

## Lecture 4

9/9/2020

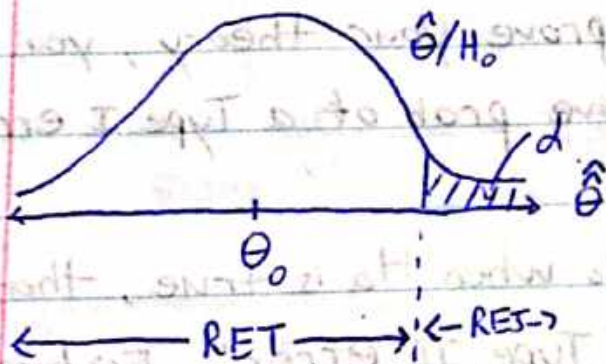
- I don't think I'll give you exam questions on this:
- 1) "level of a test"  $\alpha$  is defined as  $P(\text{Type I error}) \geq \alpha$
  - 2) "Size of a test" is exactly  $P(\text{Type I error})$ .

In our example the level was 5% but the size was 7.06% since  $\alpha = 5\%$  was "unattainable"

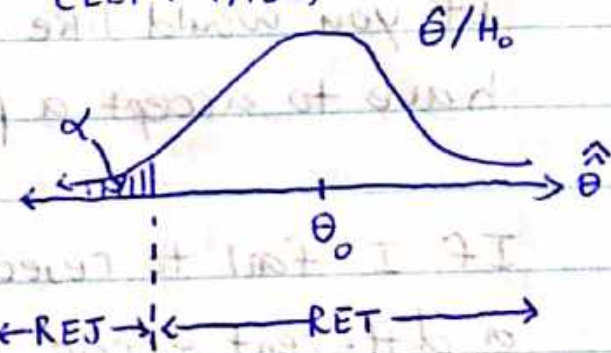
If  $\hat{\theta}/H_0$  is continuous, then level = size =  $\alpha$ . If it's discrete, some sizes won't be attainable.

If I want a level of  $\alpha = 5\%$  and the size is lower, then I'm "cheating" (we'll see why next class).

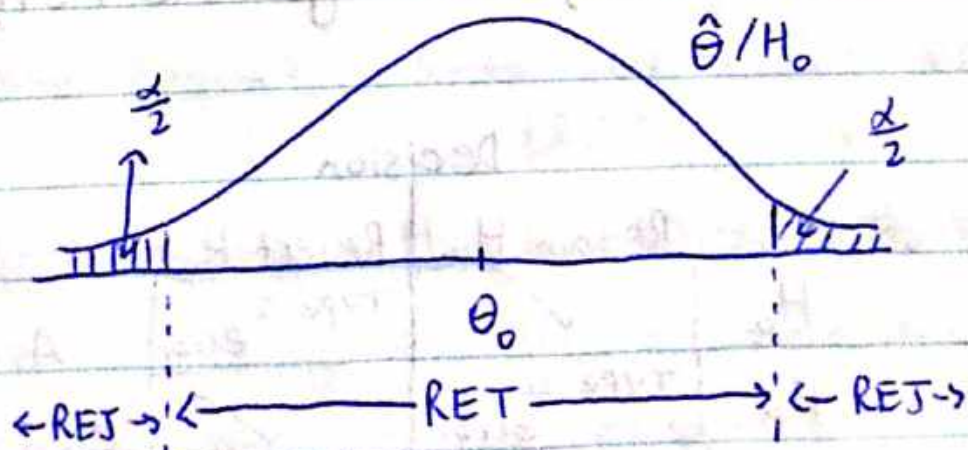
$H_a: \theta > \theta_0$   
(RIGHT TAIL)



$H_a: \theta < \theta_0$   
(LEFT TAIL)



$H_a: \theta \neq \theta_0$   
(TWO TAIL)



What we did in the previous lecture was called a "Binomial exact test of one proportion". Downsides:  
 1) you need a binomial PMF calculator and it's a lot of work to get the retainment region

2) NOT all sizes are attainable: This is the recommended test.

Let  $X_1, X_2, \dots, X_n \sim \text{i.i.d.}$  some distr. w/ mean  $\mu$  and var  $\sigma^2$ . The central limit theorem (CLT) shows that:

$$\frac{\bar{X} - \mu}{\frac{\sigma}{\sqrt{n}}} \xrightarrow{d} N(0, 1) \quad \text{"convergence in dist."}$$

It means as  $n$  gets large, the CDF of the left hand side (L.H.S.) looks more and more like the CDF of the right hand side (R.H.S.)

Prob gonna use this more

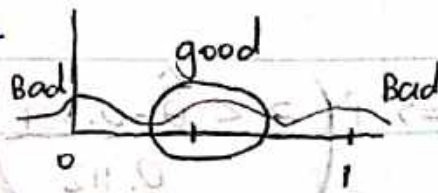
approx distr.

$$\Rightarrow \bar{X} \sim N\left(\mu, \frac{\sigma^2}{n}\right) \quad \text{and} \quad T = X_1 + \dots + X_n \sim N(n\mu, n\sigma^2)$$

If  $X_1, \dots, X_n \sim \text{i.i.d. Bern}(\theta)$  and  $n$  is "large" then:

$$\hat{\theta} = \bar{X} \sim N\left(\theta, \frac{\theta(1-\theta)}{n}\right) \quad \text{this is a pretty good approx if } \theta \text{ is not too close to 0 or 1.}$$

Ex:



How to perform an "approximate test"? There are many, many options even for the same DGP. The protocol goes as follows:

1) you think of a "test statistic" that could measure the departure away from  $H_0$ .

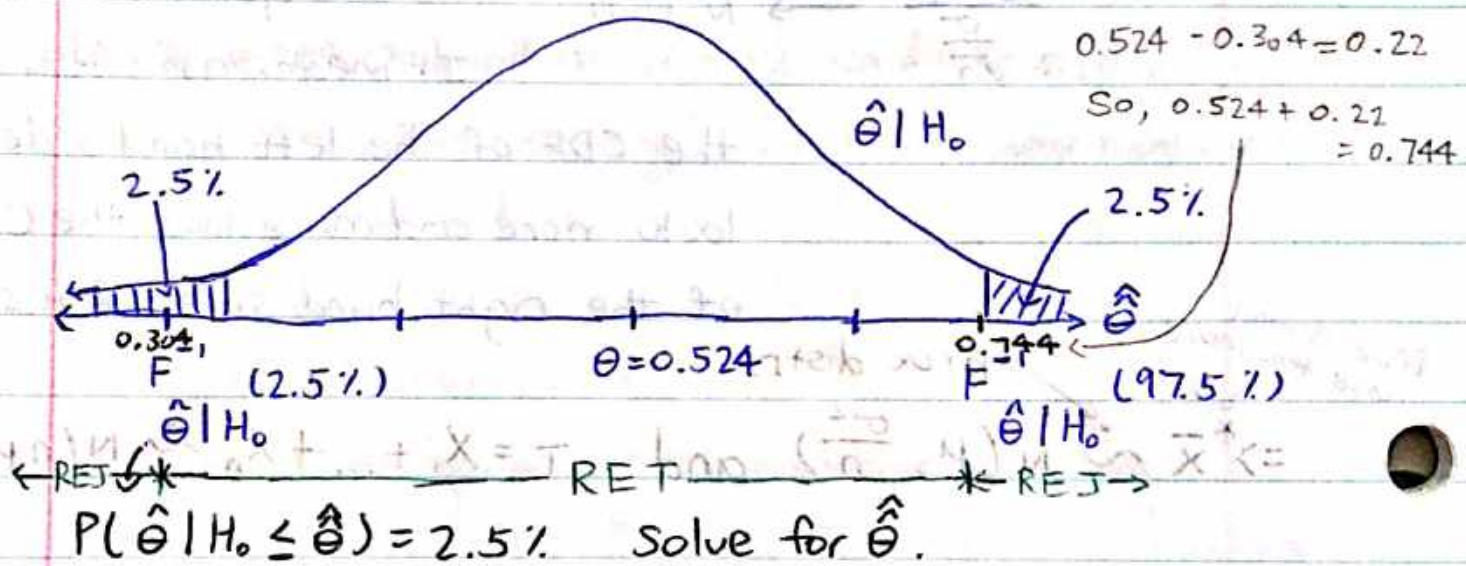


- 2) Derive the Statistical Estimator's \*approx\* distr.  
under  $H_0$ ,  $\hat{\theta} | H_0$ .
- 3) Gauge the departure of  $\hat{\theta}$  from the bulk of the  
distr.  $\hat{\theta} | H_0$  at level  $\alpha$ .

$H_0: \theta = 0.524$ ,  $H_a: \theta \neq 0.524$ ,  $n=20$ ,  $\hat{\theta} = 0.6$  (same as last class)

$$\hat{\theta} | H_0 \sim N\left(0.524, \frac{0.524(1-0.524)}{20}\right) = N\left(0.524, \frac{\sigma^2}{\sigma}\right)$$

Set  $\alpha = 5\% \Rightarrow \frac{\alpha}{2} = 2.5\%$



$$\Rightarrow P\left(\frac{\hat{\theta} | H_0 - 0.524}{0.112} \leq \frac{\hat{\theta} - 0.524}{0.112}\right) = 2.5\%$$

$N(0,1)$

look at table / use PC

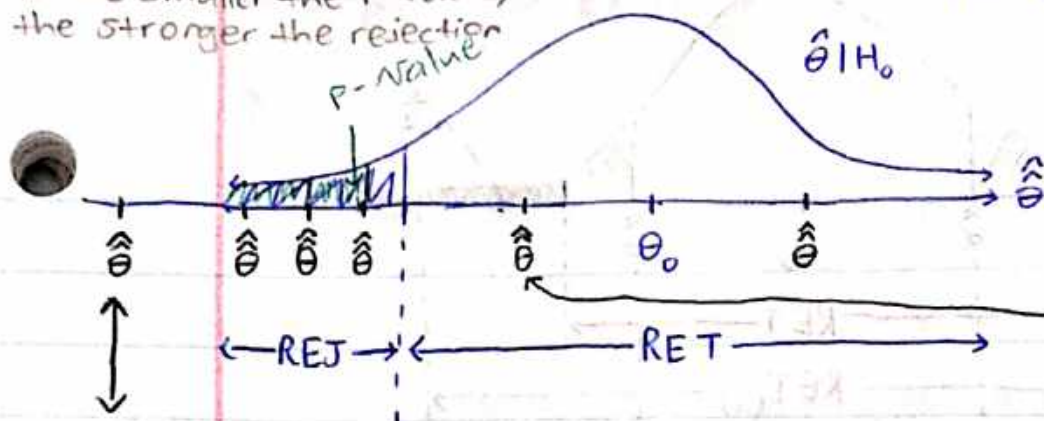
$$\Rightarrow P\left(Z \leq \frac{\hat{\theta} - 0.524}{0.112}\right) = 2.5\% \Rightarrow \frac{\hat{\theta} - 0.524}{0.112} \approx 1.96 \approx 2$$

$$\Rightarrow \hat{\theta} = 0.304$$

one proportion z-test (approx test)

\* The smaller the P-value, the stronger the rejection

$H_a: \theta < \theta_0$



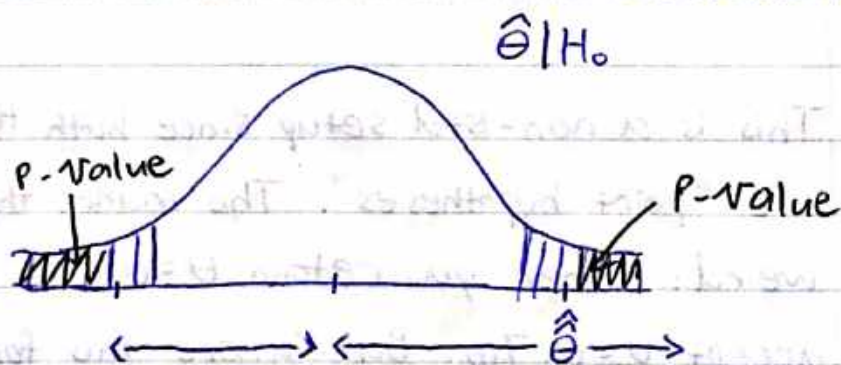
this estimate should imply a "stronger" rejection than this estimate

To measure the "strength" of a rejection (or "weakness" of a retainment), Fisher introduced the "P-Value" also called the level of statistical significance as:

P-value =  $P(\text{estimate is more extreme than the one observed} \mid H_0)$

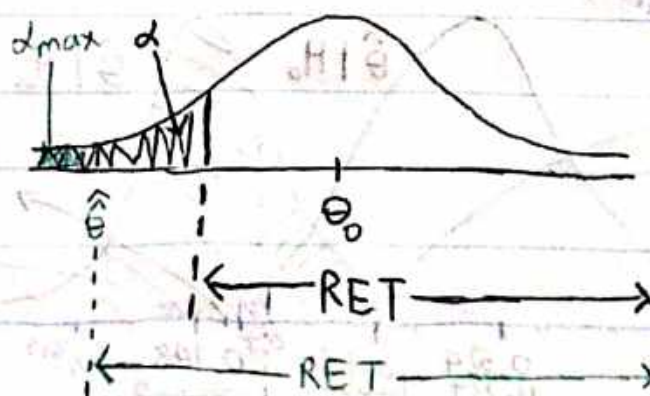
nebulous

2-sided test

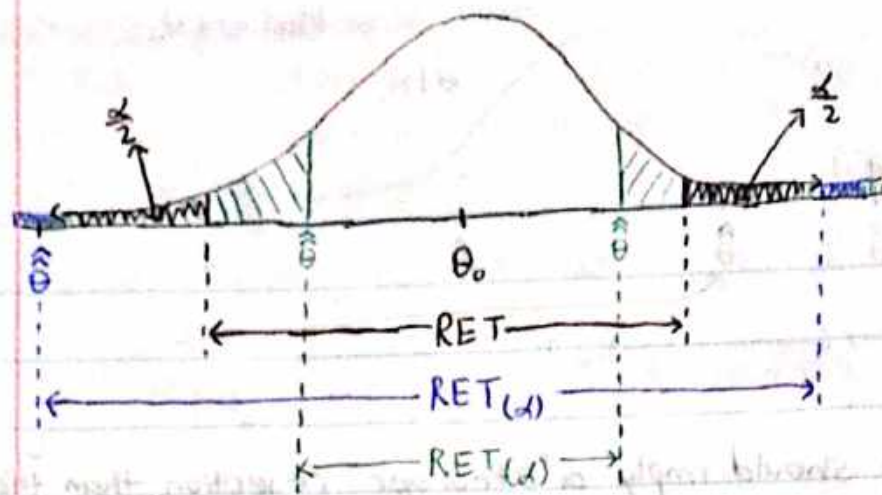


Real definition:

P-value =  $\max \{ \alpha : \hat{\theta} \in \text{RET}(\alpha) \}$







If  $H_0$  is retained, that means  $P\text{-value} \geq \alpha$  and  
 if  $H_0$  is rejected, that means  $P\text{-value} < \alpha$

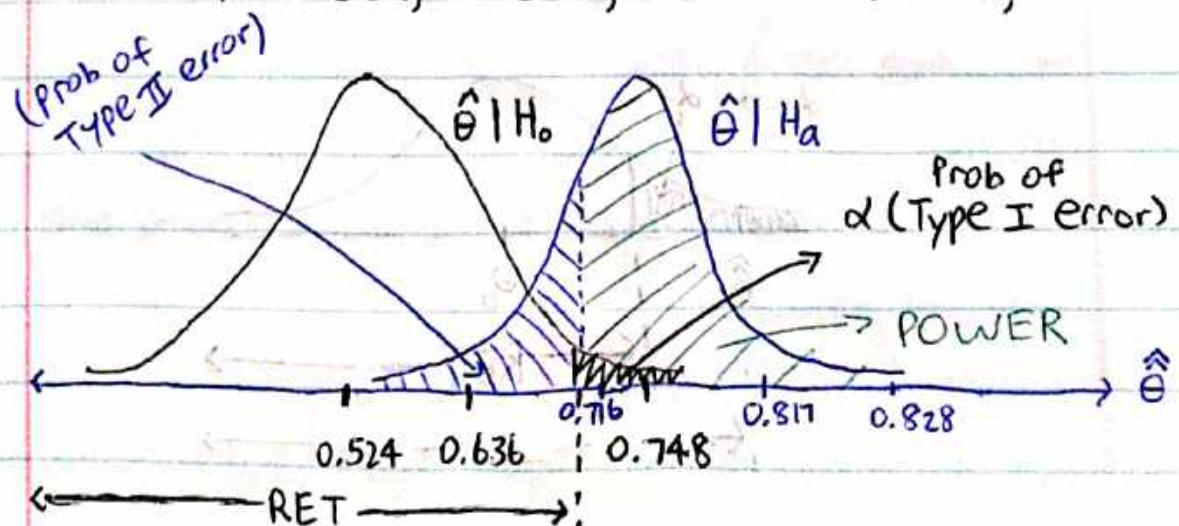
## Type II errors and POWER

DGP:  $X_1, \dots, X_n \sim \text{i.i.d. Bern}(\theta)$

$H_0: \theta = 0.524 = \theta_0$  but  $H_a: \theta = 0.716 = \theta_a$

This is a non-std setup since both  $H_0$  and  $H_a$  are "point hypotheses". This makes the outcome weird: either you retain  $\theta = 0.524$  or you accept  $\theta = 0.716$ . But ignore this for now.

$$\hat{\theta} | H_0 \sim N(0.524, 0.112^2), \quad \hat{\theta} | H_a \sim N(0.716, 0.101^2)$$



At  $\alpha = 5\%$ , the  $z$ -value is 1.645 which means the rejection region ends at

$$\hat{\theta} = 0.524 + 1.645 * 0.112 = 0.708$$

		Errors	
		Decision	
Truth	$H_0$	RET	RET
	$H_a$	TYPE 2	TYPE 1

$$\text{POWER} = P(\text{Rejecting } H_0 | H_a)$$

$$\uparrow = 1 - P(\text{Retaining } H_0 | H_a) = 1 - P(\text{Type II error})$$

POWER is the probability of proving your theory is true!! You want POWER to be LARGE i.e. near 100%.

$$P(\text{Type II error}) = P(\hat{\theta} | H_a \in \text{RET}) = P(\hat{\theta} | H_a \leq 0.708)$$

$$= P\left(\frac{\hat{\theta} | H_a - 0.716}{0.101} \leq \frac{0.708 - 0.716}{0.101}\right)$$

$$= P(z \leq -0.079) \approx 47\%$$

$$\Rightarrow \text{POWER} \approx 53\%$$