

# Package ‘rdmulti’

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**Type** Package

**Title** Analysis of RD Designs with Multiple Cutoffs or Scores

**Version** 0.6

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**Description** The regression discontinuity (RD) design is a popular quasi-experimental design for causal inference and policy evaluation. The 'rdmulti' package provides tools to analyze RD designs with multiple cutoffs or scores: `rdmc()` estimates pooled and cutoff specific effects for multi-cutoff designs, `rdmplot()` draws RD plots for multi-cutoff designs and `rdms()` estimates effects in cumulative cutoffs or multi-score designs. See Cattaneo, Titiunik and Vazquez-Bare (2020) <[https://rdpackages.github.io/references/Cattaneo-Titiunik-VazquezBare\\_2020\\_Stata.pdf](https://rdpackages.github.io/references/Cattaneo-Titiunik-VazquezBare_2020_Stata.pdf)> for further methodological details.

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## R topics documented:

rdmulti-package . . . . .	2
rdmc . . . . .	3
rdmplot . . . . .	6
rdms . . . . .	8

<b>Index</b>	<b>12</b>
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rdmulti-package

*rdmulti: analysis of RD Designs with multiple cutoffs or scores*

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## Description

The regression discontinuity (RD) design is a popular quasi-experimental design for causal inference and policy evaluation. The 'rdmulti' package provides tools to analyze RD designs with multiple cutoffs or scores: `rdmc()` estimates pooled and cutoff-specific effects in multi-cutoff designs, `rdmcpplot()` draws RD plots for multi-cutoff RD designs and `rdms()` estimates effects in cumulative cutoffs or multi-score designs. For more details, and related Stata and R packages useful for analysis of RD designs, visit <https://rdpackages.github.io/>.

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## References

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- Cattaneo, M.D., R. Titiunik and G. Vazquez-Bare. (2020). **Analysis of Regression Discontinuity Designs with Multiple Cutoffs or Multiple Scores**. *Stata Journal*, forthcoming.
- Keele, L. and R. Titiunik. (2015). **Geographic Boundaries as Regression Discontinuities**. *Political Analysis* 23(1): 127-155

**Description**

rdmc() analyzes RD designs with multiple cutoffs.

**Usage**

```
rdmc(  
  Y,  
  X,  
  C,  
  fuzzy = NULL,  
  derivvec = NULL,  
  pooled_opt = NULL,  
  verbose = FALSE,  
  pvec = NULL,  
  qvec = NULL,  
  hmat = NULL,  
  bmat = NULL,  
  rhovec = NULL,  
  covsvec = NULL,  
  covs_dropvec = NULL,  
  kernelvec = NULL,  
  weightsvec = NULL,  
  bwselectvec = NULL,  
  scaleparvec = NULL,  
  scaleregulvec = NULL,  
  masspointsvec = NULL,  
  bwcheckvec = NULL,  
  bwrestrictvec = NULL,  
  stdvarsvec = NULL,  
  vcevec = NULL,  
  nnmatchvec = NULL,  
  cluster = NULL,  
  level = 95,  
  plot = FALSE  
)
```

**Arguments**

Y	outcome variable.
X	running variable.
C	cutoff variable.
fuzzy	specifies a fuzzy design. See rdrobust() for details.

<code>derivvec</code>	vector of cutoff-specific order of derivatives. See <code>rdrobust()</code> for details.
<code>pooled_opt</code>	options to be passed to <code>rdrobust()</code> to calculate pooled estimand.
<code>verbose</code>	displays the output from <code>rdrobust</code> for estimating the pooled estimand.
<code>pvec</code>	vector of cutoff-specific polynomial orders. See <code>rdrobust()</code> for details.
<code>qvec</code>	vector of cutoff-specific polynomial orders for bias estimation. See <code>rdrobust()</code> for details.
<code>hmat</code>	matrix of cutoff-specific bandwidths. See <code>rdrobust()</code> for details.
<code>bmat</code>	matrix of cutoff-specific bandwidths for bias estimation. See <code>rdrobust()</code> for details.
<code>rhovec</code>	vector of cutoff-specific values of rho. See <code>rdrobust()</code> for details.
<code>covsvec</code>	vector of cutoff-specific covariates. See <code>rdrobust()</code> for details.
<code>covs_dropvec</code>	vector indicating whether collinear covariates should be dropped at each cutoff. See <code>rdrobust()</code> for details.
<code>kernelvec</code>	vector of cutoff-specific kernels. See <code>rdrobust()</code> for details.
<code>weightsvec</code>	vector of cutoff-specific weights. See <code>rdrobust()</code> for details.
<code>bwselectvec</code>	vector of cutoff-specific bandwidth selection methods. See <code>rdrobust()</code> for details.
<code>scaleparvec</code>	vector of cutoff-specific scale parameters. See <code>rdrobust()</code> for details.
<code>scaleregulvec</code>	vector of cutoff-specific scale regularization parameters. See <code>rdrobust()</code> for details.
<code>masspointsvec</code>	vector indicating how to handle repeated values at each cutoff. See <code>rdrobust()</code> for details.
<code>bwcheckvec</code>	vector indicating the value of <code>bwcheck</code> at each cutoff. See <code>rdrobust()</code> for details.
<code>bwrestrictvec</code>	vector indicating whether computed bandwidths are restricted to the range or <code>runvar</code> at each cutoff. See <code>rdrobust()</code> for details.
<code>stdvarsvec</code>	vector indicating whether variables are standardized at each cutoff. See <code>rdrobust()</code> for details.
<code>vcevec</code>	vector of cutoff-specific variance-covariance estimation methods. See <code>rdrobust()</code> for details.
<code>nnmatchvec</code>	vector of cutoff-specific nearestneighbors for variance estimation. See <code>rdrobust()</code> for details.
<code>cluster</code>	cluster ID variable. See <code>rdrobust()</code> for details.
<code>level</code>	confidence level for confidence intervals. See <code>rdrobust()</code> for details.
<code>plot</code>	plots cutoff-specific estimates and weights.

### Value

<code>tau</code>	pooled estimate
<code>se.rb</code>	robust bias corrected standard error for pooled estimate
<code>pv.rb</code>	robust bias corrected p-value for pooled estimate

ci.rb.l	left limit of robust bias corrected CI for pooled estimate
ci.rb.r	right limit of robust bias corrected CI for pooled estimate
hl	bandwidth to the left of the cutoff for pooled estimate
hr	bandwidth to the right of the cutoff for pooled estimate
Nhl	sample size within bandwidth to the left of the cutoff for pooled estimate
Nhr	sample size within bandwidth to the right of the cutoff for pooled estimate
B	vector of bias-corrected estimates
V	vector of robust variances of the estimates
Coefs	vector of conventional estimates
W	vector of weights for each cutoff-specific estimate
Nh	vector of sample sizes within bandwidth
CI	robust bias-corrected confidence intervals
H	matrix of bandwidths
Pv	vector of robust p-values
rdrobust.results	results from rdrobust for pooled estimate

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### References

Cattaneo, M.D., R. Titiunik and G. Vazquez-Bare. (2020). *Analysis of Regression Discontinuity Designs with Multiple Cutoffs or Multiple Scores*. *Stata Journal*, forthcoming.

### Examples

```
# Toy dataset
X <- runif(1000,0,100)
C <- c(rep(33,500),rep(66,500))
Y <- (1 + X + (X>=C))*(C==33)+(.5 + .5*X + .8*(X>=C))*(C==66) + rnorm(1000)
# rdmc with standard syntax
tmp <- rdmc(Y,X,C)
```

---

`rdmcpplot`*RD plots with multiple cutoffs.*

---

**Description**

`rdmcpplot()` RD plots with multiple cutoffs.

**Usage**

```
rdmcpplot(  
  Y,  
  X,  
  C,  
  nbinsmat = NULL,  
  binselectvec = NULL,  
  scalevec = NULL,  
  supportmat = NULL,  
  pvec = NULL,  
  hmat = NULL,  
  kernelvec = NULL,  
  weightsvec = NULL,  
  covsvec = NULL,  
  covs_evalvec = NULL,  
  covs_dropvec = NULL,  
  ci = NULL,  
  col_bins = NULL,  
  pch_bins = NULL,  
  col_poly = NULL,  
  lty_poly = NULL,  
  col_xline = NULL,  
  lty_xline = NULL,  
  nobins = FALSE,  
  nopoly = FALSE,  
  noxline = FALSE,  
  nodraw = FALSE  
)
```

**Arguments**

<code>Y</code>	outcome variable.
<code>X</code>	running variable.
<code>C</code>	cutoff variable.
<code>nbinsmat</code>	matrix of cutoff-specific number of bins. See <code>rdplot()</code> for details.
<code>binselectvec</code>	vector of cutoff-specific bins selection method. See <code>rdplot()</code> for details.
<code>scalevec</code>	vector of cutoff-specific scale factors. See <code>rdplot()</code> for details.

supportmat	matrix of cutoff-specific support conditions. See <code>rdplot()</code> for details..
pvec	vector of cutoff-specific polynomial orders. See <code>rdplot()</code> for details.
hmat	matrix of cutoff-specific bandwidths. See <code>rdplot()</code> for details.
kernelvec	vector of cutoff-specific kernels. See <code>rdplot()</code> for details.
weightsvec	vector of cutoff-specific weights. See <code>rdplot()</code> for details.
covsvec	vector of cutoff-specific covariates. See <code>rdplot()</code> for details.
covs_evalvec	vector indicating the evaluation point for additional covariates should be dropped at each cutoff. See <code>rdrobust()</code> for details.
covs_dropvec	vector indicating whether collinear covariates should be dropped at each cutoff. See <code>rdrobust()</code> for details.
ci	adds confidence intervals of the specified level to the plot. See <code>rdrobust()</code> for details.
col_bins	vector of colors for bins.
pch_bins	vector of characters (pch) type for bins.
col_poly	vector of colors for polynomial curves.
lty_poly	vector of lty for polynomial curves.
col_xline	vector of colors for vertical lines.
lty_xline	vector of lty for vertical lines.
nobins	omits bins plot.
nopoly	omits polynomial curve plot.
noxline	omits vertical lines indicating the cutoffs.
nodraw	omits plot.

**Value**

clist	list of cutoffs
cnum	number of cutoffs
X0	matrix of X values for control units
X1	matrix of X values for treated units
Yhat0	estimated polynomial for control units
Yhat1	estimated polynomial for treated units
Xmean	bin average of X values
Ymean	bin average for Y values
CI_l	lower end of confidence intervals
CI_r	upper end of confidence intervals

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## References

Cattaneo, M.D., R. Titiunik and G. Vazquez-Bare. (2020). *Analysis of Regression Discontinuity Designs with Multiple Cutoffs or Multiple Scores*. *Stata Journal*, forthcoming.

## Examples

```
# Toy dataset
X <- runif(1000,0,100)
C <- c(rep(33,500),rep(66,500))
Y <- (1 + X + (X>=C))*(C==33)+(.5 + .5*X + .8*(X>=C))*(C==66) + rnorm(1000)
# rdmcplot with standard syntax
tmp <- rdmcplot(Y,X,C)
```

---

rdms

*Analysis of RD designs with cumulative cutoffs or two running variables*

---

## Description

rdms() analyzes RD designs with cumulative cutoffs or two running variables.

## Usage

```
rdms(
  Y,
  X,
  C,
  X2 = NULL,
  zvar = NULL,
  C2 = NULL,
  rangemat = NULL,
  xnorm = NULL,
  fuzzy = NULL,
  derivvec = NULL,
  pooled_opt = NULL,
  pvec = NULL,
  qvec = NULL,
  hmat = NULL,
  bmat = NULL,
  rhovec = NULL,
  covsvec = NULL,
  covs_dropvec = NULL,
  kernelvec = NULL,
  weightsvec = NULL,
  bwselectvec = NULL,
```



```

scaleparvec = NULL,
scaleregulvec = NULL,
masspointsvec = NULL,
bwcheckvec = NULL,
bwrestrictvec = NULL,
stdvarsvec = NULL,
vcevec = NULL,
nnmatchvec = NULL,
cluster = NULL,
level = 95,
plot = FALSE
)

```

### Arguments

Y	outcome variable.
X	running variable.
C	vector of cutoffs.
X2	if specified, second running variable.
zvar	if X2 is specified, treatment indicator.
C2	if specified, second vector of cutoffs.
rangemat	matrix of cutoff-specific ranges for the running variable.
xnorm	normalized running variable to estimate pooled effect.
fuzzy	specifies a fuzzy design. See <code>rdrobust()</code> for details.
derivvec	vector of cutoff-specific order of derivatives. See <code>rdrobust()</code> for details.
pooled_opt	options to be passed to <code>rdrobust()</code> to calculate pooled estimand.
pvec	vector of cutoff-specific polynomial orders. See <code>rdrobust()</code> for details.
qvec	vector of cutoff-specific polynomial orders for bias estimation. See <code>rdrobust()</code> for details.
hmat	matrix of cutoff-specific bandwidths. See <code>rdrobust()</code> for details.
bmat	matrix of cutoff-specific bandwidths for bias estimation. See <code>rdrobust()</code> for details.
rhovec	vector of cutoff-specific values of rho. See <code>rdrobust()</code> for details.
covsvec	vector of cutoff-specific covariates. See <code>rdrobust()</code> for details.
covs_dropvec	vector indicating whether collinear covariates should be dropped at each cutoff. See <code>rdrobust()</code> for details.
kernelvec	vector of cutoff-specific kernels. See <code>rdrobust()</code> for details.
weightsvec	vector of cutoff-specific weights. See <code>rdrobust()</code> for details.
bwselectvec	vector of cutoff-specific bandwidth selection methods. See <code>rdrobust()</code> for details.
scaleparvec	vector of cutoff-specific scale parameters. See <code>rdrobust()</code> for details.

scaleregulvec	vector of cutoff-specific scale regularization parameters. See <code>rdrobust()</code> for details.
masspointsvec	vector indicating how to handle repeated values at each cutoff. See <code>rdrobust()</code> for details.
bwcheckvec	vector indicating the value of <code>bwcheck</code> at each cutoff. See <code>rdrobust()</code> for details.
bwrestrictvec	vector indicating whether computed bandwidths are restricted to the range or <code>runvar</code> at each cutoff. See <code>rdrobust()</code> for details.
stdvarsvec	vector indicating whether variables are standardized at each cutoff. See <code>rdrobust()</code> for details.
vcevec	vector of cutoff-specific variance-covariance estimation methods. See <code>rdrobust()</code> for details.
nnmatchvec	vector of cutoff-specific nearestneighbors for variance estimation. See <code>rdrobust()</code> for details.
cluster	cluster ID variable. See <code>rdrobust()</code> for details.
level	confidence level for confidence intervals. See <code>rdrobust()</code> for details.
plot	plots cutoff-specific and pooled estimates.

### Value

B	vector of bias-corrected coefficients
V	variance-covariance matrix of the estimators
Coefs	vector of conventional coefficients
Nh	vector of sample sizes within bandwidth at each cutoff
CI	bias corrected confidence intervals
H	bandwidth used at each cutoff
Pv	vector of robust p-values

### Author(s)

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### References

Cattaneo, M.D., R. Titiunik and G. Vazquez-Bare. (2020). *Analysis of Regression Discontinuity Designs with Multiple Cutoffs or Multiple Scores*. *Stata Journal*, forthcoming.

**Examples**

```
# Toy dataset: cumulative cutoffs
X <- runif(1000,0,100)
C <- c(33,66)
Y <- (1+X)*(X<C[1])+(0.8+0.8*X)*(X>=C[1]&X<C[2])+(1.2+1.2*X)*(X>=C[2]) + rnorm(1000)
# rmds: basic syntax
tmp <- rdms(Y,X,C)
```

# Index

`_PACKAGE` (`rdmulti-package`), 2

`rdmc`, 2, 3

`rdmcplot`, 2, 6

`rdms`, 2, 8

`rdmulti-package`, 2

`rdmulti_package` (`rdmulti-package`), 2