# Course Syllabus Psy 510/610: Multilevel Regression Spring 2017

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#### Instructor

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# **Meeting Times and Location**

Class: Wed 8:45–11:35 AM, 307 Cramer Hall (CH). Lab sessions: 437 Neuberger Hall (NH), Wed 11:35–12:35 AM.

#### **Text**

Snijders, T.A.B., & Bosker, R.J. (2012). *Multilevel analysis: An introduction to basic and advanced multilevel modeling (2<sup>nd</sup> Edition)*. London: Sage. ISBN: 184920201X

#### **Recommended Text**

Raudenbush, S.W., & Bryk, A.S., (2002) *Hierarchical linear models: Applications and data analysis methods*. Thousand Oaks, CA: Sage. ISBN: 076191904X

# **Optional** (not at the PSU bookstore)

Heck, R.H., Thomas, S.L, & Tabata, L.N. (2014). *Multilevel and longitudinal modeling with IBM SPSS, second edition.* New York: Routledge. ISBN: 0415817110

Finch, W. H., Bolin, J. E., & Kelley, K. (2014). *Multilevel Modeling Using R*. Boca Raton, FL: CRC Press. ISBN: 1466515856

# Overview

This course is intended to introduce students to multilevel regression techniques (also known as hierarchical linear models or random coefficient models) and will cover the fundamental concepts and application of the techniques. By the end of the course, students should be able to apply, write about, critique applications of, and read methodological articles about multilevel regression analysis.

## **Prerequisites**

This course assumes that students have taken a graduate statistics course that covers simple and multiple regression.

# Readings and Commentaries (5%)

There will be several readings assigned each week taken from the text and supplemental sources. The readings will usually include an example article that applies SEM Please read the material prior to class and be prepared for discussion. Students will be required to turn in a **one-page commentary** on the readings for that week on each Tuesday by 2 PM via email. The commentaries should be an informal set of questions, comments, or summary information (summarize only if you cannot think of anything else to say) about the articles. The purpose of the commentaries is to make sure the class is prepared for discussion and to help the instructor identify discussion topics and sources of confusion in the readings. I will assign 2 (complete and well-considered), 1 (did not read some/lacking effort), or 0 (did not read most/minimal effort/late/nothing) points to each, with one freebie.

## **Homeworks**

There will be three homework assignments consisting of data analysis and reporting of multilevel regression problems using R, SPSS or the student version of the multilevel package, HLM 7 (Raudenbush, Bryk, Cheong, Congdon, & du Toit, 2011; Scientific Software International). The student version of HLM can be downloaded from the following internet site: <a href="http://www.ssicentral.com/hlm/student.html">http://www.ssicentral.com/hlm/student.html</a>. It is unlikely that you will need to refer to the manual, but much of the information is available under the help function of the package.

Homework due dates are: Wed 5/3, Wed 5/23, Wed 6/14. Late assignments are not accepted without penalty (10% per day late) except for cases of illness or family emergencies. Please contact me ahead of time if you are going to miss the deadline for any reason.

#### **Grades**

Grades are based on an average of the three homework assignments with total percentages assigned the following grades:  $\geq 90 = A$ , 85-89.9 = B+, 80-84.9 = B, 75-79.9 = C+, 70-74.9 = C.

#### Other Resources

There are several useful electronic links on the class website. Of particular note is a website devoted to multilevel analysis with links to software and other useful information is at <a href="http://www.cmm.bristol.ac.uk/links/index.shtml">http://www.cmm.bristol.ac.uk/links/index.shtml</a>. I also suggest that you subscribe to the multilevel listserv at: <a href="http://www.bristol.ac.uk/cmm/learning/support/jisc.html">http://www.bristol.ac.uk/cmm/learning/support/jisc.html</a> (a digest format is available). A great deal can be learned from seeing questions and answers from other researchers wrestling with multilevel analysis issues.

#### **Disabilities**

I am happy to make any necessary arrangements with students who have a disability and are in need of academic accommodations. If you have not done so already, please contact the Disability Resource Center, 116 Smith Memorial Student Union, <a href="http://www.pdx.edu/drc/">http://www.pdx.edu/drc/</a>, Email: <a href="http://www.pdx.edu/drc/">drc@pdx.edu</a>, for assistance and any testing arrangements. I would appreciate it if you would check with me as soon as possible to discuss any needed accommodations and to make sure that I have received a faculty notification letter. If any aspects of instruction or course design result in barriers to your inclusion or learning, please let me know.

# Course Readings Psy 510/610 Multilevel Regression, Winter 2017

All supplemental readings available online at the class website: <a href="http://web.pdx.edu/~newsomi">http://web.pdx.edu/~newsomi</a> (password protected zip file—check with me for the password)

**Book Sources:** S & B = Snijders & Bosker text. Singer & Willett, (2003). Applied longitudinal data analysis: Modeling change and event occurrence. New York: Oxford University Press. Kreft, I., & de Leeuw, J. (1998). Introducing multilevel modeling. London: Sage. Hox, J. (2010). Multilevel analysis: Techniques and applications, second edition. New York: Routledge.

# 4/12 Regression Review & Overview of Multilevel Regression

- S & B, Chapter 1 & Chapter 2.
- Kreft & de Leeuw, pp. 1-8

Optional: • Chapter 2, "Simple linear regression and correlation," Pedhazur, E.J. (1997). *Multiple regression in behavioral research: Explanation and prediction (3rd Edition)*. Fort Worth, TX: Harcourt Brace.

Optional: Chapter 5, "Elements of multiple regression analysis: Two independent variables" in Pedhazur, E.J. (1997). Multiple regression in behavioral research: Explanation and prediction (3rd Edition). Fort Worth, TX: Harcourt Brace.

# 4/19 Random vs. Fixed Coefficients, Random Intercept Models, Intraclass Correlation Coefficient

- Kreft & de Leeuw, pp. 10-12.
- S & B, Chapter 4, Sections 4.1 4.5 and Section 4.9 only. (Optional: Chapter 3).
- From Hays, W.L. (1973). Statistics for the social sciences. New York: Holt, Rinehart, & Winston. (pp.535-536). (ICC)
- From Steele, R.G.D., Torrie, J.H., & Dickey, D.A. (1997). *Principles and procedures of statistics: A biometric approach* (3<sup>rd</sup> Ed.). Boston, MA: McGraw-Hill. (pp. 297-299). (ICC)
- Example Article: Beauchamp, M. R., Bray, S. R., Fielding, A., & Eys, M. A. (2005). A multilevel investigation of the relationship between role ambiguity and role efficacy in sport. *Psychology of Sport and Exercise*, 6, 289-302.

# 4/26 Full Multilevel Regression Models, Part I: Varying Slopes, Hypothesis Tests, Explained Variance, Model Building

- S & B, Chapter 5, except Sections 5.2 and 5.3.1, Chapter 6.
- Roberts, K.J., Monaco, J.P., Stovall, H., & Foster, V. (2011). Explained variance in multilevel models (pp.219-230). In J.J. Hox & J.K. Roberts (Eds.), *Handbook of Advanced Multilevel Analysis*. New York: Routledge.
- Example Article: Grodsky, E., & Pager, D. (2001). The structure of disadvantage: Individual and occupational determinants of the Black-White wage gap. American Sociological Review, 66, 542-567.

#### 5/3 Homework 1 Due

## 5/3 Full Multilevel Regression Models, Part II: Cross-level Interactions & Centering

- S & B, Chapter 5, Section 5.2 only (cross-level interactions)
- Preacher, K. J., Curran, P. J., & Bauer, D. J. (2006). Computational tools for probing interaction effects in multiple linear regression, multilevel modeling, and latent curve analysis. *Journal of Educational and Behavioral Statistics*, 31, 437-448. (*Optional section:* Interactions in LCA)
- S & B, Chapter 4, Section 4.6 only, Chapter 5, Section 5.3.1 only (centering)
- Enders, C.K., & Tofighi, D. (2007). Centering predictor variables in cross-sectional multilevel models: A new look at an old issue. *Psychological Methods*, *12*, 121–138.

• Example Article: Zohar, D., & Luria, G. (2005). A multilevel model of safety climate: Cross-level relationships between organization and group-Level climates. *Journal of Applied Psychology*, 90, 616–628.

# 5/10 Estimation Methods, Assumptions & Diagnostics

- S & B, Chapter 4, Sections 4.7 4.8 only (estimation).
- S & B, Chapter 10 (assumptions & diagnostics).
- Raudenbush & Bryk, pp. 266-280 (assumptions, diagnostics, remedies)
- S & B, Chapter 12, Sections 12.1 12.2 only (remedies).
- Bauer, D.J., & Cai, L. (2009). Consequences of unmodeled nonlinear effects in multilevel models. *Journal of Educational and Behavioral Statistics*, *34*, 97–114.

#### 5/17 Growth Curve Models, Part I: Linear Growth

- Singer & Willett, Chapter 2 & 3.
- Hox, Chapter 5, pp. 79-99
- Example Article: Stoddard, S.A, Zimmerman, M.A., Bauermeister, J.A. (2011). Thinking About the Future as a Way to Succeed in the Present: A Longitudinal Study of Future Orientation and Violent Behaviors Among African American Youth. American Journal of Community Psychology, 48, 238–246.

#### 5/23 Homework 2 Due

# 5/23 Growth Curve Models, Part II: Extensions of Growth Curve Models

- S&B Chapter 15
- Singer & Willett, Chapter 6.
- Example Article: Hindman, A.H., Cromley, J.G., Skibbe, L.E., and Miller, A.L (2011). Conventional and Piecewise Growth Modeling Techniques: Applications and Implications for Investigating Head Start Children's Early Literacy Learning. Evaluation Review, 35, 204 239.

#### 5/31 Binary and Noncontinuous Outcomes

- S&B Chapter 17
- Hox, Chapters 6 & 7.
- Example: Foster, H., & Brooks-Gunn, J. (2012). Neighborhood, family and individual influences on school physical victimization. *Journal of Youth and Adolescence*. Published online Dec 2012. DOI 10.1007/s10964-012-9890-
- Optional: Hedeker, D. (2005). Generalized linear mixed models. In B. Everitt & D. Howell (Eds.), *Encyclopedia of Statistics in Behavioral Science*, New York: Wiley.

# 6/7 Missing Data, Sample Size Issues & Power

- S&B, Chapter 9 (missing data)
- Hox, Chapter 12 (sample size & power)
- S&B Chapter 11 (sample size & power)

*Optional*: Scherbaum, C.A. & Ferreter, J.M. (2009). Estimating statistical power and required sample sizes for organizational research using multilevel modeling. *Organizational Research Methods*, 12, 347-367.

# 6/14 (No class—finals week) Homework 3 Due 4 PM