

V1 2019 USCOTS Workshop 1

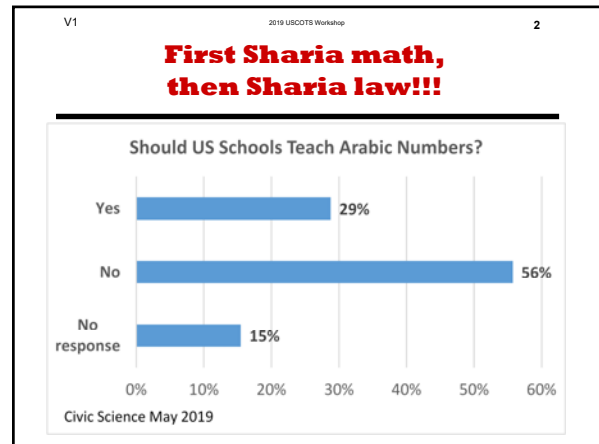
## Teaching Statistical Literacy

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**Chapter 1**  
by  
**Milo Schield**

*Half-Day Workshop*  
**USCOTS May 16, 2019**

[www.StatLit.org/pdf/2019-Schild-USCOTS-slides1.pdf](http://www.StatLit.org/pdf/2019-Schild-USCOTS-slides1.pdf)



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### Working Moms; Better Kids

23% more \$

<http://money.com/money/5272659/working-moms-better-kids/>

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### Outline

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Introduction:

- A1. Who takes intro statistics
- A2. SAT level of our students by college
- A3. Math level of our students by major

Exp vs. Obs: What kinds are relevant?

- A3. Kinds of influence on statistics
  - How common are these influences?
- A4. Grammar: Association vs. causation

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### Goals of this Workshop

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1. Present my view of statistical literacy
2. Expose you to lots of new ideas
3. Present a coherent structure for teaching
4. Show the importance of English grammar
5. Show simple ways of handling significance
6. Show simple ways of handling confounding
7. Show how confounding changes significance
8. Role-model analyzing studies

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### Fraction of 4-year Undergrads that take Intro Stats?

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# 57%

Schield (2016, IASE)

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### Fraction of Course Gain that Stat Students Lose in 4 Months

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# 50%

Tintle et al, 2013

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### Student Attitudes Toward Stats

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**Of those taking Stat I:**

- less than 1% take *Stat II* (10-yrs @ U. St. Thomas)
- less than 0.2% major in statistics (nationwide).
- most see less value in statistics after the course than they did before. Schield and Schield (2008).
- too many say “Worst course I ever took” [anecdotal]

www.amstat.org/misc/StatsBachelors2003-2013.pdf 1,135 stat majors in 2013 at 32 colleges www.StatLit.org/pdf/2015-Schild-UST-Enroll-in-Statistics.pdf

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### What fraction of 4-Yr Intro Stat students are taught outside Math?

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# 50%

Estimates by Schield (2015, Statchat)

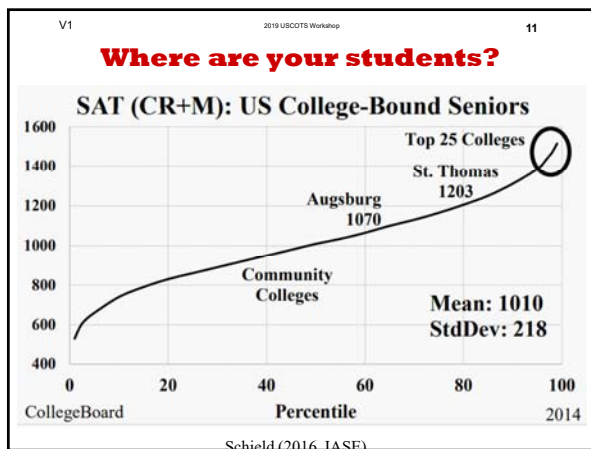
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### Who takes Intro Statistics at Four-Year Colleges?

**Table 1: Distribution of Majors in Stat 101**

%	Major
38%	Business or Economics
19%	Social Science or History
13%	Health
10%	Psychology
9%	Engineering
9%	Biological Science
2%	Math or Statistics
100%	All students in these majors

Schild (2016, IASE). Inferred from data in 2012 US Statistical Abstract.



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### SAT Math Percentile by Major

SAT MATH	PERCENTILE	MAJOR
613	80%	Math/Stats
585	72%	Physical Sciences
579	70%	Engineering
554	62%	Comp. Science
551	61%	Biological
550	61%	Social Sciences
522	51%	Business
522	51%	English Lang/Lit
506	46%	History
498	43%	Communication
489	40%	Psychology
482	38%	Education

SAT Math Scores: Average by Student Major

Percentiles of all those taking the Math SAT

Business Insider (2014), College Board (2015)  
Schield (2016, IASE)

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**GAISE 2016 Update**

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*The real world is complex and can't be described well by one or two variables.*

*If students do not have exposure to simple tools for disentangling complex relationships, they may dismiss statistics as an old-school discipline only suitable for small sample inference of randomized studies.*

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**GAISE 2016 Update**

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*Multivariable thinking is critical to make sense of the observational data around us*

- learn to identify observational studies
- learn to consider potential confounding factors
- use ... stratification ... to show confounding

*This report recommends that students be introduced to multivariable thinking, preferably early in the introductory course and not as an afterthought at the end of the course.*

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**Most Important Topics: Student Choices**

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Rank	The most important topics in Statistical Literacy for Managers
1	Take CARE: Confounding, Assembly, Randomness and Error/bias
2	Confounding
2	Hypothetical thinking: plausible confounders, plausible definitions
4	Statistics are more than numbers. They include the context
5	Association-causation (Luck-skill) including the grammar
5	Bias: Placebo, Single blind; double blind
5	Named Ratios and Ratio grammar; Percent, Percentages, Rates
5	Read tables and graphs

Schiold (2016, ASA)

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**A-B-C Words:  
A = Association**

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**Statistical association is not the same as Basketball Assoc.**  
**Association words** assert association explicitly or describe associations involving fixed conditions or unrepeatable events.

Association: Height is *associated* with age in children  
 Obesity is *correlated* with (related to) diabetes.

Prediction: Graduating from high school *predicts* success in life.

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\*Comparisons: People with degrees earn *more than* those without  
 Whites have a *higher* risk of suicide *than* blacks.

\*Co-variation: *As children get older*, their weight *increases*.

\* Manipulation is impossible, or treatment or outcome cannot be repeated.  
 Schiold (2018, SL4DM)

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**A-B-C Words:  
C = Causation**

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**Causation words** assert causation, sufficiency or contra-factual

Causation: A bomb *caused* the fire. Insomnia is a side *effect*.  
 Lightning *resulted in* a fire. Spark results in a fire.

Sufficient: The more X you do, the more Y *you will get*.  
*Prevent, stop, end, start, kill, produce, cure, avoid, ban, quit, block, ward off, stave off, cancel, hinder, or eliminate.*<sup>6</sup>

Contra-factual: Those who do X *will get* more Y *than if they had not done X*.

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**A-B-C Words:  
B = Between**

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**Between words** describe association but imply causation

Verbs: Red wine *cuts* cancer risk. TV *ups* kids' risk of flunking.  
 Gene X *increases* health risk. Smoking *raises* asthma risk.

Connectors: Nuts *linked to* cancer. Trauma *tied to* heart disease.

Contributor: Diet *contributes to* diabetes. Age is *factor* in infertility

Nouns: Spinach is *asthma protector*. Bad water is a *killer*.

Logicals: Anxiety increases *due to (because of)* high stake testing

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\*Compare: People who take antidepressants have fewer migraines  
 Asthma attacks more likely for smokers *than* non-smokers.

\*Covariation: As teacher pay *increases*, student scores increase.  
 The more hours worked, the *more likely* a promotion

\*Manipulation is possible, and treatment and outcome are repeatable.

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### A-B-C Words: Distribution in Headlines

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Of the 2,000 news headlines analyzed<sup>6</sup>,  
**71% involved A, B or C.**

Of those headlines involving A, B or C,

- **86% were "between" claims,**
- 11% sufficiency, 3% causation, 3% association.

6. Schield and Raymond (2009).

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### Association is not causation

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This statement is ambiguous. It can mean:

- 1 Association is not sufficient to prove causation
- 2 Association provides no evidence for causation.

Teachers may intend #1; students often hear #2.

A better statement would be:  
*Association is evidence of causation somewhere.*

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### Association is not causation

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*No idea has stifled the growth of statistical literacy as much as the endless repetition of the words "correlation is not causation".*

*This phrase seems to be primarily used to suppress intellectual inquiry -- by encouraging the unspoken assumption that correlational knowledge is somehow an inferior form of knowledge.*

John Myles White (2010):  
www.johnmyleswhite.com/notebook/2010/10/01/three-quarter-truths-correlation-is-not-causation/

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### Studies are the Primary Unit of Analysis

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### Harvard Case Studies: Title or Abstract

#	INFERENTIAL	CONTROL/CONFOUND
22	"clinical trial" <b>18</b>	2,263 control
7	"statistical significance"	234 "control of" <b>200</b>
4	"statistically significant"	113 "take (ing) into account"
3	"standard error"	30 "compensate (ing) for"
1	"sampling error"	19 "control (ed, ing) for"
1	"margin of error"	18 confound (er, ing)
1	"prediction interval"	17 "adjust(ed, ing) for"
1	p-value	3 "sampling bias"
0	"sampling distribution"	0 "alternate explanation"
0	"confidence interval"	0 "common cause"
0	"null hypothesis"	0 "effect modifier"
0	"reject the null"	0 "Simpson's paradox"
0	"random assignment"	0 "lurking variable"

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### Statistical Literacy : An Overview

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Statistics are numbers in a context  
Association is not causation

RANDOMNESS and CAUSATION	CONFOUNDING and CAUSATION
Chance, independence and sampling distributions Margin of error, hyp tests & statistical significance <i>Random assignment and causation (Fisher: RCT)</i>	Comparisons, ratios, models and study designs Epidemiological causation (Bradford-Hill) <i>Confounder conditions for nullification (Cornfield)</i>

v0.7 Conditional probability, medical tests and Bayesian reasoning  
Coincidence, Simpson's Paradox and regression to the mean

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### Stat Literacy studies Stats as Evidence in Arguments

The Point or the Target

The more disputable the point, the stronger the evidence must be.

**Statistic As Evidence**

“All Statistics are Socially Constructed”  
So, “Take CARE”!!

Statistics may be influenced by:

C	A	R	E
Context	Assembly	Randomness	Error

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### Statistical Literacy : Assembly

#### Living with AIDs

All (1,000)	White (non-Hispanic)	Black (non-Hispanic)	Hispanic
434	150	186	78

Q1. Which group is largest?  
Consolidate White (Non-Hispanic) with Hispanic.

Q2. Which group is largest?

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### Statistical Literacy : Randomness

Five non-quantitative Topics:

1. Regression to the Mean  
Sport Illustrated Cover
2. Statistically significant
3. Chance-Related Mistakes:  
Three Door problem; Birthday problem
  - Better than chance
  - Unlikely to be chance

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### Statistical Literacy : Error/Bias

Three kinds of error

1. Subject/respondent error:
2. Researcher/measurement error:
3. Sampling error:

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### Statistical Literacy : Assembly

#### Child Abuse Statistics

Each year, more than 7,000 children in Minnesota are confirmed to be victims of physical or sexual abuse, emotional maltreatment, or neglect.

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### Statistical Literacy : Recommendation

More college students (over half) take intro statistics than any other course (except English).

One-size fits all is no longer viable. Statistics education must support Stat 101 and 100/102.

Statistics education should (1) support different flavors for different majors, and (2) agree on the contributions of statistics to human knowledge.

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**Willful Ignorance**

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*The past success of statistics has depended on vast, deliberate simplifications amounting to willful ignorance.*

*This very success now threatens future advances in medicine, the social sciences, and other fields.*

*Limitations of existing methods result in frequent reversals of scientific findings/recommendations, to the consternation of scientists and the public.*

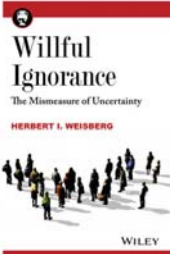
*Herbert I. Weisberg*

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**Willful Ignorance**  
**Herbert Weisberg**

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*The past success of statistics has depended on vast, deliberate simplifications amounting to willful ignorance.*



*Limitations of existing methods result in frequent reversals of scientific findings and recommendations, to the consternation of scientists and the lay public.*

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## Statistics Literacy For Decision Makers

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### Statistical Literacy Details Chapter 2

by  
**Milo Schield**

*USCOTS Workshop May 16, 2019*  
[www.StatLit.org/pdf/2019-Schild-USCOTS-Slides2.pdf](http://www.StatLit.org/pdf/2019-Schild-USCOTS-Slides2.pdf)

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### Take CARE: Details Chapter 2 Outline

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Associations: Comparison and Co-Variation

- Comparisons: Ordered and Arithmetic
- Comparisons: Kinds of Arithmetic

Take CARE: Solutions

- Confounder control: effect size, study design
- Assembly:
- Randomness: Test for statistical significance
- Error/Bias: Single & Double blind.

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### Stat Literacy studies Stats as Evidence in Arguments

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The Point or the Target

The more disputable the point,  
the stronger the evidence must be.

**Statistic As Evidence**

"All Statistics are Socially Constructed"  
So, "Take CARE"!!

Statistics may be influenced by:

C	A	R	E
Context	Assembly	Randomness	Error

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### Associations: Two Kinds

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Two-group comparisons:

- Men are taller than women
- Women live longer than men

Two-factor Covariation

- As height increases, weight increases
- The more height, the more weight

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### Comparisons: Two Kinds

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**Ordinal (Order):** Women live longer than men

**Arithmetic:**

- Men shave six days more/week *than* women  
6% is one percentage point more *than* the 5%
- Men shave seven times **as much as** women.
- Men shave 600% **more** often *than* women.  
6% is 20% **more** than 5%.  
Men shave six **times more** often *than* women.  
Women shave 7 **times less** often *than* men

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### Prevalence of Comparisons Google Ngrams

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times as

times more

by a factor of

1900 1920 1940 1960 1980 2000

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### Confounding

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What things block or negate confounders?

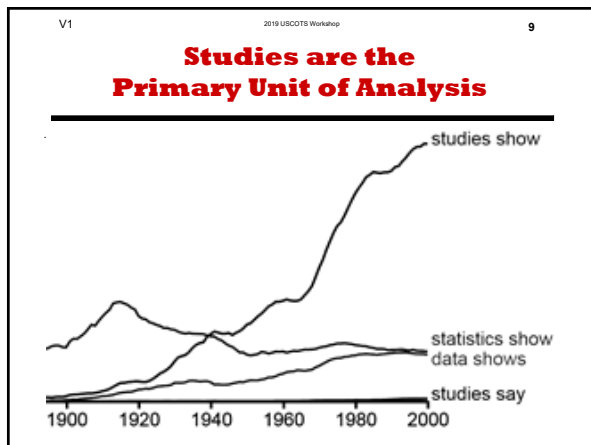
1. Large effect size; large arithmetic comparison
2. Study design
3. Ratios
4. Comparison of ratios.
5. Selection and stratification
6. Standardizing

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### #1 Effect Size

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1. *Does the association involve an effect size?*  
If not, then no reason to think it is large
2. *Is the effect size material?* For example, a factor of 10 increase in 1 chance in 10,000.
3. *Is the effect size statistically significant?*
4. *Is the effect size large enough to ward off confounders?* A: RR>4, B: RR > 3, C: RR>2, D: RR > 1.5. Schield (2018, ICOTS).



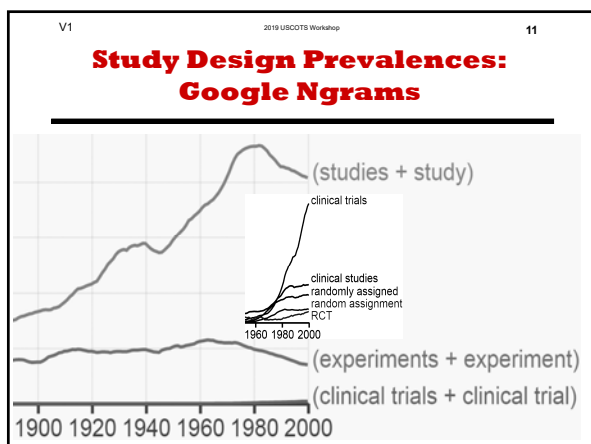
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### Six Basic Study Designs

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<b>Experiment</b>	<b>Observational</b>
Researcher assigns/intervenes	Researcher is passive/observes
Repeatable: Scientific Exp.	Movie: Longitudinal Study
Randomized: Clinical Trial	Snapshot: Cross-sectional S.
Other: Quasi-Experiment	Someone says: Anecdotal

There are distinctions within these, but these six are enough to get started.



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### Random Assignment Nullifies Prior Confounding

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Randomized controlled trials (RCT) are a major contribution of statistics to human knowledge.

By doing the impossible—controlling for all variations (known and unknown) — randomized trials can be considered a “statistical miracle.”

Experiments Gold std.      RCT Silver std.



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### Random Assignment Examples

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- 1747. Lind tests sailors with scurvy.
- 1935 Fisher: The Lady Tasting Tea.
- 1961 Perry Pre-School Project.
- 1974 RAND Health Insurance Experiment
- 1980s First AIDs trial video

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### Placebo Effect

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Placebo Effect: Clinical trials where placebo group did as well as treatment group.

See migraine prophylaxis, positive response: Placebo meds, 22%. placebo acupuncture 38%. placebo surgery, 58%.

Note; Clinical studies, clinically proven, medical trials, medically proven, medical studies and controlled trials don't require randomization.

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### Study Designs

**Quasi (Queasy)-Experiment**  
Nature or humans intervene on pre-existing groups

<i>Nature intervenes</i>	<i>Humans intervene</i>
<b>Epidemics</b> Plagues, outbreaks	<b>Wars/Politics</b> Change laws & policies
<b>Natural disasters</b> Earthquakes, tornadoes	<b>Business/Education</b> Change pricing/teaching

562 BC. Jews in Babylon test meat vs vegetarian diet.  
 1796 Jenner administers cowpox to patient with smallpox  
 1898 Lease of Hong Kong to the British for 99 years.  
 1919-1933: US prohibits production/consumption of alcohol.

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### Quasi-Experiments: More Examples

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1920 Watson's "Little Albert" study of social conditioning.  
 1945 Post-WWII division of Germany into East and West.  
 1945/48 Korea partition: North (USSR) and South (USA).  
 1951 Asch Conformity Exp. 74% agreed w peers' falsehood.  
 1954 Salk polio vaccine\*. Biggest public health experiment.  
 1968 Bystander Effect. Less likely to act if in a group.  
 1987-2014: US states allow concealed carry of weapons (CCW)

\* Salk: Second graders were treatment group; 1st and 3rd graders were control.  
[www.medicine.mcgill.ca/epidemiology/hanley/c622/salk\\_trial.pdf](http://www.medicine.mcgill.ca/epidemiology/hanley/c622/salk_trial.pdf)

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### Longitudinal Studies: Examples

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Retrospective longitudinal studies : subjects recall past events. Cheap, quick.  
 Prospective longitudinal studies: follow subjects through time.  
 Expensive, time-consuming. Minimizes recall bias and sampling bias.  
 Cross-sectional results are more reliable.

Prospective studies:

- 1921 Terman (Stanford) study of the gifted
- 1948 Framingham Study: Follow all inhabitants of Framingham MA
- 1951 British Doctors Survey
- 1976 Harvard Nurses Study
- 1979 Bouchard study of twins raised apart
- 1979 National Longitudinal Study of Youth (NLSY)

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### Cross Sectional Associations: Examples

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- 1948 Framingham Study: Cross-sectional data associated heart attacks with high blood pressure, high cholesterol and smoking.
- 1951 British Doctors Survey. Cross-sectional data strongly associated lung-cancer deaths with smoking.
- 1979 Bouchard study of twins raised apart. Similarities between twins are due more to genes, less to environment.
- 1979 National Longitudinal Study of Youth. Cross-sectional data showed that social outcomes more strongly associated with individual IQ than with parents' socio-economic status. See *The Bell Curve* (1994) by Herrnstein and Murray.

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### Evaluating Study Designs Grades are Starting Points

CONTROL OF CONFOUNDERS	
Physical Control (Grade = Quality)	
Experiment	Observational Study
A+ Scientific	C Longitudinal
A- Random Assign	D Cross-sectional
B Quasi-Exper	F Anecdotal story

Which are cheapest?  
Which are most common in the media?  
Examples of uncontrolled quasi-experiments?

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### From Association to Causation

Association is not causation vs  
Association is often evidence of causation.

Don't cross in the middle of the block vs.  
look both ways before you do.

Sex is not love (Danny Kaplan) vs.  
sex and love can be closely related.

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### Chance: Law of Very Large Numbers

The unlikely is almost certain given enough tries

Math: Suppose there is one chance in N for a given rare event on the next try.  
The chance of having **at least\*** one such event in N tries is over 50%—it is expected.

\* Chance of having just one event < 50%.

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### Chance: Statistical Significance

Consider matched statistics from two groups. If their 95% intervals don't overlap, then their difference is statistically significant. Otherwise, the difference may be statistically insignificant.

Suppose 70% of gals dream in color (40% of guys) and the 95% margin of error is 10 points. The associated 95% confidence intervals are 60 to 80% for gals (30 to 50% for guys). The 30 point difference is statistically significant.

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### Case Study: The Prontosil Experiment

Before 1936, as many as one in three expectant moms died from puerperal fever following birth.

Gerhard Domagk, a German doctor, developed Prontosil to fight against streptococcal infections.

In 1936, Prontosil was administered to 38 newly delivered mothers, all suffering from puerperal fever. Three died and thirty-five survived.

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### Case Study: The Prontosil Experiment

When Prontosil was administered earlier in the course of the infection, no mother died.

In 1936, Prontosil was used to treat Franklin D. Roosevelt, Jr., the President's son.

This was the moment when the world realized that drugs were potent alternatives to surgery.

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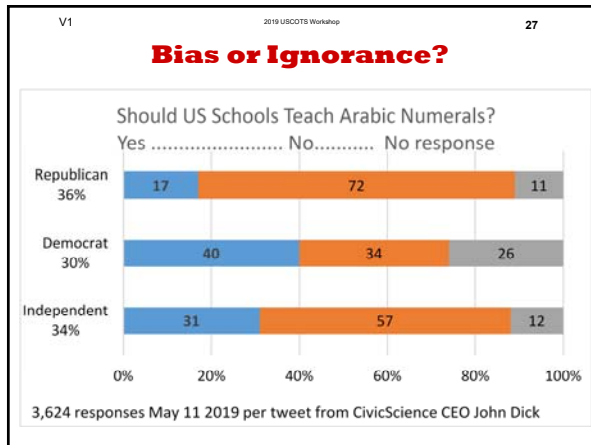
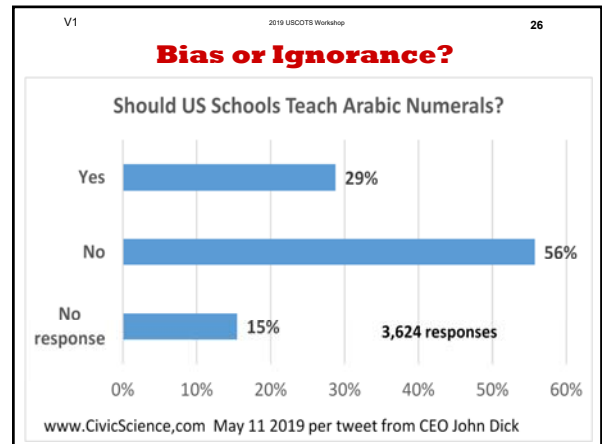
### Case Study

#### Do Magnets Reduce Pain?

Fifty subjects having pain associated with post-polio syndrome were randomly assigned. The treatment group received concentric magnets; the control group received inert placebo magnets. A major decrease in pain was reported by 75% in the treatment group 19% in the control group.

- Natural Health, August, 1998. Page 52.

Effect size. Study design.  
Hypothetical thinking using Take CARE.



Ch3: V1 2019 USCOTS Workshop 1

## Statistics Literacy For Decision Makers

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### Chapter 3: Measurements

by  
**Milo Schield**

*Half-Day Workshop  
USCOTS May 16, 2019*

[www.StatLit.org/pdf/2019-Schild-USCOTS-Slides3.pdf](http://www.StatLit.org/pdf/2019-Schild-USCOTS-Slides3.pdf)

Ch3: V1 2019 USCOTS Workshop 2

## Measurements: Chapter 3 Outline

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- Distributions
- Measures of center
- Two-group comparisons of Means & Medians
- Two-variable co-variation
- Spread
- Slope and simple regression

Ch3: V1 2019 USCOTS Workshop 3

## Stat Literacy: Study Statistics as Evidence in Arguments

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### The Point or the Target

The more disputable the point,  
the stronger the evidence must be.

**Statistic As Evidence**

"All Statistics are Socially Constructed"  
So, "Take CARE"!!

Statistics may be influenced by:

<b>C</b>	<b>A</b>	<b>R</b>	<b>E</b>
Context	Assembly	Randomness	Error

Ch3: V1 2019 USCOTS Workshop 4

## Measures of Center

In an asymmetric distribution, mean, median and mode typically align alphabetically with mean most sensitive to extremes. Why?

Hypothetical Distribution  
of Houses by Price

Figure 3D7

Ch3: V1 2019 USCOTS Workshop 5

## Mean, median, mode: Alphabetically. Why?

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Suppose that house prices in your town have a positive near-symmetric distribution

Suppose Bill and Melinda Gates move to your town. They built two Mac-Mansions.

How does that change the mode, median and mean of the original distribution?

Mode? Median? Mean?

Most relevant in the short run? In the long-run?

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## Issues:

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1. Mean is more sensitive to outliers.  
Yet statisticians prefer the mean. Why?
2. Omit measure: *City1 income more than City2.*
3. Omit characteristic: *Midtown is a median city.*
4. Assume the mean exists. *1.8 kids per family.*
5. Ambiguity in specifying the group

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### Controlling Confounding: Control Of

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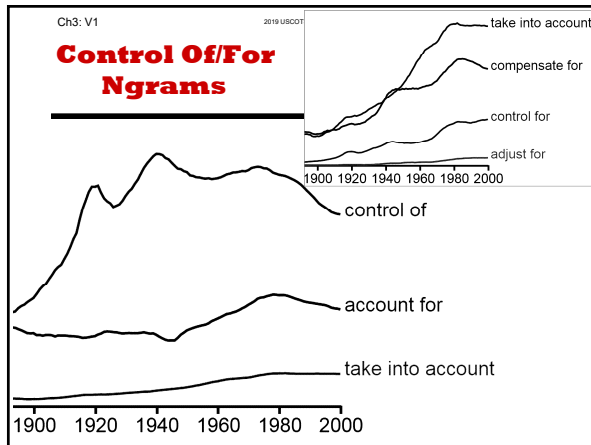
CONTROL OF CONFOUNDERS	
Physical Control (Grade = Quality)	
Experiment	Observational Study
A+ Scientific	C Longitudinal
A- Random Assign	D Cross-sectional
B Quasi-Exper	F Anecdotal story

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### Controlling Confounding: Control For

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CONTROLLING FOR CONFOUNDERS	
Take into account (mental)	
<i>Can do by hand</i>	<i>Calculator/Computer</i>
1 Select/Stratify	4 Linear Regression
2 Form Ratios	5 Logistic Regression
3 Standardize	6 Multivariate Regress



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### Crude Associations

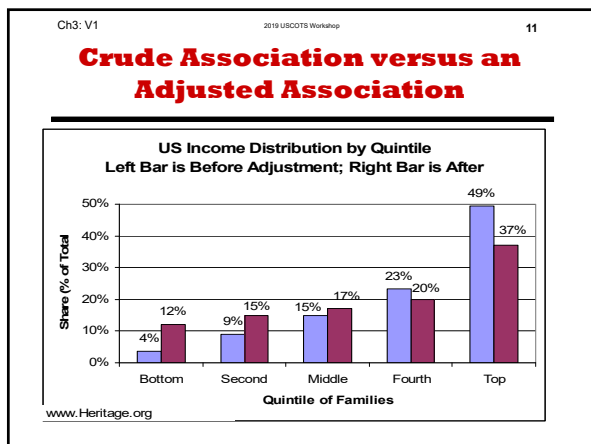
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A **crude association** is an association in which nothing else has been taken into account.

Less likely to get pregnant:

- Short young adults than tall.
- Adults that shave daily than those that don't
- Adults with long hair than those with short.

What one takes into account is an assumption. Teachers should say, "Check your assumptions."



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### Prison Expense: Crude vs Adjusted Associations

State	Total	# Inmates	Per Inmate	Total	Per Inmate
CA	\$2.9B	136K	\$21,385	50% more ↑	25% less ↓
NY	\$1.9B	69K	\$28,426		

State	Total	# Inmates	Per Inmate	Total	Per Inmate
MD	\$481M	21,623	\$22,245	3 times.. ↑	Same
KS	\$159M	7,148	\$22,245		

State	Total	# Inmates	Per Inmate	Total	Per Inmate
MN	\$184M	4,865	\$37,825	260% more ↑	12% more ↑
ME	\$48M	1,424	\$33,711		

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### Crude Ratio Associations It's the Mix!!!

Ratio associations can be still be confounded.  
Averages are ratios.

NAEP Math 8	Internet Access at Home		
	All	Yes	No
State			
Virginia (VA)	↑ 275	↓ 282	↓ 258
Texas (TX)	↓ 273	↓ 285	↓ 260

NAEP Math 8	Internet Access at home		
	All	Yes	No
State			
Virginia (VA)	↑ 275 (100%)	↓ 282 (69%)	↓ 258 (31%)
Texas (TX)	↓ 273 (100%)	↓ 285 (53%)	↓ 260 (47%)

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### Simpson's Paradox: Time It's the Mix!!

SAT Verbal flat, but every group improved.

SAT-Verbal	--- Scores ---			--- Distribution ---		
	1981	2002*	Chg	1981	2002*	Points
Group						
White	519	527	+8	85%	65%	-20
Black	412	431	+19	9%	11%	+2
Asian	474	501	+27	3%	10%	+7
Mexican	438	446	+8	2%	4%	+2
Puerto Rican	437	455	+18	1%	3%	+2
Amer. Indian	471	479	+8	0%	1%	+1
ALL	504	504	0			

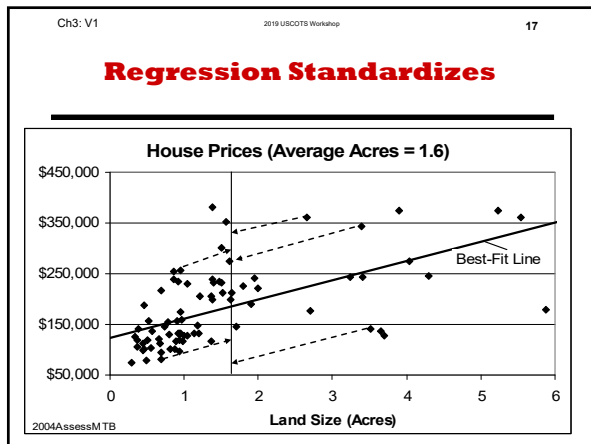
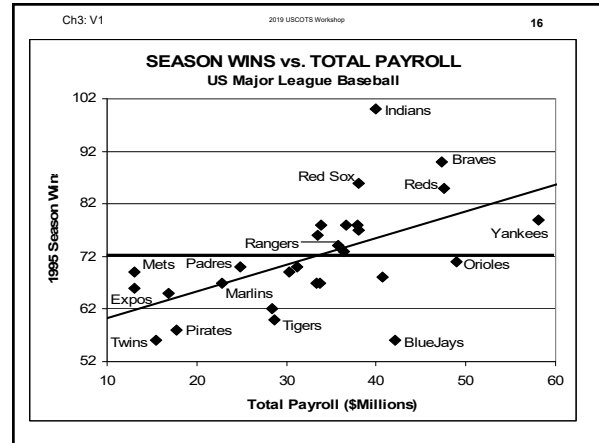
Ch3: V1 2019 USCOTS Workshop 15

### Will an Association Reverse? The Cornfield Conditions

After learning about Simpson's Paradox, one student said, "I'll never trust another statistic."  
This is cynicism: not a good outcome.

Not all confounders can reverse an association.  
Jerome Cornfield proved that a confounder association must be "bigger" than the observed.

Cornfield's conditions are one of the three biggest contributions of statistics to human knowledge.



Ch3: V1 2019 USCOTS Workshop 18

### Regression Standardizes An Example:

The data shows that house prices increase by \$39,000 per bedroom. This is a crude association.

\$16,000 per bedroom if land is *controlled for*,

\$9,000 per bedroom after *accounting for* land and house size,

\$5,000 after *adjusting for* land, house size, and number of bathrooms.

Ch3: V1 2019 USCOTS Workshop 19

**TV for toddlers interferes with brain growth, says study:**

---

Children under two should not be allowed to watch television because it increases their chances of suffering attention problems later in life, says an American study.

A study of 1,345 children found that each hour spent in front of the set every day increased the risks of attention deficit disorders by 10%.

U.S. journal, *Pediatrics*

Ch3: V1 2019 USCOTS Workshop 20

**Time to Double given Growth Rate**

---

If a child’s risk of Attention Deficit Disorder increases by 10% for every extra hour of watching TV, how many hours do they have to watch to double their risk?

**Rule of 72\*:**  $\text{Time to double} = 72 / \text{Rate}$

72 divided by 10% per hour = 7.2 hours

\* Assuming compounding

Ch3: V1 2019 USCOTS Workshop 21

**How to Relate this to Math Colleagues**

---

Don’t talk about confounding or effect size.  
Talk about assumptions.

- What one controls for is an assumption.
- What one fails to control for is an assumption.

*AAU&C Quantitative Literacy VALUE rubric:*

**Assumptions:** Ability to make and evaluate important assumptions in estimation, modeling, and data analysis.

Ch3: V1 2019 USCOTS Workshop 22

**AAC&U Quantitative Literacy VALUE Rubric**

---

Interpretation, Representation, Calculation, Application, **Assumptions**, and Communication

**Assumptions:** Ability to **make and evaluate** important assumptions in estimation, modeling, and data analysis.

[www.statlit.org/pdf/2009QuantitativeLiteracyRubricACU.pdf](http://www.statlit.org/pdf/2009QuantitativeLiteracyRubricACU.pdf)  
[www.aacu.org/peerreview/2014/summer/RealityCheck](http://www.aacu.org/peerreview/2014/summer/RealityCheck)

Ch4: V1 2019 USCOTS Workshop 1

## Teaching Statistical Literacy

---

### Chapter 4: Using and Describing Ratios

by  
Milo Schield

*Half-Day Workshop  
USCOTS May 16, 2019*

[www.StatLit.org/pdf/2019-Schild-USCOTS-Slides4.pdf](http://www.StatLit.org/pdf/2019-Schild-USCOTS-Slides4.pdf)

Ch4: V1 2019 USCOTS Workshop 2

### Workshop Schedule

---

Start	Topic
1:00	1 Statistical Literacy Intro
1:30	2 StatLit Details
2:15	3 Measurements
2:45	4 Named Ratio Grammar
3:30	5 Comparing Count Ratios
4:00	6 Untangling Statistics

Ch4: V1 2019 USCOTS Workshop 3

### Ratios: Chapter 4 Outline

---

Per grammars:

- Percent grammar
- Percentage grammar
- Reading half tables and tables w/o margins
- Rate grammar

Ordinary Preposition grammars:

- Chance grammar
- Ratio grammar

Ch4: V1 2019 USCOTS Workshop 4

### Stat Literacy: Study Statistics as Evidence in Arguments

---

The Point or the Target

The more disputable the point,  
the stronger the evidence must be.

**Statistic As Evidence**

“All Statistics are Socially Constructed”  
So, “Take CARE”!!  
Statistics may be influenced by:

C	A	R	E
Context	Assembly	Randomness	Error

Ch4: V1 2019 USCOTS Workshop 5

### Evaluate these Using Just Assembly/Assumptions

---

1. One in five children face hunger [2019 billboard in St. Paul]
2. Two absences per month = Likely to fail a grade
3. Ninth-grade attendance better predicts graduation than 8th grade test score
4. Attendance alone explains 31% of the variance in performance
5. Budget cuts lead to deaths in Federal prisons
6. 22 million victims of human trafficking trapped worldwide.
7. The National Rifle Association is a terrorist organization.
8. Ban assault weapons
9. 2016 Memphis. 228 homicides. Down 500 police officers.

Ch4: V1 2019 USCOTS Workshop 6

### Forming Ratios

---

CONTROLLING FOR CONFOUNDERS	
Take into account (mental)	
Can do by hand	Calculator/Computer
1 Select/Stratify	4 Linear Regression
2 Form Ratios	5 Logistic Regression
3 Standardize	6 Multivariate Regress



Ch4: V1 2019 USCOTS Workshop 7

### From Comparisons to Ratios: Using Prepositions

---

**ARITHMETIC COMPARISONS**  
Using Conjunctions or 'Change -By'

Difference: <i>more (greater) than</i> increase by #	Ratio: <i>times [as much as]</i> increase by a factor of	Relative Difference: <i>% (times) more than</i> increase by X%
--	--	--

↓

**RATIOS (Using Prepositions)**

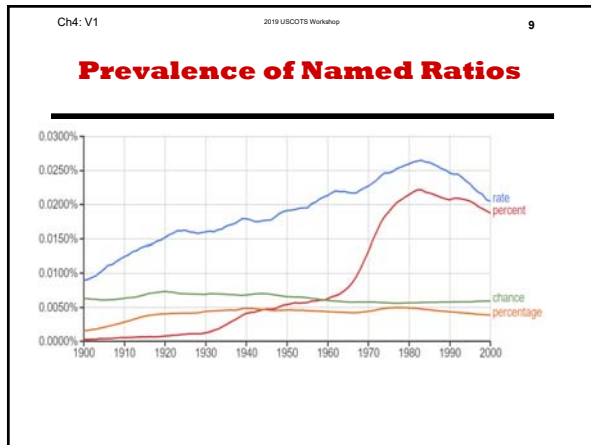
<b>Common Prepositions:</b> <i>Of, in, for, To</i> [4 to 3; 4-3; 4:3] 4 out of [every] 5; cut in half	<b>Per Grammar:</b> <i>miles per gallon; mph</i> <i>deaths per 1,000 men</i>
---	--

Ch4: V1 2019 USCOTS Workshop 8

### RATIOS (Using Prepositions)

<b>Common Prepositions:</b> <i>Of, in, for, To</i> [4 to 3; 4-3; 4:3] 4 out of [every] 5; cut in half	<b>Per Grammar:</b> <i>miles per gallon; mph</i> <i>deaths per 1,000 men</i>
<b>Named-Ratios</b>	<b>Named-Ratios</b>
<b>Ratio Grammar:</b> <i>ratio of women to men</i> <i>student-teacher ratio</i>	<b>Percent Grammar:</b> <i>85% of military personnel are men</i>
<b>Chance Grammar:</b> odds/risk/probability <i>chance of [our] winning;</i> <i>chance that we will win</i> <i>chance to win; chance for a win</i>	<b>Percentage Grammar:</b> fraction/share <i>percentage of men who bet</i>
	<b>Rate Grammar:</b> prevalence, incidence <i>rate of n per d</i> <i>Men died at a rate of n per d</i>

Light-edge boxes need clause for part and whole (cannot compare ratios).  
Dark-edge boxes have part and whole in phrases (can compare ratios)

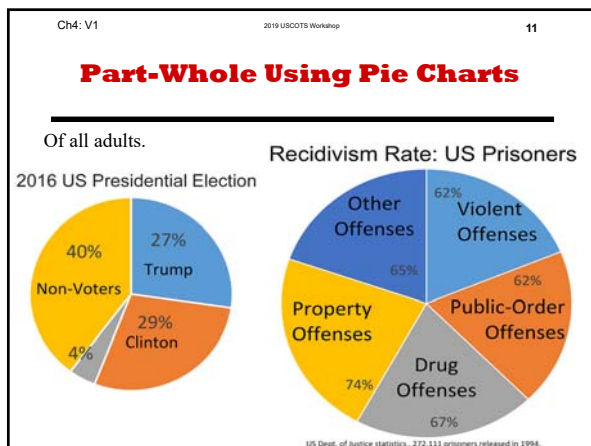


Ch4: V1 2019 USCOTS Workshop 10

### Two Kinds of Percents

Which kind of percents are these: part-whole or percent compare?

1. The youngest child's share of the candy.
2. Interest charged per year by the Mafia (criminals).
3. People live 100% longer on average in US than in Swaziland.
4. The advertisement said "40% off".



Ch4: V1 2019 USCOTS Workshop 12

### Four Different Grammars; Confusion of the Inverse

1. 40% of US adults did not vote for president in 2016.
2. The *percentage* of US adults who didn't vote was 40%.
3. The non-voter *rate* among US adults in 2016 was 40%.
4. There was a 40% *chance* that an adult was a non-voter.

-----

Confusion of the inverse exchanges part with whole.

1. "The percentage of men who are in the military" .NE. "the percentage of the military who are men".
2. The percentage of smokers among women .NE. "the percentage of smokers who are women".

Ch4: V1 2019 USCOTS Workshop 13

**Use Percent Grammar**  
**<X% of Whole are Part>**

---

Describe the 30%

Describe the 36%

US Students Grades 9-12 Using Tobacco or Marijuana in Last 30 days

Toy table

2015 CDC MMWR October 16

Ch4: V1 2019 USCOTS Workshop 14

**Tables: Use Percent Grammar**  
**<X% of Whole are Part>**

---

1. What percentage of men are art majors?
2. What percentage of art majors are men?
3. What percentage of students are male art majors?

Students	Men	Women	ALL
Humanities	28	72	100
Arts	4	36	40
Science	48	12	60
ALL	80	120	200

Ch4: V1 2019 USCOTS Workshop 15

**100% Tables: Percent Grammar**  
**<X% of Whole are Part>**

---

Describe the 10%

Students	Men	Women	ALL
Humanities	28%	72%	100%
Arts	10%	90%	100%
Science	80%	20%	100%
ALL	40%	60%	100%

Describe the 5%

Students	Men	Women	All
Humanities	35%	60%	50%
Arts	5%	30%	20%
Science	60%	10%	30%
ALL	100%	100%	100%

Ch4: V1 2019 USCOTS Workshop 16

**Use Percent Grammar**  
**<X% of Whole are Part>**

---

Table 33: World Population by Religion and Continent (1996)

(Millions)	Total	Asia	Europe	North Am	Other
Total	5,804	3,513	728	296	1,563
Christian	1,955	303	556	256	1,096
Muslim	1,126	778	32	5	316
Nonreligious	887	753	90	21	44
Hindus	793	787	2	1	4
Buddhists	325	322	2	1	1
Atheists	222	175	41	2	6
All Other	496	395	5	10	96

Table 1333. 1997 U.S. Statistical Abstract.

Ch4: V1 2019 USCOTS Workshop 17

**Percentage Grammar**  
**Four form**

---

1. The percentage of seniors who smoke is 15%.
2. Among seniors, the percentage who smoke is 15%.
3. Among Seniors, the percentage of smokers is 20%.
4. Among men, the percentage of seniors who smoke is 20%

Numbers 3 and 4 are problems.  
“OP” introduces whole in percent grammar.

Ch4: V1 2019 USCOTS Workshop 18

**Percentage Grammar**  
**Sports Grammar**

---

Sports grammar is readily understood with a natural whole:

- *percentage of defective cans; percentage of tire failures*

Without a natural whole, sports grammar is ambiguous.

- *percentage of female smokers;*
- *percentage of working males*
- *percentage of infant deaths;*
- *percentage of single mothers*

Ch4: V1 2019 USCOTS Workshop 19

### Half Tables when Parts of 100% Table are Binary

Describe the circled 60%. Use percent grammar.

Class Last Year	Percentage who are Retained	Percentage who are Not Retained	All
Freshman	60%	40%	100%
Sophomore	75%	25%	100%
Junior	90%	10%	100%
Senior	10%	90%	100%
ALL	70%	30%	100%

If 60% returned, what percentage did not return?  
So, the right two columns are redundant.  
Eliminating them will save space!

Ch4: V1 2019 USCOTS Workshop 20

### Confounding

#### Mortality by Hospital

Hospital	Total	Died	Death Rate
City	1,000	55	5.5%
Rural	1,000	35	3.5%
Both	2,000	90	4.5%

**Predictor**  
Hospital:  
City vs. Rural

**Outcome**  
Died

**Confounder**  
Patient Condition: Poor vs. Good

Ch 13: V1 2019 USCOTS Workshop 1

## Statistics Literacy For Decision Makers

---

### 13: Confounding & Cornfield

by  
**Milo Schield**

*Half-Day Workshop  
USCOTS May 16, 2019*

[www.StatLit.org/pdf/2019-Schild-USCOTS-Slides13.pdf](http://www.StatLit.org/pdf/2019-Schild-USCOTS-Slides13.pdf)

Ch 13: V1 2019 USCOTS Workshop 2

### Workshop Schedule

---

1:00 Ch 1 Statistical Literacy – Introduction  
 1:30 Ch 2 Statistical Literacy – Details

2:15 Ch 3 Measurements  
 2:45 Ch 4 Ratios

3:30 Ch 13 Standardizing  
 4:00 Feedback

Ch 13: V1 2019 USCOTS Workshop 3

### Confounding: Chapter 13 Outline

---

Cornfield-Fisher debate

Cornfield conditions

Standardizing percentages, rates and averages

Standardizing percentage & number attributable

Statistical significance and confounding

Ch 13: V1 2019 USCOTS Workshop 4

### Stat Literacy: Study Statistics as Evidence in Arguments

---

The Point or the Target

The more disputable the point,  
the stronger the evidence must be.

**Statistic As Evidence**

“All Statistics are Socially Constructed”  
So, “Take CARE”!!  
Statistics may be influenced by:

C	A	R	E
Context	Assembly	Randomness	Error

Ch 13: V1 2019 USCOTS Workshop 5

### Cornfield-Fisher Debate

---

Doctors had noticed the strong association between smoking and lung cancer. Statisticians argued that this evidence strongly supported the claim that smoking was a cause of lung cancer.

Fisher, a smoker, noted that *association is not causation in observational studies*.

Fisher produced data. Identical twins were more likely to share a smoking preference than were fraternal twins. This statistic supported genetics as an alternate explanation for the association.

Ch 13: V1 2019 USCOTS Workshop 6

### Cornfield-Fisher Debate

---

Now when the world’s leading statistician says something that every statistician agrees is true, most reasonably-minded statisticians would back off.

And when the world’s leading statistician produces data indicating a plausible confounder, it seems incredible that anyone would reply.

Jerome Cornfield did!

Ch 13: V1 2019 USCOTS Workshop 7

### Cornfield Conditions

---

Cornfield **proved** that the relative risk of lung cancer had to be greater for a confounder (e.g., genetics) than for the predictor (e.g., smoking) in order to nullify or reverse the observed association.

Cornfield pointed out that smokers were about 10 times as likely to get lung cancer as non-smokers.

Fisher's data involved a factor of two.

Fisher never replied.

Ch 13: V1 2019 USCOTS Workshop 8

### Contributions to Human Knowledge

---

“Cornfield's minimum effect size is as important to observational studies as is the use of randomized assignment to experimental studies.

No longer could one refute an ostensive causal association by simply asserting that some new factor (such as a genetic factor) might be the true cause.

Now one had to argue that the relative prevalence of this potentially confounding factor was greater than the relative risk for the ostensive cause.”

Schield (1999). [This was written 20 years ago!]

Ch 13: V1 2019 USCOTS Workshop 9

### Confounder Distribution

---

Since confounders may be unknown, there is no way to derive or infer their distribution.

Schield (2018) argued that we needed a standard for confounder: a standard confounder distribution.

He proposed an exponential (one factor determined) with a mean relative risk of 2.

This applied if predictor and confounder are binary.

Ch 13: V1 2019 USCOTS Workshop 10

### Confounder Distribution Unknown & Unknowable

---

Standard Confounder Distribution: Mean = 2

Binary Predictor      Observational Study

Ch 13: V1 2019 USCOTS Workshop 11

### Controlling for a Confounder: Graphical Technique

---

Wainer introduced a simple graphical technique that made the control of a binary confounder a relatively simple matter.

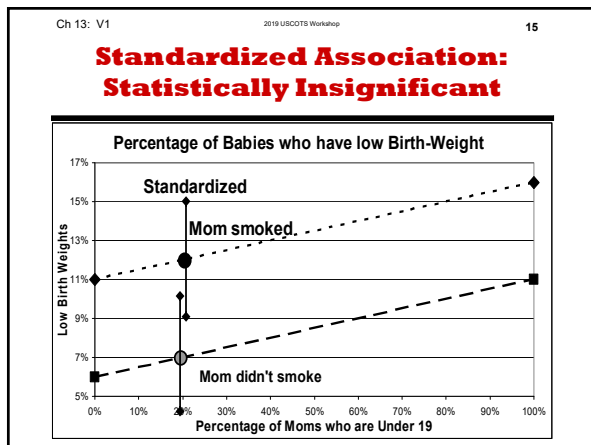
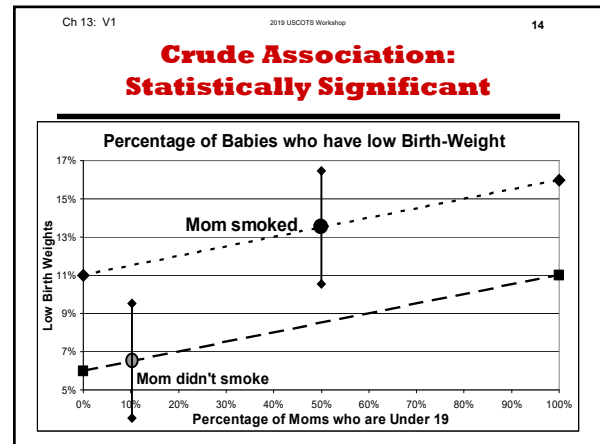
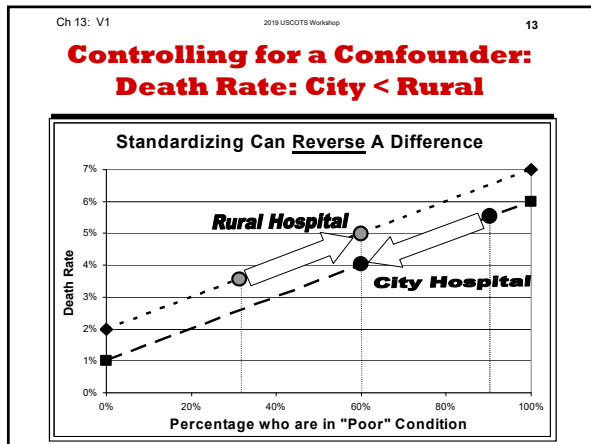
Schield (2006). Presenting Confounding Graphically Using Standardization, *STATS* magazine.  
[www.statlit.org/pdf/2006SchieldSTATS.pdf](http://www.statlit.org/pdf/2006SchieldSTATS.pdf)

Ch 13: V1 2019 USCOTS Workshop 12

### Crude Association: Death Rate: City > Rural

---

A Confounder can Influence a Difference



Ch 13: V1 2019 USCOTS Workshop 16

### Confounder Effect on Statistical Significance

Controlling for a confounder can transform a statistically-significant association into an association that is statistically insignificant.

Although statistical educators are clearly aware of this, there is nothing in any introductory textbook that alerts students to this possibility.

The failure to show a significance reversal is *statistical negligence*.

# **Teaching Statistical Literacy**

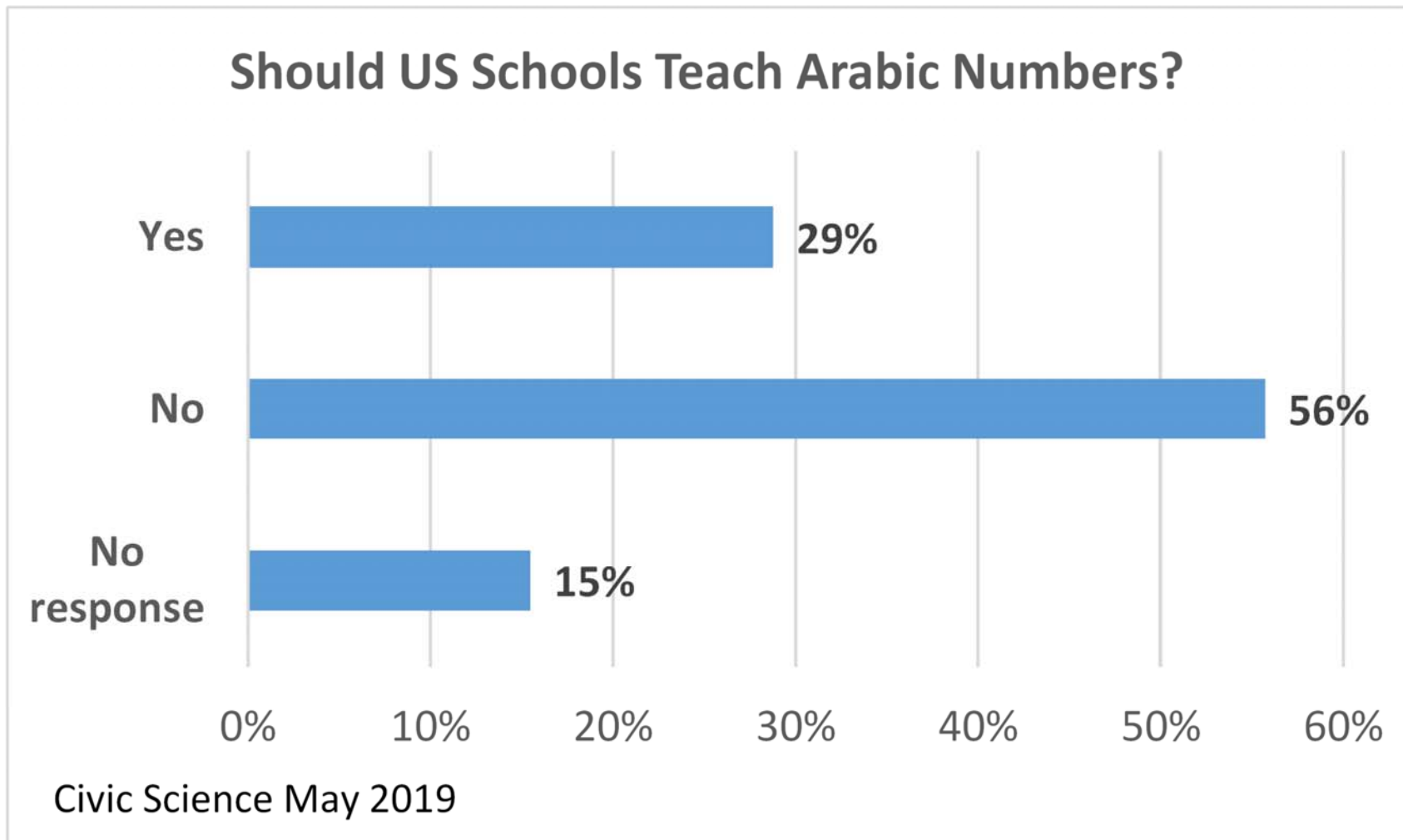
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**Chapter 1  
by  
Milo Schield**

*Half-Day Workshop  
USCOTS May 16, 2019*

*[www.StatLit.org/pdf/2019-Schild-USCOTS-slides1.pdf](http://www.StatLit.org/pdf/2019-Schild-USCOTS-slides1.pdf)*

# First Sharia math, then Sharia law!!!





# Working Moms; Better Kids



<http://money.com/money/5272659/working-moms-better-kids/>

# Outline

---

Introduction:

A1. Who takes intro statistics

A2. SAT level of our students by college

A3. Math level of our students by major

Exp vs. Obs: What kinds are relevant?

A3. Kinds of influence on statistics

How common are these influences?

A4. Grammar: Association vs. causation

## **Goals of this Workshop**

---

1. Present my view of statistical literacy
2. Expose you to lots of new ideas
3. Present a coherent structure for teaching
4. Show the importance of English grammar
5. Show simple ways of handling significance
6. Show simple ways of handling confounding
7. Show how confounding changes significance
8. Role-model analyzing studies

# **Fraction of 4-year Undergrads that take Intro Stats?**

---

57%

Schild (2016, IASE)

# **Fraction of Course Gain that Stat Students Loose in 4 Months**

---

50%

Tintle et al, 2013

# Student Attitudes Toward Stats

---

## Of those taking Stat I:

- less than 1% take *Stat II* (10-yrs @ U. St. Thomas)
- less than 0.2% major in statistics (nationwide).
- most see less value in statistics after the course than they did before. Schield and Schield (2008).
- too many say “Worst course I ever took” [anecdotal]

[www.amstat.org/misc/StatsBachelors2003-2013.pdf](http://www.amstat.org/misc/StatsBachelors2003-2013.pdf) 1,135 stat majors in 2013 at 32 colleges  
[www.StatLit.org/pdf/2015-Schild-UST-Enroll-in-Statistics.pdf](http://www.StatLit.org/pdf/2015-Schild-UST-Enroll-in-Statistics.pdf)

# **What fraction of 4-Yr Intro Stat students are taught outside Math?**

---

**50%**

Estimates by Schield (2015, Statchat)

# Who takes Intro Statistics at Four-Year Colleges?

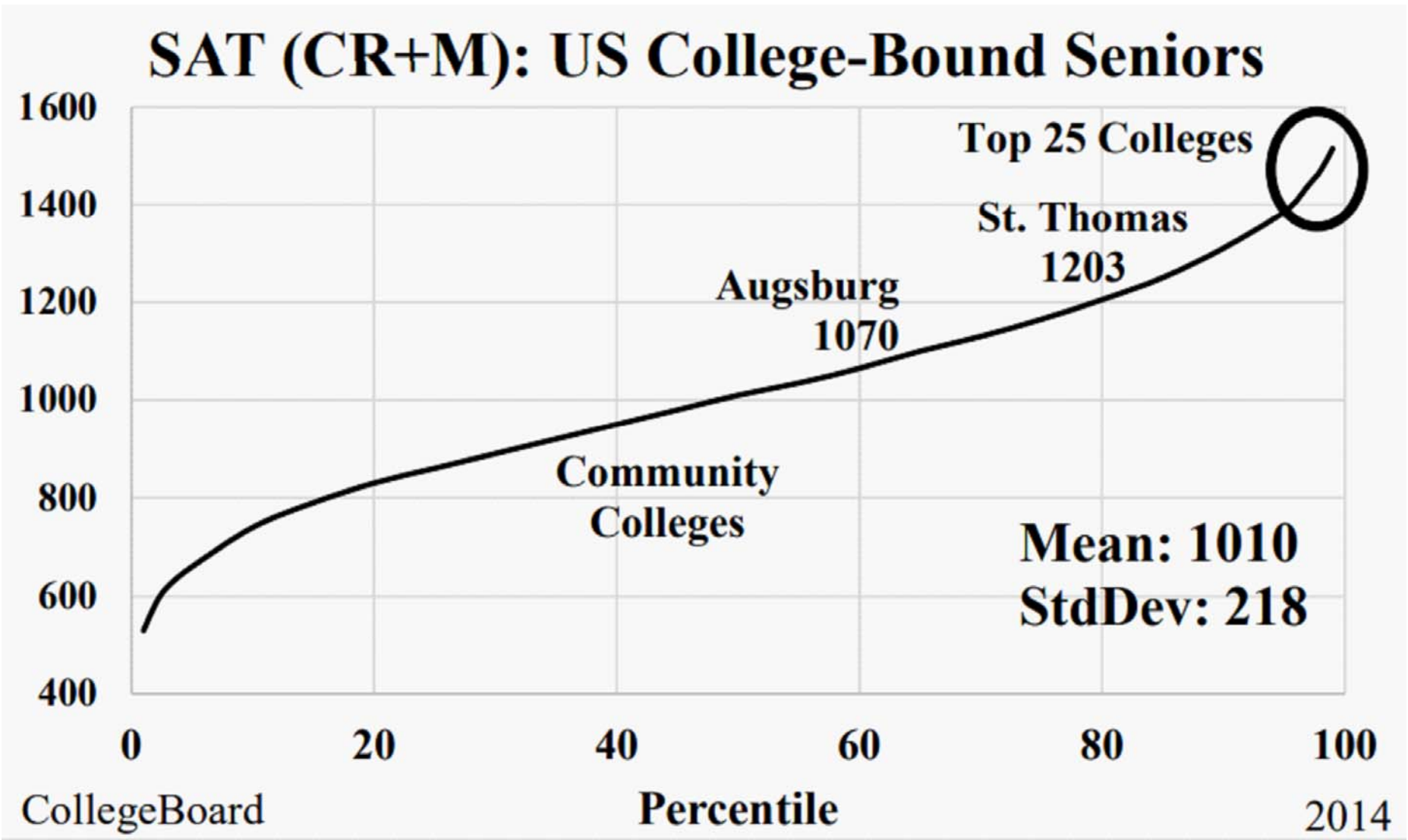
**Table 1: Distribution of Majors in Stat 101**

%	Major
38%	Business or Economics
19%	Social Science or History
13%	Health
10%	Psychology
9%	Engineering
9%	Biological Science
2%	Math or Statistics
100%	All students in these majors

Schild (2016, IASE). Inferred from data in 2012 US Statistical Abstract.



# Where are your students?



Schild (2016. IASE)

## SAT Math Percentile by Major

SAT MATH	PERCENTILE	MAJOR
613	80%	Math/Stats
585	72%	Physical Sciences
579	70%	Engineering
554	62%	Comp. Science
551	61%	Biological
550	61%	Social Sciences
522	51%	Business
522	51%	English Lang/Lit
506	46%	History
498	43%	Communication
489	40%	Psychology
482	38%	Education

Business Insider (2014), College Board (2015)

SAT Math  
Scores:  
Average by  
Student Major

Percentiles  
of all those  
taking the  
Math SAT

Schild (2016, IASE)

## **GAISE 2016 Update**

---

*The real world is complex and can't be described well by one or two variables.*

*If students do not have exposure to simple tools for disentangling complex relationships, they may dismiss statistics as an old-school discipline only suitable for small sample inference of randomized studies.*

## **GAISE 2016 Update**

---

*Multivariable thinking is critical to make sense of the observational data around us*

- *learn to identify observational studies*
- *learn to consider potential confounding factors*
- *use ... stratification ... to show confounding*

*This report recommends that students be introduced to multivariable thinking, preferably early in the introductory course and not as an afterthought at the end of the course.*

# Most Important Topics: Student Choices

	The most important topics in Statistical Literacy for Managers
Rank	
1	Take CARE: Confounding, Assembly, Randomness and Error/bias
2	Confounding
2	Hypothetical thinking: plausible confounders, plausible definitions
4	Statistics are more than numbers. They include the context
5	Association-causation (Luck-skill) including the grammar
5	Bias: Placebo, Single blind; double blind
5	Named Ratios and Ratio grammar; Percent, Percentages, Rates
5	Read tables and graphs

Schild (2016, ASA)

## **A-B-C Words:**

### **A = Association**

---

**Statistical association is not the same as Basketball Assoc.**

**Association words** assert association explicitly or describe associations involving fixed conditions or unrepeatable events.

Association: Height is *associated* with age in children

Obesity is *correlated* with (related to) diabetes.

Prediction: Graduating from high school *predicts* success in life.

---

\*Comparisons: People with degrees earn *more than* those without

Whites have a *higher* risk of suicide *than* blacks.

\*Co-variation: *As children get older*, their weight *increases*.

\* Manipulation is impossible, or treatment or outcome cannot be repeated.

Schild (2018, SL4DM)

## **A-B-C Words: C = Causation**

---

**Causation words** assert causation, sufficiency or contra-factual

Causation: A bomb *caused* the fire. Insomnia is a side *effect*.

Lightning *resulted in* a fire. Spark results in a fire.

Sufficient: The more X you do, the more Y *you will get*.

*Prevent, stop, end, start, kill, produce, cure, avoid, ban, quit, block, ward off, stave off, cancel, hinder, or eliminate.*<sup>6</sup>

Contra-factual: Those who do X *will get more Y than if they had not done X.*

## **A-B-C Words:**

### **B = Between**

---

**Between words** describe association but imply causation

Verbs: Red wine *cuts* cancer risk. TV *ups* kids' risk of flunking.

Gene X *increases* health risk. Smoking *raises* asthma risk.

Connectors: Nuts *linked to* cancer. Trauma *tied to* heart disease.

Contributor Diet *contributes to* diabetes. Age is *factor* in infertility

Nouns: Spinach is *asthma protector*. Bad water is a *killer*.

Logicals: Anxiety increases *due to (because of)* high stake testing

-----

\*Compare: People who take antidepressants have fewer migraines

Asthma attacks more likely for smokers *than* non-smokers.

\*Covariation: *As* teacher pay *increases*, student scores increase.

The more hours worked, the *more likely* a promotion

\*Manipulation is possible, and treatment and outcome are repeatable.



## **A-B-C Words: Distribution in Headlines**

---

Of the 2,000 news headlines analyzed<sup>6</sup>,  
**71% involved A, B or C.**

Of those headlines involving A, B or C,

- **86% were "between" claims,**
- 11% sufficiency, 3% causation, 3% association.

6. Schield and Raymond (2009).

## **Association is not causation**

---

This statement is ambiguous. It can mean:

- 1 Association is not sufficient to prove causation
- 2 Association provides no evidence for causation.

Teachers may intend #1; students often hear #2.

A better statement would be:

*Association is evidence of causation somewhere.*

## **Association is not causation**

---

*No idea has stifled the growth of statistical literacy as much as the endless repetition of the words "correlation is not causation".*

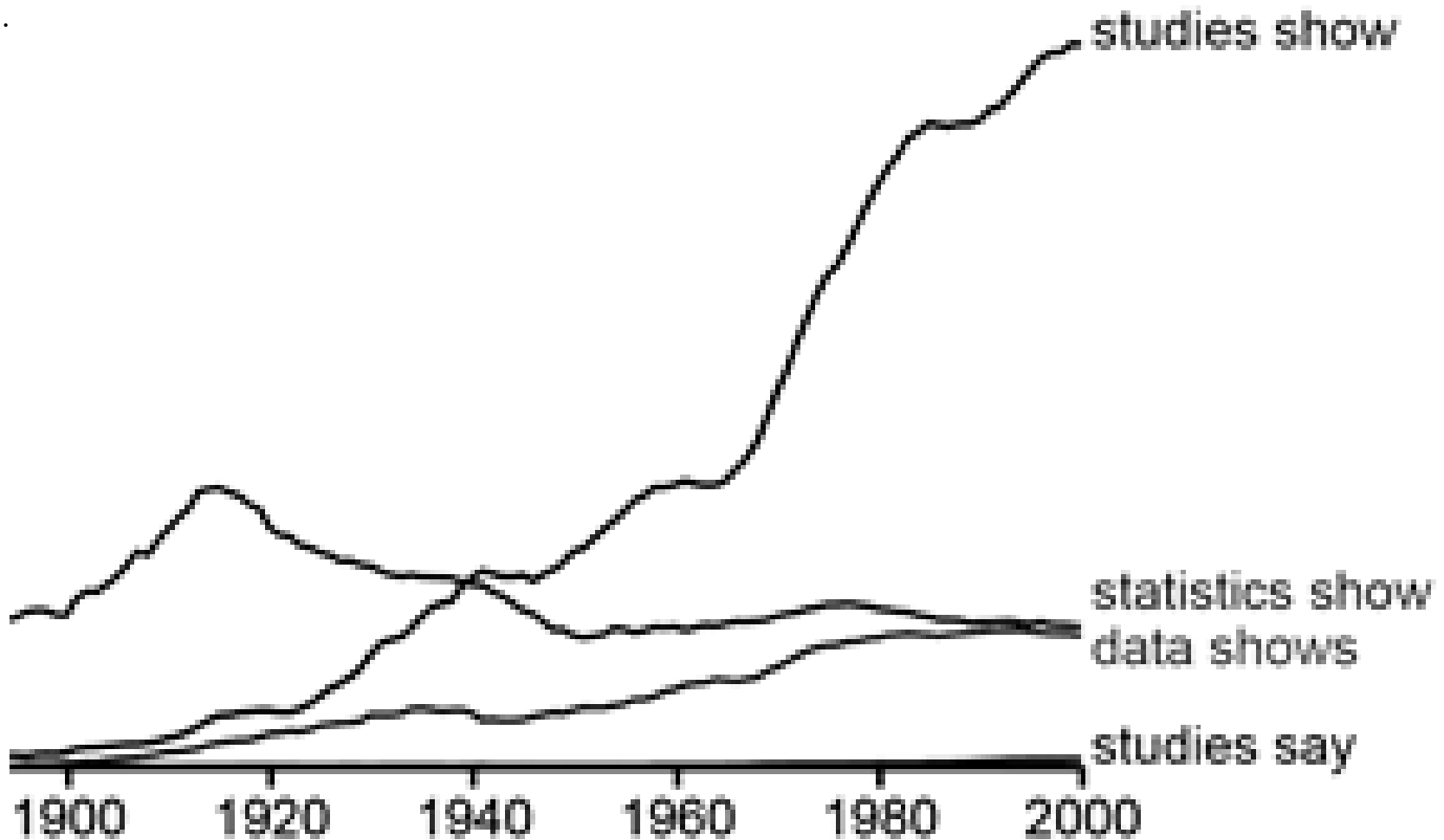
*This phrase seems to be primarily used to suppress intellectual inquiry -- by encouraging the unspoken assumption that correlational knowledge is somehow an inferior form of knowledge.*

John Myles White (2010):

[www.johnmyleswhite.com/notebook/2010/10/01/three-quarter-truths-correlation-is-not-causation/](http://www.johnmyleswhite.com/notebook/2010/10/01/three-quarter-truths-correlation-is-not-causation/)

# Studies are the Primary Unit of Analysis

---



## Harvard Case Studies: Title or Abstract

#	INFERENCEAL	CONTROL/CONFOUND
22	"clinical trial" <b>18</b>	2,263 control
7	"statistical significance"	234 "control of" <b>200</b>
4	"statistically significant"	113 "take (ing) into account"
3	"standard error"	30 "compensate (ing) for"
1	"sampling error"	19 "control (ed, ing) for"
1	"margin of error"	18 confound (er, ing)
1	"prediction interval"	17 "adjust(ed, ing) for"
1	p-value	3 "sampling bias"
0	"sampling distribution"	0 "alternate explanation"
0	"confidence interval"	0 "common cause"
0	"null hypothesis"	0 "effect modifier"
0	"reject the null"	0 "Simpson's paradox"
0	"random assignment"	0 "lurking variable"

# Statistical Literacy : An Overview

**Statistics are numbers in a context**  
**Association is not causation**

<b>RANDOMNESS and CAUSATION</b>	<b>CONFOUNDING and CAUSATION</b>
Chance, independence and sampling distributions	Comparisons, ratios, models and study designs
Margin of error, hyp tests & statistical significance	Epidemiological causation (Bradford-Hill)
<i>Random assignment and causation (Fisher: RCT)</i>	<i>Confounder conditions for nullification (Cornfield)</i>
v0.7 Conditional probability, medical tests and Bayesian reasoning Coincidence, Simpson's Paradox and regression to the mean	

# Stat Literacy studies Stats as Evidence in Arguments

The Point or the Target

The more disputable the point,  
the stronger the evidence must be.

**Statistic As Evidence**

**“All Statistics are Socially Constructed”**

**So, “Take CARE”!!**

**Statistics may be influenced by:**

<b>C</b>	<b>A</b>	<b>R</b>	<b>E</b>
<b>Context</b>	<b>Assembly</b>	<b>Randomness</b>	<b>Error</b>

## Statistical Literacy : Assembly

Living with AIDs			
All (1,000)	White (non- Hispanic)	Black (non- Hispanic)	Hispanic
434	150	186	78

Q1. Which group is largest?

Consolidate White (Non-Hispanic) with Hispanic.

Q2. Which group is largest?



# **Statistical Literacy : Randomness**

---

## **Five non-quantitative Topics:**

### **1. Regression to the Mean**

**Sport Illustrated Cover**

### **2. Statistically significant**

### **3. Chance-Related Mistakes:**

**Three Door problem; Birthday problem**

- Better than chance**
- Unlikely to be chance**

# **Statistical Literacy : Error/Bias**

---

## **Three kinds of error**

- 1. Subject/respondent error:**
- 2. Researcher/measurement error:**
- 3. Sampling error:**

# Statistical Literacy : Assembly

## Child Abuse Statistics

Each year, more than 7,000 children in Minnesota are confirmed to be victims of physical or sexual abuse, emotional maltreatment, or neglect.



## **Statistical Literacy : Recommendation**

---

More college students (over half) take intro statistics than any other course (except English).

One-size fits all is no longer viable. Statistics education must support Stat 101 and 100/102.

Statistics education should (1) support different flavors for different majors, and (2) agree on the contributions of statistics to human knowledge.

/

## **Willful Ignorance**

---

*The past success of statistics has depended on vast, deliberate simplifications amounting to willful ignorance.*

*This very success now threatens future advances in medicine, the social sciences, and other fields.*

*Limitations of existing methods result in frequent reversals of scientific findings/recommendations, to the consternation of scientists and the public.*

*Herbert I. Weisberg*

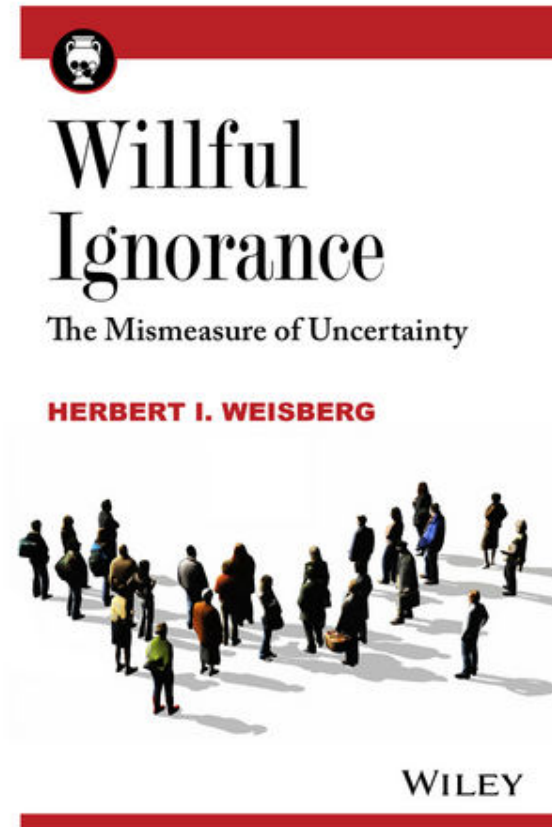
# **Willful Ignorance**

## **Herbert Weisberg**

---

*The past success of statistics has depended on vast, deliberate simplifications amounting to willful ignorance.*

*Limitations of existing methods result in frequent reversals of scientific findings and recommendations, to the consternation of scientists and the lay public.*



# **Statistics Literacy For Decision Makers**

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## **Statistical Literacy Details Chapter 2**

**by  
Milo Schield**

***USCOTS Workshop May 16, 2019***

***[www.StatLit.org/pdf/2019-Schild-USCOTS-Slides2.pdf](http://www.StatLit.org/pdf/2019-Schild-USCOTS-Slides2.pdf)***

# **Take CARE: Details**

## **Chapter 2 Outline**

---

Associations: Comparison and Co-Variation

- Comparisons: Ordered and Arithmetic
- Comparisons: Kinds of Arithmetic

Take CARE: Solutions

- Confounder control: effect size, study design
- Assembly:
- Randomness: Test for statistical significance
- Error/Bias: Single & Double blind.



# Stat Literacy studies Stats as Evidence in Arguments

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The more disputable the point,  
the stronger the evidence must be.

**Statistic As Evidence**

**“All Statistics are Socially Constructed”**

**So, “Take CARE”!!**

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<b>C</b>	<b>A</b>	<b>R</b>	<b>E</b>
<b>Context</b>	<b>Assembly</b>	<b>Randomness</b>	<b>Error</b>

# **Associations: Two Kinds**

---

Two-group comparisons:

- Men are taller than women
- Women live longer than men

Two-factor Covariation

- As height increases, weight increases
- The more height, the more weight

## **Comparisons: Two Kinds**

---

**Ordinal (Order):** Women live longer than men

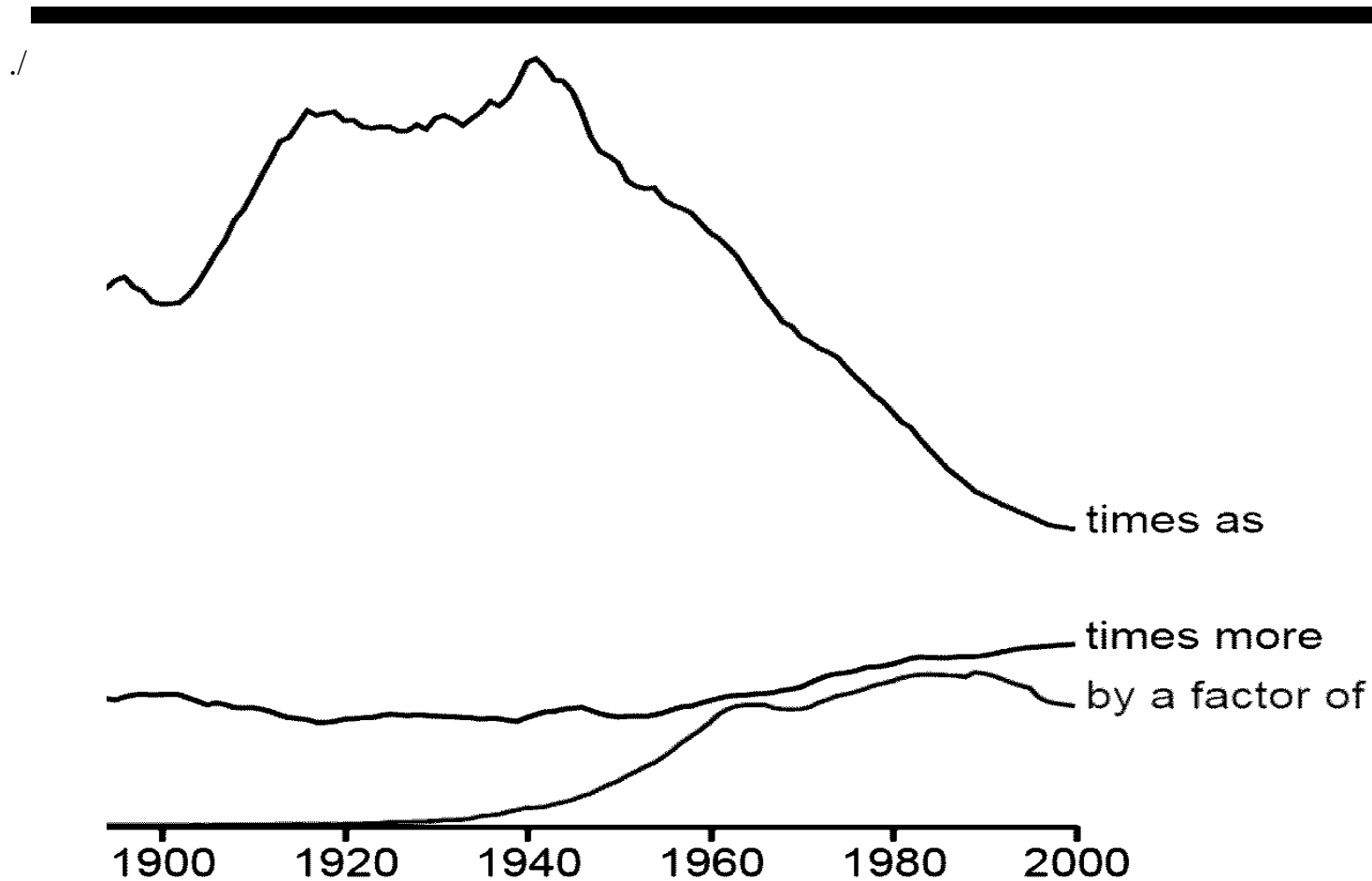
**Arithmetic:**

- Men shave six days more/week *than* women  
6% is one percentage point more *than* the 5%
- Men shave seven times **as much as** women.
- Men shave 600% **more** often *than* women.  
6% is 20% **more** than 5%.

Men shave six **times more** often *than* women.

Women shave 7 **times less** often *than* men

# Prevalence of Comparisons Google Ngrams



# Confounding

---

What things block or negate confounders?

1. Large effect size; large arithmetic comparison
2. Study design
3. Ratios
4. Comparison of ratios.
5. Selection and stratification
6. Standardizing

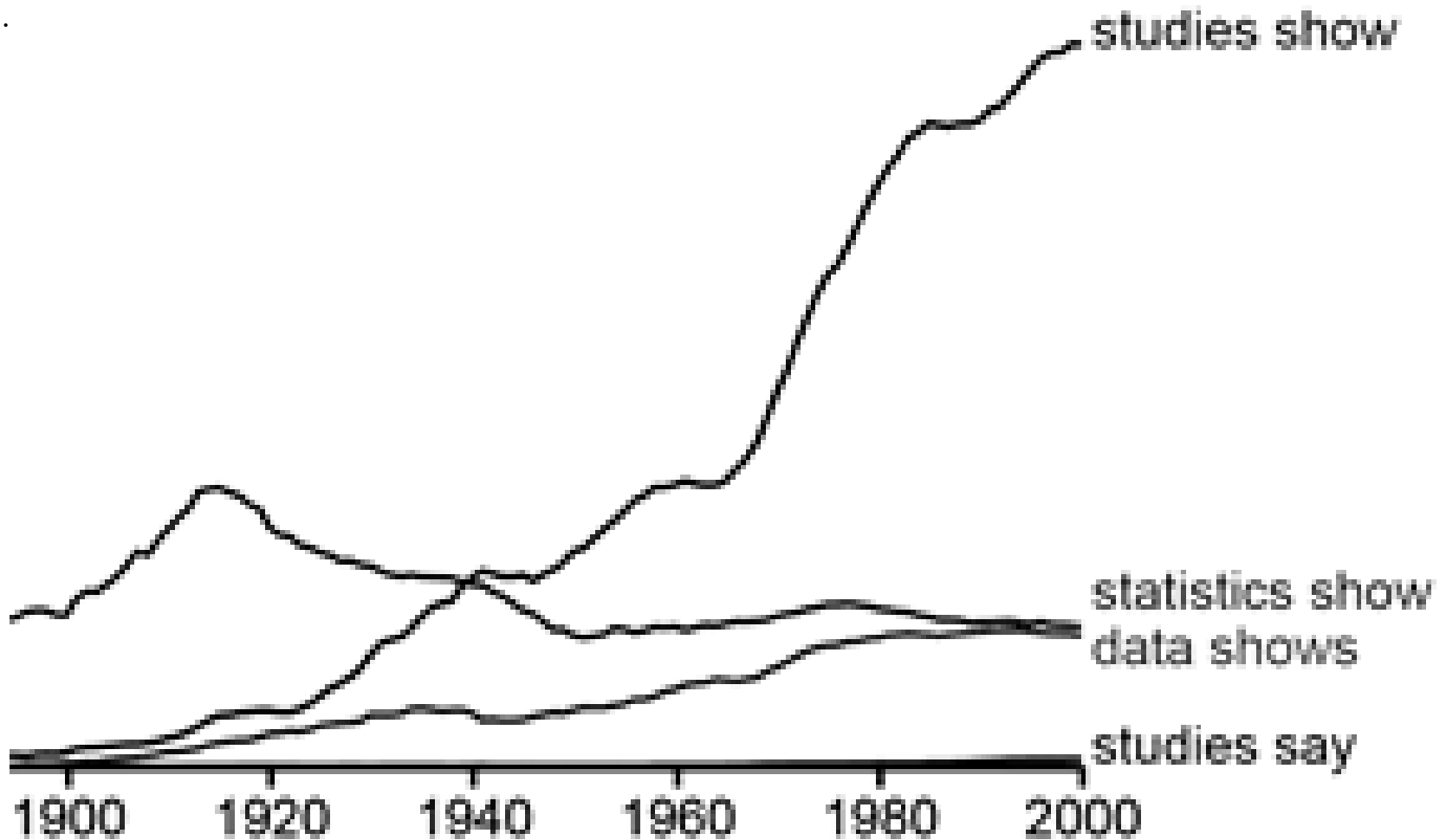
## #1 Effect Size

---

1. *Does the association involve an effect size?*  
If not, then no reason to think it is large
2. *Is the effect size material?* For example, a factor of 10 increase in 1 chance in 10,000.
3. *Is the effect size statistically significant?*
4. *Is the effect size large enough to ward off confounders?* A:  $RR > 4$ , B:  $RR > 3$ , C:  $RR > 2$ , D:  $RR > 1.5$ . Schield (2018, ICOTS).

# Studies are the Primary Unit of Analysis

---



# Six Basic Study Designs

---

## Experiment

Researcher assigns/intervenes

Repeatable: Scientific Exp.

Randomized: Clinical Trial

Other: Quasi-Experiment

## Observational

Researcher is passive/observes

Movie: Longitudinal Study

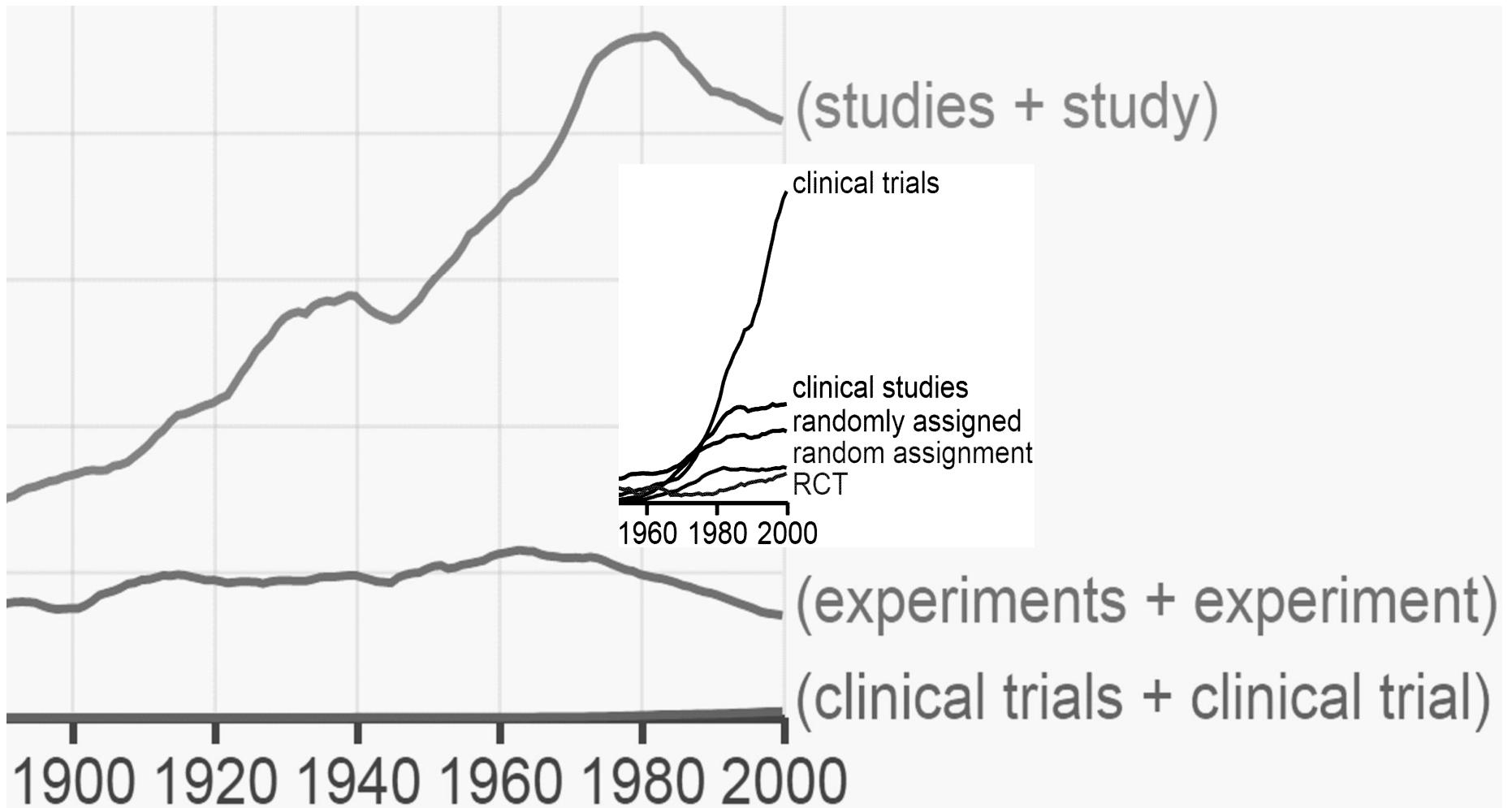
Snapshot: Cross-sectional S.

Someone says: Anecdotal

There are distinctions within these, but these six are enough to get started.



# Study Design Prevalences: Google Ngrams

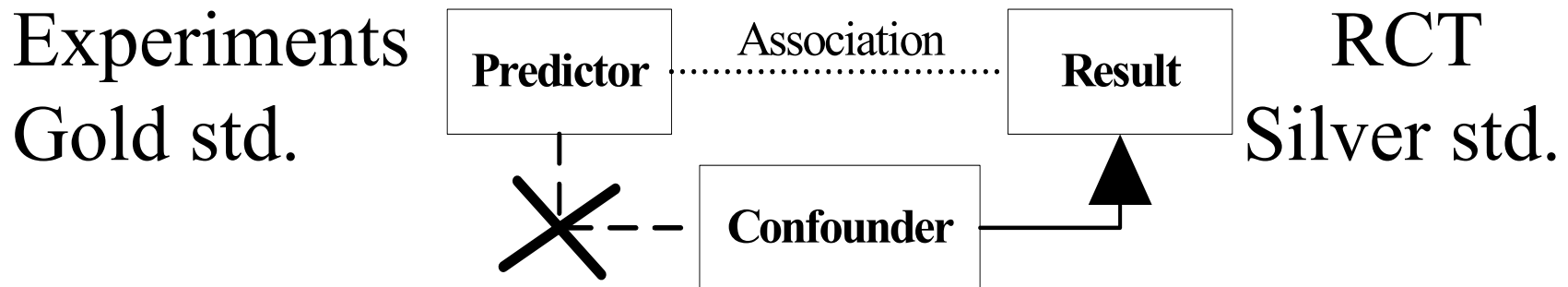


# Random Assignment Nullifies Prior Confounding

---

Randomized controlled trials (RCT) are a major contribution of statistics to human knowledge.

By doing the impossible—controlling for all variations (known and unknown) — randomized trials can be considered a “statistical miracle.”



# Random Assignment Examples

---

- 1747. Lind tests sailors with scurvy.
- 1935 Fisher: The Lady Tasting Tea.
- 1961 Perry Pre-School Project.
- 1974 RAND Health Insurance Experiment
- 1980s First AIDs trial video

## **Placebo Effect**

---

Placebo Effect: Clinical trials where placebo group did as well as treatment group.

See migraine prophylaxis, positive response:  
Placebo meds, 22%. placebo acupuncture 38%.  
placebo surgery, 58%.

Note; Clinical studies, clinically proven, medical trials, medically proven, medical studies and controlled trials don't require randomization.

## Study Designs

### Quasi (Queasy)-Experiment

Nature or humans intervene on pre-existing groups

*Nature intervenes*

#### **Epidemics**

Plagues, outbreaks

#### **Natural disasters**

Earthquakes, tornadoes

*Humans intervene*

#### **Wars/Politics**

Change laws & policies

#### **Business/Education**

Change pricing/teaching

562 BC. Jews in Babylon test meat vs vegetarian diet.

1796 Jenner administers cowpox to patient with smallpox

1898 Lease of Hong Kong to the British for 99 years.

1919-1933: US prohibits production/consumption of alcohol.

# Quasi-Experiments: More Examples

---

1920 Watson's "Little Albert" study of social conditioning.

1945 Post-WWII division of Germany into East and West.

1945/48 Korea partition: North (USSR) and South (USA).

1951 Asch Conformity Exp. 74% agreed w peers' falsehood.

1954 Salk polio vaccine\*. Biggest public health experiment.

1968 Bystander Effect. Less likely to act if in a group.

1987-2014: US states allow concealed carry of weapons (CCW)

\* Salk: Second graders were treatment group; 1st and 3rd graders were control.  
[www.medicine.mcgill.ca/epidemiology/hanley/c622/salk\\_trial.pdf](http://www.medicine.mcgill.ca/epidemiology/hanley/c622/salk_trial.pdf)

# Longitudinal Studies: Examples

---

Retrospective longitudinal studies : subjects recall past events. Cheap, quick.

Prospective longitudinal studies: follow subjects through time.

Expensive, time-consuming. Minimizes recall bias and sampling bias.

Cross-sectional results are more reliable.

Prospective studies:

- 1921 Terman (Stanford) study of the gifted
- 1948 Framingham Study: Follow all inhabitants of Framingham MA
- 1951 British Doctors Survey
- 1976 Harvard Nurses Study
- 1979 Bouchard study of twins raised apart
- 1979 National Longitudinal Study of Youth (NLSY)

# Cross Sectional Associations: Examples

---

- 1948 Framingham Study: Cross-sectional data associated heart attacks with high blood pressure, high cholesterol and smoking.
- 1951 British Doctors Survey. Cross-sectional data strongly associated lung-cancer deaths with smoking.
- 1979 Bouchard study of twins raised apart. Similarities between twins are due more to genes, less to environment.
- 1979 National Longitudinal Study of Youth. Cross-sectional data showed that social outcomes more strongly associated with individual IQ than with parents' socio-economic status. See *The Bell Curve* (1994) by Herrnstein and Murray.



## **Evaluating Study Designs**

### **Grades are Starting Points**

<b>CONTROL OF CONFOUNDERS</b>			
<b>Physical Control (Grade = Quality)</b>			
Experiment		Observational Study	
A+	Scientific	C	Longitudinal
A-	Random Assign	D	Cross-sectional
B	Quasi-Exper	F	Anecdotal story

Which are cheapest?

Which are most common in the media?

Examples of uncontrolled quasi-experiments?

## **From Association to Causation**

---

Association is not causation vs  
Association is often evidence of causation.

Don't cross in the middle of the block vs.  
look both ways before you do.

Sex is not love (Danny Kaplan) vs.  
sex and love can be closely related.

## **Chance: Law of Very Large Numbers**

---

The unlikely is almost certain given enough tries

Math: Suppose there is one chance in  $N$  for a given rare event on the next try.

The chance of having **at least\*** one such event in  $N$  tries is over 50%—it is expected.

\* Chance of having just one event  $< 50\%$ .

## **Chance: Statistical Significance**

---

Consider matched statistics from two groups. If their 95% intervals don't overlap, then their difference is statistically significant. Otherwise, the difference may be statistically insignificant.

Suppose 70% of gals dream in color (40% of guys) and the 95% margin of error is 10 points.

The associated 95% confidence intervals are 60 to 80% for gals (30 to 50% for guys).

The 30 point difference is statistically significant.

## **Case Study: The Prontosil Experiment**

---

Before 1936, as many as one in three expectant moms died from puerperal fever following birth.

Gerhard Domagk, a German doctor, developed Prontosil to fight against streptococcal infections.

In 1936, Prontosil was administered to 38 newly delivered mothers, all suffering from puerperal fever. Three died and thirty-five survived.

## **Case Study: The Prontosil Experiment**

---

When Prontosil was administered earlier in the course of the infection, no mother died.

In 1936, Prontosil was used to treat Franklin D. Roosevelt, Jr., the President's son.

This was the moment when the world realized that drugs were potent alternatives to surgery.

## **Case Study**

# **Do Magnets Reduce Pain?**

---

Fifty subjects having pain associated with post-polio syndrome were randomly assigned.

The treatment group received concentric magnets; the control group received inert placebo magnets.

A major decrease in pain was reported by 75% in the treatment group 19% in the control group.

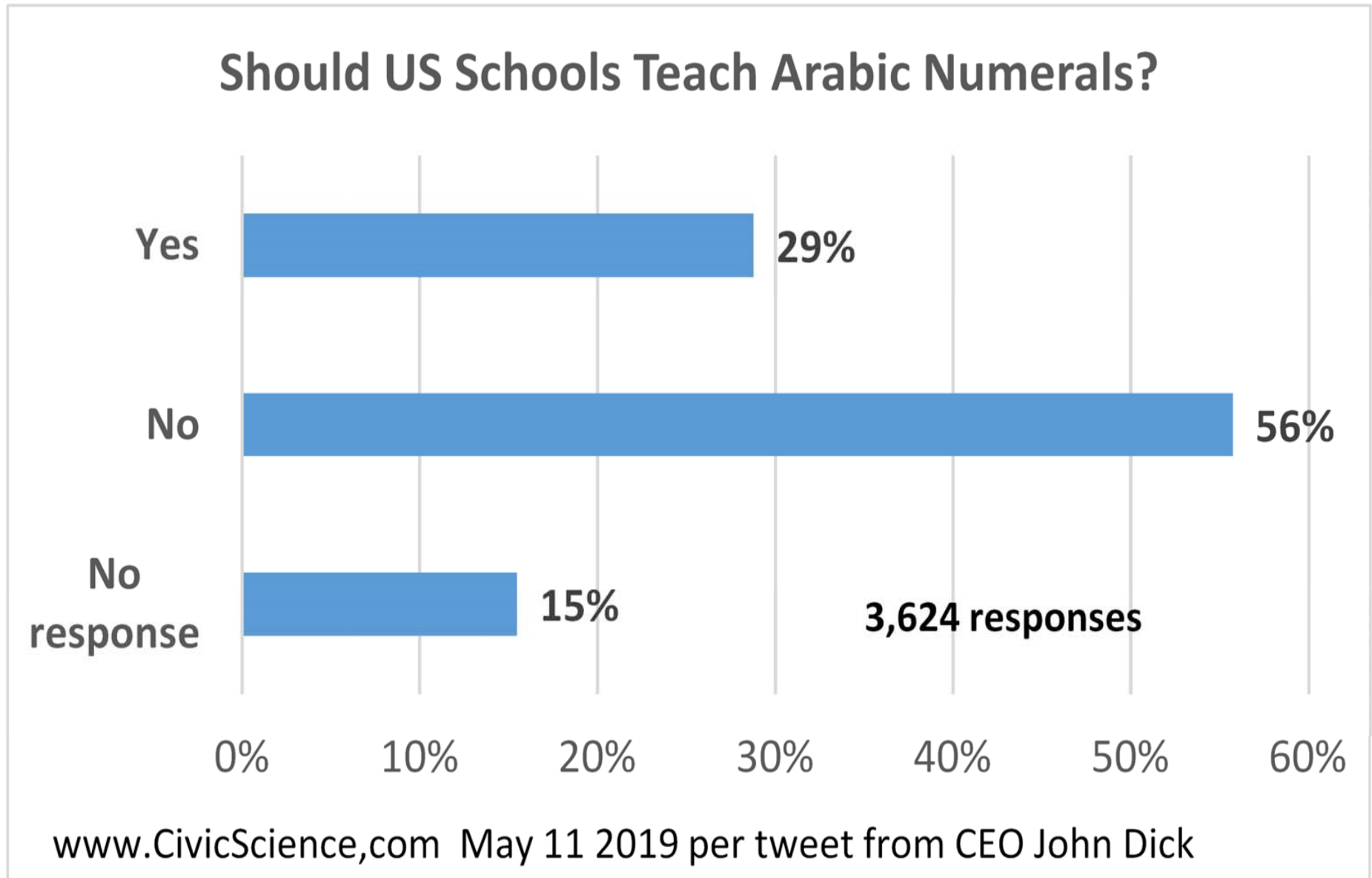
- Natural Health, August, 1998. Page 52.

Effect size. Study design.

Hypothetical thinking using Take CARE.

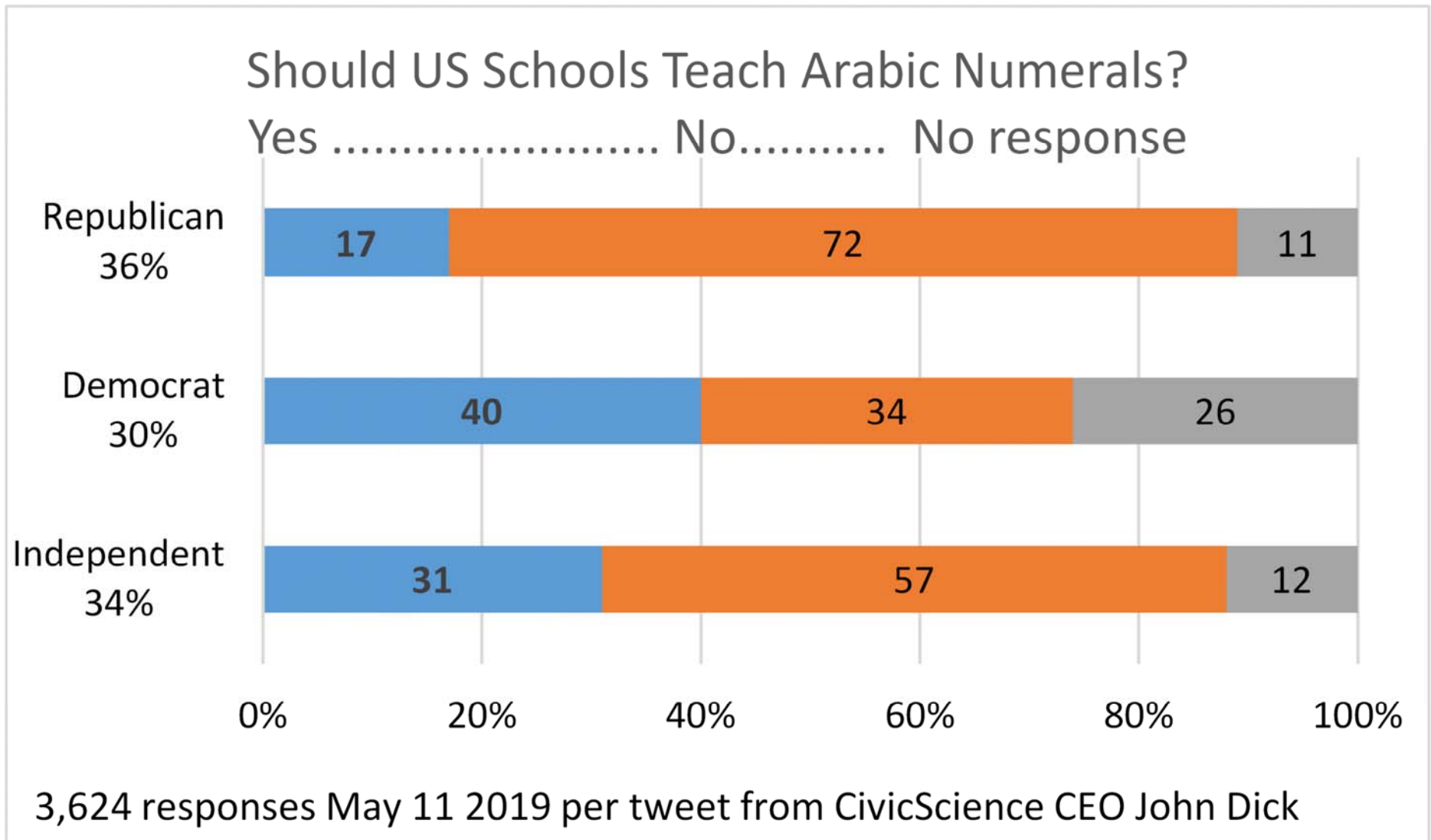
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# Bias or Ignorance?





# Bias or Ignorance?



# **Statistics Literacy For Decision Makers**

---

## **Chapter 3: Measurements**

**by  
Milo Schield**

*Half-Day Workshop  
USCOTS May 16, 2019*

*[www.StatLit.org/pdf/2019-Schild-USCOTS-Slides3.pdf](http://www.StatLit.org/pdf/2019-Schild-USCOTS-Slides3.pdf)*

# **Measurements: Chapter 3 Outline**

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Distributions

Measures of center

Two-group comparisons of Means & Medians

Two-variable co-variation

Spread

Slope and simple regression

# Stat Literacy: Study Statistics as Evidence in Arguments

The Point or the Target

The more disputable the point,  
the stronger the evidence must be.

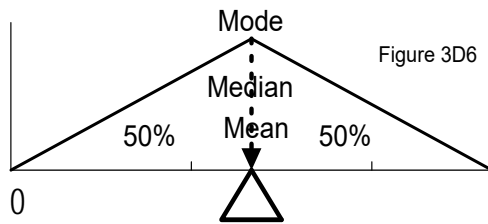
**Statistic As Evidence**

**“All Statistics are Socially Constructed”**

**So, “Take CARE”!!**

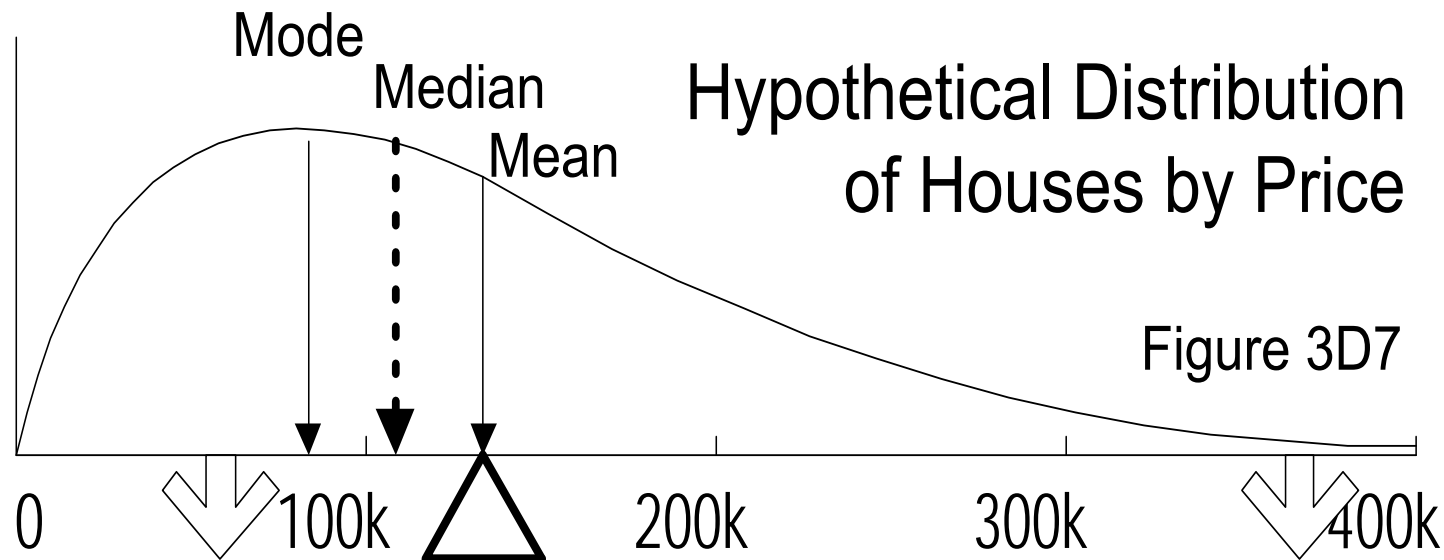
**Statistics may be influenced by:**

<b>C</b>	<b>A</b>	<b>R</b>	<b>E</b>
<b>Context</b>	<b>Assembly</b>	<b>Randomness</b>	<b>Error</b>



## Measures of Center

In an asymmetric distribution, mean, median and mode typically align alphabetically with mean most sensitive to extremes. Why?



## **Mean, median, mode: Alphabetically. Why?**

---

Suppose that house prices in your town have a positive near-symmetric distribution

Suppose Bill and Melinda Gates move to your town. They built two Mac-Mansions.

How does that change the mode, median and mean of the original distribution?

Mode? Median? Mean?

Most relevant in the short run? In the long-run?

## Issues:

---

1. Mean is more sensitive to outliers.

Yet statisticians prefer the mean. Why?

2. Omit measure: *City1 income more than City2.*

3. Omit characteristic: *Midtown is a median city.*

4. Assume the mean exists. *1.8 kids per family.*

5. Ambiguity in specifying the group

# Controlling Confounding: Control Of

CONTROL OF CONFOUNDERS	
Physical Control (Grade = Quality)	
Experiment	Observational Study
A+ Scientific	C Longitudinal
A- Random Assign	D Cross-sectional
B Quasi-Exper	F Anecdotal story



# Controlling Confounding: Control For

## CONTROLLING FOR CONFOUNDERS

Take into account (mental)

*Can do by hand*

*Calculator/Computer*

1 Select/Stratify

4 Linear Regression

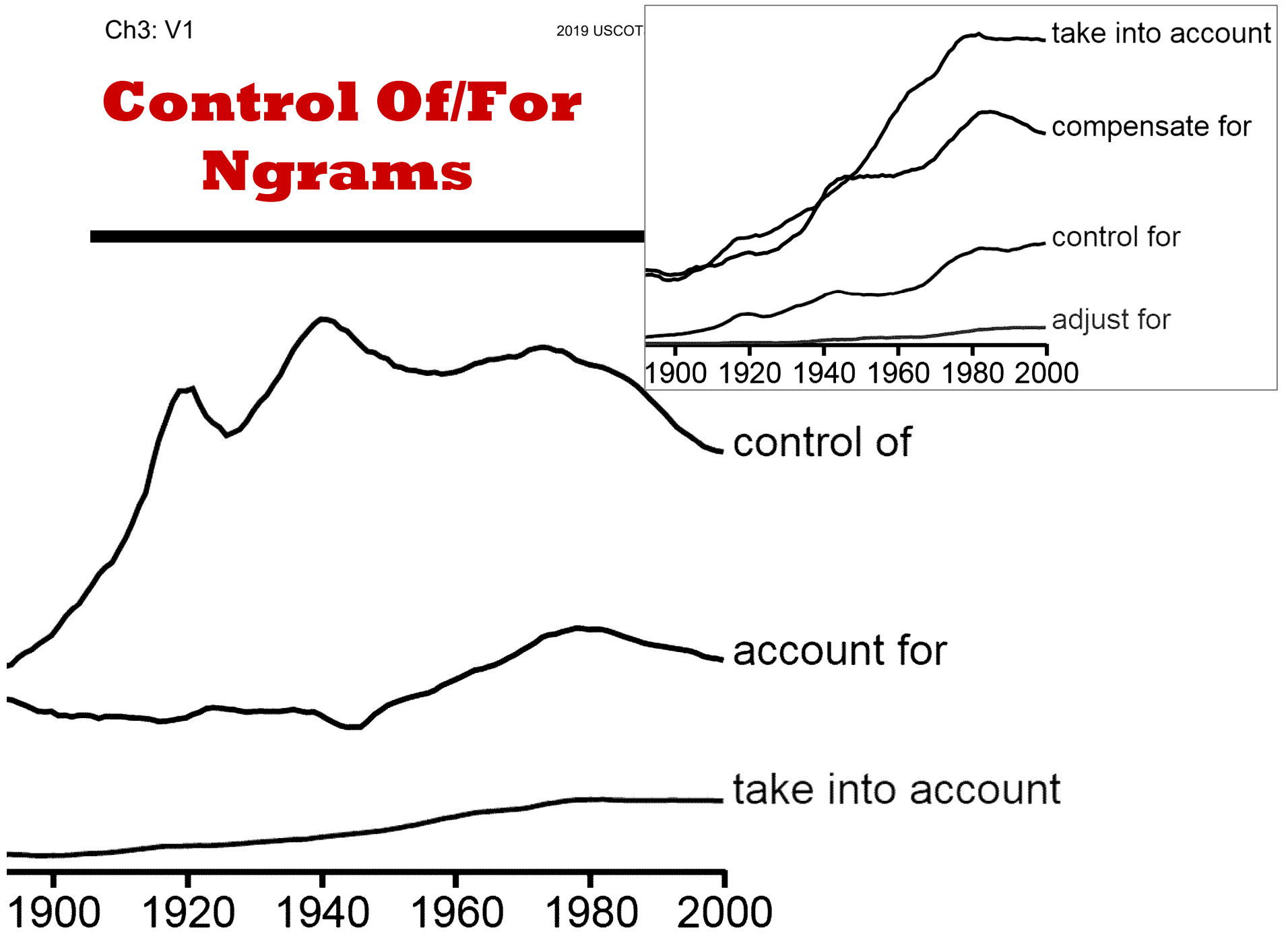
2 Form Ratios

5 Logistic Regression

3 Standardize

6 Multivariate Regress

# Control Of/For Ngrams



## **Crude Associations**

---

A **crude association** is an association in which nothing else has been taken into account.

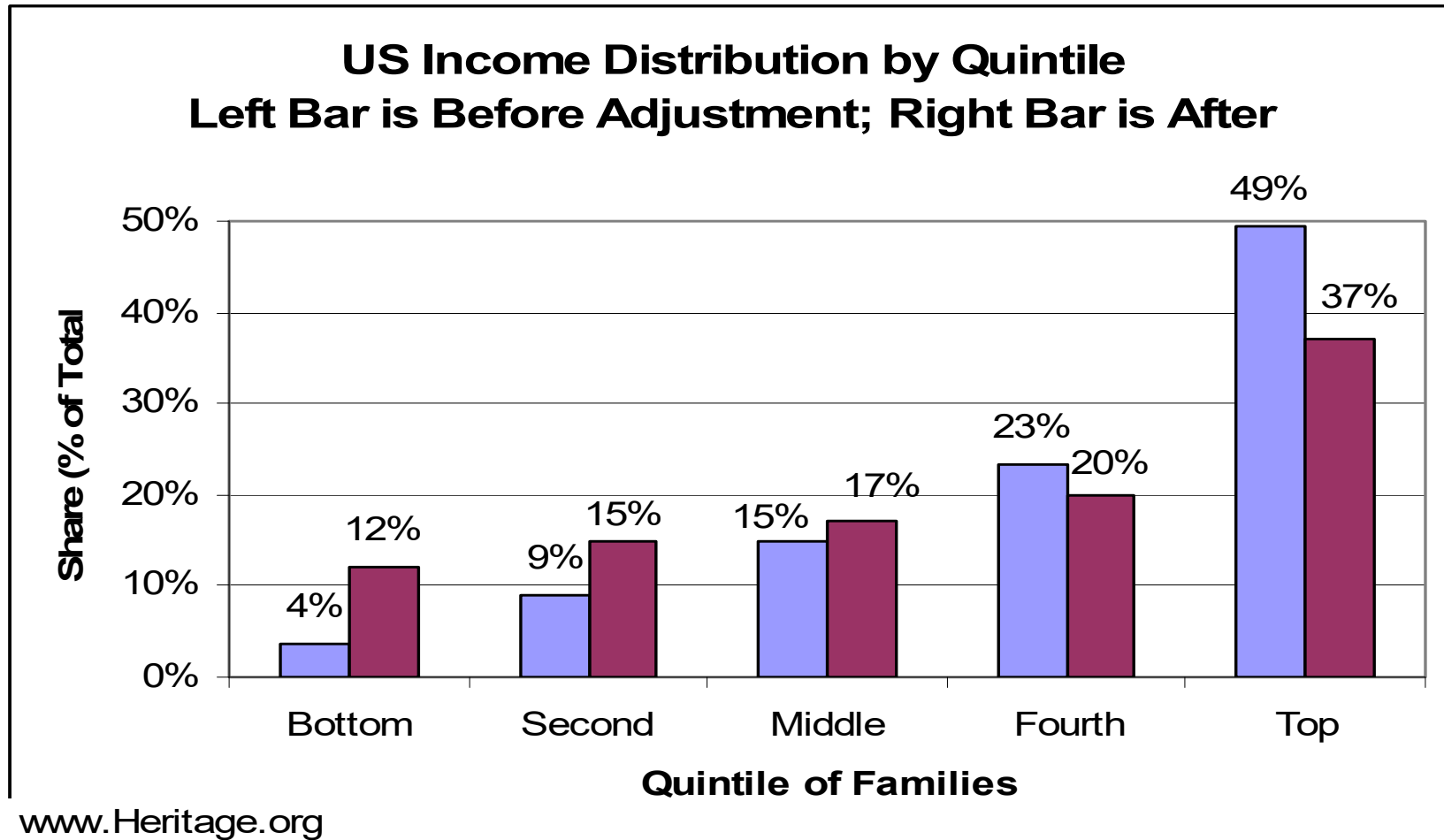
Less likely to get pregnant:

- Short young adults than tall.
- Adults that shave daily than those that don't
- Adults with long hair than those with short.



What one takes into account is an assumption.



Teachers should say, “Check your assumptions.”



# Crude Association versus an Adjusted Association



# Prison Expense: Crude vs Adjusted Associations

State	Total	# Inmates	Per Inmate		Total	Per Inmate
CA	\$2.9B	136K	\$21,385		50% more 	25% less 
NY	\$1.9B	69K	\$28,426			

State	Total	# Inmates	Per Inmate		Total	Per Inmate
MD	\$481M	21,623	\$22,245		3 times.. 	Same
KS	\$159M	7,148	\$22,245			

State	Total	# Inmates	Per Inmate		Total	Per Inmate
MN	\$184M	4,865	\$37,825		260% more 	 12% more
ME	\$48M	1,424	\$33,711			

# Crude Ratio Associations

## It's the Mix!!!

Ratio associations can be still be confounded.  
Averages are ratios.

NAEP Math 8	Internet Access at Home		
State	All	Yes	No
Virginia (VA)	▲ 275	▼ 282	▼ 258
Texas (TX)	▲ 273	▼ 285	▼ 260

NAEP Math 8	Internet Access at home		
State	All	Yes	No
Virginia (VA)	▲ 275 (100%)	282 (69%) ▲	258 (31%) ▼
Texas (TX)	▲ 273 (100%)	285 (53%) ▲	260 (47%) ▼

## **Simpson's Paradox: Time It's the Mix!!**

SAT Verbal flat, but every group improved.

SAT-Verbal Group	---- Scores ----			---- Distribution ----		
	1981	2002*	Chg	1981	2002*	Points
White	519	527	+8	85%	65%	-20
Black	412	431	+19	9%	11%	+2
Asian	474	501	+27	3%	10%	+7
Mexican	438	446	+8	2%	4%	+2
Puerto Rican	437	455	+18	1%	3%	+2
Amer. Indian	471	479	+8	0%	1%	+1
ALL	504	504	0			

## **Will an Association Reverse? The Cornfield Conditions**

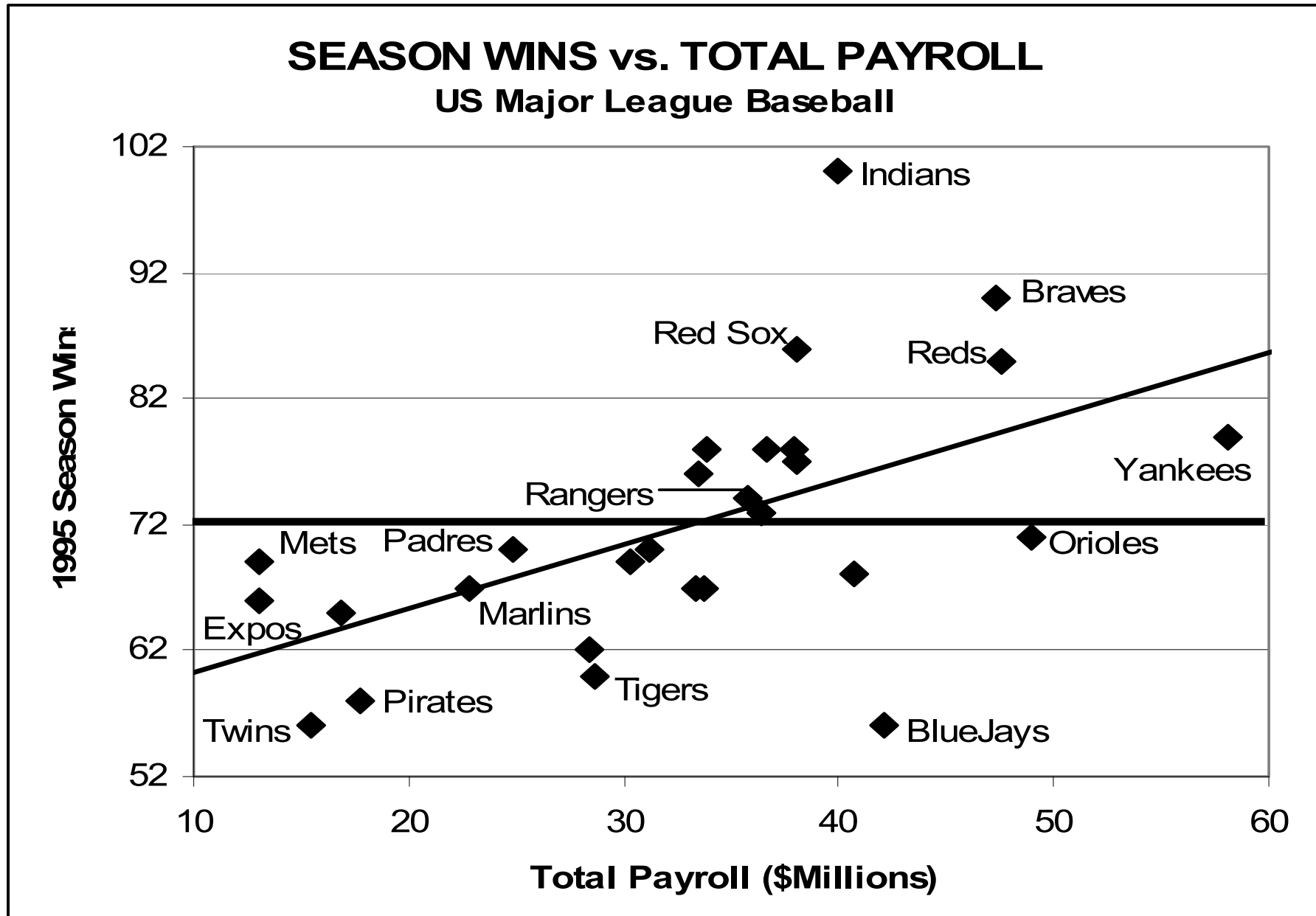
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After learning about Simpson's Paradox, one student said, "I'll never trust another statistic." This is cynicism: not a good outcome.

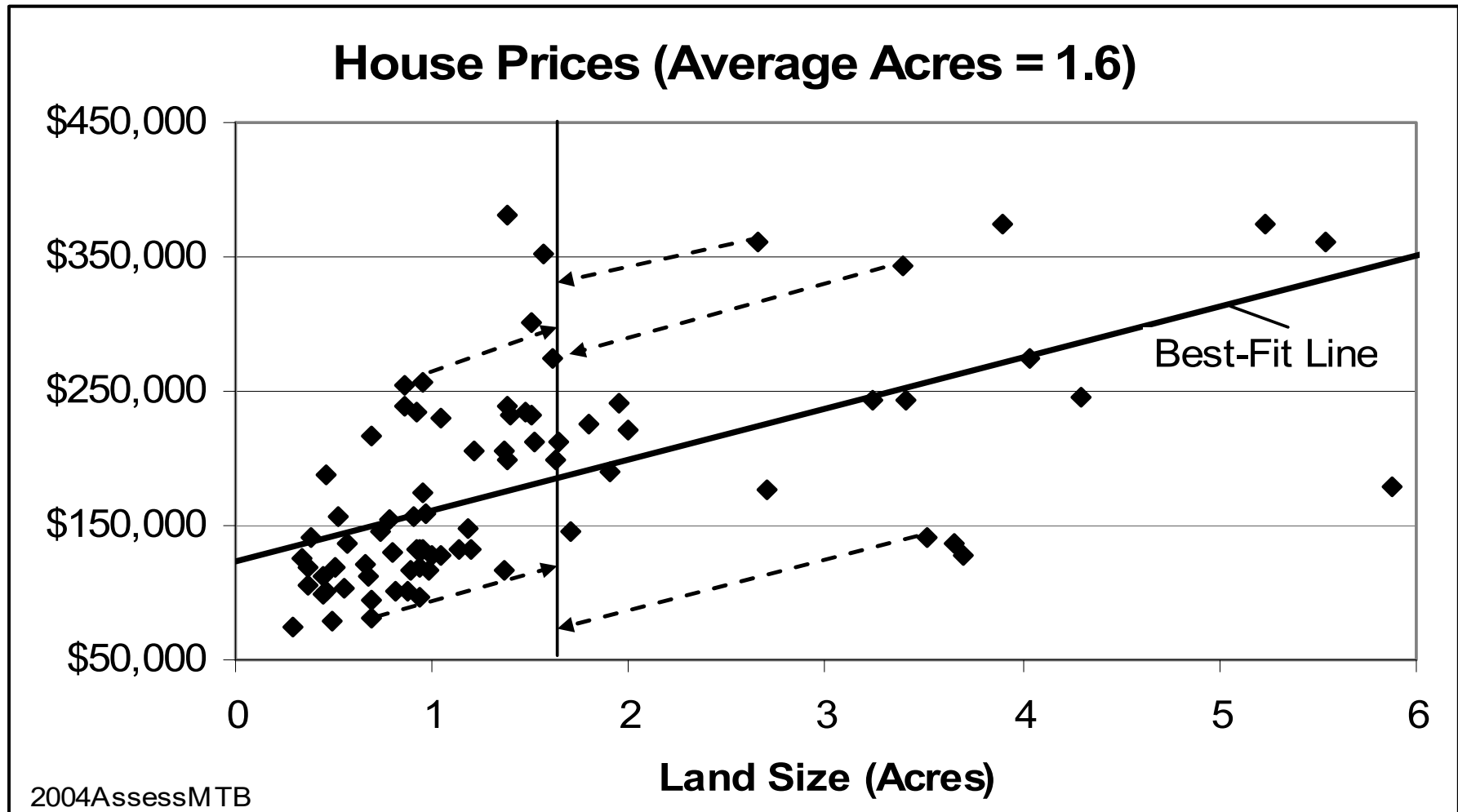
Not all confounders can reverse an association. Jerome Cornfield proved that a confounder association must be "bigger" than the observed.

Cornfield's conditions are one of the three biggest contributions of statistics to human knowledge.





# Regression Standardizes



# Regression Standardizes

## An Example:

---

The data shows that house prices increase by \$39,000 per bedroom. This is a crude association.

\$16,000 per bedroom if land is *controlled for*,

\$9,000 per bedroom after *accounting for* land and house size,

\$5,000 after *adjusting for* land, house size, and number of bathrooms.

## **TV for toddlers interferes with brain growth, says study:**

---

Children under two should not be allowed to watch television because it increases their chances of suffering attention problems later in life, says an American study.

A study of 1,345 children found that each hour spent in front of the set every day increased the risks of attention deficit disorders by 10%.

U.S. journal, *Pediatrics*

## Time to Double given Growth Rate

---

If a child's risk of Attention Deficit Disorder increases by 10% for every extra hour of watching TV, how many hours do they have to watch to double their risk?

**Rule of 72\*:** Time to double =  $72 / \text{Rate}$

72 divided by 10% per hour = 7.2 hours

\* Assuming compounding

## How to Relate this to Math Colleagues

---

Don't talk about confounding or effect size.

Talk about assumptions.

- What one controls for is an assumption.
- What one fails to control for is an assumption.

*AAU&C Quantitative Literacy VALUE rubric:*

**Assumptions:** Ability to make and evaluate important assumptions in estimation, modeling, and data analysis.

# AAC&U Quantitative Literacy VALUE Rubric

---

Interpretation, Representation, Calculation,  
Application, **Assumptions**, and Communication

**Assumptions:** Ability to **make and evaluate** important assumptions in estimation, modeling, and data analysis.

[www.statlit.org/pdf/2009QuantitativeLiteracyRubricAACU.pdf](http://www.statlit.org/pdf/2009QuantitativeLiteracyRubricAACU.pdf)

[www.aacu.org/peerreview/2014/summer/RealityCheck](http://www.aacu.org/peerreview/2014/summer/RealityCheck)

# **Teaching Statistical Literacy**

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## **Chapter 4: Using and Describing Ratios**

by  
**Milo Schield**

*Half-Day Workshop  
USCOTS May 16, 2019*

*[www.StatLit.org/pdf/2019-Schild-USCOTS-Slides4.pdf](http://www.StatLit.org/pdf/2019-Schild-USCOTS-Slides4.pdf)*



## Workshop Schedule

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Start		Topic
1:00	1	Statistical Literacy Intro
1:30	2	StatLit Details
2:15	3	Measurements
2:45	4	Named Ratio Grammar
3:30	5	Comparing Count Ratios
4:00	6	Untangling Statistics

# **Ratios:**

## **Chapter 4 Outline**

---

Per grammars:

- Percent grammar
- Percentage grammar
- Reading half tables and tables w/o margins
- Rate grammar

Ordinary Preposition grammars:

- Chance grammar
- Ratio grammar

# **Stat Literacy: Study Statistics as Evidence in Arguments**

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<b>Context</b>	<b>Assembly</b>	<b>Randomness</b>	<b>Error</b>

# Evaluate these Using Just Assembly/Assumptions

---

1. One in five children face hunger [2019 billboard in St. Paul]
2. Two absences per month = Likely to fail a grade
3. Ninth-grade attendance better predicts graduation than 8th grade test score
4. Attendance alone explains 31% of the variance in performance
5. Budget cuts lead to deaths in Federal prisons
6. 22 million victims of human trafficking trapped worldwide.
7. The National Rifle Association is a terrorist organization.
8. Ban assault weapons
9. 2016 Memphis. 228 homicides. Down 500 police officers.

# Forming Ratios

## CONTROLLING FOR CONFOUNDERS

Take into account (mental)

	<i>Can do by hand</i>		<i>Calculator/Computer</i>
1	Select/Stratify	4	Linear Regression
2	Form Ratios	5	Logistic Regression
3	Standardize	6	Multivariate Regress

# From Comparisons to Ratios: Using Prepositions

## ARITHMETIC COMPARISONS Using Conjunctions or 'Change -By'

Difference: <i>more (greater) than</i> <i>increase by #</i>	Ratio: <i>times [as much as]</i> <i>increase by a factor of</i>	Relative Difference : <i>% (times) more than</i> <i>increase by X%</i>
---	---	--



## RATIOS (Using Prepositions )

<b>Common Prepositions :</b> <i>Of, in, for. To [4 to 3; 4-3; 4:3]</i> <i>4 out of [every] 5; cut in half</i>	<b>Per Grammar:</b> <i>miles per gallon ; mph</i> <i>deaths per 1,000 men</i>
---	---

# RATIOS (Using Prepositions )

## Common Prepositions :

*Of, in, for. To [4 to 3; 4-3; 4:3]  
4 out of [every] 5; cut in half*

## Named-Ratios

## Ratio Grammar:

*ratio of women to men  
student-teacher ratio*

## Chance Grammar: odds/risk/probability

*chance of [our] winning;  
chance that we will win  
chance to win; chance for a win*

## Per Grammar:

*miles per gallon; mph  
deaths per 1,000 men*

## Named-Ratios

## Percent Grammar:

*85% of military personnel are men*

## Percentage Grammar: fraction/share

*percentage of men who bet*

## Rate Grammar: prevalence, incidence

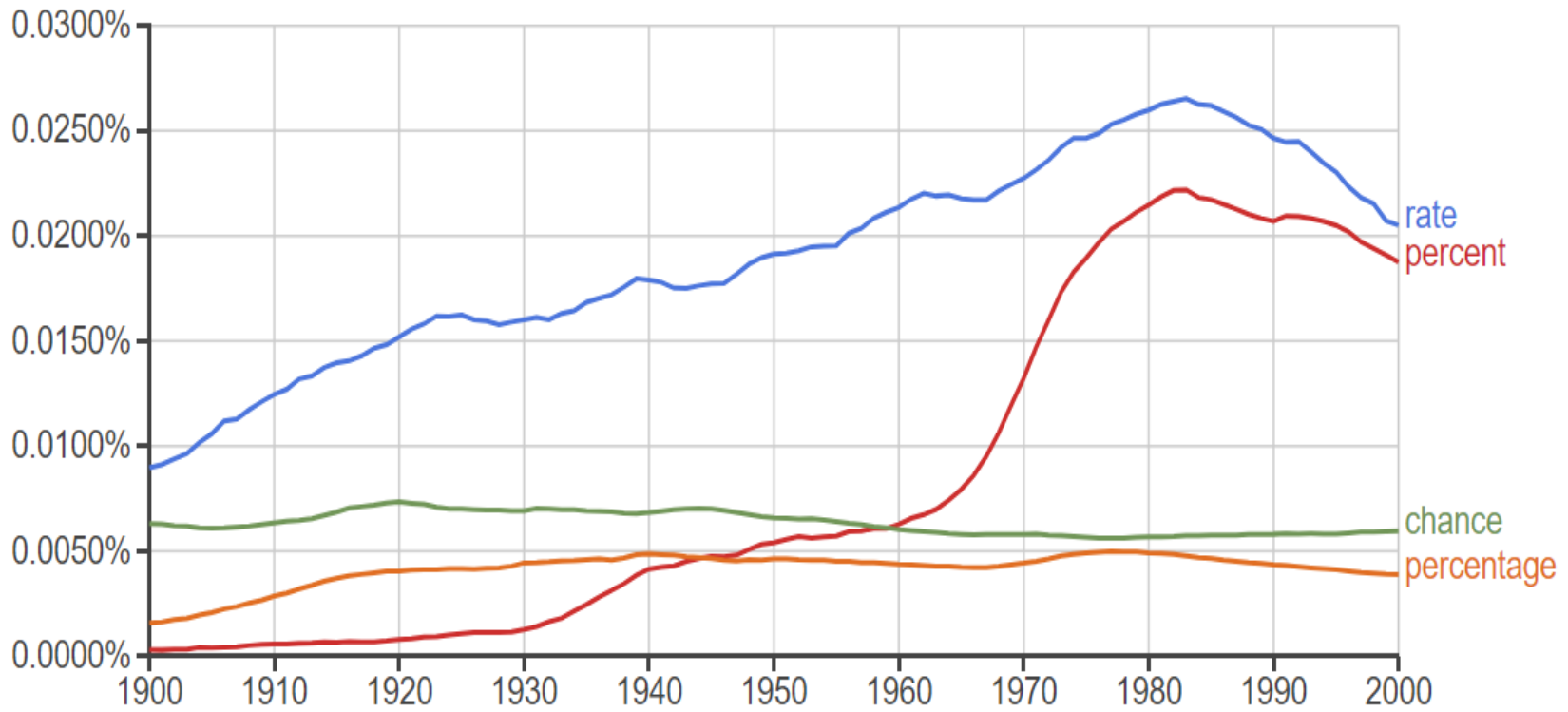
*rate of n per d*

*Men died at a rate of n per d*

Light-edge boxes need clause for part and whole (cannot compare ratios).

Dark-edge boxes have part and whole in phrases (can compare ratios)

# Prevalence of Named Ratios





## Two Kinds of Percents

---

Which kind of percents are these: part-whole or percent compare?

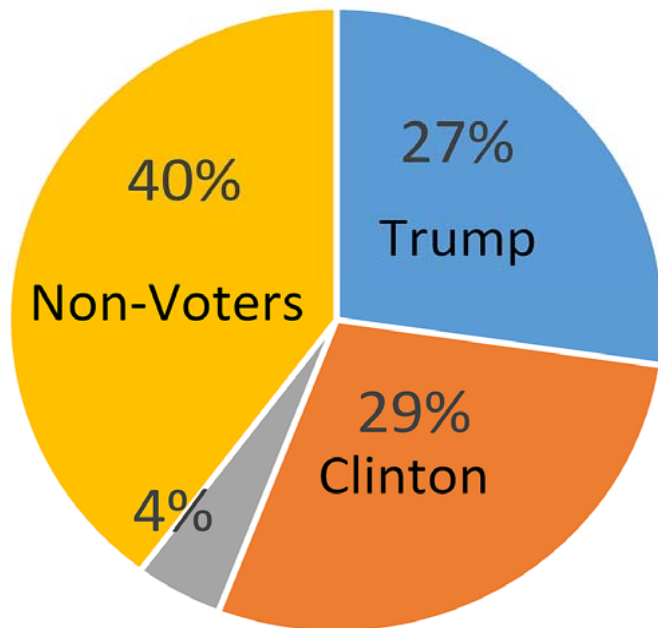
1. The youngest child's share of the candy.
2. Interest charged per year by the Mafia (criminals).
3. People live 100% longer on average in US than in Swaziland.
4. The advertisement said "40% off".

.

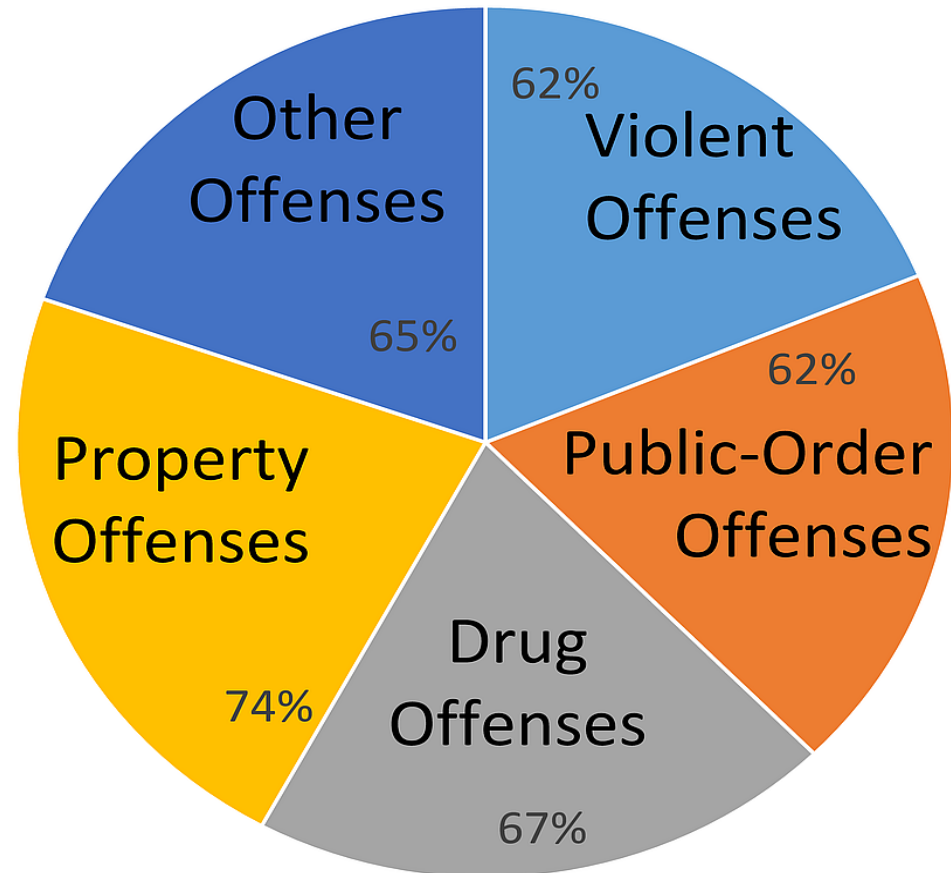
# Part-Whole Using Pie Charts

Of all adults.

2016 US Presidential Election



Recidivism Rate: US Prisoners



US Dept. of Justice statistics . 272,111 prisoners released in 1994.

## **Four Different Grammars; Confusion of the Inverse**

---

1. 40% of US adults did not vote for president in 2016.
2. The *percentage* of US adults who didn't vote was 40%.
3. The non-voter *rate* among US adults in 2016 was 40%.
4. There was a 40% *chance* that an adult was a non-voter.

-----

Confusion of the inverse exchanges part with whole.

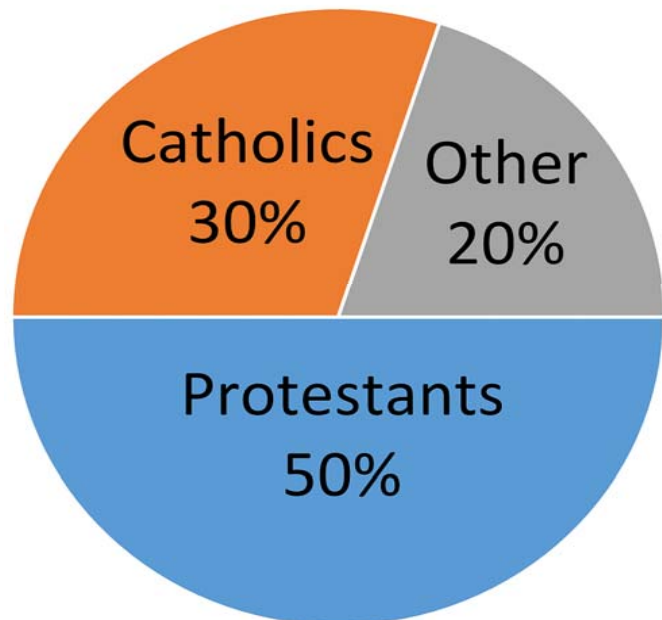
1. “The percentage of men who are in the military”  
.NE. “the percentage of the military who are men”.
2. The percentage of smokers among women .NE.  
“the percentage of smokers who are women”.

# Use Percent Grammar <X% of Whole are Part>

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Describe the 30%

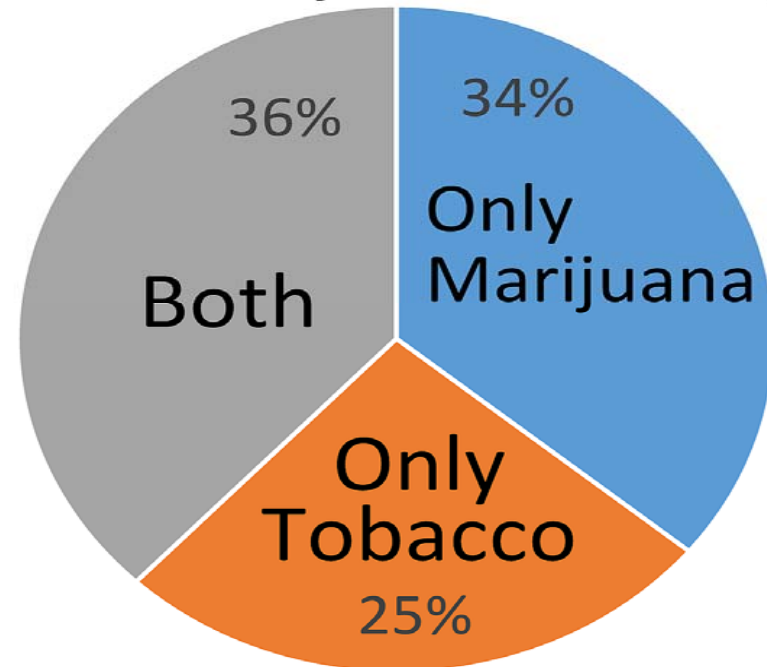
## Smokers



Toy table

Describe the 36%

US Students Grades 9-12 Using Tobacco or Marijuana in Last 30 days



2015 CDC MMWR October 16

## **Tables: Use Percent Grammar**

### **<X% of Whole are Part>**

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1. What percentage of men are art majors?
2. What percentage of art majors are men?
3. What percentage of students are male art majors?

Students	Men	Women	ALL
Humanities	28	72	100
Arts	4	36	40
Science	48	12	60
ALL	80	120	200

# 100% Tables: Percent Grammar

## <X% of Whole are Part>

Describe  
the 10%

Students	Men	Women	ALL
Humanities	28%	72%	100%
Arts	10%	90%	100%
Science	80%	20%	100%
ALL	40%	60%	100%

Describe  
the 5%

Students	Men	Women	All
Humanities	35%	60%	50%
Arts	5%	30%	20%
Science	60%	10%	30%
ALL	100%	100%	100%

## Use Percent Grammar <X% of Whole are Part>

Table 33: World Population by Religion and Continent (1996)

(Millions)	Total	Asia	Europe	North Am	Other
Total	5,804	3,513	728	296	1,563
Christian	1,955	303	556	256	1,096
Muslim	1,126	778	32	5	316
Nonreligious	887	753	90	21	44
Hindus	793	787	2	1	4
Buddhists	325	322	2	1	1
Atheists	222	175	41	2	6
All Other	496	395	5	10	96

Table 1333. 1997 U.S. Statistical Abstract.

# Percentage Grammar

## Four form

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1. The percentage of seniors who smoke is 15%.
2. Among seniors, the percentage who smoke is 15%.
3. Among Seniors, the percentage of smokers is 20%.
4. Among men, the percentage of seniors who smoke is 20%

Numbers 3 and 4 are problems.

“Of” introduces whole in percent grammar.



# Percentage Grammar

## Sports Grammar

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Sports grammar is readily understood with a natural whole:

- *percentage of defective cans; percentage of tire failures*

Without a natural whole, sports grammar is ambiguous.

- *percentage of female smokers;*
- *percentage of working males*
- *percentage of infant deaths;*
- *percentage of single mothers*

## **Half Tables when Parts of 100% Table are Binary**

Describe the circled 60%. Use percent grammar.

Class Last Year	Percentage who are Retained	Percentage who are Not Retained	All
Freshman	60%	40%	100%
Sophomore	75%	25%	100%
Junior	90%	10%	100%
Senior	10%	90%	100%
ALL	70%	30%	100%

If 60% returned, what percentage did not return?

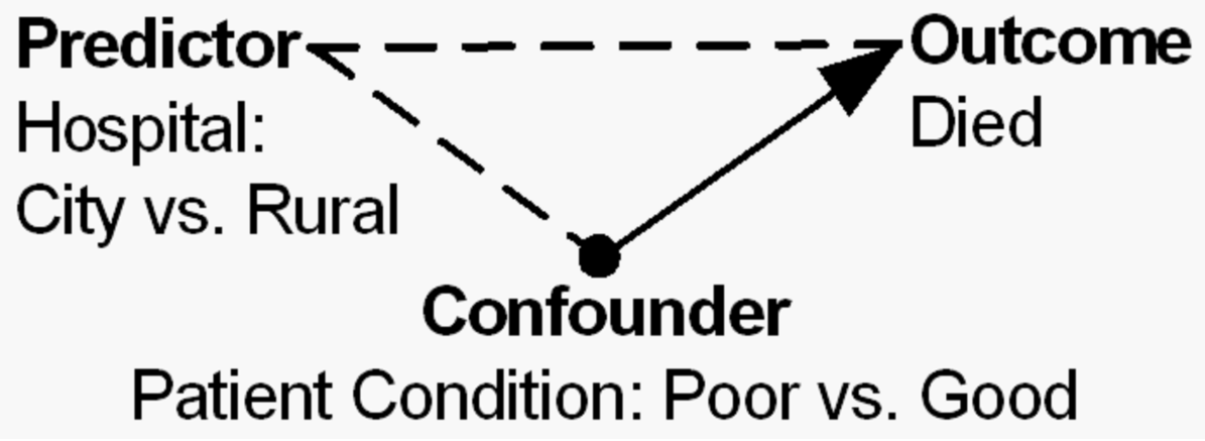
So, the right two columns are redundant.

Eliminating them will save space!

# Confounding

Mortality by Hospital

Hospital	Total	Died	Death Rate
City	1,000	55	5.5%
Rural	1,000	35	3.5%
Both	2,000	90	4.5%



# **Statistics Literacy For Decision Makers**

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## **13: Confounding & Cornfield**

by  
**Milo Schield**

*Half-Day Workshop  
USCOTS May 16, 2019*

*[www.StatLit.org/pdf/2019-Schild-USCOTS-Slides13.pdf](http://www.StatLit.org/pdf/2019-Schild-USCOTS-Slides13.pdf)*

# Workshop Schedule

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1:00 Ch 1 Statistical Literacy – Introduction

1:30 Ch 2 Statistical Literacy – Details

2:15 Ch 3 Measurements

2:45 Ch 4 Ratios

3:30 Ch 13 Standardizing

4:00 Feedback

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# **Confounding: Chapter 13 Outline**

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Cornfield-Fisher debate

Cornfield conditions

Standardizing percentages, rates and averages

Standardizing percentage & number attributable

Statistical significance and confounding

# Stat Literacy: Study Statistics as Evidence in Arguments

The Point or the Target

The more disputable the point,  
the stronger the evidence must be.

**Statistic As Evidence**

**“All Statistics are Socially Constructed”**

**So, “Take CARE”!!**

**Statistics may be influenced by:**

<b>C</b>	<b>A</b>	<b>R</b>	<b>E</b>
<b>Context</b>	<b>Assembly</b>	<b>Randomness</b>	<b>Error</b>

## Cornfield-Fisher Debate

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Doctors had noticed the strong association between smoking and lung cancer. Statisticians argued that this evidence strongly supported the claim that smoking was a cause of lung cancer.

Fisher, a smoker, noted that *association is not causation in observational studies*.

Fisher produced data. Identical twins were more likely to share a smoking preference than were fraternal twins. This statistic supported genetics as an alternate explanation for the association.



## **Cornfield-Fisher Debate**

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Now when the world's leading statistician says something that every statistician agrees is true, most reasonably-minded statisticians would back off.

And when the world's leading statistician produces data indicating a plausible confounder, it seems incredible that anyone would reply.

Jerome Cornfield did!

## Cornfield Conditions

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Cornfield **proved** that the relative risk of lung cancer had to be greater for a confounder (e.g., genetics) than for the predictor (e.g., smoking) in order to nullify or reverse the observed association.

Cornfield pointed out that smokers were about 10 times as likely to get lung cancer as non-smokers.

Fisher's data involved a factor of two.

Fisher never replied.

# Contributions to Human Knowledge

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“Cornfield's minimum effect size is as important to observational studies as is the use of randomized assignment to experimental studies.

No longer could one refute an ostensive causal association by simply asserting that some new factor (such as a genetic factor) might be the true cause.

Now one had to argue that the relative prevalence of this potentially confounding factor was greater than the relative risk for the ostensive cause.”

Schild (1999). [This was written 20 years ago!]

## **Confounder Distribution**

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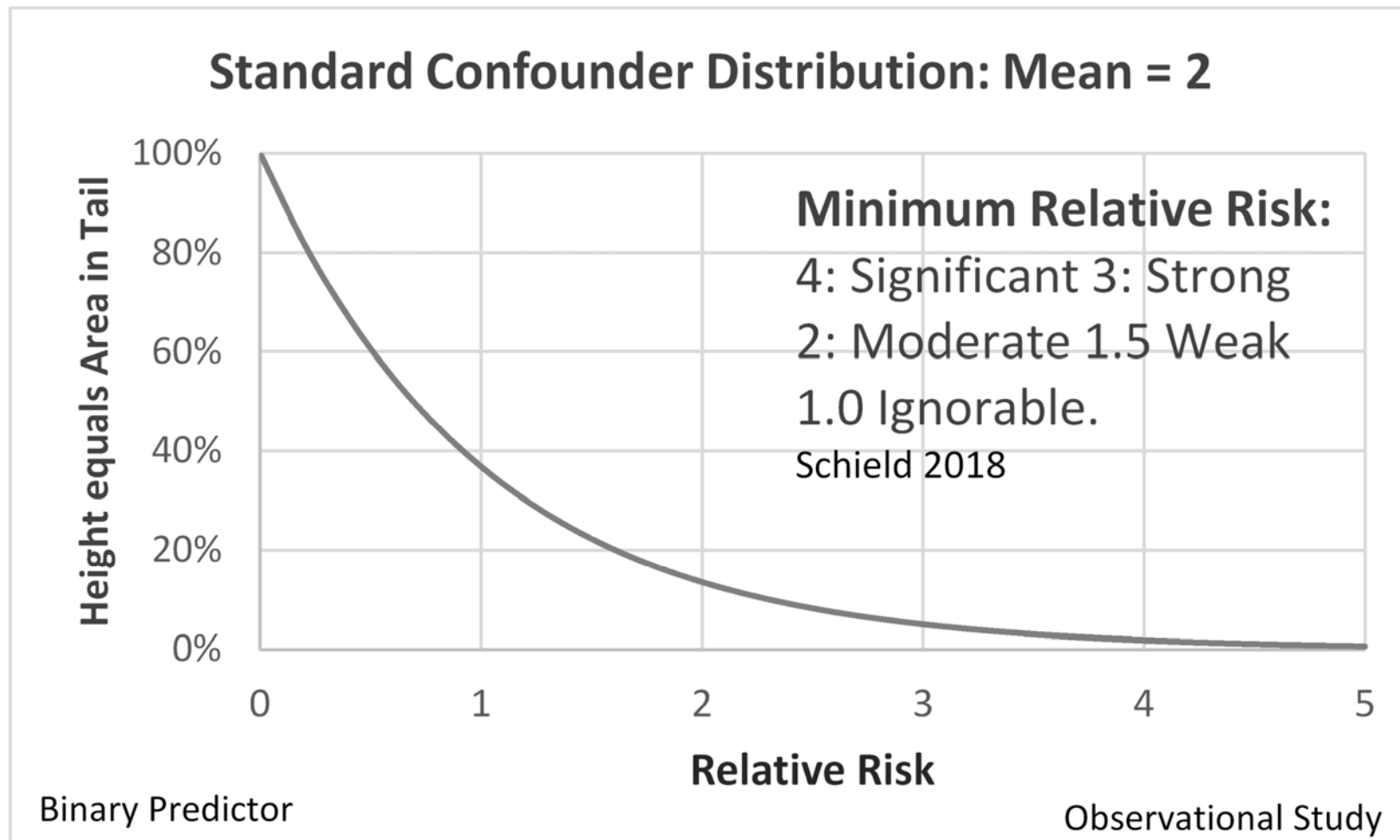
Since confounders may be unknown, there is no way to derive or infer their distribution.

Schild (2018) argued that we needed a standard for confounder: a standard confounder distribution.

He proposed an exponential (one factor determined) with a mean relative risk of 2.

This applied if predictor and confounder are binary.

# Confounder Distribution Unknown & Unknowable



# **Controlling for a Confounder: Graphical Technique**

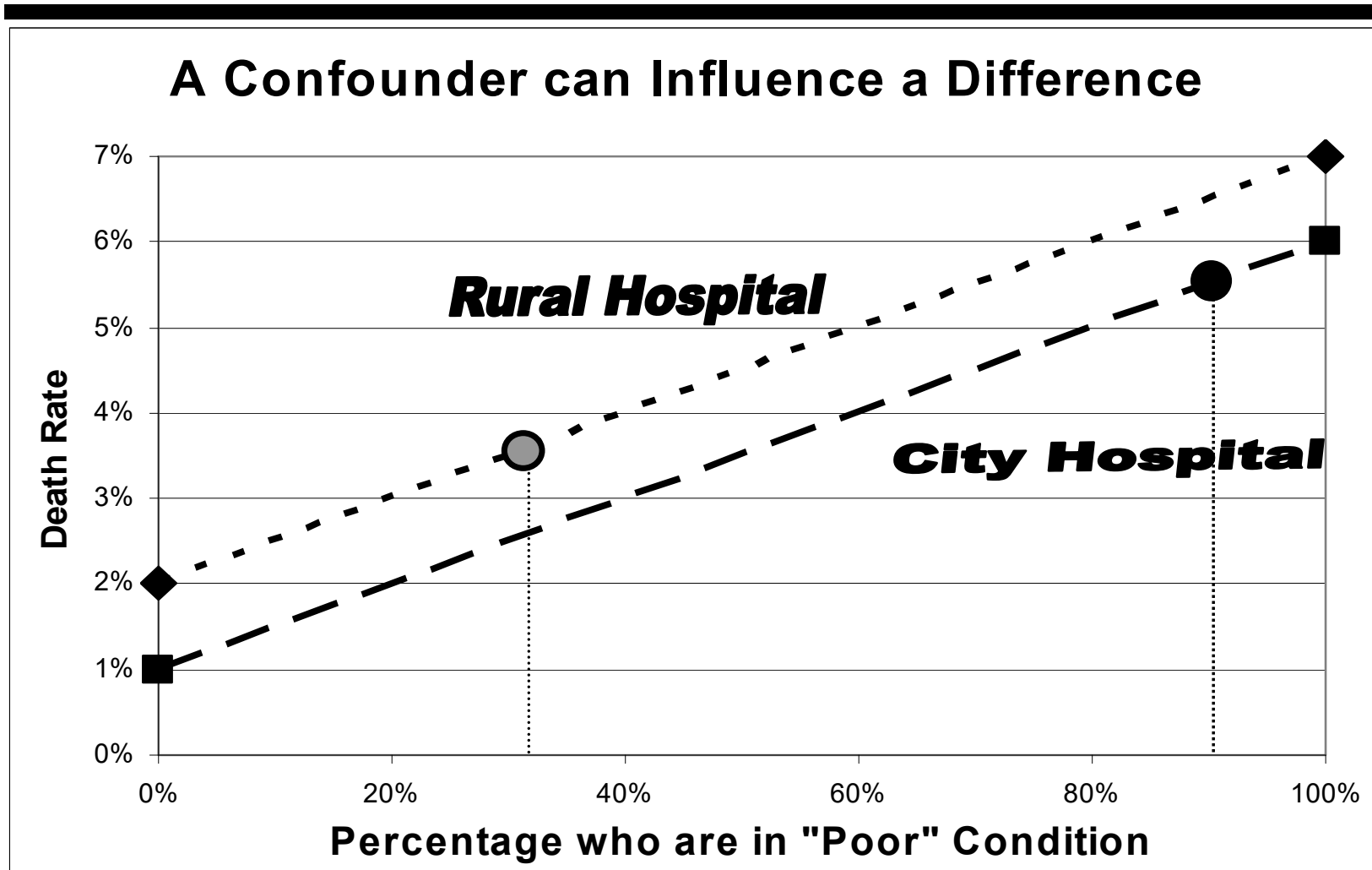
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Wainer introduced a simple graphical technique that made the control of a binary confounder a relatively simple matter.

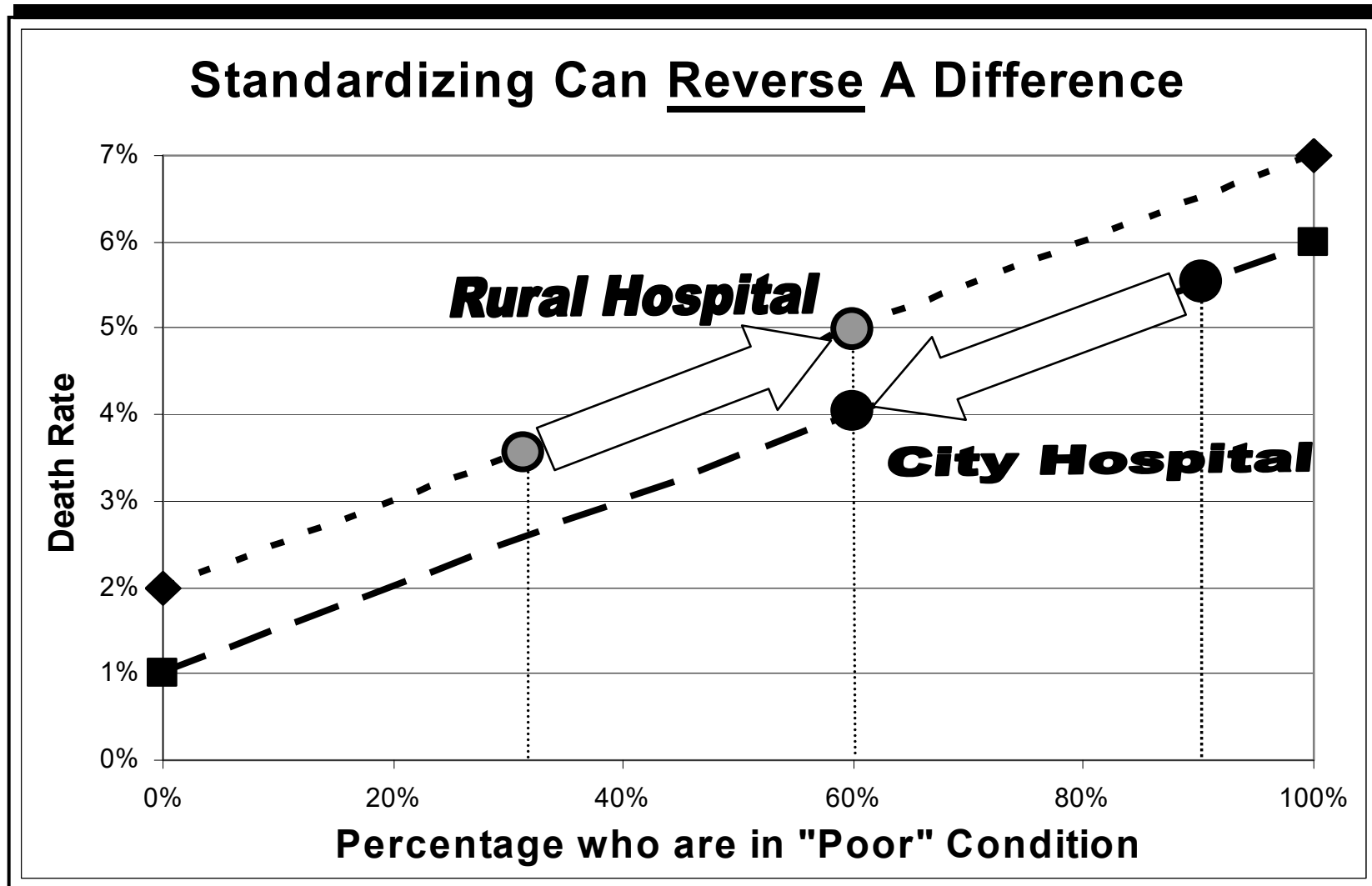
Schild (2006). Presenting Confounding Graphically Using Standardization, *STATS* magazine.

[www.statlit.org/pdf/2006SchildSTATS.pdf](http://www.statlit.org/pdf/2006SchildSTATS.pdf)

# Crude Association: Death Rate: City > Rural

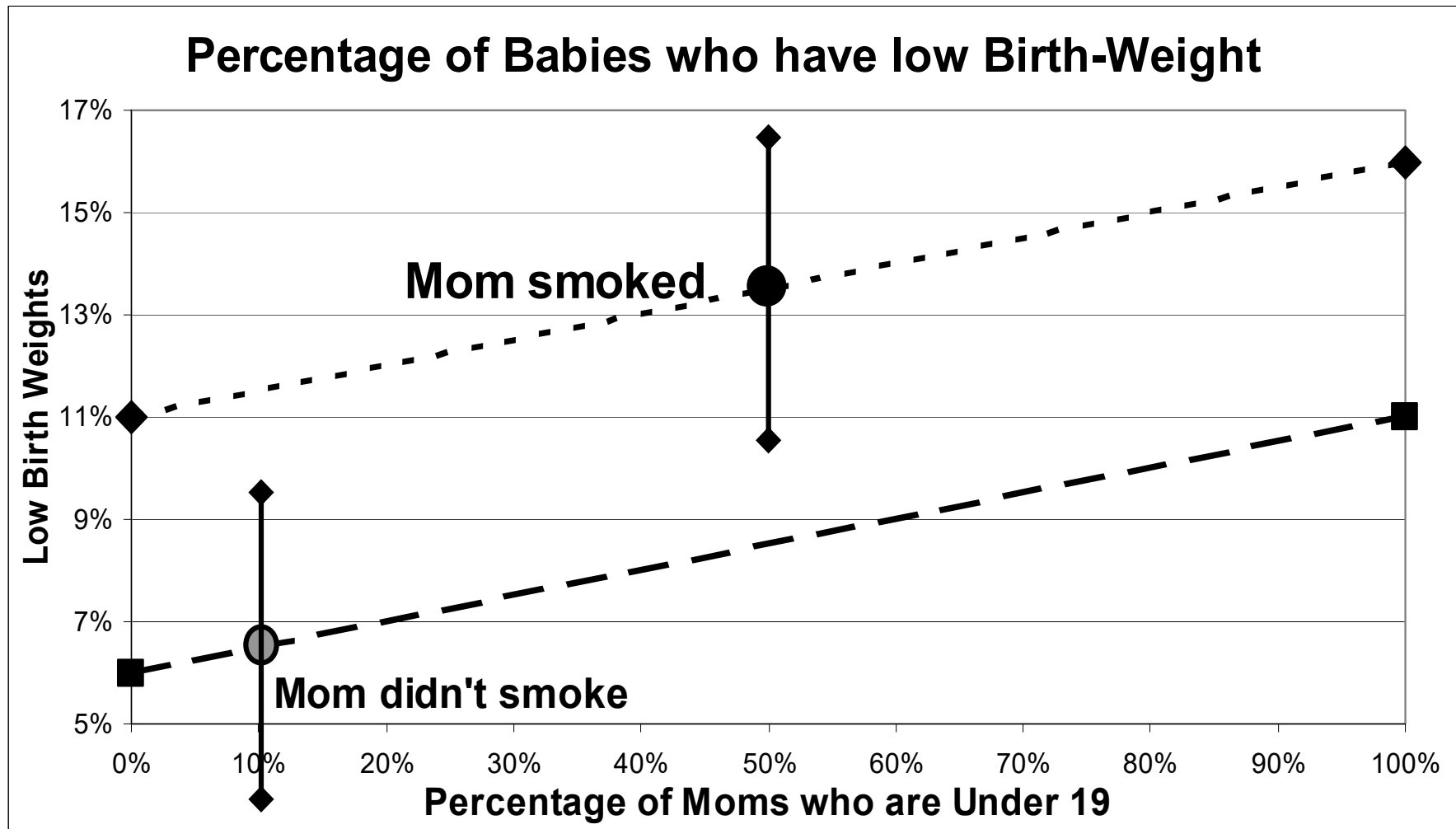


# Controlling for a Confounder: Death Rate: City < Rural

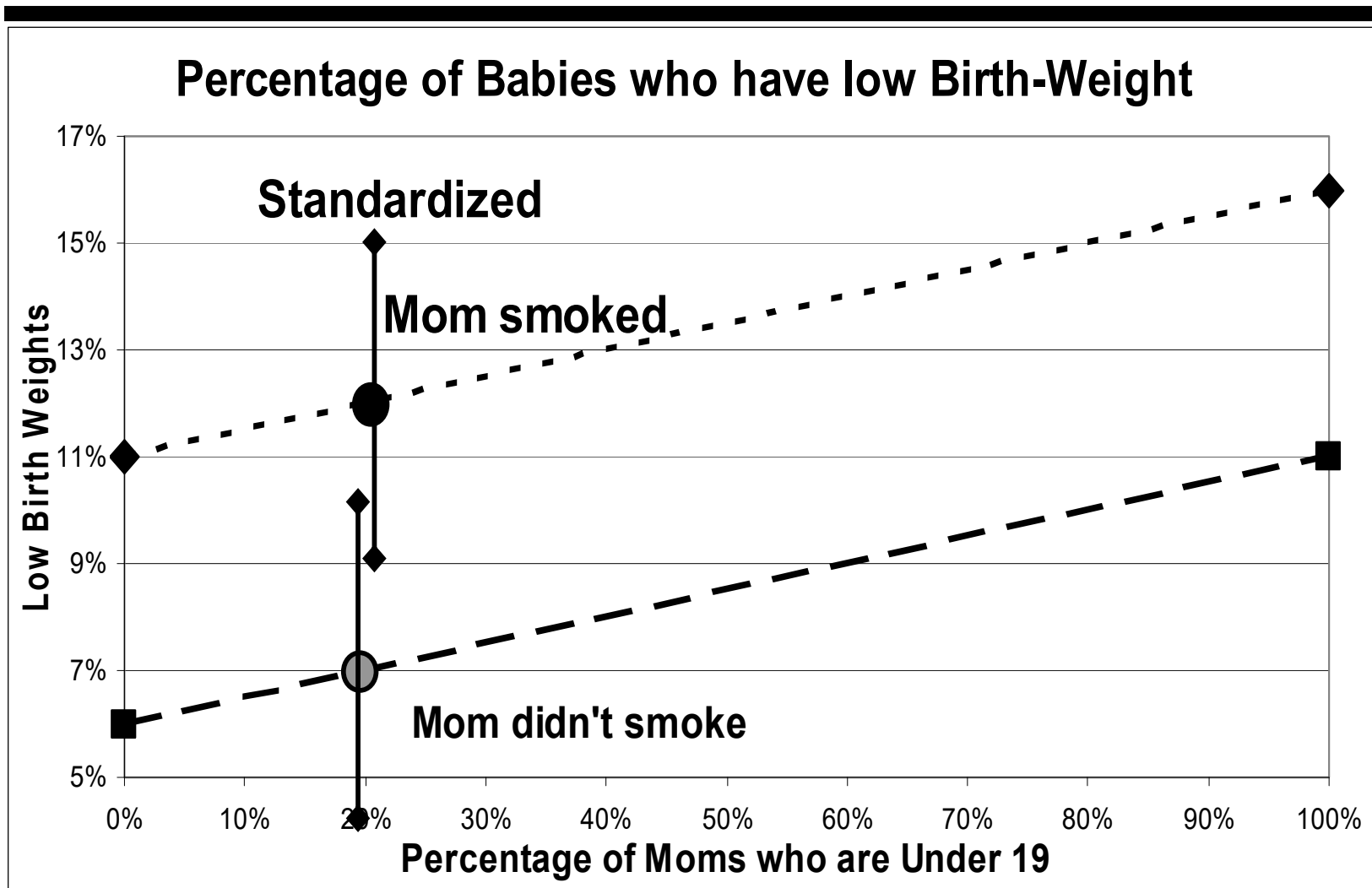




# Crude Association: Statistically Significant



# Standardized Association: Statistically Insignificant



## **Confounder Effect on Statistical Significance**

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Controlling for a confounder can transform a statistically-significant association into an association that is statistically insignificant.

Although statistical educators are clearly aware of this, there is nothing in any introductory textbook that alerts students to this possibility.

The failure to show a significance reversal is *statistical negligence*.