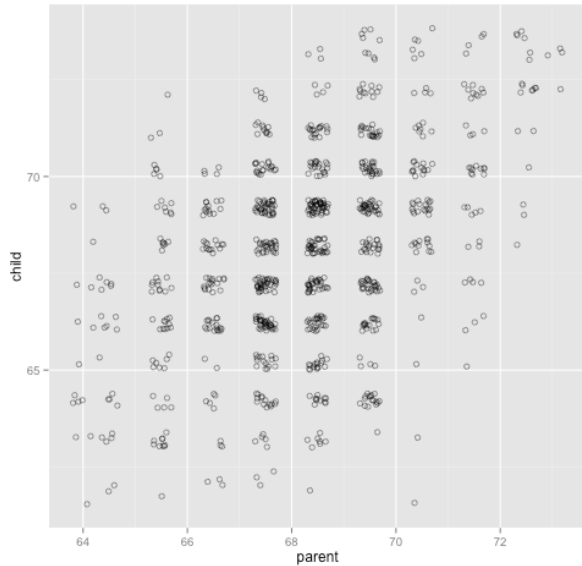


Assignment #9: Correlation (bootstrap interval and randomization test)

Scenario: Do taller parents typically have taller children? In 1885, Francis Galton recorded the heights of 928 children along with the average height of each child's parents. A scatterplot of this data is displayed below (with some *jitter* added to separate identical measurements):



You can download this data at:

<http://www.bradthiessen.com/html5/data/galton.csv>

1. Copy the data and paste it into the bootstrap confidence interval applet:

http://lock5stat.com/statkey/bootstrap_2_quant/bootstrap_2_quant.html

Record the correlation coefficient for this data: $r =$ _____

2. Generate at least 10,000 bootstrap samples and record the 95% confidence interval: _____

3. This time, paste the data into the randomization applet:

<http://www.rossmanchance.com/applets/RegShuffle.htm?hideExtras=2>

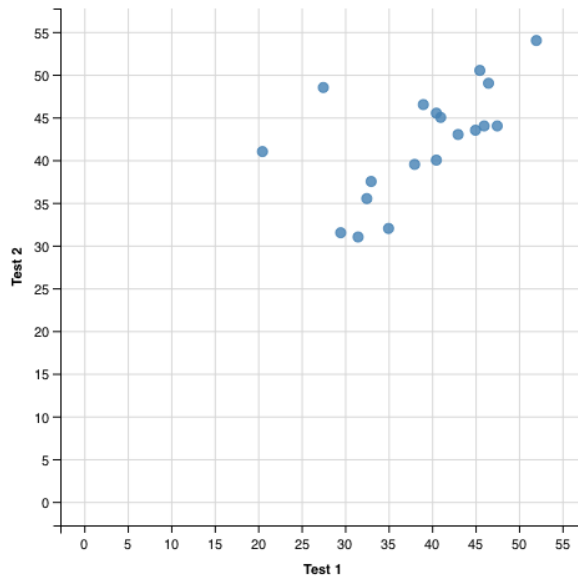
Check the CORRELATION COEFFICIENT box to verify the correlation you recorded above. Then, check the SHOW SHUFFLE OPTIONS box, shuffle the data at least 10,000 times, and record the p-value.

$p =$ _____

4. What can we conclude from all of this?

Scenario: The following table displays the unit 1 and unit 2 test scores for students in this course in 2012.

Student	Test 1	Test 2
1	20.5	41.0
2	27.5	48.5
3	29.5	31.5
4	31.5	31.0
5	32.5	35.5
6	33.0	37.5
7	35.0	32.0
8	38.0	39.5
9	39.0	46.5
10	40.5	40.0
11	40.5	45.5
12	41.0	45.0
13	43.0	43.0
14	45.0	43.5
15	45.5	50.5
16	46.0	44.0
17	46.5	49.0
18	47.5	44.0
19	52.0	54.0
Means	38.63	42.18
Std Dv	8.04	6.52



From this data, I calculated the following:

Correlation	95% Confidence Interval	p-value
Pearson's r = 0.5886	(0.258, 1.000)	0.00401
Spearman's rho = 0.6119		
Kendall's tau = 0.4765		

You can download this data at: <http://www.bradthiessen.com/html5/data/testdata.csv>

5. It looks like the scores from test 1 and test 2 have (roughly) a linear relationship. On the scatterplot displayed above, sketch the line you think best fits the data. Estimate the slope and y-intercept of that line and write the formula here:

$$y = mx + b \quad \rightarrow \quad \text{test 2} = \frac{\quad}{(\text{slope})} (\text{test 1}) + \frac{\quad}{(\text{y-intercept})}$$

6. Every student who answers the previous question will (probably) have different values for the slope and y-intercept. How could we decide which line (from all possible lines students could sketch) is best? We'll learn one approach (the *least squares criterion*) in the next activity.

As we'll find out, the line that best fits this data can be written as $y = b_0 + b_1x$. To calculate the slope and y-intercept of this best-fitting line by hand, we'll derive the following formulas:

$$b_1 = r \frac{s_y}{s_x} \quad \text{and} \quad b_0 = \bar{Y} - b_1\bar{X}, \quad \text{where } r \text{ is Pearson's } r \text{ and } s \text{ represents a standard deviation. If we let } X = \text{test 1 and}$$

$Y = \text{test 2}$, calculate this best-fitting line:

$$\text{predicted test 2} = \frac{\quad}{(\text{slope})} (\text{test 1}) + \frac{\quad}{(\text{y-intercept})}$$

7. Using the formula for the best-fitting line you just calculated, predict the following:

Predicted score on test 2 for a student with test 1 = 45: _____

Predicted score on test 2 for a student with test 1 = 15: _____

In which prediction do you have more confidence? Explain why:

8. I calculated this best-fitting line using R. The output is pasted below (so you can check your answer to #6). Interpret this slope and y-intercept. What do they represent in this scenario (regarding test scores)?

```
lm(formula = Test2 ~ Test1)
```

Coefficients:

(Intercept)	Test1
23.7461	0.4773

The slope (0.4773) represents: _____

The y-intercept (23.7461) represents: _____

9. In the next activity, we'll also learn about the *coefficient of determination*, R^2 . Calculate this coefficient in this example by simply squaring the correlation coefficient. This coefficient can be interpreted in much the same way as we interpreted eta-squared when we conducted ANOVA. Go ahead and try to interpret this coefficient of determination in this scenario.

R^2 = _____ Interpretation: _____

10. You may have heard the phrase *correlation does not imply causation*. Some examples of this appear on the following two websites:

Correlation vs. Causation: http://jfmuellet.faculty.noctrl.edu/100/correlation_or_causation.htm

Spurious correlations: <http://tylervigen.com>

Go to the first link (Correlation vs Causation) and choose one article that might interest you (e.g., Dogs walked by men are more aggressive).

For that article, do the following:

- a) Very briefly summarize the correlation implied by the article
- b) Briefly explain why that correlation does not imply causation. Identify potential reasons why the two variables in the article would have a positive correlation (and, if you can, hypothesize what other variable might be causing that correlation).
- c) Briefly describe an experiment you could do to test if the correlation implied by the article is, in fact, causation.