

E-411-PRMA

Lecture 2

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20 August 2015

SAT

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 - ▶ If Sigga got a 350 on the math section, how many people scored below her?
 - ▶ If Einar was in the 98% percentile in math, what was Einar's score?

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 - ▶ What percent of the people are between the 3rd and the 6th stanines?
- ▶ Various linear and non-linear transformations are done to create scores and scores may be normalized.

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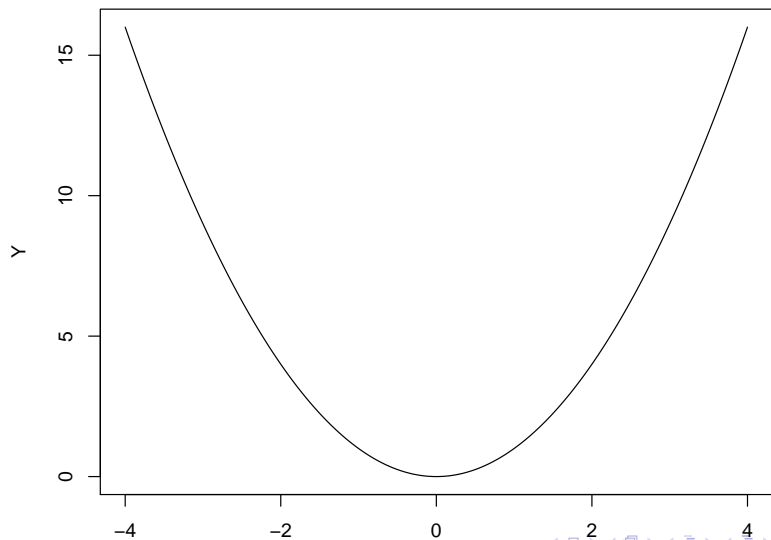
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- ▶ Are we talking about the population or the sample?
- ▶ How does this relate to a hypothesis test?

What is a correlation?

- ▶ Is it an association?
- ▶ Does it imply causation?
- ▶ Is a correlation necessary for causation?
- ▶ Does it need linearity?
- ▶ Is it affected by variability?
- ▶ Is it affected by outliers?
- ▶ Is it related to the simple linear regression?

What is the Pearson correlation coefficient?



Pearson correlation coefficient

$$\frac{\sum(X - \bar{X})(Y - \bar{Y})}{\sqrt{\sum(X - \bar{X})^2 \sum((Y - \bar{Y})^2)}}$$

Calculating Pearson correlation coefficient

	X	Y
	5	6
	3	0
	1	0
Mean	3	2

```
x <- c(5, 3, 1)
y <- c(6, 0, 0)
cor(x, y)
```


R correlation applet

1. Open RStudio
2. Open correlation_applet.R
3. Click the "Source" button

Spearman's rho

- ▶ Non-parametric measure of association
- ▶ Appropriate when at least one of your variables is ordinal variables
- ▶ Don't use Pearson's correlation with ordinal variables!

Simple Linear Regression

- ▶ If are you interested in predicting height given someone's weight, what would you do?

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- ▶ We could consider a regression model.

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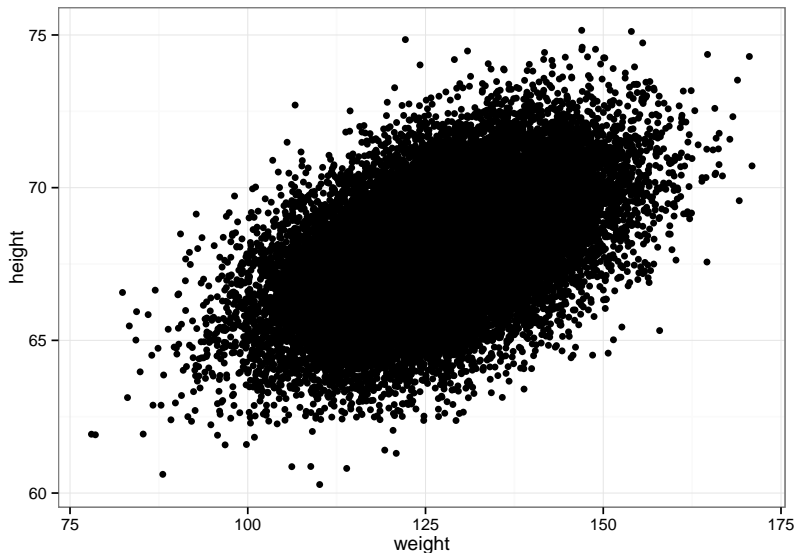
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- ▶ We could consider a regression model.
- ▶ $Y_i = \beta_0 + \beta_1 * X_i$
- ▶ How could we assess if this is appropriate?

1993 Growth Survey of 25,000 Hong Kongese children

source: http://wiki.stat.ucla.edu/socr/index.php/SOCR_Data_Dinov_020108_HeightsWeights



Model Summary

Parameter	Estimate	SE	t-value	p-value
β_0	57.57	0.11	506.01	.001
β_1	0.08	0.001	91.98	.001

How does this relate to correlation?

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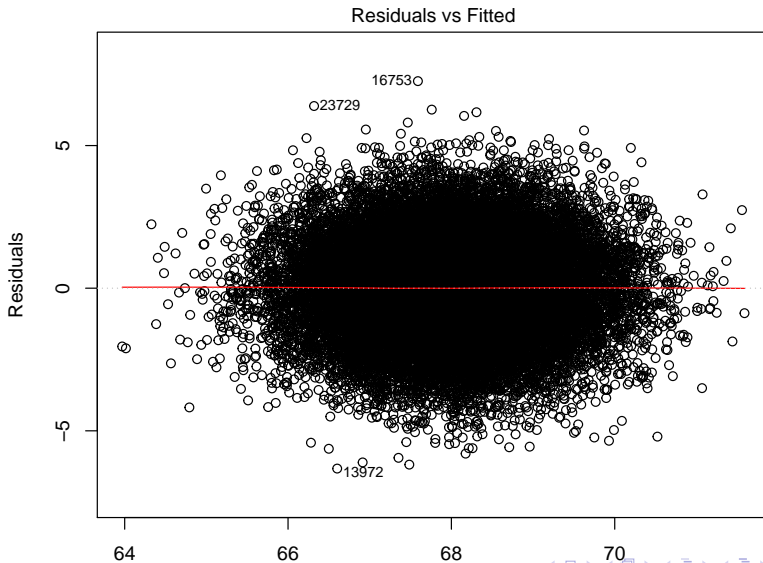
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- ▶ 0.5028585

Always look at the residuals



Brief history of testing

- ▶ 2200 BCE, Chinese believed to use testing for determining who would get governmental jobs
- ▶ Greek and Romans categorized individuals based on personality type ("blood" or "phlegm")
- ▶ Francis Galton's classification based on "natural gift" (i.e. eugenics)
 - ▶ Contributed to development of questionnaires, rating scales, and self-report inventories
- ▶ Wilhelm Wundt's laboratory and his focus on "standardization"
 - ▶ James Cattell's mental tests
 - ▶ Charles Spearman - reliability and factor analysis

Testing in the 20th century

- ▶ 1905, Binet and Simon publish a test measuring intelligence in mental retarded school children in Paris
- ▶ 1939, Wechsler publishes a test to measure intelligence in adults (would become WAIS)
- ▶ Group intelligence test administered by the US military during WWI and WWII
- ▶ WWI personality tests used to screen recruits

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- ▶ Test can be fair
- ▶ Test can benefit society

What makes a good test?

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- ▶ Understanding the normative sample is very important, why?

Sampling

- ▶ Simple random sample
- ▶ Stratified random sample
- ▶ Cluster random sample
- ▶ Purposive sample
- ▶ Convenience sample

Different Norms

- ▶ Percentiles
- ▶ Developmental Norms
 - ▶ Age Norms
 - ▶ A 6 year old performs at the level of a 10 year old
 - ▶ This is on this material only though!
 - ▶ Grade Norms
 - ▶ School year typically 10 months in the US
 - ▶ A 4th grader is performing at the level of a 5th grader in third month
 - ▶ This is on this material only though!
- ▶ National Norms, nationally representative
 - ▶ Anchor norms enable two tests to be compared
 - ▶ In USA, students could take SAT or ACT for admission to college

Fixed Reference and Criterion-Related

- ▶ Fixed reference group scores are used as the basis for calculation of future administrations of the test
- ▶ Raw scores are scaled relative to the performance of the fixed reference group
 - ▶ Answering 50 items correctly one year and 50 on the following year doesn't mean you'll have the same score
- ▶ SAT does this through using anchor items and equating
- ▶ Criterion-referenced, evaluate a score with reference to a set criteria or standard NOT other test takers
- ▶ What is the fairest way to score grades in a class room?