Title

cnsreg — Constrained linear regression

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Description

cnsreg fits constrained linear regression models.

Quick start

Linear regression with coefficients for x1 and x2 constrained to equality

```
constraint 1 x1 = x2
cnsreg y x1 x2 x3, constraints(1)
Add constraint x2 = x3 to impose x1 = x2 = x3
constraint 2 x2 = x3
cnsreg y x1 x2 x3, constraints(1 2)
Constrain the coefficient for x4 to be -1
constraint 3 x4 = -1
```

```
cnsreg y x1 x2 x3 x4, constraints(1-3)
```

Menu

Statistics > Linear models and related > Constrained linear regression

Syntax

cnsreg depvar indepvars [if] [in] [weight], constraints(constraints) [options]

options	Description
Model	
* <u>const</u> raints(<i>constraints</i>) <u>nocons</u> tant	apply specified linear constraints suppress constant term
SE/Robust	
vce(vcetype)	<pre>vcetype may be ols, robust, cluster clustvar, bootstrap, or jackknife</pre>
Reporting	
<u>l</u> evel(#)	set confidence level; default is level(95)
<u>nocnsr</u> eport	do not display constraints
display_options	control columns and column formats, row spacing, line width, display of omitted variables and base and empty cells, and factor-variable labeling
mse1	force MSE to be 1
<u>col</u> linear	keep collinear variables
<u>coefl</u> egend	display legend instead of statistics

*constraints(constraints) is required.

indepvars may contain factor variables; see [U] 11.4.3 Factor variables.

depvar and indepvars may contain time-series operators; see [U] 11.4.4 Time-series varlists.

bootstrap, by, collect, fp, jackknife, mi estimate, rolling, statsby, and svy are allowed; see [U] 11.1.10 Prefix commands.

vce(bootstrap) and vce(jackknife) are not allowed with the mi estimate prefix; see [MI] mi estimate.

With the fp prefix (see [R] fp), constraints cannot be specified for the variable containing fractional polynomial terms. Weights are not allowed with the bootstrap prefix; see [R] bootstrap.

aweights are not allowed with the jackknife prefix; see [R] jackknife.

vce(), mse1, and weights are not allowed with the svy prefix; see [SVY] svy.

vee(), moet, and weights are not anowed with the byy picita, see [5 + 1] sty.

aweights, fweights, iweights, and pweights are allowed; see [U] 11.1.6 weight.

mse1, collinear, and coeflegend do not appear in the dialog.

See [U] 20 Estimation and postestimation commands for more capabilities of estimation commands.

Options

Model

constraints(constraints), noconstant; see [R] Estimation options.

SE/Robust

vce(vcetype) specifies the type of standard error reported, which includes types that are derived from asymptotic theory (ols), that are robust to some kinds of misspecification (robust), that allow for intragroup correlation (cluster *clustvar*), and that use bootstrap or jackknife methods (bootstrap, jackknife); see [R] vce_option.

vce(ols), the default, uses the standard variance estimator for ordinary least-squares regression.

Reporting

level(#), nocnsreport; see [R] Estimation options.

display_options: noci, nopvalues, noomitted, vsquish, noemptycells, baselevels, allbaselevels, notvlabel, fvwrap(#), fvwrapon(style), cformat(% fmt), pformat(% fmt), sformat(% fmt), and nolstretch; see [R] Estimation options.

The following options are available with cnsreg but are not shown in the dialog box:

mse1 is used only in programs and ado-files that use cnsreg to fit models other than constrained linear regression. mse1 sets the mean squared error to 1, thus forcing the variance-covariance matrix of the estimators to be $(\mathbf{X}'\mathbf{D}\mathbf{X})^{-1}$ (see *Methods and formulas* in [R] regress) and affecting calculated standard errors. Degrees of freedom for t statistics are calculated as n rather than n-p+c, where p is the total number of parameters (prior to restrictions and including the constant) and c is the number of constraints.

mse1 is not allowed with the svy prefix.

collinear, coeflegend; see [R] Estimation options.

Remarks and examples

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For a discussion of constrained linear regression, see Greene (2018, 126–127); Hill, Griffiths, and Lim (2018, 271–273); or Davidson and MacKinnon (1993, 17).

Example 1: One constraint

In principle, we can obtain constrained linear regression estimates by modifying the list of independent variables. For instance, if we wanted to fit the model

$$mpg = \beta_0 + \beta_1 price + \beta_2 weight + u$$

and constrain $\beta_1 = \beta_2$, we could write

$$mpg = \beta_0 + \beta_1(price + weight) + u$$

and run a regression of mpg on price + weight. The estimated coefficient on the sum would be the constrained estimate of β_1 and β_2 . Using cnsreg, however, is easier:

. use https://www.stata-press.com/data/r18/auto
(1978 automobile data)
. constraint 1 price = weight
. cnsreg mpg price weight, constraint(1)
Constrained linear regression

							F(1, 72)	= 37.59
							Prob > F	= 0.0000
							Root MSE	= 4.7220
(1)	price -	- weight = 0						
	mpg	Coefficient	Std.	err.	t	P> t	[95% conf	. interval]

Number of obs =

74

mpg	Coefficient	Std. err.	t	P> t	[95% conf.	interval]
price	0009875	.0001611	-6.13	0.000	0013086	0006664
weight	0009875	.0001611	-6.13	0.000	0013086	0006664
_cons	30.36718	1.577958	19.24	0.000	27.22158	33.51278

We define constraints by using the constraint command; see [R] constraint. We fit the model with cnsreg and specify the constraint number or numbers in the constraints() option.

Just to show that the results above are correct, here is the result of applying the constraint by hand:

```
. generate x = price + weight
```

```
. regress mpg x
```

Source	SS	df	MS		er of obs	=	74
Model Residual	838.065767 1605.39369	1 72	838.065767 22.2971346	6 R-sq		=	37.59 0.0000 0.3430 0.3339
Total	2443.45946	73	33.4720474		-	=	4.722
mpg	Coefficient	Std. err.	t	P> t	[95% co	nf.	interval]
x _cons	0009875 30.36718	.0001611 1.577958	-6.13 19.24	0.000 0.000	001308 27.2215	-	0006664 33.51278

Example 2: Multiple constraints

Models can be fit subject to multiple simultaneous constraints. We simply define the constraints and then include the constraint numbers in the constraints() option. For instance, say that we wish to fit the model

$$\begin{split} \texttt{mpg} = \beta_0 + \beta_1 \,\texttt{price} + \beta_2 \,\texttt{weight} + \beta_3 \,\texttt{displ} + \beta_4 \,\texttt{gear_ratio} + \,\beta_5 \,\texttt{foreign} + \\ \beta_6 \,\texttt{length} + u \end{split}$$

subject to the constraints

$$\beta_1 = \beta_2 = \beta_3 = \beta_6$$
$$\beta_4 = -\beta_5 = \beta_0/20$$

(This model, like the one in example 1, is admittedly senseless.) We fit the model by typing

```
. constraint 1 price=weight
```

- . constraint 2 displ=weight
- . constraint 3 length=weight
- . constraint 5 gear_ratio = -foreign
- . constraint 6 gear_ratio = _cons/20

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. cnsreg mpg]	price weight d	ispl gear_r	atio fore	eign len	gth, c(1-3,5-6)
Constrained 1:	C C	on			Number of ob F(2, 72) Prob > F Root MSE	s = 74 = 785.20 = 0.0000 = 4.6823
-	- weight = 0					
0	nt + displacem					
•	<pre>ht + length =</pre>					
0	atio + foreign					
(5) gear_ra	atio05*_co	ns = 0				
mpg	Coefficient	Std. err.	t	P> t	[95% conf.	interval]
price	000923	.0001534	-6.02	0.000	0012288	0006172
weight	000923	.0001534	-6.02	0.000	0012288	0006172
displacement	000923	.0001534	-6.02	0.000	0012288	0006172
gear_ratio	1.326114	.0687589	19.29	0.000	1.189046	1.463183
gear_ratio foreign	1.326114 -1.326114	.0687589 .0687589	19.29 -19.29	0.000	1.189046 -1.463183	1.463183 -1.189046
0						

There are many ways we could have specified the constraints() option (which we abbreviated c() above). We typed c(1-3,5-6), meaning that we want constraints 1 through 3 and 5 and 6; those numbers correspond to the constraints we defined. The only reason we did not use the number 4 was to emphasize that constraints do not have to be consecutively numbered. We typed c(1-3,5-6), but we could have typed c(1,2,3,5,6) or c(1-3,5,6) or c(1-2,3,5,6) or even c(1-6), which would have worked as long as constraint 4 was not defined. If we had previously defined a constraint 4, then c(1-6) would have included it.

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Stored results

cnsreg stores the following in e():

Scalars		
e(N)	number of observations
e(d	f_m)	model degrees of freedom
e(d	f_r)	residual degrees of freedom
e(F)	F statistic
e(p)	<i>p</i> -value for model test
e(r	mse)	root mean squared error
e(1	1)	log likelihood
e(N	_clust)	number of clusters
e(r	ank)	rank of e(V)
Macros		
e(c	md)	cnsreg
e(c	mdline)	command as typed
e(d	epvar)	name of dependent variable
e(w	type)	weight type
e(w	exp)	weight expression
e(t	itle)	title in estimation output
e(c	lustvar)	name of cluster variable
e(v	ce)	vcetype specified in vce()
e(v	cetype)	title used to label Std. err.
e(p	roperties)	ъV
e(p	redict)	program used to implement predict

e(marginsok) e(asbalanced)	predictions allowed by margins factor variables fvset as asbalanced
e(asobserved)	factor variables fvset as asobserved
Matrices	
e(b)	coefficient vector
e(Cns)	constraints matrix
e(V)	variance-covariance matrix of the estimators
e(V_modelbased)	model-based variance
Functions	
e(sample)	marks estimation sample

In addition to the above, the following is stored in r():

```
Matrices
```

r(table)

matrix containing the coefficients with their standard errors, test statistics, p-values, and confidence intervals

Note that results stored in r() are updated when the command is replayed and will be replaced when any r-class command is run after the estimation command.

Methods and formulas

Let *n* be the number of observations, *p* be the total number of parameters (prior to restrictions and including the constant), and *c* be the number of constraints. The coefficients are calculated as $\mathbf{b}' = \mathbf{T}\{(\mathbf{T}'\mathbf{X}'\mathbf{W}\mathbf{X}\mathbf{T})^{-1}(\mathbf{T}'\mathbf{X}'\mathbf{W}\mathbf{y} - \mathbf{T}'\mathbf{X}'\mathbf{W}\mathbf{X}\mathbf{a}')\} + \mathbf{a}'$, where **T** and **a** are as defined in [P] makecns. $\mathbf{W} = \mathbf{I}$ if no weights are specified. If weights are specified, let $\mathbf{v}: 1 \times n$ be the specified weights. If fweight frequency weights are specified, $\mathbf{W} = \text{diag}(\mathbf{v})$. If aweight analytic weights are specified, then $\mathbf{W} = \text{diag}[\mathbf{v}/(1'\mathbf{v})(1'1)]$, meaning that the weights are normalized to sum to the number of observations.

The mean squared error is $s^2 = (\mathbf{y}'\mathbf{W}\mathbf{y} - 2\mathbf{b}'\mathbf{X}'\mathbf{W}\mathbf{y} + \mathbf{b}'\mathbf{X}'\mathbf{W}\mathbf{X}\mathbf{b})/(n-p+c)$. The variancecovariance matrix is $s^2\mathbf{T}(\mathbf{T}'\mathbf{X}'\mathbf{W}\mathbf{X}\mathbf{T})^{-1}\mathbf{T}'$.

This command supports the Huber/White/sandwich estimator of the variance and its clustered version using vce(robust) and vce(cluster *clustvar*), respectively. See [P] <u>robust</u>, particularly *Introduction* and *Methods and formulas*.

cnsreg also supports estimation with survey data. For details on VCEs with survey data, see [SVY] Variance estimation.

References

- Christodoulou, D. 2020. Stata tip 137: Interpreting constraints on slopes of rank-deficient design matrices. Stata Journal 20: 493–498.
- Davidson, R., and J. G. MacKinnon. 1993. Estimation and Inference in Econometrics. New York: Oxford University Press.

Greene, W. H. 2018. Econometric Analysis. 8th ed. New York: Pearson.

Hill, R. C., W. E. Griffiths, and G. C. Lim. 2018. Principles of Econometrics. 5th ed. Hoboken, NJ: Wiley.

Also see

- [R] **cnsreg postestimation** Postestimation tools for cnsreg
- [R] regress Linear regression
- [MI] Estimation Estimation commands for use with mi estimate

[SVY] svy estimation — Estimation commands for survey data

[U] 20 Estimation and postestimation commands

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