# Package 'predbayescor' documentation

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#### Version 1.1-3

Title Classification rule based on Bayesian naive Bayes models with feature selection bias corrected

Author Longhai Li <longhai@math.usask.ca>

Maintainer Longhai Li <longhai@math.usask.ca>

**Depends** R (>= 2.5.1)

Description This software is used to predict the binary response based on high dimensional features, for example gene expression data. The data are modelled with Bayesian naive Bayes models. When a large number of features are available, one may like to select only a subset of features to use, typically those features strongly correlated with the response in training cases. Such a feature selection procedure is however invalid since the relationship between the response and the features will appear stronger. This package provides a way to avoid this bias and yields well-calibrated prediction for the test cases.

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URL http://www.r-project.org, http://math.usask.ca/~longhai

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2 predict\_bayes

predict_bayes	Classification rule based on Bayesian naive Bayes models with feature		
	selection bias corrected		

# **Description**

predict\_bayes predicts the binary response based on high dimensional binary features modeled by Bayesian naive Bayes models. It also accepts real values but they will be converted into binary by thresholding at the medians estimated from the data. A smaller number of features can be selected based on the correlations with the response. The bias due to the selection procedure can be corrected. cv.bayes is the short-cut function for cross-validation with predict\_bayes.

# Usage

#### **Arguments**

test	a test data, a matrix, i.e. the data for which we want to predict the responses. The row stands for the cases. The first column is the binary response, which could be NA if they are missing.				
train	a training data, of the same format as test				
data	a data used in cross-validation, of the same format as test				
<pre>no.folds is.binary.fe</pre>					
	the indicator whether the features are binary				
k	the number of features retained				
subset.sel	the indice of training cases used to select features				
theta0	the prior of "theta" is uniform over (theta0,1-theta0)				
no.theta	the parameter in Simpson's rule used to evaluate the integration w.r.t. "theta". The integrant is evaluated at 2*(no.theta)+1 points.				
alpha.shape	the shape parameter of the inverse Gamma, which is the prior distribution of "alpha"				

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alpha.rate the rate parameter of the inverse Gamma, as above

no.alpha the number of "alpha"'s used in mid-point rule, which is used to approximate

the integral with respect to "alpha".

correct the indicator whether the correction method shall be applied

no.theta.adj a parameter of Simpson's rule, which is used to evaluate the integration with

respect to "theta" in calculating the adjustment factor

#### Value

prediction a matrix showing the detailed prediction result: the 1st column being the true

responses, the 2nd being the predicted responses, the 3rd being the predictive probabilities of class 1 and the 4th being the indicator whether wrong prediction

is made.

aml the average minus log probabilities

error.rate the ratio of wrong prediction

mse the average square error of the predictive probabilities

 $\verb|summary.pred| tabular display of the predictive probabilities and the actual fraction of class 1.$ 

alpha.prior.adj.post

a matrix showing the detailed information about the "alpha"'s, the 1st column being the values of "alpha"'s, the 2nd being the adjustment factor, i.e. probability that feature is discarded by the cutoff used in the feature selection, the 3rd being the log of the 2nd column times the numbers of discarded features, the 4th

being the posterior probabilities

features.selected

The features selected using correlation criterion

#### References

http://math.usask.ca/~longhai/doc/naivebayes/naivebayes.abstract.html

#### See Also

```
gendata.bayes
```

### **Examples**

```
#generate a dataset
d <- gendata.bayes(100,100,500,500,1000,400)

#do prediction with correction applied
pred.d.cor <- predict_bayes(d$test,d$train,TRUE,10,,0,20,0.5,5,20,TRUE,40)

#do prediction without correction applied
pred.d.uncor <- predict_bayes(d$test,d$train,TRUE,10,,0,20,0.5,5,20,FALSE,40)

#do 5-fold cross-validation on the training data with correction applied
cv.dtr.cor <- cv.bayes(d$train,TRUE,5,10,0,20,0.5,5,20,TRUE,40)</pre>
```

4 evaluate\_by\_loss

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gendata.	.baves

Generate binary data with Bayesian naive Bayes Models

#### **Description**

"gendata.bayes" generates data (both training and test data) with Bayesian naive Bayes model. The prior distribution of "theta" is uniform(0,1). The value of "alpha" is given by argument alpha, which controls the the overall relationship between the response and the predictor variables.

#### **Usage**

```
gendata.bayes(n0,n1,m0,m1,p,alpha)
```

## **Arguments**

n0	the number of class 0 in training data
n1	the number of class 1 in training data
m0	the number of class 0 in test data
m1	the number of class 1 in test data
р	the number of features
alpha	a parameter controlling the dependency between the features and the response

#### Value

Annual Con-	41 4	: 41- 41	-4 di C 41		first column being
train	the training data.	with the row	standing for the	cases and the i	irst column deing

the response

test the test data, of the same format as "train"

# See Also

```
predict_bayes
```

```
evaluate_by_loss
```

calculating the total loss of prediction results

## **Description**

Calculates the average loss of the predictive probabilities by assuming the ratio of the loss of assigning 0 to 1 to the loss of assigning 1 to 0 is ratio.loss. Note that the prediction threshold is no longer 0.5. "1" will be assigned if the predictive probability is greater than 1/(1+ratio.loss).

#### Usage

```
evaluate_by_loss ( y.true, pred.prob, ratio.loss=10)
```

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# Arguments

y.true a vector containing the true response.

pred.prob a vector containing the predictive probabilities.

ratio.loss ratio of loss1to0 to loss0to1.

#### Value

loss the average loss.

sd the standard deviation of the average loss.

predbayescor-internal

Internal Functions

# Description

Internal Functions. Type function name directly to see the definition of this function.

#### See Also

predict\_bayes

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