### "Innovative" Instruction for Business Analytics

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### Outline

Impact of analytic emphasis on courses

- More content
- More students
- More diverse students

Leverage technology Inside the classroom Outside the classroom



### **Business Analytics**

What is Business Analytics?

Depends on who you ask... Marketing Accounting Management

. . .

Business Analytics differs from Stat Greater emphasis on business context Communication



### Business Context

#### Analysis must have realistic context

#### Problem has to be well motivated

For example, regression analysis should begin with a question rather than with several anonymous columns in a spreadsheet

#### Solution needs to communicate an answer

"The confidence interval for the slope is [-2.8 to -2.0]" isn't enough.

#### Technical skills remain necessary <sup>but not</sup> sufficient Identify the appropriate statistical technique Choose between paired or two-sample comparison, for example. Do the calculations correctly Increasingly the domain of software



### Consequence

More to teach

Business application + Statistical analysis

Often in less time

Two-semester courses are less common

And to bigger classes

Analytics now a very popular major (STEM) Three sections @ 120 each, one TA

How to manage this?



### Approach

**Business context** 

Lecture starts with business question

Defer details of context to the textbook

### Example

#### Hard problem: Regression with logs, elasticity

Varying background of students is a problem. Some have little Econ, see linear demand curves. Few appreciate logs.

#### Connect to obvious problem: optimal price

Elasticity used to set optimal price

#### Along the way: relate logs to percentages

"Variation on log scale is relative variation" "Diff of logs  $\approx$  Pct diff"



#### After problem introduction...

#### Reinforce, expand discussion at "blackboard"

Slide deck is too passive, for both me and my students Research shows writing important for retention Works with large room much better than whiteboard Save and post after class





#### After the blackboard discussion...

#### "Real time" data analysis

Open data file, perform analysis, make choices interactively Exploit interactive modern software





#### After the computing and review of slides...

#### Collaborative quizzes

Grade attendance so they help each other Short, less than 10 minutes total Immediate feedback to them — and to me (Canvas summary statistics)

#### **Quiz Instructions**

Answer the following four questions. Collaboration is encouraged, so talk with your classmates. All of the questions concern the following regression analysis, so read this part first.

Rather than regress prices of used cars on the ages of the cars as done in class on Monday, a data analyst instead regressed prices of these cars on the mileages of the cars, obtaining the following results.

The fitted least squares line is

Estimated price = 39,000 - 0.24 Mileage

with  $r^2=0.37$  with  $s_e=4,500$ 

Question 1	1 pts							
The correlation between miles driven and price is approximately								
○ -0.37								
0.37								
0.6								
○ -0.6								

Attempts: 300 out of 300				
The correlation betwee	n miles driven and price is	approxi	mately	
	9		_	
-0.37	respondents	3 %		
-0.6	238 respondents	<b>79</b> %		
0.6	38 respondents	13 %		
0.37	15 respondents	5 %		

Results in real time



#### Inside the classroom

#### Team quizzes, collaborative

Grade attendance so they help each other Short, 10 minutes total Immediate feedback to them and to me (Canvas summary statistics)

#### "Interactive" iPad discussion

Slide deck is too passive, for both me and my students Research shows writing important for retention Works with large room much better than whiteboard

#### "Real time" data analysis

Open data file, perform analysis, make choices interactively Exploit interactive modern software

#### Slide deck as a review

End class by reviewing slides Defer details, tangental comments



#### Supplements outside the classroom

#### Software movies

Desktop recordings show "how to do it"

Allows classroom session to move without need to show every detail

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#### Supplements outside the classroom

#### Piazza collaborative e-mail

Students can answer questions

Answer the question once, not many many times





#### Supplements outside the classroom

#### Online, randomized assignments (MyLab)

#### Give them multiple attempts Requires students to use software



log(price)



log(price)

log(price)

#### Supplements outside the classroom

#### BlueJeans online office hours

Schedule help sessions in evening, fewer scheduling conflicts Many can participate without crowding Like Skype, but easy for students to use





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### Summary

BA brings challenges handling expanded content and increased enrollment

Adjusting the "usual" course

Motivate stat methods with business problems

Exploit technology where possible

In the classroom...

Interactive data analysis, iPad blackboard, collaborative quizzes

#### Outside the classroom...

Piazza email, Bluejeans shared office hours, software movies Randomized assignments

### How'd it go?

I'll tell you when its done!

