

## Chapter 16 notes: Simultaneity bias/reverse causation

### 16.1 The Nature of Simultaneous Equation Models

Basic model:  $y_i = \beta_0 + \beta_1 x_i + u_i$

Example: Police and Crime

Estimate of  $\beta_1$  will be biased if

- (1) there is some omitted var  $V$  that affects both  $y$  and  $x$   
(previous example: ability causes both education and wages) or
- (2) reverse causation  $x \rightarrow y$  and  $y \rightarrow x$  (e.g., police  $\rightarrow$  crime crime  $\rightarrow$  police)

Police force and crime are **determined simultaneously**

**2 actors** making choices at the same time

$\rightarrow$  Observe a set of (crime, police) points

Are these criminals' actions or city's? Both.

- potential criminals choosing crime based on how # of police
- city officials choosing police based on how high crime is.

**$\rightarrow$  model the decisions of these actors together to understand the actions of one**

Example: D&S. Suppose we are interested in measuring labor supply. Observe a set of points: hours and wage. How are these determined?

- hours supplied =  $\beta_0 + \beta_1 \text{wage} + \beta_2 \text{nonlabor income} + u_i$
- hours demanded =  $\gamma_0 + \gamma_1 \text{wage} + \gamma_2 \text{price of capital} + e_i$

Again, if observe set of points, these are net results of actions of 2 actors.

**NOTE:** simultaneity does NOT mean one person whose choice of one action affects their choice of another. For example,

- hours supplied =  $\beta_0 + \beta_1 \text{wage} + \beta_2 \text{nonlabor income} + \beta_3 \text{leisure} + u_i$
- leisure hours =  $\gamma_0 + \gamma_1 \text{wage} + \gamma_2 \text{nonlabor income} + \gamma_3 \text{hours supplied} + e_i$

This doesn't make sense. Can't think about how hours supplied changes when wage changes, holding leisure constant.

$\rightarrow$  Each equation should have a behavioral, ceteris paribus interpretation on its own

## 16.2 Simultaneity bias in OLS

We have shown how omitted vars lead to biased coefficients.

Now let's look at how simultaneity leads to a bias. Should make sense intuitively.

Write out the STRUCTURAL MODELS

(equation derived from economic theory--model in terms of causal effects):

$$(1) y_1 = \alpha_1 y_2 + \beta_1 z_1 + u_1 \quad \text{zs are exogenous variables}$$

$$(2) y_2 = \alpha_2 y_1 + \beta_2 z_2 + u_2$$

Know that will not estimate  $\alpha_1$  correctly if  $y_2$  is corr with  $u_1$ . Is it?

$$y_2 = \alpha_2 y_1 + \beta_2 z_2 + u_2$$

$$y_2 = \alpha_2(\alpha_1 y_2 + \beta_1 z_1 + u_1) + \beta_2 z_2 + u_2 \quad [\text{obvious } y_2 \text{ corr with } u_1]$$

$$(1 - \alpha_2 \alpha_1) y_2 = \alpha_2 \beta_1 z_1 + \beta_2 z_2 + u_1 + u_2$$

Assume that  $1 - \alpha_2 \alpha_1 \neq 0$

Divide through by  $1 - \alpha_2 \alpha_1$

$$\rightarrow (3) y_2 = \pi_{21} z_1 + \pi_{22} z_2 + v_2$$

This is the REDUCED FORM—the reduced form parameters are nonlinear functions of the structural parameters

Several important points:

- $v_2$  contains both  $u_1$  and  $u_2 \rightarrow y_2$  is correlated with  $u_1$   
BUT—zs are not correlated with these STRUCTURAL errors
- The interpretation of the parameters in the STRUCTURAL model is different from the REDUCED form. What is held constant in (3) is not same as what is held constant in (1). Will not get same coeff for  $\beta_2$  as for  $\pi_{22}$  (though they are related). Why not?
- Under certain special assumptions, OLS estimates of (1) may be fine. What are these assumptions? IF  $\alpha_2 = 0$ ,  $u_1$  and  $u_2$  are uncorrelated, then  $y_2$  is not corr. with  $u_1$ .
- Sign of the bias

## 16.3 Identifying and Estimating a Structural Equation

Just as in case of endogenous variables in Ch 15 (perhaps due to omitted variable), OLS estimates are biased/inconsistent—estimates are not measures of causal effect

### Use Two Stage Least Squares Estimators—Like before

Sometimes may not be able to identify entire system, but only one equation.

Demand and supply example best illustration of this:

$$\text{Supply: } q = \alpha_1 p + \beta_1 z_1 + u_1$$

$$\text{Demand: } q = \alpha_2 p + u_2$$

$q$ =per capita milk consumption,  $p$ =price milk,  $z$ =price of cattle feed

Which of these equations can we identify? Demand—can use  $z_1$  as an instrument for  $p$  in demand equation

→ changes in  $Z_1$  will shift supply → changing price.

Show this graphically.

What would enable us to identify supply? Demand shifter.

General 2-equation model:

$$y_1 = \beta_{10} + \alpha_1 y_2 + z_1 \beta_1 + u_1 \quad U\text{'s are structural errors}$$

$$y_2 = \beta_{20} + \alpha_2 y_1 + z_2 \beta_2 + u_2$$

$y$ 's are the endogenous variables.

$Z$ s are matrices (sets) of exogenous variables. betas are vectors.

$$z_1 \beta_1 = \beta_{11} z_{11} + \beta_{12} z_{12} + \dots + \beta_{1k_1} z_{1k_1}$$

$$z_2 \beta_2 = \beta_{21} z_{21} + \beta_{22} z_{22} + \dots + \beta_{2k_2} z_{2k_2}$$

The  $z$ 's might partially overlap—might be some of same  $z$ 's in both equations (example, income in city might determine both criminal activity and number of police)

- When can we solve for reduced form? ( $y_1, y_2$  as linear functions of all exogenous vars + structural errors?)  $\alpha_1 \alpha_2 \neq 1$  as before

- When can we identify the equations? Need EXCLUSION RESTRICTIONS: some exogenous variables need to be different in each equation for identification

Recall conditions from before for valid instrument:

- (1) Exogenous—not correlated with error. Means not affected by  $y_s$ , not correlated with omitted vars
- (2) Relevant—has to be included in other equation

Add a third here to make more precise:

- (3) Validly excluded—only effect on  $y_1$  is through effect on  $y_2$

Order condition: (necessary) 1<sup>st</sup> equation has at least one variable that is excluded--total number of exogenous vars must be at least as great as total number of explanatory vars

Rank condition: (necessary and sufficient) 1<sup>st</sup> eqn in a 2 eqn model is identified IFF 2<sup>nd</sup> equation contains at least 1 exogenous variable not in 1<sup>st</sup> equation (validly excluded) AND the coeff on that variable is non-zero in the 2<sup>nd</sup> equation (relevant)

Proceed by 2SLS—the excluded variable is the instrument

Police and crime example—Levitt instrument is point in election cycle