

Package ‘Scale4C’

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Type Package

Title Scale4C: an R/Bioconductor package for scale-space transformation of 4C-seq data

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Author Carolin Walter

Maintainer Carolin Walter <carolin.walter@uni-muenster.de>

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Suggests

Description Scale4C is an R/Bioconductor package for scale-space transformation and visualization of 4C-seq data. The scale-space transformation is a multi-scale visualization technique to transform a 2D signal (e.g. 4C-seq reads on a genomic interval of choice) into a tessellation in the scale space (2D, genomic position x scale factor) by applying different smoothing kernels (Gauss, with increasing sigma). This transformation allows for explorative analysis and comparisons of the data's structure with other samples.

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addPointsOfInterest *Add points of interest to a Scale4C object*

Description

The function `addPointsOfInterest` adds marker points to a `Scale4C` object, which are subsequently used to mark points of interest in created plots.

Usage

```
addPointsOfInterest(data, poi)
```

Arguments

<code>data</code>	Scale4C object the points are to be added to
<code>poi</code>	Points of interest data, in a <code>GRanges</code> object. Important: column names must be specified and include 'colour' and 'name' for each point of interest with appropriate values

Details

The function `addPointsOfInterest` adds predefined points of interest to a `Scale4C` object. Each point of interest is defined by 'chr', 'start', 'end', 'colour', and 'name'. A bed file or text file can be used to store the information, however, column names have to be added before import. Other additional columns are ignored by the function. The function then converts the information to a `GRanges` object.

Value

A data frame that contains the data for all points of interest

Author(s)

Carolin Walter

Examples

```
# import provided point of interest example, and check if import was
# successful
data(liverData)
poiFile <- system.file("extdata", "vp.txt", package="Scale4C")
pointsOfInterest(liverData) <- addPointsOfInterest(liverData,
  read.csv(poiFile, sep = "\t", stringsAsFactor = FALSE))
head(pointsOfInterest(liverData))
```

`calculateFingerprintMap`*Calculate scale-space fingerprint map for given 4C-seq data*

Description

`calculateFingerprintMap` uses the scale space map to calculate the inflection points of the smoothed signals.

Usage

```
calculateFingerprintMap(data, maxSQSigma = 5000, epsilon = 0.0000001)
```

Arguments

<code>data</code>	Scale-space object for the 4C-seq data
<code>maxSQSigma</code>	Maximum square sigma used to calculate the fingerprint map
<code>epsilon</code>	Small numeric value (can also be zero); used to test for inflection points

Details

Scale4C uses Gauss kernels of increasing (square) sigma to smooth the original 4C-seq signal. The resulting inflection points for a chosen sigma are stored in the corresponding line of the fingerprint map, i.e. a 2D matrix (position x sigma).

Value

A `Scale4C` object containing the fingerprint map for a `Scale4C` object, i.e. a matrix with quite a lot of zeros and the occasional 2 or -1 as symbols for inflection points. The fingerprint map is included as second assay of the `Scale4C` object's `scaleSpace SummarizedExperiment` slot.

Author(s)

Carolin Walter

Examples

```
# read prepared example data
data(liverData)
# use small maxSQSigma for a fast example
liverData<-calculateFingerprintMap(liverData, maxSQSigma = 50)
head(t(assay(scaleSpace(liverData), 2))[1:10,1:20])
```

calculateScaleSpace *Calculate scale-space representation for given 4C-seq data*

Description

Scale4C uses Gauss kernels of increasing (square) sigma to smooth the original 4C-seq signal. The resulting data is stored in a 2D matrix (position x sigma).

Usage

```
calculateScaleSpace(data, maxSQSigma = 5000)
```

Arguments

data	Scale-space object for the 4C-seq data
maxSQSigma	Maximum square sigma used to calculate the scale space

Details

The central idea of the scale-space transformation is to smooth the original signal with increasing strength, identify inflection points, track those inflection points throughout the different smoothing layers, and find singularities in those inflection point 'lines'. In case of 4C-seq data, this corresponds to smoothing the signal gradually, while making notes when features such as 'peaks' or 'valleys' disappear by merging with other features. `calculateScaleSpace` smoothes the original signal up to a provided smoothing factor square sigma (Gauss kernel).

Value

A `SummarizedExperiment` that contains in its first assay the scale space representation for a `Scale4C` object

Author(s)

Carolin Walter

Examples

```
# read prepared example data
data(liverData)
# use small maxSQSigma for a fast example
scaleSpace(liverData) <- calculateScaleSpace(liverData, maxSQSigma = 10)
head(t(assay(scaleSpace(liverData), 1))[,1:20])
```

findSingularities *Find singularities in a provided scale-space fingerprint map*

Description

This function allows to identify singular points in a scale-space fingerprint map.

Usage

```
findSingularities(data, minSQSigma = 5, outputTrackingInfo = FALSE,  
guessViewpoint = FALSE, useIndex = TRUE)
```

Arguments

data	Scale-space object for the 4C-seq data
minSQSigma	Minimum square sigma used to calculate singularities; for a square sigma of 1, the data can be quite chaotic and identified singularities are less prone to error when a minSQSigma of 2 or higher is used
outputTrackingInfo	If TRUE, notify the user that a certain position / singularity causes problems during tracking in the fingerprint map
guessViewpoint	If TRUE, add another 'peak' at the coordinates of the viewpoint, if provided. Extra singularities can also be added manually. The idea is to decrease running speed significantly by not actually calculating the largest singularity for a typical 4C-seq experiment, i.e. the main viewpoint peak. Its inflection point contours should easily be visible in the fingerprint map, provided that the viewpoint position is actually included in the raw data, but calculating the full contours requires a very high sigma that should usually not be needed to identify other singularities in the area. Cave: Viewpoint contours don't have to start directly next to the viewpoint coordinates.
useIndex	If TRUE, use fragment index instead of genomic position data

Details

findSingularities identifies possible singular points in the fingerprint map's contours, i.e. points where a line of '2' and '-1' in the matrix meet. Starting from those points in scale-space, the contours are traced back down. This 'localization step' ensures that the coordinates for a feature ('peak' or 'valley') corresponding to a given singular point are as accurate as possible: Smoothing with a high-sigma Gauss kernel distorts the original signal somewhat, so that the inflection points identifying the start and the end of a certain feature 'move outwards'.

Value

A data frame that lists the position where a singular point occurs (genomic position and scale-space sigma), plus the size of the feature as given by its minimal / left and maximal / right position.

Author(s)

Carolin Walter

Examples

```
# read prepared example data
data(liverData)
singularities(liverData) = findSingularities(liverData, 5, useIndex = TRUE)
singularities(liverData)
```

```
importBasic4CseqData Import raw data from a provided Basic4Cseq output file
```

Description

A convenience function to easily include **Basic4Cseq** output data into **Scale4C**, `importBasic4CseqData` extracts valid fragments or valid fragment ends from a typical **Basic4Cseq** output table.

Usage

```
importBasic4CseqData(rawFile, viewpoint, viewpointChromosome,
  distance, useFragEnds = TRUE)
```

Arguments

<code>rawFile</code>	Name for the raw file
<code>viewpoint</code>	Viewpoint position: only fragments around a certain point of interest are imported (doesn't have to be the actual viewpoint of the experiment, though)
<code>viewpointChromosome</code>	Viewpoint chromosome of the experiment
<code>distance</code>	Distance from the viewpoint: only fragments within a certain distance of the viewpoint are imported
<code>useFragEnds</code>	If TRUE, use full fragment end data, if FALSE, merge <code>fragmentStart</code> and <code>fragmentEnd</code> to a single item per fragment

Details

`importBasic4CseqData` is a convenience function to import data from **Basic4Cseq**. It can be ignored altogether if raw experimental data is imported from another source or with another function into R.

Value

A GRanges object that includes the experiment's raw data for further processing

Author(s)

Carolin Walter

Examples

```
csvFile <- system.file("extdata", "liverData.csv", package="Scale4C")
liverReads <- importBasic4CseqData(csvFile, viewpoint = 21160072,
  viewpointChromosome = "chr10", distance = 1000000)
head(liverReads)
```

`liverData`*Example 4C-seq data set of fetal liver data*

Description

This data set contains an instance of a `Scale4C` object.

The 4C-seq data was taken from Stadhouders et al's fetal liver data set.

Usage

```
data("liverData")
```

Format

Formal class `'Scale4C'`

Value

A pre-computed instance of a `Scale4C` object with fingerprint map and singularities. Scale-space image is reduced to save space.

Source

Shortened version of Stadhouders et al's fetal liver data:

Stadhouders, R., Thongjuea, S., et al. (2012): Dynamic long-range chromatin interactions control Myb proto-oncogene transcription during erythroid development. *EMBO*, 31, 986-999.

Examples

```
data("liverData")  
liverData
```

`liverDataVP`*Example 4C-seq data set of fetal liver data, with added VP*

Description

This data set contains an instance of a `Scale4C` object.

The 4C-seq data was taken from Stadhouders et al's fetal liver data set. It contains a manually added viewpoint peak and a peak with a manual coordinate correction.

Usage

```
data("liverDataVP")
```

Format

Formal class `'Scale4C'`

Value

A pre-computed instance of a Scale4C object with fingerprint map and singularities

Source

Shortened version of Stadhouders et al's fetal liver data:

Stadhouders, R., Thongjuea, S., et al. (2012): Dynamic long-range chromatin interactions control Myb proto-oncogene transcription during erythroid development. EMBO, 31, 986-999.

Examples

```
data("liverDataVP")
liverDataVP
```

outputScaleSpaceTree *Output list of all features for a given scale-space map*

Description

This function provides a list of features for a given fingerprint map in scale-space, with position and range of sigma for which the feature in question exists

Usage

```
outputScaleSpaceTree(data, outputPeaks = TRUE, useLog = TRUE,
  useIndex = TRUE)
```

Arguments

data	a Scale4C object with singularity data
outputPeaks	If TRUE, output GRanges peak list only, if FALSE, also output valley data in a larger table
useLog	If TRUE, use a log2 transformation on the square sigma values (fewer changes and fewer singularities for high sigma, in contrast to low sigma)
useIndex	If TRUE, use fragment position

Details

Similar to plotTesselation, outputScaleSpaceTree analyzes a list of singular points and calculates corresponding features, i.e. 'peaks' and 'valleys'. Each singular point marks the disappearance (or occurrence, depending on the view) of a feature in scale space: With increasing square sigma as smoothing parameter for the Gauss kernel, smaller features are merged into larger features. In case of Gauss smoothing, one feature is always surrounded by two features of the opposite type, e.g. a 'peak' is surrounded by two 'valleys'. If a 'peak' is smoothed out, it is replaced by a new valley formed of the former peak's adjacent valleys. The singularity list contains only direct information on those 'central' features; outputScaleSpaceTree adds data on the direct neighbours / adjacent features and also provides the sigma ranges for the features as a measure of their stability throughout the smoothing process. Mean read counts for the identified features are also provided ("signal"). If outputPeaks is true, a reduced list of peaks is printed, while omitting valleys or the central-left-right structural information.

Value

A GRanges object that includes all features as identified through singular points, plus 'neighbour features' at each side (each 'peak' is surrounded by two 'valleys' and vice versa for Gauss kernel smoothing), with positions and range of sigma for which the feature in question remains stable

Author(s)

Carolin Walter

Examples

```
# read prepared example data
data(liverDataVP)
output = outputScaleSpaceTree(liverDataVP, useLog = FALSE)
head(output)
```

plotInflectionPoints *Draw a smoothed near-cis profile with marked inflection points for a 4C-seq signal*

Description

plotInflectionPoints plots the inflection points for a given square sigma (i.e. a row of the fingerprint map) onto a corresponding smoothed near-cis plot for the 4C-seq signal. This allows to check problematic parts of the fingerprint map in more detail (e.g. unclear tracking areas with close contours), and to improve possible corrections in the singularity list. Plotting the smoothed signal for a given square sigma before calculation of the fingerprint map is also possible.

Usage

```
plotInflectionPoints(data, sqsigma, fileName = "inflectionPlot.pdf",
width = 9, height = 5, maxVis = 5000, useIndex = TRUE, plotIP = TRUE)
```

Arguments

data	Scale4C object with experimental 4C-seq data to be smoothed and processed
sqsigma	Chosen square sigma, i.e. row of the fingerprint map to pick the inflection points from
fileName	Optional name for export file (pdf)
width	Width of the plot
height	Height of the plot
maxVis	Maximum y-axis value (read number, not sigma!) for visualization
useIndex	If TRUE, use fragment index for x-axis
plotIP	If TRUE, then mark chosen inflection points, if FALSE, simply plot smoothed data

Value

A near-cis plot of the smoothed data with (optional) marked inflection points in darker or lighter grey, depending on their direction

Note

PDF export is supported. If no plot file name is provided, the result is plotted on screen.

Author(s)

Carolin Walter

Examples

```
data(liverData)
plotInflectionPoints(liverData, 50)
```

plotTesselation

Draw the final scale space tessellation

Description

This method draws the final scale space tessellation, as specified by the list of singularities identified for a Scale4C object. Features are marked with different colours; for the default colour scheme, brown corresponds to 'peaks' and blue to 'valleys', while slightly darker colours mark features originating from singularities ('central' features in a set of three features, e.g. 'valley-peak-valley' or 'peak-valley-peak') and lighter colours the two adjacent features. Different colours for 'central' and 'adjacent' features allow for optical quality control of the tessellation: a 'central' / dark feature's direct predecessor or successor (y-axis) can't be of the same colour (i.e. a 'peak' that passes through a singularity is smoothed out into a 'valley'), and neighbouring intervals have to be of the opposing (but lighter) colour (i.e. each 'peak' is surrounded by two 'valleys' for Gauss kernel smoothing). The same is not necessarily true for an 'adjacent' / light feature, however.

Usage

```
plotTesselation(data, minSQSigma = 5, maxSQSigma = -1, maxVis = -1,
  fileName = "tesselationPlot.pdf", width = 5, height = 5, xInterval = 100,
  yInterval = 50, chosenColour = c("grey50", "moccasin", "lightskyblue1",
  "beige", "azure"), useIndex = TRUE)
```

Arguments

data	Scale4C object with singularity data
minSQSigma	Minimum square sigma to consider
maxSQSigma	Maximum square sigma to consider; if -1 then the number of rows in the fingerprint map is used
maxVis	Maximum y value for visualization (doesn't have to be maxSQSigma); if -1 also defaults to number of rows in the fingerprint map
fileName	Optional name for export file (pdf)
width	Width of the plot
height	Height of the plot
xInterval	Interval length for x-axis
yInterval	Interval length for y-axis

chosenColour	Chosen colours for the tessellation plot, five in total. Colour 1 is used for the actual lines of the plot, colour 2 for 'central peaks', colour 3 for 'central valleys', colour 4 for 'adjacent peaks', and colour 5 for 'adjacent valleys'
useIndex	If TRUE, use fragment index for x-axis

Value

A tessellation plot, showing different features of the scale space with their range of existence (square sigma) and position)

Note

PDF export is supported. If no plot file name is provided, the result is plotted on screen.

Author(s)

Carolin Walter

Examples

```
if(interactive()) {
  data(liverData)
  plotTessellation(liverData)
}
```

plotTraceback	<i>Draw the traceback results for a list of singular points on a fingerprint map</i>
---------------	--

Description

This method plots the traceback results together with fingerprint data, allowing to check for possible errors during tracking. Problems during tracking can occur if contours are very close, have holes, or if the singularity in question is not recognized at all due to holes at the meeting point of both contours that form a singular point. Each singular point is marked with a grey triangle, and the traced left and right end of the corresponding feature are connected with grey lines. If a contour's end doesn't match the traceback line, manual correction is possible in the singularity list.

Usage

```
plotTraceback(data, maxSQSigma = -1, fileName = "tracebackPlot.pdf",
width = 15, height = 15, useIndex = TRUE)
```

Arguments

data	Scale4C object with singularity data
maxSQSigma	Maximum square sigma (i.e. maximum y value) to be drawn; if -1 then all available rows in the fingerprint map are used
fileName	Optional name for export file (pdf)
width	Width of the plot
height	Height of the plot
useIndex	If TRUE, use fragment index for x-axis

Value

A traceback plot, showing the traced singular points with their points of origin throughout different smoothing layers)

Note

PDF export is supported. If no plot file name is provided, the result is plotted on screen.

Author(s)

Carolin Walter

Examples

```
if(interactive()) {
  data(liverData)
  plotTraceback(liverData)
}
```

Scale4C

Creating a Scale4C object

Description

This function creates a Scale4C object. Data on the 4C-seq experiment, i.e. read counts per fragment and viewpoint coordinates, are stored and checked for plausibility.

Usage

```
Scale4C(viewpoint, viewpointChromosome, rawData)
```

Arguments

viewpoint	The experiment's viewpoint (start, single coordinate)
viewpointChromosome	The experiment's viewpoint Chromosome
rawData	Reads of the 4C-seq experiment per fragment on an interval of interest (GRanges object with position and read data)

Details

A Scale4C object contains the basic information on a 4C-seq experiment for a certain interval of interest, i.e. read counts at given positions. See [Scale4C-class](#) for details. Scale-space features such as fingerprint maps or tessellation are calculated during further steps of the analysis by the appropriate functions.

Scale4C expects the raw data to be in a simple data frame consisting of 'position' and 'reads'. `importBasic4CseqData` allows to import fragment data from `Basic4Cseq` for convenience, however, preparing and importing a simple table with two columns into R is sufficient.

Value

An instance of the Scale4C class.

Author(s)

Carolin Walter

See Also[Scale4C-class](#)**Examples**

```
# create a Scale4C object from a Basic4Cseq export table with added
# viewpoint data
csvFile <- system.file("extdata", "liverData.csv", package="Scale4C")
liverReads <- importBasic4CseqData(csvFile, viewpoint = 21160072,
  viewpointChromosome = "chr10", distance = 1000000)
liverData = Scale4C(rawData = liverReads, viewpoint = 21160072,
  viewpointChromosome = "chr10")
liverData
```

Scale4C-class

*Class "Scale4C"***Description**

This class is a container for information on a specific 4C-seq scale-space transformation. Stored information includes raw read data, the experiment's viewpoint location (optional), possible points of interest, the scale-space fingerprint map, and a list of identified singularities in scale-space.

Objects from the Class

Objects can be created by calls of the form `new("Scale4C", ...)`.

Slots

viewpoint: Object of class "numeric" representing the viewpoint's location

viewpointChromosome: Object of class "character" representing the viewpoint's chromosome

pointsOfInterest: Object of class "GRanges" representing any points of interest to be marked in the visualizations (usually near-cis based, i.e. close to the viewpoint)

rawData: Object of class "GRanges" representing the 4C-seq reads (or signal strength) of the experiment at given genomic positions

scaleSpace: Object of class "SummarizedExperiment" representing the gradually smoothed 4C-seq signal ('scale space') in its first assay and the corresponding fingerprint map in its second assay.

singularities: Object of class "GRanges" representing singularities in the fingerprint map for the given 4C-seq signal

Methods

viewpoint<- signature(object = "Scale4C", value = "numeric"): Setter-method for the viewpoint slot.

viewpoint signature(object = "Scale4C"): Getter-method for the viewpoint slot.

viewpointChromosome<- signature(object = "Scale4C", value = "character"): Setter-method for the viewpointChromosome slot.

viewpointChromosome signature(object = "Scale4C"): Getter-method for the viewpointChromosome slot.

pointsOfInterest<- signature(object = "Scale4C", value = "GRanges"): Setter-method for the pointsOfInterest slot.

pointsOfInterest signature(object = "Scale4C"): Getter-method for the pointsOfInterest slot.

rawData<- signature(object = "Scale4C", value = "GRanges"): Setter-method for the rawData slot.

rawData signature(object = "Scale4C"): Getter-method for the rawData slot.

scaleSpace<- signature(object = "Scale4C", value = "matrix"): Setter-method for the scaleSpace slot.

scaleSpace signature(object = "Scale4C"): Getter-method for the scaleSpace slot.

singularities<- signature(object = "Scale4C", value = "GRanges"): Setter-method for the singularities slot.

singularities signature(object = "Scale4C"): Getter-method for the singularities slot.

Author(s)

Carolin Walter

Examples

```
showClass("Scale4C")
```

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