Package 'HonestDiD'

July 14, 2024

Type Package

Title Robust Inference in Difference-in-Differences and Event Study
Designs

Version 0.2.6

Depends R (>= 3.6.0)

Imports stats, rlang, foreach (>= 1.4.7), matrixStats (>= 0.63.0),
CVXR (>= 0.99-6), latex2exp (>= 0.4.0), lpSolveAPI (>=
5.5.2.0-17), Matrix (>= 1.2-17), pracma (>= 2.2.5), purrr (>=
0.3.4), tibble (>= 1.3.4), dplyr (>= 0.7.4), ggplot2 (>=
2.2.1), Rglpk (>= 0.6-4), mvtnorm (>= 1.1-3), TruncatedNormal
(>= 1.0)

Suggests knitr, testthat, haven, lfe, rmarkdown

Description Provides functions to conduct robust inference in difference-in-
differences and event study designs by implementing the methods developed in Ram-
bachan & Roth (2023) <doi:10.1093/restud/rdad018>, ``A More Credible Approach to Paral-
lel Trends'' [Previously titled ``An Honest Approach...'']. Inference is conducted un-
der a weaker version of the parallel trends assumption. Uniformly valid confidence sets are con-
structed based upon conditional confidence sets, fixed-length confidence sets and hybridized con-
fidence sets.

Encoding UTF-8

LazyData true

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NeedsCompilation no

Author Ashesh Rambachan [aut, cph, cre],
Jonathan Roth [aut, cph]

Maintainer Ashesh Rambachan <ashesh.a.rambachan@gmail.com>

Contents

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basisVector   *Creates a standard basis vector.*

Description

Creates a basis vector of length size with a 1 in the index position.

Usage

```
# Create the index basis vector in R^size
basisVector(index, size)
```

Arguments

index	The index at which there should be a one. Default equals one.
size	The length of the vector. Default equals one.

Value

Returns a basis vector of length size with a 1 in the index position.

Examples

```
# Create the first basis vector in R^2
basisVector(index = 1, size = 2)
# Create the third basis vector in R^6
basisVector(index = 3, size = 6)
```

BCdata_EventStudy	*Event study estimates from baseline event study specification on profits in Benzarti & Carloni (2019). See discussion in Section 6.1 of Rambachan & Roth (2021).*

Description

This list contains the event study estimates from baseline event study specification on profits in Benzarti & Carloni (2019). See discussion in Section 6.1 of Rambachan & Roth (2021).

Format

A list, containing 7 objects:

Vector of estimated event study coefficients.

betasigma Estimated variance-covariance matrix.

timeVec Vector that contains the time periods associated with the event study coefficients.

referencePeriod Reference period that is normalized to zero.

prePeriodIndices Vector containing elements of timeVec that correspond to the pre-periods.

postPeriodIndices Vector containing elements of timeVec that correspond to the post-periods.

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computeConditionalCS_DeltaRM	
	Computes conditional and hybridized confidence set for $\Delta = \Delta\hat{\ }RM(Mbar)$.

Description

Computes the conditional confidence set and hybridized confidence set for $\Delta = \Delta^{RM}(Mbar)$.

Usage

```
computeConditionalCS_DeltaRM(betahat, sigma, numPrePeriods, numPostPeriods,
                l_vec = .basisVector(index = 1, size = numPostPeriods), Mbar = 0,
                    alpha = 0.05, hybrid_flag = "LF", hybrid_kappa = alpha/10,
                        returnLength = FALSE, postPeriodMomentsOnly = TRUE,
                        gridPoints=10^3, grid.ub = NA, grid.lb = NA, seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods.
numPostPeriods	Number of post-periods.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)
Mbar	Tuning parameter Mbar for $\Delta^{RM}(Mbar)$ that governs how different the maximal pre-period violation of parallel trends may be from the post-period differential trend. Default sets Mbar = 0. See Section 2.3.2 of Rambachan & Roth (2021) for more details.
alpha	Desired level of the confidence set. Default equals 0.05 (corresponding to 95% confidence interval)
hybrid_flag	Flag for whether user wishes to compute a hybridized confidence set. "ARP" specifies the conditional confidence set "LF" specifies the conditional least-favorable confidence set. The conditional FLCI hybrid confidence set is not available for $\Delta^{RM}(Mbar)$ since the FLCI is infinite length for this choice of Δ. See Section 3.3 and Section 5.3 of Rambachan & Roth (2021) for details. Default equals "LF".
hybrid_kappa	Desired first-stage size of hybridized confidence set. Only specify this value if the user wishes to compute a hybridized confidence set. Default equals alpha/10. If user specifies hybrid_flag = "ARP", set this value to NULL.
returnLength	Logical value. If TRUE, function only returns the length of the robust confidence. If FALSE, function returns dataframe that contains a grid of possible parameter values and a vector of zeros and ones associated with each value in the grid (one denotes that the grid value lies in the confidence set and zero denotes that the grid value does not fall within the confidence set.) Default equals FALSE.
postPeriodMomentsOnly	
	Logical value. If TRUE, function excludes moments for $\Delta^{RM}(Mbar)$ that only include pre-period coefficients. Default equals TRUE.
gridPoints	Number of grid points used in test inversion step. Default equals 1000.
grid.ub	Upper bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA and sets grid upper bound to equal the upper bound of the identified set under parallel trends plus 20*standard deviation of the point estimate, l_vec'betahat.
grid.lb	Lower bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA sets grid lower bound to equal the lower bound of the identified set under parallel trends minus 20*standard deviation of the point estimate, l_vec'betahat.
seed	Random seed for internal computations; included for reproducibility.

Value

If returnLength equals TRUE, function returns a scalar that equals the length of the confidence interval. If returnLength equals FALSE, function returns a dataframe with columns

grid	Vector of grid values used to construct the confidence interval by test inversion.
accept	Vector of zeros-ones associated with grid values, where one denotes a grid value that falls within the confidence interval and zero denotes a grid value that falls outside the confidence interval.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

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computeConditionalCS_DeltaRMB

Computes conditional and hybridized confidence set for $Delta = Delta\hat{} RMB(Mbar)$.

Description

Computes the conditional confidence set and hybridized confidence set for $Delta = Delta^{RMB}(Mbar)$. The set $Delta^{RMB}(Mbar)$ adds an additional sign restriction to $Delta^{RM}(Mbar)$ that restricts the sign of the bias to be either positive ($delta \geq 0$) or negative ($delta \leq 0$).

Usage

```
computeConditionalCS_DeltaRMB(betahat, sigma, numPrePeriods, numPostPeriods,
                    l_vec = .basisVector(index = 1,
                                         size = numPostPeriods),
                    Mbar = 0, alpha = 0.05, hybrid_flag = "LF",
                    hybrid_kappa = alpha/10, returnLength = FALSE,
                  biasDirection = "positive", postPeriodMomentsOnly = TRUE,
                    gridPoints=10^3, grid.ub = NA, grid.lb = NA, seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods.
numPostPeriods	Number of post-periods.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)

Mbar	Tuning parameter Mbar for $\Delta^{RM}(Mbar)$ that governs how different the maximal pre-period violation of parallel trends may be from the post-period differential trend. Default sets Mbar = 0. See Section 2.3.2 of Rambachan & Roth (2021) for more details.
alpha	Desired level of the confidence set. Default equals 0.05 (corresponding to 95% confidence interval)
hybrid_flag	Flag for whether user wishes to compute a hybridized confidence set. "ARP" specifies the conditional confidence set "LF" specifies the conditional least-favorable confidence set. The conditional FLCI hybrid confidence set is not available for $\Delta^{RMB}(Mbar)$ since the FLCI is infinite length for this choice of Δ. See Section 3.3 and Section 5.3 of Rambachan & Roth (2021) for details. Default equals "LF".
hybrid_kappa	Desired first-stage size of hybridized confidence set. Only specify this value if the user wishes to compute a hybridized confidence set. Default equals alpha/10. If user specifies hybrid_flag = "ARP", set this value to NULL.
returnLength	Logical value. If TRUE, function only returns the length of the robust confidence. If FALSE, function returns dataframe that contains a grid of possible parameter values and a vector of zeros and ones associated with each value in the grid (one denotes that the grid value lies in the confidence set and zero denotes that the grid value does not fall within the confidence set.) Default equals FALSE.
biasDirection	Specifies direction of bias restriction. If "positive", bias is restricted to be positive, $\delta \geq 0$. If "negative", bias is restricted to be negative, $\delta \leq 0$. Default equals "positive".
postPeriodMomentsOnly	
	Logical value. If TRUE, function excludes moments for $\Delta^{RMB}(Mbar)$ that only include pre-period coefficients. Default equals TRUE.
gridPoints	Number of grid points used in test inversion step. Default equals 1000.
grid.ub	Upper bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA and sets grid upper bound to equal the upper bound of the identified set under parallel trends plus 20*standard deviation of the point estimate, l_vec'betahat.
grid.lb	Lower bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA sets grid lower bound to equal the lower bound of the identified set under parallel trends minus 20*standard deviation of the point estimate, l_vec'betahat.
seed	Random seed for internal computations; included for reproducibility.

Value

If returnLength equals TRUE, function returns a scalar that equals the length of the confidence interval. If returnLength equals FALSE, function returns a dataframe with columns

grid	Vector of grid values used to construct the confidence interval by test inversion.
accept	Vector of zeros-ones associated with grid values, where one denotes a grid value that falls within the confidence interval and zero denotes a grid value that falls outside the confidence interval.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

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computeConditionalCS_DeltaRMM

Computes conditional and hybridized confidence set for $\Delta = \Delta \hat{} RMM(Mbar)$.

Description

Computes the conditional confidence set and hybridized confidence set for $\Delta = \Delta^{RMM}(Mbar)$. The set $\Delta^{RMM}(Mbar)$ adds an additional shape restriction to $\Delta^{RM}(Mbar)$ that restricts the underlying trend to be monotone. It may either be increasing ($\delta_t \geq \delta_{t-1}$) or decreasing ($\delta_t \leq \delta_{t-1}$).

Usage

```
computeConditionalCS_DeltaRMM(betahat, sigma, numPrePeriods, numPostPeriods,
                    l_vec = .basisVector(index = 1,
                                          size = numPostPeriods),
                                          Mbar = 0,
                alpha = 0.05, hybrid_flag = "LF", hybrid_kappa = alpha/10,
                    returnLength = FALSE, postPeriodMomentsOnly = TRUE,
                    monotonicityDirection = "increasing",
                    gridPoints=10^3, grid.ub = NA, grid.lb = NA, seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods.
numPostPeriods	Number of post-periods.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)
Mbar	Tuning parameter Mbar for $\Delta^{RM}(Mbar)$ that governs how different the maximal pre-period violation of parallel trends may be from the post-period differential trend. Default sets Mbar = 0. See Section 2.3.2 of Rambachan & Roth (2021) for more details.
alpha	Desired level of the confidence set. Default equals 0.05 (corresponding to 95% confidence interval)

hybrid_flag   Flag for whether user wishes to compute a hybridized confidence set. "ARP" specifies the conditional confidence set "LF" specifies the conditional least-favorable confidence set. The conditional FLCI hybrid confidence set is not available for $\Delta^{RM}(Mbar)$ since the FLCI is infinite length for this choice of Δ. See Section 3.3 and Section 5.3 of Rambachan & Roth (2021) for details. Default equals "LF".

hybrid_kappa   Desired first-stage size of hybridized confidence set. Only specify this value if the user wishes to compute a hybridized confidence set. Default equals alpha/10. If user specifies hybrid_flag = "ARP", set this value to NULL.

returnLength   Logical value. If TRUE, function only returns the length of the robust confidence. If FALSE, function returns dataframe that contains a grid of possible parameter values and a vector of zeros and ones associated with each value in the grid (one denotes that the grid value lies in the confidence set and zero denotes that the grid value does not fall within the confidence set.) Default equals FALSE.

postPeriodMomentsOnly
                    Logical value. If TRUE, function excludes moments for $\Delta^{RM}(Mbar)$ that only include pre-period coefficients. Default equals TRUE.

monotonicityDirection
                    Specifies direction of monotonicity restriction. If "increasing", underlying trend specified to be increasing, $\delta_t \geq \delta_{t-1}$. If "decreasing", underlying trend specified to be decreasing $\delta_t \leq \delta_{t-1}$. Default equals "increasing."

gridPoints   Number of grid points used in test inversion step. Default equals 1000.

grid.ub   Upper bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA and sets grid upper bound to equal the upper bound of the identified set under parallel trends plus 20*standard deviation of the point estimate, l_vec'betahat.

grid.lb   Lower bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA sets grid lower bound to equal the lower bound of the identified set under parallel trends minus 20*standard deviation of the point estimate, l_vec'betahat.

seed   Random seed for internal computations; included for reproducibility.

Value

If returnLength equals TRUE, function returns a scalar that equals the length of the confidence interval. If returnLength equals FALSE, function returns a dataframe with columns

grid   Vector of grid values used to construct the confidence interval by test inversion.

accept   Vector of zeros-ones associated with grid values, where one denotes a grid value that falls within the confidence interval and zero denotes a grid value that falls outside the confidence interval.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

---

computeConditionalCS_DeltaSD

Computes conditional and hybridized confidence set for $\Delta = \Delta\hat{}SD(M)$.

Description

Computes the conditional confidence set and hybridized confidence set for $\Delta = \Delta^{SD}(M)$.

Usage

```
computeConditionalCS_DeltaSD(betahat, sigma, numPrePeriods, numPostPeriods,
                    l_vec = .basisVector(index = 1, size = numPostPeriods),
                        M = 0, alpha = 0.05, hybrid_flag = "FLCI",
                        hybrid_kappa = alpha/10, returnLength = FALSE,
                        postPeriodMomentsOnly = TRUE,
                    gridPoints =10^3, grid.ub = NA, grid.lb = NA, seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods.
numPostPeriods	Number of post-periods.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)
M	Tuning parameter for $\Delta^{SD}(M)$ that governs the degree of non-linearity allowed in the violation of parallel trends. Default equals 0
alpha	Desired size of the confidence set. Default equals 0.05 (corresponding to 95% confidence interval)
hybrid_flag	Flag for whether user wishes to compute a hybridized confidence set. "ARP" specifies the conditional confidence set, "FLCI" specifies the conditional FLCI confidence set and "LF" specifies the conditional least-favorable confidence set. Default equals "FLCI".
hybrid_kappa	Desired first-stage size of hybridized confidence set. Only specify this value if the user wishes to compute a hybridized confidence set. Default equals alpha/10. If user specifies hybrid_flag = "ARP", set this value to NULL.
returnLength	Logical value. If TRUE, function only returns the length of the robust confidence. If FALSE, function returns dataframe that contains a grid of possible parameter values and a vector of zeros and ones associated with each value in the grid (one denotes that the grid value lies in the confidence set and zero denotes that the grid value does not fall within the confidence set. Default equals FALSE.)

postPeriodMomentsOnly

>   Logical value. If TRUE, function excludes moments for $\Delta^{SD}(M)$ that only include pre-period coefficients. Default equals TRUE.

gridPoints   Number of grid points used in test inversion step. Default equals 1000.

grid.ub   Upper bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA and sets grid upper bound to equal the upper bound of the identified set under parallel trends plus 20*standard deviation of the point estimate, l_vec'betahat.

grid.lb   Lower bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA sets grid lower bound to equal the lower bound of the identified set under parallel trends minus 20*standard deviation of the point estimate, l_vec'betahat.

seed   Random seed for internal computations; included for reproducibility.

Value

If returnLength equals TRUE, function returns a scalar that equals the length of the confidence interval. If returnLength equals FALSE, function returns a dataframe with columns

grid   Vector of grid values used to construct the confidence interval by test inversion.

accept   Vector of zeros-ones associated with grid values, where one denotes a grid value that falls within the confidence interval and zero denotes a grid value that falls outside the confidence interval.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

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computeConditionalCS_DeltaSDB

>   *Computes conditional and hybridized confidence set for* $\Delta = \Delta\hat{\ } SDB(M)$.

Description

Computes the conditional confidence set and hybridized confidence set for $\Delta = \Delta^{SDB}(M)$. The set $\Delta^{SDB}(M)$ adds an additional sign restriction to $\Delta^{SD}(M)$ that restricts the sign of the bias to be either positive ($\delta \geq 0$) or negative ($\delta \leq 0$).

Usage

```
computeConditionalCS_DeltaSDB(betahat, sigma, numPrePeriods, numPostPeriods,
                    M = 0, l_vec = .basisVector(index = 1, size=numPostPeriods),
                    alpha = 0.05, hybrid_flag = "FLCI", hybrid_kappa = alpha/10,
                            returnLength = FALSE, biasDirection = "positive",
                            postPeriodMomentsOnly = TRUE,
                    gridPoints = 10^3, grid.lb = NA, grid.ub = NA, seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods.
numPostPeriods	Number of post-periods.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, $(1, 0, ..., 0)$
M	Tuning parameter for $\Delta^{SD}(M)$ that governs the degree of non-linearity allowed in the violation of parallel trends. Default equals 0
alpha	Desired size of the confidence set. Default equals 0.05 (corresponding to 95% confidence interval)
hybrid_flag	Flag for whether user wishes to compute a hybridized confidence set. "ARP" specifies the conditional confidence set, "FLCI" specifies the conditional FLCI confidence set and "LF" specifies the conditional least-favorable confidence set. Default equals "FLCI".
hybrid_kappa	Desired first-stage size of hybridized confidence set. Only specify this value if the user wishes to compute a hybridized confidence set. Default equals alpha/10. If user specifies hybrid_flag = "ARP", set this value to NULL.
returnLength	Logical value. If TRUE, function only returns the length of the robust confidence. If FALSE, function returns dataframe that contains a grid of possible parameter values and a vector of zeros and ones associated with each value in the grid (one denotes that the grid value lies in the confidence set and zero denotes that the grid value does not fall within the confidence set.) Default equals FALSE.
biasDirection	Specifies direction of bias restriction. If "positive", bias is restricted to be positive, $\delta \geq 0$. If "negative", bias is restricted to be negative, $\delta \leq 0$. Default equals "positive".
postPeriodMomentsOnly	
	Logical value. If TRUE, function excludes moments for $\Delta^{SD}(M)$ that only include pre-period coefficients. Default equals TRUE.
gridPoints	Number of grid points used in test inversion step. Default equals 1000.
grid.ub	Upper bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA and sets grid upper bound to equal the upper bound of the identified set under parallel trends plus 20*standard deviation of the point estimate, l_vec'betahat.

grid.lb   Lower bound of grid for test inversion. The user should only specify this if she
                 wishes to manually specify the upper bound of the grid. Default equals NA sets
                 grid lower bound to equal the lower bound of the identified set under parallel
                 trends minus 20*standard deviation of the point estimate, l_vec'betahat.

seed   Random seed for internal computations; included for reproducibility.

Value

If returnLength equals TRUE, function returns a scalar that equals the length of the confidence
interval. If returnLength equals FALSE, function returns a dataframe with columns

grid   Vector of grid values used to construct the confidence interval by test inversion.

accept   Vector of zeros-ones associated with grid values, where one denotes a grid value
                 that falls within the confidence interval and zero denotes a grid value that falls
                 outside the confidence interval.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

---

computeConditionalCS_DeltaSDM

Computes conditional and hybridized confidence set for $\Delta = \Delta\hat{\;}SDM(M)$.

Description

Computes the conditional confidence set and hybridized confidence set for $\Delta = \Delta^{SDM}(M)$. The
set $\Delta^{SDB}(M)$ adds an additional shape restriction to $\Delta^{SD}(M)$ that restricts the underlying trend
to be monotone. It may either be increasing ($\delta_t \geq \delta_{t-1}$) or decreasing ($\delta_t \leq \delta_{t-1}$).

Usage

```
computeConditionalCS_DeltaSDM(betahat, sigma, numPrePeriods, numPostPeriods,
                    M = 0, l_vec = .basisVector(index = 1, size=numPostPeriods),
                            alpha = 0.05, monotonicityDirection = "increasing",
                              hybrid_flag = "FLCI", hybrid_kappa = alpha/10,
                            returnLength = FALSE, postPeriodMomentsOnly = TRUE,
                        gridPoints = 10^3, grid.lb = NA, grid.ub = NA, seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods.
numPostPeriods	Number of post-periods.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)
M	Tuning parameter for $\Delta^{SD}(M)$ that governs the degree of non-linearity allowed in the violation of parallel trends. Default equals 0
alpha	Desired size of the confidence set. Default equals 0.05 (corresponding to 95% confidence interval)
hybrid_flag	Flag for whether user wishes to compute a hybridized confidence set. "ARP" specifies the conditional confidence set, "FLCI" specifies the conditional FLCI confidence set and "LF" specifies the conditional least-favorable confidence set. Default equals "FLCI".
hybrid_kappa	Desired first-stage size of hybridized confidence set. Only specify this value if the user wishes to compute a hybridized confidence set. Default equals alpha/10. If user specifies hybrid_flag = "ARP", set this value to NULL.
returnLength	Logical value. If TRUE, function only returns the length of the robust confidence. If FALSE, function returns dataframe that contains a grid of possible parameter values and a vector of zeros and ones associated with each value in the grid (one denotes that the grid value lies in the confidence set and zero denotes that the grid value does not fall within the confidence set.) Default equals FALSE.
monotonicityDirection	
	Specifies direction of monotonicity restriction. If "increasing", underlying trend specified to be increasing, $\delta_t \geq \delta_{t-1}$. If "decreasing", underlying trend specified to be decreasing $\delta_t \leq \delta_{t-1}$. Default equals "increasing."
postPeriodMomentsOnly	
	Logical value. If TRUE, function excludes moments for $\Delta^{SD}(M)$ that only include pre-period coefficients. Default equals TRUE.
gridPoints	Number of grid points used in test inversion step. Default equals 1000.
grid.ub	Upper bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA and sets grid upper bound to equal the upper bound of the identified set under parallel trends plus 20*standard deviation of the point estimate, l_vec'betahat.
grid.lb	Lower bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA sets grid lower bound to equal the lower bound of the identified set under parallel trends minus 20*standard deviation of the point estimate, l_vec'betahat.
seed	Random seed for internal computations; included for reproducibility.

Value

If returnLength equals TRUE, function returns a scalar that equals the length of the confidence interval. If returnLength equals FALSE, function returns a dataframe with columns

`grid`	Vector of grid values used to construct the confidence interval by test inversion.
`accept`	Vector of zeros-ones associated with grid values, where one denotes a grid value that falls within the confidence interval and zero denotes a grid value that falls outside the confidence interval.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

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computeConditionalCS_DeltaSDRM

Computes conditional and hybridized confidence set for $\Delta = \hat{\Delta}SDRM(Mbar)$.

Description

Computes the conditional confidence set and hybridized confidence set for $\Delta = \Delta^{SDRM}(Mbar)$.

Usage

```
computeConditionalCS_DeltaSDRM(betahat, sigma, numPrePeriods, numPostPeriods,
                 l_vec = .basisVector(index = 1, size = numPostPeriods), Mbar = 0,
                     alpha = 0.05, hybrid_flag = "LF", hybrid_kappa = alpha/10,
                         returnLength = FALSE, postPeriodMomentsOnly = TRUE,
                         gridPoints=10^3, grid.ub = NA, grid.lb = NA, seed = 0)
```

Arguments

`betahat`	Vector of estimated event study coefficients.
`sigma`	Covariance matrix of event study coefficients.
`numPrePeriods`	Number of pre-periods. For this function, `numPrePeriods` must be greater than one. See details for further explanation.
`numPostPeriods`	Number of post-periods.
`l_vec`	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)

Mbar	Tuning parameter Mbar for $\Delta^{SDRM}(Mbar)$ that governs how different the maximal pre-period deviation from a linear trend may be from the maximal deviation from a linear trend in the post-treatment period the post-treatment period. Default sets Mbar = 0. See Section 2.3.2 of Rambachan & Roth (2021) for more details.
alpha	Desired level of the confidence set. Default equals 0.05 (corresponding to 95% confidence interval)
hybrid_flag	Flag for whether user wishes to compute a hybridized confidence set. "ARP" specifies the conditional confidence set "LF" specifies the conditional least-favorable confidence set. The conditional FLCI hybrid confidence set is not available for $\Delta^{SDRM}(Mbar)$ since the FLCI is infinite length for this choice of Δ. See Section 3.3 and Section 5.3 of Rambachan & Roth (2021) for details. Default equals "LF".
hybrid_kappa	Desired first-stage size of hybridized confidence set. Only specify this value if the user wishes to compute a hybridized confidence set. Default equals alpha/10. If user specifies hybrid_flag = "ARP", set this value to NULL.
returnLength	Logical value. If TRUE, function only returns the length of the robust confidence. If FALSE, function returns dataframe that contains a grid of possible parameter values and a vector of zeros and ones associated with each value in the grid (one denotes that the grid value lies in the confidence set and zero denotes that the grid value does not fall within the confidence set.) Default equals FALSE.
postPeriodMomentsOnly	
	Logical value. If TRUE, function excludes moments for $\Delta^{SDRM}(Mbar)$ that only include pre-period coefficients. Default equals TRUE.
gridPoints	Number of grid points used in test inversion step. Default equals 1000.
grid.ub	Upper bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA and sets grid upper bound to equal the upper bound of the identified set under parallel trends plus 20*standard deviation of the point estimate, l_vec'betahat.
grid.lb	Lower bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA sets grid lower bound to equal the lower bound of the identified set under parallel trends minus 20*standard deviation of the point estimate, l_vec'betahat.
seed	Random seed for internal computations; included for reproducibility.

Details

For the choice Δ^{SDRM}, numPrePeriods must be greater than one. As discussed in Section 2.3.2 of Rambachan & Roth (2021), Δ^{SDRM} uses observed non-linearities in the pre-treatment difference in trends to bound the possible non-linearities in the post-treatment difference in trends. This is only possible if there are multiple pre-treatment periods (i.e., numPrePeriods > 1).

Value

If returnLength equals TRUE, function returns a scalar that equals the length of the confidence interval. If returnLength equals FALSE, function returns a dataframe with columns

grid	Vector of grid values used to construct the confidence interval by test inversion.
accept	Vector of zeros-ones associated with grid values, where one denotes a grid value that falls within the confidence interval and zero denotes a grid value that falls outside the confidence interval.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

---

computeConditionalCS_DeltaSDRMB

Computes conditional and hybridized confidence set for $\Delta = \Delta\hat{}SDRMB(Mbar)$.

Description

Computes the conditional confidence set and hybridized confidence set for $\Delta = \Delta^{SDRMB}(Mbar)$. The set $\Delta^{SDRMB}(Mbar)$ adds an additional sign restriction to $\Delta^{SDRM}(Mbar)$ that restricts the sign of the bias to be either positive ($\delta \geq 0$) or negative ($\delta \leq 0$).

Usage

```
computeConditionalCS_DeltaSDRMB(betahat, sigma, numPrePeriods, numPostPeriods,
                    l_vec = .basisVector(index = 1, size = numPostPeriods),
                          Mbar = 0, alpha = 0.05, hybrid_flag = "LF",
                          hybrid_kappa = alpha/10, returnLength = FALSE,
                   postPeriodMomentsOnly = TRUE, biasDirection = "positive",
                       gridPoints=10^3, grid.ub = NA, grid.lb = NA, seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods. For this function, numPrePeriods must be greater than one. See details for further explanation.
numPostPeriods	Number of post-periods.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)
Mbar	Tuning parameter Mbar for $\Delta^{SDRM}(Mbar)$ that governs how different the maximal pre-period deviation from a linear trend may be from the maximal deviation from a linear trend in the post-treatment period the post-treatment period. Default sets Mbar = 0. See Section 2.3.2 of Rambachan & Roth (2021) for more details.

alpha	Desired level of the confidence set. Default equals 0.05 (corresponding to 95% confidence interval)
hybrid_flag	Flag for whether user wishes to compute a hybridized confidence set. "ARP" specifies the conditional confidence set "LF" specifies the conditional least-favorable confidence set. The conditional FLCI hybrid confidence set is not available for $\Delta^{SDRMB}(Mbar)$ since the FLCI is infinite length for this choice of Δ. See Section 3.3 and Section 5.3 of Rambachan & Roth (2021) for details. Default equals "LF".
hybrid_kappa	Desired first-stage size of hybridized confidence set. Only specify this value if the user wishes to compute a hybridized confidence set. Default equals alpha/10. If user specifies hybrid_flag = "ARP", set this value to NULL.
returnLength	Logical value. If TRUE, function only returns the length of the robust confidence. If FALSE, function returns dataframe that contains a grid of possible parameter values and a vector of zeros and ones associated with each value in the grid (one denotes that the grid value lies in the confidence set and zero denotes that the grid value does not fall within the confidence set.) Default equals FALSE.
biasDirection	Specifies direction of bias restriction. If "positive", bias is restricted to be positive, $\delta \geq 0$. If "negative", bias is restricted to be negative, $\delta \leq 0$. Default equals "positive".
postPeriodMomentsOnly	
	Logical value. If TRUE, function excludes moments for $\Delta^{SDRMB}(Mbar)$ that only include pre-period coefficients. Default equals TRUE.
gridPoints	Number of grid points used in test inversion step. Default equals 1000.
grid.ub	Upper bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA and sets grid upper bound to equal the upper bound of the identified set under parallel trends plus 20*standard deviation of the point estimate, l_vec'betahat.
grid.lb	Lower bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA sets grid lower bound to equal the lower bound of the identified set under parallel trends minus 20*standard deviation of the point estimate, l_vec'betahat.
seed	Random seed for internal computations; included for reproducibility.

Details

The choice Δ^{SDRMB} adds an additional sign restriction to $\Delta^{SDRM}(Mbar)$ that restricts the sign of the bias to be either positive ($\delta \geq 0$) or negative ($\delta \leq 0$). For this choice Δ^{SDRMB}, numPrePeriods must be greater than one. As discussed in Section 2.3.2 of Rambachan & Roth (2021), Δ^{SDRM} uses observed non-linearities in the pre-treatment difference in trends to bound the possible non-linearities in the post-treatment difference in trends. This is only possible if there are multiple pre-treatment periods (i.e., numPrePeriods > 1).

Value

If returnLength equals TRUE, function returns a scalar that equals the length of the confidence interval. If returnLength equals FALSE, function returns a dataframe with columns

grid	Vector of grid values used to construct the confidence interval by test inversion.
accept	Vector of zeros-ones associated with grid values, where one denotes a grid value that falls within the confidence interval and zero denotes a grid value that falls outside the confidence interval.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

---

computeConditionalCS_DeltaSDRMM

> *Computes conditional and hybridized confidence set for* $\Delta = \Delta\hat{\ }SDRMM(Mbar)$.

Description

Computes the conditional confidence set and hybridized confidence set for $\Delta = \Delta^{SDRMM}(Mbar)$. The set $\Delta^{SDRMM}(Mbar)$ adds an additional shape restriction to $\Delta^{SDRM}(Mbar)$ that restricts the underlying trend to be monotone. It may either be increasing ($\delta_t \geq \delta_{t-1}$) or decreasing ($\delta_t \leq \delta_{t-1}$).

Usage

```
computeConditionalCS_DeltaSDRMM(betahat, sigma, numPrePeriods, numPostPeriods,
                    l_vec = .basisVector(index = 1, size = numPostPeriods),
                    Mbar = 0, alpha = 0.05, hybrid_flag = "LF",
                    hybrid_kappa = alpha/10, returnLength = FALSE,
                    postPeriodMomentsOnly = TRUE,
                    monotonicityDirection = "increasing",
                    gridPoints=10^3, grid.ub = NA, grid.lb = NA, seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods. For this function, numPrePeriods must be greater than one. See details for further explanation.
numPostPeriods	Number of post-periods.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)

Mbar	Tuning parameter Mbar for $\Delta^{SDRM}(Mbar)$ that governs how different the maximal pre-period deviation from a linear trend may be from the maximal deviation from a linear trend in the post-treatment period the post-treatment period. Default sets Mbar = 0. See Section 2.3.2 of Rambachan & Roth (2021) for more details.
alpha	Desired level of the confidence set. Default equals 0.05 (corresponding to 95% confidence interval)
hybrid_flag	Flag for whether user wishes to compute a hybridized confidence set. "ARP" specifies the conditional confidence set "LF" specifies the conditional least-favorable confidence set. The conditional FLCI hybrid confidence set is not available for $\Delta^{SDRM}(Mbar)$ since the FLCI is infinite length for this choice of Δ. See Section 3.3 and Section 5.3 of Rambachan & Roth (2021) for details. Default equals "LF".
hybrid_kappa	Desired first-stage size of hybridized confidence set. Only specify this value if the user wishes to compute a hybridized confidence set. Default equals alpha/10. If user specifies hybrid_flag = "ARP", set this value to NULL.
returnLength	Logical value. If TRUE, function only returns the length of the robust confidence. If FALSE, function returns dataframe that contains a grid of possible parameter values and a vector of zeros and ones associated with each value in the grid (one denotes that the grid value lies in the confidence set and zero denotes that the grid value does not fall within the confidence set.) Default equals FALSE.
postPeriodMomentsOnly	
	Logical value. If TRUE, function excludes moments for $\Delta^{SDRM}(Mbar)$ that only include pre-period coefficients. Default equals TRUE.
monotonicityDirection	
	Specifies direction of monotonicity restriction. If "increasing", underlying trend specified to be increasing, $\delta_t \geq \delta_{t-1}$. If "decreasing", underlying trend specified to be decreasing $\delta_t \leq \delta_{t-1}$. Default equals "increasing."
gridPoints	Number of grid points used in test inversion step. Default equals 1000.
grid.ub	Upper bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA and sets grid upper bound to equal the upper bound of the identified set under parallel trends plus 20*standard deviation of the point estimate, l_vec'betahat.
grid.lb	Lower bound of grid for test inversion. The user should only specify this if she wishes to manually specify the upper bound of the grid. Default equals NA sets grid lower bound to equal the lower bound of the identified set under parallel trends minus 20*standard deviation of the point estimate, l_vec'betahat.
seed	Random seed for internal computations; included for reproducibility.

Details

The choice Δ^{SDRMM} adds an additional shape restriction to $\Delta^{SDRM}(Mbar)$ that restricts the underlying trend to be monotone. For this choice Δ^{SDRMM}, numPrePeriods must be greater than one. As discussed in Section 2.3.2 of Rambachan & Roth (2021), Δ^{SDRM} uses observed non-linearities in the pre-treatment difference in trends to bound the possible non-linearities in the

post-treatment difference in trends. This is only possible if there are multiple pre-treatment periods
(i.e., `numPrePeriods > 1`).

Value

If `returnLength` equals TRUE, function returns a scalar that equals the length of the confidence
interval. If `returnLength` equals FALSE, function returns a dataframe with columns

grid	Vector of grid values used to construct the confidence interval by test inversion.
accept	Vector of zeros-ones associated with grid values, where one denotes a grid value that falls within the confidence interval and zero denotes a grid value that falls outside the confidence interval.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

---

constructOriginalCS	*Constructs original confidence interval for parameter of interest, theta = l_vec'tau.*

Description

Constructs original confidence interval for parameter of interest, theta = l_vec'tau using the user-
specified estimated event study coefficients and variance-covariance matrix.

Usage

```
constructOriginalCS(betahat, sigma,
                    numPrePeriods, numPostPeriods,
                    l_vec = .basisVector(index = 1, size = numPostPeriods),
                    alpha = 0.05)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods.
numPostPeriods	Number of post-periods.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)
alpha	Desired size of the robust confidence sets. Default equals 0.05 (corresponding to 95% confidence interval)

Value

Returns a dataframe with columns

lb	Lower bound of original confidence set (based on asymptotic normality).
ub	Upper bound of original confidence set (based on asymptotic normality).
method	Method for constructing confidence set; set to "Original".
Delta	The set Delta that was specified; set to NA.

Examples

```
# Simple use case; for more detailed examples,
# see <https://github.com/asheshrambachan/HonestDiD#honestdid>
constructOriginalCS(betahat       = BCdata_EventStudy$betahat,
                    sigma         = BCdata_EventStudy$sigma,
                    numPrePeriods = length(BCdata_EventStudy$prePeriodIndices),
                    numPostPeriods = length(BCdata_EventStudy$postPeriodIndices),
                    alpha         = 0.05)
```

---

createEventStudyPlot   *Constructs event study plot*

Description

Constructs event study plot using the estimated event study coefficients and standard errors.

Usage

```
createEventStudyPlot(betahat, stdErrors = NULL, sigma = NULL,
                     numPrePeriods, numPostPeriods, alpha = 0.05, timeVec,
                     referencePeriod, useRelativeEventTime = FALSE)
```

Arguments

betahat	Vector of estimated event study coefficients.
stdErrors	Vector of standard errors associated with the estimated event study coefficients. Default equals NULL. Either stdErrors or sigma must be specified by the user. If stdErrors is not specified but sigma is, the stdErrors are set to equal the square root of the diagonal elements of sigma.
sigma	Covariance matrix of event study coefficients. Default equals NULL. Either stdErrors or sigma must be specified by the user.
numPrePeriods	Number of pre-periods.
numPostPeriods	Number of post-periods.
alpha	Desired size of confidence intervals. Default = 0.05.
timeVec	Vector that contains the time periods associated with the event study coefficients. This vector should not include the reference period that is normalized to zero.

referencePeriod
> Scalar that contains the time period associated with the reference period.

useRelativeEventTime
> Logical that specifies whether user would like the plot to be in relative event time (normalizes the reference period to be zero). Default equals FALSE.

Value

Returns ggplot object of the event study plot.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

Examples

```
# Simple use case; for more detailed examples,
# see <https://github.com/asheshrambachan/HonestDiD#honestdid>
createEventStudyPlot(betahat        = BCdata_EventStudy$betahat,
                     sigma          = BCdata_EventStudy$sigma,
                     numPrePeriods  = length(BCdata_EventStudy$prePeriodIndices),
                     numPostPeriods = length(BCdata_EventStudy$postPeriodIndices),
                     alpha          = 0.05,
                     timeVec        = BCdata_EventStudy$timeVec,
                     referencePeriod = BCdata_EventStudy$referencePeriod)
```

---

createSensitivityPlot *Constructs sensitivity plot for* $\Delta = \Delta\hat{\ }SD(M)$, $\Delta\hat{\ }SDB(M)$ *and* $\Delta\hat{\ }SDM(M)$

Description

This function constructs sensitivity plots that examine how the robust confidence sets change as the parameter M varies for $\Delta = \Delta^{SD}(M)$, $\Delta^{SDB}(M)$ and $\Delta^{SDM}(M)$. Similar plots are constructed in Section 6 of Rambachan & Roth (2021).

Usage

```
createSensitivityPlot(robustResults, originalResults,
                      rescaleFactor = 1, maxM = Inf, add_xAxis = TRUE)
```

Arguments

robustResults	Dataframe that contains the upper/lower bounds of robust confidence sets for each choice of M. Contains columns: method – Method of constructing robust confidence set (e.g., "FLCI"), lb – Lower bound of robust confidence set, ub – Upper bound of robust confidence set, M – M values associated with each robust confidence set.
originalResults	Dataframe that contains the original confidence set for the parameter of interest. Contains columns: method – Method of constructing confidence set (e.g., "Original"), lb – Lower bound of confidence set, ub – Upper bound of confidence set.
rescaleFactor	Scalar that is used to rescale the user specified choices of M and the upper/lower bounds of the confidence sets. Default equals one.
maxM	Scalar that specifies the maximum M value to plot in the sensitivity plot. Default equals infinity (no truncation).
add_xAxis	Logical specifying whether to plot the x-axis in the sensitivity plot. Default equals TRUE.

Value

Returns ggplot object of the sensitivity plot.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

Examples

```
# Simple use case; for more detailed examples,
# see <https://github.com/asheshrambachan/HonestDiD#honestdid>
robustResults <-
  createSensitivityResults(betahat        = BCdata_EventStudy$betahat,
                           sigma          = BCdata_EventStudy$sigma,
                           numPrePeriods  = length(BCdata_EventStudy$prePeriodIndices),
                           numPostPeriods = length(BCdata_EventStudy$postPeriodIndices),
                           alpha          = 0.05)
originalResults <-
  constructOriginalCS(betahat        = BCdata_EventStudy$betahat,
                      sigma          = BCdata_EventStudy$sigma,
                      numPrePeriods  = length(BCdata_EventStudy$prePeriodIndices),
                      numPostPeriods = length(BCdata_EventStudy$postPeriodIndices),
                      alpha          = 0.05)
createSensitivityPlot(robustResults, originalResults)
```

---

createSensitivityPlot_relativeMagnitudes

Constructs   sensitivity   plot   for Δ = $\Delta \hat{} RM(Mbar)$,
$\Delta \hat{} SDRM Mbar$ and their variants that incorporate additional
shape or sign restrictions.

Description

This function constructs sensitivity plots that examine how the robust confidence sets change as the parameter Mbar varies for $\Delta = \Delta^{RM}(Mbar)$, $\Delta^{SDRM}(Mbar)$ and their variants that incorporate additional shape or sign restrictions. Similar plots are constructed in Section 6 of Rambachan & Roth (2021).

Usage

```
createSensitivityPlot_relativeMagnitudes(robustResults, originalResults,
                                         rescaleFactor = 1, maxMbar = Inf,
                                         add_xAxis = TRUE)
```

Arguments

robustResults   Dataframe that contains the upper/lower bounds of robust confidence sets for each choice of Mbar. Contains columns: method – Method of constructing robust confidence set, lb – Lower bound of robust confidence set, ub – Upper bound of robust confidence set, Mbar – M values associated with each robust confidence set.

originalResults

Dataframe that contains the original confidence set for the parameter of interest. Contains columns: method – Method of constructing confidence set (e.g., "Original"), lb – Lower bound of confidence set, ub – Upper bound of confidence set.

rescaleFactor   Scalar that is used to rescale the user specified choices of M and the upper/lower bounds of the confidence sets. Default equals one.

maxMbar   Scalar that specifies the maximum Mbar value to plot in the sensitivity plot. Default equals infinity (no truncation).

add_xAxis   Logical specifying whether to plot the x-axis in the sensitivity plot. Default equals TRUE.

Value

Returns ggplot object of the sensitivity plot.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2019.

Examples

```
# Simple use case. For more detailed examples,
# see <https://github.com/asheshrambachan/HonestDiD#honestdid>
kwargs <- list(betahat       = BCdata_EventStudy$betahat,
               sigma         = BCdata_EventStudy$sigma,
               numPrePeriods  = length(BCdata_EventStudy$prePeriodIndices),
               numPostPeriods = length(BCdata_EventStudy$postPeriodIndices),
               alpha         = 0.05)
robustResults   <- do.call(createSensitivityResults_relativeMagnitudes, kwargs)
originalResults <- do.call(constructOriginalCS, kwargs)
createSensitivityPlot_relativeMagnitudes(robustResults, originalResults)
```

---

createSensitivityResults

Constructs robust confidence intervals for $\Delta = \Delta\hat{\ }SD(M)$, $\Delta\hat{\ }SDB(M)$ *and* $\Delta\hat{\ }SDM(M)$ *for vector of possible M values.*

Description

Constructs robust confidence intervals for a choice $\Delta = \Delta^{SD}(M)$, $\Delta^{SDB}(M)$ and $\Delta^{SDM}(M)$ for vector of possible M values. By default, the function constructs robust confidence intervals for $\Delta^{SD}(M)$.

Usage

```
createSensitivityResults(betahat, sigma,
                         numPrePeriods, numPostPeriods,
                         method = NULL,
                         Mvec = NULL,
                         l_vec = .basisVector(index = 1, size = numPostPeriods),
                         monotonicityDirection = NULL,
                         biasDirection = NULL,
                         alpha = 0.05,
                         parallel = FALSE,
                         seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods.
numPostPeriods	Number of post-periods.

method   String that specifies the choice of method for constructing robust confidence in-
                  tervals. This must be one of "FLCI", "Conditional", "C-F" (conditional FLCI hy-
                  brid), or "C-LF" (conditional least-favorable hybrid). Default equals NULL and
                  the function automatically sets method based on the recommendations in Ram-
                  bachan & Roth (2021) depending on the choice of Delta. If Delta = DeltaSD,
                  default selects the FLCI. If Delta = DeltaSDB or DeltaSDM, default delects the
                  conditional FLCI hybrid.

Mvec   Vector of M values for which the user wishes to construct robust confidence
                  intervals. If NULL, the function constructs a grid of length 10 that starts at M
                  = 0 and ends at M equal to the upper bound constructed from the pre-periods
                  using the function DeltaSD_upperBound_Mpre if number of pre-periods > 1 or
                  the standard deviation of the first pre-period coefficient if number of pre-periods
                  = 1. Default equals null.

l_vec   Vector of length numPostPeriods that describes the scalar parameter of interest,
                  theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)

biasDirection   This must be specified if the user wishes to add an additional bias restriction to
                  $\Delta^{SD}(M)$. If "positive", bias is restricted to be positive, $\delta \geq 0$. If "negative",
                  bias is restricted to be negative, $\delta \leq 0$. Default equals NULL.

monotonicityDirection
                  This must be specified if the user wishes to add an additional monotonicity re-
                  striction to $\Delta^{SD}(M)$. If "increasing", underlying trend specified to be increas-
                  ing, $\delta_t \geq \delta_{t-1}$. If "decreasing", underlying trend specified to be decreasing
                  $\delta_t \leq \delta_{t-1}$. Default equals NULL

alpha   Desired size of the robust confidence sets. Default equals 0.05 (corresponding
                  to 95% confidence interval)

parallel   Logical to indicate whether the user would like to construct the robust confi-
                  dence intervals in parallel. This uses the Foreach package and doParallel pack-
                  age. Default equals FALSE.

seed   Random seed for internal computations; included for reproducibility.

Value

Returns a dataframe with columns

lb   Lower bound of robust confidence sets.

ub   Upper bound of robust confidence sets.

method   Method for constructing robust confidence sets

Delta   The set Delta that was specified.

M   Values of M associated with each robust confidence set.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

Examples

```
# Simple use case; for more detailed examples,
# see <https://github.com/asheshrambachan/HonestDiD#honestdid>
createSensitivityResults(betahat        = BCdata_EventStudy$betahat,
                         sigma          = BCdata_EventStudy$sigma,
                         numPrePeriods  = length(BCdata_EventStudy$prePeriodIndices),
                         numPostPeriods = length(BCdata_EventStudy$postPeriodIndices),
                         alpha          = 0.05)
```

---

createSensitivityResults_relativeMagnitudes

> *Constructs robust confidence intervals for $\Delta = \Delta\hat{}RM(Mbar)$, $\Delta\hat{}SDRM(Mbar)$ and their variants that incorporate shape or sign restrictions for a vector of possible Mbar values.*

Description

Constructs robust confidence intervals for $\Delta = \Delta^{RM}(Mbar)$, $\Delta^{SDRM}(Mbar)$ and their variants that incorporate shape or sign restrictions for a vector of possible Mbar values. By default, the function constructs sensitivity results for $\Delta^{RM}(Mbar)$ and its variants. The confidence sets are constructed through test inversion.

Usage

```
createSensitivityResults_relativeMagnitudes(betahat, sigma,
                                            numPrePeriods, numPostPeriods,
                                   bound = "deviation from parallel trends",
                                         method = "C-LF",
                                         Mbarvec = NULL,
                                         l_vec = .basisVector(index = 1,
                                                     size = numPostPeriods),
                                         monotonicityDirection = NULL,
                                         biasDirection = NULL,
                                         alpha = 0.05,
                                         gridPoints = 10^3,
                                         grid.ub = NA,
                                         grid.lb = NA,
                                         parallel = FALSE,
                                         seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.

numPrePeriods	Number of pre-periods. If user selects bound = "deviation from linear trends" ($Delta^{SDRM}$ as base choice of Delta), then numPrePeriods must be greater than one. See details for further explanation.
numPostPeriods	Number of post-periods.
bound	String that specifies the base choice of Delta (to which additional sign and shape restrictions will be incorporated if specified by the user). This must be either "deviation from parallel trends" or "deviation from linear trend". If bound equals "deviation from parallel trends", then the function will select $\Delta^{RM}(Mbar)$ as the base choice of Δ. If bound equals "deviation from linear trends", then the function will select Δ^{SDRM} as the base choice of Δ. By default, this is set to "deviation from parallel trends". See Section 2.3.1 and 2.3.2 of Rambachan & Roth (2021) for a discussion of these choices of Δ.
method	String that specifies the choice of method for constructing robust confidence intervals. This must be either "Conditional", or "C-LF" (conditional least-favorable hybrid). Default equals "C-LF" and the function automatically sets method to be "C-LF" based on the recommendations in Rambachan & Roth (2021).
Mbarvec	Vector of Mbar values for which the user wishes to construct robust confidence intervals. If NULL, the function constructs a grid of length 10 that starts at Mbar = 0 and ends at Mbar = 2. Default equals null.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)
biasDirection	This must be specified if the user wishes to add an additional bias restriction to base choice of Delta. If "positive", bias is restricted to be positive, delta >= 0. If "negative", bias is restricted to be negative, delta <= 0. Default equals NULL.
monotonicityDirection	
	This must be specified if the user wishes to add an additional monotonicity restriction to base choice of Delta. If "increasing", underlying trend specified to be increasing, $\delta_t \geq \delta_{t-1}$. If "decreasing", underlying trend specified to be decreasing $\delta_t \leq \delta_{t-1}$. Default equals NULL.
alpha	Desired size of the robust confidence sets. Default equals 0.05 (corresponding to 95% confidence interval)
parallel	Logical to indicate whether the user would like to construct the robust confidence intervals in parallel. This uses the Foreach package and doParallel package. Default equals FALSE.
gridPoints	Number of grid points used for the underlying test inversion. Default equals 1000. User may wish to change the number of grid points for computational reasons.
grid.ub	Upper bound of grid used for underlying test inversion. Default sets grid.ub to be equal to twenty times the standard deviation of the estimated target parameter, l_vec * betahat. User may wish to change the upper bound of the grid to suit their application.
grid.lb	Lower bound of grid used for underlying test inversion. Default sets grid.lb to be equal to negative twenty times the standard deviation of the estimated target parameter, l_vec * betahat. User may wish to change the lower bound of the grid to suit their application.
seed	Random seed for internal computations; included for reproducibility.

Details

Note: If the user specifies bound = "deviation from linear trends", then numPrePeriods must be greater than one. By specifying bound = "deviation from linear trends", then the function selects Δ^{SDRM} as the base choice of Δ. As discussed in Section 2.3.2 of Rambachan & Roth (2021), Δ^{SDRM} uses observed non-linearities in the pre-treatment difference in trends to bound the possible non-linearities in the post-treatment difference in trends. This is only possible if there are multiple pre-treatment periods (i.e., numPrePeriods > 1).

Value

Returns a dataframe with columns

lb	Lower bound of robust confidence sets.
ub	Upper bound of robust confidence sets.
method	Method for constructing robust confidence sets
Delta	The set Delta that was specified.
M	Values of M associated with each robust confidence set.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

Examples

```
# Simple use case. For more detailed examples,
# see <https://github.com/asheshrambachan/HonestDiD#honestdid>
kwargs <- list(betahat       = BCdata_EventStudy$betahat,
               sigma         = BCdata_EventStudy$sigma,
               numPrePeriods  = length(BCdata_EventStudy$prePeriodIndices),
               numPostPeriods = length(BCdata_EventStudy$postPeriodIndices),
               alpha         = 0.05)
do.call(createSensitivityResults_relativeMagnitudes, kwargs)
```

DeltaSD_lowerBound_Mpre

Construct lower bound for M for $\Delta = \Delta\hat{\ }SD(M)$ based on observed pre-period coefficients.

Description

Constructs a lower bound for M using the observed pre-period coefficients. It constructs a one-sided confidence interval for the maximal second difference of the observed pre-period using the conditional test developed in Andrews, Roth & Pakes (2019). The number of pre-periods (not including the reference period) must be larger than or equal to two.

Usage

```
DeltaSD_lowerBound_Mpre(betahat, sigma, numPrePeriods,
                    alpha = 0.05, grid.ub = NA, gridPoints = 1000)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods. Must be larger than or equal to two.
alpha	Desired size of the one-sided confidence set. Default equals 0.05 (corresponding to 95% confidence interval)
grid.ub	Upper bound of grid of values of M that is used to construct the confidence interval by test inversion. Default equals NA and the upper bound of the grid is set equal to three times the maximum standard error of the observed pre-period event-study coefficients.
gridPoints	Number of points to include in the grid that is used to construct the confidence interval by test inversion. Default equals 1000 points.

Value

Returns a scalar that equals the lower bound of a one-sided confidence interval for the maximal second difference of the observed pre-period coefficients.

Author(s)

Ashesh Rambachan

References

Andrews, Isaiah, Jonathan Roth and Ariel Pakes. "Inference for Linear Conditional Moment Inequalities." 2019. Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

DeltaSD_upperBound_Mpre

Construct upper bound for M for $\Delta = \Delta\hat{}SD(M)$ based on observed pre-period coefficients.

Description

Constructs an upper bound for M using the observed pre-period event study coefficients. This is constructed using (1-alpha) level one-sided upper confidence intervala for the second differences of the observed pre-period event study coefficients. The number of pre-periods (not including the reference period) must be larger than or equal to two.

Usage

```
DeltaSD_upperBound_Mpre(betahat, sigma, numPrePeriods, alpha = 0.05)
```

Arguments

betahat   Vector of estimated event study coefficients.

sigma   Covariance matrix of event study coefficients.

numPrePeriods   Number of pre-periods. Must be larger than or equal to two.

alpha   Desired size of the one-sided confidence set. Default equals 0.05 (corresponding to 95% confidence interval)

Details

This function returns the maximum of the upper bounds of one-sided upper confidence intervals for the observed second differences of the pre-period event study coefficients.

Value

Returns a scalar that equals the maximum of the upper bounds of one-sided upper confidence intervals for the observed second differences of the pre-period event study coefficients.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

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findOptimalFLCI   *Constructs optimal fixed length confidence interval for* $\Delta =$
                          $\hat{\Delta}^{SD}(M).$

Description

Computes the optimal FLCI for the scalar parameter of interest under $\Delta = \Delta^{SD}(M)$.

Usage

```
findOptimalFLCI(betahat, sigma, M = 0,
                numPrePeriods, numPostPeriods,
                l_vec = .basisVector(index = 1, size = numPostPeriods),
                numPoints = 100, alpha = 0.05, seed = 0)
```

Arguments

betahat	Vector of estimated event study coefficients.
sigma	Covariance matrix of event study coefficients.
numPrePeriods	Number of pre-periods.
numPostPeriods	Number of post-periods.
l_vec	Vector of length numPostPeriods that describes the scalar parameter of interest, theta = l_vec'tau. Default equals to first basis vector, (1, 0, ..., 0)
M	Tuning parameter for $\Delta^{SD}(M)$ that governs the degree of non-linearity allowed in the violation of parallel trends. Default equals 0
numPoints	Number of possible values when optimizing the FLCI. Default equals 100.
alpha	Desired size of the FLCI. Default equals 0.05 (corresponding to 95% confidence interval)
seed	Random seed for internal computations; included for reproducibility.

Value

Returns a list containing items

FLCI	Vector containing lower and upper bounds of optimal FLCI.
optimalVec	Vector of length numPrePeriods + numPostPeriods that contains the vector of coefficients associated with the optimal FLCI.
optimalPrePeriodVec	
	Vector of length numPrePeriods that contains the vector of coefficients for the optimal FLCI that are associated with the pre-period event study coefficients.
optimalHalfLength	
	A scalar that equals the half-length of the optimal FLCI.
M	Value of M at which the FLCI was computed.
status	Status of optimization.

Author(s)

Ashesh Rambachan

References

Rambachan, Ashesh and Jonathan Roth. "An Honest Approach to Parallel Trends." 2021.

| LWdata_EventStudy | *Event study estimates from baseline female specification on employment in Lovenheim & Willen (2019). See discussion in Section 6.2 of Rambachan & Roth (2021).* |

Description

This list contains the event study estimates from the baseline female specification on employment in Lovenheim & Willen (2019). See discussion in Section 6.2 of Rambachan & Roth (2021).

Format

A list, containing 7 objects:

Vector of estimated event study coefficients.

betahanma Estimated variance-covariance matrix.

timeVec Vector that contains the time periods associated with the event study coefficients.

referencePeriod Reference period that is normalized to zero.

prePeriodIndices Vector containing elements of timeVec that correspond to the pre-periods.

postPeriodIndices Vector containing elements of timeVec that correspond to the post-periods.

stdErrors Vector of standard errors associated with estimated event study coefficients

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