

Title

rdpermute — Permutation Test for RD and RK designs

Syntax

Description

rdpermute implements permutation tests for regression discontinuity (RD) or regression kink (RK) designs developed in <u>Ganong and Jäger (2018)</u>. The code calculates RD or RK estimates at a list of pre-specified placebo discontinuities or kinks and computes both asymptotic and randomization-based p-values. It tests for the sharp null hypothesis of no effect of the policy on the outcome and can accommodate several bandwidth choice, estimation, and inference procedures including rdrobust developed by Calonico, Cattaneo and Titiunik (2014a,b).

Options

Required

placebo_disconts defines the locations of placebo kinks. See Section 3.3 of Ganong and Jäger (2017) for a discussion on how to select placebo_disconts.

true_discont defines the integer at which the true kink or discontinuity is
 located. This value has to appear in the set placebo_disconts. If
 placebo_disconts is not generated manually, but automatically (for example
 by loops), it may happen that the binary representations of true_discont
 differs from its corresponding value in placebo_disconts. In this case it is
 possible to use the parameter position_true_discont instead. Unless
 rdpermute prints an error message, this modification is not necessary.

[⊥] Optional

position_true_discont(integer -1) Position of the expected discontinuity
 true_discont in the vector placebo_disconts. This parameter replaces
 true_discont in the case of binary representation errors.

deriv_discont(integer 1) specifies whether a regression discontinuity (0) or a regression kink (1) design is implemented. Default is the implementation of a regression kink design.

bw(string) defines the bandwidth choice method. fg_aic is used as default if no alternative is specified. The possible bandwidth choices are:
- cct: uses the procedures and functions in the rdbwselect package developed in Calonico, Cattaneo and Titiunik (2014a,b) as a subroutine. The parameters of rdbwselect can be altered with the parameter cct_bw_par.
- fg: Bandwidth choice as proposed by Fan and Gijbels (1996). Additional parameters (fg_bias_p_order, fg_density_p_order, fg_num_bins, fg_f0, and fg_bandwidth_scaling) can be used to alter the calculations.
- fg_aic: Fan and Gijbels (1996) bandwidth choice with automatic selection of fg_bias_p_order. Additional parameters (fg_density_p_order, fg_num_bins, fg_f0, and fg_bandwidth_scaling) can be used to alter the the calculations.
- manual: Manual choice of a constant bandwidth. The bandwidth can be set with the parameter manual_bw.

- linear/quad/cubic specifies that a linear, quadratic, or cubic model be used.
 rdpermute will calculate the p-values for each specified model. If neither
 linear, quad nor cubic are specified, rdpermute will calculate the p-values
 for all of them automatically.
- skip_install skips the installation of required packages. rdpermute will try to
 install all dependent packages automatically using stable, predefined
 versions. This may not always be possible or desired. skip_install
 suppresses the installation. Attention: Some subroutines and parts of our
 code may not work if the dependent packages are not installed.
- filename(string) Name for final .dta output. Only if filename is provided, will
 the data be saved.
- save_path(string) Path for final .dta output. If no save_path is provided, the
 results will automatically be placed in the working directory.
- dgp(string) adds a column with an index variable to .dta output
- bw_manual(real 1) is a numerical value for the method choice bw(manual). The value will be used as bandwidth for the computation of the p-values for all placebo_disconts.
- fg_bandwidth_scaling(numlist) specifies the model-dependent constants for the
 rule-of-thumb bandwidth calculation formula by Fan and Gijbels (1996). It
 may be necessary to use other values than our presets for linear, quadratic,
 and cubic regressions. fg_bandwidth_scaling[1] describes the prefactor,
 fg_bandwidth_scaling[2] the used exponents. The parameter
 fg_bandwidth_scaling has to contain values for both entries. All other
 entries in fg_bandwidth_scaling are omitted. A detailed description of the
 formula can be found in Fan and Gijbels (1996).
- fg_bias_porder(integer 4) specifies the maximal order of the polynomial used to
 estimate m^2 m^3 and m^4 for bandwidth choice bw(fg). This parameter is only
 necessary if the chosen method is fg and not bw(fg_aic). Warning: A high
 fg_bias_p_order may result in the instability of the used regressions,
 without indication by STATA. The choice bw="fg_aic" will automatically
 prevent such errors and is therefore set as default.
- <code>fg_f_0(real 0)</code> specifies the placement of bins for the choice bw(fg). If not set with <code>fg_num_bins</code>, 50 equally spaced bins on the range of the running variable will be used. We recommend to leave this parameter empty for an automatic estimation of <code>fg_f_0</code>. If you wish to use a manual value, you can define a numerical value in <code>fg_f_0</code>.
- **fg_density_porder(***integer 3***)** specifies the polynomial order for density estimation meaning that it chooses the maximal exponent of x^p for the estimation of bw(fg) by regression. Warning: A high $fg_density_p_order$ may lead to the same problems as in $fg_bias_p_order$. We recommend to use the preset value.
- **fg_num_bins**(integer 50) specifies the number of equally spaced bins for the choice bw(fg) and $fg_f_0(0)$ that is used to estimate fg_f_0 .
- cct_bw_par(string) specifies additional or alternative parameters for the
 subroutine rdbwselect for the choice bw(cct). All parameters of rdbwselect
 can be altered except for: y, x, p, q, deriv. To alter an option, define the
 intended values within html-Tags within the string. Example:
 cct_bw_par("<kernel>epa</kernel>
bwselect>cerrd</bwselect>").
- cct_reg_par(string) specifies additional or alternative parameters for the subroutine rdrobust for the choice bw(cct). All parameters of rdrobust can be altered except for: y, x, p, q, deriv, h. Altering is done as in cct_bw_par.
- silent generates less output while running.

Example: RD

Lee (2008) uses a regression discontinuity design with the vote share margin as the running variable to estimate the effect of incumbency on likelihood of winning the next election. This plot provides visual evidence that a Democrat winning an election discretely increases the probability a Democrat will win the next election.

To conduct the permutation test, we take the data as given and treat the discontinuity point as a random variable. We calculate the RD coefficient at a given set of placebo discontinuities, which are different values of the Democratic vote share. We compare the estimates at these placebos to the estimate at the true discontinuity. We specify the following options:

placebo_disconts(-50(1)49) means we use 100 placebo discontinuities from -50 through 49 true_discont(0) means the true discontinuity is at 0 deriv_discont(0) means we are looking for a change in the intercept linear means we are using a local linear regression

- use example_data/lee_election, clear
- rdpermute y x, placebo_disconts(-50(1)49) true_discont(0) deriv_discont(0)

The conclusions from the asymptotic and permutation tests coincide: under both methodologies we reject the null hypothesis that incumbency does not affect future election victory.

Example: RK with kink

Here we simulate data with an obvious kink at 0.

We specify the following options:

placebo_disconts(-.98(.02)1) means we use 100 placebo kinks from -.98 through true_discont(0) means the true discontinuity is at 0 linear means we are using a local linear regression
The default for deriv_discont(1) means we are looking for a change in the

- . use example_data/sim1, clear
- rdpermute y x, placebo_disconts(-.98(.02)1) true_discont(0) linear

The conclusions from the tests agree: both show highly significant slope changes at the policy kink point.

Example: RK without kink

In this example, we generate data with curvature around the kink point. In such cases, misspecification of the functional form can lead to spurious RKD coefficients.

We use the same specification as in the "RK with kink" example above.

- . use example_data/sim2, clear
 . rdpermute y x, placebo_disconts(-.98(.02)1) true_discont(0) linear

The conclusions from the tests disagree. The asymptotic test for linear RKD rejects the null hypothesis even though the underlying data-generating process features no discontinuous slope changes. In contrast, the permutation test correctly detects no kink.

rdpermute stores the following in e():

```
e(kink_beta_linear)
e(kink_se_linear)
e(bw_linear)
e(pval_linear)
e(kink_beta_quadratic)
e(kink_se_quadratic)
e(bw_quadratic)
e(pval_quadratic)
e(kink_beta_cubic)
e(kink_se_cubic)
e(bw_cubic)
e(pval_cubic)
```

With N as number of placebo kinks, matrices kink* and bw* are Nx1 with row i reflecting the parameter at the ith placebo kink.

Matrices pval* are 2 x 1. Row 1 is asymptotic p-value. Row 2 is randomization p-value.

Optional .dta output: collapses all of the above into a single file.

References

- Calonico, S., Cattaneo, M. D., and Titiunik, R. "Robust data-driven inference in the regression-discontinuity design." *Stata Journal* 14.4: 909-946 (2014a).
- Calonico, S., Cattaneo, M. D., and Titiunik, R. "Robust Nonparametric Confidence Intervals for Regression-Discontinuity Designs." *Econometrica*, 82(6):2295-2326 (2014b).
- Fan, J. and Gijbels, I. Local Polynomial Modelling and Its Applications, volume 66. Chapman and Hall (1996).
- Ganong, P. and Jäger, S. "A permutation test for the regression kink design". Journal of the American Statistical Association, 113(522), pp.494-504 (2018).
- Nichols, A. "rd 2.0: Revised Stata module for regression discontinuity estimation." (2011).

Online References and Dependent Code:

- <u>rdbwselect</u> Bandwidth Selection Procedures for Local Polynomial Regression Discontinuity Estimators
- <u>rdrobust</u> Local Polynomial Regression Discontinuity Estimation with Robust Bias-Corrected Confidence Intervals and Inference Procedures
- <u>rdplot</u> Data-Driven Regression Discontinuity Plots
- rd Regression discontinuity (RD) estimator
- All dependent packages will automatically download at the first run of rdpermute. See **skip_install** for suppressing the installation.

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Acknowledgments
Ari Anisfeld, Dennis Kubitza and Michael Schöner provided excellent research assistance to develop the Stata package.