

## Levels of Measurement

### **Categorical Scales:**

#### **Nominal**

Scale Characteristics: No order, distance, or point of origin.

Basic Empirical Operations: Determination of equality.

Scale Requirements: Categories are mutually exclusive and exhaustive.

Scale Example: "Numbering" of baseball players. Assignment of identification numbers to groups. Using numbers to name categories.

Common Statistical Measures:

Central Tendency: Mode.

Variability: None.

Tests: Nonparametric.

#### **Ordinal**

Scale Characteristics: Order, but no common unit of measure or point of origin.

Basic Empirical Operations: Determination of greater or lesser, in addition to equality.

Scale Requirements: Satisfies the transitivity postulate.

Scale Example: Street numbers. Grades of lumber. Military rank.

Common Statistical Measures:

Central Tendency: Median, in addition to the Mode.

Variability: Average Absolute Deviation, Quartile Deviation.

Tests: Nonparametric.

### **Continuous Scales:**

#### **Interval**

Scale Characteristics: Order; common unit of measure; arbitrary zero point of origin.

Basic Empirical Operations: Determination of equality, greater or lesser, and measurement of differences on some scale.

Scale Requirements: Intervals on the scale are equal.

Scale Example: Time. Money.

Common Statistical Measures:

Central Tendency: Arithmetic Mean, in addition to Median and Mode.

Variability: Variance and Standard Deviation.

Tests: Parametric.

#### **Ratio**

Scale Characteristics: Order; common unit of measure; true zero point of origin.

Basic Empirical Operations: Determination of equality, greater or lesser, measurement of differences on some scale, and equality of ratios.

Scale Requirements: Meets all assumptions to perform arithmetic operations.

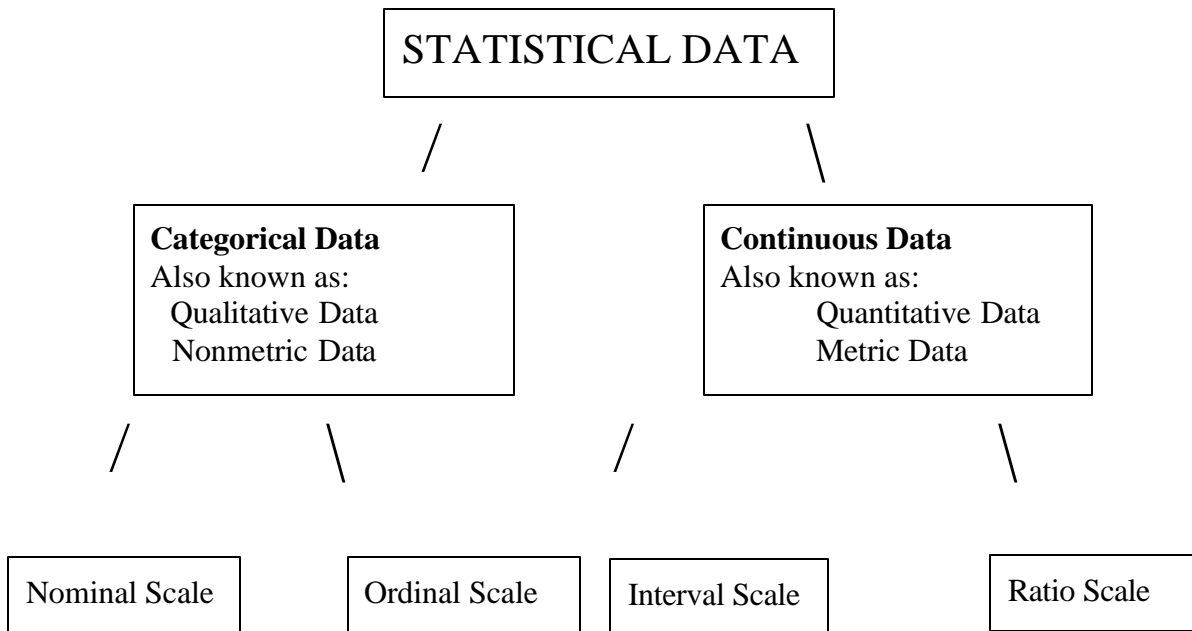
Scale Example: Length. Weight.

Common Statistical Measures:

Central Tendency: Harmonic and Geometric Means, in addition to the Arithmetic Mean; also: Median and Mode.

Variability: Coefficient of Variation, in addition to the Variance and Standard Deviation.

Tests: Parametric.



## **TYPES OF DATA AND MEASUREMENT SCALES**

# DATA ANALYSIS

Basic Rule of Data Analysis:

**“The kind of data you have determines the kind of statistical analysis that you do.”**

## Selection of statistical analysis procedure according to the kind of data you have:

### I. Descriptive Statistics

*Categorical Data:*

Nominal Data: (e.g.: gender, ethnic group, type of organization, yes/no)

Ordinal Data: (e.g.: income group, educational group, rating scale category)

Frequency count by category (“how many of what kind?”)

Mode (“what are there the most of?”)

Total n (“how many total in all categories combined?”)

Percentage (“what % of the total does each category represent?”)

*Continuous Data:*

Interval Data: (e.g.: time, money, some rating scales)

Ratio Data: (e.g.: age, income, some rating scales)

Mean (“what is the average for the group? where are the data values centered?”)

Standard Deviation (“how spread out are the data values around the center?”)

Minimum/Maximum & Range (“what are the high and low data values? total spread?”)

Total n (“how many data values are there?”)

### II. Inferential Statistics

#### Consideration of a single variable:

*Categorical Data:*

Nominal Data: (e.g.: gender, ethnic group, type of organization, yes/no)

Ordinal Data: (e.g.: income group, educational group, rating scale category)

Use a Chi-Square Goodness of Fit to a Uniform Distribution test (“One-Way Chi-Square”) to determine if there are approximately equal numbers in the several categories, or if the frequency count in some categories is significantly higher/lower than in other categories.

#### Consideration of the relationship between two variables:

*Categorical Data:*

Nominal Data: (e.g.: gender, ethnic group, type of organization, yes/no, before/after, with/without)

Ordinal Data: (e.g.: income group, educational group, rating scale category)

*Continuous Data:*

Interval Data: (e.g.: time, money, some rating scales)

Ratio Data: (e.g.: age, income, some rating scales)

If: a) Dependent is Continuous and Independent is Continuous → Regression Analysis (t-test or F-test)

Note: if you have several Continuous Predictors → Multiple Regression (F-test, then t-tests)

b) Dependent is Continuous and Independent is Categorical with 2 groups → t-test for a difference

between two group means

Note: for more than 2 groups → One-Way ANOVA (F-test, then Scheffé tests, or similar)

[One-Way ANOVA = “Analysis of Variance” with only one categorical predictor]

c) Dependent is Categorical and Independent is Categorical → Two-Way Chi-Square

[Two-Way Chi-Square = “Chi-Square Test of Independence/Association”

also known as “Cross-tabulation” or simply “Crosstabs”]

## Independent Variable(s)

		Continuous	Categorical
<b>Dependent Variable</b>	<b>Continuous</b>	<p style="text-align: center;"><b><u>Regression &amp; Correlation</u></b></p> <p>a) Simple Bivariate Regression and Correlation</p> <p>b) Multiple Regression and Correlation</p> <p>Note: Use of Dummy Variables</p>	<p style="text-align: center;"><b><u>t-Tests</u></b></p> <p>Note: F-test on variances to choose separate or pooled approach</p> <p style="text-align: center;"><b><u>ANOVA</u></b></p> <p>a) One-Way ANOVA</p> <p>Note: Follow up with Scheffé test</p> <p>b) Two-Way ANOVA</p> <p>Note: Test interaction effect first</p>
	<b>Categorical</b>	<p style="text-align: center;"><b><u>Discriminant Analysis</u></b></p> <p>Two Categories</p> <p>Three Categories</p>	<p style="text-align: center;"><b><u>Chi-Square</u></b></p> <p>a) One-Way Chi-Square</p> <p>b) Two-Way Chi-Square</p> <p>c) Three-Way Chi-Square</p> <p>Note: Expected Value Checks required</p>

## SELECTION OF DATA ANALYSIS TECHNIQUES

### BY DATA AND VARIABLE TYPES

# Statistics

## Nonparametric Methods

## Parametric Methods

### Descriptive Statistics

### Inferential Statistics

### Descriptive Statistics

### Inferential Statistics

Descriptors

- Frequency
- Mode
- Median
- Average Absolute Deviation
- Range

Deviation from Chance

- Chi Square:  $P_2$
- Median Test
- Mann-Whitney U Test
- Milgramov-Smirnov Test
- Milcoxen Matched-Pairs, Signed-Rank Test
- Milcoxen Rank Sum Test
- The Sign Test
- The Runs Test
- Milskal-Wallis H Test (One-Way ANOVA approx.)

Descriptors

- Mean
- Variance
- Standard Deviation
- Skewness
- Kurtosis

- Mode
- Median
- Average Absolute Deviation
- Range

Deviation from Chance

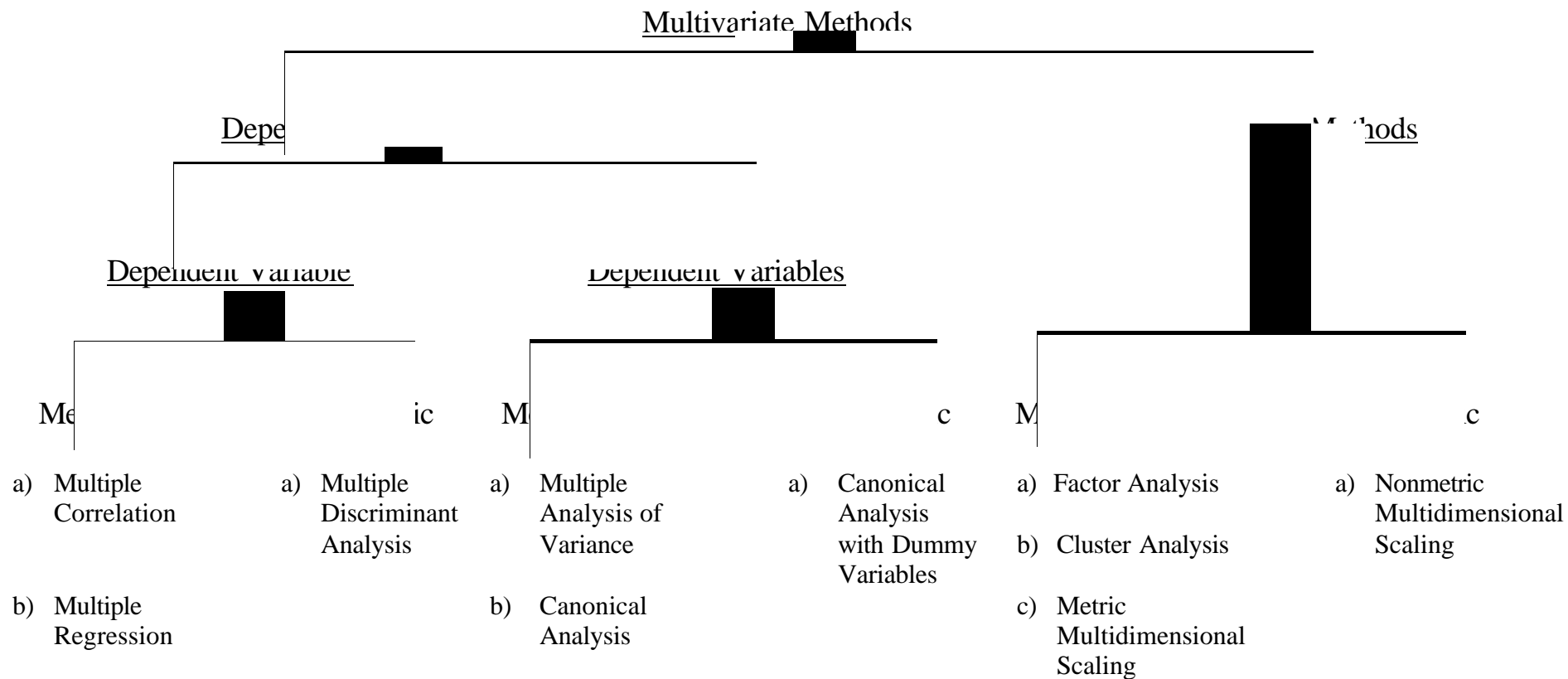
- Confidence Intervals
- z tests ( $n > 30$ )
- single sample
- two samples
- t tests ( $n < 30$ )
- single sample
- two samples
- F tests
- ANOVA
- MANOVA
- Multiple Regression

Relationship

- Contingency Approximations
- discrete/discrete: Biseiral ( $r_{bis}$ )
- discrete/continuous: Point Biseiral ( $r_{pbis}$ )
- discrete/dichotomous: Tetrachoric ( $r_{tet}$ )
- discrete/dichotomous: Phi (N)
- Spearman Rank Order ( $r_s$ ) or D (rho)
- Kendall Rank Order: Tau (J)
- b
- c
- Contingency Coefficient C
- Cramer's V
- Spearman's D
- Lambda (l or 8)
- Gama (' or ()
- Correlation Ratio: Eta (H or 0)
- Chi Square:  $P_2$

Relationship

- Bivariate Linear Regression
- Bivariate Linear Correlation (r)
- Coefficient of Determination ( $r^2$ )
- Alienation (k)
- Indetermination ( $k_2$ )
- Multiple Regression
- Multiple Correlation (R)
- Multiple Determination ( $R^2$ )



A Classification of Multivariate Methods

Taken from: Siegel, Sidney: *Nonparametric Statistics*, McGraw-Hill, 1956

NONPARAMETRIC STATISTICAL TEST*						
LEVEL OF MEASUREMENT	One-sample case	Two-sample case		κ-sample case		NONPARAMETRIC MEASURE OF
	(Chap.4)	Related samples (Chap. 5)	Independent samples (Chap. 6)	Related samples (Chap. 7)	Independent samples (Chap. 8)	CORRELATION (Chap. 9)
<b>Nominal</b>	Binomial test, pp. 36-42 $\chi^2$ one-sample test, pp. 42-47	McNemar test for the significance of changes, pp. 63-67	Fisher exact probability test, pp. 96-104 $\chi^2$ test for two independent samples, pp. 104-111	Cochran Q test, pp. 161-166	$\chi^2$ test for $\kappa$ independent samples, pp. 175-179	Contingency coefficient: C, pp. 196-202
<b>Ordinal</b>	Kolmogorov-Smirnov one-sample test, pp. 47-52 One-sample runs test, pp. 52-58	Sign test, pp. 68-75 Wilcoxon matched-pairs signed-ranks test, † pp. 75-83	•Median test, pp. 111-116 •Mann-Whitney U test, pp. 116-127 •Kolmogorov-Smirnov two-sample test, pp. 127-136 •Wald-Wolfowitz runs test, pp. 136-145 •Moses test of extreme reactions, pp. 145-152	Friedman two-way analysis of variance, pp. 166-172	•Extension of the median test, pp. 179-184 •Kruskal-Wallis one-way analysis of variance, pp. 184-193	•Spearman rank correlation coefficient: $r_s$ , pp. 202-213 •Kendall rank correlation coefficient: $r$ , pp. 213-223 •Kendall partial rank correlation coefficient: $r_{sy}$ , pp. 223-229 •Kendall coefficient of concordance: W, pp.229-238
<b>Interval</b>		Walsh test, pp. 83-87 Randomization test for matched pairs, pp. 88-92	Randomization test for two independent samples, pp. 152-156			
*Each column lists, cumulatively downward, the tests applicable to the given level of measurement. For example, in the case of $\kappa$ related samples, when ordinal measurement has been achieved both the Friedman two-way analysis of variance and the Cochran Q test are applicable.				† The Wilcoxon test requires ordinal measurement not only within pairs, as is required for the sign test, but also of the differences between pairs. See the discussion on pp. 75-76.		