

# Topics:

- coin fair or biased (contd) → heads; tails; either
- 2-sided vs 1-sided tests
- - [framework] for Hyp-testing
  - { - Z-test
  - T-test
  - Z-proportions test

Toss 100-times  $\rightarrow$  65 heads

Previous class

$$p\text{-val} = P(T \geq T_{\text{obs}} = 65 \mid H_0) = 0.17\% < \underline{\alpha = 5\% \text{ (default)}}$$

$\downarrow$

$\hookrightarrow$  coin is fair       $\hookrightarrow$  significance level

reject  $H_0$  and accept  $H_a$

[  
disb of  
 $T$  under  $H_0$   
↳  $\text{Bin}(n=100; p=0.5)$

coin is biased  
towards heads



biased towards tails. X

$T_{obs} = 20$

$p\text{-val} = P(T \geq 20 | H_0) = 0.91$  ✓ >  $\alpha = 0.05$

$\downarrow$

$p\text{-val} > \alpha$

$\downarrow$

accept  $H_0$  ✓

$$p\text{-val} = P(T \geq 20 | H_0) = 0.91$$

$H_0$ : coin is fair  
 $H_a$ : coin is biased towards heads

~~=~~

↪ (later)

$H_0$ : coin is fair  
 $H_a$ : coin is unfair  
→ heads  
→ tails

p-val <  $\alpha$  = 5%

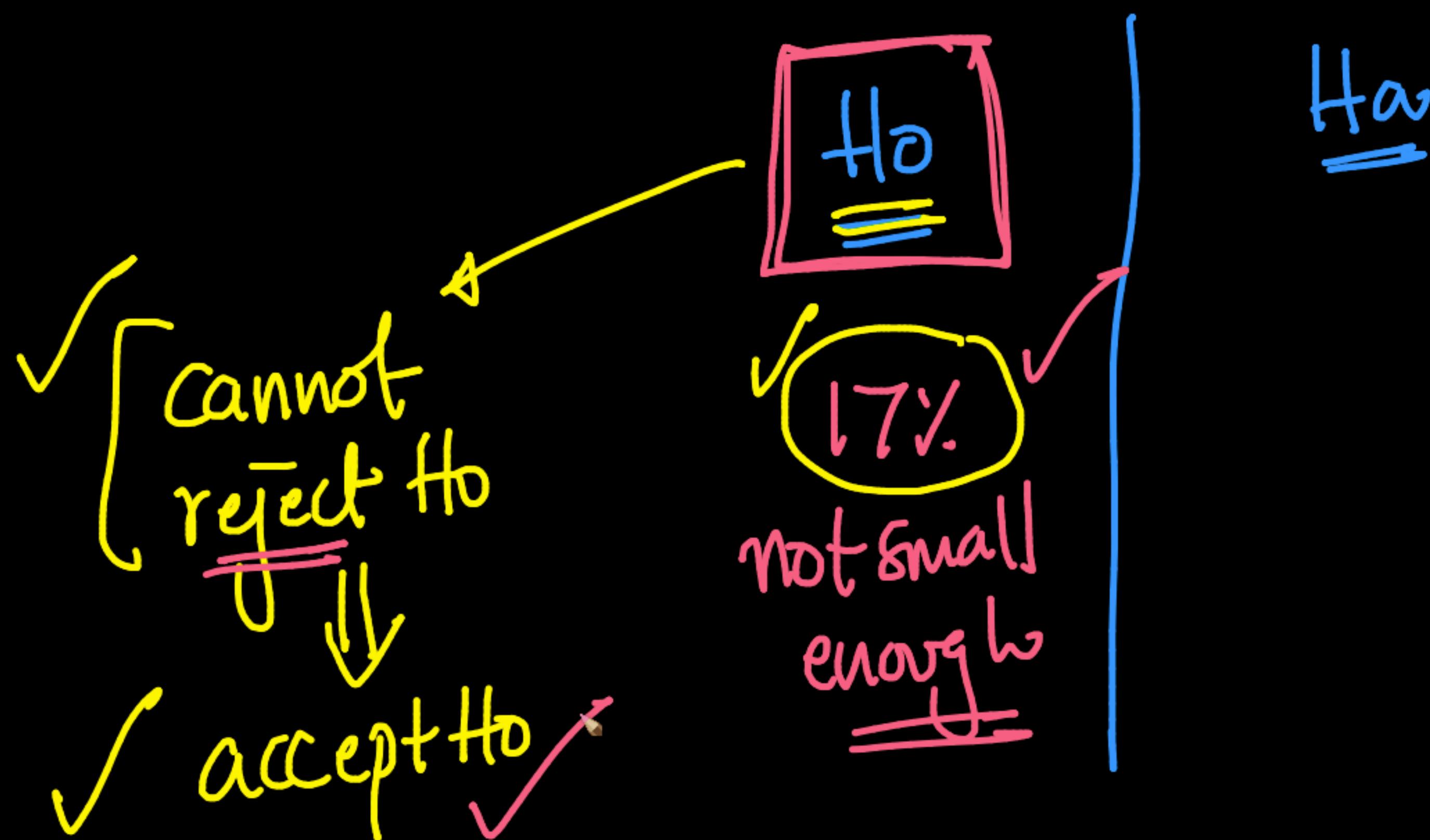
$p\text{-val} < \alpha$  (default: 5%)  
↓  
need not be 5%  
cases: 1%

$p\text{-val} < \overline{0.05}$

reject  $H_0$

Tobs = let  $\bar{x} \leq 5\%$

$\underline{17\%}$   
 $0.17 = p\text{-val} > \alpha = \underline{0.05}$



[ Expt ✓  
Ho, Ha ✓  
p-val ✓  
d ✓ ]

$H_0$ : coin is fair

$H_a$ : coin is biased towards heads

let

$T_{obs} = 65$

$H_0$

coin is biased towards heads

$H_a$ : coin is fair

$$P(H) = 0.51 \text{ or } 0.52 \text{ or}$$

$$0.53 \text{ or } 0.54 \text{ --}$$

as many

Cannot  
Compute

$$P(T \geq 65 | H_0) = ?$$

$$\text{Bin}(n=10; p)$$



choose  $H_0$  carefully s.t. you can compute

p-val

$$\downarrow p(T > T_{\text{obs}} \mid H_0) = \dots$$

↳ dist of  $T$  under  $H_0$

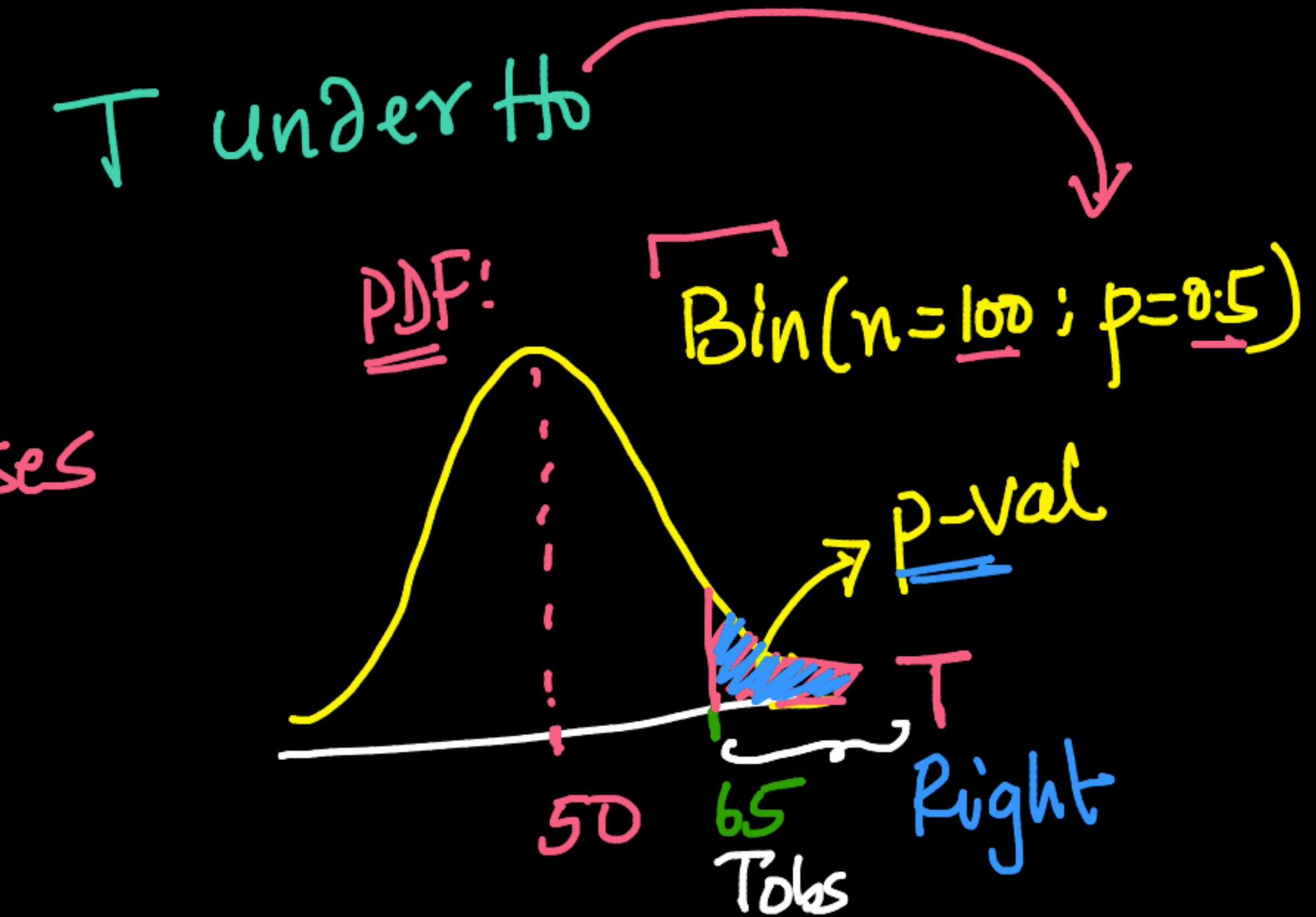
# One-sided tests:

$T = \# \text{heads in } 100 \text{ tosses}$

- 100 tosses

[ $H_0, H_a$ ; Expt; T]

↳ right-tailed test  
(one-sided)

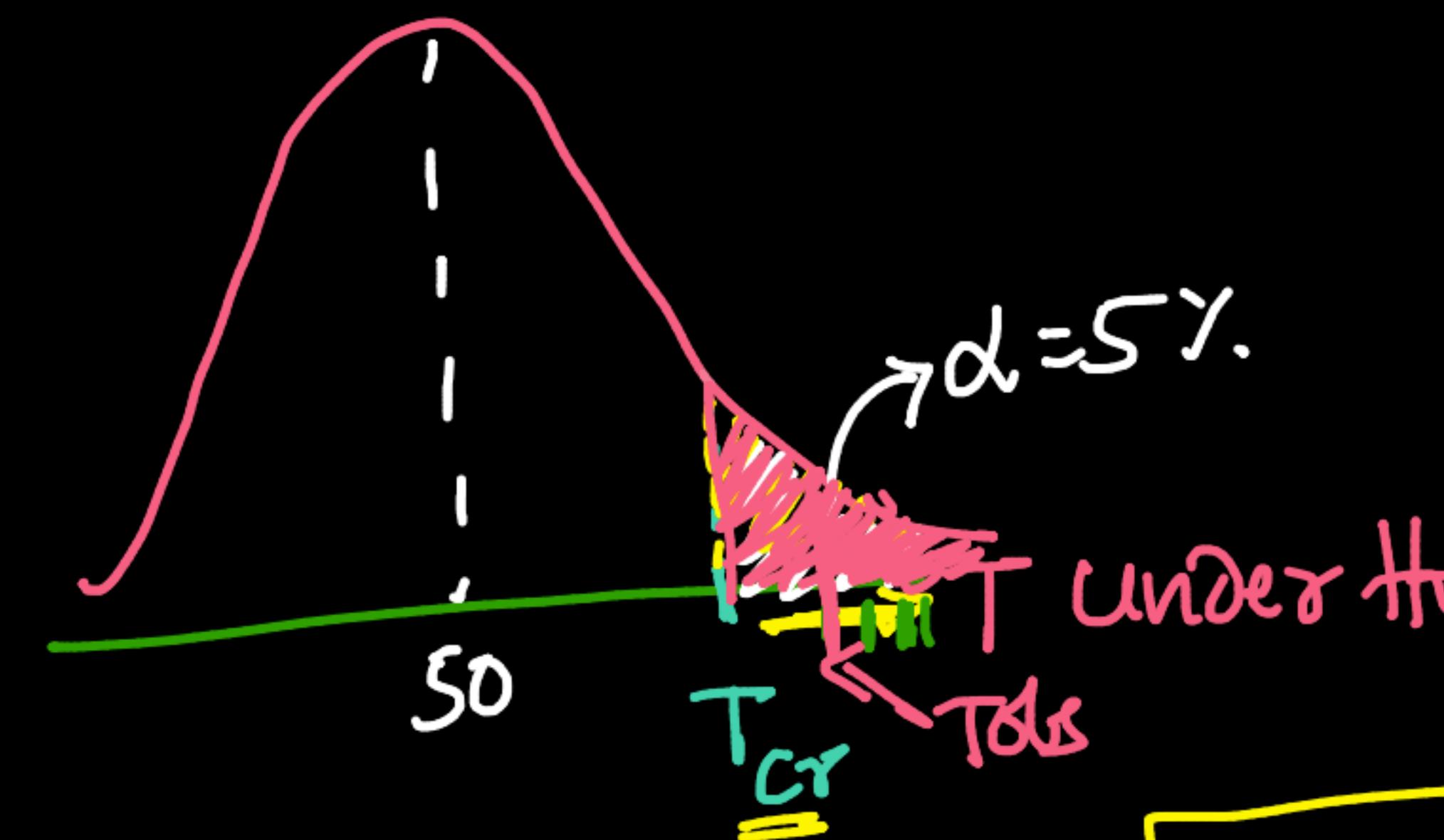


$$P(T \geq 65 | H_0) = \text{p-val} = \boxed{\square}$$

$T_{obs}$

$\max T = 100$

$T_{cr} = \text{critical-value}$



Significance-level

$$\alpha = 5\%$$

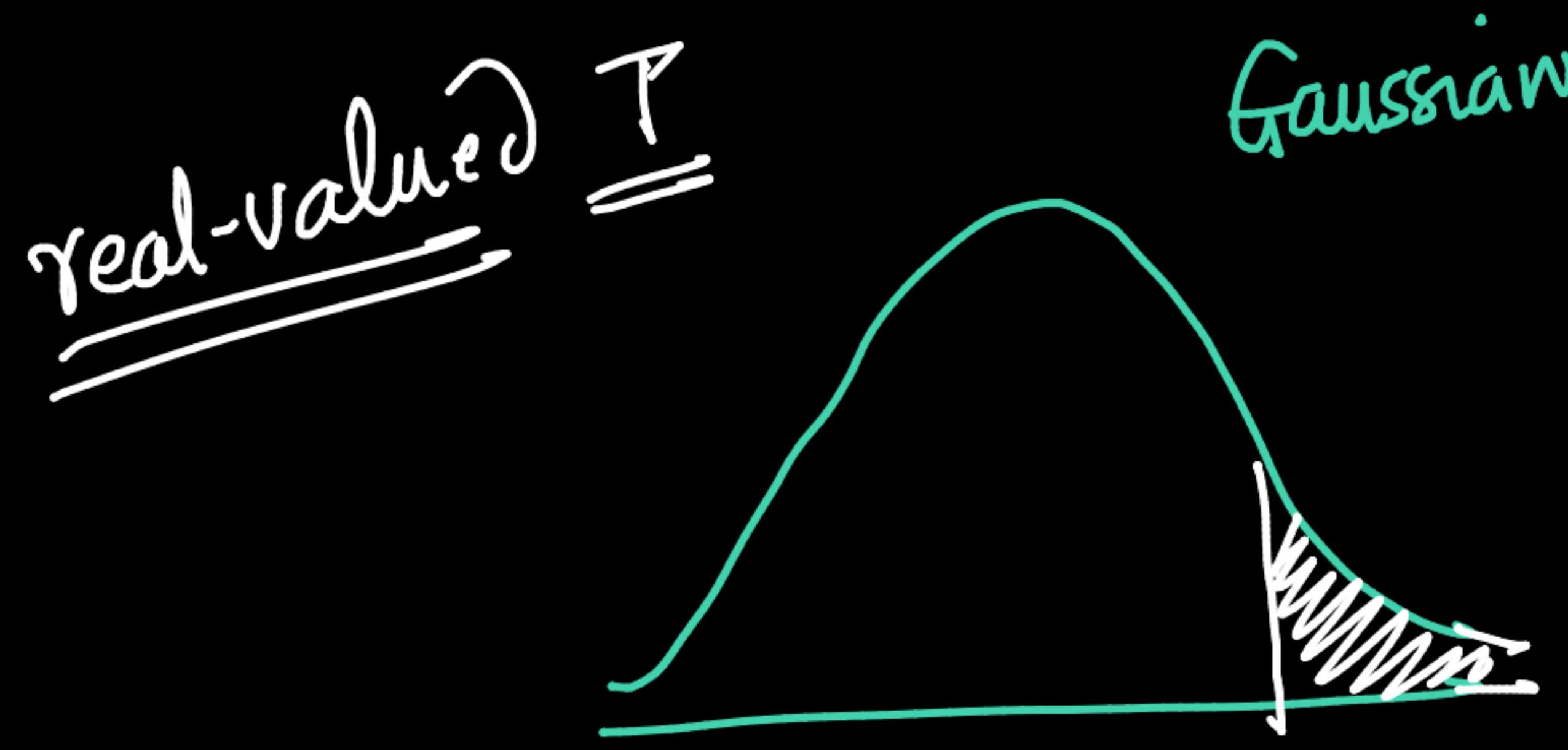
Right-tailed  
test

$T_{obs} > T_{cr}$



p-val <  $\alpha$

$\xrightarrow{\quad} \text{reject } H_0$



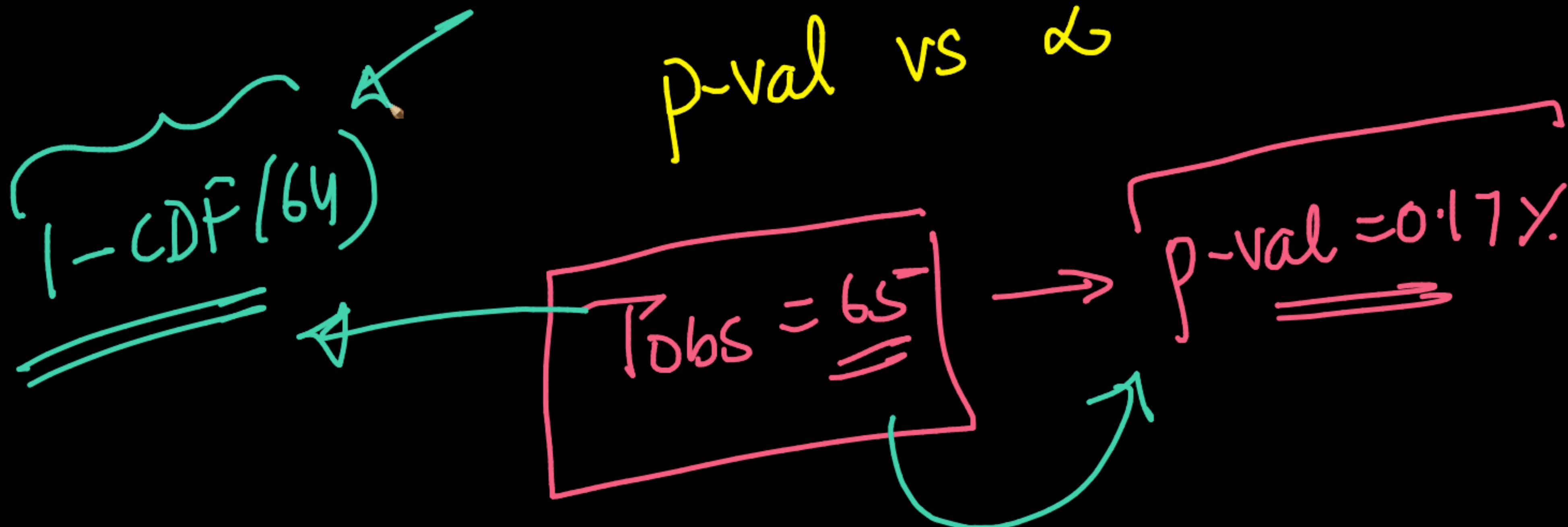
Gaussian

$$\underline{T_{kY}} = \underline{1 \cdot \underline{\underline{23}}} \rightarrow 4.98\%$$
$$1 \cdot 24 \rightarrow 5.01\%$$

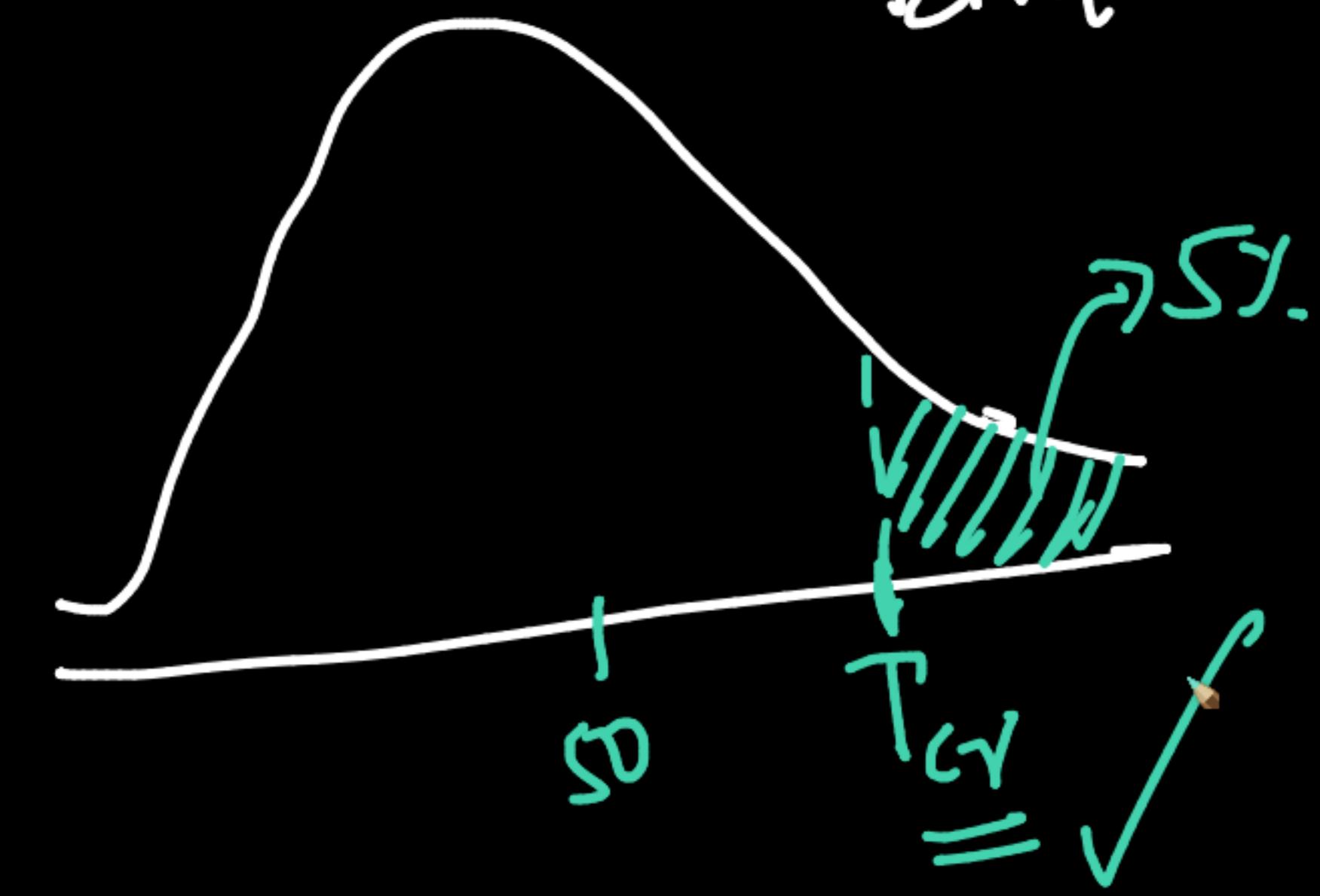
AUC

$\alpha = 5\%$

p-val vs  $\alpha$



$\text{Bin}(n=100; p=0.5)$



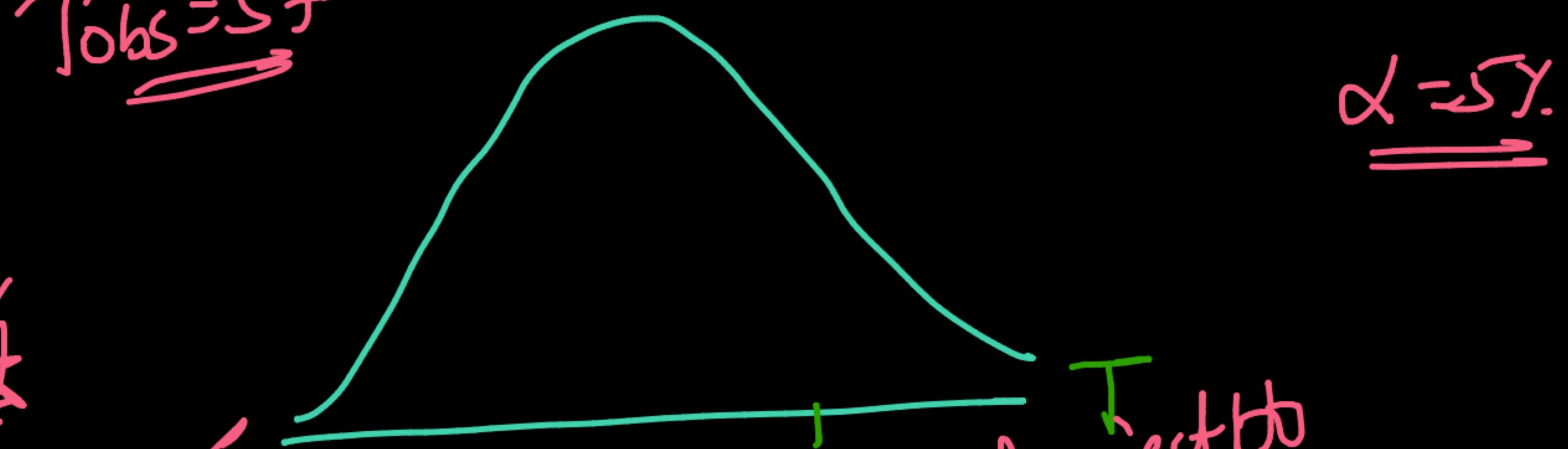
$T_{\text{crit}}$  is the  $T_{\text{obs}}$ -value where  
 $p\text{-val}_{(T_{\text{obs}})} = \alpha$

$T_{obs} = 57$

$\alpha = 5\%$

$T_{cr} = \underline{\underline{55}}$

$\underline{\underline{58}}$  ✓



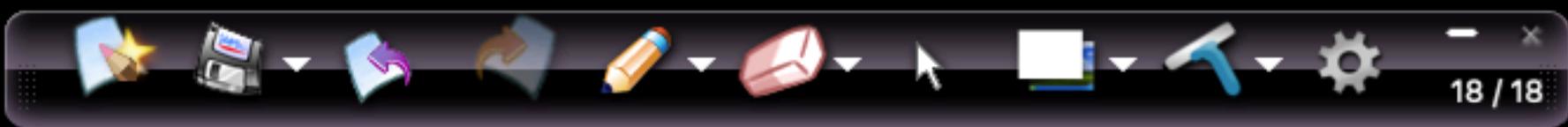
$T_{obs} : 57$

$\rightarrow p\text{-val} = 6.6\%$

$T_{obs} : \underline{\underline{58}}$

$\rightarrow p\text{-val} = 4.4\%$

$\underline{\underline{\text{reject } H_0}}$



18 / 18

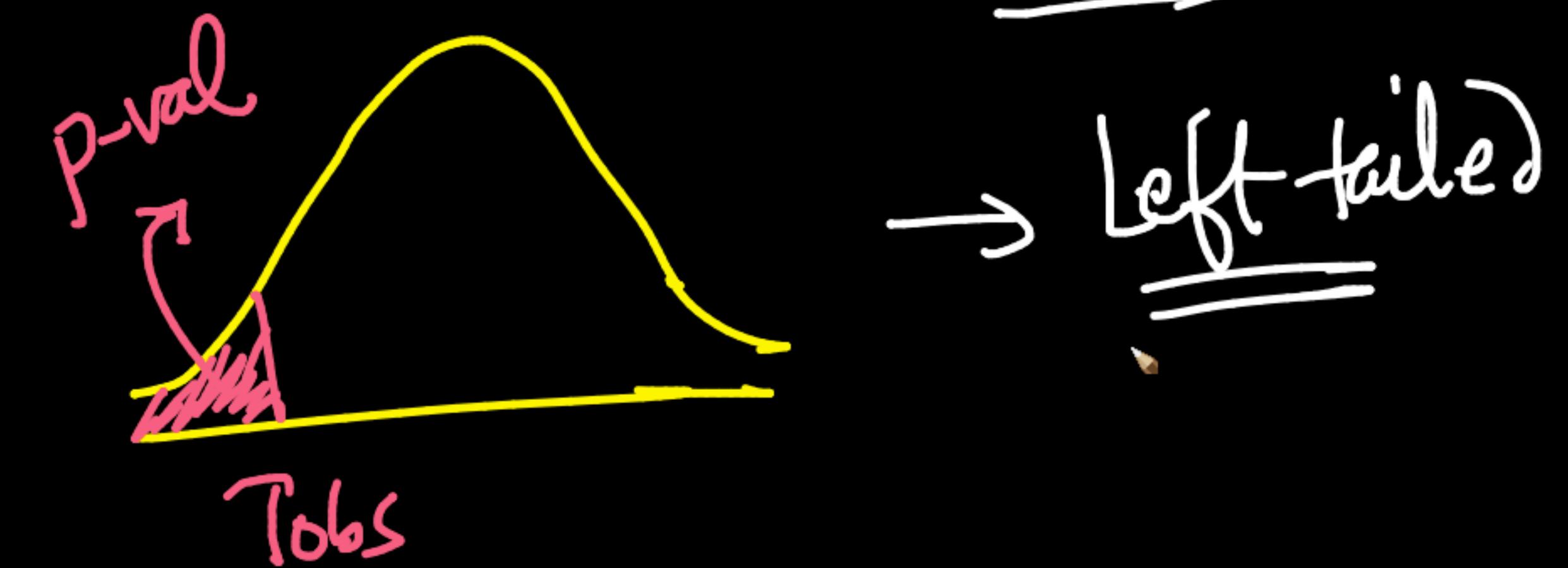
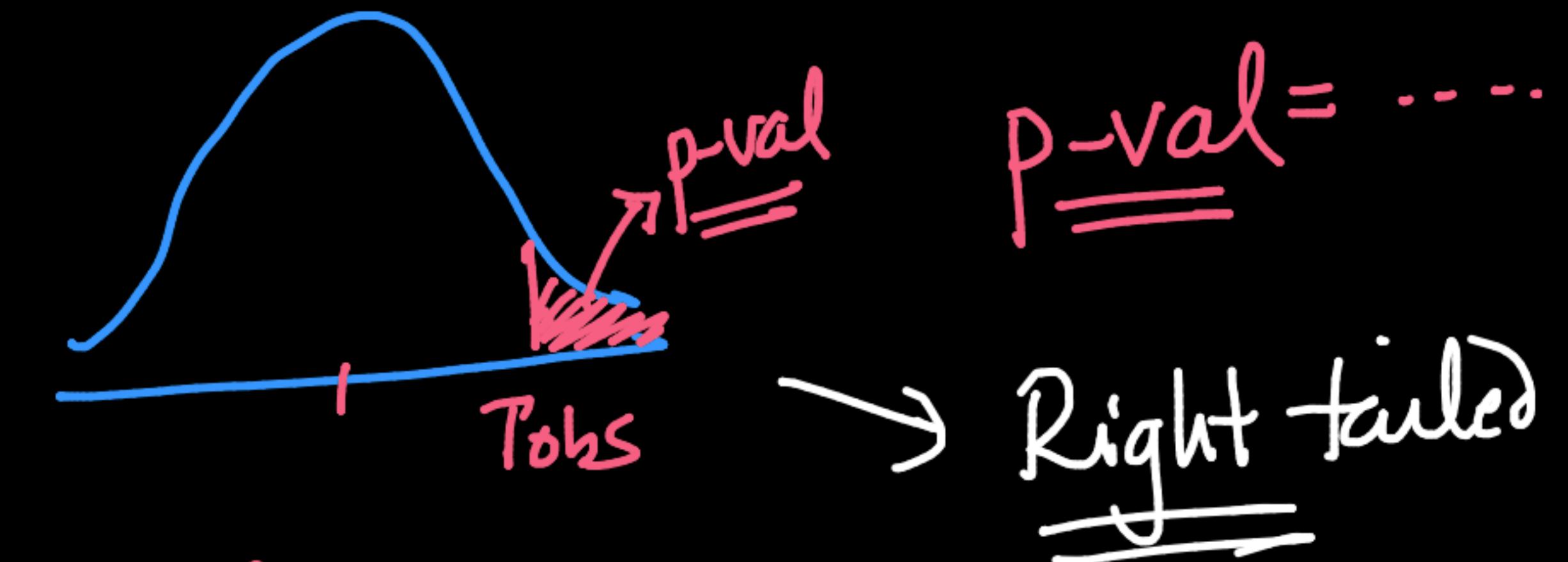


(e.g)

$\{T \text{ under } H_0\}$   
 $(H_0, H_a)$

More examples:

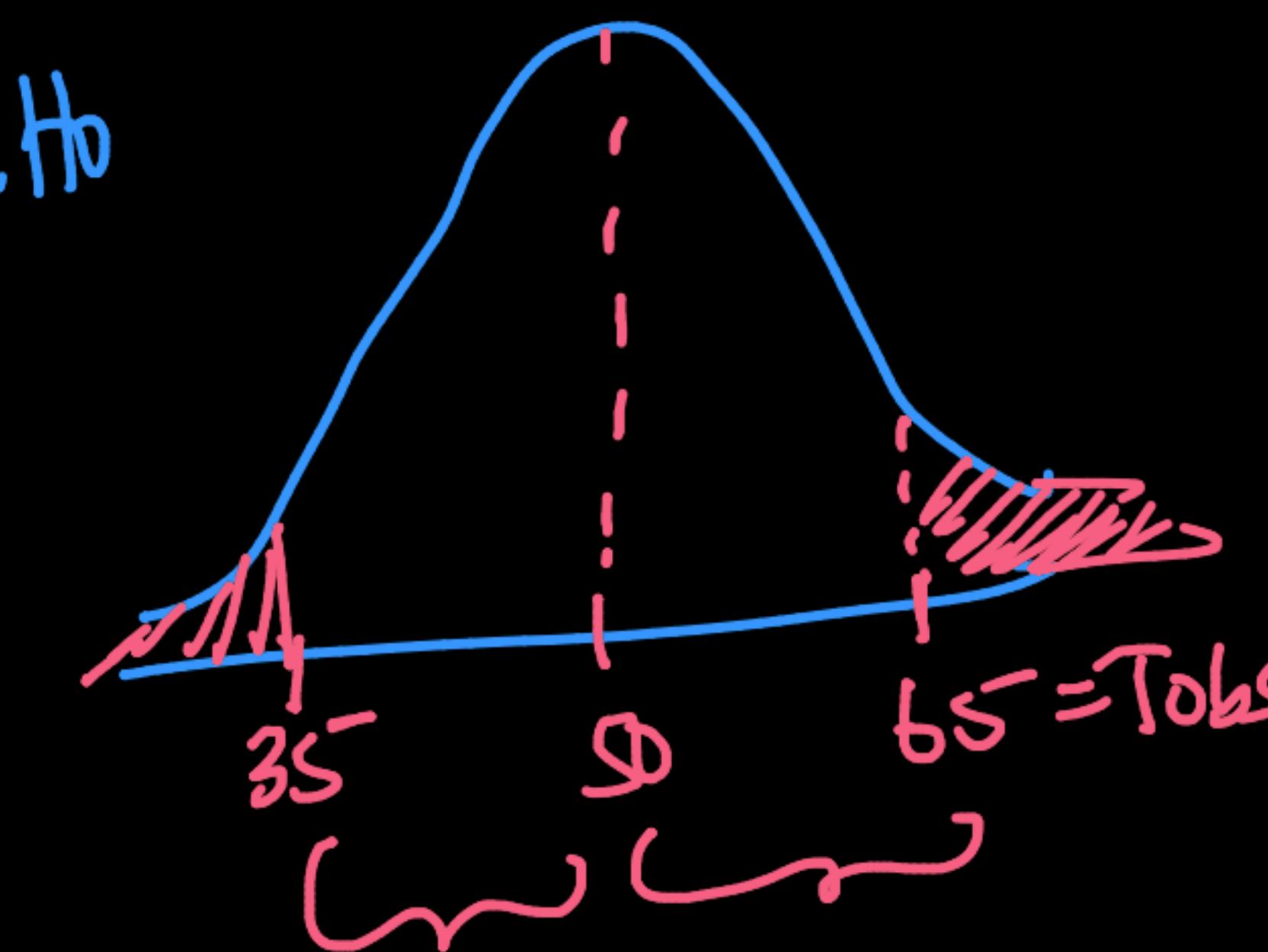
$H_0, H_a, T,$   
 $T \text{ under } H_0;$   
 $p\text{-val}$



(later)

$H_0, H_a, T \text{ under } H_0$

p-val



p-val

→ 2-sided Hailed  
test

Prev. example:

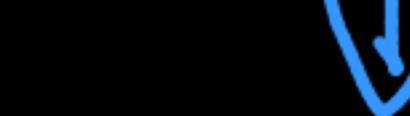
$H_0$ : coin is fair  
 $H_a$ : coin is biased towards heads

$T = \# \text{ heads in 100 tosses}$

$T_{obs} = 65$

  
if  $H_a$  were true:

$T_{obs}$



$T_{obs} > 50 = T_{mean}$

$T_{mean} = 50$

$65 = T_{obs}$

$T$

right-tailed test



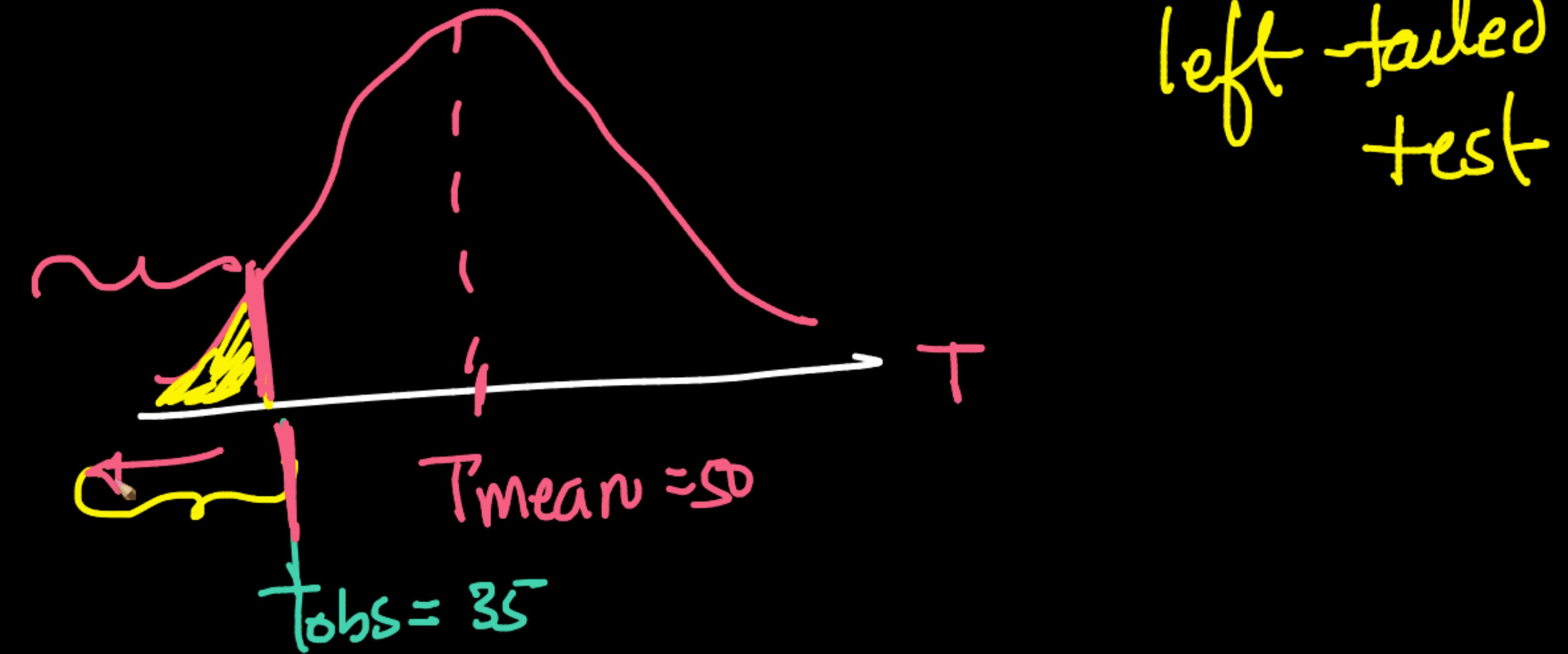
$H_0$ : Coin is fair  
 $H_a$ : Coin is biased towards Tails

$T = \# \text{heads in 100 tosses}$



Under  $\underline{H_a}$ :

✓  $T_{\text{obs}} < T_{\text{mean}}$



$$p\text{-Val} = p(T \leq 35 = T_{obs} | H_0)$$

↳  $p(\text{observing } T \text{ "as extreme as" } T_{obs} | H_0)$

TWIST

$H_0$ : coin is fair  
 $H_a$ : coin is unfair

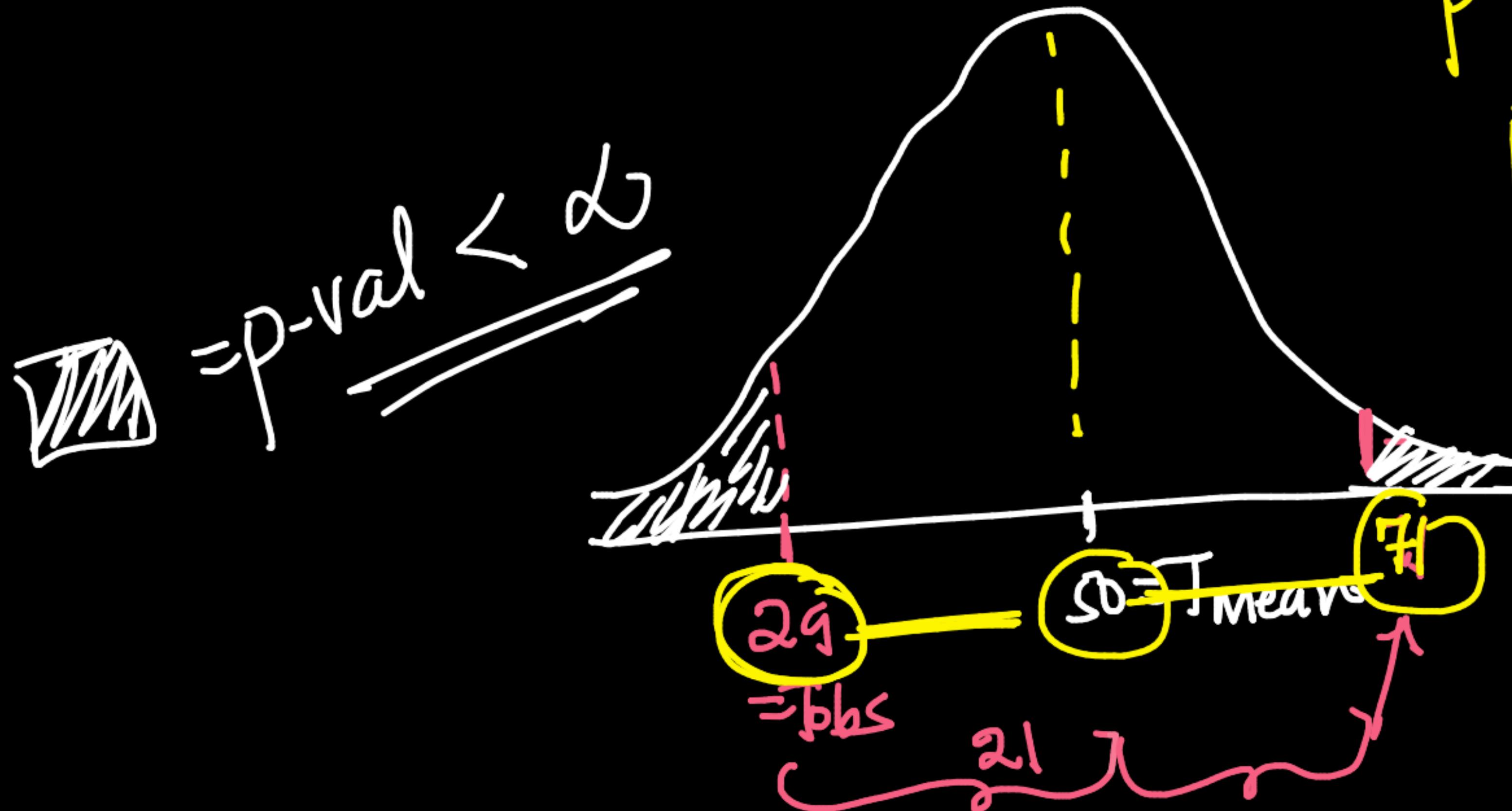
heads  
tails

T: #heads in 100 tosses

$\overline{100s = 29}$  (let)

~~p\*~~

$p\text{-val} = P(\overbrace{\text{Obs} \neq T}^{\checkmark} \text{ as extreme as } T_{\text{obs}} = 29 \mid H_0)$



$$p\text{-val} = P(T \leq 29 \text{ or } T \geq 71 \mid H_0)$$

$T_{obs} = 29 \text{ heads} \rightarrow 71 \text{ tails}$

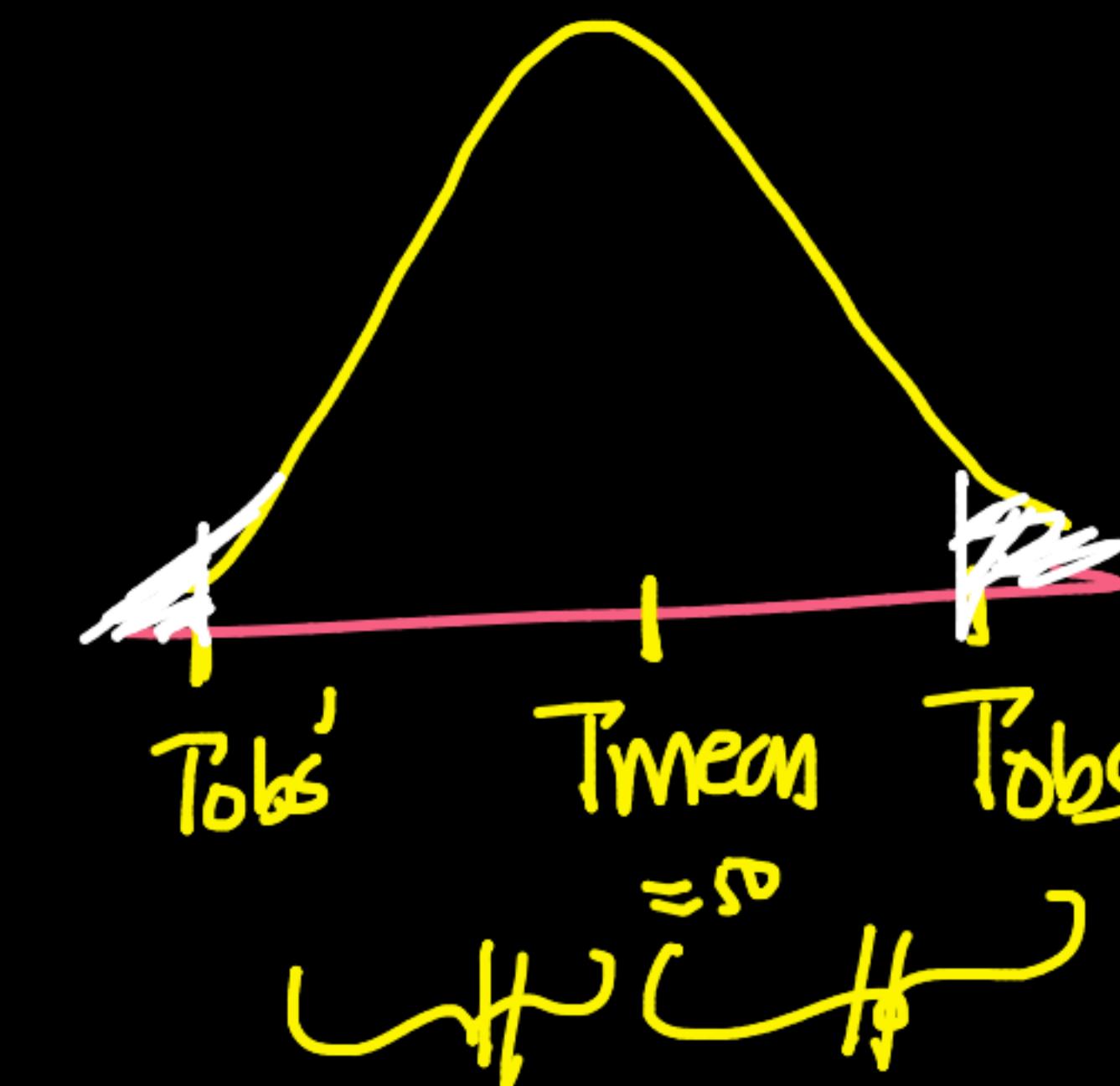
as extremes as

observing 29 tails  $\rightarrow 71 \text{ heads}$

✓  $p\text{-val} = P(T \geq 71 \text{ or } T \leq 29)$

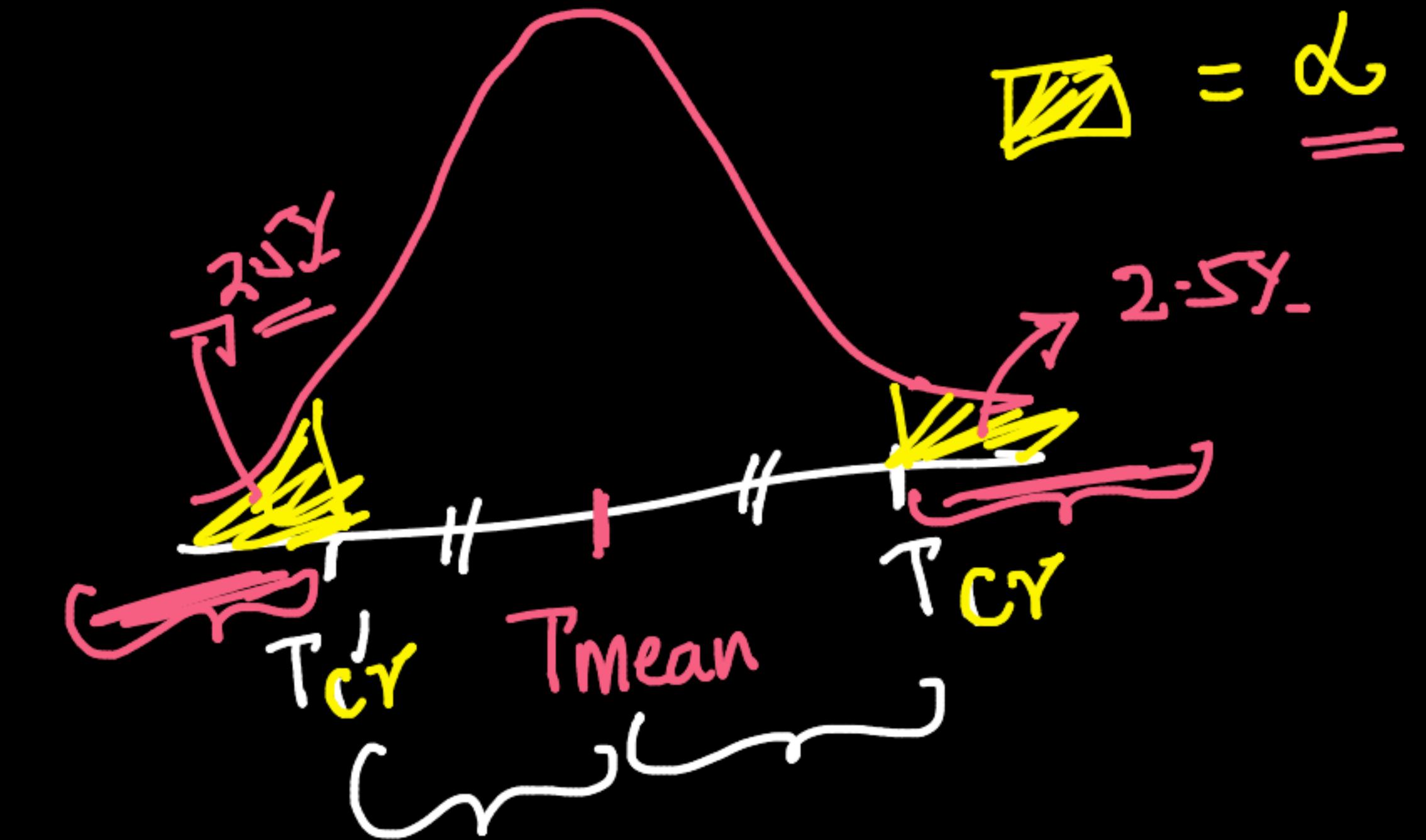
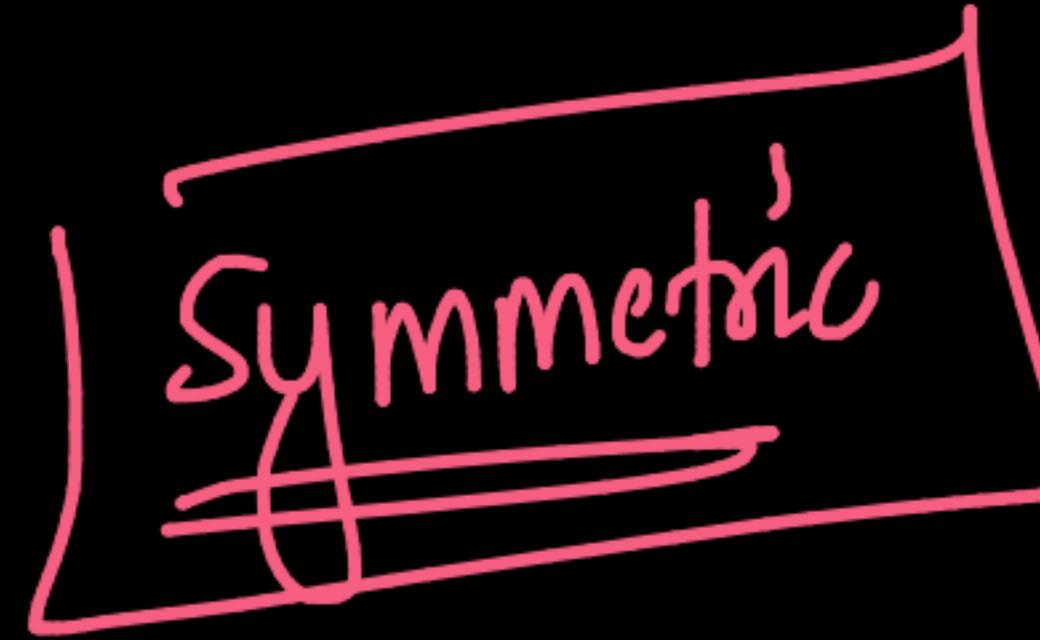
2-sided test

$$T_{\text{mean}} - T_{\text{obs}}' = T_{\text{obs}} - T_{\text{mean}}$$



 = p-val  
 $< \alpha$   
↓  
reject  $H_0$

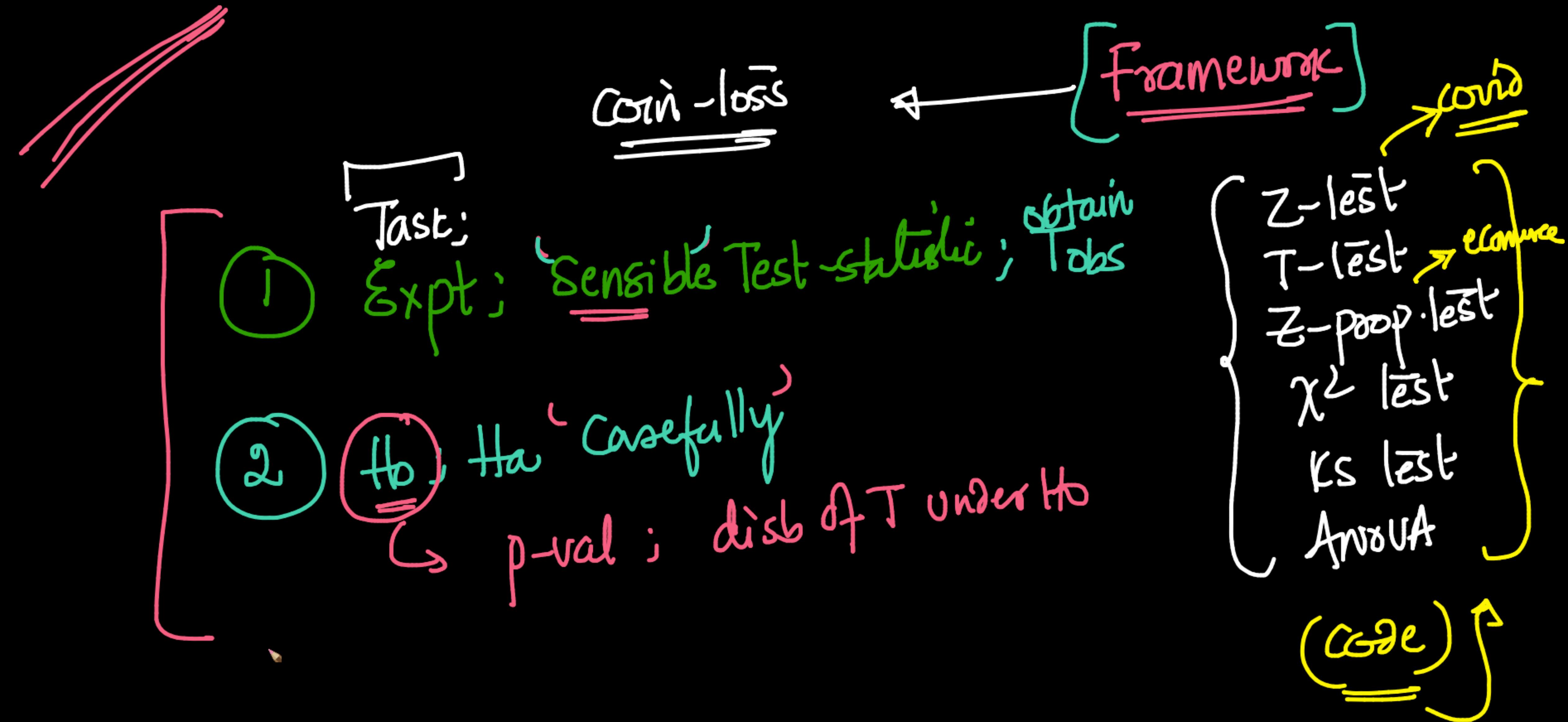
Critical-values:



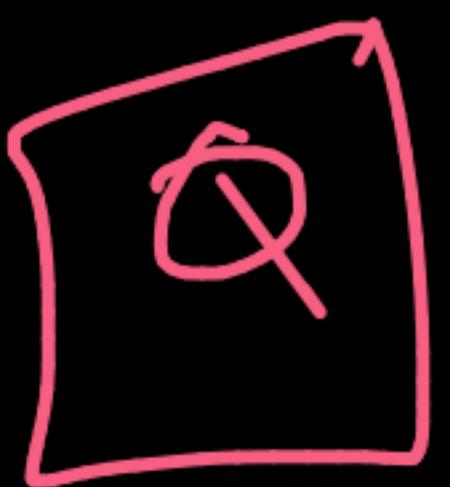
$$\left. \begin{cases} T_{\text{obs}} > T_{\text{Cr}} \\ \text{or} \\ T_{\text{obs}} < U_{\text{Cr}} \end{cases} \right\}$$

Then  $T_{\text{Cr}}$  &  $U_{\text{Cr}}$

what if PDF is not symmetric



- ③ determine Left or Right or 2-tailed test  
↳  $H_0, H_a$ ;  $T$  under  $H_0$ ;  $T$ 's behavior under the alternative
- ④  $p\text{-val} = P(T \text{ is as extreme as } T_{obs} | H_0)$   
→ can-change (medical contexts)
- ⑤  $\alpha = 5\%$  (default)
- ⑥ Compose  $p\text{-val}$  &  $\alpha$  → reject  $H_0$  or accept  $H_0$



$H_0$ : coin is fair

$H_a$ : coin is biased

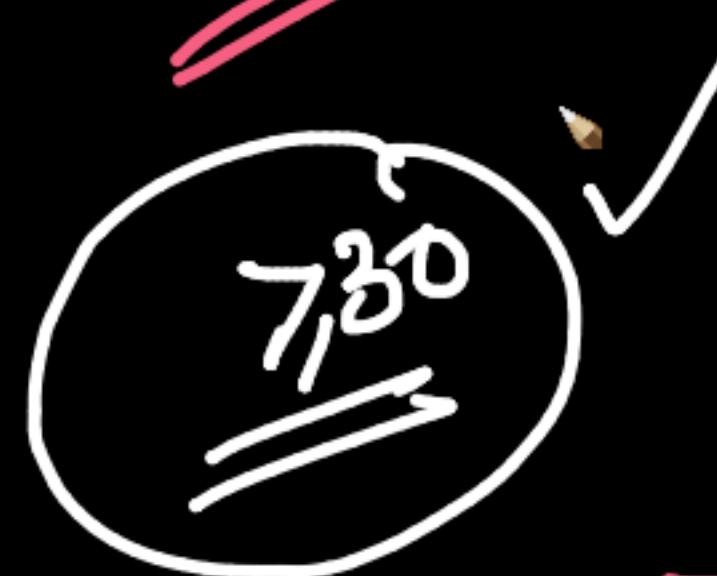
heads  
tails

$T = \# \text{ tails in } 500 \text{ tosses}$

L, R, or

2-tailed test

~~Task~~



Covid medicines:

$$n_1 = 10 \rightarrow \{ \underline{\underline{M_1}} \rightarrow$$

$$n_2 = 90 \rightarrow \underline{\underline{M_2}}$$

$x_{1i} \rightarrow \bar{x}_1: \text{sample mean recovery time}$   
 $x_{11}, x_{12}, \dots, x_{1, \text{ln}}$

$x_{2j} \rightarrow \bar{x}_2: \text{sample mean}$   
 $x_{21}, x_{22}, \dots, x_{2, \underline{90}}$

are they 'same'?

ICMR | WHO / FDA ...

One way:

asym. C.I.

mean-rec-time

$$\left[ \underline{\underline{\mu_1}} = \underline{\underline{\mu_2}} \right]$$

Hyp.-testing

Hyp-testy



Task ✓

$$\checkmark H_0: \mu_1 = \mu_2$$

$$H_a: \mu_1 \neq \mu_2$$

$\sigma_1$  &  $\sigma_2$  are pop. std-dev

$s_1 \approx \sigma_1$  as  $n_1$  is not too small

$s_2 \approx \sigma_2$  as  $n_2 = 90$

2 →  $T = \frac{\bar{x}_1 - \bar{x}_2}{\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}}$

'sensible'

sensible

↓  
distr  
 $T$  under  $H_0$

$$H_0: T \rightarrow 0$$

$H_a: T$ : large +ve  
large -ve

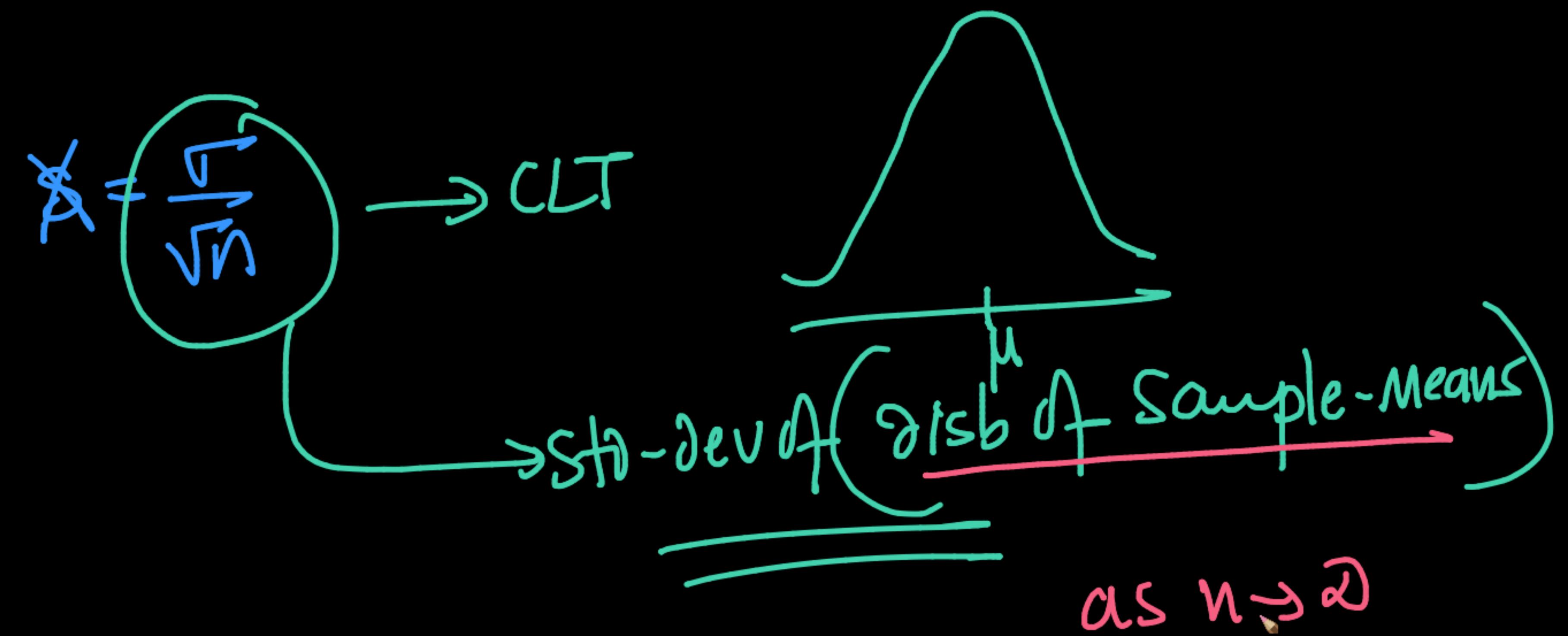
$$T \sim Z(0,1)$$

$$N(0,1)$$

~~if~~  $T = \bar{x}_1 - \bar{x}_2$  then we do NOT know  
disb~~A~~T under ~~the~~

St. err:-  $\left( \frac{\sigma_1}{\sqrt{n_1}} \right)^2 = \frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}$

den



$$T = \frac{\bar{x}_1 - \bar{x}_2}{\sqrt{\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}}}$$

why:

$n_1$  &  $n_2$  are not too small

$\sigma_1 \approx$  Sample std-dev of group 1  
Sample  $\rightarrow s_1$

$\sigma_2 \approx$  Sample std-dev of group 2  
 $\rightarrow s_2$

T is sensible

$$T = \frac{\bar{x}_1 - \bar{x}_2}{\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}}$$

~~T<sub>obs</sub>~~

H<sub>0</sub>:  $\rightarrow \sigma$

H<sub>a</sub>:  $\rightarrow$  large  
+/-ve value

means  $\rightarrow \bar{x}_1 \& \bar{x}_2$

$$T = \frac{\bar{x}_1 - \bar{x}_2}{\sqrt{\dots}}$$

Sensible  
dist of T under H<sub>0</sub>

DO NOT know dist under H<sub>0</sub>

$$T = \frac{\underline{Med}_1 - \underline{Med}_2}{\sqrt{\dots}}$$

# Test-statistic

consists of  
them

{ each test has a  
different test-statistic  
↓  
diff distributions  
info

Terminology:

✓ 2 sample Z-test

for difference  
of Means

$x_{1i} \ i: 1 \rightarrow n$

$x_{2j} \ j: 1 \rightarrow q$

T under  $H_0$

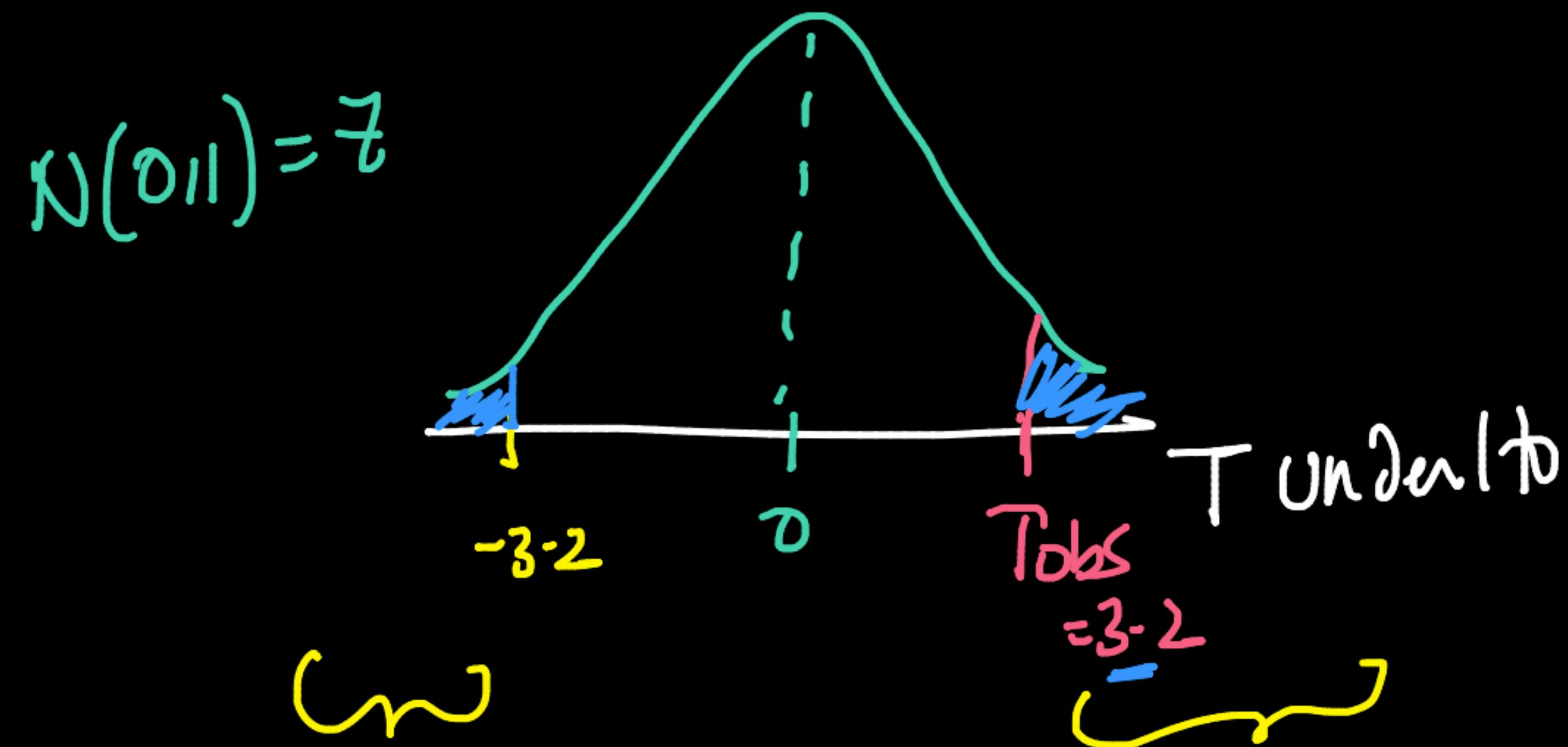
Task

$\sigma_1$  &  $\sigma_2 \rightarrow$  known

(n)  
estimate them well  $\rightarrow n_1$  &  $n_2$  are  
not too small ✓

$Z(0,1)$

$$\textcircled{3} \quad \left\{ \begin{array}{l} T_{\text{obs}} = \\ \boxed{3 \cdot 2} \end{array} \right.$$



$$\begin{aligned} x_{11} & x_{12} \dots x_{1,n_1} \xrightarrow{n_1} \vec{x}_1 \\ x_{21} & x_{22} \dots x_{2,n_2} \xrightarrow{n_2} \vec{x}_2 \end{aligned}$$

$$T_{\text{obs}} = \frac{\bar{x}_1 - \bar{x}_2}{\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}}$$

④

R or L or 2-sided test

under

$H_a:$

$\mu_1 \neq \mu_2$

$$T = \frac{\bar{x}_1 - \bar{x}_2}{\sqrt{\cdot \cdot \cdot}} : \text{large } +/- \text{ values}$$

⑤

p-val < 1%

$N(0,1)$

68-95-99 rule

⑥

$\alpha = 5\%$

p-val <  $\alpha$   
⇒ reject  $H_0$  ✓

2-sample Z-test  
diff. of  
~~Comparing Means~~



$$\begin{aligned} T &\sim Z(0, 1) \\ H_0 & \hookrightarrow \frac{\bar{x}_1 - \bar{x}_2}{\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}} \sim Z(\underline{\underline{0}}, \underline{\underline{1}}) \end{aligned}$$

# Conditions for $\bar{z}$ -test

1

pop has

finite  $\mu$  &  $\sigma$

- CLT

$T \sim Z(0,1)$

Sample means  
are Normally  
distr

2

$\sigma_1$  &  $\sigma_2 \rightarrow$  Known

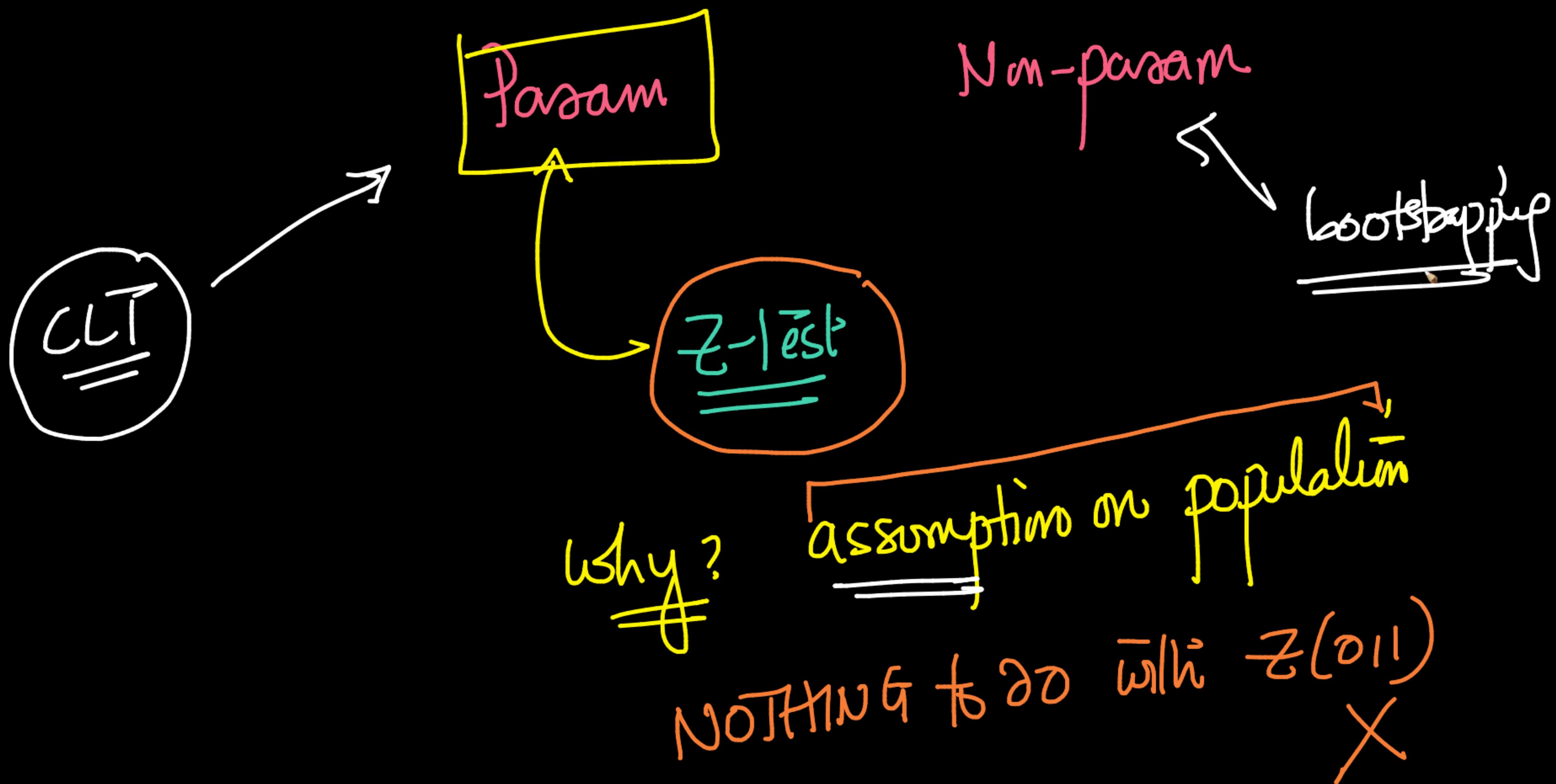
(or)

estimate well

( $n_1, n_2 \sim 10$ )

$n_1$  &  $n_2$  are not small

> 30



$n_1$  &  $n_2$  have to be same  $\times$

$$\left\{ \begin{array}{l} n_1 = 2000 \\ n_2 = 30 \end{array} \right.$$

$\sigma_1 = s_1$   
 $\sigma_2 \approx s_2$

$n_1 = 10$   
 $n_2 = 20$

$\sigma_2$  cannot be estimated well

Z-test?

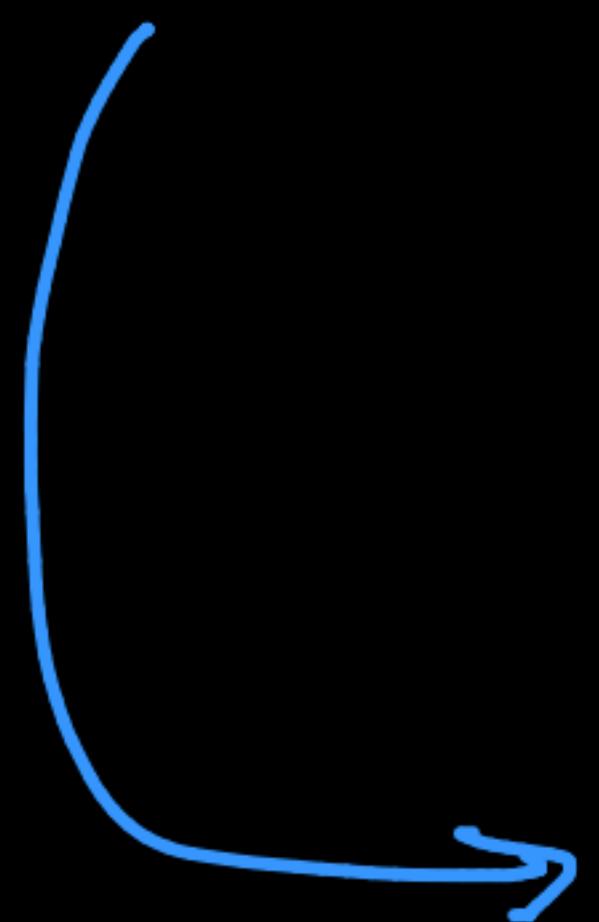
$M_1$  vs  $M_2 \rightarrow z\text{-test}$  if  $n_1 \& n_2$  are  
not too small

{  $M_1$  vs  $M_2$  vs  $M_3$  ...  $M_K$  }  $\downarrow$   
(ANOVA)

Z-test

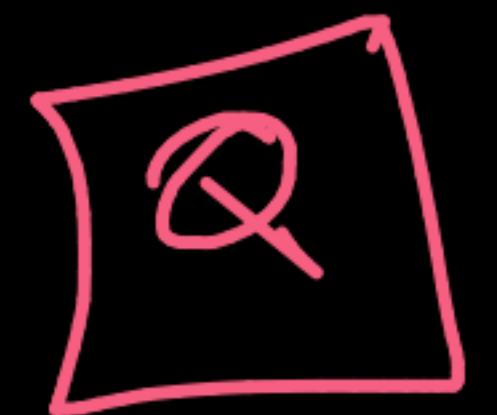
② assumptions are true

Test for difference in Means

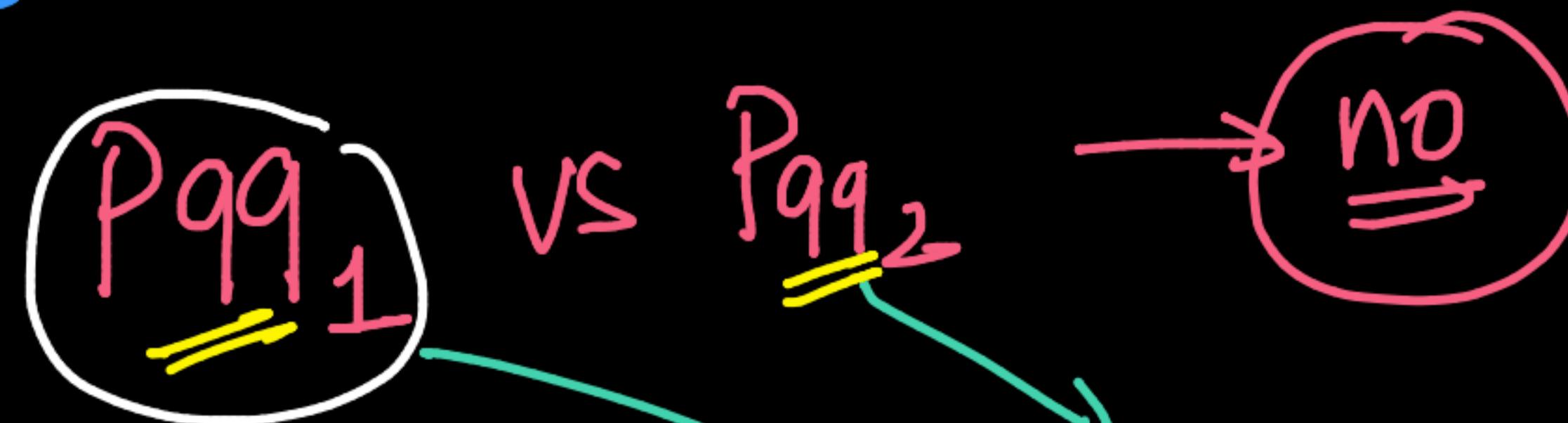


$$T = \frac{\bar{x}_1 - \bar{x}_2}{\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}} \sim Z(0,1) \text{ Under } H_0$$





## z-test



$$T = \frac{\bar{x}_1 - \bar{x}_2}{\sqrt{...}}$$

do not know  
disb AT under Ho

~~OK~~



(post-read)



~~value~~

Permutation  
Resampling  
Tests

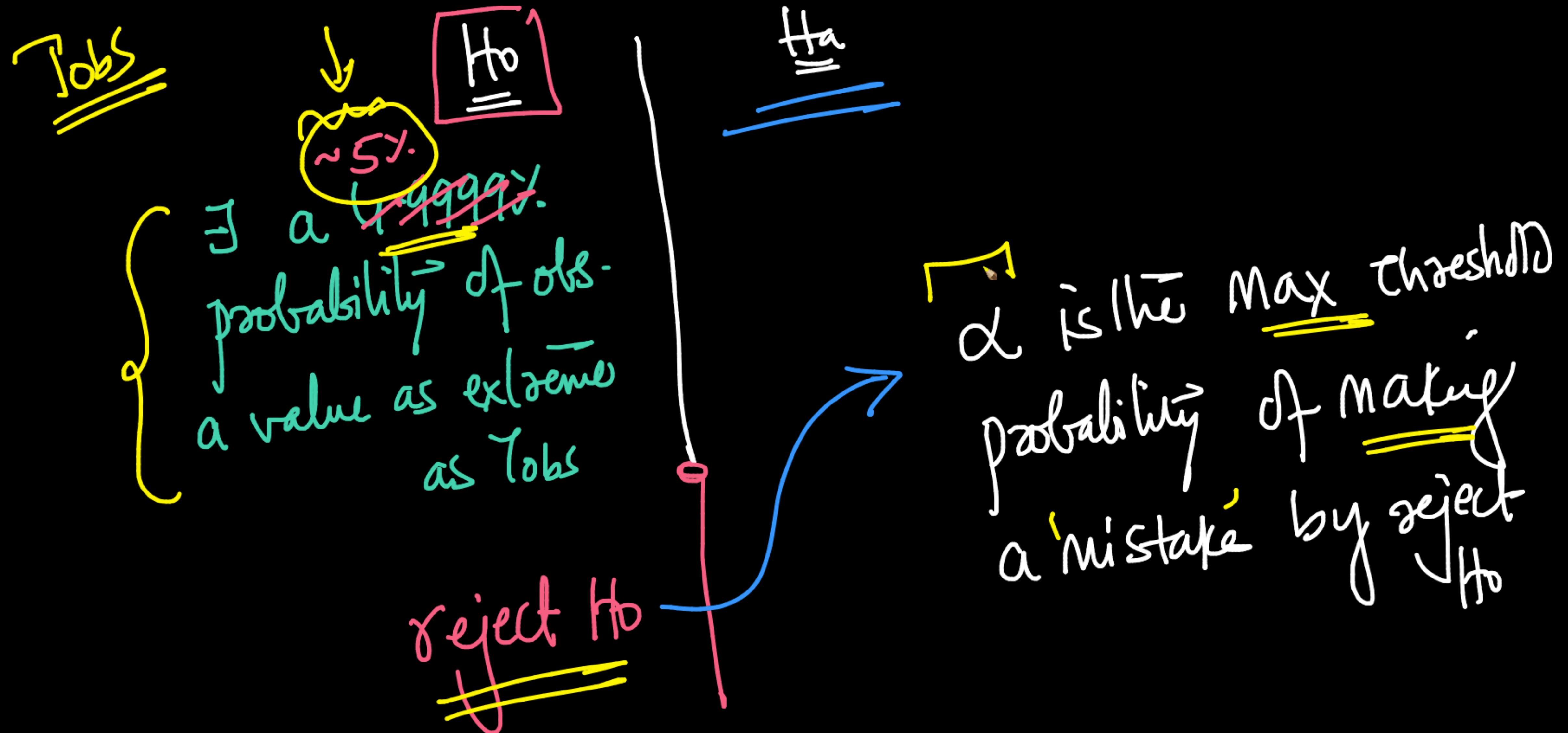
Same "framework" → hyp. tests  
T under H<sub>0</sub>

choose  $\alpha$ ?

$p\text{-val} = P(\text{observing } T \text{ as extreme as } T_{\text{obs}} | H_0)$

$\alpha = 5\%$ . (let)

$\underline{\underline{p\text{-val}}} = 4.99999\% < \alpha \Rightarrow \text{reject } H_0$



$\alpha = \text{Max. probability } \alpha \text{ of incorrectly}$   
rejecting  $H_0$

$\mu_1$   
(placebo)

$\mu_2$   
(remdesivir)

Z-test

Case 1:

p-val

= 4.9999%

choose  
 $\alpha = 5\%$

reject  $H_0$

$\mu_1 \neq \mu_2$

Concluding  $\mu_1 \neq \mu_2$

even though  $\exists$  a  $\sim 5\%$  probability  
of observing  $T$  as  
extreme as this

under  $H_0$   
 $(\mu_1 = \mu_2)$

If  $H_0$  (oracles) were true  
 $\alpha = 5\%$   
 $p\text{-val} = 4.999\%$   $\rightarrow \dots$

$\alpha = 5\%$

{ Could ('incorrectly') reject  $H_0$  with  $\omega$

Prob of  $\alpha = 5\%$

$\alpha = 5\%$

In medicine,

$$\alpha = \underline{\underline{\alpha}}$$

reduced / stringent

$$H_0: \underline{\underline{\mu_1 = \mu_2}} \rightarrow \begin{cases} M_1: \text{placebo} \\ M_2: \text{remdesivir} \end{cases}$$
$$H_a: (\mu_1 \neq \mu_2)$$

$$\alpha = \underline{\underline{1\%}} \text{ or } \underline{\underline{0.1\%}}$$

## Article Figures/Media



We conducted a double-blind, randomized, placebo-controlled trial of intravenous remdesivir in adults who were hospitalized with Covid-19 and had evidence of lower respiratory tract infection. Patients were randomly assigned to receive either remdesivir (200 mg loading dose on day 1, followed by 100 mg daily for up to 9 additional days) or placebo for up to 10 days. The primary outcome was the time to recovery, defined by either discharge from the hospital or hospitalization for infection-control purposes only.

## RESULTS

A total of 1062 patients underwent randomization (with 541 assigned to remdesivir and 521 to placebo). Those who received remdesivir had a median recovery time of 10 days (95% confidence interval [CI], 9 to 11), as compared with 15 days (95% CI, 13 to 18) among those who received placebo (rate ratio for recovery, 1.29; 95% CI, 1.12 to 1.49;  $P < 0.001$ , by a log-rank test). In an analysis that used a proportional-odds model with an eight-category ordinal scale, the patients who received remdesivir were found to be more likely than those who received placebo to have clinical improvement at day 15 (odds ratio, 1.5; 95% CI, 1.2 to 1.9, after adjustment for actual disease severity). The Kaplan-Meier estimates of mortality were 6.7% with remdesivir and 11.9% with placebo by day 15 and 11.4% with remdesivir and 15.2% with placebo by day 29 (hazard ratio, 0.73; 95% CI, 0.52 to 1.03). Serious adverse events were reported in 131 of the 532 patients who received remdesivir (24.6%) and in 163 of the 516 patients who received placebo (31.6%).

## CONCLUSIONS

Our data show that remdesivir was superior to placebo in shortening the time to recovery in adults who were hospitalized with Covid-19 and had evidence of lower respiratory tract infection. (Funded by the National Institute of Allergy and Infectious Diseases and others; ACTT-1 ClinicalTrials.gov number, NCT04280705.)

## ORIGINAL ARTICLE NOV 5, 2020

Remdesivir for 5 or 10 Days in Patients with Severe Covid-19

J.D. Goldman and Others

## CORRESPONDENCE SEP 3, 2020

Remdesivir for the Treatment of Covid-19 — Preliminary Report

**NEJM**  
**CareerCenter**

## PHYSICIAN JOBS

MAY 14, 2022

Pediatrics, General

Loma Linda, California

Academic Pediatric Psychologist in Southern California

Cardiology

Riverhead, New York

Northwell Health Cardiology Seeking Non-Invasive Cardiologist to Join Our Team

Anesthesiology

Nebraska

Anesthesiology | 90th Percentile Starting Salary Guarantee | Nebraska

Psychiatry

Danville, Pennsylvania

Physician Adult Psychiatry

✓ : acceptable ~~rate~~ of making an error: probability

for 'critical' tasks:

↳ lower prob of an error

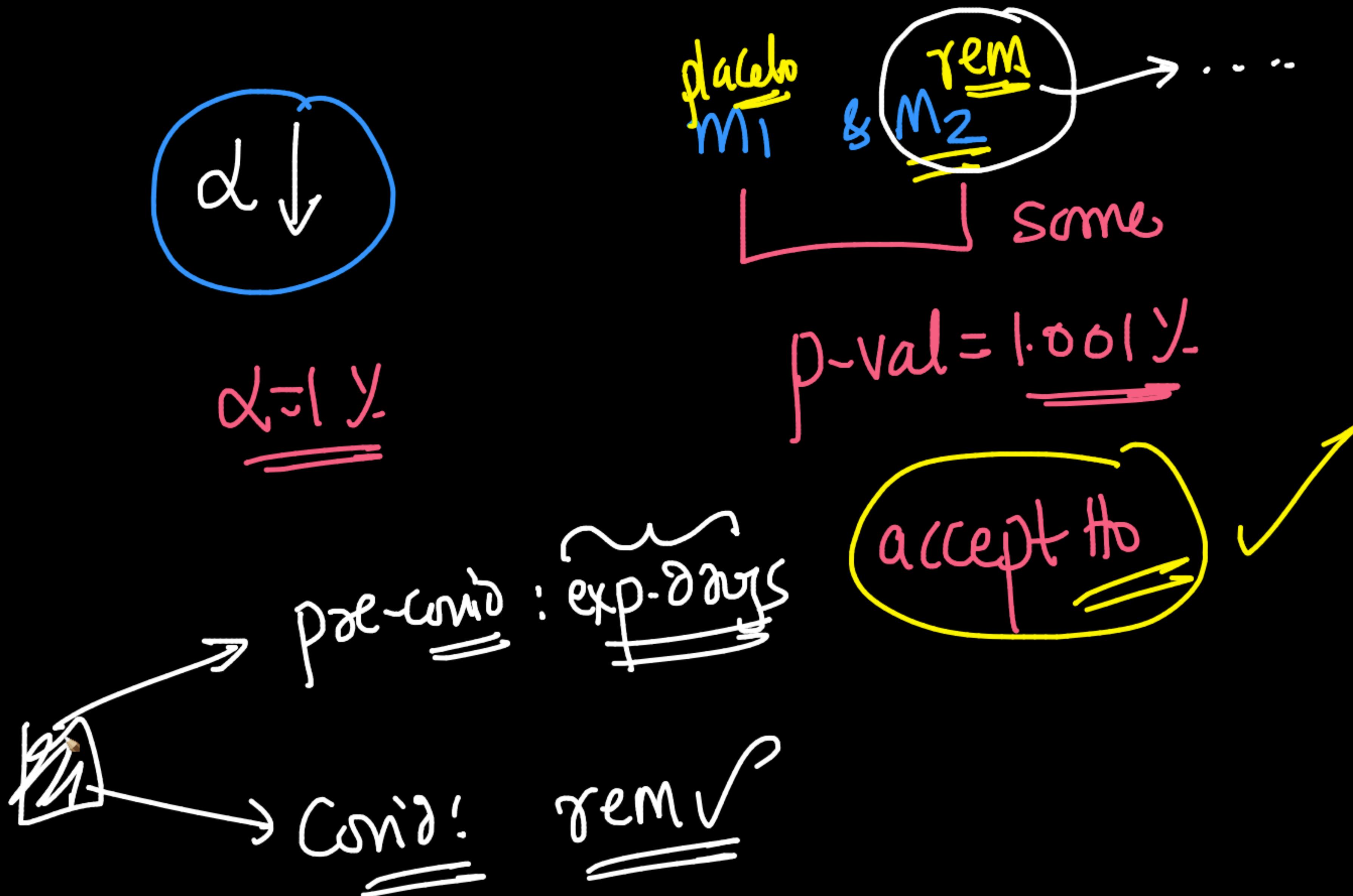
$\alpha \downarrow$  ✓

rejecting  $H_0$   
when  $H_0$  is true

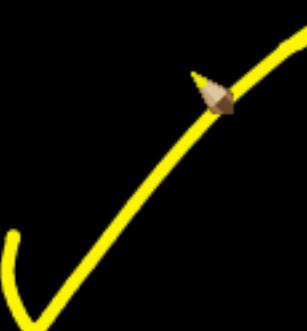
another type of error

prob. of accepting  $H_0$  when  $H_0$  is false

erroneously



t-test  
z-prop-test  
 $\chi^2$  test  
KS-test  
ANOVA



Binomial distribution - Wikipedia x z multiplier - Google Search x +

google.com/search?q=z+multiplier&rlz=1C5CHFA\_enIN958IN958&oq=Z+multiplier&aqs=chrome.0.69i59j0i512l6j69i60.1574j0j4&sourceid=chrome&ie=UTF-8

Google z multiplier

1:57 10-Jul-2018

Confidence Level to Z-Score

90%	1.645
95%	1.96
98%	2.33
7:26%	2.575

How To Find The Z Score Given The Confidence Level of a ...  
YouTube · The Organic Chemistry Tutor  
28-Oct-2019

3 key moments in this video

Finding  $z^*$  Multiplier in StatKey and ME (No Sound)  
YouTube · Whitney Zimmerman  
10-Jul-2017

View all

People also ask :

What is the Z multiplier?  
Multiplier, denoted as  $z^*$ , is the standardized score such that the area between  $-z^*$  and  $z^*$  under the standard normal curve corresponds to the desired confidence level.  
<https://www.ics.uci.edu/~jutts/> PDF  
Estimating Proportions with Confidence - ICS UCI

Search for: What is the Z multiplier?

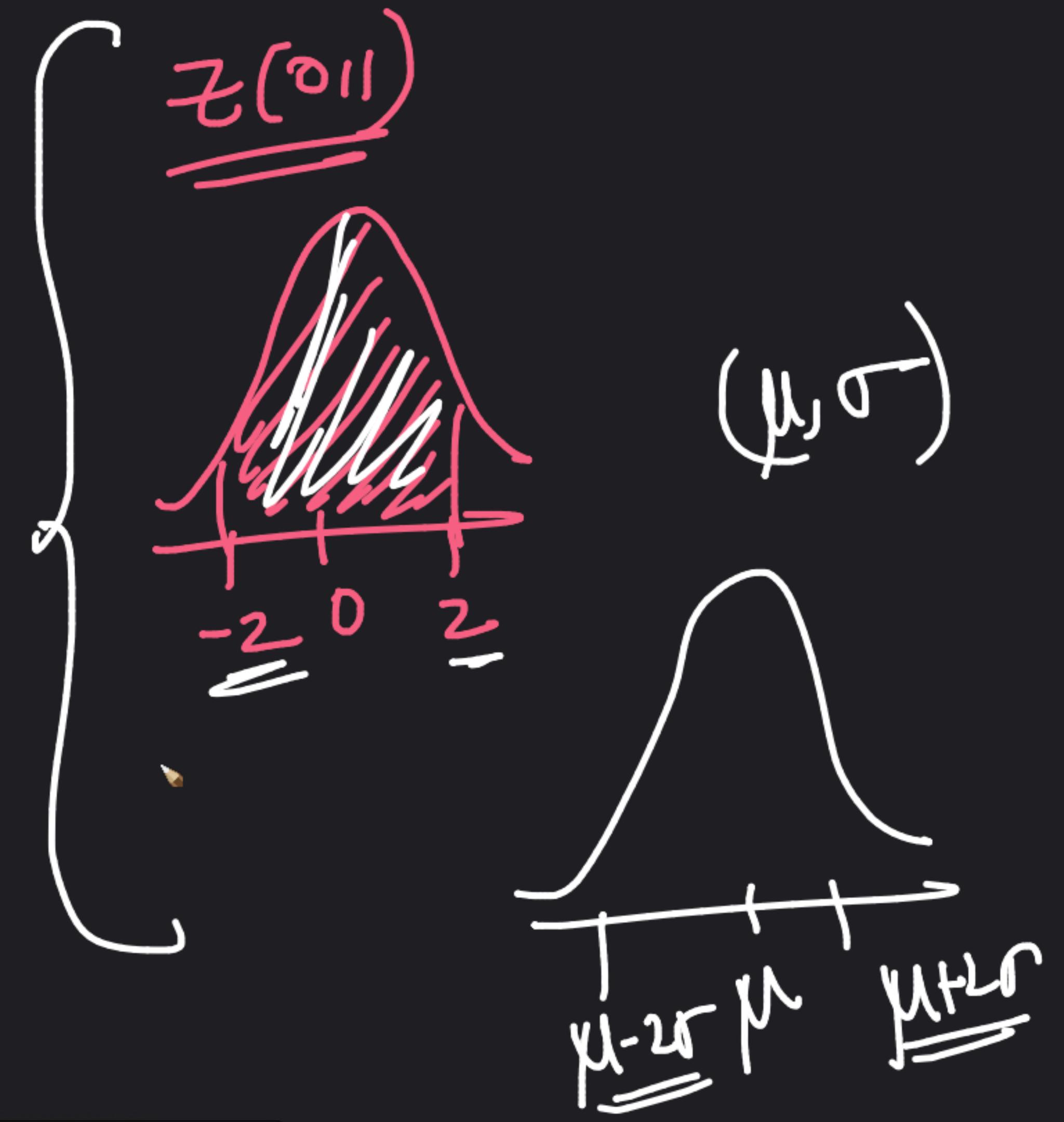
What is the Z multiplier for a 95% confidence interval?

How do you find the Z value multiplier?

How do you find the multiplier?

What is Z for a 99 confidence interval?

What does 1.96 mean in statistics?



z(0.11)

(μ, σ)

-z D z

μ - 2σ μ μ + 2σ

reuse → Tues

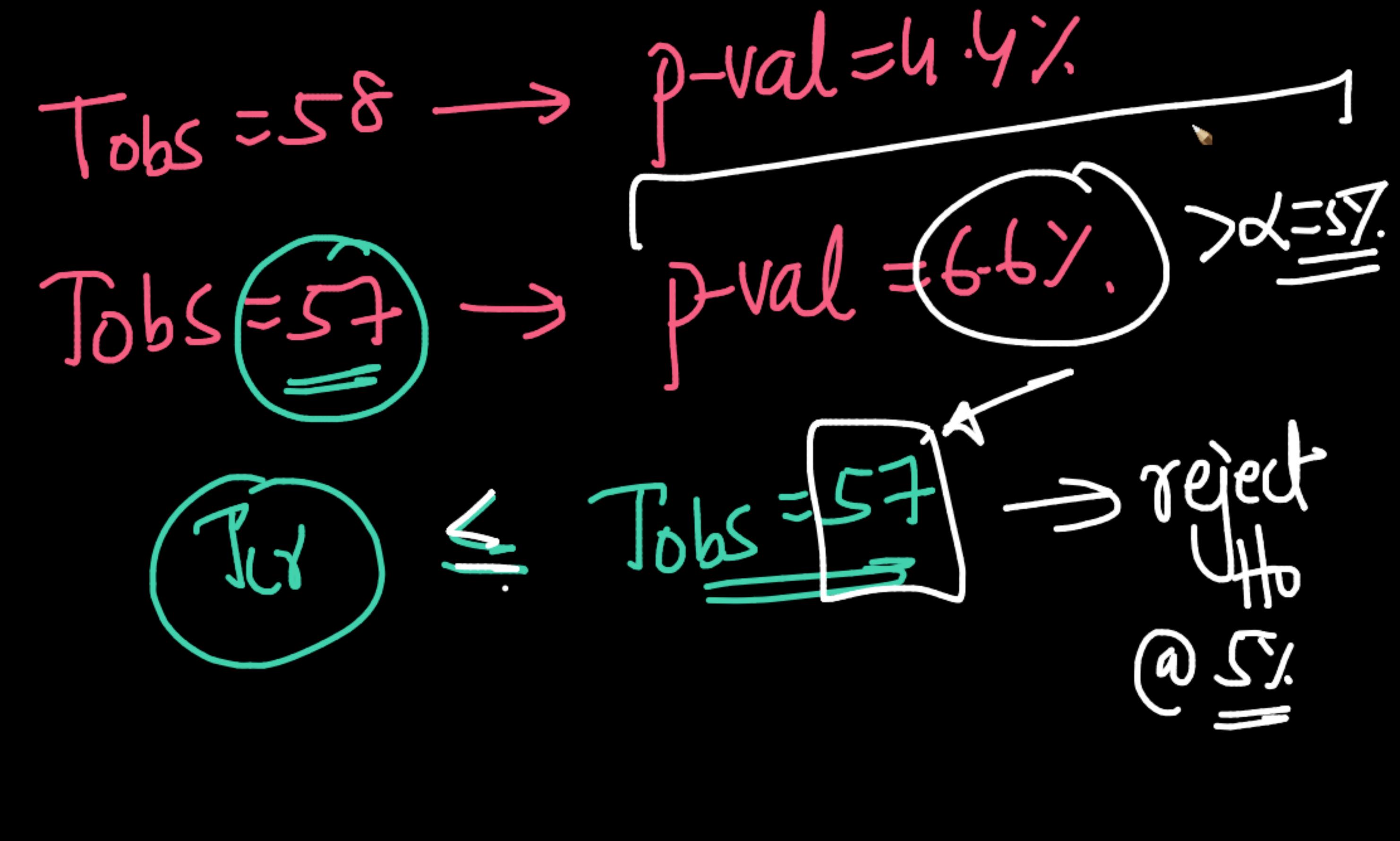
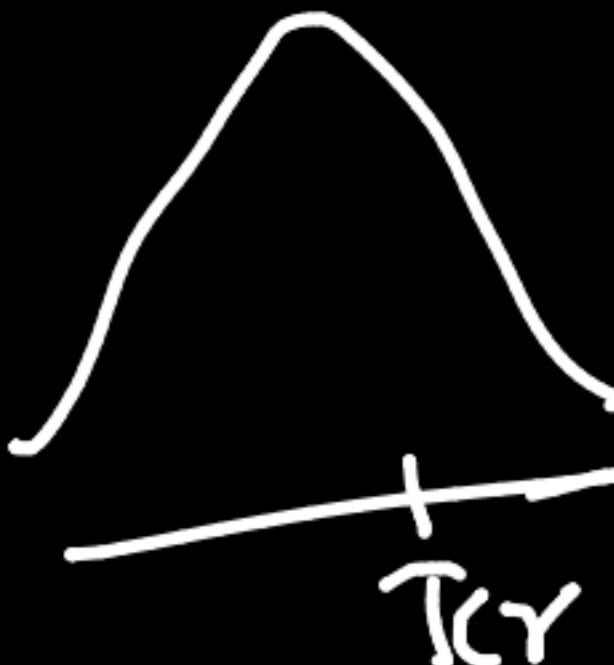


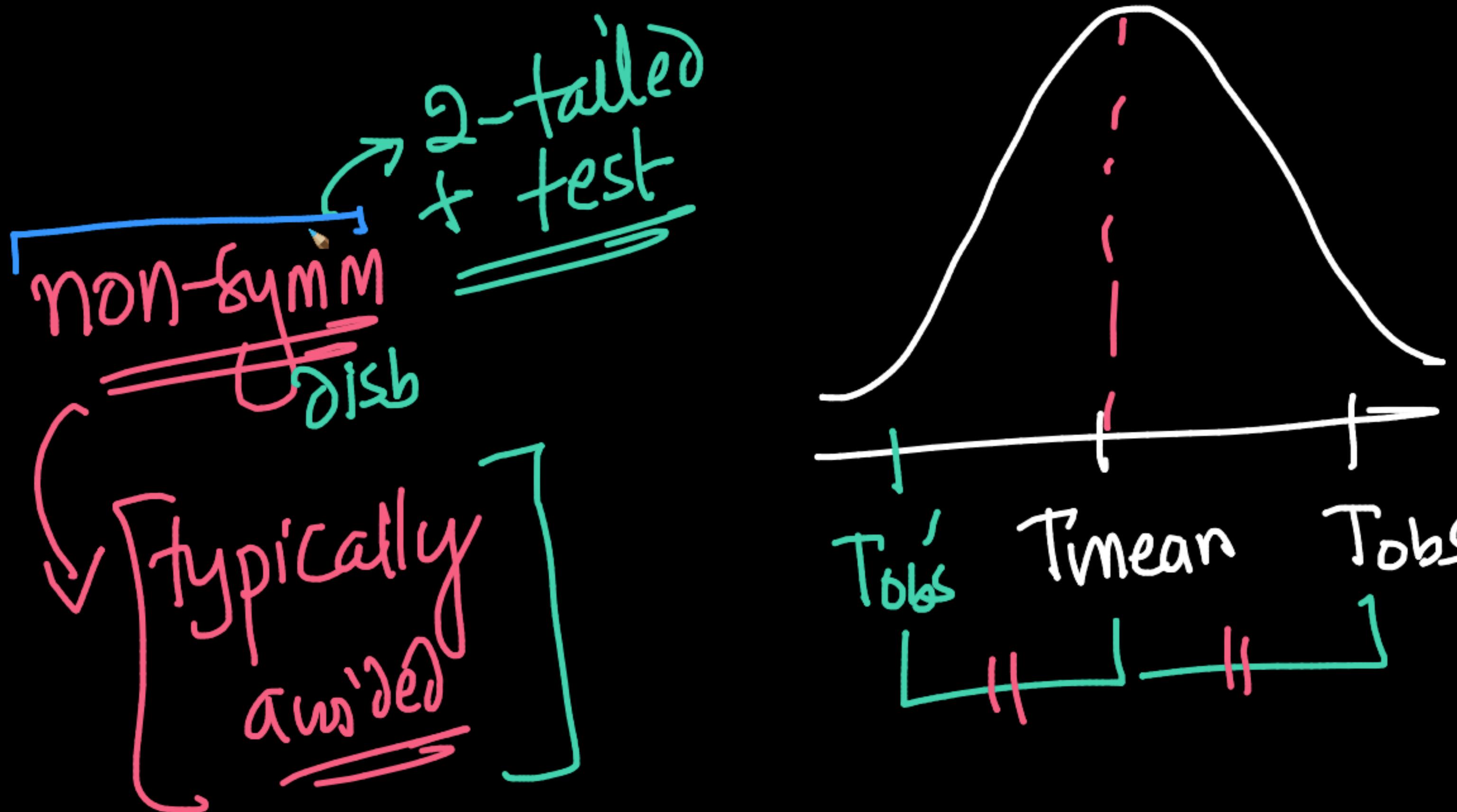
Q&A

Coin Toss:

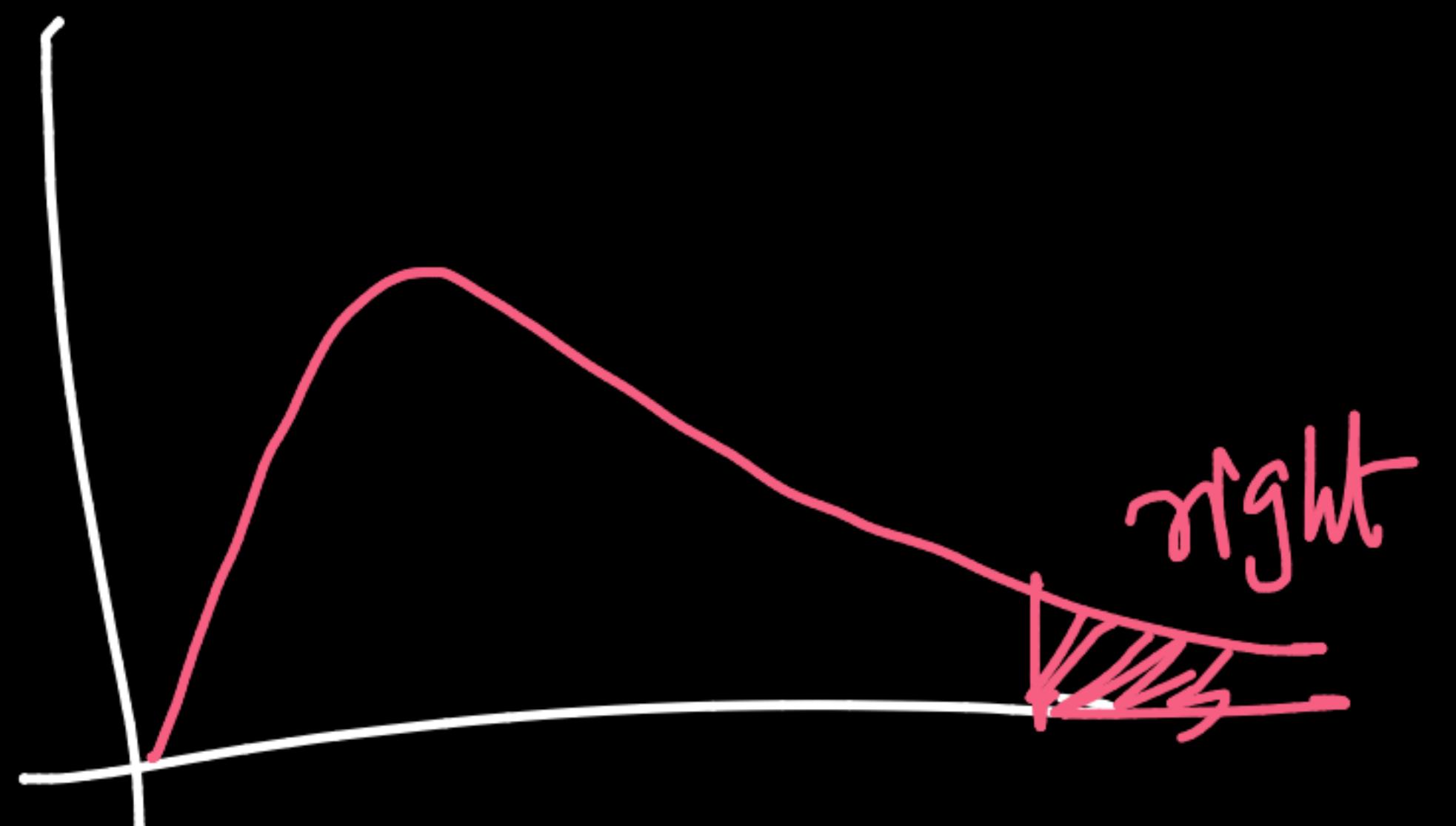
right tailed test

T<sub>CR</sub>

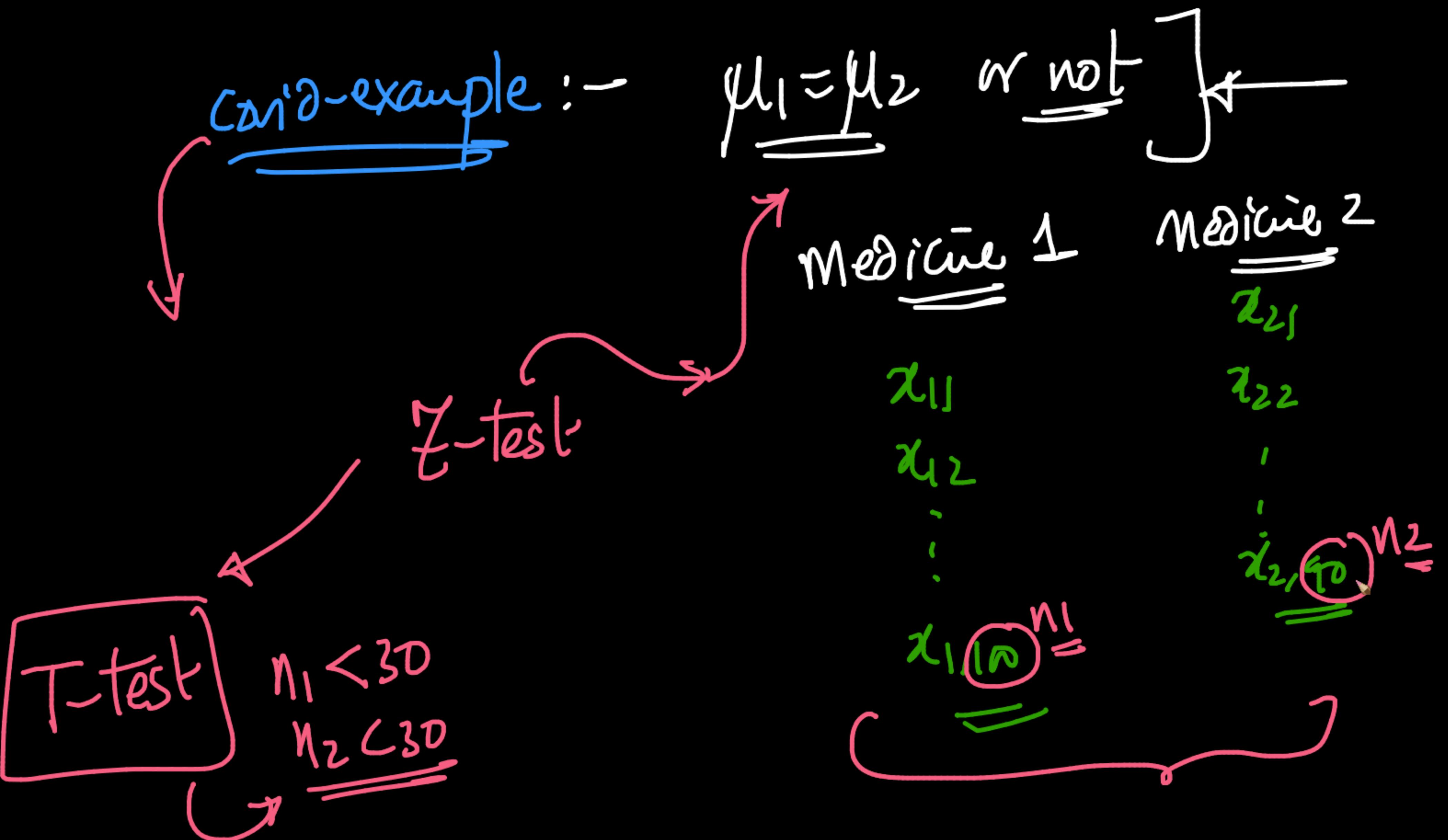




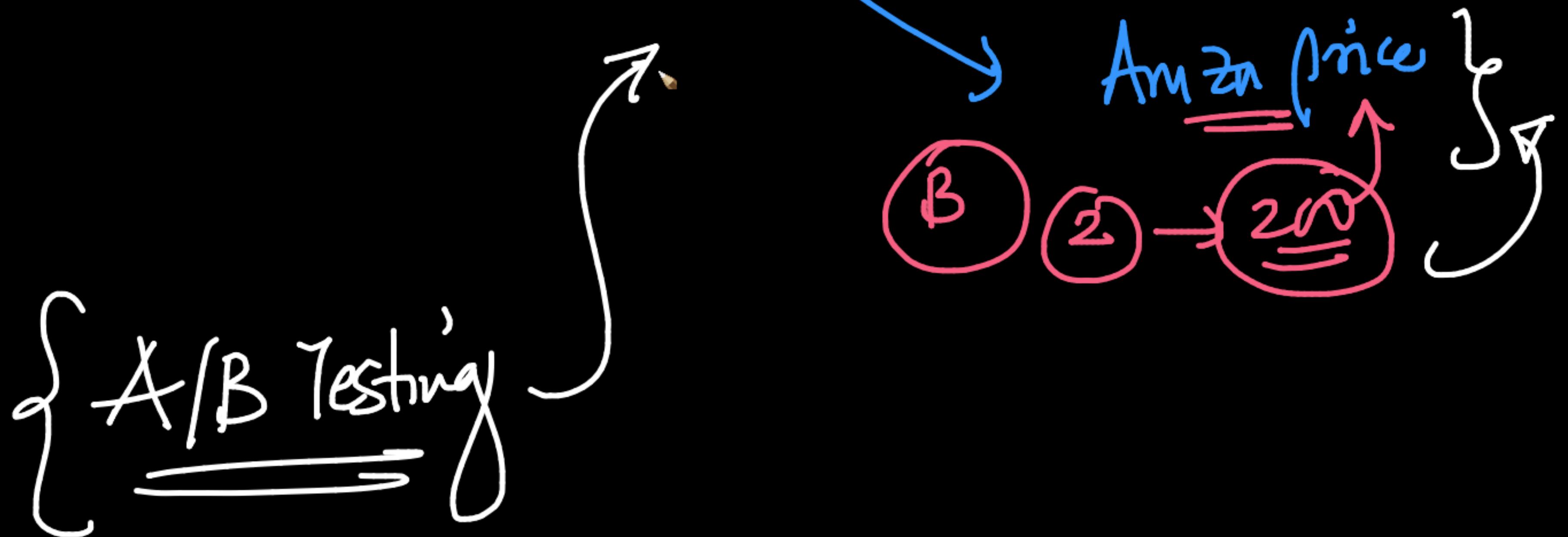
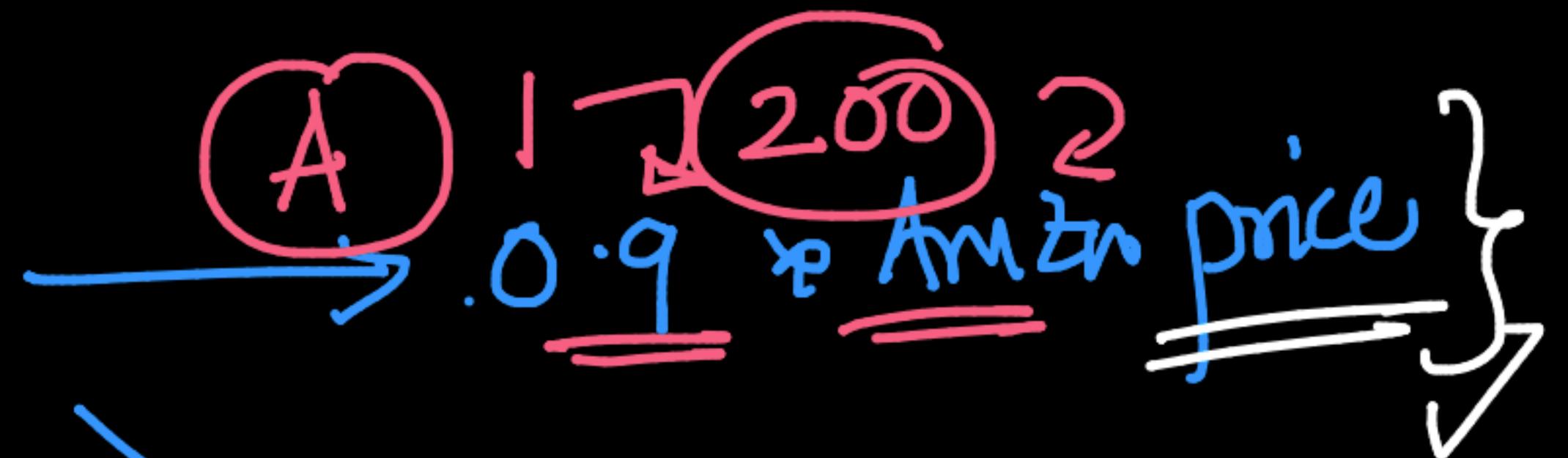
e.g. KS-test



not-symMM



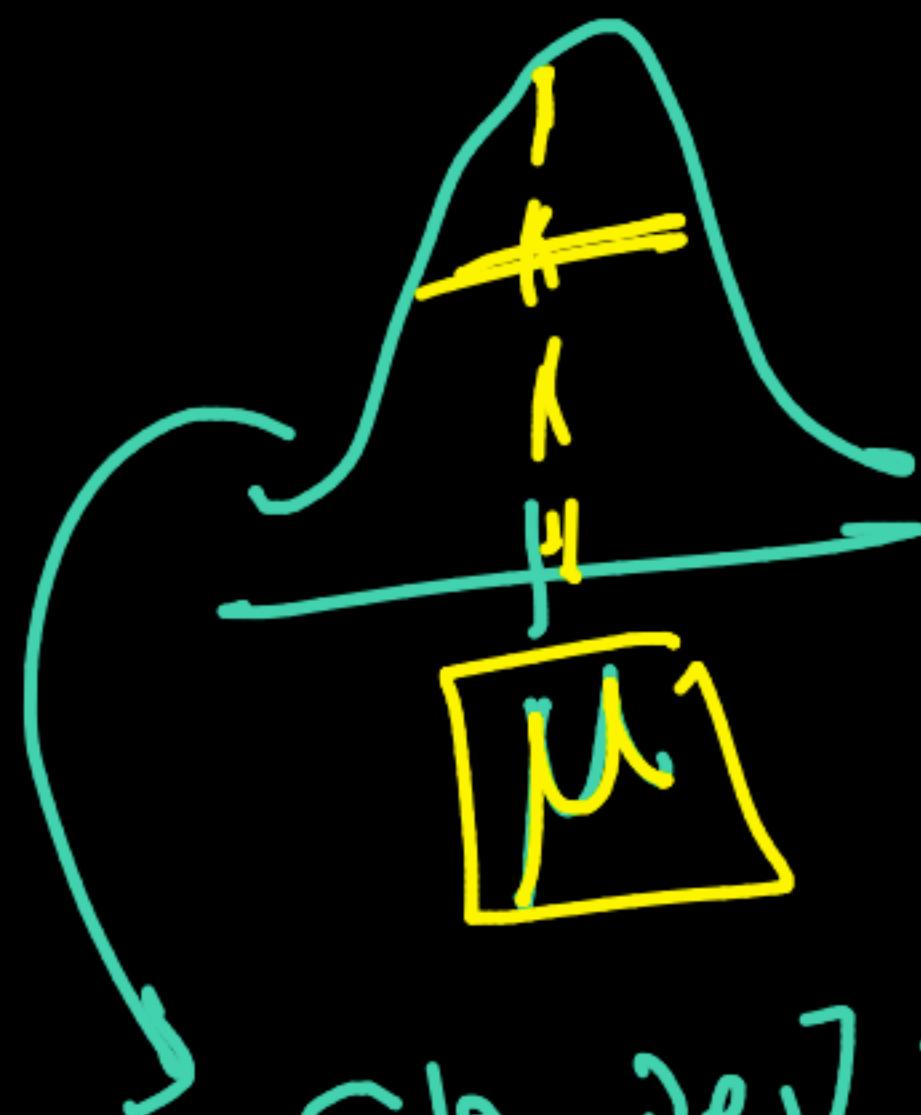
Task: e-commerce



CLT:  
⇒

disb of sample  
means

$$S.E = \frac{\sigma}{\sqrt{n}}$$



$$S.E = \frac{\sigma}{\sqrt{n}}$$

Mean  
H<sub>0</sub>: avg temp in BLR is 25°C → pop · Mean  
H<sub>a</sub>: not 25°C

$\bar{T}_{obs}$  = mean temp across 1 yr  $\leadsto$  25°C  
 $\bar{T}$  sample mean

1-Sample

$$T = \bar{x} - 25^\circ$$

$$\sim N(0, 1) = \underline{\underline{Z}}$$

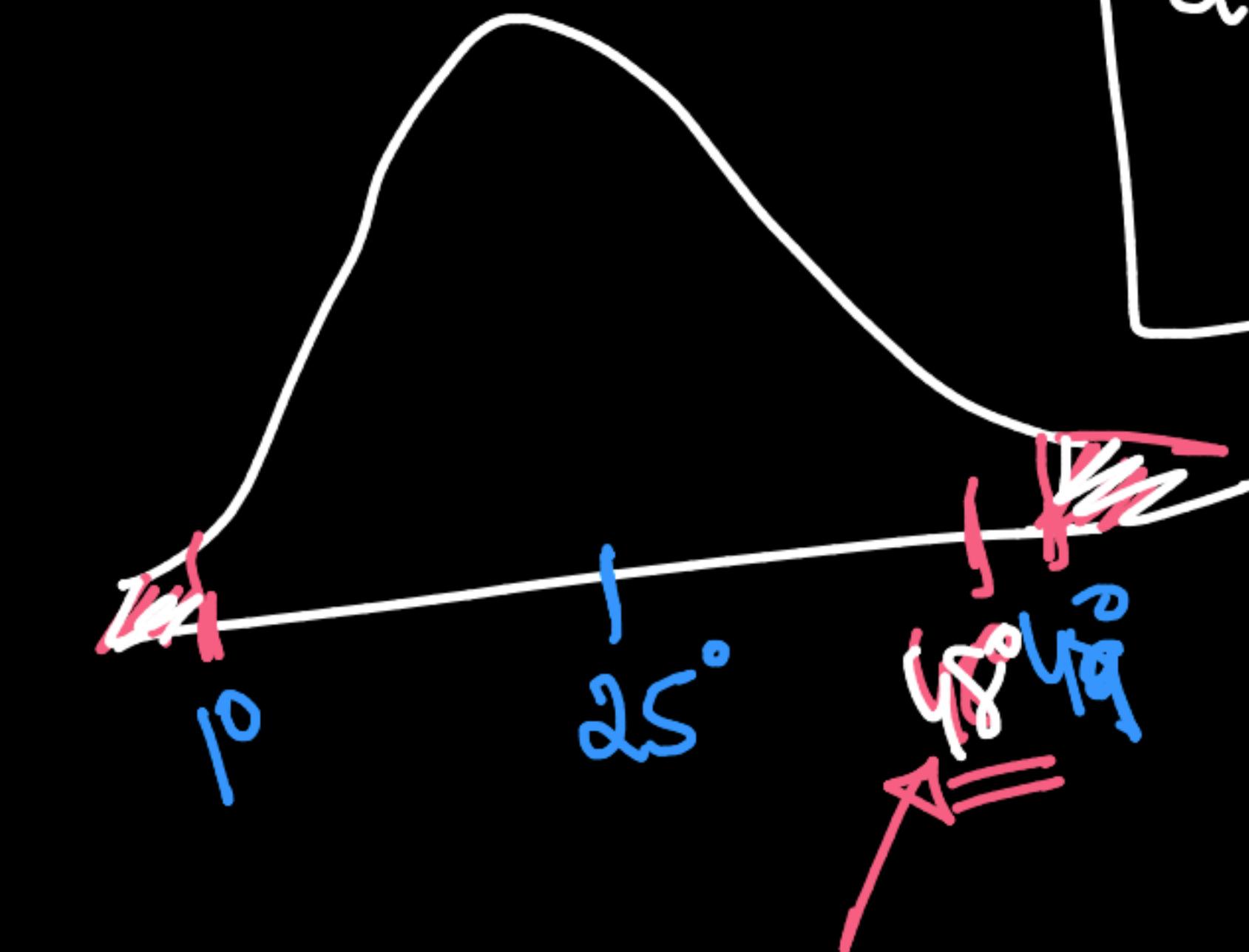
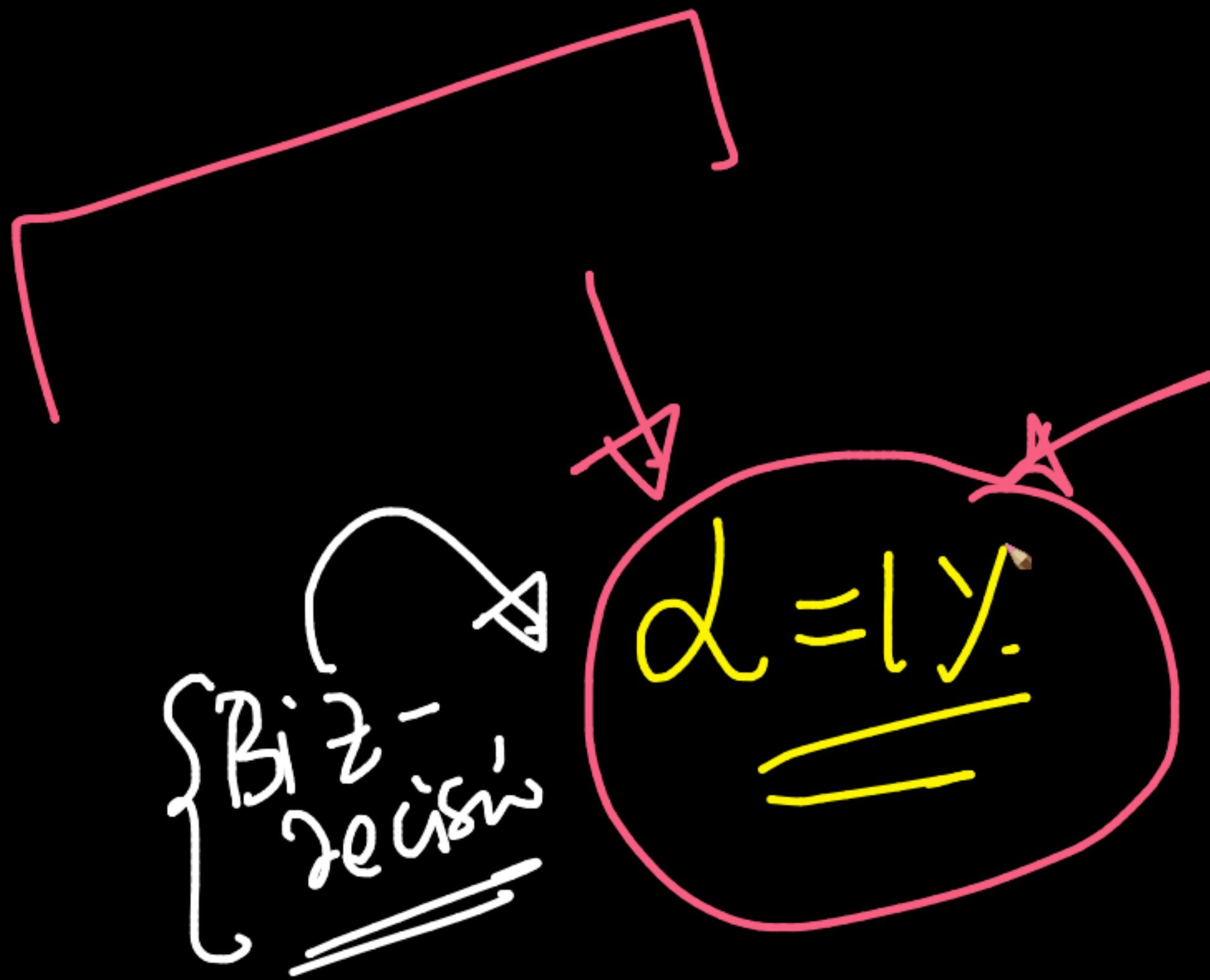
$$\sigma / \sqrt{n}$$

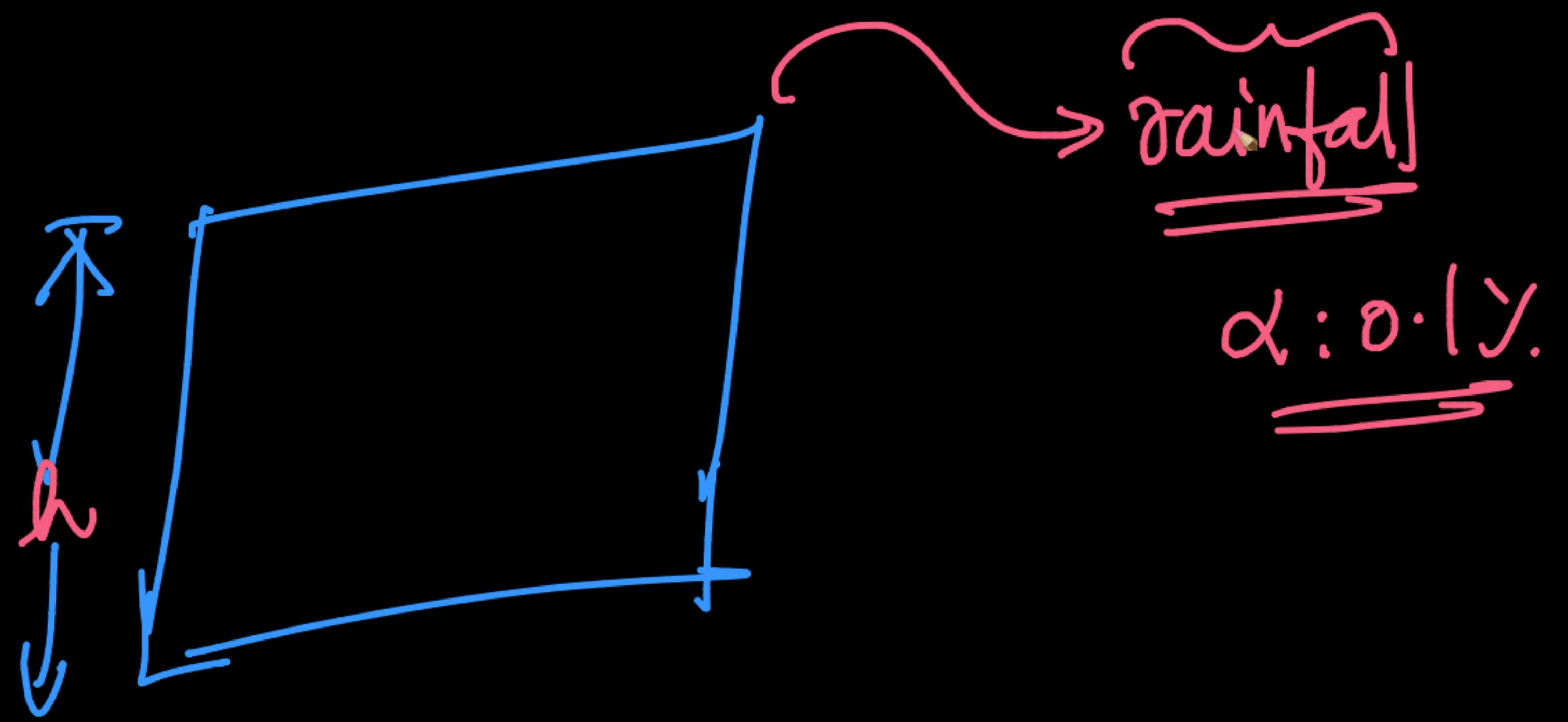
$\hookrightarrow 365 \text{ days}$

$\alpha$

accept  $H_0$

$\underline{\underline{\alpha}} = 1\%$





Z-test  $\rightarrow$  population  $\mu, \sigma$   
finite

$$T = \frac{\bar{x}_1 - \bar{x}_2}{\sqrt{\dots}} \sim Z(0|1)$$

