



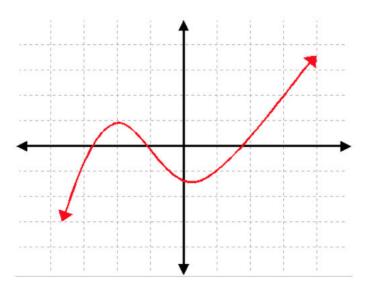
Jeffrey Borowitz, PhD

Lecturer

Sam Nunn School of International Affairs

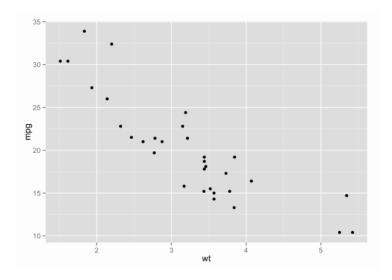
Linear Regression

- How do we determine the relationship between variables?
 - We will think about it like a function: X goes in, and Y comes out



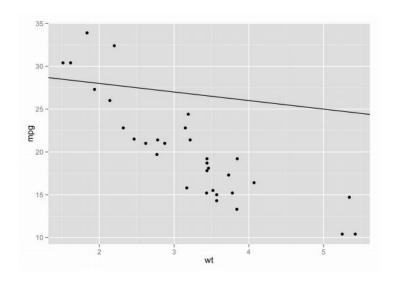


Instead of a nice functional relationship, we have messy clouds of data



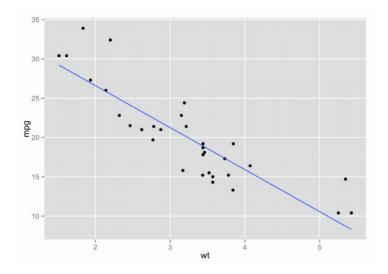


• The goal is to pick a function that fits the data "well"





• What does it mean for this line to fit "better" than the last?





- The main model we use is called "linear regression"
 - We will take a straight line (hence linear)
 - We want it to be near the data.
 - The line which was "bad" was further away than seemed necessary
- We use an equation like:

$$Y = \alpha + \beta X + \varepsilon$$



The Regression Model

- This is not a math course, but let's look at what goes into this model
 - X, Y random variables. We have draws of this data out of some population.
 - α , β parameters. These parameters represent the relationship between X and Y
 - ε This is the error term: the other things which are not in X but affect Y
- More intuitively
 - If Y is education and X is schooling
 - β is the amount that an extra unit of schooling is associated with higher wages
 - ε represents other factors which are not schooling that also affect wages



Predictions

- How does this relate to prediction?
- We are trying to predict y_i with x_i
- How do we do this?
 - We know the formula for y_i from our model

$$y_i = \alpha + \beta x_i + \varepsilon_i$$

- But if we don't know y_i , we don't know ε_i either.
- The best we can do is:

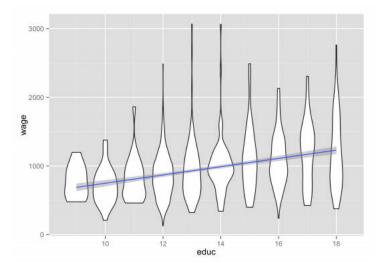
$$\hat{y}^i = \alpha + \beta x i$$

• \hat{y}^i is called the predicted value of y



Wages and Education

- X is years of schooling, Y is wages
- Prediction





What Things Can We Model With A Regression?

- What is Y?
- What is X?



Examples

- Crime and policing at the state level
 - What is the sampling frame?
 - What is X, Y?
- Crime as a function of income from survey data
 - What is the sampling frame?
 - What is X, Y?



Where Next?

- First, we'll talk about assumptions
- Linear regression was a very simple model
- But we can discuss a wide variety of extension now that we know about this model



Lesson Summary

- We try to predict an outcome random variable Y with an input random variable X
- To do this, we use a sample of pairs of (x_i, y_i) observation
- We choose the "best" parameters to fit the model
- We get a relationship between X and Y that can be used for prediction or analysis

