

Package ‘BootValidation’

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Type Package

Title Adjusting for Optimism in 'glmnet' Regression using Bootstrapping

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Description

Main objective of a predictive model is to provide accurated predictions of a new observations. Unfortunately we don't know how well the model performs. In addition, at the current era of omic data where $p \gg n$, is not reasonable applying internal validation using data-splitting. Under this background a good method to assessing model performance is applying internal bootstrap validation (Harrell Jr, Frank E (2015) <doi:10.1007/978-1-4757-3462-1>.) This package provides bootstrap validation for the linear, logistic, multinomial and cox 'glmnet' models as well as lm and glm models.

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Encoding UTF-8

LazyData true

Imports glmnet, pbapply, pROC, parallel, survival, risksetROC

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plot.bootVal	<i>Plot for repeat_cv results</i>
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Description

Plots a grid of slices from the estimates of the repeat_cv function

Usage

```
## S3 method for class 'bootVal'
plot(x, order = TRUE,
     n = length(unique(unlist(x$varImportance))), ...)
```

Arguments

x	A vboot object
order	order plot by importance
n	Variables to be displayed
...	further arguments passed to plot

Value

validation

print.bootVal	<i>Print function</i>
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Description

internal function to print vboot object

Usage

```
## S3 method for class 'bootVal'
print(x, ...)
```

Arguments

x	A vboot object
...	Further arguments of generic function

Value

validation

vboot *Generic function for bootstrap validation*

Description

Validate 'glmnet' linear, logistic or cox regression using bootstrap.

Usage

```
vboot(fit, x, y, s, nfolds = 5, B = 200, cv_replicates = 100,
      lambda = TRUE, n_cores = max(1, parallel::detectCores() - 1))
```

Arguments

fit	Object from glmnet fit.
x	A matrix of the predictors, each row is an observation vector.
y	A vector of response variable. It should be quantitative for lineal regression, a factor with two levels for logistic regression, a factor with more than two levels for multinomial regression or a two-column matrix with columns named 'time' and 'status' for cox regression.
s	Value of the penalty parameter "lambda" selected from the original 'cv.glmnet'.
nfolds	Number of folds for cross validation as in 'cv.glmnet'.
B	Number of bootsrap samples.
cv_replicates	Number of replicates for the cross-validation step.
lambda	By default, the validation is adjusted using 'lambda.1se' which has error within 1 standard error of the best model. If 'FALSE' the 'lambda.min' referered to the lowest CV error will be used.
n_cores	number of cores to use in parallel. Default detectCores()-1.

References

- Jerome Friedman, Trevor Hastie, Robert Tibshirani (2010). Regularization Paths for Generalized Linear Models via Coordinate Descent. *Journal of Statistical Software*, 33(1), 1-22. URL <http://www.jstatsoft.org/v33/i01/>.
- Noah Simon, Jerome Friedman, Trevor Hastie, Rob Tibshirani (2011). Regularization Paths for Cox's Proportional Hazards Model via Coordinate Descent. *Journal of Statistical Software*, 39(5), 1-13. URL <http://www.jstatsoft.org/v39/i05/>.
- Harrell Jr, F. E. (2015). *Regression modeling strategies: with applications to linear models, logistic and ordinal regression, and survival analysis*. Springer.
- Gordon C.S. Smith, Shaun R. Seaman, Angela M. Wood, Patrick Royston, Ian R. White (2014). Correcting for Optimistic Prediction in Small Data Sets, *American Journal of Epidemiology*, Volume 180, Issue 3, 1 August 2014, Pages 318-324, <https://doi.org/10.1093/aje/kwu140>

Examples

```
# Create the data
set.seed(25)
x <- matrix(rnorm(80),ncol=4)
y <- x[,4]*0.8+x[,3]*0.4+rnorm(20)
# Fit glmnet model
fit_enet <- glmnet::glmnet(x, y, alpha = 0.5)
# Bootstrap validation
vboot(fit_enet, x, y, nfolds = 3, B = 2, s = 0.5, cv_replicates = 5, n_cores = 1)
```

vboot.coxnet

Internal bootstrapping validation cox glmnet model

Description

Validate glmnet cox regression using bootstrap.

Usage

```
## S3 method for class 'coxnet'
vboot(fit, x, y, s, nfolds = 5, B = 200,
      cv_replicates = 100, lambda = TRUE, n_cores = max(1,
parallel::detectCores() - 1))
```

Arguments

fit	Object from glmnet fit.
x	A matrix of the predictors, each row is an observation vector.
y	Should be a two-column matrix with columns named 'time' and 'status' as in 'glmnet'.
s	Value of the penalty parameter "lambda" selected from the original 'cv.glmnet'.
nfolds	Number of folds for cross validation as in 'cv.glmnet'.
B	Number of bootstrap samples.
cv_replicates	Number of replicates for the cross-validation step.
lambda	By default, the validation is adjusted using 'lambda.1se' which has error within 1 standard error of the best model. If 'FALSE' the 'lambda.min' referred to the lowest CV error will be used.
n_cores	number of cores to use in parallel. Default detectCores()-1.

vboot.elnet

Internal bootstrapping validation linear glmnet model

Description

Validate glmnet linear regression using bootstrap.

Usage

```
## S3 method for class 'elnet'
vboot(fit, x, y, s, nfolds = 5, B = 200,
      cv_replicates = 100, lambda = TRUE, n_cores = max(1,
parallel::detectCores() - 1))
```

Arguments

fit	Object from glmnet fit.
x	A matrix of the predictors, each row is an observation vector.
y	A vector of response variable. Should be numeric.
s	Value of the penalty parameter "lambda" selected from the original 'cv.glmnet'.
nfolds	Number of folds for cross validation as in 'cv.glmnet'.
B	Number of bootstrap samples.
cv_replicates	Number of replicates for the cross-validation step.
lambda	By default, the validation is adjusted using 'lambda.1se' which has error within 1 standard error of the best model. If 'FALSE' the 'lambda.min' referred to the lowest CV error will be used.
n_cores	number of cores to use in parallel. Default detectCores()-1.

vboot.glm

Internal bootstrapping validation logistic model

Description

Validate logistic regression using bootstrap.

Usage

```
## S3 method for class 'glm'
vboot(fit, x = NULL, y = NULL, s = NULL, nfolds = NULL,
      B = 200, cv_replicates = NULL, lambda = NULL, n_cores = max(1,
parallel::detectCores() - 1))
```

Arguments

fit	Object from glm fit
x	A matrix of the predictors, each row is an observation vector.
y	A vector of response variable. It should be quantitative for lineal regression, a factor with two levels for logistic regression or a two-column matrix with columns named 'time' and 'status' for cox regression.
s	Value of the penalty parameter "lambda" selected from the original 'cv.glmnet'.
nfolds	Number of folds for cross validation as in 'cv.glmnet'.
B	Number of bootstrap samples
cv_replicates	Number of replicates for the cross-validation step
lambda	By default, the validation is adjusted using 'lambda.1se' which has error within 1 standard error of the best model. If 'FALSE' the 'lambda.min' referered to the lowest CV error will be used.
n_cores	number of cores to use in parallel. Default detectCores()-1

vboot.lm

*Internal bootstrapping validation linear model***Description**

Validate linear regression using bootstrap.

Usage

```
## S3 method for class 'lm'
vboot(fit, x = NULL, y = NULL, s = NULL, nfolds = NULL,
      B = 200, cv_replicates = NULL, lambda = NULL, n_cores = max(1,
      parallel::detectCores() - 1))
```

Arguments

fit	Object from lm fit
x	A matrix of the predictors, each row is an observation vector.
y	A vector of response variable. It should be quantitative for lineal regression, a factor with two levels for logistic regression or a two-column matrix with columns named 'time' and 'status' for cox regression.
s	Value of the penalty parameter "lambda" selected from the original 'cv.glmnet'.
nfolds	Number of folds for cross validation as in 'cv.glmnet'.
B	Number of bootstrap samples
cv_replicates	Number of replicates for the cross-validation step
lambda	By default, the validation is adjusted using 'lambda.1se' which has error within 1 standard error of the best model. If 'FALSE' the 'lambda.min' referered to the lowest CV error will be used.
n_cores	number of cores to use in parallel. Default detectCores()-1

vboot.lognet	<i>Internal bootstrapping validation logistic glmnet model</i>
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Description

Validate glmnet logistic regression using bootstrap.

Usage

```
## S3 method for class 'lognet'
vboot(fit, x, y, s, nfolds = 5, B = 200,
      cv_replicates = 100, lambda = TRUE, n_cores = max(1,
parallel::detectCores() - 1))
```

Arguments

fit	Object from glmnet fit.
x	A matrix of the predictors, each row is an observation vector..
y	A vector of response variable. Should be a factor with two levels.
s	Value of the penalty parameter "lambda" selected from the original 'cv.glmnet'.
nfolds	Number of folds for cross validation as in cv.glmnet.
B	Number of bootstrap samples.
cv_replicates	Number of replicates for the cross-validation step in 'cv.glmnet'.
lambda	By default, the validation is adjusted using 'lambda.1se' which has error within 1 standard error of the best model. If 'FALSE' the 'lambda.min' referered to the lowest CV error will be used.
n_cores	number of cores to use in parallel. Default detectCores()-1.

vboot.multnet	<i>Internal bootstrapping validation multinomial glmnet model</i>
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Description

Validate glmnet logistic regression using bootstrap.

Usage

```
## S3 method for class 'multnet'
vboot(fit, x, y, s, nfolds = 5, B = 200,
      cv_replicates = 100, lambda = TRUE, n_cores = max(1,
parallel::detectCores() - 1))
```

Arguments

<code>fit</code>	Object from <code>glmnet</code> fit.
<code>x</code>	A matrix of the predictors, each row is an observation vector.
<code>y</code>	A vector of response variable. Should be a factor with two levels.
<code>s</code>	Value of the penalty parameter "lambda" selected from the original <code>'cv.glmnet'</code> .
<code>nfolds</code>	Number of folds for cross validation as in <code>cv.glmnet</code> .
<code>B</code>	Number of bootstrap samples.
<code>cv_replicates</code>	Number of replicates for the cross-validation step in <code>'cv.glmnet'</code> .
<code>lambda</code>	By default, the validation is adjusted using <code>'lambda.1se'</code> which has error within 1 standard error of the best model. If <code>'FALSE'</code> the <code>'lambda.min'</code> referred to the lowest CV error will be used.
<code>n_cores</code>	number of cores to use in parallel. Default <code>detectCores()-1</code> .

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