# Package 'CNprep'

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Title Pre-process DNA Copy Number (CN) Data for Detection of CN Events

Type Package

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|--|
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| <b>Description</b> This package evaluates DNA copy number data, using both their initial form (copy number as a noisy function of genomic position) and their approximation by a piecewise-constant function (segmentation), for the purpose of identifying genomic regions where the copy number differs from the norm. |
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| annotexample | Annotation table for ROMA CGH platform and human genome version 17. |
|--------------|---|
|--------------|---|

# Description

Whole genome annotation table using Representational Oligonucleotide Microarray Analysis (ROMA) CGH platform, human genome version 17.

#### Usage

```
data(annotexample)
```

#### **Format**

A data frame with 83055 observations on the following 3 variables.

```
PROBEID a character vector
CHROM a numeric vector
CHROM.POS a numeric vector
```

#### **Details**

The values in the chromosome column are all integer, with 23 corresponding to X, 24 to Y and 25 to a set of non-human test probes.

#### **Source**

GEO accession GPL9775, http://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GPL9775

# **Examples**

```
data(annotexample)
```

applyCNPmask

Apply a mask to a table of copy number events.

#### **Description**

A mask is applied to amplified or deleted segments as tabulated in segtable. A decision whether to mask a segment is taken based on what portion of the segment is covered by the mask. A position is chosen at random within a segment to be masked, the flanking segments are extended to that position and the segment to be masked is indicated as such in the value returned.

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# Usage

applyCNPmask(segtable,chrom,startPos,endPos,startProbe,endProbe,
eventIndex,masktable,maskchrom,maskstart,maskend,maskindex,mincover=1,
indexvals=c(-1,1))

#### Arguments

segtable A matrix or a data frame with columns named or enumerated by the values of

chrom, startPos, endPos, startProbe, endProbe, eventIndex.

chrom A character string specifying the name for the column in segtable tabulating

the (integer) chromosome number for each segment.

startPos, endPos

Character strings or integers specifying the names or numbers of columns in segtable that tabulate the (integer) genomic start and end coordinates of each

segment.

startProbe, endProbe

Character strings specifying the names of columns in segtable that tabulate the (integer) start and end postions of each segment in internal units such as probe

numbers for data of CGH microarray origin.

eventIndex A character string giving the name of a column in segtable where copy number

variation status of the segments is tabulated.

masktable A matrix or a data frame with columns named or enumerated as given by maskchrom, maskstart, masket

and with rows corresponding to genomic intervals that comprise the mask.

maskchrom, maskstart, maskend

Character strings or integers specifying the names or numbers of columns in masktable that tabulate the chromosome number and (integer) genomic start

and end coordinates of the intervals comprising the mask.

maskindex A numeric vector corresponding to eventIndex, specifying copy number events

status for measuring units.

mincover A numeric value specifying the minimal portion of the segment that must be

covered by the mask in order to trigger masking.

indexvals A numeric vector of length 2 specifying the two values in maskindex to be

matched with values in eventIndex to determine the events that are to be masked.

# Details

Masking is performed separately for each value in indexvals. Segments (rows of segtable) with that value of eventIndex are examined for coverage by mask intervals with that value of maskindex in masktable. If the coverage is at least mincover, the segment is slated for masking, while its flanking segments are extended to a random point within the segment being masked.

# Value

A matrix with same number of observations/rows as segtable and with following three columns: startProbe, endProbe

An integer vector for the start and end positions of the segments after masking.

to remove An integer vector whose values are 1 if the segment is masked and 0 otherwise.

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# Author(s)

Alex Krasnitz

#### **Examples**

```
## Not run:
data(segexample)
data(ratexample)
data(normsegs)
data(cnpexample)
segtable<-CNpreprocessing(segall=segexample[segexample[,"ID"]=="WZ1",],</pre>
ratall=ratexample, "ID", "start", "end", chromcol="chrom", bpstartcol="chrom.pos.start",
bpendcol="chrom.pos.end",blsize=50,minjoin=0.25,cweight=0.4,bstimes=50,
chromrange=1:22,distrib="Rparallel",njobs=2,modelNames="E",normalength=normsegs[,1],
normalmedian=normsegs[,2])
#form a eventIndex vector
eventIndex<-rep(0,nrow(segtable))</pre>
eventIndex[segtable[,"marginalprob"]<1e-4&segtable[,"negtail"]>
0.999&segtable[,"mediandev"]<0] <- -1
eventIndex[segtable[,"marginalprob"]<1e-4&segtable[,"negtail"]>
0.999&segtable[,"mediandev"]>0] <- 1
segtable<-cbind(segtable,eventIndex)</pre>
#form a cnpindex vector
namps17<-cnpexample[cnpexample[, "copy.num"]=="amp",]</pre>
aCNPmask<-makeCNPmask(imat=namps17, chromcol=2, startcol=3, endcol=4,
nprof=1203, uthresh=0.02, dthresh=0.008)
ndels17<-cnpexample[cnpexample[, "copy.num"]=="del",]</pre>
dCNPmask<-makeCNPmask(imat=ndels17,chromcol=2,startcol=3,endcol=4,
nprof=1203, uthresh=0.02, dthresh=0.008)
cnptable<-rbind(cbind(aCNPmask,cnpindex=1),cbind(dCNPmask,cnpindex=-1))</pre>
#run the CNP test
myCNPtable<-applyCNPmask(segtable, "chrom", startPos="chrom.pos.start",</pre>
endPos="chrom.pos.end", "start", "end", "eventIndex", masktable=cnptable, "chrom",
maskstart="start", maskend="end", maskindex="cnpindex", mincover=0.005, indexvals=c(-1,1))
## End(Not run)
```

cnpexample

Example of a boundary positions table.

# **Description**

A table of genomic positions for DNA copy-number changing events, collected from genomes of 1203 individuals using Representational Oligonucleotide Microarray Analysis (ROMA) platform.

#### Usage

```
data(cnpexample)
```

#### **Format**

A data frame with 19188 rows and 4 columns.

copy.num a character vector indicating whether an event is a gain ("amp") or a loss ("del"). chrom a numeric vector indicating which chromosome the event is in.

chrom.start a numeric vector of event start positions.

chrom. end a numeric vector of event start positions.

#### Source

Strong association of de novo copy number mutations with autism. Sebat J, Lakshmi B, Malhotra D, Troge J, Lese-Martin C, Walsh T, Yamrom B, Yoon S, Krasnitz A, Kendall J, Leotta A, Pai D, Zhang R, Lee YH, Hicks J, Spence SJ, Lee AT, Puura K, Lehtimaki T, Ledbetter D, Gregersen PK, Bregman J, Sutcliffe JS, Jobanputra V, Chung W, Warburton D, King MC, Skuse D, Geschwind DH, Gilliam TC, Ye K, Wigler M. Science. 2007 Apr 20;316(5823):445-9.

#### **Examples**

data(cnpexample)

CNpreprocessing

*Pre-process DNA copy number (CN) data for detection of CN events.* 

#### **Description**

Description: The package evaluates DNA copy number data, using both their intitial form (copy number as a noisy function of genomic position) and their approximation by a piecewise-constant function (segmentation), for the purpose of identifying genomic regions where the copy number differs from the norm.

#### Usage

```
CNpreprocessing(segall, ratall = NULL, idcol = NULL, startcol = NULL, endcol = NULL, medcol = NULL, madcol = NULL, errorcol = NULL, chromcol = NULL, bpstartcol = NULL, bpendcol = NULL, annot = NULL, annotstartcol = NULL, annotendcol = NULL, annotchromcol = NULL, useend = F, blsize = NULL, minjoin = NULL, ntrial = 10, bestbic = -1e+07, modelNames = "E", cweight = NULL, bstimes = NULL, chromrange = NULL, myseed = 123, distrib = c("vanilla", "Rparallel"), njobs = 1, normalength = NULL, normalmedian = NULL, normalmad = NULL, normalerror = NULL)
```

#### **Arguments**

segall

A matrix or a data frame for segmented copy number profiles. It may have a character column, with a name specified by idcol, and/or numeric columns with names specified by startcol, endcol, medcol, madcol, errorcol, chromcol, bpstartcol, bpendcol. Each row of segall corresponds to a segment belonging to one of the profiles to be pre-processed.

ratall

A matrix whose rows correspond to genomic positions and columns to copy number profiles. Its matrix elements are functions of copy number, most often log ratios of copy number to the expected standard value, such as 2 in diploid genomes.

idcol

A character string specifying the name for the column in segal1 tabulating the profile IDs.

startcol, endcol

Character strings specifying the names of columns in segal1 that tabulate the (integer) start and end postions of each segment in internal units such as probe numbers for data of CGH microarray origin.

medcol, madcol, errorcol

Character strings specifying the names of columns in segal1 that, for the function of copy number used in the study (typically log ratios), tabulate the (numeric) values for the function (medcol), a measure of its spread (madcol) and its error (errorcol) for the segment.

chromcol

A character string specifying the name for the column in segal1 tabulating the (integer) chromosome number for each segment.

bpstartcol, bpendcol

Character strings specifying the names of columns in segal1 that tabulate the (integer) genomic start and end coordinates of each segment.

annot

A matrix or a data frame that contains the annotation for the copy number measurement platform in the study. It is generally expected to contain columns with names specified by annotstartcol, annotendcol, annotchromcol.

annotstartcol, annotendcol, annotchromcol

Character strings specifying the names of columns in annot that tabulate the (integer) genomic start and end coordinates and the chromosome number for each copy number measuring unit, such as a probe in case of CGH microarrays.

useend

A single logical value specifying whether the segment end positions as given by the bpendcol of segall are to be looked up in the annotendcol column of annot (if useend=TRUE) or in the annotstartcol column (default).

blsize

A single integer specifying the bootstrap sampling rate of segment medians to generate input for model-based clustering. The number of times a segment is sampled is then given by the (integer) division of the segment length in internal units by blsize.

minjoin

A single numeric value between 0 and 1 specifying the degree of overlap above which two clusters will be joined into one.

ntrial

A single integer specifying the number of times a model-based clustering is attempted for each profile in order to achieve the highest Bayesian information criterion (BIC).

bestbic A single numeric value for initalizing BIC maximization. A large negative value

is recommended. The default is -1e7.

modelNames A vector of character strings specifying the names of models to be used in

model-based clustering (see package mclust for further details). The default

is "E".

cweight A single numeric value between 0 and 1 specifying the minimal share of the

central cluster in each profile.

bstimes A single integer value specifying the number of time the median of each segment

is sampled in order to predict the cluster assignment for the segment.

chromrange A numeric vector enumerating chromosomes from which segments are to be

used for initial model-based clustering.

myseed A single integer value to seed the random number generator.

distrib One of "vanilla", "Rparallel" to specify the distributed computing option

for the cluster assignment step. For "vanilla" (default) no distributed computing is performed. For "Rparallel" the parallel package of R core is used for

multi-core processing.

njobs A single integer specifying the number of worker jobs to create in case of dis-

tributed computation.

normalength An integer vector specifying the genomic lengths of segments in the normal

reference data.

normalmedian, normalmad, normalerror

Numeric vectors, of the same length as normalength, specifying the segment

values, value spreads and errors of the normal reference segments.

#### **Details**

Depending on the availability of input, the function will perform the following operations for each copy number profile.

If raw data are available in addition to segment start and end positions, median and MAD of each segment will be computed. For each profile, bootstrap sampling of the segment median values will be performed, and the sample will be used to estimate the error in the median for each segment. Model-dependent clustering (fitting to a gaussian mixture) of the sample will be performed. The central cluster (the one nearest the expected unaltered value) will be identified and, if necessary, merged with adjacent clusters in order to comprise the minimal required fraction of the data. Deviation of each segment from the center, its probability to belong to the central cluster and its marginal probability in the central cluster will be computed.

If segment medians or median deviations are available or have been computed, and, in addition, genomic lengths and average values are given for a collection of segments with unaltered copy number, additional estimates will be performed. If median values are available for the unaltered segments, the marginal probability of the observed median or median deviation in the unaltered set will be computed for each segment. Likewise, marginal probabilities for median/MAD and/or median/error will be computed if these statistics are available.

#### Value

The input segall data frame to which some or all of the following columns may be bound, depending on the availability of input:

segmedian Median function of copy number

segmad MAD for the function of copy number

median dev median function of copy number relative to its central value

segerr error estimate for the function of copy number

segz the probability that the segment is in the central cluster

marginal probability for the segment in the central cluster

negtail the probability of finding the deviation as observed or larger in a collection of

central segments

negtailnormad the probability of finding the deviation/MAD as observed or larger in a collec-

tion of central segments

negtailnormerror

the probability of finding the deviation/error as observed or larger in a collection

of central segments

# Author(s)

Alex Krasnitz

# **Examples**

```
data(segexample)
data(ratexample)
data(normsegs)
#small tov example
segtable<-CNpreprocessing(segall=segexample[segexample[,"ID"]=="WZ1",],</pre>
ratall=ratexample, "ID", "start", "end", chromcol="chrom", bpstartcol="chrom.pos.start",
bpendcol="chrom.pos.end",blsize=50,minjoin=0.25,cweight=0.4,bstimes=50,
chromrange=1:3,distrib="Rparallel",njobs=2,modelNames="E",
normalength=normsegs[,1],normalmedian=normsegs[,2])
## Not run:
#Example 1: 5 whole genome analysis, choosing the right format of arguments
segtable<-CNpreprocessing(segall=segexample,ratall=ratexample,"ID","start","end",
chromcol="chrom", bpstartcol="chrom.pos.start", bpendcol="chrom.pos.end", blsize=50,
minjoin=0.25,cweight=0.4,bstimes=50,chromrange=1:22,distrib="Rparallel",njobs=40,
modelNames="E",normalength=normsegs[,1],normalmedian=normsegs[,2])
#Example 2: how to use annotexample, when segment table does not have columns of
#integer postions in terms of measuring units(probes), such as "mysegs" below
mysegs<-segexample[,c(1,5:12)]</pre>
data(annotexample)
segtable<-CNpreprocessing(segall=mysegs,ratall=ratexample,"ID",chromcol="chrom",
bpstartcol="chrom.pos.start",bpendcol="chrom.pos.end",annot=annotexample,
annotstartcol="CHROM.POS", annotendcol="CHROM.POS", annotchromcol="CHROM",
blsize=50,minjoin=0.25,cweight=0.4,bstimes=50,chromrange=1:22,distrib="Rparallel",
njobs=40,modelNames="E",normalength=normsegs[,1],normalmedian=normsegs[,2])
## End(Not run)
```

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|----|-----|-----|----|----|---|
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Given a set of copy-number events, create a DNA copy-number mask

# **Description**

The function takes as an input a set of intervals with integer-valued boundary positions. It then finds interval regions where the event count is above each of two thresholds, upper and lower, and returns those interval regions with the count above the lower threshold that contain interval regions with the count above the upper threshold.

# Usage

```
makeCNPmask(imat,chromcol=1,startcol=2,endcol=3,nprof=1,uthresh,dthresh)
```

# **Arguments**

imat

A matrix or a data frame tabulating the chromosome number and endpoint posi-

tions of the interval events.

chromcol, startcol, endcol

Character strings or integers specifying the columns of imat containing the chromosome number and the left (right) endpoint positions of the interval events.

nprof

An integer specifying the number of copy number profiles from which the events originate.

uthresh, dthresh

Numeric, specifying the upper and lower thresholds for the event frequency or (if nprof =1) for the event count.

#### Value

An integer matrix with three columns, called "chrom", "start" and "end", specifying the chromosome number and boundary positions of the mask.

#### Author(s)

Alex Krasnitz, Guoli Sun

# **Examples**

```
#load a table of copy number events collected from 1203 profiles.
data(cnpexample)
#Create a table of gain (amplification) events only.
amps<-cnpexample[cnpexample[,"copy.num"]=="amp",]</pre>
#Create a mask using this table.
ampCNPmask<-makeCNPmask(imat=amps,chromcol="chrom",startcol="chrom.start",</pre>
endcol="chrom.end", nprof=1203, uthresh=0.02, dthresh=0.008)
```

10 normsegs

normsegs

A reference set of segments

## **Description**

A table of segment lengths and log copy number ratios for a large set of human diploid genomes.

#### Usage

data(normsegs)

#### **Format**

A data matrix with 43497 rows/segments and 2 columns/variables.

length a numeric vector of segment genomic length

segmedian a numeric vector of segment median computed from log copy number ratio

#### **Details**

The table originates in a set of copy number profiles of over a 1000 individuals, obtained using Representational Oligonucleotide Microarray Analysis (ROMA) technology. To ensure ploidy of 2 segments from X and Y chromosomes and segemnts shorter than 5Mb were excluded.

## Source

Science. 2007 Apr 20;316(5823):445-9. Epub 2007 Mar 15.

Strong association of de novo copy number mutations with autism.

Sebat J, Lakshmi B, Malhotra D, Troge J, Lese-Martin C, Walsh T, Yamrom B, Yoon S, Krasnitz A, Kendall J, Leotta A, Pai D, Zhang R, Lee YH, Hicks J, Spence SJ, Lee AT, Puura K, Lehtimaki T, Ledbetter D, Gregersen PK, Bregman J, Sutcliffe JS, Jobanputra V, Chung W, Warburton D, King MC, Skuse D, Geschwind DH, Gilliam TC, Ye K, Wigler M.

#### **Examples**

data(normsegs)

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ratexample

Example of copy number log ratio data

# **Description**

Log ratio data for 5 breast cancer genomes, derived using Representational Oligonucleotide Microarray Analysis (ROMA), an array-based hybridization method that uses genomic complexity reduction based on representations.

# Usage

```
data(ratexample)
```

#### **Format**

A log ratio data matrix with rows of 83055 oligonucleotide probes, and columns of 5 breast tumors.

#### **Details**

The values are natural log copy number ratios, consistent with data in segexample (segmented data for these tumors) and normsegs. These copy number ratios are normalized using an intensity-based lowess curve fitting algorithm.

#### **Source**

Genome Res. 2006 Dec;16(12):1465-79.

Novel patterns of genome rearrangement and their association with survival in breast cancer.

Hicks J, Krasnitz A, Lakshmi B, Navin NE, Riggs M, Leibu E, Esposito D, Alexander J, Troge J, Grubor V, Yoon S, Wigler M, Ye K, Borresen-Dale AL, Naume B, Schlicting E, Norton L, Hagerstrom T, Skoog L, Auer G, Maner S, Lundin P, Zetterberg A.

# **Examples**

```
data(ratexample)
#Plot the whole genome log ratio data for the first profile
#Note X and Y chromosomes at the far right of the plot
plot(ratexample[,1])
```

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segexample

Example of a segmented copy number table.

#### **Description**

Segmented log ratio data for 5 breast cancer genomes, derived using Representational Oligonucleotide Microarray Analysis (ROMA) platform. ROMA detects genomic amplifications and deletions with boundaries defined at a resolution of 50 kb. In this segmented table, each row represents a segment.

#### Usage

```
data(segexample)
```

#### **Format**

A data frame with 479 rows/segments and 12 columns/variables.

start a numeric vector (segment start probe number)
end a numeric vector (segment end probe number)
num.probes a numeric vector (number of probes in the segment)
seg.median a numeric vector (median log ratio)
chrom a numeric vector (chromosome number)
chrom.pos.start a numeric vector (genomic start)
chrom.pos.end a numeric vector (genomic end)
cytoband.start a character vector (cytogenetic band start)
cytoband.end a character vector (cytogenetic band end)
abs.pos.start a numeric vector (genomic start, absolute)

abs.pos.end a numeric vector (genomic end, absolute)

#### **Details**

Segment medians are computed from log copy number ratio. The corresponding raw data table is ratexample in this package.

#### Source

Genome Res. 2006 Dec;16(12):1465-79.

Novel patterns of genome rearrangement and their association with survival in breast cancer.

Hicks J, Krasnitz A, Lakshmi B, Navin NE, Riggs M, Leibu E, Esposito D, Alexander J, Troge J, Grubor V, Yoon S, Wigler M, Ye K, Borresen-Dale AL, Naume B, Schlicting E, Norton L, Hagerstrom T, Skoog L, Auer G, Maner S, Lundin P, Zetterberg A.

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# Examples

data(segexample)

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