Package 'sequenza'

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Title Copy Number Estimation from Tumor Genome Sequencing Data

Description Tools to analyze genomic sequencing data from paired normal-tumor samples, including cellularity and ploidy estimation; mutation and copy number (allele-specific and total copy number) detection, quantification and visualization.

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```
baf.bayes
```

Model allele-specific copy numbers with specified cellularity and ploidy parameters

Description

Given a pair of cellularity and ploidy parameters, the function returns the most likely allele-specific copy numbers with the corresponding log-posterior probability of the fit, for given values of B-allele frequency and depth ratio.

Usage

Bf	vector of B-allele frequencies (values can range from 0 to 0.5).
mufreq	vector of mutation frequencies (values can range from 0 to 1).
depth.ratio	vector of depth ratios.

baf.bayes

sd.ratio	standard deviation observed in the depth ratio measures in a segment	
sd.Bf	standard deviation observed in the B-allele frequency measures in a segment	
weight.Bf	vector of weights for B-allele frequency values.	
weight.mufreq	vector of weights for the mutation frequency values.	
weight.ratio	vector of weights for the depth ratio values.	
cellularity	fraction of tumor cells in the sample.	
ploidy	2 * ratio between total DNA content in a tumor cell and a normal cell.	
avg.depth.ratio		
	average normalized depth ratio.	
CNt.min	minimum copy number to consider in the model.	
CNt.max	maximum copy number to consider in the model.	
CNn	copy number of the normal genome.	
priors.table	data frame with columns CN and value, containing the copy numbers and the corresponding weights. To every copy number is assigned the value 1 as default, so any values different from 1 will change the corresponding weight.	
ratio.priority	logical, if TRUE only the depth ratio will be used to determine the copy number state, while the Bf value will be used to determine the number of B-alleles.	

Details

baf.bayes and mufreq.bayes use a naive Bayesian approach to calculate the posterior probability of fitness of the data point with the model point resulting from the given values of cellularity and DNA-content.

Value

CNt	copy number of the tumor cell at the tested point.
A	number of A-alleles at the tested point.
В	number of B-alleles at the tested point.
CNn	copy number of the normal cell at the tested point (equal to CNn given as argument).
Mt	number of mutated alleles at the tested point.
LPP	log-posterior probability of model fitting at the given point/segment.

See Also

baf.model.fit,mufreq.model.fit.

Examples

```
## Not run:
data.file <- system.file("extdata", "example.seqz.txt.gz", package = "sequenza")
# read all the chromosomes:
seqz.data <- read.seqz(data.file)
# Gather genome wide GC-stats from raw file:
```

```
gc.stats <- gc.sample.stats(data.file)</pre>
gc.vect <- setNames(gc.stats$raw.mean, gc.stats$gc.values)</pre>
# Read only one chromosome:
seqz.data <- read.seqz(data.file, chr.name = 1)</pre>
# Correct the coverage of the loaded chromosome:
seqz.data$adjusted.ratio <- seqz.data$depth.ratio /</pre>
                            gc.vect[as.character(seqz.data$GC.percent)]
# Select the heterozygous positions
seqz.hom <- seqz.data$zygosity.normal == 'hom'</pre>
seqz.het <- seqz.data[!seqz.hom, ]</pre>
# Detect breakpoints
breaks <- find.breaks(seqz.het, gamma = 80, kmin = 10, baf.thres = c(0, 0.5))
# use heterozygous and homozygous position to measure segment values
seg.s1 <- segment.breaks(seqz.data, breaks = breaks)</pre>
# filter out small ambiguous segments, and conveniently weight the segments by size:
seg.filtered <- seg.s1[(seg.s1$end.pos - seg.s1$start.pos) > 10e6, ]
weights.seg <- 150 + round((seg.filtered$end.pos -</pre>
                              seg.filtered$start.pos) / 1e6, 0)
# get the genome wide mean of the normalized depth ratio:
avg.depth.ratio <- mean(gc.stats$adj[,2])</pre>
# run the BAF model fit
CP <- baf.model.fit(Bf = seg.filtered$Bf, depth.ratio = seg.filtered$depth.ratio,</pre>
                     weight.ratio = weights.seg,
                     weight.Bf = weights.seg,
                     avg.depth.ratio = avg.depth.ratio,
                     cellularity = seq(0.1,1,0.01),
                     ploidy = seq(0.5, 3, 0.05))
confint <- get.ci(CP)</pre>
ploidy <- confint$max.ploidy</pre>
cellularity <- confint$max.cellularity
#detect copy number alteration on the segments:
cn.alleles <- baf.bayes(Bf = seg.s1$Bf, depth.ratio = seg.s1$depth.ratio,</pre>
                         cellularity = cellularity, ploidy = ploidy,
                         avg.depth.ratio = 1)
head(cbind(seg.s1, cn.alleles))
# create mutation table:
mut.tab <- mutation.table(seqz.data, mufreq.treshold = 0.15,</pre>
                             min.reads = 40, max.mut.types = 1,
                             min.type.freq = 0.9, segments = seg.s1)
mut.tab.clean <- na.exclude(mut.tab)</pre>
# Detect mutated alleles:
mut.alleles <- mufreq.bayes(mufreq = mut.tab.clean$F,</pre>
                             depth.ratio = mut.tab.clean$adjusted.ratio,
```

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baf.model.fit

End(Not run)

baf.model.fit Model fitting using maximum a posteriori inference

Description

Computes the log-posterior probability distribution for the specified range of cellularity and ploidy parameters

Usage

```
mufreq.model.fit(cellularity = seq(0.3, 1, by = 0.01),
    ploidy = seq(1, 7, by = 0.1), mc.cores = getOption("mc.cores", 2L),
    ...)
baf.model.fit(cellularity = seq(0.3, 1, by = 0.01),
    ploidy = seq(1, 7, by = 0.1), mc.cores = getOption("mc.cores", 2L),
    ...)
```

Arguments

cellularity	vector of cellularity values to be tested.
ploidy	vector of ploidy values to be tested.
mc.cores	number of cores to use, defined as in pblapply.
	any argument accepted by mufreq.bayes or baf.bayes.

Details

baf.model.fit uses the function baf.bayes to infer the log-posterior probability of the model fit using the possible combinations of cellularity and ploidy values provided in the arguments. Similarly mufreq.model.fit fits the mutation/depth ratio model using the function mufreq.bayes. baf.model.fit is the defalt method used to infer cellularity and ploidy on segmented chromosomes. The mufreq.model.fit function estimates cellularity and ploidy using mutation frequency and depth ratio, however, the mutation data is more affected to background noise compared to the segmented B-allele frequency, hence it may give less accurate results.

Value

A list of three items:

ploidy	tested values of the ploidy parameter
cellularity	tested values of the cellularity parameter
lpp	log-posterior probability of each pair of cellularity/ploidy parameters.

See Also

cp.plot for visualization of the resulting object, and get.ci to extract confidence intervals.

Examples

```
## Not run:
data.file <- system.file("extdata", "example.seqz.txt.gz",</pre>
    package = "sequenza")
# read all the chromosomes:
seqz.data <- read.seqz(data.file)</pre>
# Gather genome wide GC-stats from raw file:
gc.stats <- gc.sample.stats(data.file)</pre>
gc.normal.vect <- mean_gc(gc.stats$normal)</pre>
gc.tumor.vect <- mean_gc(gc.stats$tumor)</pre>
# Read only one chromosome:
seqz.data <- read.seqz(data.file, chr_name = "1")</pre>
# Correct the coverage of the loaded chromosome:
seqz.data$adjusted.ratio <- round((seqz.data$depth.tumor /</pre>
    gc.tumor.vect[as.character(seqz.data$GC.percent)]) /
    (seqz.data$depth.normal /
    gc.normal.vect[as.character(seqz.data$GC.percent)]), 3)
# Select the heterozygous positions
seqz.hom <- seqz.data$zygosity.normal == 'hom'</pre>
seqz.het <- seqz.data[!seqz.hom, ]</pre>
# Detect breakpoints
breaks <- find.breaks(seqz.het, gamma = 80, kmin = 10,</pre>
    baf.thres = c(0, 0.5))
# use heterozygous and homozygous position to measure segment values
seg.s1 <- segment.breaks(seqz.data, breaks = breaks)</pre>
# filter out small ambiguous segments, and conveniently weight
# the segments by size:
seg.filtered <- seg.s1[(seg.s1$end.pos - seg.s1$start.pos) > 3e6, ]
weights.seg <- (seg.filtered$end.pos - seg.filtered$start.pos) / 1e6</pre>
# Set the average depth ratio to 1:
avg.depth.ratio <- 1
# run the BAF model fit
CP <- baf.model.fit(Bf = seg.filtered$Bf,</pre>
    depth.ratio = seg.filtered$depth.ratio, weight.ratio = weights.seg,
    weight.Bf = weights.seg, sd.ratio = seg.filtered$sd.ratio,
    sd.Bf = seg.filtered$sd.BAF, avg.depth.ratio = avg.depth.ratio,
```

chromosome.view

```
cellularity = seq(0.1, 1, 0.01), ploidy = seq(0.5, 3, 0.05))
confint <- get.ci(CP)
ploidy <- confint$max.ploidy
cellularity <- confint$max.cellularity</pre>
```

End(Not run)

chromosome.view A graphical representation of multiple chromosomal features

Description

A graphical representation of depth ratio, allele frequency and mutation frequency in multiple panels allineated by the coordinate of the same chromosome.

Usage

```
chromosome.view(baf.windows, ratio.windows, mut.tab = NULL,
    segments = NULL, min.N.baf = 1, min.N.ratio = 10000, main = "",
    vlines = FALSE, legend.inset = c(-20 * strwidth("a", units = "figure"),
    0), CNn = 2, cellularity = NULL, ploidy = NULL, avg.depth.ratio = NULL,
    model.lwd = 1, model.lty = "24", model.col = 1, x.chr.space = 10)
genome.view(seg.cn, info.type = "AB", ...)
```

baf.windows	matrix containing the windowed B-allele frequency values for one chromosome.	
ratio.windows	matrix containing the windowed depth ratio values for one chromosome.	
mut.tab	mutation table of one chromosome. If specified, the mutations will be drawn in a top panel. mut.tab must be output from the mutation.table function.	
segments	segmentation for one chromosome. If specified, the segmented B-allele fre- quency and depth ratio values will be shown as red lines.	
min.N.baf	minimum number of observations required in a BAF window for plotting.	
min.N.ratio	minimum number of observations required in a depth ratio window for plotting.	
CNn	copy number of the germline genome.	
vlines	logical, if TRUE the plot will include dotted vertical lines corresponding to seg- ment breaks.	
cellularity	fraction of tumor cells in the sample.	
ploidy	value of the estimated ploidy parameter.	
avg.depth.ratio		
	the average value of the normalized depth ratio.	
main	main title of the plot.	

legend.inset	the inset argument to pass to the legend function. Defines the distance between the mutation legend and the plot border.
model.lwd	width of the theoretical lines, if the segments matrix contains the columns A, B and CNt.
model.lty	line type of the theoretical lines, if the segments matrix contains the columns A, B and CNt.
model.col	color of the theoretical lines, if the segments matrix contains the columns A, B and CNt.
x.chr.space	step in megabase on the positions to visualize on the x-axis.
seg.cn	genome wide segments, with the columns A, B and CNt.
info.type	information to plot in genome.view. Available options are "CNt" for total copy numbers and "AB" (default) for the alleles specific copy number.
	optional arguments passed to plot.

Details

chromosome.view is a plotting function based on the default plot function and par to display multiple panels. The plotting function plotWindows is used to plot the binned data of depth-ratio and b-allele frequency. The function displays the observations reulting from the sequencing post-processing as well the results of the model.

See Also

windowValues, find.breaks.

Examples

```
## Not run:
data.file <- system.file("extdata", "example.seqz.txt.gz",</pre>
    package = "sequenza")
# read all the chromosomes:
seqz.data <- read.seqz(data.file)</pre>
# Gather genome wide GC-stats from raw file:
gc.stats <- gc.sample.stats(data.file)</pre>
gc.vect <- setNames(gc.stats$raw.mean, gc.stats$gc.values)</pre>
# Read only one chromosome:
seqz.data <- read.seqz(data.file, chr.name = 1)</pre>
# Correct the coverage of the loaded chromosome:
seqz.data$adjusted.ratio <- seqz.data$depth.ratio /</pre>
    gc.vect[as.character(seqz.data$GC.percent)]
# Select the heterozygous positions
seqz.hom <- seqz.data$zygosity.normal == 'hom'</pre>
seqz.het <- seqz.data[!seqz.hom, ]</pre>
# Detect breakpoints
breaks <- find.breaks(seqz.het, gamma = 80, kmin = 10, baf.thres = c(0, 0.5))</pre>
# use heterozygous and homozygous position to measure segment values
seg.s1 <- segment.breaks(seqz.data, breaks = breaks)</pre>
```

```
# Binning the values of depth ratio and B allele frequency
seqz.r.win <- windowValues(x = seqz.data$adjusted.ratio,</pre>
   positions = seqz.data$position, chromosomes = seqz.data$chromosome,
   window = 1e6, overlap = 1, weight = seqz.data$depth.normal)
seqz.b.win <- windowValues(x = seqz.het$Bf,</pre>
   positions = seqz.het$position, chromosomes = seqz.het$chromosome,
   window = 1e6, overlap = 1, weight = round(x = seqz.het$good.reads,
        digits = 0)
# create mutation table:
mut.tab <- mutation.table(seqz.data, mufreq.treshold = 0.15,</pre>
   min.reads = 40, max.mut.types = 1, min.type.freq = 0.9,
    segments = seg.s1)
# chromosome view without parametes:
chromosome.view(mut.tab = mut.tab[mut.tab$chromosome == "1",],
   baf.windows = seqz.b.win[[1]], ratio.windows = seqz.r.win[[1]],
   min.N.ratio = 1, segments = seg.s1[seg.s1$chromosome == "1",],
   main = "Chromosome 1")
# filter out small ambiguous segments, and weight the segments by size:
seg.filtered <- seg.s1[(seg.s1$end.pos - seg.s1$start.pos) > 10e6, ]
weights.seg <- 150 + round((seg.filtered$end.pos -</pre>
                         seg.filtered$start.pos) / 1e6, 0)
# get the genome wide mean of the normalized depth ratio:
avg.depth.ratio <- mean(gc.stats$adj[,2])</pre>
# run the BAF model fit
CP <- baf.model.fit(Bf = seg.filtered$Bf, depth.ratio = seg.filtered$depth.ratio,
   weight.ratio = weights.seg, weight.Bf = weights.seg,
    avg.depth.ratio = avg.depth.ratio, cellularity = seq(0.1,1,0.01),
   ploidy = seq(0.5, 3, 0.05))
confint <- get.ci(CP)</pre>
ploidy <- confint$max.ploidy</pre>
cellularity <- confint$max.cellularity
#detect copy number alteration on the segments:
cn.alleles <- baf.bayes(Bf = seg.s1$Bf, depth.ratio = seg.s1$depth.ratio,</pre>
    cellularity = cellularity, ploidy = ploidy, avg.depth.ratio = 1)
seg.s1 <- cbind(seg.s1, cn.alleles)</pre>
# Chromosome view with estimated paramenters:
chromosome.view(mut.tab = mut.tab[mut.tab$chromosome == "1",],
   baf.windows = seqz.b.win[[1]], ratio.windows = seqz.r.win[[1]],
   min.N.ratio = 1, segments = seg.s1[seg.s1$chromosome == "1",],
   main = "Chromosome 1", cellularity = cellularity, ploidy = ploidy,
    avg.depth.ratio = 1, BAF.style = "lines")
```

End(Not run)

```
CP.example
```

Description

Examples of results from the maximum a posteriori estimation from a set of cellularity and ploidy values, as returned by the functions baf.model.fit and mufreq.model.fit.

Usage

```
data(CP.example)
```

Format

A list containing three items:

ploidy numeric vector of tested ploidy values.

cellularity numeric vector of tested cellularity values.

lpp numeric matrix of log-posterior probability for each (ploidy, cellularity) pair.

Examples

```
data(CP.example)
str(CP.example)
## Visualization of the object
image(x = CP.example$ploidy,
    y = CP.example$cellularity,
    z = CP.example$lpp)
## A better plot
cp.plot(CP.example)
cp.plot.contours(CP.example, add = TRUE)
```

cp.plot

Plot log-posterior probability for the output of the sequenza.fit *function*

Description

This function uses the **colorgram** function from the package **squash** to plot log-posterior probability for the tested combinations of cellularity and ploidy

cp.plot

Usage

Arguments

cp.table	list, as output from baf.model.fit or mufreq.model.fit.
xlab	xlab parameter as in the function colorgram.
ylab	ylab parameter as in the function colorgram.
zlab	zlab parameter as in the function colorgram.
colFn	colFn parameter as in the function colorgram.
likThresh	vector of quantiles to define tresholds for the confindent regions.
alternative	boolean parameter, if TRUE the alternative solutions are computed and plotted.
col	vector of colors.
legend.pos	position for placing the legend.
pch	character used to indicate the point estimate.
alt.pch	if alternative is set to TRUE defines the character to indicate alternative solu- tions.
	additional arguments accepted by the function colorgram for cp.plot, or contour for cp.plot.contours.
level	decimal value of the confidence interval

Value

The get.ci function returns a list with 6 items:

values.ploidy	matrix of ploidy values with respective posterior probability.	
confint.ploidy	boundaries of the confidence interval of the estimated ploidy.	
max.ploidy	point estimate of the ploidy value that has the maximum posterior probability.	
values.cellularity		
	matrix of cellularity values with respective posterior probability.	
confint.cellularity		
	boundaries of the confidence interval of the estimated cellularity.	
max.cellularity		
	point estimate of the cellularity value that has the maximum posterior probabil- ity.	

Examples

```
data(CP.example)
cp.plot(CP.example)
cp.plot.contours(CP.example, add = TRUE)
# Plot more contours
cp.plot(CP.example)
cp.plot.contours(CP.example, likThresh = c(0.95, 0.9999), add = TRUE)
# Return the 95% confidence interval
CP.example.ci <- get.ci(CP.example)
str(CP.example.ci)</pre>
```

example.seqz Example "seqz" data

Description

The "seqz" file is produced by sequenza-utils and typically has the file extension '.seqz'. The data here is representative of a seqz file derived from an exome-sequenced tumor sample, such as could be obtained from TCGA.

Usage

data(example.seqz)

Format

A data frame with 53937 rows and 14 columns:

- [,1] chromosome Chromosome name
- [,2] position Base position
- [,3] base.ref Base in the reference genome
- [,4] depth.normal Read depth in the normal sample
- [,5] depth.tumor Read depth in the tumor sample
- [,6] depth.ratio Ratio of depth.tumor and depth.normal
- [,7] Af A-allele frequency in the tumor sample
- [,8] Bf B-allele frequency in the tumor sample, in heterozygous positions only
- [,9] zygosity.normal Zygosity of the normal sample: "hom" for homozygous or "het" for heterozygous
- [,10] GC.percent % GC content
- [,11] good.reads Number of reads from the tumor sample which pass the quality threshold
- [,12] AB.normal Base(s) found in the normal sample, sorted by allele frequency if more than one
- [,13] AB.tumor Base(s) found in the tumor sample *but not* in the normal specimen, with their observed frequencies,
- [,14] tumor.strand Identical to AB.tumor but indicating, for each variant base, the fraction of reads oriented in the forw

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find.breaks

Details

example.seqz can be loaded in the standard R way via data(example.seqz), or it can be read from a text file using read.seqz. The former is useful for examples and testing, whereas the latter is representative of the standard workflow.

Source

This is derived from a TCGA specimen, but has been scrambled to anonymize the source. The reference genome is hg19. The GC content was calculated in 50-base windows.

find.breaks	Segmentation of sequencing data using an allele-specific copy number
	algorithm

Description

This function uses aspcf or pcf from the package **copynumber** to segment depth ratio and B-allele frequency obtained from sequencing data.

Usage

Arguments

seqz.baf	an seqz file containing only the heterozygous positions.
seqz.tab	a complete seqz file.
gamma, kmin, ba	af.thres, verbose
	arguments passed to the segmentation algorithm.
breaks	breaks as output by find.breaks.
<pre>min.reads.baf</pre>	threshold on the depth of the positions included to calculate the average BAF for segment.
weighted.mean	boolean to select if the segments have to calculated using the read depth as a weights to calculate depth ratio and B-allele frequency means.
seg.algo	Selects the algorithm used for the segmentation. Available options are aspcf of pcf.
•••	additional arguments passed to aspcf.

Details

copynumber is a package to perform efficient segmentation of SNP-array data. The function find.breaks uses the algorithms from the **copynumber** package to find break points, where the default parameters have been optimized for sequencing data, but a careful choice of an optimal gamma value is advised.

Examples

```
## Not run:
```

```
data.file <- system.file("extdata", "example.seqz.txt.gz", package = "sequenza")</pre>
# read all the chromosomes:
seqz.data <- read.seqz(data.file)</pre>
# Gather genome wide GC-stats from raw file:
gc.stats <- gc.sample.stats(data.file)</pre>
gc.vect <- setNames(gc.stats$raw.mean, gc.stats$gc.values)</pre>
# Read only one chromosome:
seqz.data <- read.seqz(data.file, chr.name = 12)</pre>
# Correct the coverage of the loaded chromosome:
seqz.data$adjusted.ratio <- seqz.data$depth.ratio /</pre>
                            gc.vect[as.character(seqz.data$GC.percent)]
# Select the heterozygous positions
seqz.hom <- seqz.data$zygosity.normal == 'hom'</pre>
seqz.het <- seqz.data[!seqz.hom, ]</pre>
# Detect breakpoints
breaks <- find.breaks(seqz.het, gamma = 80, kmin = 10, baf.thres = c(0, 0.5))</pre>
# use heterozygous and homozygous position to measure segment values
segment.breaks(seqz.data, breaks = breaks)
```

End(Not run)

gc.sample.stats Collect display and correct GC-content related coverage bias

Description

Collect information and perform statistics of depth of coverage in relation with GC-content.

Usage

Arguments

file	name of a file in the seqz format.
col_types	a string describing the classes of each columns of the input file (see read_tsv). The default value corresponds to the columns of a seqz file used for carculating GC statistics.

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buffer	maximal size of each chunk in bytes(see chunk.apply).
parallel	integer, number of threads used to process a seqz file (see chunk.apply).
verbose	logical. If TRUE (the default) the function retuns information in the console.
gc_list	a normal or tumor list resulting from the gc.sample.stats function.
mean.col	color for the mean in the summary plot.
median.col	color for the median in the summary plot.
<pre>scale.subset</pre>	scale the depth values to sho in the plot. A value of 1 will show the average depth at the center of the plot.
	additional parametrers from colorgram.

Details

gc.sample.stats extracts depths and GC-content inforation for the tumor and the control samples from an seqz file it returns a list with 3 elements: file.metrics, normal and tumor.

file.metrics is a data.frame serving as index of the seqz file; the normal and tumor objects contains each 3 ojects: gc, depth and n.

gc and depth are vectors containing the recorded values of, respectively, GC and coverage depth. the n object is a matrix gcxdepth, recording the number of time a certain gc/depth pairs is observed in the data.

Value

A list with the following elements:

file.metrics	index of the seqz file.
tumor	GC and coverage depth observations in the tumor sample.
normal	GC and coverage depth observations in the control sample.

Examples

Not run:

```
data.file <- system.file("extdata", "example.seqz.txt.gz", package = "sequenza")
# read all the chromosomes:
gc_info <- gc.sample.stats(data.file)</pre>
```

mean values of depth coverage vs GC content

```
mean_gc(gc_info$normal)
```

```
# plot the information for the tumor and normal samples
par(mfrow=c(1, 2))
gc.summary.plot(gc_info$normal, main = "Normal GC stats")
gc.summary.plot(gc_info$tumor, main = "Tumor GC stats")
```

End(Not run)

model.points

model.points

Generate B-allele frequency, mutation frequency and depth ratios at given model points, cellularity and ploidy values

Description

The baf.model.points and mufreq.model.points functions combine theoretical_baf, theoretical_mufreq and theoretical_depth_ratio to model the theoretical respective values at known values of cellularity and ploidy.

Usage

```
baf.model.points(cellularity, ploidy, baf_types, avg.depth.ratio)
mufreq.model.points(cellularity, ploidy, mufreq_types, avg.depth.ratio)
```

Arguments

cellularity	fraction of tumor cells in the sample.
ploidy	2 * ratio between total DNA content in a tumor cell and a normal cell.
baf_types	matrix with the sets of copy numbers and number of mutated alleles over which to model mutation frequency and depth ratio. The matrix can be generated with baf.types.matrix.
mufreq_types	matrix with the sets of copy numbers and number of mutated alleles over which to model mutation frequency and depth ratio. The matrix can be generated with mufreq.types.matrix.
avg.depth.ratio	0

average normalized depth ratio.

Details

The baf.model.points and mufreq.model.points functions generate the theoretical values of B-allele frequency, mutation frequency and depth ratio for the given type tags. To learn more about type tags see types.matrix.

Value

For baf.model.points a data.frame with two columns:

BAF	modelled values of B-allele frequency.	
depth_ratio	modelled values of depth ratio.	
For mufreq.model.points a data.frame with two columns:		
mufreqs	modelled values of mutation frequency.	
depth_ratio	modelled values of depth ratio.	

mutation.table

See Also

```
types.matrix, theoretical.depth.ratio, theoretical.baf theoretical.mufreq.
```

Examples

```
# Simulate a cellularity of 0.5, ploidy of 2 and types from min CNt 0
# and max = 4 on an originally diploid genome:
types <- baf.types.matrix(CNt.min = 0, CNt.max = 4, CNn = 2)
cbind(types, baf.model.points(cellularity = 0.5, ploidy = 2,
        baf_types = types, avg.depth.ratio = 1))
# Simulate a cellularity of 0.5, ploidy of 2 and types from min CNt 0
# and max = 4 on an originally monoallelic genome:
types <- mufreq.types.matrix(CNt.min = 0, CNt.max = 4, CNn = 1)
cbind(types, mufreq.model.points(cellularity = 0.5, ploidy = 2,
        mufreq_types = types, avg.depth.ratio = 1))</pre>
```

mutation.table Identify mutations

Description

This function extracts positions from an seqz file that differ from the normal genome, applying various filters.

Usage

seqz.tab	an seqz table, as output from read. seqz.
mufreq.treshold	
	mutation frequency threshold.
min.reads	minimum number of reads above the quality threshold to accept the mutation
	call.
min.reads.norma	al
	minimum number of reads used to determine the genotype in the normal sample.
<pre>max.mut.types</pre>	maximum number of different base substitutions per position. Integer from 1 to 3 (since there are only 4 different bases). Default is 3, to accept "noisy" mutation calls.
<pre>min.type.freq</pre>	minimum frequency of aberrant types.
min.fw.freq	minimum frequency of variant reads detected in the forward strand. Setting it to 0, all the variant calls with strand frequency in the interval outside 0 and 1, margin not comprised, would be discarded.
segments	if specified, the values of depth ratio would be taken from the segments rather than from the raw data.

Details

Calling mutations in impure tumor samples is a difficult task, because the degree of contamination by normal cells affects the measured mutation frequency. In highly impure samples, where the normal cells comprise the major component of the sample, mutations can be so diluted that it can be difficult to distinguish them from sequencing errors.

The function mutation.table tries to separate true mutations from sequencing errors, based on the given threshold. In samples with low contamination, it should even be possible to catch sub-clonal mutations using this function.

This function identifies only those mutations occuring in positions that are homozygous in the normal genome.

Value

A data frame, which in addition to some of the columns of the seqz table, contains the following two columns:

F	the mutation frequency
mutation	a character representation of the mutation. For example, a mutation from 'A' in
	the normal to 'G' in the tumor is annotated as 'A>G'.

Examples

Not run:

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plotWindows

Description

The plotWindows function visualizes a data.frame produced by the windowValues or windowBf functions.

Usage

```
plotWindows(seqz.window, m.lty = 1, m.lwd = 3, m.col = "black",
    q.bg = "lightblue", log2.plot = FALSE, n.min = 1, xlim, ylim,
    add = FALSE, ...)
```

Arguments

seqz.window	data frame of base-pair windows and corresponding quartiles to be plotted. A list of such data frames can be output from windowValues or windowBf.
m.lty	line type used for plotting mean values.
m.lwd	line width used for plotting mean values.
m.col	line color used for plotting mean values.
q.bg	background color for the area between the 0.25 and 0.75 quartiles.
log2.plot	logical, if TRUE values are log2 scaled.
n.min	minimum number of data points required for a binned window to be plotted.
xlim	limits of the x axis.
ylim	limits of the y axis.
add	logical, if TRUE the plot will be added to an existing opened device.
	any other arguments accepted by plot.

See Also

chromosome.view,

Examples

```
data.file <- system.file("extdata", "example.seqz.txt.gz",
    package = "sequenza")
seqz.data <- read.seqz(data.file)
# 1Mb windows, each window is overlapping with 1 other adjacent
# window: depth ratio
seqz.ratio <- windowValues(x = seqz.data$depth.ratio,
    positions = seqz.data$position, chromosomes = seqz.data$chromosome,
    window = 1e6, weight = seqz.data$depth.normal, start.coord = 1,
    overlap = 1)
```

```
plotWindows(seqz.ratio[[1]], log2.plot = FALSE, ylab = "Depth ratio",
    xlab = "Position (bases)", main = names(seqz.ratio)[1], las = 1,
    n.min = 1, ylim = c(0, 2.5))
plotWindows(seqz.ratio[[17]], log2.plot = FALSE, ylab = "Depth ratio",
    xlab = "Position (bases)", main = names(seqz.ratio)[1], las = 1,
    n.min = 1, ylim = c(0, 2.5))
```

read.seqz

Read a seqz or acgt format file

Description

Efficiently reads a seqz file into R.

Usage

```
read.seqz(file, n_lines = NULL, col_types = "ciciidddcddccc", chr_name = NULL,
    buffer = 33554432, parallel = 1,
    col_names = c("chromosome", "position", "base.ref", "depth.normal",
        "depth.tumor", "depth.ratio", "Af", "Bf", "zygosity.normal",
        "GC.percent", "good.reads", "AB.normal", "AB.tumor",
        "tumor.strand"),...)
```

file	file name
col_types	a string describing the classes of each columns of the input file (see read_tsv). The default value corresponds to the columns of a seqz file.
chr_name	if specified, only the selected chromosome will be extracted instead of the en- tire file. For tabix-indexed files this argument can also be used to extract coordinated-selected genomic regions. E.g. chr_name="5:1-1000000" will se- lect the first megabase of chromosome 5.
n_lines	vector of length 2 specifying the first and last line to read from the file. If specified, only the selected portion of the file will be used.
buffer	maximal size of each chunk in bytes(see chunk.apply).
parallel	integer, number of threads used to process a seqz file (see chunk.apply).
col_names	names of the columns of the seqz file. The default corresponds to the column names of a seqz file.
	any arguments accepted by read_tsv.

read.seqz

Format

A seqz file is a tab-separated text file with 14 columns and a header row. The first 3 columns are derived from the original pileup file and contain:

chromosome the chromosome name

position the base position

base.ref the base in the reference genome. Note that this is NOT necessarily the same base as in the normal specimen. The remaining 10 columns contain the following information:

depth.normal read depth observed in the normal sample

depth.tumor read depth observed in the tumor sample

depth.ratio ratio of depth.tumor and depth.normal

- Af A-allele frequency observed in the tumor sample
- Bf B-allele frequency observed in the tumor sample in heterozygous positions
- **zygosity.normal** zygosity of the reference sample. "hom" corresponds to AA or BB, whereas "het" corresponds to AB or BA
- **GC.percent** GC-content (percent), calculated from the reference genome in fixed nucleotide windows
- **good.reads** number of reads that passed the quality threshold (threshold specified in the pre-processing software), in the tumor specimen
- **AB.normal** base(s) found in the germline sample; for heterozygous positions AB are sorted using the values of Af and Bf respectively
- **AB.tumor** base(s) found in the tumor sample not present in the normal specimen. The field include all the variants found in the tumor alignment, separated by a colon. Each variant contains the base and the observed frequency
- **tumor.strand** frequency of the variant nucleotides detected on the forward orientation. The field have a consistent structure with AB.tumor, indicating the fraction, relative to the total number of reads presenting the specific variant, orientated in the forward direction

Details

read.seqz is a function that allows to efficiently access a seqz file by chromosome or by line numbers. The function can also access coordinate specific regions with tabix-indexed seqz files. The specific content of a seqz file is explained in the value section.

See Also

read_delim.

Examples

Not run:

data_file <- system.file("extdata", "example.seqz.txt.gz", package = "sequenza")</pre>

read chromosome 1 from an seqz file.

```
seqz_data <- read.seqz(data_file, chr_name = 1)
## Fast access to chromosome X using the file metrics
gc.stats <- gc.sample.stats(data_file)
chrX <- gc.stats$file.metrics[gc.stats$file.metrics$chr == "X", ]
seqz.data <- read.seqz(data_file, n_lines = c(chrX$start, chrX$end))
## Compare the running time of the two different methods.
system.time(seqz.data <- read.seqz(data_file, n_lines = c(chrX$start, chrX$end)))
system.time(seqz.data <- read.seqz(data_file, chr_name = "X"))</pre>
```

End(Not run)

sequenza

Sequenza convenience functions for standard analysis

Description

These three functions are intended to be the main user interface of the package, to run several of the functions of sequenza in a standardized pipeline.

Usage

```
sequenza.extract(file, window = 1e6, overlap = 1,
  gamma = 80, kmin = 10, gamma.pcf = 140, kmin.pcf = 40,
  mufreq.treshold = 0.10, min.reads = 40, min.reads.normal = 10,
  min.reads.baf = 1, max.mut.types = 1, min.type.freq = 0.9,
  min.fw.freq = 0, verbose = TRUE, chromosome.list = NULL,
  breaks = NULL, breaks.method = "het", assembly = "hg19",
  weighted.mean = TRUE, normalization.method = "mean",
  ignore.normal = FALSE, parallel = 1, gc.stats = NULL,
  segments.samples = FALSE)
sequenza.fit(sequenza.extract, female = TRUE, N.ratio.filter = 10,
             N.BAF.filter = 1, segment.filter = 3e6,
             mufreq.treshold = 0.10, XY = c(X = "X", Y = "Y"),
             cellularity = seq(0.1, 1, 0.01), ploidy = seq(1, 7, 0.1),
             ratio.priority = FALSE, method = "baf",
             priors.table = data.frame(CN = 2, value = 2),
             chromosome.list = 1:24, mc.cores = getOption("mc.cores", 2L))
sequenza.results(sequenza.extract, cp.table = NULL, sample.id, out.dir = getwd(),
               cellularity = NULL, ploidy = NULL, female = TRUE, CNt.max = 20,
                 ratio.priority = FALSE, XY = c(X = "X", Y = "Y"),
                 chromosome.list = 1:24)
```

sequenza

file	the name of the seqz file to read.
window	size of windows used when plotting mean and quartile ranges of depth ratios and B-allele frequencies. Smaller windows will take more time to compute.
overlap	integer specifying the number of overlapping windows.
gamma, kmin	arguments passed to aspcf from the copynumber package.
gamma.pcf, kmir	n.pcf
	arguments passed to pcf from the copynumber package. The arguments are effective only when breaks.method is set to "full".
mufreq.treshold	
	mutation frequency threshold.
min.reads	minimum number of reads above the quality threshold to accept the mutation call.
<pre>min.reads.norma</pre>	
	minimum number of reads used to determine the genotype in the normal sample.
min.reads.baf	threshold on the depth of the positions included to calculate the average BAF for segment.
<pre>max.mut.types</pre>	maximum number of different base substitutions per position. Integer from 1 to 3 (since there are only 4 bases). Default is 3, to accept "noisy" mutation calls.
<pre>min.type.freq</pre>	minimum frequency of aberrant types.
min.fw.freq	minimum frequency of variant reads detected in the forward strand. Setting it to 0, all the variant calls with strand frequency in the interval outside 0 and 1, margin not comprised, would be discarded.
verbose	logical, indicating whether to print information about the chromosome being processed.
chromosome.list	t
	vector containing the index or the names of the chromosome to include in the model fitting.
breaks	Optional data.frame in the format chrom, start.pos, end.pos, defining a pre- existing segmentation. When the argument is set the built-in segmentation will be skipped in favor of the suggested breaks.
breaks.method	Argument indicating the resolution of the segmentation. Possible values are fast, het and full, where fast allows the lower resolution and full the higher. Custom values of gamma and kmin need to be adjusted to have optimal results.
assembly	assembly version of the genome, see aspcf or pcf.
weighted.mean	boolean to select if the segments should be calculated using the read depth as weights to calculate depth ratio and B-allele frequency means.
normalization.r	
	string defining the operation to perform during the GC-normalization process. Possible values are mean (default) and median. A median normalization is preferable with noisy data.

ignore.normal	boolean, when set to TRUE the process will ignore the normal coverage and perform the analysis by using the normalized tumor coverage.
parallel	integer, number of threads used to process a seqz file (see chunk.apply).
gc.stats	object returned from the function gc.sample.stats. If NULL the object will be computed from the input file.
segments.sample	25
	EXPERIMENTAL. Segment both tumor and normal samples separately, and add it to the QC plots.
sequenza.extrac	t
	a list of objects as output from the sequenza.extract function.
method	<pre>method to use to fit the data; possible values are baf to use baf.model.fit or mufreq to use the mufreq.model.fit function to fit the data.</pre>
cp.table	a list of objects as output from the sequenza.fit function.
female	logical, indicating whether the sample is male or female, to properly handle the X and Y chromosomes. Implementation only works for the human normal karyotype.
CNt.max	maximum copy number to consider in the model.
N.ratio.filter	threshold of minimum number of observation of depth ratio in a segment.
N.BAF.filter	threshold of minimum number of observation of B-allele frequency in a segment.
segment.filter	threshold segment length (in base pairs) to filter out short segments, that can cause noise when fitting the cellularity and ploidy parameters. The threshold will not affect the allele-specific segmentation.
XY	character vector of length 2 specifying the labels used for the X and Y chromosomes.
cellularity	vector of candidate cellularity parameters.
ploidy	vector candidate ploidy parameters.
priors.table	data frame with the columns CN and value, containing the copy numbers and the corresponding weights. To every copy number is assigned the value 1 as default, so every values different then 1 will change the corresponding weight.
ratio.priority	logical, if TRUE only the depth ratio will be used to determine the copy number state, while the Bf value will be used to determine the number of B-alleles.
sample.id	identifier of the sample, to be used as a prefix for saved objects.
out.dir	output directory where the files and objects will be saved.
mc.cores	legacy argument to set the number of cores, but it refers to the cl of pblapply. It uses mclapply when set to an integer.

Details

The first function, sequenza.extract, utilizes a range of functions from the sequenza package to read the raw data, normalize the depth.ratio for GC-content bias, perform allele-specific segmentation, filter for noisy mutations and bin the raw data for plotting. The computed objects are returned as a single list object.

theoretical.baf

The segmentation by default is performed using only the heterozygous position and the aspcf function from **copynumber** package. The full option in the breaks.method argument allow to combine results of the segmentation of all the data available, using the pcf function, and the default aspcf using only the heterozygous positions.

The second function, sequenza.fit, accepts the output from sequenza.extract and calls baf.model.fit to calculate the log-posterior probability for all pairs of the candidate ploidy and cellularity parameters.

The third function, sequenza.results, saves a number of objects in a specified directory (default is the working directory). The objects are:

- The list of segments with resulting copy numbers and major and minor alleles.
- The candidate mutation list with variant allele frequency, and copy number and number of mutated allele, in relation of the clonal population (for sub-clonal population it needs to be processed with further methods).
- A plot of all the chromosomes in one image, representing the major and minor alleles and the absolute copy number changes (genome_view).
- Multiple plots with one chromosome per image, representing copy-number, B-allele frequency and mutation in parallel (chromosome_view).
- Results of the model fitting (CP_contours and confints_CP)
- A summary of the copy number state of the sample (CN_bars).

See Also

genome.view, baf.bayes, cp.plot, get.ci.

Examples

End(Not run)

theoretical.baf Calculates cellularity and ploidy dependent model points

Description

Calculates the theoretically expected values of BAF, mutation frequency or depth ratio for given values of cellularity, ploidy and copy number.

Usage

```
theoretical.depth.ratio(CNt, cellularity, ploidy, CNn = 2,
    normal.ploidy = 2, avg.depth.ratio = 1)
theoretical.baf(CNt, B, cellularity, CNn = 2)
theoretical.mufreq(CNt, Mt, cellularity, CNn = 2)
```

Arguments

CNn	copy number in the normal sample.
CNt	copy number in the tumor sample.
В	number of B-alleles in the tumor sample.
Mt	number of alleles carrying a mutation in the tumor sample.
cellularity	fraction of tumor cells in the sample.
ploidy	2 * ratio between total DNA content in a tumor cell and a normal cell.
normal.ploidy	ploidy value in the normal sample. Default is 2 for a diploid cell.
avg.depth.ratio	
	average normalized denth ratio

average normalized depth ratio.

Details

The observed B-allele frequency, depth ratio and mutation frequency are affected by the cellularity of the tumor sample, which is the inverse of the degree of contamination by normal cells. Three functions are included, which for know values of cellularity and ploidy they produce the expected values of B-allele frequency, mutation frequency or depth ratio.

theoretical.baf returns a dataframe with the possible copy numbers of A and B alleles, along with their corresponding B-allele frequency and the total copy number state (always the sum of A+B).

theoretical.depth.ratio returns the theoretical depth ratio at a single specific position, given values of cellularity, ploidy, the ratio between the tumor copy number and the normal copy number at that position, and the average depth ratio of the sample.

theoretical.mufreq returns the theoretical mutation frequency at a single specific position, given values of cellularity, copy number in the normal and tumor samples at that position, and the number of mutated alleles.

See Also

model.points

types.matrix

Description

Type tags are a utensil to distinguish genomic positions by their copy number state, number A and B alleles and the number of mutated alleles. This function creates a matrix of all possible type tags, given the copy number of the normal sample and the range of possible copy numbers in the tumor sample.

Usage

```
baf.types.matrix(CNt.min, CNt.max, CNn = 2)
mufreq.types.matrix(CNt.min, CNt.max, CNn = 2)
```

Arguments

CNt.min	minimum copy number in the tumor.
CNt.max	maximum copy number in the tumor.
CNn	copy number of the normal sample.

Details

A type consists of 3 integers signifying the copy number in the normal and tumor samples and the number of B alleles (baf.types.matrix) or mutated alleles (mufreq.types.matrix). The two functions return all the possible types combination within the range of tumor copy numbers in the arguments (CNt.min:CNt.max).

Value

baf.types.matrix returns a data.frame with the 3 columns:

CNn	number of alleles in the normal sample.
CNt	numbers of alleles in the tumor sample.
В	number of B alleles in the tumor sample.
mufreq.types.matrix returns a data.frame with the 3 columns:	
CNn	number of alleles in the normal sample.
CNt	numbers of alleles in the tumor sample.
Mt	number of mutated alleles in the tumor sample.

See Also

theoretical_mufreq, theoretical_depth_ratio, theoretical_baf, model_points.

Examples

```
## Generate matrix types from 0 to 4 copy number, being the
## non-tumor chromosome diploid.
baf.types.matrix(CNt.min = 0, CNt.max = 4, CNn = 2)
## Generate matrix types from 0 to 4 copy number, being the
## non-tumor chromosome monoploid.
mufreq.types.matrix(CNt.min = 0, CNt.max = 4, CNn = 1)
```

windowValues

Bins sequencing data for plotting

Description

Given a variable with corresponding genomic positions, the function bins the values in windows of a specified size and calculates weighted mean and 25th and 75th percentile for each window. The resulting object are visualized by the function plotWindows.

Usage

```
windowValues(x, positions, chromosomes, window = 1e6, overlap = 0,
    weight = rep.int( x = 1, times = length(x)), start.coord = 1)
windowBf(Af, Bf, good.reads, positions, chromosomes, window = 1e6,
    overlap = 0, start.coord = 1, conf = 0.95)
```

x	variable to be windowed.
positions	base-pair positions.
chromosomes	names or numbers of the chromosomes.
window	size of windows used for binning data. Smaller windows will take more time to compute.
overlap	integer defining the number of overlapping windows. Default is 0, no overlap.
weight	weights to be assigned to each value of x, usually related to the read depth.
start.coord	coordinate at which to start computing the windows. If NULL, will start at the first position available.
Af	A-allele frequency for the Bf calculation.
Bf	B-allele frequency for the Bf calculation.
good.reads	number of reads passing filter for the Bf calculation.
conf	confidence intervals of the binned Bf value.

window Values

Details

DNA sequencing produces an amount of data too large to be handled by standard graphical devices. In addition, for samples analyzed with older machines and with low or middle coverage (20x to 50x), measures such as read depth are subject to big variations due to technical noise. Using windowValues prior to plotting reduces the noise and the amount of data to be plotted.

The binning of the B-allele frequency requires a separate function, windowBf, as the B-allele frequency calculation uses multiple values: Af, Bf and good.reads.

The output of windowValues and windowBf can be used as input for plotWindows.

Value

a list of data.frame, one per chromosome. Each data.frame contains base-pair windows covering the chromosome. Each row of the data.frame correspond to a window and its weighted mean, 25th and 75th percentiles of the input values, and the number of data points within each window.

See Also

plotWindows

Examples

```
## Not run:
   data.file <- system.file("extdata", "example.seqz.txt.gz",</pre>
        package = "sequenza")
    seqz.data <- read.seqz(data.file)</pre>
    # 1Mb windows, each window is overlapping with 1 other
    # adjacent window: depth ratio
    seqz.ratio <- windowValues(x = seqz.data$depth.ratio,</pre>
        positions = seqz.data$position, chromosomes = seqz.data$chromosome,
        window = 1e6, weight = seqz.data$depth.normal, start.coord = 1,
        overlap = 1)
    seqz.hom <- seqz.data$zygosity.normal == 'hom'</pre>
    seqz.het <- seqz.data[!seqz.hom, ]</pre>
    # 1Mb windows, each window is overlapping with 1 other adjacent window:
    # B-allele frequency
    seqz.bafs <- windowValues(x = seqz.het$Bf, positions = seqz.het$position,</pre>
        chromosomes = seqz.het$chromosome, window = 1e6,
        weight = seqz.het$depth.tumor, start.coord = 1, overlap = 1)
    # Repeat the same operation using windowBf
    seqz.bafs <- windowBf(Af = seqz.het$Bf, Bf = seqz.het$Bf,</pre>
        good.reads = seqz.het$good.reads, positions = seqz.het$position,
        chromosomes = seqz.het$chromosome, window = 1e6,
        start.coord = 1, overlap = 1, conf = 0.95)
```

End(Not run)

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