# **Summary of Inferential Statistics**

### Sunthud Pornprasertmanit

### Chulalongkorn University

## One-sample t-test

## **Objectives**

To compare one sample mean with specific mean parameter

Null hypothesis  $H_0$ :  $\mu=\mu_0$ 

Alternative hypothesis  $H_1: \mu \neq \mu_0$  (Two-tailed)

 $H_1: \mu > \mu_0$  (One-tailed)

 $H_1$ :  $\mu < \mu_0$  (One-tailed)

## **Hypothesis Testing, Confidence Interval and Effect Size**

Example 1

#### **One-Sample Statistics**

|        | N   | Mean    | Std. Deviation | Std. Error<br>Mean |
|--------|-----|---------|----------------|--------------------|
| family | 120 | 16.8000 | 2.86268        | .26133             |

#### One-Sample Test

|        |       | Test Value = 15 |                 |            |                              |        |  |  |  |  |
|--------|-------|-----------------|-----------------|------------|------------------------------|--------|--|--|--|--|
|        |       |                 |                 | Mean       | 95% Cor<br>Interva<br>Differ | lofthe |  |  |  |  |
|        | t     | df              | Sig. (2-tailed) | Difference | Lower                        | Upper  |  |  |  |  |
| family | 6.888 | 119             | .000            | 1.80000    | 1.2825                       | 2.3175 |  |  |  |  |

#### Example 2

#### **One-Sample Statistics**

|          | N  | Mean   | Std. Deviation | Std. Error<br>Mean |
|----------|----|--------|----------------|--------------------|
| moralbeh | 79 | 3.1272 | .32636         | .03672             |

#### **Author Note**

This article was written in July 2008 for teaching in Introduction to Statistics Class, Faculty of Psychology, Chulalongkorn University

Correspondence to Sunthud Pornprasertmanit. Email: <a href="mailto:psunthud@gmail.com">psunthud@gmail.com</a>

One-Sample Test

|          |      | Test Value = 3.1 |                 |            |                   |       |  |  |  |
|----------|------|------------------|-----------------|------------|-------------------|-------|--|--|--|
|          |      |                  |                 |            | 95% Co<br>Interva |       |  |  |  |
|          |      |                  |                 | Mean       | Differ            | ence  |  |  |  |
|          | t    | df               | Sig. (2-tailed) | Difference | Lower             | Upper |  |  |  |
| moralbeh | .741 | 78               | .461            | .02722     | 0459              | .1003 |  |  |  |

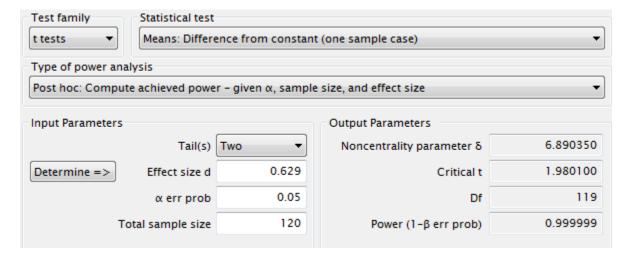
Effect size

$$d = \frac{\bar{X} - \mu_0}{SD} = \frac{16.80 - 15}{2.863} = 0.629$$

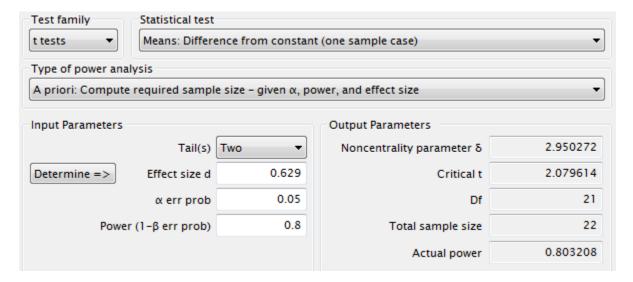
Cohen's d: .20 = small; .50 = medium; .80 = large

## **Power Analysis and Number of Sample**

Power Analysis



#### **Determining Number of Samples**



## Paired-sample t-test (Dependent t-test)

### **Objectives**

The dependent t test is used when the observations in both groups are not statistical independent.

Samples are dependent if the selection of elements in one sample is affected by the selection of elements in the other.

- 1) Repeated measures in the same unit.
- 2) Matching design or randomized block design
- 3) Twin matching
- 4) Matching by mutual selection

| Null hypothesis        | $H_0$ : $\mu_1 - \mu_2 = 0$ ; $\mu_1 = \mu_2$ |              |
|------------------------|---|--------------|
| Alternative hypothesis | $H_1: \mu_1 - \mu_2 \neq 0; \mu_1 \neq \mu_2$ | (Two-tailed) |
|                        | $H_1$ : $\mu_1 - \mu_2 > 0$ ; $\mu_1 > \mu_2$ | (One-tailed) |
|                        | $H_1$ : $\mu_1 - \mu_2 < 0$ ; $\mu_1 < \mu_2$ | (One-tailed) |

## **Hypothesis Testing, Confidence Interval and Effect Size**

## Example 1

#### **Paired Samples Statistics**

|        |        | Mean    | N   | Std. Deviation | Std. Error<br>Mean |
|--------|--------|---------|-----|----------------|--------------------|
| Pair 1 | family | 16.8000 | 120 | 2.86268        | .26133             |
|        | couple | 14.7430 | 120 | 3.32347        | .30339             |

#### **Paired Samples Correlations**

|        |                 | N   | Correlation | Sig. |
|--------|-----------------|-----|-------------|------|
| Pair 1 | family & couple | 120 | .086        | .352 |

#### **Paired Samples Test**

|        |                 |         | Paire          | ed Differences | 3       |          |       |     |                 |
|--------|-----------------|---------|----------------|----------------|---------|----------|-------|-----|-----------------|
|        |                 |         |                |                | 95% Coi | nfidence |       |     |                 |
|        |                 |         |                |                | Interva |          |       |     |                 |
| 1      |                 |         |                | Std. Error     | Differ  | ence     |       |     |                 |
|        |                 | Mean    | Std. Deviation | Mean           | Lower   | Upper    | t     | df  | Sig. (2-tailed) |
| Pair 1 | family - couple | 2.05704 | 4.19622        | .38306         | 1.29854 | 2.81554  | 5.370 | 119 | .000            |

## Example 2

#### **Paired Samples Statistics**

|        |       | Mean   | N  | Std. Deviation | Std. Error<br>Mean |
|--------|-------|--------|----|----------------|--------------------|
| Pair 1 | bpcle | 3.4059 | 79 | .34394         | .03870             |
|        | bmcle | 3.3349 | 79 | .45322         | .05099             |

#### **Paired Samples Correlations**

|        |               | N  | Correlation | Sig. |
|--------|---------------|----|-------------|------|
| Pair 1 | bpcle & bmcle | 79 | .471        | .000 |

#### **Paired Samples Test**

|        |               |        | Paire          | d Differences | 3                            |          |       |    |                 |
|--------|---------------|--------|----------------|---------------|------------------------------|----------|-------|----|-----------------|
|        |               |        |                | Std. Error    | 95% Coi<br>Interva<br>Differ | l of the |       |    |                 |
|        |               | Mean   | Std. Deviation | Mean          | Lower                        | Upper    | t     | df | Sig. (2-tailed) |
| Pair 1 | bpcle - bmcle | .07094 | .42055         | .04732        | 02326                        | .16514   | 1.499 | 78 | .138            |

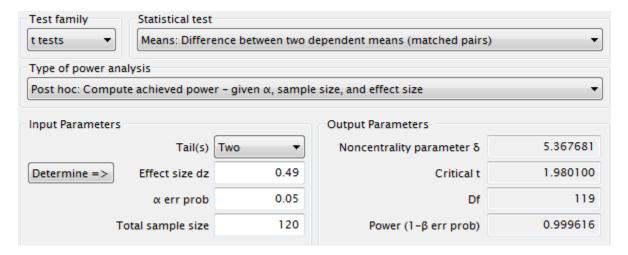
Effect Size

$$d = \frac{\bar{X}_1 - \bar{X}_2}{SD_d} = \frac{d}{SD_d} = \frac{2.057}{4.20} = 0.49$$

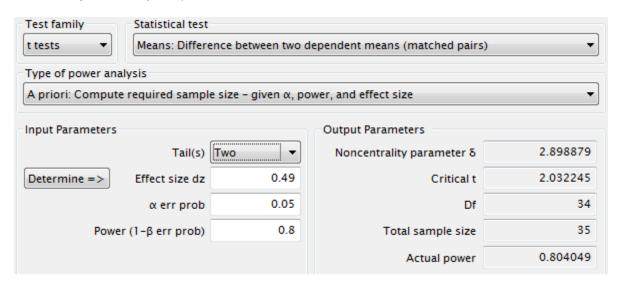
Cohen's d: .20 = small; .50 = medium; .80 = large

## **Power Analysis and Number of Sample**

**Power Analysis** 



#### **Determining Number of Samples**



## **Independent-samples T-test**

## **Objectives**

Although the population difference is equal to zero, the differences between two sample means are not equal to zero by chance.

Therefore, the difference between two independent sample means must be proved that this difference did not occur by sampling error.

Null hypothesis  $H_0$ :  $\mu_1 - \mu_2 = 0$ ;  $\mu_1 = \mu_2$ 

Alternative hypothesis  $H_1: \mu_1 - \mu_2 \neq 0; \mu_1 \neq \mu_2$  (Two-tailed)

 $H_1$ :  $\mu_1 - \mu_2 > 0$ ;  $\mu_1 > \mu_2$  (One-tailed)

 $H_1$ :  $\mu_1 - \mu_2 < 0$ ;  $\mu_1 < \mu_2$  (One-tailed)

## **Hypothesis Testing, Confidence Interval and Effect Size**

Example 1

#### **Group Statistics**

|        | sex    | N  | Mean    | Std. Deviation | Std. Error<br>Mean |
|--------|--------|----|---------|----------------|--------------------|
| family | male   | 58 | 16.8621 | 2.43835        | .32017             |
|        | female | 62 | 16.7419 | 3.22864        | .41004             |

#### Independent Samples Test

|        |                             | Levene's<br>Equality of | Test for<br>Variances |      |         |                 |            |            |   |         |
|--------|-----------------------------|-------------------------|-----------------------|------|---------|-----------------|------------|------------|---|---------|
|        |                             |                         |                       |      |         |                 | Mean       | Std. Error | 95% Confidence<br>Interval of the<br>Difference |         |
|        |                             | F                       | Sig.                  | t    | df      | Sig. (2-tailed) | Difference | Difference | Lower   | Upper   |
| family | Equal variances<br>assumed  | 3.558                   | .062                  | .229 | 118     | .819            | .12013     | .52504     | 91958   | 1.15985 |
|        | Equal variances not assumed |                         |                       | .231 | 113.075 | .818            | .12013     | .52023     | 91053   | 1.15080 |

## Example 2

## **Group Statistics**

|          |          |    |        |                | Std. Error |
|----------|----------|----|--------|----------------|------------|
|          | SchoolID | Ν  | Mean   | Std. Deviation | Mean       |
| moralbeh | 102      | 79 | 3.1272 | .32636         | .03672     |
|          | 110      | 50 | 3.3237 | .25749         | .03642     |

## Independent Samples Test

| Levene's Test for<br>Equality of Variances |                             |       | t-test for Equality of Means |        |         |                 |            |            |                              |       |
|--|-----------------------------|-------|------------------------------|--------|---------|-----------------|------------|------------|------------------------------|-------|
|  |                             |       |                              |        |         |                 | Mean       | Std. Error | 95% Cor<br>Interva<br>Differ | ofthe |
|  |                             | F     | Sig.                         | t      | df      | Sig. (2-tailed) | Difference | Difference | Lower                        | Upper |
| moralbeh                                   | Equal variances assumed     | 2.421 | .122                         | -3.604 | 127     | .000            | 19648      | .05451     | 30435                        | 08860 |
|  | Equal variances not assumed |       |                              | -3.799 | 120.828 | .000            | 19648      | .05171     | 29886                        | 09409 |

Effect Size

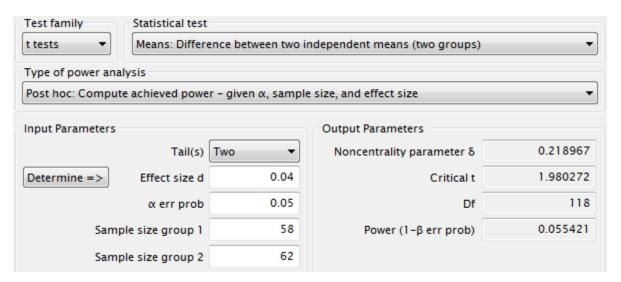
$$s_{\text{pooled}}^2 = \frac{df_1 s_1^2 + df_2 s_2^2}{df_1 + df_2} = \frac{(58 - 1)(2.438)^2 + (62 - 1)(3.229)^2}{(58 - 1) + (62 - 1)} = 8.261$$
$$d = \frac{\bar{X}_1 - \bar{X}_2}{SD_{\text{pooled}}} = \frac{16.862 - 16.742}{\sqrt{8.261}} = \frac{0.120}{2.874} = 0.04$$

Cohen's *d*: .20 = small; .50 = medium; .80 = large

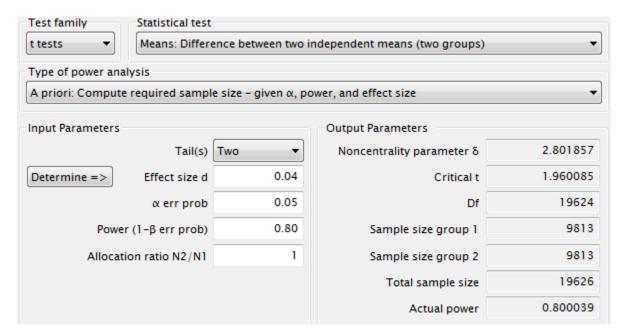
If the assumption that the population variances are equal is not tenable, the variances should not be pooled in computing d. Sample standard deviation of control group or the standard deviation of group that is used as baseline is used in place of pooled standard deviation.

### **Power Analysis and Number of Sample**

**Power Analysis** 



#### **Determining Number of Samples**



#### **Correlation**

#### **Objectives**

The correlation coefficient determines the relationship of two variables.

Correlation coefficient (r or  $\rho$ )

- Direction (Negative, Positive)
- Strength of relationship

- Coefficient of determination (Variance explained)  $\rightarrow$  ( $r^2$  or  $\rho^2$ )
- Coefficient of nondetermination  $\rightarrow$  (1  $r^2$  or 1  $\rho^2$ )

Therefore, the correlation statistics must be tested for confirming that this correlation is not stemmed from sampling error.

Null hypothesis 
$$H_0: \rho=0$$
 Alternative hypothesis 
$$H_1: \rho\neq 0 \qquad \qquad \text{(Two-tailed)}$$
 
$$H_1: \rho>0 \quad \text{or} \quad H_1: \rho<0 \qquad \text{(One-tailed)}$$

## Types of Correlation

Pearson's correlation (Interval/Interval)

Point-biserial correlation (Interval/Dichotomous)

Phi correlation (Dichotomous/Dichotomous)

Spearman's rank correlation (Ordinal/Ordinal)

## **Hypothesis Testing and Effect Size**

#### Pearson's correlation

#### Correlations

|        |                     | family   | friend   | couple   |
|--------|---------------------|----------|----------|----------|
| family | Pearson Correlation | 1        | .285(**) | .086     |
|        | Sig. (2-tailed)     |          | .002     | .352     |
|        | N                   | 120      | 120      | 120      |
| friend | Pearson Correlation | .285(**) | 1        | .396(**) |
|        | Sig. (2-tailed)     | .002     |          | .000     |
|        | N                   | 120      | 120      | 120      |
| couple | Pearson Correlation | .086     | .396(**) | 1        |
|        | Sig. (2-tailed)     | .352     | .000     |          |
|        | N                   | 120      | 120      | 120      |

<sup>\*\*</sup> Correlation is significant at the 0.01 level (2-tailed).

#### Spearman's rank correlation

#### Correlations

|                |        |                         | family   | friend   | couple   |
|----------------|--------|-------------------------|----------|----------|----------|
| Spearman's rho | family | Correlation Coefficient | 1.000    | .282(**) | .116     |
|                |        | Sig. (2-tailed)         |          | .002     | .207     |
|                |        | N                       | 120      | 120      | 120      |
|                | friend | Correlation Coefficient | .282(**) | 1.000    | .294(**) |
|                |        | Sig. (2-tailed)         | .002     |          | .001     |
|                |        | N                       | 120      | 120      | 120      |
|                | couple | Correlation Coefficient | .116     | .294(**) | 1.000    |
|                |        | Sig. (2-tailed)         | .207     | .001     |          |
|                |        | N                       | 120      | 120      | 120      |

<sup>\*\*</sup> Correlation is significant at the 0.01 level (2-tailed).

## Pearson's Correlation, Point-biserial correlation, Phi coefficient

#### Correlations

|                  |                     | evertake | evergive | gpax    | unhappywi<br>thgrade |
|------------------|---------------------|----------|----------|---------|----------------------|
| evertake         | Pearson Correlation | 1        | .630(**) | 103(**) | .032                 |
|                  | Sig. (2-tailed)     |          | .000     | .001    | .298                 |
|                  | N                   | 1093     | 1093     | 1085    | 1087                 |
| evergive         | Pearson Correlation | .630(**) | 1        | 009     | 039                  |
|                  | Sig. (2-tailed)     | .000     |          | .779    | .201                 |
|                  | N                   | 1093     | 1093     | 1085    | 1087                 |
| gpax             | Pearson Correlation | 103(**)  | 009      | 1       | 472(**)              |
|                  | Sig. (2-tailed)     | .001     | .779     |         | .000                 |
|                  | N                   | 1085     | 1085     | 1085    | 1081                 |
| unhappywithgrade | Pearson Correlation | .032     | 039      | 472(**) | 1                    |
|                  | Sig. (2-tailed)     | .298     | .201     | .000    |                      |
|                  | N                   | 1087     | 1087     | 1081    | 1087                 |

<sup>\*\*</sup> Correlation is significant at the 0.01 level (2-tailed).

Effect Size

Correlation: .10 = small; .30 = medium; .50 = large

## **Confidence Interval**

Pearson's correlation or Point-biserial correlation

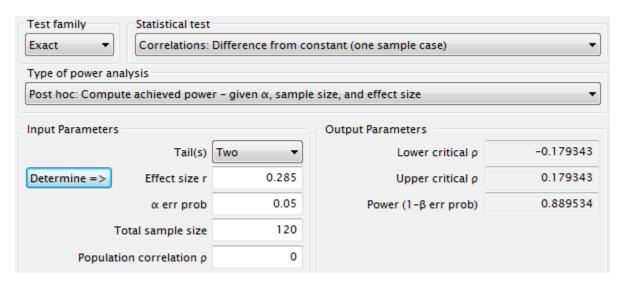
File: CI of r.xls

| Confidence Interval of Pearson's Correlation |       |       |  |  |  |  |  |
|--|-------|-------|--|--|--|--|--|
|  |       |       |  |  |  |  |  |
| r  | 0.6   |       |  |  |  |  |  |
| n  | 50    |       |  |  |  |  |  |
| CI   | 0.95  |       |  |  |  |  |  |
| CI of r                                      | 0.386 | 0.753 |  |  |  |  |  |

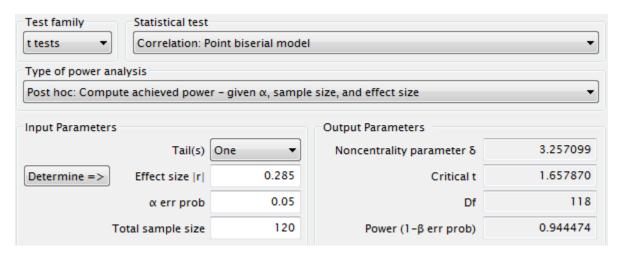
## **Power Analysis and Number of Sample**

**Power Analysis** 

#### Pearson's correlation

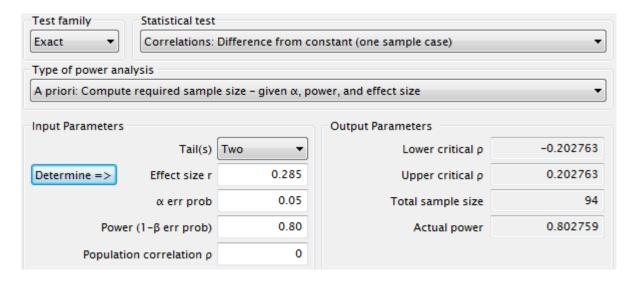


#### Point-biserial correlation

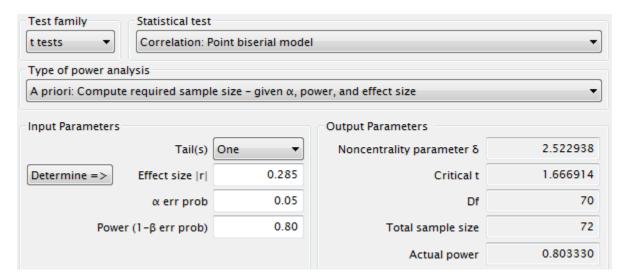


#### **Determining Number of Samples**

#### Pearson's correlation



#### Point-biserial correlation



## One-way Analysis of Variance (One-way ANOVA)

#### **Objectives**

Sometimes, researchers want to compare mean differences between three or more independent groups. (If comparing dependent groups, use repeated-measure ANOVA)

Null hypothesis 
$$H_0$$
:  $\mu_1 = \mu_2 = \mu_3 = \cdots = \mu_k$ 

If one pair of groups has significant mean differences, the null hypothesis is not tenable.

Alternative hypothesis

 $H_1$ :  $\mu_i \neq \mu_i$ 

The Analysis of Variance (ANOVA) proves whether the null hypothesis is tenable.

The multiple t tests should not be used, because of inflated type I error. The ANOVA method can control the probability of making a type I error equal to  $\alpha$ .

If reject null hypothesis, which means are different?

Method of Post Hoc (Multiple Comparisons) Test

<u>Tukey HSD</u> Homogeneity of Variance / Equal n

<u>Gabriel</u> Homogeneity of Variance / Unequal n

<u>Games-Howell</u> Heterogeneity of Variance

## **Hypothesis Testing and Effect Size**

#### Example 1

#### Descriptives

SocialSupport

|                     |     |         |                |            | 95% Confidence Interval for<br>Mean |         |         |         |
|---------------------|-----|---------|----------------|------------|-------------------------------------|---------|---------|---------|
|                     | N   | Mean    | Std. Deviation | Std. Error | Lower Bound Upper Bound             |         | Minimum | Maximum |
| high school science | 29  | 62.8797 | 7.45808        | 1.38493    | 60.0428                             | 65.7166 | 49.00   | 76.00   |
| high school arts    | 32  | 61.5669 | 9.52880        | 1.68447    | 58.1314                             | 65.0024 | 32.00   | 77.00   |
| undergraduate       | 59  | 65.3553 | 6.42781        | .83683     | 63.6802                             | 67.0304 | 47.74   | 75.00   |
| Total               | 120 | 63.7468 | 7.72156        | .70488     | 62.3510 65.1425                     |         | 32.00   | 77.00   |

#### **Test of Homogeneity of Variances**

SocialSupport

| Levene<br>Statistic | df1 | df2 | Sia. |
|---------------------|-----|-----|------|
| 1.711               | 2   | 117 | .185 |

#### **ANOVA**

SocialSupport

|                | Sum of<br>Squares | df  | Mean Square | F     | Sig. |
|----------------|-------------------|-----|-------------|-------|------|
| Between Groups | 326.516           | 2   | 163.258     | 2.822 | .064 |
| Within Groups  | 6768.553          | 117 | 57.851      |       |      |
| Total          | 7095.070          | 119 |             |       |      |

#### **Robust Tests of Equality of Means**

SocialSupport

|       | Statistic(a) | df1 | df2    | Sig. |
|-------|--------------|-----|--------|------|
| Welch | 2.598        | 2   | 56.752 | .083 |

a Asymptotically F distributed.

#### Multiple Comparisons

Dependent Variable: SocialSupport

| Dependent varia | ible. SocialSupport |                     |                    |            |      |             |                         |  |
|-----------------|---------------------|---------------------|--------------------|------------|------|-------------|-------------------------|--|
|                 |                     |                     | Mean<br>Difference |            |      | 95% Confid  | 95% Confidence Interval |  |
|                 | (I) edu2            | (J) edu2            | (I-J)              | Std. Error | Sig. | Lower Bound | Upper Bound             |  |
| Tukey HSD       | high school science | high school arts    | 1.31285            | 1.95005    | .779 | -3.3164     | 5.9421                  |  |
|                 |                     | undergraduate       | -2.47557           | 1.72493    | .326 | -6.5704     | 1.6193                  |  |
|                 | high school arts    | high school science | -1.31285           | 1.95005    | .779 | -5.9421     | 3.3164                  |  |
|                 |                     | undergraduate       | -3.78842           | 1.66984    | .064 | -7.7525     | .1756                   |  |
|                 | undergraduate       | high school science | 2.47557            | 1.72493    | .326 | -1.6193     | 6.5704                  |  |
|                 |                     | high school arts    | 3.78842            | 1.66984    | .064 | 1756        | 7.7525                  |  |
| Gabriel         | high school science | high school arts    | 1.31285            | 1.95005    | .875 | -3.4071     | 6.0328                  |  |
|                 |                     | undergraduate       | -2.47557           | 1.72493    | .379 | -6.5889     | 1.6377                  |  |
|                 | high school arts    | high school science | -1.31285           | 1.95005    | .875 | -6.0328     | 3.4071                  |  |
|                 |                     | undergraduate       | -3.78842           | 1.66984    | .069 | -7.7856     | .2088                   |  |
|                 | undergraduate       | high school science | 2.47557            | 1.72493    | .379 | -1.6377     | 6.5889                  |  |
|                 |                     | high school arts    | 3.78842            | 1.66984    | .069 | 2088        | 7.7856                  |  |
| Games-Howell    | high school science | high school arts    | 1.31285            | 2.18071    | .820 | -3.9329     | 6.5585                  |  |
|                 |                     | undergraduate       | -2.47557           | 1.61812    | .286 | -6.3864     | 1.4352                  |  |
|                 | high school arts    | high school science | -1.31285           | 2.18071    | .820 | -6.5585     | 3.9329                  |  |
|                 |                     | undergraduate       | -3.78842           | 1.88088    | .120 | -8.3414     | .7646                   |  |
|                 | undergraduate       | high school science | 2.47557            | 1.61812    | .286 | -1.4352     | 6.3864                  |  |
|                 |                     | high school arts    | 3.78842            | 1.88088    | .120 | 7646        | 8.3414                  |  |

## Example 2

#### Descriptives

moralbeh

|       |     |        |                |            | 95% Confidence Interval for<br>Mean |             |         |         |
|-------|-----|--------|----------------|------------|-------------------------------------|-------------|---------|---------|
|       | N   | Mean   | Std. Deviation | Std. Error | Lower Bound                         | Upper Bound | Minimum | Maximum |
| 102   | 79  | 3.1272 | .32636         | .03672     | 3.0541                              | 3.2003      | 2.13    | 3.80    |
| 106   | 77  | 3.1913 | .25750         | .02934     | 3.1329                              | 3.2498      | 2.60    | 3.62    |
| 110   | 50  | 3.3237 | .25749         | .03642     | 3.2505                              | 3.3969      | 2.53    | 3.80    |
| 114   | 80  | 3.2153 | .24835         | .02777     | 3.1600                              | 3.2706      | 2.71    | 3.67    |
| Total | 286 | 3.2035 | .28206         | .01668     | 3.1706                              | 3.2363      | 2.13    | 3.80    |

## **Test of Homogeneity of Variances**

moralbeh

| Levene<br>Statistic | df1 | df2 | Sig. |
|---------------------|-----|-----|------|
| 1.651               | 3   | 282 | .178 |

#### **ANOVA**

#### moralbeh

|                | Sum of<br>Squares | df  | Mean Square | F     | Sig. |
|----------------|-------------------|-----|-------------|-------|------|
| Between Groups | 1.205             | 3   | .402        | 5.274 | .001 |
| Within Groups  | 21.469            | 282 | .076        |       |      |
| Total          | 22.673            | 285 |             |       |      |

#### **Robust Tests of Equality of Means**

#### moralbeh

|       | Statistic(a) | df1 | df2     | Sig. |
|-------|--------------|-----|---------|------|
| Welch | 5.037        | 3   | 146.592 | .002 |

a Asymptotically F distributed.

#### **Multiple Comparisons**

Dependent Variable: moralbeh

#### Gabriel

| Gabriel                   |     |                             |            |      |             |                           |
|---------------------------|-----|-----------------------------|------------|------|-------------|---------------------------|
| (I) SchoolID (J) SchoolID |     | Mean<br>Difference<br>(I-J) | Std. Error | Sig. | 95% Confide | ence Interval Upper Bound |
| 102                       | 106 | 06413                       | .04419     | .615 | 1812        | .0529                     |
|                           | 110 | 19648*                      | .04986     | .001 | 3277        | 0652                      |
|                           | 114 | 08810                       | .04376     | .241 | 2040        | .0278                     |
| 106                       | 102 | .06413                      | .04419     | .615 | 0529        | .1812                     |
|                           | 110 | 13235*                      | .05011     | .049 | 2643        | 0004                      |
|                           | 114 | 02397                       | .04405     | .995 | 1406        | .0927                     |
| 110                       | 102 | .19648*                     | .04986     | .001 | .0652       | .3277                     |
|                           | 106 | .13235*                     | .05011     | .049 | .0004       | .2643                     |
|                           | 114 | .10838                      | .04974     | .162 | 0225        | .2392                     |
| 114                       | 102 | .08810                      | .04376     | .241 | 0278        | .2040                     |
|                           | 106 | .02397                      | .04405     | .995 | 0927        | .1406                     |
|                           | 110 | 10838                       | .04974     | .162 | 2392        | .0225                     |

<sup>\*.</sup> The mean difference is significant at the .05 level.

Effect Size

#### **Overall Difference**

Eta squared

$$\eta^2 = \frac{SS_{\text{group}}}{SS_{\text{total}}} = \frac{326.52}{7095.07} = 0.046$$

Omega squared

$$\omega^2 = \frac{(k-1)(F-1)}{(k-1)(F-1) + nk} = \frac{(3-1)(2.822-1)}{(3-1)(2.822-1) + (120)(3)} = 0.010$$

Omega squared:

.010 = small;

.059 = medium;

.138 = large

Cohen's f

$$f = \frac{\sigma_M}{\sigma} = \frac{\frac{\sum (M - \mu_M)^2}{k}}{\sqrt{MS_{\text{error}}}} = \frac{1.57}{7.606} = 0.206$$

Cohen's *f*:

.10 = small;

.25 = medium; .40 = large

#### Each comparison

$$d = \frac{\bar{X}_1 - \bar{X}_2}{SD_{\text{pooled}}} = \frac{\bar{X}_1 - \bar{X}_2}{\sqrt{MS_{\text{error}}}}$$

$$d_{1-2} = \frac{1.313}{\sqrt{57.851}} = 0.17$$

$$d_{1-3} = \frac{-2.476}{\sqrt{57.851}} = -0.33$$

$$d_{2-3} = \frac{-3.788}{\sqrt{57.851}} = -0.50$$

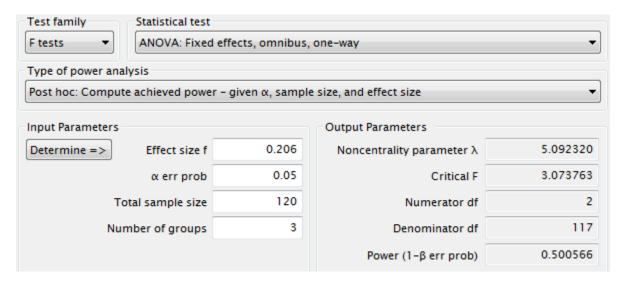
Cohen's d:

.20 = small;

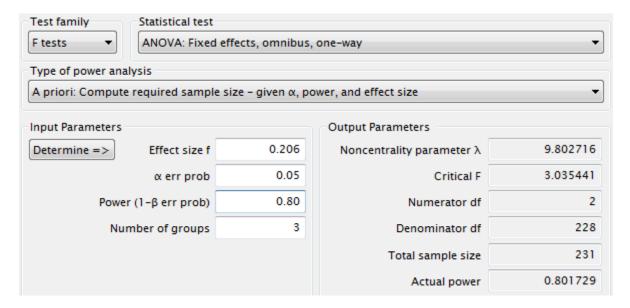
.50 = medium; .80 = large

## **Power Analysis and Number of Sample**

**Power Analysis** 



#### **Determining Number of Samples**



## **Simple Regression**

### **Objectives**

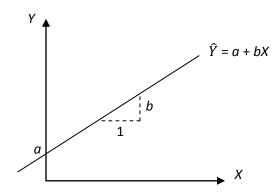
When two variables are correlated, the knowledge of one variable can predict the value of another variable.

Predictor Variable (Independent Variable; X) is the variable use for prediction Predicted variable (Criterion Variable or Dependent Variable; Y) is the variable predicted by X. Actual Value (Y), Predicted Value ( $\hat{Y}$ ), Error of Prediction (e)

$$Y - \hat{Y} = e$$

Regression Line

$$\hat{Y} = a + bX$$



Slope (b) is change in predicted Y if X change in one unit.

Y-intercept (a) is predicted Y value if X = 0.

You must test  $H_0$ :  $\rho=0$  before run regression analysis. If the correlation is equal to 0, the predictor is not predicted more precise than  $\overline{Y}$ .

There are two more null hypotheses testing in regression analysis.

$$H_0$$
:  $a = 0$  and  $H_0$ :  $b = 0$ 

The alternative hypotheses are

$$H_0$$
:  $a \neq 0$  and  $H_0$ :  $b \neq 0$  (Two-tailed)  $H_0$ :  $a > 0$  and  $H_0$ :  $b > 0$  (One-tailed)  $H_0$ :  $a < 0$  and  $H_0$ :  $b < 0$  (One-tailed)

Standardized regression coefficient ( $\beta$ ) is the change in predicted standard score of Y if X change in one standard score unit (one SD).

Standard regression coefficient (
$$\beta$$
): .10 = small; .30 = medium; .50 = large

In simple regression, the correlation coefficient is equal to standardized regression coefficient.

If there are more than one predictors in regression analysis, the name is changed to multiple regression.

$$\hat{Y} = a + b_1 X_1 + b_2 X_2$$

## **Hypothesis Testing and Effect Size**

Example 1

#### Variables Entered/Removed(b)

| Model | Variables<br>Entered | Variables<br>Removed | Method |
|-------|----------------------|----------------------|--------|
| 1     | couple(a)            |                      | Enter  |

a All requested variables entered.

#### **Model Summary**

| Model | R       | R Square | Adjusted R<br>Square | Std. Error of the Estimate |
|-------|---------|----------|----------------------|----------------------------|
| 1     | .086(a) | .007     | 001                  | 2.86419                    |

a Predictors: (Constant), couple

b Dependent Variable: family

#### ANOVA(b)

| Model |            | Sum of<br>Squares | df  | Mean Square | F    | Sig.    |
|-------|------------|-------------------|-----|-------------|------|---------|
| 1     | Regression | 7.175             | 1   | 7.175       | .875 | .352(a) |
|       | Residual   | 968.025           | 118 | 8.204       |      |         |
|       | Total      | 975.200           | 119 |             |      |         |

a Predictors: (Constant), couple b Dependent Variable: family

#### Coefficients(a)

|       |            | Unstandardized Coefficients |            | Standardized Coefficients |        |      |
|-------|------------|-----------------------------|------------|---------------------------|--------|------|
| Model |            | В                           | Std. Error | Beta                      | t      | Sig. |
| 1     | (Constant) | 15.711                      | 1.194      |                           | 13.161 | .000 |
|       | couple     | .074                        | .079       | .086                      | .935   | .352 |

a Dependent Variable: family

### Example 2

#### Variables Entered/Removed(b)

| Model | Variables<br>Entered | Variables<br>Removed | Method |
|-------|----------------------|----------------------|--------|
| 1     | bdelig(a)            |                      | Enter  |

a All requested variables entered.b Dependent Variable: Grade

## Model Summary

| Model | R       | R Square | Adjusted R<br>Square | Std. Error of the Estimate |
|-------|---------|----------|----------------------|----------------------------|
| 1     | .326(a) | .106     | .103                 | .44796                     |

a Predictors: (Constant), bdelig

#### ANOVA(b)

| Model | -          | Sum of<br>Squares | df  | Mean Square | F      | Sig.    |
|-------|------------|-------------------|-----|-------------|--------|---------|
| 1     | Regression | 6.700             | 1   | 6.700       | 33.386 | .000(a) |
|       | Residual   | 56.387            | 281 | .201        |        |         |
|       | Total      | 63.087            | 282 |             |        |         |

a Predictors: (Constant), bdeligb Dependent Variable: Grade

#### Coefficients(a)

|       | Unstandardized Coefficients |       | Standardized<br>Coefficients |      |        |      |
|-------|-----------------------------|-------|------------------------------|------|--------|------|
| Model |                             | В     | Std. Error                   | Beta | t      | Sig. |
| 1     | (Constant)                  | 2.303 | .147                         |      | 15.694 | .000 |
|       | bdelig                      | .286  | .049                         | .326 | 5.778  | .000 |

a Dependent Variable: Grade

Effect Size

All predictors

$$f^2 = \frac{R^2}{1 - R^2} = \frac{0.007}{1 - 0.007} = 0.007$$

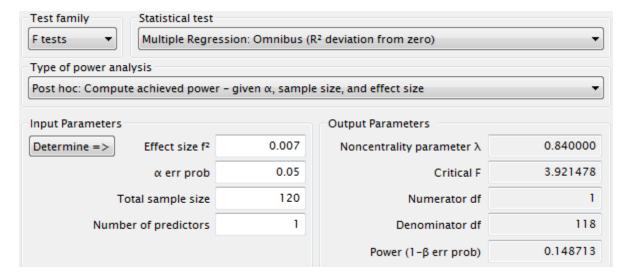
<u>f squared</u>: .02 = small; .15 = medium; .35 = large

**Each predictors** 

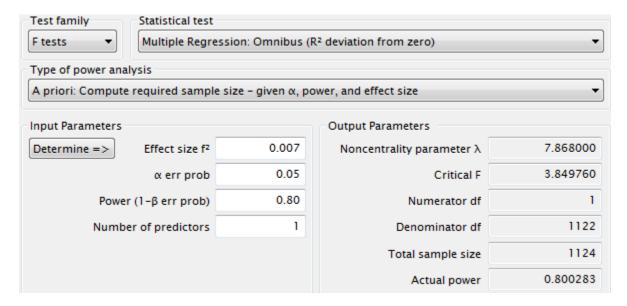
Standard regression coefficient ( $\beta$ ): .10 = small; .30 = medium; .50 = large

## **Power Analysis and Number of Sample**

**Power Analysis** 



#### **Determining Number of Samples**



## **Chi-Square: Goodness-of-fit Test**

## **Objectives**

The chi-square goodness-of-fit test is used for testing that the proportion is different from expected proportion.

Null hypothesis 
$$H_0\colon p_1=P_1; p_2=P_2; \dots; p_i=P_i$$
 or 
$$H_0\colon (p_1\colon p_2\colon \dots\colon p_i)=(P_1\colon P_2\colon \dots\colon P_i)$$
 Alternative hypothesis 
$$H_1\colon p_i\neq P_i \quad \text{ for one or more categories}$$
 or 
$$H_0\colon (p_1\colon p_2\colon \dots\colon p_i)\neq (P_1\colon P_2\colon \dots\colon P_i)$$

## **Hypothesis Testing and Effect Size**

#### Example 1

#### age

|       | Observed N | Expected N | Residual |
|-------|------------|------------|----------|
| 15    | 4          | 13.3       | -9.3     |
| 16    | 18         | 13.3       | 4.7      |
| 17    | 26         | 13.3       | 12.7     |
| 18    | 23         | 13.3       | 9.7      |
| 19    | 14         | 13.3       | .7       |
| 20    | 16         | 13.3       | 2.7      |
| 21    | 12         | 13.3       | -1.3     |
| 22    | 6          | 13.3       | -7.3     |
| 23    | 1          | 13.3       | -12.3    |
| Total | 120        |            |          |

#### **Test Statistics**

|                   | age    |
|-------------------|--------|
| Chi-<br>Square(a) | 43.350 |
| df                | 8      |
| Asymp. Sig.       | .000   |

a 0 cells (.0%) have expected frequencies less than 5. The minimum expected cell frequency is 13.3.

Example 2

evertake

|       | Observed N | Expected N | Residual |
|-------|------------|------------|----------|
| .00   | 377        | 546.5      | -169.5   |
| 1.00  | 716        | 546.5      | 169.5    |
| Total | 1093       |            |          |

**Test Statistics** 

|                   | evertake |
|-------------------|----------|
| Chi-<br>Square(a) | 105.143  |
| df                | 1        |
| Asymp. Sig.       | .000     |

a 0 cells (.0%) have expected frequencies less than 5. The minimum expected cell frequency is 546.5.

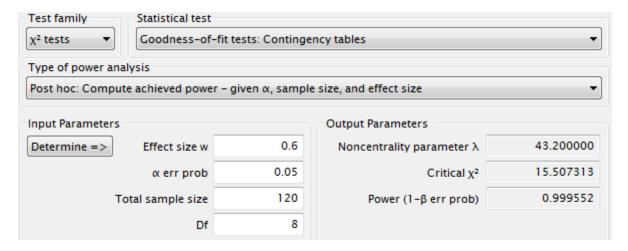
Effect Size

$$w = \sqrt{\frac{\chi^2}{n}} = \sqrt{\frac{43.35}{120}} = 0.60$$

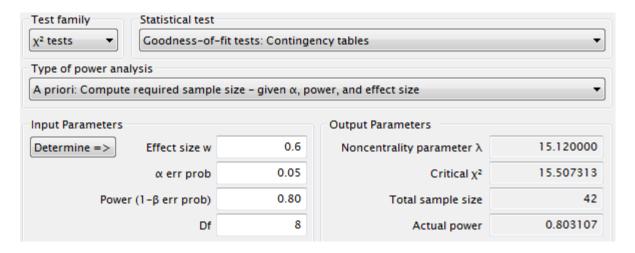
Cohen's w: .10 = small; .30 = medium; .50 = large

### **Power Analysis and Number of Sample**

**Power Analysis** 



**Determining Number of Samples** 



## **Chi-Square: Contingency Table**

## **Objectives**

The chi-square contingency table is used for testing whether groups are equal in distribution of proportion of each category.

Null hypothesis  $H_0: (p_1: p_2: ...: p_i)_1 = (p_1: p_2: ...: p_i)_2 = \cdots = (p_1: p_2: ...: p_i)_k$ 

Alternative hypothesis:  $H_1: (p_1: p_2: ...: p_i)_k = (p_1: p_2: ...: p_i)_l$  for one or more categories

## **Hypothesis Testing, Confidence Interval and Effect Size**

Example 1

#### **Case Processing Summary**

|                     | Cases |         |         |         |       |         |
|---------------------|-------|---------|---------|---------|-------|---------|
|                     | Va    | lid     | Missing |         | Total |         |
|                     | N     | Percent | Ν       | Percent | N     | Percent |
| evergive * evertake | 1093  | 100.0%  | 0       | .0%     | 1093  | 100.0%  |

#### evergive \* evertake Crosstabulation

|          |      |                   | ever   | take   | Total  |
|----------|------|-------------------|--------|--------|--------|
|          |      |                   | .00    | 1.00   | .00    |
| evergive | .00  | Count             | 325    | 147    | 472    |
|          |      | % within evertake | 86.2%  | 20.5%  | 43.2%  |
|          | 1.00 | Count             | 52     | 569    | 621    |
|          |      | % within evertake | 13.8%  | 79.5%  | 56.8%  |
| Total    |      | Count             | 377    | 716    | 1093   |
|          |      | % within evertake | 100.0% | 100.0% | 100.0% |

#### **Chi-Square Tests**

|                                 | Value      | df | Asymp. Sig.<br>(2-sided) | Exact Sig. (2-sided) | Exact Sig. (1-sided) |
|---------------------------------|------------|----|--------------------------|----------------------|----------------------|
| Pearson Chi-Square              | 434.167(b) | 1  | .000                     |                      |                      |
| Continuity<br>Correction(a)     | 431.494    | 1  | .000                     |                      |                      |
| Likelihood Ratio                | 465.360    | 1  | .000                     |                      |                      |
| Fisher's Exact Test             |            |    |                          | .000                 | .000                 |
| Linear-by-Linear<br>Association | 433.770    | 1  | .000                     |                      |                      |
| N of Valid Cases                | 1093       |    |                          |                      |                      |

a Computed only for a 2x2 table

#### **Symmetric Measures**

|                  |            | Value | Approx. Sig. |
|------------------|------------|-------|--------------|
| Nominal by       | Phi        | .630  | .000         |
| Nominal          | Cramer's V | .630  | .000         |
| N of Valid Cases |            | 1093  |              |

a Not assuming the null hypothesis.

b 0 cells (.0%) have expected count less than 5. The minimum expected count is 162.80.

b Using the asymptotic standard error assuming the null hypothesis.

#### **Case Processing Summary**

|                  | Cases |         |         |         |       |         |
|------------------|-------|---------|---------|---------|-------|---------|
|                  | Valid |         | Missing |         | Total |         |
|                  | N     | Percent | N       | Percent | N     | Percent |
| evertake * class | 1087  | 99.5%   | 6       | .5%     | 1093  | 100.0%  |

#### evertake \* class Crosstabulation

|          |      |                |        | class  |        |        |        |  |
|----------|------|----------------|--------|--------|--------|--------|--------|--|
|          |      |                | 1      | 2      | 3      | 4      | 1      |  |
| evertake | .00  | Count          | 115    | 93     | 91     | 77     | 376    |  |
|          |      | % within class | 37.0%  | 30.6%  | 34.2%  | 37.4%  | 34.6%  |  |
|          | 1.00 | Count          | 196    | 211    | 175    | 129    | 711    |  |
|          |      | % within class | 63.0%  | 69.4%  | 65.8%  | 62.6%  | 65.4%  |  |
| Total    |      | Count          | 311    | 304    | 266    | 206    | 1087   |  |
|          |      | % within class | 100.0% | 100.0% | 100.0% | 100.0% | 100.0% |  |

#### **Chi-Square Tests**

|                                 | Value    | df | Asymp. Sig.<br>(2-sided) |
|---------------------------------|----------|----|--------------------------|
| Pearson Chi-Square              | 3.656(a) | 3  | .301                     |
| Likelihood Ratio                | 3.682    | 3  | .298                     |
| Linear-by-Linear<br>Association | .032     | 1  | .858                     |
| N of Valid Cases                | 1087     |    |                          |

a 0 cells (.0%) have expected count less than 5. The minimum expected count is 71.26.

#### **Symmetric Measures**

|                       |            | Value | Approx. Sig. |
|-----------------------|------------|-------|--------------|
| Nominal by<br>Nominal | Phi        | .058  | .301         |
|                       | Cramer's V | .058  | .301         |
| N of Valid Cases      |            | 1087  |              |

a Not assuming the null hypothesis.

b Using the asymptotic standard error assuming the null hypothesis.

#### Effect Size

<u>Phi</u>: Pearson's *r* in 2 x 2 contingency table

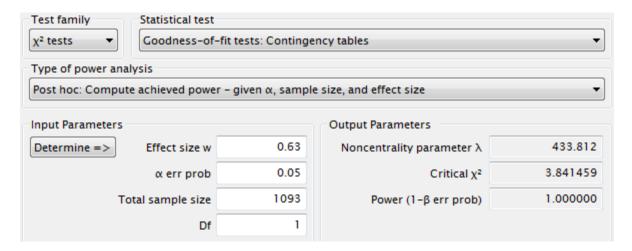
Cohen's w

$$w = \sqrt{\frac{\chi^2}{n}} = \sqrt{\frac{434.167}{1093}} = 0.63$$

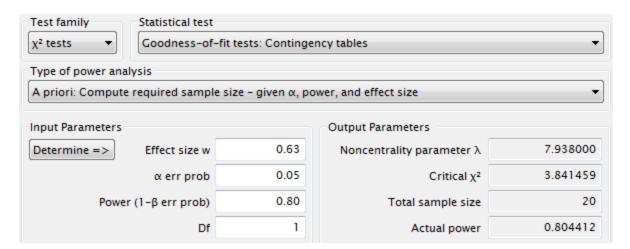
Cohen's w: .10 = small; .30 = medium; .50 = large

## **Power Analysis and Number of Sample**

**Power Analysis** 



#### **Determining Number of Samples**



## **Correlation (or Difference) and Causation**

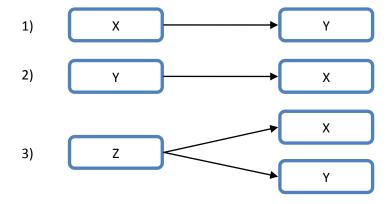
The conditions make causal relation

- 1) X precedes Y in time
- 2) Some mechanism explained
- 3) Change in X is accompanied by change in Y
- 4) Effect X on Y cannot be explained by other variables

The research design that can prove casual relationship is experimental design.

Interpretation of correlation (or difference)

- 1) X causes Y.
- 2) Y causes X.
- 3) Z causes both X and Y.



#### **Statistical Decision Tree**

In this statistical decision tree, the statistics that include in this tree are only in introduction to statistics lecture. For advanced statistic, this decision tree will enhance its sophistication.

- 1) Fitting Population Parameters
  - a. Means  $\rightarrow$  One-sample z-test or One-sample t-test
  - b. Proportions → Chi-square Goodness-of-fit
- 2) Comparison between Groups
  - a. Means
    - i. Independent Group
      - 1. Two Categories  $\rightarrow$  Independent *t*-test
      - 2. Three or More Categories → One-way ANOVA
    - ii. Dependent Group
      - 1. Two Categories  $\rightarrow$  Dependent *t*-test
      - 2. Three or More Categories → Repeated-measure ANOVA
  - b. Proportions → Chi-square
- 3) Correlation
  - a. Interval & Interval → Pearson's correlation (Prediction: Simple Regression)
  - b. Interval & Dichotomous → Point-biserial Correlation
  - c. Ordinal & Ordinal → Spearman's rank correlation
  - d. Dichotomous & Dichotomous → Phi Coefficient