

Bensamin Nguyen

9/12/20

Les #04

I don't think I'll give you exam questions on this:

"Level of a test" alpha is defined as  $P(\text{Type I error}) = \alpha$  "size of a test" is exactly  $P(\text{Type I error})$ .

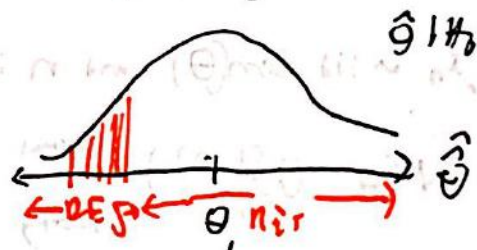
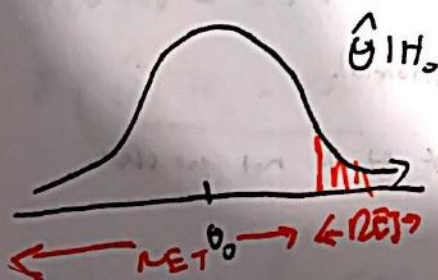
In our example the level of alpha was 5%, but the size was 7.06%. Since  $\alpha = 5\%$  was "unattainable".

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

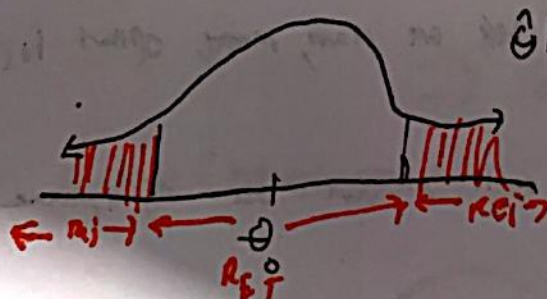
If I want a level of  $\alpha = 5\%$  and the size is lower, then I'm "cheating".

$$H_a: \theta > \theta_0$$

$$H_a: \theta < \theta_0$$



$$H_a: \theta \neq \theta_0$$



What we did in the previous lecture was called a "binomial exact test" or <sup>if</sup> proportion. Downsides: (1) you need a binomial pmf calculator and it's a bit of work to get the rejection region (2) not all sizes are attainable.

Let  $X_1, X_2, \dots, X_n \sim \text{iid}$  some distribution with mean  $\mu$  and variance  $\sigma^2$ . The CLT shows that:

$$\frac{\bar{X} - \mu}{\frac{\sigma}{\sqrt{n}}} \rightarrow N(0,1)$$

"Convergence in distribution". As  $n$  gets large, looks more like bell curve; LHS looks more like the RHS CDF.

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

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

$$\hat{\theta} = \bar{X} \sim N(\theta, \frac{\theta(1-\theta)}{n})$$

Normal approximation to binomial.  
Pretty good approximation if  $\theta$  is not too close to 0 or 1.

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

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

(2) derive the sampling distribution's "approx" distribution under  $H_0$ .

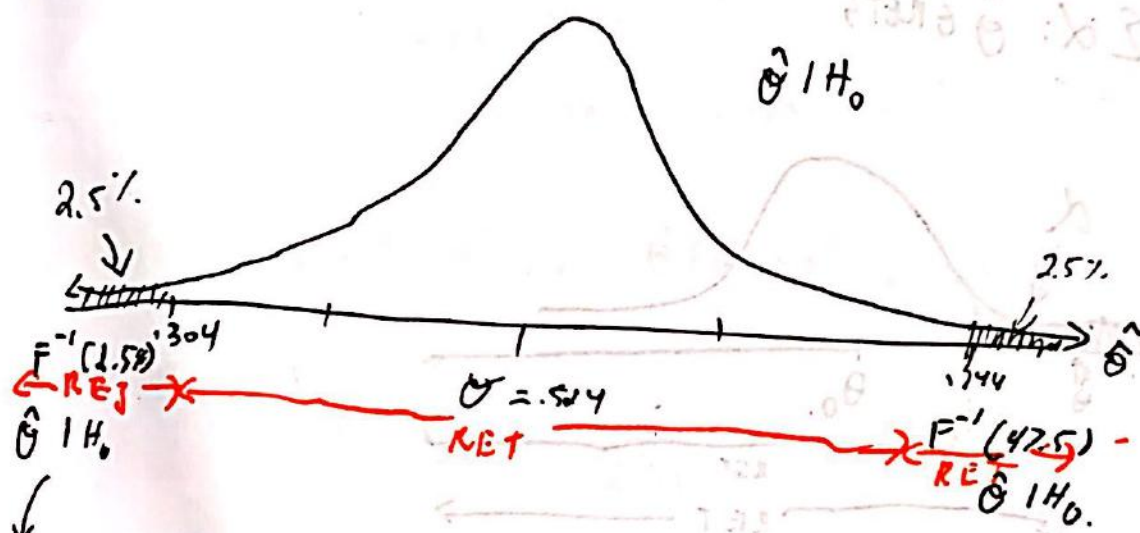
(3) Gauge the departure of  $\hat{\theta}$  from the value of the distribution.

$\hat{\theta} | H_0 \sim \text{dist}$  at level  $\alpha$ .



$H_0: \theta = .524$ ,  $H_a: \theta \neq .524$ ,  $n = 20$ ,  $\hat{\theta} = 0.16$  (same as last class)

$$\hat{\theta} | H_0 \sim N\left(.524, \frac{.524(1-.524)}{20}\right) = N(.524, .112)$$



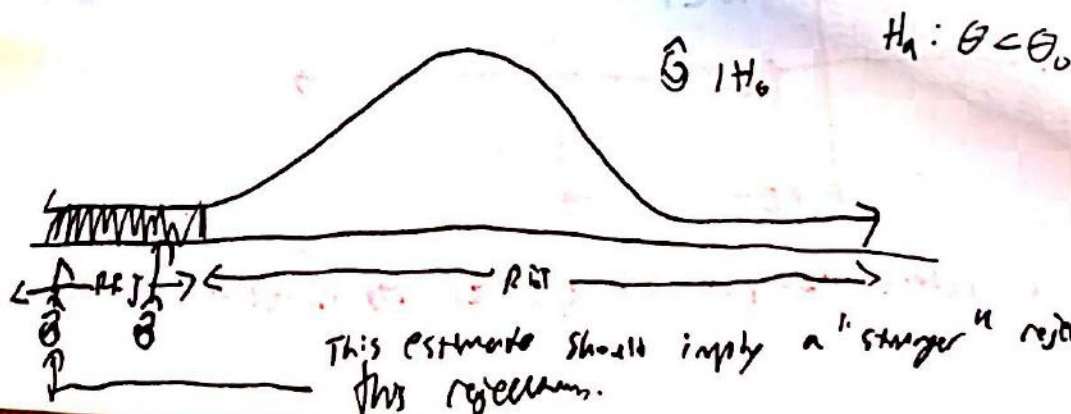
$$P(\hat{\theta} | H_0 \leq \hat{\theta}) = 2.5\%. \text{ Solve for } \hat{\theta}.$$

$$P\left(\frac{\hat{\theta} | H_0 - .524}{.112} \leq \frac{\hat{\theta} - .524}{.112}\right) = 2.5\%.$$

$$P\left(Z \leq \frac{\hat{\theta} - .524}{.112}\right) = 2.5\% \Rightarrow \frac{\hat{\theta} - .524}{.112} = 1.96 = 2.$$

$$\Rightarrow \hat{\theta} = .304.$$

"One proportion z-test (approximate test).



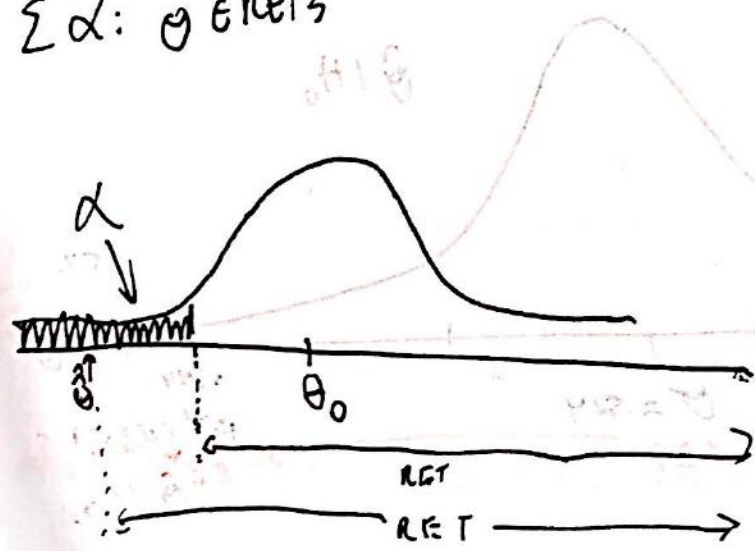
This estimate should imply a "strong" rejection. The  
this rejection.

To measure the "strength" of a rejection (or "weakness" of a retention), Fine introduces the "p-value" also called the level of statistical significance as:

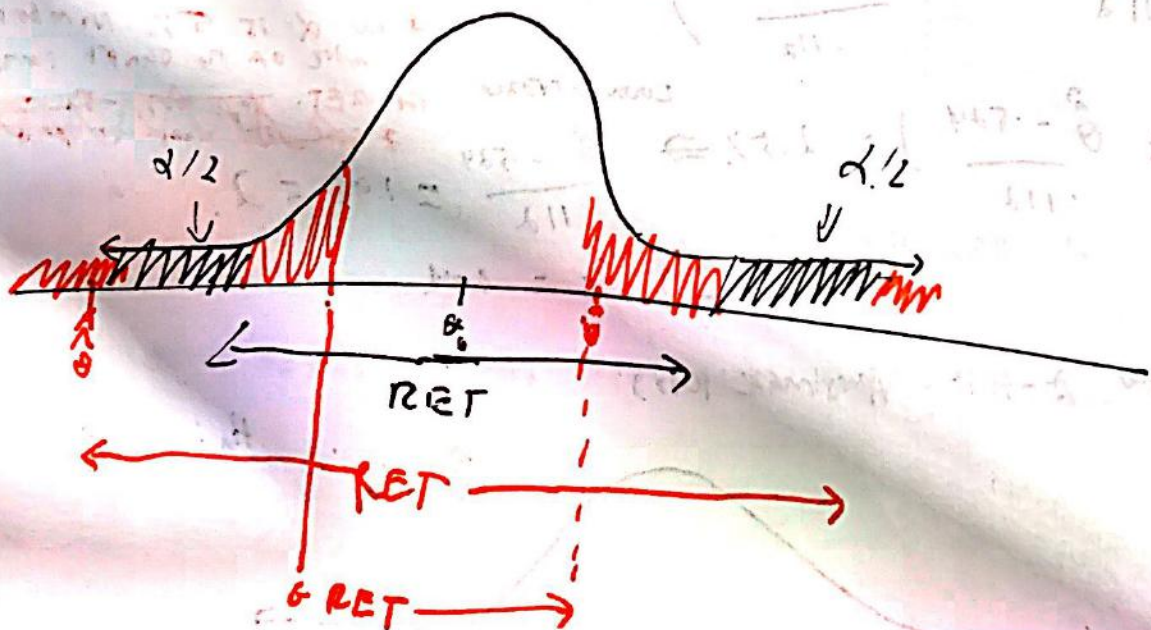
$$p\text{-value} := P(\text{estimate is more extreme than the one observed} \mid H_0)$$

Real definition:

$$p\text{-value} = \max \sum \alpha : \hat{\theta} \in \text{RET}$$



α max: The largest p-value such that α is still inside in RET.



If  $H_0$  is retained  $\Rightarrow p\text{-val} > \alpha$ . If  $H_0$  is rejected  $\Rightarrow p\text{-val} \leq \alpha$ .



File II error and power

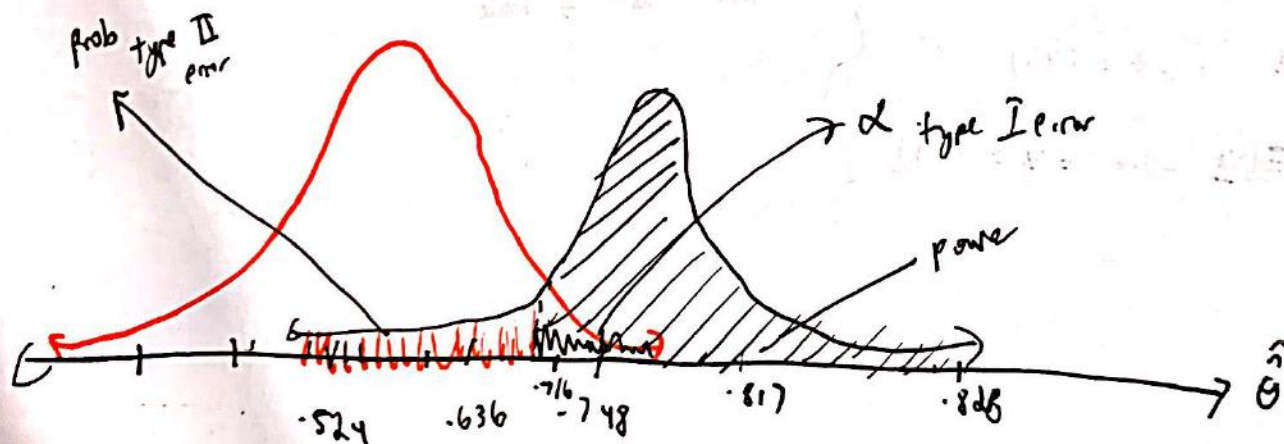
DGP:  $X_1, \dots, X_n \text{ iid } \text{Bern}(\theta)$

$H_0: \theta = .524 = \theta_0$  but  $\theta = .716 = \theta_a$

Min standard

either you retain  $\theta = .524$  or accept  $\theta = .716$ .

$$\hat{\theta} | H_0 \sim N(-.524, .112^2), \quad \hat{\theta} | H_a \sim N(.716, .101^2)$$



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

$$\hat{\theta} = -.524 + 1.645 * .112 = -.708$$

$$\theta_0 + z * SD$$

$$\text{power} = P(\text{rejection } H_0 | H_a)$$

$$= 1 - P(\text{retaining } H_0 | H_a) = 1 - (\text{type II error})$$

power is the prob of being right!!  
you want power to be near 100!

		Decision	
		RET	REJ
Truth	$H_0$		Type I
	$H_a$	Type II	

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

$$= P(\hat{\theta} | H_a \leq -.708)$$



$$P\left(\frac{\hat{\theta} - \theta_0}{\sqrt{1/n}} \leq \frac{.708 - .716}{\sqrt{.01}}\right) = P(Z \leq -0.79) \approx 47\%$$

$$.5 - .0319 \approx 46.8\%$$

$$1 - 47 = 53$$

39d.

~~use table~~  
 $P(Z \leq -0.79)$

$$P(0 \leq Z < 1.40)$$

$$P(-0.6 \leq Z \leq 1.40)$$

use "half" Z table.

