# Package 'aCGH'

# October 8, 2013

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|---|
| Title Classes and functions for Array Comparative Genomic Hybridization data.   |
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| <b>Description</b> Functions for reading aCGH data from image analysis output files and clone information files, creation of aCGH S3 objects for storing these data. Basic methods for accessing/replacing, subsetting, printing and plotting aCGH objects. |
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| License GPL-2   |
| Collate aCGH.R aCGH.plotting.R aCGH.read.R aCGH.test.R clusterGenome.R funcs.dataplot.R heatmap.R hmm.R human.chrom.info.Jul03.R human.chrom.info.May04.R mergeLevels.R   |
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# **Description**

Objects of this class represent batch of arrays of Comparative Genomic Hybridization data. In addition to that, there are slots for representing phenotype and various genomic events associated with aCGH experiments, such as transitions, amplifications, aberrations, and whole chromosomal gains and losses. Currently objects of class aCGH are represented as S3 classes which are named list of lists with functions for accessing elements of that list. In the future, it's anticipated that aCGH objects will be implemented using S4 classes and methods.

# **Details**

One way of creating objects of class aCGH is to provide the two mandatory arguments to create.aCGH function: log2.ratios and clones.info. Alternatively aCGH object can be created using aCGH.read.Sprocs that reads Sproc data files and creates object of type aCGH.

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#### Value

log2.ratios Data frame containing the log2 ratios of copy number changes; rows correspond

to the clones and the columns to the samples (Mandatory).

clones.info Data frame containing information about the clones used for comparative ge-

nomic hybridization. The number of rows of clones.info has to match the

number of rows in log2.ratios (Mandatory).

phenotype Data frame containing phenotypic information about samples used in the exper-

iment generating the data. The number of rows of phenotype has to match the

number of columns in log2.ratios (Optional).

log2.ratios.imputed

Data frame containing the imputed log2 ratios. Calculate this using impute.lowess

function; look at the examples below (Optional).

hmm The structure of the hmm element is described in hmm. Calculate this using

find.hmm.states function; look at the examples below (Optional).

hmm Similar to the structure of the hmm element. Calculate this using mergeHmmStates

function; look at the examples below (Optional).

sd. samples The structure of the sd.samples element is described in computeSD. Samples.

Calculate this using computeSD. Samples function; look at the examples below

(Optional). It is prerequisite that the hmm states are estimated first.

genomic.events The structure of the genomic.events element is described in find.genomic.events.

Calculate this using find.genomic.events function; look also at the examples below. It is prerequisite that the hmm states and sd.samples are computed first. The genomic.events is used widely in variety of plotting functions such as

plotHmmStates, plotFreqStat, and plotSummaryProfile.

dim.aCGH returns the dimensions of the aCGH object: number of clones by number of

samples.

num. clones number of clones/number of rows of the log2.ratios data.frame.

nrow.aCGH same as num.clones.

is.aCGH tests if its argument is an object of class aCGH.

num. samples number of samples/number of columns of the log2.ratios data.frame.

nrow.aCGH same as num.samples.

num.chromosomes

number of chromosomes processed and stored in the aCGH object.

clone.names returns the names of the clones stored in the clones.info slot of the aCGH object.

row.names.aCGH same as clone.names.

sample.names returns the names of the samples used to create the aCGH object. If the object

is created using aCGH. read. Sprocs, these are the file names of the individual

arrays.

col.names.aCGH same as sample.names.

[.aCGH subsetting function. Works the same way as [.data.frame.

Most of the functions/slots listed above have assignment operators '<-' associated with them.

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#### Note

clones. info slot has to contain a list with at least 4 columns: Clone (clone name), Target (unique ID, e.g. Well ID), Chrom (chromosome number, X chromosome = 23 in human and 20 in mouse, Y chromosome = 24 in human and 21 in mouse) and kb (kb position on the chromosome).

#### Author(s)

Peter Dimitrov

#### See Also

aCGH.read.Sprocs, find.hmm.states, computeSD.Samples, find.genomic.events, plotGenome, plotHmmStates, plotFreqStat, plotSummaryProfile

```
## Creating aCGH object from log2.ratios and clone info files
## For alternative way look at aCGH.read.Sprocs help
datadir <- system.file(package = "aCGH")</pre>
datadir <- paste(datadir, "/examples", sep="")</pre>
clones.info <-
      read.table(file = file.path(datadir, "clones.info.ex.txt"),
                 header = TRUE, sep = "\t", quote="", comment.char="")
log2.ratios <-</pre>
      read.table(file = file.path(datadir, "log2.ratios.ex.txt"),
                 header = TRUE, sep = "\t", quote="", comment.char="")
pheno.type <-
      read.table(file = file.path(datadir, "pheno.type.ex.txt"),
                 header = TRUE, sep = "\t", quote="", comment.char="")
ex.acgh <- create.aCGH(log2.ratios, clones.info, pheno.type)</pre>
## Printing, summary and basic plotting for objects of class aCGH
data(colorectal)
colorectal
summary(colorectal)
sample.names(colorectal)
phenotype(colorectal)
plot(colorectal)
## Subsetting aCGH object
colorectal[1:1000, 1:30]
## Imputing the log2 ratios
log2.ratios.imputed(ex.acgh) <- impute.lowess(ex.acgh)</pre>
## Determining hmm states of the clones
```

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```
## WARNING: Calculating the states takes some time
##in the interests of time, hmm-finding function is commented out
##instead the states previosuly save are assigned
##hmm(ex.acgh) <- find.hmm.states(ex.acgh)</pre>
hmm(ex.acgh) <- ex.acgh.hmm</pre>
hmm.merged(ex.acgh) <-</pre>
   mergeHmmStates(ex.acgh, model.use = 1, minDiff = .25)
## Calculating the standard deviations for each array
sd.samples(ex.acgh) <- computeSD.Samples(ex.acgh)</pre>
## Finding the genomic events associated with each sample
genomic.events(ex.acgh) <- find.genomic.events(ex.acgh)</pre>
## Plotting and printing the hmm states
plotHmmStates(ex.acgh, 1)
pdf("hmm.states.temp.pdf")
plotHmmStates(ex.acgh, 1)
dev.off()
## Plotting summary of the sample profiles
plotSummaryProfile(colorectal)
```

aCGH.process

Process data in aCGH object

## **Description**

This function takes object of class aCGH, and filters clones based on their mapping information and proportion missing. It also average duplicated clones and reports quality statistic.

#### Usage

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#### **Arguments**

aCGH.obj Object of class aCGH

chrom.remove.threshold

Chromosomes are ordered and numbered as usual, except for X and Y chromosome, which in for Homo sapiens genome have numbers 23 and 24 repsectivelly,

in for Mus musculus 20 and 21, etc.

prop.missing Clones are screened out and if the proportion missing in the samples is prop.missing

they are removed.

sample.quality.threshold

Mark those samples that have their proportion of missing values sample.quality.threshold.

unmapScreen Indicator for whether clones with incomplete mapping information should be

removed from the dataset. Note that leaving them in may cause plotting routines

fail. Defaults to TRUE

dupRemove Indicator for whether clones with duplicate names should be averaged and re-

moved from the dataset leaving only one occurence of each duplicated set. Defaults

to TRUE

#### Value

Object of class aCGH.

#### Author(s)

Jane Fridlyand, Peter Dimitrov

## See Also

aCGH

aCGH.read.Sprocs 7

aCGH.read.Sprocs

Create object of class "aCGH" from Sproc files

## **Description**

This function reads in two-channel Array Comparative Genomic Hybridization Sproc files, flags them for bad quality and missing data, and creates object of class aCGH.

#### **Usage**

## Arguments

fnames a vector of character strings containing the file names of each Sproc data file.

latest.mapping.file

The name of an optional file that contains newer clone mapping different from

the clone mapping used at the time when the arrays were created.

maxsd maximum of standard deviation of log2 ratios used in pre-filtering.

minreplic minimum number of replicates per clone for a single chip used to calculate the

log2 ratios.

chrom.remove.threshold

Chromosomes are ordered and numbered as usual, except for X and Y chromosome, which in for Homo sapiens genome have numbers 23 and 24 repsectivelly,

in for Mus musculus 20 and 21, etc.

prop.missing Clones are screened out and if the proportion missing in the samples is prop.missing

they are removed.

sample.names Sample names. If they are missing, the file names are used after stripping the

characters after the last dot in the filename if one exists; for example 'myfile.txt'

becomes myfile.

sample.quality.threshold

Mark those samples that have their proportion of missing values sample.quality.threshold.

cols character vector of length 4 containing the following Sproc file column names:

 $\log 2$  ratios, std. deviations of the  $\log 2$  ratios, number of replicates for each clone and flags for bad clones. Defaults to c("Log2Rat", "Log2StdDev", "NReplic", "Bad.P"). Note that all the whitespace characters in the column names will be

replaced with dots.

unmapScreen Indicator for whether clones with incomplete mapping information should be

removed from the dataset. Note that leaving them in may cause plotting routines

fail. Defaults to TRUE

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dupRemove

Indicator for whether clones with duplicate names should be averaged and removed from the dataset leaving only one occurence of each duplicated set.Defaults to TRUE

## Value

Object of class aCGH.

## Author(s)

Jane Fridlyand, Peter Dimitrov

## See Also

aCGH

# **Examples**

aCGH.test

Testing association of aCGH clones with censored or continuous outcomes

# Description

aCGH. test function tests for association of each clone in an univariate manner with censored or continous outcome by fitting Cox proportional hazards model or linear regression model. There is also an alternative to Cox prop. hazards - testing for differences in survival curves defined by the groups in the outcome variable using the  $G^{\rho}$  family of tests.

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## Usage

## **Arguments**

aCGH.obj aCGH object containing clones' log2 ratios.

rsp Response variable which is either Surv object from survival package or con-

tinous outcome.

test Currently only three values are allowed - "coxph", "survdiff", and "linear.regression",

which test for association using Cox proportional hazards model,  $G^{\rho}$  family of

tests (survdiff) or linear model.

p.adjust.method

This is a parameter controlling how the p-values from the univariate tests are going to be adjusted for multiple testing. Default value is Benjamini & Hochberg

(1995) FDR method. Please refer to p. adjust function for more help.

imputed Whether imputed or original log2ratios should be used. Default is TRUE (im-

puted).

subset Specifies subset index of clones to be tested.

strt Aptional strata variable for splitting the data in different strata.

... Optional parameters passed further along to each of the univariate testing func-

tions.

# Value

A data frame similar to the result returned from mt.maxT function from multtest package with components:

index Vector of row indices, between 1 and nrow(X), where rows are sorted first ac-

cording to their adjusted p-values, next their unadjusted p-values, and finally

their test statistics.

teststat Vector of test statistics, ordered according to index. To get the test statistics in

the original data order, use teststat[order(index)].

rawp Vector of raw (unadjusted) p-values, ordered according to index.

adjp Vector of adjusted *p*-values, ordered according to index.

## Author(s)

Peter Dimitrov

## See Also

```
aCGH, Surv, mt.maxT, coxph, survdiff, p.adjust
```

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|  | clusterGenome | clustering and heatmap |  |
|--|---------------|------------------------|--|
|--|---------------|------------------------|--|

# Description

This function clusters samples and shows their heatmap

# Usage

# **Arguments**

| aCGH.obj    | object of class aCGH here   |
|-------------|---|
| _           | •   |
| 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 $\boldsymbol{F}$      |
| showaber    | logical indicating whether high level amplifications and homozygous deletions should be indicated on the plot. defaults to 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"   |
|             |   |

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methodS clustering method to cluster samples. defaults to "ward"

dendPlot logical indicating whether dendogram needs to be drawn. defaults to T.

imp logical indicating whether imputed or original values should be used. defaults

to T, i.e. imputed.

categoricalPheno

logical indicating whether phenotype is categorical. Continious phenotypes are treated as "no groups" except that their values are dispalyed.defaults to TRUE.

#### **Details**

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.

#### See Also

aCGH heatmap

```
data(colorectal)
#cluster all samples using imputed data on all chromosomes (autosomes and X):
clusterGenome(colorectal)
#cluster samples within sex groups based on 3 chromosomes individually.
#use non-imputed data and do not show dendogram. Indicate amplifications and
#homozygous deletions.
clusterGenome(colorectal, response = phenotype(colorectal)$sex,
                   byclass = TRUE, showaber = TRUE, vecchrom = c(4,8,9),
                   dendPlot = FALSE, imp = FALSE)
#cluster samples based on each chromosome individualy and display age. Show
#gains in red and losses in green. Show aberrations and use values < -1
#to identify homozgous deletions. Do not show dendogram.
pdf("plotimages.pdf", width = 11, height = 8.5)
for (i in 1:23)
   clusterGenome(colorectal,
                       response = phenotype(colorectal)$age,
                       chrominfo = human.chrom.info.Jul03,
                       cutoff = 1, ncolors = 50, lowCol="green",
                       highCol="red", midCol="black", byclass = FALSE,
                       showaber = TRUE, homdel = -1, vecchrom = i,
                       titles = "Image Plot", methodS = "ward",
```

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```
dendPlot = FALSE, categoricalPheno = FALSE)
dev.off()
```

colorectal

Colorectal array CGH dataset

# **Description**

The colorectal dataset is an object of class aCGH. It represents a collection of 124 array CGH profiles of primary colorectal tumors and their derived attributes. Each sample was measured on the BAC clone DNA microarray with approximate resolution of 1.4 Mb per clone. There were approximately 2400 clones spotted on the array and each clone was printed in triplicates located immediately next to each other. Each array consisted of the 16 (4 by 4) subarrays. The clones were mapped on the July 03 UCSC freeze. There were a number of the discrete and continious phenotypes associated with the samples such as age, mutation status for various markers, stage, location and so on. All images were quantified and normalized by Dr. Taku Tokuyasu using custom image software SPOT and postprocessing custom software SPROC.

## Usage

```
data(colorectal)
```

#### Source

These data were generated at Dr. Fred Waldman's lab at UCSF Cancer Center by K. Nakao and K. Mehta. The manuscript describing the data and the analysis are described in High-resolution analysis of DNA copy number alterations in colorectal cancer by array-based comparative genomic hybridization, *Carcinogenesis*, 2004, Nakao et. al.

#### References

Nakao et. al., High-resolution analysis of DNA copy number alterations in colorectal cancer by array-based comparative genomic hybridization, *Carcinogenesis*, 2004 Jain et. al, Fully automatic quantification of microarray image data, *Genome Research*, 2003

# See Also

```
aCGH plotGenome
```

```
data(colorectal)
## WARNING: plotting the heatmap takes some time
plot(colorectal)
plotGenome(colorectal[,1:2])
```

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| computeSD.func | Function to estimate experimental variability of a sample |
|----------------|---|
| •              | 1 2 2 1   |

## **Description**

This functions estimate experimental variability of a given sample. This value can be used to rank samples in terms of the quality as well as to derive thresholds for declaring gained and lost clones.

# Usage

## **Arguments**

| aCGH.obj       | Object of class aCGH.  |
|----------------|--|
| statesres      | The states.hmm object, generally is the output of mergeFunc.   |
| maxmadUse      | Maximum median absolute deviation allowed to controbute to the overall variability calculation.  |
| maxmedUse      | Maximum median value for a state allowed to contribute to the calculation.   |
| maxState       | Maximum number of the states on a given chromosome for the states from that chromosome to be allowed to enter noise variability calculation. |
| maxStateChange | Maximum number of changes from state to state on a given chromosome for that chromosome to enter noise variability calculation.              |
| minClone       | Minimum number of clones in a state for clones in that sate to enter variability calculation.  |
| maxChrom       | Maxiumum chromosomal index (generally only autosomes are used for this calculation.  |

# Details

Median absolute deviation is estimated in all the states passing the criteria defined by the parameters of the function. Then median of all MADs on individual chromosomes as well as across all chromosomes is taken to estimate chromosomal experimental variability and sample experimental variability.

#### Value

| madChrom  | Returns a matrix containing estimated variability for each chromosome for each sample. |
|-----------|--|
| madGenome | Returns a vector with estimate of experimental varibility for each sample.             |

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#### 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

aCGH

fga.func

Function to compute fraction of genome altered for each sample

## **Description**

This function outputs lists containing proportions of the genome that are gained and lost for each sample.

## Usage

## **Arguments**

aCGH.obj An object of aCGH class

thres either a vector providing unique threshold for each sample or a vector of the

same length as number of samples providing sample-specific threshold. If 'aCGH.obj' has non-null 'sd.samples', then threshold is automatically replaced by tumor-specific sd multiplied by 'factor'. Clone is considered to be gained if it is above

the threshold and lost if it is below negative threshold. Defaults to 0.25

factor specifies the number by which experimental variability should be multiples.

Used only when tumor specific variability in 'aCGH.obj' is not NULL or when

factor is greater than 0. Defaults to 2.5.

samplenames Sample names. Default is sample.names(aCGH.obj)

chrominfo A chromosomal information associated with the mapping of the data. Default is

human.chrom.info.Jul03 data frame

# Value

gainP Vector of proportion of genome gained for each sample
lossP Vector of proportion of genome lost for each sample

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## Author(s)

Jane Fridlyand, Ritu Roydasgupta

# **Examples**

```
data(colorectal)
col.fga <- fga.func(colorectal, factor=3,chrominfo=human.chrom.info.Jul03)
cbind(gainP=col.fga$gainP,lossP=col.fga$lossP)[1:5,]</pre>
```

find.genomic.events Finds the genomic events associated with each of the array CGH samples

# Description

Finds the genomic events associated with each of the array CGH samples. Events include whole chromosomal gains and losses, aberrations, transitions, amplifications and their respective counts and sizes. The hmm states has to be computed before using this function.

# Usage

# Arguments

| aCGH.obj     | Object of class aCGH.  |
|--------------|--|
| maxChrom     | Highest chromosomal number to find events.   |
| factor       | Determines outliers. See findOutliers.func.  |
| maxClones    | Determines aberrations. See findAber.func.   |
| maxLen       | Determines aberrations. See findAber.func.   |
| absValSingle | Determines amplifications. See findAmplif.func.  |
| absValRegion | Determines amplifications. See findAmplif.func.  |
| diffVal1     | Determines amplifications. See findAmplif.func.  |
| diffVal2     | Determines amplifications. See findAmplif.func.  |
| maxSize      | Determines amplifications. See findAmplif.func.  |
| pChrom.min   | Determines whole chromosomal gains and losses. Chromosome should contain no transitions, have its absolute median equal or greater than medChrom.min and at least medChrom.min has to be greater or less than 0. |
| medChrom.min | Determines whole chromosomal gains and losses. Chromosome should contain no transitions, have its absolute median equal or greater than medChrom.min and at least medChrom.min has to be greater or less than 0. |

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#### **Details**

The default parameters generally work. Threshold for merging may be changed depending on the expected normal cell contamination and/or expected magnitude of the changes. AIC model generally works, however, may need to be readjusted depending on how liberal or conservative one wants to be in finding genomic events. We recommend BIC criterion with delta = 1 for noisier data.

#### Value

num.transitions

matrix of dimensions maxChrom by number of samples. It contains number of transitions that were recorded on a given chromosome for a given sample.

num.amplifications

matrix of dimensions maxChrom by number of samples It contains number of amplifications that were recorded on a given chromosome for a given sample.

num.aberrations

matrix of dimensions maxChrom by number of samples. It contains number of focal aberrations that were recorded on a given chromosome for a given sample.

num.outliers matrix of dimensions maxChrom by number of samples. It contains number of outliers that were recorded on a given chromosome for a given sample.

num.transitions.binary

binary matrix of dimensions maxChrom by number of samples. Non-zero entry indicates whether 1 or more transitions were recorded on a given chromosome for a given sample.

num.amplifications.binary

binary matrix of dimensions maxChrom by number of samples. Non-zero entry indicates whether 1 or more amplifications were recorded on a given chromosome for a given sample.

num.aberrations.binary

binary matrix of dimensions maxChrom by number of samples. Non-zero entry indicates whether 1 or more focal aberrations were recorded on a given chromosome for a given sample.

num.outliers.binary

binary matrix of dimensions maxChrom by number of samples. Non-zero entry indicates whether 1 or more outliers were recorded on a given chromosome for a given sample.

whole.chrom.gain.loss

matrix of dimensions maxChrom by number of samples. Positive entry indicates that a given chromosome was gained in a given sample, negative entry indicates that a given chromosome was lost in a given sample, 0 entry is normal chromosome and NA marks chromosomes with one or more transition.

size.amplicons matrix of dimensions maxChrom by number of samples. Reports size of a given chromosome that is amplified (kb units) in a given sample.

num.amplicons matrix of dimensions maxChrom by number of samples. Reports number of disjoint amplicons on a given chromosome for a given sample.

outliers list containing 3 matrices of dimensions number of clones by number of samples. See findOutliers. func.

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| aberrations    | list containing a matrix of dimensions number of clones by number of samples. See findAber.func.      |
|----------------|---|
| transitions    | list containing 2 matrices of dimensions number of clones by number of samples. See $findTrans.func.$ |
| amplifications | list containing a matrix of dimensions number of clones by number of samples.  See findAmplif. func.  |

# See Also

 $a CGH \ find. hmm. states \ merge Func \ find Aber. func \ find Trans. func \ find Amplif. func \ find Outliers. func \ find Trans. func \ find Amplif. func \ find Trans. func \ find$ 

| ates of the clones | Determine | find.hmm.states | f |
|--------------------|-----------|-----------------|---|
|--------------------|-----------|-----------------|---|

# **Description**

This function runs unsupervised HMM algorithm and produces the essentual state information which is used for the subsequent structure determination.

# Usage

# **Arguments**

| aCGH.obj | object of class aCGH.  |
|----------|--|
| dat      | dataframe with clones in the rows and samples in the columns   |
| datainfo | dataframe containing the clones information that is used to map each clone of the array to a position on the genome. Has to contain columns with names Clone/Chrom/kb containing clone names, chromosomal assignment and kb positions respectively |
| vr       | Initial experimental variance  |
| maxiter  | Maximum number of iterations   |
| aic      | TRUE or FALSE variable indicating whether or nor AIC criterion should be used for model selection (see DETAILS)  |
| bic      | TRUE or FALSE variable indicating whether or nor BIC criterion should be used for model selection (see DETAILS)  |
| delta    | numeric vector of penalty factors to use with BIC criterion. If BIC is true, delta=1 is always calculated (see DETAILS)  |
| eps      | parameter controlling the convergence of the EM algorithm.   |
|          | All the parameters that can be passed to find.hmm.states except dat and datainfo.  |

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#### **Details**

One or more model selection criterion is used to determine number of states on each chromosomes. If several are specified, then a separate matrix is produced for each criterion used. Delta is a fudge factor in BIC criterion:  $\delta BIC(\gamma) = \log RSS(\gamma) + q_{\gamma}\delta \log n/n$ . Note that delta = NA leads to conventional BIC. (Broman KW, Speed TP (2002) A model selection approach for the identification of quantitative trait loci in experimental crosses (with discussion). J Roy Stat Soc B 64:641-656, 731-775)

find.hmm.states(aCGH.obj, ...) uses aCGH object instead of log2 ratios matrix dat. Equivalent representation (assuming normally distributed residuals) is to write  $-\log lik(gamma) = n/2*log(RSS)(gamma)$  and then bic= $-\log lik+log(n)*k*delta/2$  and aic = $-\log lik+2*k/2$ 

#### Value

Two lists of lists are returned. Each list contains information on the states with each of the specified model selection criteria. E.g., if AIC = T, BIC = T and delta = c(1.5), then each list will contain three lists corresponding to AIC, BIC(1) and BIC(1.5) as the 1st,2nd and 3rd lists repsectively. If AIC is used, it always comes first followed by BIC and then deltaBIC in the order of delta vector.

states.hmm

Each of the sublists contains 2+6\*n columns where the first two columns contain chromosome and kb positions for each clone in the dataset supplied followed up by 6 columns for each sample where n = number of samples.

column 1 = state

column 2 = smoothed value for a clone

column 3 = probability of being in a state

column 4 = predicted value of a state

column 5 = dispersion

column 6 = observed value

nstates.hmm

Each of the sublists contains a matrix with each row corresponding to a chromosome and each column to a sample. The entries indicate how many different states were identified for a given sample on a given chromosome

#### WARNING

When algorithm fails to fit an HMM for a given number of states on a chromosome, it prints a warning.

# 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

aCGH

findAber.func 19

## **Examples**

findAber.func

Function to determines focal aberrations

# Description

The function identifies clones that are focal aberrations.

## Usage

```
findAber.func(maxClones = 1, maxLen = 1000, statesres)
```

## **Arguments**

maxClones Maximum number of clones assigned to the same state which can be considered

to be focal aberrations

maxLen Maximum lengeth of the region containing clones assigned to the state so that

those clones can be considered to be focal aberrations

statesres The states output of the hmm. run. func

## **Details**

The focal aberrations are the one or more clones assigned to the state different from the states of the surrounding clones. They may indicate copy number polymorphisms or interesting high or low focal changes.

#### Value

aber

Binary matrix with a row for each clone and column for each sample. 1 indicates presence of a focal aberrations, 0 lack of such.

20 findAmplif.func

## Author(s)

Jane Fridlyand

#### References

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

findAmplif.func

Function to determine high level amplifications

# **Description**

This function identifies high level amplifications by considering the height, the width of an amplicon relative to the urrounding clones. Only narrow peaks much higher than its neigbors are considered as high level amplifications.

# Usage

```
findAmplif.func(absValSingle = 1, absValRegion = 1.5, diffVal1 = 1,
diffVal2 = 0.5, maxSize = 10000, translen.matr, trans.matr, aber,
outliers, pred, pred.obs, statesres)
```

## **Arguments**

| absValSingle  | A clone is declared to be an amplification if it is a focal aberration or an outlier and its value exceeds absValSingle                                |
|---------------|--|
| absValRegion  | A clone is an amplification if if a clone belong to a region with width less than maxSize and observed value for a clones is greater than absValRegion |
| diffVal1      | Clone is an amplification if it is an aberration and greater by diffVal1 than max of the two surrounding stretches                                     |
| diffVal2      | Clone is an amplification if it is an outlier, its observed values is greater by diffVal2 than max of the two surrounding stretches                    |
| maxSize       | The clones may not be declared as amplifications if they belong to the states with spanning more than maxSize  |
| translen.matr | State length matrix. The output of the findTrans.func  |
| trans.matr    | Transition matrix. The output of the findTrans.func  |
| aber          | Aberration matrix. The output of the findAber.func   |
| outliers      | Outliers matrix. The output of the findOutliers.func   |
| pred          | Predicted values matrix. The output of the findOutliers.func   |
| pred.obs      | Predicted values matrix with observed values assigned to the outliers. The output of the findOutliers.func   |
| statesres     | The states output of the hmm.run.func  |

findOutliers.func 21

# **Details**

Note that all the distances are in Megabases and all the heights are on log2ratio scale.

## Value

amplif.matrix Binary matrix with a row for each clone and column for each sample. "1" indicates amplification

•••

#### 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

aCGH

findOutliers.func

Function to identify outlier clones

# Description

The function identified the clones that are outliers.

#### Usage

```
findOutliers.func(thres, factor = 4, statesres)
```

# **Arguments**

thres Estimate of experimental variability, generally, madGenome

factor Factor indicating how many standard statesres The states output of the hmm.run.func

#### **Details**

The outliers are the clones that are dissimilar enough from the clones assigned to the same state. Magnitude of the factor determines how many MADs away from a median a value needs to be to be declared an outlier. Outliers consitent over many samples may indicate technological artificat with that clone or possibly copy number polymorpism.

22 findTrans.func

## Value

outlier Binary matrix with a row for each clone and column for each sample. "1" indi-

cates outlier, 0 otherwise.

pred.obs.out Matrix with a row for each clone and column for each sample. The entries are

the median value for the state with outliers exceluded for all clones but outliers.

The value if the observed value for the outliers.

pred.out Matrix with a row for each clone and column for each sample. The entries are

the median value for the state

## 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

aCGH

findTrans.func

Funtion identifying the transitions

## **Description**

This function identifies the start and end of the states (regions with the constant estimated copy number).

## Usage

```
findTrans.func(outliers, aber, statesres)
```

## **Arguments**

outliers Binary matrix of the outliers (generally output of the findOutliers.func)

aber Binary matrix of the focal aberrations (generally output of the findAber.func)

statesres The states output of the hmm.run.func

#### **Details**

The transitions end is placed at the last non-focal aberration clone of the contiguous region containing clones belonging to the same state and transitions start is placed at the first non-focal aberration clone of the contiguous region containing clones belonging to the same state.

gainLoss 23

## Value

trans.matrix Matrix

Matrix with a row for each clone and column for each sample. The starts of the states are indicated by "1", the end are by "2" and the focal aberrations are coded as "3"

translen.matrix

Matrix with a row for each clone and column for each sample. The entries are the length of the region to which a clone belongs. Zero length is assigned to the focal aberrations. This output may be buggy at the moment.

## 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

aCGH

gainLoss

Function to compute proportion of gains and losses for each clones

# Description

This function outputs lists containing proportion of gains and losses for each clone.

# Usage

```
gainLoss(dat, cols, thres=0.25)
```

#### **Arguments**

dat log2ratios of the relevant array CGH object

cols indeces of the samples to use

thres global or tumor-specific threshold. defaults to 0.25

# Value

gainP Vector of proportion gained for each clones

lossP Vector of proportion lost for each clones

## Author(s)

Jane Fridlyand

24 heatmap

## See Also

plotFreqStat

# **Examples**

```
data(colorectal)
## Use mt.maxT function from multtest package to test
## differences in group means for each clone grouped by sex
##use only clones with show gain or loss in at least 10% of the samples
colnames(phenotype(colorectal))
sex <- phenotype(colorectal)$sex</pre>
sex.na <- !is.na(sex)</pre>
colorectal.na <- colorectal[ ,sex.na, keep = TRUE ]</pre>
factor <- 2.5
minChanged <- 0.1
gainloss <-\ gainLoss (log2.ratios(colorectal.na),\ cols=1: ncol(colorectal.na),\ thres=factor *sd.samples(colorectal.na),\ cols=1: ncol(colorectal.na),\ thres=factor *sd.samples(colorectal.na),\ cols=1: ncol(colorectal.na),\ thres=factor *sd.samples(colorectal.na),\ cols=1: ncol(colorectal.na),\ cols=1
ind.clones.use <- which(gainloss$gainP >= minChanged | gainloss$lossP>= minChanged)
#create filtered dataset
colorectal.na <- colorectal.na[ind.clones.use,keep=TRUE]</pre>
dat <- log2.ratios.imputed(colorectal.na)</pre>
resT.sex <- mt.maxT(dat, sex[sex.na],test = "t.equalvar", B = 1000)
## Plot the result along the genome
plotFreqStat(colorectal.na, resT.sex, sex[sex.na],factor=factor,titles = c("Male", "Female"))
```

heatmap

Creates heatmap array CGH objects

## **Description**

Clusters samples and produces heatmapp of the observed log2ratios.

# Usage

```
heatmap(x, imp = TRUE, Rowv = NA, Colv = NULL, distfun = dist,
    hclustfun = hclust, add.expr, symm = FALSE,
    revC = identical(Colv, "Rowv"), scale = "none",
    na.rm = TRUE, margins = c(5, 5), ColSideColors,
    RowSideColors, cexRow = 0.2 + 1 / log10(nr),
    cexCol = 0.2 + 1 / log10(nc), labRow = NULL,
    labCol = NULL, main = NULL, xlab = NULL, ylab = NULL,
    verbose = getOption("verbose"), methodR = "ward",
    methodC = "ward", zlm = c(-0.5, 0.5), ...)
```

heatmap 25

#### **Arguments**

object of the aCGH object Х logical variable indicating whether log2.ratios.imputed or log2.ratios slot imp of aCGH should be used. Defaults to imputed value (TRUE). determines if and how the row dendrogram should be computed and reordered. Rowv Either a 'dendrogram' or a vector of values used to reorder the row dendrogram or 'NA' to suppress any row dendrogram (and reordering) or by default, 'NULL' Colv determines if and how the column dendrogram should be reordered. Has the same options as the Rowv argument above and additionally when x is a square matrix, Colv = "Rowv" means that columns should be treated identically to the rows. distfun function used to compute the distance (dissimilarity) between both rows and columns. Defaults to 'dist'. hclustfun function used to compute the hierarchical clustering when 'Rowy' or 'Coly' are not dendrograms. Defaults to 'hclust' add.expr expression that will be evaluated after the call to 'image'. Can be used to add components to the plot. logical indicating if 'x' should be treated \*symm\*etrically; can only be true symm when 'x' is a square matrix. revC logical indicating if the column order should be 'rev'ersed for plotting, such that e.g., for the symmetric case, the symmetry axis is as usual. scale character indicating if the values should be centered and scaled in either the row direction or the column direction, or none. The default is "row" if symm false, and "none" otherwise. logical indicating whether 'NA's should be removed. na.rm margins numeric vector of length 2 containing the margins (see 'par(mar= \*)') for column and row names, respectively. ColSideColors (optional) character vector of length 'ncol(x)' containing the color names for a horizontal side bar that may be used to annotate the columns of 'x'. RowSideColors (optional) character vector of length 'nrow(x)' containing the color names for a vertical side bar that may be used to annotate the rows of 'x'. cexRow, cexCol positive numbers, used as 'cex.axis' in for the row or column axis labeling. The defaults currently only use number of rows or columns, respectively. labRow, labCol character vectors with row and column labels to use; these default to 'rownames(x)' or 'colnames(x)', respectively. main, xlab, ylab main, x- and y-axis titles; verbose logical indicating if information should be printed. methodR method to use for clustering rows. defaults to "ward" methodC method to use for clustering columns. defaults to "ward" all the values greater or equal than zlm are set to zlm - 0.01. a;; value less or zlm equal to -zlm are set to -zlm + 0.01

additional arguments passed on to 'image', e.g., 'col' specifying the colors.

26 human.chrom.info.Jul03

## **Details**

This function is almost identical to the heatmap in base R. The slight modifications are that (1) a user can specify clustering method for rows and columns; (2) all the values outside specified limits are floored to be 0.01 less than a limit; (3) default values are different. Note that using default option of imp (TRUE) produces nicer looking plots as all missing values are removed.

#### Value

Invisibly, a list with components

crowInd row index permutation vector as returned by order.dendrogram colInd row index permutation vector as returned by order.dendrogram

#### References

heatmap function in base R

#### See Also

aCGH clusterGenome

## **Examples**

```
#default plotting method for the aCGH object
data(colorectal)
plot(colorectal)
#to produce smoother looking heatmap, use imp = T: this will use imputed
#slot of aCGH object
plot(colorectal, imp = TRUE)
```

human.chrom.info.Jul03

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. human.chrom.info.Jul03 is loaded automatically with the aCGH package.

## Usage

human.chrom.info.Jul03

#### **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 kilobases.

centromere Location of the centromere on the chromosome (kb).

## **Details**

This file is used for many plotting functions and needs to correspond to clones.info mapping file. The centromeric location is approximately extimated 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

human.chrom.info.May04

Basic Chromosomal Information for UCSC Human Genome Assembly May 2004 freeze

#### **Description**

This dataset contains basic chromosomal information for UCSC Human Genome Assembly May 2004 freeze. human.chrom.info.May04 is loaded automatically with the aCGH package.

## Usage

human.chrom.info.May04

## **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 kilobases.

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

#### Details

This file is used for many plotting functions and needs to correspond to clones.info mapping file. The centromeric location is approximately extimated 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.

28 impute.HMM

## Source

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

impute.HMM

Imputing log2 ratios using HMM

# **Description**

Imputing log2 ratios using the output of the HMM segmenttation

# Usage

```
impute.HMM(aCGH.obj, chrominfo = human.chrom.info.Jul03, maxChrom =
23, use.BIC = TRUE)
```

## **Arguments**

aCGH. obj Object of class aCGH.

chrominfo a chromosomal information associated with the mapping of the data

maxChrom Highest chromosome to impute.

use.BIC logical parameter; if true impute missing values based on the Hidden Markov

Model selected using Bayesian Information Criterion impute missing data, oth-

erwise use AIC.

#### **Details**

See details in aCGH discussion.

# Value

Computes and returns the imputed log2 ratio matrix of the aCGH object using the output of the Hidden Markov Model segmentation done by invoking find.hmm.states function.

## See Also

```
aCGH, find.hmm.states, impute.lowess.
```

impute.lowess 29

impute.lowess

Imputing log2 ratios

## **Description**

Imputing log2 ratios

## Usage

```
impute.lowess(aCGH.obj, chrominfo = human.chrom.info.Jul03, maxChrom =
23, smooth = 0.1)
```

#### **Arguments**

aCGH. obj Object of class aCGH.

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 fuctions 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 os 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

```
aCGH, impute.HMM.
```

30 mergeFunc

## **Examples**

mergeFunc

Funtion to merge states based on their state means

# **Description**

mergeFunc takes the output of hmm.run.func (or find.hmm.states) with a particular model selection criterion and iteratively merges the states with means closer than a supplied threshold. mergeHmmStates is a frontend for mergeFunc using aCGH object.

## Usage

```
mergeHmmStates(aCGH.obj, model.use = 1, minDiff = 0.25)
mergeFunc(statesres, minDiff = 0.1)
```

# **Arguments**

| aCGH.obj  | Object of class aCGH.   |
|-----------|---|
| statesres | the sublist of the states.hmm list output from $\verb find.hmm.states $ for a given model selection crterion                          |
| minDiff   | The states whose predicted values are less than minDiff apart are merged into one state and all the predicited values are recomputed. |
| model.use | Model selection criterion to use, See find.hmm.states.  |

#### **Details**

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

mergeLevels 31

# Value

List containing states.hmm object is returned.

# 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

aCGH, find.hmm.states

|--|

# Description

Merging of predicted levels for array CGH data and similar.

# Usage

mergeLevels(vecObs,vecPred,pv.thres=0.0001,ansari.sign=0.05,thresMin=0.05,thresMax=0.5,verbose=1,sc

# **Arguments**

| vec0bs      | Vector of observed values, i.e. observed log2-ratios  |
|-------------|---|
| vecPred     | Vector of predicted values, i.e. mean or median of levels predicted by segmentation algorithm   |
| pv.thres    | Significance threshold for Wilcoxon test for level merging  |
| ansari.sign | Significance threshold for Ansari-Bradley test  |
| thresMin    | merge if segment medians are closer than thresMin , defaiult is $0.05$  |
| thresMax    | don't merge if segment medians are further than thresMax (unless needs to be merged for a different reason: wilcoxon test), default is .5 |
| verbose     | if 1, progress is printed   |
| scale       | whether thresholds are on the log2ratio scale and thus need to be converted to the copy number. default is TRUE                           |

# **Details**

mergeLevels takes a vector of observed log2-ratios and predicted log2ratios and merges levels that are not significantly distinct.

32 mergeLevels

## Value

| vecMerged | Vector with merged values. One merged value returned for each predicted/observed value  |
|-----------|---|
| mnNow     | Merged level medians  |
| sq        | Vector of thresholds, the function has searched through to find optimum. Note, these thresholds are based on copy number transformed values |
| ansari    | The p-values for the ansari-bradley tests for each threshold in sq  |

# Note

vecObs and vecPred must have same length and observed and predicted value for a given probe should have same position in vecObs and vedPred. The function assumes that log2-ratios are supplied

## Author(s)

Hanni Willenbrock (<Hanni@cbs.dtu.dk>) and Jane Fridlyand (<jfridlyand@cc.ucsf.edu>)

#### References

Willenbrock H, Fridlyand J. (2005). A comparison study: applying segmentation to array CGH data for downstream analyses. Bioinformatics. 2005 Sep 14; [Epub ahead of print]

```
# Example data of observed and predicted log2-ratios
vecObs <- c(rep(0,40),rep(0.6,15),rep(0,10),rep(-0.4,20),rep(0,15))+rnorm(100,sd=0.2)
vecPred <- c(rep(median(vecObs[1:40]),40),rep(median(vecObs[41:55]),15),
    rep(median(vecObs[56:65]),10),rep(median(vecObs[66:85]),20),rep(median(vecObs[86:100]),15))

# Plot observed values (black) and predicted values (red)
plot(vecObs,pch=20)
points(vecPred,col="red",pch=20)

# Run merge function
merge.obj <- mergeLevels(vecObs,vecPred)

# Add merged values to plot
points(merge.obj$vecMerged,col="blue",pch=20)

# Examine optimum threshold
merge.obj$sq</pre>
```

plotFreqStat 33

| n1 | <u>~</u> + | E۳ | ~~ | C+  | <b>~</b> + |  |
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frequency plots and significance analysis

# **Description**

The main application of this function is to plot the frequency of changes.

# Usage

# **Arguments**

| Object of class aCGH  |
|---|
| Data frame having the same structure as the result of applying mt.maxT or mt.minP functions from Bioconductor's multtest package for multiple testing. The result is a data frame including the following 4 components: 'index', 'teststat', 'rawp' and 'adjp'.   |
| phenotype to compare.   |
| Chromosomal information. Defaults to human.chrom.info.Jul03   |
| Include X chromosome? Defaults to yes.  |
| Include Y chromosome? Defaults to no.   |
| rsp.uniq specified the codes for the groups of interest. Default is the unique levels of the phenotype. Not used when all is T.   |
| all specifies whether samples should be analyzed by subgroups (T) or together (F).  |
| titles names of the groups to be used. Default is the unique levels of the pheno.   |
| only clones with at least cutplot frequency of gain and loss are plotted.   |
| thres is either a vector providing unique threshold for each sample or a vector of the same length as number of samples (columns in data) providing sample-specific threshold. If aCGH.obj has non-null sd.samples, then thres is automatically replaced by factor times madGenome of aCGH object. Clone is considered to be gained if it is above the threshold and lost if it below negative threshold. Used for plotting the gain/loss frequency data as well as for clone screening and for significance analysis when threshold is TRUE.Defaults to 0.25 |
|   |

34 plotFreqStat

factor specifies the number by which experimental variability should be mulfactor tiplied. used only when sd.samples(aCGH.obj) is not NULL or when factor is greater than 0. Defaults to 2.5 ylm vertical limits for the plot ylm p. thres vector of p-value ciut-off to be plotted. computed conservatively as the p.thres threshold corresponding to a given adjusted p-value. numaut number of the autosomes numaut onepage whether all plots are to be plotted on one page or different pages. When onepage more than 2 groups are compared, we recommend multiple pages. colored Is plotting in color or not? Default is TRUE.

```
data(colorectal)
## Use mt.maxT function from multtest package to test
## differences in group means for each clone grouped by sex
colnames(phenotype(colorectal))
sex <- phenotype(colorectal)$sex</pre>
sex.na <- !is.na(sex)</pre>
colorectal.na <- colorectal[ ,sex.na, keep = TRUE ]</pre>
dat <- log2.ratios.imputed(colorectal.na)</pre>
resT.sex <- mt.maxT(dat, sex[sex.na], test = "t", B = 1000)</pre>
## Plot the result along the genome
plotFreqStat(colorectal.na, resT.sex, sex[sex.na],
             titles = c("Male", "Female"))
## Adjust the p.values from previous exercise with "fdr"
## method and plot them
resT.sex.fdr <- resT.sex
resT.sex.fdr$adjp <- p.adjust(resT.sex.fdr$rawp, "fdr")</pre>
plotFreqStat(colorectal.na, resT.sex.fdr, sex[sex.na],
             titles = c("Male", "Female"))
## Derive statistics and p-values for testing the linear association of
## age with the log2 ratios of each clone along the samples
age <- phenotype(colorectal)$age
age.na <- which(!is.na(age))</pre>
age <- age[age.na]
colorectal.na <- colorectal[, age.na]</pre>
stat.age <- aCGH.test(colorectal.na, age, test = "linear.regression", p.adjust.method = "fdr")
#separate into two groups: < 70 and > 70 and plot freqeuncies of gain and loss
#for each clone. Note that statistic plotted corresponds to linear coefficient
#for age variable
plotFreqStat(colorectal.na, stat.age, ifelse(age < 70, 0, 1), titles =</pre>
             c("Young", "Old"), X = FALSE, Y = FALSE)
```

plotGenome 35

| plotGenome | Plots the genome |
|------------|------------------|
|            |                  |

# **Description**

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

# Usage

# Arguments

| aCGH.obj    | an object of class aCGH  |
|-------------|--|
| samples     | vector containing indeces of the samples to be plotted.  |
| naut        | number of autosomes in the organism  |
| Υ           | TRUE if chromosome Y is to be plotted, FALSE otherwise   |
| X           | TRUE if chromosome X is to be plotted, FALSE otherwise   |
| data        | a matrix containing values to use for plotting. defaults to the $log2.ratios(aCGH.obj)$ .                          |
| chrominfo   | a chromosomal information associated with the mapping of the data.   |
| yScale      | Minimum y-scale to use for plotting. Scale is expanded if any of the values exceed the positive or negative limit. |
| samplenames | sample names.  |
| ylb         | label for the Y-axis.  |
|             |  |

# See Also

aCGH

```
#plot samples in the order of descending quality
data(colorectal)
order.quality <- order(sd.samples(colorectal)$madGenome)
pdf("plotGenome.orderByQuality.pdf")
par(mfrow=c(2,1))
for(i in order.quality)
    plotGenome(colorectal, samples = i, Y = FALSE)
dev.off()</pre>
```

36 plotHmmStates

| plotHmmStates  | Plotting the estimated hmm states and      | d 1002 | ratios for each sample |
|----------------|--|--------|------------------------|
| protiminatates | I withing the estimated filling states and | u 1082 | ranos joi each sample. |

# **Description**

This function displays the estimated hmm states and log2 ratios for each sample.

#### Usage

# Arguments

aCGH.obj object of class aCGH

sample.ind index of the sample to be plotted relative to the data matrix (i.e. column index

in the file)

statesres matrix containing states informations. defaults to the states selected using the

first model selection criterionof aCGH.obj

chr vector of chromosomes to be plotted

yScale specified scale for Y-exis
maxChrom highest chromosome to show

chrominfo a chromosomal information associated with the mapping of the data

samplenames vector of sample names

## **Details**

Each chromosome is plotted on a separate page and contains two figures. The top figure shows the observed log2ratios and the bottom figure shows predicted values for all clones but outliers which show observed values. The genomic events are indicated on both figures as following. The first clone after transition is indicated with solid blue line and the last clone after transitions is shown with dotted green line. Focal aberrations clones are colored orange, amplifications are colored red and outliers are yellow.

#### Author(s)

Jane Fridlyand

#### References

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

plotSummaryProfile 37

# See Also

```
aCGH find.hmm.states plotGenome
```

## **Examples**

```
data(colorectal)
plotHmmStates(colorectal, 1)
```

plotSummaryProfile

plotSummaryProfile

# **Description**

This function display the genomic events and tests for the differences between groups if they are specified.

# Usage

# **Arguments**

negThres

| aCGH.obj        | an object of aCGH class.  |
|-----------------|---|
| response        | phenotype to compare. defaults to all the samples being analyzed together.  |
| titles          | titles for the groups, defaults to the name of the response   |
| Χ               | logical indicating whether X needs to be shown  |
| Υ               | logical indicating whether Y needs to be shown  |
| maxChrom        | this parameter controls how many chromosomes will be plotted, from 1 to max-Chrom $$  |
| chrominfo       | a chromosomal information associated with the mapping of the data   |
|                 |   |
| num.plots.per.p | age   |
| num.plots.per.p | page number of frequency plots per page. Default is the number of groups  |
| num.plots.per.p |   |
|                 | number of frequency plots per page. Default is the number of groups factor specifies the number by which experimental variability should be multiples. Used only when tumor specific variability in aCGH.obj is not NULL. |

Threshold for homozygous deletion

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## **Details**

This function utilizes output of the find.genomic.events by plotting it and testing between groups. The test are performed using kruskal-wallis rank test.

#### See Also

```
aCGH find.genomic.events
```

# **Examples**

```
data(colorectal)
## Plotting summary of the sample profiles
plotSummaryProfile(colorectal)
```

states.hmm.func

A function to fit unsupervised Hidden Markov model

# Description

This function is a workhorse of find. hmm. states. It operates on the individual chromosomes/samples and is not called directly by users.

# Usage

# **Arguments**

| sample   | sample identifier  |
|----------|--|
| chrom    | chromosome identifier  |
| dat      | dataframe with clones in the rows and samples in the columns   |
| datainfo | dataframe containing the clones information that is used to map each clone of the array to a position on the genome. Has to contain columns with names Clone/Chrom/kb containing clone names, chromosomal assignment and kb positions respectively |
| vr       | Initial experimental variance  |
| maxiter  | Maximum number of iterations   |
| aic      | TRUE or FALSE variable indicating whether or nor AIC criterion should be used for model selection (see DETAILS)  |

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bic TRUE or FALSE variable indicating whether or nor BIC criterion should be

used for model selection (see DETAILS)

delta numeric vector of penalty factors to use with BIC criterion. If BIC is true,

delta=1 is always calculated (see DETAILS)

nlists defaults to 1 when aic=TRUE, otherwise > 1

eps parameter controlling the convergence of the EM algorithm.

print.info print.info = T allows diagnostic information to be printed on the screen.

diag.prob parameter controlling the construction of the initial transition probability matrix.

#### See Also

aCGH

summarize.clones Extracting summary information for all clones

## **Description**

summarize.clones function is the text equivalent of plotFreqStat function - it summarizes the frequencies of changes for each clone across tumors and when available assigns statistics. The resulting table can be easily exported.

# Usage

summarize.clones(aCGH.obj, resT = NULL, pheno = rep(1, ncol(aCGH.obj)), rsp.uniq = unique(pheno), thres

## **Arguments**

aCGH.obj object here

resT Data frame having the same structure as the result of applying mt.maxT or

mt.minP functions from Bioconductor's multtest package for multiple testing. The result is a data frame including the following 4 components: 'index', 'teststat', 'rawp' and 'adjp'.Default is the unique levels of the phenotype. Not

used when all is TRUE.

pheno phenotype to compare

rsp.uniq rsp.uniq specified the codes for the groups of interest. Default is the unique

levels of the phenotype. Not used when all is TRUE.

thres is either a vector providing unique threshold for each sample or a vector

of the same length as number of samples (columns in data) providing sample-specific threshold. If aCGH.obj has non-null sd.samples, then threshold is automatically replaced by tumor-specific sd multiplied by factor. Clone is considered to be gained if it is above the threshold and lost if it below negative

threshold. Defaults to 0.25

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| factor | factor specifies the number by which experimental variability should be multiples. used only when tumor specific variability in aCGH.obj is not NULL. Defaults to 2.5 |
|--------|---|
| all    | all specifies whether samples should be analyzed by subgroups (TRUE) or together (FALSE) $$   |
| titles | titles names of the groups to be used. Default is the unique levels of the pheno.   |

# Value

Returns matrix containg the following information for each clones: annotation (same as in clones.info), number and proportion of samples where clone is present, gained and lost; and the same in each group if more than one group. Additionally, if significance comparison has been done, value of the statistic, unadjusted p-value and adjusted p-values are included for each clone.

## Author(s)

Jane Fridlyand

## See Also

```
plotFreqStat, aCGH
```

# **Examples**

```
data(colorectal)
summarize.clones(colorectal)
```

threshold.func

Function to indicate gain or loss for each clone for each sample

## **Description**

This function outputs a matrix containing gain/loss indicator for each clone and sample.

# Usage

```
threshold.func(dat, posThres, negThres = NULL)
```

# **Arguments**

dat log2ratios of the relevant array CGH object posThres Global or sample-specific threshold for gain

negThres Global or sample-specific threshold for loss. Defaults to -posThres

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# Value

Returns a matrix with a row for each clone and column for each sample. "1" indicates gain and "-1" indicates loss.

# Author(s)

Jane Fridlyand, Ritu Roydasgupta

```
data(colorectal)

factor <- 3
tbl <- threshold.func(log2.ratios(colorectal),posThres=factor*(sd.samples(colorectal)$madGenome))
rownames(tbl) <- clone.names(colorectal)
colnames(tbl) <- sample.names(colorectal)
tbl[1:5,1:5]</pre>
```

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