# Package 'cancerclass'

November 5, 2024

Type Package
<b>Version</b> 1.50.0
<b>Date</b> 2011-10-26
<b>Title</b> Development and validation of diagnostic tests from high-dimensional molecular data
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<b>Description</b> The classification protocol starts with a feature selection step and continues with nearest centroid classification. The accuracy of the predictor can be evaluated using training and test set validation, leave-one-out cross-validation or in a multiple random validation protocol. Methods for calculation and visualization of continuous prediction scores allow to balance sensitivity and specificity and define a cutoff value according to clinical requirements.
<b>Depends</b> R (>= 2.14.0), Biobase, binom, methods, stats
Suggests cancerdata
License GPL 3
biocViews Cancer, Microarray, Classification, Visualization
Collate validation-class.R nvalidation-class.R prediction-class.R predictor-class.R cancerclass-internal.R fit.R loo.R nvalidate.R plot3d_nvalidation.R plot3d_validation.R plot_nvalidation.R plot_predictor.R plot_predictor.R plot_validation.R predict_predictor.R summary_prediction.R validate.R
git_url https://git.bioconductor.org/packages/cancerclass
git_branch RELEASE_3_20
git_last_commit 2ac0a44
git_last_commit_date 2024-10-29
Repository Bioconductor 3.20
Date/Publication 2024-11-05
Contents
cancerclass-package

2 cancerclass-package

canc	erclass-package	Developm molecular		val	ida	tic	n o	of a	lia,	gno	ost	ic i	tes	ts j	fro	m	hi	gh	-d	im	er	ısio	onc	al
Index																								19
	validation-class		 				•					•		•	•	•		•	•	•			•	1′
	validate																							
	predictor-class summary,prediction																							
	prediction-class																							
	predict-methods																							
	plot3d																							
	plot																							
	nvalidation-class .																							
	loo																							
	GOLUB																							

# Description

This package implements classification and validation methods for high-dimensional applications, such as gene expression data. The classification protocol starts with a feature selection step and continues with nearest-centroid classification. The accurarcy of the predictor can be evaluated using training and test set validation, leave-one-out cross-validation or in a multiple random validation protocol [1]. Methods for calculation and visualization of continuous prediction scores allow to balance sensitivity and specificity and define a cutoff value according to clinical requirements.

## **Details**

Package: cancerclass
Type: Package
Version: 1.5.1
Date: 2013-09-04
License: GPL (>=2)

## Author(s)

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# References

[1] Michiels S, Koscielny S, Hill C (2005), *Prediction of cancer outcome with microarrays: a multiple random validation strategy*, Lancet 365:488-492.

## See Also

fit, GOLUB1, loo, nvalidate, nvalidation-class, plot, plot, nvalidation-method, plot, prediction-method, plot, predictor-method, plot, validation-method, plot3d, nvalidation-method, plot3d, validation-predict, prediction-class, predictor-class, summary, validate, validation-class, cancerclass-internal, ilogit, calc.roc, calc.auc, get.d, get.d2, get.prop, get.ntrain, prepare, filter

cancerclass-internal 3

cancerclass-internal Internal Functions in the cancerclass Package

# Description

Internal functions in the cancerclass package, which are only user-visible because of the special nature of the cancerclass name space.

# Usage

```
get.d(X, y, method="cor")
get.d2(X, x1, x2, method="cor")
ilogit(x)
calc.roc(x, y, ci="wilson")
calc.auc(S)
get.prop(n, m, ci="exact", conf.level=.9)
get.ntrain(n1, n2, percent, n.min=5)
prepare(eset, class="class")
get.lm(v, ngenes=10, dist="cor")
filter(method)

#.First.lib(lib, pkg)
.onLoad(lib, pkg)
.initFoo(where)
#ratio(x,c1,c2)
```

# **Arguments**

Χ	A numeric data matrix or data frame
method	A numeric data matrix or data frame
X	Numerical or character vector describing class membership
у	Fixed number of features

## **Details**

Internal function are used for auxiliary calculation.

# Value

Each internal function represents function specific results.

# Author(s)

Cancerclass Team

4 fit

fit Fitting of a predu	ictor
------------------------	-------

# Description

Fits a predictor to a training data set.

# Usage

```
fit(eset, class="class", method = "welch.test", hparam = 0.75)
```

## **Arguments**

eset Bioconductor ExpressionSet

class Character vector specifying classes related to the samples.

method Character string specifying the feature selection method. Possible values are

"cor", "student.test", "welch.test", "wilcoxon.test", "foldchange", "copa", "os",

"ort", "shift", "throw".

hparam Hyperparamter needed for the feature selection methods: Confidential Interval

for copa, ort, os (e.g. 0.75, 0.95). Minimum number of samples in each class after applying shift/throw (only necessary for the feature selection methods: throw,

shift).

## **Details**

The matrix eset contains the expression signatures of the patients in the columns. The vector class contains the class membership of each sample or patient. Only two-class problems are supported. The colnames of eset are matched to the names of classifier (if both exist).

The hyperparameter hparam describes the minimum number of samples in each class after applying shift/throw. For copa the hyperparameter is quanilte for the definition of outliers. Typical values are 0.75 (default), 0.9, 0.95.

A nearest centroid predictor is constructed by calculating the average level of each feature in each of the two classes of the trainig data set.

## Value

A predictor object, see predictor object for details.

## See Also

```
predictor
```

```
### see: help(GOLUB);
```

GOLUB 5

GOLUB GOLUB DATA

# **Description**

Gene expression data from the leukemia microarray study of Golub et al. [1]. Dataset GOLUB has a dimention of 7129 genes in 72 tumors samples. Dataset GOLUB1 has a dimention of 3571 genes in 72 tumors samples. This dataset is filtered and preprocessed as described in [2].

# Usage

```
data(GOLUB)
data(GOLUB1)
```

## Value

Data and annotations are organized in a ExtressenSet of the package Biobase.

```
GOLUB ExpressionSet (7129 genes in 72 tumors)
GOLUB1 ExpressionSet (3571 genes in 72 tumors)
```

## References

- [1] Golub TR et al (1999), Molecular Classification of cancer: class Discovery and Class Prediction by gene expression monitoring, Science 286:531-7.
- [2] Dudoit S, Fridlyand J (2002), A prediction-based resampling method for estimating the number of clusters in a dataset, Genome Biol. 3(7):RESEARCH0036.

```
### nvalidate
data(GOLUB1)
nval <- nvalidate(GOLUB1[1:200, ])</pre>
# Use only the first 200 genes for speed-up of the calculations
plot(nval, type="xy")
plot(nval, type="genes")
plot(nval, type="samples")
### validate
data(GOLUB1)
val <- validate(GOLUB1[1:200, ])</pre>
# Use only the first 200 genes for speed-up of the calculations
plot(val, type="xy")
plot(val, type="genes")
plot(val, type="samples")
### fit und predict
data(GOLUB1)
train <- GOLUB1[, 1:38]</pre>
test <- GOLUB1[, 39:72]
predictor <- fit(train, method="welch.test")</pre>
prediction <- predict(predictor, test, positive="AML", ngenes=50, dist="cor")</pre>
plot(prediction, type="histogram", score="zeta")
```

6 loo

```
plot(prediction, type="curves", score="zeta")
plot(prediction, type="roc", score="zeta")
summary(prediction)

### loo
data(GOLUB1)
cv <- loo(GOLUB1, positive="AML", ngenes=10, method="welch.test", dist="cor")
plot(cv, type="histogram", score="zeta")
plot(cv, type="samples", score="zeta")
plot(cv, type="curves", score="zeta")
plot(cv, type="roc", score="zeta")
plot(cv, type="roc", score="zeta")</pre>
```

100

Leave-one-out cross-validation

# **Description**

Fitting and validation of a predictor in a leave-one-out protocol.

## Usage

```
loo(eset, class="class", method = "welch.test", ngenes=50, dist="cor", hparam = 0.75, positive="")
```

## **Arguments**

eset	Bioconductor ExpressionSet
class	String specifying the column in pData(eset) that contains the class information.
method	Specifying the feature selection method. Possible values are "cor", "student.test", "welch.test", "wilcoxon.test", "foldchange", "copa", "os", "ort", "shift", "throw".
ngenes	Number of features used for classification.
dist	Metric for distance calculation
hparam	Hyperparameter needed for some of the feature selection methods. For methods copa, ors and os: Quantile (e.g. 0.75, 0.9, 0.95) used in order to detect outliers. For methods shift and throw: the minimum number of samples in each class after applying shift or throw.
positive	One of the two classes. Membership to this class is considered as positive. Needed in order to calculate sensitivity and specificity of the validation.

# **Details**

A leave-one-out cross-validation is performend by calling fit and predict in a loop.

# Value

A pvalidation object, see pvalidation.object for details.

```
### see: help(GOLUB);
```

nvalidate 7

nvalidate	Classification in a multiple random validation protocol in pependence of the number of features used for predictor construction

## **Description**

Feature selection and class prediction in a multiple random validation protocol as it was introduced in [1]. Misclassifications rates are calculated for predictors that include different numbers of features.

# Usage

nvalidate(eset, class="class", ngenes = c(5, 10, 20, 50, 100, 200, 500, 1000), method = "welch.test"

# **Arguments**

eset	Bioconductor ExpressionSet
class	Specification of the column in pData(eset) that contains the class information.
ngenes	Numerical vector specifying the numbers features that are used for classification.
method	Character string specifying the feature selection method. Possible values are "cor", "student.test", "welch.test", "wilcoxon.test", "foldchange", "copa", "os", "ort", "shift", "throw".
dist	Character string specifying the method for calculation of the distance between test samples and the centroids. Possible values are "euclidean", "angle", "cor", "center".
ntrain	One of the strings "balanced" or "prevalence" or a numeric vector specifying the number of samples of class1 and the number of samples of class2 in the training sets.
nrep	The number of repetitions for each training set size.
hparam	Hyperparameter needed for some of the feature selection methods: Quantile used for the methods for copa, ort, os (e.g. 0.75, 0.95). Minimum number of samples in each class after applying shift/throw (only necessary for the feature selection methods: throw, shift).

## **Details**

The matrix exprs(eset) contains the expression signatures of the patients in the columns. The character vector pData(eset)[[class]] contains the class membership of each sample or patient. Only tow-class problems are supported.

The hyperparameter hparam describes the minimum number of samples in each class after applying shift/throw. For copa, ort and os the hyperparameter specifies the quantile that has to be exceeded in order to consider a sample as an outlier. Typical values are 0.75 (default), 0.9, 0.95.

Validation is implemented in a multiple random validation protocol [1]. For each training set size, nrep training sets are randomly drawn from the patients. Features are selected and the centroid is calculated for each of the two classes in feature space. The test samples are classified to the class with the nearest centroid.

Four methods are available for calculation of the distance between test samples and the centroids: euclidean distance, euclidean distance after centering, angle and Pearson correlation. Calculation of distances is executed using the internal function get.d.

Feature selection, classification and validation are for predictors that include ngenes features.

8 nvalidation-class

#### Value

A nvalidation object, see nvalidation.object for details. Objects of this class have a method for the function plot.

#### References

[1] Michiels S, Koscielny S, Hill C (2005), *Prediction of cancer outcome with microarrays: a multiple random validation strategy*, Lancet 365:488-92.

## See Also

nvalidation

## **Examples**

```
### see: help(GOLUB);
```

nvalidation-class

Class "nvalidation"

## **Description**

This class of objects is returned by the function nvalidation and represents the validation of a nearest centroid predictor in a random validation protocol. Objects of this class have methods for the function plot.

# **Objects from the Class**

Objects can be created by calls of the form new("nvalidation", ...). describe objects here

## **Slots**

ngenes: Numerical vector containing the numbers features that are used for classification.

method: Character string specifying the feature selection method. Possible values are "cor", "student.test", "welch.test", "wilcoxon.test", "foldchange", "copa", "os", "ort", "shift", "throw".

dist: Character string specifiying the method for calculation of the distance between test samples and the centroids. Possible values are "euclidean", "angle", "cor", "center".

ntrain: The number of samples in the training set.

nrep: The number of repetitions for each training set size.

hparam: Hyperparameter needed for some of the feature selection methods. For methods copa, ors and os: Quantile (e.g. 0.75, 0.9, 0.95) used in order to detect outliers. For methods shift and throw: the minimum number of samples in each class after applying shift or throw.

misclass: A list containing the total, the class1 and the class2 misclassification rates.

nselected: Contains information, how often each of the genes was selected for a predictor.

samples: Numeric matrix containing the classification rates for each of the samples.

classifier: Numerical or character vector containing the class membership of the samples.

fdata: Feature annotations inherited from the ExpressionSet.

plot 9

## Methods

There are three plot methods for visualization of the validation results.

## See Also

```
nvalidate, nvalidation
```

# **Examples**

```
showClass("nvalidation")
```

plot

Plot Method for 'validation, nvalidation, prediction, predictor' Classes

# **Description**

• class nvalidation:

Plot of misclassification rates in dependence of the number of features that were used for classification. Total, class1 and class2 misclassification rates including confidence intervals can be plotted separately.

• class prediction:

Plot methods for continuous predictions scores. Prediction scores are obtained by validation of a predictor in a test set. Four methods for assessment and visualization of predictor performance can be selected by the parameter type.

· class predictor:

Among the three continuous prediction scores (z, zeta and ratio), zeta has the special property to be a linear combination of gene expression values. The plot method works only for the prediction score zeta and visualizes the contribution of each gene to the score.

• class validation:

Plots the misclassification rate in dependence of the training set size. Total, class1 and class2 misclassification rates can be plotted including confidence intervals.

# Usage

```
plot(x, y, ...)
```

## **Arguments**

x Object of class nvalidation.

y missing

... Further arguments directly passed to plot.

10 plot

#### Methods

- x Object of class validation
- y missing
- **type** Three different kinds of plots can be generated: a xy-plot showing the misclassification rate in dependence of the training set size (type="xy"), a barplot showing the misclassification rates for each of the samples (type="samples"), a barplot showing how often (in %) a gene is included in a predictor (type="genes").
- **method** A character vector specifying the types of misclassification rates to be plotted. Possible types are the names of the classes and all for the total misclassification rate.
- **anno** Only relevant if type="genes": annotation of the features by array probes (anno="probe") or gene symbols (anno="symbol").
- **sig** Vector of numerical values corresponding to the method vector. The numerical values are equal to the confidence level, if equal to NULL, the corresponding confidence interval is not plotted.
- xlog A logical value. If TRUE, a logarithmic scale is used for the x-axis.
- **pos** Position of legend specified by a keyword from the list "bottomright", "bottom", "bottomleft", "left", "topleft", "topright", "right" and "center".
- **ntrain** Only relevant if type="samples" or type="genes". Either results for predictors trained in training sets of different sample sizes (ntrain="all"), or results for predictors trained in training sets of the sample size specified by ntrain.
- min.percent Only relevant if type="genes". The shold for selection of the genes that are plotted.
- **n** Only relevant if type="genes": Number of top genes that are plotted.
- **col** Only relevant if type="samples". Color of the boxes for samples of class1 and of class2.
- ylim Range of the y-axis.
- **cex.names** Only relevant if type="samples" or type="genes". Scaling factor for the labels of the x-axis.
- **col.curves** Only relevant if type="xy". A vector of strings corresponding to curves. Specifies the colors of the plot curves.
- ... Further arguments directly passed to plot.

## Methods

- x Object of class nvalidation
- y missing
- **type** Three different kinds of plots can be generated: a xy-plot showing the misclassification rate in dependence of the training set size (type="xy"), a barplot showing the misclassification rates for each of the samples (type="samples"), a barplot showing how often (in %) a gene is included in a predictor (type="genes").
- **method** A character vector specifying the types of misclassification rates to be plotted. Possible types are the names of the classes and all for the total misclassification rate.
- **anno** Only relevant if type="genes": annotation of the features by array probes or gene symbols.
- sig Vector of numerical values corresponding to the method vector. The numerical values are equal to the confidence level, if equal to NULL, the corresponding confidence interval is not plotted.
- xlog A logical value. If TRUE, a logarithmic scale is used for the x-axis.
- **pos** Position of legend specified by a keyword from the list "bottomright", "bottom", "bottomleft", "left", "topleft", "topright", "right" and "center".

plot 11

**ngenes** Only relevant if type="samples" or type="genes". Either results for predictors including different number of genes (ngenes="all"), or results for predictors including the number of genes specified by the numeric value ngenes.

min.percent Only relevant if type="genes". The shold for selection of the genes that are plotted.

- **n** Only relevant if type="genes": Number of top genes that are plotted.
- col Only relevant if type="samples". Color of the boxes for samples of class1 and of class2.

ylim Range of the y-axis.

- **cex.names** Only relevant if type="samples" or type="genes". Scaling factor for the labels of the x-axis
- ... Further arguments directly passed to plot.

## Methods

- x Object of class prediction
- y missing
- type Four different kinds of plots can be generated: a histogram showing the distribution of the prediction score in class1 and class2 (type="histogram"), a xy-plot showing sensitivity, specificity, positive prediction value (PPV) and negative prediction value (NPV) in dependence on cutoffs for the prediction score (type="curves"), an ROC curve including calculation of the area under the curve (type="roc"), a barplot showing the prediction score for each of the samples (type="samples").
- **score** Specification of the prediction scores used for the plot: score="z", "zeta" or "ratio". If type="roc" a comparative analysis of two or three scores can be done.

breaks.dist Distance of breaks.

- ci Only relevant, if type="roc". The method to calculate confidence intervals for sensitivity and specificity. Possibly values are "exact", "ac", "asymptotic", "wilson", "prop.test", "bayes", "logit", "cloglog", "probit", see R package binom for details.
- **col** Only relevant if type="samples". Numerical or character vector of length two specifying the color of symbols for correct and wrong classifications.
- **curves** Only relevant if type="curves". A vector of strings specifying the curves that are included into the plot. Can include "sensitivity", "specificity", "PPV" and "NPV".
- **col.curves** Only relevant if type="curves". A vector of strings corresponding to curves. Specifies the colors of the plot curves.
- **lty** Only relevant if type="roc". Numerical or character vector corresponding to the vector score. Specifies the line types used for the ROC plot.

**npoints** Only relevant if type="logistic". Number of points to be plotted.

**alpha** Only relevant if type="logistic". The probability of class membership is estimated by logistic regression. The parameter alpha specifies the confidence level for the confidence interval of this probability.

main Title of the plot.

**cex.names** Only relevant if type="samples". Scaling factor for the labels of the x-axis.

... Further arguments directly passed to plot.

12 plot3d

## Methods

```
x Object of class validation
```

y missing

**type** Currently only type="genes" is supported.

ngenes Number of genes in the predictor.

**dist** Character string specifying the method for calculation of the distance between test samples and the centroids. Possible values are "euclidean", "angle", "cor", "center".

anno Annotation of the features by array probes (anno="probe") or gene symbols (anno="symbol").

ylab Label of the y-axis.

main Title of the plot.

... Further arguments directly passed to plot.

# See Also

```
validate, validation
```

# **Examples**

```
### see: help(GOLUB);
```

plot3d

Plot3d method for 'validtion and 'nvalidation' classes

# Description

nvalidation:

For each gene, the frequency that it is selected is plotted in dependence of the number of genes in the predictor.

• validation:

For each gene, the frequency that it is selected is plotted in dependence of the training set size.

# Usage

```
plot3d(object,...)
```

# **Arguments**

object Object of class nvalidation or validation
... Further arguments directly passed to plot.

# See Also

```
plot3d, persp
```

predict-methods 13

predict-methods

Predict Method for 'predictor' Class

## **Description**

Assessment of the performance of a predictor in a test data set.

# Usage

```
predict(object="predictor", ...)
```

# **Arguments**

object Object of class predictor.

... Further arguments described below.

## Value

A prediction object, see prediction object for details. Objects of this class have a method for the function plot.

## Methods

**object** Object of class predictor.

eset Test set, stored in a Bioconductor ExpressionSet object.

**positive** String referring to one of the two classes. Sensitivity and specificity calculations are carried out with respect to this class.

**class** Specification of the column in pData(eset) that contains the class information. The default value is class="class".

ngenes Number of features used for classification. The default value is ngenes=50.

**dist** Character string specifiying the method for calculation of the distance between test samples and the centroids. Possible values are "euclidean", "angle", "center" and the default "cor".

## **Details**

The test samples are classified to the class with the nearest centroid. For methods are available for calculation of the distance between test samples and the centroids: Euclidean distance, euclidean distance after centering, angle and Pearson correlation. Calculation of distances is executed using the internal function get.d.

# See Also

fit prediction predictor

```
### see: help(GOLUB);
```

14 prediction-class

prediction-class

Class "prediction"

## **Description**

An object of this class is returned by the function fit.predictor and contains the results of a validation of a predictor on a test set.

# **Objects from the Class**

Objects of this class can be created by new("prediction", ...).

## **Slots**

type: String specifying the type of validation: "traintest" for validation in a test set or "loo" for leave-one-out cross-validation.

predictor: The predictor that is validated, object of class predictor.

method: Character string specifying the feature selection method. Possible values are "cor", "student.test", "welch.test", "wilcoxon.test", "foldchange", "copa", "os", "ort", "shift", "throw".

ngenes: Numerical vector containing the numbers features that are used for classification.

dist: Character string specifiying the method for calculation of the distance between test samples and the centroids. Possible values are "euclidean", "angle", "cor", "center".

prediction: Matrix containing the prediction results. Each row represents a sample of the test data set. The first two columns contain the actual and the predicted class membership of the sample. Columns three, four and five contain the scores "z", "zeta" and "ratio". The score "z" is defined as difference of the distance of the sample from the class1 centroid minus the distance of the sample from the class2 centroid divided by the distance of the two centroids. For calculation of the score "zeta", the sample is orthogonally projected to the straight line through the centroids. Then the difference is calculated between the distance from the class1 and the class2 centroid. The score "ratio" is defined as the logarithm of the ratio of the distance of the sample from the class1 centroid divided by the correponding distance from the class2 centroid. For all three prediction scores, the sample is predicted to belong to class1, if the prediction score is negative, while the sample is predicted to belong to class2, if the prediction score is positive.

cl: The column in pData(eset) that was used to define the class membership.

positive: Character string or number specifying one of the two classes. This information is used for sensitivity and specificity calculations.

## See Also

```
predict, plot, fit
```

```
showClass("prediction")
```

predictor-class 15

predictor-class

Class "predictor"

## **Description**

An object of this class is returned by the function predict(...) and represents a nearest centroid predictor learned on a training data set.

# **Objects from the Class**

Objects can be created by the call new("predictor", ...).

## **Slots**

```
predictor: Object of class "predictor"
```

cl: Character string or number specifying one of the two classes.

method: Character string specifying the feature selection method that was used for predictor construction: Possible values are "cor", "student.test", "welch.test", "wilcoxon.test", "foldchange", "copa", "os", "ort", "shift", "throw".

hparam: Hyperparameter needed for some of the feature selection methods. For methods copa, ors and os: Quantile (e.g. 0.75, 0.9, 0.95) used in order to detect outliers. For methods shift and throw: the minimum number of samples in each class after applying shift or throw.

type: Type of calculation. Loo (leave one out) or prediction (simple prediction).

fdata: Feature annotations inherited from the training ExpressionSet.

# Methods

plotA plot method is only avaiable for the score "zeta" that is a linear combination of features.

# See Also

See Also as fit, or predictor for links to other classes

# **Examples**

```
showClass("predictor")
```

 $\verb"summary,prediction-methods"$ 

Summary Method for 'prediction' Class

# **Description**

Assessment of the performance of a predictor on a test data set.

## Usage

```
summary(object="prediction", ...)
```

16 validate

# **Arguments**

objectObject of class prediction.Further arguments desribed below.

## Methods

object Object of class prediction.

**positive** Character string specifying one of the two classes. Sensitivity and specificity calculations are carried out with respect to this class.

## See Also

prediction

# **Examples**

```
### see: help(GOLUB);
```

validate

Classification in a Multiple Random Validation Protocol in Dependence of the Training Set Size

# Description

Feature selection and class prediction in a multiple random validation protocol. Misclassifications rates are calculated for different sizes of the training set.

# Usage

```
validate(eset, class="class", ngenes = 50, method = "welch.test", dist="cor", ntrain = "balanced", r
```

# Arguments

eset	Bioconductor ExpressionSet
class	Specification of the column in pData(eset) that contains the class information.
ngenes	Numerical vector specifying the numbers features that are used for classification.
dist	Character string specifiying the method for calculation of the distance between test samples and the centroids. Possible values are "euclidean", "angle", "cor", "center".
method	Character string specifying the feature selection method. Possible values are "cor", "student.test", "welch.test", "wilcoxon.test", "foldchange", "copa", "os", "ort", "shift", "throw".
ntrain	One of the strings "balanced" or "prevalence" or a numeric matrix that contains the numbers of training samples of the first class in the in first row and the numbers of training samples of the second class in the second row.
nrep	The number of repeated training-test splits for each training set size.
hparam	Hyperparameter needed for some of the feature selection methods. For methods copa, ors and os: Quantile (e.g. 0.75, 0.9, 0.95) used in order to detect outliers. For methods shift and throw: the minimum number of samples in each class after applying shift or throw.

validation-class 17

#### **Details**

The matrix exprs(eset) contains the expression signatures of the patients in the columns. The character vector pData(eset)[[class]] contains the class membership of each sample or patient. Only two-class problems are supported.

The hyperparameter hparam describes the minimum number of samples in each class after applying shift/throw. For copa, ort and os the hyperparameter specifies the quantile that has to be exceeded in order to consider a sample as an outlier. Typical values are 0.75 (default), 0.9, 0.95.

Validation is implemented in a multiple random validation protocol [1]. For each training set size, nrep training sets are randomly drawn from the patients. Features are selected and the centroid is calculated for each of the two classes in feature space. The test samples are classified to the class with the nearest centroid.

Four methods are available for calculation of the distance between test samples and the centroids: euclidean distance, centered euclidean distance, angle and Pearson correlation. Calculation of distances is executed using the internal function get.d.

The parameter ntrain should be equal to one of the strings "balanced" or "prevalence" or a numeric matrix with two rows. For ntrain = "balanced", a balanced layout is used, i.e. half of the training set is chosen from each of the two classes. For ntrain = "prevalence" the training sets are balanced according to the prevalence of the two classes in the entire data set. Further, the user can manually specify the sizes of the training sets.

#### Value

A validation object, see validation object for details. Objects of this class have a method for the function plot.

## References

[1] Michiels S, Koscielny S, Hill C (2005), *Prediction of cancer outcome with microarrays: a multiple random validation strategy*, Lancet 365:488-92.

## See Also

validation

# **Examples**

```
### see: help(GOLUB);
```

validation-class

Class "validation"

## **Description**

An object of this class is returned by the function validate and represents the validation of a nearest centroid predictor in a random validation protocol.

## **Objects from the Class**

Objects can of this class be created by new("validation", ...).

18 validation-class

## **Slots**

ngenes: Numerical vector containing the numbers features that are used for classification.

method: Character string specifying the feature selection method. Possible values are "cor", "student.test", "welch.test", "wilcoxon.test", "foldchange", "copa", "os", "ort", "shift", "throw".

dist: Character string specifiying the method for calculation of the distance between test samples and the centroids. Possible values are "euclidean", "angle", "cor", "center".

ntrain: A numeric vector containing the numbers of samples in the training sets.

nrep: The number of repetitions for each training set size.

hparam: Hyperparameter needed for some of the feature selection methods. For methods copa, ors and os: Quantile (e.g. 0.75, 0.9, 0.95) used in order to detect outliers. For methods shift and throw: the minimum number of samples in each class after applying shift or throw.

misclass: A list containing the total, the class1 and the class2 misclassification rates.

nselected: Contains information, how often each of the genes was selected for a predictor.

samples: Numeric matrix containing the classification rates for each of the samples.

classifier: Numerical or character vector containing the class membership of the samples.

fdata: Numerical or character vector containing the class membership of the samples.

## Methods

There are three plot methods for visualization of the validation results.

## See Also

validate, validation

## **Examples**

showClass("validation")

# Index

* classes	<pre>get.prop(cancerclass-internal), 3</pre>
nvalidation-class, 8	GOLUB, 5
prediction-class, 14	GOLUB1, 2
predictor-class, 15	GOLUB1 (GOLUB), 5
validation-class, 17	
* classif	ilogit, 2
fit,4	ilogit (cancerclass-internal), 3
loo, 6	
nvalidate, 7	100, 2, 6
plot, 9	nvalidate, 2, 7, 9
plot3d, 12	nvalidation, 8, 9
validate, 16	nvalidation-class, 8
* datasets	invalidation class, 8
GOLUB, 5	persp, 12
* internal	plot, 2, 9, 14
cancerclass-internal, 3	plot, nvalidation-method (plot), 9
* methods	plot, prediction-method (plot), 9
plot, 9	plot, predictor-method (plot), 9
plot3d, 12	plot, validation-method (plot), 9
predict-methods, 13	plot3d, 2, 12, 12
summary, prediction-methods, 15	plot3d, nvalidation-method (plot3d), 12
* package	plot3d, validation-method (plot3d), 12
cancerclass-package, 2	predict, 2, 14
	predict (predict-methods), 13
calc.auc, 2	predict, predictor-method
<pre>calc.auc(cancerclass-internal), 3</pre>	(predict-methods), 13
calc.roc, 2	predict-methods, 13
<pre>calc.roc(cancerclass-internal), 3</pre>	prediction, 13, 16
cancerclass (cancerclass-package), 2	prediction-class, 14
cancerclass-internal, 3	predictor, 4, 13, 15
cancerclass-package, 2	predictor-class, 15
	prepare, 2
filter, 2	prepare (cancerclass-internal), 3
filter (cancerclass-internal), 3	, , , , , , , , , , , , , , , , , , ,
fit, 2, 4, <i>13–15</i>	summary, 2
	summary (summary, prediction-methods), 15
get.d, 2	summary, prediction-method
get.d (cancerclass-internal), 3	(summary,prediction-methods),
get.d2, 2	15
<pre>get.d2 (cancerclass-internal), 3</pre>	summary, prediction-methods, 15
<pre>get.lm(cancerclass-internal), 3</pre>	
get.ntrain, 2	validate, 2, 12, 16, 18
<pre>get.ntrain(cancerclass-internal), 3</pre>	validation, <i>12</i> , <i>17</i> , <i>18</i>
get.prop, 2	validation-class, 17