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**heckoprobit postestimation** — Postestimation tools for heckoprobit

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# **Postestimation commands**

The following postestimation commands are available after heckoprobit:

Command	Description			
contrast	contrasts and ANOVA-style joint tests of estimates			
estat ic	Akaike's, consistent Akaike's, corrected Akaike's, and Schwarz's Bayesian information criteria (AIC, CAIC, AICc, and BIC)			
estat summarize	summary statistics for the estimation sample			
estat vce	variance-covariance matrix of the estimators (VCE)			
estat (svy)	postestimation statistics for survey data			
estimates	cataloging estimation results			
etable	table of estimation results			
*hausman	Hausman's specification test			
lincom	point estimates, standard errors, testing, and inference for linear combinations of coefficients			
*lrtest	likelihood-ratio test			
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	probabilities, linear predictions and their SEs, etc.			
predictnl	point estimates, standard errors, testing, and inference for generalized predictions			
pwcompare	pairwise comparisons of estimates			
suest	seemingly unrelated estimation			
test	Wald tests of simple and composite linear hypotheses			
testnl	Wald tests of nonlinear hypotheses			

<sup>\*</sup>hausman and lrtest are not appropriate with svy estimation results.

# predict

#### **Description for predict**

predict creates a new variable containing predictions such as probabilities, linear predictions, and standard errors.

#### Menu for predict

Statistics > Postestimation

### Syntax for predict

```
predict [type] { stub* | newvar | newvarlist } [if] [in] [, statistic
  outcome(outcome) nooffset
predict [type] stub* [if] [in], scores
```

statistic	Description
Main	
pmargin	marginal probabilities; the default
<del>p1</del>	bivariate probabilities of levels with selection
p0	bivariate probabilities of levels with no selection
pcond1	probabilities of levels conditional on selection
pcond0	probabilities of levels conditional on no selection
psel	selection probability
хb	linear prediction
stdp	standard error of the linear prediction
<u>xbs</u> el	linear prediction for selection equation
stdpsel	standard error of the linear prediction for selection equation

If you do not specify outcome(), pmargin (with one new variable specified) assumes outcome(#1).

You specify one or k new variables with pmargin, where k is the number of outcomes.

You specify one new variable with psel, xb, stdp, xbsel, and stdpsel.

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

## Options for predict

Main )

pmargin, the default, calculates the predicted marginal probabilities.

You specify one or k new variables, where k is the number of categories of the outcome variable  $y_i$ . If you specify the outcome() option, you must specify one new variable. If you specify one new variable and do not specify outcome(), outcome(#1) is assumed.

When outcome() is specified, the marginal probability that  $y_i$  is equal to the level outcome() is calculated. When outcome() is not specified, the marginal probabilities for each outcome level are calculated.

p1 calculates the predicted bivariate probabilities of outcome levels with selection.

You specify one or k new variables, where k is the number of categories of the outcome variable  $y_i$ . If you specify the outcome() option, you must specify one new variable. If you specify one new variable and do not specify outcome(), outcome(#1) is assumed.

When outcome() is specified, the bivariate probability that  $y_i$  is equal to the level outcome() and that  $y_i$  is observed is calculated. When outcome() is not specified, the bivariate probabilities for each outcome level and selection are calculated.

p0 calculates the predicted bivariate probabilities of outcome levels with no selection.

You specify one or k new variables, where k is the number of categories of the outcome variable  $y_i$ . If you specify the outcome() option, you must specify one new variable. If you specify one new variable and do not specify outcome(), outcome(#1) is assumed.

When outcome() is specified, the bivariate probability that  $y_i$  is equal to the level outcome() and that  $y_i$  is not observed is calculated. When outcome() is not specified, the bivariate probabilities for each outcome level and no selection are calculated.

pcond1 calculates the predicted probabilities of outcome levels conditional on selection.

You specify one or k new variables, where k is the number of categories of the outcome variable  $y_i$ . If you specify the outcome() option, you must specify one new variable. If you specify one new variable and do not specify outcome(), outcome(#1) is assumed.

When outcome() is specified, the probability that  $y_j$  is equal to the level outcome() given that  $y_j$  is observed is calculated. When outcome() is not specified, the probabilities for each outcome level conditional on selection are calculated.

pcond0 calculates the predicted probabilities of outcome levels conditional on no selection.

You specify one or k new variables, where k is the number of categories of the outcome variable  $y_i$ . If you specify the outcome() option, you must specify one new variable. If you specify one new variable and do not specify outcome(), outcome(#1) is assumed.

When outcome() is specified, the probability that  $y_i$  is equal to the level outcome() given that  $y_i$  is not observed is calculated. When outcome() is not specified, the probabilities for each outcome level conditional on no selection are calculated.

psel calculates the predicted univariate (marginal) probability of selection.

xb calculates the linear prediction for the outcome variable, which is  $x_i\beta$  if offset() was not specified and  $\mathbf{x}_{i}\boldsymbol{\beta}$  + offset; if offset() was specified.

stdp calculates the standard error of the prediction, which can be thought of as the standard error of the predicted expected value or mean for the observation's covariate pattern. The standard error of the prediction is also referred to as the standard error of the fitted value.

xbsel calculates the linear prediction for the selection equation, which is  $z_i \gamma$  if offset() was not specified in select() and  $\mathbf{z}_j \gamma + \text{offset}_i^{\gamma}$  if offset() was specified in select().

stdpsel calculates the standard error of the linear prediction for the selection equation.

outcome (outcome) specifies for which outcome the predicted probabilities are to be calculated. outcome() should contain either one value of the dependent variable or one of #1, #2, ..., with #1 meaning the first category of the dependent variable, #2 meaning the second category, etc.

nooffset is relevant only if you specified offset(varname) for heckoprobit. It modifies the calculations made by predict so that they ignore the offset variable; the linear prediction is treated as  $x_ib$  rather than as  $x_jb$  + offset<sub>j</sub>.

scores calculates equation-level score variables.

The first new variable will contain  $\partial \ln L/\partial (\mathbf{x}_i \boldsymbol{\beta})$ .

The second new variable will contain  $\partial \ln L/\partial (\mathbf{z}_i \boldsymbol{\gamma})$ .

When the dependent variable takes k different values, new variables three through k+1 will contain  $\partial \ln L/\partial(\kappa_{j-2})$ .

The last new variable will contain  $\partial \ln L/\partial (\operatorname{atanh} \rho)$ .

## margins

#### **Description for margins**

margins estimates margins of response for probabilities and linear predictions.

#### Menu for margins

Statistics > Postestimation

## Syntax for margins

```
margins [marginlist] [, options]
  margins [marginlist], predict(statistic ...) [predict(statistic ...) ...] [options]
statistic
                    Description
default
                    marginal probabilities for each outcome
pmargin
                    marginal probabilities
                    bivariate probabilities of levels with selection
р1
                    bivariate probabilities of levels with no selection
0q
                    probabilities of levels conditional on selection
pcond1
                    probabilities of levels conditional on no selection
pcond0
psel
                    selection probability
хb
                    linear prediction
                    linear prediction for selection equation
xbsel
stdp
                    not allowed with margins
                    not allowed with margins
stdpsel
```

pmargin, p1, p0, pcond1, and pcond0 default to the first outcome.

Statistics not allowed with margins are functions of stochastic quantities other than e(b).

For the full syntax, see [R] margins.

# Remarks and examples

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### Example 1

In example 1 of [R] heckoprobit, we examined a simulated dataset of 5,000 women, 3,480 of whom work and can thus report job satisfaction. Using job satisfaction (satisfaction) as the outcome variable and employment (work) as the selection variable, we estimated the parameters of an ordered probit sample-selection model. Covariates age (age), years of education (education), number of children (children), and marital status (married) are expected to affect selection. The outcome, job satisfaction, is affected by age (age) and education (education).

We first reestimate the parameters of the regression, but this time we request a robust variance estimator:

- . use https://www.stata-press.com/data/r18/womensat (Job satisfaction, female)
- . heckoprobit satisfaction education age,
- > select(work=education age i.married##c.children) vce(robust) (output omitted)

We then use margins (see [R] margins) to estimate the average marginal effect of education on the probability of having low job satisfaction.

. margins, dydx(education) vce(unconditional) Average marginal effects Number of obs = 5,000dy/dx wrt: education 1.\_predict: Pr(satisfaction=1), predict(pmargin outcome(1)) 2.\_predict: Pr(satisfaction=2), predict(pmargin outcome(2)) 3.\_predict: Pr(satisfaction=3), predict(pmargin outcome(3)) 4.\_predict: Pr(satisfaction=4), predict(pmargin outcome(4))

	dy/dx	Unconditiona std. err.	al z	P> z	[95% conf	interval]
education						
$\_\mathtt{predict}$						
1	0234776	.0019176	-12.24	0.000	027236	0197192
2	0230858	.0015143	-15.24	0.000	0260538	0201178
3	0020603	.001142	-1.80	0.071	0042987	.000178
4	.0486238	.0018593	26.15	0.000	.0449795	.052268

The estimated average marginal effect of education on the probability of having low job satisfaction is approximately -0.023. 4

## Methods and formulas

The ordinal outcome equation is

$$y_j = \sum_{h=1}^{H} v_h 1 \left( \kappa_{h-1} < \mathbf{x}_j \boldsymbol{\beta} + u_{1j} \le \kappa_h \right)$$

where  $\mathbf{x}_j$  is the outcome covariates,  $\boldsymbol{\beta}$  is the coefficients, and  $u_{1j}$  is a random-error term. The observed outcome values  $v_1,\ldots,v_H$  are integers such that  $v_i < v_m$  for i < m.  $\kappa_1,\ldots,\kappa_{H-1}$  are real numbers such that  $\kappa_i < \kappa_m$  for i < m.  $\kappa_0$  is taken as  $-\infty$  and  $\kappa_H$  is taken as  $+\infty$ .

The selection equation is

$$s_j = 1(\mathbf{z}_j \boldsymbol{\gamma} + u_{2j} > 0)$$

where  $s_j = 1$  if we observed  $y_j$  and 0 otherwise,  $\mathbf{z}_j$  is the covariates used to model the selection process,  $\boldsymbol{\gamma}$  is the coefficients for the selection process, and  $u_{2j}$  is a random-error term.

 $(u_{1j}, u_{2j})$  have bivariate normal distribution with mean zero and variance matrix

$$\begin{bmatrix} 1 & \rho \\ \rho & 1 \end{bmatrix}$$

The probability of selection is

$$Pr(s_j = 1) = \Phi(\mathbf{z}_j \boldsymbol{\gamma} + \text{offset}_j^{\gamma})$$

 $\Phi(\cdot)$  is the standard cumulative normal distribution function.

The probability of selection and the outcome  $y_j = v_h$  is

$$\Pr(y_j = v_h, s_j = 1) = \Phi_2 \left( \mathbf{z}_j \boldsymbol{\gamma} + \text{offset}_j^{\gamma}, \kappa_h - x_j \boldsymbol{\beta} - \text{offset}_j^{\beta}, -\rho \right)$$
$$- \Phi_2 \left( \mathbf{z}_j \boldsymbol{\gamma} + \text{offset}_j^{\gamma}, \kappa_{h-1} - \mathbf{x}_j \boldsymbol{\beta} - \text{offset}_j^{\beta}, -\rho \right)$$

 $\Phi_2(\cdot)$  is the cumulative bivariate normal distribution function (with mean  $\begin{bmatrix} 0 & 0 \end{bmatrix}'$ ).

The probability of  $y_j$  not being selected and the outcome  $y_j = v_h$  is

$$Pr(y_j = v_h, s_j = 0) = \Phi_2 \left( -\mathbf{z}_j \boldsymbol{\gamma} - \text{offset}_j^{\gamma}, \kappa_h - x_j \boldsymbol{\beta} - \text{offset}_j^{\beta}, \rho \right)$$
$$- \Phi_2 \left( -\mathbf{z}_j \boldsymbol{\gamma} - \text{offset}_j^{\gamma}, \kappa_{h-1} - \mathbf{x}_j \boldsymbol{\beta} - \text{offset}_j^{\beta}, \rho \right)$$

The probability of outcome  $y_j = v_h$  given selection is

$$\Pr(y_j = v_h | s_j = 1) = \frac{\Pr(y_j = v_h, s_j = 1)}{\Pr(s_i = 1)}$$

The probability of outcome  $y_j = v_h$  given  $y_j$  is not selected is

$$\Pr(y_j = v_h | s_j = 0) = \frac{\Pr(y_j = v_h, s_j = 0)}{\Pr(s_j = 0)}$$

The marginal probabilities of the outcome  $y_i$  are

$$\begin{aligned} & \Pr(y_j = v_1) = \Phi(\kappa_1 - x_j \boldsymbol{\beta} - \text{offset}_j^{\beta}) \\ & \Pr(y_j = v_H) = 1 - \Phi(\kappa_{H-1} - x_j \boldsymbol{\beta} - \text{offset}_j^{\beta}) \\ & \Pr(y_j = v_h) = \Phi(\kappa_h - x_j \boldsymbol{\beta} - \text{offset}_j^{\beta}) - \Phi(\kappa_{h-1} - x_j \boldsymbol{\beta} - \text{offset}_j^{\beta}) \end{aligned}$$

# Also see

- [R] heckoprobit Ordered probit model with sample selection
- [U] 20 Estimation and postestimation commands

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