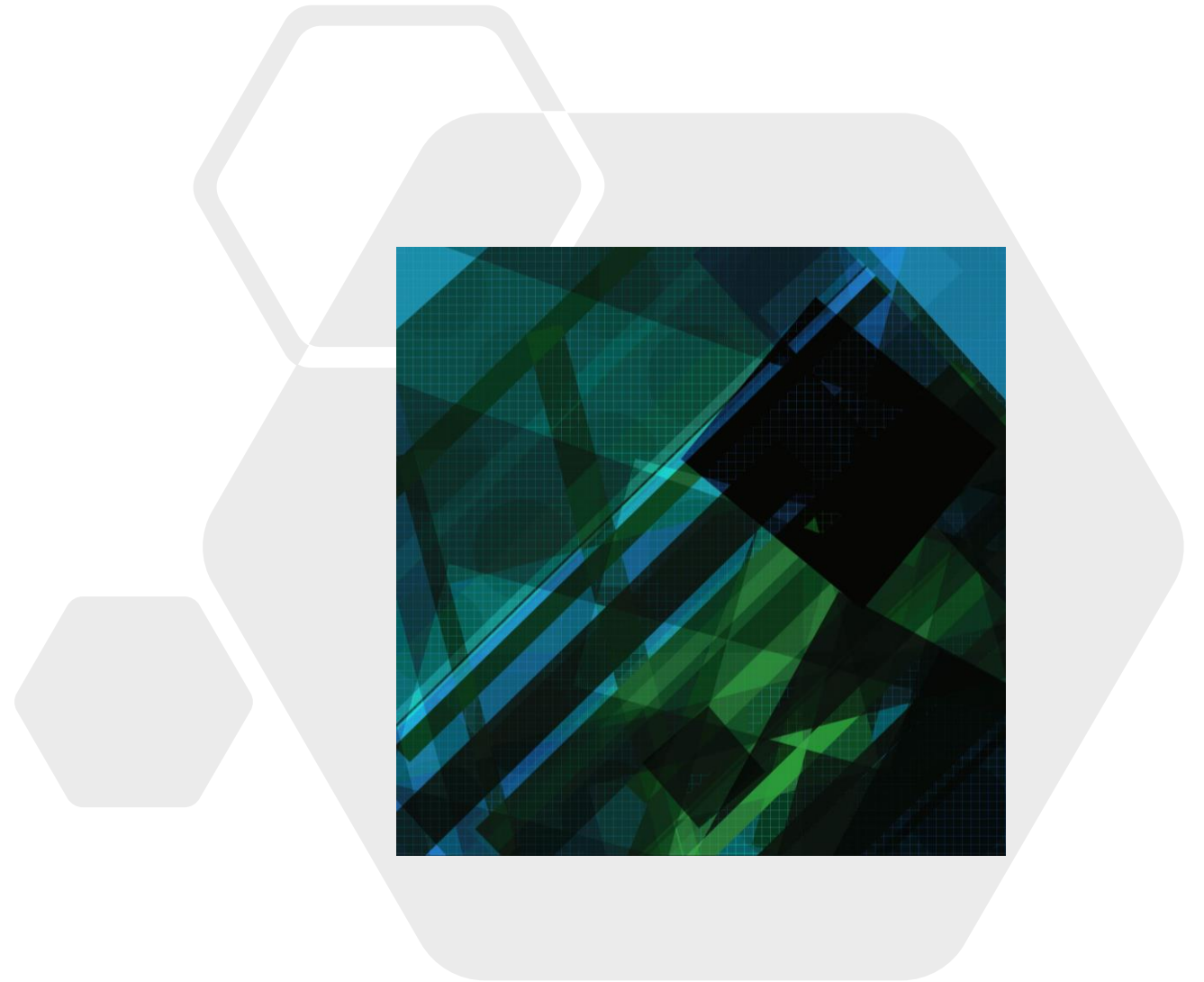


# Intermediate Econometrics

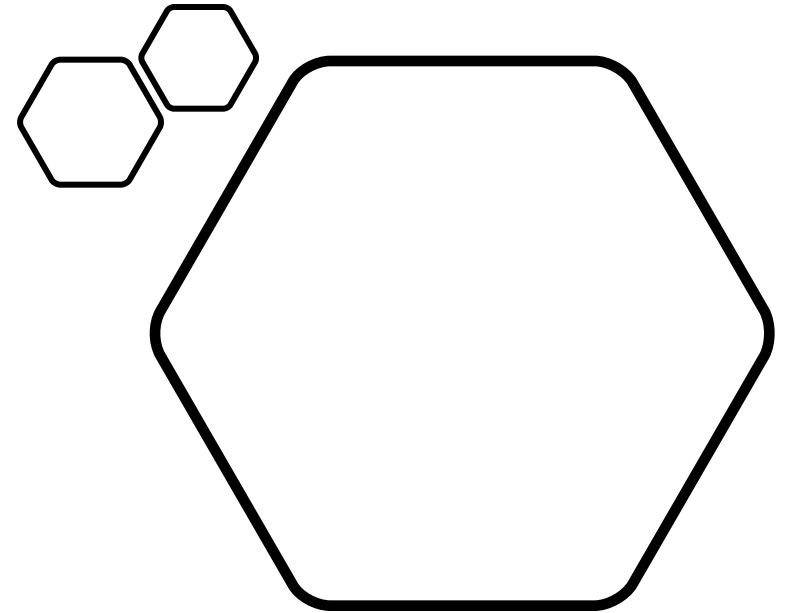
IMQF & MEAE 2024/25

Aleksandra Nojković



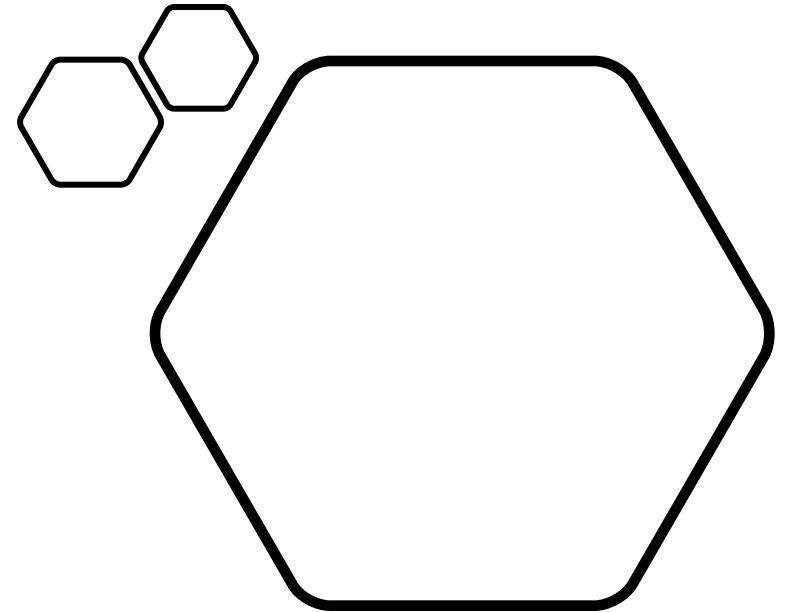
# INTRODUCTION

- What is Econometrics?
- The Stages of Econometrics Work
- The Structure of Economic Data



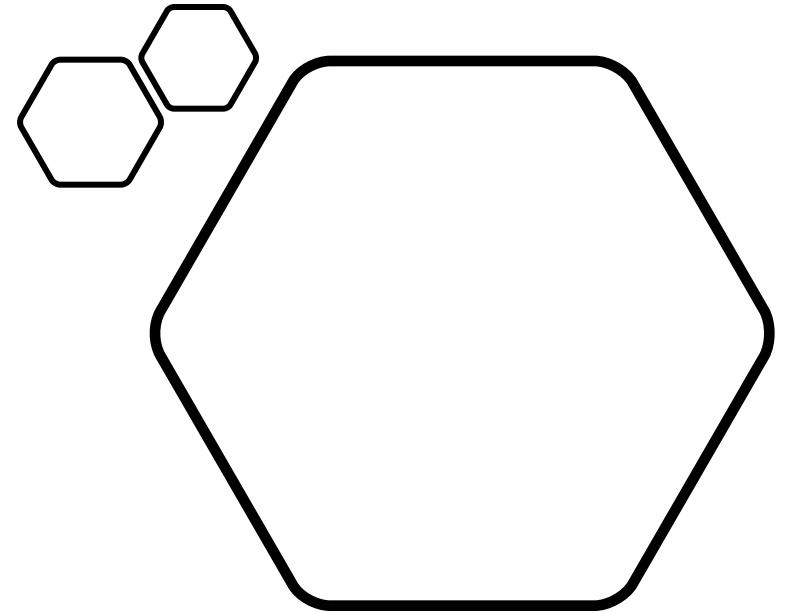
# Introduction

- What is Econometrics?
- Responses vary from the silly “Econometrics is what econometricians do” to the serious “Econometrics is the study of the application of statistical methods to the analysis of economic phenomena”



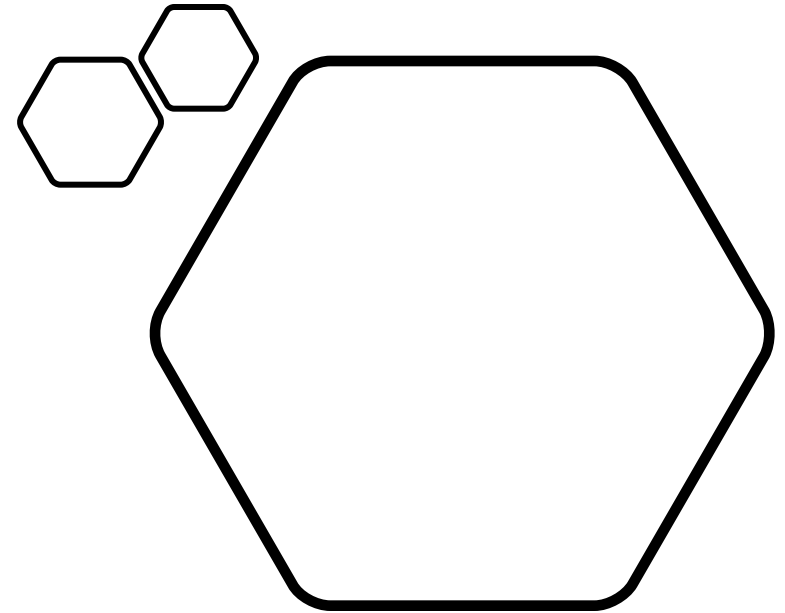
# Introduction (II)

- Econometrics is the interaction of economic theory, observed data and statistical methods
- The interaction of these three that makes econometrics interesting, challenging, and, perverse, difficult

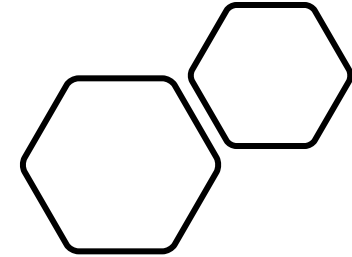


# Introduction (III)

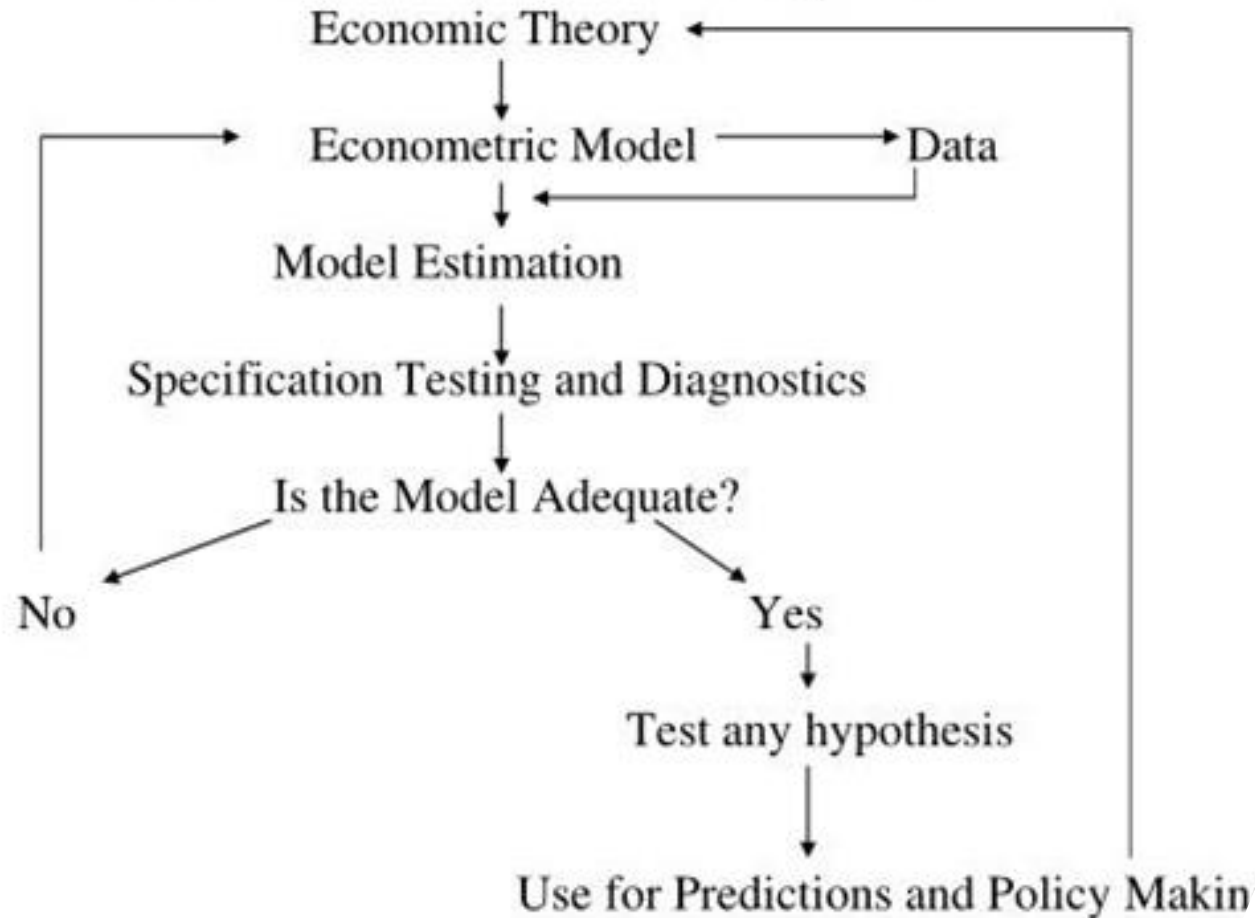
- Econometric methods are used in many branches of the economy, including finance, labor economics, macroeconomics, microeconomics, marketing, and economic policy
- Application will be found far more broadly, in virtually all the social sciences and elsewhere



# Applied Econometrics



## The Stages of Applied Econometric Analysis



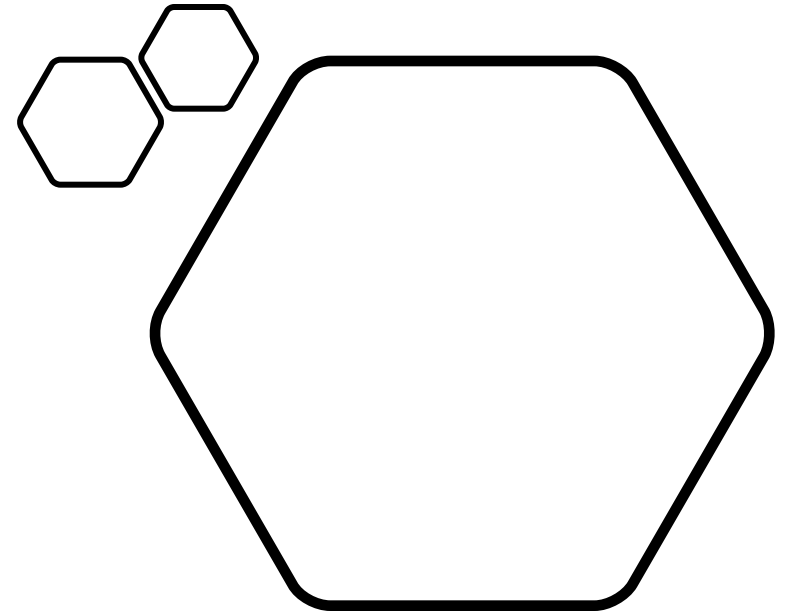
# About econometrics: cooperation vs specific

- Economics and econometrics
- Demand for money model:

$$m = f(Y, r), \text{ where}$$

$m$  – real money;  $Y$  – real income and  $r$  – interest rate.

- Defining variables
- Form of function  $f(\cdot)$
- Quantification of the above relationship (estimate and predict economic variables)

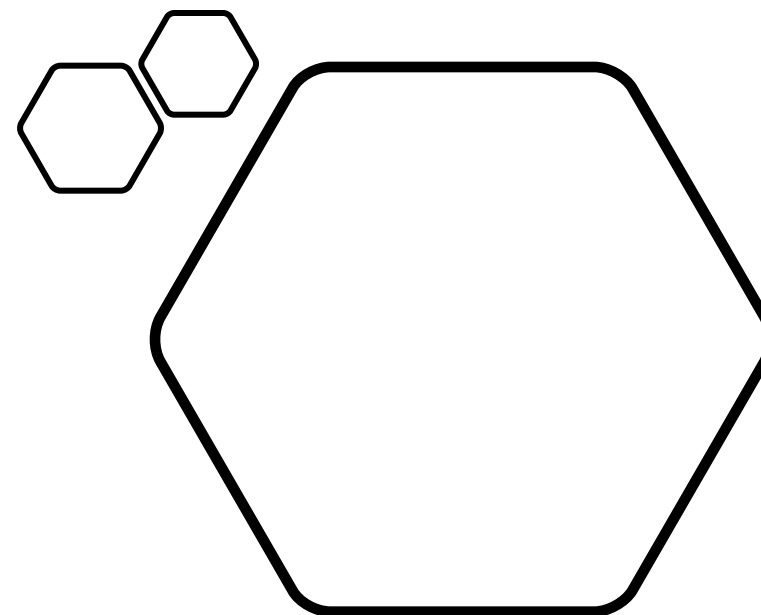


# About econometrics: cooperation vs specific (II)

- Statistics and econometrics
- Econometric model:

$$m = \theta_1 + \theta_2 Y + \theta_3 r + \varepsilon.$$

- Most important component of any econometric analysis: dealing with *error term* or *disturbance term*  $\varepsilon$
- Development of statistical techniques appropriate to the empirical problems characterizing the science of econometrics



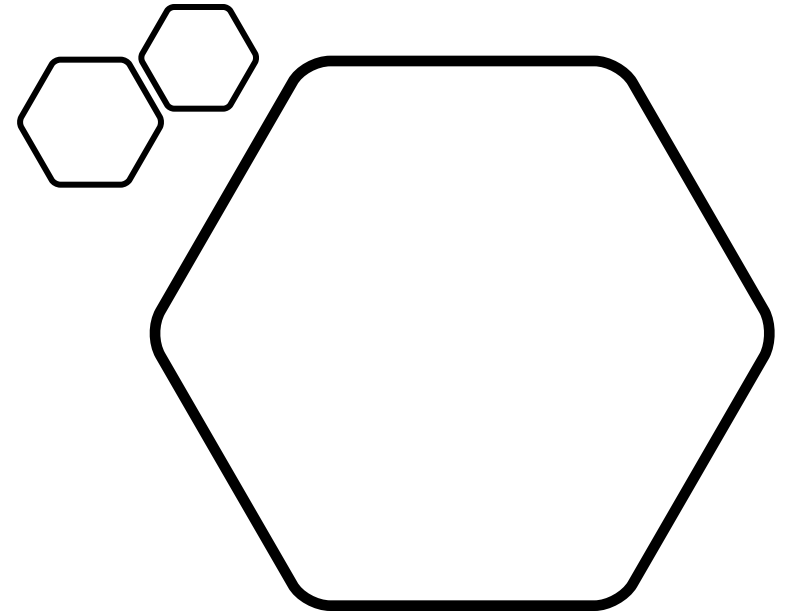


# The Structure of Economic Data

- There are three different types of economic data:

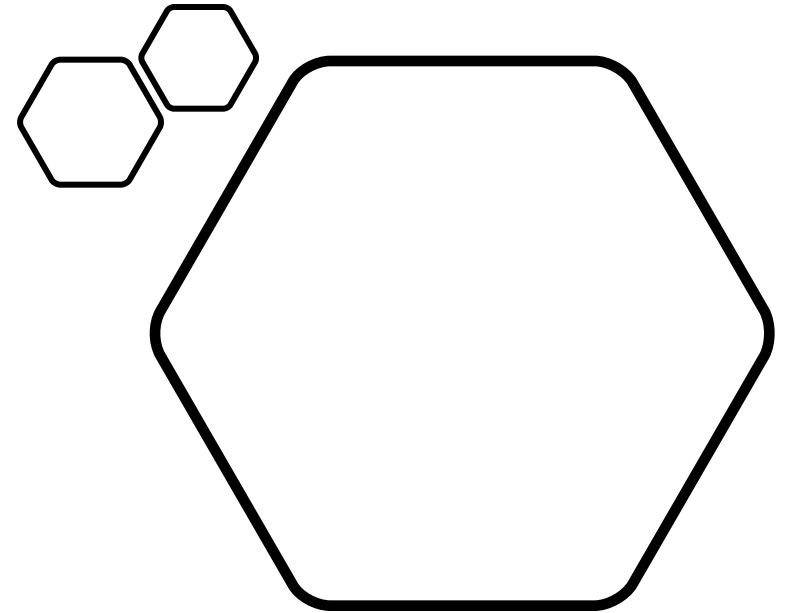
- 1) Cross-sectional
- 2) Time series
- 3) Panel data

+ Dummy variables



# Cross-Sectional Data

- Data on different entities (individuals) – workers, consumers, firms, governmental unites, countries , and so forth – for a single time period
- For example, the data on GDP in 2016 for OECD countries or data on income for 2016 LFS in Serbia



# Example 1: Cross-sectional data (source: Wooldridge, 2021)

**TABLE 1.1 A Cross-Sectional Data Set on Wages and Other Individual Characteristics**

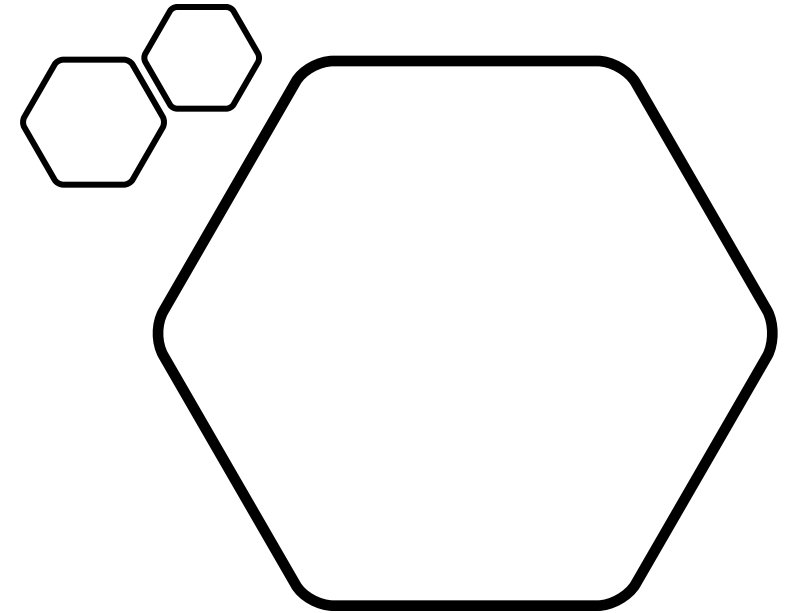
obsno	wage	educ	exper	female	married
1	3.10	11	2	1	0
2	3.24	12	22	1	1
3	3.00	11	2	0	0
4	6.00	8	44	0	1
5	5.30	12	7	0	1
.	.	.	.	.	.
.	.	.	.	.	.
.	.	.	.	.	.
525	11.56	16	5	0	1
526	3.50	14	5	1	0

# Example 2: Cross-sectional data (source: Wooldridge, 2021)

obsno	country	gpcrgdp	govcons60	second60
1	Argentina	0.89	9	32
2	Austria	3.32	16	50
3	Belgium	2.56	13	69
4	Bolivia	1.24	18	12
.	.	.	.	.
.	.	.	.	.
.	.	.	.	.
61	Zimbabwe	2.30	17	6

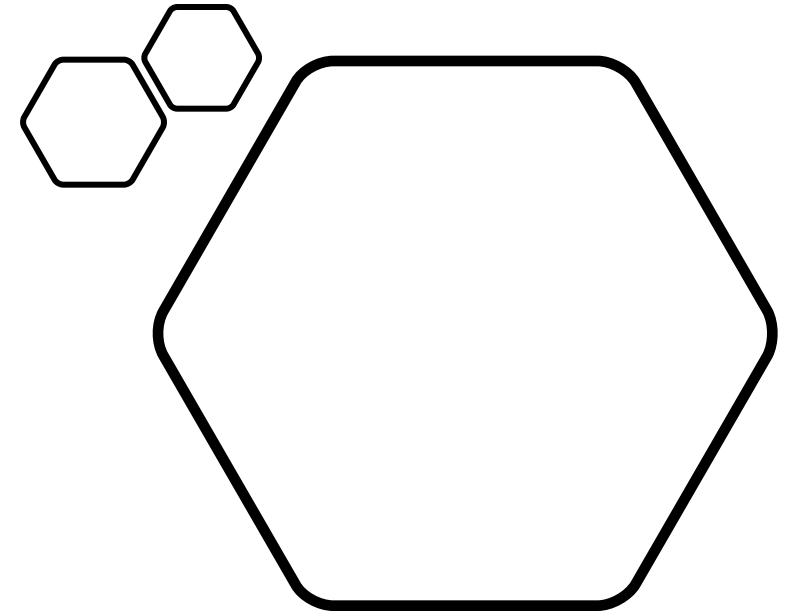
# Time Series Data

- Data for a single entity (person, firm, country) collected at multiple time periods or data set consists of observations on a variable over time
- Examples of time-series data include stock prices, money supply, consumer price index, GDP, annual homicide rates, and automobile sales figures
- Time is important dimension and the chronological ordering of observation in a time series carries potentially important information



# Time Series Data (II)

- More difficult to analyze because economic time series are dependent across time and data sets are related (often, strongly related) to their recent history
- Some modifications to standard econometric techniques have been developed to address specific nature of economic variables
- Data frequency at which data are collected (daily, weekly, monthly, quarterly or annually)
- Some specifics of TS data: trends, seasonality, volatility, and non-standard observations (i.e., structural breaks)

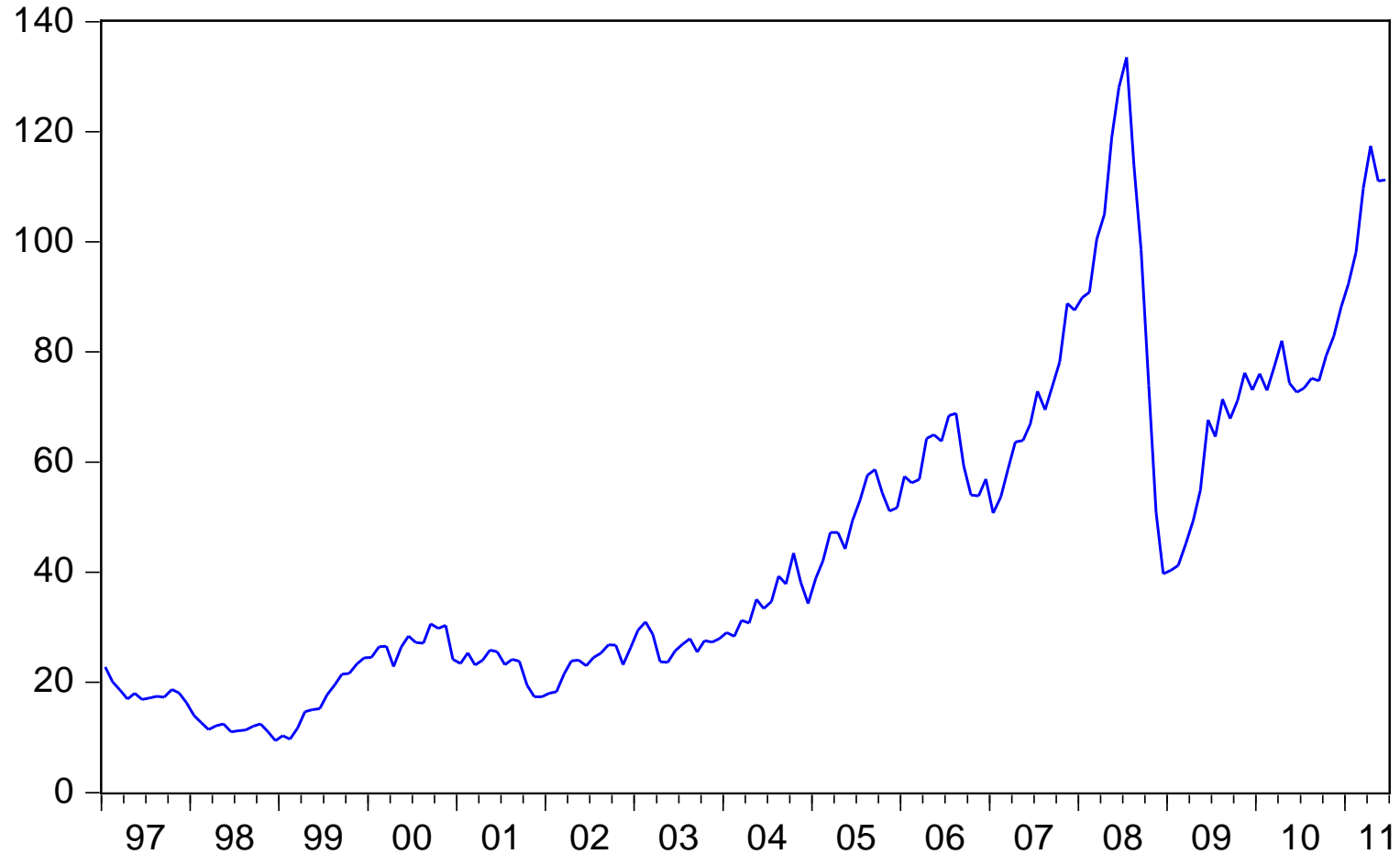


# Example 3: Time series data (source: Wooldridge, 2021)

obsno	year	avgmin	avgcov	prunemp	prgnp
1	1950	0.20	20.1	15.4	878.7
2	1951	0.21	20.7	16.0	925.0
3	1952	0.23	22.6	14.8	1015.9
.	.	.	.	.	.
.	.	.	.	.	.
.	.	.	.	.	.
37	1986	3.35	58.1	18.9	4281.6
38	1987	3.35	58.2	16.8	4496.7

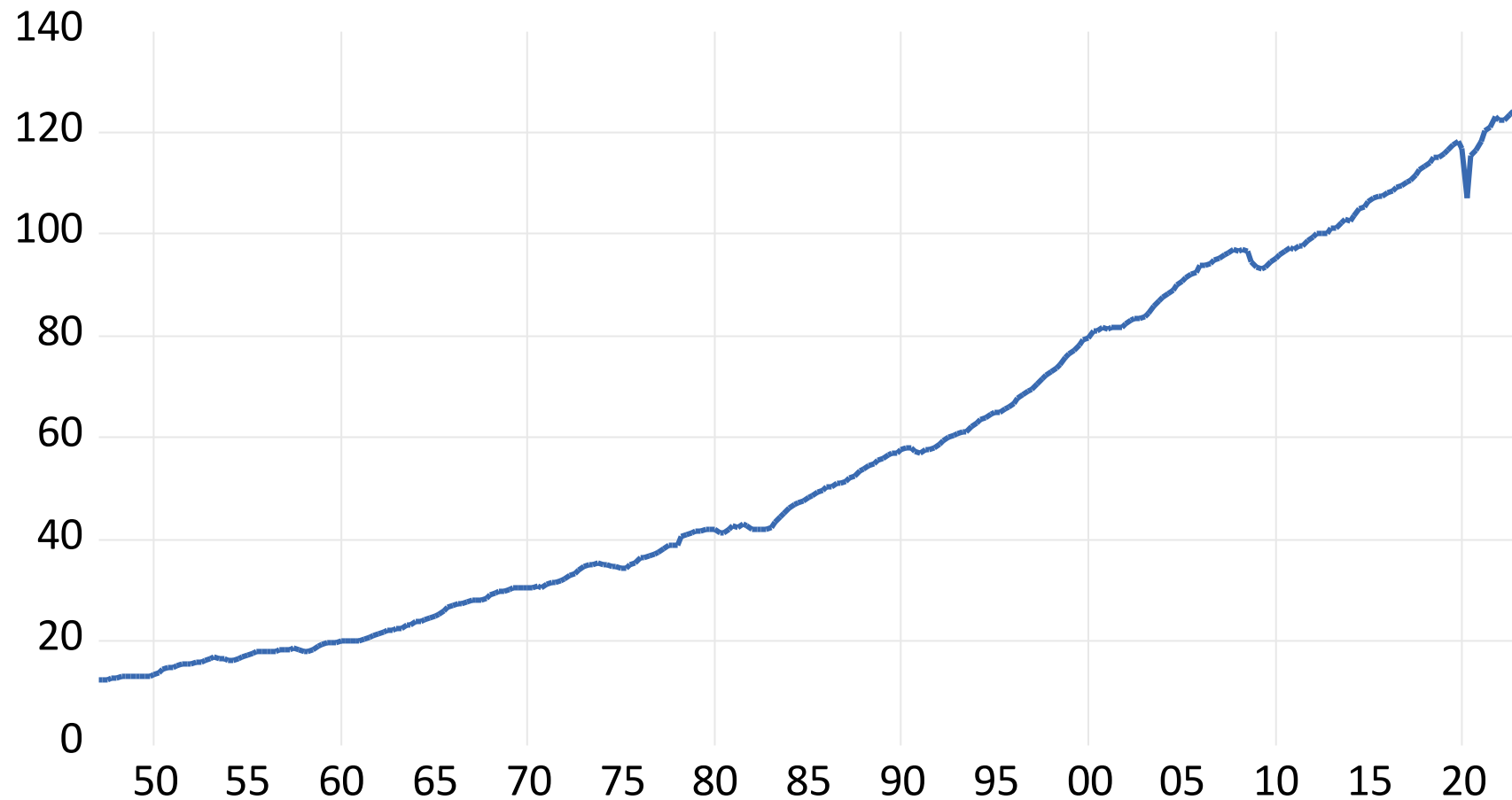
# Example 4: Oil price

(USD per barrel, period: 1997M1-2011M6)

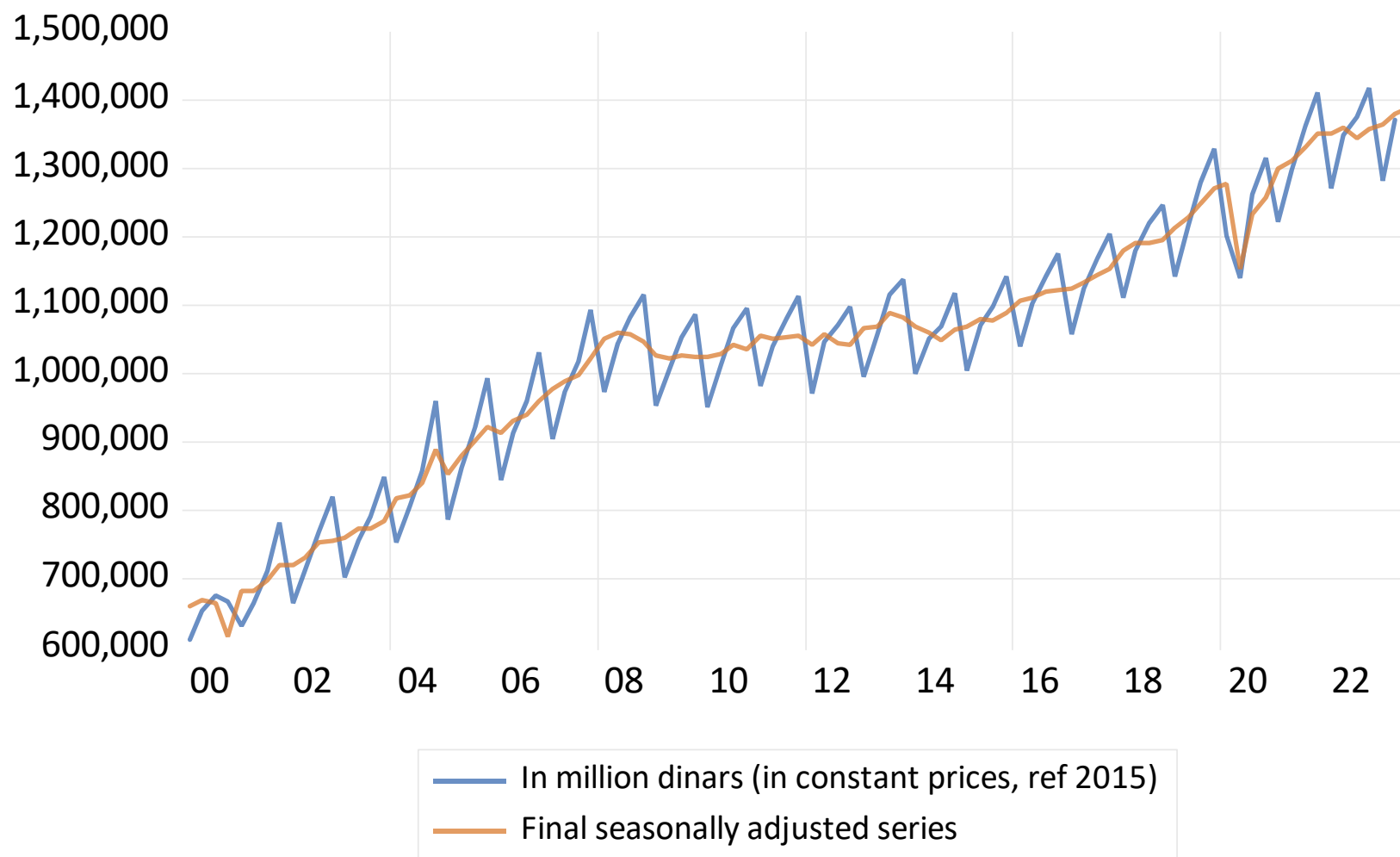




# Example 5: US data on GDP (SA, in billions of 2012 dollars, period: 1947Q1-2023Q2)

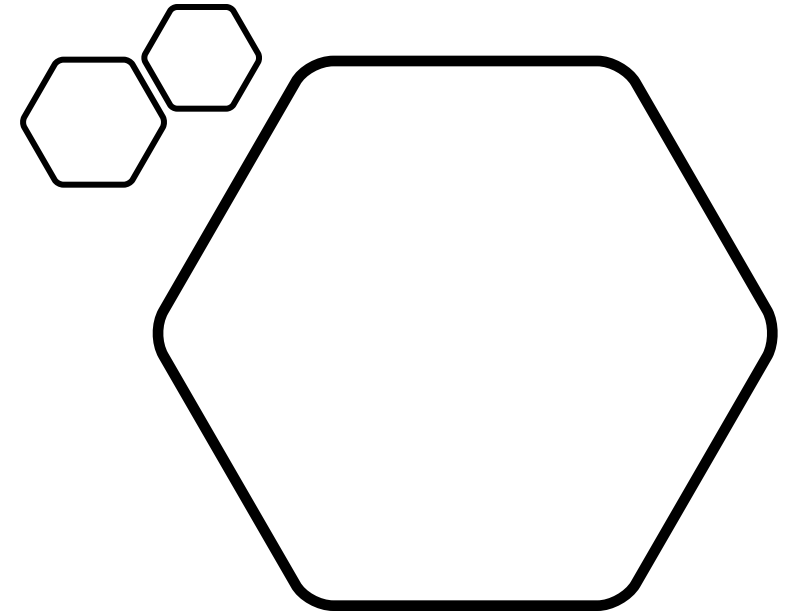


# Example 6: Serbian data on GDP (period: 2000Q1-2023Q2)



# Panel Data/Longitudinal Data

- Same cross-sectional units (individuals, firms, or countries) are followed over a given period
- As an example, suppose we have wage, education or employment history for a set of individuals followed over a ten-years period or data on GDP for 20 OECD countries from 1997 – 2022
- Observing the same units over time leaves to several advantages, but more needs to be done in terms of modification and embellishment to standard econometric techniques



# Example 7: Panel data (source: Wooldridge, 2021)

**TABLE 1.5 A Two-Year Panel Data Set on City Crime Statistics**

obsno	city	year	murders	population	unem	police
1	1	1986	5	350,000	8.7	440
2	1	1990	8	359,200	7.2	471
3	2	1986	2	64,300	5.4	75
4	2	1990	1	65,100	5.5	75
.	.	.	.	.	.	.
.	.	.	.	.	.	.
.	.	.	.	.	.	.
297	149	1986	10	260,700	9.6	286
298	149	1990	6	245,000	9.8	334
299	150	1986	25	543,000	4.3	520
300	150	1990	32	546,200	5.2	493

# Example 8: panel of 12 CEE countries (N=12) in period 1995-2018 (T=24)

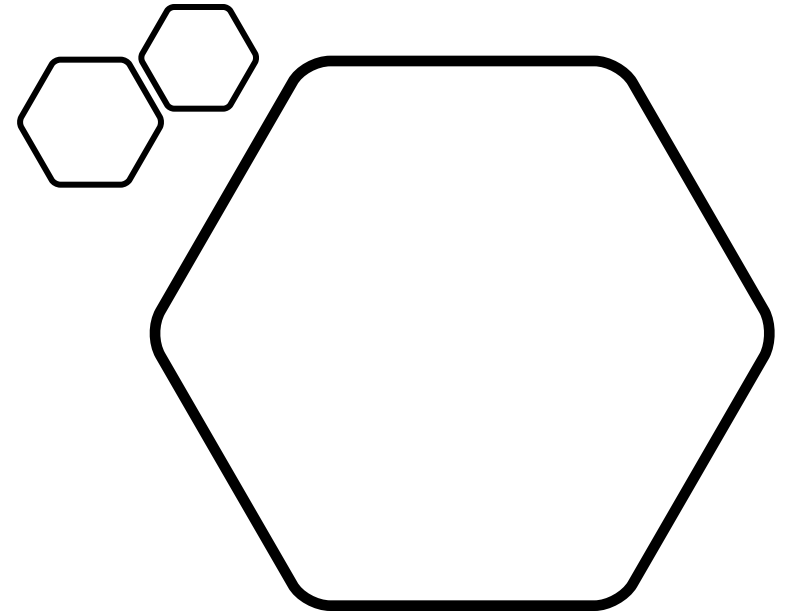


# The Structure of Economic Data - Notation

1) Cross-sectional:  $Y_i, i=1,2,\dots,N$  ( $n$ )

2) Time series:  $Y_t, t=1,2,\dots, T$

3) Panel data:  $Y_{it}, i$  and  $t$  defined as above  
(number of obs.  $N \times T$ )



# Econometric software

- All major commercial software packages for econometrics can be used
- Tables in this course reproduce EViews output. Output from other applications look very similar
- Practical lessons in EViews (Stata) will be provided to the students enrolled in this course

