# Making Causal Critiques Day 1 - Deconstructing an Argument

Jonathan Phillips

January 27, 2019

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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"

- What is a causal critique?
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  - A worry about your own research paper

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

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- No! We do not know if the laptop, the charger, the adapter or the socket is the problem. We do not have a *theory* to support our solution
- 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

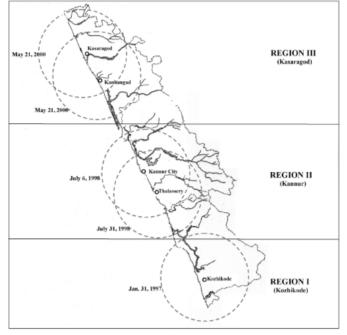
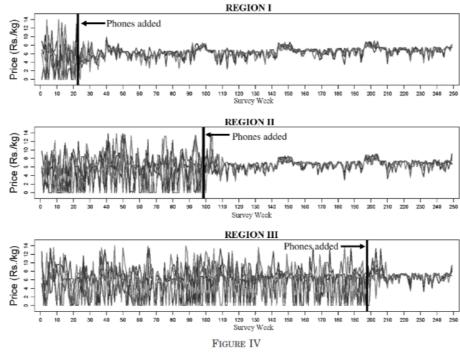


FIGURE II Spread of Mobile Phone Coverage in Kasaragod, Kannur, and Kozhikode Districts



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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- 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:

Actively, intentionally

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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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  - Scope of argument Does the argument apply only to democracies, Asian countries, since World War II, only to women?

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  - 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
			<b>u</b>	Dimerence	In-Differences

**Critiquing Concepts** 

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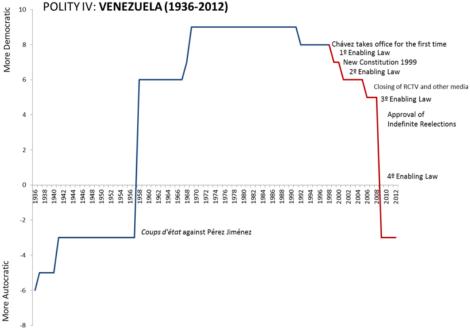
#### Measurement Validity

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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?

Methodologies for gathering evidence:

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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				<b>Year:</b> 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	

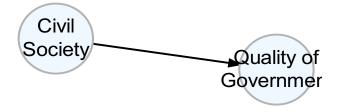
Using Causal Diagrams to clarify arguments

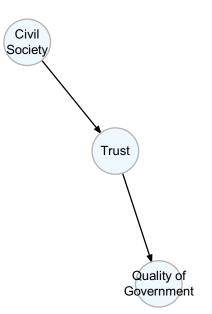
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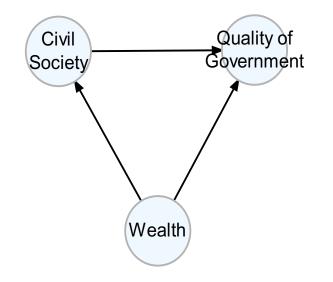
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  - Write all the variables on the paper
  - Connecting them with arrows to represent the author's causal argument
  - And also the threats to the author's argument
    - Even if they can't be measured







# 1. Deterministic Causation - If D then Y

- 1. Deterministic Causation If D then Y
- 2. **Probabilistic Causation** If *D* then the probability of *Y* increases

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