

Package ‘cghFLasso’

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CGH

Example CGH Array Data

Description

A list of four components (an example CGH array data for package cghFLasso)

Usage

```
data(CGH)
```

Format

Both NormalArray and DiseaseArray are numeric matrix of 2270 rows and 3 columns: each row corresponds to one gene/clone, and each column corresponds to one CGH array. The value of each entry is the log fluorescence ratio resulted from the CGH experiment. The order of the genes/clones in the rows is the same as the order of the genes/clones on the genome. chromosome and nucposition provide chromosome number and nucleotide position for each gene/clone. \GBM.y is a numeric vector of length 990, providing CGH measurement of one pseudo chromosome.

References

P. Wang, Y. Kim, J. Pollack, B. Narasimhan and R. Tibshirani, "A method for calling gains and losses in array CGH data", *Biostatistics* 2005, 6: 45-58, available at <http://www-stat.stanford.edu/~wp57/CGH-Miner/>

R. Tibshirani and P. Wang (2007) 'Spatial smoothing and hot spot detection using the Fused Lasso', *Biostatistics* (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.

cghFLasso

A function to call alteration for CGH arrays using the fused lasso regression

Description

A function to call alteration for CGH arrays using the fused lasso regression

Usage

```
cghFLasso(CGH.Array, chromosome=NULL, nucleotide.position=NULL, FL.norm=NULL, FDR=NULL, filter=NULL,
```

Arguments

| | |
|---------------------|--|
| CGH.Array | numeric vector or matrix. It's the result of one or multiple CGH experiments. Each column is the log ₂ ratios returned from one array experiment and is ordered according to the gene/clones' position on the genome. Missing value should be coded as NA. |
| chromosome | numeric vector. Length should be the same as the row number of CGH.Array. It's the chromosome number of each gene/clone. If no value is specified, the arrays will be treated as one chromosome. |
| nucleotide.position | numeric vector. Length should be the same as the row number of CGH.Array. It's the nucleotide position of each gene/clone. This information is used mainly for plot. If no value is specified, the program will make genes/clones equally spaced on the genome. |
| FL.norm | numeric vector or matrix. Smoothed result of the reference arrays. Set to NULL (default) if the reference arrays are not available. |
| FDR | numeric value (between 0 and 1). User can use this option to control False Discovery Rate of the results. If not specified, the function will return the raw output of fused lasso regression on the target array. |
| filter | numeric vector. Length should be the same as the row number of CGH.Array. Each element takes value 1 or 0. Value 1 means that the corresponding gene/clone will be filter away in ahead of the analysis. If no filter is specified, the program will process all the genes/clones in the input arrays. |
| missing.Plugin | Bollen value. If its value is TRUE, the missing values will be replaced with local averages. |
| smooth.size | numeric value, specifying the window size for carrying out the local average. The average is used only to replace the missing values. |

Details

cghFLasso calls copy number alterations for CGH arrays using the fused lasso regression. The dynamic programming algorithm developed by N.A.Johnson is used for the model fitting.

Value

| | |
|---------------------------------|---|
| | an object of class cghFLasso with components |
| Esti.CopyN | data matrix reporting the estimated DNA copy numbers for selected genes/clones of all the samples. |
| CGH.Array | data matrix reporting the raw CGH array measurements for selected genes/clones of all the samples. |
| chromosome, nucleotide.position | numeric vectors reporting the chromosome numbers and the nucleotide positions of selected genes/clones. If filter=NULL, these are the same as the input chromosome and nucleotide.position. |
| FDR | fdr value specified by the user. |

Author(s)

N. A. Johnson, R. Tibshirani and P. Wang

References

- R. Tibshirani, M. Saunders, S. Rosset, J. Zhu and K. Knight (2004) 'Sparsity and smoothness via the fused lasso', J. Royal. Statist. Soc. B. (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.
- P. Wang, Y. Kim, J. Pollack, B. Narasimhan and R. Tibshirani (2005) 'A method for calling gains and losses in array CGH data', Biostatistics 2005, 6: 45-58, available at <http://www-stat.stanford.edu/~wp57/CGH-Miner/>
- R. Tibshirani and P. Wang (2007) 'Spatial smoothing and hot spot detection using the Fused Lasso', Biostatistics (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.
- J. Friedman, T. Hastie. R. Tibshirani (2007) 'Pathwise coordinate optimization and the fused lasso'.

Examples

```
library(cghFLasso)
data(CGH)

#####
### Example 1: Process one chromosome vector without using normal references.

CGH.FL.obj1<-cghFLasso(CGH$GBM.y)
plot(CGH.FL.obj1, index=1, type="Lines")

#####
### Example 2: Process a group of CGH arrays and use normal reference arrays.

Normal.FL<-cghFLasso.ref(CGH$NormalArray, chromosome=CGH$chromosome)
Disease.FL<-cghFLasso(CGH$DiseaseArray, chromosome=CGH$chromosome, nucleotide.position=CGH$nucposition, FL.normal=Normal.FL)

### Plot for the first arrays
i<-1
plot(Disease.FL, index=i, type="Single")
title(main=paste("Plot for the ", i, "th BAC array", sep=""))

### Consensus plot
plot(Disease.FL, index=1:4, type="Consensus")
title(main="Consensus Plot for 4 BAC arrays")

### Plot all arrays
plot(Disease.FL, index=1:4, type="All")
title(main="Plot for all 4 arrays")

### Report and output
report<-summary(Disease.FL, index=1:4)
print(report)
output.cghFLasso(report, file="CGH.FL.output.txt")
```

| | |
|---------------|--|
| cghFLasso.ref | <i>A function to process reference CGH arrays using the fused lasso regression</i> |
|---------------|--|

Description

A function to process reference CGH arrays using the fused lasso regression

Usage

```
cghFLasso.ref(CGH.Array, chromosome=NULL, filter=NULL)
```

Arguments

| | |
|------------|--|
| CGH.Array | numeric vector or matrix. It's the result of one or mutiiple CGH experiments. Each column is the log2 ratios returned from one array experiment and is ordered according to the gene/clones' position on the genome. Missing value should be coded as NA. |
| chromosome | numeric vector. Length should be the same as the row number of CGH.Array. It's the chromosome number of each gene/clone. If no value is specified, the arrays will be treated as one chromosome. |
| filter | numeric vector. Length should be the same as the row number of CGH.Array. Each element takes value 1 or 0. Value 1 means that the corresponding gene/clone will be filter away in ahead of the analysis. If no filter is specified, the program will process all the genes/clones in the input arrays. |

Details

cghFLasso.ref fits fused lasso regression on reference CGH arrays . The dynamic programming algorithm developed by N.A.Johnson is used for the model fitting.

Value

numeric matrix representing the smoothed result of the reference arrays.

Author(s)

N. A. Johnson, R. Tibshirani and P. Wang

References

- R. Tibshirani, M. Saunders, S. Rosset, J. Zhu and K. Knight (2004) 'Sparsity and smoothness via the fused lasso', J. Royal. Statist. Soc. B. (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.
- P. Wang, Y. Kim, J. Pollack, B. Narasimhan and R. Tibshirani (2005) 'A method for calling gains and losses in array CGH data', Biostatistics 2005, 6: 45-58, available at <http://www-stat.stanford.edu/~wp57/CGH-Miner/>
- R. Tibshirani and P. Wang (2007) 'Spatial smoothing and hot spot detection using the Fused Lasso', Biostatistics (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.
- J. Friedman, T. Hastie. R. Tibshirani (2007) 'Pathwise coordinate optimization and the fused lasso'.

Examples

```

library(cghFLasso)
data(CGH)

#####
### Example 1: Process one chromosome vector without using normal references.

CGH.FL.obj1<-cghFLasso(CGH$GBM.y)
plot(CGH.FL.obj1, index=1, type="Lines")

#####
### Example 2: Process a group of CGH arrays and use normal reference arrays.

Normal.FL<-cghFLasso.ref(CGH$NormalArray, chromosome=CGH$chromosome)
Disease.FL<-cghFLasso(CGH$DiseaseArray, chromosome=CGH$chromosome, nucleotide.position=CGH$nucposition, FL.norm

### Plot for the first arrays
i<-1
plot(Disease.FL, index=i, type="Single")
title(main=paste("Plot for the ", i ,"th BAC array", sep=""))

### Consensus plot
plot(Disease.FL, index=1:4, type="Consensus")
title(main="Consensus Plot for 4 BAC arrays")

### Plot all arrays
plot(Disease.FL, index=1:4, type="All")
title(main="Plot for all 4 arrays")

### Report and output
report<-summary(Disease.FL, index=1:4)
print(report)
output.cghFLasso(report, file="CGH.FL.output.txt")

```

output.cghFLasso *Output gain/loss calls by cghFLasso*

Description

Output gain/loss calls by cghFLasso.

Usage

```
output.cghFLasso(summary.obj, file, gene.info=NULL)
```

Arguments

summary.obj an object of class summary.cghFLasso, usually, a result of a call to summary.cghFLasso.
file a character specifying the file name to output the data.
gene.info matrix. Additional gene/clone annotation to output.

Details

Output gain/loss calls by cghFLasso.

Value

No return value.

Author(s)

N. A. Johnson, R. Tibshirani and P. Wang

References

- R. Tibshirani, M. Saunders, S. Rosset, J. Zhu and K. Knight (2004) 'Sparsity and smoothness via the fused lasso', J. Royal. Statist. Soc. B. (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.
- P. Wang, Y. Kim, J. Pollack, B. Narasimhan and R. Tibshirani (2005) 'A method for calling gains and losses in array CGH data', Biostatistics 2005, 6: 45-58, available at <http://www-stat.stanford.edu/~wp57/CGH-Miner/>
- R. Tibshirani and P. Wang (2007) 'Spatial smoothing and hot spot detection using the Fused Lasso', Biostatistics (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.
- J. Friedman, T. Hastie. R. Tibshirani (2007) 'Pathwise coordinate optimization and the fused lasso'.

Examples

```

library(cghFLasso)
data(CGH)

#####
### Example 1: Process one chromosome vector without using normal references.

CGH.FL.obj1<-cghFLasso(CGH$GBM.y)
plot(CGH.FL.obj1, index=1, type="Lines")

#####
### Example 2: Process a group of CGH arrays and use normal reference arrays.

Normal.FL<-cghFLasso.ref(CGH$NormalArray, chromosome=CGH$chromosome)
Disease.FL<-cghFLasso(CGH$DiseaseArray, chromosome=CGH$chromosome, nucleotide.position=CGH$nucposition, FL.norm

### Plot for the first arrays
i<-1
plot(Disease.FL, index=i, type="Single")
title(main=paste("Plot for the ", i ,"th BAC array", sep=""))

### Consensus plot
plot(Disease.FL, index=1:4, type="Consensus")
title(main="Consensus Plot for 4 BAC arrays")

### Plot all arrays
plot(Disease.FL, index=1:4, type="All")
title(main="Plot for all 4 arrays")

### Report and output
report<-summary(Disease.FL, index=1:4)
print(report)
output.cghFLasso(report, file="CGH.FL.output.txt")

```

plot.cghFLasso

A function to plot gain/loss calls on CGH arrays

Description

A function to plot gain/loss calls on CGH arrays

Usage

```
plot.cghFLasso(x, index, type="All", centro=NULL, ...)
```


Arguments

| | |
|--------|---|
| x | an object of class cghFLasso (returned by function cghFLasso). |
| index | numeric vector specifying which arrays to plot. |
| type | a character specifying the plot type. It should be one of "Lines", "Single", "Consensus", or "All". See details for more information. |
| centro | numeric vector specifying the centromere positions. If missing, the default centromere value of human genome will be used. |
| ... | further arguments passed to or from other methods. |

Details

plot.cghFLasso provides several summary plots for cghFLasso result object. If type="Lines", it plots the raw CGH measurements and the gain/loss results for the one selected array along the genome (no separation of chromosomes). If type="Single", it plots the raw CGH measurements and the gain/loss results for the one selected array along the genome (different chromosomes are plotted in different lines). If type="Consensus", it plots the percentages of the gain/loss calls across a group of samples along the genome. If type="All", it plots the results of all selected arrays in one figure.

Value

It returns the type of the plot.

Author(s)

N. A. Johnson, R. Tibshirani and P. Wang

References

- R. Tibshirani, M. Saunders, S. Rosset, J. Zhu and K. Knight (2004) 'Sparsity and smoothness via the fused lasso', *J. Royal. Statist. Soc. B.* (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.
- P. Wang, Y. Kim, J. Pollack, B. Narasimhan and R. Tibshirani (2005) 'A method for calling gains and losses in array CGH data', *Biostatistics* 2005, 6: 45-58, available at <http://www-stat.stanford.edu/~wp57/CGH-Miner/>
- R. Tibshirani and P. Wang (2007) 'Spatial smoothing and hot spot detection using the Fused Lasso', *Biostatistics* (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.
- J. Friedman, T. Hastie, R. Tibshirani (2007) 'Pathwise coordinate optimization and the fused lasso'.

Examples

```
library(cghFLasso)
data(CGH)

#####
### Example 1: Process one chromosome vector without using normal references.
```

```

CGH.FL.obj1<-cghFLasso(CGH$GBM.y)
plot(CGH.FL.obj1, index=1, type="Lines")

#####
### Example 2: Process a group of CGH arrays and use normal reference arrays.

Normal.FL<-cghFLasso.ref(CGH$NormalArray, chromosome=CGH$chromosome)
Disease.FL<-cghFLasso(CGH$DiseaseArray, chromosome=CGH$chromosome, nucleotide.position=CGH$nucposition, FL.normal=Normal.FL)

### Plot for the first arrays
i<-1
plot(Disease.FL, index=i, type="Single")
title(main=paste("Plot for the ", i, "th BAC array", sep=""))

### Consensus plot
plot(Disease.FL, index=1:4, type="Consensus")
title(main="Consensus Plot for 4 BAC arrays")

### Plot all arrays
plot(Disease.FL, index=1:4, type="All")
title(main="Plot for all 4 arrays")

### Report and output
report<-summary(Disease.FL, index=1:4)
print(report)
output.cghFLasso(report, file="CGH.FL.output.txt")

```

summary.cghFLasso *Summarizing gain/loss calls by cghFLasso*

Description

'summary' method for class cghFLasso.

Usage

```
summary.cghFLasso(object, index, ...)
print.summary.cghFLasso(x, ...)
```

Arguments

| | |
|--------|---|
| object | an object of class cghFLasso (returned by function cghFLasso). |
| index | numeric vector specifying which arrays to plot. |
| x | an object of class summary.cghFLasso, usually, a result of a call to summary.cghFLasso. |
| ... | further arguments passed to or from other methods. |

Details

summary.cghFLasso summarize the gain/loss calls for a group of CGH arrays. It reports the consensus counts of alterations as well as the corresponding FDRs for each gene/clones. It also returns the sample percentage of amplification and deletion at each gene/clones.

print.summary.cghFLasso outputs a matrix summarizing the gain/loss calls across all the samples for each chromosome. It returns the maximum sample percentage of amplification and deletion on each chromosome respectively. It also reports the genome percentage of alteration for each chromosome (proportion of genes having consensus FDR smaller than 0.05 on the chromosome).

Value

ans<-list(ConsensusCount=ConsensusCount, CC.FDR=CC.FDR, Amp.ConCount=Amp.CC, Del.ConCount=Del.CC, chrom.summary=chrom.summary, sample.summary=sample.summary, Esti.copy=Esti.copy, chromosome=chromosome, nucposi=nucposi)

| | |
|----------------|---|
| ConsensusCount | numeric vector with the same length as each CGH array. It reports the number of samples showing copy number alteration at each gene/clones |
| CC.FDR | numeric vector of the same length of ConsensusCount. It is the estimated probability of observing the same or higher consensus count by random chance. |
| Amp.ConCount | numeric vector of the same length of ConsensusCount. It reports the number of samples showing amplification at each gene/clones. |
| Del.ConCount | numeric vector of the same length of ConsensusCount. It reports the number of samples showing deletion at each gene/clones. |
| chrom.summary | matrix with four columns. The first column is the chromosome number. The second and third columns are the maximum sample percentages of amplifications and deletions on each chromosome respectively. The fourth column represents the genome percentage of alterations on each chromosome. |
| sample.summary | numeric vector with the same length of sample numbers. It reports the overall alteration percentage of each sample. |
| Esti.copy | numeric matrix showing estimated copy numbers of all genes/clones of all samples. |
| chromosome | numeric vector with the same length as each CGH array. It's the chromosome number of each gene/clone. |
| nucposi | numeric vector with the same length as each CGH array. It's the nucleotide position of each gene/clone. |

Author(s)

N. A. Johnson, R. Tibshirani and P. Wang

References

- R. Tibshirani, M. Saunders, S. Rosset, J. Zhu and K. Knight (2004) 'Sparsity and smoothness via the fused lasso', *J. Royal. Statist. Soc. B.* (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.
- P. Wang, Y. Kim, J. Pollack, B. Narasimhan and R. Tibshirani (2005) 'A method for calling gains and losses in array CGH data', *Biostatistics* 2005, 6: 45-58, available at <http://www-stat.stanford.edu/~wp57/CGH-Miner/>

R. Tibshirani and P. Wang (2007) 'Spatial smoothing and hot spot detection using the Fused Lasso', Biostatistics (In press), available at <http://www-stat.stanford.edu/~tibs/research.html>.

J. Friedman, T. Hastie. R. Tibshirani (2007) 'Pathwise coordinate optimization and the fused lasso'.

Examples

```
library(cghFLasso)
data(CGH)

#####
### Example 1: Process one chromosome vector without using normal references.

CGH.FL.obj1<-cghFLasso(CGH$GBM.y)
plot(CGH.FL.obj1, index=1, type="Lines")

#####
### Example 2: Process a group of CGH arrays and use normal reference arrays.

Normal.FL<-cghFLasso.ref(CGH$NormalArray, chromosome=CGH$chromosome)
Disease.FL<-cghFLasso(CGH$DiseaseArray, chromosome=CGH$chromosome, nucleotide.position=CGH$nucposition, FL.norm

### Plot for the first arrays
i<-1
plot(Disease.FL, index=i, type="Single")
title(main=paste("Plot for the ", i ,"th BAC array", sep=""))

### Consensus plot
plot(Disease.FL, index=1:4, type="Consensus")
title(main="Consensus Plot for 4 BAC arrays")

### Plot all arrays
plot(Disease.FL, index=1:4, type="All")
title(main="Plot for all 4 arrays")

### Report and output
report<-summary(Disease.FL, index=1:4)
print(report)
output.cghFLasso(report, file="CGH.FL.output.txt")
```

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