# Package 'SummaryLasso'

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Type Package

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funcIndex

Inputs for the functional annotations of SNPs.

# **Description**

A 3614 x 3 matrix with (0,1) entry with 3614 SNPs and 3 functional annotations. For the element at i-th row, j-th column, the entry 0 means SNP i without j-th functional annotation; entry 1 means otherwise. follows:

- f1: The binary index for functional annotation 1.
- f2: The binary index for functional annotation 2.
- f3: The binary index for functional annotation 3.

#### Usage

```
data(summaryZ)
```

#### **Format**

A matrix with 3614 rows for the 3614 SNPs and 3 columns for functional annotations.

gsfPEN

SummaryLasso incorporating multiple traits and functional annotations of SNPs.

# Description

SummaryLasso to model pleiotropy by introducing a group-Lasso type penalty, which is sensitive to select SNPs modestly associated with multiple traits and to incorporate functional annotations of SNPs simultaneously.

# Usage

```
gsfPEN(summaryZ, Nvec, plinkLD, NumIter = 1000, RupperVal = NULL, breaking = 1, numChrs = 22, ChrIndexBeta = 0, Init_summaryBetas = 0, Zscale = 1, tuningMatrix = NULL, penalty = "mixLOG", funcIndex, numfunc, p.Threshold = NULL, p.Thresholdpara = c(0.5, 10^{4}-4, 4), taufactor = c(1/25, 1, 3), llim_length = 4, subtuning = 4, Lambda_limit = c(0.5, 0.9), Lenlam = 4, lambdavec_func = NULL, lambdavec_func_limit_len = c(1.5, 3), dfMax = NULL, outputAll = 0, warmStart = 0, customed = 0, AllTuningMatrix = NULL, SDvec = NULL, IniBeta = 0)
```

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#### **Arguments**

summaryZ The Z statistics of p SNPs from q GWA studies. A matrix with dimension p x

q for p SNPs and q traits. The first column corresponds to the primary trait and

the rest columns correspond to the secondary traits.

Nvec A vector of length q for the sample sizes of q GWA studies.

plinkLD .ld file obtained from the LD calculation from plink.

NumIter The number of maximum iterations for the estimation procedure.

RupperVal The maximum tolerable magnitude of the estimates of coefficients during the

iterations. This is to avoid certain estimates of coefficients to diverge during the iterations. This may happen when the signs of the correlation coefficients were estimated incorrectly. The default value is 50 times the maximum of coefficients

from the input in absolute values.

breaking A binary (0,1) variable to check if there are some certain estimates of coeffi-

cients to diverge during the iterations. This may happen when the signs of the correlation coefficients were estimated incorrectly. The default value is 1.

numChrs The number of chromosomes used in the analysis. Current version of package

does not use this argument.

ChrIndexBeta The chromosome index for each SNP. Current version of packge does not use

this argument.

Init\_summaryBetas

Can be used to set the initial values of the coefficients for the iterative estimation.

Zscale A binary (0,1) variable to make the coefficients from different GWA studies with

unequal sample sizes comparable. The default value is 1.

tuningMatrix Inputs for the tuning values of the tuning parameters. Default is null and it will

be generated automatically.

penalty Current version of pacakge does not use this argument.

funcIndex Inputs for the functional annotations of SNPs. A p x k matrix with (0,1) entry;

p is the number of SNPs and k is the number of functional annotations. For the element at i-th row, j-th column, the entry 0 means SNP i without j-th functional

annotation; entry 1 means otherwise.

numfunc The number of functional annotations.

p. Threshold The p-values threshold to set up the tuning values of the baseline tuning param-

eter.

p.Thresholdpara

When p.Threshold is null, p.Threshold will be generated automatically based on the values of p.Thresholdpara. The default values are  $c(0.5, 10^4, 5)$ , where the first element is the maximum of the p-value threshold, the second element is the minimum, and the third element is total number of p-value thresholds to be

generated from the minimum to the maximum.

taufactor The weights to generate the tuning values for the tuning paramter "tau" and the

default is c(1/25, 1, 10) times the median of the p summation of the coefficients

for each SNP across q traits.

lower and upper bound. The default value is 10.

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subtuning The argument to set up the number of tuning values for lambdas between the

lower and upper bound. The default value is 50.

Lambda\_limit The quantiles to set up the tuning values of lambda. The default value is c(0.5,

0.9).

Lenlam The number of tuning values for lambda parameter without using the Log penalty.

In other words, the initial Lenlam rows of the tuning Matrix are for summay Lasso

single trait analysis.

lambdavec\_func The tuning values for the tuning parameters associated with the functional an-

notations.

lambdavec\_func\_limit\_len

When lambdavec\_func is null, lambdavec\_func will be generated automatically based on the arguments of lambdavec\_func\_limit\_len. The default values are c(1.5, 4). The first element is the maximum of the tuning value and the second element is the total number of the tuning values to be generated from 0 to the

maximum.

dfMax The upper bound of the number of non-zero estimates of coefficients for the

primary trait.

outputAll For internal checking usage. The default value is 0.

warmStart For internal checking usage. The default value is 0.

customed For internal checking usage. The default value is 0.

AllTuningMatrix

For internal checking usage. The default value is NULL.

SDvec The matrix of the standard error for regression coefficients. When the input of

SummaryZ is at Z scale, let SDvec = NULL and it will be computed internally.

IniBeta A binary (0,1) variable to indicate if the regression coefficients need to be ini-

tialized or not. 1 is for yes.

#### Details

Note that the tuning values for the tuning parameters may need to be modified manually when the selected optimal tuning parameters are at the boundary of the inputs.

#### Value

BetaMatrix The output of the coefficients matrix with dimensions (total number of combina-

tions of the tuning values times (pq)). Each column represents the vectorization of the p x q coefficients matrix given a particular combination of the tuning

values (stacking its columns into a column vector).

Numitervec This vector shows the number of iterations to converge for each combination of

the tuning values.

AllTuningMatrix

This matrix shows all combination of tuning values used in the estimation process. Its dimension is that total number of combinations of the tuning values times total number of tuning parameters.

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#### Author(s)

Ting-Huei Chen

#### References

This R packages is based on the method introduced in the manuscript "A comprehensive statistical framework for building polygenic risk prediction models based on summary statistics of genomewide association studies."

# **Examples**

```
data("summaryZ")
data("Nvec")
data("plinkLD")
data("funcIndex")
output = gsfPEN(summaryZ=summaryZ, Nvec=Nvec, plinkLD=plinkLD,funcIndex=funcIndex,
numfunc=ncol(funcIndex))
```

gsPEN

SummaryLasso incorporating multiple traits

# **Description**

SummaryLasso to model pleiotropy by introducing a group-Lasso type penalty, which is sensitive to select SNPs modestly associated with multiple traits.

# Usage

```
gsPEN(summaryZ, Nvec, plinkLD, NumIter = 100, breaking = 1, numChrs = 22, ChrIndexBeta = 0, Init_summaryBetas = 0, Zscale = 1, RupperVal = NULL, tuningMatrix = NULL, penalty = c("mixLOG"), taufactor = c(1/25, 1, 10), llim_length = 10, subtuning = 50, Lambda_limit = c(0.5, 0.9), lenlam_singleTrait = 200, logth{off}{dfMax} = NULL, lniBeta = 0, logth{off}{inverseTuning} = 0, logth{off}{outputAll} = 0, logth{outputAll} = 0, logth{off}{outputAll} = 0, logth{outputAll} = 0, logth{off}{outputAll} = 0, logth{outputAll} = 0, logth{off}{outputAll} = 0, logth{outputAll} = 0, logth{off}{outputAll} = 0, logth{outputAll} = 0, logth{off}{outputAll} = 0, logth{outputAll} = 0, logth{off}{outputAll} = 0, l
```

# **Arguments**

summaryZ	The Z statistics of p SNPs from q GWA studies. A matrix with dimension p x q for p SNPs and q traits. The first column corresponds to the primary trait and the rest columns correspond to the secondary traits.
Nvec	A vector of length q for the sample sizes of q GWA studies.
plinkLD	.ld file of the LD calculation from plink.
NumIter	The number of maximum iteraions for the estimation procedure.
breaking	A binary (0,1) variable to check if there are some certain estimates of coefficients to diverge during the iterations. This may happen when the signs of the correlation coefficients were estimated incorrectly. The default value is 1.

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numChrs The number of chromosomes used in the analysis. Current version of pacakge

does not use this argument.

ChrIndexBeta The chromosome index for each SNP. Current version of pacakge does not use

this argument.

Init\_summaryBetas

Can be used to set the initial values of the coefficients for the iterative estimation.

Zscale A binary (0,1) variable to make the coefficients from different GWA studies with

unequal sample sizes comparable. The default value is 1.

RupperVal The maximum tolerable magnitude of the estimates of coefficients during the it-

erations. This is to avoid a certain estimates of coefficients to diverge during the iterations. This may happen when the signs of the correlation coefficients were estimated incorrectly. The default value is 50 times the maximum of coefficients

from the input in absolute values.

tuningMatrix Inputs for the tuning values of the tuning parameters. Default is null and it will

be generated automatically.

penalty Current version of pacakge does not use this argument.

taufactor The weights to generate the tuning values for the tuning paramter "tau" and the

default is c(1/25, 1, 10) times the median of the p summation of the coefficients

for each SNP across q traits.

11im\_length The argument to set up the number of tuning values for lambdas between the

lower and upper bound. The default value is 10.

subtuning The argument to set up the number of tuning values for lambdas between the

lower and upper bound. The default value is 50.

Lambda\_limit The quantiles to set up the tuning values of lambda. The default value is c(0.5,

0.9).

Lenlam\_singleTrait

The quantiles to set up the tuning values of lambda for single trait analysis.

dfMax The upper bound of the number of non-zero estimates of coefficients for the

primary trait.

IniBeta A binary (0,1) variable to indicate if the regression coefficients need to be ini-

tialized or not. 1 is for yes.

inverseTuning For internal checking usage. The default value is 0.

outputAll For internal checking usage. The default value is 0.

warmStart For analysis with single trait or multiple traits without functional annotations, it

is recommended to use warmStart = 1 to enhance computations.

#### **Details**

Note that the tuning values for the tuning parameters may need to be modified manually when the selected optimal tuning parameters are at the boundary of the inputs.

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#### Value

BetaMatrix The output of the coefficients matrix with dimensions (total number of combina-

tions of the tuning values times (pq)). Each column represents the vectorization of the p x q coefficients matrix given a particular combination of the tuning

values (stacking its columns into a column vector).

Numitervec This vector shows the number of iterations to converge for each combination of

the tuning values.

AllTuningMatrix

This matrix shows all combination of tuning values used in the estimation process. Its dimension is that total number of combinations of the tuning values

times total number of tuning parameters.

#### Author(s)

Ting-Huei Chen

#### References

This R packages is based on the method introduced in the manuscript "A comprehensive statistical framework for building polygenic risk prediction models based on summary statistics of genomewide association studies."

### **Examples**

```
data("summaryZ")
data("Nvec")
data("plinkLD")
output = gsPEN(summaryZ=summaryZ, Nvec=Nvec, plinkLD=plinkLD)
```

Nvec

A vector of sample sizes for the q traits of the summaryZ.

# **Description**

A vector of q sample sizes for the q set of Z statistics corresponding to the q columns of summaryZ.

#### Usage

data(Nvec)

#### **Format**

A vector with q elements, where q is the number of columns of summaryZ.

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plinkLD

The LD info from output of the software (plink)

### Description

The LD information is crucial for the analysis by SummaryLasso. The reference alleles used to obtained for the Z statistics or the regression coefficients have to be the sames as those used for the LD calculation. This file can be obtained directly from the output of the LD calculation by the software (plink); for example the output can be like plink.ld. On the other hand, the user can calculate the LD based on their prefered tools. The variables are as follows:

- CHR\_A: The chromosome of SNP\_A
- BP\_A: The positions of SNP\_A
- SNP\_A: The names of SNP\_A
- CHR\_B: The chromosome of SNP\_B
- BP\_B: The positions of SNP\_B
- SNP\_B: The names of SNP\_B
- R: The correlation between SNP\_A and SNP\_B

#### Usage

data(plinkLD)

#### **Format**

A data frame with 205959 rows and 7 columns

### References

• Purcell S, et al. (2007) PLINK: a toolset for whole-genome association and population-based linkage analysis. *American Journal of Human Genetics*, **81**.

summaryZ

The Z statistics from the univariate analysis of the association between 3614 SNPs and three traits respectively.

### Description

These Z statsitics are obtained from simulated datasets. The variables are as follows:

- Z1: The Z statistics from trait 1; the primary trait.
- Z2: The Z statistics from trait 2; the secondary trait.
- Z2: The Z statistics from trait 3; the secondary trait.

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# Usage

data(summaryZ)

# **Format**

A matrix with 3614 rows for the 3614 SNPs and 3 columns for 3 traits.

# **Index**

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