

## Lecture 5: Environmental Econometrics

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Prof. Parthum  
Environmental Economics  
Econ 475

# Follow-up from Last Class

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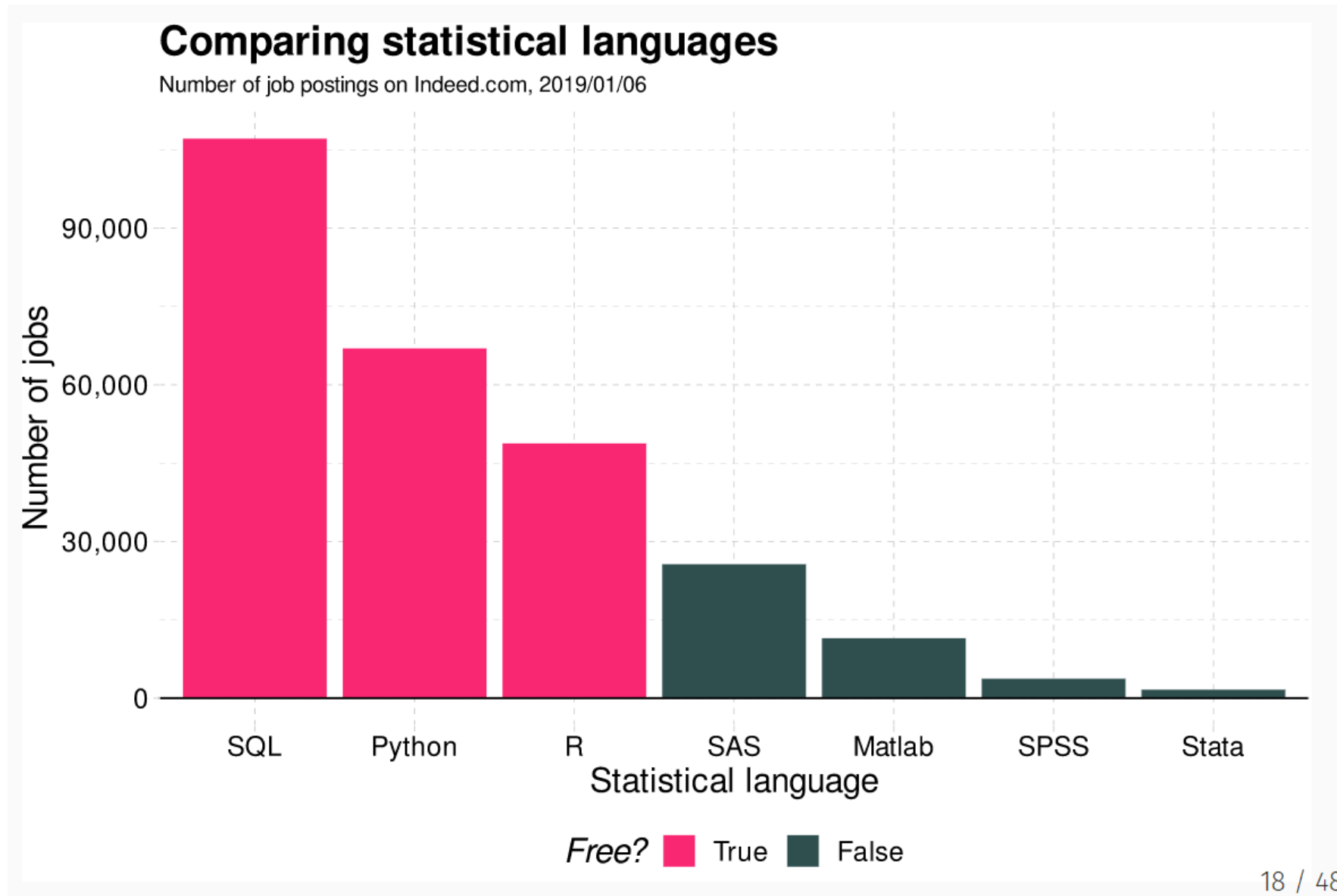
# Follow-up from Last Class

- How can we ensure that economic research remains positive when research questions are inheritably normative?
- Subjectivity is also a part of research. Decisions must be made, and if those decisions are made in concert with other researchers with different background and experience, we stand a better chance of making the “best” one.
- Lastly, environmental economics would do well to push the frontiers of science when it comes to asking difficult questions, especially when we are interested in solving society’s problems (or at least contributing to the conversation). This is an active area of research and you all can make a career out of advancing these methods!

# Econometrics, in General

- Knowledge and experience with econometrics can get you a job! A really good job, a good pre-doc, research assistantship, etc.
- There are amazing resources out there.
  - Dr. Jennifer Doleac's Probable Causation [Podcast](#)
  - Dr. Scott Cunningham's [Substack](#), [Journal of Human Resources threads](#), [Podcast](#), and [Causal Inference: The Mixtape](#) book
  - Dr. Nick Huntington-Klein's [website](#) has a TON of resources on econometrics, methods, causality, and examples with replication
  - Dr. Patty Champ et al. A Primer in Nonmarket Valuation (PDF version available [here](#) for free, and Amazon link [here](#))
  - Dr. Elieen Tipoe and Dr. Ralph Becker's [Doing Economics](#)

# An aside:



# Why Do Economists use Econometrics?

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  - Why is there such a focus on causality? Correlations are still interesting.
  - We want to *know* with some degree of confidence that an intervention/policy etc. affects an outcome. Resources are constrained and interventions cost money!

When estimating the benefits of a policy intervention, we want to know the causal effect of the policy on the outcome of interest. In this simple representation,  $\delta$  would be the effect of cleanup on  $Y$ .

$$Y_i = \mathbf{X}\beta + \delta \text{Cleanup}_i + \phi_i + \varepsilon_i$$

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- $Y_i \equiv$
1. Water Quality Index
  2. Ecological Health
  3. Human Health
  4. Pr(lightning the river on fire)

Whatever the outcome might be, we want to know that  $\delta$  is the best unbiased estimate of the effect of *cleanup* on  $Y$ .

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- However, in many cases the research questions are different and, therefore, require different methods.
- Because the research questions are different, environmental economists have advanced specific areas of econometrics to address hurdles that other fields may not face. For example, constructing hypothetical markets to estimate the value of nonmarket goods and services, specifically nonuse or nonlocal goods.

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  - Exploits variation in travel distance (the “cost”) to identify the value of “a trip”.
  - A “trip” contains multiple “amenities” and is a “bundled” good.
    - Activities, hiking, biking, fishing
    - Trail miles, park benches, access
    - Quality and quantity of these amenities

$$U_{ij} = -\lambda price_{ij} + X\beta + \phi + \varepsilon_{ij}$$

$$price_{ij} = \delta distnace_{ij} + \gamma Z + \epsilon$$



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  - Exploits variation in distance from a place of residence to the amenity
  - Similar to “trips” in the case of travel cost, residences are a “bundled” good.
    - Square footage, lot size, distance to park, etc.

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  - Because markets for nonmarket goods don't exist, sometimes it is useful to create them!
  - Hypothetical markets can address:
    - Changes in nonmarket goods outside of their historically observed levels
    - Creation of entirely new goods and services (new park, etc.)
    - Nonuse values. If people don't travel to them, live near by them, but just care that they exist.

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  - People are exposed to various levels of pollution. This exposure presents risks, often in the form of lost productivity or lost workdays.
  - To help protect themselves from this reduction in productivity, people can invest in expenditures that will reduce the severity or length of the illness.
  - Cost of illness takes many forms, but personal cost of illness is one.
  - However, it's important to note that defensive investments are often endogenous to the person.

$$Days\ Sick_{ij} = X\beta + \phi + \varepsilon_{ij}$$

# Environmental Econometrics

- Linking research questions to econometric approaches requires careful thought about what the question is, what you believe the answer might look like, and the available data.
- I often have a research question and think about what the “ideal” data might look like. Knowing the “ideal” data often doesn’t exist helps guide which approach I am going to use.
- Lastly, think about unique events that happen in our everyday lives that act as natural experiments. Did something occur suddenly and without expectation? Do states have very different policies while the communities on either side of the border remain the same?

# Module 2

- Major focus on academic research articles in the field of environmental economics
- Each class we will be reviewing articles, their methods, and their conclusions
- Reading academic articles is really hard (at first). But there is a lot of great advice out there on how to best get started.
- [How to Read Journal Articles like a Professor](#)

# Reflection Post

- Grading Rubric
  - Do not summarize the podcast. Skip to the good part:

**your experience with the material and what you believe the experience of others is**

Grading:

- **50 points:** For connecting your experience to the material in a concise way. E.g. “Dr. Spiller talks about the location of schools and the schools I attended growing up...”
- **50 points:** For connecting your experience with the material to what you think others in your neighborhood, city, state, etc. faced. Can those experiences be generalized to other towns/states/countries? If not, why? How do you believe the experience differs?