

Package ‘formulaiv’

June 24, 2026

Title Sensitivity of Formula Instrument to Shock Design

Version 0.1.0

Description Functions to implement the formula instrument method in Borusyak and Hull (2023) <[doi:10.3982/ECTA19367](https://doi.org/10.3982/ECTA19367)> and examine its sensitivity to the assumed distributional of counterfactual shocks.

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URL <https://github.com/peizansheng/formulaiv>

BugReports <https://github.com/peizansheng/formulaiv/issues>

Encoding UTF-8

LazyData true

LazyDataCompression xz

RoxygenNote 7.3.3

Imports stats, lpSolve

Suggests testthat (>= 3.0.0), knitr, rmarkdown

Config/testthat/edition 3

Depends R (>= 3.5)

VignetteBuilder knitr

NeedsCompilation no

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Repository CRAN

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Contents

BH_precomputed_results	2
formulaiv	2
line	4
ma	5

Index	6
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 BH_precomputed_results

Precomputed BH (2023) Sensitivity Bounds

Description

A named list of four `formulaiv()` bound tables for the Borusyak and Hull (2023) China market-access application, used as the expected values in `tests/testthat/test-bh2023.R`. Each element is the `$beta` data frame returned by `formulaiv()` for one specification. Because they are produced by the package itself, that test is a self-regression check; regenerate the list with `source("data-raw/BH_precomputed_results.R")`.

Usage

```
BH_precomputed_results
```

Format

A named list of four data frames:

```
BH_sens_joint_cons_no_controls joint set, no controls, eps = seq(1, 20, 0.2)
```

```
BH_sens_joint_cons_with_controls joint set, with controls, eps = seq(1, 20, 0.2)
```

```
BH_sens_marginal_cons_no_controls marginal set, no controls, eps = seq(1, 2.5, 0.25)
```

```
BH_sens_marginal_cons_with_controls marginal set, with controls, eps = seq(1, 2.5, 0.25)
```

Each data frame has columns `eps`, `lb`, and `ub` (the sensitivity bounds).

 formulaiv

Sensitivity of formula instrument to shock design

Description

`formulaiv()` evaluates the sensitivity of formula instrument estimates to small or large deviations away from an assumed baseline distribution of shocks.

Usage

```
formulaiv(y, x, z, f, eps, cons, controls = NULL, denom_tol = 1e-08)
```

Arguments

y	outcome ($N \times 1$ vector)
x	endogenous regressor / treatment ($N \times 1$ vector)
z	formula instrument ($N \times 1$ vector)
f	counterfactual shock realizations, one scenario per column ($N \times S$ data frame or matrix)
eps	degree of sensitivity of interest ($M \times 1$ vector; a scalar is allowed), where eps corresponds to <ul style="list-style-type: none"> • κ for joint constraints • δ for marginal constraints
cons	constraint list specifying the sensitivity set. One of: <ul style="list-style-type: none"> • joint — <code>list(name = "joint", pbar = pbar)</code>, where pbar is the baseline distribution over the S scenarios ($S \times 1$ vector). • marginal — <code>list(name = "marginal", g = g, qbar = qbar)</code> or <code>list(name = "marginal", g = g, pbar = pbar)</code>, where <ul style="list-style-type: none"> – g is the shock realization matrix ($L \times S$ data frame or matrix) whose row marginals are constrained, and – the baseline marginals are supplied either directly as qbar ($L \times 1$ vector) or derived from a baseline joint distribution pbar ($S \times 1$ vector) via $\bar{q} = g \bar{p}$.
controls	control variables ($N \times J$ data frame or matrix, or NULL)
denom_tol	numeric tolerance below which the first-stage denominator is treated as zero when reading off its sign over the feasible set (default 1e-8). This is an internal numerical safeguard that rarely needs changing.

Value

A list of two data frames:

- beta — the sensitivity bounds, one row per eps (columns eps, lb, ub).
- p_opt — the optimal weights achieving each bound, in tidy long form (columns eps, scenario, lb, ub; MS rows).

Numerical conditioning

Each bound is the optimal value of a linear program solved with `lpSolve::lp()`, whose simplex routine is sensitive to the magnitude of the problem coefficients. Inputs on a very large scale — for example population- or weight-aggregated sums — can make the solver report a numerical failure (lpSolve status 5) instead of returning a bound. The estimate is invariant to multiplying y and x by a common positive constant, so when this happens it is enough to divide both y and x by a single scale factor that brings them to within a few orders of magnitude of 1: every bound (beta\$lb, beta\$ub) is unchanged. (Rescaling only one of y or x, or rescaling them by different factors, *does* change the estimate.)

Examples

```
# BH market-access data (bundled with the package)
y <- ma$emp_growth # outcome (N x 1)
x <- ma$dma0 # endogenous regressor (N x 1)
z <- x # formula instrument (N x 1)
f <- ma[, paste0("ma_nlink", 1:1999)] - ma$ma2007 # shock draws (N x S)
pbar <- rep(1 / 1999, 1999) # baseline weights (S x 1)

# Joint sensitivity set without controls, evaluated at eps = 1.5 and 2.
# Wrapped in \donttest{} because solving the linear-fractional programs over
# all S = 1999 shock draws takes longer than CRAN's 5s example budget.

formulaiv(
  y = y,
  x = x,
  z = z,
  f = f,
  eps = c(1.5, 2),
  cons = list(name = "joint", pbar = pbar)
)$beta
```

line

High Speed Railway (HSR) Data

Description

high speed railway (HSR) data from Borusyak and Hull (2023) replication file

Usage

line

Format

A data frame with 150 rows and 2022 columns. The package directly uses the following groups of columns:

- line characteristics used in the ML model: line_type_en, speed, computed_length, nlinks, year_approved, plan_type
- realized opening year: year_operate0
- simulated opening years: year_operate1 to year_operate1999

Source

<https://zenodo.org/records/8286785>

ma	<i>Market Access (MA) Data</i>
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Description

city-level data from Borusyak and Hull (2023) replication file

Usage

ma

Format

A data frame with 275 rows and 2013 columns. The sensitivity analysis uses the following groups of columns:

- identifiers and geography: cityid, year, latitude, longitude, scaled_lat, scaled_lon, distance_B
- outcomes and baseline market access: emp_growth, dma0, ma0, ma2007
- market-access simulations: ma_nlink1 to ma_nlink1999
- expected market access: ma_nlink_pscore, dma_nlink_pscore
- recentered market access: ma_nlink_rc

Source

<https://zenodo.org/records/8286785>

Index

* datasets

BH_precomputed_results, 2

line, 4

ma, 5

BH_precomputed_results, 2

formulaiv, 2

formulaiv(), 2

line, 4

lpSolve::lp(), 3

ma, 5