PSY 201: Statistics in Psychology Lecture 30 Hypothesis testing for two correlations *How careful are students?*

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CORRELATIONS

- you have two independent populations (tests with dependent samples are more complicated)
- each with two scores for which you can calculate a correlation coefficient. e.g.
 - male population of students
 - female population of students
- might want to compare correlations between verbal SAT and math SAT

HYPOTHESIS

• the null hypothesis to test is

$$H_0:\rho_1=\rho_2$$

- where ho_1 is the correlation coefficient of scores in population 1
- and ρ_2 is the correlation coefficient of scores in population 2
- and the alternative hypothesis is

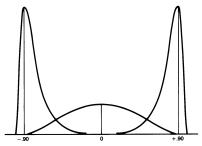
$$H_a: \rho_1 \neq \rho_2$$

• or the same thing is:

$$H_0: \rho_1 - \rho_2 = 0$$
$$H_a: \rho_1 - \rho_2 \neq 0$$

SAMPLING DISTRIBUTION

- to test *H*₀ we need to know the sampling distribution of the difference of correlation coefficients
- \bullet unfortunately, just like for the one-sample case, the sampling distribution changes as ρ changes



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FISHER z TRANSFORMATION

$$z_r = \frac{1}{2}\log_e\left(\frac{1+r}{1-r}\right)$$

- which can be found by using the calculator in the textbook
- the sampling distribution of difference of z_r values is approximately normal and has a mean of

$$z_{\rho_1} - z_{\rho_2}$$

• which is zero, if H_0 is true

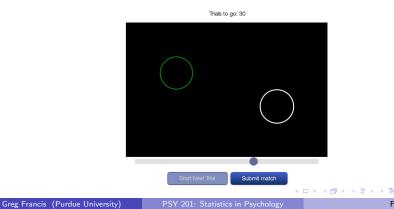
SAMPLING DISTRIBUTION

- so we know that the sampling distribution of the $z_{r_1} z_{r_2}$ values is normally distributed and (if H_0 is true) has a mean of zero.
- all we need to know is the standard error of the difference between independent transformed correlation coefficients

$$s_{z_{r_1}-z_{r_2}} = \sqrt{\frac{1}{n_1-3} + \frac{1}{n_2-3}}$$

- (note, you need more than three scores in each group)
- We just apply the same hypothesis testing approach as for other cases!

- In some tasks, correlation can be a measure of consistency or carefulness
- For example, in the STATLAB Weber's Law experiment, subjects adjust the size of a circle so it matches a target. There were two different target sizes, and we expect these matches to be correlated across subjects.



• Using the STATLAB data, we find that for the $n_1 = 30$ subjects who completed the Weber's Law lab, the correlation in matching sizes for the 10 pixel and 50 pixel targets is

$$r_1 = 0.1516$$

• In part this correlation reflects carefulness by the subject. If subjects are careless in their judgments, then they essentially add noise to their matching circles, and this will reduce the correlation

- In some tasks, correlation can be a measure of consistency or carefulness
- For example, in the STATLAB Typical Reasoning experiment, subjects rate the likelihood of certain characteristics of a described person. The descriptions were set up in a systematic way, so that some descriptions were expected to produce high ratings and other descriptions were expected to produce low ratings.



Trials to go: 12

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• Using the STATLAB data, we find that for the $n_2 = 29$ subjects who completed the Typical Reasoning lab, the correlation in likelihood ratings for the *Low typicality and two activities* and the *High typicality and two activities* is

$r_2 = 0.1836$

• In part this correlation reflects carefulness by the subject. If subjects are careless in their judgments, then they essentially add noise to their ratings, and this will reduce the correlation

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- Are the correlations similar across the two tasks? They might seem like very different tasks, but to some extent, the correlations measure "effort" or "consistency" by the subjects.
- The overall strength of the correlation is less interesting than the similarity of the correlations. Some tasks may involve rather a lot of variability, so the correlation cannot be very large. Still, we can compare across tasks.
- Just looking at the correlations would not let us draw strong conclusions, but it could be part of a bigger argument.

• We use the on-line calculator to do the computations:

Sample correlation for group 1, $r_1 = 0.1516$					
Sample size for group 1, $n_1 = 30$					
Sample correlation for group 2, $r_2 = 0.1836$					
Sample size for group 2, $n_2 = 29$					
Specify hypotheses:					
$H_0:\rho_1-\rho_2=0$					
H_a : Two-tails \div					
$\alpha = 0.05$					
Run Test					
Test summary					

Test summary					
Null hypothesis	$H_0: \rho_1 - \rho_2 = 0$				
Difference of null Fisher z transforms $z_{\rho_1} - z_{\rho_2} = 0.0000$					
Alternative hypothesis	$H_a: \rho_1 - \rho_2 \neq 0$				
Type I error rate	$\alpha = 0.05$				
Label for group 1					
Sample size for group 1	$n_1 = 30$				
Sample correlation for group 1	$r_1 = 0.1516$				
Fisher z transform of r_1	$z_{r_1} = 0.1528$				
Label for group 2					
Sample size for group 2	$n_2 = 29$				
Sample correlation for group 2	$r_2 = 0.1836$				
Fisher z transform of r_2	$z_{r_2} = 0.1857$				
Sample standard error	$s_{z_r} = 0.274770$				
Test statistic	z = -0.119839				
p value	p =0.904611				
Decision	Do not the reject null hypothesis				

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MISSING?

- It is possible to compute a confidence interval for a difference of independent correlations.
- It is also possible to compute a hypothesis test for a difference of dependent correlations.
- However, these methods require some new ideas that we do not have time to go into (lots of special cases).

- Computing power for a test of independent correlations is conceptually similar to other power calculations
- however, the use of the Fisher z transform of correlations makes it difficult to have good intuition into how sample size relates to power
- Since we take the Fisher *z* transform of each correlation and then take the difference, a fixed difference of correlations does not necessarily produce a fixed difference of Fisher *z* transform values.

• For example,

$$r_1 - r_2 = 0.3 - 0.2 = 0.1$$

• corresponds to

$$z_{r_1} - z_{r_2} = 0.203 - 0.100 = 0.103$$

but

$$r_1 - r_2 = 0.5 - 0.4 = 0.1$$

• corresponds to a larger value:

$$z_{r_1} - z_{r_2} = 0.549 - 0.424 = 0.125$$

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• these differences mean that testing for a specific alternative

$$H_{a}:
ho_{1}-
ho_{2}=0.5-0.4$$

• is easier than testing for

$$H_a: \rho_1 - \rho_2 = 0.2 - 0.1$$

• Suppose you wanted 80% power for each test

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H_{a} : $ ho_{1}$	$-\rho_2=0.$	5 – 0.4	H_{a} : $ ho_{1}$	$-\rho_2=0.$	2 - 0.1
pecify the population character	istics:		Specify the population character	istics:	
$I_0: \rho_1 - \rho_2 = 0$			$H_0: \rho_1 - \rho_2 = 0$		
$I_a: \rho_{a1} - \rho_{a2} = 0.09999999999999999999999999999999999$			$H_a: \rho_{a1} - \rho_{a2} = 0.1$		
$\rho_{a1} = 0.5$ $\rho_{a2} =$	0.4		$ \rho_{a1} = 0.2 $ $ \rho_{a2} = 0.2 $	= 0.1	
pecify the properties of the test	:		Specify the properties of the test		
Type of test	Two-tails ‡		Type of test	Two-tails ‡	
Type I error rate, $\alpha =$	0.05		Type I error rate, $\alpha =$	0.05	
Power=	0.8	Calculate minimum sample size	Power=	0.8	Calculate minimum sample size
Sample size for group $1, n_1 =$	998		Sample size for group 1, $n_1 =$	1501	
Sample size for group 2, $n_2 =$	998	Calculate power	Sample size for group 2, $n_2 =$	1501	Calculate power

• a difference of 1006 subjects across the two groups!

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- Let's look at a specific example
- Height is correlated with economic success (income, wealth). Taller people are more successful
- Combining data across multiple studies suggests a difference in the correlation for men compared to women
 - ▶ Men: *r*₁ = 0.24
 - ▶ Women: *r*₂ = 0.18

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- Suppose you want to test this difference in correlations for Purdue engineering technology graduates. You will look at starting salaries and height.
- Engineering Technology degrees are given by Purdue Polytechnic, and each year it typically distributes BS degrees to 18 women and 78 men.
- You think you can get starting salary and height data for a third of the graduates. If the Purdue graduates are similar to the general population, what is the power of your study?

٩	there's	 You need a total of nearly
	no point in running such a study! Specify the population characteristics: $H_0: \rho_1 - \rho_2 = 0$ $H_a: \rho_{a1} - \rho_{a2} = 0.06$ $\rho_{a1} = 0.24$ $\rho_{a2} = 0.18$	8000 subjects to have 80% power Specify the population characteristics: $H_0: \rho_1 - \rho_2 = 0$ $H_a: \rho_{a1} - \rho_{a2} = 0.06$ $\rho_{a1} = 0.24$ $\rho_{a2} = 0.18$
	Specify the properties of the test: Type of test Two-tails	Specify the properties of the test: Type of test Two-tails +
	Type I error rate, $\alpha = 0.05$	Type I error rate, $\alpha = 0.05$
	Power= 0.051148: Calculate minimum sample size	Power= 0.8 Calculate minimum sample
	Sample size for group 1, $n_1 = 26$ Sample size for group 2, $n_2 = 6$ Calculate power	Sample size for group 1, $n_1 = 3386$ Sample size for group 2, $n_2 = 3386$ Calculate power

• You simply cannot test for these kinds of small differences in correlations for relatively small populations (like Purdue graduates).

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CONCLUSIONS

- two-sample case for correlations
- opwer
- trust the numbers!

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NEXT TIME

- More than two comparisons
- Multiple testing

Error is sneaky.

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