



# Sampling

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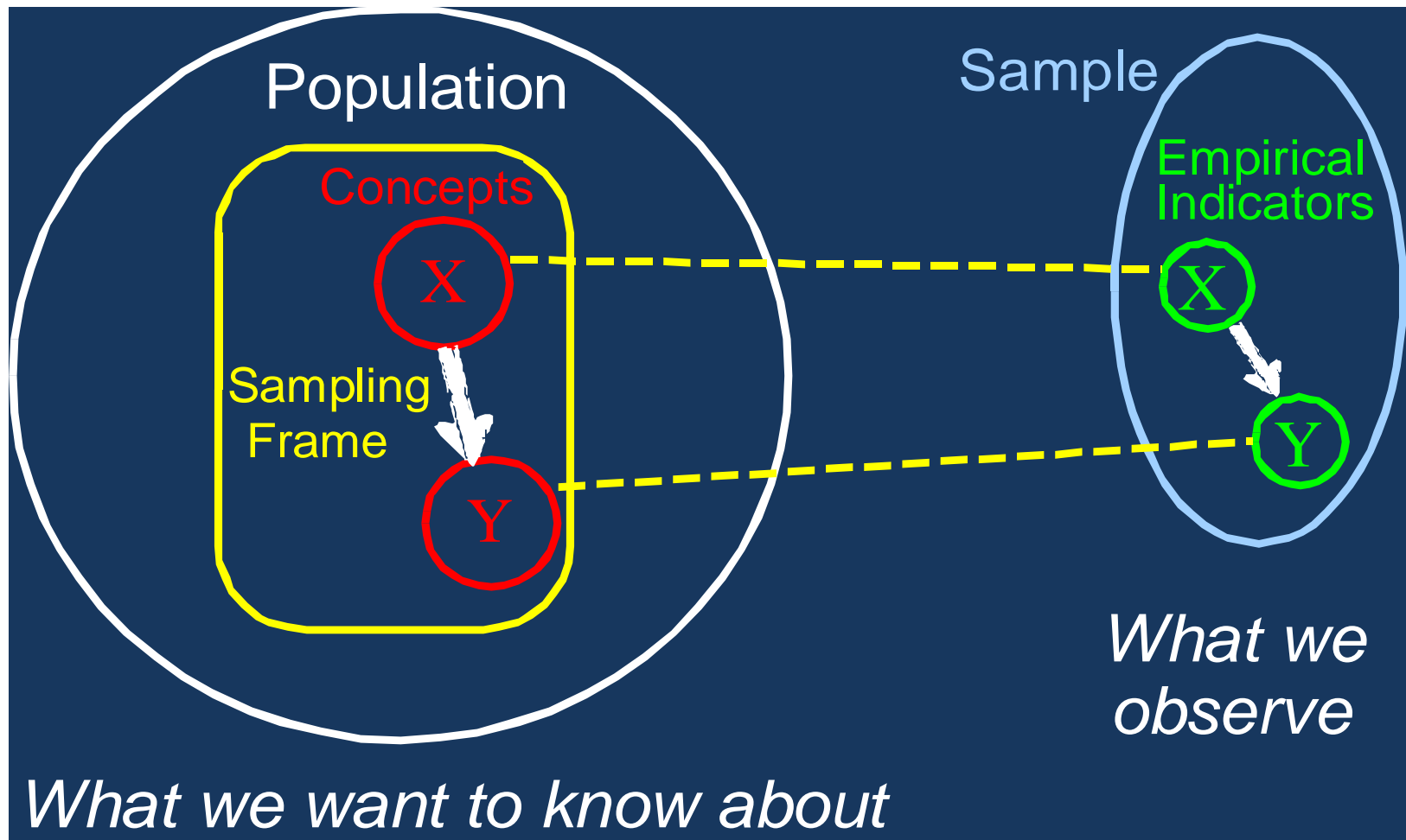


## A sampling plan

Specifies in advance how participants are to be selected and how many to include.

- It is usually discussed in a report's Method section, sometimes in a subsection called "Sample" or "Study participants."

# The Logic of Sampling & Measurement





# Basic Sampling Concepts

## Population

- The aggregate of cases in which a researcher is interested
- Population is **limited to human subjects** but it might consists of all the **hospital records** on file in a particular hospital or all **blood samples** at a particular laboratory..
- E.g. all children in Canada with cystic fibrosis.



## Basic Sampling Concepts (cont.)

- ✓ **Target population:** The entire population of interest
- ✓ **Accessible population:** The portion of the target population that is accessible to the researcher, from which a sample is drawn



# Population Importance

- ✓ Conclusions based on data
- ✓ Data from accessible population
- ✓ Decisions made from study results



# Sampling

- **Sampling:** selection of a portion of the population to represent the entire population
- **Eligibility criteria:** The characteristics that define the population
- **Inclusion criteria**
- **Exclusion criteria**
- **Strata:** Subpopulations of a population (e.g., male, female)



## Example of inclusion & exclusion criteria:

- Lindgren and colleagues (2008) studied how elderly patients with ischemic coronary heart disease cluster based on presenting symptoms in the week before hospitalization.
- Patients from five medical centers were eligible for the study if they were:
  - ✓ unpartnered adults aged 65 or older;
  - ✓ had positive enzyme tests considered diagnostic for myocardial infarction or coronary artery bypass surgery;
  - ✓ read and spoke English;
  - ✓ had a telephone;
  - ✓ lived within 50 miles of the medical center.





## Example

For example, the researcher's target population might be all diabetic patients in the United States, but, in reality, the population that is accessible might be diabetic patients in a particular clinic.



So...

A **sample** is a subset of population elements.

**Sampling** is the process of selecting cases to represent an entire population so that inferences about the population can be made.



# Steps in the sampling process

- 1) Identify the target population
- 2) Identify the accessible population
- 3) Determine the size of the sample needed
- 4) Select the sampling technique
- 5) Implement the plan



## Critical Factor

- The sample needs to be **representative** of your population of interest
- **Generalizability** (external validity) of your results is dependent on this factor!



# Randomization

- 1) ensures representativeness
- 2) unbiased selection
- 3) to equalize characteristics across experimental & control conditions



# Terms

- **Random selection:** sample is representative of larger population
- **Random assignment:** involves equalizing experimental groupings (essential for internal validity of a study)



# Sampling Goal in Quantitative Research

## Representative sample

- A sample whose key characteristics closely approximate those of the population



# Representative sample

But there is never a guarantee of a representative sample.

More easily achieved with:

- ✓ Probability sampling
- ✓ Homogeneous populations
- ✓ Larger samples





## Sampling Problems in Quantitative Research

- ✓ **Sampling bias:** The systematic over- or under representation of segments of the population on key variables.
- ✓ **It is affected by: Homogeneity of population**
  - Age, blood pressure & stress level are all attributes that reflects heterogeneity of human




## Sampling Bias (example)

- As an example of consciously biased selection, suppose we were investigating patients' responsiveness to nurses' touch & decide to use as our sample the first 50 patients meeting eligibility criteria in a specific hospital unit.
- We decide to omit Mr. Z from the sample because he has shown hostility to nurses. Mrs. X, who has just lost a spouse, is also excluded from the study because she is under stress.



## Sampling Bias (example) cont.

- We have made conscious decisions to exclude certain individuals, and the decisions do not reflect bona fide حسن النية
- Eligibility criteria
- This can lead to bias because responsiveness to nurses' touch (the dependent variable) may be affected by patients' feelings about nurses or their emotional state.




**Sampling error:** Differences between sample values and population values



# Strata

- Subpopulations of a population (e.g., male/female)
- QoL: 35-50; >50-65; >65
- often used in sample selection to enhance the sample's representativeness

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- For instance, a population consisting of all RNs in the US could be divided into **two strata** based on gender (M/F)
  - Alternatively, we could specify **three strata** (nurses < 30 years of age, nurses aged 30-45 years, & nurses 46 years or >)
  - Strata are often used in sample selection **to enhance the sample's representativeness**



# Sampling Techniques in Quantitative Studies

## Nonprobability sampling

- ✓ Does not involve selection of elements at random

## Probability sampling

- ✓ Involves **random selection** of elements: Each element has an equal, independent chance of being selected.



## Types of Nonprobability Sampling: Quantitative Research

- Convenience sampling
- Quota sampling
- Consecutive sampling
- Purposive sampling





## Nonprobability Sampling

**Convenience Sampling** entails using the most conveniently available people as participants

A group of participants to whom the researcher has access, for example, patients on a ward.

A faculty member who distributes questionnaires to nursing students in a class is using a convenience sample, or an **accidental sample**, as it is sometimes called



## Convenience

- ✓ Poor approach
- ✓ The right place at the right time

✓ Example:

A class room of students;

Pt who attend a clinic on a specific day



## Example of a convenience sample:

- Fraser and Polito (2007) compared the self-efficacy of men versus women with multiple sclerosis (MS). They used a convenience sample of 556 individuals with MS.
- **Stopping people at a street corner** to conduct an interview is sampling by convenience.




- The problem with convenience sampling is that available subjects might be atypical of the population, and so the price of convenience is the **risk of bias**





# Nonprobability Sampling


**Snowball Sampling** (network sampling or chain sampling); used when the population is people with characteristics who might be difficult to identify

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- In a **snowball sample**, participants who are already part of the sample are **asked to identify others** who would possibly be suitable for inclusion in the study and who would be agreeable to taking part in it
  - In other words, the **sample gradually increases in size, like a snowball being rolled down a hill**
  - This type of sample is useful when the researcher is studying a subgroup who may not easily be accessible otherwise, for example **drug users**
  - Network sampling

# Nonprobability Sampling

- **Consecutive Sampling** involves recruiting *all* of the people from an accessible population who meet the eligibility criteria over a specific time interval
- For example, in study of ventilated-associated pneumonia in ICU patients, if the accessible population were patients in an ICU of a specific hospital, consecutive sample might consist of all eligible patients who were admitted to that ICU **over a 6-month period**  
Or it might be the first 250 eligible patients admitted to the ICU, if 250 were the targeted sample size



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- **Consecutive samples** can be selected either for a retrospective or prospective time period
  - For example, the sample could include every patient who visited a diabetic clinic in the previous 30 days (**retrospective or prospective**)?
  - Or, it could include all of the patients who will enroll in the clinic in the next 30 days (**retrospective or prospective**)??



## Nonprobability Sampling

- **Purposive sampling** is often used when researchers **want a sample of experts**, as in the case of a needs assessment using the key informant approach or in Delphi surveys
- **Purposeful Sampling** (judgmental sampling) is based on the belief that researchers' knowledge about the population can be used to hand-pick sample members



## Example of purposive sampling

- Van den Heede and colleagues (2007) assessed the views of an international panel of experts regarding the state of nurse staffing & patient outcomes research
- Two rounds of surveys were conducted with a purposively selected sample of researchers & nurse administrators from 10 countries.



# Nonprobability Sampling

- **Quota Sampling:** researchers identify **population strata** and determine how many participants are needed from each stratum
- By using information about population characteristics, researchers can ensure that diverse segments are adequately represented in the sample.



## Example 1: quota Sample

- For instance, if a researcher is required by a quota sampling plan to interview **10 men between the ages of 65 & 80 years**, a trip to a nursing home might be the most convenient method of obtaining those subjects
- Yet this approach would fail to represent the many senior citizens who live independently in the community.



## Example 2: quota sample

- Williams et al (2000) studied mothers' expectations for children' development
- The researchers used quota sampling to ensure an equal number of urban & rural mothers, and an equal number of male and female children.



## Evaluation of Nonprobability Sampling

- Although a nonprobability sample is often **acceptable** for pilot, exploratory, or in-depth qualitative research, for most quantitative studies, the use of nonprobability samples is **problematic**
- Nonprobability samples are **rarely representative** of the population
- When every element in the population does not have a chance of being included in the sample, it is likely that some segment of it will be systematically underrepresented.



# Evaluation of Nonprobability Sampling

- Why, then, are nonprobability samples used in most nursing studies?
- The advantage of these sampling designs lies in their **convenience & economy**
- **Probability sampling, requires skill & resources**
- There is often **no option but to use a nonprobability** approach or to abandon the project altogether
- Even hard-nosed research methodologists would hesitate to advocate the abandonment of an idea in the absence of a random sample.






# Probability sampling



# Types of Probability Sampling

- ✓ Simple random sampling
- ✓ Stratified random sampling
- ✓ Systematic sampling
- ✓ Cluster sampling

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- **Probability sampling** involves the **random** selection of elements from a population.
  - **Random assignment** refers to the process of allocating subjects to different treatment conditions at random.
  - Random *assignment* has no bearing on how subjects in an experiment were selected in the first place.



- **Simple Random Sampling:** in this technique every unit of the study population has an equal and independent chance of selection.
- Randomization software

<https://www.randomizer.org/>



## Steps for Simple Random Sampling

- Identify the accessible population or list of elements
- Choose the method for getting the sample
- **An easy example:**
  - ✓ Names of elements on slips of paper
  - ✓ Papers are placed into a hat
  - ✓ Individual draws a slip of paper
  - ✓ Individual continues till sample number is met



## Example of a simple random sample

- Nachreiner and colleagues (2007) conducted a survey of registered nurses & licensed practical nurses to compare their experience with workplace violence.
- Questionnaires were mailed to a random sample of 6,300 licensed nurses in Minnesota.



# Simple Random Sampling

- Advantages:
  - ✓ Little knowledge of population is needed
  - ✓ Most unbiased of probability method
  - ✓ Easy to analyze data and compute errors
- Disadvantages:
  - ✓ Complete listing of population is necessary
  - ✓ It is time consuming to use



# Stratified Random Sampling

- Population divided into strata, then random selection from the stratified sampling frames
- Enhances **representativeness**
- Can sample proportionately or disproportionately from the strata





## Variable commonly used for stratification:

- Age; gender; ethnicity; socioeconomic status; diagnosis; geographic area; type of institution; type of care; and site of care.



## Stratified Random Sampling


- The most common procedure for drawing a stratified sample is:
  - ✓ to group together elements belonging to a stratum & to select randomly the desired number of elements
  - ✓ You can either select an equal number of elements from each stratum or select unequal numbers



- To illustrate the procedure used in the simplest case, suppose that the list consisted of 25 men (numbers 1 through 25) and 25 women (numbers 26 through 50)
- Using gender as the stratifying variable, we could guarantee a sample of 10 men and 10 women by randomly sampling 10 numbers from the first half of the list and 10 from the second half.




- Stratifying variables usually divide the population into unequal subpopulations
- For example, if the person's race were used to stratify the population of U. S. citizens, the subpopulation of white people would be larger than that of African-American and other nonwhite people.
- The researcher might decide to select subjects in proportion to the size of the stratum in the population, using **proportionate stratified sampling**.

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- **If the population** was students in a nursing school that had 10% African-American students, 10% Hispanic students, and 80% white students, then a proportionate stratified sample of 100 students, with racial/ ethnic background as the stratifying variable, would consist of 10, 10, and 80 students from the respective strata



- When researchers are interested in understanding differences among strata, proportionate sampling may result in insufficient numbers for making comparisons.
- In the previous example, would the researcher be justified in drawing conclusions about the characteristics of Hispanic nursing students based on only 10 cases?

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- It would be unwise to do so.
  - For this reason, researchers often adopt a **disproportionate sampling design when comparisons are sought** between strata of greatly unequal size.
  - In the example, the sampling proportions might be altered to select 20 African-American students, 20 Hispanic students, and 60 white students.
  - This design would ensure a more adequate representation of the two racial/ethnic minorities.
  - When **disproportionate sampling** is used, however, it is necessary to make an adjustment to the data to arrive at the best estimate of *overall population values*. *This adjustment process*, known as **weighting**.



## Example of stratified random sampling

- Ekwall and Hallberg (2007) studied caregiver satisfaction among informal older caregivers who participated in a mail survey in Sweden. The sample was stratified on the basis of age.
- Questionnaires were mailed to:
  - 2,500 elders aged 75 to 79,
  - 2,500 elders aged 80 to 84,
  - 2,000 elders aged 85 to 89,
  - and 1,500 elders aged 90 and over





# Cluster sampling

- ✓ Known as **multistage sample** because it involves taking samples in stages, from the more general to the more detailed unit
- ✓ It is particularly useful when widely geographic areas to be sampled by personal interview
- ✓ In cluster sampling, there is a **successive random sampling of units**
- ✓ The first unit is large groupings, or clusters



## Cluster sampling [Example1]

- ✓ In drawing a sample of nursing students, we might first draw a random sample of nursing schools and then draw a random sample of students from those schools.



## Cluster sampling [Example 2]

- ✓ A researcher want to study the prenatal care at the MCH centers all over Palestine:
- ✓ **The first** step is to divide Palestine into clusters (North, south, center)
- ✓ **Second** the researcher need to decide how many centers in each cluster wants to include



## Cluster sampling [Example 2]

- ✓ **Third**, the MCH centers needed are chosen by using simple random sample
- ✓ In many cases the each cluster **may need to be clustered again**, for example, the governmental MCH & the Non-Governmental ones.



## Disadvantages of Cluster sampling

- ✓ Causes a larger sampling error
- ✓ The appropriate handling of the statistical data from cluster is very complex
- ✓ Requires each member assignment of population to cluster
- ✓ Uses a more complicated statistic analysis



## Advantages of Cluster Random Sampling

- Saves time and money
- Arrangements made with small number sampling units
- Characteristics of clusters/population can be estimated



# Systematic sampling

- Involves the selection of *every  $k$ th case* from a list, such as every 10th person on a patient list.
- Where the difference between any consecutive number is the same
- Systematic sampling designs can be applied in such a way that an essentially random sample is drawn.



# Systematic Random Sampling

## Process

- ✓ Obtain a **listing** of population
- ✓ Determine the **sample size**
- ✓ Determine the **sampling interval** ( $k = N/n$ )
- ✓ Select **random starting point**
- ✓ Select **every  $k$ th** element





## Example on systematic sampling

- For instance, if we wanted a sample of 50 from a population of 5,000, our sampling interval would be 100 ( $5,000/50 = 100$ ).
- In other words, **every 100th** case on the sampling frame would be sampled
- Next, the first case would be selected randomly (e.g., by using a table of random numbers)
- If the random number chosen were 73, the people corresponding to numbers 73, 173, 273, and so forth would be included in the sample.



## Example of a systematic sample:

- Houghton and colleagues (2008) surveyed nurse anesthetists about their practices and attitudes regarding smoking intervention
- Using the membership list of the American Association of Nurse Anesthetists, every 30th name in the alphabetized list was selected for the sample



# Systematic Random Sampling

## Advantages

- ✓ Easy to draw sample
- ✓ Economical
- ✓ Time-saving technique

## Disadvantages:

- ✓ Samples may be biased
- ✓ After first sample chosen, no longer “equal chance”



# Special Sampling Strategy

- ✓ One of the most common strategy is “Matching”
- ✓ Matching is used to construct an **equivalent comparison** sample group by filling it with subjects who are similar to each subject in another sample group in relation to such pre-established variables such as sex, age, marital status, education...etc.
- ✓ In some studies, in order to ensure high control and representative sample both matching & randomization are used.



# Evaluation of Probability Sampling

- The only viable method of obtaining representative samples. If all the elements in the population have an equal probability of being selected, then the resulting sample is likely to do a good job of **representing the population**
- Probability sampling allows researchers to estimate the **magnitude of sampling error**.
- **Sampling error refers to differences between** population values (such as the average age of the population) and sample values (such as the average age of the sample).



# Sample Size

- The number of study participants in the final sample
- **Sample size** adequacy is a key determinant of sample quality in quantitative research
- **The larger the sample, the more representative it is likely to be**
- **The larger the sample, the smaller the sampling error**
- There are no simple formulas that can tell you how large a sample you will need in a given study



## Sample Size

- when **samples are too small**, and researchers run the risk of gathering data that will not support their hypotheses—even when those hypotheses are correct
- When critiquing quantitative studies, you must assess both the sample size & the sample selection method to judge how representative the sample likely was.



# Sample Size

- Qualitative studies almost always use small, nonrandom samples.
- Qualitative researchers ask such sampling questions as:
  - ✓ “Who would be an information-rich data source for my study?”
  - ✓ “To whom should I talk, or what should I observe, to maximize my understanding of the phenomenon?”





# Saturation

- A guiding principle in sampling is **data saturation**—that is, sampling to the point at which no new information is obtained and redundancy is achieved.



# Sampling Bias

- Bias when samples are not carefully selected
- All nonprobability sampling methods have it
- It may occur in probability sampling methods
  - ✓ Subjects decide not to participate when chosen
  - ✓ Final sample is now not representative of population



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