## Introduction to Econometrics

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### Introduction

 The principal objective of any science is the generation of testable hypotheses and conjectures regarding its object of study

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- Reality is complex  $\implies$  simplification is needed
- Theoretical models and their variables

### How are theoretical models evaluated?

- Internal mathematical consistency
- Contrast refutable hypotheses generated with observed reality
- Example from microeconomic theory:
  - Collection of assumptions regarding utility and consumer behavior
  - Obtain  $q = f(p, \rho, w)$
  - Is the conjecture that q is a function of p, ρ, and w supported by the reality we observe?

## What is Econometrics?

- Econometrics has been defined as the set of concepts, methods and procedures used to summarize and analyze economic data that correspond to the economic variables that appear in economic models.
- But, it is more than that:
  - Its methods and procedures can be used in other social and natural sciences

- It helps theoretical economists develop better theoretical models
- It can be used for forecasting and policy evaluation

### Economic data

- stochastic and mostly observational/non-experimental
- stochastic data that emerge from stochastic phenomena have certain regularities
- stochastic regularity => we can make probabilistic statements about generating phenomena
- Observational data produced by processes not controlled by researcher

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#### Representing data

If X represents a variable of interest. We represent *n*observations on X as  $\{X_k\}_{k=1}^n$ :

- When k is an index representing time, we say that {x<sub>k</sub>}<sup>n</sup><sub>k=1</sub> is a time series on X.
- When k represents something other than time, e.g., a specific economic agent, a region of the country, etc. we say that {X<sub>k</sub>}<sup>n</sup><sub>k=1</sub> is a cross-section on X.
- When k = (i, t) with i = 1, 2, ...N and t = 1, 2, ...T indexing sections and time respectively, we say that {X<sub>it</sub>}<sup>N,T</sup><sub>i=1,t=1</sub> is a panel on X.

# Types of data

- ► X is said to be measured in ratio scale if for any two observation x<sub>k</sub> and x<sub>s</sub>:
  - 1.  $\frac{x_k}{x_s}$  is meaningful
  - 2.  $x_k x_s$  is meaningful
  - there exists an order relation between x<sub>k</sub> and x<sub>s</sub>, i.e., x<sub>k</sub> ≥ x<sub>s</sub> or x<sub>k</sub> ≤ x<sub>s</sub> or both.
- X is said to be measured in interval scale if 2 and 3 are valid, but 1 is not. Example: time.
- X is said to be measured in ordinal scale if 3 is valid, but not 1 and 2. Examples: income level (upper, middle, low), educational level (High School degree, Bachelor's degree, Graduate degree), etc.
- The variable X is said to be measured in nominal scale if neither 1, 2 or 3 are valid. Examples: marital status, gender and employment status.
- Variables measured in ordinal or nominal scales are normally referred to as categorical data.

## Statistical Models

- A statistical model is a set of general assumptions regarding the stochastic nature of the phenomenon which produced the observed data.
- These assumptions should be general enough to account for the stochastic regularity patterns exhibited by the data.
- A precise description of a statistical model requires the definition of concepts that we will study later, such as probability, stochastic variables, probability distributions, and statistical independence.

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#### Example of a statistical model

- Stochastic phenomenon of interest is the toss of a coin.
- ► The toss produces a result R which takes the value H for heads or T for tails. Results on n consecutive tosses are represented by the time series {R<sub>t</sub>}<sup>n</sup><sub>t=1</sub>.
- ► A statistical model for *R* can be described by the following assumptions,
  - 1.  $R_t = H$  with probability p and  $R_t = T$  with probability 1 p for all t = 1, ..., n. p is an unknown **parameter** of the model.

2.  $R_t$  and  $R_s$  are statistically independent for all  $t \neq s$ .

This very simple statistical model contains the basic elements that are present in many (parametric) statistical models.

- A parameter (p) that takes value in a pre specified set [0,1] that defines a class of probabilities (all pairs (p,1-p) for p ∈ [0,1]) associated with the occurrence of the variable of interest (R)
- 2. An assumption about how the data is obtained. In this case the time series is assumed to come from n independent tosses with the same chance of observing T and H in each toss.