# Package 'DAMEfinder'

October 17, 2020

```
Title Finds DAMEs - Differential Allelicly MEthylated regions
Version 1.0.3
Description 'DAMEfinder' offers functionality for taking methtuple or bismark
      outputs to calculate ASM scores and compute DAMEs.
      It also offers nice visualization of methyl-circle plots.
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calc\_asm

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Calculate ASM Score

# Description

This function takes in a list of samples resulting from the read\_tuples function and returns a SummarizedExperiment of Allele-Specific Methylation (ASM) scores, where each row is a tuple and each column is a sample.

## Usage

```
calc_asm(
  sampleList,
  beta = 0.5,
  a = 0.2,
  transform = modulus_sqrt,
  coverage = 5,
  verbose = TRUE
)
```

# Arguments

beta The beta parameter used to calculate the weight in the ASM score. link{calc\_weight} uses this parameter to penalize fully methylated or unmethylated tuples. Default = 0.5.

a The distance from 0.5 allowed, where 0.5 is a perfect MM:UU balance for a tuple. In the default mode this value is set to 0.2, and we account for the instances where the balance is between 0.3 and 0.7.

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transform Transform the calculated tuple ASM scores. We use the modulus square root

function which outputs the square root, while preserving the original sign.

coverage Remove tuples with total reads below coverage. Default = 5.

verbose If the function should be verbose. Default = TRUE.

#### **Details**

Calculates ASM score for a list of samples in the output format of the result of read\_tuples This functions uses the following other functions: process, calcScore, calcWeight.

#### Value

A SummarizedExperiment of ASM scores where the rows are all the tuples and the columns the sample names.

#### **Examples**

```
DATA_PATH_DIR <- system.file('extdata', '.', package = 'DAMEfinder')
get_data_path <- function(file_name) file.path(DATA_PATH_DIR, file_name)

tuple_files <- list.files(DATA_PATH_DIR, '.tsv.gz')
tuple_files <- get_data_path(tuple_files)

ASM <- read_tuples(tuple_files, c('CRC1', 'NORM1'))

ASMscore <- calc_asm(ASM)
```

calc\_derivedasm

Calculate SNP-based ASM

## **Description**

Combines all the GRangeslist generated in extract\_bams into a RangedSummarizedExperiment object, and calculates SNP-based allele-specific methylation. TODO: Doesn't work for one sample

#### Usage

```
calc_derivedasm(sampleList, cores = 1, verbose = TRUE)
```

## Arguments

 $sample List \qquad List \ of \ samples \ returned \ from \ {\tt extract\_bams}.$ 

cores Number of cores to thread.

verbose If the function should be verbose.

#### Value

RangedSummarizedExperiment containing in assays:

- der.ASM: matrix with SNP-based ASM
- snp.table: Matrix with SNP associated to the CpG site.
- ref.cov: Coverage of the 'reference' allele.

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- alt.cov: Coevarage of the 'alternative' allele.
- ref.meth: Methylated reads from the 'reference' allele.
- alt.meth: Methylated reads from the 'alternative' allele.

## **Examples**

```
data(extractbams_output)
derASM <- calc_derivedasm(extractbams_output[c(1,2)], cores = 1,
    verbose = FALSE)</pre>
```

calc\_logodds

Calculate the log odds ratio

#### **Description**

This function calculates the log odds ratio for a CpG tuple: (MM\*UU)/(UM\*MU), where 'M' stands for methylated and 'U' for unmethylated. 'MM' reflects the count for instances the CpG pair is methylated at both positions. The higher the MM and UU counts for that CpG pair, the higher the log odds ratio.

## Usage

```
calc_logodds(s, eps = 1)
```

# Arguments

S	A data frame that contains the MM,UU,UM, and MU counts for each CpG tuple
	for a particular sample. It is the resulting object of the read_tuples.
eps	Count added to each of the MM,UU,UM and MU counts to avoid dividing by
	zero for example. The default is set to 1.

## Value

The same object is returned with an additional column for the log odds ratio.

calc\_score Calculate score

# Description

This function calculates the ASM score for every tuple in a given sample. The ASM score is a multiplication of the log odds ratio by a weight that reflects the extent of allele-specific methylation. This weight is obtained with the calc\_weight function.

```
calc\_score(df, beta = 0.5, a = 0.2)
```

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#### **Arguments**

df	data frame of a sample containing all information per tuple (MM,UU,UM and MU counts, as well as the log odds ratio per tuple) needed for the ASM score.
beta	parameter for the calc_weight function. It's the alpha and beta values for the Beta function.
a	parameter for the calc_weight function. The weight will be the probability that the MM/(MM+UU) ratio lies between 0.5-a and 0.5+a.

#### **Details**

This function returns an allele-specific methylation (ASM) score for every given tuple in a sample. The ASM score is a product of the log odds ratio and a weight reflecting a measure of allele-specificity using the MM and UU counts.

#### Value

The same object with an additional column for the ASM score.

|--|

## **Description**

This function calculates a weight which reflects MM to UU balance, where M stands for methylated and U for unmethylated. Given the MM and UU counts for a particular tuple, the weight is obtained using the link{pbeta} function.

# Usage

```
calc_weight(MM, UU, beta = 0.5, a = 0.2)
```

## **Arguments**

MM	The read counts for where pos1 and pos2 of the tuple were both methylated.
UU	The read counts for where pos1 and pos2 of the tuple were both unmethylated.
beta	parameter for the beta distribution. In B(alpha,beta), we set alpha=beta=0.5 by default.
a	parameter for how far from 0.5 we go as a measure of allele-specific methylation. The weight is the probability that the MM:(MM+UU) ratio is between 0.5-a and 0.5+a. The default is set to 0.2.

# **Details**

For a given tuple with MM and UU counts, the weight that reflects allele-scpecificity is calculated as follows:

• Prior:

$$p(\theta|\alpha,\beta) \sim Beta(\alpha,\beta),$$

where  $\theta = \frac{MM}{MM + UU}$  and  $\alpha = \beta = 0.5$ .  $p(\theta | \alpha, \beta)$  represents our prior belief which is that tuples are either fully methylated or fully unmethylated, rather than allele-specifically methylated which is a much rarer event.

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· Likelihood:

$$p(x|\alpha,\beta) \propto \theta^{MM} (1-\theta)^{UU}$$
,

where x is our observation (the MM and UU counts).

• Posterior:

$$p(\theta|x) \propto p(x|\theta) * p(\theta|\alpha, \beta)$$

$$p(\theta|x) \propto \theta^{MM-0.5} (1-\theta)^{UU-0.5},$$

where  $\alpha = \beta = 0.5$ . This posterior also follows a beta distribution  $\sim Beta(\alpha' = MM + 0.5, \beta' = UU + 0.5)$ 

#### Value

A number that reflects allele-specificity given MM and UU counts for a CpG pair. This is used as a weight that is multiplied by the log odds ratio to give the final ASM score of that tuple.

#calc\_weight(MM=50, UU=50) #0.9999716

#calc\_weight(MM=20, UU=60) #0.1646916

DAMEfinder

DAMEfinder: Method to detect allele-specific methylation (ASM), and differential ASM from Bisulfite sequencing data in R.

# Description

The package allows the user to extract an ASM score in two ways: either from a bismark bam file(s) and VCF file(s), or from the output from methtuple. Either way the final output is a list of regions with differential allele-specific methylated between groups of samples of interest. The package also provides functions to visualize ASM at the read level or the score level

## **DAMEfinder functions**

calc\_asm extracts ASM for pairs of CpG sites from a methtuple file, calc\_derivedasm extracts ASM at each CpG site linked to a SNP from the VCF file. Both functions generate a RangedSummarizedExperiment, which is the input for the main function find\_dames, that generates a data. frame with regions exhibiting differential ASM between a number of samples.

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 $dame\_track$ 

Plot score tracks

# Description

Plot score tracks

# Usage

```
dame_track(
  dame,
  window = 0,
  positions = 0,
  derASM = NULL,
  ASM = NULL,
  colvec = NULL,
  plotSNP = FALSE
)
```

## **Arguments**

dame	GRanges object containing a region of interest, or detected with find_dames		
window	Number of CpG sites outside (up or down-stream) of the DAME should be plotted. Default = $0$ .		
positions	Number of bp sites outside (up or down-stream) of the DAME should be plotted. Default = $0$ .		
derASM	SummarizedExperiment object obtained from calc_derivedasm (Filtering should be done by the user)		
ASM	SummarizedExperiment object obtained from calc_asm (Filtering should be done by the user)		
colvec	Vector of colors (mainly useful for the SNP plot, because I add it with cowplot, so I don't export a ggplot, optional)		
plotSNP	whether to add the SNP track, only if derASM is specified. Default = FALSE		

# Value

Plot

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dame\_track\_mean

Plot means per group of score tracks.

# Description

Plot means per group of score tracks.

# Usage

```
dame_track_mean(
  dame,
  window = 0,
  positions = 0,
  derASM = NULL,
  ASM = NULL,
  colvec = NULL)
```

# Arguments

dame	GRanges object containing a region of interest, or detected with find_dames		
window	Number of CpG sites outside (up or down-stream) of the DAME should be plotted. Default = $0$ .		
positions Number of bp sites outside (up or down-stream) of the DAME should be Default = 0.			
derASM	SummarizedExperiment object obtained from calc_derivedasm (Filtering should be done by the user)		
ASM	SummarizedExperiment object obtained from calc_asm (Filtering should be done by the user)		
colvec	Vector of colors (mainly useful for the SNP plot, because I add it with cowplot, so I don't export a ggplot, optional)		

## Value

Plot

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extractbams\_output

extract\_bams() output.

#### **Description**

4 Patients from a previous study (Parker et al, 2018.) with colorectal cancer were sequenced and the normal and cancerous tissue of each patient was obtained. The data includes a subset of chromosome 19.

#### Usage

```
extractbams_output
```

#### **Format**

A large list with 8 elements. Each element is a list of GRanges for each sample. Each GRanges in the list includes the location of the CpG sites contained in the reads for each SNP. The GRanges metadata table contains:

```
cov.ref Number of reads of "reference" allele in that SNP cov.alt Number of reads of "alternative" allele in that SNP meth.ref Number of methylated reads of "reference" allele in that SNP cov.ref Number of methylated reads of "alternative" allele in that SNP snp The SNP containing the reads
```

For further details, see https://www.ebi.ac.uk/arrayexpress/experiments/E-MTAB-6949/sample names in in ArrayExpress do not necessarily match names given here!

extract\_bams

Detect allele-specific methylation from a bam file

## **Description**

The function takes a bam (from bismark) and vcf file for each sample. For each SNP contained in the vcfile it calculates the proportion of methylated reads for each CpG site at each allele. At the end it returns (saves to working directory) a GRanges list, where each GRanges contains all the CpG sites overlapping the reads containing a specific SNP.

```
extract_bams(
  bamFiles,
  vcfFiles,
  sampleNames,
  referenceFile,
  coverage = 4,
  cores = 1,
  verbose = TRUE
)
```

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#### **Arguments**

bamFiles List of bam files. vcfFiles List of vcf files.

sampleNames Names of files in the list.

referenceFile fasta file used to generate the bam files. Or DNAStringSet with DNA sequence.

coverage Minimum number of reads covering a CpG site on each allele. Default = 2.

Cores Number of cores to use. See package parallel for description of core. Default =

1

verbose Default = TRUE

#### Value

A list of GRanges for each sample. Each list is saved in a separate .rds file.

#### **Examples**

```
DATA_PATH_DIR <- system.file('extdata', '.', package = 'DAMEfinder')
get_data_path <- function(file_name) file.path(DATA_PATH_DIR, file_name)
bamFiles <- get_data_path('NORM1_chr19_trim.bam')
vcfFiles <- get_data_path('NORM1.chr19.trim.vcf')
sampleNames <- 'NORM1'

#referenceFile
suppressPackageStartupMessages({library(BSgenome.Hsapiens.UCSC.hg19)})
genome <- BSgenome.Hsapiens.UCSC.hg19
seqnames(genome) <- gsub("chr","", seqnames(genome))
dna <- DNAStringSet(genome[[19]], use.names = TRUE)
names(dna) <- 19

GRanges_list <- extract_bams(bamFiles, vcfFiles, sampleNames, dna)
```

find\_dames

Find DAMEs

## **Description**

This function finds Differential Allele-specific MEthylated regions (DAMEs). It uses the regionFinder function from bumphunter, and asigns p-values either empirically or using the Simes method.

```
find_dames(
    sa,
    design,
    coef = 2,
    contrast = NULL,
    smooth = TRUE,
    Q = 0.5,
    pvalAssign = "simes",
```

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```
maxGap = 20,
verbose = TRUE,
maxPerms = 10,
method = "1s",
trend = FALSE,
...
)
```

#### **Arguments**

design A design matrix created with model.matrix.  coef Column in design specifying the parameter to estimate. Default = 2.  contrast a contrast matrix, generated with makeContrasts.  smooth Whether smoothing should be applied to the t-Statistics. Default = TRUE.  Q The percentile set to get a cutoff value K. K is the value on the Qth quantile of the absolute values of the given (smoothed) t-statistics. Only necessary if pvalAssign = 'empirical'. Default = 0.5.  pvalAssign Choose method to assign pvalues, either 'simes' (default) or 'empirical'. This second one performs maxPerms number of permutations to calculate null statistics, and runs regionFinder.  maxGap Maximum gap between CpGs in a cluster (in bp). NOTE: Regions can be as small as 1 bp. Default = 20.  verbose If the function should be verbose. Default = TRUE.  maxPerms Maximum possible permutations generated. Only necessary if pvalAssign = 'empirical'. Default = 10.  method The method to be used in limma's lmFit. The default is set to 'ls' but can also be set to 'robust', which is recommended on a real data set.  trend Passed to eBayes. Should an intensity-trend be allowed for the prior variance? Default is that the prior variance is constant, e.g. FALSE.  Arguments passed to get_tstats.	sa	A SummarizedExperiment containing ASM values where each row correspond to a tuple/site and a column to sample/replicate.	
a contrast matrix, generated with makeContrasts.  Smooth Whether smoothing should be applied to the t-Statistics. Default = TRUE.  Q The percentile set to get a cutoff value K. K is the value on the Qth quantile of the absolute values of the given (smoothed) t-statistics. Only necessary if pvalAssign = 'empirical'. Default = 0.5.  PvalAssign Choose method to assign pvalues, either 'simes' (default) or 'empirical'. This second one performs maxPerms number of permutations to calculate null statistics, and runs regionFinder.  Maximum gap between CpGs in a cluster (in bp). NOTE: Regions can be as small as 1 bp. Default = 20.  Verbose If the function should be verbose. Default = TRUE.  Maximum possible permutations generated. Only necessary if pvalAssign = 'empirical'. Default = 10.  method The method to be used in limma's lmFit. The default is set to 'ls' but can also be set to 'robust', which is recommended on a real data set.  trend Passed to eBayes. Should an intensity-trend be allowed for the prior variance? Default is that the prior variance is constant, e.g. FALSE.	design	A design matrix created with model.matrix.	
Whether smoothing should be applied to the t-Statistics. Default = TRUE.  The percentile set to get a cutoff value K. K is the value on the Qth quantile of the absolute values of the given (smoothed) t-statistics. Only necessary if pvalAssign = 'empirical'. Default = 0.5.  Choose method to assign pvalues, either 'simes' (default) or 'empirical'. This second one performs maxPerms number of permutations to calculate null statistics, and runs regionFinder.  Maximum gap between CpGs in a cluster (in bp). NOTE: Regions can be as small as 1 bp. Default = 20.  Verbose If the function should be verbose. Default = TRUE.  Maximum possible permutations generated. Only necessary if pvalAssign = 'empirical'. Default = 10.  method The method to be used in limma's lmFit. The default is set to 'ls' but can also be set to 'robust', which is recommended on a real data set.  trend Passed to eBayes. Should an intensity-trend be allowed for the prior variance? Default is that the prior variance is constant, e.g. FALSE.	coef	Column in design specifying the parameter to estimate. Default = 2.	
The percentile set to get a cutoff value K. K is the value on the Qth quantile of the absolute values of the given (smoothed) t-statistics. Only necessary if pvalAssign = 'empirical'. Default = 0.5.  PvalAssign  Choose method to assign pvalues, either 'simes' (default) or 'empirical'. This second one performs maxPerms number of permutations to calculate null statistics, and runs regionFinder.  Maximum gap between CpGs in a cluster (in bp). NOTE: Regions can be as small as 1 bp. Default = 20.  verbose  If the function should be verbose. Default = TRUE.  Maximum possible permutations generated. Only necessary if pvalAssign = 'empirical'. Default = 10.  method  The method to be used in limma's lmFit. The default is set to 'ls' but can also be set to 'robust', which is recommended on a real data set.  trend  Passed to eBayes. Should an intensity-trend be allowed for the prior variance? Default is that the prior variance is constant, e.g. FALSE.	contrast	a contrast matrix, generated with makeContrasts.	
of the absolute values of the given (smoothed) t-statistics. Only necessary if pvalAssign = 'empirical'. Default = 0.5.  pvalAssign  Choose method to assign pvalues, either 'simes' (default) or 'empirical'. This second one performs maxPerms number of permutations to calculate null statistics, and runs regionFinder.  maxGap  Maximum gap between CpGs in a cluster (in bp). NOTE: Regions can be as small as 1 bp. Default = 20.  verbose  If the function should be verbose. Default = TRUE.  maxPerms  Maximum possible permutations generated. Only necessary if pvalAssign = 'empirical'. Default = 10.  method  The method to be used in limma's lmFit. The default is set to 'ls' but can also be set to 'robust', which is recommended on a real data set.  trend  Passed to eBayes. Should an intensity-trend be allowed for the prior variance? Default is that the prior variance is constant, e.g. FALSE.	smooth	Whether smoothing should be applied to the t-Statistics. Default = TRUE.	
second one performs maxPerms number of permutations to calculate null statistics, and runs regionFinder.  maxGap Maximum gap between CpGs in a cluster (in bp). NOTE: Regions can be as small as 1 bp. Default = 20.  verbose If the function should be verbose. Default = TRUE.  maxPerms Maximum possible permutations generated. Only necessary if pvalAssign = 'empirical'. Default = 10.  method The method to be used in limma's lmFit. The default is set to 'ls' but can also be set to 'robust', which is recommended on a real data set.  trend Passed to eBayes. Should an intensity-trend be allowed for the prior variance? Default is that the prior variance is constant, e.g. FALSE.	Q	of the absolute values of the given (smoothed) t-statistics. Only necessary if	
small as 1 bp. Default = 20.  verbose If the function should be verbose. Default = TRUE.  maxPerms Maximum possible permutations generated. Only necessary if pvalAssign = 'empirical'. Default = 10.  method The method to be used in limma's lmFit. The default is set to 'ls' but can also be set to 'robust', which is recommended on a real data set.  trend Passed to eBayes. Should an intensity-trend be allowed for the prior variance? Default is that the prior variance is constant, e.g. FALSE.	pvalAssign	second one performs maxPerms number of permutations to calculate null statis-	
maxPerms  Maximum possible permutations generated. Only necessary if pvalAssign = 'empirical'. Default = 10.  method  The method to be used in limma's lmFit. The default is set to 'ls' but can also be set to 'robust', which is recommended on a real data set.  trend  Passed to eBayes. Should an intensity-trend be allowed for the prior variance? Default is that the prior variance is constant, e.g. FALSE.	maxGap		
'empirical'. Default = 10.  The method to be used in limma's lmFit. The default is set to 'ls' but can also be set to 'robust', which is recommended on a real data set.  trend Passed to eBayes. Should an intensity-trend be allowed for the prior variance? Default is that the prior variance is constant, e.g. FALSE.	verbose	If the function should be verbose. Default = TRUE.	
be set to 'robust', which is recommended on a real data set.  Passed to eBayes. Should an intensity-trend be allowed for the prior variance?  Default is that the prior variance is constant, e.g. FALSE.	maxPerms		
Default is that the prior variance is constant, e.g. FALSE.	method		
Arguments passed to get_tstats.	trend	· · · · · · · · · · · · · · · · · · ·	
		Arguments passed to get_tstats.	

#### **Details**

The simes method has higher power to detect DAMEs, but the consistency in signal across a region is better controlled with the empirical method, since it uses regionFinder and getSegments to find regions with t-statistics above a cuttof (controlled with parameter Q), whereas with the 'simes' option, we initially detects clusters of CpG sites/tuples, and then test if at least 1 differential site/tuple is present in the cluster.

We recommend trying out different maxGap and Q parameters, since the size and the effect-size of obtained DAMEs change with these parameters.

# Value

A data frame of detected DAMEs ordered by the p-value. Each row is a DAME and the following information is provided in the columns (some column names change depending on the pvalAssign choice):

• chr: on which chromosome the DAME is found.

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- start: The start position of the DAME.
- end: The end position of the DAME.
- pvalSimes: p-value calculated with the Simes method.
- pvalEmp: Empirical p-value obtained from permuting covariate of interest.
- sumTstat: Sum of t-stats per segment/cluster.
- meanTstat: Mean of t-stats per segment/cluster.
- segmentL: Size of segmented cluster (from getSegments).
- clusterL: Size of original cluster (from clusterMaker).
- FDR: Adjusted p-value using the method of Benjamini, Hochberg. (from p. adjust).
- numup: Number of sites with ASM increase in cluster (only for Simes).
- numdown: Number of sites with ASM decrease in cluster (only for Simes).

# **Examples**

```
data(readtuples_output)
ASM <- calc_asm(readtuples_output)
grp <- factor(c(rep('CRC',3),rep('NORM',2)), levels = c('NORM', 'CRC'))
mod <- model.matrix(~grp)
dames <- find_dames(ASM, mod, verbose = FALSE)</pre>
```

get\_tstats

Get t-Statistics

# Description

This function calculates a moderated t-Statistic per site or tuple using limma's lmFit and eBayes functions. It then smoothes the obtained t-Statistics using bumphunter's smoother function.

```
get_tstats(
    sa,
    design,
    contrast = NULL,
    method = "ls",
    trend = FALSE,
    smooth = FALSE,
    maxGap = 20,
    coef = 2,
    verbose = TRUE,
    filter = TRUE,
    ...
)
```

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## **Arguments**

	sa	A SummarizedExperiment containing ASM values where each row and column correspond to a tuple/site and sample respectively.	
	design	a design matrix created with model.matrix.	
	contrast	a contrast matrix, generated with makeContrasts.	
	method	The method to be used in limma's ${\tt lmFit}$ . The default is set to 'ls' but can also be set to 'robust', which is recommended on a real data set.	
	trend	Passed to eBayes. Should an intensity-trend be allowed for the prior variance? Default is that the prior variance is constant, e.g. FALSE.	
	smooth	Whether smoothing should be applied to the t-Statistics. Default = FAI If TRUE, wherever smoothing is not possible, the un-smoothed t-stat is instead.	
	maxGap	The maximum allowed gap between genomic positions for clustering of genomic regions to be used in smoothing. Default = $20$ .	
coef Column in model.matrix specifying the parameter to estimate. Default = contrast specified, column with contrast of interest.			
	verbose Set verbose. Default = TRUE.		
	filter	Remove empty tstats. Default = TRUE.	
		Arguments passed to loessByCluster. Only used if smooth = TRUE.	

## **Details**

The smoothing is done on genomic clusters consisting of CpGs that are close to each other. In the case of tuples, the midpoint of the two genomic positions in each tuple is used as the genomic position of that tuple, to perform the smoothing. The function takes a RangedSummarizedExperiment generated by calc\_derivedasm or calc\_asm containing ASM across samples, and the index of control and treatment samples.

## Value

 $A\ vector\ of\ t\text{-}Statistics\ within\ the\ RangedSummarizedExperiment.$ 

```
data(readtuples_output)
ASM <- calc_asm(readtuples_output)
grp <- factor(c(rep('CRC',3),rep('NORM',2)), levels = c('NORM', 'CRC'))
mod <- model.matrix(~grp)
tstats <- get_tstats(ASM, mod)</pre>
```

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## **Description**

Draws CpG site methylation status as points, in reads containing a specific SNP. Generates one plot per bam file.

## Usage

```
methyl_circle_plot(
    snp,
    vcfFile,
    bamFile,
    refFile,
    build = "hg19",
    dame = NULL,
    letterSize = 2.5,
    pointSize = 3,
    sampleName = "sample1",
    cpgsite = NULL,
    sampleReads = FALSE,
    numReads = 20
)
```

## **Arguments**

snp GRanges object containing SNP location.

vcfFile vcf file.

bamFile bismark bam file path.

refFile fasta reference file path. Or DNAStringSet with DNA sequence.

build genome build used. default = "hg19"

dame (optional) GRanges object containing a region to plot.

letterSize Size of alleles drawn in plot. Default = 2.5.
pointSize Size of methylation circles. Default = 3.

sampleName FIX?: this is to save the vcf file to not generate it every time you run the function.

cpgsite (optional) GRanges object containing a single CpG site location of interest.

sampleReads Whether a subset of reads should be plotted. Default = FALSE.

numReads Number of reads to plot per allele, if sampleReads is TRUE. Default = 20

#### Value

Plot

#### **Examples**

```
DATA_PATH_DIR <- system.file('extdata', '.', package = 'DAMEfinder')</pre>
get_data_path <- function(file_name) file.path(DATA_PATH_DIR, file_name)</pre>
bam_files <- get_data_path('NORM1_chr19_trim.bam')</pre>
vcf_files <- get_data_path('NORM1.chr19.trim.vcf')</pre>
sample_names <- 'NORM1'</pre>
#reference_file
suppressPackageStartupMessages(\{library(BSgenome.Hsapiens.UCSC.hg19)\})\\
genome <- BSgenome.Hsapiens.UCSC.hg19</pre>
seqnames(genome) <- gsub("chr","",seqnames(genome))</pre>
dna <- DNAStringSet(genome[[19]], use.names = TRUE)</pre>
names(dna) <- 19
snp <- GenomicRanges::GRanges(19, IRanges::IRanges(292082, width = 1))</pre>
methyl_circle_plot(snp = snp,
vcfFile = vcf_files,
bamFile = bam_files,
 refFile = dna,
 sampleName = sample_names)
```

methyl\_circle\_plotCpG Draw methylation circle plot without SNP

## **Description**

Draws CpG site methylation status as points, in reads containing a specific CpG site. Generates one plot per bam file.

## Usage

```
methyl_circle_plotCpG(
  cpgsite = cpgsite,
  bamFile = bamFile,
  pointSize = 3,
  refFile = refFile,
  dame = NULL,
  order = FALSE,
  sampleName = NULL,
  sampleReads = FALSE,
  numReads = 20
)
```

## Arguments

cpgsite	GRanges object containing a single CpG site location of interest
bamFile	bismark bam file path
pointSize	Size of methylation circles. Default $= 3$ .
refFile	fasta reference file path
dame	(optional) GRanges object containing a region to plot

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order Whether reads should be sorted by methylation status. Default= False.

sampleName Plot title.

sampleReads Whether a subset of reads should be plotted. Default = FALSE.

numReads Number of reads to plot, if sampleReads is TRUE. Default = 20

#### Value

Plot

#### **Examples**

```
DATA_PATH_DIR <- system.file('extdata', '.', package = 'DAMEfinder')
get_data_path <- function(file_name) file.path(DATA_PATH_DIR, file_name)
bam_files <- get_data_path('NORM1_chr19_trim.bam')
sample_names <- 'NORM1'
#reference_file
suppressPackageStartupMessages({library(BSgenome.Hsapiens.UCSC.hg19)})
genome <- BSgenome.Hsapiens.UCSC.hg19
seqnames(genome) <- gsub("chr","", seqnames(genome))
dna <- DNAStringSet(genome[[19]], use.names = TRUE)
names(dna) <- 19

cpg <- GenomicRanges::GRanges(19, IRanges::IRanges(292082, width = 1))
methyl_circle_plotCpG(cpgsite = cpg,
bamFile = bam_files,
refFile = dna)</pre>
```

methyl\_MDS\_plot Multidimensional scaling plot of distances between methylation proportions (beta values)

#### **Description**

Same as plotMDS, except for an arc-sine transformation of the methylation proportions.

#### Usage

```
methyl_MDS_plot(x, group, top = 1000, coverage = 5, adj = 0.02, pointSize = 4)
```

## **Arguments**

x R	angedSummarizedE	experiment, outp	put from calc_d	erivedasm or calc_asm.
-----	------------------	------------------	-----------------	------------------------

group Vector of group or any other labels, same length as number of samples.

top Number of top CpG sites used to calculate pairwise distances.

coverage Minimum number of reads covering a CpG site on each allele. Default = 5.

adj Text adjustment in y-axis. Default = 0.2.

pointSize Default = 4.

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#### Value

Two-dimensional MDS plot.

## **Examples**

```
data(readtuples_output)
ASM <- calc_asm(readtuples_output)
grp <- factor(c(rep('CRC',3),rep('NORM',2)), levels = c('NORM', 'CRC'))
methyl_MDS_plot(ASM, grp)</pre>
```

modulus\_sqrt

Get Modulus Square Root

## **Description**

Function to calculate signed square root (aka modulus square root).

## Usage

```
modulus_sqrt(values)
```

# **Arguments**

values

Vector or matrix of ASM scores where each column is a sample. These values are transformed with a square root transformation that (doesn't) preserve the sign.

## Value

Vector or matrix of transformed scores.

 ${\tt readtuples\_output}$ 

read\_tuples() output.

## **Description**

3 Patients from a previous study (Parker et al, 2018.) with colorectal cancer were sequenced and the normal and cancerous tissue of each patient was obtained. The data includes a subset of chromosome 19. Here one normal sample is not included.

```
readtuples_output
```

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#### **Format**

A large list with 5 elements. Each element is a tibble with the coordinates of the pairs of CpG sites (tuples). Rest of the tibble contains:

MM Number of reads with both CpG sites methylated

MU Number of reads with first CpG site methylated

UM Number of reads with second CpG site methylated

UU Number of reads with both CpG sites unmethylated

cov Coverage, total reads at tuple

inter\_dist Distance in bp between CpG sites

For further details, see https://www.ebi.ac.uk/arrayexpress/experiments/E-MTAB-6949/sample names in in ArrayExpress do not necessarily match names given here!

read\_tuples

Read in list of methtuple files

## **Description**

This function reads in a list of files obtained from the methtuple tool. It filters out tuples based on the set minimum coverage (min\_cov) and the maximum allowed distance (maxGap) between two genomic positions in a tuple.

#### Usage

```
read_tuples(files, sampleNames, minCoverage = 2, maxGap = 20, verbose = TRUE)
```

#### Arguments

files List of methtuple files. sampleNames Names of files in the list.

minCoverage The minimum coverage per tuple. Tuples with a coverage < minCoverage are

filtered out. Default = 2.

maxGap The maximum allowed distance between two positions in a tuple. Only distances

that are  $\leftarrow$  maxGap are kept. Default = 150 base pairs.

verbose If the function should be verbose.

#### Value

A list of data frames, where each data frame corresponds to one file.

```
DATA_PATH_DIR <- system.file('extdata', '.', package = 'DAMEfinder')
get_data_path <- function(file_name) file.path(DATA_PATH_DIR, file_name)

tuple_files <- list.files(DATA_PATH_DIR, '.tsv.gz')
tuple_files <- get_data_path(tuple_files)

ASM <- read_tuples(tuple_files, c('CRC1', 'NORM1'))
```

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