Lecture 14
Hypothesis Testing
Text: Chapter 5

STAT 8010 Statistical Methods I
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Agenda

1. Hypothesis Testing
2. Type I & Type II Errors
3. Duality of Hypothesis Test with Confidence Interval

Hypothesis Testing

- **Hypothesis Testing**: A method for using sample data to decide between two competing claims (hypotheses) about a population characteristic (a parameter. e.g. μ)

- **Examples**:

  - The true mean starting salary for graduates of four-year business schools is \$4,500 per month $\Rightarrow \mu = 4,500$

  - The true mean monthly income for systems analysts is at least \$6,000 $\Rightarrow \mu \geq 6,000$

In the next few slides we are going to discuss how to set up/perform a hypothesis test

Null and Alternative Hypotheses

- **Null Hypothesis (H_0)**: A claim about a parameter that we want to disprove.
- **Alternative Hypothesis (H_a)**: The competing claim that the researcher is really interested in

Examples

- The average starting monthly salary for graduates of four-year business schools:

$$H_0 : \mu = 4500 \quad \text{vs.} \quad H_a : \mu > 4500$$

- The mean monthly income for systems: analysts is at

$$H_0 : \mu \geq 6000 \quad \text{vs.} \quad H_a : \mu < 6000$$

We will use test statistic to make a decision

Test Statistics

- In a hypothesis test, our "evidence" comes in the form of a test statistic
- A test statistic incorporates a number of aspects of the sample: the **sample size**, the **point estimate**, the **standard deviation**, and the **hypothesized value**
- If we're conducting a hypothesis test about μ (assuming we don't know σ) we would use the following test statistic:

$$t^* = \frac{\bar{X} - \mu_0}{\frac{s}{\sqrt{n}}}$$

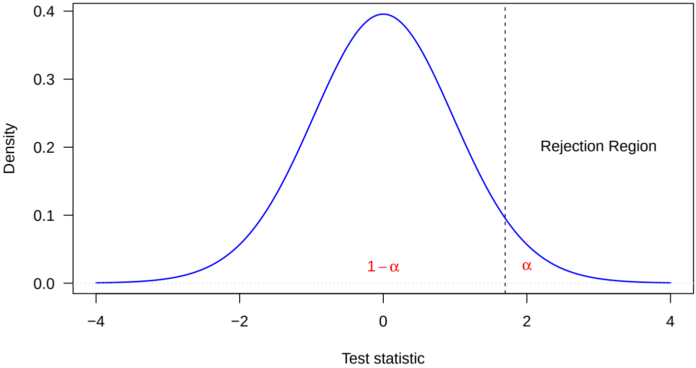
If $\mu = \mu_0$ (i.e., H_0 is true), we have $t^* \sim t_{df=n-1}$

Decision-Making: Rejection Region and P-Value Methods

- Decision based on t^*, H_a, and α, the **significant level**, that is pre-defined by the researcher
- Two approaches:
  - Rejection Region Method: reject H_0 if t^* is in the rejection region, otherwise fail to reject H_0
  - P-Value Method: reject H_0 if P-value is less than α, otherwise fail to reject H_0
- **Question:** How to determine the rejection region and how to compute P-value?

Rejection Region Method

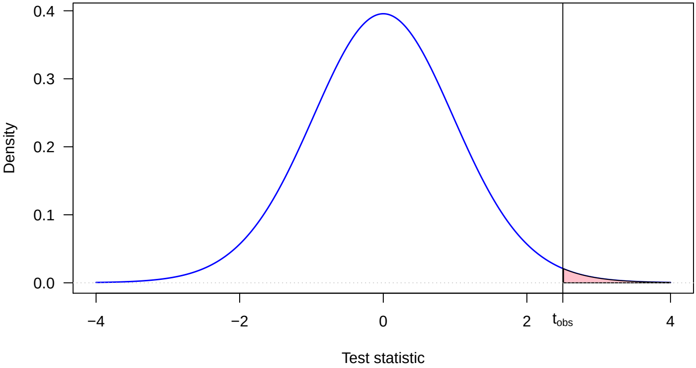
Let $H_0 : \mu = \mu_0$ vs. $H_a : \mu > \mu_0$ and $\alpha = 0.05$



Under the H_0, the test statistic $t^* = \frac{\bar{X}-\mu_0}{\frac{s}{\sqrt{n}}} \sim t_{df=n-1}$. The cutoff of the rejection region (=$t_{0.05,n-1}$) can be found from a t-table

P-Value Method

Let $H_0 : \mu = \mu_0$ vs. $H_a : \mu > \mu_0$



P-value: the probability of getting a test statistic that is at least as extreme as the one we actually observed **if the null hypothesis is true** $\Rightarrow \mathbb{P}(t^* \geq t_{obs})$

Draw a Conclusion

Use the following "generic" conclusion:

> "We (do/do not) have enough statistical evidence to conclude that (H_a in words) at α% significant level."

- Reject $H_0 \Leftrightarrow$ do
- Fail to reject $H_0 \Leftrightarrow$ do not

Example (taken from The Cartoon Guide To Statistics)

New Age Granola Inc claims that average weight of its cereal boxes is 16 oz. The Genuine Grocery Corporation will send back a shipment if the average weight is any less.

Suppose Genuine Grocery Corporation takes a random sample of 49 boxes, weight each one, and compute the sample mean $\bar{X} = 15.90$ oz and sample standard deviation $s = 0.35$ oz.

Perform a hypothesis test at 0.05 significant level to determine if they would reject H_0, and therefore, this shipment

Cereal Weight Example Cont'd

1. $H_0 : \mu = 16$ vs. $H_a : \mu < 16$

Cereal Weight Example Cont'd

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2. Test Statistic: $t_{obs} = \frac{15.9-16}{0.35/\sqrt{49}} = -2$

Cereal Weight Example Cont'd

1. $H_0 : \mu = 16$ vs. $H_a : \mu < 16$
2. Test Statistic: $t_{obs} = \frac{15.9-16}{0.35/\sqrt{49}} = -2$
3. Rejection Region Method: $-t_{0.05,48} = -1.68 \Rightarrow$ Rejection Region is $(-\infty, -1.68]$. Since t_{obs} is in rejection region, we reject H_0

Cereal Weight Example Cont'd

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4. P-Value Method: $\mathbb{P}(t^* \leq -2) = 0.0256 < \alpha = 0.05 \Rightarrow$ reject H_0

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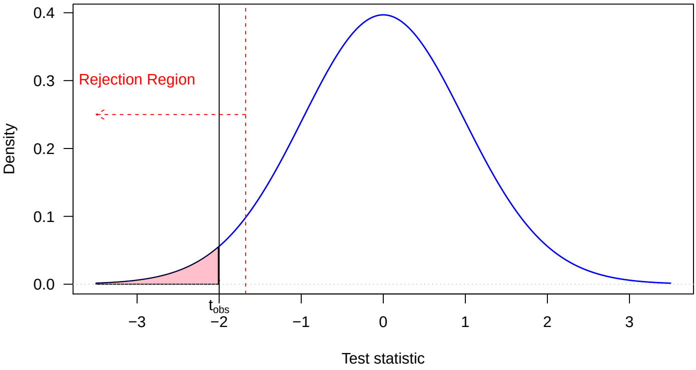
4. P-Value Method: $\mathbb{P}(t^* \leq -2) = 0.0256 < \alpha = 0.05 \Rightarrow$ reject H_0
5. Draw a Conclusion: We do have enough statistical evidence to conclude that the average weight is less than 16 oz at 0.05 significant level

Cereal Weight Example Cont'd

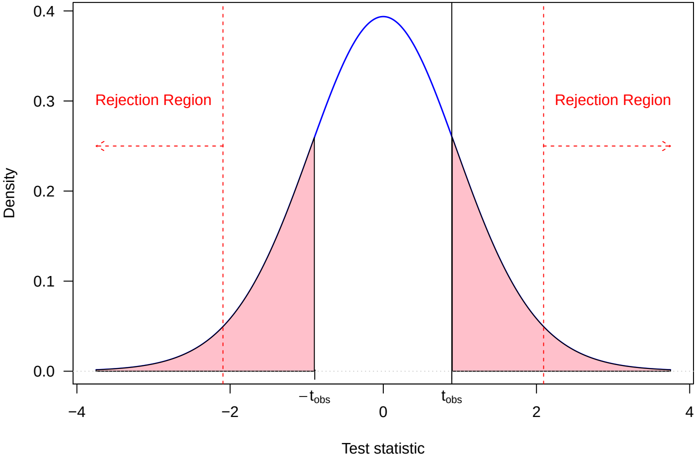


Example

A series of blood tests were run on a particular patient over five days. It is of interest to determine if the mean blood protein for this patient differs from 7.25, the value for healthy adults. Suppose the sample mean (n=20) is 7.35 and sample standard deviation is 0.5. Perform a hypothesis test using significance level of 0.05

1. $H_0 : \mu = 7.25$ vs. $H_a : \mu \neq 7.25$
2. $t_{obs} = \frac{7.35-7.25}{0.5/\sqrt{20}} = 0.8944$
3. P-value: $2 \times \mathbb{P}(t^* \geq 0.8944) = 0.3823 > 0.05$
4. We do not have enough statistical evidence to conclude that the mean blood protein is different from 7.25 at 5% significant level

Example Cont'd



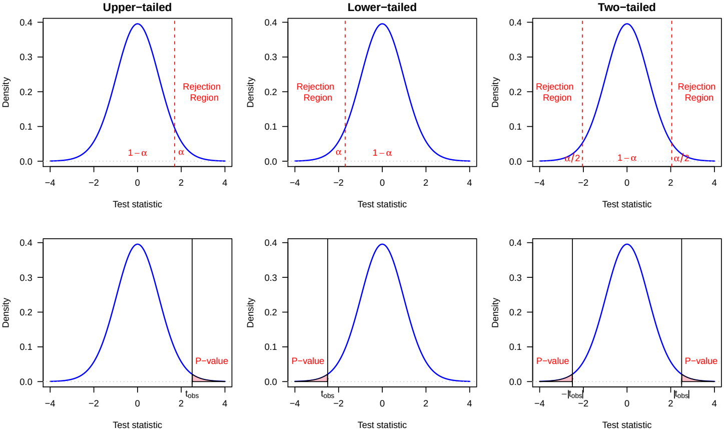
Recap: Hypothesis Testing

1. State the null H_0 and the alternative H_a hypotheses
   - $H_0 : \mu = \mu_0$ vs $H_a : \mu > \mu_0 \Rightarrow$ Upper-tailed
   - $H_0 : \mu = \mu_0$ vs $H_a : \mu < \mu_0 \Rightarrow$ Lower-tailed
   - $H_0 : \mu = \mu_0$ vs $H_a : \mu \neq \mu_0 \Rightarrow$ Two-tailed
2. Compute the test statistic

   $t^* = \frac{\bar{X}_n - \mu_0}{s/\sqrt{n}}$ (σ unknown); $z^* = \frac{\bar{X}_n - \mu_0}{\sigma/\sqrt{n}}$ (σ known)
3. Identify the rejection region(s) (or compute the P-value)
4. Draw a conclusion

   We do/do not have enough statistical evidence to conclude H_a at α significant level

Region Region and P-Value Methods



The 2×2 Decision Paradigm for Hypothesis Testing

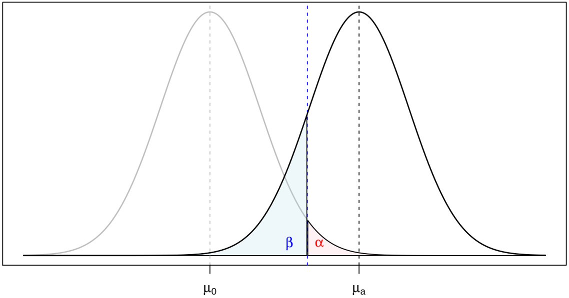
True State	Decision	
	Reject H_0	Fail to reject H_0
H_0 is true	Type I error	Correct
H_0 is false	Correct	Type II error

Errors in Hypothesis Testing

- The probability of a type I error is denoted by α
- The probability of a type II error is denoted by β

Type I & Type II Errors

- Type I error: $\mathrm{P}(\text{Reject } H_0 | H_0 \text{ is true}) = \alpha$
- Type II error: $\mathrm{P}(\text{Fail to reject } H_0 | H_0 \text{ is false}) = \beta$



$\alpha \downarrow \beta \uparrow$ and vice versa

Type II Error and Power

- The type II error, β, depends upon the true value of μ (let's call it μ_a)
- We use the formula below to compute β

$$\beta(\mu_a) = \mathrm{P}(z^* \le z_\alpha - \frac{|\mu_0 - \mu_a|}{\sigma/\sqrt{n}})$$

- The power (PWR): $\mathrm{P}(\text{Reject } H_0 | H_0 \text{ is false}) = 1 - \beta$. Therefore PWR$(\mu_a) = 1 - \beta(\mu_a)$

Question: What increases Power?

Sample Size Determination

Suppose that we wish to determine what sample size is required to detect the difference between a hypothesized mean and true mean $\mu_0 - \mu_a$, denoted by Δ, with a given power $1 - \beta$ and specified significance level α and known standard deviation σ. We can use the following formulas

$$n = \sigma^2 \frac{(z_\alpha + z_\beta)^2}{\Delta^2} \text{ for a one-tailed test}$$

$$n \approx \sigma^2 \frac{(z_{\alpha/2} + z_\beta)^2}{\Delta^2} \text{ for a two-tailed test}$$

Example

An existing manufacturing process produces, on average, 100 units of output per day. A pilot plant is used to evaluate a possible process change. Suppose the Company CEO wants to know if yield is increased. The CEO uses $\alpha = 0.05$ and the sample mean $(n = 25)$ is 103. Do we have sufficient evidence to conclude that the mean yield exceeds 100 if $\sigma = 10$?

1. $H_0 : \mu = 100$ vs. $H_a : \mu > 100$
2. $z_{obs} = \frac{103-100}{10/\sqrt{25}} = 1.5$
3. The cutoff value of the rejection region is $z_{0.05} = 1.645$. Therefore we do not have enough evidence to conclude that the new process mean yield exceeds 100

Example Cont'd

Suppose the true true mean yield is 104.

- What is the power of the test?

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- What is the power of the test?

$$\begin{aligned}\beta(\mu = 104) &= \mathbb{P}\left(Z \leq z_{0.05} - \frac{|100 - 104|}{10/\sqrt{25}}\right) \\ &= \mathbb{P}(Z \leq 1.645 - 4/2) = \mathbb{P}(Z \leq -0.355) \\ &= \Phi(-0.355) = 0.3613\end{aligned}$$

Therefore, the power is $1 - 0.3613 = 0.6387$

- What sample size is required to yield a power of 0.8 with a significance level of 0.05?

Example Cont'd

Suppose the true true mean yield is 104.

- What is the power of the test?

$$\beta(\mu = 104) = \mathbb{P}\left(Z \le z_{0.05} - \frac{|100 - 104|}{10/\sqrt{25}}\right)$$
$$= \mathbb{P}(Z \le 1.645 - 4/2) = \mathbb{P}(Z \le -0.355)$$
$$= \Phi(-0.355) = 0.3613$$

Therefore, the power is $1 - 0.3613 = 0.6387$

- What sample size is required to yield a power of 0.8 with a significance level of 0.05?

$$n = \sigma^2 \frac{(z_{0.05} + z_{0.2})^2}{\Delta^2} = 10^2 \frac{(1.645 + 0.8416)^2}{4^2} = 38.6324$$

Therefore, the required sample size is 39

Duality of Hypothesis Test with Confidence Interval

There is an interesting relationship between CIs and hypothesis tests. If H_0 is rejected with significance level α then the corresponding confidence interval does not contain the value μ_0 targeted in the hypotheses with the confidence level $(1 - \alpha)$, and vice versa

Hypothesis test at α level	$(1-\alpha)\times$ 100% CI
$H_0 : \mu = \mu_0$ vs. $H_a : \mu \neq \mu_0$	$\bar{X} \pm t_{\alpha/2,n-1} \frac{s}{\sqrt{n}}$
$H_0 : \mu = \mu_0$ vs. $H_a : \mu > \mu_0$	$\left(\bar{X} - t_{\alpha,n-1} s/\sqrt{n}, \infty\right)$
$H_0 : \mu = \mu_0$ vs. $H_a : \mu < \mu_0$	$\left(-\infty, \bar{X} + t_{\alpha,n-1)s/\sqrt{n}}\right)$