

# Comparison of Learning Outcomes from Traditional and Randomization-Based Inference Curricula in a Designed Experiment

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# Outline

- Comparing Inference Curricula
- Experimental Design
- Data Collection
- Model
- Results
- Conclusions

# Comparing Inference Curricula

- Traditional Approach
  - Central Limit Theorem
  - Normal Based Inference
  - Normal Tables and Formulas
- Randomization-Based Approach
  - Bootstrap Confidence Intervals
  - Randomization/Permutation Tests
  - Tactile and Computer Simulation

# Comparing Inference Curricula

Week	Traditional Curriculum	Randomization-Based Curriculum
1	Introduction	Introduction
2	One Variable Descriptive	One Variable Descriptive
3	Two variable Descriptive	Two variable Descriptive
4	Linear Regression	Linear Regression
5	Experimental Design	Experimental Design
6	Probability	Probability
7	Binomial Distribution	Binomial Distribution
8	Midterm Exam	Midterm Exam
9	<b>Normal Distribution</b>	<b>Sampling Distributions</b>
10	<b>Sampling Distributions</b>	<b>Bootstrap Confidence Intervals</b>
11	<b>Central Limit Theorem (CLT)</b>	<b>Randomization Tests</b>
12	<b>Inference for single proportions</b>	<b>Normal Distribution and CLT</b>
13	<b>Inference for prop. and means</b>	<b>Inference for single proportions</b>
14	<b>Inference for single means</b>	<b>Inference for single means</b>
15	<b>Inference for two means</b>	<b>Inference for two means</b>
16	<b>Final Exam</b>	<b>Final Exam</b>

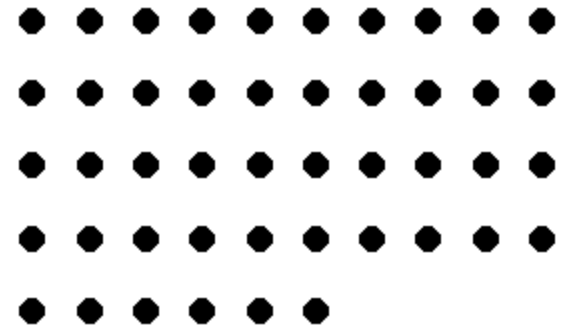
# Experimental Design

- 116 Students enrolled into Stat 104
  - 4 Students dropped by week 2
- 112 Students randomly assigned to inference curricula beginning in week 9
  - 11 Students did not consent to data release
  - 101 Students consented to data release
- Experimental Design utilized co-teaching structure and room scheduling isolate curricula effect

46 Consenting Students in Section 1

Lecture TR 8:00-9:00

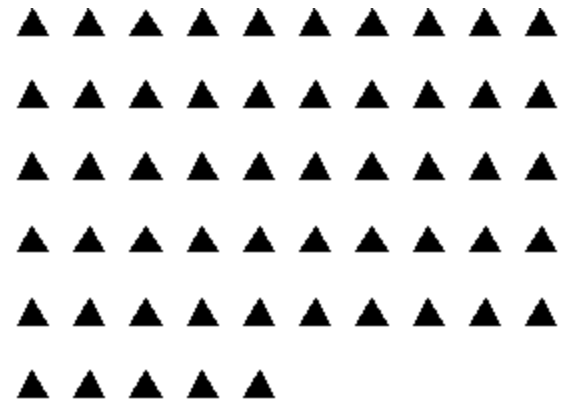
Lab F 8:00-10:00



55 Consenting Students in Section 2

Lecture TR 8:00-9:00

Lab F 10:00-12:00



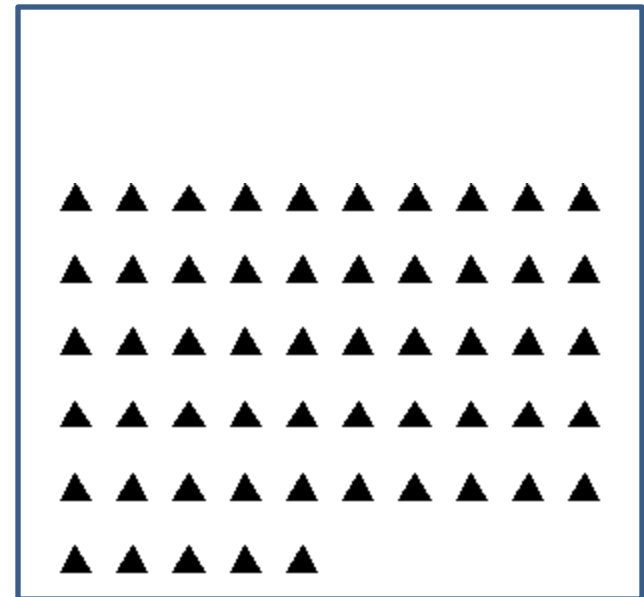
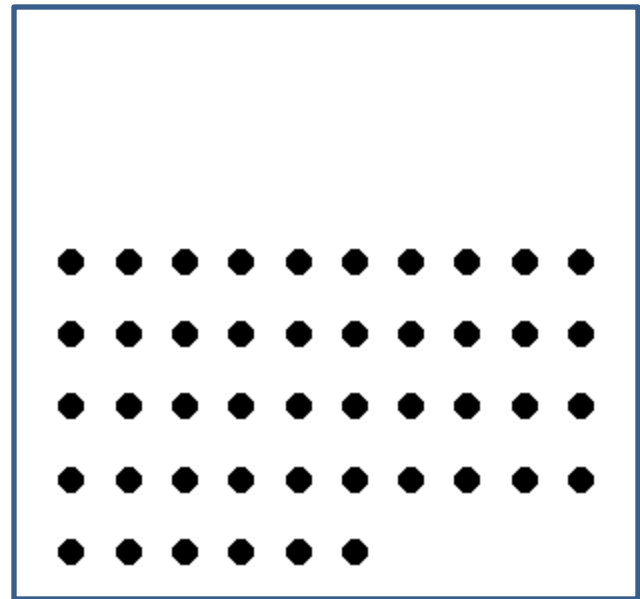
# Co-teaching Structure



Instructor 1  
*(Dennis Lock)*




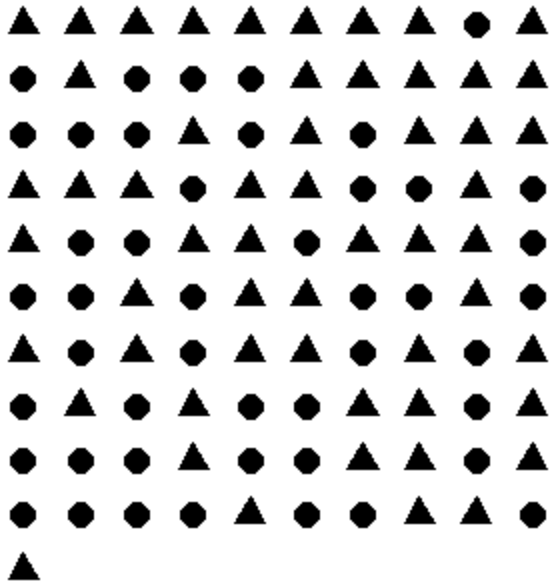
Instructor 2  
*(Karsten Maurer)*




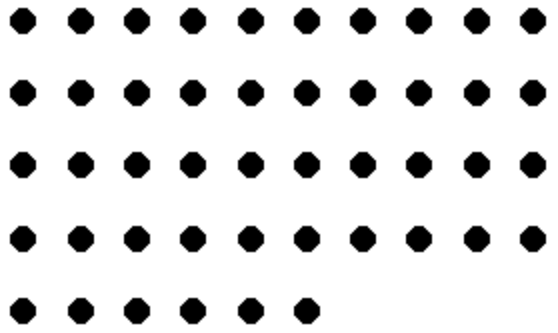
# Week 1


(Non-Inference Topics)

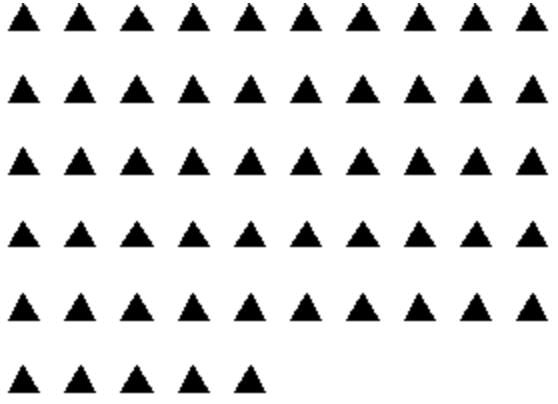
 *Large Lecture Hall*  
Lecture TR 8:00-9:00



 *Lab Room 1*  
Lab F 8:00-10:00



 *Lab Room 1*  
Lab F 10:00-12:00



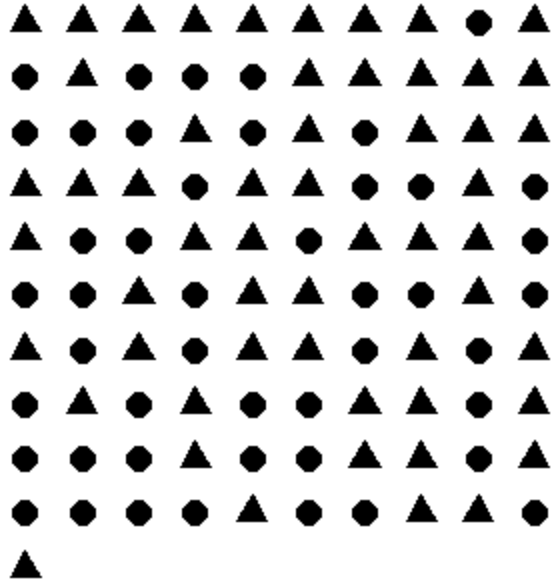


# Week 2

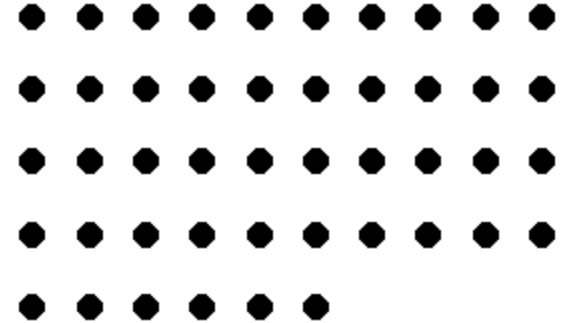
(Non-Inference Topics)



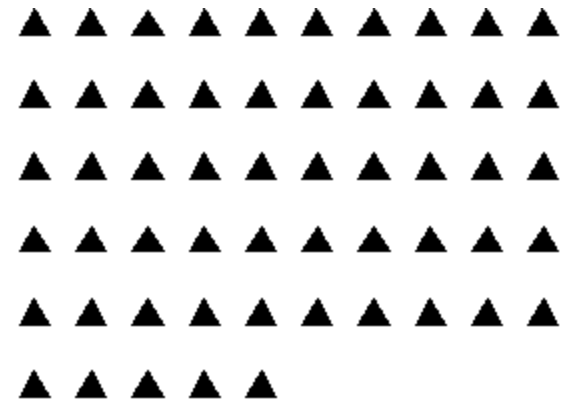
*Large Lecture Hall*  
Lecture TR 8:00-9:00



*Lab Room 1*  
Lab F 8:00-10:00



*Lab Room 1*  
Lab F 10:00-12:00

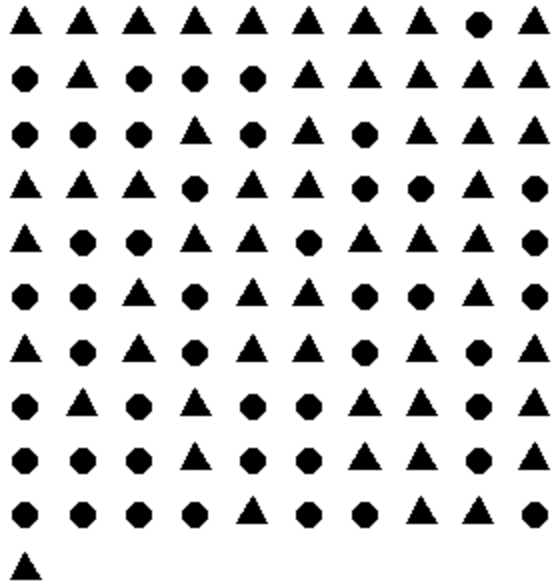


# Week 1,3,5,7

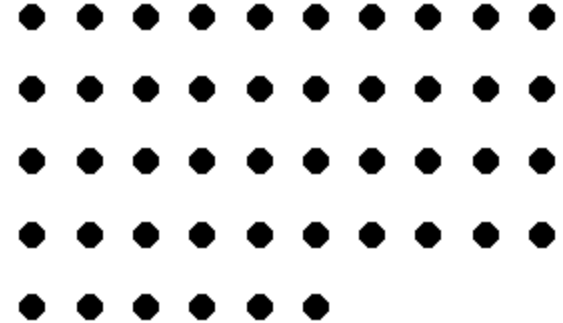
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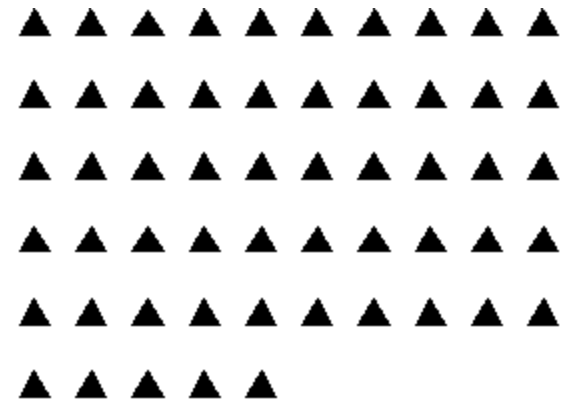
*Large Lecture Hall*  
Lecture TR 8:00-9:00



*Lab Room 1*  
Lab F 8:00-10:00



*Lab Room 1*  
Lab F 10:00-12:00

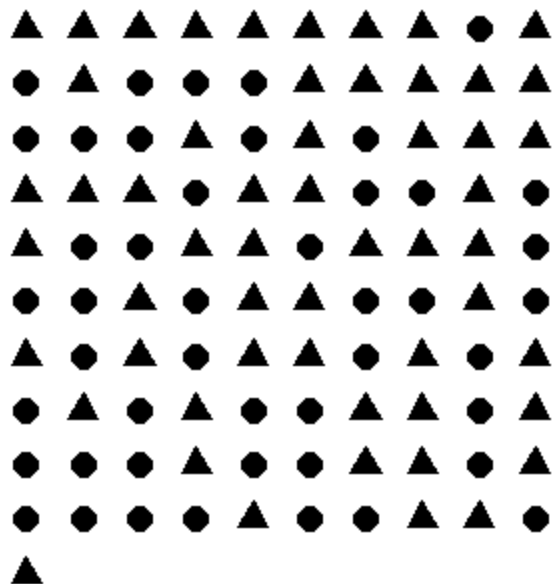


# Week 2,4,6,8

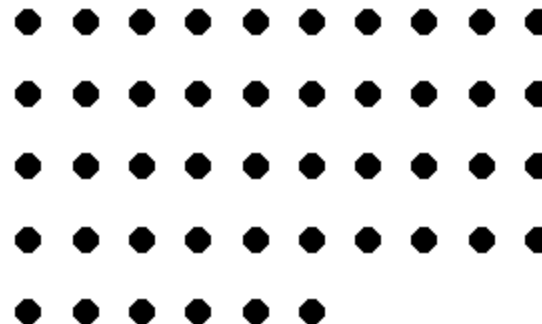
(Non-Inference Topics)



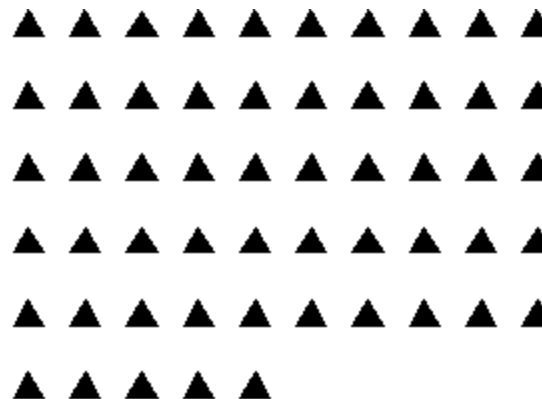
*Large Lecture Hall*  
Lecture TR 8:00-9:00



*Lab Room 1*  
Lab F 8:00-10:00



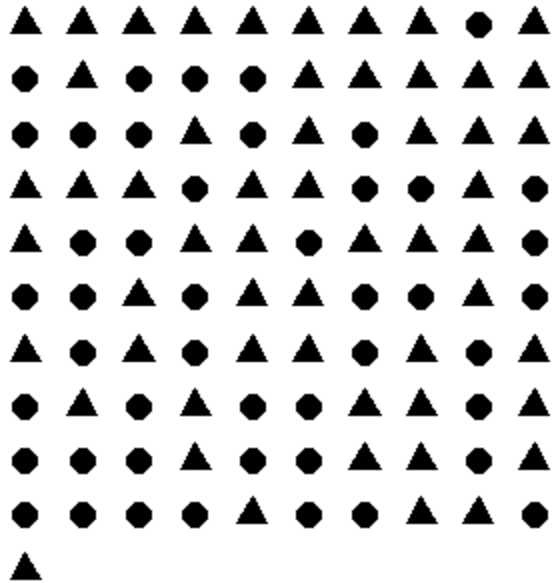
*Lab Room 1*  
Lab F 10:00-12:00



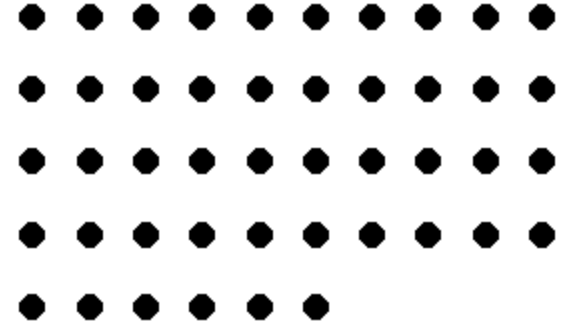
# Random Assignment

Students to Inference Curricula  
Needed for Weeks 9-16

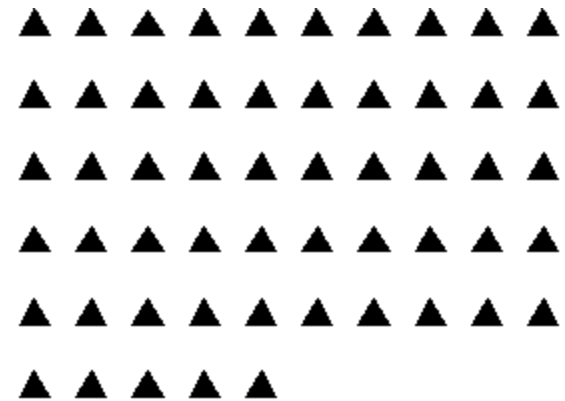
*Large Lecture Hall*  
Lecture TR 8:00-9:00



*Lab Room 1*  
Lab F 8:00-10:00



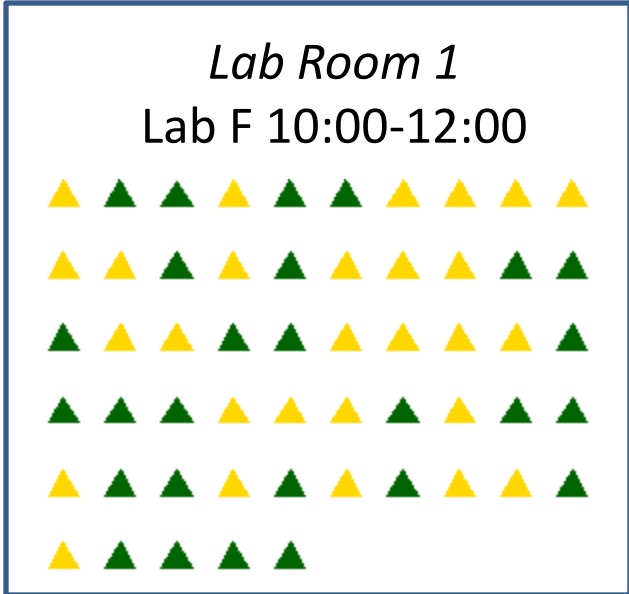
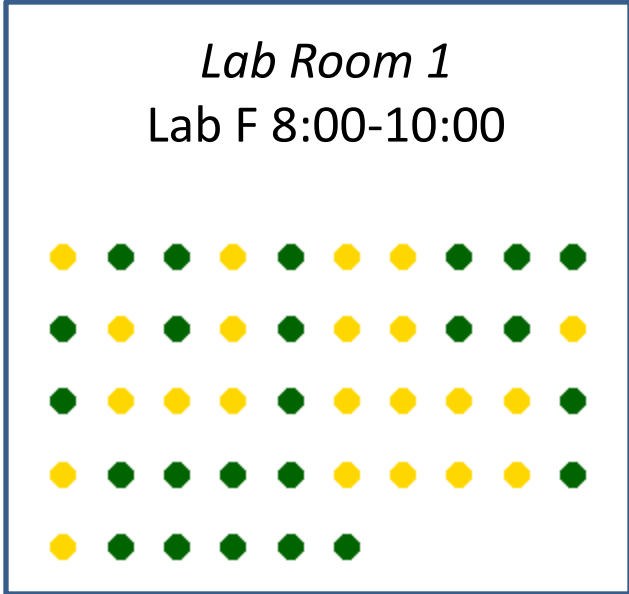
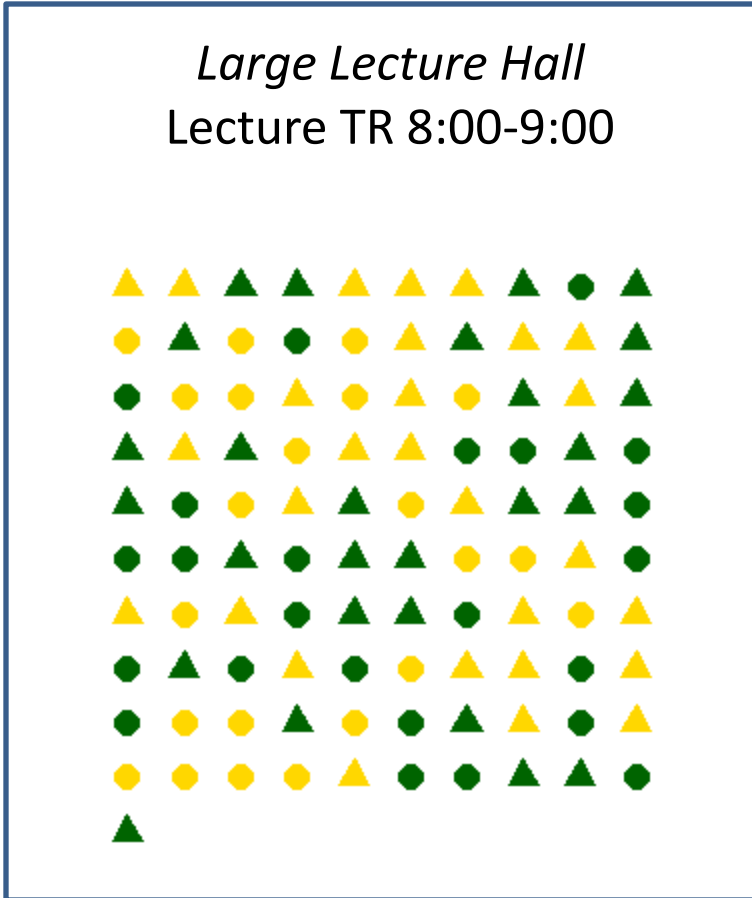
*Lab Room 1*  
Lab F 10:00-12:00



# Random Assignment

Green = Traditional

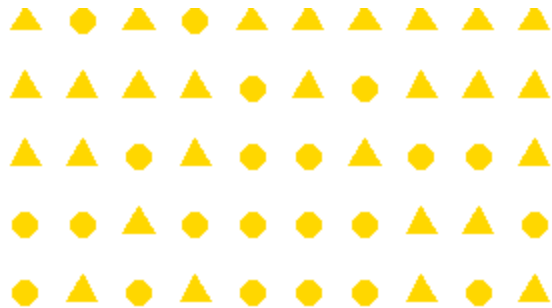
Yellow = Randomization-Based



# Split to New Rooms

## *Small Classroom 1*

Lecture TR 8:00-9:00



## *Lab Room 1*

Lab F 8:00-10:00



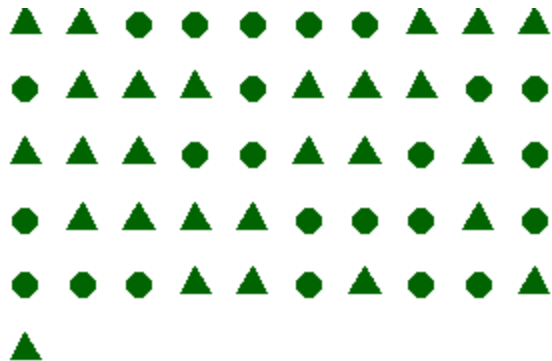
## *Lab Room 1*

Lab F 10:00-12:00



## *Small Classroom 2*

Lecture TR 8:00-9:00



## *Lab Room 2*

Lab F 8:00-10:00





## *Lab Room 2*

Lab F 10:00-12:00





# Week 9

 *Small Classroom 1*  
Lecture TR 8:00-9:00





A grid of 50 yellow shapes representing student seats. The shapes are arranged in 5 rows and 10 columns. The shapes are a mix of triangles and circles, with approximately 25 triangles and 25 circles.

 *Lab Room 1*  
Lab F 8:00-10:00




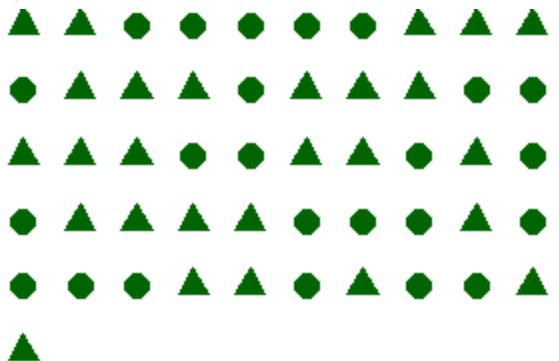
A grid of 20 yellow circles representing student seats. The shapes are arranged in 3 rows: the first two rows have 10 circles each, and the third row has 2 circles.

 *Lab Room 1*  
Lab F 10:00-12:00





A grid of 30 yellow triangles representing student seats. The shapes are arranged in 3 rows: the first two rows have 10 triangles each, and the third row has 10 triangles.

 *Small Classroom 2*  
Lecture TR 8:00-9:00





A grid of 50 green shapes representing student seats. The shapes are arranged in 5 rows and 10 columns. The shapes are a mix of triangles and circles, with approximately 25 triangles and 25 circles.

 *Lab Room 2*  
Lab F 8:00-10:00



A grid of 20 green circles representing student seats. The shapes are arranged in 3 rows: the first two rows have 10 circles each, and the third row has 4 circles.

 *Lab Room 2*  
Lab F 10:00-12:00

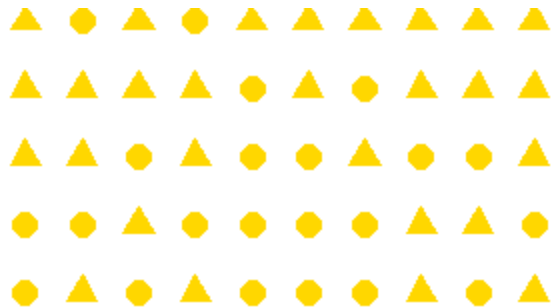


A grid of 30 green triangles representing student seats. The shapes are arranged in 3 rows: the first two rows have 10 triangles each, and the third row has 10 triangles.

# Week 10



*Small Classroom 1*  
Lecture TR 8:00-9:00



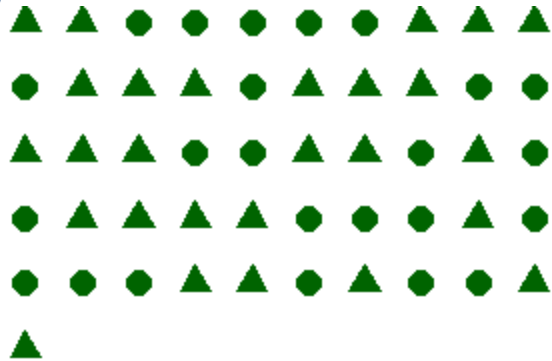
*Lab Room 1*  
Lab F 8:00-10:00



*Lab Room 1*  
Lab F 10:00-12:00



*Small Classroom 2*  
Lecture TR 8:00-9:00



*Lab Room 2*  
Lab F 8:00-10:00





*Lab Room 2*  
Lab F 10:00-12:00







# Week 9,11,13,15

 *Small Classroom 1*  
Lecture TR 8:00-9:00





A 5x10 grid of yellow shapes representing student seats. Row 1: 10 triangles. Row 2: 10 triangles. Row 3: 10 triangles. Row 4: 10 circles. Row 5: 10 triangles.

 *Lab Room 1*  
Lab F 8:00-10:00




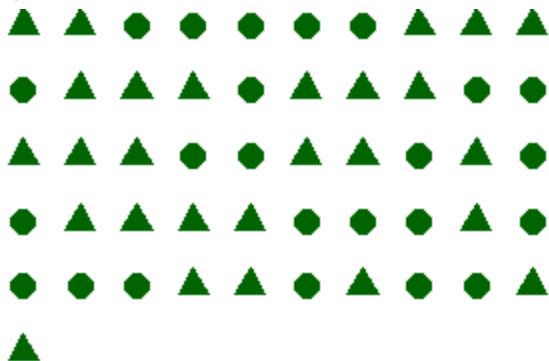
A 3x10 grid of yellow circles representing student seats. Row 1: 10 circles. Row 2: 10 circles. Row 3: 2 circles.

 *Lab Room 1*  
Lab F 10:00-12:00




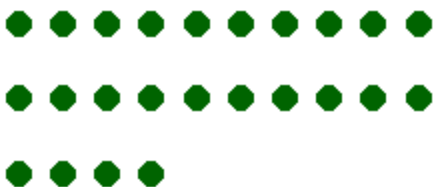
A 3x10 grid of yellow triangles representing student seats. Row 1: 10 triangles. Row 2: 10 triangles. Row 3: 10 triangles.

 *Small Classroom 2*  
Lecture TR 8:00-9:00





A 6x10 grid of green shapes representing student seats. Row 1: 10 triangles. Row 2: 10 triangles. Row 3: 10 triangles. Row 4: 10 triangles. Row 5: 10 triangles. Row 6: 10 triangles.

 *Lab Room 2*  
Lab F 8:00-10:00




A 3x10 grid of green circles representing student seats. Row 1: 10 circles. Row 2: 10 circles. Row 3: 4 circles.


 *Lab Room 2*  
Lab F 10:00-12:00





A 3x10 grid of green triangles representing student seats. Row 1: 10 triangles. Row 2: 10 triangles. Row 3: 10 triangles.


# Week 10,12,14,16


 *Small Classroom 1*  
Lecture TR 8:00-9:00




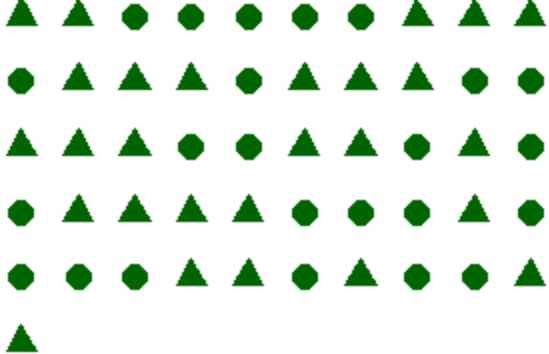
 *Lab Room 1*  
Lab F 8:00-10:00





 *Lab Room 1*  
Lab F 10:00-12:00





 *Small Classroom 2*  
Lecture TR 8:00-9:00



 *Lab Room 2*  
Lab F 8:00-10:00



 *Lab Room 2*  
Lab F 10:00-12:00



# Data Collection

- Course Administration
  - Inference Curriculum Treatment
  - Enrollment Section
- Pre-Treatment Measures
  - Homework 1-7 Scores
  - Lab 1-7 Scores
  - Midterm Exam Score
- Learning Outcomes: ARTIST scaled question sets
  - Hypothesis Testing (HT score)
  - Confidence Intervals (CI score)

# Model

- Student HT and CI scores are bivariate responses
- Use MANCOVA model to incorporate administrative and pre-treatment variables as covariates
- Start with full model including all covariates
- Backward stepwise selection based on AIC
- Final model reduced to three covariates:  
midterm score, Lab 5 score, curriculum treatment

# Results

- Tests for Overall Covariate Significance

	Pillai's $\Lambda$	Approx. F Stat	p-value
Midterm	0.2109	12.8277	< 0.001
Lab 5	0.0792	4.1261	0.0191
Curricula	0.0469	2.3605	0.0998

# Results

- Model Coefficients

	HT coefficient (SE)	CI coefficient (SE)
Intercept	<b>2.1053 (1.0584)</b>	1.4648 (1.0135)
Midterm	<b>0.0386 (0.0118)</b>	<b>0.0477 (0.0113)</b>
Lab 5	0.8547 (0.6618)	<b>1.8274 (0.6337)</b>
Curricula	0.3050 (0.3532)	<b>0.7146 (0.3382)</b>

\***Bold** indicates a significant effect at the  $\alpha = 0.05$  level

# Conclusions

- Randomization-based inference curriculum has a significant improvement in CI learning outcomes
- 7% improvement on the ARTIST scale for CI
- No significant effect of curricula on HT outcomes
  
- Consider causality and applicability of results
  - Experimental design allows for causal inference
  - Representative of all introductory students?
  - What about treatment lead to improved learning outcomes?

# Thanks!

- Dennis Lock : Co-investigator
- Dr. Heike Hofmann: Study Advisor
- Dr. Bob Stephenson : Study Advisor
- All of you for attending



# Any Questions?

- If time does not permit question:
  - Please look for publication (to be submitted next week)
  - Contact me (karstenm@iastate.edu)