

Class 1: Introduction to quantitative analysis

API-201

Quantitative Analysis and Empirical Methods I

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Agenda

1. Assessing claims of voter fraud
2. Discrimination in policing
3. Course overview
4. Next steps

Claims of voter fraud

Beliefs about double voting

About **25%** of the public believes that voting more than once happens either “commonly” or “occasionally”.

[As opposed to “infrequently” or “never”]

[Stewart III et al. (2016)]

The statistical challenge

There is no unique national identifier that links voting records across states. Only consistently available info is **first name, last name, and date of birth**.

Estimation strategy

1. Start with complete national record of voting.
[100M+ records]
2. Count records with matching first name, last name, DOB.
[800k matches]

What's going on?

The birthday paradox

In a group of 50 people, how many pairs of people have the same birthday [month & day]?

The birthday paradox

Coincidental matches are surprisingly common

In the 2012 presidential election, **141** ballots were cast by a “John Smith” born in 1970.

Among these ballots, **27** pairs had the exact same birthdate, and so would naively be flagged as double votes.

[Same name and exact date of birth]

But you would expect to see ___ matches by chance alone!

The birthday paradox

In a room full of **141** people, there are nearly **10,000** distinct *pairs* of people. **What's the likelihood two random people have the same birthday?**

Estimation strategy

1. Start with complete national record of voting.
[100M+ records]
2. Count records with matching first name, last name, DOB.
[800k matches]
3. Adjust estimate by matches expected to occur by chance.
[Generalization of the *birthday paradox*]

Estimated number of double votes

After birthday paradox correction...

800k → 30k

After error correction...

30k → _____

[Based on 1% error rate in Philadelphia]

**One Person, One Vote: Estimating the Prevalence of
Double Voting in U.S. Presidential Elections**

Goel, Meredith, Morse, Rothschild & Shirani-Mehr
American Political Science Review [2020]

Stop and Frisk

Officers can legally stop and question individuals when there is “reasonable suspicion” of criminal activity.

Until recently, 500,000 stops conducted annually in NYC
[substantially curtailed at the end of 2013]

Question: Is the policy racially discriminatory?

Stop and Frisk

Fact: 80% of stops involved Black or Hispanic individuals.

Fact: 50% of NYC population was Black or Hispanic.

Stop and Frisk

To test for discrimination, we'll look at stop *success* rates.

[An "outcome test"]

The hit rate

Proportion of stops that are "successful"

Lower hit rate for Black individuals compared to White individuals suggests a double standard, with a lower [and discriminatory] bar for stopping Black people than White people.

Outcome tests

How do you detect racial discrimination in bank lending?

[Discuss with your neighbor.]

Stop and frisk

Hit rate

Percentage of CPW stops that turn up a weapon

Stops of Black individuals

_____ hit rate

Stops of White individuals

_____ hit rate

Precinct or Prejudice? Understanding Racial Disparities in New York

City's Stop-and-Frisk Policy

Goel, Rao & Shroff

Annals of Applied Statistics [2016]

The role of statistics in reform

What is the role of statistics in public policy?

[Discuss with your neighbor.]

What you need to know about API-201

1. Teaching approach

- **Philosophy:** Focus on deep conceptual understanding, applied to real-world problems
- **Handouts:** take notes, work on problems, note questions
- **Participation:** highly valued, in and out of class

What you need to know about API-201

1. Teaching approach
2. Communication

All course-related information is on your Canvas homepage. For discussion, use



- **#askforhelp**: questions and answers about course
- **#r**: R-specific questions and answers
- **#random**: articles, tweets, quotes, overheard,...
- **#section-c/d**: channel for Section C/D

What you need to know about API-201

1. Teaching approach
2. Communication
3. Resources

- **TF sessions [starting next week]**
 - Tuesdays 4:30 - 5:45 [Starr Auditorium — Belfer 200]
 - Attend each week — crucial for completing problem sets
- **Teaching Team office hours [posted next week]**
- **Faculty office hours [starting next week]**

What you need to know about API-201

1. Teaching approach
2. Communication
3. Resources
4. Expectations
 - Arrive to class **on time**, ready to engage
 - Generally no technology in class other than **Poll Everywhere**
 - Bring your **laptop** for in-class R exercises
 - Complete **pre-class exercises** the day before each class at 5 PM
 - Complete **problem sets** by Thursdays at 8am
 - Check **exam dates on syllabus** to make sure you are available

Next Steps

- Pre-Class Exercise due Monday at 5 PM
 - ◆ Available on Canvas
- Problem Set #1 due Thursday at 8am
 - ◆ Aimed at familiarizing you with Jupyter Notebooks
 - ◆ Submit as PDF on Canvas
- If you have a seating need, contact your faculty member
 - ◆ By tomorrow [Friday] at 5 PM