# Package 'GeneDMRs'

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Type Package

Title Gene-based differentially methylated regions analysis

Version 1.0

**Imports** clusterProfiler, corrplot, dplyr, genomation, Hmisc, KEGG.db, org.Hs.eg.db (for human), org.Mm.eg.db (for mouse), org.Ss.eg.db (for pig), pheatmap, plotrix, qqman, RCircos, RColorBrewer, VennDiagram,

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**Description** GeneDMRs is an R package to detect the differentially methylated regions based on genes, gene body, CpG islands and gene body interacted with CpG island features. The output *coverage* file (i.e. *.bismark.cov*) of Bismark software for reduced-representation bisulfite sequencing (RRBS) can be directly used in the GeneDMRs package. Additionally, the methylation calling of whole genome bisulfite sequencing (WGBS) can be used if they are in the same format as the output *coverage* file of Bismark. *Bed* file (i.e. *.bed*) of refseq and cpgi can be directly used for the methylation levels in different gene or CpG island regions, and then filtered for the significant methylated genes or CpG islands. With the annotation of promoter, exon, intron, CpG island and CpG island shore based on R package genomation, gene body or CpG island feature regions and their interactive regions can also be analyzed by GeneDMRs package.

License GPL-3

RoxygenNote 6.0.1

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Bedfile	read	Read the

# **Description**

This function reads the *bed* file of refseq or cpgi and sorts them by chromosome and position. The dataset of the example are the mouse reference genes and CpG island information that are downloaded from UCSC website (<a href="http://genome.ucsc.edu/cgi-bin/hgTables">http://genome.ucsc.edu/cgi-bin/hgTables</a>). The R package genomation used here can divide the *refseq.bed* file into several gene body features, e.g. promoter, exon, intron regions and the *cpgi.bed* file into CpG island features, e.g. CpG island and CpG island shore.

Bed file

# # refseq.bed file

134202950	134199214 ) 13	1342354 4203505	57 0	NM_00129	91930 4376,230	0 ),	- 0,3601
134202950	134199214 ) 13	1342348 4234733	56 0	NM_00129	91928 4376,194	0 4,	- 0,3544
134202950	134199214 ) 13	1342354 4234355	57 0	NM_00128	32945 4376,432	0 2,230,	- 0,3480
134202950	134199214 ) 13	1342354 4234355	57 0	NM_00103	39510 4376,398	0 3,230,	- 0,3480
134202950	134199214 ) 13	1342354 4234355	57 0	NM_00100	08533 4376,144	0 43,	- 0,3480
0,							

# # cpgi.bed file

chr1	84934572	84935054	CpG:_47	
chr1	63176547	63177427	' CpG:_78	
chr1	12543517	4	$1254\overline{3}5976$	CpG:_67
chr1	18336892	6	183369826	cpG:_93
chr1	3531624	3531843	CpG:_27	. –
chr1	3670619	3671074	CpG:_34	
chr1	3671654	3672156	CpG:_45	
chr1	4491701	4493673	CpG:_165	
chr1	4496947	4497608	CpG:_47	
chr1	4571641	4572075	CpG:_44	

# **Usage**

Bedfile\_read(paths = paste(system.file(package = "GeneDMRs"), "/methdata", sep=""), bedfile = "refseq", suffix = ".txt", feature = FALSE, featurewrite = FALSE)

#### **Arguments**

paths	The path of bed file, with default the package path.
bedfile	The file name of <i>bed</i> file like "refseq" or "cpgi". This file is
	downloaded from UCSC website, with default "refseq".
suffix	The suffix of bed file, e.g. ".gz", ".zip" and so on (some files are in
	text .txt format, then ".txt" or ".txt.gz"), with default ".txt".
feature	TRUE or FALSE value indicating whether to read the bed file with
	the features, with default FALSE. If feature = TRUE, the output of
	this function will contain the features e.g. promoter, exon, intron or
	CpG island, CpG island shore based on R package genomation.
featurewrite	TRUE or FALSE value indicating whether to write out the feature
	file to the given path, with default FALSE.

#### Value

A data frame contains four columns of chromosome, start position, end position. If feature = TRUE, the data frame is five columns with the added feature such as genebody or cpgfeature.

#### Reference

Akalin A, Franke V, Vlahovicek K, Mason C, Schubeler D (2014). "genomation: a toolkit to summarize, annotate and visualize genomic intervals." *Bioinformatics*. doi: 10.1093/bioinformatics/btu775, http://bioinformatics.oxfordjournals.org/content/early/2014/12/04/bioinformatics.btu775.long.

# **Examples**

```
inputrefseqfile <- Bedfile_read()
inputrefseqfile <- Bedfile_read(paths = paste(system.file(package = "GeneDMRs"),
   "/methdata", sep=""), bedfile = "refseq", suffix = ".txt", feature = FALSE)
inputcpgifile <- Bedfile_read(paths = paste(system.file(package = "GeneDMRs"), "/methdata",
sep=""), bedfile = "cpgi", suffix = ".txt", feature = FALSE)
inputgenebodyfile <- Bedfile_read(bedfile = "refseq", feature = TRUE, featurewrite = TRUE)
inputcpgifeaturefile <- Bedfile_read(bedfile = "cpgi", feature = TRUE, featurewrite = FALSE)</pre>
```

Circos\_plot Plot the circos

# **Description**

This function outputs the circos plot for the methylation level and the density of gene, CpG island and CpG island shore on different chromosomes based on R RCircos package. All the files used in this function should contain chromosome, start position, and end position information that are required for R RCircos package.

#### **Usage**

Circos\_plot(inputcytofile, inputmethfile\_QC, inputrefseqfile, inputcpgifeaturefile, labelname = regiongeneall\_significant, linecolor = NULL)

#### **Arguments**

inputcytofile The output of Cytofile\_read() which contains the chromosome

information.

inputmethfile QC The input file with methylation levels after quality control.

inputrefseqfile The output of Bedfile\_read() which contains the gene information. Inputcpgifeaturefile The output of Bedfile\_read() which contains the CpG island and

CpG island shore information.

labelname The label of gene names which could be the significant genes after

Significant\_filter(), with default regiongeneall\_significant with

differentially methylated genes. Sometimes,

regiongenealls\_significant will have some errors because it has unannotated chromosome name like chrUn\_JH584304 or

chrUn\_NW\_018084826v1. Thus, these chromosome names should be removed. If the labelname is from selfdefinedfile, then the file

should contain the headers with chr (chromosome), start (start

position), end (end position) and id (gene name).

linecolor The colors of the lines plot for different methylation levels, with

default NULL (black). If the linecolor is used, the length of colors

should correspond to the length of groups.

#### Value

A circus figure with chromosomes, gene labels, the densities of the genes (track 3), CpG islands (track 4) and CpG island shores (track 5) and the methylation levels of different groups from the outermost circle to the innermost circle.

#### Reference

Hongen Zhang, Paul Meltzer, and Sean Davis. RCircos: an R package for Circos 2D track plots. BMC Bioinformatics, 2013, 14:244.

# **Examples**

Circos\_plot(inputcytofile, inputmethfile\_QC, inputrefseqfile, inputcpgifeaturefile)
Circos\_plot(inputcytofile, inputmethfile\_QC, inputrefseqfile, inputcpgifeaturefile, labelname = selfdefinedfile, linecolor = c("blue", "orange", "green"))

Correlation plot

Plot the methylation correlation

# **Description**

This function outputs the correlation plot for the methylation level of different samples or groups based on R package corrplot, Hmisc and RColorBrewer.

#### **Usage**

Correlation\_plot(inputmethfile\_QC, unmeth\_exclude = TRUE)

### **Arguments**

inputmethfile QC The input file with methylation levels, with default inputmethfile

after quality control.

unmeth\_exclude TRUE or FALSE value indicating whether to exclude the

unmethylated sites or regions, with default TRUE

#### Value

A correlation figure.

# **Examples**

Correlation\_plot(inputmethfile\_QC)

Correlation plot(siteall)

Correlation\_plot(regiongenealls)

Correlation\_plot(genefeatureall\_cpgfeature)

Correlation plot(genefeatureall cpgfeature, unmeth exclude = FALSE)

Chomosome\_pieplot

Pie plot based on different chromosomes

# **Description**

This function outputs the pie plot for the percentages of sites or regions in different chromosomes.

# Usage

Chromosome\_pieplot(genefeatureall\_cpgfeature\_significantcpgisland, genefeatureall\_cpgfeature\_significantshore = NULL, methydirection = "both", title = "Pie plot for chromosome")

#### **Arguments**

genefeatureall\_cpgfeature\_significantcpgisland

The input file with chromosomes, which can be files with/without

Significant\_filter().

genefeatureall\_cpgfeature\_significantshore

Another input file with chromosomes,

e.g.

genefeatureall\_cpgfeature\_significant shore file for comparison, with

default NULL.

methydirection

The methylation direction when the input file contains the methylation difference column i.e. methdiff after

Logic\_regression(), which can be "hypo", "hyper" and "both", with the default "both" for both directions.
Figure titles, with the default "Pie

plot for chromosome".

title

#### Value

A pie figure in different chromosomes.

# **Examples**

Chromosome\_pieplot(genefeatureall\_cpgfeature\_significantcpgisland, title = "")

Chromosome\_pieplot(genefeatureall\_cpgfeature\_significantcpgisland, title = "CpGisland")

Chromosome\_pieplot(genefeatureall\_cpgfeature\_significantcpgisland, genefeatureall\_cpgfeature\_significantshore = genefeatureall\_cpgfeature\_significantshore, title = c("CpGisland","Shore"))

Chromosome\_pieplot(siteall, title = "All cytosine sites") # Only consider the annotated chromosomes and the unannotated chromosomes will be discarded #

Chromosome\_pieplot(siteall\_Qvalue, title = "All cytosine sites")

Chromosome\_pieplot(siteall\_significant, title = "Significant cytosine sites")

Chromosome\_pieplot(siteall\_Qvalue, methydirection = "hyper", title = "Hyper-methylated distribution"))

Chromosome\_pieplot(siteall\_significant, methydirection = "hypo", title = "Hypo-methylated pie plot"))

Chromosome\_pieplot(regiongeneall\_Qvalue, methdirection = "hyper", title = "Hypermethylated genes")

Cytofile\_read

Read the cyto file

#### **Description**

This function reads the chromosome information from *cyto* file (*cytoBandIdeo.txt*) and sort them by chromosome and position. The dataset of the example is the mouse genome information downloaded from UCSC website

(http://hgdownload.cse.ucsc.edu/goldenPath/mm10/database/cytoBandIdeo.txt.gz).

# Usage

Cytofile\_read(paths = paste(system.file(package = "GeneDMRs"), "/methdata", sep=""), cytofile = "cytoBandIdeo", suffix = ".txt.gz")

#### **Arguments**

paths The path of input file, with default the package path.

cytofile The name of input cyto file that is downloaded from UCSC website,

with default "cytoBandIdeo".

suffix The suffix of input cyto file, e.g. ".gz", ".zip" and so on (some files

are in text .txt format, then ".txt" or ".txt.gz"), with default

".txt.gz".

#### Value

A data frame contains chromosome, start position, end position.

#### **Examples**

inputcytofile <- Cytofile\_read()

inputcytofile <- Cytofile\_read(paths = paste(system.file(package = "GeneDMRs"), "/methdata",
sep=""), cytofile = "cytoBandIdeo", suffix = ".txt.gz")</pre>

DMC feature	Annotate the differentially methylated cytosine
Divic_leature	(DMC) to features

# **Description**

This function annotates the differentially methylated cytosine (DMC) after statistical test Logic regression() to gene body or CpG island features.

# Usage

DMC\_feature(siteall\_significant, featureid = TRUE, featurefile = list(inputgenebodyfile, inputcpgifeaturefile))

# **Arguments**

siteall significant The input file with DMC sites.

featureid TRUE or FALSE value indicating whether to include the feature id

or not, with the default TRUE. The feature id will output the id of

first file of the featurefile list e.g. the id of inputgenebodyfile.

featurefile The input feature files e.g. input genebodyfile and

inputcpgifeaturefile, with default two files in a list as featurefile = list(inputgenebodyfile, inputcpgifeaturefile), and it can also be one

file without a list e.g. featurefile = inputgenebodyfile.

### Value

A data frame contains DMC sites with features.

# **Examples**

siteall\_significant\_feature <- DMC\_feature(siteall\_significant, featurefile = list(inputgenebodyfile, inputcpgifeaturefile))

siteall\_significant\_feature <- DMC\_feature(siteall\_significant, featureid = FALSE, featurefile = list(inputgenebodyfile, inputcpgifeaturefile))

siteall\_significant\_feature <- DMC\_feature(siteall\_significant, featureid = TRUE, featurefile = inputgenebodyfile)

DMC methfile QC	Merge the methylation file after quality control
<b>-</b> - ·	with DMCs

# **Description**

This function merges the methylation file after quality control of all samples with the DMCs after Significant\_filter().

### **Usage**

DMC methfile QC(inputmethfile QC, siteall significant)

#### **Arguments**

inputmethfile\_QC Input methylation file after quality control.

siteall\_significant Input DMCs file.

#### Value

A data frame by merging two input files of inputmethfile\_QC and siteall\_significant.

### **Examples**

DMC\_inputmethfile\_QC <- DMC\_methfile\_QC(inputmethfile\_QC, siteall\_significant)

Enrich\_plot

Enrich plot for GO terms and pathways

# **Description**

This function outputs the groups, GO terms and pathways plot for the enrichment based on R package clusterProfiler, org.Mm.eg.db (Mouse for example) and KEGG.db.

#### **Usage**

Enrich\_plot(regiongenealls\_significant, adjustpvaluecut = 0.1, enrichterm = "pathway", Dbannotation = "org.Mm.eg.db", keggorganism = "mmu", listnum = 20, title = "Enrichment for significant gene", expressionfile\_significant = NULL, expressionfile\_genetype = NULL)

# **Arguments**

regiongenealls\_significant Differentially methylated genes.

adjustpvaluecut Threshold of the adjusted P values for the enrichment,

with default 0.1.

enrichterm The term need to be analyzed, which can be "GOgroup",

"GO", "pathway", with default "pathway".

category TRUE or FALSE value indicating whether to divide the

enrichments into two categories, i.e. hypo/hyper

methylated or down/up regulated, with default TRUE.

Dbannotation Annotation dataset, with default "org.Mm.eg.db" of

mouse.

keggorganism Species name for KEGG enrichment, with default "mmu"

of mouse.

listnum The list of display number, with default 20. title The title of figure, with default "Enrichments for

significant gene".

expressionfile\_significant An additional file for differentially expressed genes,

which includes gene name and Log fold change (LogFC). This is an optional file for GO terms and pathways, with

default NULL.

expressionfile genetype The gene type of expressionfile\_significant file, which

can be "REFSEQ", "ENTREZID", "SYMBOL", or other gene types that can be used in clusterProfiler, with default

NULL.

#### Value

A dot-plot figure of enrichment.

### **Examples**

Enrich\_plot(regiongenealls\_significant, enrichterm = "GOgroup", Dbannotation = "org.Mm.eg.db", title = "Biological process for significant gene")

Enrich\_plot(regiongenealls\_significant, enrichterm = "GO", title = "Go term for significant
gene")

Enrich\_plot(regiongenealls\_significant, enrichterm = "GO", Dbannotation = "org.Hs.eg.db", title = "Go term for significant gene") # for human data #

Enrich\_plot(regiongenealls\_significant, adjustpvaluecut = 0.2, enrichterm = "pathway", keggorganism = "mmu", title = "Pathway for significant gene")

Enrich\_plot(regiongenealls\_significant, enrichterm = "pathway", category = FALSE, keggorganism = "hsa", title = "Pathway for significant gene") # for human data #

expressionfile\_significant <- read.table(paste(system.file(package = "GeneDMRs"), "/methdata/DEgenes.txt", sep=""), header = T) # read DEgene file #

Enrich\_plot(regiongenealls\_significant, adjustpvaluecut = 0.2, enrichterm = "GO", Dbannotation = "org.Mm.eg.db", title = "Go term for significant gene in two categories", expressionfile significant = expressionfile significant, expressionfile genetype = "SYMBOL")

Enrich\_plot(regiongenealls\_significant, enrichterm = "pathway", keggorganism = "mmu", title = "Pathway for significant gene in two categories", expressionfile\_significant = expressionfile\_significant, expressionfile\_genetype = "SYMBOL")

Feature\_pieplot

Pie plot based on different features

#### **Description**

This function outputs the pie plot of feature percentages in gene body or CpG island mainly for DMC sites with features.

#### **Usage**

Feature\_pieplot(siteall\_significant\_feature, methdirection = "both", title = "Pie plot for feature", threeDplot = TRUE)

### **Arguments**

features.

methydirection The methylation direction when the input file contains the

methylation difference column i.e. methdiff after Logic\_regression(), which can be "hypo", "hyper" and "both", with the default "both" for both directions. Figure titles, with the default "Pie plot for chromosome".

title Figure titles, with the default "Pie plot for chromosome"
TRUE or FALSE value indicating whether to pie plot in

three dimensions based on R pacakge plotrix, with the

default TRUE.

#### Value

A pie figure in different features.

### **Examples**

Feature\_pieplot(siteall\_significant\_feature)

Feature\_pieplot(siteall\_significant\_feature, methdirection = "hypo")

Feature\_pieplot(siteall\_significant\_feature, title = c("Gene body", "CpG island"))

Feature\_pieplot(siteall\_significant\_feature, title = c("Pie plot for Gene body", "Pie plot for CpG island"), threeDplot = FALSE)

Feature\_pieplot(siteall\_significant\_feature, methdirection = "hyper", title = c("Pie plot for Gene body", "Pie plot for CpG island"))

Group\_boxplot

Boxplot the methylation levels for groups

# Description

This function outputs the methylation levels of all the groups in boxplot without considering other features.

# **Usage**

Group boxplot(regiongeneall, ttest = TRUE, title = "Group boxplot", col = NULL)

# **Arguments**

regiongeneall The input file with group methylation levels.

ttest TRUE or FALSE value indicating whether to perform the Student t-

test, with default TRUE.

title The figure title, with default "Group boxplot among genes".

col The boxplot colors, with default NULL.

#### Value

A boxplot figure with groups.

# **Examples**

Group\_boxplot(regiongeneall)

Group\_boxplot(genebodypromoterall, title = "Three groups among genes in promoter region")

Group\_boxplot(regiongeneall, ttest = FALSE, title = "Three groups among genes", col = c("red", "green", "blue"))

Group_cpgfeature_boxplot	Boxplot the methylation levels for groups based on CpG island features
	r = r = r

# **Description**

This function outputs the methylation levels in boxplot for one or more groups based on CpG island features, e.g. CpG island and CpG island shore features.

# Usage

Group\_cpgfeature\_boxplot(genefeatureall\_cpgfeature, groupnum = "all", ttest = TRUE, cpgfeaturelable = c("CpGisland", "Shore"), title = c("Group1", "Group2", "Group3"), col = NULL)

#### **Arguments**

genefeatureall cpgfeature The input file with group methylation levels and CpG

island features.

groupnum Group number, with default "all" for all of the groups.

TRUE or FALSE value indicating whether to perform the

Student t-test, with default TRUE.

cpgfeaturelable CpG island features, with default "CpGisland" and

"Shore". Only one CpG island feature can also be

available, e.g. "CpGisland".

title The figure title, with default "Group1", "Group2" and

"Group3".

col The boxplot colors, with default NULL.

#### Value

A boxplot figure with groups and CpG island features.

# **Examples**

Group\_cpgfeature\_boxplot(genefeatureall\_cpgfeature, groupnum = 1)

Group\_cpgfeature\_boxplot(genefeatureall\_cpgfeature, groupnum = "all", ttest = TRUE, cpgfeaturelable = c("CpGisland", "Shore"), title = c("Group1", "Group2", "Group3"), col = c("blue", "red", "green"))

Genebody_cpgfeature_boxplot	Boxplot the methylation levels for gene body based on CpG island features
-----------------------------	---

# **Description**

This function outputs the methylation levels in boxplot for one or more features of gene body based on CpG island features, e.g. CpG island and CpG island shore features.

### Usage

Genebody\_cpgfeature\_boxplot(genefeatureall\_cpgfeature, genebodyname = c("promoters","exons","introns","TSSes"), ttest = TRUE, cpgfeaturelable = c("CpGisland", "Shore"), title = c("Promoter", "Exon", "Intron", "TSS"), col = NULL)

# **Arguments**

CpG island features.

genebodyname The name of gene body features e.g. promoter, exon,

intron and TSSes, with default "promoters", "exons",

"introns", "TSSes".

ttest TRUE or FALSE value indicating whether to perform the

Student t-test, with default TRUE.

cpgfeaturelable CpG island features, with default "CpGisland" and

"Shore".

title The figure title, with default "Promoter", "Exon", "Intron"

and "TSS".

col The boxplot colors, with default NULL.

#### Value

A boxplot figure with gene body and CpG island features.

#### **Examples**

Genebody\_cpgfeature\_boxplot(genefeatureall\_cpgfeature)

c("promoters", "exons", "introns", "TSSes"), ttest = TRUE, cpgfeaturelable = c("CpGisland", "Shore"), title = c("Promoters", "Exons", "Introns", "TSSes"), col = c("blue", "red", "green", "purple"))

Heatmap\_plot

*Heat map plot for chromosomes and features* 

# **Description**

This function outputs the heat map plot for methylation level in different chromosomes of differentially methylated genes with features based on R package pheatmap.

#### **Usage**

Heatmap\_plot(regiongeneall\_significant, featurename = NULL, title = "Methylation level (%)", display\_numbers = FALSE, number\_format = "%.0f", cluster\_rows = FALSE, cluster\_cols = TRUE, gaps\_row = c(1,2), gaps\_col = NULL)

# **Arguments**

regiongeneall_significant	The input file of methylation levels with differen	tially

methylated genes or the genes in different gene body

features.

feature name of the output file from Significant filter() for

genefeatureall\_cpgfeature file, that is "CpGisland" or

"Shore", with default NULL.

title The figure title, with the default "Methylation level (%)".

display\_numbers TRUE or FALSE value indicating whether to display the

methylation value in the figure, with default FALSE.

number\_format The displayed number of the methylation value in round

format.

cluster\_rows TRUE or FALSE value indicating whether to cluster the

row, with the default FALSE.

cluster\_cols TRUE or FALSE value indicating whether to cluster the

column, with the default TRUE.

gaps\_row TRUE or FALSE value indicating whether to divide the

row, with the default c(1,2) that divide the rows into three

parts by row 1 and row 2.

gaps\_col TRUE or FALSE value indicating whether to divide the

column, with the NULL.

#### Value

A heat map figure with methylation levels.

Heatmap\_plot(regiongeneall\_significant)

Heatmap\_plot(genefeatureall\_cpgfeature\_significantcpgisland, featurename = "CpGisland", display numbers = FALSE, title = "Methylation level (%) for genes with CpG island")

Heatmap\_plot(genefeatureall\_cpgfeature\_significantshore, featurename = "Shore", title = "Methylation level (%) for genes with shores")

Heatmap\_plot(genefeatureall\_cpgfeature\_significantshore, featurename = "Shore", title = "Methylation level (%) for genes with shores", cluster\_cols = FALSE)

Heatmap\_plot(regiongeneall\_significant, title = "Methylation level (%) for genes", display\_numbers = FALSE)

Heatmap\_plot(regiongeneall\_significant, title = "Methylation level (%) for genes", display\_numbers = FALSE, cluster\_rows = TRUE, gaps\_row = NULL)

Logic_regression	Logistical regression analysis for each region
0 = 0	or each cytosine site

# **Description**

This function tests each region or each cytosine site by logistical regression model to achieve the P values and then be adjusted to Q values to account for multiple hypothesis testing.

#### **Usage**

Logic\_regression(genefeatureall\_cpgfeature, covariates = NULL, adjustedmethod = "fdr", diffgroup = NULL)

#### **Arguments**

covariates Extra covariates used in the model, with the default

NULL.

adjustedmethod The methods to adjust P values to Q values, with the

default "fdr" method. The adjustedmethod could be "holm", "Hochberg", "hommel", "bonferroni", "BH",

"BY", "none" methods as well.

diffgroup Methylation difference between two groups, with the

default NULL, that is the max group - min group. The two

groups can be manually selected e.g. diffgroup =

c("group1", "group2").

#### Value

A data frame of region gene or region cpgi or those regions with different features or cytosine sites, by accompanying with P values, Q values and methylation differences.

```
regiongeneall_Qvalue <- Logic_regression(regiongenealls)
regioncpgall_Qvalue <- Logic_regression(regioncpgall , adjustedmethod = "fdr")
regiongenebodyall_Qvalue <- Logic_regression(regioncpgall , adjustedmethod = "fdr")
regiongenebodyall_Qvalue <- Logic_regression(regiongenebodyall, diffgroup = c("group1", "group2"))
regiongeneall_cpgfeature_Qvalue <- Logic_regression(regiongeneall_cpgfeature)
genefeatureall_cpgfeature_Qvalue <- Logic_regression(genefeatureall_cpgfeature)
genefeatureall_Qvalue <- Logic_regression(genefeatureall, adjustedmethod = "bonferroni")

siteall_Qvalue <- Logic_regression(siteall, adjustedmethod = "fdr") # for each cytosine site #
siteall_Qvalue <- Logic_regression(siteall, adjustedmethod = "fdr", diffgroup = c("group1", "group2"))
```

Manhattan\_plot

Manhattan plot for all cytosines or regions

# **Description**

This function outputs the Manhattan plot for all cytosines or regions in different chromosomes with significant line based on R package qqman.

#### **Usage**

 $\label{eq:manhattan_plot} Manhattan_plot(siteall_Qvalue, chrlabs = NULL, col = c("black", "grey"), ylab = "-log(Q value)", suggestiveline = -log10(1e-02), genomewideline = -log10(1e-03))$ 

# **Arguments**

siteall\_Qvalue The input file with Q values from DMR\_test(), e.g.

regiongeneall\_Qvalue, genefeatureall\_cpgfeature\_Qvalue

or others with Q values.

chrlabs The label of chromosomes, with default NULL. col The color of plots, with default black and grey.

suggestiveline The significant line, with default 0.01.

genomewideline The genome-wide significant line, with default 0.001.

#### Value

A Manhattan figure with Q values.

#### **Examples**

```
Manhattan_plot(siteall_Qvalue, ylab = "-log(Q-value)")
```

```
Manhattan_plot(regiongenealls_Qvalue, chrlabs = c(1:18,"X"), col = c("green","orange"), genomewideline = -log10(1e-02))
```

Manhattan\_plot(genefeatureall\_cpgfeature\_Qvalue, ylab = c("-log(Q value) for CpG island", "-log(Q value) for Shore"), col = c("red","blue"), suggestiveline = -log10(5e-02), genomewideline = -log10(1e-02))

Methfile\_read

Read the methylation file

# **Description**

This function reads all of the methylation files and generates one file with all samples including methylated read coverages (Cs) and unmethylated read coverages (Ts). It can automatically test how many samples and how many replicates in each group and the distribute them from 1\_1, 1\_2 to the final file by headers. The methylation files should be the standard *coverage* file (i.e. *.bismark.cov*) outputted from Bismark software. The dataset of the example is the Reduced representation bisulfite sequencing (RRBS) data of DNA methylation for mouse myeloid progenitor tissue from GEO (Accession number: GSE62392)

(https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE62392).

#1 1.gz after rename the coverage file (i.e. .bismark.cov) of the first replicate of first group

```
chr1 3020877 3020877
                            97.46835 77
chr1 3020891 3020891
                            92.40506 73
                                            6
chr1 3020946 3020946
                            88.67925 47
                                            6
chr1 3020988 3020988
                            98.64865 73
chr1 3021013 3021013
                          100.00000 74
                                            0
chr1 3094122 3094122
                             0.00000
                                            1
chr1 3094126 3094126 100.00000
chr1 3150008 3150008 100.00000
                                            0
chr1 3150022 3150022 100.00000
chr1 3150068 3150068 100.00000
                                            0
```

#### **Usage**

```
Methfile_read(paths = paste(system.file(package = "GeneDMRs"), "/methdata", sep=""), suffix = ".gz")
```

#### **Arguments**

paths	The path of methylation file, with default the package path.
suffix	The suffix of methylation file, e.g. ".gz", ".zip" and so on (some
	files are in text .txt format, then ".txt" or ".txt.gz"), with default
	".gz".

#### Value

A data frame contain chromosome, position, and Cs & Ts for different replicates and groups.

```
inputmethfile <- Methfile_read()
inputmethfile <- Methfile_read(paths = paste(system.file(package = "GeneDMRs"),
"/methdata", sep=""), suffix = ".gz")</pre>
```

# # inputmethfile

#chr	posi	Cs1_1	Ts1_1	Cs1_2	Ts1_2	Cs1_3	Ts1_3	Cs2_1	Ts2_1	Cs2_2	Ts2_2
chr1	3020877	77	2	77	7	49	2	31	4	68	0
chr1	3020891	73	6	78	6	49	2	33	2	68	0
chr1	3020946	47	6	96	17	71	9	52	5	71	12
chr1	3020988	73	1	58	0	57	6	55	2	61	2
chr1	3021013	74	0	56	2	59	4	49	8	63	0
chr1	3531651	11	1	25	0	13	1	7	0	15	1
chr1	3531658	12	0	25	0	12	2	7	0	16	0
chr1	3531671	12	0	25	0	13	1	6	1	16	0
chr1	3531676	12	0	25	0	14	0	7	0	16	0
chr1	3531680	12	0	22	3	10	3	7	0	14	1

Methfile\_QC

Quality control for the input methylation file

# **Description**

This function discards the cytosine sites with low read coverage (quantile) or high read coverage (quantile).

# Usage

Methfile\_QC(inputmethfile, low\_coveragenum = 10, high\_coveragenum = NULL, low\_quantile = NULL, high\_quantile = 99.9, coveragewrite = TRUE)

# **Arguments**

inputmethfile	The input of methylation file after Methfile_read().
low_coveragenum	The minimum read coverage to be discarded, with default 10.
high_coveragenum	The maximum read coverage to be discarded, with default
	NULL.
low_quantile	The minimum quantile of read coverage to be discarded, with
	default NULL.
high_quantile	The maximum quantile of read coverage to be discarded, with
	default 99.99.
coveragewrite	TRUE or FALSE value indicating whether to write out the read
	coverage file to the given path, with default TRUE.

# Value

A data frame contain chromosome, position, and Cs & Ts for different replicates and groups after quality control.

inputmethfile QC <- Methfile QC(inputmethfile)

inputmethfile\_QC <- Methfile\_QC(inputmethfile, low\_coveragenum = 20, high\_quantile = 99.99)

inputmethfile\_QC <- Methfile\_QC(inputmethfile, low\_coveragenum = 10, high\_coveragenum = 100, coveragewrite = FALSE)

Methmean region

Calculate the methylation mean for regions

# **Description**

This function outputs the methylation mean for different groups based on gene and CpG island regions by matching with cytosine. It is also for gene body of promoter, exon, intron and TSSes regions, cgpi feature of CpG island and CpG island shores and their interactive regions e.g. promoter CpG island.

# Usage

Methmean\_region(inputmethfile\_QC, inputrefseqfile, cpgifeaturefile = NULL, chrnum = "all", posistart = NULL, posiend = NULL, featureid = NULL, featurename = NULL)

#### **Arguments**

inputmethfile\_QC The input of methylation file after quality control.

inputrefseqfile The input file with regions e.g. inputrefseqfile/inputcpgifile with 4

columns or input genebody file/input cpg if eature file with 5 columns.

cpgifeaturefile The input of CpG island feature file e.g. inputcpgifeaturefile, with

default NULL. If provided, the output file is methylation mean of inputrefseqfile or inputgenebodyfile with CpG island and CpG

island shore features.

chrnum The chromosome number or all chromosomes (all) or all

chromosomes with unannotated sites (alls), with default "all".

posistart Start position if requested, with default NULL. End position if requested, with default NULL.

featureid NCBI ID of specific gene or all the genes, with default NULL. The

CpG id can also be used like "cpgi1" or "shore2".

featurename Different gene body features of promoter, exon, intron and TSSes.

The CpG island features can also be used that are "CpGisland" and

"Shores".

#### Value

A data frame of the methylation mean of provided regions with/without different features.

#### **Examples**

```
Methmean region(inputmethfile QC, inputrefseqfile, chrnum = "alls", featureid =
c("NM 001244353", "NM 001244864")) # find sepecific gene by NCBI ID #
Methmean_region(inputmethfile_QC, inputrefseqfile, chrnum = "chr1", posistart = 21800,
posiend = 21900)
regiongenechr <- Methmean region(inputmethfile QC, inputrefseqfile, chrnum =
c("chr1","chr2"))
regiongeneall <- Methmean region(inputmethfile QC, inputrefseqfile, chrnum = "all")
DMC regiongeneall <- Methmean region(DMC inputmethfile QC, inputrefseqfile, chrnum =
"all") # Calculate DMC first and then recalculate the methylation mean by replacing the RRBS
cytosine sites #
regiongenealls <- Methmean region(inputmethfile QC, inputrefsegfile, chrnum = "alls") # alls
include unannotated CpG site like chrUn_NW_018084826v1 #
Methmean_region(inputmethfile_QC,inputcpgifile,"chr1", 21800, 21900) # acturally
regiongenepart = regioncpgpart #
regioncpgchr <- Methmean_region(inputmethfile_QC, inputcpgifile, chrnum = c("chr1", "chr2"))
regioncpgall <- Methmean_region(inputmethfile_QC, inputcpgifile, chrnum = "all")
regioncpgalls <- Methmean_region(inputmethfile_QC, inputcpgifile)
regiongenebodychr <- Methmean region(inputmethfile QC, inputgenebodyfile, chrnum =
c("chr1","chr2"))
regiongenebodyall <- Methmean_region(inputmethfile_QC, inputgenebodyfile, chrnum = "all")
regiongenebodyalls <- Methmean_region(inputmethfile_QC, inputgenebodyfile)
regioncpgifeaturechr <- Methmean_region(inputmethfile_QC, inputcpgifeaturefile, chrnum =
c("chr1","chr2"))
regioncpgifeatureall <- Methmean region(inputmethfile QC, inputcpgifeaturefile, chrnum =
"all")
regioncpgifeaturealls <- Methmean region(inputmethfile QC, inputcpgifeaturefile)
partgenebody <- Methmean region(inputmethfile QC, inputgenebodyfile, featureid =
"NM 001244353")
partgenebodyexon <- Methmean region(inputmethfile QC, inputgenebodyfile, featureid =
"NM 001244353", featurename = "exons")
partgenebodyall <- Methmean region(inputmethfile QC, inputgenebodyfile, featureid =
"NM_001244353", featurename = c("promoters","exons","introns","TSSes"))
genebodypromoterall <- Methmean_region(inputmethfile_QC, inputgenebodyfile, featureid =
"all", featurename = "promoters")
```

```
genebodyexonall <- Methmean_region(inputmethfile_QC, inputgenebodyfile, featureid = "all",
featurename = "exons")
genefeatureall <- Methmean_region(inputmethfile_QC, inputgenebodyfile, featureid = "all",
featurename = c("promoters", "exons", "introns", "TSSes")) #long time #
partcpgi <- Methmean region(inputmethfile QC, inputcpgifeaturefile, featureid = "cpgi1")
partshore <- Methmean region(inputmethfile QC, inputcpgifeaturefile, featureid = "shore10")
cpgislandall <- Methmean_region(inputmethfile_QC, inputcpgifeaturefile, featureid = "all",
featurename = "CpGisland")
cpgshoreall <- Methmean region(inputmethfile QC, inputcpgifeaturefile, featureid = "all",
featurename = "Shores") #long time #
cpgfeatureall <- Methmean region(inputmethfile QC, inputcpgifeaturefile, featureid = "all",
featurename = c("CpGisland", "Shores") #long time #
genebodychr_promoter <- Methmean_region(inputmethfile_QC, inputgenebodyfile, chrnum =
"chr1", featureid = "all", featurename = "promoters")
cpgchr island <- Methmean region(inputmethfile QC, inputcpgifeaturefile, chrnum = "chr1",
featureid = "all", featurename = "CpGisland")
# when the cpgifeaturefile = inputcpgifeaturefile is provided #
regiongenechr_cpgfeature <- Methmean_region(inputmethfile_QC, inputrefseqfile,
cpgifeaturefile = inputcpgifeaturefile, chrnum = c("chr1","chr2"))
regiongeneall_cpgfeature <- Methmean_region(inputmethfile_QC, inputrefseqfile,
cpgifeaturefile = inputcpgifeaturefile, chrnum = "all")
regiongenealls cpgfeature <- Methmean region(inputmethfile QC, inputrefseqfile,
cpgifeaturefile = inputcpgifeaturefile, chrnum = "alls")
genebodypromoterall cpgfeature <- Methmean region(inputmethfile QC, inputgenebodyfile,
cpgifeaturefile = inputcpgifeaturefile, featureid = "all", featurename = "promoters")
genebodyexonall cpgfeature <- Methmean region(inputmethfile QC, inputgenebodyfile,
cpgifeaturefile = inputcpgifeaturefile, featureid = "all", featurename = "exons")
genefeatureall_cpgfeature <- Methmean_region(inputmethfile_QC, inputgenebodyfile,
cpgifeaturefile = inputcpgifeaturefile, featureid = "all", featurename =
c("promoters", "exons", "introns", "TSSes")) #long time #
# windows #
windowfileall <- Methmean region(inputmethfile QC, windowfile, chrnum = "all")
windowfilealls <- Methmean region(inputmethfile QC, windowfile, chrnum = "alls")
```

Methmean_site	Calculate the methylation mean for cytosine
	sites

# **Description**

This function outputs the methylation mean for each cytosine site. It will calculate methylation difference along each group.

# Usage

Methmean\_site(inputmethfile\_QC)

# **Arguments**

inputmethfile\_QC The input of methylation file after quality control.

#### Value

A data frame of the methylation mean of provided cytosine sites.

# **Examples**

siteall <- Methmean\_site(inputmethfile\_QC)

Quick_DMCs	Quick use the GeneDMRs package for differentially methylated cytosine sites
	aijjereniiaity meinytatea cytosine sites

# **Description**

This function outputs the differentially methylated cytosine sites (DMCs).

# Usage

```
Quick_DMCs(paths = paste(system.file(package = "GeneDMRs"), "/methdata", sep=""), suffixmeth = ".gz")
```

# **Arguments**

paths The path of input file, with default the package path.

suffixmeth The suffix of methylation file, e.g. ".gz", ".zip" and so on (some

files are in text .txt format, then ".txt" or ".txt.gz"), with default

".gz".

#### Value

Outputs DMC results.

Quick\_DMCs()

Quick_GeneDMRs	Quick use the GeneDMRs package for gene based differentially methlated regions

# **Description**

This function outputs a series of results and figures for gene based regions' methylation analysis.

# Usage

```
Quick_GeneDMRs(paths = paste(system.file(package = "GeneDMRs"), "/methdata", sep=""), suffixmeth = ".gz", bedfile = "refseq", suffixbed = ".txt", Dbannotation = "org.Mm.eg.db", keggorganism = "mmu")
```

# **Arguments**

paths The path of input file, with default the package path.

suffixmeth The suffix of methylation file, e.g. ".gz", ".zip" and so on (some

files are in text .txt format, then ".txt" or ".txt.gz"), with default

".gz"

bedfile The file name of bed file for "refseq". This file is downloaded

from UCSC website, with default "refseq".

suffixbed The suffix of bed file, e.g. ".gz", ".zip" and so on (some files are

in text .txt format, then ".txt" or ".txt.gz"), with default ".txt".

Dbannotation The annotation dataset for enrichment, with default

"org.Mm.eg.db" of mouse.

keggorganism The species name for KEGG enrichment, with default "mmu" of

mouse.

#### Value

Outputs a series of DMG results.

# **Examples**

Quick GeneDMRs()

Quick\_GeneDMRs(Dbannotation = "org.Mm.eg.db", keggorganism = "mmu")

Sample_boxplot	Boxplot the methylation levels or read numbers in different samples

# **Description**

This function outputs the methylation levels or read numbers of the selected genes or all the genes in the different samples.

### **Usage**

Sample\_boxplot(inputmethfile, inputrefseqfile, Meth\_plot = TRUE, ylab = "Methylation level (%)", refseqname = NULL, col = NULL)

### **Arguments**

inputmethfile The input file with methylation levels.

inputrefseqfile The input of gene regions.

Meth\_plot TRUE or FALSE value indicating whether to plot the methylation

levels, with default TRUE, otherwise to plot the read numbers.

ylab The label of y axis, with default "Methylation level (%)".

refseqname NCBI ID of specific gene, with default NULL.

The boxplot colors, with default NULL.

#### Value

A boxplot figure with all the samples.

# **Examples**

Sample\_boxplot(inputmethfile\_QC, inputrefseqfile)

Sample boxplot(inputmethfile QC, inputrefseqfile, refseqname = "NM 001244864")

Sample\_boxplot(inputmethfile\_QC, inputrefseqfile, refseqname = c("NM\_001244864", "NM\_001244534"))

Sample\_boxplot(inputmethfile\_QC, inputrefseqfile, refseqname = c("NM\_001244864", "NM\_001143697", "NM\_213902"), col = c("red", "green", "blue"))

Sample\_boxplot(inputmethfile\_QC, inputrefseqfile, Meth\_plot = FALSE, ylab = "Read number", col = c("red", "blue"))

Sample\_boxplot(inputmethfile\_QC, inputrefseqfile, Meth\_plot = FALSE, ylab = "Read number", refseqname = c("NM\_001244864", "NM\_001244534"))

Sample\_boxplot(inputmethfile\_QC, inputrefseqfile, Meth\_plot = FALSE, ylab = "Read number", refseqname =  $c("NM\_001244864", "NM\_001143697", "NM\_213902")$ , col = c("red", "green", "blue"))

Significant filter

Filter the significant regions or cytosine sites

# **Description**

This function filters significant regions or cytosine sites based on Q value and methylation difference.

#### **Usage**

Significant\_filter(genefeatureall\_cpgfeature\_Qvalue, qvalue = 0.01, methdiff = 0, featureout = 1)

#### **Arguments**

methdiff

differences need to be filtered.

qvalue Threshold of Q values that Q values larger than

this will be discarded, with default 0.01. Threshold of methylation differences that

methylation differences less than this will be discarded, with the default 0.

feature will be filtered, with default 1.

When featureout = 2, it means that the second

feature will be filtered and outputted.

#### Value

A data frame of the significant regions or cytosine sites.

#### **Examples**

```
genefeatureall_cpgfeature_significantcpgisland <-
Significant_filter(genefeatureall_cpgfeature_Qvalue)

genefeatureall_cpgfeature_significantshore <-
Significant_filter(genefeatureall_cpgfeature_Qvalue, featureout = 2)

genefeatureall_cpgfeature_significantcpgisland <-
Significant_filter(genefeatureall_cpgfeature_Qvalue, qvalue = 0.001, methdiff = 0.01, featureout = 1)

regiongeneall_significant <- Significant_filter(regiongeneall_Qvalue)

regiongenealls_significant <- Significant_filter(regiongenealls_Qvalue, methdiff = 0.1)

siteall_significant <- Significant_filter(siteall_Qvalue)

siteall_significant <- Significant_filter(siteall_Qvalue, qvalue = 0.001, methdiff = 0.1)
```

Venn_plot island shore	Venn_plot	Venn plot for the common CpG island and CpG island shore
------------------------	-----------	--

# **Description**

This function outputs the venn plot for the common CpG island and CpG island shore regions that are covered by methylated cytosine sites based on R package VennDiagram.

#### **Usage**

```
Venn plot(genefeatureall cpgfeature Qvalue, title = "Venn plot", fillcolor =
c("cornflowerblue","green"))
```

# **Arguments**

genefeatureall\_cpgfeature\_Qvalue

title

fillcolor

The input file with two features. Figure title, with default "Venn plot".

Filled color, with default "cornflowerblue" and

"green"

#### Value

A venn figure in two features.

# **Examples**

Venn\_plot(genefeatureall\_cpgfeature)

Venn\_plot(genefeatureall\_cpgfeature\_Qvalue)

Venn plot(genefeatureall cpgfeature Qvalue, fillcolor = c("red", "blue"))

Volcano\_plot

Volcano plot for all the cytosines

# **Description**

This function outputs the volcano plot for all the cytosines with Q values and methylation differences.

# Usage

Volcano\_plot(siteall\_Qvalue, title = "Volcano for Q value and methylation difference", qvalue = 0.01, methdiffpercentage = c(5, 10, 15, 20, 15), pointcolor = c("red", "purple", "orange", ""yellow", "blue", "green"))

#### **Arguments**

The input file with Q values and methylation differences. siteall\_Qvalue

Figure title, with default "Volcano for Q value and methylation title

difference".

Threshold of Q values that Q values less than this will be colored, qvalue

with default 0.01.

Threshold of methylation level (%) differences that methylation methdiffpercentage

differences larger than this will be colored, with default 5, 10, 15,

20, 25.

pointcolor Point plot color, with default "red", "purple", "orange", "yellow",

"blue", "green".

#### Value

A volcano figure.

# **Examples**

```
Volcano_plot(siteall_Qvalue)
```

Volcano\_plot(siteall\_Qvalue, pointcolor = c("red", "blue", "yellow", "purple", "orange", "green"))

Volcano\_plot(siteall\_Qvalue, title = "Volcano plot", qvalue = 0.001, methdiffpercentage = c(10, 15, 20, 30, 40), pointcolor = c("red", "purple", "orange", "yellow", "blue", "green"))

Window divide

Divide the genome to windows

# **Description**

This function outputs the window regions of the whole genome.

# Usage

Window\_divide(inputcytofile, windowbp = 1000000)

# **Arguments**

inputcytofile The input *cyto* file with chromosome information.

windowbp Window length in base pair (bp) to be divided, with default 1,000,000.

#### Value

A data frame with window regions.

# **Examples**

```
windowfile <- Window divide(inputcytofile)
```

windowfile <- Window\_divide(inputcytofile, windowbp = 10000)