# CpGassoc January 2, 2014

cpg.assoc	Association	Analysis	Between	Methylation	Beta	Values
	and Phenoty	ype of Inte	erest			

#### Usage

cpg.assoc(beta.val, indep, covariates = NULL, data = NULL, logit.transform = FALSE, chip.id = NULL, subset = NULL, random = FALSE, fdr.cutoff = 0.05, large.data = TRUE, fdr.method = "BH", logitperm = FALSE)

# Arguments

indep

beta.val	A vector, matrix, or data frame containing the beta values
	of interest (1 row per CpG site, 1 column per individual).

A vector containing the variable to be tested for association. cpg.assoc will evaluate the association between the beta values (dependent variable) and indep (independent variable)

variable).

A data frame consisting of additional covariates to be included in the model. covariates can also be specified as a matrix if it takes the form of a model matrix with no intercept column, or can be specified as a vector if there is only one covariate of interest. Can also be a formula (e.g. cov1+cov2).

an optional data frame, list or environment (or object coercible by as.data.frame to a data frame) containing the variables in the model. If not found in data, the variables are taken from the environment from which cpg.assoc is called.

Logical. If TRUE, the logit transform of the beta values log(beta.val/(1-beta.val)) will be used. Any values equal to zero or one will be set to the next smallest or next largest value respectively; values <0 or >1 will be set to NA.

covariates

data

logit.transform

chip.id An optional vector containing chip or batch identifiers.

If specified, chip.id will be included as a factor in the

model.

subset An optional logical vector specifying a subset of observa-

tions to be used in the fitting process.

random Logical. If TRUE, chip.id will be included in the model as

a random effect, and a random intercept model will be fitted. If FALSE, chip.id will be included in the model as an ordinary categorical covariate, for a much faster analysis.

fdr.cutoff The desired FDR threshold. The default setting is .05.

The set of CpG sites with FDR < fdr.cutoff will be

labeled as significant.

large.data Logical. Enables analyses of large datasets. When

large.data=TRUE, cpg.assoc avoids memory problems

by performing the analysis in chunks.

fdr.method Character. Method used to calculate False Discovery

Rate. Choices include any of the methods available in p.adjust() or "qvalue" for John Storey's qvalue method (requires that *qvalue* package is installed). The default method is "BH" for the Benjamini and Hochberg method.

logitperm Logical. For internal use only.

# Details

cpg.assoc is designed to test for association between an independent variable and methylation at a number of CpG sites, with the option to include additional covariates and factors. cpg.assoc assesses significance with the Holm (step-down Bonferroni) and FDR methods.

If class(indep)='factor', cpg.assoc will perform an ANOVA test of the variable conditional on the covariates specified. Covariates, if entered, should be in the form of a data frame, matrix, or vector. For example, covariates=data.frame(weight,age,factor(city)). The data frame can also be specified prior to calling cpg.assoc. The covariates should either be vectors or columns of a matrix or data.frame.

cpg.assoc is also designed to deal with large data sets. Setting large.data=TRUE will make cpg.assoc split up the data to enable efficient analysis of large datasets.

#### Value

cpg.assoc will return an object of class cpg. The functions summary and plot can be called to get a summary of results and to create QQ plots.

results A data frame consisting of the t or F statistics and P-

values for each CpG site, as well as indicators of Holm and FDR significance. CpG sites will be in the same order as the original input, but the sort() function can be used directly on the cpg.assoc object to sort CpG sites by p-

value.

results A data frame consisting of the t or F statistics and P-

values for each CpG site, as well as indicators of Holm and FDR significance. CpG sites will be in the same order as the original input, but the sort() function can be used directly on the cpg.assoc object to sort CpG sites by

p-value.

Holm.sig A list of sites that met criteria for Holm significance.

FDR.sig A data.frame of the CpG sites that were significant by the

FDR method specified.

info A data frame consisting of the minimum P-value observed,

the FDR method that was used, the phenotype of interest, the number of covariates in the model, the name of the matrix or data frame the methylation beta values were taken from, the FDR cutoff value and whether a mixed

effects analysis was performed.

indep The independent variable that was tested for association.

covariates Data.frame or matrix of covariates, if specified (otherwise

NULL).

chip chip.id vector, if specified (otherwise NULL).

coefficients A data frame consisting of the degrees of freedom, and if

object is continous the intercept effect adjusted for possible covariates in the model, the estimated effect size, and the standard error. The degrees of freedom is used in

plot.cpg to compute the genomic inflation factors.

## Authors

Barfield, R.; Conneely, K.; Kilaru, V.

Maintainer: R. Barfield: rbarfield01@fas.harvard.edu

#### See Also

cpg.perm, cpg.work, plot.cpg scatterplot, cpg.combine, manhattan, plot.cpg.perm, sort.cpg.perm, sort.cpg, cpg.qc, cpg.QC

# Examples

- > #Sample output from CpGassoc
- > ###NOTE: If you are dealing with large data, do not specify large.data=FALSE.
- > ##This will involve partitioning up the data and performing more gc() to clea
- > library(CpGassoc)
- > data(samplecpg,samplepheno,package="CpGassoc")
- > results<-cpg.assoc(samplecpg,samplepheno\$weight,large.data=FALSE)
- > results

# The top ten CpG sites were:

	CPG.Labels	T.statistic	P.value	Holm.sig	FDR	gc.p.value
694	CpG694	3.454271	0.0006456268	FALSE	0.4318310	0.0006456268
293	CpG293	3.412320	0.0007485123	FALSE	0.4318310	0.0007485123
560	CpG560	3.313353	0.0010549618	FALSE	0.4318310	0.0010549618
148	CpG148	3.133454	0.0019286973	FALSE	0.5645412	0.0019286973
998	CpG998	-3.079596	0.0022986204	FALSE	0.5645412	0.0022986204
1059	CpG1059	-2.883525	0.0042668430	FALSE	0.7693539	0.0042668430
1182	CpG1182	-2.819710	0.0051827097	FALSE	0.7693539	0.0051827097
100	CpG100	2.787987	0.0057015107	FALSE	0.7693539	0.0057015107
751	CpG751	-2.759379	0.0062093208	FALSE	0.7693539	0.0062093208
238	CpG238	2.756367	0.0062650966	FALSE	0.7693539	0.0062650966

To access results for all 1228 CpG sites use object\$results or sort(object)\$results to obtain results sorted by p-value.

```
General info:
 Min.P.Observed Num.Cov fdr.cutoff FDR.method Phenotype chipinfo num.Holm
    0.0006456268
                               0.05
                                            BH
                                                   weight
                                                              NULL
 num.fdr
1
        \cap
O sites were found significant by the Holm method
O sites were found significant by BH method
The beta values were taken from: samplecpg
Effect sizes and standard error can be accessed using $coefficients
Other attributes are: results, Holm.sig, FDR.sig, info, indep, covariates, chip
 They can be accessed using the $
> #Analysis with covariates. There are multiple ways to do this. One can define
> #dataframe prior or do it in the function call or as a function such as ~Cov1
> #We will do it in the function call
> test<-cpg.assoc(samplecpg,samplepheno$weight,data.frame(samplepheno$Distance,</p>
> #Doing a mixed effects model. This does take more time, so we will do a subse
> #the samplecpg
> randtest<-cpg.assoc(samplecpg[1:10,],samplepheno$weight,chip.id=samplepheno$c
> #summary function will work on items of class cpg.
```

cpg.combine

Combine various objects of class cpg

## Description

Takes a list containing objects of class *cpg* and combines them into one cpg item. Assumes that there are no repeated CpG sites bewtween the various objects (i.e. analysis wasn't performed on the same sites twice).

# usage

cpg.combine(allvalues, fdr.method="BH",fdr.cutoff=.05)

#### Arguments

all values A list containing the *cpg* objects that are desired to be

consolidated.

fdr.method FDR method that user wants to use. For options see the

cpg.assoc help page.

fdr.cutoff The desired FDR threshold. The default setting is .05.

The set of CpG sites with FDR < fdr.cutoff will be labeled

as significant.

#### Value

indo.data An object of class cpg that is the consolidated version of

the objects of class cpg that were passed in.

#### Authors

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## Note

This is designed to be used by cpg.assoc when it does analysis on large data sets or by the user if they split up the analysis by chromosome or some other such partition.

## See Also

cpg.perm, cpg.work, plot.cpg scatterplot, cpg.assoc, manhattan, plot.cpg.perm, sort.cpg.perm, sort.cpg

# Examples

- > library(CpGassoc)
- > data(samplecpg,samplepheno,package="CpGassoc")
- > ###NOTE: If you are dealing with large data, do not specify large.data=FALSE.
- > ##This will involve partitioning up the data and performing more gc() to clea
- > test1<-cpg.assoc(samplecpg[1:100,],samplepheno\$weight,large.data=FALSE)
- > test2<-cpg.assoc(samplecpg[101:200,],samplepheno\$weight,large.data=FALSE)
- > overall <-cpg.combine(list(test1,test2))
- > overall

The top ten CpG sites were:

	${\tt CPG.Labels}$	${\tt T.statistic}$	P.value	${\tt Holm.sig}$	FDR	gc.p.value
148	CpG148	3.133454	0.001928697	FALSE	0.3857395	0.008032723
100	CpG100	2.787987	0.005701511	FALSE	0.5701511	0.018186157
52	CpG52	-2.400358	0.017093566	FALSE	0.6753972	0.041721245
3	CpG3	-2.307436	0.021828750	FALSE	0.6753972	0.050222867
85	CpG85	2.289916	0.022840129	FALSE	0.6753972	0.051979447
72	CpG72	-2.093410	0.037296699	FALSE	0.6753972	0.075466953
153	CpG153	-2.080196	0.038502367	FALSE	0.6753972	0.077318076
178	CpG178	-2.055509	0.040844281	FALSE	0.6753972	0.080876123
70	CpG70	-2.023648	0.044045272	FALSE	0.6753972	0.085664559
35	CpG35	-2.000859	0.046463353	FALSE	0.6753972	0.089228937

To access results for all 200 CpG sites use object\$results or sort(object)\$results to obtain results sorted by p-value.

#### General info:

```
Min.P.Observed Num.Cov fdr.cutoff FDR.method Phenotype chipinfo num.Holm
1 0.001928697 0 0.05 BH weight NULL 0
num.fdr
1 0
```

O sites were found significant by the Holm method O sites were found significant by BH method

The beta values were taken from: samplecpg
Effect sizes and standard error can be accessed using \$coefficients
Other attributes are: results, Holm.sig, FDR.sig, info, indep, covariates, chip

They can be accessed using the \$

cpg.perm	Perform a Permutation Test of the Association Between
	Methylation and a Phenotype of Interest

# Description

Calls cpg.assoc to get the observed P-values from the study and then performs a user-specified number of permutations to calculate an emperical p-value. In addition to the same test statistics computed by cpg.assoc, cpg.perm will compute the permutation p-values for the observed p-value, the number of Holm significant sites, and the number of FDR significant sites.

#### Usage

cpg.perm(beta.values, indep, covariates = NULL, nperm, data = NULL, seed = NULL, logit.transform = FALSE, chip.id = NULL, subset = NULL, random = FALSE, fdr.cutoff = 0.05, fdr.method = "BH",large.data=TRUE)

## Arguments

beta.values A vector, matrix, or data frame containing the beta values of interest

(1 row per CpG site, 1 column per individual).

indep A vector containing the main variable of interest. cpg.assoc will eval-

uate the association between indep and the beta values.

covariates A data frame consisting of the covariates of interest. covariates can also

be a matrix if it is a model matrix minus the intercept column. It can also be a vector if there is only one covariate of interest. Can also be a

formula(e.g. cov1+cov2).

nperm The number of permutations to be performed.

data an optional data frame, list or environment (or object coercible by

as.data.frame to a data frame) containing the variables in the model. If not found in data, the variables are taken from the environment from

which cpg.perm is called.

seed The required seed for random number generation. If not input, will use

R's internal seed.

logit.transform Logical. If TRUE, the logit transform of the beta values log(beta.val/(1-

beta.val)) will be used. Any values equal to zero or one will be set to the next smallest or next largest value respectively; values <0 or >1

will be set to NA.

chip.id An optional vector containing the chip information. If specified, chip

id will be included as a factor in the model.

subset An optional logical vector specifying a subset of observations to be used

in the fitting process.

random Logical. If TRUE, the chip.id will be processed as a random effect, and

a random intercept model will be fitted.

fdr.cutoff The threshold at which to compare the FDR values. The default setting

is .05. Any FDR values less than .05 will be considered significant.

fdr.method Character. Method used to calculate False Discovery Rate. Can be

any of the methods listed in p.adjust or "qvalue" for John Storey's qvalue method (required to have qvalue package installed). The default

method is "BH" for the Benjamini and Hochberg method.

large.data Logical. Enables analyses of large datasets. When large.data=TRUE,

cpg.assoc avoids memory problems by performing the analysis in

chunks.

#### Value

The item returned will be of class *cpg.perm*. It will contain all of the values of class *cpg* cpg.assoc and a few more:

permutation.matrix A matrix consisting of the minimum observed P-value, the number of

Holm significant CpG sites, and the number of FDR significant sites

for each permutation.

perm.p.values A data frame consisting of the permutation P-values, and the number

of permutations performed.

perm.tstat If one hundred or more permutations were performed and indep is

a continuous variable, consists of the quantile .025 and .975 of observed t-statistics for each permutation, ordered from smallest to largest. perm.tstat is used by plot.cpg.perm to compute the confidence inter-

vals for the QQ plot of t-statistics. Otherwise NULL.

perm.pval If one hundred or more permutations were performed, consists of the ob-

served p-values for each permutation, ordered from smallest to largest. perm.pval is usd by plot.cpg.perm to compute the confidence intervals

for the QQ plot of the p-values. Otherwise NULL.

gc.permutation.matrix Similar to the permutation.matrix only in relation to the genomic con-

trol adjusted p-values.

#### Authors

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#### See Also

cpg.assoc, cpg.work, plot.cpg scatterplot, cpg.combine, manhattan, plot.cpg.perm, sort.cpg.perm, sort.cpg, cpg.qc, cpg.GC

# Examples

```
> ##Loading the data
```

- > library(CpGassoc)
- > data(samplecpg,samplepheno,package="CpGassoc")
- > ###NOTE: If you are dealing with large data, do not specify large.data=FALSE. The default option i
- > ##This will involve partitioning up the data and performing more gc() to clear up space
- > #Performing a permutation 10 times
- > Testperm<-cpg.perm(samplecpg,samplepheno\$weight,data.frame(samplepheno\$Dose,samplepheno\$Distance),
- + seed=2314,nperm=10,large.data=FALSE)
- > Testperm

The permutation P-values, number of permutations and seed:

p.value.p p.value.holm p.value.FDR nperm seed
0.3 1 1 10 2314

```
Other information:
   Min.P.Observed Num.Cov fdr.cutoff FDR.method num.real.Holm num.real.fdr
       0.0006002142
                                           2
                                                         0.05
                                                                                  BH
The top ten CpG sites were:
         CPG.Labels T.statistic
                                                             P.value Holm.sig
                                                                                                         FDR
                                                                                                                    gc.p.value
694
                CpG694
                                   3.475160 0.0006002142
                                                                                 FALSE 0.3833341 0.0006002142
293
                CpG293
                                   3.464076 0.0006243226
                                                                                  FALSE 0.3833341 0.0006243226
560
                CpG560
                                   3.333678 0.0009848497
                                                                                  FALSE 0.4031318 0.0009848497
                CpG148
                                   3.187753 0.0016135434
                                                                                  FALSE 0.4953578 0.0016135434
148
238
                CpG238
                                   3.012760 0.0028504303
                                                                                  FALSE 0.5921086 0.0028504303
998
                CpG998
                                 -3.008091 0.0028930386
                                                                                  FALSE 0.5921086 0.0028930386
1059
               CpG1059
                                 -2.932014 0.0036749081
                                                                                  FALSE 0.6295151 0.0036749081
100
                CpG100
                                   2.889847 0.0041873059
                                                                                  FALSE 0.6295151 0.0041873059
1006
               CpG1006
                                 -2.831992 0.0049965867
                                                                                  FALSE 0.6295151 0.0049965867
1182
               CpG1182
                                 -2.823521 0.0051263442
                                                                                  FALSE 0.6295151 0.0051263442
To access results for all 1228 CpG sites use object$results
 or sort(object)$results to obtain results sorted by p-value.
O sites were found significant by the Holm method
O sites were found significant by BH method
The beta values were taken from: samplecpg
Other attributes are: permutation.matrix, perm.p.values, gc.permutation.matrix, results, Holm.sig ,
 FDR.sig, info, indep, covariates, chip, coefficients.
They can be accessed using the $
> #All the contents of CpGassoc are included in the output from Testperm
> #Using the output from CpGassoc in the example
> \ test < -cpg. assoc (samplecpg, samplepheno \$ weight, data. frame (samplepheno \$ Distance, samplepheno \$ Dose), larrow (samplecpg, samplepheno \$ Dose), larrow (samplecpg, samplecpg, 
> all.equal(Testperm$results,test$results)
[1] TRUE
> #summary function works on objects of class cpg.perm
> summary(Testperm)
The permutation P-values, number of permutations and seed:
   p.value.p p.value.holm p.value.FDR nperm seed
                                                                           10 2314
1
              0.3
                                          1
                                                                 1
Other information:
   Min.P.Observed Num.Cov fdr.cutoff FDR.method num.real.Holm num.real.fdr
      0.0006002142
                                                          0.05
The top ten CpG sites were:
         CPG.Labels T.statistic
                                                             P.value Holm.sig
                                                                                                         FDR
                                                                                                                    gc.p.value
694
                 CpG694
                                   3.475160 0.0006002142
                                                                                  FALSE 0.3833341 0.0006002142
                                                                                  FALSE 0.3833341 0.0006243226
293
                CpG293
                                   3.464076 0.0006243226
                                                                                  FALSE 0.4031318 0.0009848497
560
                CpG560
                                   3.333678 0.0009848497
148
                CpG148
                                   3.187753 0.0016135434
                                                                                  FALSE 0.4953578 0.0016135434
238
                CpG238
                                   3.012760 0.0028504303
                                                                                  FALSE 0.5921086 0.0028504303
```

FALSE 0.5921086 0.0028930386

FALSE 0.6295151 0.0036749081

-3.008091 0.0028930386

-2.932014 0.0036749081

998

1059

CpG998

CpG1059

```
      100
      CpG100
      2.889847
      0.0041873059
      FALSE
      0.6295151
      0.0041873059

      1006
      CpG1006
      -2.831992
      0.0049965867
      FALSE
      0.6295151
      0.0049965867

      1182
      CpG1182
      -2.823521
      0.0051263442
      FALSE
      0.6295151
      0.0051263442
```

To access results for all 1228 CpG sites use object\$results or sort(object)\$results to obtain results sorted by p-value.

```
O sites were found significant by the Holm method O sites were found significant by \operatorname{BH} method
```

```
The beta values were taken from: samplecpg
Other attributes are: permutation.matrix, perm.p.values, gc.permutation.matrix, results, Holm.sig ,
FDR.sig, info, indep, covariates, chip, coefficients.
They can be accessed using the $
```

cpg.GC

For genomic control adjusted statistics.

#### Description

 ${\tt cpg.GC}$  accepts an object of class cpg.perm or cpg and returns information regarding Holm and FDR-significance of the GC (genomic control) adjusted test statistics. For cpg.perm will return permutation p-values based on the GC-adjusted values from each permutation.

# Usage

cpg.GC(x)

#### Arguments

 $\mathbf{x}$  Object of class cpg.perm or cpg..

## Details

cpg.GC will display the number of Holm and FDR-significant sites using the genomic control adjusted p-values test statistics. It will also display the estimated genomic control inflation factor.

#### Value

cpg.GC returns an object of class cpg.gc or cpg.perm.gc

gc.results Matrix consisting of GC-adjusted test statistics for each CpG site. Sim-

ilar to the results output of cpg.assoc.

gc.info Data frame with information on the number of Holm and FDR sig-

nificant sites. Will also have the genomic control inflation estimate. Objects from cpg.perm will also have information concerning the per-

mutation p-values.

#### Authors

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#### See Also

cpg.assoc, cpg.work, plot.cpg scatterplot, cpg.combine, manhattan, plot.cpg.perm, sort.cpg.perm, sort.cpg, cpg.qc

#### Examples

- > library(CpGassoc)
- > data(samplecpg,samplepheno,package="CpGassoc")
- > results<-cpg.assoc(samplecpg,samplepheno\$weight,large.data=FALSE)
- > cpg.GC(results)

Using genomic control adjustment the top sites are:

	CPG.Labels	GC.Adjusted	Adjust.P.value	Adj.Holm	Adj.FDR
694	CpG694	3.454271	0.0006456268	FALSE	0.4318310
293	CpG293	3.412320	0.0007485123	FALSE	0.4318310
560	CpG560	3.313353	0.0010549618	FALSE	0.4318310
148	CpG148	3.133454	0.0019286973	FALSE	0.5645412
998	CpG998	-3.079596	0.0022986204	FALSE	0.5645412
1059	CpG1059	-2.883525	0.0042668430	FALSE	0.7693539
1182	CpG1182	-2.819710	0.0051827097	FALSE	0.7693539
100	CpG100	2.787987	0.0057015107	FALSE	0.7693539
751	CpG751	-2.759379	0.0062093208	FALSE	0.7693539
238	CpG238	2.756367	0.0062650966	FALSE	0.7693539

# General info:

- O sites were found significant by the Holm method
- O sites were found significant by BH method
- > ##If the genomic inflation factor is less than one there is no need for adjustment

cpg.qc

Performs quality control on Illumina data.

# Description

cpg.qc is designed to perform quality control on Illumina data prior to analysis. In addition to the matrix of beta values, this function requires as input matrices of Signal A, Signal B, and detection p-values. It will remove samples that have low intensity (mean signal intensity less than half of the overall median or 2000). It can also set to NA datapoints with detection p-values exceeding a user-specified cutoff, and can remove samples or sites that have a missing rate above a user-specified value. Finally, users can opt to compute beta values as M/(U+M) or M/(U+M+100).

#### Usage

cpg.qc(beta.orig,siga,sigb,pval,p.cutoff=.001,cpg.miss=NULL,sample.miss=NULL,constant 100=FALSE)

# Arguments

beta.orig The original beta values matrix obtained from GenomeStudio.

siga The unmethylated signals matrix obtained from GenomeStudio.

sigb The methylated signals matrix obtained from GenomeStudio.

pval A matrix of detection p-values obtained from GenomeStudio. pval

should have the same dimension as the beta values and signals: one

row for each site and one column for each individual.

p.cutoff The user-specified cutoff for detection p-values (default=.001).

cpg.miss Optional cutoff value. If specified, cpg.qc will remove cpg sites where

the proportion of missing values exceeds this cutoff.

sample.miss Optional cutoff value. If specified, cpg.qc will remove samples where

the proportion of missing values exceeds this cutoff.

constant 100 Logical. If TRUE, the new beta values will be calculated as

M/(U+M+100); if FALSE (default) they will be calculated as

M/(U+M).

## Details

It is important that all the matrices or data frames listed above (pval, siga, sigb, beta.orig) are ordered similarly with respect to samples and CpG sites.

# Value

returns a new matrix of beta values that has been subjected to the specified quality control filters. This matrix can be input directly into cpg.assoc.

#### Authors

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## See Also

cpg.perm, cpg.assoc, plot.cpg scatterplot

# Examples

> ##See the examples in the CpGassoc tutorial.

cpg.work	Does the analysis between the CpG sites and phenotype of interest
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#### Description

Association Analysis Between Methylation Beta Values and Phenotype of Interest. This function contains the code that does the brunt of the work for cpg.assoc and cpg.perm.

#### Usage

cpg.work(beta.values, indep, covariates = NULL, data = NULL, logit.transform = FALSE, chip.id = NULL, subset = NULL, random = FALSE, fdr.cutoff = 0.05, callarge = FALSE, fdr.method = "BH", logitperm = FALSE, big.split=FALSE)

#### Arguments

beta.values A vector, matrix, or data frame cont	taining the beta values of interest
--	-------------------------------------

(1 row per CpG site, 1 column per individual).

indep A vector containing the main variable of interest. cpg.work will evalu-

ate the association between indep and the beta values.

covariates A data frame consisting of the covariates of interest. covariates can also

be a matrix if it is a model matrix minus the intercept column. It can also be a vector if there is only one covariate of interest. Can also be a

formula (e.g. cov1+cov2).

data an optional data frame, list or environment (or object coercible by

as.data.frame to a data frame) containing the variables in the model. If not found in data, the variables are taken from the environment from

which cpg.work is called.

logit.transform Logical. If TRUE, the logit transform of the beta values log(beta.val/(1-

beta.val)) will be used. Any values equal to zero or one will be set to the next smallest or next largest value respectively; values <0 or >1

will be set to NA.

chip.id An optional vector containing chip or batch identities. If specified, chip

id will be included as a factor in the model.

subset an optional logical vector specifying a subset of observations to be used

in the fitting process.

random Logical. If TRUE, the chip.id will be included in the model as a random

effect, and a random intercept model will be fitted. If FALSE, chip.id will be included in the model as an ordinary categorical covariate, for

a much faster analysis.

fdr.cutoff The threshold at which to compare the FDR values. The default setting

is .05. Any FDR values less than .05 will be considered significant.

callarge Logical. Used by cpg.assoc when it calls cpg.work. If TRUE it means

that beta values is actually split up from a larger data set and that memory.limit may be a problem. This tells cpg.work to perform more

rm() and gc() to clear up space.

fdr.method Character. Method used to calculate False Discovery Rate. Can be

any of the methods listed in p.adjust or qvalue for John Storey's qvalue method (required to have qvalue package installed). The default method is "BH" for the Benjamini and Hochberg method.

logitperm Passes from cpg.perm when permutation test is performed. Stops from

future checks involving the logistic transformation.

big.split Passes from cpg.assoc. Internal flag to inform cpg.work that the large

data did not need to be split up.

#### Details

cpg.work does the analysis between the methylation and the phenotype of interest. It is called by cpg.assoc to do the brunt of the work. It can be called itself with the same input as cpg.assoc, it just cannot handle large data sets.

#### Value

cpg.work will return an object of class cpg.

The functions summary and plot can be called to get a summary of results and to create QQ plots. The output is in the same order as the original input. To sort it by p-value, use the sort function.

results A data frame consisting of the statistics and P-values for each CpG site.

Also has the adjusted p-value based on the fdr.method and whether the

site was Holm significant.

Holm.sig A list of sites that met criteria for Holm significance.

FDR.sig A data.frame of the sites that were FDR significant by the fdr method.

info A data frame consisting of the minimum P-value observed, the fdr

method used, what the phenotype of interest was, and the number of

covariates in the model.

indep The main phenotype of interest.

covariates If covariates was non NULL, the covariates will be included. Otherwise

will be NULL.

chip If chip.id was non NULL, the chip will be included. Otherwise will be

NULL

coefficients A data frame consisting of the degrees of freedom, and if object is

continous the intercept effect adjusted for possible covariates in the model, the estimated effect size, and the standard error. The degrees of freedom is used in plot.cpg to compute the genomic inflation factors.

#### Authors

Barfield, R.; Conneely, K.; Kilaru, V.

Maintainer: R. Barfield: rbarfield01@fas.harvard.edu

#### See Also

cpg.perm, cpg.assoc, plot.cpg scatterplot, cpg.combine, manhattan, plot.cpg.perm, sort.cpg.perm, sort.cpg, cpg.qc

# Examples

> ##See the examples listed in cpg.assoc for ways in which to use cpg.work.

> ##Just change the cpg.assoc to cpg.work.

design Create full and reduced design matrices for the cpg.assoc function.

#### Description

Designed to be used by cpg.assoc and cpg.perm. Creates a full and reduced design matrices.

#### Usage

design(covariates, indep, chip.id, random)

# Arguments

covariates A data frame consisting of the covariates of interest. covariates can also

be a matrix if it is a model matrix minus the intercept column. It can also be a vector if there is only one covariate of interest. If no covariates

must be specified as NULL.

indep A vector containing the main variable of interest. cpg.assoc will eval-

uate the association between indep and the beta values.

chip.id An optional vector containing chip or batch identities. If specified,

chip.id will be included as a factor in the model.

random Is the model going to be a mixed effects. If so, chip.id will not be

included in the design matrices.

#### Value

Returns a list containing the full and reduced design matrices.

full The full design matrix

reduced The reduced design matrix

#### Author

Barfield, R.; Kilaru, V.; Conneely, K.

Maintainer: R. Barfield: rbarfield01@fas.harvard.edu

#### Note

The design function is designed to be used exclusively by the cpg.assoc and cpg.perm functions.

# See Also

cpg.assoc, cpg.perm, plot.cpg, cpg.work, scatterplot, cpg.combine, manhattan, plot.cpg.perm, sort.cpg.perm, sort.cpg

#### examples

```
> library(CpGassoc)
```

- > data(samplecpg,samplepheno,package="CpGassoc")
- > #Example where there are covariates:
- > covar<-data.frame(samplepheno\$weight,samplepheno\$Distance)
- > test<-design(covar,samplepheno\$SBP,samplepheno\$chip,FALSE)
- > dim(test\$full)

[1] 258 26

> dim(test\$reduced)

[1] 258 25

> test\$reduced[1:5,1:5]

```
(Intercept) samplepheno.weight samplepheno.Distance factor(chip.id)3
1
                       31.02998
                                            28.49084
2
                       20.83885
                                           13.10059
           1
                                                                   0
3
                       21.47078
                                           14.76703
           1
                                                                   0
                       23.95091
                                           25.54482
           1
                                                                   0
                       34.12922
                                            29.45997
           1
```

factor(chip.id)4 0

2 0 3 0 4 0

> test\$full[1:5,1:5]

5

	(Intercept)	indep	samplepheno.weight	${\tt samplepheno.Distance}$	<pre>factor(chip.id)3</pre>
1	1	16.98629	31.02998	28.49084	0
2	1	34.90645	20.83885	13.10059	0
3	1	21.55838	21.47078	14.76703	0
4	1	20.90882	23.95091	25.54482	0
5	1	27.01004	34.12922	29.45997	0

- > #When no covariates or chip.id:
- > test2<-design(NULL,samplepheno\$SBP,NULL,FALSE)
- > dim(test2\$full)

[1] 258 2

# > dim(test2\$reduced)

# [1] 258 1

manhattan	Create a manhattan plot	

# Description

This function will produce a manhattan plot for the observed P-values from a object of class cpg or cpg.perm.

# Usage

manhattan(x, cpgname, chr, pos, save.plot = NULL, file.type="pdf", popup.pdf = FALSE, eps.size = c(15, 5), main.title = NULL, cpg.labels = NULL, chr.list = NULL, color.list = NULL, ...)

# Arguments

X	Object of class $cpg$ or $cpg.perm$ .
cpgname	A vector consisting of the labels for each CpG site.
chr	A vector consisting of the chromosome number for each CpG site.
pos	The map position of each CpG site within its chromosome.
save.plot	Name of the file for the plot to be saved to. If not specified, plot will not be saved.
file.type	Type of file to be saved. Can either be "pdf" or "eps". Selecting file.type="eps" will result in publication quality editable postscript files that can be opened by Adobe Illustrator or Photoshop.
popup.pdf	TRUE or FALSE. If creating a pdf file, this indicates if the plot should appear in a popup window as well. If running in a cluster-like environment, best to leave FALSE.
eps.size	Vector indicating the size of .eps file (if creating one). Corresponds to horrizontal and height.

main.title Main title to be put on the graph. If NULL one based on

the analysis will be used.

cpg.labels A character scalar of either "FDR" or "HOLM" which will

label the significant sites on the manhattan plot.

chr.list A vector listing the chromosomes to be plotted (all avail-

able chromosomes are plotted by default). The X and Y

chromosomes can be denoted by 23 and 24

color.list A vector of custom colors to be used for each chromosomes

in the manhattan plot.

... Arguments to be passed to methods, such as graphical

parameters.

#### Authors

Barfield, R.; Conneely, K.; Kilaru, V.

Maintainer: R. Barfield: rbarfield01@fas.harvard.edu

# Note

cpgname, chr, and pos must be sorted in the same order, so that the first cpgname[1] corresponds to chr[1] and pos[1], and so on.

# See Also

cpg.assoc, cpg.perm, plot.cpg, cpg.work, scatterplot, cpg.combine, design, plot.cpg.perm, sort.cpg.perm, sort.cpg

#### Examples

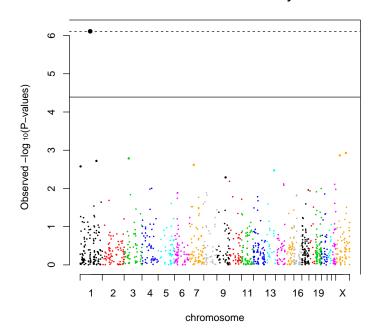
Object of class cpg	Methods for object of class	

# Usage

plot.cpg(x, save.plot = NULL, file.type="pdf", popup.pdf = FALSE, tplot = FALSE, classic = TRUE, main.title = NULL, eps.size = c(5,

```
> #Doing a Manhattan plot. First load the data:
> #Doing a Manhattan plot. First load the data:
> library(CpGassoc)
> data(samplecpg,samplepheno,annotation,package="CpGassoc")
> ###NOTE: If you are dealing with large data, do not specify large.data=FALSE. The defaul
> ##This will involve partitioning up the data and performing more gc() to clear up space
> examplemanhat<-cpg.assoc(samplecpg,samplepheno$Disease,large.data=FALSE)
> manhattan(examplemanhat,annotation$TargetID,annotation$CHR,annotation$MAPINFO)
```

#### Manhattan Plot for association between methylation and Diseas



```
5), gc.p.val = FALSE, gcdisplay = FALSE, ...)
summary.cpg(object,...)
print.cpg(x,...)
sort.cpg(x,decreasing,...)
```

## Arguments

x Output of class *cpg* from cpg.assoc or cpg.work.

save.plot Name of the file for the plot to be saved to. If not specified,

plot will not be saved.

file.type Type of file to be saved. Can either be "pdf" or "eps".

Selecting file.type="eps" will result in publication quality editable postscript files that can be opened by Adobe

Illustrator or Photoshop.

popup.pdf TRUE or FALSE. If creating a pdf file, this indicates if the

plot should appear in a popup window as well. If running

in a cluster-like environment, best to leave FALSE.

tplot Logical. If TRUE, ordered t-statistics will be plotted

against their expected quanties. If FALSE (default), - log(p) will be plotted. If indep is a class variable this

option will be ignored.

classic Logical. If TRUE, a classic qq-plot will be generated, with

all p-values plotted against predicted values (including significant). If FALSE Holm-significant CpG sites will not be used to compute expected quantiles and will be plotted

separately.

main.title Main title to be put on the graph. If NULL one based on

the analysis will be used.

eps.size Vector indicating the size of .eps file (if creating one).

Correponds to the options horizontal and height in the

postscript function.

gc.p.val Logical. If TRUE, plot will use the genomic control ad-

justed p-values.

gcdisplay Logical. If TRUE, plot will display the genomic control

value in the legend.

object Output of class cpg from cpg.assoc or cpg.work.

decreasing Logical. Should the sort be increasing or decreasing? Not

available for partial sorting.

... Arguments to be passed to methods, such as graphical

parameters.

# Description

Methods and extra functions for class cpg.

plot.cpg creates a QQ plot based on the association p-values or t-statistics from the function cpg.assoc.

#### Value

sort.cpg returns an item of class cpg that is sorted by p-value.

summary.cpg creates a qq-plot based on the data, and scatterplots or boxplots for the top sites.

#### Authurs

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Maintainer: R. Barfield: rbarfield01@fas.harvard.edu

#### Note

Plots with empirical confidence intervals based on permutation tests can be obtained from cpg.perm.

See plot.cpg.perm for more info

#### See Also

cpg.perm, cpg.work, cpg.assoc scatterplot, cpg.combine, manhattan, plot.cpg.perm, sort.cpg.perm,cpg.qc

# Examples

Object of	class cpg.perm
-----------	----------------

Methods for object of class cpg.perm

# Usage

```
\begin{aligned} & plot.cpg.perm(x, save.plot = NULL, file.type="pdf", popup.pdf = FALSE, \\ & main.title = NULL, \ eps.size = c(5, 5), \ tplot = FALSE, \ perm.ci = \\ & TRUE, \ classic = TRUE, \ gc.p.val = FALSE, \ gcdisplay = FALSE, \ldots) \\ & summary.cpg.perm(object, \ldots) \\ & print.cpg.perm(x, \ldots) \\ & sort.cpg.perm(x, decreasing, \ldots) \end{aligned}
```

# Description

Methods and extra functions for class *cpg.perm*. plot.cpg.perm creates a QQ plot based on the association p-values or t-statistics from the function cpg.perm.

# Arguments

Х

	1	101	151	
save.plot	Name of the fi	ile for the plot to be s be saved.	saved to. If not spe	ecified,
file.type	Selecting file	o be saved. Can eite.type="eps" will resortscript files that of Photoshop.	esult in publication	n qual-
popup.pdf	plot should a	E. If creating a pdf ppear in a popup wi ke environment, bes	indow as well. If r	

Output from cpg.perm. Of class cpg.perm.

main.title Main title to be put on the graph. If NULL one based on

the analysis will be used

eps.size Vector indicating the size of .eps file (if creating one).

Correponds to the options horizontal and height in the

postscript function.

tplot Logical. If TRUE, ordered t-statistics will be plotted

against their expected quanties. If FALSE (default), - log(p) will be plotted. If indep is a class variable this

option will be ignored.

perm.ci Logical. If TRUE, the confidence intervals computed will

be from the permutated values, otherwise will be based

on the theoretical values.

classic Logical. If TRUE, a classic qq-plot will be generated, with

all p-values plotted against predicted values (including significant). If FALSE Holm-significant CpG sites will not be used to compute expected quantiles and will be plotted

separately.

gc.p.val Logical. If TRUE, plot will use the genomic control ad-

justed p-values.

gcdisplay Logical. If TRUE, plot will display the genomic control

value in the legend.

object Output of class *cpg.perm* from *cpg.perm*.

decreasing Logical. Should the sort be increasing or decreasing? Not

available for partial sorting.

... Arguments to be passed to methods, such as graphical

parameters.

# Authors

Barfield, R.; Kilaru, V.; Conneely, K.

Maintainer: R. Barfield: rbarfield01@fas.harvard.edu

- > ##Using the results from the example given in cpg.assoc.
- > ###NOTE: If you are dealing with large data, do not specify large.data=FALSE. The defaul
- > ##This will involve partitioning up the data and performing more gc() to clear up space
- > ##QQ Plot:
- > library(CpGassoc)
- > data(samplecpg,samplepheno,package="CpGassoc")
- > test<-cpg.assoc(samplecpg,samplepheno\$weight,data.frame(samplepheno\$Distance,samplepheno
- > plot(test)
- > ##t-statistic plot:
- > plot(test,tplot=TRUE)
- > ##Now an example of sort
- > head(sort(test)\$results)

	${\tt CPG.Labels}$	T.statistic	P.value	Holm.sig	FDR	gc.p.value
694	CpG694	3.475160	0.0006002142	FALSE	0.3833341	0.0006002142
293	CpG293	3.464076	0.0006243226	FALSE	0.3833341	0.0006243226
560	CpG560	3.333678	0.0009848497	FALSE	0.4031318	0.0009848497
148	CpG148	3.187753	0.0016135434	FALSE	0.4953578	0.0016135434
238	CpG238	3.012760	0.0028504303	FALSE	0.5921086	0.0028504303
998	CpG998	-3.008091	0.0028930386	FALSE	0.5921086	0.0028930386

- > ##Summary
- > summary(test)

The top ten CpG sites were:

	CPG.Labels	${\tt T.statistic}$	P.value	Holm.sig	FDR	gc.p.value
694	CpG694	3.475160	0.0006002142	FALSE	0.3833341	0.0006002142
293	CpG293	3.464076	0.0006243226	FALSE	0.3833341	0.0006243226
560	CpG560	3.333678	0.0009848497	FALSE	0.4031318	0.0009848497
148	CpG148	3.187753	0.0016135434	FALSE	0.4953578	0.0016135434
238	CpG238	3.012760	0.0028504303	FALSE	0.5921086	0.0028504303
998	CpG998	-3.008091	0.0028930386	FALSE	0.5921086	0.0028930386
1059	CpG1059	-2.932014	0.0036749081	FALSE	0.6295151	0.0036749081
100	CpG100	2.889847	0.0041873059	FALSE	0.6295151	0.0041873059
1006	CpG1006	-2.831992	0.0049965867	FALSE	0.6295151	0.0049965867
1182	CpG1182	-2.823521	0.0051263442	FALSE	0.6295151	0.0051263442

To access results for all 1228 CpG sites use object\$results or sort(object)\$results to obtain results sorted by p-value.

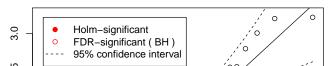
# General info:

```
Min.P.Observed Num.Cov fdr.cutoff FDR.method Phenotype chipinfo num.Holm
 0.0006002142
               2
                           0.05
                                       BH
                                             weight
                                                        NULL
num.fdr
```

- O sites were found significant by the Holm method
- O sites were found significant by BH method

The beta values were taken from: samplecpg Effect sizes and standard error can be accessed using \$coefficients Other attributes are: results, Holm.sig, FDR.sig, info, indep, covariates, chip They can be accessed using the  $\$_5$ 

# QQ plot for association between methylation and weight



#### Note

Empirical confidence intervals will be computed only if there are a hundred or more permutations. Otherwise the theoretical confidence intervals will be plotted.

# See Also

cpg.assoc, cpg.perm, plot.cpg, cpg.work, scatterplot, cpg.combine, design, manhattan, sort.cpg

# Examples

scatterplot	Plot beta values of individual CpG sites against the inde-
	pendent variable.

# Usage

scatterplot(x, cpg.rank = NULL, cpg.name = NULL, save.plot = NULL, file.type="pdf", eps.size = c(5, 5), popup.pdf = FALSE, beta.values = NULL,main.title=NULL, ...)

# Arguments

X	Object of class cpg or cpg.perm.
cpg.rank	A vector listing the rank of sites to be plotted. The rank is based on the ordered p-values.
cpg.name	A character vector containing the names of CpG sites to be plotted against the phenotype of interest. This option is ignored if cpg.rank is specified.
save.plot	Prefix of the filename for the plot(s) to be saved to. If specified, plot filenames will be created by appending this prefix to either cpg.rank or cpg.name. If not specified, plot will not be saved.
file.type	Type of file to be saved. Can either be "pdf" or "eps". Selecting file.type="eps" will result in publication quality editable postscript files that can be opened by Adobe Illustrator or Photoshop.

eps.size Vector indicating the size of .eps file (if creating one). Cor-

reponds to horrizontal and height.

popup.pdf TRUE or FALSE. If creating a pdf file, this indicates if the

plot should appear in a popup window as well. If running

in a cluster-like environment, best to leave FALSE.

beta.values If the object has been renamed (i.e. xinfobetainfo is no

longer in ls(.GlobalEnv)) then specify the new object

here.

main.title Main title to be put on the graph. If NULL one based on

the analysis will be used

.. Arguments to be passed to methods, such as graphical

parameters.

#### Details

An unlimited number of CpG sites can be selected for plotting by specifying either cpg.rank or cpg.name, as shown in the Examples below. Note that only one of these options is needed; if both are entered, cpg.rank will be used.

#### Authors

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# See Also

cpg.assoc, cpg.perm, manhattan, cpg.work, plot.cpg.perm, cpg.combine, design, plot.cpg, sort.cpg.perm, sort.cpg

# Examples

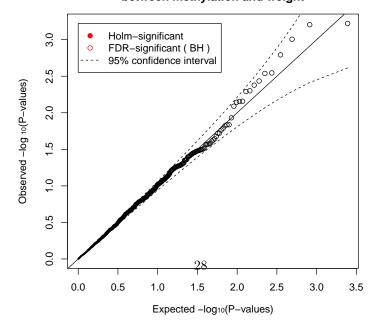
- > library(CpGassoc)
- > data(samplecpg,samplepheno,package="CpGassoc")
- > ##We will do the analysis on a subset to save time
- > ###NOTE: If you are dealing with large data, do not specify large.data=FALSE. The defaul
- > ##This will involve partitioning up the data and performing more gc() to clear up space
- > #The qq plot:
- > Testperm<-cpg.perm(samplecpg,samplepheno\$weight,data.frame(samplepheno\$Dose,samplepheno\$
  + seed=2314,nperm=10,large.data=FALSE)</pre>
- > plot(Testperm)
- > #The t-statistic plot from cpg.perm has confidence intervals since we were allowed to pe
  > plot(Testperm,tplot=TRUE)
- > #If there was 100 or more permutations, there would be emperical confidence intervals.
- >
- > ###Now for Sort
- > head(sort(Testperm)\$results)

	${\tt CPG.Labels}$	${\tt T.statistic}$	P.value	Holm.sig	FDR	gc.p.value
694	CpG694	3.475160	0.0006002142	FALSE	0.3833341	0.0006002142
293	CpG293	3.464076	0.0006243226	FALSE	0.3833341	0.0006243226
560	CpG560	3.333678	0.0009848497	FALSE	0.4031318	0.0009848497
148	CpG148	3.187753	0.0016135434	FALSE	0.4953578	0.0016135434
238	CpG238	3.012760	0.0028504303	FALSE	0.5921086	0.0028504303
998	CpG998	-3.008091	0.0028930386	FALSE	0.5921086	0.0028930386

# > head(Testperm\$results)

	CPG.Labels	T.statistic	P.value	Holm.sig	FDR	gc.p.value
1	CpG1	-1.63736663	0.10279215	FALSE	0.9439499	0.10279215
2	CpG2	-0.09076561	0.92775038	FALSE	0.9927071	0.92775038
3	CpG3	-2.36081337	0.01899094	FALSE	0.9057057	0.01899094
4	CpG4	1.28326656	0.20056830	FALSE	0.9530109	0.20056830
5	CpG5	-1.29476076	0.19657851	FALSE	0.9530109	0.19657851
6	CnG6	-0 94975324	0 34314045	FAISE	0 9911946	0 34314045

# QQ plot for association between methylation and weight



```
> #Load the data:
> data(samplecpg,samplepheno,package="CpGassoc")
> library(CpGassoc)
> ###NOTE: If you are dealing with large data, do not specify large.data=FALSE. The defaul
> ##This will involve partitioning up the data and performing more gc() to clear up space
> test<-cpg.assoc(samplecpg,samplepheno$weight,large.data=FALSE)
> ##Using rank, will plot the top three sites in order of significance:
> scatterplot(test,c(1:3))
Press enter to continue
Press enter to continue
Press enter to continue
All 3 sites plotted
> ##Using name, specify three sites:
> scatterplot(test,cpg.name=c("CpG1182","CpG1000","CpG42"))
Press enter to continue
Press enter to continue
Press enter to continue
All 3 sites plotted
> ##Plotting something that is categorical in nature:
> test2<-cpg.assoc(samplecpg,factor(samplepheno$Disease),large.data=FALSE)
> scatterplot(test2,c(2))
Press enter to continue
```

All 1 sites plotted