# Package 'wavClusteR'

July 12, 2025

Type Package

**Title** Sensitive and highly resolved identification of RNA-protein interaction sites in PAR-CLIP data

**Version** 2.43.0 **Date** 2015-05-07

**Depends** R (>= 3.2), GenomicRanges (>= 1.31.8), Rsamtools

**Imports** methods, BiocGenerics, S4Vectors (>= 0.17.25), IRanges (>= 2.13.12), Biostrings (>= 2.47.6), foreach, GenomicFeatures (>= 1.31.3), ggplot2, Hmisc, mclust, rtracklayer (>= 1.39.7), seqinr, stringr

Suggests BiocStyle, knitr, rmarkdown, BSgenome. Hsapiens. UCSC. hg19

Enhances doMC

VignetteBuilder knitr

Author Federico Comoglio and Cem Sievers

Maintainer Federico Comoglio <federico.comoglio@gmail.com>

Description The package provides an integrated pipeline for the analysis of PAR-CLIP data. PAR-CLIP-induced transitions are first discriminated from sequencing errors, SNPs and additional non-experimental sources by a non-parametric mixture model. The protein binding sites (clusters) are then resolved at high resolution and cluster statistics are estimated using a rigorous Bayesian framework. Post-processing of the results, data export for UCSC genome browser visualization and motif search analysis are provided. In addition, the package allows to integrate RNA-Seq data to estimate the False Discovery Rate of cluster detection. Key functions support parallel multicore computing. Note: while wavClusteR was designed for PAR-CLIP data analysis, it can be applied to the analysis of other NGS data obtained from experimental procedures that induce nucleotide substitutions (e.g. BisSeq).

License GPL-2

**biocViews** ImmunoOncology, Sequencing, Technology, RIPSeq, RNASeq, Bayesian

LazyLoad yes

RoxygenNote 7.0.2

git\_url https://git.bioconductor.org/packages/wavClusteR

git\_branch devel

git\_last\_commit d3893ef git\_last\_commit\_date 2025-04-15 Repository Bioconductor 3.22 Date/Publication 2025-07-11

# **Contents**

	wavClusteR-package
	annotateClusters
	estimateFDR
	exportClusters
	exportCoverage
	exportHighConfSub
	exportSequences
	filterClusters
	fitMixtureModel
	getAllSub
	getClusters
	getExpInterval
	getHighConfSub
	getMetaCoverage
	getMetaGene
	getMetaTSS
	model
	plotSizeDistribution
	plotStatistics
	plotSubstitutions
	readSortedBam
Index	27

wavClusteR-package

A comprehensive pipeline for the analysis of PAR-CLIP data. PAR-CLIP-induced transitions are first discriminated from sequencing errors, SNPs and additional non- experimental sources by a non-parametric mixture model. The protein binding sites (clusters) are then resolved at high resolution and cluster statistics are estimated using a rigorous Bayesian framework. Post-processing of the results, data export for UCSC genome browser visualization and motif search analysis are provided. In addition, the package allows to integrate RNA-Seq data to estimate the False Discovery Rate of cluster detection. Key functions support parallel multicore computing. Note: while wavClusteR was designed for PAR-CLIP data analysis, it can be applied to the analysis of other NGS data obtained from experimental procedures that induce nucleotide substitutions (e.g. BisSeq).

annotateClusters 3

### **Description**

Package: wavClusteR
Type: Package
Version: 2.5.0
Date: 2016-01-09
License: GPL-2

# Author(s)

Federico Comoglio and Cem Sievers

**Epigenomics Group** 

Department of Biosystems Science and Engineering (D-BSSE)

ETH Zurich, Switzerland

Maintainer: Federico Comoglio

<federico.comoglio@gmail.com>

#### References

Comoglio F, Sievers C and Paro R (2015) Sensitive and highly resolved identification of RNA-protein interaction sites in PAR-CLIP data, BMC Bioinformatics 16, 32.

Sievers C, Schlumpf T, Sawarkar R, Comoglio F and Paro R. (2012) Mixture models and wavelet transforms reveal high confidence RNA-protein interaction sites in MOV10 PAR-CLIP data, Nucleic Acids Res. 40(20):e160. doi: 10.1093/nar/gks697

annotateClusters

Annotate clusters with respect to transcript features

# **Description**

Carries out strand-specific annotation of clusters with respect to distinct transcript features, particularly introns, coding sequences, 3'-UTRs, 5'-UTRs. Mapping to multiple features and to those outside the above mentioned ones are reported. Unmapped clusters are then futher further analyzed and annotated with respect to features localizing on the anti-sense strand. Results can be plotted as dotchart and annotations are returned as clusters metadata.

# Usage

```
annotateClusters(clusters, txDB = NULL, genome = "hg19", tablename =
"ensGene", plot = TRUE, verbose = TRUE)
```

4 annotateClusters

### **Arguments**

clusters GRanges object containing individual clusters as identified by the getClusters

function

txDB TranscriptDb object obtained through a call to the makeTxDbFromUCSC function

in the GenomicFeatures package. Default is NULL, namely the object will be

fetched internally

genome A character specifying the genome abbreviation used by UCSC. Available ab-

breviations are returned by a call to ucscGenomes()[, "db"]. Default is "hg19"

(human genome)

tablename A character specifying the name of the UCSC table containing the transcript an-

notations to retrieve. Available table names are returned by a call to supportedUCSCtables().

Default is "ensGene", namely ensembl gene annotations

plot Logical, if TRUE a dotchart with cluster annotations is produced

verbose Logical, if TRUE processing steps are printed

#### Value

Same as the input GRanges object, with an additional metadata column containing the following character encoding of the genomic feature each cluster maps to:

"CDS ss" Coding Sequence Sense Strand

"Introns ss" Intron Sense Strand
"3' UTR ss" 3' UTR Sense Strand
"5' UTR ss" 5' UTR Sense Strand

"Multiple" More than one of the above

"CDS as" Coding Sequence Antisense Strand

"Introns as" Intron Antisense Strand
"3' UTR as" 3' UTR Antisense Strand
"5' UTR as" 5' UTR Antisense Strand

"Other" None of the above

If plot=TRUE, a dotchart is produced in addition.

### Author(s)

Federico Comoglio

#### References

M. Carlson and H. Pages and P. Aboyoun and S. Falcon and M. Morgan and D. Sarkar and M. Lawrence, GenomicFeatures: Tools for making and manipulating transcript centric annotations, R package version 1.12.4

Comoglio F, Sievers C and Paro R (2015) Sensitive and highly resolved identification of RNA-protein interaction sites in PAR-CLIP data, BMC Bioinformatics 16, 32.

### See Also

getClusters

estimateFDR 5

#### **Examples**

```
require(BSgenome.Hsapiens.UCSC.hg19)
data( model, package = "wavClusteR" )
filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )</pre>
example <- readSortedBam( filename = filename )</pre>
countTable <- getAllSub( example, minCov = 10, cores = 1 )</pre>
highConfSub <- getHighConfSub( countTable, supportStart = 0.2, supportEnd = 0.7, substitution = "TC")
coverage <- coverage( example )</pre>
clusters <- getClusters( highConfSub = highConfSub,</pre>
                           coverage = coverage,
                           sortedBam = example,
                   cores = 1,
                   threshold = 2)
fclusters <- filterClusters( clusters = clusters,</pre>
                highConfSub = highConfSub,
                coverage = coverage,
        model = model,
        genome = Hsapiens,
                refBase = 'T',
                minWidth = 12 )
## Not run: fclusters <- annotateClusters( clusters = fclusters )</pre>
```

 ${\tt estimateFDR}$ 

Estimate False Discovery Rate within the relative substitution frequency support by integrating PAR-CLIP data and RNA-Seq data

### **Description**

Estimate upper and lower bounds for the False Discovery Rate within the relative substitution frequency (RSF) support by integrating PAR-CLIP data and RNA-Seq data (current version makes use of unstranded RNA-Seq)

# Usage

```
estimateFDR(countTable, RNASeq, substitution = 'TC', minCov = 20,
span = 0.1, cores = 1, plot = TRUE, verbose = TRUE, ...)
```

#### **Arguments**

countTable A GRanges object, corresponding to a count table as returned by the getAllSub

function

RNASeq GRanges object containing aligned RNA-Seq reads as returned by readSorted-

Bam

substitution A character indicating which substitution is induced by the experimental proce-

dure (e.g. 4-SU treatment - a standard in PAR-CLIP experiments - induces T to

C transitions and hence substitution = 'TC' in this case.)

6 exportClusters

minCov	An integer defining the minimum coverage required at a genomic position exhibiting a substitution. Genomic positions of coverage less than minCov are discarded. Default is 20 (see Details).
span	A numeric indicating the width of RSF intervals to be considered for FDR computation. Defauls is 0.1 (i.e. 10 intervals are considered spanning the RSF support (0,1]
cores	An integer defining the number of cores to be used for parallel processing, if available. Default is 1.
plot	Logical, if TRUE a dotchart with cluster annotations is produced
verbose	Logical, if TRUE processing steps are printed
	Additional parameters to be passed to the plot function

### **Details**

For details on the FDR computation, please see Comoglio, Sievers and Paro.

#### Value

A list with three slots, containing upper and lower FDR bounds, and the total number of positive instances each RSF interval. If plot, these three vectors are depicted as a line plot.

### Note

The approach used to compute the upper bound for the FDR is very conservative. See supplementary information in Comoglio et al. for details.

### Author(s)

Federico Comoglio and Cem Sievers

### See Also

readSortedBam, getAllSub Comoglio F, Sievers C and Paro R (2015) Sensitive and highly resolved identification of RNA-protein interaction sites in PAR-CLIP data, BMC Bioinformatics 16, 32.

exportClusters	Export clusters as BED track	
----------------	------------------------------	--

# **Description**

Export clusters as BED track, compatible with the UCSC genome browser

# Usage

```
exportClusters(clusters, filename = 'wavClusters.bed', trackname =
'wavClusters', description = 'wavClusters')
```

exportCoverage 7

### **Arguments**

clusters GRanges object containing individual clusters as identified by the filterClusters

function

filename A character defining the BED file name. Default to "wavClusters.bed"

trackname A character defining the track.name of the BED file. Default to "wavClusters" description A character defining the description of the BED file. Default to "wavClusters"

# Value

A BED file of the exported GRanges object

#### Note

Clusters are color coded according to their strand information (red for the plus strand, blue for the minus strand).

### Author(s)

Federico Comoglio

### See Also

filterClusters

exportCoverage Export coverage as BigWig track
--

# Description

Export coverage as BigWig track, compatible with the UCSC genome browser

# Usage

```
exportCoverage(coverage, filename = 'wavClusters.BigWig')
```

# Arguments

coverage An Rle object containing the coverage at each genomic position as returned by

a call to coverage

filename A character defining the BED file name. Default to "wavClusters.BigWig"

#### Value

A BigWig file of the exported Rle object

### Author(s)

Federico Comoglio

8 exportSequences

exportHighConfSub	Export high-confidence substitutions as BED track
-------------------	---

### **Description**

Export high-confidence substitutions as BED track, compatible with the UCSC genome browser

# Usage

```
exportHighConfSub(highConfSub, filename = 'highConfSub.bed',
trackname = 'highConfSub', description = 'highConfSub')
```

### **Arguments**

highConfSub GRanges object containing high-confidence substitution sites as returned by the

getHighConfSub function

filename A character defining the BED file name. Default to "wavClusters.bed"

trackname A character defining the track.name of the BED file. Default to "wavClusters" description A character defining the description of the BED file. Default to "wavClusters"

### Value

A BED file of the exported GRanges object

### Note

Substitutions are color coded according to their strand information (red for the plus strand, blue for the minus strand).

# Author(s)

Federico Comoglio

### See Also

getHighConfSub

exportSequences	Export cluster sequences for motif search analysis

# Description

Export cluster sequences for motif search analysis (FASTA format), e.g. using MEME-ChIP

# Usage

```
exportSequences(clusters, filename = 'wavClusters.fasta')
```

filterClusters 9

### **Arguments**

clusters GRanges object containing individual clusters as identified by the filterClusters

function

filename A character defining the BED file name. Default to "wavClusters.fasta"

#### Value

A FASTA file containing the cluster sequences

### Author(s)

Federico Comoglio

### See Also

filterClusters

filterClusters

Merge clusters and compute all relevant cluster statistics

# Description

If clusters have been identified using the mini-rank norm algorithm, cluster statistics are computed. In contrast, if the CWT-based cluster identification algorithm was used, clusters are first filtered to retain only those instances containing a wavelet peak and a high-confidence substitution site within their cluster boundaries.

# Usage

```
filterClusters(clusters, highConfSub, coverage, model, genome,
refBase = 'T', minWidth = 12, verbose = TRUE)
```

# **Arguments**

clusters	GRanges object containing individual clusters as identified by the getClusters function
highConfSub	GRanges object containing high-confidence substitution sites as returned by the getHighConfSub function
coverage	An Rle object containing the coverage at each genomic position as returned by a call to coverage
model	List of 5 items containing the estimated mixture model as returned by the fit-MixtureModel function
genome	BSgenome object of the relevant reference genome (e.g. Hsapiens for the human genome hg19)
refBase	A character specifying the base in the reference genome for which transitions are experimentally induced (e.g. 4-SU treatment - a standard in PAR-CLIP experiments - induces T to C transitions and hence refBase = "T" in this case). Default is "T"
minWidth	An integer corresponding to the minimum width of reported clusters. Shorter clusters are extended to minWidth starting from the cluster center
verbose	Logical, if TRUE processing steps are printed

10 filterClusters

#### Value

GRanges object containing the transcriptome-wide identified clusters, having metadata:

Ntransitions The number of high-confidence transitions within the cluster

MeanCov The mean coverage within the cluster

NbasesInRef The number of genomic positions within the cluster corresponding to refBase

CrossLinkEff The crosslinking efficiency within the cluster, estimated as the ratio between the

number of high-confidence transitions within the cluster and the total number of

genomic positions therein corresponding to refBase

Sequence The genomic sequence undelying the cluster (plus strand)

SumLogOdds The sum of the log-odd values within the cluster

RelLogOdds The sum of the log-odds divided by the number of high-confidence transitions

within the cluster. This variable can be regarded as a proxy for statistical significance and can be therefore used to rank clusters. See Comoglio, Sievers and

Paro for details.

#### Note

1) This function calls the appropriate processing function according to the method used to compute clusters. This information is stored in the metadata(ranges(clusters)) slot as an object of type list.

2) Notice that genome corresponds to the according reference genome matching the organism in which experiments have been carried out. For example genome = Hsapiens is used for the human reference genome (assembly 19), where Hsapiens is provided by BSgenome. Hsapiens. UCSC.hg19.

#### Author(s)

Federico Comoglio and Cem Sievers

## References

Herve Pages, BSgenome: Infrastructure for Biostrings-based genome data packages

Sievers C, Schlumpf T, Sawarkar R, Comoglio F and Paro R. (2012) Mixture models and wavelet transforms reveal high confidence RNA-protein interaction sites in MOV10 PAR-CLIP data, Nucleic Acids Res. 40(20):e160. doi: 10.1093/nar/gks697

Comoglio F, Sievers C and Paro R (2015) Sensitive and highly resolved identification of RNA-protein interaction sites in PAR-CLIP data, BMC Bioinformatics 16, 32.

# See Also

```
getClusters, getHighConfSub, fitMixtureModel
```

```
require(BSgenome.Hsapiens.UCSC.hg19)

data( model, package = "wavClusteR" )

filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )
example <- readSortedBam( filename = filename )
countTable <- getAllSub( example, minCov = 10, cores = 1 )</pre>
```

fitMixtureModel 11

fitMixtureModel

Fit a non-parametric mixture model from all identified substitutions

# **Description**

Estimates the two-component mixture model consisting of the mixing coefficients and the density functions.

# Usage

```
fitMixtureModel(countTable, substitution = "TC")
```

# **Arguments**

countTable A GRanges object, corresponding to a count table as returned by the getAllSub

function

substitution A character indicating which substitution is induced by the experimental proce-

dure (e.g. 4-SU treatment - a standard in PAR-CLIP experiments - induces T to

C transitions and hence substitution = 'TC' in this case.)

### Value

A list containing:

The first mixing coefficient
The second mixing coefficient

p The mixture model

p1 The first component of the mixture p2 The second component of the mixture

### Author(s)

Federico Comoglio and Cem Sievers

12 getAllSub

#### See Also

```
getAllSub getExpInterval
```

### **Examples**

```
## Not run:
filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )</pre>
example <- readSortedBam(filename = filename)</pre>
countTable <- getAllSub( example, minCov = 10, cores = 1 )</pre>
fitMixtureModel( countTable, substitution = "TC" )
## End(Not run)
#load and inspect the model
data( model )
str( model )
#plot densities and estimate the relative substitution frequency support dominated by PAR-CLIP induction
getExpInterval( model, bayes = TRUE, plot = TRUE )
```

getAllSub

Identify all substitutions observed across genomic positions exhibiting a specified minimum coverage

# **Description**

All substitutions observed across genomic positions exhibiting user-defined minimum coverage are extracted and a count table is returned. This function supports parallel computing.

### Usage

```
getAllSub(sortedBam, minCov = 20, cores = 1)
```

# **Arguments**

sortedBam GRanges object containing aligned reads as returned by readSortedBam An integer defining the minimum coverage required at a genomic position exminCov hibiting a substitution. Genomic positions of coverage less than minCov are discarded. Default is 20 (see Details). An integer defining the number of cores to be used for parallel processing, if cores

available. Default is 1.

### **Details**

The choice of the minimum coverage influences the variance of the relative substitution frequency estimates, which in turn affect the mixture model fit. A conservative value depending on the library size is recommended for a first analysis. Values smaller than 10 have not been tested and are therefore not recommended.

getClusters 13

#### Value

A GRanges object containing a count table, where each range correspond to a substitution. The metadata correspond to the following information:

substitutions observed substitution, e.g. AT, i.e. A in the reference sequence and T in the

mapped read.

coverage strand-specific coverage.

count number of strand-specific substitutions.

### Author(s)

Federico Comoglio and Cem Sievers, with contributions from Martin Morgan

### See Also

readSortedBam

# **Examples**

```
filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )
example <- readSortedBam(filename = filename)
countTable <- getAllSub( example, minCov = 10, cores = 1 )
countTable</pre>
```

getClusters

Identify clusters containing high-confidence substitutions and resolve boundaries at high resolution

# Description

Identifies clusters using the mini-rank norm (MRN) algorithm, which employs thresholding of background coverage differences and finds the optimal cluster boundaries by exhaustively evaluating all putative clusters using a rank-based approach. This method has higher sensitivity and an approximately 10-fold faster running time than the CWT-based cluster identification algorithm.

# Usage

```
getClusters(highConfSub, coverage, sortedBam, cores =
1, threshold)
```

# Arguments

highConfSub	GRanges object containing high-confidence substitution sites as returned by the getHighConfSub function
coverage	An Rle object containing the coverage at each genomic position as returned by a call to coverage
sortedBam	a GRanges object containing all aligned reads, including read sequence (qseq) and MD tag (MD), as returned by the readSortedBam function
cores	integer, the number of cores to be used for parallel evaluation. Default is 1.

14 getClusters

threshold

numeric, the difference in coverage to be considered noise. If not specified, a Gaussian mixture model is used to learn a threshold from the data. Empirically, 10% of the minimum coverage required at substitutions (see argument minCov in the getHighConfSub function) might suffice to provide highly resolved clusters. However, if minCov is much lower than the median strand-specific coverage at substitutions m, which can be computed using summary(elementMetadata(highConfSub)[, 'coverage'])['Median']), 10% of m might represent an optimal choice.

### Value

GRanges object containing the identified cluster boundaries.

#### Note

Clusters returned by this function need to be further merged by the function filterClusters, which also computes all relevant cluster statistics.

### Author(s)

Federico Comoglio and Cem Sievers

#### References

Sievers C, Schlumpf T, Sawarkar R, Comoglio F and Paro R. (2012) Mixture models and wavelet transforms reveal high confidence RNA-protein interaction sites in MOV10 PAR-CLIP data, Nucleic Acids Res. 40(20):e160. doi: 10.1093/nar/gks697

Comoglio F, Sievers C and Paro R (2015) Sensitive and highly resolved identification of RNA-protein interaction sites in PAR-CLIP data, BMC Bioinformatics 16, 32.

## See Also

```
getHighConfSub, filterClusters
```

getExpInterval 15

getExpInterval Identify the interval of relative substitution frequencies dominated by experimental induction.	getExpInterval	
--	----------------	--

### **Description**

Identifies the interval/support of relative substitution frequencies (RSFs) dominated by the second model component, i.e. by the probability of being induced by the experimental procedure. In addition, this function can be used to generate diagnostic plots of the model fit, representing (i) model densities and log odds ratio (ii) the posterior class probability, i.e. the probability of a given observation being generated by experimental induction.

# Usage

```
getExpInterval(model, bayes = TRUE, leftProb, rightProb, plot = TRUE)
```

### **Arguments**

model	A list containing the model as returned by the function fitMixtureModel
bayes	Logical, if TRUE the Bayes classifier (cutoff at posterior class probabilities >= 0.5) is applied. If FALSE, custom cutoff values should be provided through leftProb and rightProb. Default is TRUE.
leftProb	Numeric, the posterior probability corresponding to the left boundary (start) of the high confidence RSF interval.
rightProb	Numeric, the posterior probability corresponding to the right boundary (end) of the high confidence RSF interval.
plot	Logical, if TRUE diagnostics plot showing the model components, log odds and the computed posterior with highlighted identified RSF interval are returned.

# Value

A list with two numeric slots, corresponding to the extremes of the RSF interval (RSF support).

supportStart start of the high confidence RSF interval end of the high confidence RSF interval

#### Author(s)

Federico Comoglio and Cem Sievers

# References

Sievers C, Schlumpf T, Sawarkar R, Comoglio F and Paro R. (2012) Mixture models and wavelet transforms reveal high confidence RNA-protein interaction sites in MOV10 PAR-CLIP data, Nucleic Acids Res. 40(20):e160. doi: 10.1093/nar/gks697

Comoglio F, Sievers C and Paro R (2015) Sensitive and highly resolved identification of RNA-protein interaction sites in PAR-CLIP data, BMC Bioinformatics 16, 32.

### See Also

 $fit {\tt Mixture Model getHigh Conf Sub \ estimate FDR}$ 

16 getHighConfSub

### **Examples**

```
data( model )
#default
support <- getExpInterval( model = model, bayes = TRUE, plot = TRUE )
support
#custom interval (based, e.g. on visual inspection of posterior class probability
# or evaluation of FDR using the estimateFDRF function)
support <- getExpInterval( model = model, leftProb = 0.2, rightProb = 0.7, plot = TRUE )
support</pre>
```

getHighConfSub

Classify substitutions based on identified RSF interval and return high confidence transitions

# **Description**

Classify genomic positions exhibiting a substitution based on the relative substitution frequency (RSF) interval. The latter is returned by the getExpInterval function, but can be user-specified through visual inspection of the posterior class probability returned by the same function.

# Usage

```
getHighConfSub(countTable, support, supportStart = NA, supportEnd =
NA, substitution = "TC")
```

### **Arguments**

countTable	A GRanges object, corresponding to a count table as returned by the getAllSub function
support	List, consisting of two numeric slots defining the left and right boundaries (start and end values, respectively) of the RSF interval, as returned by the getExpInterval function.
supportStart	Numeric, if support not provided, the RSF value determining the left boundary (start) of the RSF interval. Use this argument to specify a user-defined RSF interval.
supportEnd	Numeric, if support not provided, the RSF value determining the right boundary (end) of the RSF interval. Use this argument to specify a user-defined RSF interval.
substitution	A character indicating which substitution is induced by the experimental procedure (e.g. 4-SU treatment - a standard in PAR-CLIP experiments - induces T to C transitions and hence substitution = 'TC' in this case.)

# Value

a GRanges object containing high confidence substitutions, with strand-specific coverage, counts and RSF values as metadata.

getMetaCoverage 17

### Note

In the example below, left and right boundaries were arbitrarily chosen as showcase.

# Author(s)

Federico Comoglio and Cem Sievers

### See Also

```
getAllSub, getExpInterval
```

### **Examples**

```
filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )
example <- readSortedBam( filename = filename )
countTable <- getAllSub( example, minCov = 10, cores = 1 )
highConfSub <- getHighConfSub( countTable, supportStart = 0.2, supportEnd = 0.7, substitution = "TC" )
highConfSub</pre>
```

getMetaCoverage	Compute and plot distribution of average coverage or relative log-
	odds as metagene profile using identified clusters

# Description

Transcriptome-wide identified clusters are used to generate a metagene profile by binning gene bodies. Within each bin, the distribution of the average cluster coverage or of the relative log-odds is computed.

# Usage

```
getMetaCoverage(clusters, txDB = NULL, upstream = 1e3, downstream =
1e3, nBins = 40, nBinsUD = 10, minLength = 1, genome = 'hg19', tablename =
'ensGene', odds = FALSE, plot = TRUE, verbose = TRUE, ...)
```

# **Arguments**

clusters	GRanges object containing individual clusters as identified by the getClusters function
txDB	TranscriptDb object obtained through a call to the makeTxDbFromUCSC function in the GenomicFeatures package. Default is NULL, namely the object will be fetched internally
upstream	An integer corresponding to the number of bases to be considered upstream the gene. Default is 1000
downstream	An integer corresponding to the number of bases to be considered downstream the gene. Default is $1000$
nBins	An integer corresponding to the number of bins to be used to partition the genes. Default is $40$

18 getMetaCoverage

and downstream regions. Defauls is 10, i.e. the bin size is 100 bases for the default extension minLength An integer indicating the the minimum required length of a gene in order for it to be considered. Default is 1, i.e. all genes are considered A character specifying the genome abbreviation used by UCSC. Available abgenome breviations are returned by a call to ucscGenomes()[, "db"]. Default is "hg19" (human genome) tablename A character specifying the name of the UCSC table containing the transcript annotations to retrieve. Available table names are returned by a call to supportedUCSCtables(). Default is "ensGene", namely ensembl gene annotations odds

Logical, if TRUE relative log-odds distributions are shown instead of mean cov-

An integer corresponding to the number of bins to be used to partion upstream

Logical, if TRUE a dotchart with cluster annotations is produced plot

Logical, if TRUE processing steps are printed verbose

Additional parameters to be passed to the plot function

#### Value

nBinsUD

Called for its effects.

#### Author(s)

Federico Comoglio

### References

Comoglio F\*, Sievers C\* and Paro R, wavClusteR: an R package for PAR-CLIP data analysis, submitted

### See Also

```
getClusters
```

```
require(BSgenome.Hsapiens.UCSC.hg19)
data( model, package = "wavClusteR" )
filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )</pre>
example <- readSortedBam( filename = filename )</pre>
countTable <- getAllSub( example, minCov = 10, cores = 1 )</pre>
highConfSub <- getHighConfSub( countTable, supportStart = 0.2, supportEnd = 0.7, substitution = "TC")
coverage <- coverage( example )</pre>
clusters <- getClusters( highConfSub = highConfSub,</pre>
                           coverage = coverage,
                           sortedBam = example,
                   threshold = 2)
fclusters <- filterClusters( clusters = clusters,</pre>
                highConfSub = highConfSub,
                coverage = coverage,
```

getMetaGene 19

```
model = model,
    genome = Hsapiens,
        refBase = 'T',
        minWidth = 12 )
## Not run: getMetaCoverage( clusters = fclusters, odds = FALSE )
```

getMetaGene

Compute and plot metagene profile using identified clusters

# Description

Transcriptome-wide identified clusters are used to generate a metagene profile by binning gene bodies, upstream and downstream regions.

# Usage

```
getMetaGene(clusters, txDB = NULL, upstream = 1e3, downstream = 1e3,
nBins = 40, nBinsUD = 10, minLength = 1, genome = 'hg19', tablename =
'ensGene', plot = TRUE, verbose = TRUE, ...)
```

# **Arguments**

clusters	GRanges object containing individual clusters as identified by the getClusters function
txDB	TranscriptDb object obtained through a call to the makeTxDbFromUCSC function in the GenomicFeatures package. Default is NULL, namely the object will be fetched internally
upstream	An integer corresponding to the number of bases to be considered upstream the gene. Default is 1000
downstream	An integer corresponding to the number of bases to be considered downstream the gene. Default is 1000
nBins	An integer corresponding to the number of bins to be used to partition the genes. Default is 40
nBinsUD	An integer corresponding to the number of bins to be used to partion upstream and downstream regions. Defauls is 10, i.e. the bin size is 100 bases for the default extension
minLength	An integer indicating the the minimum required length of a gene in order for it to be considered. Default is 1, i.e. all genes are considered
genome	A character specifying the genome abbreviation used by UCSC. Available abbreviations are returned by a call to ucscGenomes()[,"db"]. Default is "hg19" (human genome)
tablename	A character specifying the name of the UCSC table containing the transcript annotations to retrieve. Available table names are returned by a call to supportedUCSCtables(). Default is "ensGene", namely ensembl gene annotations
plot	Logical, if TRUE a dotchart with cluster annotations is produced
verbose	Logical, if TRUE processing steps are printed
	Additional parameters to be passed to the plot function

20 getMetaTSS

#### Value

A numeric vector of the same length as nBins + 2 \* nBinsUD containing normalized counts. If plot, the metagene profile is also depicted as a line plot.

### Author(s)

Federico Comoglio

Comoglio F, Sievers C and Paro R (2015) Sensitive and highly resolved identification of RNA-protein interaction sites in PAR-CLIP data, BMC Bioinformatics 16, 32.

### References

Comoglio F\*, Sievers C\* and Paro R, wavClusteR: an R package for PAR-CLIP data analysis, submitted

### See Also

```
getClusters
```

# **Examples**

```
require(BSgenome.Hsapiens.UCSC.hg19)
data( model, package = "wavClusteR" )
filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )</pre>
example <- readSortedBam( filename = filename )</pre>
countTable <- getAllSub( example, minCov = 10, cores = 1 )</pre>
highConfSub <- getHighConfSub( countTable, supportStart = 0.2, supportEnd = 0.7, substitution = "TC")
coverage <- coverage( example )</pre>
clusters <- getClusters( highConfSub = highConfSub,</pre>
                           coverage = coverage,
                           sortedBam = example,
                   threshold = 2)
fclusters <- filterClusters( clusters = clusters,</pre>
                highConfSub = highConfSub,
                coverage = coverage,
        model = model,
        genome = Hsapiens,
                refBase = 'T',
                minWidth = 12 )
## Not run: meta <- getMetaGene( clusters = fclusters )</pre>
```

getMetaTSS

Compute and plot read densities in genomic regions around transcription start sites

### **Description**

Aligned reads are used generate a metaTSS profile across genomic regions containing transcription start sites (TSSs).

getMetaTSS 21

# Usage

```
getMetaTSS(sortedBam, txDB = NULL, upstream = 1e3, downstream = 1e3,
nBins = 40, genome = 'hg19', tablename = 'ensGene', unique = FALSE, plot =
TRUE, verbose = TRUE, ...)
```

# **Arguments**

sortedBam	GRanges object containing aligned reads as returned by readSortedBam
txDB	TranscriptDb object obtained through a call to the makeTxDbFromUCSC function in the GenomicFeatures package. Default is NULL, namely the object will be fetched internally
upstream	An integer corresponding to the number of bases to be considered upstream the TSS. Default is 1000
downstream	An integer corresponding to the number of bases to be considered downstream the TSS. Default is 1000
nBins	An integer corresponding to the number of bins to be used to partition the genes. Default is 40, i.e. bin size 50 bases
genome	A character specifying the genome abbreviation used by UCSC. Available abbreviations are returned by a call to ucscGenomes()[,"db"]. Default is "hg19" (human genome)
tablename	A character specifying the name of the UCSC table containing the transcript annotations to retrieve. Available table names are returned by a call to supportedUCSCtables(). Default is "ensGene", namely ensembl gene annotations
unique	Logical, if TRUE only non-overlapping TSSs extended by upstream/downstream are considered. Default is FALSE, i.e. all TSSs are considered
plot	Logical, if TRUE a dotchart with cluster annotations is produced
verbose	Logical, if TRUE processing steps are printed
	Additional parameters to be passed to the plot function

# Value

A numeric vector of the same length as nBins containing normalized counts. If plot, the metaTSS profile is also depicted as a line plot.

# Author(s)

Federico Comoglio

# References

Comoglio  $F^*$ , Sievers  $C^*$  and Paro R, wavClusteR: an R package for PAR-CLIP data analysis, submitted

# See Also

readSortedBam

22 plotSizeDistribution

#### **Examples**

```
require(BSgenome.Hsapiens.UCSC.hg19)

filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )
example <- readSortedBam( filename = filename )
## Not run: tss <- getMetaTSS( sortedBam = example )</pre>
```

model

Components of the non-parametric mixture moodel fitted on Ago2 PAR-CLIP data

# **Description**

The non-parametric mixture model was fit on the entire Ago2 public available PAR-CLIP dataset (Kishore et al.) using the fitMixtureModel function.

# Usage

```
data(model)
model
```

### **Format**

List of 5 items containing the estimated mixing coefficients and model densities. See the help page of the fitMixtureModel function for a detailed description of the output.

### References

Kishore et al. A quantitative analysis of CLIP methods for identifying binding sites of RNA-binding proteins. Nat Methods (2011) vol. 8 (7) pp. 559-64 http://www.nature.com/nmeth/journal/v8/n7/full/nmeth.1608.html

# See Also

fitMixtureModel

plotSizeDistribution Plot the distribution of cluster sizes

# **Description**

Produce an histogram of cluster sizes

# Usage

```
plotSizeDistribution( clusters, showCov = FALSE, ... )
```

plotStatistics 23

# **Arguments**

clusters	GRanges object containing individual clusters as identified by the getClusters function
showCov	logical, if TRUE a scatter plot of average cluster coverage vs. cluster size is shown along with a loess fit. Default is FALSE.
	Additional parameters to be passed to the hist function

#### Value

Called for its effect, returns a histogram.

# Author(s)

Federico Comoglio

# See Also

```
getClusters
```

# **Examples**

```
require(BSgenome.Hsapiens.UCSC.hg19)
data( model, package = "wavClusteR" )
filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )</pre>
example <- readSortedBam( filename = filename )</pre>
countTable <- getAllSub( example, minCov = 10, cores = 1 )</pre>
highConfSub <- getHighConfSub( countTable, supportStart = 0.2, supportEnd = 0.7, substitution = "TC" )</pre>
coverage <- coverage( example )</pre>
clusters <- getClusters( highConfSub = highConfSub,</pre>
                          coverage = coverage,
                          sortedBam = example,
                          threshold = 2)
fclusters <- filterClusters( clusters = clusters,</pre>
                highConfSub = highConfSub,
                coverage = coverage,
        model = model,
        genome = Hsapiens,
                refBase = 'T',
                minWidth = 12)
plotSizeDistribution(fclusters, breaks = 30, col = 'skyblue2')
```

 ${\tt plotStatistics}$ 

Pairs plot visualization of clusters statistics

# **Description**

Graphical representation of cluster statistics, featuring pairwise correlations in the upper panel.

24 plotStatistics

#### Usage

```
plotStatistics(clusters, corMethod = 'spearman', lower =
panel.smooth, ...)
```

### **Arguments**

clusters GRanges object containing individual clusters as identified by the getClusters

function

corMethod A character defining the correlation coefficient to be computed. See the help

page of the cor function for possible options. Default is "spearman". Hence,

rank-based Spearman's correlation coefficients are computed

lower A function compatible with the lower panel argument of the pairs function

... Additional parameters to be passed to the pairs function

### Value

called for its effect

### Author(s)

Federico Comoglio

### See Also

```
getClusters
```

```
require(BSgenome.Hsapiens.UCSC.hg19)
data( model, package = "wavClusteR" )
filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )</pre>
example <- readSortedBam( filename = filename )</pre>
countTable <- getAllSub( example, minCov = 10, cores = 1 )</pre>
highConfSub <- getHighConfSub( countTable, supportStart = 0.2, supportEnd = 0.7, substitution = "TC")
coverage <- coverage( example )</pre>
clusters <- getClusters( highConfSub = highConfSub,</pre>
                          coverage = coverage,
                          sortedBam = example,
                          threshold = 2)
fclusters <- filterClusters( clusters = clusters,</pre>
               highConfSub = highConfSub,
               coverage = coverage,
        model = model,
        genome = Hsapiens,
               refBase = 'T',
                minWidth = 12 )
plotStatistics( clusters = fclusters )
```

plotSubstitutions 25

plotSubstitutions	Barplot visualization of the number of genomic positions exhibiting a
	given substitution and, if model provided, additional diagnostic plots.

# Description

Graphical representation of the total number of genomic positions exhibiting one or more substitutions of a given type. This information is used to estimate the mixing coefficients of the non-parametric mixture model. If the mixture model fit is provided, returns additional diagnostic plots such as the total number of reads exhibiting a given substitution and relative substitution frequency-dependent representations of the total number of genomic positions with substitutions of a given type.

# Usage

```
plotSubstitutions(countTable, highlight = "TC", model)
```

### **Arguments**

countTable A GRanges object, corresponding to a count table as returned by the getAllS	countTable	A GRanges object.	corresponding to a	count table as return	ned by the getAllS
--	------------	-------------------	--------------------	-----------------------	--------------------

function

highlight A character indicating which substitution should be highlighted in the barplot.

A standard PAR-CLIP experiment employing 4-SU treatment induces T to C

transitions, encoded as "TC". Default is "TC".

model A list containing the model as returned by the function fitMixtureModel

### Value

called for its effect

#### Author(s)

Federico Comoglio and Cem Sievers

# See Also

```
getAllSub
```

```
filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )
example <- readSortedBam( filename = filename )
countTable <- getAllSub( example, minCov = 10, cores = 1 )
plotSubstitutions(countTable = countTable, highlight = "TC")</pre>
```

26 readSortedBam

readSortedBam

Load a sorted BAM file

# **Description**

Load a sorted BAM file. Optionally, only reads mapping to a specific set of genomics coordinates are loaded. Only fields strictly necessary to run a wavClusteR analysis are loaded.

### Usage

```
readSortedBam(filename, which)
```

# **Arguments**

filename Name of the sorted BAM file, including full path to file if it is located outside

the current working directory.

which a GRanges or IntegerRangesList specifying the regions on the reference se-

quence for which matches are desired. See the documentation of the Rsamtools

package for details.

#### Value

a GRanges object containing aligned reads, including read sequence (qseq) and MD tag (MD)

#### Note

The input BAM file must be sorted and indexed. Alignment with bowtie or bowtie2, conversion from SAM to BAM output, sorting and indexing using SAMtools is recommended.

### Author(s)

Federico Comoglio

### References

Martin Morgan and Herve Pages, Rsamtools: Binary alignment (BAM), variant call (BCF), or tabix file import, http://bioconductor.org/packages/release/bioc/html/Rsamtools.html

```
library(Rsamtools)
filename <- system.file( "extdata", "example.bam", package = "wavClusteR" )
sortedBam <- readSortedBam( filename = filename )</pre>
```

# **Index**

* Import
readSortedBam, 26
* core
estimateFDR, 5
filterClusters,9
fitMixtureModel, 11
getAllSub, 12
getClusters, 13
getExpInterval, 15
getHighConfSub, 16
* datasets
model, 22
* graphics
annotateClusters, $3$
estimateFDR, 5
<pre>getExpInterval, 15</pre>
getMetaCoverage, 17
getMetaGene, 19
getMetaTSS, 20
plotSizeDistribution, 22
plotStatistics, 23
plotSubstitutions, 25
* model
fitMixtureModel, 11
* package
wavClusteR-package, 2
* postprocessing
annotateClusters, 3
exportClusters, 6
exportCoverage, 7
exportHighConfSub, 8
exportSequences, 8
getMetaCoverage, 17
getMetaGene, 19 getMetaTSS, 20
plotSizeDistribution, 22
plotStatistics, 23
protistatistics, 23
${\tt annotateClusters}, 3$
coverage, <i>9</i> , <i>13</i>
estimateFDR, 5, 15
exportClusters, 6

```
exportCoverage, 7
exportHighConfSub, 8
exportSequences, 8
filterClusters, 7, 9, 9, 14
fitMixtureModel, 9, 10, 11, 15, 22
getAllSub, 5, 6, 11, 12, 12, 16, 17, 25
getClusters, 4, 9, 10, 13, 17-20, 23, 24
getExpInterval, 12, 15, 16, 17
getHighConfSub, 8-10, 13-15, 16
getMetaCoverage, 17
getMetaGene, 19
getMetaTSS, 20
mode1, 22
plotSizeDistribution, 22
plotStatistics, 23
plotSubstitutions, 25
readSortedBam, 5, 6, 12, 13, 21, 26
wavClusteR (wavClusteR-package), 2
wavClusteR-package, 2
```