

# Lecture 10

## Endogeneity 4 of 4: Simultaneous Equations Models II

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# Lecture 10 Outline

## Identification & Estimation (2 Equations)

Identifying & Estimating a Structural Equation (2 Equation System)

## Identification & Estimation (More Than 2 Equations)

Systems with More Than 2 Equations

## Summary & References

Summary & References

# Overview

- Lecture 9: OLS biased and inconsistent when applied to structural equation in a SEM.
- Lecture 8: 2SLS solves endogenous explanatory variables problem.
- This lecture: show how 2SLS can be applied to SEMs.
- Mechanics of 2SLS similar to chapter 15.
- Difference: since we specify structural equation for each endogenous variable, can immediately see whether sufficient IVs are available to estimate either equation.
- Begin by discussing identification problem.

## Identification in a 2 Equation System

- Key identifying condition when estimating by OLS is that each explanatory variable is uncorrelated with the error term.
- This fundamental condition no longer holds, in general for SEMs.
- However, if we've some IVs, we can still identify (or consistently estimate) parameters in a SEM equation, just as with omitted variables or measurement errors.
- Before considering a general 2-equation SEM, get intuition from simple supply and demand example with system in equilibrium form (i.e. with  $q_s = q_d = q$ ):

$$q = \alpha_1 p + \beta_1 z_1 + u_1 \quad (1)$$

$$q = \alpha_2 p + u_2 \quad (2)$$

- Given a random sample on  $(q, p, z_1)$ , which of these equations can be estimated? That is, which is an **identified equation**?

## Identification in a 2 Equation System

- To see *demand* equation (2) is identified but the supply equation is not use  $z_1$  as an IV for price in equation (2).
- As  $z_1$  appears in (1), we've no IV for price in the supply equation.
- Intuitively, demand equation identified as we've an observed variable  $z_1$  that shifts supply equation while not affecting demand equation.
- Given variation in  $z_1$  and no errors, can trace out demand curve.
- Unobserved demand shifter  $u_2$  causes us to estimate the demand equation with error, but the estimators will be consistent provided  $z_1$  uncorrelated with  $u_2$ ; supply equation can't be traced out as there are no exogenous observed factors shifting the demand curve.
- Unobservable factors shifting the demand function don't help: need something observable. If as in the labour demand function  $h_d$ , we've an observed exogenous demand shifter e.g. income in the milk demand function, then the supply function would also be identified.
- Summary: *in system of (1) and (2) presence of an exogenous variable in supply equation allows us to estimate demand equation.*

## Identification in a 2 Equation System

Extending identification discussed to a general 2 equation model:

$$y_1 = \beta_{10} + \alpha_1 y_2 + z_1 \beta_1 + u_1 \quad (3)$$

$$y_2 = \beta_{20} + \alpha_2 y_1 + z_2 \beta_2 + u_2 \quad (4)$$

$z_1$  denotes a set of  $k_1$  exogenous variables appearing in the first equation:  $z_1 = (z_{11}, z_{12}, \dots, z_{1k_1})$ . Similarly,  $z_2$  is set of  $k_2$  exogenous variables in second equation:  $z_2 = (z_{21}, z_{22}, \dots, z_{2k_2})$ . In many cases,  $z_1$  and  $z_2$  will overlap. As a shorthand form, use notation:

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

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

Fact that  $z_1$  and  $z_2$  generally contain different exogenous variables means we've imposed **exclusion restrictions** on the models, i.e. we *assume* that certain exogenous variables don't appear in 1st equation and others are absent from the 2nd equation. As we saw with supply and demand examples, this allows us distinguish between the 2 structural equations.

## Identification in a 2 Equation System

- When can we solve (3) and (4) for  $y_1$  and  $y_2$  (as linear functions of all exogenous variables and the structural errors  $u_1$  and  $u_2$ )?
- The condition is the same as in the last lecture, *viz.*  $\alpha_2\alpha_1 \neq 1$ .
- Under this ass, reduce form exist for  $y_1$  and  $y_2$ .
- Key question is: under what assumptions can we estimate parameters in say (3)? This is the identification issue.

## Identification in a 2 Equation System

- **Rank condition** for identification of structural equation (3): First equation in 2-equation SEM is identified  $\iff$  *second* equation contains at least one exogenous variable (with a nonzero coefficient) that is excluded from the first equation – necessary and sufficient condition for (3) to be identified.
- **Order condition** is necessary for the rank condition.
- The order condition for identifying the 1st equation states that at least one exogenous variable is excluded from this equation – trivial to check once both equations have been specified.
- Rank condition requires more: at least one of the exogenous variables excluded from the 1st equation must have a nonzero population coefficient in the 2nd equation – ensures at least one of the exogenous variables omitted from the 1st equation actually appears in the reduced form of  $y_2$  so can use these variables as instruments for  $y_2$ ; can test this using  $t$  or  $F$  test.
- Examples.

## Estimation by 2SLS

- Once we have determined an equation is identified, we can estimate via 2SLS.
- IV consist of exogenous variables appearing in either equation.
- Example 16.5.
- Estimating the effect of openness on inflation by IV is also straightforward: e.g. 16.6.
- Question 16.3.

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# Identification in Systems with 3 or More Equations

- SEMs can consist of more than 2 equations.
- General identification of these models is difficult and requires matrix algebra.
- Once an equation in a general system has been shown to be identified, it can be estimated by 2SLS.

## Identification in Systems with 3 or More Equations

- 3-equation system illustrates identification issues with complicated SEMs.

$$y_1 = \alpha_{12}y_2 + \alpha_{13}y_3 + \beta_{11}z_1 + u_1 \quad (5)$$

$$y_2 = \alpha_{21}y_1 + \beta_{21}z_1 + \beta_{22}z_2 + \beta_{23}z_3 + u_2 \quad (6)$$

$$y_3 = \alpha_{32}y_2 + \beta_{31}z_1 + \beta_{32}z_2 + \beta_{33}z_3 + \beta_{34}z_4 + u_3 \quad (7)$$

- Generally difficult to show an equation in a SEM with more than 2 equations is identified but easy to see when specific equations are *not* identified: (7) since every exogenous variable appears in this equation, we have no IVs for  $y_2$ , so can't consistently estimate the parameters of this equation.
- OLS estimation will not usually be consistent.
- (5) is identified:  $z_2, z_3$  and  $z_4$  all excluded from the equation (another e.g. of *exclusion restrictions*) and although there are 2 endogenous variables in this equation, we've 3 potential IVs for  $y_2$  and  $y_3$ , so (5) passes the order condition.

# Identification in Systems with 3 or More Equations

## Order Condition for Identification of General SEMs

- An equation in any SEM satisfies the order condition for identification if the number of *excluded* exogenous variables from the equation is at least as large as the number of RHS endogenous variables.
- The second equation (6) also passes the order condition because there's one excluded exogenous variable,  $z_4$  and one RHS endogenous variable,  $y_1$ .
- As discussed in chapter 15 and in previous section, order condition is necessary (not sufficient) for identification.
- E.g. if  $\beta_{34} = 0$ ,  $z_4$  appears nowhere in the system, so it's not correlated with  $y_1$ ,  $y_2$  or  $y_3$ ; if  $\beta_{34}=0$ , then the second equation is not identified, because  $z_4$  is useless as an IV for  $y_1$ ; this again illustrates that identification of an equation depends on the values of the parameters (which we can never know for sure) in the other equations.

## Identification in Systems with 3 or More Equations

- Nomenclature on overidentified and just identified equations originated with SEMs.
- In terms of order condition (5) is an **overidentified equation** since we need only 2 IVs (for  $y_2$  and  $y_3$ ) but we have 3 available ( $z_2, z_3$  and  $z_4$ ): there's one overidentifying restriction in this equation.
- In general, number of overidentifying restrictions equals the total number of exogenous variables in the system minus the total number of explanatory variables in the equation.
- Equation (6) is a **just identified equation** and the third equation is an **unidentified equation**.

## Estimation in Systems with 3 or More Equations

- Each identified equation can be estimated by 2SLS.
- Instruments for particular equation: exogenous variables in system.
- Tests for endogeneity, heterogeneity, serial correlation and overidentifying restrictions as before.
- When system is correctly specified (and certain additional assumptions hold), *system estimation methods* generally are more efficient than estimating each equation by 2SLS.
- Most common system estimation method in context of SEMs is *Three stage least squares* (not covered in this course – see advanced Wooldridge).

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- 2SLS solves endogenous explanatory variables problem in SEMs (OLS biased and inconsistent when applied to structural equation in a SEM).
- Key: identify equations in a SEM before estimation via 2SLS – rank and order conditions.
- With more than two equations, once an equation is identified (trickier – focus on which equations are not identified), it can be estimated by 2SLS.
- Equations in a SEM are:
  1. Overidentified if there are more available IVs than we need.
  2. Just (exactly) identified if the number of available IVs is exactly the same as the number we need.
  3. Underidentified  $\equiv$  unidentified otherwise.
- Note that system estimation methods are more efficient than estimating each equation separately by 2SLS.

# References

- Simultaneous Equations Models II: Wooldridge 16.3-4.