

Type I and Type II Errors

Because we are basing our conclusion in a significance test on sample data, there is always a chance that our conclusions will be in error. It turns out that there are two types of errors that can be committed in a significance test:

- If we reject H_0 when H_0 is true, it is called a **Type I Error**
- If we fail to reject H_0 when H_0 is false, it is called a **Type II Error**

Memory aid: Type II error occurs when we fail to reject the null hypothesis when we really should.

	H_0 TRUE	H_0 FALSE (H_A TRUE)
REJECT H_0	TYPE I	CORRECT
FAIL TO REJECT H_0	CORRECT	TYPE II



Example - The manager of a fast-food restaurant wants to reduce the proportion of drive-through customers who have to wait for more than 2 minutes to receive their food once their order is placed. Based on store records, the proportion of customers who had to wait at least 2 minutes was $p = 0.63$. To reduce this proportion, the manager will collect a random sample of drive-through times and test the following hypotheses:

$$H_0: p = 0.63$$

$$H_A: p < 0.63$$

TYPE I - REJECT $p = 0.63$ WHEN THAT IS TRUE
 TYPE II - FAIL TO REJECT $p = 0.63$ WHEN $p < 0.63$

Where p is the true proportion of drive-through customers who have to wait more than 2 minutes after their order is placed to receive their food. Describe a Type I and a Type II error in this setting and explain the consequences of each.

Which is worse?

I: TRUE PROPORTION OF CUSTOMERS HAS BEEN REDUCED WHEN IT REALLY HAS NOT BEEN. HE WOULD NOT HAVE ADD'L EMPLOYEES ON DUTY.
 MGR DID NOT DECIDE

II: TRUE PROPORTION OF CUSTOMERS HAS ~~BEEN~~ BEEN REDUCED WHEN IN FACT IT HAS. MGR WOULD HAVE PEOPLE ON DUTY UNNECESSARILY.

Application - In the United States court system, defendants are "presumed innocent" and to be proven guilty, it must be done "beyond a shadow of a doubt."

In this situation, what constitutes a Type I error?

FINDING GUILTY WHEN INNOCENT.

What constitutes a Type II error?

FINDING INNOCENT WHEN GUILTY

Which error is worse?

(DISCUSS)

REJECT INNOCENT
 FAIL TO REJECT INNOCENT

	INNOCENT	GUILTY
REJECT INNOCENT	TYPE I	✓
FAIL TO REJECT INNOCENT	✓	TYPE II

H_0 : PRESUMED INNOCENT

H_A : GUILTY.

Error Probabilities - We can assess the performance of a significance test by looking at the probabilities of the two types of errors.

Example (cont) - In the fast-food example we were testing the following hypotheses

$$H_0: p = 0.63$$

$$H_A: p < 0.63$$

where p = the true proportion of drive-through customers who have to wait more than two minutes after their order is placed to receive their food. Suppose that the manager decided to carry out this test using a random sample of 250 orders with a significance level of $\alpha = 0.10$. What is the probability of making a Type I error?

A Type I error is to reject H_0 when H_0 IS TRUE.

If our sample results in a \hat{p} that is much smaller than 0.63, we will REJECT H_0 .

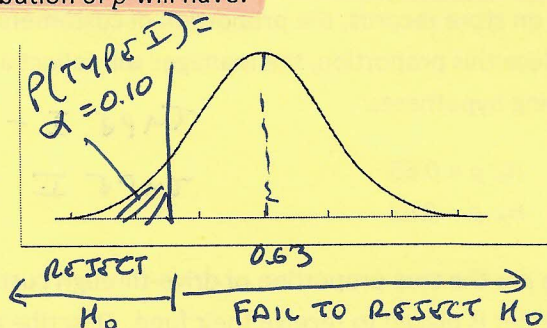
How small would \hat{p} have to be? The 10% significance level tells us to count results that could happen less than 10% of the time by chance if H_0 IS TRUE AS EVIDENCE H_0 IS FALSE.

Let's assume $H_0: p = 0.63$ is true. Then the sampling distribution of \hat{p} will have:

Shape: APPROX NORMAL S.D.C.F.
 $(250)(0.63) = 157.5$, $(250)(1-0.63) = 92.5$
BOTH ≥ 10

Center: $M_{\hat{p}} = p = 0.63$

Spread: $\sigma_{\hat{p}} = \sqrt{\frac{p(1-p)}{n}} = \sqrt{\frac{(0.63)(0.37)}{250}} = 0.0305$



From this example, what can we conclude about the probability of a Type I error? IN THIS CASE, A TYPE I ERROR OCCURS WHEN THE TRUE PROPORTION OF CUSTOMERS WHO HAVE TO WAIT AT LEAST 2 MIN REMAINS $p = 0.63$, BUT WE GET A VALUE OF \hat{p} SMALL ENOUGH THAT THE P-VALUE IS LESS THAN 0.10. WHEN H_0 IS TRUE, THIS WILL HAPPEN 10% OF THE TIME. IN OTHER WORDS $P(\text{TYPE I}) = \alpha$.

Significance and Type I Error

The significance level α of any fixed level test is the probability of a Type I error. That is, α is the probability that the test will reject the null hypothesis H_0 when H_0 is in fact true. Consider the consequences of a Type I error before choosing a significance level.

$$P(\text{Type I error}) = P(\text{Reject } H_0 \mid H_0 \text{ is true}) = \alpha$$

What about Type II errors?

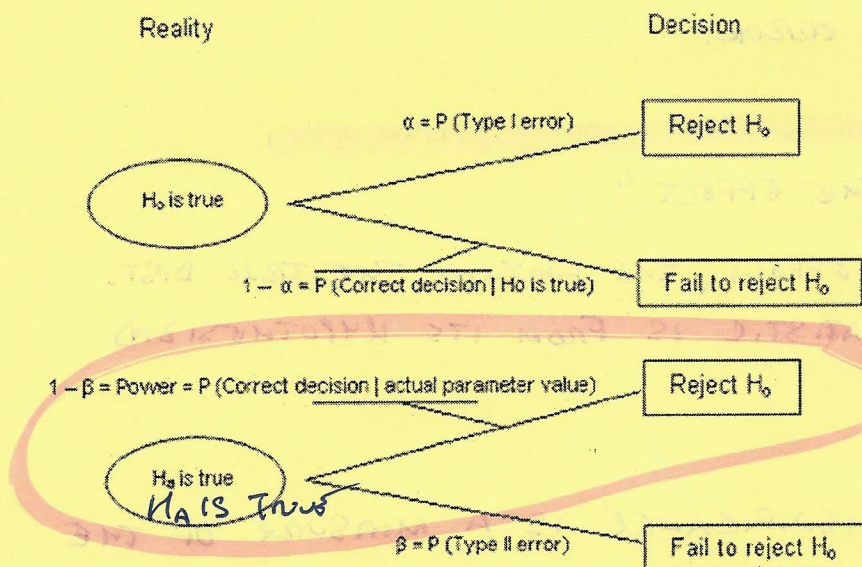
A significance test makes a Type II error when WE FAIL TO REJECT H_0 WHEN H_0 IS FALSE

A high probability of a Type II error for a particular alternative hypothesis means that the test is not sensitive enough to usually detect the alternative. Rather than being concerned with the probability of failing to reject H_0 when H_0 is false we really want the probability of "getting it right." In other words, we want the probability of rejecting H_0 when H_0 is in fact false. This probability (of "getting it right") is referred to as the **power** of a significance test.

The **power** of a test against a specific alternative is the probability that the test will reject H_0 at a chosen significance level α when the specified alternative value of the parameter is true.

The **power** of a test against any alternative is 1 minus the probability of a Type II error for that alternative, that is

$$\text{Power} = 1 - \beta = P(\text{Rejecting } H_0 \mid H_A \text{ is true})$$



✱
"GETTING IT
RIGHT."
REJECT H_0 WHEN
 H_0 IS NOT TRUE

There are many ways to explain **power**:

- Power is the probability of rejecting the null hypothesis when in fact it is false.
- Power is the probability of making a correct decision (to reject the null hypothesis) when the null hypothesis is false.
- Power is the probability that a test of significance will pick up on an effect that is present.
- Power is the probability that a test of significance will detect a deviation from the null hypothesis, should such a deviation exist.
- Power is the probability of avoiding a Type II error.

Planning Studies: The Power of a Statistical Test - How large a sample should we take to carry out a significance test? The answer depends on what alternative values of the parameter are important to detect.

There are basically four things that affect power:

- (1) The **significance level α** of the test. A LARGER α MEANS A LARGER REJECTION REGION FOR THE TEST AND THUS A GREATER PROB OF REJECTING H_0 .
- (2) The **sample size n** . A LARGER SAMPLE SIZE NARROWS THE DISTRIBUTION OF THE TEST STATISTIC.
(INCREASE TIME + RESOURCES FOR COLLECTING MORE DATA.)
- (3) The **inherent variability** in the measured response variable.
DO A PRELIM STUDY TO DET'M SAMPLE SIZE NEEDED FOR A GIVEN MARGIN OF ERROR.
- (4) The difference between the hypothesized value of a parameter and its true value.

"MAGNITUDE OF THE EFFECT"

THE LARGER THE EFFECT, THE FURTHER THE TRUE DIST. OF THE TEST STATISTIC IS FROM ITS HYPOTHEZED DISTRIBUTION.

* STATISTICAL SIGNIFICANCE IS A MEASURE OF THE STRENGTH OF EVIDENCE OF THE PRESENCE OF AN EFFECT.
IT IS NOT A MEASURE OF THE MAGNITUDE OF THE EFFECT.

Example (cont) - Suppose the manager of the fast-food restaurant wants to change some aspects of his study about the proportion of drive-through customers who have to wait at least two minutes to receive their food after they place their order.

- **Significance level:** To reduce the possibility of Type I error and avoid the possibility of unnecessarily paying an extra employee, the manager reduces the significance level from 0.10 to 0.01.
- **Practical importance:** To justify the additional cost of the extra employee, the manager decides that the true proportion must be reduced to at most 0.53.
- To get faster results, the manager reduces the sample size from 250 to 100.

How will these changes affect the power of the test of $H_0: p = 0.63$ versus $H_A: p < 0.63$?

We will use the "Improved Batting Averages (Power) Applet" at www.rossmanchance.com to answer this.

① ~~CRITICAL VALUE = 0.53~~

SEE APPLET SHEET.

- (2) $\alpha \downarrow$ POWER \downarrow
 (3) ALT \downarrow POWER \uparrow
 (4) $n \downarrow$ POWER \downarrow

① $H_0: 0.63$ $H_A: 0.53$ $n = 250, 10000 \text{ SAMPLES}$ $\alpha = 0.10$ $1 - \beta = 0.969$	③ $H_0: 0.63$ $H_A: 0.50$ $n = 250, 10000 \alpha = 0.01$ $1 - \beta = 0.9661$
② $H_0: 0.63$ $H_A: 0.53$ $n = 250, \alpha = 0.01$ $1 - \beta = 0.8072$	④ $H_0: 0.63$ $H_A: 0.50$ $n = 100$ $1 - \beta = 0.6176$

Ways to Reduce Error

- (1) If you insist on a smaller significance level, you have to take a larger sample. A smaller significance level requires stronger evidence to reject the null hypothesis.
- (2) If you insist on higher power, you will need a larger sample. Higher power gives a better chance of detecting a difference when it is really there.
- (3) At any significance level and desired power, detecting small a small difference requires a larger sample than detecting a large difference.

The best advice for maximizing the power of a test is to choose as high an α level (Type I error probability) as you are willing to risk and as large a sample size as you can afford.

HW: Read pp. 538-545; do problems 15, 19, 21, 23, 25, 31*, 32* on pp. 547-548.

WATCH CARTOON VIDEO ON CHAP 9 PAGE.