Hypothesis Testing

Preview

Theory Development and Hypothesis Generation

Department of Government London School of Economics and Political Science

Preview

1 Theory

2 Generating Hypotheses

3 Hypothesis Testing

4 Preview

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Scientific method

- Research question(s)
- 2 Clarify the core concepts
- **3** Develop theory
- ⁴ Derive specific, testable hypotheses
- 5 Plan data collection
- 6 Gather data/evidence
- 7 Analyze data
- 8 Draw inferences

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¹Kellstedt and Whitten, p.3

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 - Theories contain:
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 - Explanatory, independent, or causal variable(s) thought to affect the outcome
 - A mechanism ("how") that links the two

Theory



Theory vs. Framework

- Theories are general statements about causal relationships
- Testing a theory involves:
 - Stating observable implications of theory (and rival theory/ies)
 - Examining whether evidence is consistent or inconsistent with expectations

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- Theories are general statements about causal relationships
- Testing a theory involves:
 - Stating observable implications of theory (and rival theory/ies)
 - Examining whether evidence is consistent or inconsistent with expectations
- Applying an interpretive framework involves merely focusing on particular features of an empirical phenomenon

Key Points!

- **1** Theory is about concepts
- Analysis is about measured variables
 Everything from MT
- 3 So our task as scientists is to:
 - Find observable implications of theory
 - Draw theoretical implications from measures





Generating Theory I

- One way to theorize is to reason inductively
- Induction works by drawing generalities from specific observations
- Sometimes called "bottom-up" theorizing

Generating Theory II

- An alternative way of developing theory is through *deduction*
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- Common example: Rational choice theory

Generating Theory III

"The Calculus of Voting" is a *rational* choice theory

- Assumes utility maximization is the driver of all behaviour
- Understanding phenomena is a matter of figuring out utility structures, especially those created by institutions

The Calculus of Voting

Theory: Voting is explained by 3 factors

- Costs of voting
- Benefits from preferred alternative winning
- Probability of impacting result



The Calculus of Voting

Theory: Voting is explained by 4 factors

- Costs of voting
- Benefits from preferred alternative winning
- Probability of impacting result
- Benefits from voting per se



Aside: Assumptions

If a theory requires assumptions, is that theory credible?

Generating Theory III

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- "The Calculus of Voting" is a *rational* choice theory
 - Assumes utility maximization is the driver of all behaviour
 - Understanding phenomena is a matter of figuring out utility structures, especially those created by institutions
 - Not the only broad theoretical paradigm

The Michigan Model

Theory: Vote choice is explained by long-standing partisan identification, which is in turn shaped by early socialization.



Induction vs. Deduction?

- Induction and deduction are both integral to science
- Theory testing and theory building both require observation

Theory Generation in Practice

As you theorize an explanation for some phenomenon, you will draw on:

- General principles
- Extant theory
- Specific evidence

What makes for a good theory?

- Truth
- Relevance
- Coherence
- Falsifiability
- Precision
- Generality
- Parsimony

Generality & Parsimony

Think for 90 seconds about each of these principles:

- Generality: Theories that can explain more are preferred over theories that can explain less
- Parsimony: Simple theories are preferred over complex theories

Are these principles defensible? Are they any good?

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Hypotheses

²Toshkov p.64

Hypotheses

- Definitions:
 - observable implications; testable propositions entailed by the logic of the theory²
 - a theory-based statement about a relationship that we expect to observe³

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Features

- Derived from theory
- Specific
- Empirical/observable
- Causal ("if-then" logic)

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How do we generate hypotheses?

- Think about observable implications
- What would evidence consistent with this theory be?
- What would evidence inconsistent with this theory be?

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This is falsifiability

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 Around Broad Street (Soho)
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- What causes transmission of cholera?
- Dominant theory at time: "miasma"
- Hypotheses:
 - Clean up garbage → ↓ cholera
 Open windows → ↓ cholera



Observational Equivalence

- Definition: All hypotheses for two (or more) theories are identical
 - What to do?
 - Generate more specific expectations
 - Move outside scope conditions
 - Settle for lack of explanation







Median Voter Theory of Legislatures



If this is true, why do we sometimes see policies left of m in a legislature?

Three Competing Theories



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Hypothesis Testing

- Multiple schools of thought
- History is conflictual and murky
- Two strands of literature
 Philosophy of science
 Statistics

Identify and collect data

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- 2 Data should include:
 - Outcome variable(s), X
 - Explanatory variable(s), Y
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- 3 Need variation on both X and Y
- Test difference between outcomes when (possibly) causal variable differs

Forms of Hypothesis Testing

Null hypothesis

Begin with *null* hypothesis

Your hypothesis expects an alternative state of the world

c/o Ronald Fisher

Alternative hypotheses

Begin with 2(+) alternative hypotheses

Accept hypothesis consistent with observation

c/o Jerzy Neyman and Egon Pearson

Fearon's Counterfactuals

- Sometimes we cannot test our hypothesis with actual observations
- What does Fearon suggest we do?

A Good Test

- Correct level of analysis
- Within scope conditions of theory
- Well-defined concepts
- Measures of high construct validity, accuracy, and precision
- Possible to observe any correlation between potential cause and outcome
- Consistent with or an improvement upon past methods
- Test using different data than data used to generate theory

Some Testing Challenges

- 1 Deterministic and probabilistic causality
- 2 Effect heterogeneity
- ³ Multiple causation
- ⁴ Equifinality
- 5 Confirmation or disconfirmation bias

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Theory testing involves:

- Between-case comparisons, or
- Across-time comparisons, or
- Between-case & across-time comparisons
- Within-case comparisons at a lower level of analysis

Methods of theory testing include:

- Case comparisons
- Process-tracing
- Observational statistical comparisons
 - Tabulation/visualization
 - Bivariate statistical inference (e.g., t-tests)
 - Multivariate analysis (e.g., regression)
 - Experimentation

Preview of Next Week

How do we make between-case comparisons to test theories?