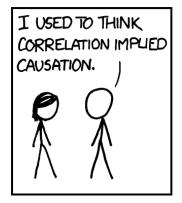
# POLS 8500: Causal Inference

# Spring 2023

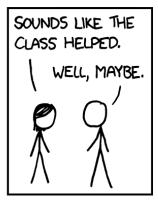
Professor:Joe OrnsteinTime:Th 3:55pm - 6:40pmEmail:jornstein@uga.eduPlace:101B Baldwin Hall

Website: github.com/joeornstein/causal-inference

Correlations alone are rarely satisfying. As social scientists, we don't just want to identify patterns in data – we want to convincingly explain *why* those patterns exist. In this class, we introduce the workhorse methods for inferring causal relationships from observational data, with a focus on building the skills you need to develop convincing research designs, identify useful variation in your data, and write error-free, reproducible code.







# Requirements

Your course grade will be based on three components.

- Readings and Annotations (25%): Each week, read the assigned chapters/articles and annotate them using Hypothesis.
- Replications (2 × 25%): Choose two of *Optional Bonus Fun* papers on the syllabus below (each student must choose a different set of papers). Using their posted replication materials, recreate the paper's key results in a Quarto report. You will present your findings in a Mock Conference Presentation during the second week of the module.
- Final Paper (25%): Write a final paper using one or more of the designs we introduced in class. This could be either an original research project or a re-analysis and extension of one of the papers you replicated.

# Course Outline

Here is the rough plan of action for our semester together. Readings abbreviated "NHK" denote our primary textbook, Nick Huntington-Klein's *The Effect*, available in hard copy or free online.

# Week 1: Garbage Cans, Causal Salads, and the Seven Deadly Sins

Required Reading:

• Angrist, Joshua D, and Jörn-Steffen Pischke. 2010. "The Credibility Revolution in Empirical Economics: How Better Research Design Is Taking the Con out of Econometrics." *Journal of Economic Perspectives* 24(2): 3–30.

- McElreath, Richard. 2021. Regression, Fire, and Dangerous Things.
- Schrodt, Philip A. 2014. "Seven Deadly Sins of Contemporary Quantitative Political Analysis." Journal of Peace Research 51(2): 287–300.

#### Week 2: The Fundamental Problem of Causal Inference

Required Reading:

• NHK Chapters 1-4

Deeper Dives:

• Abadie, Alberto, Susan Athey, Guido W. Imbens, and Jeffrey M. Wooldridge. 2020. "Sampling-Based versus Design-Based Uncertainty in Regression Analysis." *Econometrica* 88(1): 265–96.

# Weeks 3: D'ya Like DAGs?

Required Reading:

• NHK Chapters 5-8

Deeper Dives:

• Pearl, Judea, and Dana Mackenzie. The Book of Why: The New Science of Cause and Effect. Penguin Science. London: Penguin Books, 2019.

### Weeks 4–5: Experiments (Natural and Unnatural)

Required Reading:

- NHK Chapters 9-11
- Montgomery, Jacob M., Brendan Nyhan, and Michelle Torres. "How Conditioning on Posttreatment Variables Can Ruin Your Experiment and What to Do about It." *American Journal of Political Science* 62, no. 3 (2018): 760–75.

Optional Bonus Fun:

• Hall, Andrew B., Connor Huff, and Shiro Kuriwaki. 2019. "Wealth, Slaveownership, and Fighting for the Confederacy: An Empirical Study of the American Civil War." *American Political Science Review* 113(3): 658–73.

Deeper Dives:

• Sekhon, Jasjeet S., and Rocío Rocio Titiunik. 2012. "When Natural Experiments Are Neither Natural nor Experiments." *American Political Science Review* 106(1): 35–57.

# Weeks 6–7: Selection on Observables (Regression and Matching)

Required Reading:

• NHK Chapter 12-14

#### Deeper Dives:

- Cinelli, Carlos, and Chad Hazlett. "Making Sense of Sensitivity: Extending Omitted Variable Bias." Journal of the Royal Statistical Society: Series B (Statistical Methodology) 82, no. 1 (2020): 39–67. https://doi.org/10.1111/rssb.12348.
- Hainmueller, Jens. 2012. "Entropy Balancing for Causal Effects: A Multivariate Reweighting Method to Produce Balanced Samples in Observational Studies." *Political Analysis* 20(1): 25–46.
- Xu, Yiqing, and Eddie Yang. 2022. "Hierarchically Regularized Entropy Balancing." *Political Analysis*: 1–8.
- King, Gary, and Richard Nielsen. 2019. "Why Propensity Scores Should Not Be Used for Matching." *Political Analysis*: 1–20.

#### Weeks 8–9: Fixed Effects

Required Readings:

• NHK Chapter 16

#### Deeper Dives:

- Hazlett, Chad, and Leonard Wainstein. "Understanding, Choosing, and Unifying Multilevel and Fixed Effect Approaches." *Political Analysis* 30, no. 1 (January 2022): 46–65.
- Imai, Kosuke, and In Song Kim. "On the Use of Two-Way Fixed Effects Regression Models for Causal Inference with Panel Data." *Political Analysis* 29, no. 3 (July 2021): 405–15.

#### Weeks 10–11: Difference-in-Differences

Required Reading:

• NHK Chapter 18

#### Deeper Dives:

- Roth, Jonathan, Pedro H. C. Sant'Anna, Alyssa Bilinski, and John Poe. "What's Trending in Difference-in-Differences? A Synthesis of the Recent Econometrics Literature." *arXiv*, January 13, 2022. http://arxiv.org/abs/2201.01194.
- Causal Inference w/ Panel Data Lecture Series (Yiqing Xu)

#### Weeks 12–13: Instrumental Variables

# Required Reading:

• NHK Chapter 19

#### Optional Bonus Fun:

- Miguel, Edward, Shanker Satyanath, and Ernest Sergenti. 2004. "Economic Shocks and Civil Conflict: An Instrumental Variables Approach." *Journal of Political Economy* 112(4): 725–53.
- Trounstine, Jessica. 2015. "Segregation and Inequality in Public Goods." American Journal of Political Science 60(3): 709–25.

#### Deeper Dives:

- Mellon, Jonathan. 2020. "Rain, Rain, Go Away: 137 Potential Exclusion-Restriction Violations for Studies Using Weather as an Instrumental Variable." Working Paper.
- Lal, Apoorva, Yiqing Xu, Mac Lockhart, and Ziwen Zu. "How Much Should We Trust Instrumental Variable Estimates in Political Science? Practical Advice Based on 57 Replicated Studies." Working Paper.

### Week 14-15: Regression Discontinuity

### Required Reading:

• NHK Chapter 20

#### Optional Bonus Fun:

- Klašnja, Marko, and Rocío Titiunik. 2017. "The Incumbency Curse: Weak Parties, Term Limits, and Unfulfilled Accountability." *The American Political Science Review* 111(1): 129–48.
- Keele, Luke J., and Rocío Titiunik. 2015. "Geographic Boundaries as Regression Discontinuities." *Political Analysis* 23(1): 127–55.
- Mummolo, Jonathan. 2018. "Modern Police Tactics, Police-Citizen Interactions, and the Prospects for Reform." *The Journal of Politics* 80(1): 1–15.

# Deeper Dives:

- Cattaneo, Matias D, Nicolas Idrobo, and Rocío Titiunik. 2018. "A Practical Introduction to Regression Discontinuity Designs: Volume I."
- Marshall, John. 2022. "Can Close Election Regression Discontinuity Designs Identify Effects of Winning Politician Characteristics?" American Journal of Political Science.
- Ornstein, Joseph T. & Duck-Mayr, JBrandon. 2022. "Gaussian Process Regression Discontinuity". Working Paper.

# **Academic Honesty**

Remember that when you joined the University of Georgia community, you agreed to abide by a code of conduct outlined in the academic honesty policy called *A Culture of Honesty*. It has some pretty specific things to say on the subject of cheating. Quite specific. I will report any and all dishonest conduct to the Office of the Vice President for Instruction.

## Mental Health and Wellness Resources

- If you or someone you know needs assistance, you are encouraged to contact Student Care and Outreach in the Division of Student Affairs at 706-542-7774 or visit <a href="https://sco.uga.edu">https://sco.uga.edu</a>. They will help you navigate any difficult circumstances you may be facing by connecting you with the appropriate resources or services.
- UGA has several resources for a student seeking mental health services or crisis support.
- If you need help managing stress anxiety, relationships, etc., please visit BeWellUGA for a list of FREE workshops, classes, mentoring, and health coaching led by licensed clinicians and health educators in the University Health Center.
- Additional resources can be accessed through the UGA App.