

Topics:



①

Hypothesis testing

→ Toy example
+ code

②

Terminology & Math

③

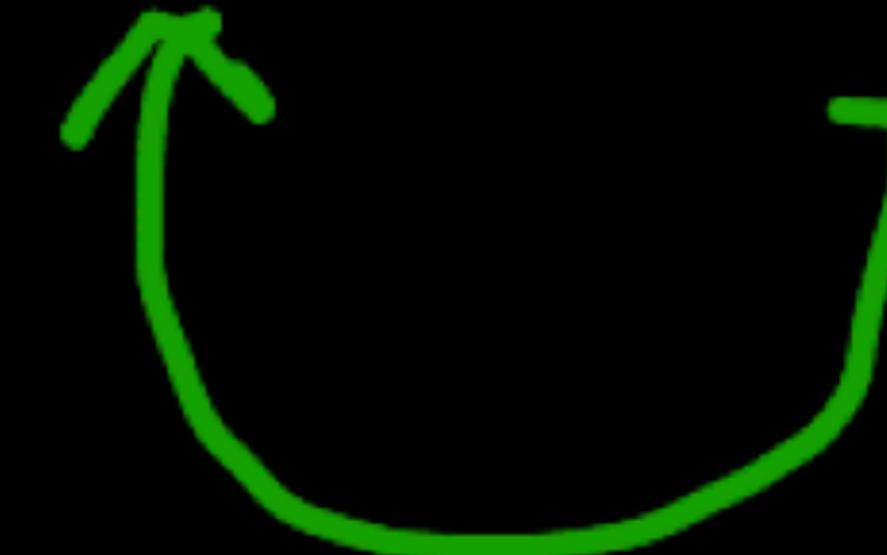
1-sided vs 2-sided tests }

④

Framework of Hyp. Testing ***

⑤

Errors & Power



afléy

11:30 ↗

log-normal distribution ✓



=



why use $n-1$ instead of n
for variance estimation ✓



why does expo-disb have
mode @ 0 [next class ... more math]



OPS!

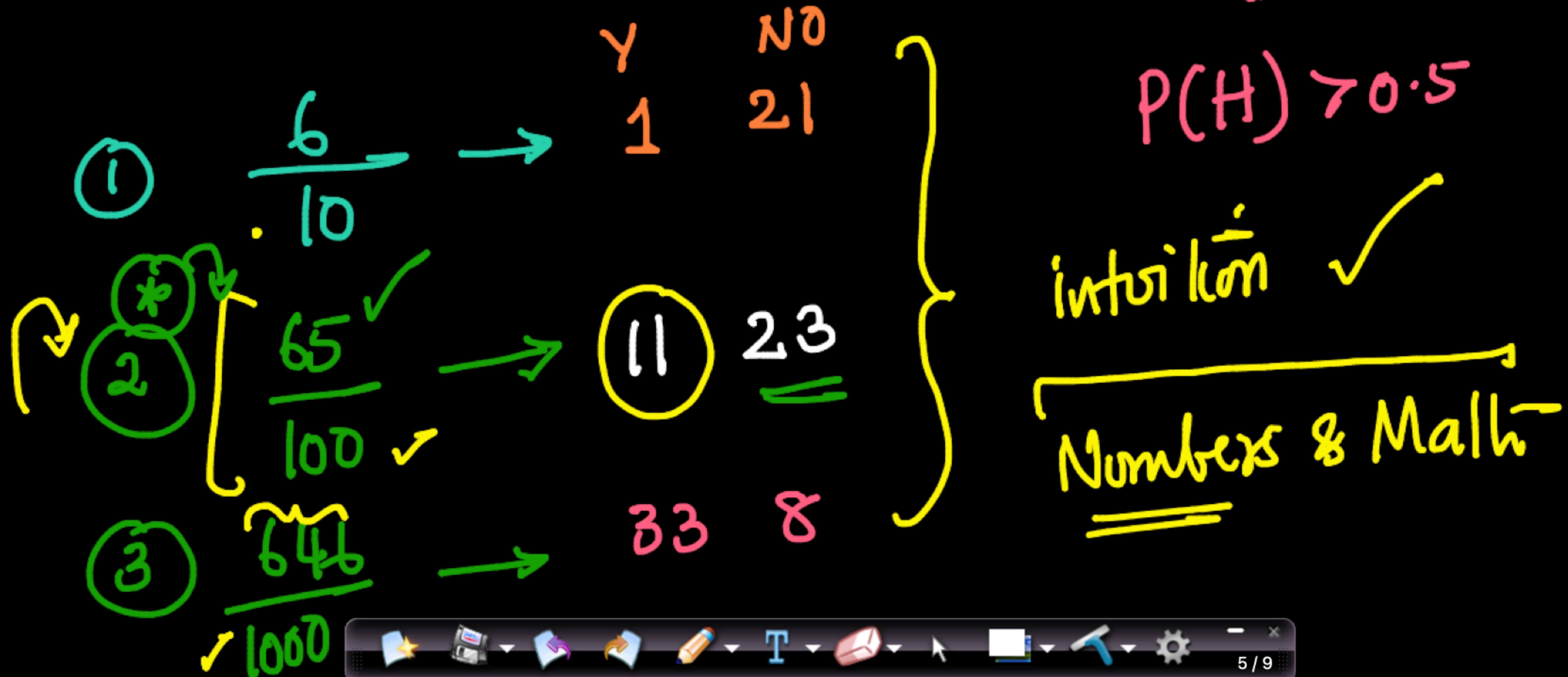
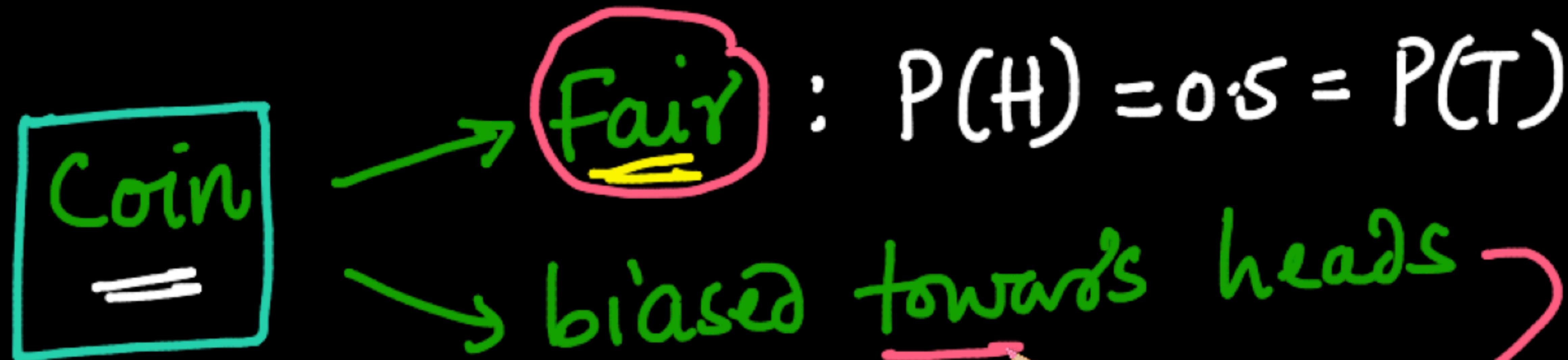
Questions → tab
"END . . . "

Chat → Y/N & interactivity

Hyp. Testing

- Tricky ; mind-bending
- fun & lots of applications
- time to digest

~~ToU:~~



Hyp. testing

- ↳ Toy - example: coin
- M_1 vs M_2 → ...
- disb₁ vs disb₂
- gender → \$ e-commerce

Hyp. lessing

↳ Terminology ↗

EONS +
~~English~~



~~Toy ex:~~

Expt :

Toss coin 100 times

[Test-statistic : # heads in 100 tosses
(T)]
Obs. # of heads = 65 (let)
Tobs

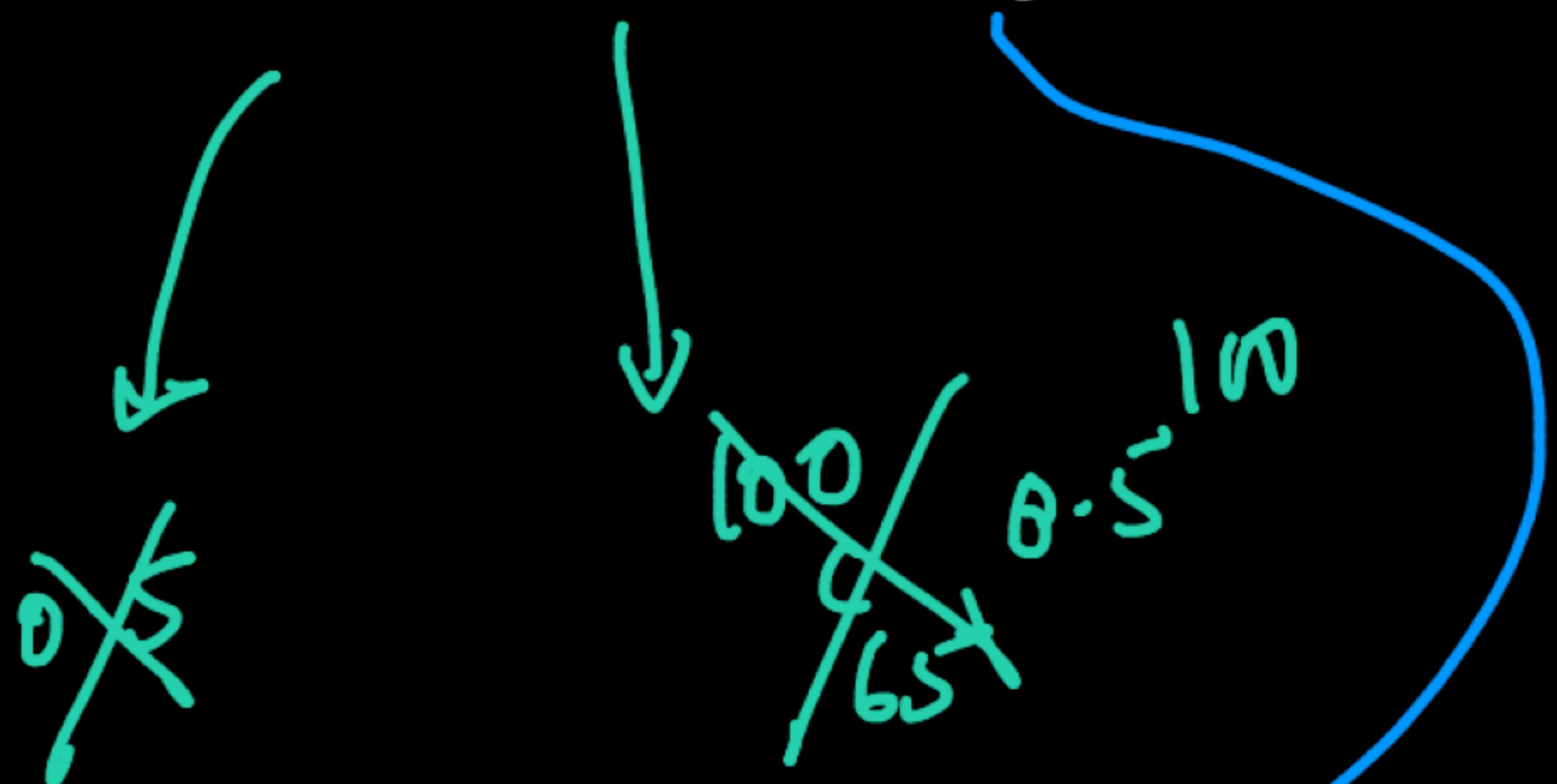
default
Null-hyp :
 H_0

coin is fair

Alt-hyp :
 H_a or H_1

coin is biased towards heads

$P(\text{observing } \geq 65 \text{ or more heads} \rightarrow T_{\text{obs}})$ = ?



$$P(T > 65) = 1 - P(T \leq 64)$$

$CDF(T)_{64}$

100 tosses → H
→ T

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

✓ $T \sim \text{binomial}(n=10; p=0.5)$

Hypothesis Testing.ipynb - Colab | Log-normal distribution - Wikipedia | Bias of an estimator - Wikipedia | New Tab | colab.research.google.com/drive/1uNuXZ3pBTxJxZTdJEx-AHzq3ix8teh5n#scrollTo=MRYFtPjZ9iCz

+ Code + Text Reconnect

import numpy as np
import matplotlib.pyplot as plt
from scipy import stats
import seaborn as sns

{x}

[] # Expt: Toss the coin 100 times
Test statistic: Count the number of heads
H0: Coin is fair
Ha: Coin is biased towards heads
$T \sim \text{Binomial}(n=100, p=0.5)$ under Null Hypothesis($=H_0$)

prob = stats.binom.cdf(k=65, n=100, p=0.5)
print(1-prob) # $P(T \geq 65 \mid H_0)$

0.0008949651957433913

Plot PDF of Binomial(100, 0.5)
X = stats.binom.rvs(n=100, p=0.5, size=100000)
plt.grid()
sns.distplot(X)

/usr/local/lib/python3.6/dist-packages/seaborn/distributions.py:110: DeprecationWarning: `distplot` is a deprecate

12 / 12

+ Code + Text

[5] `import numpy as np
import matplotlib.pyplot as plt
from scipy import stats
import seaborn as sns`

{x}

Expt: Toss the coin 100 times
Test statistic: Count the number of heads
H0: Coin is fair
Ha: Coin is biased towards heads
$T \sim \text{Binomial}(n=100, p=0.5)$ under Null Hypothesis ($=H_0$)

prob = stats.binom.cdf(k=64, n=100, p=0.5)
print(1-prob) # $P(T \geq 65 \mid H_0)$

0.0017588208614850442

Plot PDF of Binomial(100, 0.5)
X = stats.binom.rvs(n=100, p=0.5, size=100000)
plt.grid()
sns.distplot(X)

0.001758



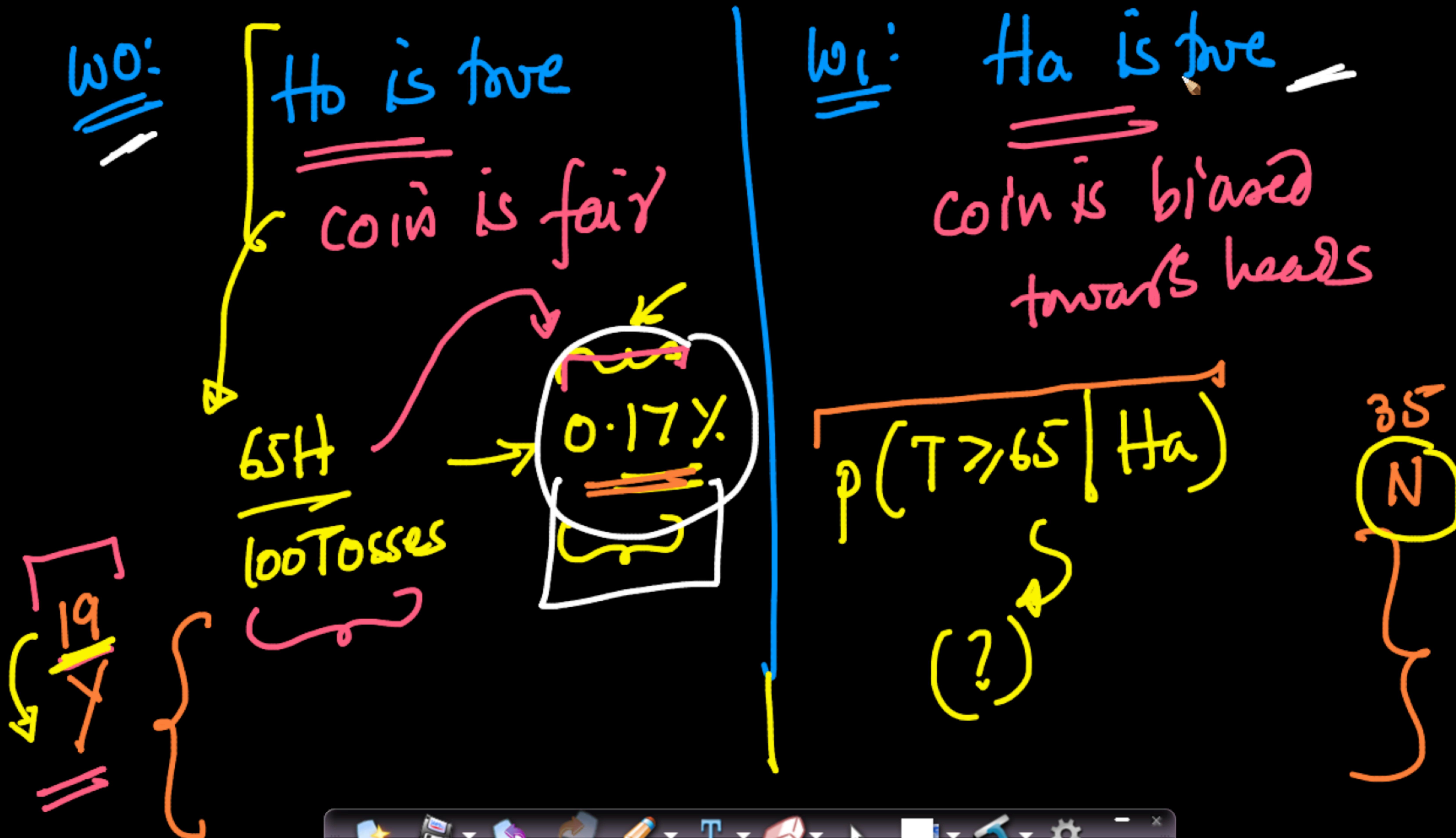
0.17%



65H
100 tosses → observed data

$P(\text{observing } 65 \text{ or more heads in 100 tosses} \mid H_0) = 0.17\%$

$P(T \geq 65 \mid H_0) = 0.17\% \quad \underline{\underline{=}}$



v. low →  5y. (rule of thumb)

lets:

Tosses = 52 heads

$$P(T \geq 52 | H_0) = 38.2\%$$

W0: H_0 is true

$$P(T > 52 | H_0)$$

$$= 38.21\%$$

Wa: H_a is true

$$P(T > 52 | H_a)$$

Not possible
to calc

$$P(T \geq T_{\text{obs}} \mid \underline{\text{Ha}})$$

coin is biased
towards heads

∞ many bins
 \Rightarrow ∞ bins

$$\left\{ \begin{array}{l} P(H) = 0.51 \text{ or } \\ P(H) = 0.511 \end{array} \right.$$

why is H_0 : coin is fair $P(H) = 0.5$

$$P(T > T_{obs} | H_0)$$

Binomial dist



T_{obs} = 5



→ H₀: coin is fair

→ H_a: coin is biased

too many H X

Variations

✓ { H_0 : coin is fair (later)
 H_a : coin is unfair

✓ [H_0 : coin is fair
 H_a : coin is biased towards tails

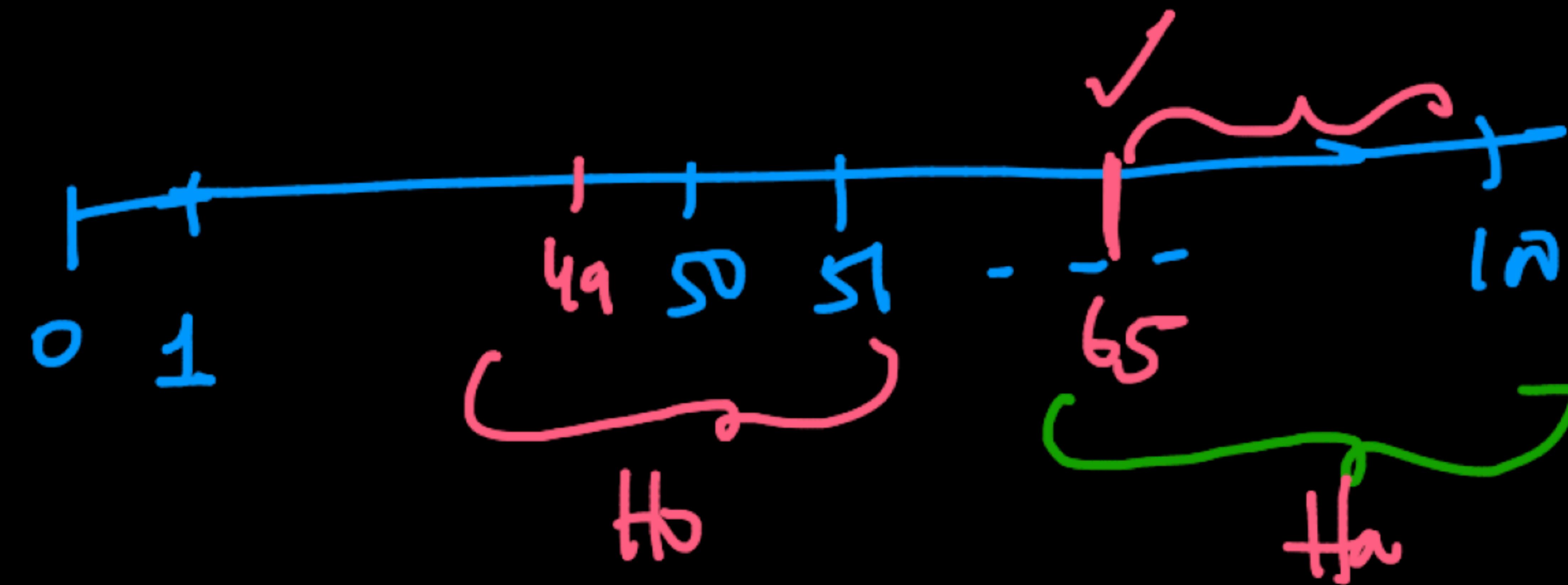
gickschule

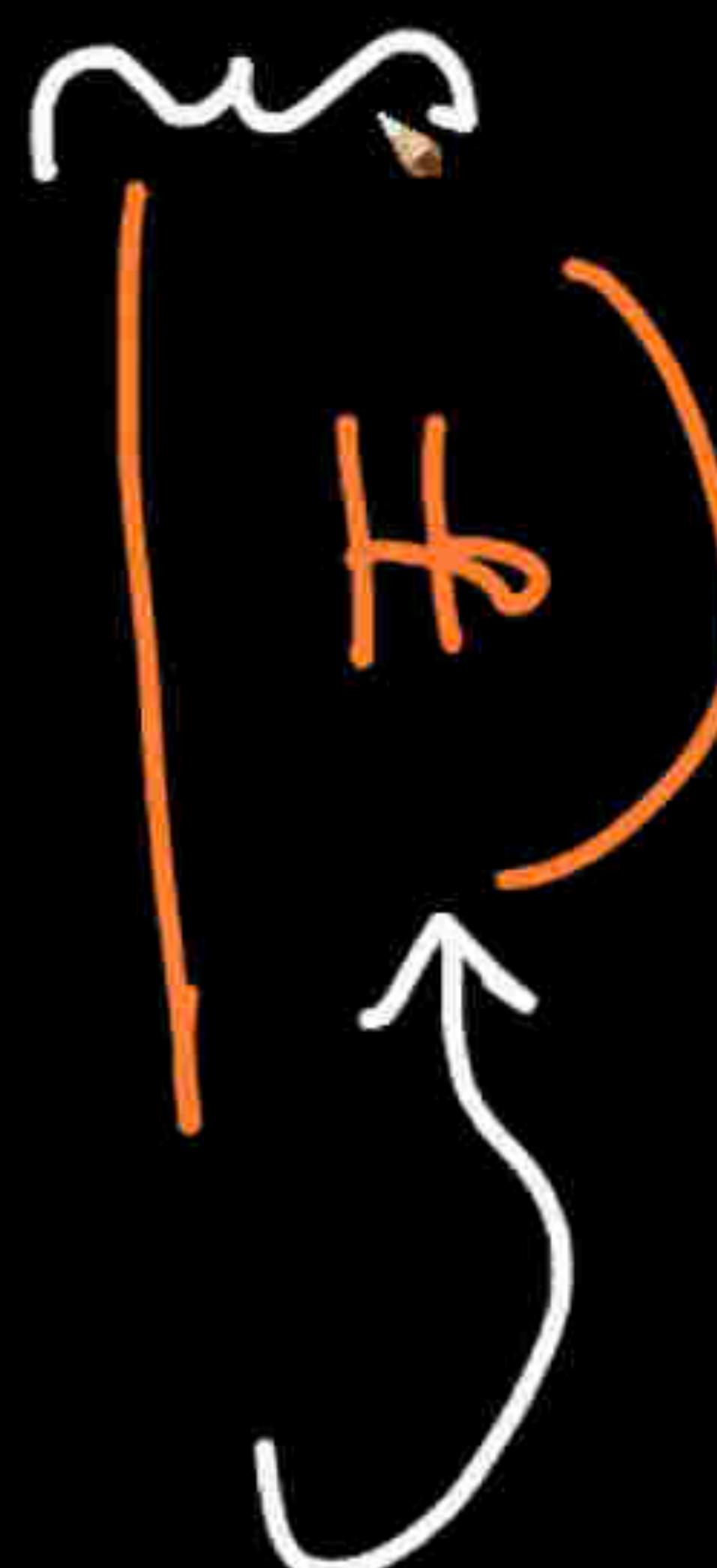
"END": —

$$P(T \geq 65 = T_{obs} | H_0)$$
$$\{ P(T \leq 65 | H_0)$$

H_0 : coin is fair
 H_a : coin is biased towards heads
 $\rightarrow P(\text{observing } \geq \text{num heads} | H_0) = ?$

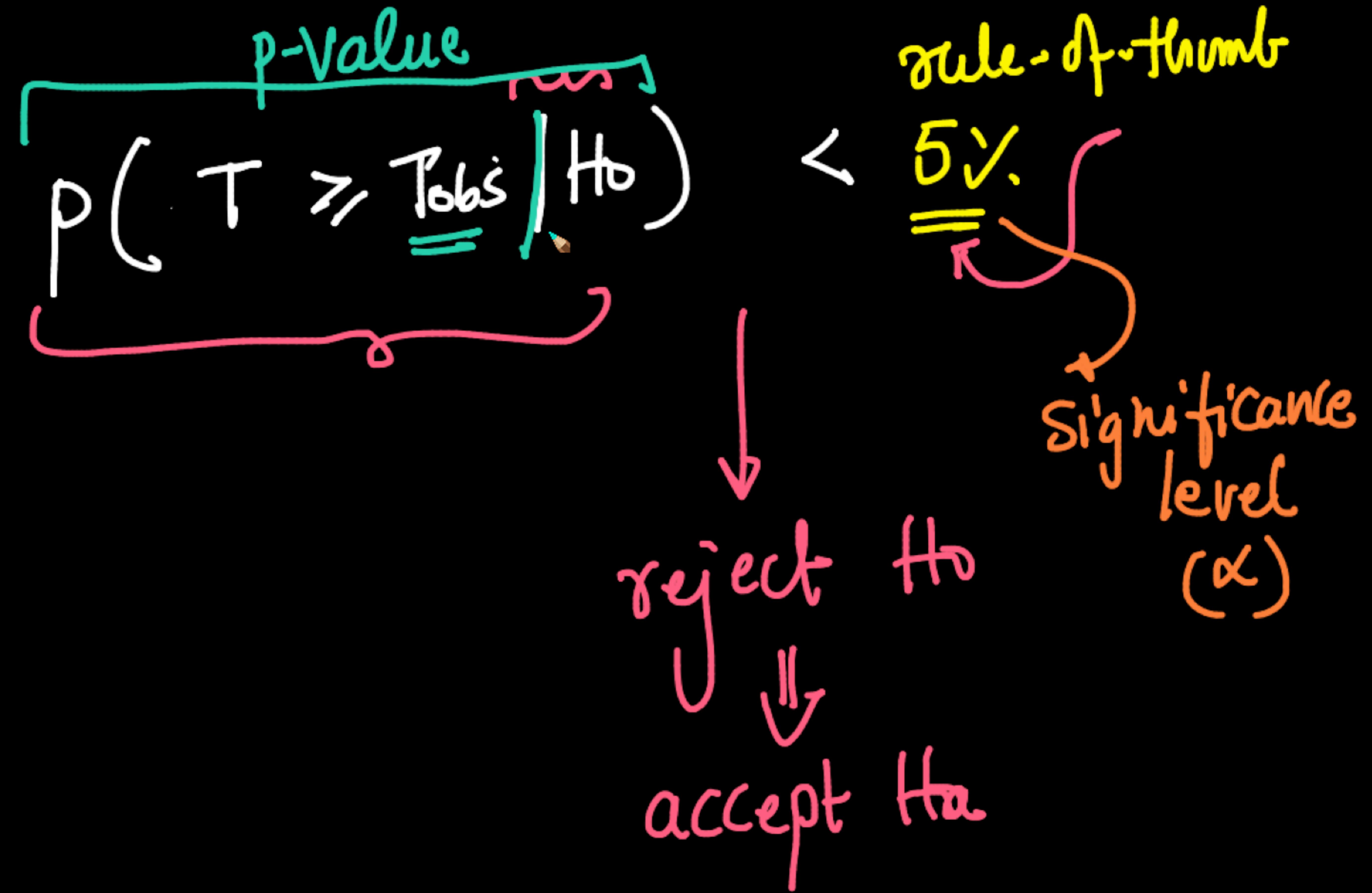
65 or More extreme



{ P (observing T as
extreme as T_{obs} or
more) } 

~~Ho~~ ✓

Ha



⇒ $p\text{-val} < \alpha \rightarrow \text{reject } H_0 \Rightarrow \text{accept } H_a$

$P(T > T_{\text{obs}} | H_0) \geq 5\%$

\downarrow

$p\text{-val} > 5\%$

→ $\text{Cannot reject } H_0$

$\Rightarrow \text{accept } H_0 \Rightarrow \text{reject } H_a$

$$P(T > T_{\text{obs}} = 52 \mid H_0) = 38.21\%$$

p-val 75%

↓

cannot reject $H_0 \Rightarrow$ accept H_0

p-val \neq prob that H_0 is true

$$\rightarrow P(T \geq T_{obs} | H_0)$$

$$P(T > T_{obs} | H_0) \approx 0.5$$

$\sqrt{65}$

$T = \frac{\text{# heads in 600 tosses}}{600}$

{ 6H
10 Tosses

Some:- H_0 & H_a \rightsquigarrow (coin is biased towards
need not be exhaustive)

Coin is fair



accept H_a

H_0 : Coin is fair

H_a : Coin is biased

$$\left\{ \frac{5H}{100T} \right.$$

$P(T > 5 | H_0) \approx 1.0$
p-val
 \uparrow
 $> 5\%$
 \downarrow accept $\underline{H_0}$

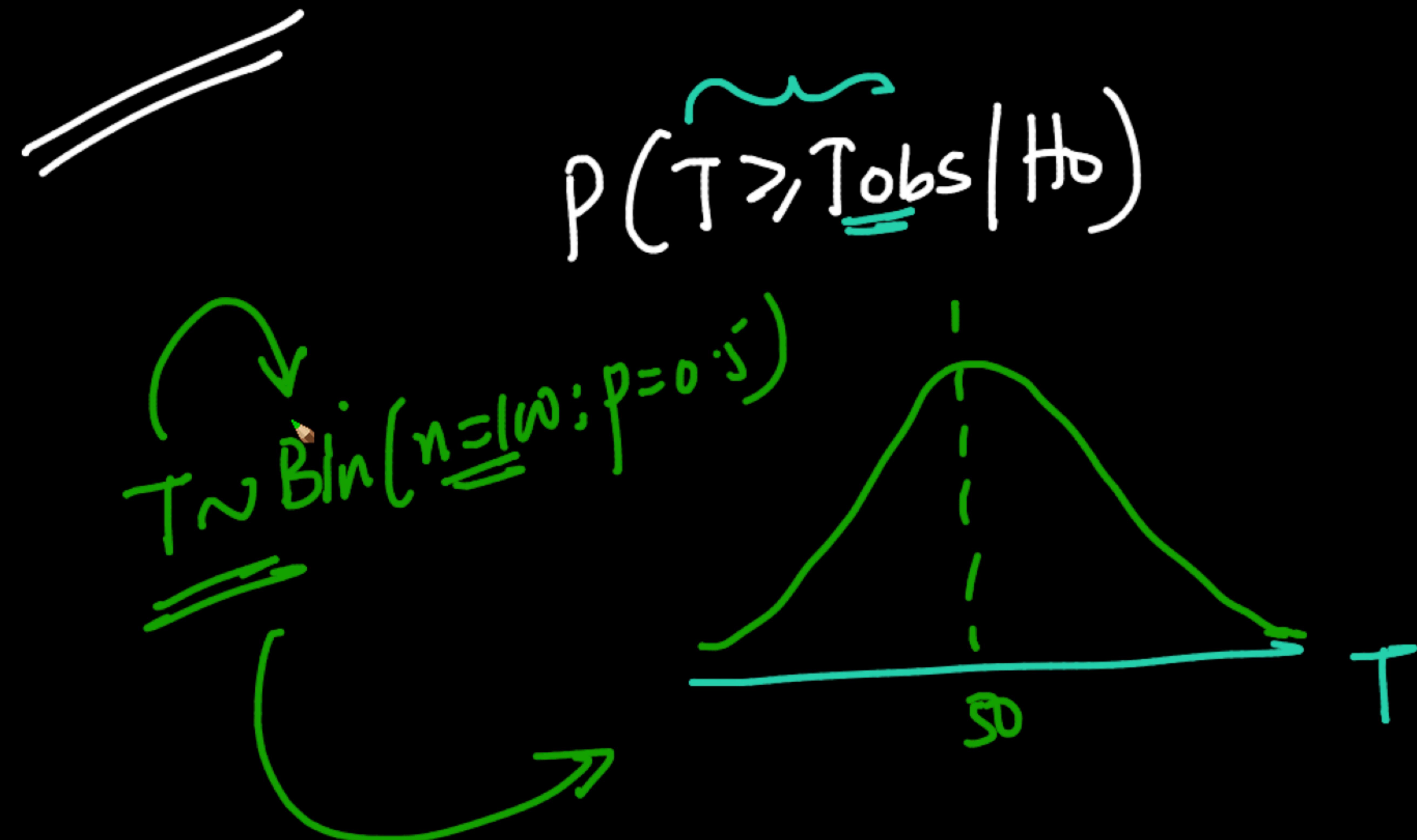
In this case

$$\underline{P(T \geq T_{obs} | H_0)}$$



$P(\text{observing } T \text{ as extreme or more than } T_{obs} | H_0)$

$$P(- \leq T \leq - | H_0) \rightarrow (\text{alter})$$

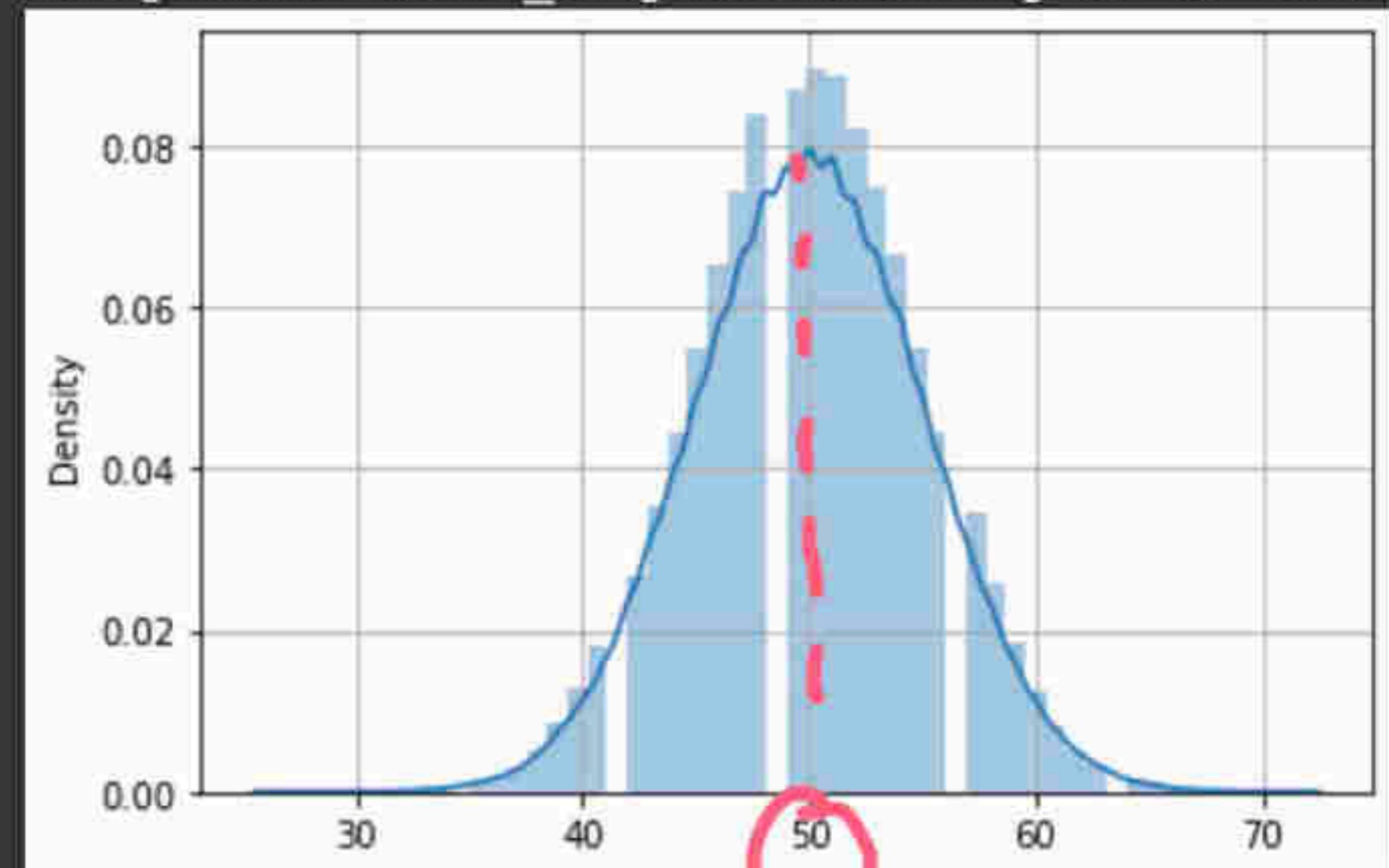


+ Code + Text

✓ RAM Disk

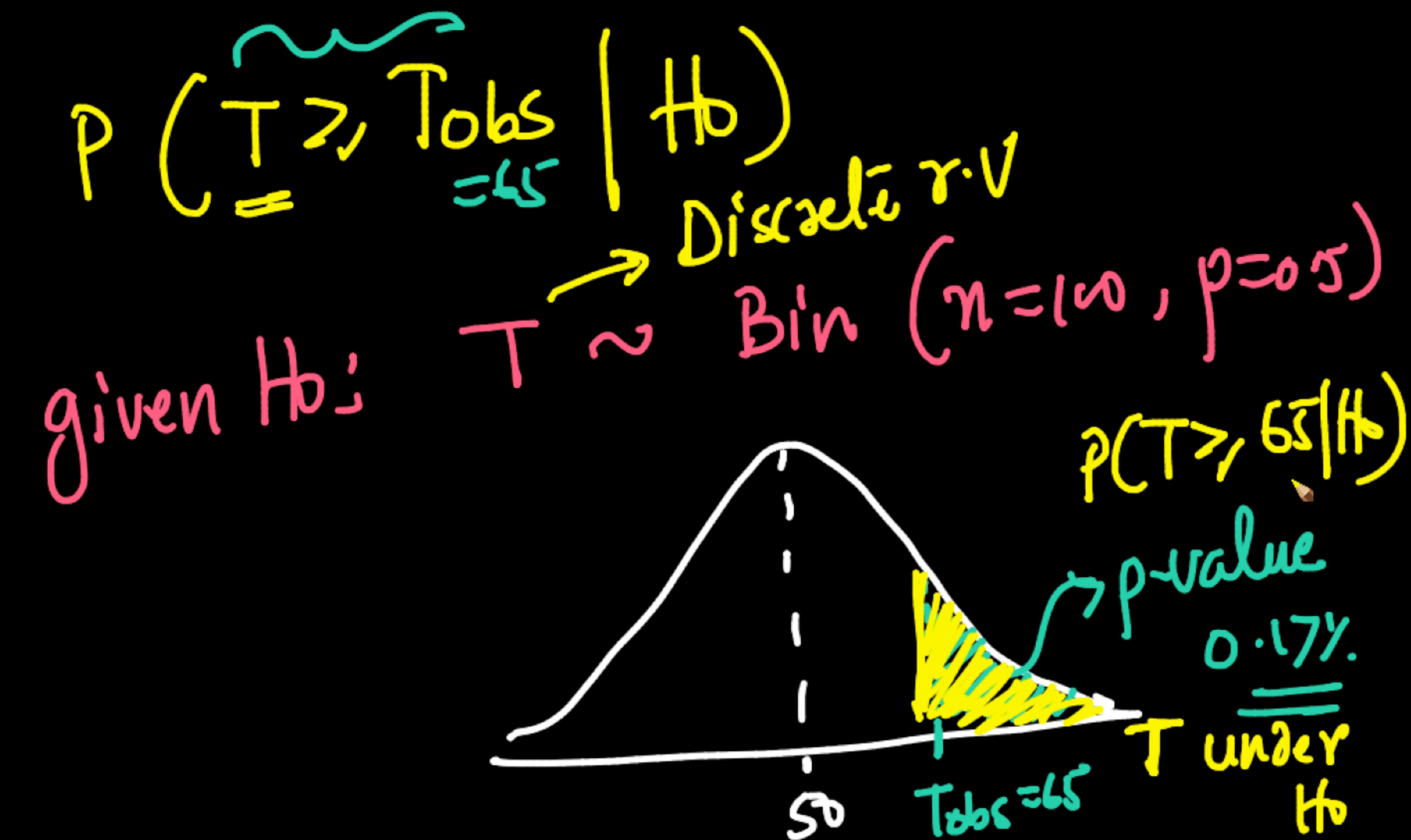
```
[3] # Plot PDF of Binomial(100, 0.5)
X = stats.binom.rvs(n=100, p=0.5, size=100000)
plt.grid()
sns.distplot(X)
```

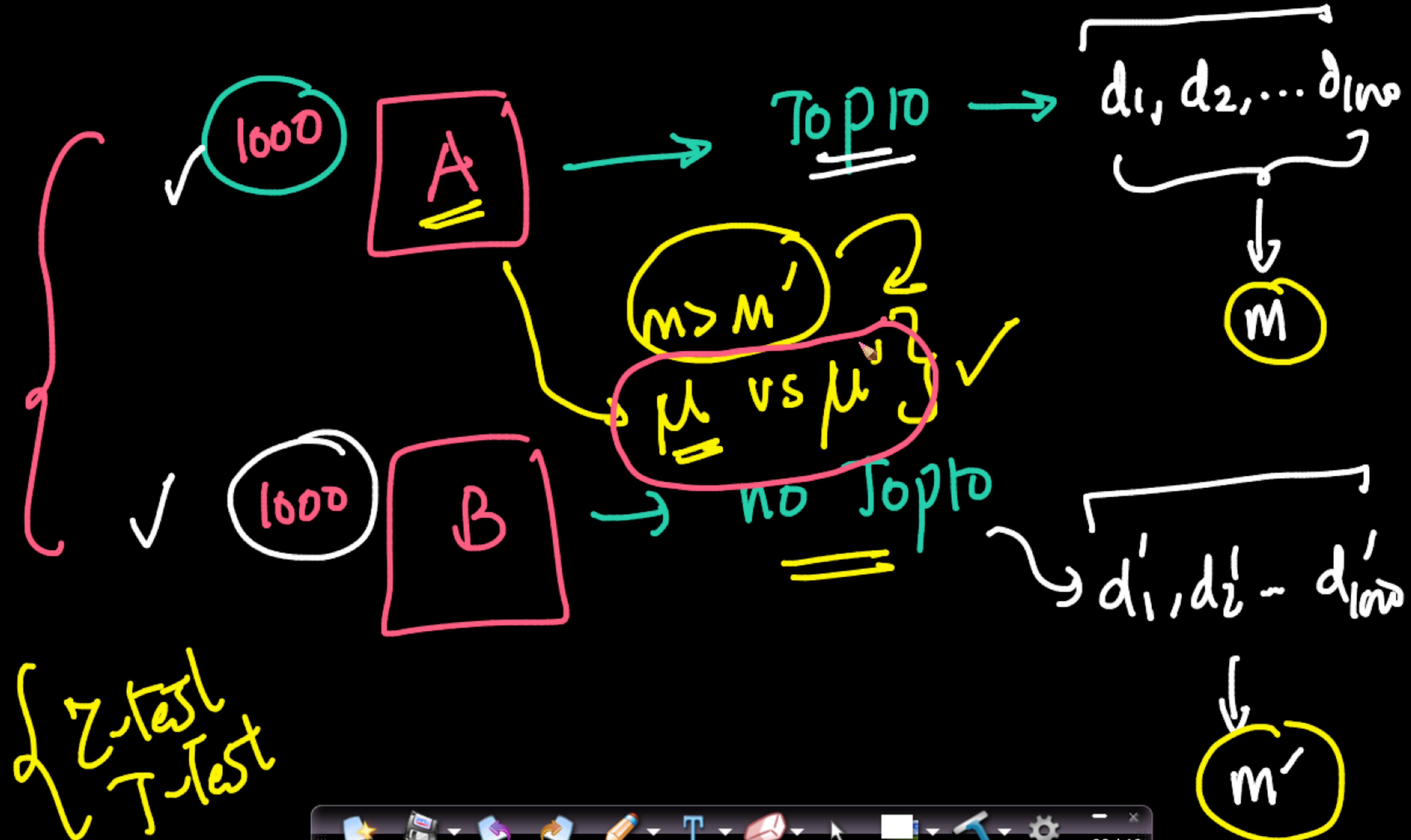
```
/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecate
  warnings.warn(msg, FutureWarning)
<matplotlib.axes._subplots.AxesSubplot at 0x7fd257cb9110>
```



$$n \cdot p = 50$$







$$\left\{ \begin{array}{l} H_0: \mu = \mu' \\ H_a: \mu \neq \mu' \end{array} \right.$$

z test

T test

(later)

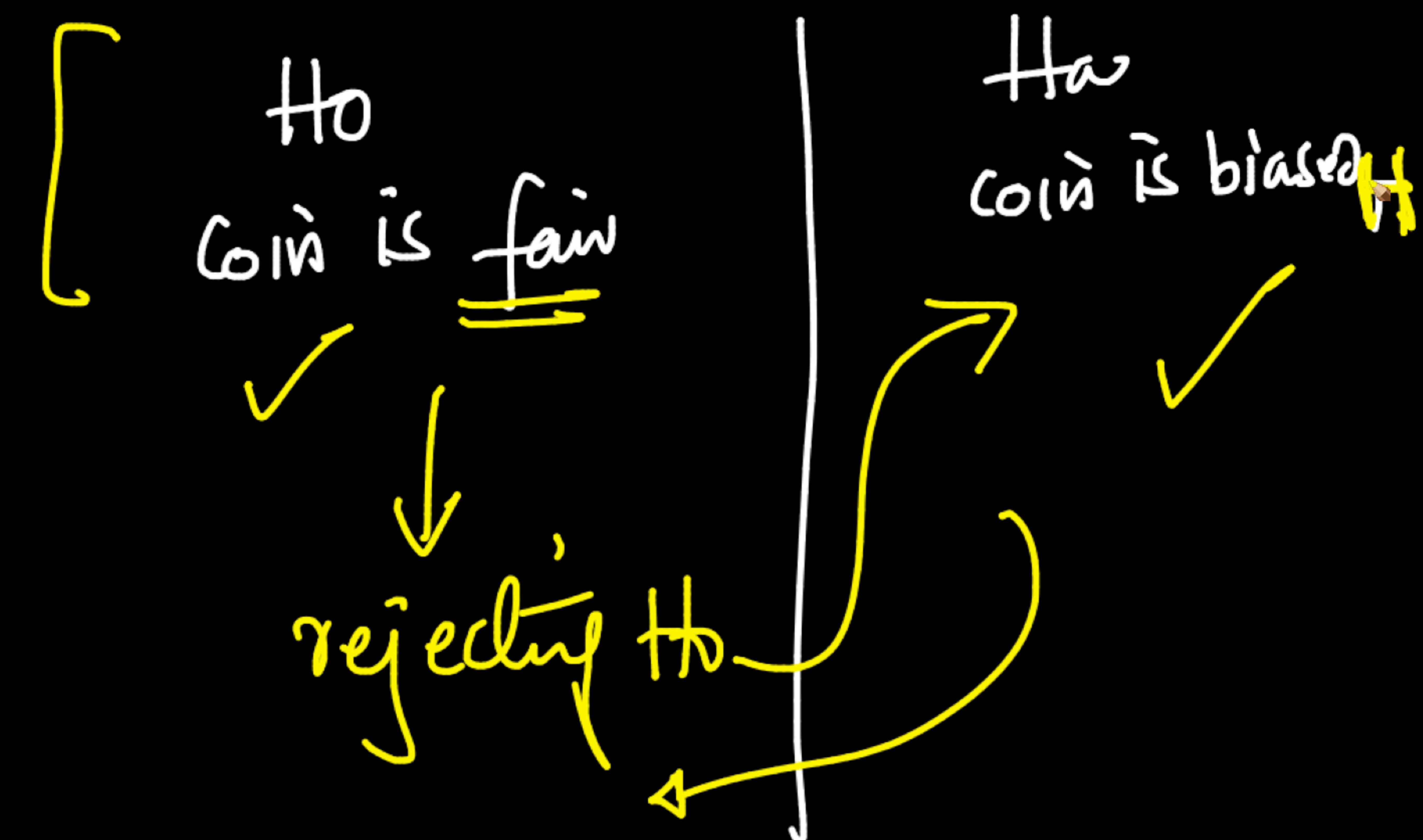


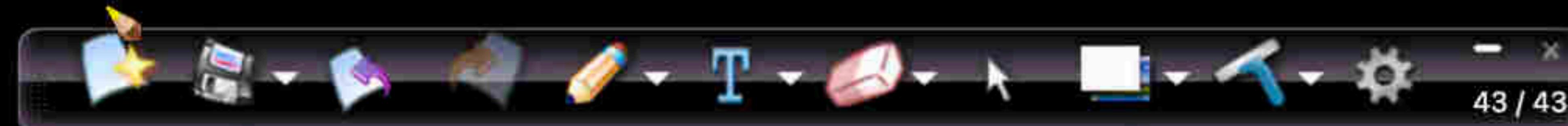
✓ 65 Heads
100 Tosses

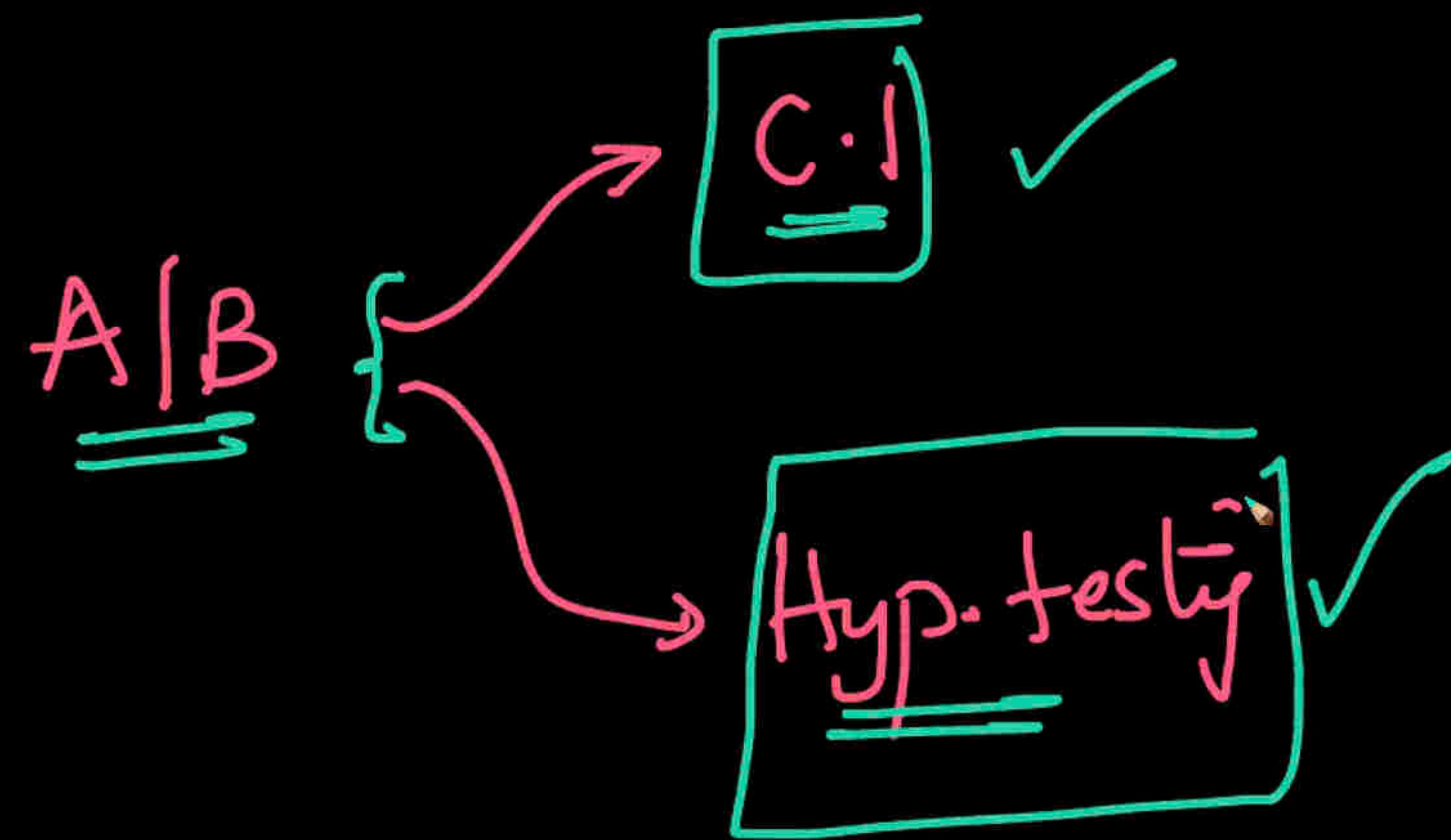
$P(H) = 0.5$

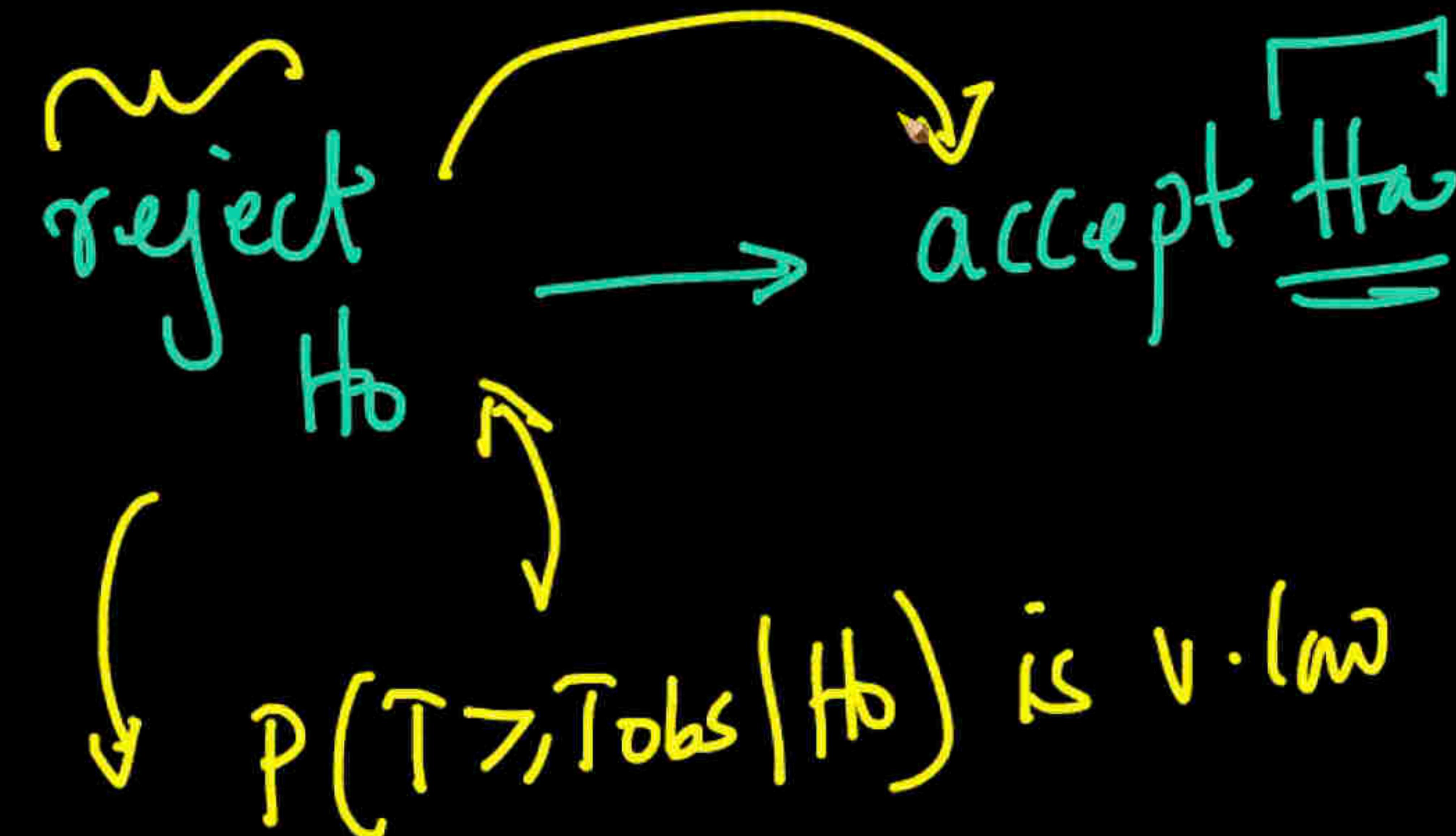
$P(H) > 0.5$

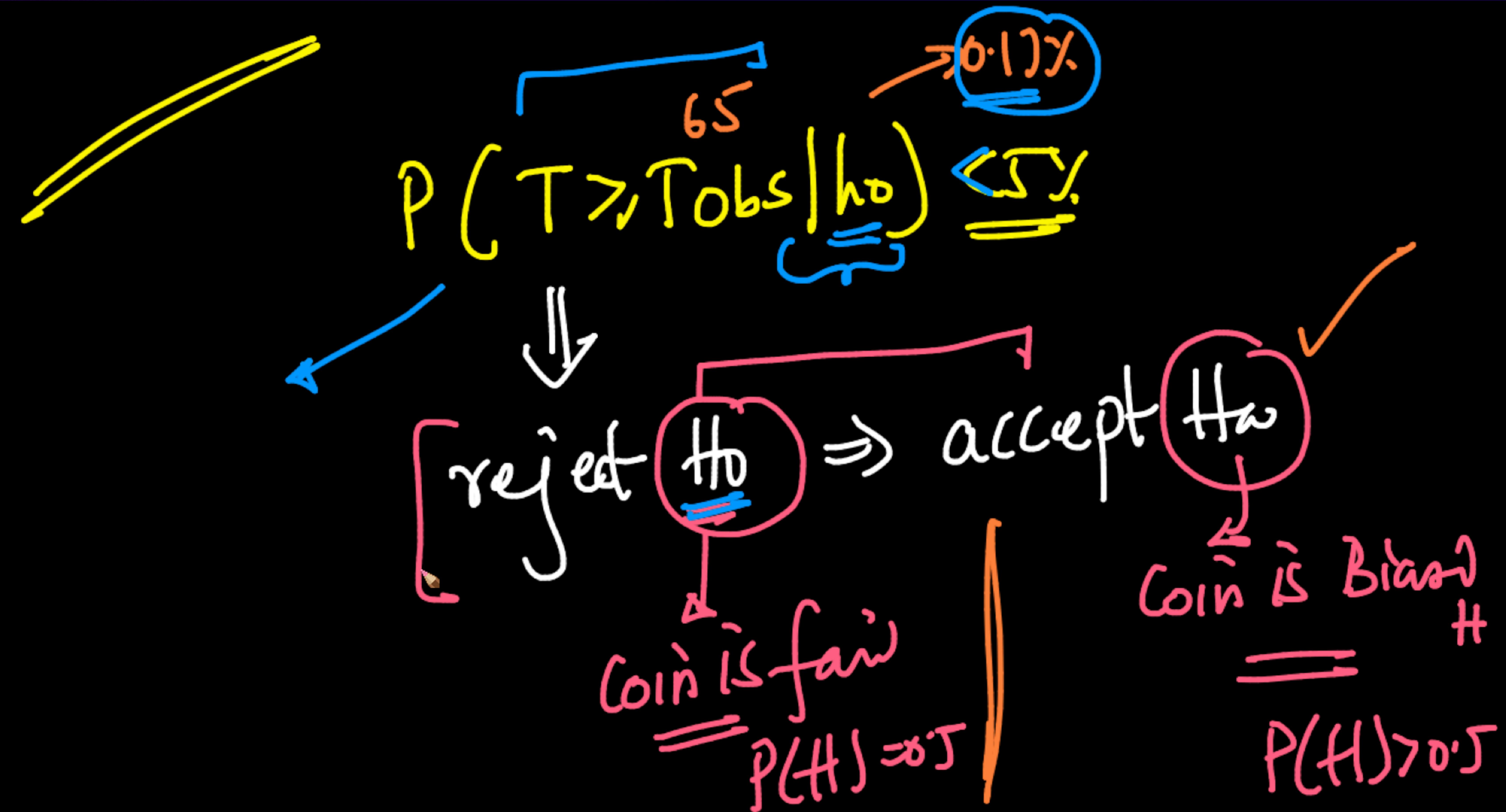
H
T











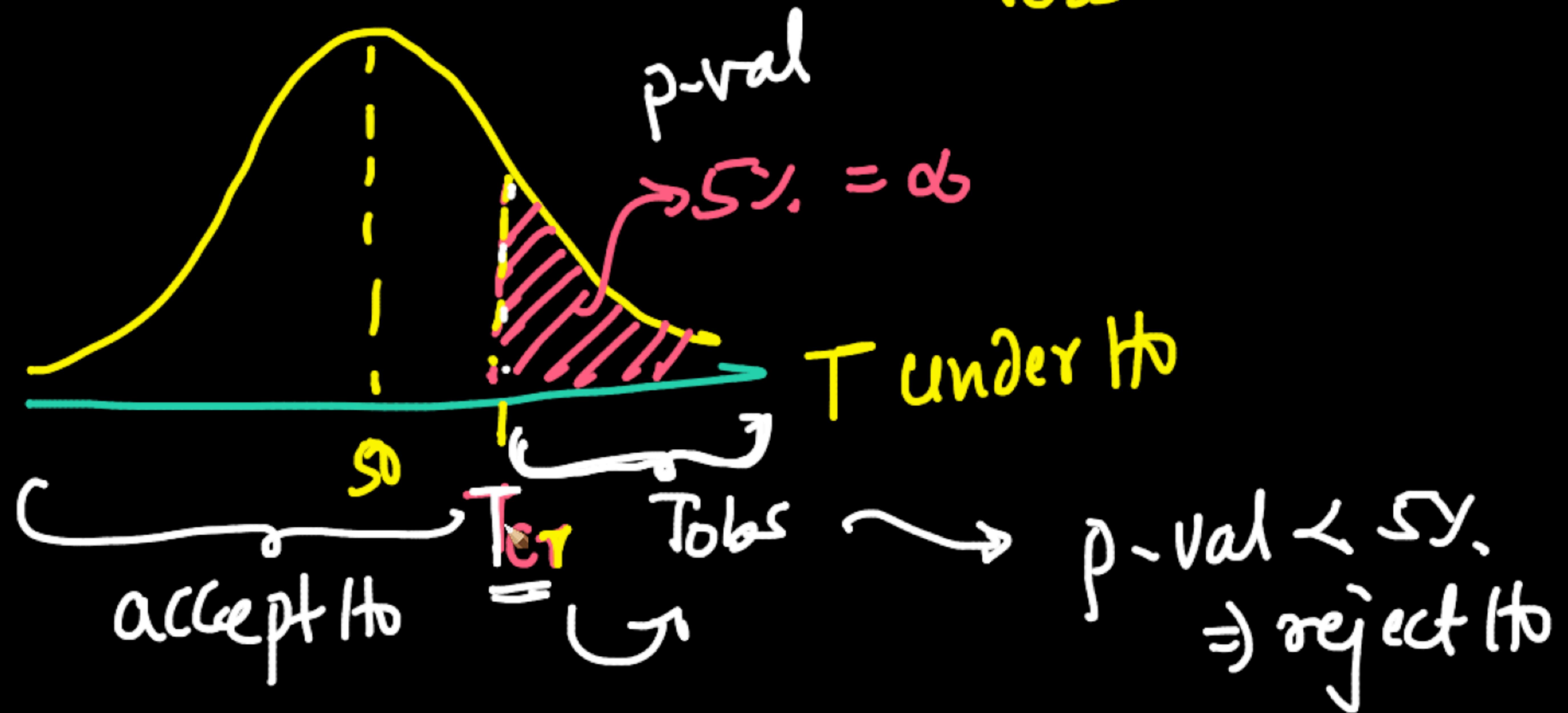
not Gilly

Gilly

critical-value

Terminology:

$$T_{obs} = 65$$





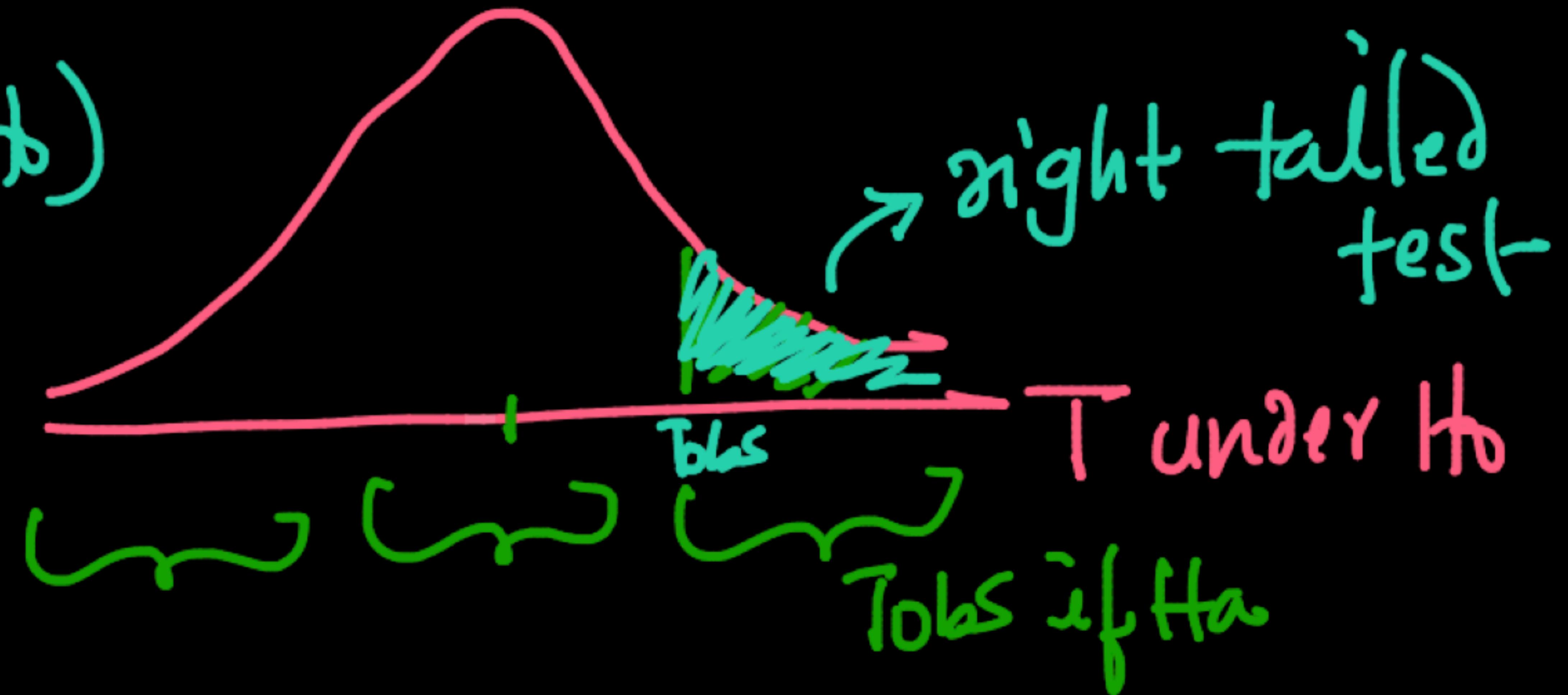
H_0 : coin is fair

Var 1:

[H_a : coin is biased]

Tobs

$$P(T > T_{\text{obs}} | H_0)$$



Var: 2

$\checkmark H_0: \text{Colin is fair}$

$H_a:$

Colin is biased

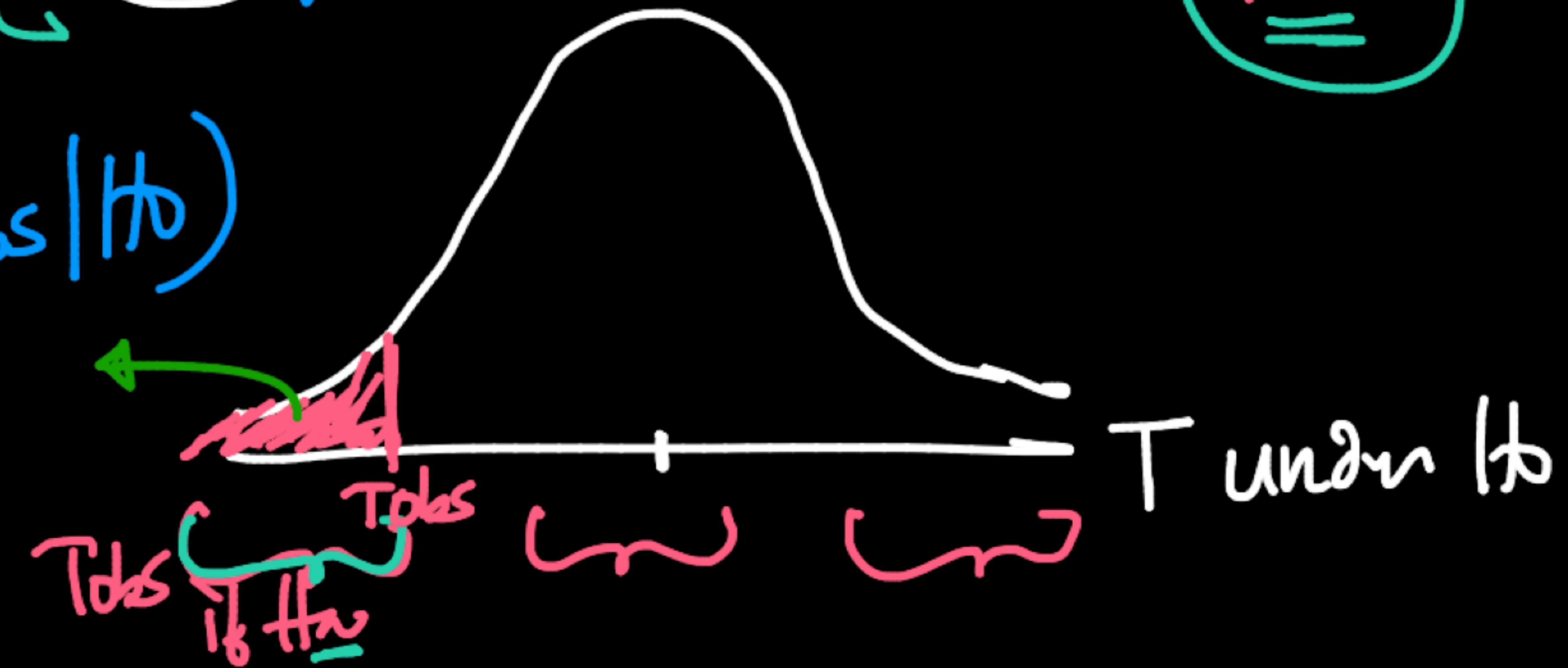
Expt: 100 tosses

T: #heads

T_{obs}

$$P(T \leq T_{\text{obs}} | H_0)$$

left-tailed test



P(observing T as extreme
or more than $| \bar{x}$)
Tols

Var 3:

H_0 : coin is fair

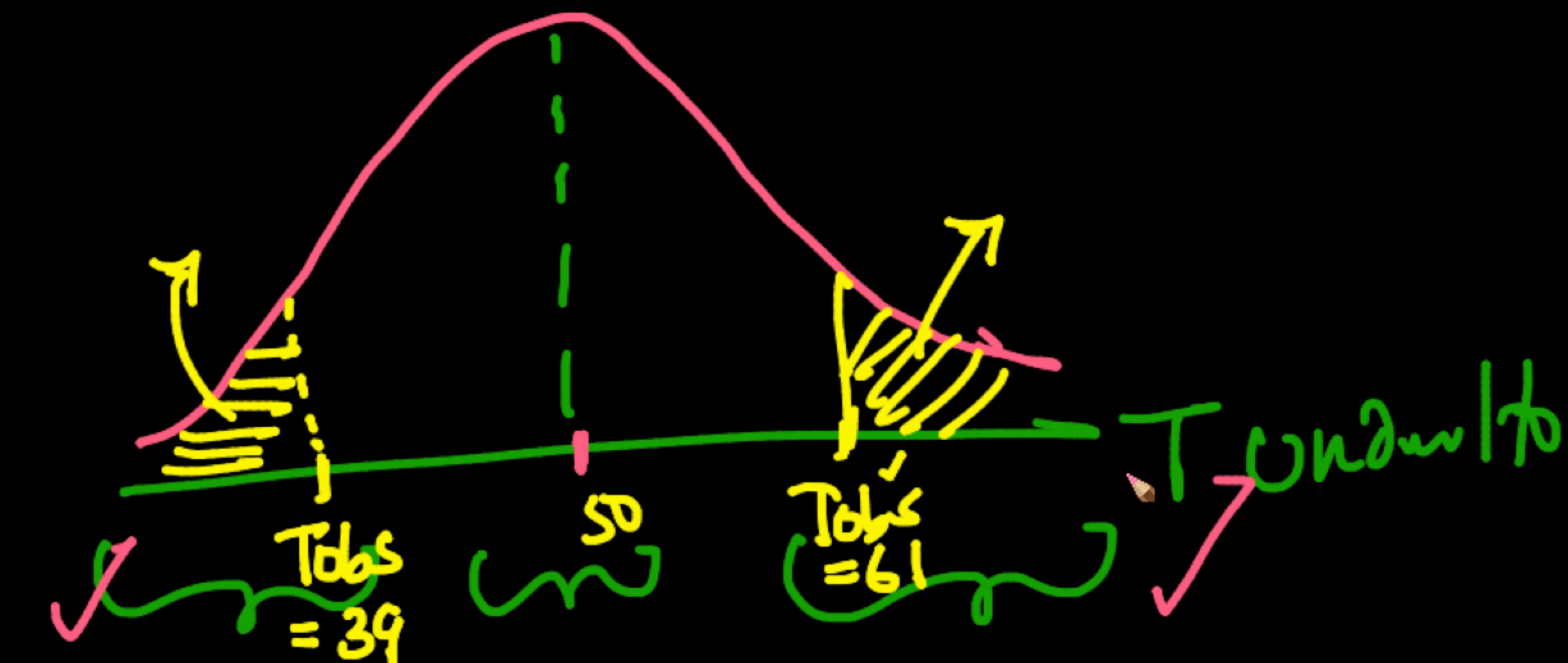
H_a : coin is biased

H

T

T_{obs}

2-sided test



$$P(\tau \leq 39 \text{ or } \tau > 61 | H)$$

Fair or unfair coin?

when H_0 is true

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

```
[5] import numpy as np  
import matplotlib.pyplot as plt  
from scipy import stats  
import seaborn as sns
```

```
# Expt: Toss the coin 100 times  
# Test statistic: Count the number of heads  
# H0: Coin is fair  
# Ha: Coin is biased towards heads  
# T ~ Binomial(n=100, p=0.5) under Null Hypothesis(=H0)  
  
prob = stats.binom.cdf(k=4, n=100, p=0.5)  
print(1-prob) # P(T >= 65 | H0 )
```

1.0



$H_0 \rightarrow H_0 \text{ is true}$



accepted H_0

p-val $> 5\%$

$$P(T > T_{obs} | Ha) \times$$

∞ -Many Cases

$$\left\{ \begin{array}{l} p = 0.51 \\ p = 0.50 \\ p = 0.49 \end{array} \right. ;$$

```
+ Code + Text
```

```
# Expt: Toss the coin 100 times
# Test statistic: Count the number of heads
# H0: Coin is fair
# Ha: Coin is biased towards heads
# T ~ Binomial(n=100, p=0.5) under Null Hypothesis(=H0)

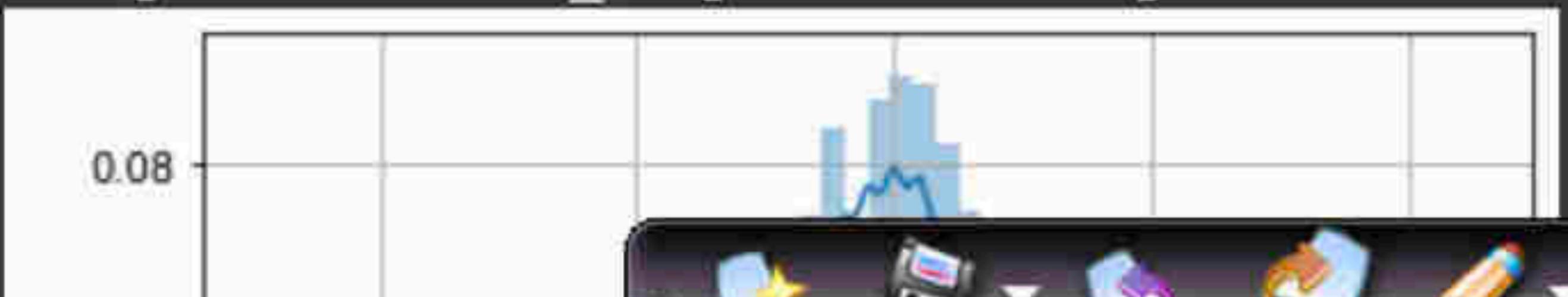
prob = stats.binom.cdf(k=651, n=1000, p=0.5)
print(1-prob) # P(T >= 651 | H0 )
```

651 H
1000 trials

$$\rightarrow P(T > 651 | H_0) \approx 0.0 \quad < 5\%$$

```
# Plot PDF of Binomial(100, 0.5)
X = stats.binom.rvs(n=100, p=0.5, size=100000)
plt.grid()
sns.distplot(X)
```

```
/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecate
warnings.warn(msg, FutureWarning)
<matplotlib.axes._subplots.AxesSubplot at 0x7fd257cb9110>
```



```
+ Code + Text
✓ # Expt: Toss the coin 100 times
# Test statistic: Count the number of heads
# H0: Coin is fair
# Ha: Coin is biased towards heads
# T ~ Binomial(n=100, p=0.5) under Null Hypothesis(=H0)

prob = stats.binom.cdf(k=651, n=1000, p=0.5)
print(1-prob) # P(T >= 651 | H0 )
```

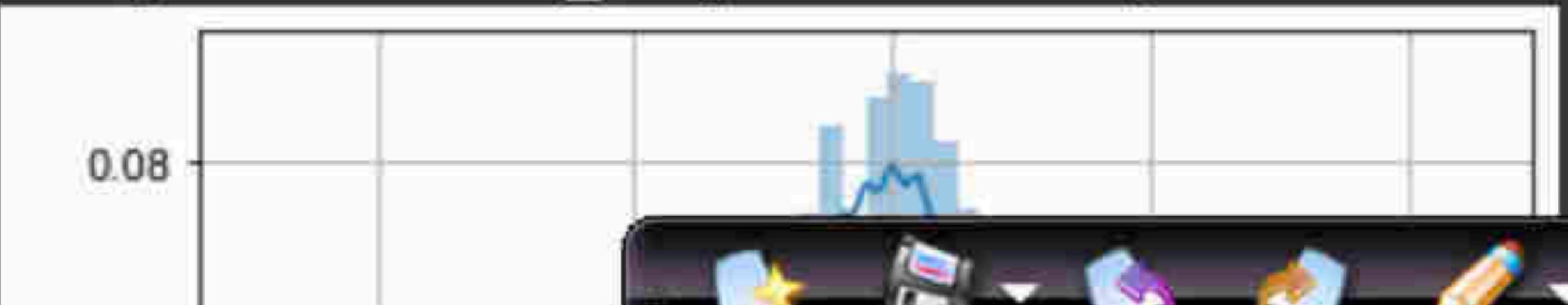
$$P(T > T_{obs} | H_0)$$

1.1102230246251565e-16

```
[3] # Plot PDF of Binomial(100, 0.5)
X = stats.binom.rvs(n=100, p=0.5, size=100000)
plt.grid()
sns.distplot(X)
```

distrib of T under H₀

```
/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecate
warnings.warn(msg, FutureWarning)
<matplotlib.axes._subplots.AxesSubplot at 0x7fd257cb9110>
```



+ Code + Text

Expt: Toss the coin 100 times
Test statistic: Count the number of heads
H0: Coin is fair
Ha: Coin is biased towards heads
$T \sim \text{Binomial}(n=100, p=0.5)$ under Null Hypothesis(=H0)

{x}

prob = stats.binom.cdf(k=651, n=1000, p=0.5)
print(1-prob) # $P(T \geq 651 \mid H_0)$

1.1102230246251565e-16

[3] # Plot PDF of Binomial(100, 0.5)
X = stats.binom.rvs(n=100, p=0.5, size=100000)
plt.grid()
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/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecate warning.
warnings.warn(msg, FutureWarning)
<matplotlib.axes._subplots.AxesSubplot at 0x7fd257cb9110>



+ Code + Text

Expt: Toss the coin 100 times
Test statistic: Count the number of heads
H0: Coin is fair
Ha: Coin is biased towards heads
$T \sim \text{Binomial}(n=100, p=0.5)$ under Null Hypothesis(=H0)

{x}

prob = stats.binom.cdf(k=651, n=1000, p=0.5)
print(1-prob) # $P(T \geq 651 \mid H_0)$

1.1102230246251565e-16

[3] # Plot PDF of Binomial(100, 0.5)
X = stats.binom.rvs(n=100, p=0.5, size=100000)
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/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecate warning.
warnings.warn(msg, FutureWarning)
<matplotlib.axes._subplots.AxesSubplot at 0x7fd257cb9110>



+ Code + Text

Expt: Toss the coin 100 times
Test statistic: Count the number of heads
H0: Coin is fair
Ha: Coin is biased towards heads
$T \sim \text{Binomial}(n=100, p=0.5)$ under Null Hypothesis(=H0)

{x}

prob = stats.binom.cdf(k=651, n=1000, p=0.5)
print(1-prob) # $P(T \geq 651 \mid H_0)$

1.1102230246251565e-16

[3] # Plot PDF of Binomial(100, 0.5)
X = stats.binom.rvs(n=100, p=0.5, size=100000)
plt.grid()
sns.distplot(X)

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecate warning.
warnings.warn(msg, FutureWarning)
<matplotlib.axes._subplots.AxesSubplot at 0x7fd257cb9110>



+ Code + Text

[5]

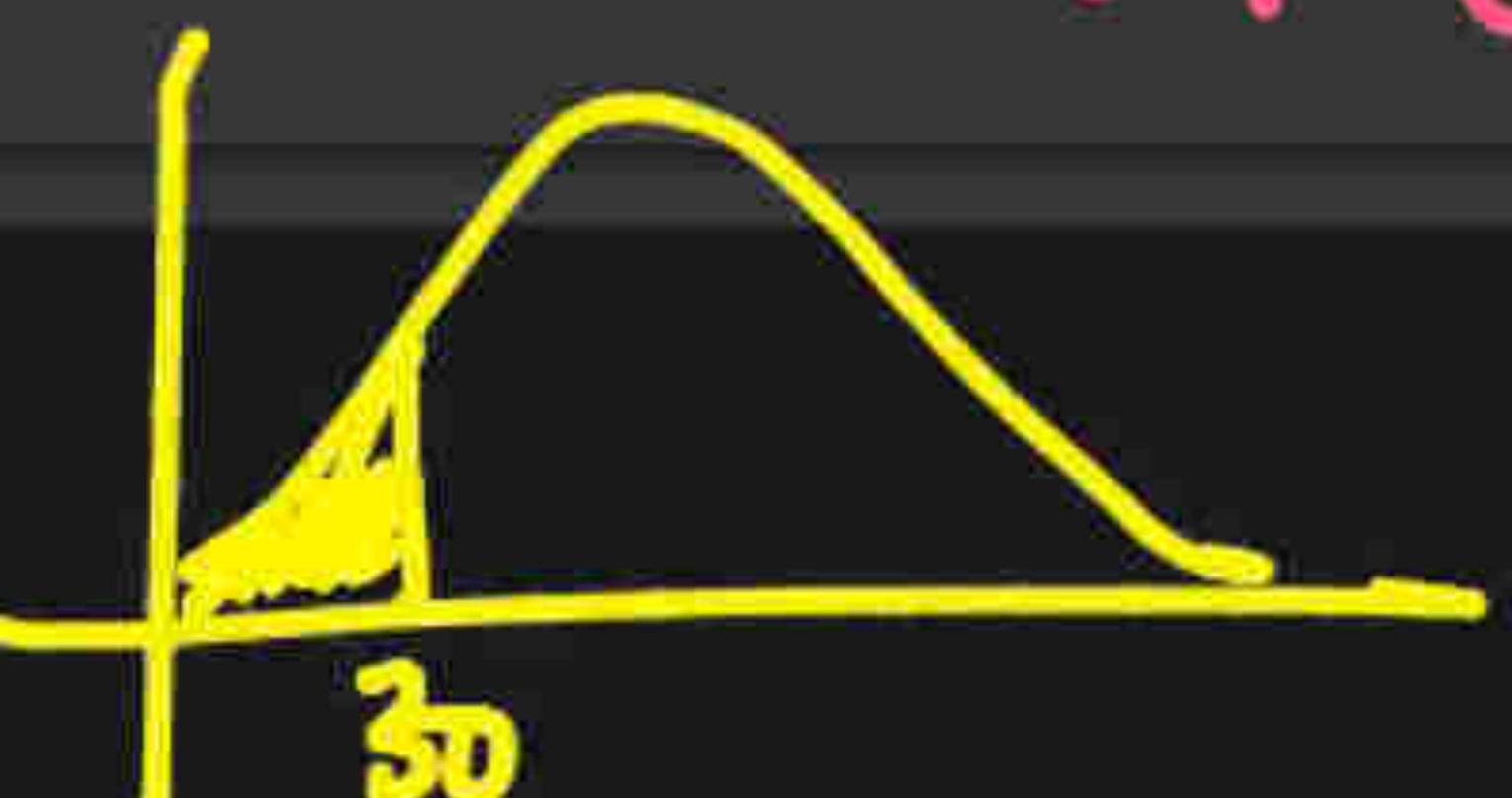
```
# Expt: Toss the coin 100 times
# Test statistic: Count the number of heads
# H0: Coin is fair
# Ha: Coin is biased towards tails
# T ~ Binomial(n=100, p=0.5) under Null Hypothesis(=H0)
```

```
prob = stats.binom.cdf(k=30, n=100, p=0.5)
print(prob) # P(T >= 65 | H0 )
```

3.925069822796833e-05

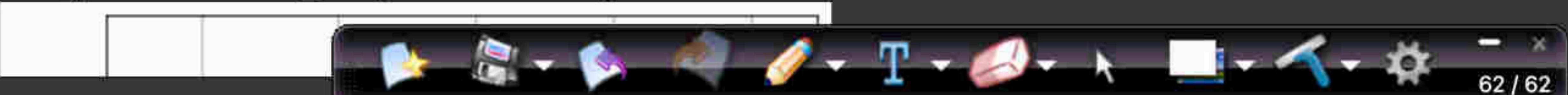
$$= 3.9 \times 10^{-5} \leq 5\%$$

$$\begin{aligned} P(T \leq 30 | H_0) \\ = CDF(T, 30) \end{aligned}$$

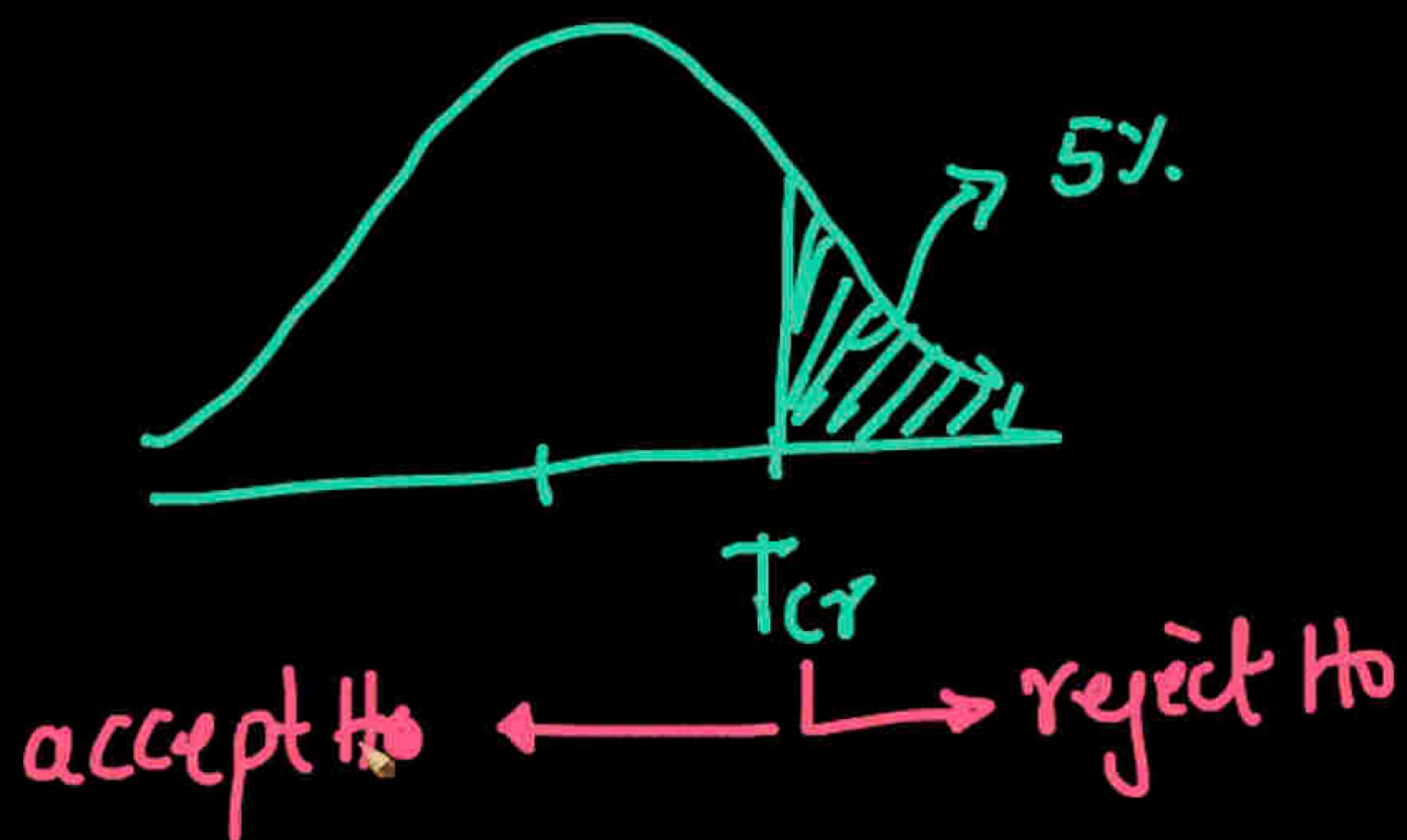


```
# Plot PDF of Binomial(100, 0.5)
x = stats.binom.rvs(n=100, p=0.5, size=100000)
plt.grid()
sns.distplot(x)
```

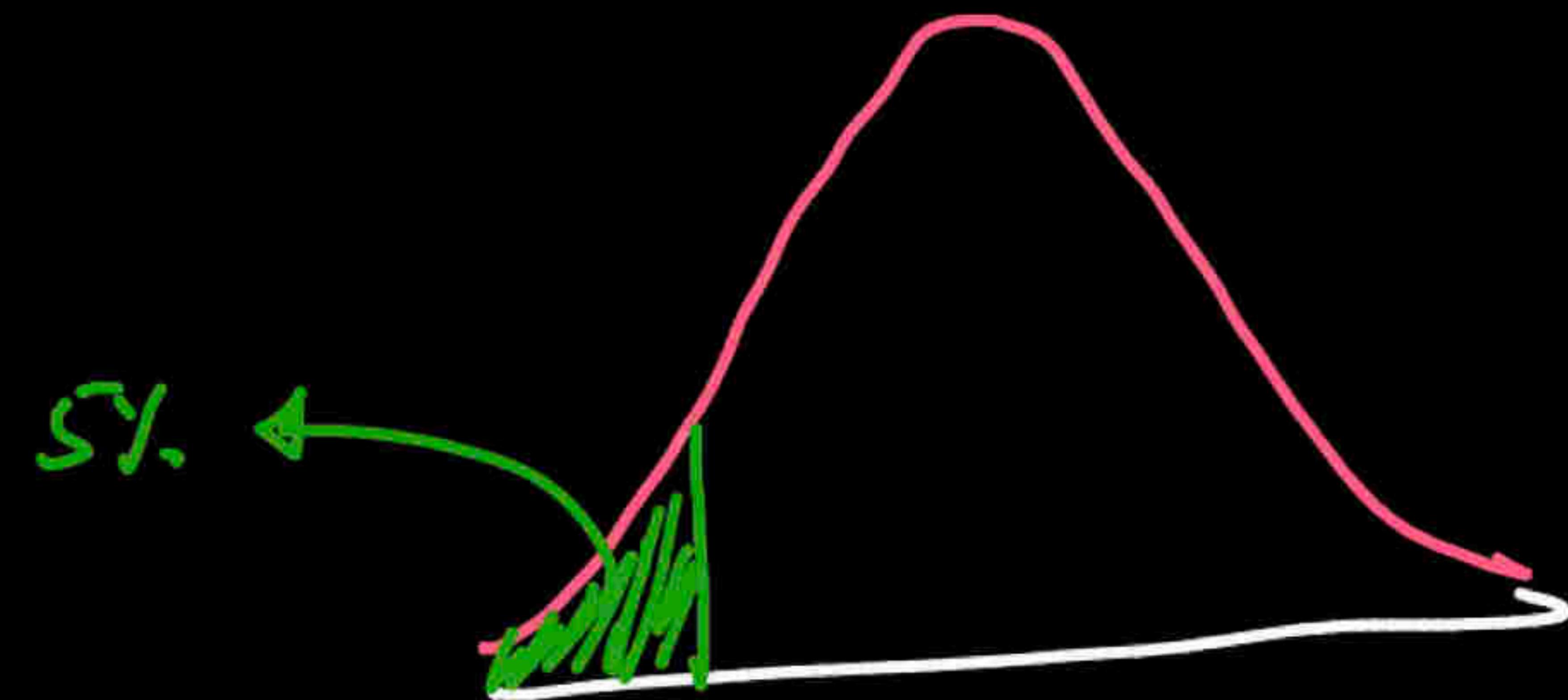
```
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<matplotlib.axes._subplots.AxesSubplot at 0x7fd257cb9110>
```



Critical-Val: T_{CR}



T_{cr}



T_{cr}

reject H_0 \rightarrow accept H_0

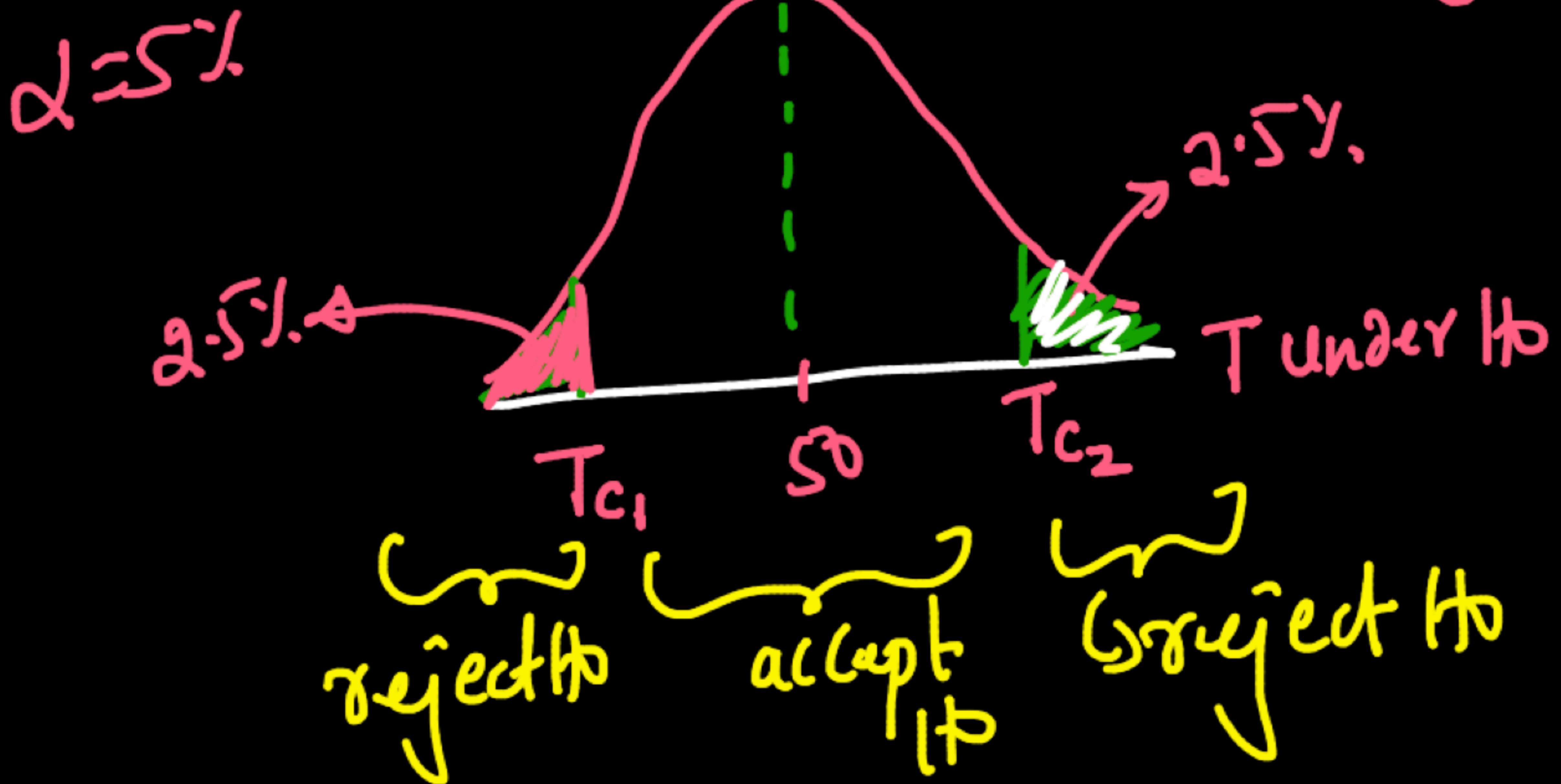
H_0 : coin is fair

H_1 : coin is biased

$T = \# \text{heads}$

T_{cγ} fw 2-tailed

H₀: coin is fair
H_a: coin is unfair
~~Symm. Curve~~



Framework of hyp. testing

- ① Define H_0, H_a carefully based on what you want
- ② Define ~~exp~~ & "sensible" Test statistic
✓ [dist of \bar{T} under H_0]

(3)

One-sided (R or L) or 2-tailed
test



T, H₀, H_a

(4)

P(T is as extreme | H₀) = p-val

③ fix $\alpha = 5\%$ $\rightarrow \text{default}$
some cases
by. or 0.1%
(later)

④ Compare p-val vs α

p-val < α

p-val > α

\downarrow
reject $H_0(\text{if})$ cannot reject H_0
 \downarrow
accept H_0
 \downarrow
accept H_0

Same-framework

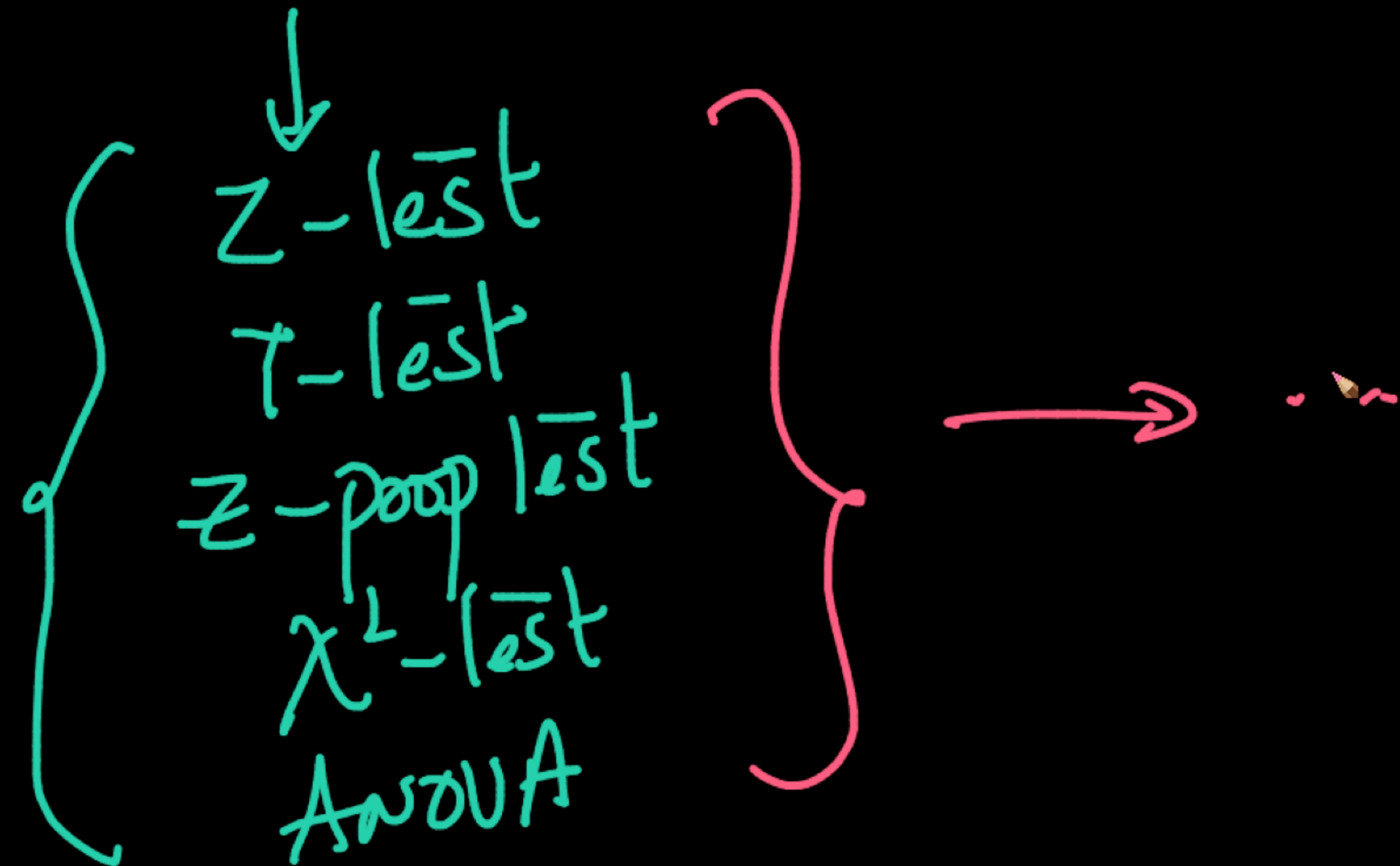
z-test

t-test

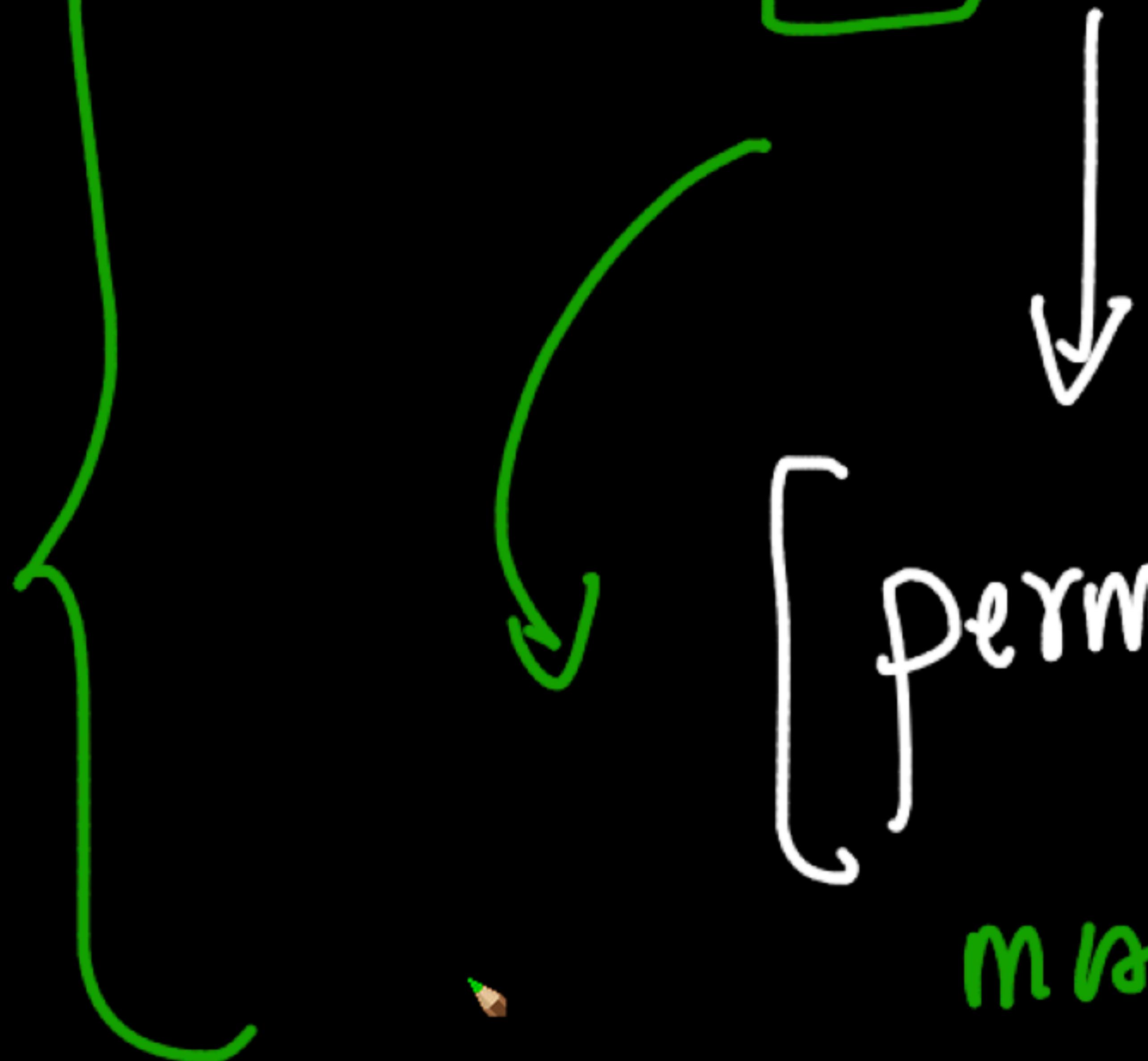
z-proportion test

χ^2 -test

Anova



What if T under Ho doesn't follow any distb



permutation -resampling test

more advanced

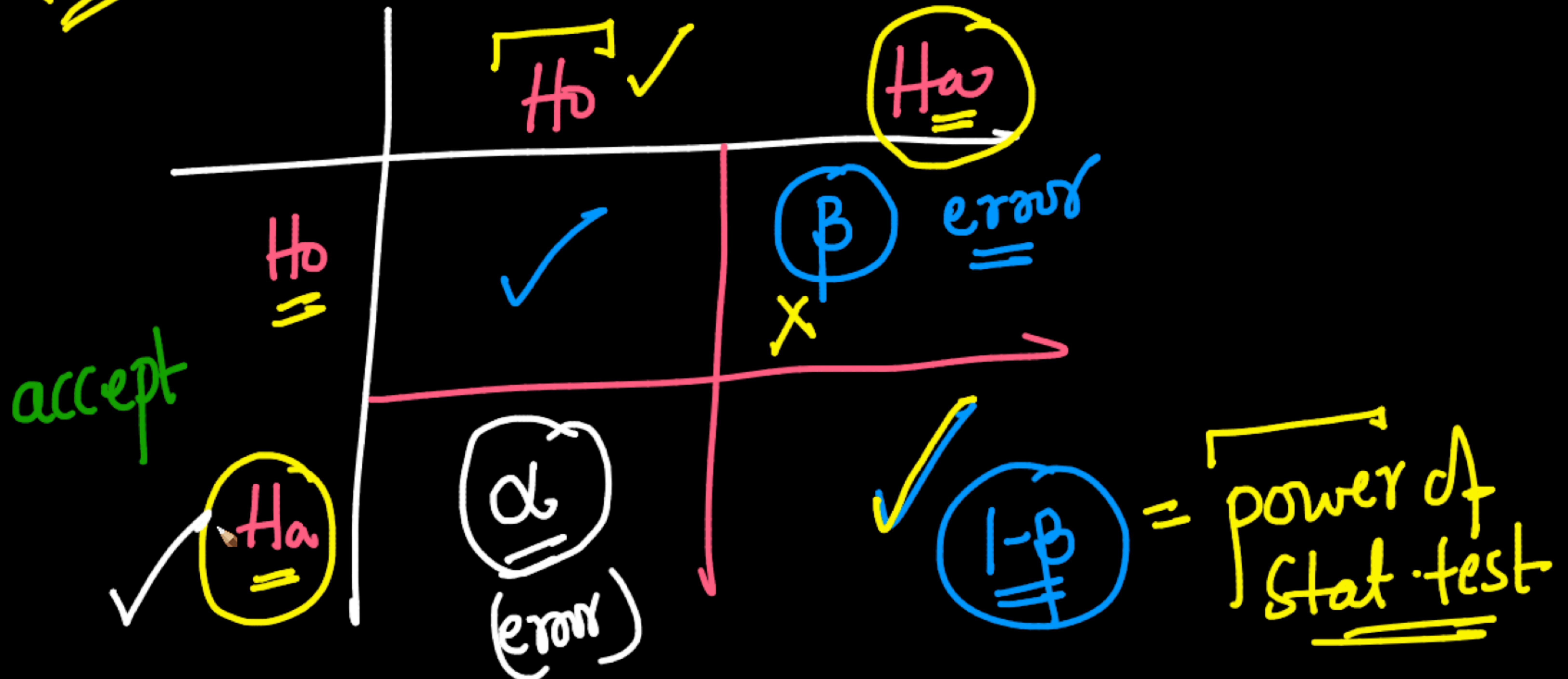
bootstrapping
like

✓ $P(\tau > T_{obs} | H_0)$ and

✓ $P(\tau > T_{obs} | H_a)$

~~CONFUSION
MATRIX~~

→ HYP-test w/ actual ✓
Errors



$$P(T > T_{\text{obs}} | H_0) \leftarrow \alpha = 5\%$$

{ 4.999999%

reject H_0
incorrectly

↓
reject H_0

$\alpha = \boxed{\text{prob of rejecting } H_0 \text{ incorrectly}}$

Medicine:



M_1
(placebo)
 $\alpha = \boxed{S.Y. (\text{let})}$

M_2
(Remedied)

post of couch Ha is true when Ho is act
Ho: both Medicines are Same

Ha: both Medicines are different

$\alpha = \text{post of incorrectly sig } \underline{\text{Ho}}$

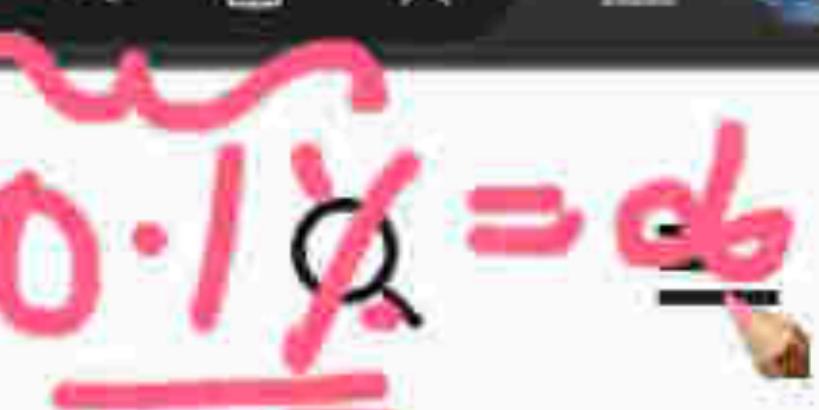
$\alpha = 1\%$ or 0.1%



Article Figures/Media**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

$p < 0.001 = 0.1\%$ 

CareerCenter**PHYSICIAN JOBS**

JULY 13, 2022

Surgery, Trauma

Greeley, Colorado

TRAUMA SURGEON: EXCEPTIONAL COLORADO LIFESTYLE!**Infectious**

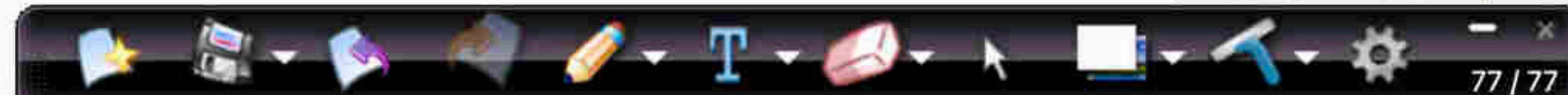
Cambridge, Massachusetts

Disease**Infectious Disease Moonlighter****Pediatrics, General**

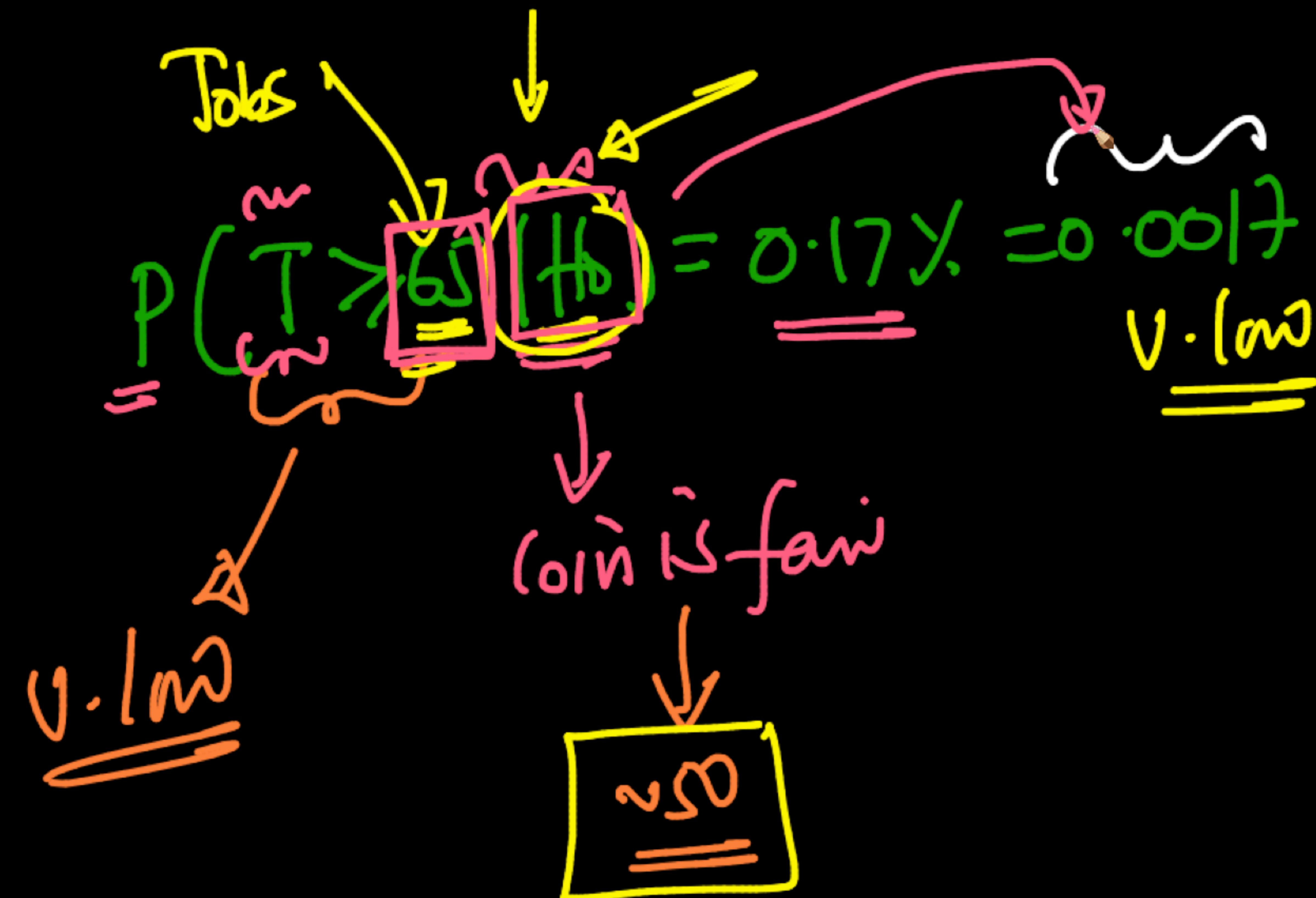
Indianapolis, Indiana

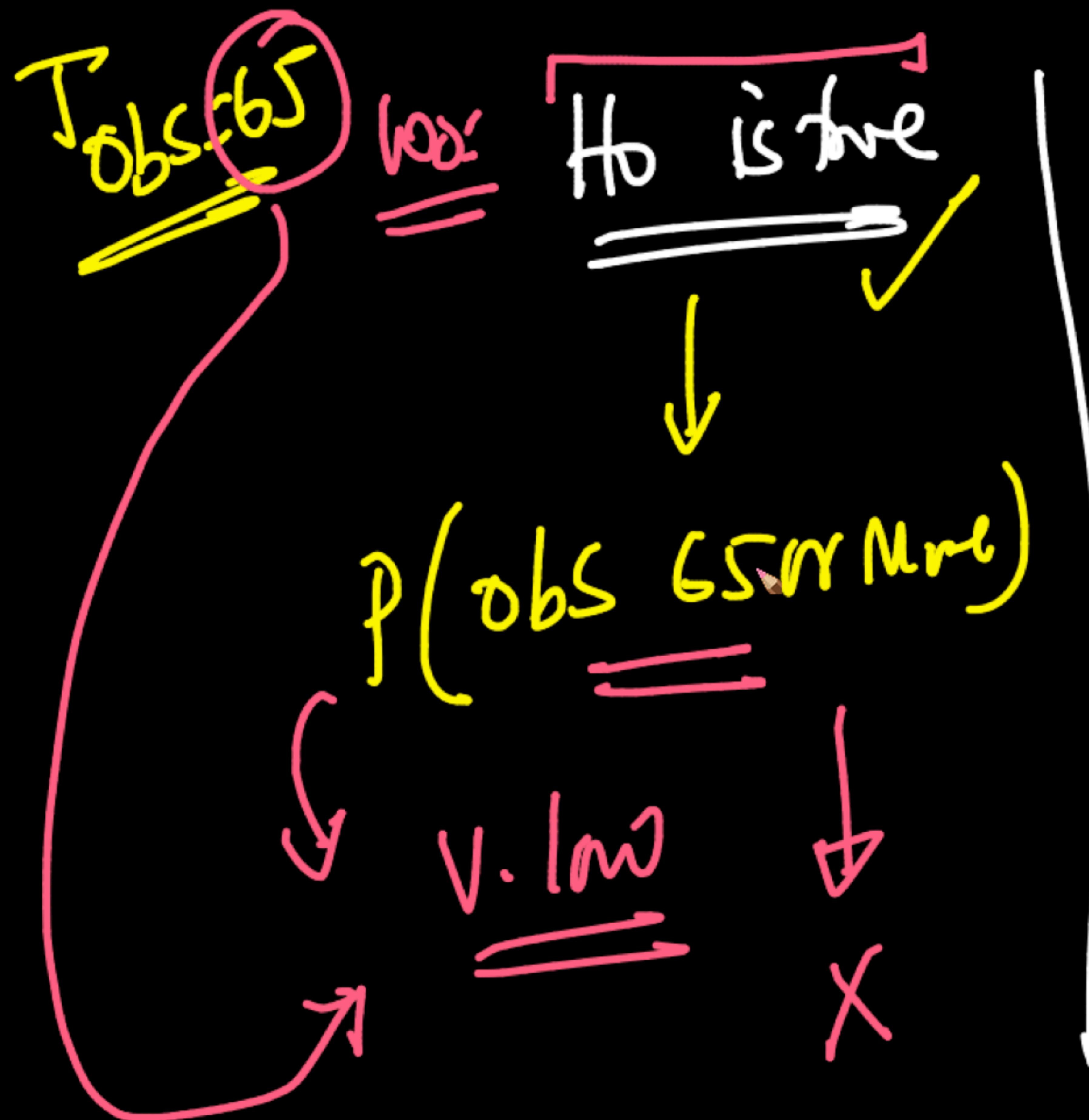
Pediatric Rehabilitation Medicine Physician (Riley Hospital)**Dermatology**

Boston, Massachusetts

Medical Dermatologist - Tufts Medical Center - Boston, MA

d → path of incorr reg H
high cost ⇒ lower d



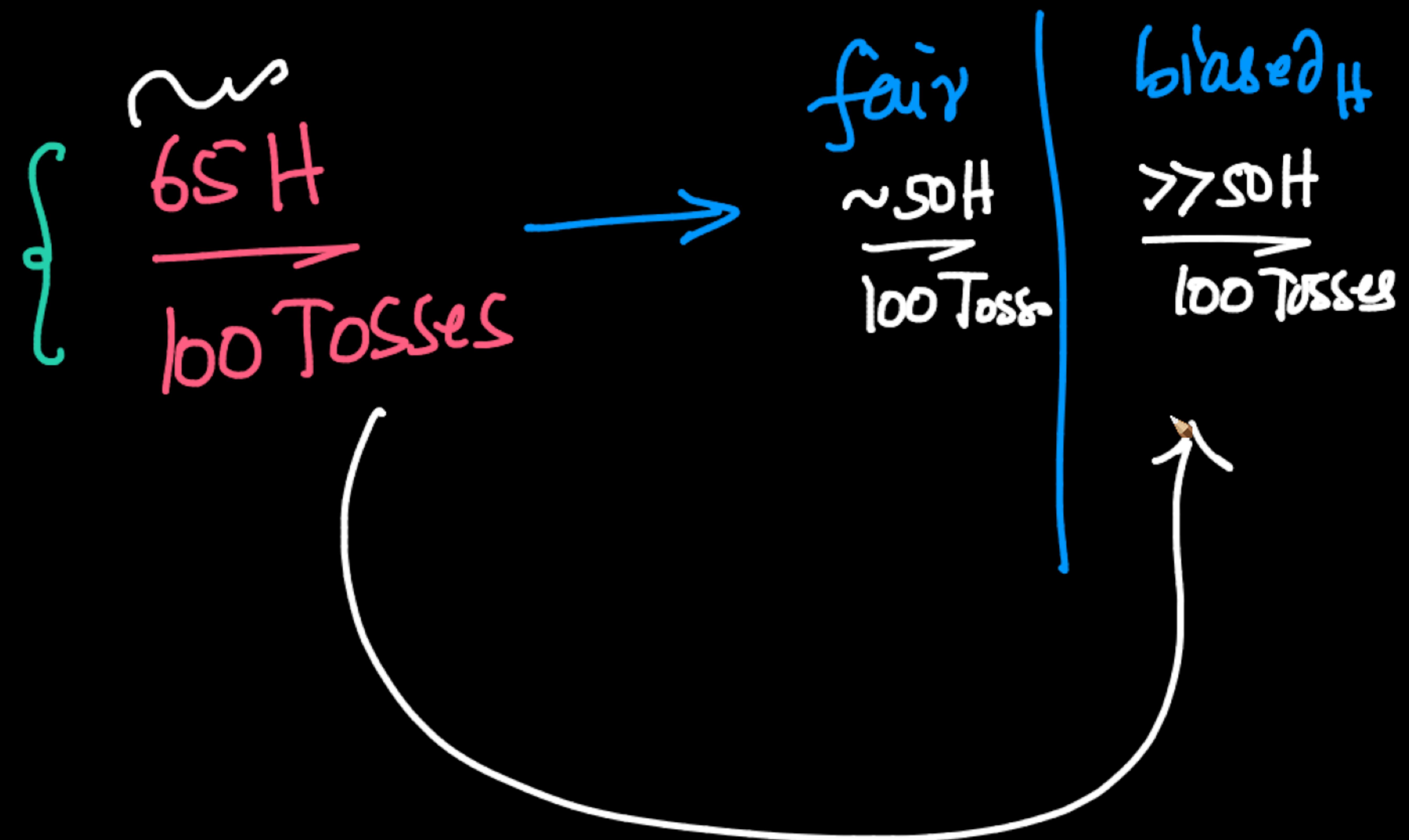


H_a is true ✓

$P(obs. 65 \text{ or } \text{more})$

\equiv X

A yellow checkmark is placed next to the word "true". A yellow arrow points from the equivalence symbol in $P(obs. 65 \text{ or } \text{more})$ up to the equivalence symbol in "X". A yellow checkmark is placed next to the "X" symbol.



(in-loss)

$P(T > 65) | H_0) = 0.1\% > \alpha$

$\alpha \downarrow$

do not want

incorrect H_0

$$\alpha = 0.1\%$$



reject H_0

accept H_0

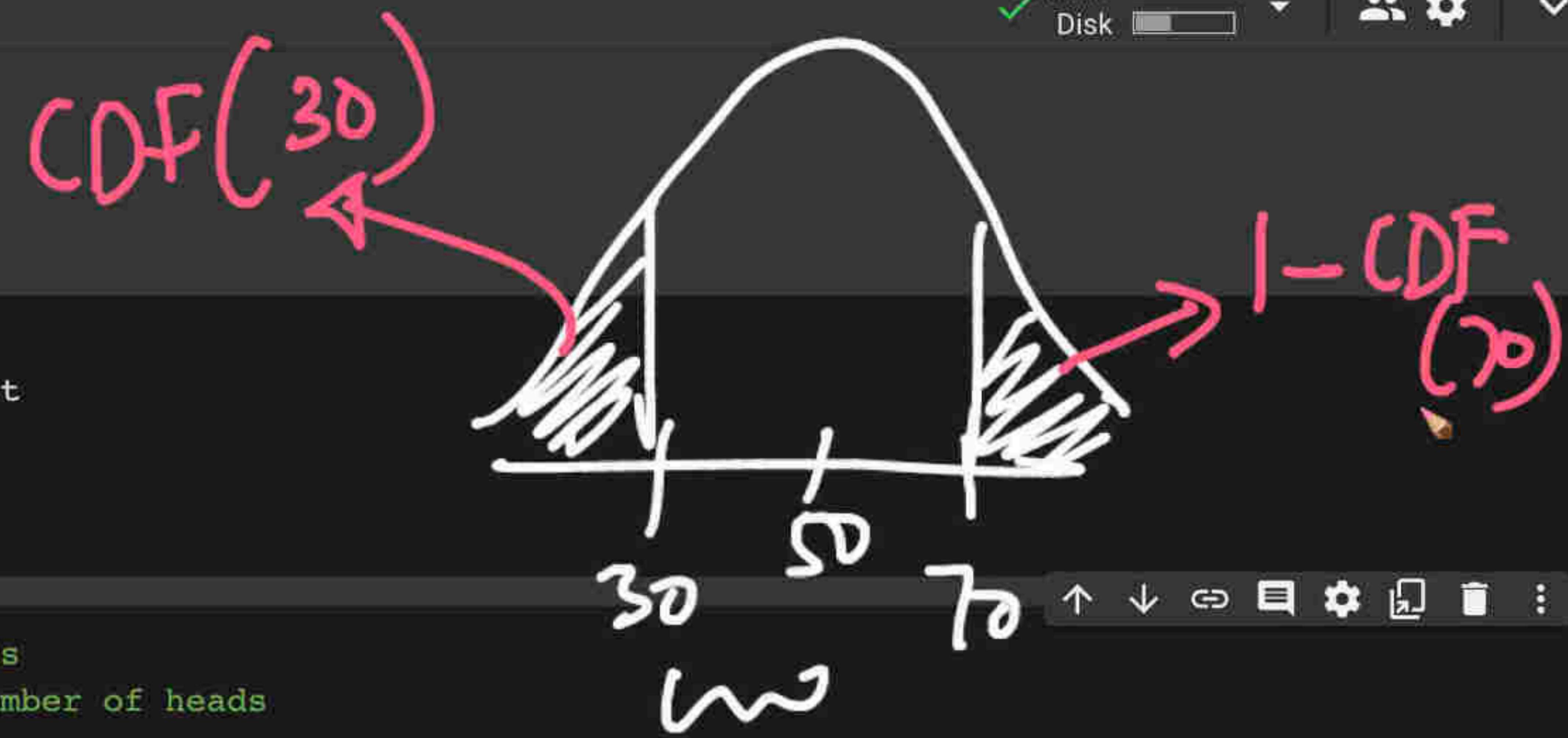
$\left\{ \begin{array}{l} z\text{-test : } \text{Test-st. } \sim Z(0,1) \\ t\text{-test } \rightarrow " \sim t\text{-dist}(\nu) \\ \chi^2\text{-test } \rightarrow " \sim \chi^2\text{-dist} \\ \text{ANOVA } \rightarrow " \sim F\text{-dist} \end{array} \right.$

▼ Fair or unfair coins

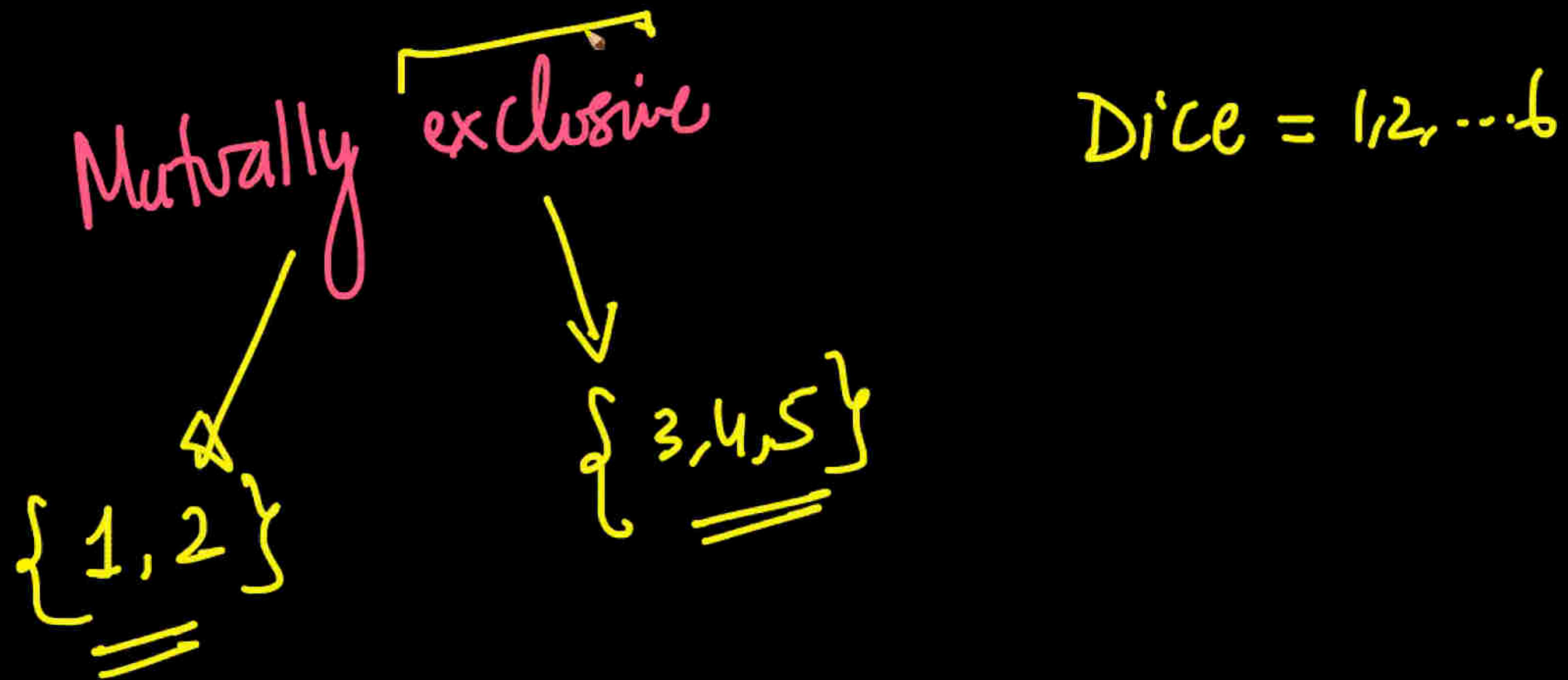
```
[5] import numpy as np
     import matplotlib.pyplot as plt
     from scipy import stats
     import seaborn as sns
```

```
# Expt: Toss the coin 100 times
# Test statistic: Count the number of heads
# H0: Coin is fair
# Ha: Coin is unfair
# T ~ Binomial(n=100, p=0.5) under Null Hypothesis(=H0)

prob = stats.binom.cdf(k=30, n=100, p=0.5)
print(prob) # P( T<=30 or T>=70 | H0 )
```



3.925069822796833e-0



$$E_1 = \{1, 2, 3\}$$

$$E_2 = \{2, 4, 6\}$$

$$E_1 \cap E_2$$

$$E_1 \cap E_2 = \emptyset$$

no common outcomes



Mutually exclusive

mutually

exhaustive ✓

U
 $E_1 \cup E_2 = \text{all}$
possibilities



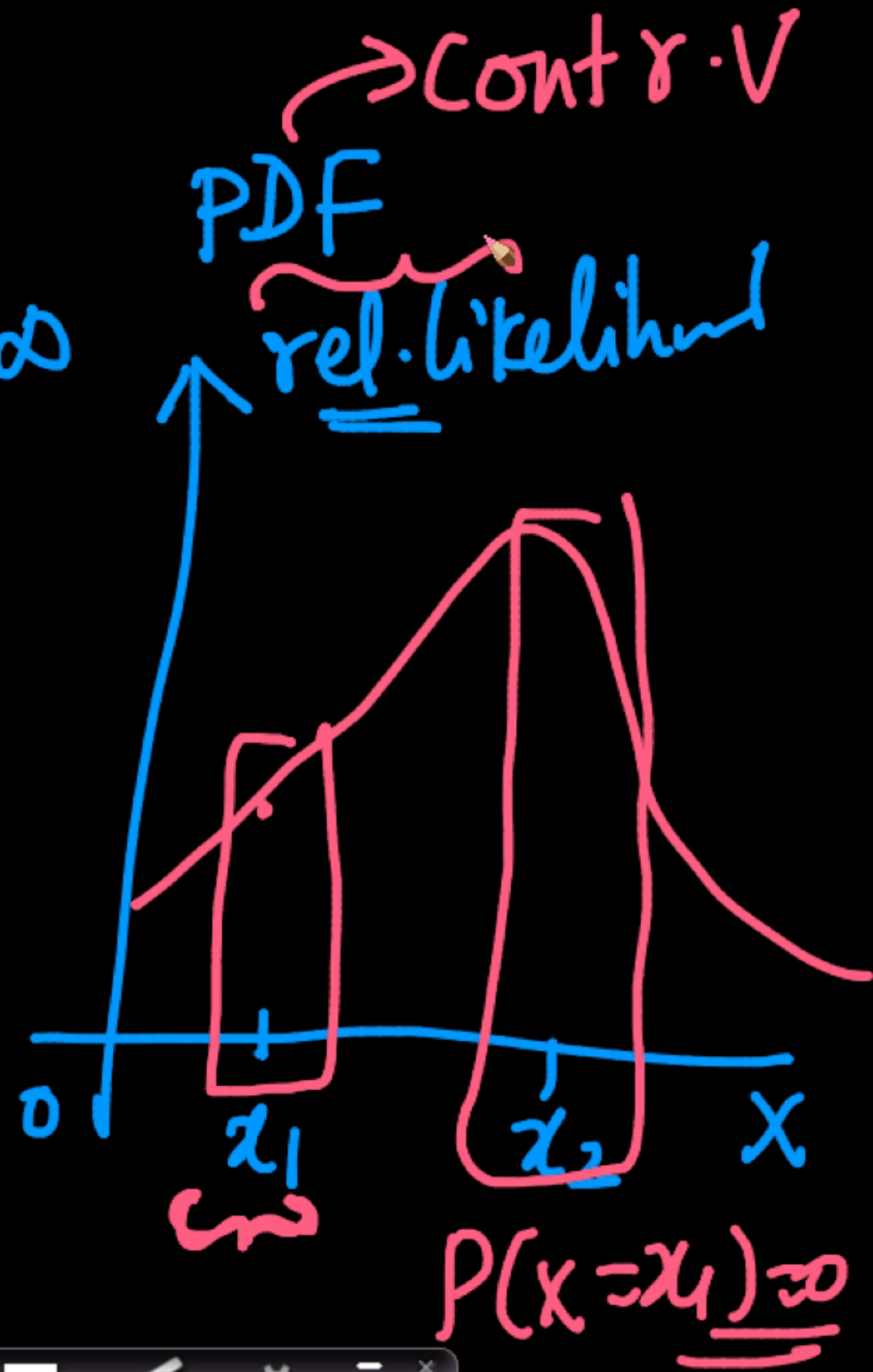
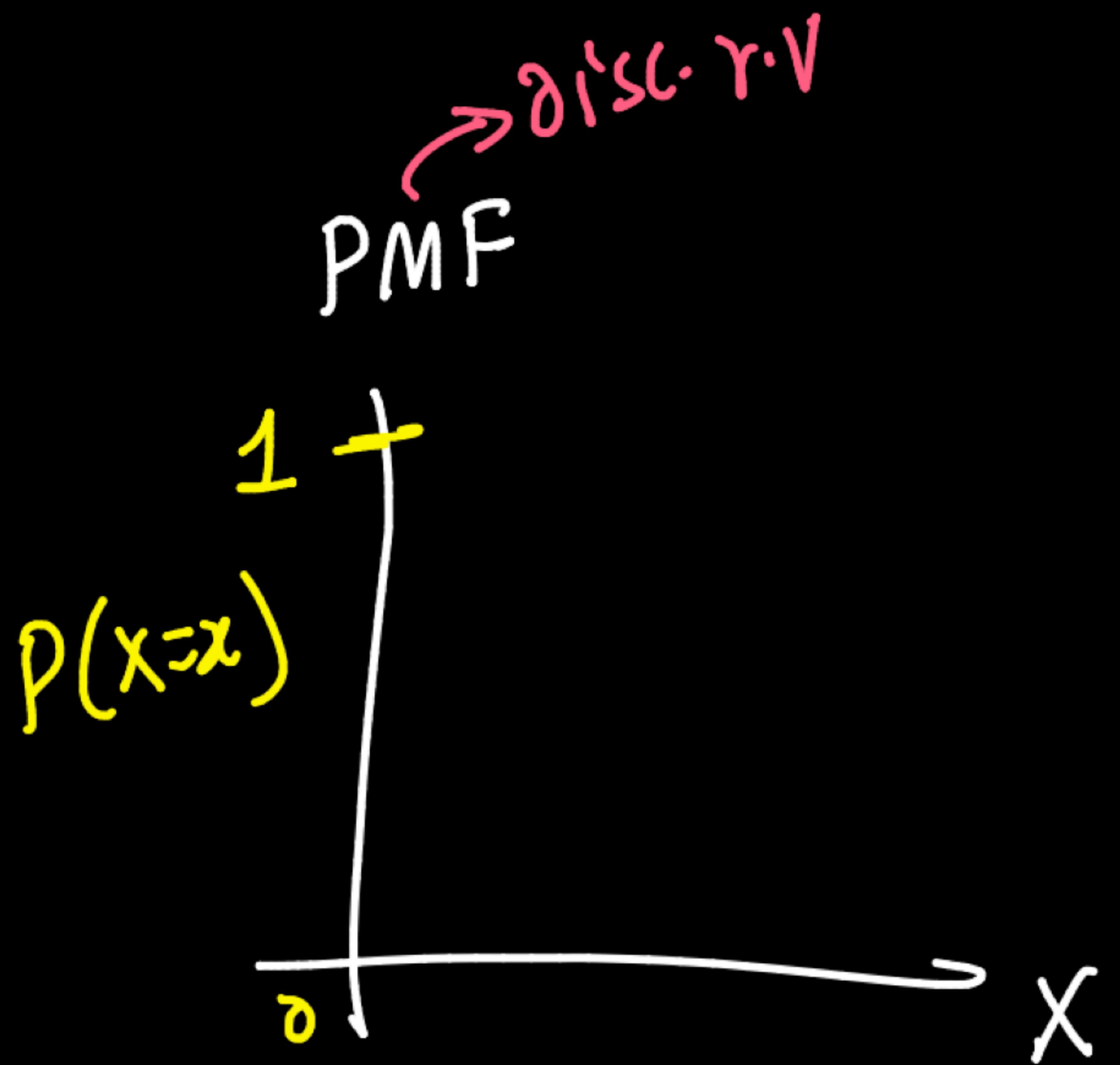
$$E_1 = \{2, 4, 6\}$$

$$E_2 = \{1, 3, 5\}$$

mutually
excl
=

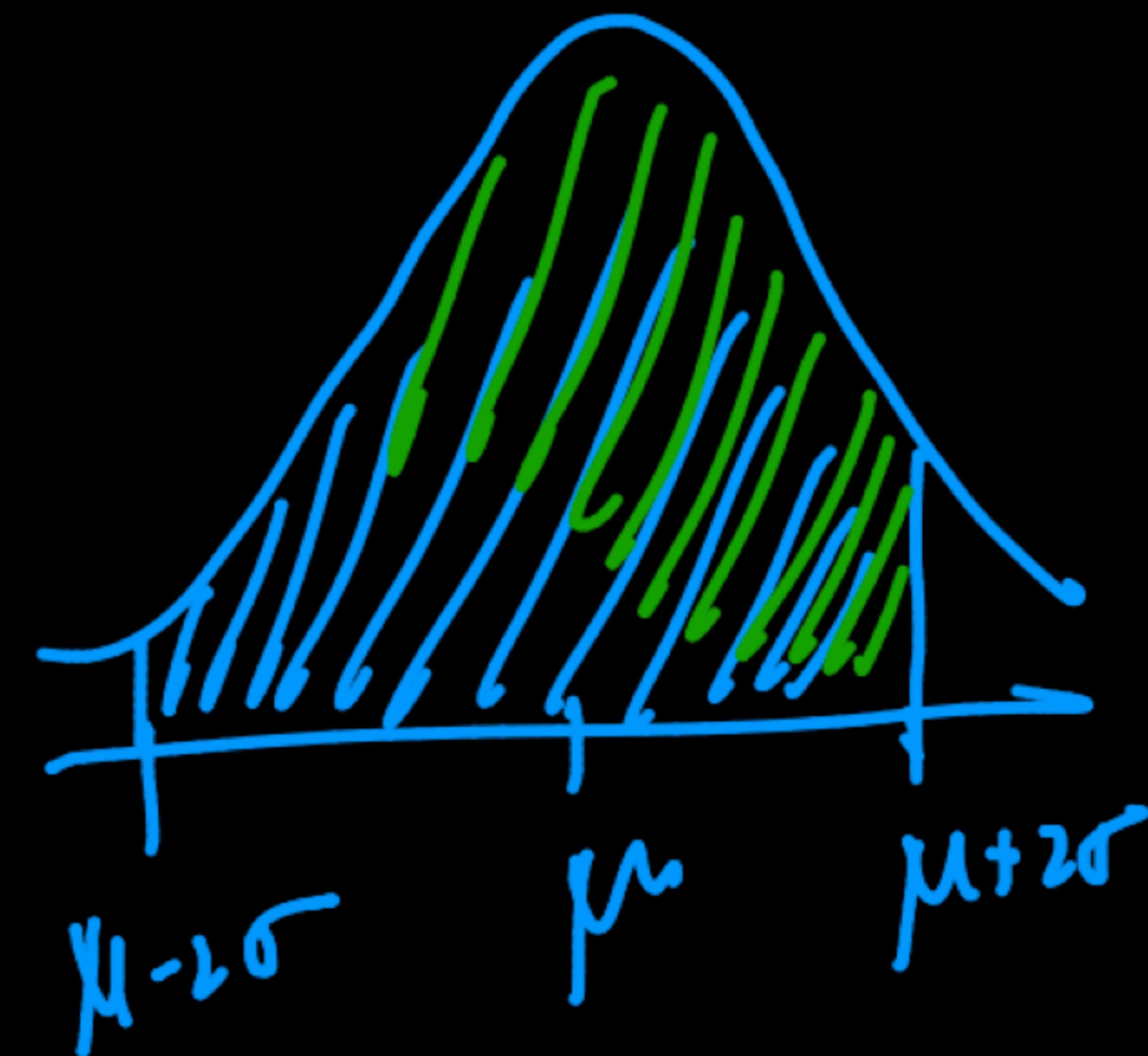
prob \approx likelihood'

0 - 1



$$X \sim N(\mu, \sigma)$$
$$\int_{\mu - 1.96\sigma}^{\mu + 1.96\sigma} p(x) dx = 0.95$$

pdf



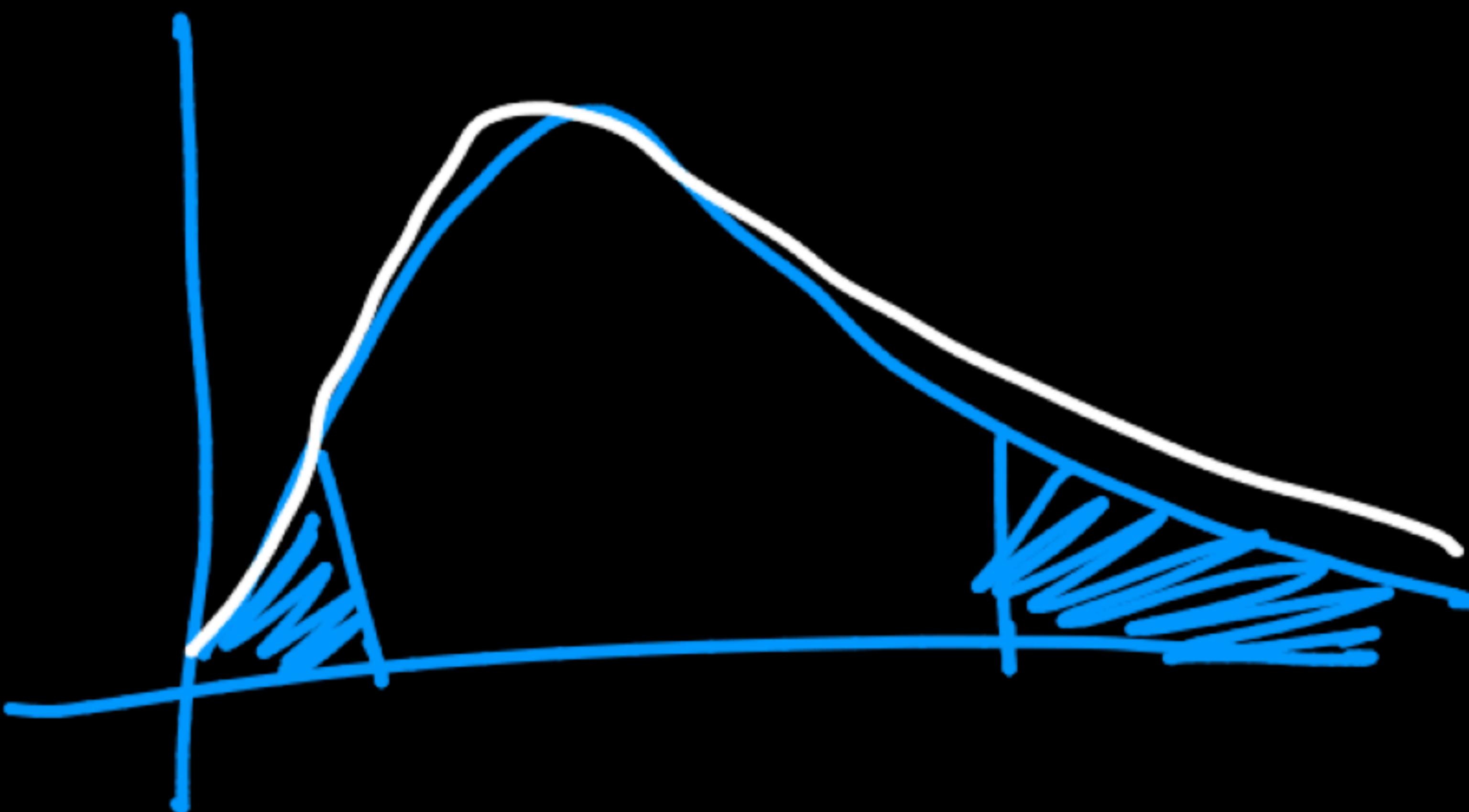
2-tailed

p-val

vs $\alpha = 5\%$

α

[area under
both tails]



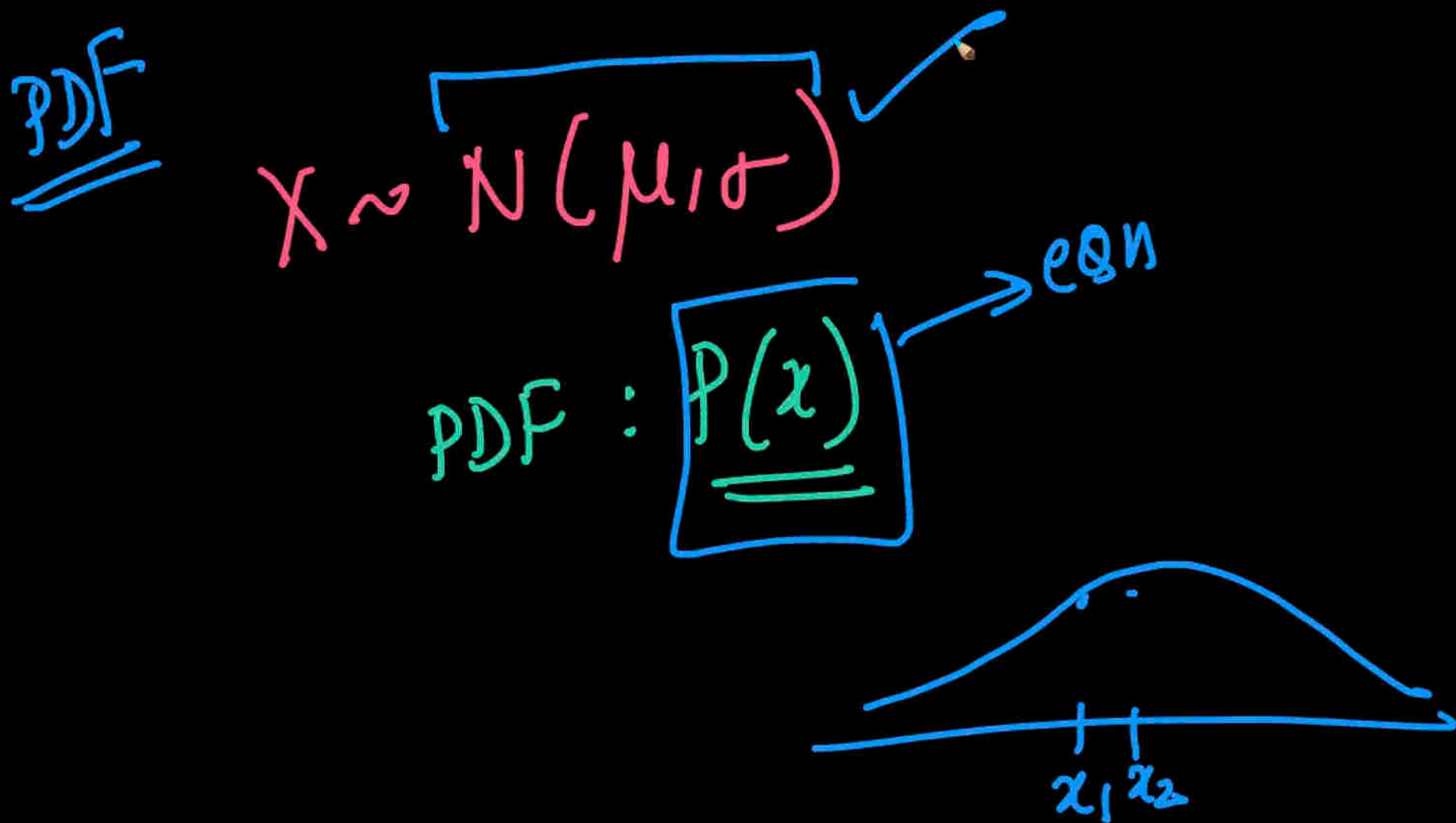
$$\alpha = 0.1.$$

✓ [Ho: bolt med are save
Ha: ls "

==== ✓

$\alpha = 0.1\%$

=====

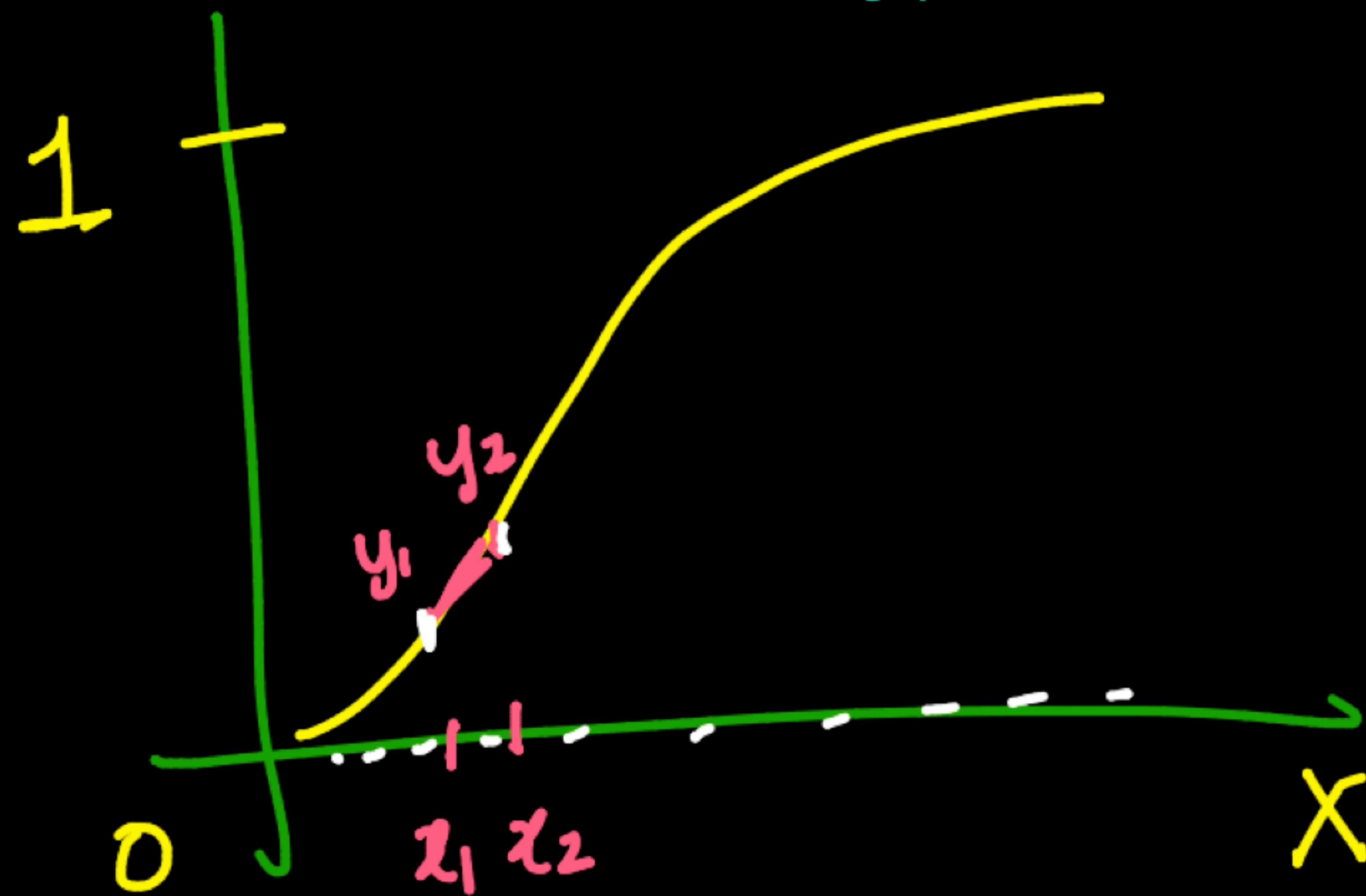


Datásek: $x_1 \dots x_n$

↓

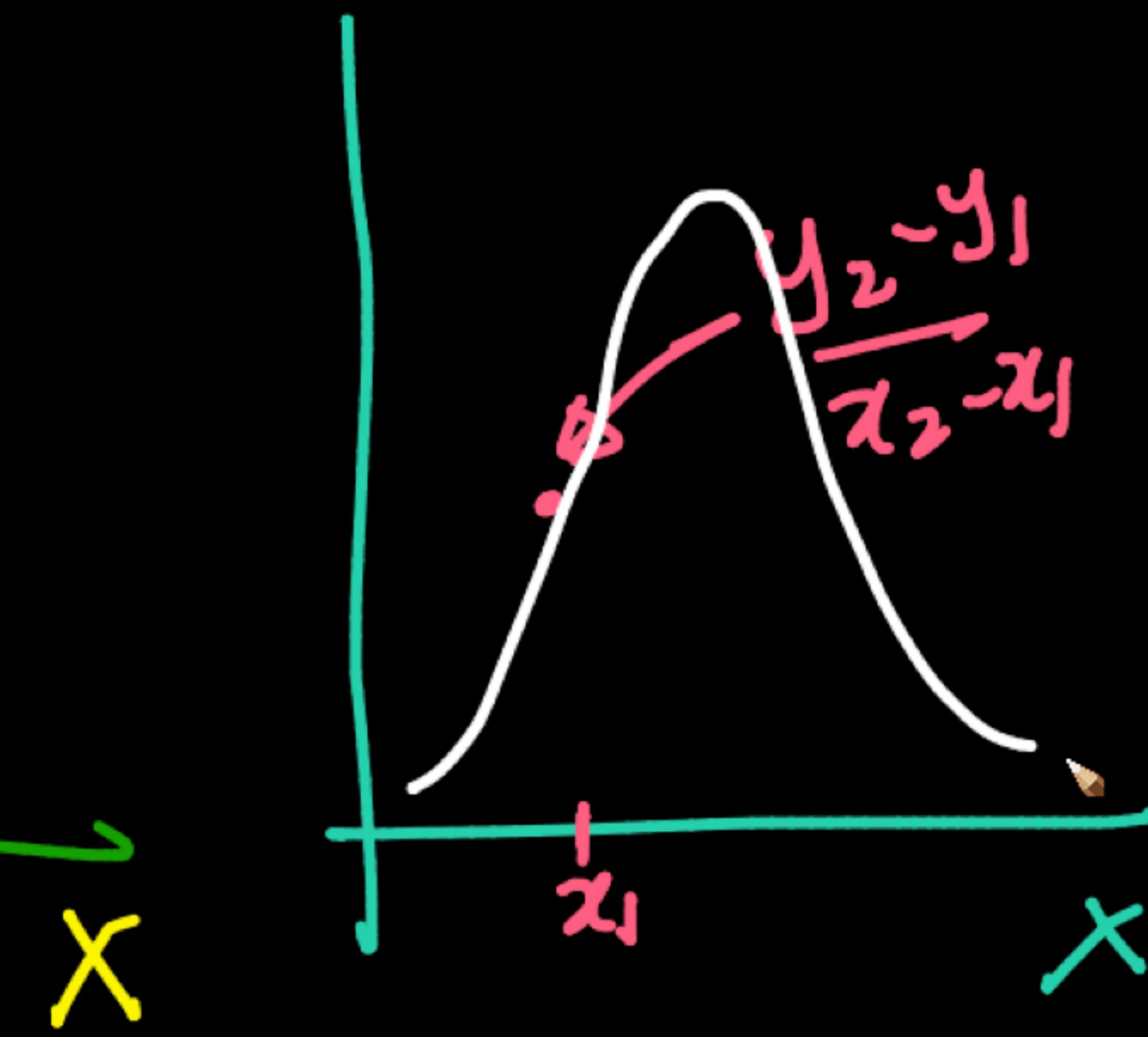
CDF

CDF



y_1
 y_2
 x_1 x_2
 v_{small}

PDF



Simplified

