

Stat 411/511

# STATISTICAL INFERENCE

Jan 18 2012

Charlotte Wickham

[stat511.cwick.co.nz](http://stat511.cwick.co.nz)

# Today

- **Scopes of statistical inference**  
Study design
- **Quantifying evidence**  
Study design + data

# Inference

A conclusion that patterns in the data are present  
in some broader context

# Inference

A conclusion that patterns in the data are present in some broader context

## Statistical Inference

An inference justified by a **probability model** linking the data with the broader context

---

**Creativity scores in two motivation groups, and their summary statistics**

---

**Motivation Group**

	<u><i>Intrinsic</i></u>		<u><i>Extrinsic</i></u>		
	12.0	20.5	5.0	17.4	
	12.0	20.6	5.4	17.5	
	12.9	21.3	6.1	18.5	
	13.6	21.6	10.9	18.7	
	16.6	22.1	11.8	18.7	
	17.2	22.2	12.0	19.2	
	17.5	22.6	12.3	19.5	
	18.2	23.1	14.8	20.7	
	19.1	24.0	15.0	21.2	
	19.3	24.3	16.8	22.1	
	19.8	26.7	17.2	24.0	
	20.3	29.7	17.2		
<b>Sample Size:</b>	24		23		
<b>Average:</b>	19.88	-	15.74	= 4.1	
<b>Sample Standard Deviation:</b>	4.44		5.25		

Read: 1.1.1 in Sleuth

---

**Creativity scores in two motivation groups, and their summary statistics**

---

Does intrinsic motivation improve creativity?

**Motivation Group**

***Intrinsic***

***Extrinsic***

12.0	20.5	5.0	17.4
12.0	20.6	5.4	17.5
12.9	21.3	6.1	18.5
13.6	21.6	10.9	18.7
16.6	22.1	11.8	18.7
17.2	22.2	12.0	19.2
17.5	22.6	12.3	19.5
18.2	23.1	14.8	20.7
19.1	24.0	15.0	21.2
19.3	24.3	16.8	22.1
19.8	26.7	17.2	24.0
20.3	29.7	17.2	

<b>Sample Size:</b>	24		23	
<b>Average:</b>	19.88	-	15.74	= 4.1
<b>Sample Standard Deviation:</b>	4.44		5.25	

Read: 1.1.1 in Sleuth

---

**Creativity scores in two motivation groups, and their summary statistics**

---

Does intrinsic motivation improve creativity?

		<u>Motivation Group</u>			
		Assigned randomly by researcher			
		<u>Intrinsic</u>		<u>Extrinsic</u>	
	12.0	20.5		5.0	17.4
	12.0	20.6		5.4	17.5
	12.9	21.3		6.1	18.5
	13.6	21.6		10.9	18.7
	16.6	22.1		11.8	18.7
	17.2	22.2		12.0	19.2
	17.5	22.6		12.3	19.5
	18.2	23.1		14.8	20.7
	19.1	24.0		15.0	21.2
	19.3	24.3		16.8	22.1
	19.8	26.7		17.2	24.0
	20.3	29.7		17.2	

<b>Sample Size:</b>	24		23	
<b>Average:</b>	19.88	-	15.74	= 4.1
<b>Sample Standard Deviation:</b>	4.44		5.25	

Read: 1.1.1 in Sleuth

---

**Creativity scores in two motivation groups, and their summary statistics**

---

Does intrinsic motivation improve creativity?

		<u>Motivation Group</u>		
		Assigned randomly by researcher		
		<u>Intrinsic</u>	<u>Extrinsic</u>	
	12.0	20.5	5.0	17.4
	12.0	20.6	5.4	17.5
	12.9	21.3	6.1	18.5
	13.6	21.6	10.9	18.7
	16.6	22.1	11.8	18.7
	17.2	22.2	12.0	19.2
	17.5	22.6	12.3	19.5

The intrinsic group has a creativity score 4.1 points higher than the extrinsic group

	20.5	29.7		17.2	
<b>Sample Size:</b>		24		23	
<b>Average:</b>		19.88	-	15.74	= 4.1
<b>Sample Standard Deviation:</b>		4.44		5.25	

# Statistical Inference

# Statistical Inference

Data



Broader context

# Statistical Inference

Question of interest

Data  Broader context

# Statistical Inference

Question of interest

Data



Broader context

Mechanism of chance

# Statistical Inference

Question of interest



Does intrinsic motivation  
improve creativity?

# Statistical Inference

Question of interest



Does intrinsic motivation  
improve creativity?

Creativity scores  
for an intrinsic and  
extrinsic group

# Statistical Inference

Question of interest



Does intrinsic motivation  
improve creativity?



# Statistical Inference

Question of interest



Does intrinsic motivation  
improve creativity?



# Two scopes of inference

# Two scopes of inference

## Causal inference

The difference seen in the data was due to the group assignment. Cause and effect relationship.

# Two scopes of inference

## Causal inference

The difference seen in the data was due to the group assignment. Cause and effect relationship.

## Population inference

The difference seen in the data can be inferred to a wider population.

# Two mechanisms of chance

# Two mechanisms of chance

## Random sampling

Subjects are selected from a population at random.

# Two mechanisms of chance

## Random sampling

Subjects are selected from a population at random.

## Random allocation to groups

Subjects are assigned a group (or treatment) at random.

# Two mechanisms of chance

## Random sampling

Subjects are selected from a population at random.

## Random allocation to groups

Subjects are assigned a group (or treatment) at random.

# Two mechanisms of chance

## Random sampling

Subjects are selected from a population at random.

## Random allocation to groups

Subjects are assigned a group (or treatment) at random.

**controlled experiment**

# Two mechanisms of chance

## Random sampling

Subjects are selected from a population at random.

## Random allocation to groups

Subjects are assigned a group (or treatment) at random.

**controlled experiment**

If group assignment is not controlled  
**observational study**

Statistical inferences permitted by study designs

ALLOCATION OF UNITS TO GROUPS

By Randomization

Not by Randomization

SELECTION OF UNITS

At Random

*A random sample is selected from one population; units are then randomly assigned to different treatment groups.*

*Random samples are selected from existing distinct populations.*

*Inferences to the populations can be drawn*

Not at Random

*A group of study units is found; units are then randomly assigned to treatment groups.*

*Collections of available units from distinct groups are examined.*

*Causal inferences can be drawn*

Question 1 on HW#1

# Your turn

For each of the following studies decide on the scope of the inferences that could be made:

I compare the heights between male and female students in ST411/511.

I assign you randomly to labs and compare the average midterm grades between the 8am and noon lab classes.

I randomly sample OSU students with a GPA  $\geq 3$  and randomly sample OSU students with GPA  $< 3$ . I compare the number of facebook friends of the high and low GPA samples.

I randomly sample 1000 people living in Corvallis and ask whether they commute by bike.

I pick 20 students in class and give them a extra review lecture every week and compare their final grades to the rest of the class.

# Remember

For **population inference** the subjects must be **randomly sampled** from the **population of interest**.

For **causal inference** the **group membership** must be **randomly assigned** (must be a controlled experiment).

Why do groups need to be randomly assigned for cause and effect?

A **confounding variable** is related to both group assignment and outcome, and makes it hard to determine cause and effect.

The difference in the outcome might be due to the confounder not the group membership.

Example: people who live in houses with  $> 2$  bathrooms have higher blood pressure, wealth might be a confounder.

Randomly assigning subjects to groups breaks the relationship.

# Your turn

Come up with potential confounders for these (fictitious) cause and effect relationships:

- Eating oatmeal increases your jogging stamina.
- Breastfeeding babies increases infant mortality.
- Cold weather makes Oregonians spend more money.
- Commuting by bike decreases your commute time.

Which could you do a controlled experiment on?

# The mechanism of chance:

- determines how our findings can be extended to a broader context.

Study design

- allows us quantify the evidence the data gives us.

Study design + data