# Package 'BiTrinA'

October 12, 2022

2 BASCResult-class

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# **Description**

A specialized class storing the results of a call to binarize.BASC.

# Objects of this class

Objects of this class shouldn't be created directly. They are created implicitly by a call to binarize. BASC.

#### **Slots**

p.value: The p-value of the statistical test for reliability of the binarization.

intermediateSteps: A matrix specifying the optimal step functions from which the binarization was calculated. The number of rows corresponds to the number of step functions, and the number of columns is determined by the length of the input vector minus 2 (that is, the length of the step function corresponding to the input vector). From the first to the last row, the number of steps increases. The non-zero entries of the matrix represent the locations of the steps. Step functions with fewer steps than the input step function have entries set to zero.

intermediateHeights: A matrix giving the jump heights of the steps supplied in intermediateSteps.

intermediateStrongestSteps: A vector with one entry for each step function (row) in intermediateSteps. The entries specify the location of the strongest step for each of the functions.

originalMeasurements: A numeric vector storing the input measurements.

binarizedMeasurements: An integer vector of binarized values (0 or 1) corresponding to the original measurements.

threshold: The threshold that separates 0 and 1.

method: A string describing the binarization method that yielded the result.

#### **Extends**

```
Class "BinarizationResult", directly.
```

## Methods

```
plotStepFunctions signature(x = "BASCResult"): Plot the intermediate optimal step functions
    used to determine the threshold.
```

```
print signature(x = "BASCResult"): Print a summary of the binarization.
show signature(object = "BASCResult"): ...
```

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## See Also

binarize.BASC, BinarizationResult

binarizationExample

An artificial data set consisting of ten artificial feature vectors.

## **Description**

An artificial data set consisting of ten artificial feature vectors that are used to illustrate the binarization methods in the package vignette. Each row of the matrix binarizationExample corresponds to one feature vector, of which 10 measurements are drawn from a normal distribution N(0,1). The remaining 10 measurements are drawn from a normal distribution N(m,1), with m=10:1 decreasing from the first to the last row.

## Usage

data(binarizationExample)

#### **Format**

The data is a matrix with 20 columns and 10 rows.

BinarizationResult-class

Class "BinarizationResult"

# **Description**

This is the base class for objects that store the results of a binarization algorithm. It defines the slots and methods that the results of all algorithms share.

# Objects of this class

Objects of this class shouldn't be created directly. They are created implicitly by a call to one of the binarizeation algorithms.

### **Slots**

originalMeasurements: A numeric vector storing the input measurements.

binarizedMeasurements: An integer vector of binarized values (0 or 1) corresponding to the original measurements.

threshold: The threshold that separates 0 and 1.

method: A string describing the binarization method that yielded the result.

p.value: The p-value obtained by a test for validity of the binarization (e.g. BASC bootstrap test, Hartigan's dip test for k-means binarization, scan statistic p-value for best window. If no test was performed, this is NA.

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# Methods

```
plot signature(x = "BinarizationResult"): Plot the binarization and the threshold.
print signature(x = "BinarizationResult"): Print a summary of the binarization.
show signature(object = "BinarizationResult"): ...
```

## See Also

```
binarize.BASC,
binarize.kMeans,BASCResult,
```

binarize.BASC

Binarization Across Multiple Scales

# Description

Binarizes real-valued data using the multiscale BASC methods.

# Usage

```
binarize.BASC(vect,
    method = c("A","B"),
    tau = 0.01,
    numberOfSamples = 999,
    sigma = seq(0.1, 20, by=.1),
    na.rm=FALSE)
```

# Arguments

method	Chooses the BASC method to use (see details), i.e. either "A" or "B".
vect	A real-valued vector of data to binarize.
tau	This parameter adjusts the sensitivity and the specificity of the statistical testing procedure that rates the quality of the binarization. Defaults to $0.01$ .
numberOfSamples	3
	The number of samples for the bootstrap test. Defaults to 999.
sigma	If method="B", this specifies a vector of different sigma values for the convolutions with the Bessel function. Ignored for method="A".
na.rm	If set to TRUE, NA values are removed from the input. Otherwise, binarization

will fail in the presence of NA values.

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#### **Details**

The two BASC methods can be subdivided into three steps:

Compute a series of step functions: An initial step function is obtained by rearranging the original time series measurements in increasing order. Then, step functions with fewer discontinuities are calculated. BASC A calculates these step functions in such a way that each minimizes the Euclidean distance to the initial step function. BASC B obtains step functions from smoothened versions of the input function in a scale-space manner.

**Find strongest discontinuity in each step function:** A strong discontinuity is a high jump size (derivative) in combination with a low approximation error.

**Estimate location and variation of the strongest discontinuities:** Based on these estimates, data values can be excluded from further analyses.

#### Value

Returns an object of class BASCResult.

#### References

M. Hopfensitz, C. Müssel, C. Wawra, M. Maucher, M. Kuehl, H. Neumann, and H. A. Kestler. Multiscale Binarization of Gene Expression Data for Reconstructing Boolean Networks. IEEE/ACM Transactions on Computational Biology and Bioinformatics 9(2):487-498, 2012.).

#### See Also

BinarizationResult, BASCResult

# **Examples**

```
par(mfrow=c(2,1))
result <- binarize.BASC(iris[,"Petal.Length"], method="A", tau=0.15)
print(result)
plot(result)

result <- binarize.BASC(iris[,"Petal.Length"], method="B", tau=0.15)
print(result)
plot(result)</pre>
```

binarize.kMeans

k-means Binarization

# **Description**

Binarizes a vector of real-valued data using the k-means clustering algorithm. The data is first split into 2 clusters. The values belonging to the cluster with the smaller centroid are set to 0, and the values belonging to the greater centroid are set to 1.

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## Usage

```
binarize.kMeans(vect,
                nstart=1,
                 iter.max=10,
                dip.test=TRUE,
                 na.rm=FALSE)
```

# **Arguments**

vect A real-valued vector to be binarized (at least 3 measurements). nstart The number of restarts for k-means. See kmeans for details. The maximum number of iterations for k-means. See kmeans for details. iter.max If set to TRUE, Hartigan's dip test for unimodality is performed on vect, and its dip.test p-value is returned in the pvalue slot of the result. An insignificant test indicates that the data may not be binarizeable. If set to TRUE, NA values are removed from the input. Otherwise, binarization na.rm

will fail in the presence of NA values.

#### Value

Returns an object of class BinarizationResult.

## See Also

```
kmeans, BinarizationResult, BoolNet
```

## **Examples**

```
result <- binarize.kMeans(iris[,"Petal.Length"])</pre>
print(result)
plot(result, twoDimensional=TRUE)
```

binarizeMatrix

Utility function to binarize a matrix of measurements

# **Description**

Binarizes a matrix of measurements all at once, and returns the binarized vectors as well as the binarization thresholds and the p-values.

## Usage

```
binarizeMatrix(mat,
               method = c("BASCA", "BASCB", "kMeans"),
               adjustment = "none",
               ...)
```

# **Arguments**

mat	A n x m matrix comprising m raw measurements of n features.
method	The binarization algorithm to be used. method="BASCA" calls binarize.BASC with method="A". method="BASCB" calls binarize.BASC with method="B". method="kMeans" calls binarize.kMeans.
adjustment	Specifies an optional adjustment for multiple testing that is applied to the p-values (see p. adjust for possible values). By default, no adjustment is applied.
• • •	Further parameters that are passed to the respective binarization methods (binarize.BASC or method="kMeans").

## Value

A n x (m+2) matrix of binarized measurements. Here, the first m columns correspond to the binarized measurements. The m+1-st column comprises the binarization thresholds for the features, and the m+2-nd column contains the p-values.

## See Also

```
binarize.BASC, binarize.kMeans, p.adjust
```

# **Examples**

```
bin <- binarizeMatrix(t(iris[,1:4]))
print(bin)</pre>
```

```
plot,BinarizationResult-method
```

Visualization of binarization results.

# **Description**

Visualizes a binarization as a ray or a two-dimensional plot.

# Usage

#### **Arguments**

У

x If y is supplied, this is a vector of x coordinates for the binarization values iny, which are plotted on the y axis. If y is not supplied, this is object of class BinarizationResult containing the binarized values to visualize.

If x is a vector of x coordinates, this is object of class BinarizationResult containing the binarized values to visualize.

twoDimensional Specifies whether the binarization is depicted as a ray or as a two-dimensional curve (see details).

showLegend If set to true, a legend is included in the plot.

showThreshold If set to true, the binarization threshold is depicted as a horizontal or vertical

line (depending on twoDimensional).

Further graphical parameters to be passed to plot. The parameters col and pch can be supplied in different ways: If supplied as vectors of size 2, the first value corresponds to a 0 in the binarization, and the second value corresponds to a 1 in the binarization. col can also have length 3, in which case the third entry is the color of the threshold line. If col or pch have the size of the input vector, the corresponding colors and symbols are assigned to the data points.

### **Details**

The function comprises two different plots: If twoDimensional = TRUE, the positions in the input vector are aligned with the x axis, and the y axis corresponds to the values. The binarization threshold is shown as a horizontal line, and the binarization is indicated by two different symbols.

If twoDimensional = FALSE, the binarized values are aligned with a one-dimensional ray, and the separating threshold is depicted as a vertical line.

# See Also

```
plot, BinarizationResult
```

# **Examples**

```
# plot a binarization in one and two dimensions
res <- binarize.BASC(iris[,"Petal.Length"], method="A")
plot(res)
plot(res, twoDimensional = TRUE)
plot(res, twoDimensional = TRUE,
    pch = c("x", "+"),
    col = c("red", "black", "royalblue"),
    lty = 4, lwd = 2)</pre>
```

```
plot, TrinarizationResult-method
```

Visualization of trinarization results.

# **Description**

Visualizes a trinarization as a ray or a two-dimensional plot.

# Usage

```
## S4 method for signature 'TrinarizationResult,ANY'
plot(x,
twoDimensional=FALSE,
showLegend=TRUE,
showThreshold=TRUE,
...)
## S4 method for signature 'numeric,TrinarizationResult'
plot(x,
y,
showLegend=TRUE,
showThreshold=TRUE,
...)
```

# **Arguments**

x If y is supplied, this is a vector of x coordinates for the trinarization values iny, which are plotted on the y axis. If y is not supplied, this is object of class

iny, which are plotted on the y axis. If y is not supplied, this is object of clas TrinarizationResult containing the trinarized values to visualize.

the input vector, the corresponding colors and symbols are assigned to the data

y If x is a vector of x coordinates, this is object of class TrinarizationResult

containing the trinarized values to visualize.

twoDimensional Specifies whether the trinarization is depicted as a ray or as a two-dimensional

curve (see details).

showLegend If set to true, a legend is included in the plot.

showThreshold If set to true, the trinarization thresholds are depicted as a horizontal or vertical

lines (depending on twoDimensional).

Further graphical parameters to be passed to plot. The parameters col and pch can be supplied in different ways: If supplied as vectors of size 3, the first value corresponds to a 0 in the trinarization, the second value corresponds to a 1, and the third value corresponds to a 2. col can also have length 4, in which case the fourth entry is the color of the threshold line. If col or pch have the size of

points.

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## **Details**

The function comprises two different plots: If twoDimensional = TRUE, the positions in the input vector are aligned with the x axis, and the y axis corresponds to the values. The trinarization thresholds are shown as a horizontal lines, and the trinarization is indicated by three different symbols.

If twoDimensional = FALSE, the trinarized values are aligned with a one-dimensional ray, and the separating thresholds are depicted as a vertical lines.

## See Also

```
plot, TrinarizationResult
```

# **Examples**

```
# plot a binarization in one and two dimensions
res <- TASC(iris[,"Petal.Length"])
plot(res)
plot(res, twoDimensional = TRUE)
plot(res, twoDimensional = TRUE,
    pch = c("x", "+"),
    col = c("red", "black", "royalblue", "green"),
    lty = 4, lwd = 2)</pre>
```

plotStepFunctions

Plot all step functions for BASC or TASC

# **Description**

A specialized visualization that plots all the optimal step functions computed by the BASC algorithms or TASC.

# Usage

# **Arguments**

X	$A\ binarization\ (or\ trinarisation)\ result\ object\ of\ class\ {\tt BASCResult}\ ({\tt TASCResult}).$	
showLegend	If TRUE, a legend is included in the plot.	
connected	If TRUE, the single steps of the step functions are connected by lines.	
withOriginal	If set to TRUE, the original step function (i.e. the sorted input vector) is included in the plot.	
	Additional graphical parameters to be passed to plot.	

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# See Also

```
BASCResult, binarize.BASC, TASCResult, TASC
```

# **Examples**

**TASC** 

Trinarization Across Multiple Scales

# Description

Trinarizes real-valued data using the multiscale TASC method.

# Usage

```
TASC(vect,
method = c("A","B"),
tau = 0.01,
numberOfSamples = 999,
sigma = seq(0.1, 20, by=.1),
na.rm=FALSE,
error = c("mean", "min"))
```

# Arguments

method	Chooses the TASC method to use (see details), i.e. either "A" or "B".
vect	A real-valued vector of data to trinarize.
tau	This parameter adjusts the sensitivity and the specificity of the statistical testing procedure that rates the quality of the trinarization. Defaults to 0.01.
numberOfSamples	
	The number of samples for the bootstrap test. Defaults to 999.
sigma	If method="B", this specifies a vector of different sigma values for the convolutions with the Bessel function. Ignored for method="A".
na.rm	If set to TRUE, NA values are removed from the input. Otherwise, trinarization will fail in the presence of NA values.
error	Determines which error should be used for the data points between two thresholds, the "mean" error (default) to the thresholds or the "min" error.

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#### **Details**

The two TASC methods can be subdivided into three steps:

Compute a series of step functions: An initial step function is obtained by rearranging the original time series measurements in increasing order. Then, step functions with fewer discontinuities are calculated. TASC A calculates these step functions in such a way that each minimizes the Euclidean distance to the initial step function. TASC B obtains step functions from smoothened versions of the input function in a scale-space manner.

**Find strongest discontinuities in each step function:** A strong discontinuity is a high jump size (derivative) in combination with a low approximation error. For TASC a pair of strongest discontinuities is determined.

**Estimate location and variation of the strongest discontinuities:** Based on these estimates, data values can be excluded from further analyses.

#### Value

Returns an object of class TASCResult.

## See Also

```
TrinarizationResult. TASCResult
```

# **Examples**

```
par(mfrow=c(2,1))
result <- TASC(iris[,"Petal.Width"], method="A", tau=0.15)
print(result)
plot(result)

result <- TASC(iris[,"Petal.Width"], method="B", tau=0.15)
print(result)
plot(result)</pre>
```

TASCResult-class

Class "TASCResult"

# **Description**

A specialized class storing the results of a call to TASC.

# Objects of this class

Objects of this class shouldn't be created directly. They are created implicitly by a call to TASC.

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#### Slots

p.value: The p-value of the statistical test for reliability of the trinarization.

intermediateSteps: A matrix specifying the optimal step functions from which the trinarization was calculated. The number of rows corresponds to the number of step functions, and the number of columns is determined by the length of the input vector minus 2 (that is, the length of the step function corresponding to the input vector). From the first to the last row, the number of steps increases. The non-zero entries of the matrix represent the locations of the steps. Step functions with fewer steps than the input step function have entries set to zero.

intermediateHeights1: A matrix giving the jump heights of the steps supplied in intermediateSteps for the first threshold.

intermediateHeights2: A matrix giving the jump heights of the steps supplied in intermediateSteps for the second threshold.

intermediateStrongestSteps: A matrix with one row for each step function (row) in intermediateSteps. The entries specify the location of the two strongest steps for each of the functions.

originalMeasurements: A numeric vector storing the input measurements.

trinarizedMeasurements: An integer vector of trinarized values (0, 1 or 2) corresponding to the original measurements.

threshold1: The threshold that separates 0 from 1.

threshold2: The threshold that separates 1 from 2.

method: A string describing the trinarization method that yielded the result.

#### **Extends**

```
Class "TrinarizationResult", directly.
```

#### Methods

```
plotStepFunctions signature(x = "TASCResult"): Plot the intermediate optimal step functions
    used to determine the thresholds.
```

```
print signature(x = "TASCResult"): Print a summary of the trinarization.
```

```
show signature(object = "TASCResult"): ...
```

# See Also

TASC, TrinarizationResult

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trinarizationExample An artificial data set consisting of ten artificial feature vectors.

# **Description**

An artificial data set consisting of 100 artificial feature vectors that are used to illustrate the trinarization methods in the package vignette. Each row of the matrix trinarizationExample corresponds to one feature vector, of which 5 measurements are drawn from a normal distribution N(0,1). The remaining 10 measurements are drawn from two normal distributions N(m,1), with m=10:1 and m=seq(20,2,by=-2) (5 meansurements per distribution).

## Usage

data(trinarizationExample)

#### **Format**

The data is a matrix with 15 columns and 100 rows.

TrinarizationResult-class

Class "TrinarizationResult"

## **Description**

This is the base class for objects that store the results of a trinarization algorithm. It defines the slots and methods that the results of all algorithms share.

# Objects of this class

Objects of this class shouldn't be created directly. They are created implicitly by a call to one of the trinarizeation algorithms.

# Slots

originalMeasurements: A numeric vector storing the input measurements.

trinarizedMeasurements: An integer vector of trinarized values (0 or 1 or 2) corresponding to the original measurements.

threshold1: The threshold that separates 0 and 1.

threshold2: The threshold that separates 1 and 2.

method: A string describing the trinarization method that yielded the result.

p.value: The p-value obtained by a test for validity of the trinarization (e.g. TASC bootstrap test). If no test was performed, this is NA.

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# Methods

```
plot signature(x = "TrinarizationResult"): Plot the trinarization and the thresholds.
print signature(x = "TrinarizationResult"): Print a summary of the trinarization.
show signature(object = "TrinarizationResult"): ...
```

# See Also

TASC,
TASCResult,

trinarize.kMeans

k-means Trinarization

# **Description**

Trinarizes a vector of real-valued data using the k-means clustering algorithm. The data is first split into 3 clusters. The values belonging to the cluster with the smallest centroid are set to 0, the values belonging to the greater centroid are set to 1, and the values belonging to the greatest centroid are set to 2.

# Usage

# **Arguments**

vect	A real-valued vector to be trinarized.
nstart	The number of restarts for k-means. See kmeans for details.
iter.max	The maximum number of iterations for k-means. See kmeans for details.
dip.test	If set to TRUE, Hartigan's dip test for unimodality is performed on vect, and its p-value is returned in the pvalue slot of the result. An insignificant test indicates that the data may not be trinarizeable.
na.rm	If set to TRUE, NA values are removed from the input. Otherwise, trinarization will fail in the presence of NA values.

## Value

 $Returns \ an \ object \ of \ class \ {\tt TrinarizationResult}.$ 

# See Also

kmeans, TrinarizationResult

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## **Examples**

```
result <- trinarize.kMeans(iris[,"Petal.Length"])
print(result)
plot(result, twoDimensional=TRUE)</pre>
```

trinarizeMatrix

Utility function to trinarize a matrix of measurements

# **Description**

Trinarizes a matrix of measurements all at once, and returns the trinarized vectors as well as the trinarization thresholds and the p-values.

# Usage

## **Arguments**

mat	A n x m matrix comprising m raw measurements of n features.
method	The trinarization algorithm to be used. $method="TASCA"$ calls TASC with $method="A"$ . $method="TASCB"$ calls TASC with $method="B"$ . $method="kMeans"$ calls $trinarize.kMeans$ .
adjustment	Specifies an optional adjustment for multiple testing that is applied to the p-values (see p.adjust for possible values). By default, no adjustment is applied.
• • •	Further parameters that are passed to the respective trinarization methods (TASC, trinarize.kMeans).

# Value

A n x (m+3) matrix of trinarized measurements. Here, the first m columns correspond to the trinarized measurements. The m+1-st and the m+2-st column comprises the trinarization thresholds for the features, and the m+3-nd column contains the p-values.

# See Also

```
TASC, trinarize.kMeans, p.adjust
```

# **Examples**

```
tri <- trinarizeMatrix(t(iris[,1:4]))
print(tri)</pre>
```

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