## ANALYSIS OF PANEL DATA

An Introduction

datascience@berkeley

## Introduction to Panel Data

#### What Is Panel Data?

- Panel data, which are often referred to as longitudinal data, have both cross-section and time series dimensions.
- Panel data can be created by sampling the same individuals, families, departments within a company, companies, schools, cities, counties, and so on, over time.
- This gives us both the characteristics and response of interest over multiple time points.
- The example shows two individuals observed daily over a 10-day period.



```
Reaction Days Subject
    249.5600
                        308
                 0
    258.7047
                        308
    250.8006
                        308
                        308
    321.4398
    356.8519
                        308
    414.6901
                        308
                        308
    382.2038
    290.1486
                        308
    430.5853
                        308
    466.3535
                        308
                 9
    222.7339
                        309
    205.2658
                        309
13
    202.9778
                        309
    204.7070
                        309
    207.7161
                        309
16
    215.9618
                        309
                        309
    213.6303
    217.7272
                        309
                        309
    224.2957
    237.3142
                        309
```

## Potentials and Capabilities

- Analysis of panel data provides potentials and capabilities to address questions that would not have been possible using cross-section data.
- Specifically, with multiple observations per subject, we can understand behavior dynamic by observing the same subjects over time.
- We can also understand how these dynamics are related to other variables.
- Within-individual change is characterized in terms of some appropriate summary of the changes in the repeated measurements on each individual during the period of observation.

## Characteristics of Panel Data and Implications

#### Two Key Characteristics:

- A common feature of repeated measurements on an individual is correlation, that is, knowledge of the value of the response on one occasion provides information about the likely value of the response on a future occasion.
- Another common feature of longitudinal data is heterogeneous variability, that is, the variance of the response changes over the duration of the study.

## Characteristics of Panel Data and Implications

#### **Consequences:**

• These two features of longitudinal data violate the fundamental assumptions of independence and homogeneity of variance that are at the basis of many standard techniques (e.g., *t* test, ANOVA, and multiple linear regression).

#### **Solution:**

- To account for these features, statistical models for longitudinal data have two main components: a model for the covariance among repeated measures, coupled with a model for the mean response and its dependence on covariates.
  - Covariance means both the correlations among pairs of repeated measures on an individual and the variability of the responses on different occasions.
  - Failure to properly account for the covariance results in hypothesis tests and CIs that are invalid and may result in misleading inferences.

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