

# Package ‘MeinteR’

September 9, 2019

**Type** Package

**Title** MeinteR (MEthylation INTERpretation): A computational method to prioritize aberrant DNA methylation using local genomic substrate

**Description** MeinteR builds genomic signatures of differential methylated sites based on a set of transcriptional regulatory elements and prioritizes critical sites that more likely have strong influence on phenotype expression.

**Version** 0.99.0

**URL** <https://github.com/andigoni/MeinteR>

**Date** 2019-04-30

**License** GPL-3

**LazyData** TRUE

**Depends** R (>= 2.10), Biostrings, pqsfinder, DNASHapeR, FDb.InfiniumMethylation.hg19,IlluminaHumanMethylationEPICanno.ilm10b4.hg19

**Suggests** testthat, knitr

**VignetteBuilder** knitr

**biocViews** DNAMethylation, AlternativeSplicing, DifferentialMethylation, GeneRegulation, Epigenetics,Sequencing,MethylationArray,MethylSeq,EpigeneticsWorkflow

**Imports** GenomicRanges, BSgenome.Hsapiens.UCSC.hg19, ggplot2, dplyr, plyr, rtracklayer, BSgenome, tidyverse, XVector, GenomeInfoDb, S4Vectors, stats4, stats, IRanges, BiocGenerics, parallel, reshape2, TFBSTools, JASPAR2018, graphics, utils, grDevices, TxDb.Hsapiens.UCSC.hg19.knownGene, GenomicFeatures, GEOquery, Biobase

**Author** Andigoni Malousi <andigoni@auth.gr>

**Maintainer** Andigoni Malousi <andigoni@auth.gr>

**RoxygenNote** 6.1.1

## R topics documented:

|                             |   |
|-----------------------------|---|
| bed2Seq . . . . .           | 2 |
| cpgIslands . . . . .        | 3 |
| cTF . . . . .               | 3 |
| filterByCGI . . . . .       | 3 |
| filterByProm . . . . .      | 4 |
| findAltSplicing . . . . .   | 4 |
| findConservedTFBS . . . . . | 5 |

|                           |           |
|---------------------------|-----------|
| findPals . . . . .        | 5         |
| findQuads . . . . .       | 6         |
| findShapes . . . . .      | 7         |
| findSpliceSites . . . . . | 7         |
| findTFBS . . . . .        | 8         |
| importGEO . . . . .       | 9         |
| importLimma . . . . .     | 9         |
| isEmptyDF . . . . .       | 10        |
| loadFile . . . . .        | 10        |
| loadSeqGEO . . . . .      | 11        |
| meinter . . . . .         | 11        |
| nameStudy . . . . .       | 12        |
| plotBeta . . . . .        | 12        |
| plotCpG . . . . .         | 13        |
| plotTF . . . . .          | 13        |
| refFreq . . . . .         | 14        |
| reorderBed . . . . .      | 14        |
| sample . . . . .          | 15        |
| scatterConsTF . . . . .   | 15        |
| test.data . . . . .       | 16        |
| TF.class . . . . .        | 16        |
| validateBed . . . . .     | 17        |
| <b>Index</b>              | <b>18</b> |

---

bed2Seq

---

*Fetch sequences from bed-formatted data frames*


---

## Description

Fetch sequences from bed-formatted data frames

## Usage

```
bed2Seq(bedline, offset)
```

## Arguments

|         |   |
|---------|---|
| bedline | Valid bed-formatted data frame                              |
| offset  | Number of nucleotides expanded in each direction ([1,1000]) |

## Value

A DNAStringset containing the sequences in hg19 genome assembly

---

|            |                                     |
|------------|-------------------------------------|
| cpgIslands | <i>CpG islands (reference data)</i> |
|------------|-------------------------------------|

---

**Description**

List of 27,718 human CpG islands with their corresponding GC-content and observed/expected ratio in chromosomes chr1..22,X,Y (hg19). The list is obtained from the cpgIslandExt table of UCSC Table Browser.

**Format**

chrom CpG island chromosome  
chromStart CpG island chromosome start position  
chromEnd CpG island chromosome end position  
perGC GC-content i.e. Percentage of the CpG island that is C or G  
obsExp Observed/expected ratio i.e.:  $\text{Number of CpG} * N / (\text{Number of C} * \text{Number of G})$ ,  $N = \text{Sequence length}$

---

|     |   |
|-----|---|
| cTF | <i>Conserved transcription factors (reference data)</i> |
|-----|---|

---

**Description**

Tab-delimited data containing the 634 conserved transcription factors among mouse-rat-human alignments. The list is obtained from the tfbsConsFactors table of UCSC Table Browser.

**Format**

name Identifier of the conserved transcription factor  
factor Name of the transcription factor

---

|             |                              |
|-------------|------------------------------|
| filterByCGI | <i>Filter by CpG islands</i> |
|-------------|------------------------------|

---

**Description**

Selects genomic coordinates included in CpG islands, using the cpgIslands dataset.

**Usage**

```
filterByCGI(input.data)
```

**Arguments**

input.data      A data frame containing input data in bed format

**Value**

A data frame with the CpG sites located in CpG islands

---

|              |                            |
|--------------|----------------------------|
| filterByProm | <i>Filter by promoters</i> |
|--------------|----------------------------|

---

**Description**

Selects genomic coordinates included in promoters based on the UCSC hg19 gene coordinates.

**Usage**

```
filterByProm(input.data, up.tss, down.tss)
```

**Arguments**

|            |   |
|------------|---|
| input.data | A data frame containing input data in bed format          |
| up.tss     | Number of nucleotides upstream transcription start site   |
| down.tss   | Number of nucleotides downstream transcription start site |

**Value**

A data frame with the CpG sites located in promoter regions

---

|                 |   |
|-----------------|---|
| findAltSplicing | <i>Find alternative splicing events</i> |
|-----------------|---|

---

**Description**

Identifies known alternative splicing events co-localized with input data.

**Usage**

```
findAltSplicing(bed.data, known.alt.splice = NULL)
```

**Arguments**

|                  |  |
|------------------|--|
| bed.data         | A data frame containing input bed-formatted data   |
| known.alt.splice | (optional) Full local path to the UCSC knownalt table. If the table is not available locally then the script will fetch known alternative splicing events from UCSC (needs Internet connection). |

**Value**

- 1/ A data frame with the identified alternative splicing event overlaps (hg19)
- 2/ A summary table with the frequency of each alternative splicing event compared to the reference frequency
- 3/ A data frame with the number of alternative splicing events per sequence (input to meinter function)
- 4/ An overlaid bar chart object

---

|                   |   |
|-------------------|---|
| findConservedTFBS | <i>Find differentially methylated sites overlapping human/mouse/rat conserved transcription factor binding sites.</i> |
|-------------------|---|

---

### Description

Detects transcription factor binding sites that are conserved in human/mouse/rat alignments and overlap with the input data. A binding site is considered to be conserved across the alignment if its score meets the threshold score for its binding matrix in all three species. The score and threshold are computed with the Transfac Matrix Database (v7.0) created by Biobase. The data are purely computational, and as such not all binding sites listed here are biologically functional binding sites.

### Usage

```
findConservedTFBS(bed.data, known.conserved.tfbs.file = NULL)
```

### Arguments

|                           |  |
|---------------------------|--|
| bed.data                  | A data frame containing input bed-formatted data   |
| known.conserved.tfbs.file | (optional) Full local path to the UCSC conserved transcription factor binding sites. If the table is not available locally then the script will fetch it from UCSC (needs Internet connection). NOTE: It is recommended to download the compressed file (Unzipped file >290MB) |

### Value

- 1/ Data frame containing overlaps between bed.data and conserved transcription factor binding sites
- 2/ Frequency table of conserved transcription factors on human genome (input to scatterConsTF function)
- 3/ A data frame with the number of conserved transcription factor binding sites per sequence (input to meinter function)

---

|          |  |
|----------|--|
| findPals | <i>Find palindromes in a bed-formatted dataset</i> |
|----------|--|

---

### Description

Deetects whether the target cytosine overlaps with a palindromic sequences or it is located inbetween of the two arms of a palindromic sequence i.e. in the loop formed by the palindrome.

### Usage

```
findPals(bed.data, offset = 10, min.arm = 5, max.loop = 5,
max.mismatch = 1)
```

**Arguments**

|              |   |
|--------------|---|
| bed.data     | A data frame containing input bed-formatted data  |
| offset       | Number of nucleotides expanded in each direction (default:10, max:200)                    |
| min.arm      | Minimum length of each arm (default:5)  |
| max.loop     | Maximum length of the loop between the two arms of the palindrome                         |
| max.mismatch | The maximum number of mismatching letters allowed between the two arms of the palindromes |

**Value**

- 1/ DNAString subject with the identified palindromes
- 2/ Number of palindromes falling on/neighbors input data
- 3/ Number of palindromes per sequence (input to 'meinter' function)

---

|           |   |
|-----------|---|
| findQuads | <i>Find quadruplexes in sequences centered at CpG sites</i> |
|-----------|---|

---

**Description**

This function will detect DNA sequence patterns that likely fold into G-quadruplex structures.

**Usage**

```
findQuads(bed.data, offset = 100)
```

**Arguments**

|          |  |
|----------|--|
| bed.data | A data frame containing input bed-formatted data                         |
| offset   | Number of nucleotides expanded in each direction (default:100, max:1000) |

**Value**

A DNAString subject with the identified G-quadruplexes, their length and relative coordinates  
 Number of G-quadruplexes per sequence (input to 'meinter' function)

---

findShapes

*Find putative conformational DNA changes*


---

### Description

Predicts conformational changes of DNA shapes, such as minor groove width (MGW), roll, propeller twist (ProT) and helix twist (HeIT) in the unmethylated and methylated context using methyl-DNAshape algorithm.

### Usage

```
findShapes(bed.data, offset = 50, shape.plot = FALSE)
```

### Arguments

|            |   |
|------------|---|
| bed.data   | A data frame containing input bed-formatted data  |
| offset     | Number of nucleotides expanded in each direction (default:50, max:200)  |
| shape.plot | A logical flag. If TRUE, the function will display a multi-plot with the conformational changes. (default: FALSE) |

### Value

- 1/ p-value of the MGW in the unmethylated/methylated CpG context for each sequence
- 2/ p-value of the HeIT in the unmethylated/methylated CpG context for each sequence
- 3/ p-value of the ProT in the unmethylated/methylated CpG context for each sequence
- 4/ p-value of the Roll in the unmethylated/methylated CpG context for each sequence

---

findSpliceSites

*Find splice sites*


---

### Description

Detects potential splice sites in the proximal region of the input genomic coordinates. The function implements the prediction model proposed by Shapiro and Senapathy (Shapiro MB, Senapathy P. Nucleic Acids Research. 1987;15(17):7155-7174.)

### Usage

```
findSpliceSites(bed.data, persim = 0.8, offset = 10)
```

### Arguments

|          |  |
|----------|--|
| bed.data | A data frame containing input bed-formatted data                             |
| persim   | Similarity with the splice site consensus (default:0.8, range between [0,1]) |
| offset   | Number of nucleotides expanded in each direction (default:10, min:5, max:50) |

**Value**

- 1/ A detailed table with the location of the detected splice sites in each sequence and the corresponding similarity score
- 2/ A summary table with the number of splice sites detected in each sequence (input 'meinter' function)

---

|          |   |
|----------|---|
| findTFBS | <i>Find putative transcription factor binding sites</i> |
|----------|---|

---

**Description**

Detects JASPAR's transcription factor binding sites (core collection), co-localized with input data. Both sequence strands are examined. The analysis can be restricted to promoters (use 'uptss' and 'down.tss' to define promoter length, relative to transcription start site) and CpG islands of the human genome (hg19).

**Usage**

```
findTFBS(bed.data, persim = 0.8, offset = 12, target = "PROMOTER",
         up.tss = 1000, down.tss = 100, mcores = NULL, tf.ID = NULL)
```

**Arguments**

|          |   |
|----------|---|
| bed.data | A data frame containing input bed-formatted data  |
| persim   | Minimum similarity with transcription factors consensus matrices (default:0.8, range in [0,1])  |
| offset   | Number of nucleotides expanded in each direction (default:12, min:5, max:100)   |
| target   | Search for transcription factor binding sites on specific regions. 'PROMOTER': selects sites located in promoter regions, 'CGI': selects sites in CpG islands, 'ALL': No filtering is applied (time-consuming for large datasets) (default: "PROMOTER") |
| up.tss   | Number of nucleotides upstream transcription start site (Only when target="PROMOTER" is set, default: 1000)   |
| down.tss | Number of nucleotides downstream transcription start site (Only when target="PROMOTER" is set, default: 100)  |
| mcores   | Number of cores to be used (default: maximum available)   |
| tf.ID    | A vector of JASPAR transcription factors identifiers to search for (default: all)   |

**Value**

- 1/ Data frame containing the transcription factors identified in each sequence, their position and binding score (input to 'plotTF' function)
- 2/ Data frame of the detected transcription factor binding sites per sequence (input to 'meinter' function)



---

|           |  |
|-----------|--|
| importGEO | <i>Import GEO data series in the workspace</i> |
|-----------|--|

---

**Description**

Imports GEO data series. The function fetches data matrices corresponding to a pre-defined GSE identifier and builds valid, bed-formatted dataset with delta-beta values between two sample groups, described in a user-defined annotation file.

**Usage**

```
importGEO(gse.acc, annotation.file)
```

**Arguments**

|                 |  |
|-----------------|--|
| gse.acc         | A string corresponding to the accession number of the GEO data series  |
| annotation.file | A string corresponding to the full local path to the annotation files containing sample grouping information |

**Value**

- 1/ A bed-formatted data frame with the chromosomal coordinates and of each methylation probe and the corresponding delta-beta values between the two groups
- 2/ Beta values of each sample listed in the annotation file
- 3/ Annotation data frame
- 4/ Mean beta values of group 1
- 5/ Mean beta values of group 2

---

|             |   |
|-------------|---|
| importLimma | <i>Imports the results of differential methylation analyses exported by limma</i> |
|-------------|---|

---

**Description**

Imports the results of differential methylation analyses exported by limma

**Usage**

```
importLimma(ltop.obj, platform = "hm450k", sortBy = "adj.P.Val")
```

**Arguments**

|          |  |
|----------|--|
| ltop.obj | Output of limma differential analysis. The output data frame produced by the <code>limma::topTable</code> function.      |
| platform | A string corresponding to the human methylation array. Possible values are "hm27k", "hm450k" and "EPIC" (default:hm450k) |
| sortBy   | The criterion for selecting probes of the MArrayLM object. Possible values are: "logFC", "P.Value", "adj.P.Val"          |

**Value**

df A well-formatted data frame to be used as input to the MeinteR workflow.

---

|           |                                     |
|-----------|-------------------------------------|
| isEmptyDF | <i>Check if data frame is empty</i> |
|-----------|-------------------------------------|

---

**Description**

Checks if a data frame has no values

**Usage**

```
isEmptyDF(df)
```

**Arguments**

df                      The input data frame

**Value**

TRUE/FALSE (TRUE is the data frame is empty)

---

|          |                        |
|----------|------------------------|
| loadFile | <i>Load input data</i> |
|----------|------------------------|

---

**Description**

Loads tabular files containing methylation data. The function checks the delimiter and validates the order of the columns (chr, start,end,score,strand).

**Usage**

```
loadFile(FH)
```

**Arguments**

FH                      Full path of the tabular methylation data

**Value**

df A data frame with the tabular methylation data

loadSeqGEO

*Reformat methylation sequencing data fetched from GEO***Description**

Transforms sequencing data into bed-formatted files. Valid for per sample usage.

**Usage**

```
loadSeqGEO(file.path, cov = 10, chroms = NULL)
```

**Arguments**

|           |  |
|-----------|--|
| file.path | Local folder of the bed.gz file  |
| cov       | Minimum read coverage (default:10)   |
| chroms    | A vector of chromosome vector to be included in the analysis (default:ALL) |

**Value**

A valid bed-formatted data frame

meinter

*Calculate the genomic index of methylation sites based on the Meinter's 'find\*' functions' outputs***Description**

Calculates the genomic index given a set of features pre-analysed using MeinterR's 'find\*' functions. First, the function builds the local genomic signature of each site and then it calculates the genomic index using a weighting scheme.

**Usage**

```
meinter(bed.data, funList, weights)
```

**Arguments**

|          |   |
|----------|---|
| bed.data | A data frame containing input bed-formatted data  |
| funList  | List of 'find*' functions outputs. At least one core function is needed to calculate the genomic index. Valid element names of the list: 'spl's'- 'findSpliceSites', 'altss'- 'findAltSplicing', 'ctfbs'- 'findConservedTFBS', 'tfbs'- 'findTFBS', 'pals'- 'findPals', 'quads'- 'findQuads', 'shapes'- 'findShapes' |
| weights  | A list of positive values corresponding to feature weights [0,10]. Same list elements with 'funList' list   |

**Value**

A data frame with the genomic index of the input data

---

|           |                         |
|-----------|-------------------------|
| nameStudy | <i>Set a study name</i> |
|-----------|-------------------------|

---

**Description**

Sets a name to the analysis that appears in the exported plots.

**Usage**

```
nameStudy(study.name)
```

**Arguments**

`study.name`      A string corresponding to the name of the study

**Value**

The name of the study

---

|          |  |
|----------|--|
| plotBeta | <i>Plot scores of the input data Generates a density plot of the score values listed in the input dataset.</i> |
|----------|--|

---

**Description**

Plot scores of the input data Generates a density plot of the score values listed in the input dataset.

**Usage**

```
plotBeta(bed.data)
```

**Arguments**

`bed.data`      A data frame containing input bed-formatted data

---

|         |  |
|---------|--|
| plotCpG | <i>Plot G+C-content and observed/expected ratio.</i> |
|---------|--|

---

**Description**

Generates density plots of the G+C content and observed/expected CpG ratio for the input dataset and the human genome CpG islands

**Usage**

```
plotCpG(bed.data, offset = 200)
```

**Arguments**

|          |   |
|----------|---|
| bed.data | A data frame containing input bed-formatted data                                |
| offset   | Number of nucleotides expanded in each direction (default:200, min:20 max:1000) |

**Value**

- 1/ A data frame containing the G+C content (percentage of island that is C or G) and ratio of observed (CpG number) to expected(Number of C\* Number of G/sequence length)
- 2/ Density plot of the G+C-content
- 3/ Density plot of the observed/expected ratio

---

|        |  |
|--------|--|
| plotTF | <i>Create barplot of the identified transcription factor binding sites</i> |
|--------|--|

---

**Description**

Generates an overlaid barplot of the results exported by the 'findTFBS' function. The bar plot visualises the most frequent transcription factors with respect to the total number of occurrences and the number of sequences that contain these transcription factors.

**Usage**

```
plotTF(df, topTF = 10)
```

**Arguments**

|       |   |
|-------|---|
| df    | The data frame exported by the 'findTFBS' function  |
| topTF | Integer corresponding to the number of the most frequent transcription factors to be displayed (default:10) |

**Value**

- 1/ A barplot with the 'topTF' most frequent transcription factors
- 2/ A barplot with the number of transcription factors per class
- 3/ A scatterplot comparing the observed and expected number of transcription factors per class

---

|         |  |
|---------|--|
| refFreq | <i>Human transcription factor frequency (reference data)</i> |
|---------|--|

---

### Description

Frequency of the human conserved transcription factors in the reference genome. The frequency of each transcription factor is calculated using the UCSC Table Browser (tables: tfbsConsFactors, tfbsConsSites).

### Format

factor Name of the transcription factor  
 freq Frequency in the human genome

---

|            |   |
|------------|---|
| reorderBed | <i>Reorder tabular methylation data to bed format</i> |
|------------|---|

---

### Description

Reorders tabular methylation data to bed-formatted files. Compatible inputs are .txt, .csv data and other textual formats that contain the following mandatory columns: chr, start, end and score.

### Usage

```
reorderBed(input.data, chr.col, start.col, end.col, score.col,
           strand.col = NULL)
```

### Arguments

|            |  |
|------------|--|
| input.data | A data frame containing input bed-formatted data   |
| chr.col    | Column number containing the chromosome name   |
| start.col  | Column number containing the chromosome's start position   |
| end.col    | Column number containing the chromosome's end position   |
| score.col  | Column number containing the methylation score values either beta or delta-beta                              |
| strand.col | Column number containing the strand in the use data file ('+' strand is assumed if strand column is missing) |

### Value

A valid bed-formatted file (input of the 'MeinteR::find\*' functions)

sample

*Sample DNA methylation dataset (sample data)***Description**

A data frame with 5840 methylation sites containing the chromosomal position of the methylation sites and the corresponding delta beta values.

**Format**

The dataset has the following 5 variables:

Chromosome A factor with valid values chr1 to chr22, chrX, chrY, chrM

Start Start position of the methylation site

End End position of the methylation site

Strand Strand of the methylation site, either + or -

Differences A numeric vector with the (group1 - group2) methylation value for each CpG site.

**Examples**

```
#Distribution of the methylation values
plot(sample[,5])
```

scatterConsTF

*Create a scatterplot of the identified conserved transcription factors***Description**

Generates a scatterplot of the results exported by the 'findConservedTFBS' function. The scatterplot illustrates the number of binding sites per transcription factor relative to the expected frequency on the reference human genome. The transcription factors with high frequency ( $\geq$  3rd quantile) in the reference genome or to the analysed data are labeled on the scatterplot.

**Usage**

```
scatterConsTF(df)
```

**Arguments**

df The data frame exported by the 'findConservedTFBS' function

---

|           |   |
|-----------|---|
| test.data | <i>Test dataset with chromosomal position of the methylated sites and the corresponding delta beta values (sample data)</i> |
|-----------|---|

---

### Description

A valid and well-formatted sample dataset containing 401 differentially methylated data with  $|\text{delta beta-values}| > 0.3$ .

### Format

The dataset has the following 5 variables:

chr A factor with valid values chr1 to chr22, chrX, chrY and chrM

start Start position of the methylation site

end End position of the methylation site

score A numeric vector with the (group1 - group2) methylation value for each methylation site.

strand Strand of the methylation site, either + or -

### Examples

```
#Distribution of the methylation values
plot(test.data$score)
```

---

|          |  |
|----------|--|
| TF.class | <i>Transcription factor classes (reference data)</i> |
|----------|--|

---

### Description

Tabular file containing the number of transcription factors per class.

### Format

A data frame with 34 transcription factor classes and their corresponding number of factors in each class.

class Name of the class

Number Number of factors in the class



---

|             |  |
|-------------|--|
| validateBed | <i>Validate format of the input bed data</i> |
|-------------|--|

---

**Description**

Validates input methylation data. Checks the presence of the chr, start, end, score columns. If column 'strand' is not set then '+' strand is assumed. Cleans rows with empty cells and sets numeric format to the start, end and score columns.

**Usage**

```
validateBed(bed.data, omit.na = TRUE)
```

**Arguments**

|          |  |
|----------|--|
| bed.data | A data frame containing input bed-formatted data |
| omit.na  | Omit rows with empty cells (default:TRUE)        |

**Value**

A well-formatted data frame

# Index

## \*Topic **datasets**

- cpGISlands, [3](#)
- cTF, [3](#)
- refFreq, [14](#)
- sample, [15](#)
- test.data, [16](#)
- TF.class, [16](#)

bed2Seq, [2](#)

cpGISlands, [3](#)  
cTF, [3](#)

filterByCGI, [3](#)  
filterByProm, [4](#)  
findAltSplicing, [4](#)  
findConservedTFBS, [5](#)  
findPals, [5](#)  
findQuads, [6](#)  
findShapes, [7](#)  
findSpliceSites, [7](#)  
findTFBS, [8](#)

importGEO, [9](#)  
importLimma, [9](#)  
isEmptyDF, [10](#)

loadFile, [10](#)  
loadSeqGEO, [11](#)

meinter, [11](#)

nameStudy, [12](#)

plotBeta, [12](#)  
plotCpG, [13](#)  
plotTF, [13](#)

refFreq, [14](#)  
reorderBed, [14](#)

sample, [15](#)  
scatterConstTF, [15](#)

test.data, [16](#)  
TF.class, [16](#)

validateBed, [17](#)