Package 'cancerTiming'

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 Title Estimation of Temporal Ordering of Cancer Abnormalities

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Description Timing copy number changes using estimates of mutational allele frequency from resequencing of tumor samples.

Depends R (>= 2.11.0)

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Imports utils, stats, grDevices, graphics, LearnBayes, gplots

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R topics documented:

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alleleFrequency Get allele frequencies for tumor data

Description

Calculate allele frequencies that would be possible for a variant found in a region with a given number of total copies of the tumor, adjusted for the given percentage of normal contamination.

Usage

```
allAF(totalCopy,normCont=0,totalCopyNormal=2,
type=c("mutation","SNPHet","SNPHomo"))
contAF(trueAF, totalCopy, normCont = 0, totalCopyNormal = 2,
type = c("mutation", "SNPHet", "SNPHomo"))
decontAF(contAF, totalCopy, normCont = 0, totalCopyNormal = 2,
type = c("mutation", "SNPHet", "SNPHomo"))
errorAF(trueAF,seqError=0)
```

Arguments

totalCopy	total number of copies of DNA of the tumor, integer						
normCont	proportion of normal contamination (see Details)						
totalCopyNormal							
	total number of copies of DNA in the normal sample						
type	type of allele frequency (see Details)						
trueAF	vector of true AF values in tumor						
contAF	vector of observed (contaminated by normal) allele frequency values						
seqError	The probability of sequencing error per base						

Details

contAF takes as input a true allele frequency and then adjusted its based on the given normal contamination, to give the allele frequencies actually expected from the mixture of tumor and normal cells present. decontAF does the reverse, taking contaminated AF and calculating the true AF that is implied for the given normal contamination.

errorAF gives the adjusted allele frequencies to account for sequencing error.

allAF returns all the possible allele frequencies for a variant, namely (0:totalCopy)/totalCopy. For type="mutation", only alleles from (1:totalCopy)/totalCopy are calculated, since the assumption is that mutated (relative to germline) regions by definition are not expected to be present at 0 copies

in the tumor. For 'allAF', 'normCont' can be a vector, in which case all the allele frequencies are calculated for all the values of 'normCont'; for the remaining functions, it must be a single value.

Only integer values of 'totalCopy' are allowed.

'type' refers to the type of variant, relative to the normal. Namely, how many copies of the variant are in the normal. Therefore 'mutation' implies 0 copies in the normal, 'SNPHet' implies 1 copy in the normal, and 'SNPHomo' implies variant is in every copy of the normal (which could be not equal to 2 if totalCopyNormal is not 2).

For the functions seqError, contAF, and decontAF, 'totalCopy', 'normCont', 'totalCopyNormal', and 'seqError' can be vectors of the same length as the input.

Value

For 'allAF', a list of the same length of 'normCont'. Each element of the list is a vector of the entire set of possible allele frequencies for the corresponding level of normal contamination.

For 'contAF', 'decontAF', and 'seqError' a vector the same length as the inputted allele frequencies that were to be converted.

Author(s)

Elizabeth Purdom

Examples

```
contAF(1/3,totalCopy=3,normCont=.1,type="mutation")
contAF(c(.5,.5,.5),totalCopy=c(2,4,6),normCont=.2)
```

```
#allele frequencies possible for a location that is same
#as reference in the normal, for three different values of normal contamination
allAF(totalCopy=3,normCont=c(0,.1,.5),type="mutation")
#same, but for those that are heterozygous in the normal
allAF(totalCopy=3,normCont=c(0,.1,.5),type="SNPHet")
```

bootstrapEventTiming Bootstrap the results of eventTiming

Description

Create bootstrap estimates of pi base on the results of a call to eventTiming.

Usage

Arguments

eventOrdering	output from eventTiming
В	number of bootstrap samples to take
type	type of bootstrap confidence interval to calculate, one of "parametric", "non-parametric"
pi	the estimate of \$pi\$ from which to create bootstrap samples (if type="parametric". If not given, will use output from eventOrdering)
x	vector. the number of reads/fragments containing the variant; not needed if output from eventOrdering given.
m	vector. the number of reads/fragments covering the location with the variant (the coverage); not needed if output from eventOrdering given.
call	information about the call given to original eventTiming command. Only needed if eventOrdering object not given (mainly used for internal calls within event- Timing function)

Value

Matrix of dimension (B,length(pi)) with the estimate of pi for each of the bootstrap samples

Author(s)

Elizabeth Purdom

Examples

```
##can do this within eventTiming function, but here is an example doing it separately...
data(mutData)
ACNLOH<-matrix(c(1,3,1,0),ncol=2,nrow=2,byrow=TRUE)
onlyMuts<-subset(mutData,is.na(rsID) & position <= 1.8E7)
onlyMuts$t_depth<-onlyMuts$t_ref_count+onlyMuts$t_alt_count
x<-eventTiming(x=onlyMuts$t_alt_count,m=onlyMuts$t_depth,
    history=ACNLOH,totalCopy=2,type="CNLOH",normCont=0.22,returnAssignments=TRUE)
piBoot<-bootstrapEventTiming(x,B=100,type="parametric")</pre>
```

eventTiming

Estimate the time of events in tumor data

Description

Estimate the proportion of time spent between different chromosomal abnormalities based on the allele frequencies of mutated locations.

eventTiming

Usage

```
eventTiming (x, m, history, totalCopy,
method = c("fullMLE","partialMLE", "Bayes"),
type = c("gain", "CNLOH"), seqError = 0, bootstrapCI = NULL,
B = if (method =="Bayes") 10000 else 500, CILevel = 0.95, normCont = 0,
verbose = TRUE, returnAssignments = FALSE, coverageCutoff = 1,
minMutations = 10, init = NULL, maxiter = 100, tol= 1e-04,
mutationId = 1:length(x),...)
```

Arguments

x	vector. the number of reads/fragments containing the variant						
m	vector. the number of reads/fragments covering the location with the variant (the coverage)						
history	a matrix, based on the history of the region (see Details)						
totalCopy	integer. the total number of copies of the tumor DNA for this region						
method	what estimation method to use, one of "fullMLE", "partialMLE", "Bayes"						
type	type of region, either a gain or a CNLOH region						
seqError	Probability of sequencing error						
bootstrapCI	type of bootstrap confidence interval to calculate, one of "parametric", "non- parametric". If NULL, then the confidence interval is not calculated						
В	number of bootstrap samples to take (or simulations from the posterior for Bayesian estimation)						
CILevel	At what level the confidence intervals should be calculated.						
normCont	the proportion of normal contamination, between 0 and 1.						
verbose	logical. Whether to give additional warnings as the program is running.						
returnAssignments							
	logical. Whether to return the probabilistic assignments of mutations to allele frequencies generated by the EM algorithm. Also returns the x,m values for those that pass the filter.						
coverageCutoff	minimum value for m[i]; any entries with m[i] <coveragecutoff are="" estimation.<="" ignored="" in="" td=""></coveragecutoff>						
minMutations	minimum number of mutations required.						
init	initial value of multinomial parameter q passed to estimateQ.						
maxiter	maximum number of iterations in calculation q.						
tol	tolerance in the convergence of q						
mutationId	identification values of the mutations (vector of the same length as x and m). Default is indexing values, 1:length(x). Used when returnAssignments=TRUE so that the assignments of the mutations to allele frequencies can be linked with the original mutations if there has been filtering in eventTiming, e.g. due to depth of coverage.						

Arguments passed to internal fitting function for Bayesian Method. For example, 'alpha' gives the Dirichlet prior of the bayesian estimate (default=1), 'tdf' gives the number of degrees of freedom for the t proposal density used in the bayesian estimate (default=4), 'bayesApproxMethod' gives the method for calculating the approximate distribution (default is "sir"; "inv" is for K=1 when the problem is 1-dimensional and one can easily grid and get the approximate posterior density and cdf).

Value

A list with values

pi	estimate of pi vector					
piCI	bootstrap confidence interval, if requested					
q	estimate of the multinomial parameter q					
perLocationProb						
	output from estimateQ giving per location P(P[i] X[i],q), if requested. Only locations used in the estimation are included.					
optimDetails	optimization details from estimateQ					
call	list of the parameters of the call to the function: history, totalCopy, type, ex- actAllele, normCont, coverageCutoff, minMutations. In addition, 'alleleSet' is included in this list, which is the set of possible alleles for this history, after adjusting for normal contamination.					

Author(s)

Elizabeth Purdom

References

Durinck S, et al. (2011). "Temporal Dissection of Tumorigenesis in Primary Cancers." Cancer Discovery, 1(2): 137–143. Greenman CD, et al. (2012). "Estimation of rearrangement phylogeny for cancer genomes." Genome Research, 22(2): 346–361. Purdom E, et al. (2013). "Timing Chromosomal Abnormalities within Cancer Samples." Bioinformatics, 29(24): 3113–3120.

Examples

```
data(mutData)
ACNLOH<-matrix(c(1,3,1,0),ncol=2,nrow=2,byrow=TRUE)
onlyMuts<-subset(mutData,is.na(rsID) & position <= 1.8E7)
onlyMuts$t_depth<-onlyMuts$t_ref_count+onlyMuts$t_alt_count
x<-eventTiming(x=onlyMuts$t_alt_count,m=onlyMuts$t_depth,
    history=ACNLOH,totalCopy=2,type="CNLOH",normCont=0.22)
x$pi #estimate of time of stages
x$q #estimate of the multinomial (likelihood of each of the alleles)
x$call$alleleSet #possible set of alleles after
    #adjusting for normal contamination
```

. . .

eventTimingOverList eventTiming for multiple samples and regions

Description

eventTimingOverList is a wrapper to eventTiming that allows for timing of common events over several regions of a sample and/or multiple samples. getPiOSummary gets summary information about π_0 (the first event) from the output of that function and returns a simple dataframe of the estimate of π_0 for every region and sample combination.

Usage

```
eventTimingOverList(dfList, normCont, eventArgs)
getPi0Summary(eventList, CI = TRUE)
```

Arguments

dfList	a list of mutation data per sample. Each element of the list corresponds to a sam- ple, and consists of a data frame of mutation information for all of the regions that are to be timed. The data frame must have a certain format, see description below.
normCont	a vector of equal length as dfList giving the normal contamination of each sample
eventArgs	list of arguments passed to eventTiming via 'do.call'. Should NOT contain the arguments 'x', 'm', 'history', 'totalCopy', 'type', 'mutationId' or 'normCont'
eventList	Output of eventTimingOverList (see below)
CI	logical, whether to grab CI from the output.

Details

The data frame of mutation data for each sample must have the following columns: 'segId', 'type', 'nMutAllele', 'nReads', 'mutationId'. The rows of the data frame correspond to mutated locations within the sample. 'segId' is an identifier of the segmented region that the mutation is in; eventTiming will be run using the mutation data for each 'segId' in the sample. 'type' identifies the type of segment, one of c("Other", "CNLOH", "SingleGain", "Diploid", "DoubleGain"). 'nMutAllele' gives for every row (mutated location) the number of reads with the mutation and corresponds to 'x' imputed into eventTiming. 'nReads' gives the total number of reads covering the location and corresponds to 'm' imputed into eventTiming. 'mutationId' is a unique identifier for the mutation.

For arguments passed to eventTiming, it is recommended to pass verbose=FALSE if you want to avoid many warnings about mutations that do not meet the necessary criteria of coverage, etc.

Value

eventTimingOverList returns a list equal to the number of samples. Each element of that list (i.e. per sample) is itself a list of length three corresponding to the three types of regions that can be timed, "CNLOH", "SingleGain", and "DoubleGain". Each of these gives the output of eventTiming per region of that type.

Author(s)

Elizabeth Purdom

See Also

eventTiming

Examples

```
if(require(GenomicRanges)){
#fix up mutation data to right format
data(mutData)
colnames(mutData)[1]<-c("chr")
colnames(mutData)[grep("t_alt_count",colnames(mutData))]<-"nMutAllele"
colnames(mutData)[grep("t_ref_count",colnames(mutData))]<-"nRefAllele"
mutData$nReads<-mutData$nMutAllele+mutData$nRefAllele
mutData$nReads<-mutData$nMutAllele+mutData$nRefAllele
mutData$mutationId<-1:nrow(mutData)
#add segmentation annotation -- second region is bogus, only for illustration
segs<-data.frame(chr=c(17,17),start=c(1,1.8e7+100),end=c(1.8e7,81195210),
normCont=0.22,segId=c("Seg1","Seg2"),type=c("CNLOH","SingleGain"))
##Create Trivial segmentation annotation for example
mutId<-mut2Seg(mutData,segs)</pre>
```

```
eventOut<-eventTimingOverList(dfList=list(Sample1=mutId),normCont=0.22)
getPi0Summary(eventOut)</pre>
```

```
}
```

hg19chromosomes Definitions of the p,q, and centromeres of chromosomes

Description

Gives the coordinates of the p,q, and centromeres of human chromosomes, based on hg19

Usage

hg19chromosomes

Format

A data.frame containing 72 rows and 5 columns.

chr chromosome

start start position end end position

label one of "p", "q", and "centromere"

width width of region

labelSeg

Source

UCSC genome browser

```
labelSeg
```

Helper functions for plotting

Description

Helper functions for plotting and working with chromosomes and segmentations

Usage

```
labelSeg(chr, start, end, pctOv = 0.1)
numChromosome(chr)
divideGenome(size=10)
```

Arguments

chr	chromosome
start	start position of segment
end	end position of segment
pct0v	required amount of percent overlap needed in order to report
size	Size, in MB, of the desired equally spaced divisions of the genome

Details

labelSeg creates labels 'p', 'q', and 'pq' for segmentations based on the overlap of the segment with the p/q portions of the human chromosome (hg19). It uses the data stored in hg19chromosomes with the package (under the directory 'extdata', not as a dataset of the package). Uses the findOverlaps function of GenomicRanges.

numChromosome takes character valued chromosome labels ("1","2",...,"X","Y") and converts them into values 1:23. This is useful for sorting chromosome values, for example.

divideGenome makes segments of the genome of size equal to 'size' times 1e6, i.e. size-MB length intervals, also based on the hg19chromosomes data described above.

Value

vector of numerical values between 1:23

Author(s)

Elizabeth Purdom

See Also

hg19chromosomes,findOverlaps

Examples

```
data(mutData)
segData<-data.frame(chromosome="17",start=c(0,1.8e7+1),
    end=c(1.8e7,max(mutData$position)),totalCpy=c(2,NA),
    markRegion=c(FALSE,TRUE))
if(require(GenomicRanges) & require(IRanges)) labelSeg(chr=segData$chromosome,
    start=segData$start,end=segData$end)
chr<-c("1","4","10","23","X")
chr[order(chr)]
chr[order(numChromosome(chr))]</pre>
```

makeEventHistory Create the event history matrix

Description

Create the event history matrix needed for the event timing algorithm

Usage

```
makeEventHistory(type = c("gain", "LOH"), copies = NULL,
totalCopy = sum(copies), onlyIdentifiable = TRUE)
```

Arguments

type						
copies	a vector of length 2, giving the number of copies of the maternal and paternal chromosomes					
totalCopy	an integer between 2 and 5. totalCopy must be the sum of the numbers given for the argument copies					
onlyIdentifiable						
	logical. Only return event matrices corresponding to event histories with identifiable π_0 ?					

Value

The A matrix relates allele frequencies to the event history. The vector $A\pi$ gives the probabilities of each allele frequency possible for the specified event.

Author(s)

Elizabeth Purdom

References

Purdom, E, et al. (submitted). "Timing Chromosomal Abnormalities within Cancer Samples."

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mleAF

Examples

```
makeEventHistory(type="gain",totalCopy=8)
makeEventHistory(type="gain",copies=c(1,4),totalCopy=5,onlyIdentifiable=FALSE)
```

mleAF

Estimate the most likely allele frequency

Description

Estimate the number of copies a mutation is found in, based on which allele value maximizes the binomial likelihood after correcting for normal contamination and seqError.

Usage

```
mleAF(x, m, totalCopy, maxCopy=totalCopy, seqError = 0, normCont = 0)
```

Arguments

x	vector. the number of reads/fragments containing the variant
m	vector. the number of reads/fragments covering the location with the variant (the coverage)
totalCopy	The total number of copies (maternal and paternal combined), can be vector with length equal to $length(x)$
maxCopy	The maximum number of copies of either maternal or paternal alleles, can be vector with length equal to $length(x)$
seqError	The probability of sequencing error per base, can be vector with length equal to $length(x)$
normCont	Percentage of normal contamination, can be vector with length equal to $length(x)$

Details

maxCopy and totalCopy are used to determine the possible allele frequencies in a pure tumor cell, given by 1:maxCopy/totalCopy. The default of maxCopy=totalCopy ensures that all theoretically possible alleles are considered given the lack of further information, but in general will not be correct. For example, if the region has allelic copy 2/3, then there are only three possible allele frequencies rather than five.

Value

List with following values:

perLocationProb

matrix of dimension (number of locations) x (number of possible allele frequencies), with each row corresponding to a given location and each column giving the probability of observing the data for that location for each of the possible allele frequencies

assignments	data.frame of dimension (number of locations) x 3, with columns ncopies=estimate of number of copies mutation is found in, based on which maximizes the likeli- hood, totalCopy=totalCopy given by user, AF=estimate of true allele frequency given by ncopies/totalCopy
alleleSet	Only returned if the parameters totalCopy, maxCopy, seqError, and normCont are of length=1. A data.frame with rows equal to number of possible alleles and three columns, tumorAF=the allele frequency in the pure tumor, AF= the corresponding allele frequency after adjusting for normal contamination and sequencing error, frequency = number of locations with that allele frequency.

Author(s)

Elizabeth Purdom

References

Greenman, C D et al. 2012. "Estimation of rearrangement phylogeny for cancer genomes." Genome Research 22(2):346-361.

Examples

```
#example of CNLOH
m<-c(24,41,40,15)
x<-c(13,21,17,12)
nc<-c(0.27,0.39,0.49,0.22)
mleAF(x=x,m=m,totalCopy=2,maxCopy=2,normCont=nc)
mleAF(x=x,m=m,totalCopy=c(2,3,2,3),maxCopy=2,normCont=nc)
#note the difference in output if instead all data is from
#same sample (shares normal Contamination estimate)
mleAF(x=x,m=m,totalCopy=2,maxCopy=2,normCont=nc[1])
```

multidensity plot multiple density functions on top of each other

Description

plots multiple density functions on top of each other, calculating the correct xlim, ylim, etc.

Usage

```
multidensity(x, col = palette(), lwd = 1, lty = 1, xlim, ylab = "Density", ...)
```

Arguments

х	list of values to create density from (can be a data.frame which where columns are elements of the list)
col	colors for each density plot
lwd	lwd for each density plot

mut2Seg

lty	lty for each density plot
xlim	user defined xlim
ylab	user defined ylab
	plotting parameters passed to initial plot command.

Author(s)

Elizabeth Purdom

Examples

```
x<-lapply(c(1,2,3),function(x){rnorm(100,mean=x)})
multidensity(x)</pre>
```

mut2Seg

Align mutations to segments

Description

A function to match mutations into the segments that include them.

Usage

```
mut2Seg(mutData, segData, verbose = TRUE)
```

Arguments

mutData	matrix or data.frame. Column names must include 'chr' and 'position'
segData	matrix or data.frame. Column names must include 'chr', 'start', and 'end' (in any order)
verbose	logical. If TRUE gives information about the progress and possible problems (e.g. if different chromosome names in the two sets)

Details

This function finds which segments in the segData file contain the mutations and returns a data.frame with the concatenation of the mutation information and the segments information. The function relies on findOverlaps in the GenomicRanges package in bioconductor.

Value

Data frame with concatenated values.

Author(s)

Elizabeth Purdom

See Also

findOverlaps

Examples

```
if(require(GenomicRanges) & require(IRanges)){
data(mutData)
colnames(mutData)[1]<-c("chr")
segs<-data.frame(chr=c(17,17),start=c(1,1.8e7+100),end=c(1.8e7,81195210),
normCont=0.22,segId=c("CNLOH","Other"))
##Trivial segmentation annotation for example
mutId<-mut2Seg(mutData,segs)
head(mutId)
}</pre>
```

mutData

Example Mutation Data

Description

Example mutation data

Usage

data(mutData)

Format

A data frame with 1007 observations on the following 10 variables.

chromosome chromosome

position position

refbase reference base at this location

mutbase variant base at this location

rsID dbSNP database number, NA if not in database.

t_ref_count number of fragments in tumor with the reference base

t_alt_count number of fragments in tumor with the variant base

allelefreq observed allele frequency

n_ref_count number of fragments in normal with the ref base

n_alt_count number of fragments in normal with the variant base

Details

Mutation data from chr17. The CNLOH region is from positions 0 to 1.8E7. The normal contamination estimate in the paper was given as 0.22.

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Source

Durinck, S, et al. (2011). "Temporal Dissection of Tumorigenesis in Primary Cancers." Cancer Discovery, 1(2), 137-143.

Examples

```
data(mutData)
head(mutData)
#only mutations in the CNLOH region
onlyMuts<-subset(mutData,is.na(rsID) & position <= 1.8E7)</pre>
```

plotAlleleByPosition Plot allele frequencies by position

Description

Plot observed allele frequencies from sequencing data against their location on the chromosome.

Usage

```
plotAlleleByPosition(mutData, segmentData = NULL,
whChr = 1:22, chromosomeId = "chr",
sampleName = NULL, sample = FALSE, tumorAFId, positionId, type = "mutation",
startId = "start", endId = "end", segFactorId, tCNId, MarkId, segColors,
normCont = NULL, addData = NULL, addColor="red",col="black",pch=1,lwd=2,
xlim,ylab="Allele Frequency",...)
```

Arguments

mutData	data.frame with mutation data set to be plotted
segmentData	(optional) segmentation data
whChr	which chromosome to plot
chromosomeId	column name for chromosome (must be same in all data.frames)
sampleName	id printed on the plot to identify the sample
sample	logical. If true, take only a random sample of 10,000 locations for the chromo- some. Can speed up for plotting SNPs.
tumorAFId	column name for the allele frequency in mutData
positionId	column name for the allele location in mutData
type	type of allele frequency plotted (passed to 'allAF' in order to create the lines for the expected AF)
startId	column name for the start of the segmentation (in segData)
endId	column name for the end of the segmentation (in segData)
segFactorId	column name for the factor for segmentations (in segData).

tCNId	column name that gives the total copy number for the segmentation (in segData); needed if give normCont to calculated expected AF
MarkId	column name of a column with logical values that identifies segments that should be marked up with hash marks.
segColors	vector of colors for the segmentations. Should be as long as the number of levels of segFactorId
normCont	percent normal contamination. If missing, then lines for the expected AF will not be calculated.
addData	data.frame with another set (example germline SNPs) to be plotted in red
addColor	color for the additional data
lwd	line width of the lines for the expected AF
ylab	label for y-axis
xlim	xlim boundaries. If missing, will be calculated.
col	col for the mutData points
pch	pch for the mutData points
	arguments passed to initial plotting command.

Value

returns invisibly the vector of colors for the segmentations, useful for making legends (see the example)

Author(s)

Elizabeth Purdom

Examples

```
data(mutData)
#only mutations in the CNLOH region
onlyMuts<-subset(mutData,is.na(rsID) & position <= 1.8E7)</pre>
snps<-subset(mutData,!is.na(rsID) )</pre>
segData<-data.frame(chromosome="17",start=c(0,1.8e7+1),</pre>
end=c(1.8e7,max(mutData$position)),
totalCpy=c(2,NA),markRegion=c(FALSE,TRUE))
out<-plotAlleleByPosition(onlyMuts,whChr=17, segmentData=segData,</pre>
tCNId="totalCpy",normCont=0.22, addData=snps,pch=19,
addColor="grey",MarkId="markRegion",
segColors="pink",xaxt="n",xlab="Position", segFactorId="totalCpy",
chromosomeId = "chromosome",tumorAFId="allelefreq",
positionId="position",type="mutation")
axis(1,line=1,tick=FALSE)
legend("topright",legend=c(names(out),"unknown"),fill=c(out,NA),
title="Total Copy Number")
```

plotAlleleDensity *Plot density/histogram of allele frequencies*

Description

Plot of densities/histograms of allele frequencies, useful for evaluating normal contamination estimate, total Copy number estimates, etc.

Usage

```
plotAlleleDensity(af, depth, groupingId, totalCopy, groupCol=palette(),
normCont = 0, type="mutation", minDepth = 40,
lineCols = c("grey", "tan4"), minMut = 40,
histogram = FALSE)
```

Arguments

af	vector of allele frequencies
depth	coverage of the location
groupingId	grouping variable for allele frequencies (single density curve/histogram for each id)
totalCopy	the total copy number for the allele frequencies plotted (must be the same)
groupCol	colors for the different groups (if histogram=FALSE)
type	type of allele frequency (mutation, SNPHet, SNPHomo), passed to allAF
normCont	percentage of normal contamination. Can be vector of different values.
minDepth	min required depth in order to include it in the density/histogram
lineCols	colors of the vertical lines (each color is for different normal contamination)
minMut	minimum number of mutations per group in order to plot the group
histogram	logical. should the plot be superimposed density curves (FALSE), or a single histogram per group (TRUE)?

Value

Returns invisibly the data used (i.e. passed minimum cutoff criteria), separated by the groupingId given by the user

Author(s)

Elizabeth Purdom

Examples

```
data(mutData)
#only mutations in the CNLOH region
onlyMuts<-subset(mutData,is.na(rsID) & position <= 1.8E7)
plotAlleleDensity(onlyMuts$allelefreq,onlyMuts$t_ref_count+onlyMuts$t_alt_count,
totalCopy=2,normCont=c(0,0.22),minMut=0,minDepth=0,hist=TRUE)
gpId<-factor(is.na(mutData$rsID),levels=c("TRUE","FALSE"),labels=c("Mutations","SNPs"))</pre>
```

```
plotAlleleDensity(mutData$allelefreq,mutData$t_ref_count+mutData$t_alt_count,
groupCol=c("black","red"),totalCopy=2,groupingId=gpId,minMut=0,minDepth=30,hist=FALSE)
legend("topleft",levels(gpId),fill=c("red","black"))
```

plotCopies plot segmentation values against each other

Description

Plot different values per segment against each other (e.g. minor and major allele estimates).

Usage

Arguments

х	The values plotted for x coordinates (e.g. segmentation value for minor allele)
У	The values plotted for y coordinates (e.g. segmentation value for major allele)
nX	The grouping id for the x coordinate (e.g. assignment of number of copies)
nY	The grouping id for the y coordinate (e.g. assignment of number of copies)
xleg	title for the legend of the x values
yleg	title for the legend of the y values
xlim	limits for the x axis
ylim	limits for the y axis
onlyPositive	only plot values positive in x and y
equalAxis	xlim and ylim are forced to be the same
integerLegend	Only give integers
	passed to the scatter plot command

Author(s)

Elizabeth Purdom

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plotPi0

Examples

```
cp1<-c(0,0,0,1,1,1,1,2,2,2,3,3,3)
cp2<-c(0,1,2,1,2,2,3,2,2,4,3,6,8)
seg1<-jitter(c(0,0,0,1,1,1,1,2,2,2,3,3,3))
seg2<-jitter(c(0,1,2,1,2,2,3,2,2,4,3,6,8))
plotCopies(x=seg1,y=seg2,nX=cp1,nY=cp2)
```

```
plotPi0
```

Confidence intervals for π_0

Description

A plotting function to plot the confidence intervals of the estimated π_0 values returned from event-Timing

Usage

```
plotPi0(est, ui, li, samples, labels = NULL, xlab = "Segment",
ylab = expression(pi[0]),
pchFac = rep(1, length(est)), whHighlight = NULL,
nMut = NULL, xorder = NULL, ...)
```

Arguments

est	vector of the estimates of π_0
ui	vector of the upper values for the confidence interval of the π_0
li	vector of the lower values for the confidence interval of the π_0
samples	vector indicating which sample each π_0 corresponds to (will be converted to factor with factor command)
labels	character vector of the labels of each estimate (optional)
xlab	label for the xaxis, defaults to "Segment"
ylab	label for the yaxis, defaults to " π_0 "
pchFac	vector of pch values for the center of the confidence interval
whHighlight	a vector of indices of the estimates that should be 'highlighted' by coloring their confidence intervals red (optional)
nMut	a vector of values of the number of mutations from each confidence interval to be printed at the top of the plot
xorder	a vector giving an ordering of the estimates for the confidence intervals; if NULL, an order within each sample is created automatically.
	arguments passed to plotCI function

Value

The order of the estimates found internally by the program (or given by the user) are returned invisibly.

Author(s)

Elizabeth Purdom

See Also

plotCI, eventTiming

plotSegmentation plot segmentation(s) against positions

Description

Plot the values of a segmentation against chromosome position.

Usage

```
plotSegmentation(segs, valId, col = palette(),lty=1, lwd = 2, xlim, ylim,
xlab="Position", ylab = valId,...)
```

Arguments

segs	list of segmentation data.frames. Each data.frame must have 'start' and 'end' as the column names of the limits of the segmentations.
valId	name of the column with the segmentation value to be plotted (must be the same in all data.frames)
col	colors for the segmentation (1 per element of the list of segmentations)
lty	lty for the lines
lwd	lwd for the lines
xlim	x limits
ylim	y limits
xlab	The label for the x-axis
ylab	The label for the y-axis
	passed to initial plotting command

Value

returns invisibly the col and lty after any processing done, useful for legends.

Author(s)

Elizabeth Purdom

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plotSeqCount

Examples

```
data(mutData)
segData<-data.frame(chromosome="17",start=c(0,1.8e7+1),
end=c(1.8e7,max(mutData$position)),val=c(2,3))
cp1<-data.frame(chromosome="17",start=c(0,1.8e7+1),
end=c(1.8e7,max(mutData$position)),val=c(1,1))
cp2<-data.frame(chromosome="17",start=c(0,1.8e7+1),
end=c(1.8e7,max(mutData$position)),val=c(.9,2))
out<-plotSegmentation(list(total=segData,cp1=cp1,cp2=cp2),
valId="val",lwd=2,ylab="Segmentation Value")
legend("topright",names(out),fill=out)</pre>
```

plotSeqCount Basic function for plotting the ratio of tumor to normal coverage

Description

Basic function for plotting the ratio of tumor to normal coverage, and calculating the average over segments. A simple tool for assessing copy number breaks.

Usage

```
plotSeqCount(position, t_count, n_count, ylim=NULL, normFac=1,
segs, segColors = palette(), ...)
```

Arguments

position	vector of position of the base
t_count	vector of number of reads overlapping position in tumor
n_count	vector of number of reads overlapping position in normal
ylim	set the limits of y axis. If NULL, default values found.
normFac	a normalizing factor to correct for
segs	factor as same length as position, identifying which segment a count is from
segColors	
	passed to plot

Author(s)

Elizabeth Purdom

readSimulation

Description

Simulate reads based on an event matrix

Usage

```
readSimulation(B, alleleSet, q, totalCopy, mutRate = NULL, seqError = 0,
fixedN = FALSE, normCont = 0, aveReadCoverage = 30, countDistribution = NULL)
```

Arguments

В	the number of simulated data sets to make
alleleSet	a vector of expected allele frequencies, without contamination or sequencing error accounted for
q	integer. the number of expected allele frequencies???
totalCopy	integer. The total number of copies in the final stage, i.e. at the end of the event
mutRate	a number between 0 and 1. The mutation rate, defined as the number of muta- tions observed divided by number of nucleotides sequenced or examined
seqError	a number between 0 and 1 representing the sequencing error. The default value is 0, i.e. no sequencing error.
fixedN	logical. Should the number of mutations be fixed? By default set to FALSE. If set to TRUE, the expected number of mutations is used, i.e. mutRate*B
normCont	a number between 0 and 1 describing the amount of normal contamination present in the sample. The default value is 0, i.e. no normal contamination.
aveReadCoverage	
	average read coverage of an allele. The default value is 30 reads per allele.
countDistribution	
	optional. Provide an empirical distribution for read coverage. If given, the argument aveReadCoverage is ignored, and the mean of the empirical distribution is used. By default, set to NULL.

Value

Returns a data frame with simulated read counts under the normal contamination, sequencing error, allele frequency distribution, and read count distributions provided.

Author(s)

Elizabeth Purdom

readSimulation

Examples

```
#simulate from CNLOH event with pi[0]=.1
Amat<-makeEventHistory(totalCopy=2,type="LOH")[[1]]
piVal<-c(.1,.9)
qvec<-prop.table(Amat%*%piVal)
sims<-readSimulation(10, alleleSet=allAF(totalCopy=2)[[1]], q=qvec,
totalCopy=2, mutRate = 100, seqError = 0.1, fixedN = TRUE,
normCont = 0.1, aveReadCoverage = 30)
```

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