

Package ‘iilasso’

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Type Package

Title Independently Interpretable Lasso

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Description Efficient algorithms for fitting linear / logistic regression model with Independently Interpretable Lasso.

Takada, M., Suzuki, T., & Fujisawa, H. (2018). Independently Interpretable Lasso: A New Regularizer for Sparse Regression with Uncorrelated Variables. AISTATS.
<<http://proceedings.mlr.press/v84/takada18a/takada18a.pdf>>.

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Imports Rcpp, Matrix

LinkingTo Rcpp, BH

RoxygenNote 6.0.1

Suggests testthat, knitr, rmarkdown, MASS, parallel

VignetteBuilder knitr

URL <http://proceedings.mlr.press/v84/takada18a/takada18a.pdf>

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R topics documented:

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 cov_lasso

Fit a linear regression model using a covariance matrix

Description

Fit a linear regression model using a covariance matrix

Usage

```
cov_lasso(Gamma, gamma, lambda.min.ratio = 1e-04, nlambda = 100,
  lambda = NULL, delta = 0, alpha = NULL, R = NULL,
  funcR = function(G) { abs(G)^2 }, maxit = 10000, eps = 1e-04,
  warm = "lambda", init.beta = NULL, strong = TRUE, sparse = FALSE,
  impl = "cpp", abs = TRUE)
```

Arguments

| | |
|------------------|--|
| Gamma | covariance matrix of explanatory variables |
| gamma | covariance vector of explanatory and objective variables |
| lambda.min.ratio | ratio of max lambda and min lambda |
| nlambda | the number of lambda (ignored if lambda is specified) |
| lambda | lambda sequence |
| delta | ratio of regularization (exclusive penalty / l1 penalty) (default: 0) |
| alpha | mixing parameter of regularization of l1 and exclusive penalty terms (delta = (1 - alpha) / alpha) |
| R | matrix using exclusive penalty term |
| funcR | function of R (input: X, output: R) |
| maxit | max iteration (default: 1e+4) |
| eps | convergence threshold for optimization (default: 1e-4) |
| warm | warm start direction: "lambda" (default) or "delta" |
| init.beta | initial values of beta |
| strong | whether use strong screening (default) or not |
| sparse | whether use sparse matrix or not (default) |
| impl | implementation language of optimization: "cpp" (default) or "r" |
| abs | (experimental) whether use absolute value of beta (default) or not |

Value

lasso model

beta_standard standardized coefficients

lambda regularization parameters

alpha alpha defined above

delta delta defined above

Examples

```
X <- matrix(c(1,2,3,5,4,7,6,8,9,10), nrow=5, ncol=2)
b <- matrix(c(-1,1), nrow=2, ncol=1)
e <- matrix(c(0,-0.1,0.1,-0.1,0.1), nrow=5, ncol=1)
y <- as.numeric(X %*% b + e)
fit <- lasso(X, y)
pr <- predict_lasso(fit, X)
plot_lasso(fit)
```

cv_lasso

Fit a model using a design matrix with cross validation

Description

Fit a model using a design matrix with cross validation

Usage

```
cv_lasso(X, y, nfolds = 10, lambda.min.ratio = 1e-04, nlambda = 100,
         lambda = NULL, foldid = NULL, unit = "sample", seed, cl, ...)
```

Arguments

X matrix of explanatory variables

y vector of objective variable

nfolds the number of folds (ignored if foldid is specified)

lambda.min.ratio ratio of max lambda and min lambda (ignored if lambda is specified)

nlambda the number of lambda (ignored if lambda is specified)

lambda lambda sequence

foldid vector indicating id of fold for each sample

unit unit for cross validation error: "sample" (default) or "fold"

seed random seed of cross validation

cl (not yet implemented)

... parameters of lasso function

Value

| | |
|------------------|--|
| lasso model | |
| fit | lasso model with hole data |
| lambda.min | lambda with minimum cross validation error |
| lambda.min.index | index of lambda.min |
| lambda.1se | largest lambda such that error is within 1 standard error of the minimum |
| lambda.1se.index | index of lambda.1se |
| delta | delta defined above |
| foldid | fold id |
| cve | cross validation error |
| cvse | cross validation standard error |
| cvup | cross validation error + standard error |
| cvlo | cross validation error - standard error |
| pe | prediction error (for family="binomial") |

Examples

```
X <- matrix(c(1,2,3,5,4,7,6,8,9,10), nrow=5, ncol=2)
b <- matrix(c(-1,1), nrow=2, ncol=1)
e <- matrix(c(0,-0.1,0.1,-0.1,0.1), nrow=5, ncol=1)
y <- as.numeric(X %*% b + e)
cv_fit <- cv_lasso(X, y, nfold=5)
fit <- cv_fit$fit
pr <- predict_lasso(fit, X, cv_fit$lambda.min)
plot_cv_lasso(cv_fit)
```

| | |
|-------|--|
| lasso | <i>Fit a model using a design matrix</i> |
|-------|--|

Description

Fit a model using a design matrix

Usage

```
lasso(X, y, family = "gaussian", impl = "cpp", lambda.min.ratio = 1e-04,
      nlambda = 100, lambda = NULL, warm = "lambda", ...)
```

Arguments

| | |
|------------------|---|
| X | matrix of explanatory variables |
| y | vector of objective variable |
| family | family of regression: "gaussian" (default) or "binomial" |
| impl | implementation language of optimization: "cpp" (default) or "r" |
| lambda.min.ratio | ratio of max lambda and min lambda (ignored if lambda is specified) |
| nlambda | the number of lambda (ignored if lambda is specified) |
| lambda | lambda sequence |
| warm | warm start direction: "lambda" (default) or "delta" |
| ... | parameters for optimization |

Value

| | |
|---------------|---------------------------|
| lasso model | |
| beta | coefficients |
| beta_standard | standardized coefficients |
| a0 | intercepts |
| lambda | regularization parameters |
| alpha | alpha defined above |
| delta | delta defined above |
| family | family |

Examples

```
X <- matrix(c(1,2,3,5,4,7,6,8,9,10), nrow=5, ncol=2)
b <- matrix(c(-1,1), nrow=2, ncol=1)
e <- matrix(c(0,-0.1,0.1,-0.1,0.1), nrow=5, ncol=1)
y <- as.numeric(X %*% b + e)
fit <- lasso(X, y)
pr <- predict_lasso(fit, X)
plot_lasso(fit)
```

logit_lasso

Fit a logistic regression model using a design matrix

Description

Fit a logistic regression model using a design matrix

Usage

```
logit_lasso(X_tilde, y, lambda.min.ratio = 1e-04, nlambda = 100,
  lambda = NULL, delta = 0, alpha = NULL, R = NULL,
  funcR = function(G) { abs(G)^2 }, maxit = 10000, eps = 1e-04,
  warm = "lambda", init.beta = NULL, strong = FALSE, sparse = FALSE,
  impl = "cpp", abs = TRUE)
```

Arguments

| | |
|-------------------------------|---|
| <code>X_tilde</code> | standardized matrix of explanatory variables |
| <code>y</code> | vector of objective variable |
| <code>lambda.min.ratio</code> | ratio of max lambda and min lambda |
| <code>nlambda</code> | the number of lambda (ignored if lambda is specified) |
| <code>lambda</code> | lambda sequence |
| <code>delta</code> | ratio of regularization (exclusive penalty / l1 penalty) (default: 0) |
| <code>alpha</code> | mixing parameter of regularization of l1 and exclusive penalty terms ($\delta = (1 - \alpha) / \alpha$) |
| <code>R</code> | matrix using exclusive penalty term |
| <code>funcR</code> | function of R (input: X, output: R) |
| <code>maxit</code> | max iteration (default: 1e+4) |
| <code>eps</code> | convergence threshold for optimization (default: 1e-4) |
| <code>warm</code> | warm start direction: "lambda" (default) or "delta" |
| <code>init.beta</code> | initial values of beta |
| <code>strong</code> | whether use strong screening (default) or not |
| <code>sparse</code> | whether use sparse matrix or not (default) |
| <code>impl</code> | implementation language of optimization: "cpp" (default) or "r" |
| <code>abs</code> | (experimental) whether use absolute value of beta (default) or not |

Value

| | |
|----------------------------|---------------------------|
| lasso model | |
| <code>beta_standard</code> | standardized coefficients |
| <code>lambda</code> | regularization parameters |
| <code>alpha</code> | alpha defined above |
| <code>delta</code> | delta defined above |

Examples

```
X <- matrix(c(1,2,3,5,4,7,6,8,9,10), nrow=5, ncol=2)
b <- matrix(c(-1,1), nrow=2, ncol=1)
e <- matrix(c(0,-0.1,0.1,-0.1,0.1), nrow=5, ncol=1)
y <- as.numeric(X %*% b + e)
y <- ifelse(y>mean(y), 1, 0)
fit <- lasso(X, y, family="binomial")
pr <- predict_lasso(fit, X)
plot_lasso(fit)
```

plot_cv_lasso *Plot a cross validation error path*

Description

Plot a cross validation error path

Usage

```
plot_cv_lasso(cv_fit, ...)
```

Arguments

| | |
|--------|-------------------------------|
| cv_fit | cross validated IILasso model |
| ... | parameters of |

Examples

```
X <- matrix(c(1,2,3,5,4,7,6,8,9,10), nrow=5, ncol=2)
b <- matrix(c(-1,1), nrow=2, ncol=1)
e <- matrix(c(0,-0.1,0.1,-0.1,0.1), nrow=5, ncol=1)
y <- as.numeric(X %*% b + e)
cv_fit <- cv_lasso(X, y, nolds=5)
fit <- cv_fit$fit
pr <- predict_lasso(fit, X, cv_fit$lambda.min)
plot_cv_lasso(cv_fit)
```

 plot_lasso

Plot a solution path

Description

Plot a solution path

Usage

```
plot_lasso(fit, ...)
```

Arguments

| | |
|-----|---------------------------------|
| fit | IILasso model |
| ... | parameters of matlines function |

Examples

```
X <- matrix(c(1,2,3,5,4,7,6,8,9,10), nrow=5, ncol=2)
b <- matrix(c(-1,1), nrow=2, ncol=1)
e <- matrix(c(0,-0.1,0.1,-0.1,0.1), nrow=5, ncol=1)
y <- as.numeric(X %*% b + e)
fit <- lasso(X, y)
pr <- predict_lasso(fit, X)
plot_lasso(fit)
```

 predict_lasso

Predict responses

Description

Predict responses

Usage

```
predict_lasso(fit, newx, s = NULL, type = "response")
```

Arguments

| | |
|------|---|
| fit | IILasso model |
| newx | matrix of explanatory variables |
| s | selected lambda (default: all) |
| type | prediction type for logistic lasso: "response" (default) or "class" |

Value

prediction matrix (if `s` is NULL) or vector (if `s` is specified)

Examples

```
X <- matrix(c(1,2,3,5,4,7,6,8,9,10), nrow=5, ncol=2)
b <- matrix(c(-1,1), nrow=2, ncol=1)
e <- matrix(c(0,-0.1,0.1,-0.1,0.1), nrow=5, ncol=1)
y <- as.numeric(X %*% b + e)
fit <- lasso(X, y)
pr <- predict_lasso(fit, X)
plot_lasso(fit)
```

 setup_lambda

Set up a lambda sequence

Description

Set up a lambda sequence

Usage

```
setup_lambda(X, y, family = "gaussian", lambda.min.ratio = 1e-04,
            nlambda = 100)
```

Arguments

| | |
|-------------------------------|--|
| <code>X</code> | matrix of explanatory variables |
| <code>y</code> | vector of objective variable |
| <code>family</code> | family of regression: "gaussian" (default) or "binomial" |
| <code>lambda.min.ratio</code> | ratio of max lambda and min lambda |
| <code>nlambda</code> | the number of lambda (ignored if lambda is specified) |

Value

lambda

Examples

```
X <- matrix(c(1,2,3,5,4,7,6,8,9,10), nrow=5, ncol=2)
b <- matrix(c(-1,1), nrow=2, ncol=1)
e <- matrix(c(0,-0.1,0.1,-0.1,0.1), nrow=5, ncol=1)
y <- as.numeric(X %*% b + e)
setup_lambda(X, y)
```

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