#### Multi-Method Experiments

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- Classic Natural Experiment
- Instrumental Variables-Type Natural Experiment

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- Instrumental Variables-Type Natural Experiment
- Regression-Discontinuity Design

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  - All (observable and unobservable) confounding variables are balanced between treatment and control groups.

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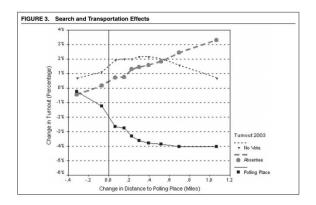
- 1 "Nature" randomizes the treatment.
  - All (observable and unobservable) confounding variables are balanced between treatment and control groups.
  - No discretion is involved in assigning treatments, or the relevant information is unavailable or unused.
- 2 Randomized treatment has the same effect as non-randomized treatment would have.

Process tracing and the cause of the cause.

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- Process tracing to compare mechanisms inside and outside of the natural experiment.

#### Snow on Cholera

# Brady and McNulty on Costs of Voting



#### Vietnam War Draft Lottery

#### Statisticians Charge Draft Lotter'y Was Not Random

By DAVID E. ROSENBAUM JAN. 4, 1970

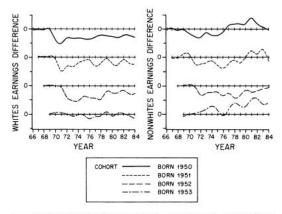
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WASHINGTON, Jan. 3—The new draft lottery is being challenged by statisticians and politicians on the ground that the selection process did not produce a truly random result.



Notes: The figure plots the difference in FICA taxable earnings by draft-eligibility status for the four cohorts born 1950-53. Each tick on the vertical axis represents \$500 real (1978) dollars.

FIGURE 2. THE DIFFERENCE IN EARNINGS BY DRAFT-ELIGIBILITY STATUS

# Lottery Winners and Political Attitudes

- "Nature" randomizes a cause of the treatment.
  - Call the treatment X.
  - Call the randomized cause of the treatment Z.

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- 2 only affects Y through its effects on X.
- Treatment caused by the randomized cause has the same effect as treatment with any other cause would have

 Process tracing backwards from the cause of the cause.

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- Process tracing backwards from the cause of the cause.
- Process tracing forward from the cause of the cause to the cause.
- Process tracing between the cause and the outcome in a matched pair of cases.

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(potential) settler  
  mortality  
⇒ settlements

⇒ early  
institutions  
⇒ current  
institutions

⇒ current  
performance.
```

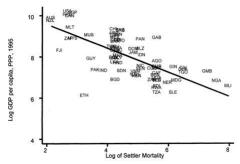


FIGURE 1. REDUCED-FORM RELATIONSHIP BETWEEN INCOME AND SETTLER MORTALITY

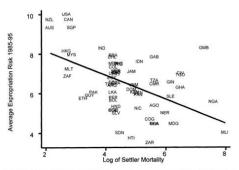


FIGURE 3. FIRST-STAGE RELATIONSHIP BETWEEN SETTLER MORTALITY AND EXPROPRIATION RISK

	Base sample (1)	Base sample (2)	Base sample without Neo-Europes (3)	Base sample without Neo-Europes (4)	Base sample without Africa (5)	Base sample without Africa (6)	Base sample with continent dummies (7)	Base sample with continent dummies (8)	Base sample, dependent variable is log output per worker (9)
			Panel A: Two-	Stage Least Squ	ares				
Average protection against expropriation risk 1985–1995 Latitude	0.94 (0.16)	1.00 (0.22) -0.65 (1.34)	1.28 (0.36)	1.21 (0.35) 0.94 (1.46)	0.58 (0.10)	0.58 (0.12) 0.04 (0.84)	0.98 (0.30)	1.10 (0.46) -1.20 (1.8)	0.98 (0.17)
Asia dummy Africa dummy							-0.92 (0.40) -0.46 (0.36)	-1.10 (0.52) -0.44 (0.42)	
"Other" continent dummy							-0.94 (0.85)	-0.99 (1.0)	
Panel	B: First S	tage for A	verage Protecti	on Against Exp	ropriation	Risk in 19	85-1995		
Log European settler mortality	-0.61 (0.13)	-0.51 (0.14)	-0.39 (0.13)	-0.39 (0.14)	-1.20 (0.22)	-1.10 (0.24)	-0.43 (0.17)	-0.34 (0.18)	-0.63 (0.13)
Latitude		(1.34)		-0.11 (1.50)		0.99 (1.43)		2.00 (1.40)	
Asia dummy							(0.49)	(0.50)	
Africa dummy "Other" continent dummy							-0.27 (0.41) 1.24	-0.26 (0.41) 1.1	
p2	0.27	0.20	0.12	0.12	0.47	0.47	(0.84)	(0.84)	0.20

# Vietnam Draft Lottery and Returns to Education

#### NBER WORKING PAPERS SERIES

#### ESTIMATING THE PAYOFF TO SCHOOLING USING THE VIETNAM-ERA DRAFT LOTTERY

Joshua D. Angrist

Alan B. Krueger

Table 3

2SIS and OIS Wage Equation Estimates
Dependent Variable: Log Real Weekly Wage
Men Born 1944 - 1953

Independent	Mean	2SLS	2SLS	2SLS	OLS
Variables	(SD)	(1)	(2)	(3)	(4)
Intercept	_	4.551	4.639	4.543	4.647
		(0.199)	(0.033)	(0.201)	(0.025)
Education	13.39	0.066	0.059	0.066	0.059
	[2.92]	(0.015)	(0.001)	(0.015)	(0.001)
Veteran	0.34	0.022	0.041	0.042	0.022
Status	[0.43]	(0.007)	(0.055)	(0.055)	(0.007)
Black	0.07	-0.161	-0.167	-0.162	-0.167
	[0.26]	(0.017)	(0.013)	(0.017)	(0.013)
Hispanic and	0.03	-0.121	-0.113	-0.118	-0.116
Other Races	[0.18]	(0.021)	(0.020)	(0.023)	(0.019)
Central City	0.23	0.016	0.019	0.017	0.018
	[0.42]	(0.010)	(0.009)	(0.011)	(0.009)
Balance of	0.32	0.131	0.136	0.131	0.136
SMSA	[0.47]	(0.013)	(0.008)	(0.013)	(0.008)

#### RDD

• There is an assignment variable, Z.

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- Cases are assigned to treatment if and only if Z is greater than a predetermined threshold value, T.

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- **1** There are enough cases that lots have scores of Z that are just above and just below T.

 Assumptions 1 and 3 can be checked with the quantitative data.

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- For assumption 2, process trace the cause of the cause and the cause of the cause of the cause.

"The number of pupils assigned to each teacher is twenty-five. If there are fifty, we appoint two teachers. If there are forty, we appoint an assistant, at the expense of the town." (Baba Bathra, Chapter II, page 21a; translated by Epstein 1976: 214)

"Twenty-five children may be put in charge of one teacher. If the number in the class exceeds twenty-five but is not more than forty, he should have an assistant to help with the instruction. If there are more than forty, two teachers must be appointed." (Maimonides, given in Hyamson 1937: 58b)

 Maimonides' Rule is used to determine class sizes in Israel

- Maimonides' Rule is used to determine class sizes in Israel.
- Angrist and Lavy (1999) use this to carry out an RDD analysis of the effects of class size on educational outcomes.

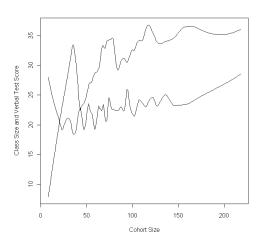


Figure: Age Cohorts and Verbal Test Scores

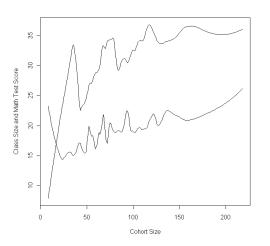


Figure: Age Cohorts and Math Test Scores

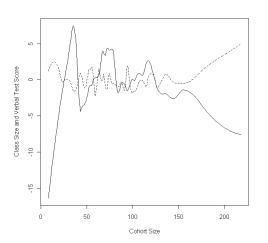


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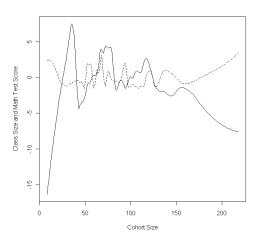


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#### RDD isn't a good idea if:

 Actors are aware of the discontinuity and adjust their behavior accordingly.

#### RDD isn't a good idea if:

- Actors are aware of the discontinuity and adjust their behavior accordingly.
- The variable which assigns the discontinuity is so coarsely measured or distributed that the cases nearest to the divide are not close to each other.

# Case Selection and Natural Experiments

- Classic natural experiments: extreme values of the cause
- IV natural experiments: extreme values of the cause of the cause; surprising values of the cause
- RDD natural experiments: cases with power or privilege