

PLSC 503: “Multivariate Analysis for Political Research”

Spring 2023

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Mondays, 1:00 p.m. - 4:00 p.m. ET
Boucke 304

Course Description

This is the second (full) course in quantitative methods in Penn State’s political science Ph.D. program. The course introduces students to regression models for the analysis of quantitative data, and provides a basis of knowledge for more advanced statistical methods. It will also have a substantial programming/computation focus. The course assumes basic math literacy, including familiarity with probability theory, properties of estimators, rudimentary calculus, and linear algebra, as well as mastery of the basic statistics taught in PLSC 502. The bulk of the course will focus on regression models for continuous response variables, and will include discussions of the mathematical bases for such models, their estimation and interpretation, model assumptions and techniques for addressing violations of those assumptions, model diagnostics, and topics related to model specification and functional forms. The course will also address a range of other topics, including missing data, regularization, validation and cross-validation, and tools for robust inference (jackknife, bootstrap, randomization, and so forth), as well as maximum likelihood and generalized linear models (logit, probit, etc.).

Note that all course materials (including this syllabus, slides, notes, data, computer code, homework exercises, etc.) are or will be available on a dedicated Github repo, which can be found at <https://github.com/PrisonRodeo/PLSC503-2023-git>. Throughout this syllabus, hot links are in [Penn State Blue](#).

Texts

“Required”:

The scare quotes around “required” are there because these texts are not, actually, required; the topics we’ll cover from them can be found in lots of places, including for free on the web (e.g., [here](#) and [here](#)).

Weisberg, Sanford. 2013. *Applied Linear Regression*, 4th Ed. New York: Wiley. ([ALR's Wiley page](#).)

Faraway, Julian J. 2016. *Extending the Linear Model with R: Generalized Linear, Mixed Effects and Nonparametric Regression*, 2nd Ed. London: Chapman & Hall.

Gelman, Andrew, Jennifer Hill, and Aki Vehtari. 2020. *Regression and Other Stories*. New York: Cambridge University Press. It's terrific, covers a *lot* of ground, and has a good [webpage](#). It's also *very* Bayesian (neither good nor bad, just the truth) and very reliant on Stan (and `rstan`).

Additional readings as necessary, all of which will be available via JSTOR™ or on the course [github repo](#).

The Weisberg text will be the source of most listed readings in the course. It's expensive, but a good reference, and is available both used and in an e-book version. Faraway is better for the latter part of the course, and (among other things) is also used in PLSC 504. There are many first editions of Faraway available used; either version will work for this course. Gelman-Hill-Ventari (hereinafter “GHV”) will be used periodically; it's perhaps good to have an IRL copy, but there's a PDF of it in the “Readings” folder of the Github repository.

Strongly Recommended:

Fox, John. 2015. *Applied Regression Analysis and Generalized Linear Models*, Third Edition. Thousand Oaks, CA: Sage Publications. Nice to have if you can get it cheaply; previous versions of this course used this as its main text.

Fox, John, and Sanford Weisberg. 2019. *An R and S-Plus Companion to Applied Regression*, Third Edition. Thousand Oaks, CA: Sage Publications. A companion to the Fox text, for S-Plus™ and R users.

Nagler, Jonathan. 1996. “Coding Style and Good Computing Practices.” *The Political Methodologist* 6(2):2-8. See also this [blog post](#) from 2015. The original article is old, and also contains words to live by.

Shalizi, Cosma. 2021. *Advanced Data Analysis from an Elementary Point of View*. This is an unpublished draft of a textbook that Cosma Shalizi (CMU) has been working on for roughly a decade. It's very comprehensive, super smart, often funny, and worth keeping around.

Other Good Linear Regression Texts:

Chatterjee, Samprit, and Ali S. Hadi. 2013. *Regression Analysis by Example*, 5th Ed. New York: Wiley.

Cohen, Jacob, Patricia Cohen, Stephen G. West, and Leona S. Aiken. 2002. *Applied Multiple Regression/Correlation Analysis for the Behavioral Sciences*, 3rd Ed. Lawrence Erlbaum.

Gelman, Andrew, and Jennifer Hill. 2006. *Data Analysis Using Regression and Multilevel/Hierarchical Models*. New York: Cambridge University Press.

Harrell Jr., Frank E. 2015. *Regression Modeling Strategies: With Applications to Linear Models, Logistic and Ordinal Regression, and Survival Analysis*. New York: Springer.

Montgomery, Douglas C., Elizabeth A. Peck, and G. Geoffrey Vining. 2012. *Introduction to Linear Regression Analysis*, 5th Ed. New York: Wiley.

Seber, George A.F., and Alan J. Lee. 2003. *Linear Regression Analysis*, 2nd Ed. New York: Wiley.

Books on “Econometrics”:

Don’t bother.

Books on R (a few from a [a very long list](#); many of these are available electronically via the Penn State Libraries)

Crawley, Michael J. 2014. *Statistics: An Introduction Using R*, 2nd Ed. New York: Wiley.

Everitt, Brian S., Torsten Hothorn. 2014. *A Handbook of Statistical Analyses Using R*, 3rd Ed. Boca Raton, FL: Chapman & Hall.

Mailund, Thomas. 2022. *Beginning Data Science in R: Data Analysis, Visualization, and Modelling for the Data Scientist*. New York: APress.

Maindonald, John, and John Braun. 2013. *Data Analysis and Graphics Using R: An Example-Based Approach*, 3rd Ed. New York: Cambridge University Press.

Murrell, Paul. 2019. *R Graphics*, 3rd Ed. Boca Raton, FL: Chapman & Hall. (Website is [here](#)).

Navarro, Danielle. 2021. *Learning Statistics With R* (and the `lsr` R package on CRAN).

A Few Other R Resources (mostly online)

[R Reference Card 2.0](#) (also in Chinese).

[The R Language: A Short Companion](#).

Robert Kabakoff's [Quick-R](#) (really excellent).

Owen, W. J. 2010. [The R Guide](#).

Peng, Roger P. 2022. [R Programming for Data Science](#).

Phillips, Nathaniel D. 2018. [YaRrr! The Pirate's Guide to R](#).

Ricci, Vito. 2005. [Fitting Distributions With R](#).

Ricci, Vito. 2005. [R Functions For Regression Analysis](#).

Santana, Julio Sergio, and Efrain Mateos Farfan. 2014. *El Arte de Programar en R: Un Lenguaje Para la Estadística*.

Shupinov, Alexay. 2019. *Visual Statistics. UseR!*.

Wickham, Hadley, and Garrett Grolemund. 2017. [R for Data Science](#). O'Reilly. (Note: This is not an R book, it's a [Tidyverse](#) book, and the Tidyverse is not R. That doesn't make it a bad resource, just a very limited one. For my take on the Tidyverse, see pp. 6-7 of the [syllabus for PLSC 502](#).)

The Methods Preceptor

[Tuba Sendinc](#) is the methods preceptor for PLSC 503. She is a Political Science Ph.D. candidate who studies international relations and political methodology. She will serve as a “first line of defense” in the course: she can assist you with course material, software and programming issues, and other matters related to the course work. She can be reached via e-mail at `tzs5636 [at] psu [dot] edu`.

Grading

Grading will be based on a total of 1000 points, divided as follows:

- Homework exercises: Ten worth 50 points each.
- A final project, worth 500 points.

Details for the homework assignments and the final project will be announced in class. An overview of expectations for the final project is available on the course Github repository.

Some Other Useful Resources

The **Inter-University Consortium for Political and Social Research** (ICPSR), at the University of Michigan, maintains an extensive archive of data in the social and behavioral sciences. Much of it is accessible via their homepage (<http://www.icpsr.umich.edu>).

The **Political Methodology Section** of the American Political Science Association was created to provide APSA members with an interest in political methodology with a forum in which to meet and discuss ideas. The section publishes a quarterly newsletter (*The Political Methodologist*), a quarterly journal on political methodology (*Political Analysis*), conducts a discussion list on topics relating to political methodology, and maintains an extensive electronic archive of papers, accessible via their homepage (at <http://polmeth.wustl.edu>).

The **Comprehensive R Archive Network** (CRAN) (<http://cran.r-project.org/>) is the place to go for downloads, packages, and documentation. Similarly, the **StataTM** homepage (<http://www.stata.com>) is a valuable resource for questions about Stata statistical software.

Obligatory Statement on Academic Integrity

Academic integrity is the pursuit of scholarly activity in an open, honest and responsible manner. Academic integrity is a basic guiding principle for all academic activity at The Pennsylvania State University, and all members of the University community are expected to act in accordance with this principle. Consistent with this expectation, the University's Code of Conduct states that all students should act with personal integrity, respect other students' dignity, rights and property, and help create and maintain an environment in which all can succeed through the fruits of their efforts.

Academic integrity includes a commitment by all members of the University community not to engage in or tolerate acts of falsification, misrepresentation or deception. Such acts of dishonesty violate the fundamental ethical principles of the University community and compromise the worth of work completed by others.

In cases of any violation of academic integrity it is the policy of the Department of Political Science to follow procedures established by the College of the Liberal Arts. More information on

academic integrity and procedures followed for violation can be found [here](#).

Obligatory Statement on Accommodations for Disabilities

Penn State welcomes students with disabilities into the University's educational programs. Every Penn State campus has an office for students with disabilities. Student Disability Resources (SDR) website provides contact information for every Penn State campus ([here](#)). For further information, please visit the Student Disability Resources website ([here](#)).

In order to receive consideration for reasonable accommodations, you must contact the appropriate disability services office at the campus where you are officially enrolled, participate in an intake interview, and provide documentation: See documentation guidelines [here](#). If the documentation supports your request for reasonable accommodations, your campus disability services office will provide you with an accommodation letter. Please share this letter with your instructors and discuss the accommodations with them as early as possible. You must follow this process for every semester that you request accommodations.

Obligatory Statement on Counseling and Psychological Services

Many students at Penn State face personal challenges or have psychological needs that may interfere with their academic progress, social development, or emotional wellbeing. The university offers a variety of confidential services to help you through difficult times, including individual and group counseling, crisis intervention, consultations, online chats, and mental health screenings. These services are provided by staff who welcome all students and embrace a philosophy respectful of clients' cultural and religious backgrounds, and sensitive to differences in race, ability, gender identity and sexual orientation.

Counseling and Psychological Services at University Park (CAPS)

(<http://studentaffairs.psu.edu/counseling/>): 814-863-0395

Counseling and Psychological Services at Commonwealth Campuses

(<http://senate.psu.edu/faculty/counseling-services-at-commonwealth-campuses/>)

Penn State Crisis Line (24 hours / 7 days/week): 877-229-6400. Crisis Text Line (24 hours / 7 days/week): Text LIONS to 741741.

Obligatory Statement on Educational Equity and Reporting Bias

Penn State takes great pride to foster a diverse and inclusive environment for students, faculty, and staff. Consistent with University Policy AD29, students who believe they have experienced

or observed a hate crime, an act of intolerance, discrimination, or harassment that occurs at Penn State are urged to report these incidents as outlined on the University's Report Bias webpage (<http://equity.psu.edu/reportbias/>).

Course Schedule

Reading the things assigned here each week is a good idea. If you miss a reading or two now and again, no worries; some weeks have more to read than others, and sometimes life intervenes.

Linear Regression

- **January 9:** *Introduction + Review of Bivariate Linear Regression*

Readings (for background):

- Weisberg: Preface + Chapters 1 and 2 + Appendices A.1 - A.4.
- *GHV*, Chapter 7.
- Alley, Joshua. 2021. "An Open Collection of Political Science Research with OLS Models and Cross-Sectional Data." *Political Methodologist* blog, September 8, 2021.
- Roberts, Margaret E. 2018. "What is Political Methodology?" *PS: Political Science & Politics* 51:597-601.
- Lewis-Beck, Michael S., and Andrew Skalaban. 1990. "When to Use R-Squared." *Political Methodologist* 3(2):11-12.
- King, Gary. 1990. "When Not to Use R-Squared." *Political Methodologist* 3(2):9-11.
- Luskin, Robert C. 1991. "R-Squared Encore." *Political Methodologist* 4(1):21-23.

- **January 16: NO CLASS** – Martin Luther King, Jr. Holiday

- **January 23:** *Multivariate Regression: Estimation and Inference*

Readings:

- Weisberg, Chapter 3 (pp. 51-68) and 6 (pp. 133-150) and Appendix A.8.
- Berk, Richard, Lawrence Brown, Andreas Buja, Edward George, Emil Pitkin, Kai Zhang, and Linda Zhao. 2014. "Misspecified Mean Function Regression: Making Good Use of Regression Models That Are Wrong." *Sociological Methods & Research* 43:422-451.
- Gelman, Andrew. 2008. "Scaling Regression Inputs by Dividing by Two Standard Deviations." *Statistics in Medicine* 27:2865-2873.

- Kastlelec, Jonathan P., and Eduardo L. Leoni. 2007. “Using Graphs Instead of Tables in Political Science.” *Perspectives on Politics* 5:755-771.
- Wysocki, Anna C., Katherine M. Lawson and Mijke Rhemtulla. 2022. “Statistical Control Requires Causal Justification.” *Advances in Methods and Practices in Psychological Science* 5:1-19.

Homework One due.

● **January 30:** *Practical Multivariate Linear Regression*

Readings:

- Berk, Richard. 2010. “What You Can and Can’t Properly Do with Regression.” *Journal of Quantitative Criminology* 26(4):481-487.
- Keele, Luke, Randolph T. Stevenson, and Felix Elwert. 2020. “The Causal Interpretation of Estimated Associations in Regression Models.” *Political Science Research and Methods* 8:1-13.
- Rainey, Carlisle. 2014. “Arguing for a Negligible Effect.” *American Journal of Political Science* 58:1083-1091.
- Spirling, Arthur, and Brandon M. Stewart. 2022. “What Good is a Regression? Inference to the Best Explanation and the Practice of Political Science Research.” Working paper: New York University. [\[URL\]](#)
- Westreich, Daniel, and Sander Greenland. 2013. “The Table 2 Fallacy: Presenting and Interpreting Confounder and Modifier Coefficients.” *American Journal of Epidemiology* 177:292-298.

● **February 6:** *Dichotomous Predictors, (Non-)Linearity, and Data Transformations*

Readings:

- Weisberg, Chapters Four (pp. 67-93), Five (pp. 98-123), and Eight (pp. 185-199).
- *GHV*, Chapter 12.

Homework Two due.

● **February 13:** *Variance Issues, Collinearity, and Regularization*

Readings:

- Weisberg, Chapter 7 (pp. 156-179).

- Long, J. Scott, and Laurie H. Ervin. 2000. "Using Heteroscedasity-Consistent Standard Errors in the Linear Regression Model." *The American Statistician* 54:217-224.
- King, Gary, and Margaret E. Roberts. 2014. "[How Robust Standard Errors Expose Methodological Problems They Do Not Fix, and What To Do About It.](#)" *Political Analysis* 22:1-21.
- One or more online resources on regularization, e.g. [here](#), [here](#), [here](#), [here](#), and/or [here](#).

Homework Three due.

● **February 20:** *Residuals, Outliers, and Diagnostics + Endogeneity / Simultaneity*
Readings:

- Weisberg, Chapter 9 (pp. 204-226).
- Kennedy (pp. 107-109; 180-191).
- Baissa, Daniel, and Carlisle Rainey. 2020. "When BLUE Is Not Best: Non-Normal Errors and the Linear Model." *Political Science Research and Methods* 8:136-148.
- Lal, Apoorva, Mackenzie William Lockhart, Yiqing Xu, and Ziwen Zu. 2021. "[How Much Should We Trust Instrumental Variable Estimates in Political Science? Practical Advice based on Over 60 Replicated Studies.](#)" Working paper, Stanford/UCSD.
- Sovey, Allison J., and Donald P. Green. 2011. "Instrumental Variables Estimation in Political Science: A Readers' Guide." *American Journal of Political Science* 55:188-200.

Homework Four due.

● **February 27:** *Variable Selection and Multiplicative Interactions*
Readings:

- Weisberg, Chapter 10 (pp. 234-248).
- Friedrich, Robert J. 1982. "[In Defense of Multiplicative Terms in Multiple Regression Equations.](#)" *American Journal of Political Science* 26(November):797-833.
- Brambor, Thomas, William R. Clark, and Matt Golder. 2006. "[Understanding Interaction Models: Improving Empirical Analyses.](#)" *Political Analysis* 14:63-82.
- Esarey, Justin, and Jane Lawrence Sumner. 2018. "[Marginal Effects in Interaction Models: Determining and Controlling the False Positive Rate.](#)" *Comparative Political Studies* 51:1144-1176.

- Hainmueller, Jens, Jonathan Mummolo, and Xiqing Xu. 2019. “How Much Should We Trust Estimates from Multiplicative Interaction Models? Simple Tools to Improve Empirical Practice.” *Political Analysis* 27:163-192.

Homework Five due.

- **March 6: NO CLASS** (Spring Break)

- **March 13: Bootstrapping, etc. + Missing Data Redux**

Readings:

- GHV, Chapter 17.
- Harden, Jeffrey J. 2011. “A Bootstrap Method for Conducting Statistical Inference with Clustered Data.” *State Politics & Policy Quarterly* 11:223-246.
- Lall, Ranjit. 2016. “How Multiple Imputation Makes a Difference.” *Political Analysis* 24:414-433.
- Mooney, Christopher Z. 1996. “Bootstrap Statistical Inference: Examples and Evaluations for Political Science.” *American Journal of Political Science* 40:570-602.

Likelihood-Based Regression

- **March 20: Maximum Likelihood: Introduction + Optimization**

Readings:

- Weisberg, Appendix A.11.
- GHV, Chapter 8.
- Fox, [Appendix D6](#), pp. 92-95.

Homework Six due.

- **March 27: MLE: Inference and Testing**

Readings:

- Weisberg, Chapter 12 (pp. 270-279).

- Buse, A. 1982. “The Likelihood Ratio, Wald, and Lagrange Multiplier Tests: An Expository Note.” *The American Statistician* 36(3):153-57.
- Freedman, D. A. 2006. “On the So-Called ‘Huber Sandwich Estimator’ and ‘Robust’ Standard Errors.” *The American Statistician* 60:299-302.

Homework Seven due.

• **April 3: Models for Binary Outcomes**

Readings:

- Faraway (pp. 25-38).
- *GHV*, Chapter 13.
- Breen, Richard, Kristian Bernt Karlson, and Anders Holm. 2018. “Interpreting and Understanding Logits, Probits, and Other Nonlinear Probability Models.” *Annual Review of Sociology* 44:39-54.
- Hanmer, Michael J., and Kerem Ozan Kalkan. 2013. “Behind the Curve: Clarifying the Best Approach to Calculating Predicted Probabilities and Marginal Effects from Limited Dependent Variable Models.” *American Journal of Political Science* 57:263-277.
- Mize, Trenton D. 2019. “Best Practices for Estimating, Interpreting, and Presenting Nonlinear Interaction Effects.” *Sociological Science* 6:81-117.

• **April 10: Models for Nominal and Ordinal Responses**

Readings:

- Faraway, pp. 97-112.
- Paolino, Philip. 2021. “Predicted Probabilities and Inference with Multinomial Logit.” *Political Analysis* 29:416-421.
- Winship, Christopher, and Robert D. Mare. 1984. “Regression Models with Ordinal Variables.” *American Sociological Review* 49(4):512-25.

Homework Eight due.

• **April 17: Event Counts**

Readings:

- Faraway, pp. 55-66.
- Gould, William. 2011. “Use Poisson Rather Than Regress; Tell a Friend.” *The Stata Blog*, August 22, 2011.
- Wooldridge, Jeffrey. 2001. *Econometric Analysis of Cross Section and Panel Data*. Cambridge, MA: MIT Press. Chapter 19 (pp. 645-659).

Homework Nine due.

● **April 24: Generalized Linear Models**

Readings:

- Weisberg, Chapter 12, pp. 279-285.
- *GHV*, Chapter 15.
- Gill, Jeff. 2001. *Generalized Linear Models: A Unified Approach*. Thousand Oaks, CA: Sage.

Homework Ten due.

● **May 4: Final Papers / Projects Due**