

# EXAM

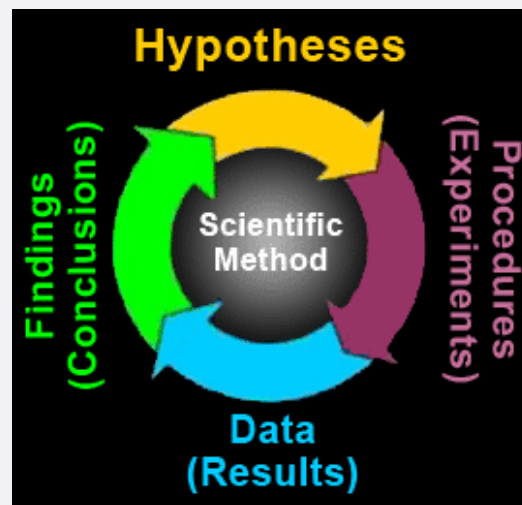
- **Wednesday Dec 8: Exam #3**
  - **Bring a calculator (no phone etc.)**
  - **Allowed to bring one single-page letter-size (8.5x11) sheet with you. What you put on it is up to you, but it has to be your own sheet (we'll collect it)**
- **If you take exam at CDR, please sign up now!**

# EXAM

- **Material covered**
  - **Everything from Nov 3 (More Bivariate Hypothesis Testing, Hypothesis Testing When Using a Sample) to Dec 6 (next Monday)**

# SCIENTIFIC PROCESS

- Formulate research question
- Propose explanation/theory, hypotheses
- Data collection process
- Use data to evaluate hypotheses
- Reassess explanation



# LINEAR REGRESSION

- **General form:  $y = a + b * x$** 
  - **y: dependent variable**
  - **a: intercept**
  - **b: slope**
  - **x: independent variable**
- **Interpretation**
  - **Slope: For every one unit increase in x, y changes by b units**
  - **Intercept: When  $x=0$ , y takes the value a**
- **Caveat**
  - ***Linear* relationships**

# R-SQUARE

- $R^2$  tells us how much variation of the dependent variable is explained by the independent variable (in a linear regression)

# USING SAMPLES

- **Bivariate relationship between two variables in sample**
- **Is this a real relationship that we would find in the population as well, or is it something that only shows up in our sample?**

# HYPOTHESIS

- $H_0$ : In the population, there is *no relationship* between dependent and independent variable
  - If there is a difference in the sample, it is due to random sampling error
- $H_A$ : There *is* a relationship between the independent and dependent variable in the population

# ERRORS

	There Is A Relation In The Population	There Is No Relation In The Population
We Conclude There Is A Relation	✓	✗ Type I
We Conclude There Is No Relation	✗ Type II	✓



# ERRORS

	There Is A Relation In The Population	There Is No Relation In The Population
We Conclude There Is A Relation	✓	<div>✗ Type I in at most 5% of cases</div>
We Conclude There Is No Relation	<div>✗ Type II</div>	✓

# IDEA

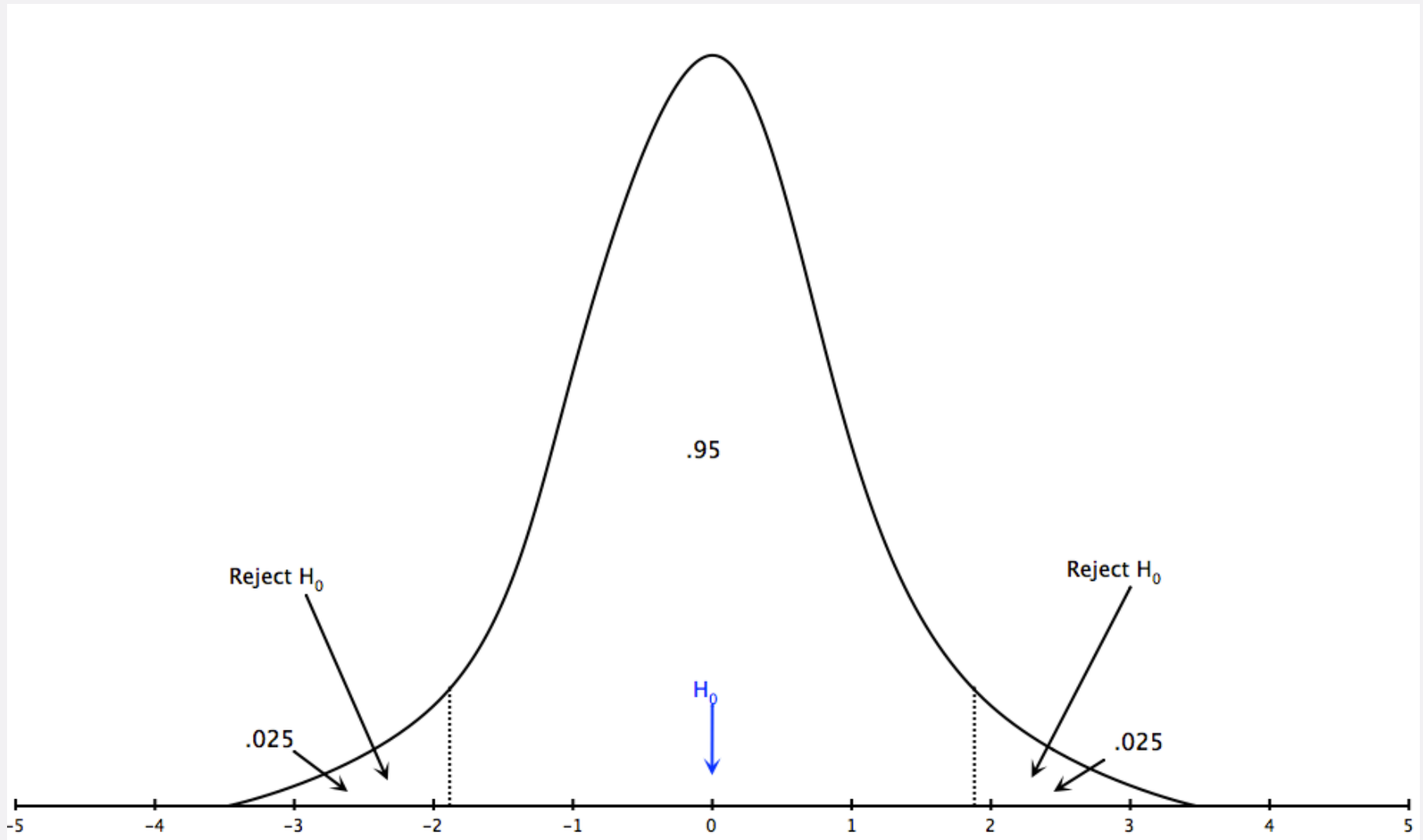
- We start out thinking  $H_0$  is true
  - No relationship between X and Y in population
- We ask: If  $H_0$  is true, how likely is it that a random sample would produce an effect as large (or larger) than the one we have observed?
  - If less than 5% ( $p < 0.05$ ): we reject  $H_0$
  - If more than 5% ( $p > 0.05$ ): we don't reject  $H_0$

# T-STATISTIC

$$t = \frac{H_A - H_0}{\text{Standard Error}}$$

- $H_A$ : observed relation between  $X$  and  $Y$  in sample
- $H_0$ : relation between  $X$  and  $Y$  if  $H_0$  is true

# SIGNIFICANCE TEST



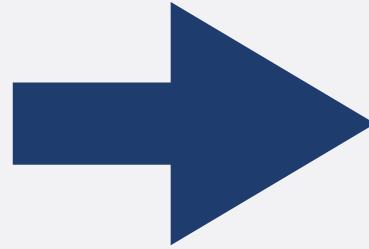
- We reject  $H_0$  if  $t < -1.96$  or  $t > 1.96$
- This is equivalent to  $p < 0.05$

# HURDLES TO CAUSALITY

- Is there a credible causal mechanism that connects  $X$  to  $Y$ ?
- Can we rule out the possibility that  $Y$  could cause  $X$ ?
- Is there covariation between  $X$  and  $Y$ ?
- Have we controlled for all confounding variables ( $Z$ ) that might make the association between  $X$  and  $Y$  spurious?

# BIVARIATE RELATIONSHIP

**Partisanship**



**Evaluation of  
Afghanistan  
involvement**

- **Zero-order effect: Non-Democrats are 22.2% more likely to agree that Afghanistan involvement was beneficial than Democrats**

# MAYBE THIS IS GOING ON?

**Gender (Z)**

W might be more  
critical of

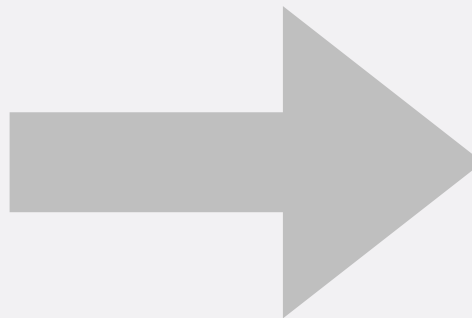
benefits of war than  
M

W more likely to be  
Democrats than M

**Partisanship (X)**

**Afghanistan  
position (Y)**

Maybe partisanship by  
itself has no effect on  
climate change position



# TERMINOLOGY

- **Controlled effect**: relationship between an independent variable (X) and a dependent variable (Y) within one value of another independent variable (Z)



# CONTROLLED COMPARISON TABLE

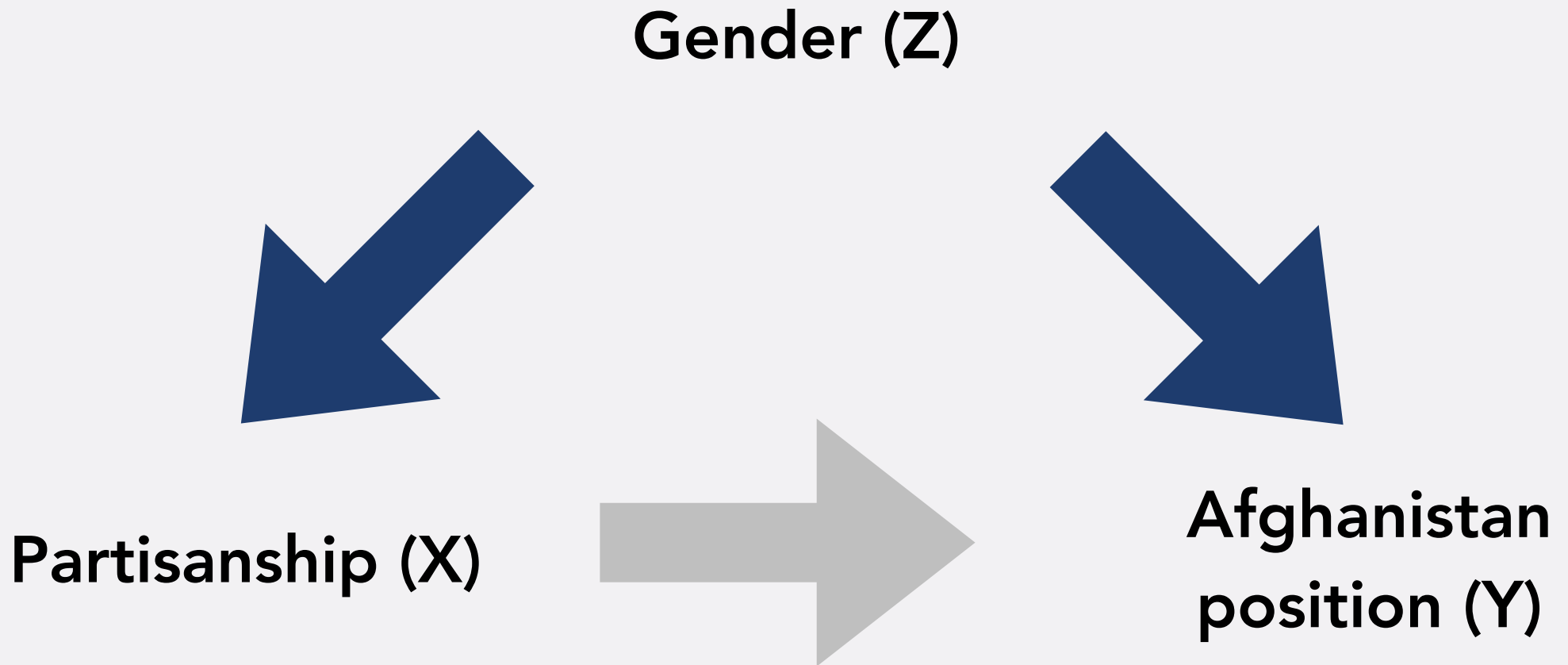
Afghanistan war was beneficial

Female				Male		
	Dem	Non-Dem	Total	Dem	Non-Dem	Total
	22.3%			21.7%		
Agree	18.9%	41.2%	25.9%	20.0%	41.7%	29.6%
	(7)	(7)	(14)	(3)	(5)	(8)
Disagree	81.1%	58.8%	74.1%	80.0%	58.3%	70.4%
	(30)	(10)	(40)	(12)	(7)	(19)
Total	100%	100%	100%	100%	100%	100%
	(37)	(17)	(54)	(15)	(12)	(27)

# CONTROLLED EFFECT

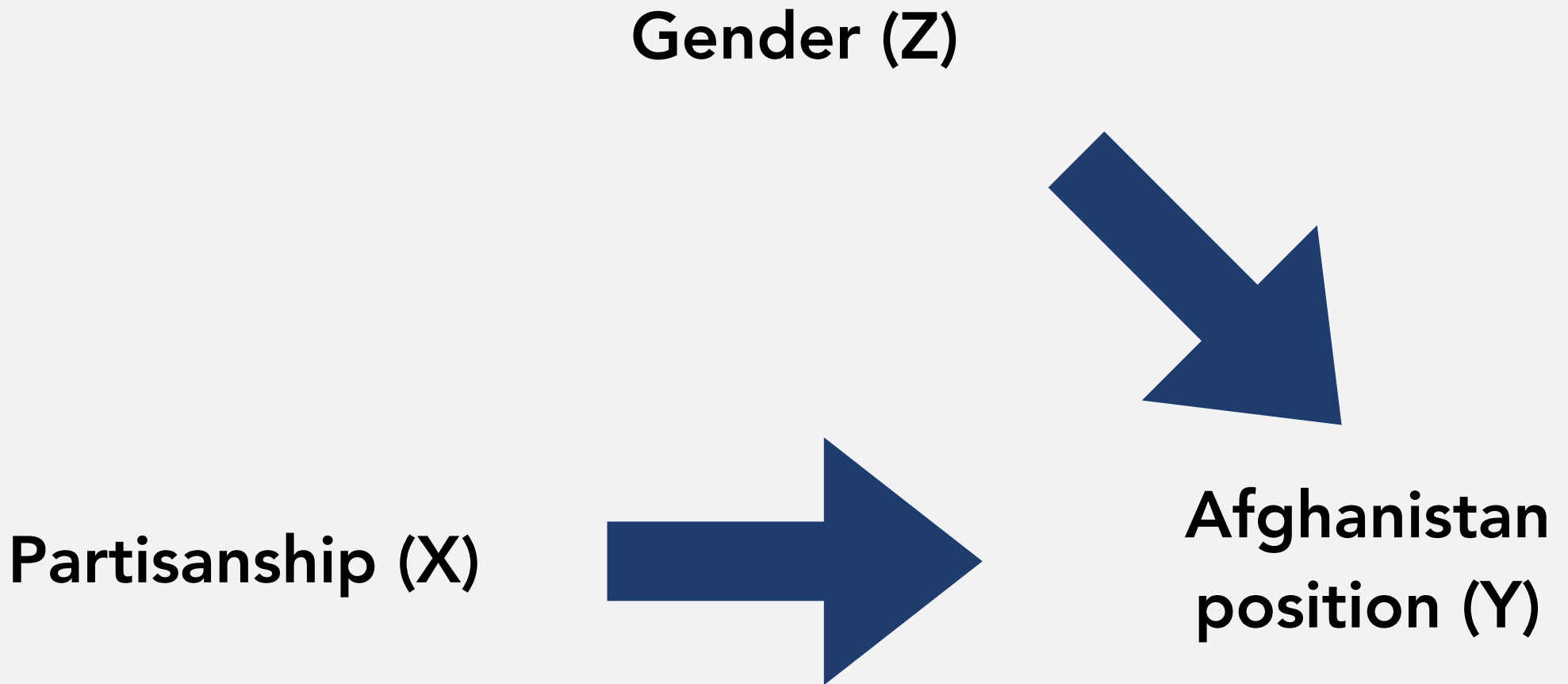
- Even when looking just among men, and just among women, partisanship still has an effect on Afghanistan evaluation
- Effect of partisanship holds when “controlling for” gender

# SPURIOUS RELATIONSHIP



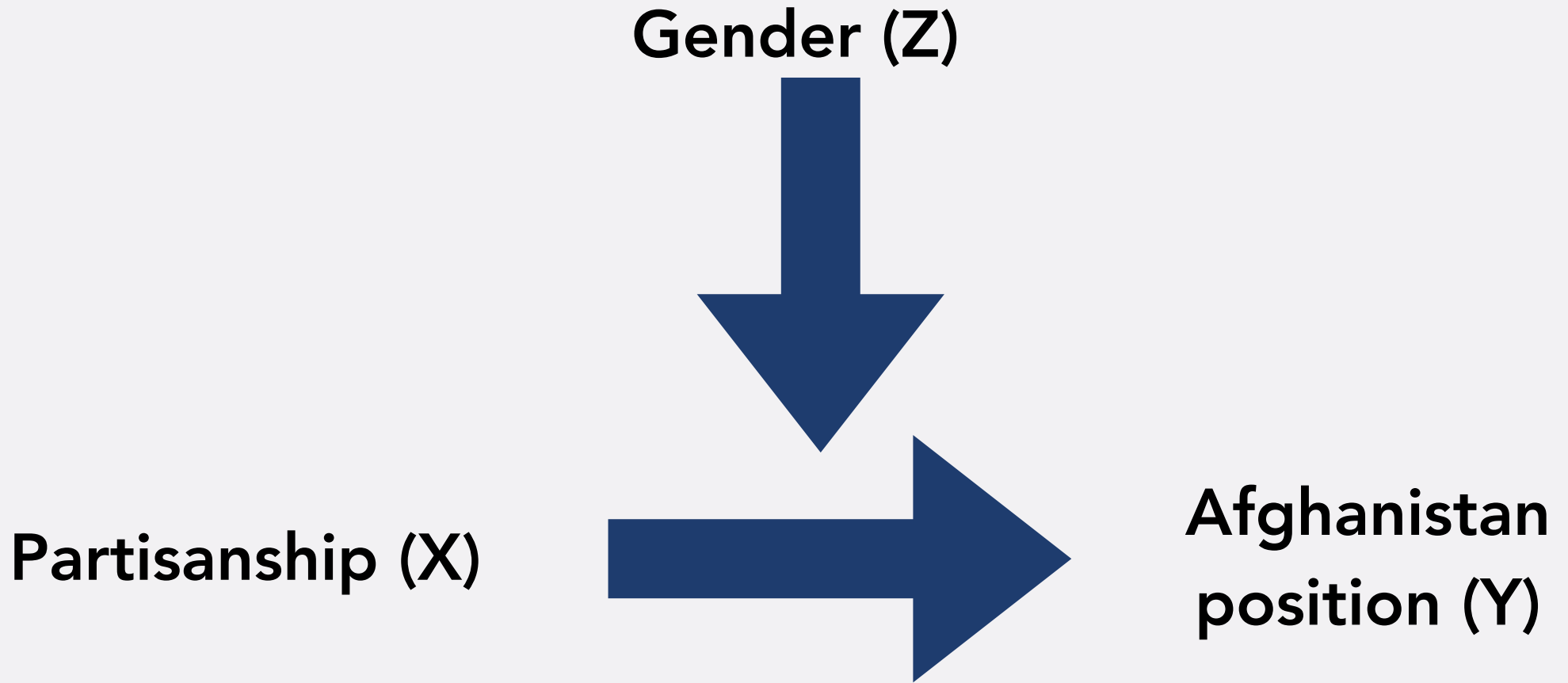
- Once we control for gender, no independent effect of partisanship
- All controlled effects zero or close to zero

# ADDITIVE RELATIONSHIP



- Both partisanship *and* gender determine Y
- Controlled effects not zero and of roughly same size

# INTERACTIVE RELATIONSHIP



- Gender determines how much partisanship affects Y
- Controlled effects not zero and of different size

# MULTIPLE REGRESSION

- **Another way to control for potential confounding variables: multiple regression**
  - **Allows us to control for many potential confounders**

# DV: APPROVAL OF J. BIDEN

	Coefficient	Standard Error	T-Value
Intercept	101.8	60.8	1.68
Liberal-Conservative	-0.44	0.15	-2.93
Age	-1.89	3.08	-0.61
Gender (Male)	11.66	6.29	1.85

**R<sup>2</sup>: 0.15**

# EFFECT OF LIB/CONS

- **Coefficient: -0.44**
- **Interpretation: For every one point increase on the liberal-conservative scale, the evaluation of J. Biden decreases by 0.44 points, *holding all other independent variables constant***



# EFFECT OF LIB/CONS

$$t = \frac{H_A - H_0}{\text{Standard Error}}$$

$$t = \frac{-0.44 - 0.00}{0.15} = -2.93$$

- We reject  $H_0$ , so effect of liberal-conservative on evaluation is significant at the 5% level

# DV: APPROVAL OF J. BIDEN

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# EFFECT OF GENDER

- Coefficient: -11.66
- Interpretation: If someone is male, their evaluation of J. Biden is expected to be 11.66 points higher than if someone is female, *holding all other independent variables constant*

# EFFECT OF GENDER

- **t-value: 1.85**
- **We do not reject  $H_0$ , so effect of gender on evaluation is not significant at the 5% level**

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# PREDICTED VALUE

- **Evaluation =  $101.8 - 0.44 * \text{Lib/Cons} - 1.89 * \text{Age} + 11.66 * \text{Gender (Male)}$**
- **Expected approval for someone who is:**
  - 50 on Lib/Cons scale
  - 22 years old
  - Male

# PREDICTED VALUE

- **Evaluation =  $101.8 - 0.44 * \text{Lib/Cons} - 1.89 * \text{Age} + 11.66 * \text{Gender (Male)}$**
- **Expected approval for someone who is:**
  - 50 on Lib/Cons scale
  - 22 years old
  - Male
- **Evaluation =  $101.8 - 0.44 * 50 - 1.89 * 22 + 11.66 * 1 = 49.88$**

# DV: APPROVAL OF J. BIDEN

	Coefficient	Standard Error	T-Value
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# OBSERVATIONAL RESEARCH DESIGN

- **Linear regression is (usually) used in observational research design**
  - **Takes data as we find it in the world**
  - **Regression isolates the independent effect of  $X$  on  $Y$ , controlling for other variables (=potential alternative explanations)**

# OBSERVATIONAL RESEARCH DESIGN

- **Can never be sure we controlled for all potential alternative explanations**
  - **Potentially low internal validity**

# EXPERIMENTAL RESEARCH DESIGN

- Researchers *actively decide* assignment of the independent variable
- Treatment and control groups
  - Subjects randomly allocated

# EXPERIMENTAL RESEARCH DESIGN

- On average, treatment and control group are the same on *every* variable we can think of
  - *Except* on the independent variable of interest, where researcher assigns treatment and control
  - Unlikely that differences in Y between treatment and control groups caused by other variables
  - High internal validity

# TYPES OF EXPERIMENTS

- **Field Experiment**
- **Lab Experiment**
- **Survey Experiment**

# ISSUES WITH EXPERIMENTS

- **May lack external validity**
- **Ethics issues**
- **Cannot study many things we are interested in experimentally**