

Package: hdqr (via r-universe)

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Description Implements an efficient algorithm to fit and tune penalized quantile regression models using the generalized coordinate descent algorithm. Designed to handle high-dimensional datasets effectively, with emphasis on precision and computational efficiency. This package implements the algorithms proposed in Tang, Q., Zhang, Y., & Wang, B. (2022) <<https://openreview.net/pdf?id=RvwMTDYTOb>>.

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coef.cv.hdqr	<i>Extract Coefficients from a 'cv.hdqr' Object</i>
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Description

Retrieves coefficients from a cross-validated 'hdqr()' model, using the stored "'hdqr.fit'" object and the optimal 'lambda' value determined during cross-validation.

Usage

```
## S3 method for class 'cv.hdqr'
coef(object, s = c("lambda.1se", "lambda.min"), ...)
```

Arguments

object	A fitted 'cv.hdqr()' object from which coefficients are to be extracted.
s	Specifies the value(s) of the penalty parameter 'lambda' for which coefficients are desired. The default is 's = "lambda.1se"', which corresponds to the largest value of 'lambda' such that the cross-validation error estimate is within one standard error of the minimum. Alternatively, 's = "lambda.min"' can be used, corresponding to the minimum of the cross-validation error estimate. If 's' is numeric, these are taken as the actual values of 'lambda' to use.
...	Not used.

Value

Returns the coefficients at the specified 'lambda' values.

See Also

[cv.hdqr](#), [predict.cv.hdqr](#)

Examples

```

set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
lam2 <- 0.01
cv.fit <- cv.hdqr(x = x, y = y, tau = tau, lam2 = lam2)
coef(cv.fit, s = c(0.02, 0.03))

```

coef.cv.nc.hdqr

*Extract Coefficients from a 'cv.nc.hdqr' Object***Description**

Retrieves coefficients at specified values of 'lambda' from a fitted 'cv.nc.hdqr()' model. Utilizes the stored "nchdqr.fit" object and the optimal 'lambda' values determined during the cross-validation process.

Usage

```

## S3 method for class 'cv.nc.hdqr'
coef(object, s = c("lambda.1se", "lambda.min"), ...)

```

Arguments

object	A fitted 'cv.nc.hdqr()' object from which coefficients are to be extracted.
s	Specifies the 'lambda' values at which coefficients are requested. The default is 's = "lambda.1se"', representing the largest 'lambda' such that the cross-validation error estimate is within one standard error of the minimum. Alternatively, 's = "lambda.min"' corresponds to the 'lambda' yielding the minimum cross-validation error. If 's' is numeric, these values are directly used as the 'lambda' values for coefficient extraction.
...	Not used.

Value

Returns a vector or matrix of coefficients corresponding to the specified 'lambda' values.

See Also

[cv.nc.hdqr](#), [predict.cv.nc.hdqr](#)

Examples

```

set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
lam2 <- 0.01
lambda <- 10^(seq(1,-4, length.out=30))
cv.nc.fit <- cv.nc.hdqr(x = x, y = y, tau = tau, lambda = lambda, lam2 = lam2)
coef(cv.nc.fit, s = c(0.02, 0.03))

```

coef.hdqr

*Extract Model Coefficients from a 'hdqr' Object***Description**

Retrieves the coefficients at specified values of 'lambda' from a fitted 'hdqr()' model.

Usage

```

## S3 method for class 'hdqr'
coef(object, s = NULL, type = c("coefficients", "nonzero"), ...)

```

Arguments

object	Fitted 'hdqr()' object.
s	Values of the penalty parameter 'lambda' for which coefficients are requested. Defaults to the entire sequence used during the model fit.
type	Type of prediction required. Type "coefficients" computes the coefficients at the requested values for 's'. Type "nonzero" returns a list of the indices of the nonzero coefficients for each value of s.
...	Not used.

Details

This function extracts coefficients for specified 'lambda' values from a 'hdqr()' object. If 's', the vector of 'lambda' values, contains values not originally used in the model fitting, the 'coef' function employs linear interpolation between the closest 'lambda' values from the original sequence to estimate coefficients at the new 'lambda' values.

Value

Returns a matrix or vector of coefficients corresponding to the specified 'lambda' values.

See Also[hdqr](#), [predict.hdqr](#)**Examples**

```

set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
lam2 <- 0.01
fit <- hdqr(x = x, y = y, tau = tau, lam2 = lam2)
coefs <- coef(fit, s = fit$lambda[3:5])

```

coef.nc.hdqr

*Extract Model Coefficients from a 'nc.hdqr' Object***Description**

Retrieves the coefficients at specified values of 'lambda' from a fitted 'nc.hdqr()' model.

Usage

```

## S3 method for class 'nc.hdqr'
coef(object, s = NULL, type = c("coefficients", "nonzero"), ...)

```

Arguments

object	Fitted 'nc.hdqr()' object.
s	Values of the penalty parameter 'lambda' for which coefficients are requested. Defaults to the entire sequence used during the model fit.
type	Type of prediction required. Type "coefficients" computes the coefficients at the requested values for 's'. Type "nonzero" returns a list of the indices of the nonzero coefficients for each value of s.
...	Not used.

Details

This function extracts coefficients for specified 'lambda' values from a 'nc.hdqr()' object. If 's', the vector of 'lambda' values, contains values not originally used in the model fitting, the 'coef' function employs linear interpolation between the closest 'lambda' values from the original sequence to estimate coefficients at the new 'lambda' values.

Value

Returns a matrix or vector of coefficients corresponding to the specified ‘lambda’ values.

See Also

[nc.hdqr](#), [predict.nc.hdqr](#)

Examples

```
set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
lam2 <- 0.01
lambda <- 10^(seq(1,-4, length.out=30))
nc.fit <- nc.hdqr(x=x, y=y, tau=tau, lambda=lambda, lam2=lam2, pen="scad")
nc.coefs <- coef(nc.fit, s = nc.fit$lambda[3:5])
```

cv.hdqr	<i>Cross-validation for Selecting the Tuning Parameter in Penalized Quantile Regression</i>
---------	---

Description

Performs k-fold cross-validation for [hdqr](#).

Usage

```
cv.hdqr(x, y, lambda = NULL, tau, nfolds = 5L, foldid, ...)
```

Arguments

x	A numerical matrix with n rows (observations) and p columns (variables).
y	Response variable.
lambda	Optional; a user-supplied sequence of lambda values. If NULL, hdqr selects its own sequence.
tau	Quantile level (tau) used in the loss function.
nfolds	Number of folds for cross-validation. Defaults to 5.
foldid	Optional vector specifying the indices of observations in each fold. If provided, it overrides nfolds.
...	Additional arguments passed to hdqr .

Details

This function computes the average cross-validation error and provides the standard error.

Value

An object with S3 class `cv.hdqr` consisting of

<code>lambda</code>	Candidate lambda values.
<code>cvm</code>	Mean cross-validation error.
<code>cvsd</code>	Standard error of the mean cross-validation error.
<code>cvup</code>	Upper confidence curve: <code>cvm + cvsd</code> .
<code>cvlo</code>	Lower confidence curve: <code>cvm - cvsd</code> .
<code>lambda.min</code>	lambda achieving the minimum cross-validation error.
<code>lambda.1se</code>	Largest lambda within one standard error of the minimum error.
<code>cv.min</code>	Cross-validation error at <code>lambda.min</code> .
<code>cv.1se</code>	Cross-validation error at <code>lambda.1se</code> .
<code>hdqr.fit</code>	a fitted <code>hdqr</code> object for the full data.
<code>nzero</code>	Number of non-zero coefficients at each lambda.

Examples

```
set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
cv.fit <- cv.hdqr(x = x, y = y, tau = tau)
```

`cv.nc.hdqr`

Cross-validation for Selecting the Tuning Parameter of Nonconvex Penalized Quantile Regression

Description

Conducts k-fold cross-validation for the `'nc.hdqr()'` function.

Usage

```
cv.nc.hdqr(x, y, lambda = NULL, tau, nfolds = 5L, foldid, ...)
```

Arguments

x	A numerical matrix with dimensions (n rows and p columns), where each row represents an observation.
y	Response variable.
lambda	Optional user-supplied sequence of lambda values.
tau	The quantile level (tau) used in the error calculation. Default value is typically 0.5 unless specified.
nfolds	Number of folds in the cross-validation, default is 5.
foldid	An optional vector that assigns each observation to a specific fold. If provided, this parameter overrides nfolds.
...	Additional arguments passed to nc.hdqr .

Details

This function estimates the average cross-validation error and its standard error across folds. It is primarily used to identify the optimal lambda value for fitting nonconvex penalized quantile regression models.

Value

An object of class `cv.nc.hdqr` is returned, which is a list with the ingredients of the cross-validated fit.

lambda	the values of lambda used in the fits.
cvm	the mean cross-validated error - a vector of length <code>length(lambda)</code> .
cvsd	estimate of standard error of <code>cvm</code> .
cvupper	upper curve = <code>cvm+cvsd</code> .
cvlower	lower curve = <code>cvm-cvsd</code> .
nzero	number of non-zero coefficients at each lambda.
name	a text string indicating type of measure (for plotting purposes).
nchdqr.fit	a fitted nc.hdqr object for the full data.
lambda.min	The optimal value of lambda that gives minimum cross validation error <code>cvm</code> .
lambda.1se	The largest value of lambda such that error is within 1 standard error of the minimum.

Examples

```
set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
```



```
lam2 <- 0.01
lambda <- 10^(seq(1,-4, length.out=10))
cv.nc.fit <- cv.nc.hdqr(y=y, x=x, tau=tau, lambda=lambda, lam2=lam2, pen="scad")
```

hdqr	<i>Solve the linear quantile regression. The solution path is computed at a grid of values of tuning parameter lambda.</i>
------	--

Description

Solve the linear quantile regression. The solution path is computed at a grid of values of tuning parameter lambda.

Usage

```
hdqr(
  x,
  y,
  tau,
  nlambda = 100,
  lambda.factor = ifelse(nobs < nvars, 0.01, 1e-04),
  lambda = NULL,
  lam2 = 0.01,
  hval = 0.125,
  pf = rep(1, nvars),
  pf2 = rep(1, nvars),
  exclude,
  dfmax = nvars + 1,
  pmax = min(dfmax * 1.2, nvars),
  standardize = TRUE,
  eps = 1e-08,
  maxit = 1e+06,
  sigma = 0.05,
  is_exact = FALSE
)
```

Arguments

x	Matrix of predictors, of dimension (nobs * nvars); each row is an observation.
y	Response variable. The length is n .
tau	The quantile level τ . The value must be in (0,1). Default is 0.5.
nlambda	The number of lambda values (default is 100).
lambda.factor	The factor for getting the minimal value in the lambda sequence, where $\min(\text{lambda}) = \text{lambda.factor} * \max(\text{lambda})$ and $\max(\text{lambda})$ is the smallest value of lambda for which all coefficients (except the intercept when it is present) are

penalized to zero. The default depends on the relationship between n (the number of rows in the design matrix) and p (the number of predictors). If $n < p$, it defaults to 0.05 . If $n > p$, the default is 0.001 , closer to zero. A very small value of `lambda.factor` will lead to a saturated fit. The argument takes no effect if there is a user-supplied lambda sequence.

<code>lambda</code>	A user-supplied lambda sequence. Typically, by leaving this option unspecified, users can have the program compute its own lambda sequence based on <code>nlambda</code> and <code>lambda.factor</code> . It is better to supply, if necessary, a decreasing sequence of lambda values than a single (small) value. The program will ensure that the user-supplied lambda sequence is sorted in decreasing order before fitting the model to take advantage of the warm-start technique.
<code>lam2</code>	Regularization parameter lambda2 for the quadratic penalty of the coefficients. Unlike lambda, only one value of lambda2 is used for each fitting process.
<code>hval</code>	The smoothing index for <code>method='huber'</code> . Default is 0.125.
<code>pf</code>	L1 penalty factor of length p used for the adaptive LASSO or adaptive elastic net. Separate L1 penalty weights can be applied to each coefficient to allow different L1 shrinkage. Can be 0 for some variables (but not all), which imposes no shrinkage, and results in that variable always being included in the model. Default is 1 for all variables (and implicitly infinity for variables in the <code>exclude</code> list).
<code>pf2</code>	L2 penalty factor of length p used for adaptive elastic net. Separate L2 penalty weights can be applied to each coefficient to allow different L2 shrinkage. Can be 0 for some variables, which imposes no shrinkage. Default is 1 for all variables.
<code>exclude</code>	Indices of variables to be excluded from the model. Default is none. Equivalent to an infinite penalty factor.
<code>dfmax</code>	The maximum number of variables allowed in the model. Useful for very large p when a partial path is desired. Default is $p + 1$.
<code>pmax</code>	The maximum number of coefficients allowed ever to be nonzero along the solution path. For example, once β enters the model, no matter how many times it exits or re-enters the model through the path, it will be counted only once. Default is $\min(\text{dfmax} * 1.2, p)$.
<code>standardize</code>	Logical flag for variable standardization, prior to fitting the model sequence. The coefficients are always returned to the original scale. Default is TRUE.
<code>eps</code>	Stopping criterion.
<code>maxit</code>	Maximum number of iterates.
<code>sigma</code>	Penalty parameter appearing in the quadratic term of the augmented Lagrangian function. Must be positive.
<code>is_exact</code>	Exact or approximated solutions. Default is FALSE.

Details

Note that the objective function in the penalized quantile regression is

$$1' \rho_{\tau}(y - X\beta - b_0) / N + \lambda_1 \cdot |pf_1 \circ \beta|_1 + 0.5 * \lambda_2 \cdot |\sqrt{pf_2} \circ \beta|^2,$$

where ρ_τ the quantile or check loss and the penalty is a combination of weighted L1 and L2 terms and \circ denotes the Hadmarnard product.

For faster computation, if the algorithm is not converging or running slow, consider increasing `eps`, increasing `sigma`, decreasing `nlambda`, or increasing `lambda.factor` before increasing `maxit`.

Value

An object with S3 class `hdqr` consisting of

<code>call</code>	the call that produced this object
<code>b0</code>	intercept sequence of length <code>length(lambda)</code>
<code>beta</code>	a <code>p*length(lambda)</code> matrix of coefficients, stored as a sparse matrix (dgCMatrix class, the standard class for sparse numeric matrices in the <code>Matrix</code> package.). To convert it into normal type matrix, use <code>as.matrix()</code> .
<code>lambda</code>	the actual sequence of <code>lambda</code> values used
<code>df</code>	the number of nonzero coefficients for each value of <code>lambda</code> .
<code>npasses</code>	the number of iterations for every <code>lambda</code> value
<code>jerr</code>	error flag, for warnings and errors, 0 if no error.

Examples

```
set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
lam2 <- 0.01
fit <- hdqr(x = x, y = y, tau = tau, lam2 = lam2)
```

Description

This function fits the penalized quantile regression model using nonconvex penalties such as SCAD or MCP. It allows for flexible control over the regularization parameters and offers advanced options for initializing and optimizing the fit.

Usage

```
nc.hdqr(
  x,
  y,
  tau,
  lambda,
  pen = "scad",
  aval = NULL,
  lam2 = 1,
  ini_beta = NULL,
  lla_step = 3,
  ...
)
```

Arguments

<code>x</code>	Matrix of predictors, with dimensions (nobs * nvars); each row represents an observation.
<code>y</code>	Response variable, with length n .
<code>tau</code>	The quantile level τ , which must be in the range (0,1). Default is 0.5.
<code>lambda</code>	Optional user-supplied sequence of lambda values. If unspecified, the program calculates its own sequence based on <code>nlambda</code> and <code>lambda.factor</code> . Supplying a decreasing sequence of lambda values is advisable to leverage the warm-start optimization.
<code>pen</code>	Specifies the type of nonconvex penalty: "SCAD" or "MCP".
<code>aval</code>	The parameter value for the SCAD or MCP penalty. Default is 3.7 for SCAD and 2 for MCP.
<code>lam2</code>	Regularization parameter lambda2 for the quadratic penalty on the coefficients. Only one value of lambda2 is used per fit.
<code>ini_beta</code>	Optional initial coefficients to start the fitting process.
<code>lla_step</code>	Number of Local Linear Approximation (LLA) steps. Default is 3.
<code>...</code>	Additional arguments passed to hdqr .

Value

An object with S3 class `nc.hdqr` consisting of

<code>call</code>	the call that produced this object
<code>b0</code>	intercept sequence of length <code>length(lambda)</code>
<code>beta</code>	a $p \times \text{length}(\text{lambda})$ matrix of coefficients, stored as a sparse matrix (<code>dgCMatrix</code> class, the standard class for sparse numeric matrices in the <code>Matrix</code> package.). To convert it into normal type matrix, use <code>as.matrix()</code> .
<code>lambda</code>	the actual sequence of lambda values used
<code>df</code>	the number of nonzero coefficients for each value of lambda.
<code>npasses</code>	the number of iterations for every lambda value

```
jerr          error flag, for warnings and errors, 0 if no error.
#'
```

Examples

```
set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
lam2 <- 0.01
lambda <- 10^(seq(1,-4, length.out=30))
nc.fit <- nc.hdqr(x=x, y=y, tau=tau, lambda=lambda, lam2=lam2, pen="scad")
```

predict.cv.hdqr	<i>Make Predictions from a 'cv.hdqr' Object</i>
-----------------	---

Description

Generates predictions using a fitted 'cv.hdqr()' object. This function utilizes the stored 'hdqr.fit' object and an optimal value of 'lambda' determined during the cross-validation process.

Usage

```
## S3 method for class 'cv.hdqr'
predict(object, newx, s = c("lambda.1se", "lambda.min"), ...)
```

Arguments

object	A fitted 'cv.hdqr()' object from which predictions are to be made.
newx	Matrix of new predictor values for which predictions are desired. This must be a matrix and is a required argument.
s	Specifies the value(s) of the penalty parameter 'lambda' at which predictions are desired. The default is 's = "lambda.1se"', representing the largest value of 'lambda' such that the cross-validation error estimate is within one standard error of the minimum. Alternatively, 's = "lambda.min"' can be used, corresponding to the minimum of the cross-validation error estimate. If 's' is numeric, these are taken as the actual values of 'lambda' to use for predictions.
...	Not used.

Value

Returns a matrix or vector of predicted values corresponding to the specified 'lambda' values.

See Also

[cv.hdqr](#), [coef.cv.hdqr](#)

Examples

```
set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
lam2 <- 0.01
cv.fit <- cv.hdqr(x = x, y = y, tau = tau, lam2 = lam2)
predict(cv.fit, newx = x[50:60, ], s = "lambda.min")
```

predict.cv.nc.hdqr *Make Predictions from a 'cv.nc.hdqr' Object*

Description

Generates predictions using a fitted 'cv.nc.hdqr()' object. This function utilizes the stored 'nchdqr.fit' object and an optimal value of 'lambda' determined during the cross-validation process.

Usage

```
## S3 method for class 'cv.nc.hdqr'
predict(object, newx, s = c("lambda.1se", "lambda.min"), ...)
```

Arguments

object	A fitted 'cv.nc.hdqr()' object from which predictions are to be made.
newx	Matrix of new predictor values for which predictions are desired. This must be a matrix and is a required argument.
s	Specifies the value(s) of the penalty parameter 'lambda' at which predictions are desired. The default is 's = "lambda.1se"', representing the largest value of 'lambda' such that the cross-validation error estimate is within one standard error of the minimum. Alternatively, 's = "lambda.min"' can be used, corresponding to the minimum of the cross-validation error estimate. If 's' is numeric, these are taken as the actual values of 'lambda' to use for predictions.
...	Not used.

Value

Returns a matrix or vector of predicted values corresponding to the specified 'lambda' values.

See Also

[cv.nc.hdqr](#), [predict.cv.nc.hdqr](#)

Examples

```
set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
lam2 <- 0.01
lambda <- 10^(seq(1,-4, length.out=10))
cv.nc.fit <- cv.nc.hdqr(x = x, y = y, tau = tau, lambda = lambda, lam2 = lam2)
predict(cv.nc.fit, newx = x[50:60, ], s = "lambda.min")
```

predict.hdqr

Make Predictions from a 'hdqr' Object

Description

Produces fitted values for new predictor data using a fitted 'hdqr()' object.

Usage

```
## S3 method for class 'hdqr'
predict(object, newx, s = NULL, ...)
```

Arguments

object	Fitted 'hdqr()' object from which predictions are to be derived.
newx	Matrix of new predictor values for which predictions are desired. This must be a matrix and is a required argument.
s	Values of the penalty parameter 'lambda' for which predictions are requested. Defaults to the entire sequence used during the model fit.
...	Not used.

Details

This function generates predictions at specified 'lambda' values from a fitted 'hdqr()' object. It is essential to provide a new matrix of predictor values ('newx') at which these predictions are to be made.

Value

Returns a vector or matrix of predicted values corresponding to the specified 'lambda' values.

See Also[hdqr](#), [coef.hdqr](#)**Examples**

```

set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
lam2 <- 0.01
fit <- hdqr(x = x, y = y, tau = tau, lam2 = lam2)
preds <- predict(fit, newx = tail(x), s = fit$lambda[3:5])

```

`predict.nc.hdqr`*Make Predictions from a 'nc.hdqr' Object*

Description

Produces fitted values for new predictor data using a fitted 'nc.hdqr()' object.

Usage

```

## S3 method for class 'nc.hdqr'
predict(object, newx, s = NULL, ...)

```

Arguments

<code>object</code>	Fitted 'nc.hdqr()' object from which predictions are to be derived.
<code>newx</code>	Matrix of new predictor values for which predictions are desired. This must be a matrix and is a required argument.
<code>s</code>	Values of the penalty parameter 'lambda' for which predictions are requested. Defaults to the entire sequence used during the model fit.
<code>...</code>	Not used.

Details

This function generates predictions at specified 'lambda' values from a fitted 'nc.hdqr()' object. It is essential to provide a new matrix of predictor values ('newx') at which these predictions are to be made.

Value

Returns a vector or matrix of predicted values corresponding to the specified 'lambda' values.

See Also[nc.hdqr](#), [coef.nc.hdqr](#)**Examples**

```
set.seed(315)
n <- 100
p <- 400
x <- matrix(data = rnorm(n * p, mean = 0, sd = 1), nrow = n, ncol = p)
beta_star <- c(c(2, 1.5, 0.8, 1, 1.75, 0.75, 0.3), rep(0, (p - 7)))
eps <- rnorm(n, mean = 0, sd = 1)
y <- x %*% beta_star + eps
tau <- 0.5
lam2 <- 0.01
lambda <- 10^(seq(1,-4, length.out=30))
nc.fit <- nc.hdqr(x=x, y=y, tau=tau, lambda=lambda, lam2=lam2, pen="scad")
nc.preds <- predict(nc.fit, newx = tail(x), s = nc.fit$lambda[3:5])
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