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- Today: statistical power, and errors of a hypothesis test.
- Thursday: review session on all material for the test, especially this week's problem set.



Statistical power

Statistical significance is not the same as biological "significance" (or meaning).

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What is the power of a test?



As you recall, a screening test has four combinations of test outcome/condition.





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Situation	Decision	
	Accept H <sub>0</sub>	Reject <i>H</i> 0
H <sub>0</sub> true	$1 - \alpha$	α
H <sub>0</sub> false	β	$1 - \beta$



• Type I error is  $\alpha$ .

### Terminology

Statistical power

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- Type II error is  $\beta$ .

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### Terminology

#### Statistica power

- Type I error is  $\alpha$ .
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- Sensitivity of the test is the power, which is  $1 \beta$ .

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### Terminology

#### Statistica power

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- Sensitivity of the test is the power, which is  $1 \beta$ .

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• Specificity of the test is  $1 - \alpha$ .

#### Basic power equations, one-sample Z-test

$$Z_{pow} = |Z_{crit}| - \frac{\delta}{\frac{\sigma}{\sqrt{n}}} = |Z_{crit}| - \frac{\delta\sqrt{n}}{\sigma}$$
$$n = \sigma^2 \frac{(Z_{pow} - Z_{crit})^2}{\delta^2}$$
$$\delta = \sigma \frac{(Z_{crit} - Z_{pow})}{\sqrt{n}}$$

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#### Power = $1 - \text{pnorm}(Z_{pow})$



$$Power = 1 - pnorm(Z_{pow})$$

$$Z_{pow} = qnorm(1 - power)$$

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Statistica power

$$Power = 1 - pnorm(Z_{pow})$$

$$Z_{pow} = qnorm(1 - power)$$

$$Z_{crit} = \pm qnorm(1 - \alpha/T),$$

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$$Power = 1 - pnorm(Z_{pow})$$

$$Z_{pow} = \operatorname{qnorm}(1 - \operatorname{power})$$

 $Z_{crit} = \pm \operatorname{norm}(1 - \alpha/T),$ T is the number of tails in the test. Note that the  $Z_{crit}$  is negative for a left-tailed test. For right tailed

#### Example

Statistical power A buyer wants to buy a large batch of apples from a grower. But he does not want to buy if the true mean weight is less than 150 g. He can't weigh all the apples, but he can weigh a sample of *n*, and calculate the sample mean. Let's say the true standard deviation is 30g. If he weighs 20 apples and does a Ztest he may or may not reject the null hypothesis. If the **true** mean weight of apples is 150 g, what is the probability that he rejects the null hypothesis, and rejects the apples? Assume he is doing a one-tailed Z-test, with a significance level of 0.05 $(\alpha = 0.05)$ . He rejects the apples only if he rejects the null hypothesis.

#### Example

Statistica power

 $J = 30 \ n = 20$  $S = 19 \ x = 0.05$  $Z_{cnit} = 1.64$ 

What if the true mean weight of the grower's apples is 149 g? Will he reject the null hypothesis? 145 g? 140 g?  $Z_{POW} = Z_{CA} - \frac{8}{9} \frac{140}{9} = \frac{140}{9} \frac{140}{9} = \frac{140}{9} \frac{140}{9} = \frac{140}{9} =$ 



 $LSD = Zcrit \frac{D}{IN}$ 

What is the least significant difference (LSD) that the buyer must see before he rejects the grower's apples?







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Example f = 30 Z p = -0.84 h = f'(Z p = 2 cont)Zent=1.64

If he wants to detect, at a power of 80%, a true difference of only 2 g, what sample size will he need? 1 g? 0.5 g?



If he wants to detect a true difference of 10 g, at a power of 80%, what should his sample size be? At a power of 90%? 95%? 99%?

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### If he wants to detect a true difference of 15 g, at a power of 80%, with a sample size of 20. What effect $\alpha$ should he use?

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