

Population: the entire collection of individuals/objects of interest

Sample: a subset of the population

### Types of Studies

- Experiment: researcher manipulates 1 or more independent variables (Factors)

Treatments are the levels for the factors (or combinations thereof)

#### Experimental Unit (EU)

- the unit to which a treatment is randomly assigned
- An EU constitutes one replication of the experiment

#### Measurement Unit

- the unit on which a measurement is taken
- An EU constitutes one replication of the experiment

- Quasi-Experiment: treatments not randomly assigned to EUs
- Observational: no variables manipulated by researcher  
experiment may not be feasible or ethical
- Survey: voluntary response

Causal inference can be made from an experiment

Association relationships can be inferred from an observational study

**Experimental Error** - Variation among identically treated EUs

- Natural variation among EUs
- Measurement variability
- Variation in treatment conditions
- Extraneous factors (nuisance/lurking variables)
- Interaction of treatments and EUs

**Control Treatments** – A benchmark for comparing experimental treatments

- No treatment
- Placebo
- Standard practice

## 3 Principles of Designed Experiments

- 1) Blocking to reduce experimental error
- 2) Randomization to reduce hidden bias
- 3) Replication on a large number of subjects

### **Key Ingredients to identify:**

A hypothesis  
Dependent variable(s)  
Experimental conditions  
Nuisance variables  
# of EUs  
Assignment mechanism

**Blocking** - Grouping of EUs into similar classes

- Common Criteria for blocking
  - Location
  - Characteristics (age, weight, sex, ...)
  - Time

**Randomization** - Random assignment of treatments to EUs

- Independent observations needed for valid estimates of experimental error
- Randomization simulates the effect of independence
  - Allows the assumption of independence & normal distribution

### **Replication**

- Demonstrates reproducibility
- Allows for increased precision in estimating treatment effects

## Surveys

- Administered to a sample from the population to gather information about the entire pop.
- Possible Problems:
  - non-response, incomplete recall, leading questions, unclear questions
  - Bias – when a study systematically favors certain outcomes

## Sampling Designs for Surveys

- Simple Random Sample (SRS):
  - A method of selecting  $n$  individuals from a pop. so that each is equally likely to be selected
- Stratified Random Sample:
  - Divide the population into groups of similar individuals (strata)
  - Take a Simple Random Sample from within each stratum
- Cluster Sampling:
  - Divide the population into groups of similar individuals (clusters)
  - Select a subset of clusters, and sample all individuals in the selected clusters
- Systematic Sampling:
  - Select every  $k^{\text{th}}$  individual from the population
  - May be more convenient, but is less efficient than other methods
  - Potential for bias is higher than for other methods

## The National Health Interview Survey (NHIS)

- Conducted by the Census Bureau for the National Center for Health Statistics (NCHS)
  - Uses:
    - to help set public policy
    - to track progress of national health objectives
    - to aid in research (in conjunction with the Medical Expenditure Panel Survey)
- Target Population: U.S. resident, civilian, non-institutionalized persons
- Sampling Frame: geographic areas defined in 3 stages
- Sampling Design: stratified multi-stage probability sample
- Components: Core Survey and usually 4 Supplements

## 1993 Sample:

- 43,007 households interviewed → 109,671 persons
- Non-interview rate: 4.4%

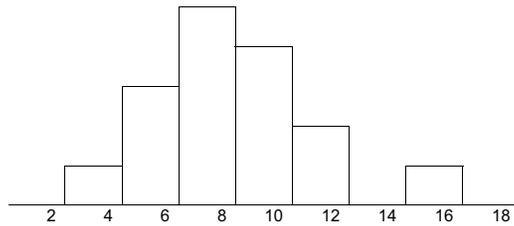
### Histogram

1. Divide the range of values into equal length intervals
2. Count the # of observations in each interval
3. Plot adjacent rectangles with height equal to the count (or %) in each interval

- Example: Enzyme Data (concentrations sorted from lowest to highest)

2.3, 4.3, 4.7, 5.1, 6.3, 6.7, 6.9, 7.4, 7.8, 8.2, 8.2, 8.7, 9.6, 10.6, 10.8, 15.5

Interval	Count
2.1 – 4.0	1
4.1 – 6.0	3
6.1 – 8.0	5
8.1 – 10.0	4
10.1 – 12.0	2
12.1 – 14.0	0
14.1 – 16.0	1



### Stem & Leaf Plot

- The stem consists of all but the right most digit(s)
- The leaf consists of the last digit(s)

stem	leaf
2	3
3	
4	37
5	1
6	379
7	48
8	227
9	6
10	68
11	
12	
13	
14	
15	5

( The decimal point is at the | )

Stem	Leaf	Count
15	5	1
14		
13		
12		
11		
10	68	2
9	6	1
8	227	3
7	48	2
6	379	3
5	1	1
4	37	2
3		
2	3	1

2|3 represents 2.3

### Stem & Leaf Plot

- A histogram-like plot that allows you to recover the actual data
- The stem consists of all but the right most digit(s)
- The leaf consists of the last digit(s)

#### Procedure:

1. Write the stems in a column in increasing order
2. Use a vertical line to represent the decimal point
3. Write the leaves in increasing order next to the corresponding stem

## Measures of Center

- Mean: ordinary average

$$\bar{x} = \frac{x_1 + x_2 + \dots + x_n}{n} = \frac{\sum_i x_i}{n}$$

- Median (M): the “middle value” of the ordered data
  - ½ of the values are larger, ½ of the values are smaller
  - Procedure: Order the sample from smallest to largest
    - If  $n$  is odd,  $M$  is the middle value
    - If  $n$  is even,  $M$  is the average of the two middle values
  - The location of  $M$  among the ranked values is  $(n+1)/2$

Example Data: 5, 4, 2, 6, 3

## Measures of Spread

- Range: the difference between the largest and smallest values
- Quartiles: break a distribution into 4 intervals
  - ¼ of the observations are less than the 1<sup>st</sup> Quartile (Q1 = 25<sup>th</sup> Percentile)
  - ½ of the observations are less than the 2<sup>nd</sup> Quartile (Q2 = 50<sup>th</sup> Percentile)
  - ¾ of the observations are less than the 3<sup>rd</sup> Quartile (Q3 = 75<sup>th</sup> Percentile)

Inter Quartile Range (IQR): the difference between the 3<sup>rd</sup> and 1<sup>st</sup> Quartiles

- IQR = Q3 - Q1
- Measures the spread of the middle half of the data
- 5 Number Summary: Minimum, Q1, Median, Q3, Maximum
- Variance and Standard Deviation:

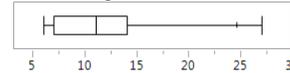
Ex Data: 7 7 8 9 11 12 12 14 15 16 28

Example Data: 7 7 8 9 11 12 12 14 15 16 28

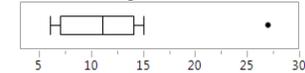
**Boxplot**: A graphical representation of a 5 number summary (developed by John Tukey)

- A central box at Q1 and Q3 with a line at the Median
- ‘whiskers’ extending to ...
  - the Min and Max (*Basic* or “*Skeletal*” boxplot), **OR**
  - the lower and upper adjacent values (*Outlier* boxplot) [outliers indicated by \*]

*Basic* boxplot



*Outlier* boxplot:



- Lower Inner Fence:  $LIF = Q_1 - 1.5 * IQR$
- Upper Inner Fence:  $UIF = Q_3 + 1.5 * IQR$

- **Outlier**: any observed value  $< LIF$  or  $> UIF$

- Lower Adjacent Value (*LAV*): the smallest non-outlier
- Upper Adjacent Value (*UAV*): the largest non-outlier