



Nature of Econometrics

Overview and Economic Data

Read Wooldridge (2013), Chapter 1

Outline

- I. What is Econometrics?
- II. Steps in Empirical Economic Analysis
- III. The Structure of Economic Data
- IV. Causality

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I. What is Econometrics?

- 1) 2000 baht cheque handout
 - a stimulus package to jump start the economy from the economic crisis of 2008
- We want to determine the effect of government expenditures on GDP or economic growth.

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A Stock Analyst

- Effect of past stock returns on the stock price
- Effect of profit margins on stock values.
 - Economic fundamentals are the real “characteristics of the firm”.

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Econometrics Defined



- Econometrics means “economic measurement”
- **Jeffery Wooldridge (2009)**
Econometrics is based upon the development of statistical methods for
 - o estimating economic relationships
 - o testing economic theories, and
 - o evaluating and implementing government and business policy”

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II. Steps in Empirical Economic Analysis



Empirical economic analysis – uses data to test a theory or to estimate a relationship.

- **1) Formulating a question of interest:**
- We should have
 - a statement of theory or hypothesis
 - specifications of the economic model and
wine = f(price, income)
 - econometric models.

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Economic Model



- Example: Demand for imported wine (y) over 1994-1998.

Economic (Mathematical) Model

$$wine = \beta_0 + \beta_1 price + \beta_2 income$$

Econometric Model

$$wine_t = \beta_0 + \beta_1 price_t + \beta_2 income_t + u_t$$

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u_t : unobserved Factors



- $wine_t = \beta_0 + \beta_1 price_t + \beta_2 income_t + u_t$
 u_t : unobserved factors. They are factors that affect wine other than price and income.
- “ u_t ” is called the **error** term or **disturbance** term.
- What are some “ u_t ” in the wine example?

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2) Gathering Data



- Empirical economic analysis
- Wine Consumption between 1994:10 to 1998:09 (research done by Panipa Changpetch)
 - wine* : quantity of imported *wine* demand.
Excise Department (**thousands of liters**)
 - price* : *price* of imported wine
Ministry of Commerce (baht)
 - income* : personal *income*
National income data from NESDB (**millions of baht**)

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Experimental vs. Nonexperimental



- Nonexperimental data
 - Examples:
 - wine prices (Commerce Ministry)
 - wine imports (Custom Department)
 - disposable income (NESDB)
- Experimental data – from laboratory
 - values obtained from controlled experiments

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3) Estimating the model



- Want to find the values of these parameters, β_0 , β_1 and β_2 from the model.
 $wine = \beta_0 + \beta_1 price + \beta_2 income + u$
- From Estimation: Regression Analysis
- Estimates: $\hat{\beta}_0 = 1738$; $\hat{\beta}_1 = -9.1$; $\hat{\beta}_2 = .0027$

$$\widehat{wine} = 1738 - 9.1price + 0.0027 income$$

- If price increases by one baht, the predicted value of the quantity demanded decreases by 9,100 liters, *ceteris paribus*.
- If income increases by one million baht, the predicted value of wine consumption increases by .0027 thousand liters or 2.7 liters, *ceteris paribus*.

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Eviews Results



Dependent Variable: WINE				
Method: Least Squares				
Sample: 1994:10 1998:09				
Included observations: 48				
Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	1738.059	584.4014	2.974085	0.0047
PRICE	-9.14414	0.743276	-12.30249	0
INCOME	0.00276	0.00181	1.524716	0.1343
R-squared	0.937366	Mean dependent var	530.3638	
Adjusted R-squared	0.934582	S.D. dependent var	299.6162	
S.E. of regression	76.63244	Akaike info criterion	11.57638	
Sum squared resid	264263.9	Schwarz criterion	11.69333	
Log likelihood	-274.833	F-statistic	336.7305	
Durbin-Watson stat	1.945696	Prob(F-statistic)	0	

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4) Testing Hypothesis

- We want to test various hypotheses, which can state in terms of the unknown parameters.
 - Test whether price has any effect on wine demand

$$wine = \beta_0 + \beta_1 price + \beta_2 income + u$$

$$H_0: \beta_1 = 0$$
- Such confirmation and refutation of sample evidences is based on a branch of statistical theory – **statistical inference** – learning something about the population from a sample.
 - hypothesis testing

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5) Interpreting the result

- Prediction and forecasting
- What is the predicted value of the quantity demanded of wine when $price=200$ baht and $income=250,000$ million baht?
 - $\hat{wine} = 1738 - 9.1price + 0.0027 income$
 $\hat{wine} = 599.1760.$

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III. The Structure of Economic Data

- Cross section
- Time series
- Pooled cross section
- Panel or longitudinal data

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1) Cross-sectional Data

- Cross-sectional data** refer to data collected from a population at a given point in time.
 - Example: a sample of individuals, households, firms, provinces, countries, or a variety of other units.
 - A Cross Section Data Set on Wages and Other Individual Characteristics [see Table]

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A Cross Section Data Set on Wages and Other Individual Characteristics



obsno	wage	educ	exper	female	married
1	3.10	11	2	1	0
2	3.24	12	22	1	1
3	3.00	11	2	0	0
4	6.00	8	44	0	1
5	5.30	12	7	0	1
..
..
..
525	11.56	16	5	0	1
526	3.50	14	5	1	0

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Cross-sectional Data



Random sampling – assumption

- Example: Draw a random sample of 526 people from the working population.
- This requires that observations are **independently** drawn.

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Cross-sectional Data



- Random sampling – definition
If Y_1, Y_2, \dots, Y_n are independent random variables with a common pdf $f(y; \mu, \sigma^2)$, then $\{Y_1, Y_2, \dots, Y_n\}$ is a random sample from the population represented by $f(y; \mu, \sigma^2)$
- *We also say that*
 - Y_i are **i.i.d.** (independent, identically distributed) random variables from a distribution.

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2) Time series data



- A time series is data of a variable or several variables collected at different times.
 - Unlike cross section data, order is important.
 - Note that time series economic data can rarely be assumed to be drawn from a random sample.
 - Trends and seasonality will be important

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A time series data set of foreign wine consumption in Thailand

<i>obs</i>	<i>year</i>	<i>Wine</i>	<i>Price</i>	<i>Income</i>
1	1994:10	131	241.41	228133.8
2	1994:11	408	213.82	230330.7
3	1994:12	404	218.18	235050.6
4	1995:01	200	237.35	235835.9
5	1995:02	264	238.24	236490.2

46	1998:07	265.59	240.8445	229220.3
47	1998:08	151.41	234.0185	228601
48	1998:09	221.54	230.874	224751.3

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3) Pooled Cross Sections

- The data from pooled cross sections have both cross-sectional and time series features.
- Example: The cross-sectional household survey (Socioeconomic Survey) in Thailand: one in 2006 and another in 2008
 - In each year, a random sample of households is surveyed for variables such as income, saving, family size, and so on.
 - Two years of housing prices (1993, 1995).

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A Data Set of Pooled Cross Sections

<i>obsno</i>	<i>year</i>	<i>hprice</i>	<i>proptax</i>	<i>sprft</i>	<i>bdrms</i>	<i>bthrms</i>
1	1993	85500	42	1600	3	2.0
2	1993	67300	36	1440	3	2.5
3	1993	134000	38	2000	4	2.5
..
..
..
250	1993	243600	41	2600	4	3.0
251	1995	65000	16	1250	2	1.0
252	1995	182400	20	2200	4	2.0
253	1995	97500	15	1540	3	2.0
..
..
520	1995	57200	16	1100	2	1.5

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Pooled Cross Sections - continue

- Advantages:
 1. An increase of sample size.
 2. A study of a key relationship changing over time: a change in new policy.

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4) Panel Data (Longitudinal data)



- A panel data set consists of *a time series for each cross sectional member* in the data set.
- We follow the same random individual observations over time – known as panel data or longitudinal data
- Example:
 - Investment and financial data of the same set of firms over a five-year time period.
 - A two-year panel data set on city crime statistics

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A Panel Data Set on City Crime Statistics



obsno	city	year	murders	population	unem	police
1	1	1986	5	350000	8.7	440
2	1	1990	8	359200	7.2	471
3	2	1986	2	64300	5.4	75
4	2	1990	1	65100	5.5	75
..
..
..
297	149	1986	10	260700	9.6	286
298	149	1990	6	245000	9.8	334
299	150	1986	25	543000	4.3	520
300	150	1990	32	546200	5.2	493

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Panel Data - Continue



- Advantages
 - 1) same unit allows us to control certain unobserved characteristics of individuals and other units.
 - 2) it allows us to study the importance of lags in behavior or the result of decision making

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IV. Causality



- In most tests of economic theory and certainly for evaluating public policy, the goal is to infer that one or more variables have a causal effect on another variable.
 - Infer – to form an opinion that something is probably true because of information that you have.
- Simply establishing a relationship between variables is rarely sufficient

$$wine = \beta_0 + \beta_1 price + u$$

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The Question of Causality



- If we've truly controlled for enough other variables, then the estimated ceteris paribus effect can often be considered to be causal.
- The notion of "ceteris-paribus" plays an important rule in economics.
 - "Ceteris paribus" refers to other things being equal.

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Example of Causality



- Example : find the effect of price on wine consumption.
$$wine = \beta_0 + \beta_1 price + \beta_2 income + u$$
 - Relationship between **two** variables.
 - Question: given an increase in price, by how much will the wine consumption increase?
- While the error term, u , includes other factors affecting wine consumption. We want to control for as much as possible
- Some things are still unobserved, which can be problematic.

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Recap of Overview



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- Steps in Empirical Economic Analysis
- The Structure of Economic Data
- Causality

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GRADING SYSTEM



- 15 percent on homework assignments,
- 40 percent on the midterm examination and
- 45 percent on the final.
- Note that Students are strongly advised to attend lectures, for attendance will be checked randomly and be used partially to adjust grade distribution.

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Grade distribution is as follows:



90-100	A;
80-90	B+;
65-80	B;
55-65	C+;
45-55	C;
35-45	D+;
25-35	D;
below 25	F.

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