

# A Data-Driven Approach to Promoting Innovation and Excellence in Teaching at Higher Education Institutions

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- Quantile regression methods for evaluating student equity in STEM
- Data access for senate faculty
- Academic Success Research Fellows Program

# Evaluating Student Equity in STEM

## Introduction

Primary Goal: Use Institutional Data to Identify Faculty Superstars

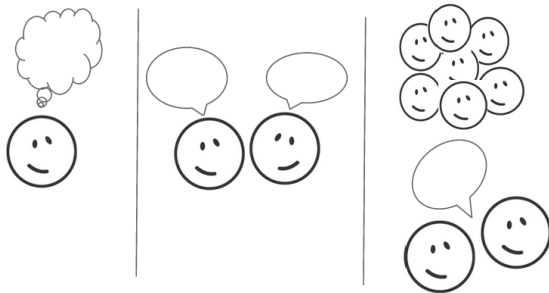
### Data

- Department
- Term
- Student Grades
- Student Demographics
- Previous Academic Performance
- Faculty Demographics

# Evaluating Student Equity in STEM

## Think-pair-share

- Can you think of any other potentially important variables that you would like to include in a model?
- What are some statistical challenges you foresee with identifying faculty superstars?



# Evaluating Student Equity in STEM

## Quantile Regression Model for the $\tau$ th Quantile

$$y_i = x_i^T \beta_\tau + \epsilon_i. \quad (1)$$

$\tau^{\text{th}}$  conditional quantile

$$Q_\tau(y_i|x_i) = x_i^T \beta_\tau. \quad (2)$$

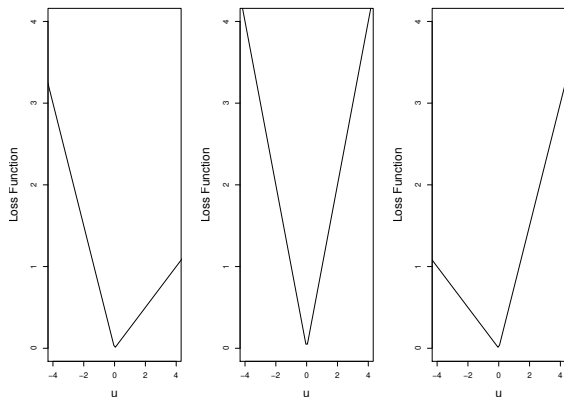
Parameter estimates

$$\arg \min_{\beta_\tau} \sum_{i=1}^n \rho_\tau(y_i - x_i^T \beta_\tau), \quad (3)$$

where the loss function is  $\rho_\tau(u) = u(\tau - I(u < 0))$  and  $I(\cdot)$  is the indicator function,  $\epsilon_i$ 's are i.i.d. asymmetric Laplace random variables, and  $Q_\tau(\epsilon_i|x_i) = 0$ .

# Evaluating Student Equity in STEM

## Loss Function



**Figure:** Loss Function for  $\tau = 0.25, 0.50,$  and  $0.75$ ; on the left is  $\rho_{\tau=.25}(u)$ , in the middle is  $\rho_{\tau=.5}(u)$ , and on the right is  $\rho_{\tau=.75}(u)$ .

# Evaluating Student Equity in STEM

## Regression rankscores

- Fit quantile regression lines for a set of  $\tau \in (0, 1)$
- Use the rank generating function to calculate quantile regression rankscores for each observation
- Calculate the normalized regression rankscores for each faculty member

The normalized regression rankscores serve as continuous measure of student equity.

# Evaluating Student Equity in STEM

## Regression rankscores equations

Let  $(Y_1, \dots, Y_n)$  be the response and let  $(R_1, \dots, R_n)$  be the associated ranks. The rank generating function is given by:

$$\hat{a}_i(\tau) = \begin{cases} 1 & \text{if } \tau < \frac{R_i-1}{n} \\ R_i - \tau n & \text{if } \frac{R_i-1}{n} \leq \tau \leq \frac{R_i}{n} \\ 0 & \text{if } \tau > \frac{R_i}{n} \end{cases} . \quad (4)$$

The normalized regression rankscores are given by:

$$\hat{b}_i = - \int_0^1 \Phi^{-1}(\tau) d\hat{a}_i(\tau), \quad (5)$$

where  $\Phi^{-1}(\cdot)$  is the inverse standard normal distribution.



# Evaluating Student Equity in STEM

## Results

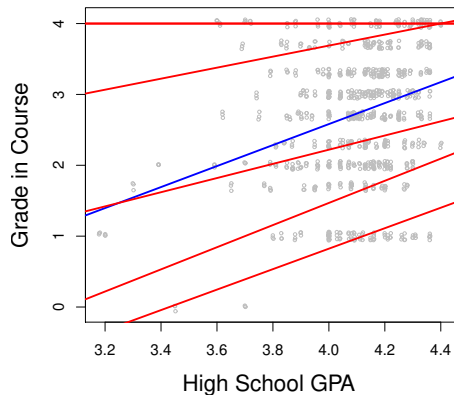


Figure: Quantile regression (median regression in blue).

# Evaluating Student Equity in STEM

## Results

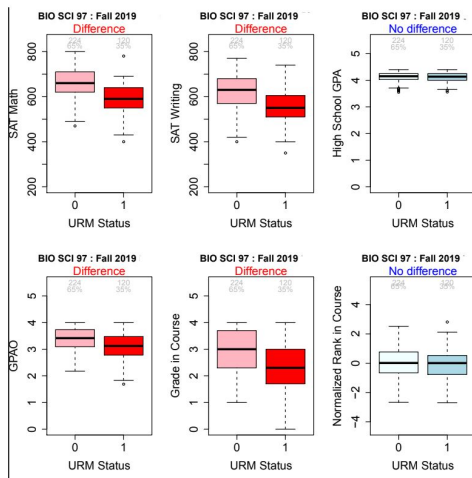


Figure: Example of Equity Evaluation in a single STEM course.

# Evaluating Student Equity in STEM

## Next Steps

- Interview Faculty Members
- Identify common teaching practices and pedagogy
- Identify common themes around diversity and inclusion

Target population: Senate faculty members who are conducting education research projects with an intent to publish or present the results.

## Goals

- Expanding University data capabilities
- Leveraging institutional data to inform efforts to improve student success
- Effective collaborations to build interest in research on teaching and learning



IRB



Letter of Legitimate Educational Interest  
(signed by chair or dean)



online FERPA training through the UC  
Learning Center

# Academic Success Research Fellows Program

- Support faculty interested in studying issues of undergraduate student success
- Provide data and analytic support to explore those issues
- No formal statistical or analytic training is expected from participants
- \$2,000 award to participants

## Goals

- Identify actionable insights to help students.
- Help students learn
- Increase retention or graduation rates
- Close gaps between groups of students

## Requirements

- A short online application
- Monthly meetings with researcher support staff
- Present findings at Teach Week
- Make evidence based recommendations back to home department



# ASR Application

## Undergraduate Student Success

Describe an issue related to undergraduate student success or teaching and learning you would like to explore. List your specific research questions you would like to address.

## Importance

What can you say about how that issue impacts you, students in your courses or your department? Why is that issue important?

## Data

What data would be helpful to address the question(s) above, and how might you consider analyzing it?

## Departmental Change

What changes might result based upon the findings of this work?

## Improving statistical methodology for discipline-based education research

- Linear Quantile Mixed Effects Models
- Algorithms to Account for Self-Selection
- Identification of Institutional Barriers to Success in STEM
- Building models to identify how student characteristics correspond to course engagement, learning, and STEM completion

## Improving student success and teaching at UCI and beyond

- Evaluating current programs
- Repeating studies across disciplines
- Expanding the use of data science across disciplines
- Evaluating teaching through COPUS and DART

Thank you!

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