Title

gmm postestimation — Postestimation tools for gmm

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Postestimation commands

The following postestimation command is of special interest after gmm:

Command	Description
estat overid	perform test of overidentifying restrictions

The following standard postestimation commands are also available:

Command	Description
contrast	contrasts and ANOVA-style joint tests of estimates
estat vce	variance-covariance matrix of the estimators (VCE)
estimates	cataloging estimation results
hausman	Hausman's specification test
lincom	point estimates, standard errors, testing, and inference for linear combinations of coefficients
margins	marginal means, predictive margins, marginal effects, and average marginal effects
marginsplot	graph the results from margins (profile plots, interaction plots, etc.)
nlcom	point estimates, standard errors, testing, and inference for nonlinear combinations of coefficients
predict	linear predictions, residuals, and scores
predictnl	point estimates, standard errors, testing, and inference for generalized predictions
pwcompare	pairwise comparisons of estimates
test	Wald tests of simple and composite linear hypotheses
testnl	Wald tests of nonlinear hypotheses

predict

Description for predict

predict creates a new variable containing predictions such as linear predictions, residuals, and scores.

Menu for predict

Statistics > Postestimation

Syntax for predict

predict [type] newvar [if] [in] [, xb equation(#eqno|eqname)]
predict [type] newvar [if] [in], residuals [equation(#eqno|eqname)]
predict [type] { stub* | newvar_1 ... newvar_q } [if] [in] [, residuals]
predict [type] { stub* | newvar_1 ... newvar_p } [if] [in] [, scores]

Residuals are available both in and out of sample; type predict ... if e(sample) ... if wanted only for the estimation sample.

Scores are available only for observations within the estimation sample.

You specify one new variable and (optionally) equation(), or you specify stub* or q or p new variables, where q is the number of moment equations and p is the number of parameters in the model.

Option for predict

Main

xb, the default, calculates the linear prediction.

residuals calculates the residuals, the predicted values of the moment equations. This option requires that the length of the new variable list be equal to the number of moment equations, q. Otherwise, use *stub** to have predict generate enumerated variables with prefix *stub*. If equation() is not specified, the *j*th new variable will contain the residuals for the *j*th moment equation.

equation (#eqno | eqname) specifies the equation for which residuals or linear predictions are desired. The specified equation may be either a model equation or a moment equation.

If xb is specified, equation() is used to specify equations in the model. Specifying equation(#1) indicates that the calculation is to be made for the first model equation. Specifying equation(demand) would indicate that the calculation is to be made for the model equation named demand, assuming there is an equation named demand in the model.

If residuals is specified, equation() is used to specify moment equations. Specifying equation(#1) indicates that the calculation is to be made for the first moment equation. Specifying equation(demand) would indicate that the calculation is to be made for the moment equation named demand, assuming there is a moment equation named demand in the model. If you specify one new variable name and omit equation(), results are the same as if you had specified equation(#1).

For more information on using predict after multiple-equation estimation commands, see [R] predict.

scores calculates the parameter-level score equations, the first derivatives of the GMM criterion function with respect to the parameters scaled by -0.5. This option requires that the length of the new variable list be equal to the number of parameters, p. Otherwise, use *stub** to have predict generate enumerated variables with prefix *stub*. The *j*th new variable will contain the *j*th score of the model.

margins

Description for margins

margins estimates margins of response for linear predictions.

Menu for margins

Statistics > Postestimation

Syntax for margins

margins	[marginlist] [, options]
margins	[marginlist], predict(statistic) [predict(statistic)] [options]
statistic	Description
xb residuals	linear prediction; the default not allowed with margins

xb defaults to the first equation.

Statistics not allowed with margins are functions of stochastic quantities other than e(b). For the full syntax, see [R] margins.

estat

Description for estat

estat overid reports Hansen's J statistic, which is used to determine the validity of the overidentifying restrictions in a GMM model. If the model is correctly specified in the sense that $E\{\mathbf{z}_i u_i(\beta)\} = \mathbf{0}$, then the sample analog to that condition should hold at the estimated value of β . Hansen's J statistic is valid only if the weight matrix is optimal, meaning that it equals the inverse of the covariance matrix of the moment conditions. Therefore, estat overid only reports Hansen's J statistic after two-step or iterated estimation, or if you specified winitial (*matname*) when calling gmm. In the latter case, it is your responsibility to determine the validity of the J statistic.

Menu for estat

Statistics > Postestimation

Syntax for estat

estat <u>over</u>id

Remarks and examples

stata.com

As we noted in *Introduction* of [R] **gmm**, underlying generalized method of moments (GMM) estimators is a set of l moment conditions, $E\{\mathbf{z}_i u_i(\beta)\} = \mathbf{0}$. When l is greater than the number of parameters, k, any size-k subset of the moment conditions would yield a consistent parameter estimate. We remarked that the parameter estimates we would obtain would in general depend on which k moment conditions we used. However, if all our moment conditions are indeed valid, then the parameter estimate should not differ too much regardless of which k moment conditions we used to estimate the parameters. The test of overidentifying restrictions is a model specification test based on this observation. The test of overidentifying restrictions requires that the number of moment conditions be greater than the number of parameters in the model.

Recall that the GMM criterion function is

$$Q = \left\{ \frac{1}{N} \sum_{i} \mathbf{z}_{i} u_{i}(\boldsymbol{\beta}) \right\}' \mathbf{W} \left\{ \frac{1}{N} \sum_{i} \mathbf{z}_{i} u_{i}(\boldsymbol{\beta}) \right\}$$

The test of overidentifying restrictions is remarkably simple. If **W** is an optimal weight matrix, under the null hypothesis $H_0: E\{\mathbf{z}_i u_i(\boldsymbol{\beta})\} = \mathbf{0}$, the test statistic $J = N \times Q \sim \chi^2(l-k)$. A large test statistic casts doubt on the null hypothesis.

For the test to be valid, W must be optimal, meaning that W must be the inverse of the covariance matrix of the moment conditions:

$$\mathbf{W}^{-1} = E\{\mathbf{z}_i u_i(\boldsymbol{\beta}) u_i'(\boldsymbol{\beta}) \mathbf{z}_i'\}$$

Therefore, estat overid works only after the two-step and iterated estimators, or if you supplied your own initial weight matrix by using the winitial(*matname*) option to gmm and used the one-step estimator.

Often the overidentifying restrictions test is interpreted as a test of the validity of the instruments z. However, other forms of model misspecification can sometimes lead to a significant test statistic. See Hall (2005, sec. 5.1) for a discussion of the overidentifying restrictions test and its behavior in correctly and misspecified models.

Example 1

In example 6 of [R] gmm, we fit an exponential regression model of the number of doctor visits based on the person's gender, income, possession of private health insurance, and presence of a chronic disease. We argued that the variable income may be endogenous; we used the person's age and race as additional instrumental variables. Here we refit the model and test the specification of the model. We type

```
. use http://www.stata-press.com/data/r15/docvisits
. gmm (docvis - exp({xb:private chronic female income} + {b0})),
> instruments(private chronic female age black hispanic)
 (output omitted)
. estat overid
  Test of overidentifying restriction:
  Hansen's J chi2(2) = 9.52598 (p = 0.0085)
```

The J statistic is significant even at the 1% significance level, so we conclude that our model is misspecified. One possibility is that age and race directly affect the number of doctor visits, so we are not justified in excluding them from the model.

A simple technique to explore whether any of the instruments is invalid is to examine the statistics

$$r_j = \mathbf{W}_{jj}^{1/2} \left\{ \frac{1}{N} \sum_{i=1}^N z_{ij} u_i(\widehat{\boldsymbol{\beta}}) \right\}$$

for j = 1, ..., k, where \mathbf{W}_{jj} denotes the *j*th diagonal element of \mathbf{W} , $u_i(\widehat{\boldsymbol{\beta}})$ denotes the sample residuals, and k is the number of instruments. If all the instruments are valid, then the scaled sample moments should at least be on the same order of magnitude. If one (or more) instrument's r_i is large in absolute value relative to the others, then that could be an indication that instrument is not valid.

In Stata, we type

rage

rblack

rhispanic

4,412

4.412

-.0379317

-.017435

```
. predict double r if e(sample), residuals
                                             // obtain residual from the model
. matrix W = e(W)
                                              // retrieve weight matrix
. local i 1
. // loop over each instrument and compute r_j
. foreach var of varlist private chronic female age black hispanic {
 2.
             generate double r'var' = r*'var'*sqrt(W['i', 'i'])
             local '++i'
 з.
 4. }
. summarize r*
   Variable
                      Obs
                                          Std. Dev.
                                                          Min
                                 Mean
                                                                     Max
           r
                    4,412
                             .0344373
                                           8.26176
                                                   -151.1847
                                                                 113.059
                    4,412
                              .007988
                                          3.824118
                                                   -72.66254
                                                                54.33852
    rprivate
                    4,412
                             .0026947
                                            2.0707
                                                     -43.7311
                                                                  32.703
    rchronic
    rfemale
                    4,412
                             .0028168
                                          1.566397
                                                     -12.7388
                                                                24.43621
                    4,412
                             .0360978
                                         4.752986 -89.74112
                                                                55.58143
```

1.062027

-24.39747

1.08567 -5.509386

27.34512

31.53512

We notice that the r_j statistics for age, black, and hispanic are larger than those for the other instruments in our model, supporting our suspicion that age and race may have a direct impact on the number of doctor visits.

Stored results

estat overid stores the following in r():

Scalars

r (J)Hansen's J statisticr (J_df)J statistic degrees of freedomr (J_p)J statistic p-value

References

Hall, A. R. 2005. Generalized Method of Moments. Oxford: Oxford University Press.

Lindsey, C. 2016. Testing model specification and using the program version of gmm. The Stata Blog: Not Elsewhere Classified. http://blog.stata.com/2016/02/11/testing-model-specification-and-using-the-program-version-of-gmm/.

Also see

[R] gmm — Generalized method of moments estimation

[U] 20 Estimation and postestimation commands