



UNIVERSITY OF
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Non-Probability Sampling, Part 1

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Lecture Overview

- What defines a non-probability sample?
- **Common examples** of non-probability samples
- Intro to **two common population inference methods**
- Example of non-probability sampling: **Twitter data**



Non-probability sampling namely drawing a sample from Logo from Twitter Twitter.

What Are Non-Probability Samples?

- **Features of Non-probability samples:**
 - Probabilities of selection **can't be determined** for sampled units
 - **No random selection** of individual units
 - Sample divided into groups (strata) or clusters, but **clusters not randomly sampled** in earlier stage
 - Data collection often very **cheap** ¢ relative to probability sampling

much less expensive than probability samples.

Examples of Non-Probability Samples

- Studies of **volunteers**

**Do you suffer from
XXX?**

**Learn more about our
clinical research study
for an investigational drug**

**ABC Clinical Trials:
(XXX) XXX-XXXX**

and then you're given a phone number or an email and then you call in and say,

Examples of Non-Probability Samples

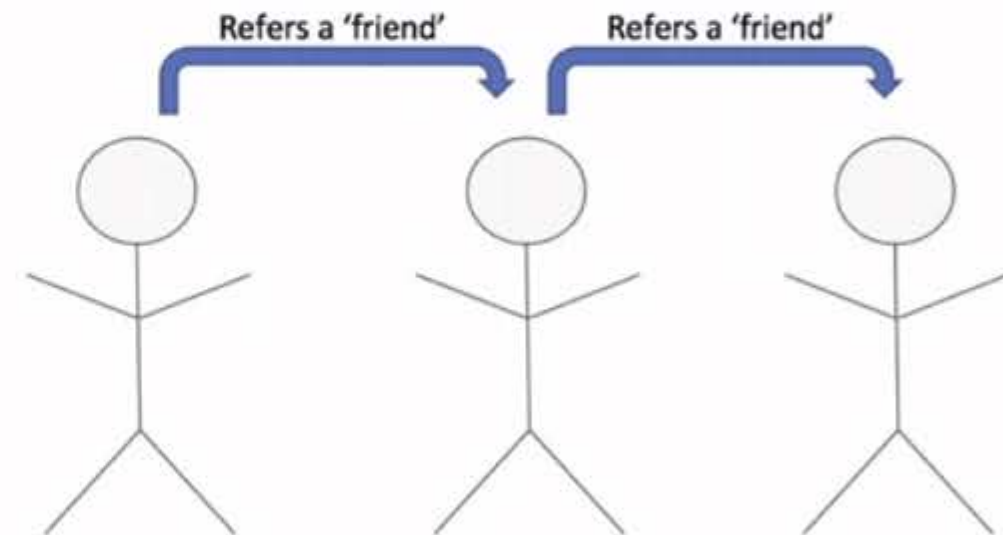
- Studies of **volunteers** (e.g., clinical trials)
- **Opt-in** / Intercept web surveys



So, when you're on a website and you see an invitation

Examples of Non-Probability Samples

- Studies of **volunteers** (e.g., clinical trials)
- **Opt-in** / Intercept web surveys
- **Snowball** samples



A third example is Snowball sampling and again we talked about this a little bit earlier,

Examples of Non-Probability Samples

- Studies of **volunteers** (e.g., clinical trials)
- **Opt-in** / Intercept web surveys
- **Snowball** samples
(e.g., word-of-mouth data collection)
- **Convenience** samples



All Students in Psych 101

Classroom by velkr0 CC-BY 2.0

So, you see here a common example in academic settings is when

Examples of Non-Probability Samples

- Studies of **volunteers** (e.g., clinical trials)
- **Opt-in** / Intercept web surveys
- **Snowball** samples
(e.g., word-of-mouth data collection)
- **Convenience** samples
(e.g., all students in Psych 101)
- **Quota** samples
certain targets that you wish to hit in terms of your sample size,



Recruit 1,000 males and 1,000 females in any way

Examples of Non-Probability Samples

Common Feature:
Probabilities of selection
cannot be determined
a priori!

probabilities of selection cannot be determined a

So What Is The Problem?

- Non-probability sample → **no statistical basis for making inference** about larger population from which sample selected
- **Knowing probabilities of selection**
(in addition to population strata and randomly sampled clusters)
→ **can estimate features of sampling distribution**
if were to take many random samples using same design

absolutely crucial for making inference about a larger population,

So What Is The Problem?

- Sampled units **not selected at random** → strong risk of **sampling bias**
(e.g., people actually interested in visiting particular web site)



Across the board, there's no selection at random occurring here and what this


So What Is The Problem?

- Sampled units **not selected at random** → strong risk of **sampling bias**
(e.g., people actually interested in visiting particular web site)
- Sampled units **not generally representative** of larger target population of interest



generally not representative of the larger target population of interests.

So What Is The Problem?

- Sampled units **not selected at random** → strong risk of **sampling bias**
(e.g., people actually interested in visiting particular web site)
- Sampled units **not generally representative** of larger target population of interest
- **“Big data”** (e.g., information from millions of tweets )
often from non-probability samples ~ be careful!

there's no probability sampling mechanism that gives

Logo from Twitter

An undergraduate student in Psychology 101 is tasked with collecting data from a sample of students at that college on recent experiences with depression. To collect the data, the student stands in the middle of campus at Noon and asks 30 different people walking by whether they have recently had an experience with depression. What are the problems with the sample measured by this student? Please select all responses that apply.

☒ There is no guarantee that all respondents are students (lack of representation).

Correct

☒ The 30 people have not been selected at random (risk of sampling bias).

Correct

☒ People walking on the campus at noon may be quite different from people walking on the campus at other times of day (lack of representation).

Correct

☐ The sample size is too large.

Un-selected is correct

☒ The probabilities of selection for the sampled persons cannot be determined.

Correct

So What Can We Do?

- Many data sets arise from non-probability samples
... can we say anything about a larger population?
- **Two possible approaches:**
 - Pseudo-Randomization
 - Calibration

For technical “deep dive”
into estimation approaches:
Elliott and Valliant
(2017, Statistical Science)

So, you wait your Non-probability sample to