

# Package ‘ShiftShareSE’

April 3, 2022

**Title** Inference in Regressions with Shift-Share Structure

**Version** 1.0.1.9000

**Description** Provides confidence intervals in least-squares regressions when the variable of interest has a shift-share structure, and in instrumental variables regressions when the instrument has a shift-share structure. The confidence intervals implement the AKM and AKM0 methods developed in Adão, Kolesár, and Morales (2019) <[doi:10.1093/qje/qjz025](https://doi.org/10.1093/qje/qjz025)>.

**Depends** R (>= 3.5.0)

**License** GPL-3

**Encoding** UTF-8

**LazyData** true

**Suggests** testthat (>= 2.1.0),  
knitr,  
rmarkdown,  
AER,  
spelling,  
formatR

**Imports** Formula

**RoxygenNote** 7.1.2

**URL** <https://github.com/kolesarm/ShiftShareSE>

**Language** en-US

**BugReports** <https://github.com/kolesarm/ShiftShareSE/issues>

**VignetteBuilder** knitr

## R topics documented:

ADH . . . . .	2
ivreg_ss . . . . .	3
ivreg_ss.fit . . . . .	5
reg_ss . . . . .	7
reg_ss.fit . . . . .	9

**Index****11**

ADH

*Dataset from Autor, Dorn and Hanson (2013)***Description**

Subset of data from Autor, Dorn and Hanson (2013, ADH) that is used to illustrate the confidence intervals implemented in this package.

**Usage**

ADH

**Format**

A list, consisting of a data frame, a vector, and a matrix. The first data frame, `ADH$reg`, has 1,444 rows and 16 variables. The rows correspond to 722 commuting zones (CZ) over 2 time periods (1990-1999 and 2000-2007), and the variables are as follows:

**d\_sh\_empl** Change in the share of working-age population

**d\_sh\_empl\_mfg** Change in the share of working-age population employed in manufacturing.

**d\_sh\_empl\_nmfg** Change in the share of working-age population employed in non-manufacturing.

**shock** Change in sectoral U.S. imports from China normalized by U.S. total employment in the corresponding sector, aggregated to regional level. This is the variable of interest in ADH.

**IV** Change in sectoral imports from China by rest of the world, aggregated to regional level. This is the variable used to instrument for shock, called `d_tradeotch_pw_lag` in ADH.

**weights** Regression weights corresponding to start of period CZ share of national populations

**statefip** State FIPS code

**czone** CZ number

**t2** Indicator for 2000-2007

**l\_shind\_manuf\_cbp** Employment share of manufacturing

**l\_sh\_popedu\_c** percent population college-educated

**l\_sh\_popfborn** percent population foreign-born

**l\_sh\_empl\_f** percent employment among women

**l\_sh\_routine33** percent employment in routine occupations

**l\_task\_outsource** Offshorability index of occupations in CZ

**division** US Census division of CZ

The second list component, the vector `ADH$sic` is a vector of length 770 that gives 4-digit SIC industry codes for the sectors used to construct the shift-share IV `ADH$reg$IV`. Finally, `ADH$W` is a 1444-by-700 matrix of shares that correspond to the CZ employment shares in 4-digit SIC sectors.

## Source

We thank David Dorn for helping us with the construction of the share matrix. The remaining data was obtained from David Dorn's website, <http://ddorn.net/data.htm>.

## References

Autor, David H., David Dorn, and Gordon H. Hanson, "The China syndrome: Local labor market effects of import competition in the United States," *American Economic Review*, 2013, 103 (6), 2121–2168. doi: [10.1257/aer.103.6.2121](https://doi.org/10.1257/aer.103.6.2121).

Adão, Rodrigo, Kolesár, Michal, and Morales, Eduardo, "Shift-Share Designs: Theory and Inference", *Quarterly Journal of Economics* 2019, 134 (4), 1949-2010. doi: [10.1093/qje/qjz025](https://doi.org/10.1093/qje/qjz025).

---

ivreg\_ss

*Inference in an IV regression with a shift-share instrument*


---

## Description

Computes confidence intervals and p-values in an instrumental variables regression in which the instrument has a shift-share structure, as in Bartik (1991). Several different inference methods can be computed, as specified by method.

## Usage

```
ivreg_ss(
  formula,
  X,
  data,
  W,
  subset,
  weights,
  method,
  beta0 = 0,
  alpha = 0.05,
  region_cvar = NULL,
  sector_cvar = NULL
)
```

## Arguments

formula	An object of class "formula" (or one that can be coerced to that class) of the form <code>outcome ~ controls   endogenous_regressor</code> . For a regression with no controls (only an intercept), it takes the form <code>outcome ~ 1   endogenous_regressor</code>
X	Shift-share vector with length N of sectoral shocks, aggregated to regional level using the share matrix W. That is, each element of X corresponds to a region.

<code>data</code>	An optional data frame, list or environment (or object coercible by <code>as.data.frame</code> to a data frame) containing the outcome and running variables in the model. If not found in <code>data</code> , the variables are taken from <code>environment(formula)</code> , typically the environment from which the function is called. Each row in the data frame corresponds to a region.
<code>W</code>	A matrix of sector shares, so that <code>W[i,s]</code> corresponds to share of sector <code>s</code> in region <code>i</code> . The ordering of the regions must coincide with that in the other inputs, such as <code>X</code> . The ordering of the sectors in the columns of <code>W</code> is irrelevant but the identity of the sectors in must coincide with those used to construct <code>X</code> .
<code>subset</code>	An optional vector specifying a subset of observations to be used in the fitting process.
<code>weights</code>	An optional vector of weights to be used in the fitting process. Should be <code>NULL</code> or a numeric vector, with each row corresponding to a region. If non- <code>NULL</code> , for computing the first stage and the reduced form, weighted least squares is used with weights <code>weights</code> (that is, we minimize <code>sum(weights*residuals^2)</code> ); otherwise ordinary least squares is used.
<code>method</code>	Vector specifying which inference methods to use. The vector elements have to be one or more of the following strings: <code>"homosk"</code> Assume i.i.d. homoskedastic errors <code>"ehw"</code> Eicker-Huber-White standard errors <code>"region_cluster"</code> Standard errors clustered at regional level <code>"akm"</code> Adão-Kolesár-Morales <code>"akm0"</code> Adão-Kolesár-Morales with null imposed. Note the reported standard error for this method corresponds to the normalized standard error, given by the length of the confidence interval divided by $2z_{1-\alpha/2}$ <code>"all"</code> All of the methods above
<code>beta0</code>	null that is tested (only affects reported p-values)
<code>alpha</code>	Determines confidence level of reported confidence intervals, which will have coverage $1-\alpha$ .
<code>region_cvar</code>	A vector with length <code>N</code> of cluster variables, for method <code>"cluster_region"</code> . If the vector <code>1:N</code> is used, clustering is effectively equivalent to <code>ehw</code>
<code>sector_cvar</code>	A vector with length <code>S</code> of cluster variables, if sectors are to be clustered, for methods <code>"akm"</code> and <code>"akm0"</code> . If the vector <code>1:S</code> is used, this is equivalent to not clustering.

### Value

Returns an object of class `"SSResults"` containing the estimation and inference results. The `print` function can be used to print a summary of the results. The object is a list with at least the following components:

**beta** Point estimate of the effect of interest  $\beta$

**se, p** A vector of standard errors and a vector of p-values of the null  $H_0: \beta = \beta_0$  for the inference methods in `method`, with  $\beta_0$  specified by the argument `beta0`. For the method `"akm0"`, the standard error corresponds to the effective standard error (length of the confidence interval divided by `2*stats::qnorm(1-alpha/2)`)

**ci.l, ci.r** Upper and lower endpoints of the confidence interval for the effect of interest  $\beta$ , for each of the methods in method

### Note

subset is evaluated in the same way as variables in formula, that is first in data and then in the environment of formula.

### References

Bartik, Timothy J., *Who Benefits from State and Local Economic Development Policies?*, Kalamazoo, MI: W.E. Upjohn Institute for Employment Research, 1991.

Adão, Rodrigo, Kolesár, Michal, and Morales, Eduardo, "Shift-Share Designs: Theory and Inference", *Quarterly Journal of Economics* 2019, 134 (4), 1949-2010. doi: [10.1093/qje/qjz025](https://doi.org/10.1093/qje/qjz025).

### Examples

```
## Use ADH data from Autor, Dorn, and Hanson (2013)
ivreg_ss(d_sh_empl ~ 1 | shock, X=IV, data=ADH$reg, W=ADH$W,
        method=c("ehw", "akm", "akm0"))
```

---

ivreg\_ss.fit

---

*Inference in an IV regression with a shift-share instrument*


---

### Description

Basic computing engine to calculate confidence intervals and p-values in an instrumental variables regression with a shift-share instrument, using different inference methods, as specified by method.

### Usage

```
ivreg_ss.fit(
  y1,
  y2,
  X,
  W,
  Z,
  w = NULL,
  method = c("akm", "akm0"),
  beta0 = 0,
  alpha = 0.05,
  region_cvar = NULL,
  sector_cvar = NULL
)
```

**Arguments**

y1	Outcome variable. A vector of length N, with each row corresponding to a region.
y2	Endogenous variable, vector of length N, with each row corresponding to a region.
X	Shift-share vector with length N of sectoral shocks, aggregated to regional level using the share matrix W. That is, each element of X corresponds to a region.
W	A matrix of sector shares, so that $W[i, s]$ corresponds to share of sector s in region i. The ordering of the regions must coincide with that in the other inputs, such as X. The ordering of the sectors in the columns of W is irrelevant but the identity of the sectors in must coincide with those used to construct X.
Z	Matrix of regional controls, matrix with N rows corresponding to regions.
w	vector of weights (length N) to be used in the fitting process. If not NULL, weighted least squares is used with weights w, i.e., $\sum(w * residuals^2)$ is minimized.
method	Vector specifying which inference methods to use. The vector elements have to be one or more of the following strings: "homosk" Assume i.i.d. homoskedastic errors "ehw" Eicker-Huber-White standard errors "region_cluster" Standard errors clustered at regional level "akm" Adão-Kolesár-Morales "akm0" Adão-Kolesár-Morales with null imposed. Note the reported standard error for this method corresponds to the normalized standard error, given by the length of the confidence interval divided by $2z_{1-\alpha/2}$ "all" All of the methods above
beta0	null that is tested (only affects reported p-values)
alpha	Determines confidence level of reported confidence intervals, which will have coverage 1-alpha.
region_cvar	A vector with length N of cluster variables, for method "cluster_region". If the vector 1:N is used, clustering is effectively equivalent to ehw
sector_cvar	A vector with length S of cluster variables, if sectors are to be clustered, for methods "akm" and "akm0". If the vector 1:S is used, this is equivalent to not clustering.

**Value**

Returns an object of class "SSResults" containing the estimation and inference results. The print function can be used to print a summary of the results. The object is a list with at least the following components:

**beta** Point estimate of the effect of interest  $\beta$

**se, p** A vector of standard errors and a vector of p-values of the null  $H_0: \beta = \beta_0$  for the inference methods in method, with  $\beta_0$  specified by the argument beta0. For the method "akm0", the standard error corresponds to the effective standard error (length of the confidence interval divided by  $2 * stats::qnorm(1 - alpha/2)$ )

**ci.l, ci.r** Upper and lower endpoints of the confidence interval for the effect of interest  $\beta$ , for each of the methods in method

reg\_ss

*Inference in linear regression with a shift-share regressor*

## Description

Computes confidence intervals and p-values in a linear regression in which the regressor of interest has a shift-share structure, as the instrument in Bartik (1991). Several different inference methods can be computed, as specified by method.

## Usage

```
reg_ss(
  formula,
  X,
  data,
  W,
  subset,
  weights,
  method,
  beta0 = 0,
  alpha = 0.05,
  region_cvar = NULL,
  sector_cvar = NULL
)
```

## Arguments

formula	object of class "formula" (or one that can be coerced to that class) of the form outcome ~ controls. For a regression with no controls (only an intercept), it takes the form outcome ~ 1
X	Shift-share vector with length N of sectoral shocks, aggregated to regional level using the share matrix W. That is, each element of X corresponds to a region.
data	optional data frame, list or environment (or object coercible by <code>as.data.frame</code> to a data frame) containing the variables in the model. If not found in data, the variables are taken from <code>environment(formula)</code> , typically the environment from which the function is called. Each row in the data frame corresponds to a region.
W	A matrix of sector shares, so that <code>W[i,s]</code> corresponds to share of sector s in region i. The ordering of the regions must coincide with that in the other inputs, such as X. The ordering of the sectors in the columns of W is irrelevant but the identity of the sectors in must coincide with those used to construct X.
subset	optional vector specifying a subset of observations to be used in the fitting process.

weights	an optional vector of weights to be used in the fitting process. Should be NULL or a numeric vector, with each row corresponding to a region. If non-NULL, weighted least squares is used with weights weights (that is, we minimize $\text{sum}(\text{weights} \times \text{residuals}^2)$ ); otherwise ordinary least squares is used.
method	Vector specifying which inference methods to use. The vector elements have to be one or more of the following strings: "homosk" Assume i.i.d. homoskedastic errors "ehw" Eicker-Huber-White standard errors "region_cluster" Standard errors clustered at regional level "akm" Adão-Kolesár-Morales "akm0" Adão-Kolesár-Morales with null imposed. Note the reported standard error for this method corresponds to the normalized standard error, given by the length of the confidence interval divided by $2z_{1-\alpha/2}$ "all" All of the methods above
beta0	null that is tested (only affects reported p-values)
alpha	Determines confidence level of reported confidence intervals, which will have coverage $1-\alpha$ .
region_cvar	A vector with length N of cluster variables, for method "cluster_region". If the vector 1:N is used, clustering is effectively equivalent to ehw
sector_cvar	A vector with length S of cluster variables, if sectors are to be clustered, for methods "akm" and "akm0". If the vector 1:S is used, this is equivalent to not clustering.

### Value

Returns an object of class "SSResults" containing the estimation and inference results. The print function can be used to print a summary of the results. The object is a list with at least the following components:

**beta** Point estimate of the effect of interest  $\beta$

**se, p** A vector of standard errors and a vector of p-values of the null  $H_0: \beta = \beta_0$  for the inference methods in method, with  $\beta_0$  specified by the argument beta0. For the method "akm0", the standard error corresponds to the effective standard error (length of the confidence interval divided by  $2 \times \text{stats::qnorm}(1-\alpha/2)$ )

**ci.l, ci.r** Upper and lower endpoints of the confidence interval for the effect of interest  $\beta$ , for each of the methods in method

### Note

subset is evaluated in the same way as variables in formula, that is first in data and then in the environment of formula.

### References

- Bartik, Timothy J., *Who Benefits from State and Local Economic Development Policies?*, Kalamazoo, MI: W.E. Upjohn Institute for Employment Research, 1991.
- Adão, Rodrigo, Kolesár, Michal, and Morales, Eduardo, "Shift-Share Designs: Theory and Inference", *Quarterly Journal of Economics* 2019, 134 (4), 1949-2010. doi: [10.1093/qje/qjz025](https://doi.org/10.1093/qje/qjz025).



### Examples

```
## Use ADH data from Autor, Dorn, and Hanson (2013)
reg_ss(d_sh_empl ~ 1, X=IV, data=ADH$reg, W=ADH$W,
      method=c("ehw", "akm", "akm0"))
```

reg\_ss.fit

*Inference in a shift-share regression*

### Description

Basic computing engine to calculate confidence intervals and p-values in shift-share designs using different inference methods, as specified by method.

### Usage

```
reg_ss.fit(
  y,
  X,
  W,
  Z,
  w = NULL,
  method = c("akm", "akm0"),
  beta0 = 0,
  alpha = 0.05,
  region_cvar = NULL,
  sector_cvar = NULL
)
```

### Arguments

y	Outcome variable, vector of length N, with each row corresponding to a region.
X	Shift-share vector with length N of sectoral shocks, aggregated to regional level using the share matrix W. That is, each element of X corresponds to a region.
W	A matrix of sector shares, so that $W[i,s]$ corresponds to share of sector s in region i. The ordering of the regions must coincide with that in the other inputs, such as X. The ordering of the sectors in the columns of W is irrelevant but the identity of the sectors in must coincide with those used to construct X.
Z	Matrix of regional controls, matrix with N rows corresponding to regions.
w	vector of weights (length N) to be used in the fitting process. If not NULL, weighted least squares is used with weights w, i.e., $\sum(w * residuals^2)$ is minimized.
method	Vector specifying which inference methods to use. The vector elements have to be one or more of the following strings: "homosk" Assume i.i.d. homoskedastic errors "ehw" Eicker-Huber-White standard errors

	"region_cluster" Standard errors clustered at regional level
	"akm" Adão-Kolesár-Morales
	"akm0" Adão-Kolesár-Morales with null imposed. Note the reported standard error for this method corresponds to the normalized standard error, given by the length of the confidence interval divided by $2z_{1-\alpha/2}$
	"all" All of the methods above
beta0	null that is tested (only affects reported p-values)
alpha	Determines confidence level of reported confidence intervals, which will have coverage $1-\alpha$ .
region_cvar	A vector with length N of cluster variables, for method "cluster_region". If the vector 1:N is used, clustering is effectively equivalent to ehv
sector_cvar	A vector with length S of cluster variables, if sectors are to be clustered, for methods "akm" and "akm0". If the vector 1:S is used, this is equivalent to not clustering.

### Value

Returns an object of class "SSResults" containing the estimation and inference results. The `print` function can be used to print a summary of the results. The object is a list with at least the following components:

**beta** Point estimate of the effect of interest  $\beta$

**se, p** A vector of standard errors and a vector of p-values of the null  $H_0: \beta = \beta_0$  for the inference methods in method, with  $\beta_0$  specified by the argument beta0. For the method "akm0", the standard error corresponds to the effective standard error (length of the confidence interval divided by  $2 \cdot \text{stats::qnorm}(1-\alpha/2)$ )

**ci.l, ci.r** Upper and lower endpoints of the confidence interval for the effect of interest  $\beta$ , for each of the methods in method

# Index

## \* **datasets**

ADH, [2](#)

ADH, [2](#)

ivreg\_ss, [3](#)

ivreg\_ss.fit, [5](#)

reg\_ss, [7](#)

reg\_ss.fit, [9](#)