
Introduction to Inference

Tests of Significance

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Tests of significance

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The significance level α

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Reasoning of significance tests

We have seen that the properties of the sampling distribution of the sample mean help us estimate a range of likely values for population mean μ .

We can also rely on the properties of the sample distribution to test hypotheses.

Ex: You are in charge of quality control in your food company. You sample randomly 35 packs of cherry tomatoes, each labeled 1/2 lb. (227 g).

The average weight from your 35 boxes is 225 g. Obviously, we cannot expect boxes filled with whole tomatoes to all weigh exactly half a pound. Thus,

- Is the somewhat smaller weight simply due to chance variation?

OR

- Is it evidence that the calibrating machine that sorts cherry tomatoes into packs needs revision?



Stating hypotheses

A **test of statistical significance** tests a specific hypothesis using sample data to decide on the validity of the hypothesis.

In statistics, a **hypothesis** is a statement about the population, developed for the purpose of testing. **It is a statement about the value of a population parameter.**

What you want to know: Does the calibrating machine that sorts cherry tomatoes into packs need revision?

The same question reframed statistically: Is the population mean μ for the distribution of weights of cherry tomato packages equal to 227 g (i.e., half a pound)?



Stating hypotheses

- The statement being tested in a test of significance is called the null hypothesis, H_0 . The test of significance is designed to assess the strength of the evidence against the null hypothesis. It is usually a statement of “no effect” or “no difference.”
- The alternative hypothesis is the statement we suspect is true instead of the null hypothesis. It is labeled H_a .

- Null Hypothesis:

- It is a statement about the value of a population parameter.
- Status quo.
- Denoted as H_0 .

- Research (Alternate) Hypothesis:

- It is a statement about the value of a population parameter.
- What the researcher is trying to prove.
- Opposite of the H_0 .
- Denoted as H_a or H_1 .

One-sided and two-sided tests

- A **two-tail or two-sided test** of the population mean has these null and alternative hypotheses:

$$H_0: \mu = [\text{a specific number}]$$

$$H_a: \mu \neq [\text{a specific number}]$$

- A **one-tail or one-sided test** of a population mean has these null and alternative hypotheses:

$$H_0: \mu = [\text{a specific number}]$$

$$H_a: \mu < [\text{a specific number}] \quad \text{OR}$$

$$H_0: \mu = [\text{a specific number}]$$

$$H_a: \mu > [\text{a specific number}]$$

Stating hypotheses

Weight of cherry tomato packs:

$H_0: \mu = 227$ g (μ is the average weight of the population of packs)

$H_a: \mu \neq 227$ g (μ is either larger or smaller)



Possible Results from Testing

- ❑ Reject the **Null Hypothesis**
- ❑ Do Not Reject the **Null Hypothesis** or
Failure to Reject the **Null Hypothesis**

Running a test of significance is a balancing act between the chance α of making a **Type I error** and the chance β of making a **Type II error**. Reducing α reduces the power of a test and thus increases β .

	H_0 true	H_a true
REJECT H_0	Type I error	Correct decision
DO NOT REJECT H_0	Correct decision	Type II error

Sample Evidence: Test statistics

- The test statistic is based on the statistic that estimates the parameter.
- Because Normal calculations require standardized variables, we use as our test statistic the standardized sample mean.

$$Z = \frac{\bar{X} - \mu_0}{s / \sqrt{n}}$$

- This random variable has the standard Normal distribution $N(0, 1)$.

Statistical Significance

- In statistics, a result is called **statistically significant** if it has been predicted as unlikely to have occurred by chance alone, according to a pre-determined threshold probability, the significance level, *alpha*.

The P -value

The packaging process has a known standard deviation, $s = 7$ g.

$$H_0: \mu = 227 \text{ g}$$

$$H_a: \mu \neq 227 \text{ g}$$

The average weight from your 35 random boxes is 225 g.

What is the probability of drawing a random sample such as yours if H_0 is true?



Tests of statistical significance quantify the chance of obtaining a particular random sample result **if the null hypothesis were true**. This quantity is the **P -value**.

This is a way of assessing the “believability” of the null hypothesis given the evidence provided by a random sample.

Interpreting a P -value

Could random variation alone account for the difference between the null hypothesis and observations from a random sample?

- ▣ A small P -value implies that random variation because of the sampling process alone is not likely to account for the observed difference.
- ▣ With a small P -value we **reject H_0** . The true property of the population is **significantly** different from what was stated in H_0 .

Thus, small P -values are strong evidence AGAINST H_0 .

But how small is small...?

The significance level, α

We compare the p -value with a level that we regard as decisive called the **significance level**, α . This value is decided arbitrarily before conducting the test.

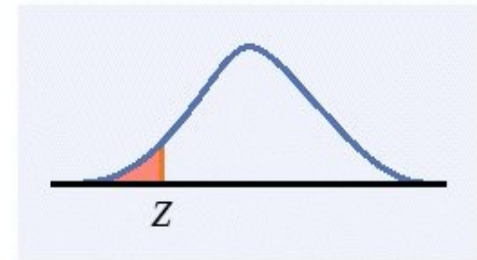
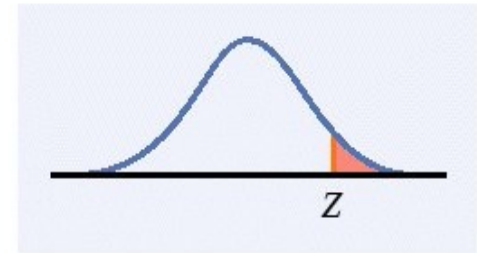
- ▣ If the P -value is equal to or less than α ($p \leq \alpha$), then we **reject H_0** .
- ▣ If the P -value is greater than α ($p > \alpha$), then we **fail to reject H_0** .

P-value in one-sided and two-sided tests

One-sided (one-tailed) test

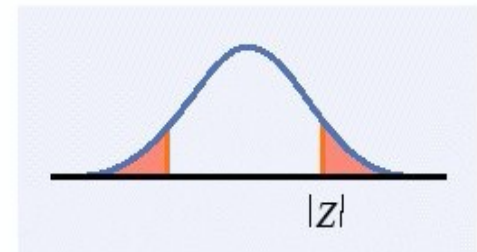
$H_a: \mu > \mu_0$ is $P(Z \geq z)$

$H_a: \mu < \mu_0$ is $P(Z \leq z)$



Two-sided (two-tailed) test

$H_a: \mu \neq \mu_0$ is $2P(Z \geq |z|)$



To calculate the p -value for a two-sided test, use the symmetry of the Normal curve. Find the p -value for a one-sided test and double it.



Does the packaging machine need revision?

- $H_0: \mu = 227$ g versus $H_a: \mu \neq 227$ g
- What is the probability of drawing a random sample such as yours if H_0 is true?
- Use alpha = 0.05

$$\bar{x} = 225\text{g} \quad s = 7\text{g} \quad n = 35$$

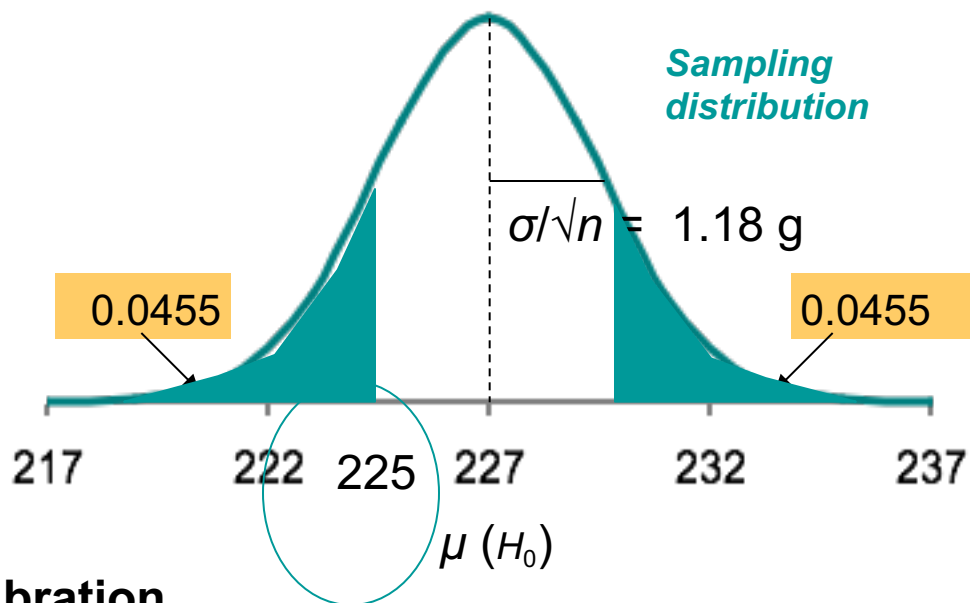
$$z = \frac{\bar{x} - \mu}{s/\sqrt{n}} = \frac{225 - 227}{7/\sqrt{35}} = -1.69$$

The area under the standard Normal curve to the left of z is 0.0455.

Thus, $P\text{-value} = 2 \times 0.0455 = 0.0910$.

The probability of getting a random sample average so different from μ is not unlikely enough to reject H_0 .

→ **The machine does not need recalibration.**



Result and Conclusion

- ❑ Result: Do not Reject H_0
- ❑ Conclusion: There is not enough evidence, at the 0.05 level of significance, to conclude that the average weight (μ) is not exactly equal to 227g.
- ❑ Therefore, based on the evidence, the machine does not need recalibration.

- ❑ What would be a consequence of incurring type I error?
- ❑ What would be a consequence of incurring type II error?

Steps of Hypothesis Testing

1. Formulate the **null hypothesis** (commonly, that the observations are the result of pure chance) and the **alternative hypothesis** (commonly, that the observations show a real effect combined with a component of chance variation).
2. Identify a **test statistic** that can be used to assess the truth of the null hypothesis.
3. Compute the **p-value**, which is the probability that a test statistic at least as significant as the one observed would be obtained assuming that the null hypothesis were true. **The smaller the p-value, the stronger the evidence against the null hypothesis.**
4. Compare the p-value to an acceptable significance value (the alpha value). **If the p-value is less than or equal to alpha**, then the observed effect is statistically significant, the null hypothesis is ruled out in favor of the alternative hypothesis.