# Package 'snapCGH'

# April 15, 2017

Title Segmentation, normalisation and processing of aCGH data.

**Version** 1.44.0 **Date** 2009-10-08

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<b>Description</b> Methods for segmenting, normalising and processing aCGH data; including plotting functions for visualising raw and segmented data for individual and multiple arrays.
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<b>Depends</b> limma, DNAcopy, methods
Imports aCGH, cluster, DNAcopy, GLAD, graphics, grDevices, limma, methods, stats, tilingArray, utils
License GPL
biocViews Microarray, CopyNumberVariation, TwoChannel, Preprocessing
NeedsCompilation yes
R topics documented:
cbind       chrominfo.Mb         compareSegmentations       convert.output         dim       dim         dimnames       filterClones         find.param.five       find.param.four         find.param.one       find.param.three         find.param.two       10         findBreakPoints       1         fit.model       1         genomePlot       1         heatmapGenome       1

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cbind

Combine SegList Objects

# Description

Combine a series of SegList objects.

# Usage

```
## S3 method for class 'SegList'
cbind(..., deparse.level=1)
```

# **Arguments**

```
... SegList objects
deparse.level not currently used, see cbind in the base package
```

chrominfo.Mb 3

#### **Details**

cbind combines data objects assuming the same gene lists but different arrays.

For cbind, the matrices of expression data from the individual objects are cbinded. The data.frames of target information, if they exist, are rbinded. The combined data object will preserve any additional components or attributes found in the first object to be combined. It is not recommend to use the is rbind function for the SegList object. This is because it would require SegLists with mutually exclusive chromosomes or would result in combining multiple different segmentations for the same chromosome, which is pointless. If rbind is required perform it on an MAList and then segment it. It is currently only included as an internal function called within other library functions.

#### Value

An SegList object holding data from all the arrays and all genes from the individual objects.

#### Author(s)

Gordon Smyth, modified by Mike Smith for SegList object

#### See Also

cbind in the base package.

chrominfo.Mb

Basic Chromosomal Information for UCSC Human Genome Assembly July 2003 freeze

## **Description**

This dataset contains basic chromosomal information for UCSC Human Genome Assembly July 2003 freeze.

#### Usage

chrominfo.basepair

#### **Format**

A data frame with 24 observations on the following 3 variables.

**chrom** Chromosomal index, X is coded as 23 and Y as 24.

length Length of each chromosome in megabases.

**centromere** Location of the centromere on the chromosome (Mb).

#### **Details**

This file is used for many plotting functions. The centromeric location is approximately estimated by taking mid-point between the last fish-mapped clone on the p-arm and the first fish-mapped clone on the q-arm using relevant UCSC freeze. For an alternative freeze, one needs to manually create a 3-column file of the format described above.

## Source

http://genome.ucsc.edu/cgi-bin/hgText

4 convert.output

compareSegmentations Function for comparing segmentation methods to a known truth

#### **Description**

This function takes a SegList and compares the breakpoints indicated in other SegLists with this original one.

## Usage

```
compareSegmentations(TrueSeg,offset = 0,...)
```

## **Arguments**

TrueSeg	An object of class SegList which is scored against. Normally the output from simulateData.
offset	Integer value between 0 and 2 specifying how close (in number of clones) to a true breakpoint the segmentation method must be before it is scored.
	One or more objects of class SegList. These are compared to TrueSeg.

## Value

The method returns a list containing two matrices. The first of these, \\$TPR, contains the true positive rate, whilst the second, \\$FDR, holds the false discovery rate. Both of these matrices are arranged such that a row represents a segmentation method and each column is an array.

#### Author(s)

John Marioni and Mike Smith

convert.output	Converts the output from the simulation to a format which can be used
	by segmentation schemes available within R

## **Description**

This function converts the output obtained by applying our simulation scheme into a format that can be used (either directly or indirectly) as the input to various segmentation schemes available within R. Additionally, we are in the process of submitting a library to CRAN which will enable the user to apply a number of the segmentation schemes available within R to datasets which have the same structure as that generated by this function.

## Usage

```
convert.output(input)
```

#### **Arguments**

input The output obtained upon applying the sim.structure function

dim 5

#### **Details**

This function outputs an object which is similar in structure/format to an RG or MA object used in Limma.

#### Value

This function outputs a list with entries

M A matrix containing the  $\log_2$  ratios

genes A matrix containing the simulated midpoints and the chromosome which forms

the template upon which the simulation is based.

#### Author(s)

Michael Smith, John Marioni

## **Examples**

```
## The function is currently defined as
function(input){
  holder <- list()</pre>
  for (i in 1:length(input)){
  holder[[i]] <- list()}</pre>
  for(i in 1:length(input)){
    holder[[i]]$genes <- matrix(NA, nrow = length(input[[i]]$clones$mid.point),</pre>
                                   ncol = 2)
  for(i in 1:length(input)){
    holder[[i]]$M <- as.matrix(input[[i]]$datamatrix)</pre>
    holder[[i]]$genes[,1] <- input[[i]]$clones$mid.point</pre>
    holder[[i]]$genes[,2] <- rep(input[[i]]$chrom,length(input[[i]]$clones$mid.point))</pre>
    colnames(holder[[i]]$genes) <- c("kb", "Chrom")</pre>
    holder[[i]] <- new("aCGHList", holder[[i]])</pre>
  }
  holder
  }
```

dim

Retrieve the Dimensions of an RGList, MAList or SegList Object

## **Description**

Retrieve the number of rows (genes) and columns (arrays) for an RGList, MAList or SegList object.

an object of class RGList, MAList or SegList

## Usage

```
## S3 method for class 'SegList'
dim(x)
## S3 method for class 'SegList'
length(x)
```

# Arguments x

6 dimnames

#### **Details**

Microarray data objects share many analogies with ordinary matrices in which the rows correspond to spots or genes and the columns to arrays. These methods allow one to extract the size of microarray data objects in the same way that one would do for ordinary matrices.

A consequence is that row and column commands nrow(x), ncol(x) and so on also work.

## Value

Numeric vector of length 2. The first element is the number of rows (genes) and the second is the number of columns (arrays).

#### Author(s)

Gordon Smyth, modified by Mike Smith for SegList object

#### See Also

dim in the base package.

#### **Examples**

```
M <- A <- matrix(11:14,4,2)
rownames(M) <- rownames(A) <- c("a","b","c","d")
colnames(M) <- colnames(A) <- c("A1","A2")
MA <- new("MAList",list(M=M,A=A))
dim(M)
ncol(M)
nrow(M)
length(M)</pre>
```

dimnames

Retrieve the Dimension Names of an RGList, MAList or SegList Object

## **Description**

Retrieve the dimension names of a microarray data object.

#### Usage

```
## S3 method for class 'SegList'
dimnames(x)
```

# Arguments

Х

An object of class SegList

#### **Details**

The dimension names of an microarray object are the same as those of the most important matrix component of that object.

A consequence is that rownames and colnames will work as expected.

filterClones 7

#### Value

Either NULL or a list of length 2. If a list, its components are either 'NULL' or a character vector the length of the appropriate dimension of x.

## Author(s)

Gordon Smyth, edited by Mike Smith

## See Also

dimnames in the base package.

filterClones

Filter clones from sample

## Description

Function for filtering clones via a user defined function.

## Usage

```
filterClones(MA, filterFunc, ...)
```

# Arguments

MA An object of class MAList

filterFunc A user specified function that accepts an MAList and returns the indices of the

clones to be removed.

... Additional arguments to be passed to the filter function.

## **Details**

Any clones identified by the filter function are turned into NA's. These are then removed or imputed within the processCGH function.

## Author(s)

Mike Smith

8 find.param.four

find.param.five	Yields the output in a model with five underlying states

## **Description**

This function is a workhorse of the process.data function. It outputs state means/variances and transitions matrices in the model with five states.

## Usage

```
find.param.five(output.optim, var.fixed)
```

## **Arguments**

output.optim output of the optimisation with 5 underlying states

var.fixed Logical variable - TRUE if you want to fix the variance to be the same across

states

#### Value

Outputs the mean/variance, transition matrix, maximised likelihood and convergence information

## Author(s)

John Marioni

find.param.four	Yields output when there are 4 underlying states

## **Description**

This function provides the output (means/variances, transition matrix, likelihood) when the heterogeneous HMM is fitted with four underlying states. It is a workhorse of the process.data function.

## Usage

```
find.param.four(output.optim,var.fixed)
```

## **Arguments**

output.optim The output from fitting a heterogeneous HMM when there are four underlying

states

var.fixed Logical variable - TRUE if you want the variance to be tied across states. De-

faults to FALSE

## Value

This function outputs the state means/variances, transition matrices, rate parameters, maximised likelihood and convergence information provided by fitting a heterogeneous HMM with four underlying states.

find.param.one

#### Author(s)

John Marioni

find.param.one	Yields output when there is 1 underlying states

## Description

This function provides the output (means/variances, transition matrix, likelihood) when the heterogeneous HMM is fitted with one underlying state. It is a workhorse of the process.data function.

## Usage

```
find.param.one(output.optim)
```

## Arguments

output.optim The output from fitting a heterogeneous HMM when there is one underlying

#### Value

This function outputs the state means/variances, transition matrices, rate parameters, maximised likelihood and convergence information provided by fitting a heterogeneous HMM with one underlying state.

#### Author(s)

John Marioni

find.param.three Yields output when there are 3 underlying states
---

# Description

This function provides the output (means/variances, transition matrix, likelihood) when the heterogeneous HMM is fitted with three underlying states. It is a workhorse of the process.data function.

## Usage

```
find.param.three(output.optim,var.fixed)
```

#### **Arguments**

output.optim	The output from fitting a heterogeneous HMM when there are four underlying states
var.fixed	Logical variable - TRUE if you want the variances to be tied across states. Defaults to FALSE

10 find.param.two

#### Value

This function outputs the state means/variances, transition matrices, rate parameters, maximised likelihood and convergence information provided by fitting a heterogeneous HMM with three underlying states.

## Author(s)

John Marioni

find.param.two

Yields output when there are 2 underlying states

## **Description**

This function provides the output (means/variances, transition matrix, likelihood) when the heterogeneous HMM is fitted with two underlying states. It is a workhorse of the process.data function.

#### Usage

```
find.param.two(output.optim,var.fixed)
```

# **Arguments**

output.optim 
The output from fitting a heterogeneous HMM when there are two underlying

states

var.fixed Logical variable - TRUE if you want to tie the variance across states. Defaults

to FALSE

## Value

This function outputs the state means/variances, transition matrices, rate parameters, maximised likelihood and convergence information provided by fitting a heterogeneous HMM with two underlying states.

#### Author(s)

John Marioni

findBreakPoints 11

findBreakPoints	Returns the start and end of segments.

#### **Description**

Function to returns the start and end of segments when given a SegList and an array. Currently only used within the plotSegmentedGenome function.

## Usage

```
findBreakPoints(seg, array)
```

## **Arguments**

seg An object of class SegList.

array Numeric value corresponding to a column in seg.

## Author(s)

Mike Smith

fit.model	Fitting a heterogeneous HMM to the log2 ratios on a particular chro-
	mosome.

## Description

This function fits five homogeneous HMMs to the log2 ratios on a particular chromosome. It then uses either the AIC or BIC to determine which of the five models is optimal before using a scaled version of the Viterbi algorithm to assign clones to states with the same underlying copy number.

# Usage

```
fit.model(sample, chrom, dat, datainfo = clones.info, useCloneDists = TRUE, covariates,
aic = TRUE, bic = FALSE, delta = 1, var.fixed=FALSE, epsilon = 1e-06,
numiter = 30000)
```

# Arguments

sample	If there are multiple samples, the number of the sample to be segmented
chrom	The chromosome on which the segmentation is to be carried out on
dat	The log2 ratios obtained from the clones located on that chromosome
datainfo	A dataframe containing information about the clones on that chromosome (

A dataframe containing information about the clones on that chromosome (name,

chromosome and location (in Mbs))

 ${\tt useCloneDists} \quad Boolean \ stating \ whether \ the \ distance \ between \ clones \ should \ be \ incorportated$ 

into the HMM. If false then the HMM become homogeneous.

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covariates	A matrix containing the covariate information for the clones located on the chromosome to be segmented. It should have length one less than the number of clones as covariate information is not used when segmenting the first clone on the chromosome.
aic	Set to true if you want to use the aic. This is the default. Only one of aic and bic should be set to true.
bic	Set to true if you want to use the bic.
delta	A parameter to be set if you want to use the BIC
var.fixed	Logical variable - TRUE if you want to tie the variance to be the same across all states. Defaults to FALSE
epsilon	
numiter	Number of iterations to be used in the optimization algorithm.

#### Value

The output is in the same format as that obtained when the nlm function is applied.

## Author(s)

John Marioni and Mike Smith

## Description

Basic plot of the log2 ratios for each array ordered along the genome.

## Usage

## Arguments

input	an object of class MAList or SegList
array	integer of the array (sample) to be plotted.
naut	number of autosomes in the organism
Υ	TRUE if chromosome Y is to be plotted, FALSE otherwise
Χ	TRUE if chromosome X is to be plotted, FALSE otherwise
main	Provides the title of the plot
status	character vector giving the control status of each spot on the array, of same length as the number of rows of log2ratios(input). If omitted, all points are plotted in the default color, symbol and size.
values	character vector giving values of status to be highlighted on the plot. Defaults to unique values of status. Ignored if there is no status vector.

heatmapGenome 13

pch	vector or list of plotting characters. Default to integer code 16. Ignored is there is no status vector.
col	numeric or character vector of colors, of the same length as values. Defaults to 1:length(values). Ignored if there is no status vector.
cex	numeric vector of plot symbol expansions, of the same length as values. Defaults to $0.2$ for the most common status value and 1 for the others. Ignored if there is no status vector.
chrominfo	a chromosomal information associated with the mapping of the data.
ylim	Minimum y-scale to use for plotting.
chrom.to.plot	Specify which chromosome to plot
ylb	label for the Y-axis.
xlim	limits for the x-axis
	Any other parameters

## **Details**

The status vector is intended to specify the control status of each spot, for example "gene", "ratio control", "house keeping gene", "buffer" and so on. The vector is usually computed using the function controlStatus and a spot-types file. However the function may be used to highlight any subset of spots.

## Author(s)

John Marioni

#### See Also

MAList SegList

|--|

# Description

This function clusters samples and shows their heatmap

## Usage

14 heatmapGenome

## **Arguments**

input	object of class MAList or SegList
response	phenotype of interest. defaults to the same phenotype assigned to all samples
chrominfo	a chromosomal information associated with the mapping of the data
cutoff	maximum absolute value. all the values are floored to +/-cutoff depending on whether they are positive of negative. defaults to $1$
ncolors	number of colors in the grid. input to maPalette. defaults to 50
lowCol	color for the low (negative) values. input to maPalette. defaults to "red"
highCol	color for the high (positive) values. input to maPalette. defaults to "green"
midCol	color for the values close to 0. input to maPalette. defaults to "black"
byclass	logical indicating whether samples should be clustered within each level of the phenotype or overall. defaults to F
showaber	logical indicating whether high level amplifications and homozygous deletions should be indicated on the plot. defaults to ${\rm F}$
amplif	positive value that all observations equal or exceeding it are marked by yellow dots indicating high-level changes. defaults to 1
homdel	negative value that all observations equal or below it are marked by light blue dots indicating homozygous deletions. defaults to $-0.75$
samplenames	sample names
vecchrom	vector of chromosomal indeces to use for clustering and to display. defaults to 1:23
titles	plot title. defaults to "Image Plots"
methodS	clustering method to cluster samples. defaults to "ward"
categoricalPheno	
	logical indicating whether phenotype is categorical. Continuous phenotypes are treated as "no groups" except that their values are dispalyed.defaults to TRUE.

## **Details**

CENTROMERE

This functions is a more flexible version of the heatmap. It can cluster within levels of categorical phenotype as well as all of the samples while displaying phenotype levels in different colors. It also uses any combination of chromosomes that is requested and clusters samples based on these chromosomes only. It draws the chromosomal boundaries and displays high level changes and homozygous deletions. If phenotype if not categorical, its values may still be displayed but groups are not formed and byclass = F. Image plot has the samples reordered according to clustering order.

logical indicating whether to plot the centromere

## See Also

heatmap

IDProbes 15

IDProbes	Interactive version of genomePlot

# Description

Interactive version of genomePlot. Allows the user to click near a probe and the name of that probe will be displayed next to it.

# Usage

## **Arguments**

input	an object of class MAList or SegList
array	integer of the array (sample) to be plotted.
naut	number of autosomes in the organism
Υ	TRUE if chromosome Y is to be plotted, FALSE otherwise
Χ	TRUE if chromosome X is to be plotted, FALSE otherwise
status	character vector giving the control status of each spot on the array, of same length as the number of rows of log2ratios(input). If omitted, all points are plotted in the default color, symbol and size.
values	character vector giving values of status to be highlighted on the plot. Defaults to unique values of status. Ignored if there is no status vector.
pch	vector or list of plotting characters. Default to integer code 16. Ignored is there is no status vector.
col	numeric or character vector of colors, of the same length as values. Defaults to 1:length(values). Ignored if there is no status vector.
cex	numeric vector of plot symbol expansions, of the same length as values. Defaults to 0.2 for the most common status value and 1 for the others. Ignored if there is no status vector.
chrominfo	a chromosomal information associated with the mapping of the data.
ylim	Minimum y-scale to use for plotting.
chrom.to.plot	Specify which chromosome to plot
ylb	label for the Y-axis.
xlim	limits for the x-axis

## Author(s)

Mike Smith

## See Also

genomePlot

#### **Description**

Imputing log2 ratios

#### Usage

```
imputeMissingValues(seg, chrominfo = chrominfo.Mb, maxChrom =
23, smooth = 0.1)
```

#### **Arguments**

seg Object of class SegList

chrominfo a chromosomal information associated with the mapping of the data

maxChrom Highest chromosome to impute

smooth smoothing parameter for the lowess procedure

#### Details

There are two main reasons to impute data. One is that given that imputation is reasonable, one can increase the analytical power and improve results. Another, more practical, is that at the moment many widely used functions in R do not support missing values. While procedures such as kNN imputations is widely used for gene expression data, it is more powerful to take advantage of the genomic structure of the array CGH data and use a smoother. Note that we perform only one pass of smoothing. If there still remain missing values, they are imputed by the median on the chromosome or chromosomal arm where applicable.

## Value

Computes and returns the imputed log2 ratio matrix of the aCGH object.

## See Also

SegList

 ${\tt Large\,Data\,Object-class} \ \ \textit{Large\,Data\,Object-class}$ 

## **Description**

A virtual class including the data classes RGList, MAList and SegList, all of which typically contain large quantities of numerical data in vector, matrices and data.frames.

## Methods

A show method is defined for objects of class LargeDataObject which uses printHead to print only the leading elements or rows of components or slots which contain large quantities of data.

log2ratios 17

## Author(s)

Gordon Smyth

## **Examples**

# see normalizeBetweenArrays

log2ratios

Extracting log2 ratios

## **Description**

This function extracts the log2 ratios from either an MAList object or a SegList object.

# Usage

log2ratios(x)

## **Arguments**

Х

An object of class MAList or SegList

#### Author(s)

Mike Smith

mergeStates

Function to merge states based on their state means

# Description

mergeStates takes the output of a segmentation algorithm in the form of a SegList and iteratively merges the states with means closer than a supplied threshold.

## Usage

```
mergeStates(segList, MergeType = 1, pv.thres=0.0001, ansari.sign=0.01, minDiff = 0.25)
```

# Arguments

segList	Object of class SegList.
MergeType	Select either 1 or 2. 1 uses a new merging algorithm developed by Hanni Willenbrock and Jane Fridlyand.
pv.thres	Significance threshold for Wilcoxon test for level merging. Used when MergeType = $1$ .
ansari.sign	Significance threshold for Ansari-Bradley test. Used when MergeType = 1.
minDiff	The states whose predicted values are less than minDiff apart are merged into one state and all the predicted values are recomputed. Used when MergeType = 2.

#### **Details**

This function is intended to reduce effect of the possible small magnitude technological artifacts on the structure determination.

#### Value

A SegList object is returned with the merged states stored in the pred list.

#### Author(s)

Jane Fridlyand

#### References

Application of Hidden Markov Models to the analysis of the array CGH data, Fridlyand et.al., *JMVA*, 2004

#### See Also

SegList, runHomHMM, runGLAD, runDNAcopy

```
non.zero.length.distr.non.tiled
```

Empirical distribution of segment lengths in non-tiled regions with copy number gains or losses

# Description

This file contains the empirical distribution of segment lengths (of untiled regions and whose state mean indicates that they correspond to regions of copy number gain or loss) derived by applying the DNAcopy segmentation scheme (Olshen et al., 2004) to an unpublished breast cancer dataset. Instead of using the physical length of the segments we calculate the lengths as a proportion of the length of the untiled region.

# Usage

```
data(non.zero.length.distr.non.tiled)
```

#### Source

The empirical distribution was derived using an unpublished breast cancer dataset.

```
non.zero.length.distr.tiled
```

Empirical distribution of segment lengths in tiled regions with copy number gains or losses

#### **Description**

This file contains the empirical distribution of segment lengths (of tiled regions and whose state mean indicates that they correspond to regions of copy number gain or loss) derived by applying the DNAcopy segmentation scheme (Olshen et al., 2004) to an unpublished breast cancer dataset. Instead of using the physical length of the segments we calculate the lengths as a proportion of the length of the tiled region.

## Usage

```
data(non.zero.length.distr.tiled)
```

## **Source**

The empirical distribution was derived using an unpublished breast cancer dataset.

plotSegmentedGenome

Plots the genome

# Description

Basic plot of the log2 ratios for each array ordered along the genome.

## Usage

## Arguments

• • •	Objects of class SegList
array	integer of the array (sample) to be plotted.
naut	number of autosomes in the organism
Υ	TRUE if chromosome Y is to be plotted, FALSE otherwise
Χ	TRUE if chromosome X is to be plotted, FALSE otherwise
status	character vector giving the control status of each spot on the array, of same length as the number of rows of log2ratios(input). If omitted, all points are plotted in the default color, symbol and size.
values	character vector giving values of status to be highlighted on the plot. Defaults to unique values of status. Ignored if there is no status vector.

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pch vector or list of plotting characters. Default to integer code 16. Ignored is there

is no status vector.

col numeric or character vector of colors, of the same length as values. Defaults to

1:length(values). Ignored if there is no status vector.

cex numeric vector of plot symbol expansions, of the the same length as values.

Defaults to 0.2 for the most common status value and 1 for the others. Ignored

if there is no status vector.

chrominfo a chromosomal information associated with the mapping of the data.

ylim Minimum y-scale to use for plotting. chrom.to.plot Specify which chromosome to plot

ylb label for the Y-axis. xlim limits for the x-axis

colors vector of colors to plot segmented states of each SegList passed to the function.

mark.regions Boolean. If true will colour code the segmentation plot using the informa-

tion stored in \\$regions and generated by bayesCGH::nudSegmentation, or an

equivalent method.

main Specify the title of the plot

#### **Details**

The status vector is intended to specify the control status of each spot, for example "gene", "ratio control", "house keeping gene", "buffer" and so on. The vector is usually computed using the function controlStatus and a spot-types file. However the function may be used to highlight any subset of spots.

#### Author(s)

Mike Smith

#### See Also

genomePlot SegList

#### **Description**

This function takes object of class MAList and it re-orders and filters clones based on their mapping information and proportion missing. It also average duplicated clones and imputes missing values for clones that are still NA after the filtering step. Note that imputation will only take place if duplicated clones are removed.

## Usage

read.clonesinfo 21

#### **Arguments**

input

Object of class MAList or RGList

maxChromThreshold

Chromosomes are ordered and numbered as usual, except for X and Y chromosome, which in for Homo sapiens genome have numbers 23 and 24 respectively, in for Mus musculus 20 and 21, etc. Remove chromosomes from segmentation analysis which are greater than this value.

minChromThreshold

Chromosomes are ordered and numbered as usual, except for X and Y chromosome, which in for Homo sapiens genome have numbers 23 and 24 respectively, in for Mus musculus 20 and 21, etc. Remove chromosomes from segmentation analysis which are lower than this value.

method.of.averaging

If left as the default no combining of replicate spots takes place. Otherwise this should specify a function which takes a vector of duplicates and combines them into a single value.

ID

Name of column in RG\$genes corresponding to the clone names. For most data the default will work, however for affy data the value for ID should be "CloneName"

prop.missing

For each probe the proportion of NA's is calculated, and the probe is kept for further analysis if the proportion of NA's is less than missing.prop

#### Value

Object of class SegList

#### Author(s)

Jane Fridlyand, Peter Dimitrov, John Marioni and Mike Smith

# See Also

MAList

read.clonesinfo

Reading chromsome and positional information about each clone.

#### **Description**

Function to read the chromosomal position information of each clone and incorporate it into the genes data.frame of the relevant object.

## Usage

```
read.clonesinfo(file, RG, path = NULL, sep="\t", quote="\"")
```

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#### **Arguments**

file Name of the file containing the chromosomal information.

RG Object containing a \\$genes data.frame that the information should be incorpo-

rated into.

path Path to the chromosomal information file.

sep Identifying the column seperator in the designated file.

quote Identifying the quotation character used in the designated file.

#### Author(s)

Mike Smith

readPositionalInfo readPositionalInfo

#### **Description**

This function automatically inserts information about the chromosomal positional of a clone into the \\$genes matrix of an RGList or MAList. This information is used in all the available segmentation methods as well as many of the plotting functions available in snapCGH.

#### Usage

readPositionalInfo(input, source, path = NULL)

#### **Arguments**

input An object of class RGList or MAList

source Defines which platform or technology this data was produced on. Currently

supported options are: "aglient", "bluefuse", "nimblegen". This list will be ex-

panded in time.

optional parameter to specify where the original data is stored. Defaults to the

current working directory. This option is only required for reading "bluefuse" data at the moment, as chromosome information isn't read by limma as default.

removeByWeights Remove clones based on a weights matrix

#### **Description**

An example function to be used by the filterClones method. This function takes an MA list, a weights matrix and a threshold and returns the indices of any clones with weight below the threshold.

#### Usage

removeByWeights(MA, weights=MA\$weights, threshold = 0.2)

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#### **Arguments**

MA An object of class MAList

weights A matrix with the same dimensions as MA containing weight information.

threshold Threshold value. Any clones with weight below this are removed.

#### Author(s)

Mike Smith

#### See Also

filterClones

runBioHMM

This function implements the BioHMM

#### **Description**

This function reads in a dataset of log2 ratios and the corresponding clone and covariate information. It calculates a heterogeneous HMM when there are 1,2,3,4 or 5 underlying states and chooses between them using either the AIC or BIC. It then assigns clones using a modified version of the Viterbi algorithm.

## Usage

```
runBioHMM(input, useCloneDists = TRUE, covariates, criteria="AIC", delta=NA
,var.fixed=FALSE, epsilon = 1e-06, numiter = 30000)
```

#### **Arguments**

input An object of class MAListor SegList

useCloneDists Boolean stating whether the distance between clones should be incorportated

into the HMM. If false then the HMM becomes homogeneous.

covariates This is a dataframe containing information about covariate factors. The first two

columns should be Chrom (giving the chromosome on which a clone is located) and Mb (giving the position of the chromosome along a particular chromosome in Megabases). The order should be the same as that described above with the following crucial difference. No covariate information about the first clone is used in the segmentation. Hence, for each chromosome, there should be one less row in the covariate dataframe than in the datainfo dataframe corresponding to this missing chromosome. This is important if the transition matrix is to be

calculated correctly.

criteria Options are AIC or BIC depending upon which we want to use to distinguish

between the number of states

delta A variable to be assigned if the BIC is used.

var.fixed Logical variable - TRUE if you want to tie the variance to be the same across all

states. Defaults to FALSE

epsilon Stopping criterion for the optimization algorithm.

numiter Number of iterations to be used in the optimization algorithm.

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#### Value

The model returns an object of class SegList.

#### Author(s)

John Marioni and Mike Smith

#### References

Marioni, J.C., Thorne, N.P., Tavar\'e, S., BioHMM: a heterogeneous Hidden Markov Model for segmenting array CGH data, submitted

runDNAcopy	Results of segmenting an MAList data object using the DNAcopy library

#### **Description**

The results of segmenting data from copy number array experiments from programs such as circular binary segmentation (CBS). This function requires the library DNAcopy to be loaded.

#### Usage

```
runDNAcopy(input, smooth.region=2, outlier.SD.scale = 4, smooth.SD.scale = 2, trim=0.025, alpha =
   "perm"), kmax = 25, nmin = 200, undo.splits = c("none", "prune", "sdundo"),
   undo.prune = 0.05, undo.SD = 3, nperm = 10000, eta = 0.05)
```

#### Arguments

input An object of class MAList or SegList

smooth.region number of points to consider on the left and the right of a point to detect it as an

outlier.

outlier.SD.scale

the number of SDs away from the nearest point in the smoothing region to call

a point an outlier.

smooth.SD.scale

the number of SDs from the median in the smoothing region where a smoothed

point is positioned.

trim proportion of data to be trimmed for variance calculation for smoothing outliers

and undoing splits based on SD.

alpha significance levels for the test to accept change-points.

p.method method used for p-value computation. For the "perm" method the p-value is

based on full permutation. For the "hybrid" method the maximum over the entire region is split into maximum of max over small segments and max over the rest.

Approximation is used for the larger segment max. Default is hybrid.

kmax the maximum width of smaller segment for permutation in the hybrid method.

nmin the minimum length of data for which the approximation of maximum statistic

is used under the hybrid method.

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undo.splits	A character string specifying how change-points are to be undone, if at all. Default is "none". Other choices are "prune", which uses a sum of squares criterion, and "sdundo", which undoes splits that are not at least this many SDs apart.
undo.prune	the proportional increase in sum of squares allowed when eliminating splits if undo.splits="prune".
undo.SD	the number of SDs between means to keep a split if undo.splits="sdundo".
nperm	number of permutations used for p-value computation.
eta	the probability to declare a change conditioned on the permuted statistic exceeding the observed statistic exactly j (= 1,,nperm*alpha) times.

#### Value

The function returns an object of class SegList

#### Author(s)

Mike Smith, based upon DNAcopy help files written by E. S. Venkatraman and Adam Olshen

#### See Also

segment MAList runHomHMM runGLAD SegList

runGLAD	Results of segmenting an aCGHList data object using the GLAD library

## **Description**

This function allows the detection of breakpoints in genomic profiles obtained by array CGH technology and affects a status (gain, normal or lost) to each clone. It requires that the library GLAD is loaded.

# Usage

```
runGLAD(input, smoothfunc="lawsglad", base=FALSE, sigma = NULL, bandwidth=10,
round=2, lambdabreak=8, lambdacluster=8, lambdaclusterGen=40,
type="tricubic", param=c(d=6), alpha=0.001, method="centroid",
nmax=8, verbose=FALSE, ...)
```

## **Arguments**

input	An object of class MAList or SegList
smoothfunc	Type of algorithm used to smooth LogRatio by a piecewise constant function. Choose either lawsglad, aws::aws or aws::laws.
base	If TRUE, the position of clone is the physical position onto the chromosome, otherwise the rank position is used.
sigma	Value to be passed to either argument sigma2 of aws::aws function or shape of aws::laws. If NULL, sigma is calculated from the data.

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bandwidth Set the maximal bandwidth hmax in the aws::aws or aws::laws function. For

example, if bandwidth=10 then the hmax value is set to  $10*X_N$  where  $X_N$  is

the position of the last clone.

round The smoothing results are rounded or not depending on the round argument.

The round value is passed to the argument digits of the round function.

lambdabreak Penalty term  $(\lambda')$  used during the **Optimization of the number of breakpoints** 

step.

lambdacluster Penalty term ( $\lambda *$ ) used during the **MSHR clustering by chromosome** step.

lambdaclusterGen

Penalty term ( $\lambda*$ ) used during the **HCSR clustering throughout the genome** 

step.

type Type of kernel function used in the penalty term during the **Optimization of the** 

number of breakpoints step, the MSHR clustering by chromosome step and

the HCSR clustering throughout the genome step.

param Parameter of kernel used in the penalty term.

alpha Risk alpha used for the **Outlier detection** step.

method The agglomeration method to be used during the MSHR clustering by chro-

mosome and the HCSR clustering throughout the genome clustering steps.

nmax Maximum number of clusters (N\*max) allowed during the the MSHR cluster-

ing by chromosome and the HCSR clustering throughout the genome clus-

tering steps.

verbose If TRUE some information are printed

.. ..

#### **Details**

For a detailed explanation of the GLAD algorithm please see the relevant section of the GLAD manual: glad

#### Value

The function returns an object of class SegList

## See Also

glad MAList runHomHMM runDNAcopy SegList

runHomHMM

A function to fit unsupervised Hidden Markov model

#### **Description**

This function fits an unsupervised Hidden Markov model to a given MAList or SegList

## Usage

runTilingArray 27

#### **Arguments**

an object of class MAList or SegList input Gets passed to the function repeated::hidden as the pshape argument. vr

maxiter Gets passed to the function repeated::hidden as the iterlim argument. Choice of which selection criteria should be used in the algorithm. The choices criteria

are either AIC or BIC.

delta Delta value used of the BIC is selected. If no value is entered it defaults to 1. full.output

if true the SegList output includes a probability that a clone is in its assigned state and a smoothed value for the clone.

parameter controlling the convergence of the EM algorithm. eps

#### See Also

runDNAcopy runGLAD SegList

runTilingArray Results of segmenting an MAList data object using the Picard et al

algorithm found in the tilingArray library

## **Description**

Wrapper calling the Tiling Array segmentation algorithm on an MAList object. This function requires the library DNAcopy to be loaded.

#### **Usage**

```
runTilingArray(input, maxSeg = 5, maxk = 200, criteria = "BIC")
```

## **Arguments**

input An object of class MAList or SegList

maxSeg integer of length 1, maximum number of segments (= 1 + maximum number of

change points)

integer of length 1, maximum length of a single segment maxk

criteria Criteria for model selection. Options are "none", "AIC" and "BIC" (default)

#### Value

The function returns an object of class SegList

#### Author(s)

Mike Smith

#### See Also

segment MAList runHomHMM runGLAD SegList

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SegList-class	Segmentation States - class

## **Description**

A list based class for storing the results of a segmentation algorithm. They are generally created by running one of the following functions runHomHMM, runGLAD or runDNAcopy on an MAList object.

## **Slots/List Components**

Objects should contain the following list components:

pred: Predicted value of the state.

disp: Dispersion.
obs: Observed value.
state: Numeric value.

nstates.hmm: The number of states per chromosome. Each row represents a chromosome and each column is an array.

genes:

data.frame that contains the chromosome and position on the chromosome for each clone. Used for plott

## Optional:

rpred: Smoothed value for the clone.

prob: Probability of the clone being in the assigned state.

#### Methods

SegLists can be subsetted and combined. They also return dimensions so functions such as dim, nrow and ncol are also defined. SegList inherits the show method from the Limma class LargeDataObject. This means that the SegList will print in a relatively compact way.

#### Author(s)

Mike Smith

simulateData	A function for simulating aCGH data and the corresponding clone
	layout

#### **Description**

This simulation scheme operates in two stages. Initially, we simulate the layout of clones before using a modified version of the scheme developed by Willenbrock et al., 2005 to generate the  $\log_2$  ratios. For each simulated clone layout we generate 20 sets of simulated  $\log_2$  ratios from one of five templates. Additionally, we also take account of the cellularity of the test sample in our simulation.

simulateData 29

#### Usage

#### **Arguments**

nArrays The number of arrays we want to simulate

chrominfo The information about chromosome length/centromere location to be used. De-

faults to the information provided in aCGH package of Jane Fridlyand and Peter Dimitrov.

prb.short.tiled

The probability of a tiled region on the short arm of the simulated chromosome (defaults to 0.5).

 $\verb|prb.long.tiled| The probability of a tiled region on the long arm of the simulated chromosome$ 

(defaults to 0.5).

non.tiled.lower.res

The lower limit for the distance (in Mbs) between adjacent clones in non-tiled regions of the genome (defaults to 0.9Mb).

non.tiled.upper.res

The upper limit for the distance (in Mbs) between adjacent clones in non-tiled regions of the genome (defaults to 1.1Mb).

length.clone.lower

The lower limit for the length (in Mbs) of a clone (this defaults to 0.05Mb).

length.clone.upper

The upper limit for the length (in Mbs) of a clone (this defaults to 0.2Mb).

tiled.lower.res

The lower limit for the distance (in Mbs) between adjacent clones in tiled regions of the genome (defaults to -0.05Mb).

tiled.upper.res

The upper limit for the distance (in Mbs) between adjacent clones in tiled regions of the genome (defaults to 0Mb).

The standard deviation of the simulated data in each of the states. Defaults to being randomly sampled between 0.1 and 0.2.

output A logical variable which is TRUE if you want the output to be written to txt files in the present working directory. Defaults to FALSE.

prb.proportion.tiled

Given that an arm of a chromosome contains a tiled region this variable (which is a vector of length 5) gives the probability that 20,30,40,50 or 100% of the chromosome is tiled. It defaults to (0.2,0.2,0.2,0.2,0.2)

zerolengthnontiled

The empirical distribution for regions of the genome which are non-tiled and contain no copy number gains or losses. Defaults to zero.length.distr.non.tiled

30 Viterbi.five

zerolengthtiled

The empirical distribution for regions of the genome which are tiled and contain no copy number gains or losses. Defaults to zero.length.distr.tiled

nonzerolengthnontiled

The empirical distribution for regions of the genome which are non-tiled and contain no copy number gains or losses. Defaults to non.zero.length.distr.non.tiled

nonzerolengthtiled

The empiricial distribution for regions of the genome which are tiled and contain copy number gains or losses. Defaults to non.zero.length.distr.tiled

seed Seed value allowing simulation to be reproduced if the same seed value is set.

#### Details

For more details see the article by Marioni and Thorne published in Bioinformatics.

#### Value

The function returns a list containing the following elements.

clones	Gives the start, end and midpoint of the simulated clones.
class.output	A list of the true underlying state clones are assigned to for each of the twenty simulations associated with each clone layout.
class.matrix	Defines the true underlying state clones are assigned to in each of the five classes
classes	Which of the five class outputs has been used to simulate the $\log_2$ ratios
datamatrix	A matrix containing twenty columns each of which contains the simulated $\log_2$ ratios associated with each of the simulations for a particular clone layout.
samples	Gives information about the cellularity associated with each of the samples.

#### Author(s)

John Marioni and Natalie Thorne

#### References

See the relevant article in Bioinformatics or the following website: www.damtp.cam.ac.uk/user/jcm68

Viterbi.five	A scaled Viterbi algorithm for allocating clones to one of five underlying states.
	tying states.

## **Description**

A work horse of the fit.model function. It uses a scaled version of the Viterbi algorithm to allocate clones to one of five underlying states as fitted using a heterogeneous HMM.

## Usage

```
Viterbi.five(y, BFGS.output, BFGS.trans.mat)
```

Viterbi.four 31

## **Arguments**

y the data to be allocated to states

BFGS. output The output obtained from the find.param.five function

BFGS.trans.mat A list of the heterogeneous transition matrices

## Value

A vector of numbers indicating to which state clones are allocated to.

## Author(s)

John Marioni

Viterbi.four

A scaled Viterbi algorithm for allocating clones to one of four underlying states.

## **Description**

A work horse of the fit.model function. It uses a scaled version of the Viterbi algorithm to allocate clones to one of four underlying states as fitted using a heterogeneous HMM.

## Usage

```
Viterbi.four(y, BFGS.output, BFGS.trans.mat)
```

## **Arguments**

y the data to be allocated to states

BFGS.output The output obtained from the find.param.four function

BFGS.trans.mat A list of the heterogeneous transition matrices

## Value

A vector of numbers indicating to which state clones are allocated to.

## Author(s)

John Marioni

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Viterbi.three	A scaled Viterbi algorithm for allocating clones to one of two underlying states.
---------------	---

## **Description**

A work horse of the fit.model function. It uses a scaled version of the Viterbi algorithm to allocate clones to one of three underlying states as fitted using a heterogeneous HMM.

## Usage

```
Viterbi.three(y, BFGS.output, BFGS.trans)
```

## Arguments

y the data to be allocated to states

BFGS.output The output obtained from the find.param.three function

BFGS. trans A list of the heterogeneous transition matrices

#### Value

A vector of numbers indicating to which state clones are allocated to.

## Author(s)

John Marioni

Viterbi.two	A scaled Viterbi algorithm for allocating clones to one of two underlying states.
	tying states.

# Description

A work horse of the fit.model function. It uses a scaled version of the Viterbi algorithm to allocate clones to one of two underlying states as fitted using a heterogeneous HMM.

## Usage

```
Viterbi.two(y, BFGS.output, BFGS.trans.mat)
```

## **Arguments**

y the data to be allocated to states

BFGS.output The output obtained from the find.param.two function

BFGS.trans.mat A list of the heterogeneous transition matrices

# Value

A vector of numbers indicating to which state clones are allocated to.

#### Author(s)

John Marioni

zero.length.distr.non.tiled

Empirical distribution of segment lengths in non-tiled regions with no copy number gains or losses

## **Description**

This file contains the empirical distribution of segment lengths (of untiled regions and whose state mean indicates that they correspond to regions of no copy number gain or loss) derived by applying the DNAcopy segmentation scheme (Olshen et al., 2004) to an unpublished breast cancer dataset. Instead of using the physical length of the segments we calculate the lengths as a proportion of the length of the untiled region.

## Usage

```
data(zero.length.distr.non.tiled)
```

#### **Source**

The empirical distribution was derived using an unpublished breast cancer dataset.

zero.length.distr.tiled

Empirical distribution of segment lengths in tiled regions with no copy number gains or losses

## **Description**

This file contains the empirical distribution of segment lengths (of tiled regions and whose state mean indicates that they correspond to regions of no copy number gain or loss) derived by applying the DNAcopy segmentation scheme (Olshen et al., 2004) to an unpublished breast cancer dataset. Instead of using the physical length of the segments we calculate the lengths as a proportion of the length of the tiled region.

# Usage

```
data(zero.length.distr.tiled)
```

#### **Source**

The empirical distribution was derived using an unpublished breast cancer dataset.

34 zoomGenome

zoomChromosome Interactive plot of a single chromsome	
---	--

#### **Description**

Plot splitting the screen into two. The top windows displays the entire chromosome, whilst the bottom plots a selected region. The plot is interactive allowing the user to click twice on a chromosome in the upper plot and have it the region between the two clicks displayed below.

# Usage

```
zoomChromosome(..., array = 1, chrom.to.plot, colors = NULL, chrominfo = chrominfo.Mb, ylim = <math>c(-2, 2)
```

## **Arguments**

... Objects of type MAList or SegList array Specify which array should be plotted. Chrom.to.plot Which chromosome should be plotted

colors Vector specify the colors for each of the SegLists

chrominfo chromosomal information associated with the mapping of the data.

ylim Specify the limits of the y-axis

## **Details**

If colors is unspecified then all SegLists passed to this function will be plotted in blue. Since this makes it quite hard to tell which is which it is highly recommended to specify the colors vector if more than one object is being passe to this function.

## Author(s)

Mike Smith

zoomGenome	Interactive plot of the whole genome		
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## Description

Plot splitting the screen into two. The top windows displays the entire genome, whilst the bottom plots a single chromosome. The plot is interactive allowing the user to click on a chromosome in the upper plot and have it displayed below. Clicking to either side of the plot borders ends the interactivity.

## Usage

```
zoomGenome(..., array = 1, colors = NULL, chrominfo = chrominfo.Mb)
```

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## **Arguments**

... Objects of type SegList

array Specify which array should be plotted.

colors Vector specify the colors for each of the SegLists

chrominfo chromosomal information associated with the mapping of the data.

#### **Details**

If colors is unspecified then all objects passed to this function will be plotted in blue. Since this makes it quite hard to tell which is which it is highly recommended to specify the colors vector if more than one object is being passe to this function.

## Author(s)

Mike Smith

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