Making Causal Critiques Day 1 - Deconstructing an Argument

Jonathan Phillips

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What is a causal critique?

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Did voters support President Trump because of jobs lost to immigration?	"Obviously not, jobs were lost to technological change"

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 - A comment at a seminar
 - A critique of a policy
 - A response as a journal referee
 - Advice to a friend
 - A worry about your own research paper

- Explanation requires:
 - 1. Theory
 - 2. Evidence

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- Next time the laptop fails to charge, our wiggling might not be enough and we won't know how to fix it

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- We can design other tests to check the laptop, charger, adapter etc.

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- Explanation requires evidence that supports a specific theory
 - And rejects other theories

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- 4. **Doubly Decisive Test**: Can confirm a hypothesis and reject all other hypotheses

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 - 4. **Doubly Decisive Test**: If we test the charger with an entirely new socket and laptop that we have checked work

- What caused the reduction in price variation in Kerala's fishing industry?
- ► **Hypothesis:** The introduction of mobile phone service
- Theory: Mobile phones allowed people to quickly share the price of fish in different villages, so fishermen got the best prices more consistently
 - Jensen et al (2007)
 - A 'smoking gun' test

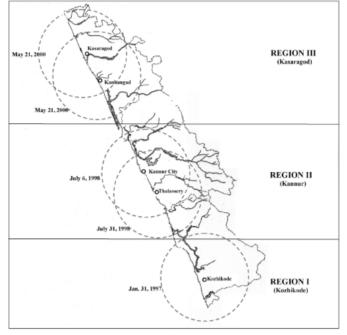
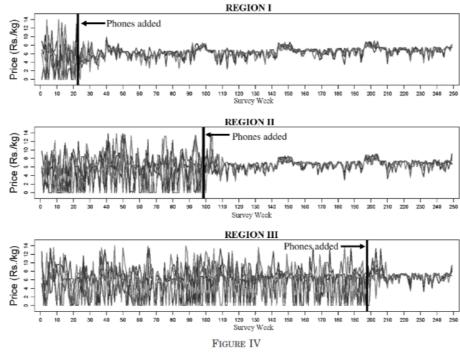


FIGURE II Spread of Mobile Phone Coverage in Kasaragod, Kannur, and Kozhikode Districts



Prices and Mobile Phone Service in Kerala

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 - 4. Ethical constraints on the data we can gather
 - 5. Political explanations in one place may not work in another

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- Most causes operate only if certain other hard-to-measure conditions are in place
- That means we need to treat causation as probabilistic
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- For example, a left-wing party in government may not guarantee the passage of social welfare legislation
- But it can make it more likely

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 - This is logically inconsistent

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- 2. **False dichotomy**: Restricting the possible options to only two
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- 3. **Circular reasoning**: The conclusions just restate the premises
 - Eg. "Abortion should be legal because women have the right to an abortion."

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- 6. **Appeal to Authority**: Assuming the author is right because they are senior
 - Eg. Assuming that political science professors know what they are doing!

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 - Eg. "If someone stands up at a football match, they can see better. Therefore, if everyone stands up, they can all see better."

- ► Some political science arguments are logically inconsistent:
 - Voters are rational they choose the politician that is best for them. Therefore we always elect the best politicians.

► How to read a political science paper:

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- Summarize the paper in your own words

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 - What is the scope of the argument's application?

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 - Units of Analysis At what level are these measures taken; individuals, countries, city-years?
 - Role of Variables Which is the outcome variable and which the explanatory? What controls are used?

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 - Evidence What evidence does the methodology produce?

Title:					
Authors:					Year:
Research Question:					
Answer/Causal Argument:					
Scope of Argument (in Time, Space, Demographics etc.):					
Concept/Variable	Measure	Unit	Unit of Analysis		Role (DV, XV, Control)
Theory:			Methodology:		
				Case Study	, Process Tracing
				Comparative Cases	
				-	with Controls
				Matching	
Evidence:				Field Experiment	
				Lab/Survey Experiment Natural Experiment	
				Instrument	
			u 0	-	Discontinuity
			u	Dimerence	In-Differences

Critiquing Concepts

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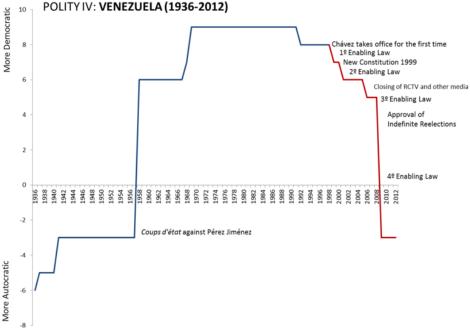
Measurement Validity

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 - Are the cases (units) scored correctly? How reliable is the scoring?



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- What was the "Data Generating Process"?
- How does this data help us answer the question?

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 - Difference-in-Differences

Small-N Studies:

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 - Case Study, Process Tracing

Title: Making Democracy Work					
Authors: Robert Putnam				Year: 1993	
Research Question: Why are some parts of Italy governed better than oth- ers?					
Answer/Causal Argument: Places with more civic social interactions have					
better government					
Scope of Argument (in Time, Space, Demographics etc.): Advanced Democracies					
Concept/Variable	Measure	Unit of Analysis			Polo (D) ()() (control)
Civil Society	Density of sports clubs,	Region		andiysis	Role (DV, XV, Control) Explanatory Variable
civil society	newspapers, electoral turnout				expandicity variable
Government Perfor- mance	12 Indicators, eg. Budget on time, number of day care centres per child	Region			Dependent Variable
Wealth	GDP per capita	Region			Control Variable
Theory: Civic interactions between people Methodology:					
and groups create trust and more				Case Study, Process Tracing	
'horizontal' relationships that prevent gov- ernment from being predatory Evidence: Regions of Italy with similar insti- tutional rules and similar wealth but with more civil society have, on average, better performing government			×	Comparative Cases	
				Regression with Controls	
				Matching	
				Field Experiment	
				Instrumental Variable	
				Regression Discontinuity	
				Difference-in-Differences	

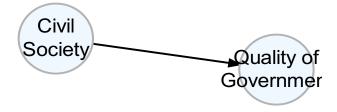
Using Causal Diagrams to clarify arguments

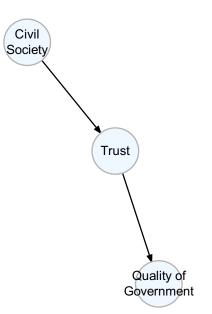
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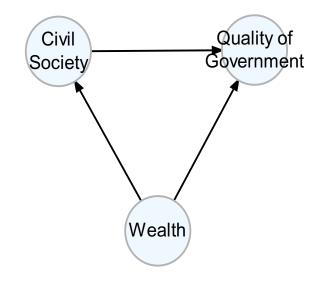
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 - Write all the variables on the paper
 - Connecting them with arrows to represent the author's causal argument
 - And also the threats to the author's argument
 - Even if they can't be measured







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- 4. Equifinality Causation If D1 or D2 then Y

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- 2. **Probabilistic Causation** If *D* then the probability of *Y* increases
- 3. Conjuctural Causation If D1 and D2 then Y
- 4. Equifinality Causation If D1 or D2 then Y
- 5. Non-Linear Causation If D > 1000 then Y

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- 7. **Replicability** Can we take the same (or similar) data and reach the same conclusion?