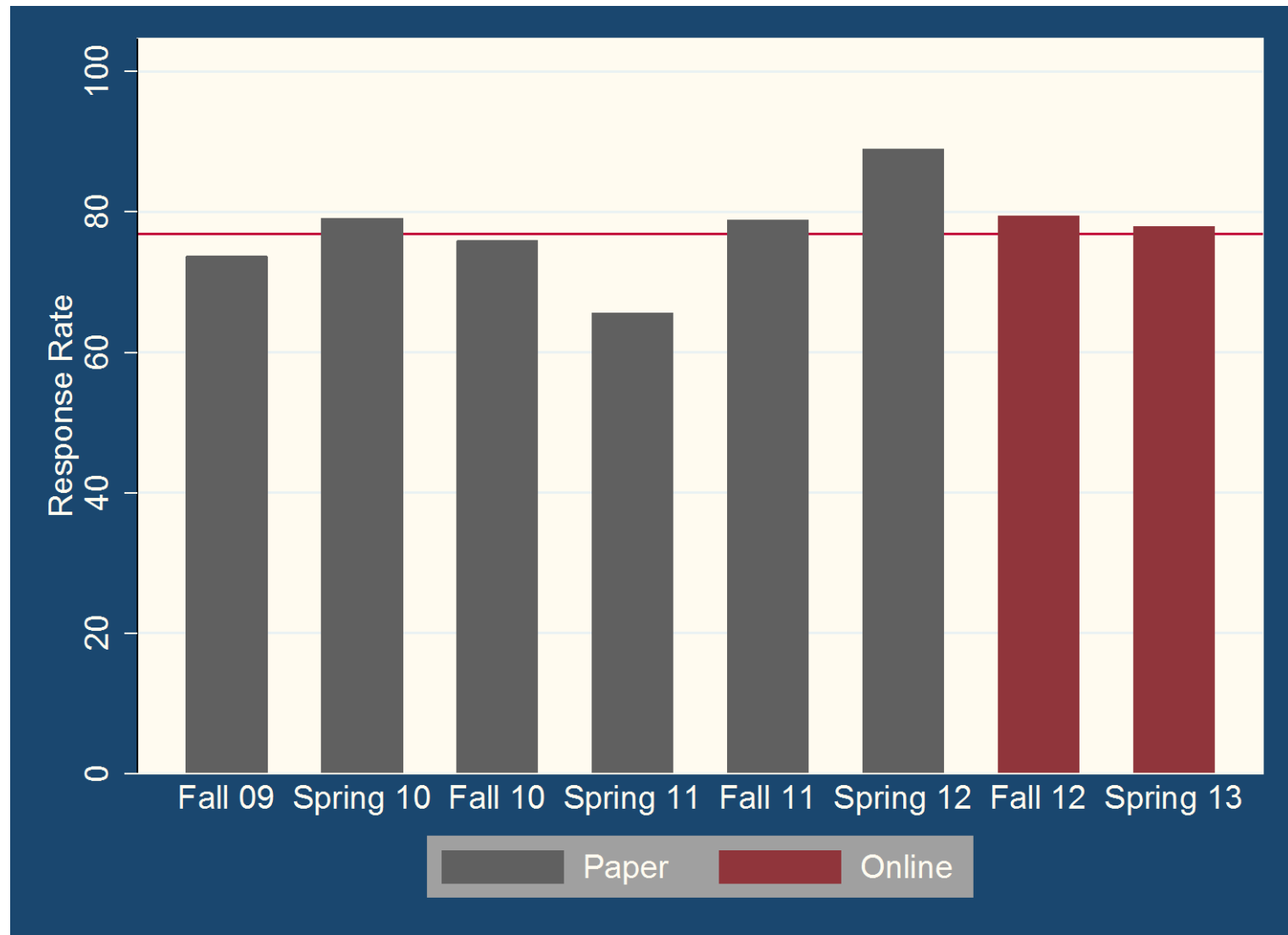


Fixed-effects regression for within-subjects designs: Causal effects of a transition to online course evaluations

- School of Ed. enjoying benefits of online collection
 - Tens of thousands in labor savings
 - Real-time access to reports for faculty and administration
 - Instructional time savings
 - No more missing packets / 0% response rates
- Expanded adoption up to other deans
 - Concerned about impact on scores, response rates
 - Initial results suggested no impact on rates
 - IR initiated study with strong design to discern impacts

Simple Means of Response Rates Suggest No Effect



- Evaluations from Fall 2009 to Spring 2013
 - New form implemented Fall 2009
 - 7 instructor-related questions; 1 global item; 5-pt Likert
 - Online collection began Fall 2012 (same form)
- Course registration database for class size
- Course catalogs 2009-10 to 2012-13
 - Built map of course name / number changes
 - Worked with associate dean
 - Provided largest “same course” sample over time

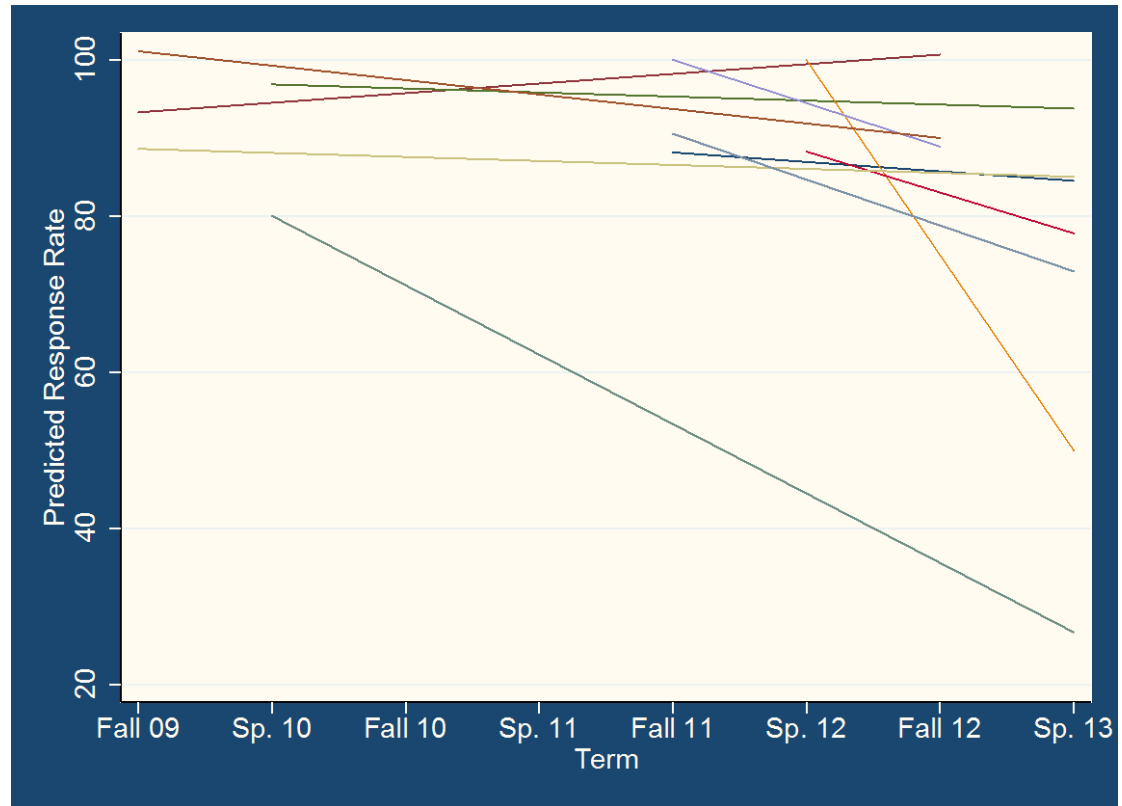
- Remap old course numbers to current naming
- Find instructor-course combos before/after online
- Collapse individual data to section level
- 3 outcomes related to global item
 - Section mean
 - Section standard deviation
 - Response rate
 - Other items correlated with global item $0.78 < p < 0.90!$
- 461 sections
 - 113 instructor/course combos; 2-17 sections each
 - 81 unique courses; 84 unique instructors

Method: Fixed Effects Regression

- Within-subjects design desirable
 - Examine changes over time within each combination
 - Outcome changes unlikely due to curriculum / instruction
 - Immune to mix shifts over time / new courses or programs
- Fixed effects regression
 - Control for all course/instructor factors that do not change
 - Allows other control variables that vary over time

Graphical Intuition of Fixed Effects Model

- Intended to provide intuition only!
- Best-fit line for each instructor-course pairing (in reality it's its own level shift)
- Slope averaged across all lines (not estimated to be its own RV)
- Indicator used to model a level shift due to online collection at and beyond Fall 2012



Panel vs. Pooled OLS Methods

- Superior panel estimators not advisable/possible
 - Unbalanced (inst.-course combos missing) (complicating)
 - 1 to 4 sections at $T_{i,j}$ (-16% sample to solve) (unwilling)
 - Sections not weighted equally (class size) (unable)
- Pooled OLS
 - Indicator variable for every instructor-course combination
 - Model online evaluation with time indicator variable
 - Analytic weights allowed (outcomes are averages)
 - Robust & clustered standard errors to relax assumptions
 - Use all available data

Pooled OLS Model

$$\begin{Bmatrix} \mu_{i,t} \\ \sigma_{i,t} \\ R_{i,t} \end{Bmatrix} = \beta_0 + \beta_1 \text{Online}_{i,t} + \beta_2 \overline{\text{Interest}}_{i,t} + \sum_{j=2}^{113} \beta_{3,j} \text{Line}_{i,j,t} + \epsilon_{i,t}$$

Variable	Mean Rating		S.D. of Ratings		Response Rate	
	β	p	β	p	β	p
Online	0.06	0.14	-0.02	0.50	-12.4	0.00
Interest	0.63	0.00	-0.41	0.00	2.5	0.41
R ²	72.9%		58.9%		49.7%	

- No effect on ratings or distribution of ratings
- Clear negative impact on response rate

Panel Estimator Method Yields Similar Result

```
. xtreg rate q17 online, fe vce(robust)
```

```
Fixed-effects (within) regression                Number of obs   =       388
Group variable: id                             Number of groups =       113

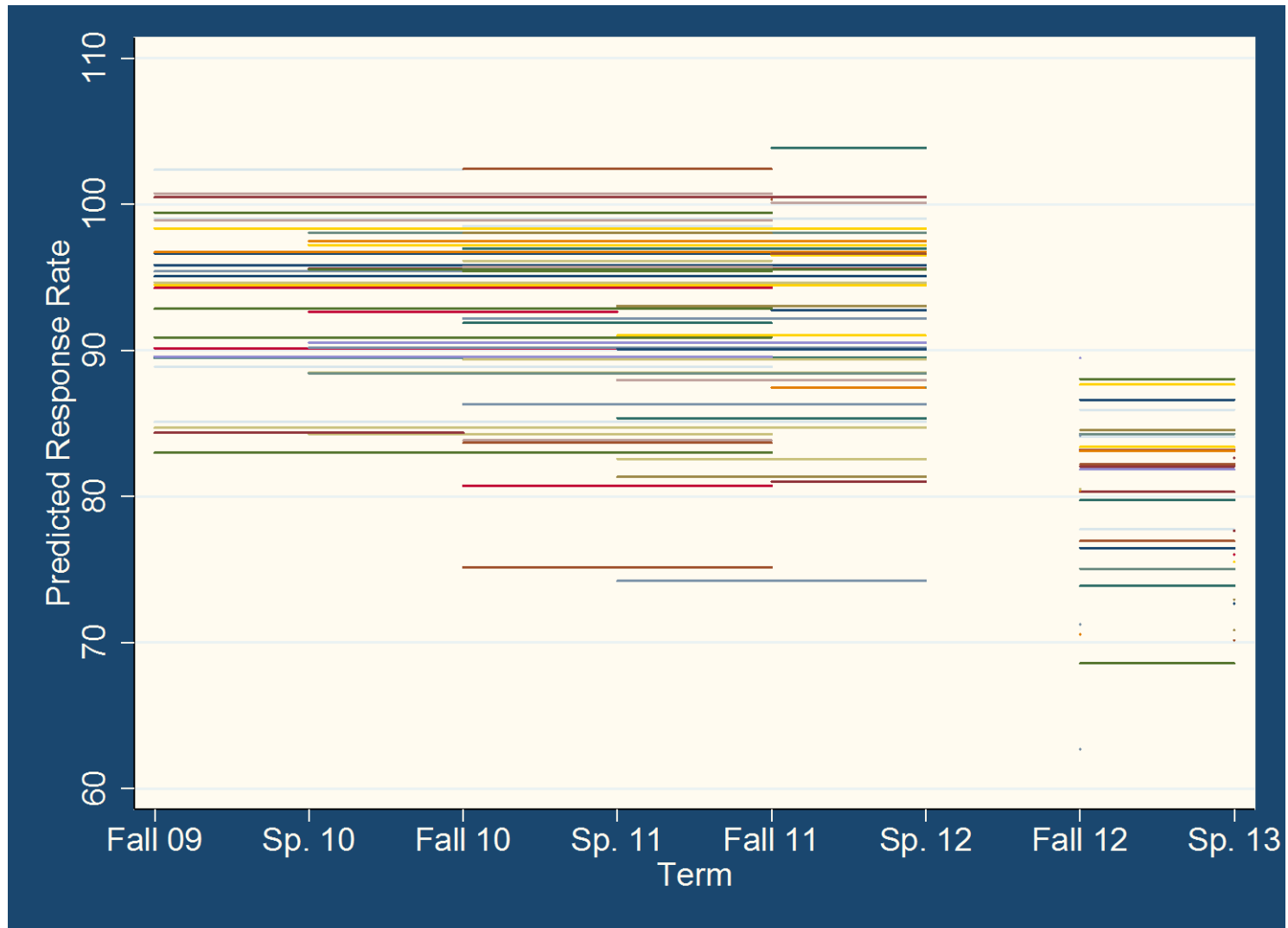
R-sq:  within = 0.3026                          Obs per group:  min =        2
        between = 0.0423                          avg   =        3.4
        overall = 0.2229                          max   =        8

                                                F(2,112)        =       38.29
corr(u_i, Xb) = 0.0118                          Prob > F        =       0.0000
```

(Std. Err. adjusted for 113 clusters in id)

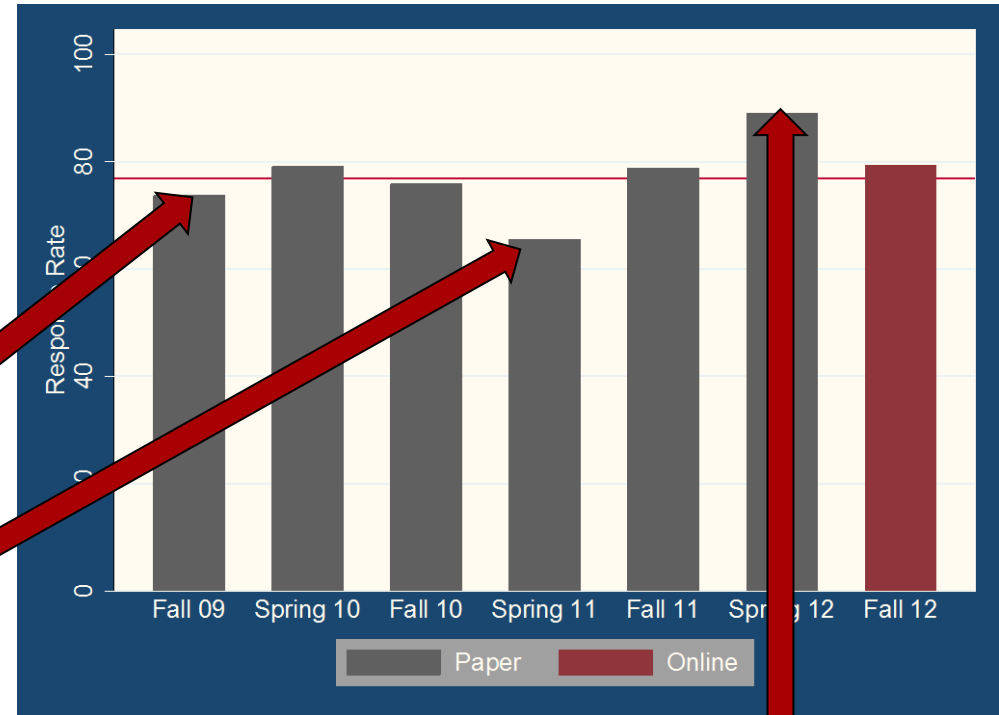
rate	Coef.	Robust Std. Err.	t	P> t	[95% Conf. Interval]	
q17	1.595988	2.855016	0.56	0.577	-4.060861	7.252836
online	-13.05868	1.499591	-8.71	0.000	-16.02993	-10.08744
_cons	85.3433	12.44181	6.86	0.000	60.69144	109.9952
sigma_u	8.4742692					
sigma_e	10.994828					
rho	.37266961	(fraction of variance due to u_i)				

Actual Pooled OLS Graphical Representation



Simple Means Revisited

- Result did not square with administrators' expectations
- Investigation yielded fascinating masking of effects
- Individualized studies
- Exam courses
- Clinical coursework added erroneously
- Faculty saw these paper packets and never bothered (0% rate)



Stopped sending paper evaluations to unmeasured sections.

Had staff had the correct course list from Fall 2009, bars would have been

consistently higher and demonstrated negative effect more clearly

Limitations and Thoughts on Generalization

- Generalization a downside of internally valid designs
- Very specific population
 - Graduate School of Education only
 - Our selection criteria cut 60% of Ed. Sections
- Considerable emphasis on response rate
 - Email alerts to students
 - Space in computer labs dedicated to terminals
 - Encouragement of instructors to convey importance
 - Sub study to look at instructor behavior on response rate

Questions?

Leave business card for a digital copy of paper and slides.

LMU|LA