# Package 'OutlierDC'

## February 19, 2015

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Title Outlier Detection using quantile regression for Censored Data
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Version 0.3-0
<b>Description</b> This package provides three algorithms to detect outlying observations for censored survival data
<b>Depends</b> R (>= 3.0.0), methods, survival, quantreg, Formula
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OutlierDC-package	Functions for detecting outlying observations for censored data using quantile regression

#### **Description**

This package offers three outlier detection algorithms for censored data using quantile regression.

## **Details**

Package: OutlierDC
Type: Package
Version: 0.3-0
Date: 2014-03-23
License: GPL version 3

LazyLoad: no

#### Note

We would like to thank Huxia Judy Wang and Lan Wang for permission to use their LCRQ functions.

#### Author(s)

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### References

Eo S-H, Hong S-M Hong, Cho H (2014). Identification of outlying observations with quantile regression for censored data, *Submitted*.

Wang HJ, Wang L (2009) Locally Weighted Censored Quantile Regression. JASA 104:1117–1128. doi: 10.1198/jasa.2009.tm08230

#### See Also

```
odc, plot, coef, show, quantreg
```

#### **Examples**

```
## Not run:
    require(OutlierDC)
# Toy example
    data(ebd)
# The data consists of 402 observations with 6 variables.
```

coef 3

```
dim(ebd)
    # To show the first six observations of the dataset,
    head(ebd)
    #scoring algorithm
    fit <- odc(Surv(log(time), status) ~ meta, data = ebd)</pre>
    fit
    coef(fit)
    plot(fit)
    \ensuremath{\text{\#}}\xspace Add upper bound for the selection of outleirs
    fit1 \leftarrow update(fit, k_s = 4)
    fit1
    plot(fit1)
    # residual-based algorithm
   fit2 \leftarrow odc(Surv(log(time), status) \sim meta, data = ebd, method = "residual", k_r = 1.5)
    fit2
    plot(fit2)
    # To display all of outlying observations in the fitted object
    fit2@outlier.data
    # boxplot algorithm
    fit3 <- odc(Surv(log(time), status) ~ meta, data = ebd, method = "boxplot", k_b = 1.5)
    plot(fit3, ylab = "log survival times", xlab = "metastasis lymph nodes")
## End(Not run)
```

coef

a coef method for "OutlierDC".

#### **Description**

coef is a generic function which extracts model coefficient matrix including the 10th, 25th, 50th, 75th, 90th quantile estimates.

## Usage

```
## S4 method for signature 'OutlierDC'
coef(object)
```

## Arguments

object

an object with class OutlierDC.

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#### **Details**

This function is a generic function coef for the S4 class OutlierDC. It can be invoked by calling print for an object of the appropriate class, or directly by calling coef regardless of the class of the object.

#### See Also

odc and OutlierDC class

ebd

Extrahepatic Cholangiocarcinoma Data

## Description

The extrahepatic cholangiocarcinoma data comes form the US Surveilance, Epidemiology, and End Results (SEER) program of the National Cancer Institute.

#### Usage

data(ebd)

#### **Source**

Hankey B., Ries L., and Edwards B. (1999). The surveillance, epidemiology, and end results program a national resource. *Cencer Epidemiology Biomarkers and Prevention*, 12:1117-1121.

#### **Examples**

data(ebd)

odc

Outlier detection using quantile regression for censored data

#### **Description**

outlier detection algorithms using quantile regression for censored data

## Usage

```
odc(formula, data,
    method = c("score", "boxplot","residual"),
    rq.model = c("Wang", "PengHuang", "Portnoy"),
    k_r = 1.5, k_b = 1.5, h = .05)
```

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#### **Arguments**

formula a type of Formula object with a survival object on the left-hand side of the ~ operator and covariate terms on the right-hand side. The survival object with survival time and its censoring status is constructed by the Surv function in survival package. data a data frame with variables used in the formula. It needs at least three variables, including survival time, censoring status, and covariates. the outlier detection method to be used. The options "socre", "boxplot", method and "residual" conduct the scoring, boxplot, and residual-based algorithm, respectively. The default algorithm is "score". rq.model the type of censored quantile regression to be used for fitting. The options "Wang", "Portnoy", and "PengHuang" conduct Wang and Wang's, Portnoy's, and Peng and Huang's censored quantile regression approaches, respectively. The default is "Wang". a value to control the tightness of cut-offs for the residual algorithm with a dek\_r fault value of 1.5. k\_b a value to control the tightness of cut-offs for the boxplot algorithm with a default value of 1.5. h bandwidth for locally weighted censored quantile regression with a default value of 0.05.

#### **Details**

The odc function conducts three outlier detection algorithms on the basis of censored quantile regression. Three outlier detection algorithms were implemented: residual-based, boxplot, and scoring algorithms. The residual-based algorithm detects outlying observations using constant scale estimates; however, it does not account for the heterogeneity of variability. When the data is extremely heterogeneous, the boxplot algorithm with censored quantile regression is more effective. The residual-based and boxplot algorithms produce cut-offs to determine whether observations are outliers. In contrast, the scoring algorithm provides the outlying magnitude or deviation of each point from the distribution of observations. Outlier detection is achieved by visualising the scores.

#### Value

an object of the S4 class "OutlierDC" with the following slots:

call: evaluated function call formula: formula to be used

raw.data: data to be used for model fitting refined.data: the data set after removing outliers refined.data: the data set containing outliers

coefficients: the estimated censored quantile regression coefficient matrix consisting of 10th, 25th, 50th, 75th, and 90th quantiles

fitted.mat: the censored quantile regression fitted value matrix consisting of 10th, 25th, 50th, 75th, and 90th quantiles

score: outlying scores (scoring algorithm) or residuals (residual-based algorithm)

cutoff: estimated scale parameter for the residual-based algorithm lower: lower fence vector used for the boxplot and scoring algorithms

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upper: upper fence vector used for the boxplot and scoring algorithms outliers: logical vector to determine which observations are outliers

n.outliers: number of outliers detected method: outlier detection method to be used rq.model: censored quantile regression to be used

k\_r: a value to be used for the tightness of cut-offs in the residual algorithm k\_b: a value to be used for the tightness of cut-offs in the boxplot algorithm

k\_s: a value to be used for the tightness of upper fence cut-offs used for the scoring algorithm with the update function

#### Source

Eo S-H, Hong S-M Hong, Cho H (2014). Identification of outlying observations with quantile regression for censored data, *Submitted*.

Wang HJ, Wang L (2009) Locally Weighted Censored Quantile Regression. JASA 104:1117–1128. doi: 10.1198/jasa.2009.tm08230

#### See Also

```
OutlierDC-package coef, plot, show, update
```

#### **Examples**

```
## Not run:
  require(OutlierDC)
  # Toy example
 data(ebd)
  # The data consists of 402 observations with 6 variables.
 dim(ebd)
  # To show the first six observations of the dataset,
 head(ebd)
  #scoring algorithm
  fit <- odc(Surv(log(time), status) ~ meta, data = ebd)</pre>
  fit
  coef(fit)
  plot(fit)
  # Add upper bound for the selection of outleirs
  fit1 \leftarrow update(fit, k_s = 4)
  fit1
  plot(fit1)
  # residual-based algorithm
 fit2 <- odc(Surv(log(time), status) ~ meta, data = ebd, method = "residual", k_r = 1.5)
  fit2
 plot(fit2)
  # To display all of outlying observations in the fitted object
```

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```
fit2@outlier.data

# boxplot algorithm
fit3 <- odc(Surv(log(time), status) ~ meta, data = ebd, method = "boxplot", k_b = 1.5)
fit3
plot(fit3, ylab = "log survival times", xlab = "metastasis lymph nodes")

## End(Not run)</pre>
```

OutlierDC-class

"OutlierDC" class

#### **Description**

The OutlierDC class presents outlier detection algorithms for censored data.

#### **Objects from the Class**

update function

Objects can be created by calls of the form new("OutlierDC").

#### **Slots**

```
call: evaluated function call
formula: formula to be used with the type of "Formula"
raw.data: data to be used with the type of "data.frame"
refined.data: the data set after removing outliers
outlier.data: the data set containing outliers
coefficients: the estimated censored quantile regression coefficient matrix
fitted.mat: the censored quantile regression fitted value matrix with the type of "matrix"
score: outlying scores (scoring algorithm) or residuals (residual-based algorithm)
cutoff: estimated scale parameter for the residual-based algorithm
lower: lower fence vector used for the boxplot and scoring algorithms with the type of "vector"
upper: upper fence vector used for the boxplot and scoring algorithms with the type of "vector"
outliers: logical vector to determine which observations are outliers
n.outliers: number of outliers to be used. The object of class "integer".
method: outlier detection method to be used
rq.model: censored quantile regression to be fitted
k_r: a value to be used for the tightness of cut-offs in the residual-based algorithm
k_b: a value to be used for the tightness of cut-offs in the boxplot algorithm
bound: type of fence to be used in the model fittind
k_s: a value to be used for the tightness of upper fence cut-offs used for the scoring algorithm with
```

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#### Methods

```
coef signature(object = "OutlierDC"): Print the coefficient matrix of censored quantile re-
gression to be used. See coef.

plot signature(x = "OutlierDC", y = "missing"): See plot.

show signature(object = "OutlierDC"): See show.

update signature(object = "OutlierDC"): Update the fitted object to find outliers in scoring
algorithm. See update.
```

#### See Also

```
OutlierDC-package coef, plot, show, update
```

#### **Examples**

```
showClass("OutlierDC")
```

plot

a plot-method for a "OutlierDC" object

#### **Description**

This function provides three different results. If the algorithm is score, it draws a normal quantile-quantile plot of the outlying scores. If the algorithm is boxplot, the scatter plot of log survival times against the covariate used is given. Lastly, if the algorithm is residual, it offers a residual plot.

#### Usage

```
## S4 method for signature 'OutlierDC'
plot(x, y = NA, ...)
```

#### **Arguments**

```
x fitted model object of class OutlierDC.y missing value... plot.default arguments
```

#### See Also

```
odc and OutlierDC class
```

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show

a show method for OutlierDC

#### **Description**

This function provides a summary for the OutlierDC class.

#### Usage

```
## S4 method for signature 'OutlierDC'
show(object)
```

#### Arguments

object

fitted model object of class OutlierDC.

#### **Details**

This function is a method for the generic function show for the S4 class OutlierDC. It can be invoked by calling print for an object of the appropriate class, or directly by calling show regardless of the class of the object.

#### See Also

odc and OutlierDC

update

Update a scoring algorithm.

## Description

This function updates a scoring algorithm using upper and/or lower fences. Using the call stored in the object, the update function declares outlying observatoins based on the QQ plot. k\_s is used to set the upper cut-off bound.

#### Usage

```
## S4 method for signature 'OutlierDC'
update(object, k_s = NA, LB = NA)
```

## Arguments

object fitted model object of class OutlierDC.

k\_s cut-off value for the upper fence
LB cut-off value for the lower fence

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## **Details**

This function is a generic function called update for the S4 class OutlierDC. Cut-off bounds are added to find outliers on the normal QQ plot.

## See Also

odc and OutlierDC class

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