept Boolean. Should intercept(s) be fitted (default=TRUE) or set to zero (FALSE).

intercept\_sign Character. Choose one of "non\_negative" (default) or "unconstrained". By default, if intercept is negative, Robyn will drop intercept and refit the model. Consider changing intercept\_sign to "unconstrained" when there are context\_vars

with large positive values.

robyn\_save 35

```
lambda_control Deprecated in v3.6.0.

outputs Boolean. If set to TRUE, will run robyn_run() and robyn_outputs(), returning a list with OutputModels and OutputCollect results.

... Additional parameters passed to robyn_outputs().

x robyn_models() output.
```

## Value

List. Class: robyn\_models. Contains the results of all trials and iterations modeled.

 $List.\ Contains\ all\ trained\ models.\ Class:\ robyn\_models.$ 

# **Examples**

```
## Not run:
# Having InputCollect results
OutputModels <- robyn_run(
   InputCollect = InputCollect,
   cores = 2,
   iterations = 200,
   trials = 1
)
## End(Not run)</pre>
```

robyn\_save

Export Robyn Model to Local File [DEPRECATED]

#### **Description**

Use robyn\_save() to select and save as .RDS file the initial model.

```
robyn_save(
   InputCollect,
   OutputCollect,
   robyn_object = NULL,
   select_model = NULL,
   dir = OutputCollect$plot_folder,
   quiet = FALSE,
   ...
)

## S3 method for class 'robyn_save'
print(x, ...)
## S3 method for class 'robyn_save'
```

36 robyn\_train

```
plot(x, ...)
robyn_load(robyn_object, select_build = NULL, quiet = FALSE)
```

# **Arguments**

InputCollect List. Contains all input parameters for the model. Required when robyn\_object

is not provided.

OutputCollect List. Containing all model result. Required when robyn\_object is not pro-

vided.

robyn\_object Character or List. Path of the Robyn.RDS object that contains all previous mod-

eling information or the imported list.

select\_model Character. A model SolID. When robyn\_object is provided, select\_model

defaults to the already selected SolID. When robyn\_object is not provided, select\_model must be provided with InputCollect and OutputCollect, and

 $must\ be\ one\ of\ {\tt OutputCollect\$allSolutions}.$ 

dir Character. Existing directory to export JSON file to.

quiet Boolean. Keep messages off?

... Additional parameters passed to robyn\_outputs().

x robyn\_save() output.

select\_build Integer. Default to the latest model build. select\_build = 0 selects the initial

model. select\_build = 1 selects the first refresh model.

#### Value

(Invisible) list with filename and summary. Class: robyn\_save. (Invisible) list with imported results

robyn\_train

Train Robyn Models

#### **Description**

robyn\_train() consumes output from robyn\_input() and runs the robyn\_mmm() on each trial.

```
robyn_train(
   InputCollect,
   hyper_collect,
   cores,
   iterations,
   trials,
   intercept_sign,
   intercept,
```

robyn\_train 37

```
nevergrad_algo,
dt_hyper_fixed = NULL,
ts_validation = TRUE,
add_penalty_factor = FALSE,
objective_weights = NULL,
rssd_zero_penalty = TRUE,
refresh = FALSE,
seed = 123,
quiet = FALSE
)
```

#### **Arguments**

InputCollect List. Contains all input parameters for the model. Required when robyn\_object

is not provided.

hyper\_collect List. Containing hyperparameter bounds. Defaults to InputCollect\$hyperparameters.

cores Integer. Default to parallel::detectCores() - 1 (all cores except one). Set

to 1 if you want to turn parallel computing off.

iterations Integer. Recommended 2000 for default when using nevergrad\_algo = "TwoPointsDE".

trials Integer. Recommended 5 for default nevergrad\_algo = "TwoPointsDE".

intercept\_sign Character. Choose one of "non\_negative" (default) or "unconstrained". By de-

fault, if intercept is negative, Robyn will drop intercept and refit the model. Consider changing intercept\_sign to "unconstrained" when there are context\_vars

with large positive values.

intercept Boolean. Should intercept(s) be fitted (default=TRUE) or set to zero (FALSE).

nevergrad\_algo Character. Default to "TwoPointsDE". Options are c("DE", "TwoPointsDE",

"OnePlusOne", "DoubleFastGADiscreteOnePlusOne", "DiscreteOnePlusOne", "PortfolioDiscreteOnePlusOne", "NaiveTBPSA", "cGA", "RandomSearch").

dt\_hyper\_fixed data.frame or named list. Only provide when loading old model results. It consumes hyperparameters from saved csv pareto\_hyperparameters.csv or

JSON file to replicate a model.

ts\_validation Boolean. When set to TRUE, Robyn will split data by test, train, and validation

partitions to validate the time series. By default the "train\_size" range is set to c(0.5, 0.8), but it can be customized or set to a fixed value using the hyperparameters input. For example, if  $train_size = 0.7$ , validation size and test size will both be 0.15 and 0.15. When  $ts_validation = FALSE$ ,  $nrmse_train$  is the objective function; when  $ts_validation = TRUE$ ,  $nrmse_val$  is the objective

function.

add\_penalty\_factor

Boolean. Add penalty factor hyperparameters to glmnet's penalty.factor to be optimized by nevergrad. Use with caution, because this feature might add too much hyperparameter space and probably requires more iterations to converge.

objective\_weights

Numeric vector. Default to NULL to give equal weights to all objective functions. Order: NRMSE, DECOMP.RSSD, MAPE (when calibration data is provided). When you are not calibrating, only the first 2 values for objective\_weights

38 robyn\_update

must be defined, i.e. set c(2, 1) to give double weight to the 1st (NRMSE). This is an experimental feature. There's no research on optimal weight setting. Subjective weights might strongly bias modeling results.

rssd\_zero\_penalty

Boolean. When TRUE, the objective function DECOMP.RSSD will penalize models with more 0 media effects additionally. In other words, given the same DECOMP.RSSD score, a model with 50% 0-coef variables will get penalized by DECOMP.RSSD \* 1.5 (larger error), while another model with no 0-coef variables gets up penalized with DECOMP.RSSD \* 1.

variables gets un-penalized with DECOMP.RSSD \* 1.

refresh Boolean. Set to TRUE when used in robyn\_refresh().

seed Integer. For reproducible results when running nevergrad and clustering. Each

trial will increase the seed by 1 unit (i.e. 10 trials with seed 1 will share 9 results

with 10 trials with seed 2).

quiet Boolean. Keep messages off?

#### Value

List. Iteration results to include in robyn\_run() results.

robyn\_update

Update Robyn Version

# **Description**

Update Robyn version from Github repository for latest "dev" version or from CRAN for latest "stable" version.

#### Usage

```
robyn_update(dev = TRUE, ...)
```

# **Arguments**

dev Boolean. Dev version? If not, CRAN version.

... Parameters to pass to remotes::install\_github or utils::install.packages,

depending on dev parameter.

#### Value

Invisible NULL.

robyn\_write 39

robyn\_write

Import and Export Robyn JSON files

#### **Description**

robyn\_write() generates light JSON files with all the information required to replicate Robyn models. Depending on user inputs, there are 3 use cases: only the inputs data, input data + modeling results data, and input data, modeling results + specifics of a single selected model. To replicate a model, you must provide InputCollect, OutputCollect, and, if OutputCollect contains more than one model, the select\_model.

# Usage

```
robyn_write(
  InputCollect,
  OutputCollect = NULL,
  select_model = NULL,
  dir = OutputCollect$plot_folder,
  add_data = TRUE,
  export = TRUE,
  quiet = FALSE,
 pareto_df = NULL,
)
## S3 method for class 'robyn_write'
print(x, ...)
robyn_read(json_file = NULL, step = 1, quiet = FALSE, ...)
## S3 method for class 'robyn_read'
print(x, ...)
robyn_recreate(json_file, quiet = FALSE, ...)
```

#### **Arguments**

InputCollect robyn\_inputs() output.

OutputCollect robyn\_run(..., export = FALSE) output.

select\_model Character. Which model ID do you want to export into the JSON file?

dir Character. Existing directory to export JSON file to.

add\_data Boolean. Include raw dataset. Useful to recreate models with a single file containing all the required information (no need of CSV).

export Boolean. Export outcomes into local files?

quiet Boolean. Keep messages off?

40 saturation\_hill

pareto_df	Dataframe. Save all pareto solutions to json file.
	Additional parameters to export into a custom Extras element.
x	<pre>robyn_read() or robyn_write() output.</pre>
json_file	Character. JSON file name to read and import.
step	Integer. 1 for import only and 2 for import and output.

# Value

(invisible) List. Contains all inputs and outputs of exported model. Class: robyn\_write.

# **Examples**

```
## Not run:
InputCollectJSON <- robyn_inputs(
    dt_input = Robyn::dt_simulated_weekly,
    json_file = "~/Desktop/RobynModel-1_29_12.json"
)
print(InputCollectJSON)
## End(Not run)</pre>
```

saturation\_hill

Hill Saturation Transformation

# **Description**

 $saturation\_hill$  is a two-parametric version of the Hill function that allows the saturation curve to flip between S and C shape.

Produce example plots for the Hill saturation curve.

# Usage

```
saturation_hill(x, alpha, gamma, x_marginal = NULL)
plot_saturation(plot = TRUE)
```

# Arguments

X	Numeric vector.
alpha	Numeric. Alpha controls the shape of the saturation curve. The larger the alpha, the more S-shape. The smaller, the more C-shape.
gamma	Numeric. Gamma controls the inflexion point of the saturation curve. The larger the gamma, the later the inflexion point occurs.
x_marginal	Numeric. When provided, the function returns the Hill-transformed value of the $x_marginal$ input.
plot	Boolean. Do you wish to return the plot?

set\_default\_hyppar 41

# Value

List. x\_saturated as transformed values and inflexion point

# See Also

```
Other Transformations: adstock_geometric(), transformations
```

# **Examples**

```
saturation_hill(c(100, 150, 170, 190, 200), alpha = 3, gamma = 0.5)
```

set\_default\_hyppar

Set default hyperparameters

# **Description**

For quick setting of hyperparameter ranges.

## Usage

```
set_default_hyppar(
   adstock = NULL,
   all_media = NULL,
   list_default = list(alpha = c(0.5, 3), gamma = c(0.01, 1), theta = c(0, 0.8), shape =
      c(0, 10), scale = c(0, 0.1), train_size = c(0.5, 0.9))
)
```

# **Arguments**

adstock Character. InputCollect\$adstock

all\_media Character. Provide InputCollect\$all\_media.

 ${\tt list\_default} \qquad A \ List. \ Default \ ranges \ for \ hyperparameters.$ 

# Value

List. Expanded range of hyperparameters for all media.

42 transformations

set\_holidays Detect and set date variable interval

# Description

Robyn only accepts daily, weekly and monthly data. This function is only called in robyn\_engineering().

# Usage

```
set_holidays(dt_transform, dt_holidays, intervalType)
```

## Arguments

```
dt_transform A data.frame. Transformed input data.

dt_holidays A data.frame. Raw input holiday data.

intervalType A character. Accepts one of the values: c("day", "week", "month")
```

#### Value

List. Containing the all spend-exposure model results.

transformations Michaelis-Menten Transformation

# Description

The Michaelis-Menten mic\_men() function is used to fit the spend exposure relationship for paid media variables, when exposure metrics like impressions, clicks or GRPs are provided in paid\_media\_vars instead of spend metric.

```
mic_men(x, Vmax, Km, reverse = FALSE)
run_transformations(
   all_media,
   window_start_loc,
   window_end_loc,
   dt_mod,
   adstock,
   dt_hyppar,
   ...
)
```

transformations 43

# **Arguments**

x Numeric value or vector. Input media spend when reverse = FALSE. Input me-

dia exposure metrics (impression, clicks, GRPs, etc.) when reverse = TRUE.

Vmax Numeric Indicates maximum rate achieved by the system.

Km Numeric. The Michaelis constant.

reverse Boolean. Input media spend when reverse = FALSE. Input media exposure met-

rics (impression, clicks, GRPs etc.) when reverse = TRUE.

all\_media Character. Vector of all selected paid media variable names.

window\_start\_loc

Integer. Rolling window start location.

window\_end\_loc Integer. Rolling window end location.

dt\_mod dataframe. Transformed input table for transformation.

adstock Character. Adstock config.

dt\_hyppar data.frame. All hyperparaters for provided media.
... Additional parameters passed to prophet functions.

#### Value

Numeric values. Transformed values.

#### See Also

Other Transformations: adstock\_geometric(), saturation\_hill()

# **Examples**

```
mic_men(x = 5:10, Vmax = 5, Km = 0.5)
```

# **Index**

* Dataset	<pre>print.robyn_save (robyn_save), 35</pre>
df_curve_reach_freq, 4	print.robyn_write(robyn_write), 39
dt_prophet_holidays, 5	prophet_decomp, 8
dt_simulated_weekly, 6	p. opouooop, o
* Transformations	Robyn, 10
adstock_geometric, 2	Robyn-package (Robyn), 10
saturation_hill, 40	robyn_allocator, 10
transformations, 42	robyn_calibrate, 13
* datasets	robyn_clusters, 15
df_curve_reach_freq, 4	robyn_converge, 17
dt_prophet_holidays, 5	robyn_csv (robyn_outputs), 24
dt_simulated_weekly, 6	<pre>robyn_immcarr (robyn_outputs), 24</pre>
, , , , , , , , , , , , , , , , , , ,	robyn_inputs, 18
adstock_geometric, 2, 41, 43	robyn_load(robyn_save), 35
<pre>adstock_weibull(adstock_geometric), 2</pre>	robyn_mmm, 22
	robyn_onepagers (robyn_outputs), 24
decomp_plot (robyn_outputs), 24	robyn_outputs, 24
df_curve_reach_freq, 4, 5, 6	<pre>robyn_plots (robyn_outputs), 24</pre>
dt_prophet_holidays, 4, 5, 6	<pre>robyn_read(robyn_write), 39</pre>
dt_simulated_weekly, 4, 5, 6	<pre>robyn_recreate (robyn_write), 39</pre>
human limita 7	robyn_refresh, 27
hyper_limits, 7 hyper_names, 7	robyn_response, 30
Typer_names, /	robyn_run, 33
mic_men (transformations), 42	robyn_save, 35
model_decomp (robyn_mmm), 22	robyn_train, 36
	robyn_update, 38
pareto_front (robyn_outputs), 24	robyn_write,39
<pre>plot.robyn_allocator(robyn_allocator),</pre>	<pre>run_transformations(transformations),</pre>
10	42
<pre>plot.robyn_refresh(robyn_refresh), 27</pre>	
<pre>plot.robyn_save (robyn_save), 35</pre>	saturation_hill, $4$ , $40$ , $43$
<pre>plot_adstock (adstock_geometric), 2</pre>	set_default_hyppar,41
<pre>plot_saturation(saturation_hill), 40</pre>	set_holidays,42
<pre>print.robyn_allocator</pre>	Annua Cama a data da Cadata da manuatada X
(robyn_allocator), 10	transform_adstock(adstock_geometric), 2
<pre>print.robyn_inputs (robyn_inputs), 18</pre>	transformations, 4, 41, 42
<pre>print.robyn_models(robyn_run), 33</pre>	ts_validation (robyn_outputs), 24
<pre>print.robyn_outputs(robyn_outputs), 24</pre>	
<pre>print.robyn_read (robyn_write), 39</pre>	
<pre>print.robyn_refresh(robyn_refresh), 27</pre>	