

# Quantile Regression for Data Science

Gib Bassett  
Lightning Talk



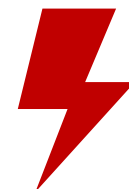
# Quantile Regression

Detects data features otherwise missed

Powerful tool for analyzing data



A Better Mousetrap

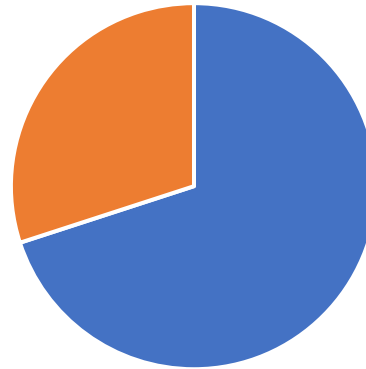


# The Current Situation in Data Science



# *Standard* Regression Analysis in Data Science: COMMON

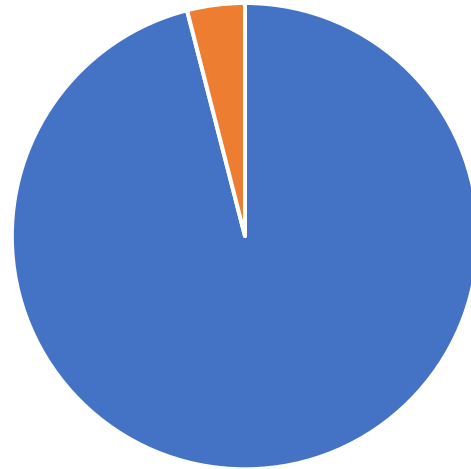
Regression in Data Science



■ Regression



# *Quantile Regression:* RARE



■ Quantile Regression



## Reason

### *Quantile Models:*

- *not Understood*
- *not Applicable*
- *not Estimable*



Standard Regression Analysis:  
*Conditional Expected Values*



Standard Regression Analysis:  
*Conditional Expected Values*

Quantile Regression Analysis:  
*Conditional Quantiles*





Expected and Quantile Effects can be very different:

*It matters!*

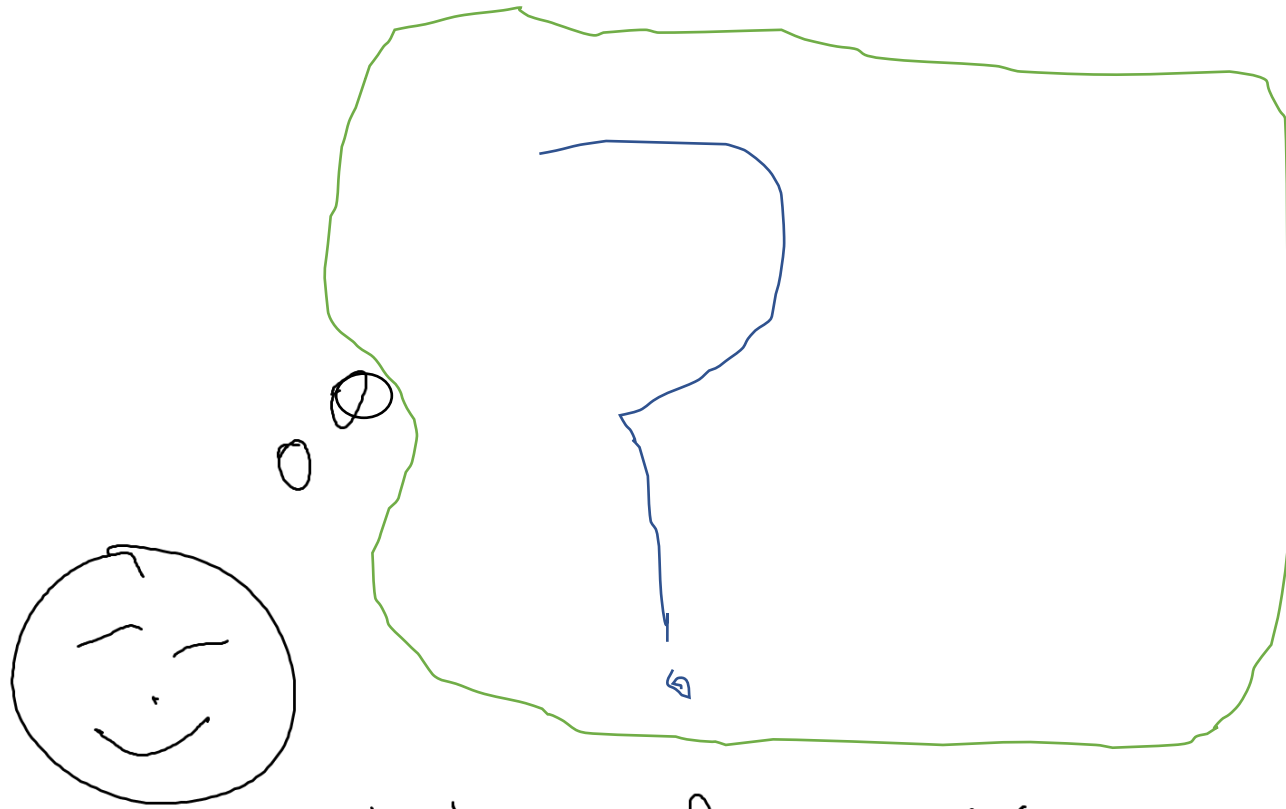


# Regression “History”



Wondering  
about Data?

How does  $y$   
depend on  $x$ ?



...  $y$  depends on  $x$

Wondering  
about Data?

How does  $y$   
depend on  $x$ ?

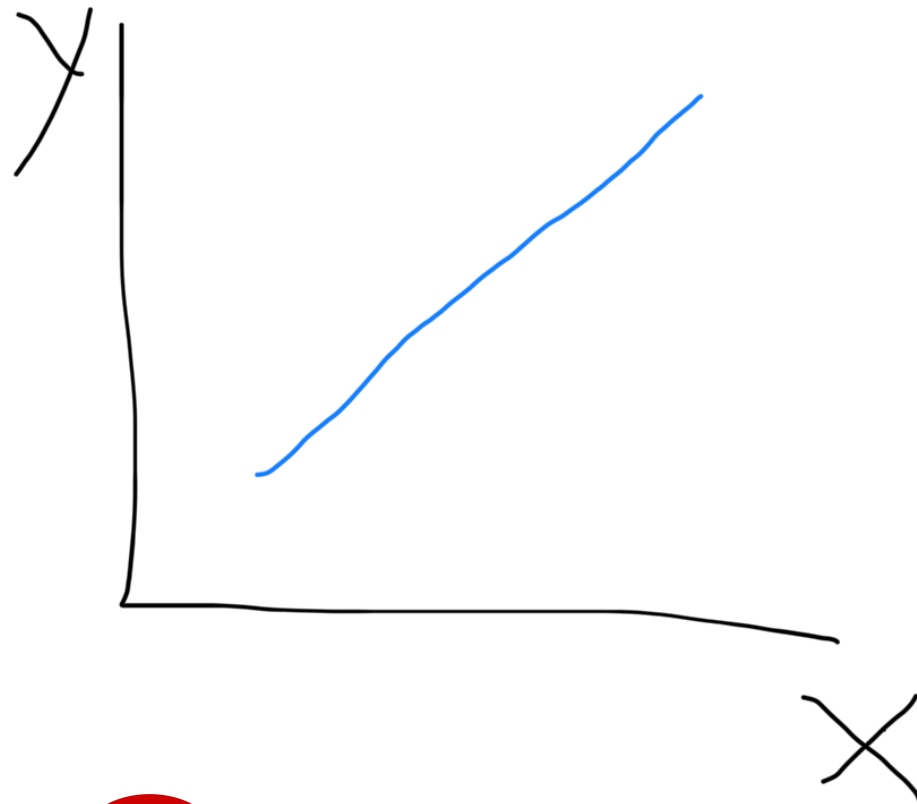
- How does  $y$ =GPA of UIC freshman depends on their  $x$ =ACT, c.p.
- How does  $y$ =his wage depend on  $x$ =education, c.p.
- How does  $y$ =her wage depend  $x$ =education, c.p.
- How does  $y$ =Google's stock price depend on the  $x$ =Market, c.p.?
- How does  $y$ =income distribution depend on  $x$ =tax rates, c.p.?



Wondering  
about Data?

How does  $y$   
depend on  $x$ ?

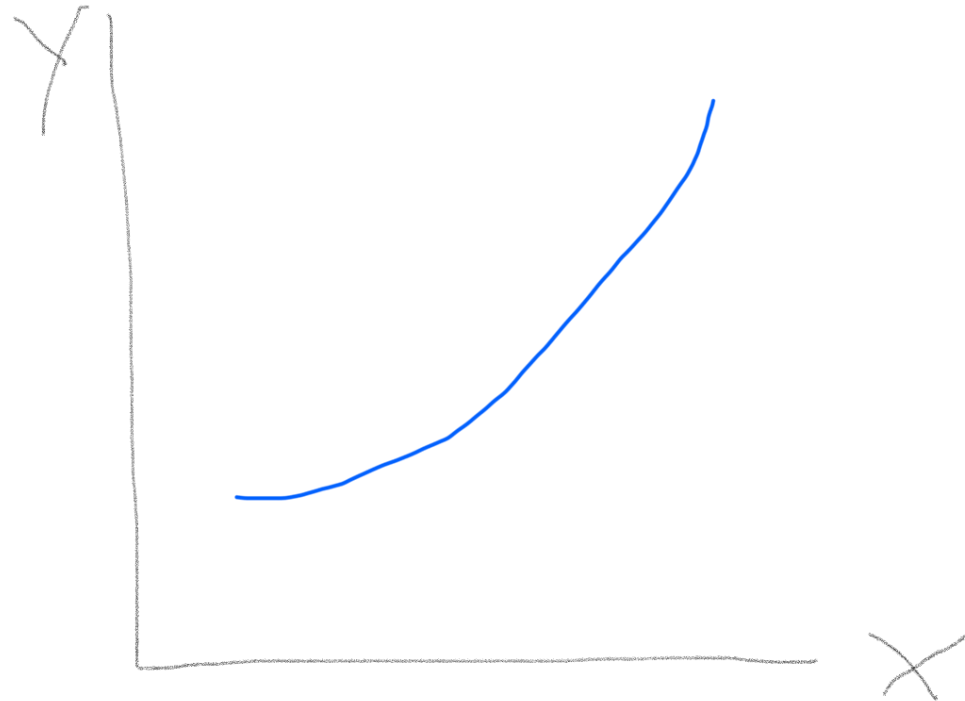
## THE OLDEN DAYS



Wondering  
about Data?

How does  $y$   
depend on  $x$ ?

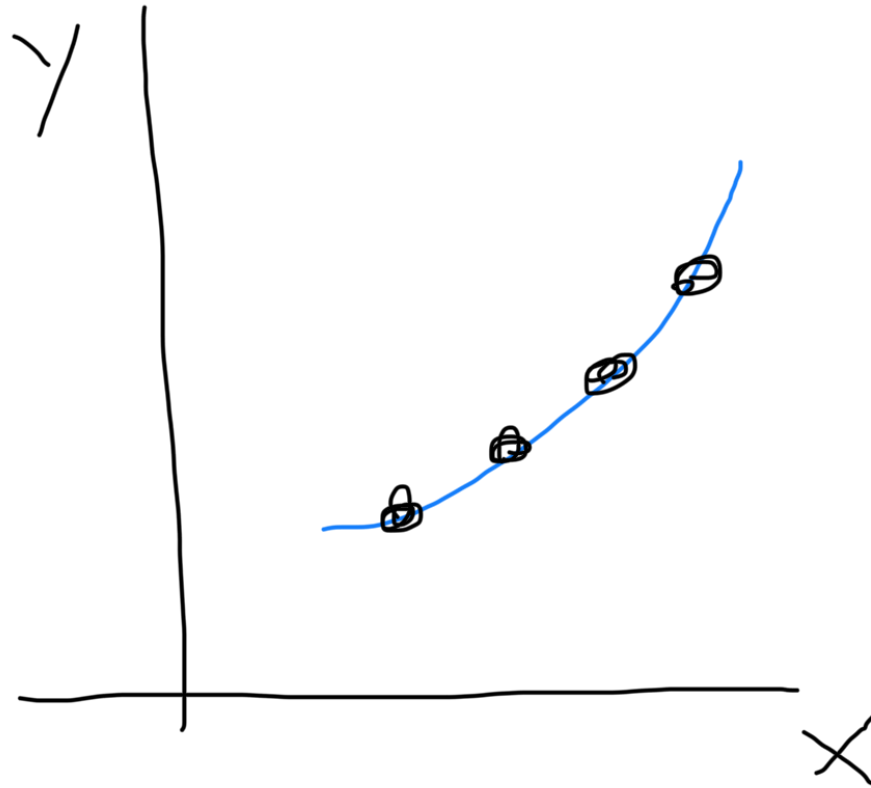
## THE OLDEN DAYS



Wondering  
about Data?

How does  $y$   
depend on  $x$ ?

# THE OLDEN DAYS



Not *deterministic*

Instead:

***EXPECTED VALUE***

depends on  $x$ .



ooo



MODERN

DISTRIBUTION depends  
on  $x$ .

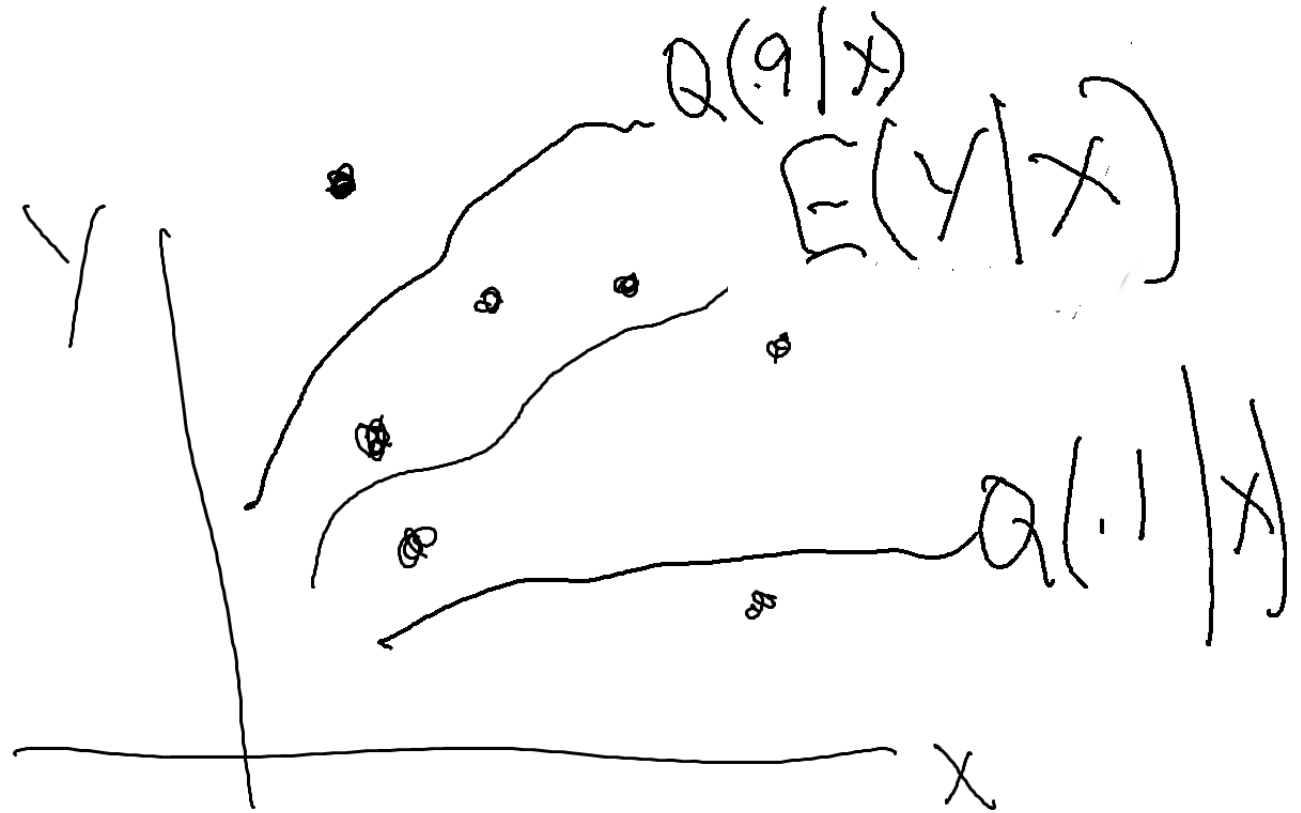


ooo

Positive mean effect

No quantile(.1) effect

Does ACT matter?

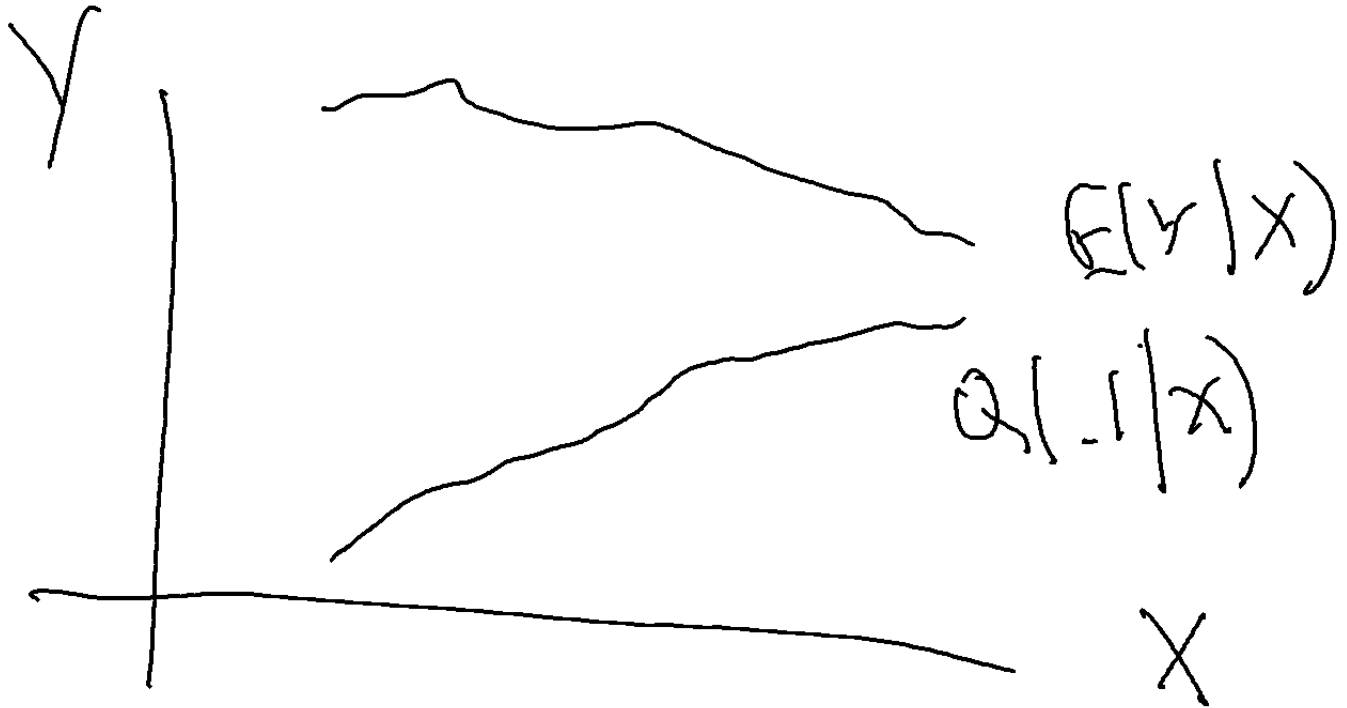


ooo

Zero mean effect

Positive quantile(.1)  
effect

Does ACT matter?



000

So,  
Does  $y$  depend on  $X$ ?

Does  $y$  depend on  $X$ ?

Yes or no:

depending on where in the distribution

What to do?

# Quantile Regression Estimation

Reveals how the conditional distribution depends on  $x$

# How to Estimate?

---in 30 seconds.....



Think about the mean this way:

$$\min_b \sum (y_i - b)^2$$

(Not that way:  $b = n^{-1} \sum y_i$ )

Think about the  $\theta^{th}$  quantile this way:

$$\min_b \sum \{ \theta |y_i - b|^+ + (1 - \theta) |y_i - b|^- \}$$

(Not that way:

*$b = \text{the } \theta^{th} \text{ smallest } y_i, i = 1, \dots, n.$*

# Software

R

Stata

SAS

Etc.

# Quantile Regression for Data Science

Use for any “y depends on x” Model

Detects Data Features otherwise missed



# Quantile Regression for Data Science

Thanks!

