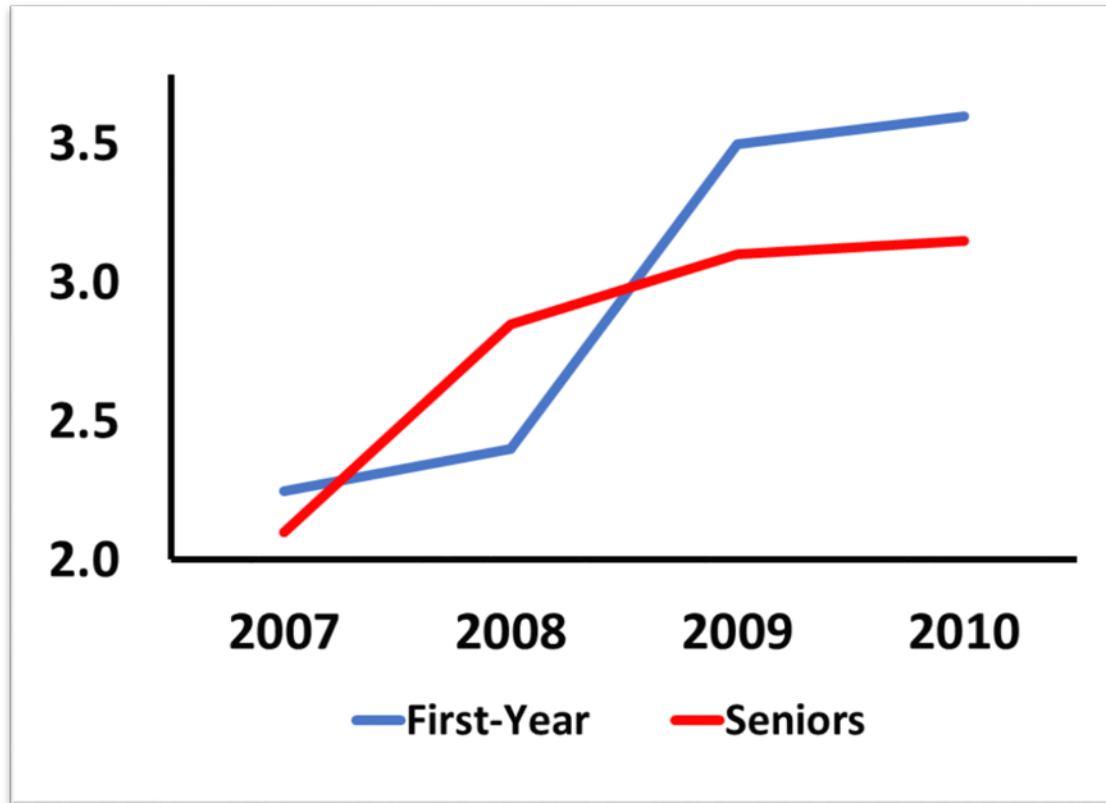


A Multi-Year Analysis (of NSSE Data) Using ANOVA



UNIVERSITY
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MĀNOA



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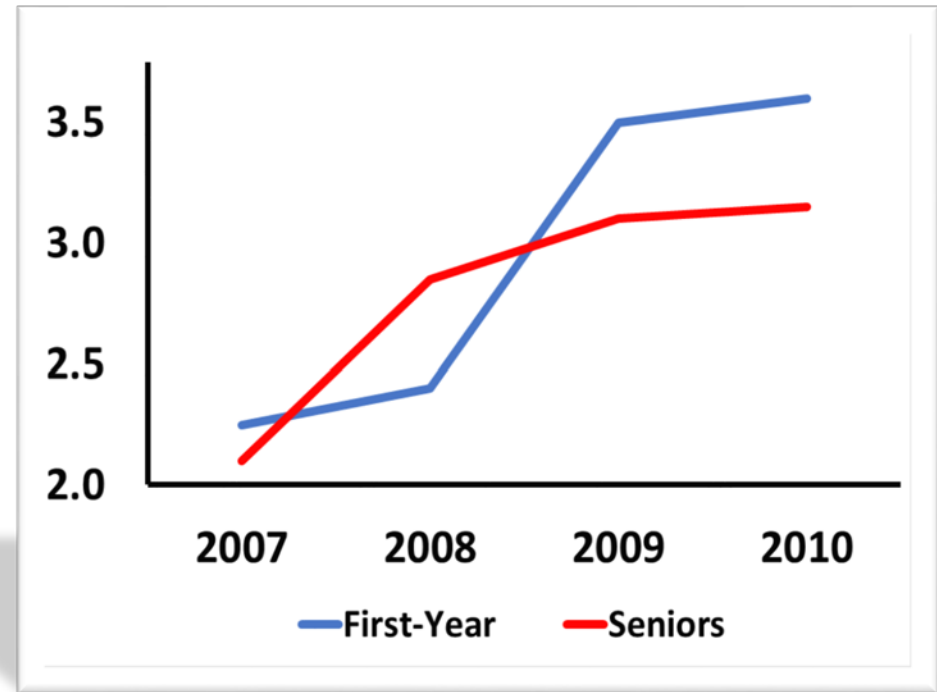
Presentation Outline

- What is a multi-year data analysis and why is it useful?
- UH Mānoa example using NSSE data
 - Brief background on NSSE
 - Research question
 - Methodology
 - Step-by-Step data analysis
 - Results
- Limitations and future studies



What is a Multi-Year Data Analysis?

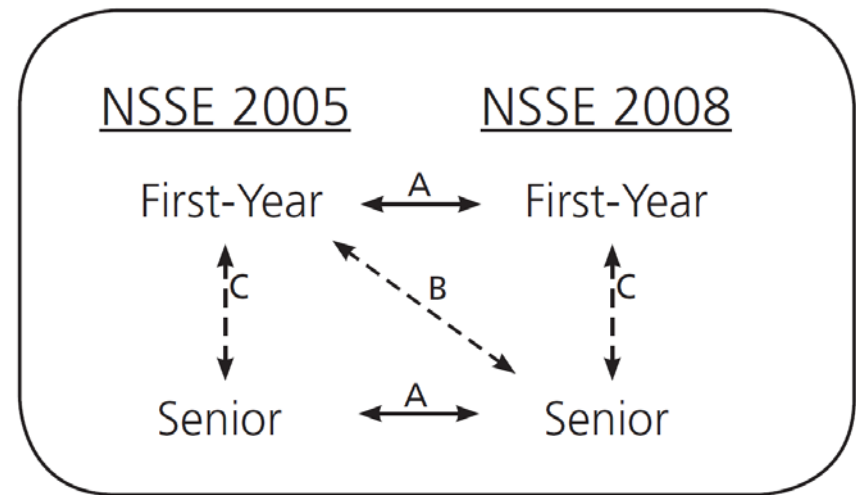
In multi-year designs, we are interested in measuring whether there has been a meaningful change in outcomes over time.



Research Questions that can be Addressed by 'Multi-Year' Analysis

- *Cross-Sectional (A): “Are 2005 and 2008 first year students’ experiences about advising significantly different?”*
- *Longitudinal (B): “Did 2005 first year students’ experiences change in 2008 when they became seniors?”*
- *(C): “Are 2005 first year students’ perceptions of a supportive campus environment significantly different from 2005 seniors?”*

Multi-Year analyses can be longitudinal or cross-sectional



From NSSE Multi-Year Data Analysis Guide 2012

From NSSE Multi-Year Data Analysis Guide 2012



Why NSSE?

- NSSE is popular. As of 11/18/2013, 721 institutions will participate in 2014. Two million students have participated NSSE since 2000.
- NSSE Schedule: Administered in spring, reports is available in summer, and student responses are available in early fall.
- NSSE focuses on student engagement. It indirectly measures the extent to which first-year and senior students participate in educational practices that contribute to their academic and personal growth.
- Survey questions and benchmarks
 - 5 benchmarks: level of academic challenge; active and collaborative learning; student-faculty interaction; supportive campus environment, enriching educational experiences.
- Who will be interested in findings: leadership, faculty, committees (retention and graduation, strategic planning, initiatives, etc.)



UH Manoa Example

- Context: UH Mānoa's Strategic Plan for 2002-2010 called for increasing support for academic advising.
- Approximately 40 new academic advising positions were created:
 - Faculty involvement in advising and mentoring increased considerably between 2002 and 2010.
 - Manoa Advising Center (MAC) formed in January 2007.
- Can NSSE data be used to indirectly measure the effectiveness of these strategic planning decisions?

i.e. Given the implementation of additional advising services in 2006-07, how much did student perceptions of the quality of academic advising increase from 2005 to 2009?



Research Question

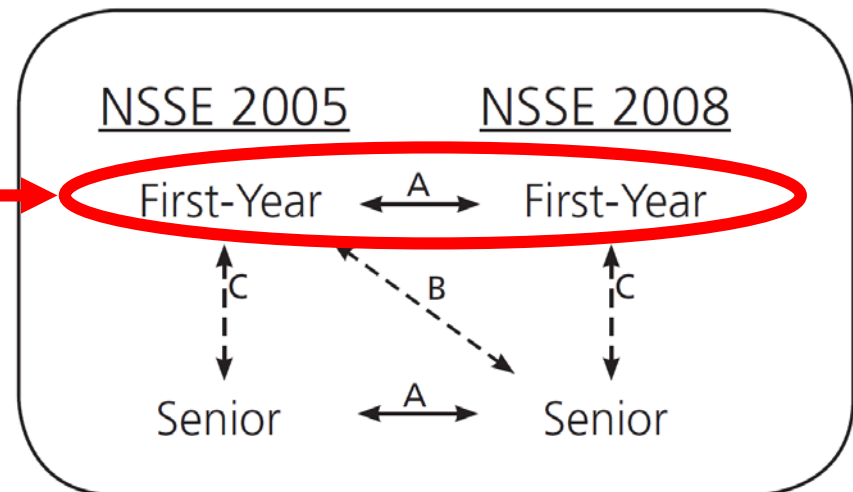
➤ Given the implementation of additional advising services at UHM in 2006-07, how much did student perceptions in the quality of academic advising increase from **2005 to 2009**?

12 Overall, how would you evaluate the quality of academic advising you have received at your institution?

- Excellent
- Good
- Fair
- Poor

From NSSE Survey PDF, 2008

Today's Example is designed like this



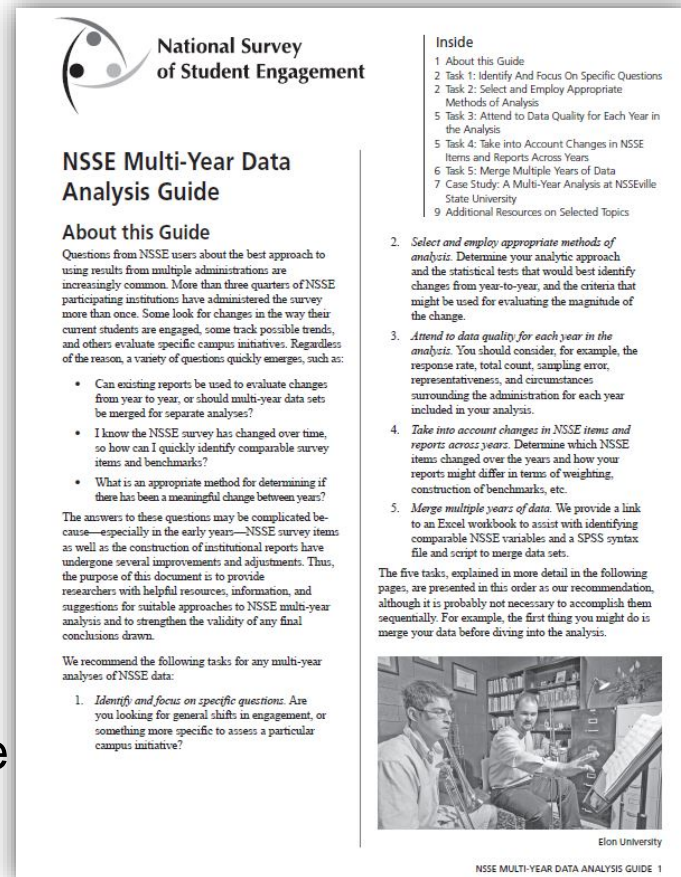
From NSSE Multi-Year Data Analysis Guide 2012



Useful documentation provided by NSSE to get you started

- NSSE Multi-Year Data Analysis Guide
- Contextualizing NSSE effect sizes
- SPSS syntax for merging multiple years of data
- Excel codeset for tracking year-to-year variable changes
- Working with NSSE Data: A Facilitator's Guide

Link to NSSE Data Analysis Resources:
http://nsse.iub.edu/html/analysis_resources.cfm



NSSE Multi-Year Data Analysis Guide



Relevant Literature

Astin, A. W. (1993). *What matters in college? Four critical years revisited*. San Francisco: Jossey-Bass.

Herzog, S., and Bowman, N. A. (Eds.). (2011). *Special issue: validity and limitations of college student self-report data*. *New Directions for Institutional Research*. 2011(150). 1–120.

Kuh, G. D. (2000). Understanding campus environments. In Barr, M. J., and Desler, M. (Eds.), *Handbook on student affairs administration* (2nd ed.). San Francisco: Jossey-Bass.

Kuh, G. D., et al. (2010). *Student success in college: creating conditions that matter*. San Francisco: Jossey-Bass.

Pascarella, E., and Terenzini, P. (2005). *How college affects student: volume 2, a third decade of research*. San Francisco: Jossey-Bass.

Porter, S. R. (2013). *Self-reported learning gains: a theory and test of college student survey response*. *Research in Higher Education*. 54(2). 201–226.



Data Analysis

Four Steps:

1. Merge Multiple Years of NSSE Data
2. Perform Data Management Tasks
 - a) Check Data Quality (sampling error, changes over time)
 - b) Random Sampling
 - c) Weighting
3. Choose Statistical Method
4. Data Analysis
 - a) One-way ANOVA
 - b) Post-hoc tests (Tukey Test)
 - c) Cohen's d



Step 1: Merge Multiple Years of NSSE Data

```
Sub CombinedDataFiles (strPath As String, strFilemask As String)

Dim strFname As String
Dim strCmd As String
Dim intFileNb

If InStr(strPath, "\\") = 0 Then      'no path given, use current folder
    strPath = objSpssApp.GetSPSSPath
End If
If Len(strFilemask) = 0 Then        'no file Mask given, combine all files
    strFilemask = "*.sav"
End If

'Get the first file name and load file
strFname = Dir$(strPath & strFilemask)
strCmd = "GET FILE='" & strPath & strFname & "'." & vbCrLf
strCmd = strCmd & "COMPUTE source=1." & vbCrLf
strCmd = strCmd & "VALUE LABEL source 1 " & "'" & strFname & "'." & vbCrLf
strCmd = strCmd & "VARIABLE LABEL source 'path=" & strPath & "'." & vbCrLf
strCmd = strCmd & "EXECUTE."
objSpssApp.ExecuteCommands strCmd , True

'Combine the other files
intFileNb = 2
While strFname <> ""
    strFname = Dir$()
    If strFname <> "" Then
        strCmd = "ADD FILES /FILE=* /FILE='" & strPath & strFname & "'." & vbCrLf
        strCmd = strCmd & "IF MISSING(source) source=" & intFileNb & "." & vbCrLf
        strCmd = strCmd & "ADD VALUE LABEL source " & intFileNb & " '" & strFname & "'." & vbCrLf
        strCmd = strCmd & "EXECUTE."
        Debug.Print strCmd
        objSpssApp.ExecuteCommands strCmd , True
        intFileNb = intFileNb + 1
    End If
Wend

' Save the combined file
strCmd = "SAVE OUTFILE='" & strPath & "combined file.sav'." & vbCrLf
strCmd = strCmd & "EXECUTE."
objSpssApp.ExecuteCommands strCmd , True

End Sub
```

NSSE provides a SPSS script that can merge multiple years of data in to one combined file called “combinedfile.sav”.

http://nsse.iub.edu/html/analysesSyntax_original.cfm



Step 2: Review Respondent Characteristics

Respondent Characteristics

The adjacent table displays your number of respondents, response rate, and sampling error by class. Sampling error is an estimate of the margin by which the true percentage of your students may differ from the reported percentage on a given item (because not all of your students completed surveys).

| | N | Resp. Rate | Sampling Error |
|---------------------|-----|------------|----------------|
| First-Year Students | 613 | 26% | +/-3.4% |
| Seniors | 685 | 26% | +/-3.3% |

From NSSE Executive Snapshot 2008 (University of Hawaii at Mānoa)



Step 2: Randomization and Weighting

Tips on Developing Comparable NSSE Statistics

Tip #1: Use All Randomly Selected Cases

- For 2004 and earlier, use values of '1' and '2' for "smp101"
- For 2005 to the present, use values of '1', '2', and '3' for "smp105"

Tip #2: Use Weights

- "stuwt2" for 2001 to 2003 administrations
- "weight1" for 2004 to current administration

Tip #3: Exclude Ineligibles

- For 2005 to the present, use values of '1' for "inelig" to ensure only eligible respondents are included.

From NSSE Multi-Year Data Analysis Guide 2012



Step 3: Choosing a Method

Table 1
Considerations for Multi-Year Analytical Methods

| | t-test | ANOVA | Regression | Effect Size | Percentage Change |
|--|--------|-----------|------------|-------------|-------------------|
| How many years of data required? | 2 | 3 or more | 2 or more | 2 | 2 |
| Determines statistical significant difference? | Yes | Yes | Yes | No | No |
| Determines magnitude of difference? | No* | No* | No* | Yes | Yes |
| Are statistical controls possible? | No | Yes | Yes | No | No |

* Determining the magnitude of the difference is possible but requires additional manipulations to variables of interest, inclusion of ad hoc software commands, or additional calculations.

From NSSE Multi-Year Data Analysis Guide 2012



Step 4: One-way ANOVA in SPSS

The screenshot displays the IBM SPSS Statistics Data Editor interface. The main window shows a data table with the following columns: Name, Type, Width, Decimals, Label, Values, Missing, Columns, Align, Measure, and Role. The data rows include variables such as AC, ACa, acadpr01, ACL, actt, and advise.

The One-Way ANOVA dialog box is open, showing the following configuration:

- Dependent List:** Overall, how would you evaluate the quality of academic advising you have received a...
- Factor:** path=c:\temp\multiyear\ [source]
- Buttons:** Contrasts..., Post Hoc..., Options..., Bootstrap...

The background data table (partially visible) includes the following rows:

| Name | Type | Width | Decimals | Label | Values | Missing | Columns | Align | Measure | Role |
|------------|---------|-------|----------|--------------------|--------------|---------|---------|-------|---------|-------|
| 1 AC | Numeric | 8 | 2 | Academic Chall... | None | None | 8 | Right | Scale | Input |
| 2 ACa | Numeric | 8 | 2 | Academic Chall... | None | None | 8 | Right | Scale | Input |
| 3 acadpr01 | Numeric | 8 | 0 | Hours per 7-da... | {1, 0}... | None | 8 | Right | Ordinal | Input |
| 4 ACL | Numeric | 8 | 2 | Active and Coll... | None | None | 8 | Right | Scale | Input |
| 5 actt | Numeric | 8 | 0 | ACT total score | None | None | 8 | Right | Scale | Input |
| 6 advise | Numeric | 8 | 0 | Overall, how wo... | {1, Poor}... | None | 8 | Right | Ordinal | Input |



One-way ANOVA: Options

IBM SPSS Statistics Data Editor window showing a list of variables and a One-Way ANOVA dialog box with the Options sub-dialog open.

Variables List:

| Name | Type | Width | Decimals | Label | Values | Missing | Columns | Align | Measure | Role |
|------------|---------|-------|----------|--------------------|--------------|---------|---------|-------|---------|-------|
| 1 AC | Numeric | 8 | 2 | Academic Chall... | None | None | 8 | Right | Scale | Input |
| 2 ACa | Numeric | 8 | 2 | Academic Chall... | None | None | 8 | Right | Scale | Input |
| 3 acadpr01 | Numeric | 8 | 0 | Hours per 7-da... | {1, 0}... | None | 8 | Right | Ordinal | Input |
| 4 ACL | Numeric | 8 | 2 | Active and Coll... | None | None | 8 | Right | Scale | Input |
| 5 actt | Numeric | 8 | 0 | ACT total score | None | None | 8 | Right | Scale | Input |
| 6 advise | Numeric | 8 | 0 | Overall, how wo... | {1, Poor}... | None | 8 | Right | Ordinal | Input |

One-Way ANOVA Dialog:

- Dependent List: Overall, how would you evaluate the quality of academic advising you have received a...
- Factor: path=c:\temp\multiyear1 [source]

One-Way ANOVA: Options Dialog:

- Statistics:**
 - Descriptive
 - Fixed and random effects
 - Homogeneity of variance test
 - Brown-Forsythe
 - Welch
- Means plot:**
 - Means plot
- Missing Values:**
 - Exclude cases analysis by analysis
 - Exclude cases listwise

Buttons: Continue, Cancel, Help

Bottom of the main dialog: OK, Paste, Reset, Cancel, Help

Bottom of the window: Data View, Variable View, IBM SPSS Statistics Processor is ready, Filter On, Weight On



One-way ANOVA: Post Hoc Test

The screenshot displays the IBM SPSS Statistics interface. The main window shows a list of variables on the left and a data table on the right. The 'One-Way ANOVA' dialog box is open, with the dependent variable 'Overall, how would you evaluate the quality of academic advising you have received at your in...' selected. The 'Post Hoc Multiple Comparisons' dialog box is also open, showing options for 'Equal Variances Assumed' (LSD, Bonferroni, Sidak, Scheffe, R-E-G-W F, R-E-G-W Q, S-N-K, Tukey, Tukey's-b, Duncan, Hochberg's GT2, Gabriel, Waller-Duncan, Dunnett) and 'Equal Variances Not Assumed' (Tamhane's T2, Dunnett's T3, Games-Howell, Dunnett's C). The significance level is set to 0.05.

| row | class | cl |
|-----|-------|----|
| 2 | 4 | |
| 2 | 4 | |
| 3 | 4 | |
| 4 | 4 | |
| 2 | 4 | |
| 4 | 4 | |
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| 4 | 4 | |
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| 3 | 4 | |
| 3 | 3 | |
| 3 | 4 | |
| 2 | 4 | |
| 3 | 4 | |
| 2 | 4 | |
| 2 | 4 | |
| 3 | 4 | |
| 3 | 4 | |



One-way ANOVA: Descriptive Statistics

*Output2 [Document3] - IBM SPSS Statistics Viewer

File Edit View Data Transform Insert Format Analyze Direct Marketing Graphs Utilities Add-ons Window Help

Output

- Log
- Oneway
 - Title
 - Notes
 - Active Dataset
 - Descriptives
 - Test of Homogeneity of Variances
 - ANOVA
 - Means Plots
 - Title
 - Overall, how would you evaluate the quality of ac
- Log

➔ Oneway

[DataSet1] O:\Temp Folder\Jennifer\John help 3\combined file.sav

Descriptives

Overall, how would you evaluate the quality of academic advising you have received at your institution?

| | N | Mean | Std. Deviation | Std. Error | 95% Confidence Interval for Mean | | Minimum | Maximum |
|----------------------------|-----|------|----------------|------------|----------------------------------|-------------|---------|---------|
| | | | | | Lower Bound | Upper Bound | | |
| NSSE05 Data (UH Manoa).sav | 93 | 2.62 | .776 | .080 | 2.46 | 2.78 | 1 | 4 |
| NSSE07 Data (UH Manoa).sav | 98 | 2.50 | .890 | .090 | 2.32 | 2.68 | 1 | 4 |
| NSSE08 Data (UH Manoa).sav | 106 | 2.81 | .758 | .074 | 2.66 | 2.95 | 1 | 4 |
| NSSE09 Data (UH Manoa).sav | 105 | 2.75 | .617 | .060 | 2.63 | 2.87 | 1 | 4 |
| Total | 402 | 2.67 | .770 | .038 | 2.60 | 2.75 | 1 | 4 |

Test of Homogeneity of Variances

Overall, how would you evaluate the quality of academic advising you have received at your institution?

| Levene Statistic | df1 | df2 | Sig. |
|------------------|-----|-----|------|
| 7.522 | 3 | 398 | .000 |

ANOVA

Overall, how would you evaluate the quality of academic advising you have received at your institution?

| | Sum of Squares | df | Mean Square | F | Sig. |
|----------------|----------------|-----|-------------|-------|------|
| Between Groups | 5.677 | 3 | 1.892 | 3.245 | .022 |
| Within Groups | 232.143 | 398 | .583 | | |
| Total | 237.820 | 401 | | | |



One-way ANOVA: Post Hoc Results

Post Hoc Tests

Multiple Comparisons

Dependent Variable: Overall, how would you evaluate the quality of academic advising you have received at your institution?
Games-Howell

| (I) path=c:\temp\multiyear | (J) path=c:\temp\multiyear | Mean Difference (I-J) | Std. Error | Sig. | 95% Confidence Interval | |
|----------------------------|----------------------------|-----------------------|------------|------|-------------------------|-------------|
| | | | | | Lower Bound | Upper Bound |
| NSSE05 Data (UH Manoa).sav | NSSE07 Data (UH Manoa).sav | .119 | .121 | .758 | -.19 | .43 |
| | NSSE08 Data (UH Manoa).sav | -.188 | .109 | .314 | -.47 | .09 |
| | NSSE09 Data (UH Manoa).sav | -.129 | .100 | .574 | -.39 | .13 |
| NSSE07 Data (UH Manoa).sav | NSSE05 Data (UH Manoa).sav | .119 | .121 | .758 | -.19 | .43 |
| | NSSE08 Data (UH Manoa).sav | -.307* | .116 | .045 | -.61 | -.01 |
| | NSSE09 Data (UH Manoa).sav | -.248 | .108 | .105 | -.53 | .03 |
| NSSE08 Data (UH Manoa).sav | NSSE05 Data (UH Manoa).sav | .188 | .109 | .314 | -.09 | .47 |
| | NSSE07 Data (UH Manoa).sav | -.307* | .116 | .045 | .01 | .61 |
| | NSSE09 Data (UH Manoa).sav | .059 | .095 | .926 | -.19 | .31 |
| NSSE09 Data (UH Manoa).sav | NSSE05 Data (UH Manoa).sav | .129 | .100 | .574 | -.13 | .39 |
| | NSSE07 Data (UH Manoa).sav | .248 | .108 | .105 | -.03 | .53 |
| | NSSE08 Data (UH Manoa).sav | -.059 | .095 | .926 | -.31 | .19 |

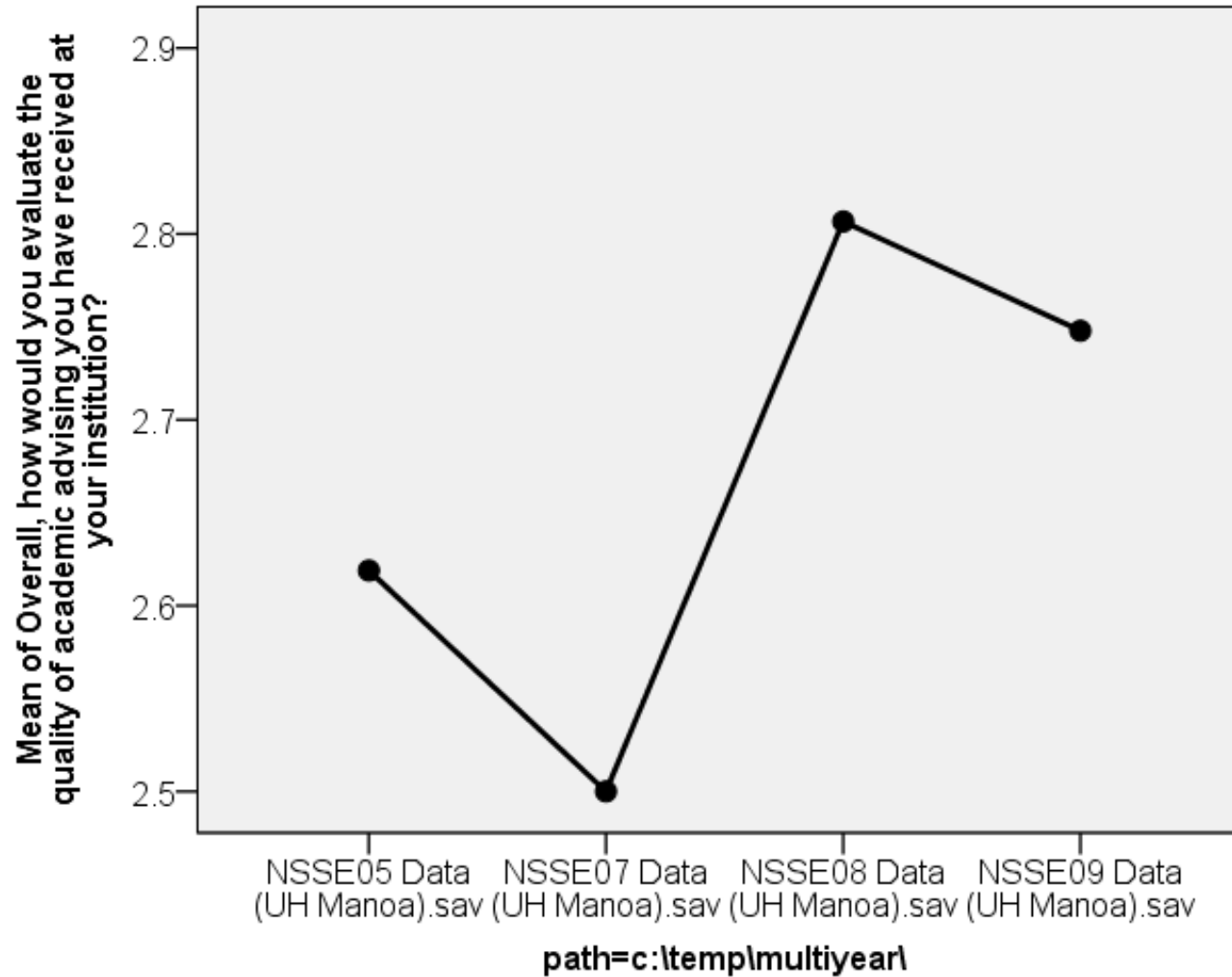
*. The mean difference is significant at the 0.05 level.

Means Plots



One-way ANOVA: Means Plot

First-Year Undergraduates

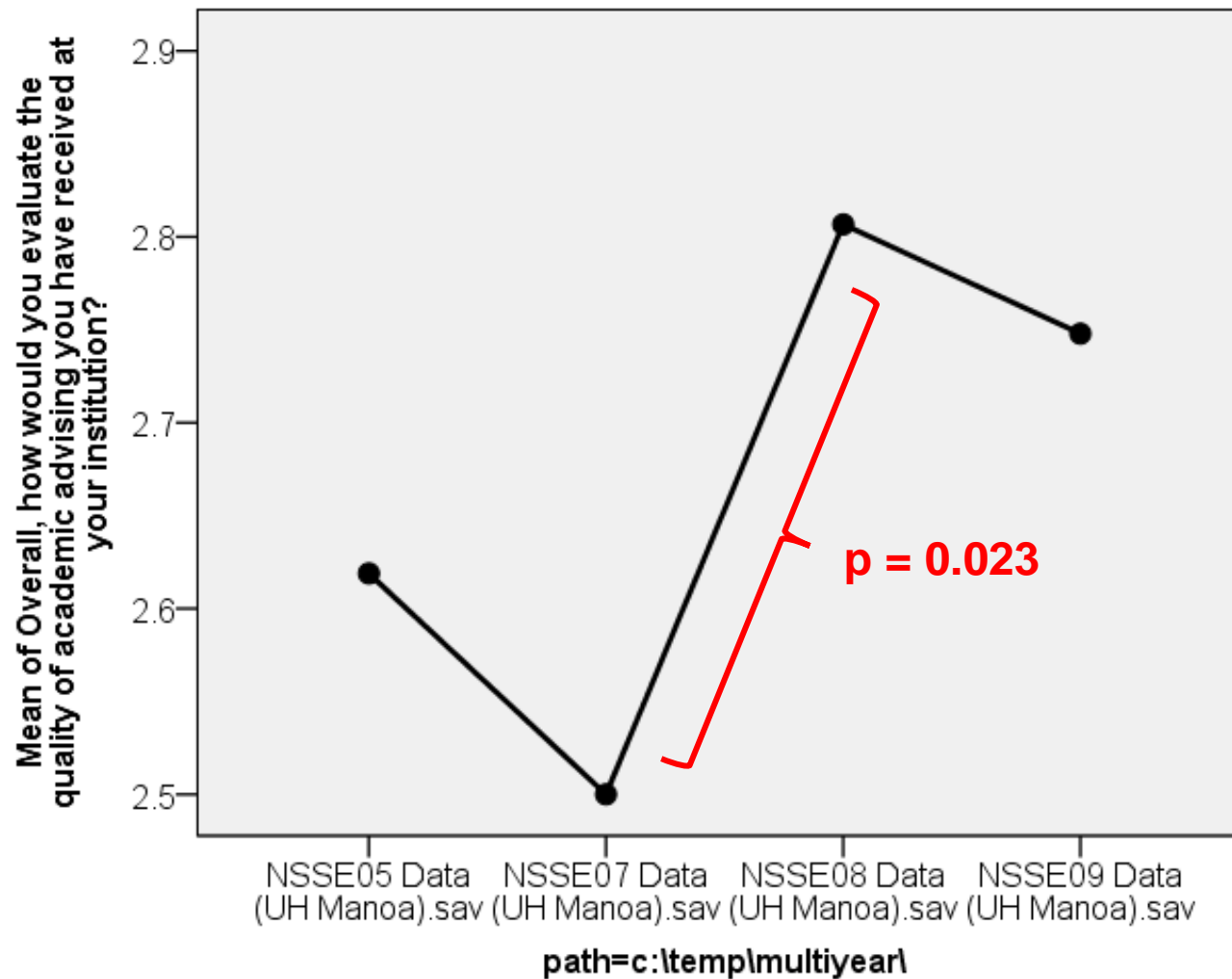


- 1 = "Poor"
- 2 = "Fair"
- 3 = "Good"
- 4 = "Excellent"



One-way ANOVA: Means Plot

First-Year Undergraduates



- 1 = "Poor"
- 2 = "Fair"
- 3 = "Good"
- 4 = "Excellent"



Cohen's d



Dr. Lee A. Becker (Effect size Calculators)
College of Letters, Arts, and Sciences
UNIVERSITY OF COLORADO COLORADO SPRINGS

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Effect Size Calculators

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Effect Size Calculators

Calculate Cohen's d and the effect-size correlation, r_{YX} , using --

- means and standard deviations
- independent groups t test values and df

For a discussion of these effect size measures see [Effect Size Lecture Notes](#)

Calculate d and r using means and standard deviations

Calculate the value of Cohen's d and the effect-size correlation, r_{YX} , using the means and standard deviations of two groups (treatment and control).

$$\text{Cohen's } d = \frac{M_1 - M_2}{\sigma_{\text{pooled}}}$$
$$\text{where } \sigma_{\text{pooled}} = \sqrt{[(\sigma_1^2 + \sigma_2^2) / 2]}$$

$$r_{YX} = \frac{d}{\sqrt{(d^2 + 4)}}$$

Note: d and r_{YX} are positive if the mean difference is in the predicted direction.

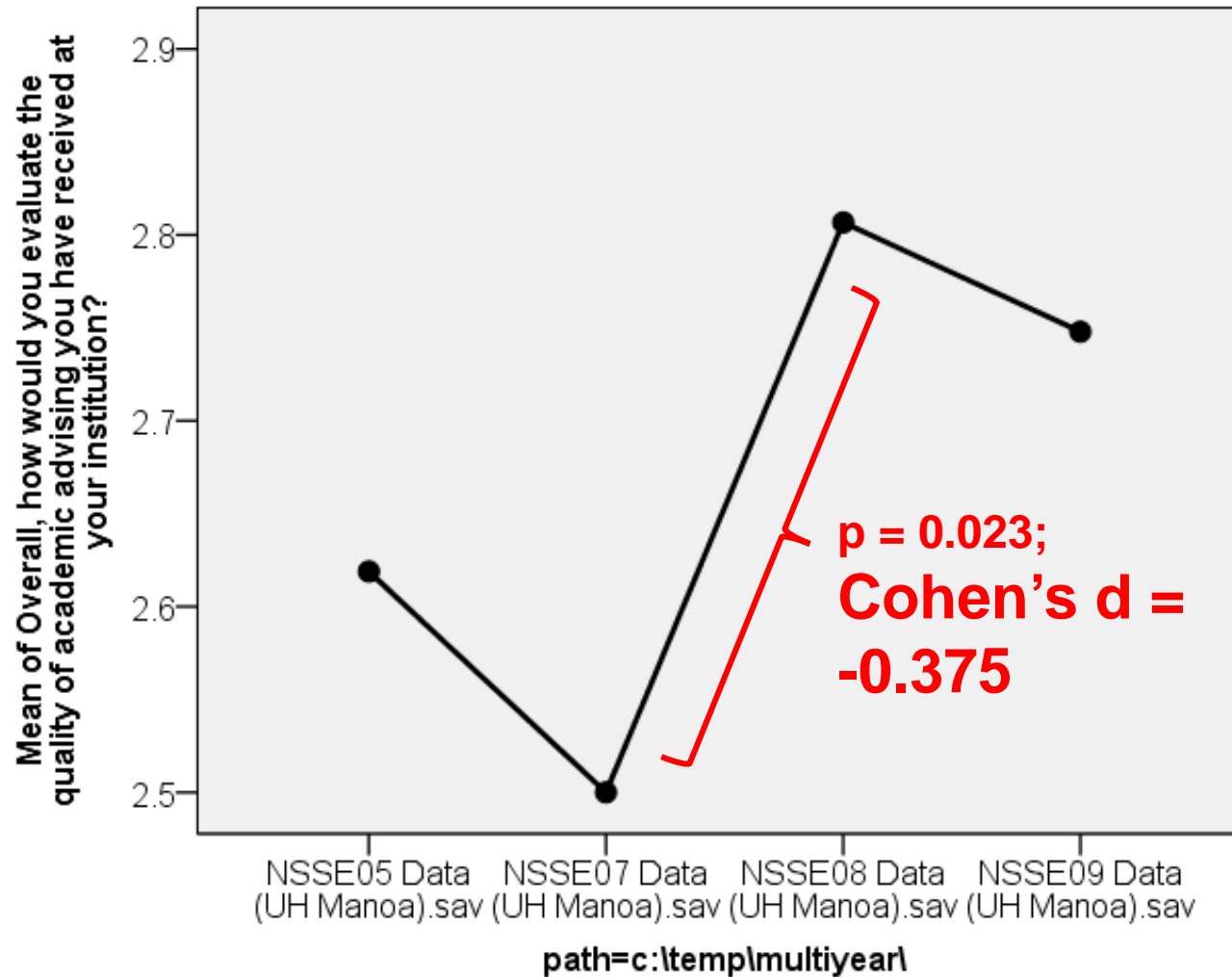
| Group 1 | Group 2 |
|--|---|
| M_1 <input type="text"/> | M_2 <input type="text"/> |
| SD_1 <input type="text"/> | SD_2 <input type="text"/> |
| <input type="button" value="Compute"/> | <input type="button" value="Reset"/> |
| Cohen's d <input type="text"/> | effect-size r <input type="text"/> |

Available at: <http://www.uccs.edu/~lbecker/>



One-way ANOVA: Means Plot

First-Year Undergraduates



- 1 = "Poor"
- 2 = "Fair"
- 3 = "Good"
- 4 = "Excellent"



Proposed Reference Values for Effect Size Interpretation

(NSSE Benchmark Comparisons)

| | Effect Size |
|------------|-------------|
| Small | 0.1 |
| Medium | 0.3 |
| Large | 0.5 |
| Very Large | 0.7 |



Summary

- Choose criteria to measure based on strategic planning priorities.
 - *Identify and focus on specific questions.* Are you looking for general shifts in engagement, or something more specific to assess a particular campus initiative?
- Follow steps to ensure data quality, randomization, and weighting.
- Post-hoc tests to see where the differences lies
- Check effect sizes



Limitations and Future Studies

Limitations/ Challenges:

- Sample size difference in different years
- Limited knowledge about college initiatives and strategies
- Change of NSSE instruments over years, especially in 2013
(Benchmarks to Engagement Indicators)

Future studies employing a multi-year analysis

- analyzing other NSSE questions & benchmarks
- using other external or home grown surveys results. Such as graduating seniors survey, first year experience survey, alumni survey, etc.

Questions and Suggestions?



Mahalo

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Manoa Institutional Research Office

Questions: miro@hawaii.edu

Link to this presentation:
<http://manoa.hawaii.edu/ovcaa/mir/pdf/cair2013.pdf>

