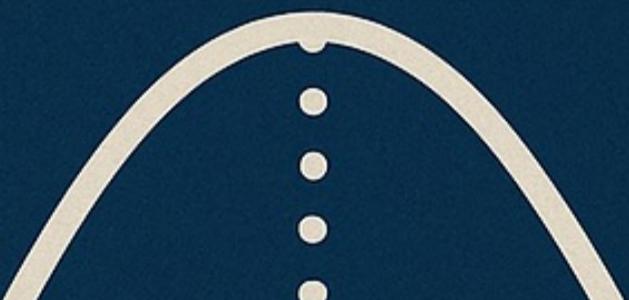


DAV-3

HYPOTHESIS TESTING

(Class starts
@ 9:08 PM)



Lecture 1: Introduction to Hypothesis Testing

Agenda

- ① Module Overview ✓
- ② Problem Statement ✓
- ③ Hypothesis Testing ✓
- ④ Null & Alternate Hypothesis ✓
- ⑤ P-value ✓
- ⑥ Significance Level ✓
- ⑦ Types of Error ✓
- ⑧ Tailed Test ✓
- ⑨ HT Framework ✓

Class starts at 9:10 AM

70% of this module deals with hypothesis testing

30% deals with feature engineering

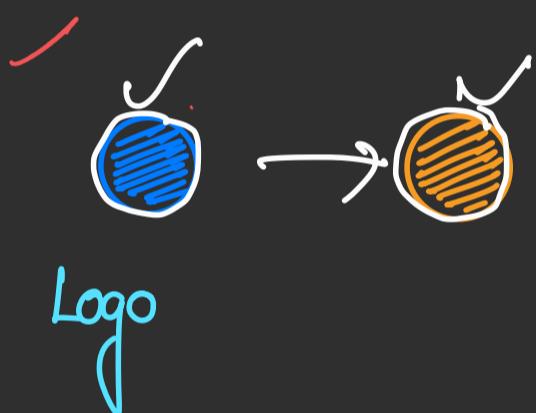
ML point of view

Module Overview

Real World Problem → How HT is used to solve those problems?

For Example,

Website }



Logo

I want to change logo from blue
to orange

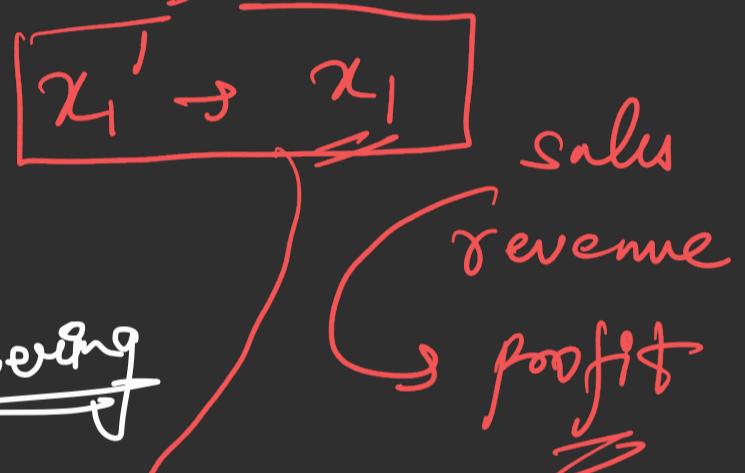
② Power of EDA

↳ Feature Engg

$$\begin{aligned}x_1 &\rightarrow x'_1 \quad [\text{derived column}] \\x_2 &\rightarrow x'_2 \\x_3 &\rightarrow x'_3\end{aligned}$$

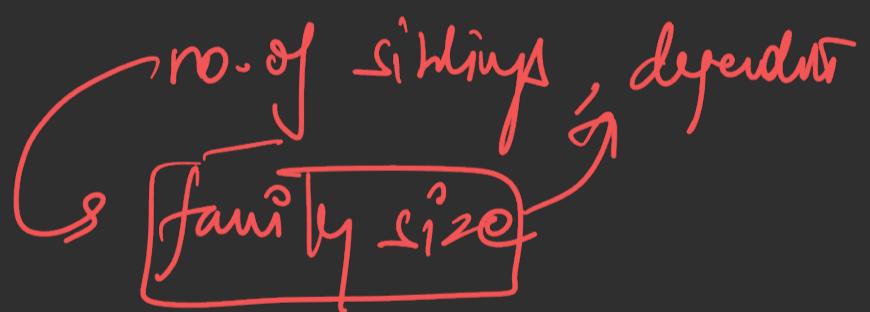
Transformation

x_1, x_2 and x_3
↳ Feature / Column



↳ features

"Feature Engg"

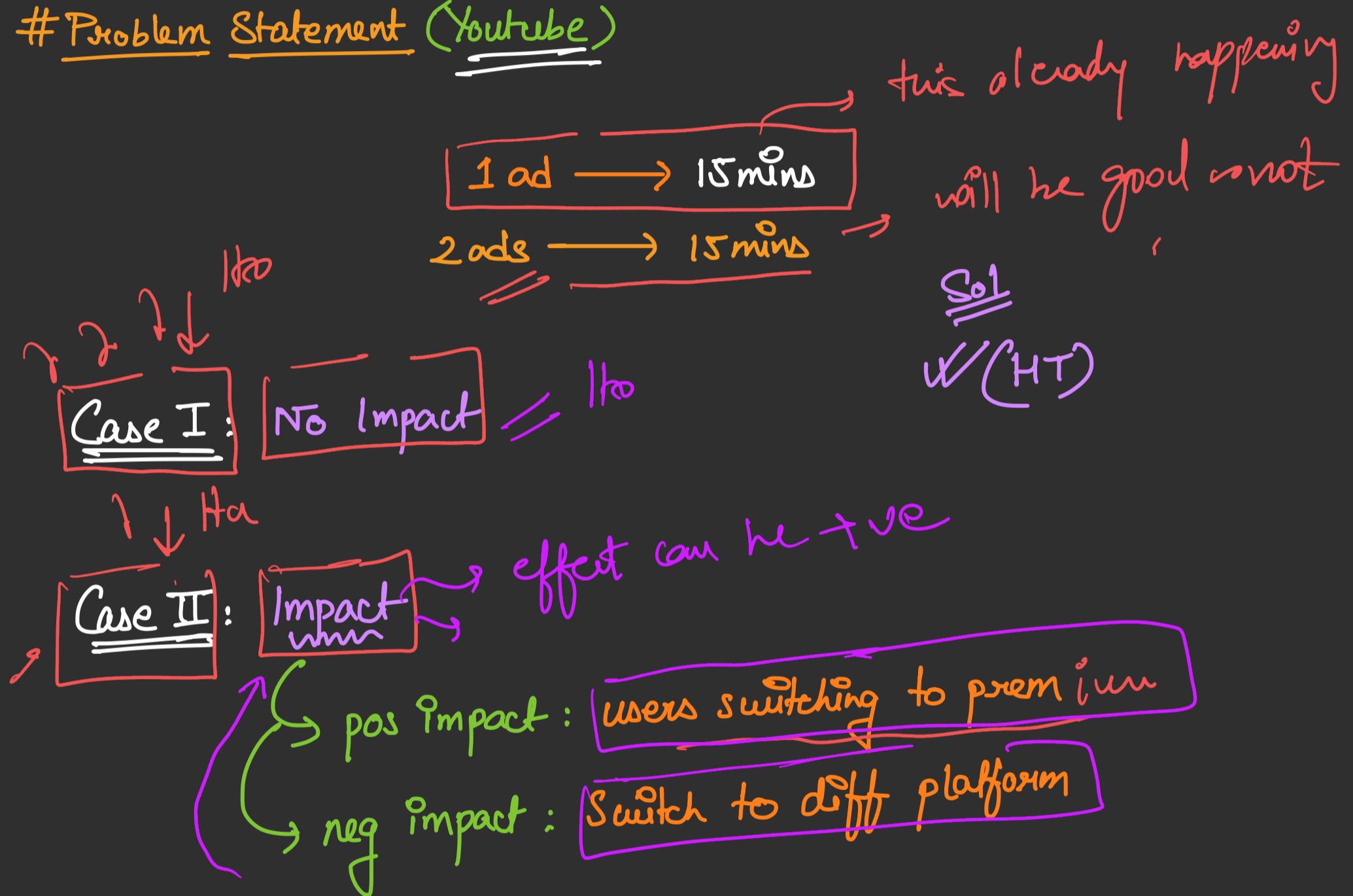


③ Types of Hypothesis Test

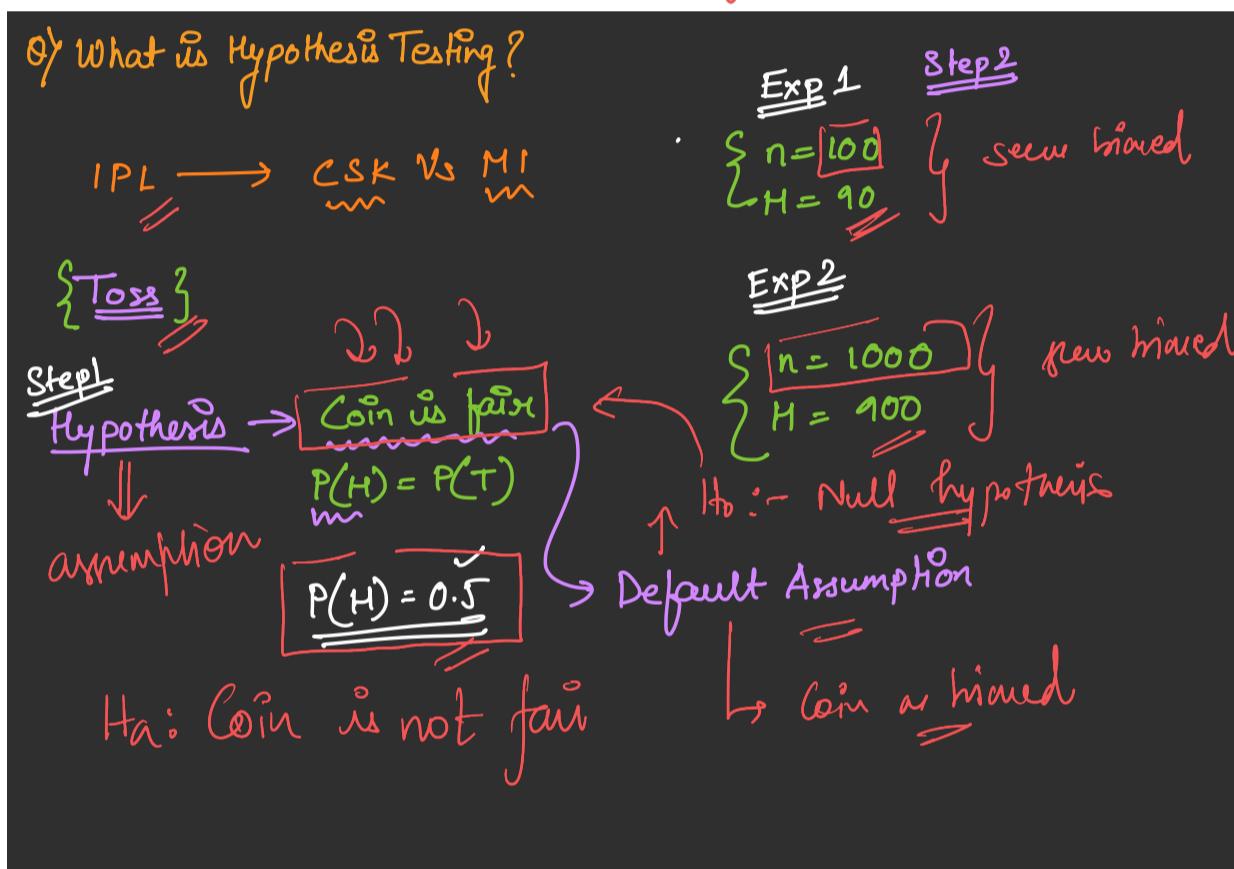
- Z-test ✓
- T-test ✓
- Chi-squared Test ✓
- ANOVA ✓
- Correlation Analysis ✎



Problem Statement (Youtube)



Step 1: Coming up with H_0 & H_a



H_0 : Coin is fair
 H_1 : Coin is biased

Null hypothesis is always no effect assumption

- Step 1: Assumption (Hypothesis)
- Step 2: Data / Evidence
- H_0 : Coin is fair
 H_a : Coin is not fair
- 100 , $H_1 = 50$ $T = 50$

Judge in Court



Suspect at hearing

charged for murder

"Innocent until proven guilty"

① Assumption:

Suspect is not guilty

② Evidence:

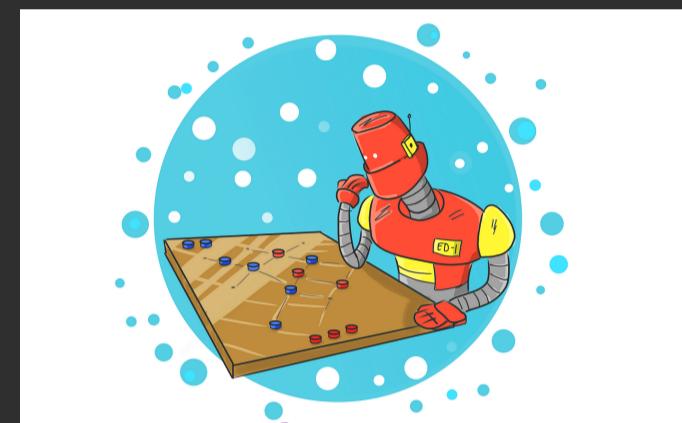
Fingerprint ✓
CCTV ✓
Murder weapon ✓

→ Default Assumption

H_0 : Suspect is innocent

H_a : Suspect is guilty

ML Deployment Example



(Rec Sys)

ML1: Legacy Model (10 yrs back) ML1

H1

① Assumption:

$$\overbrace{ML_1}^{22} == \overbrace{ML_2}^2$$

② Evidence:

metrics →

change in accuracy

Increase in sales

Less memory consmp.

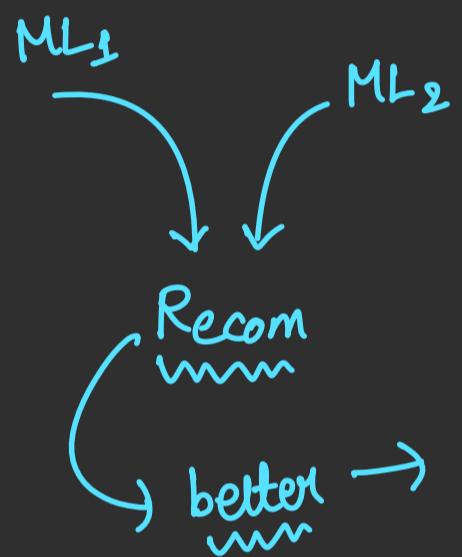
(Rec Sys)

ML2: New version of ML1

Some sample of users

ML1 → 68%

ML2 → 68% X



Terminologies

① Null Hypothesis (H_0)

↳ Default assumption

① Coin is fair (no effect)

② Suspect is innocent

② Alternate Hypothesis (H_a)

↳ Opp of Null Hypothesis

① Coin is unfair

② Suspect is guilty

① Assumption

↳ H_0 and H_a
Coin is fair Coin is biased

(Default Assumption) \rightarrow H_0 \rightarrow Null Hypothesis

Ib not gonna rain

$$\left\{ \begin{array}{l} H_0: \text{Coin is fair} \\ H_a: \text{Coin is unfair} \end{array} \right.$$

Case I
✓

$$\left\{ \begin{array}{l} H_0: \text{Coin is unfair} \\ H_a: \text{Coin is fair} \end{array} \right.$$

Case II
✗

Step 1 Frame H_0 & H_a (Why?) \rightarrow P value

Step 2 Collect Data

Step 3 Calculate p-value "pvalue calculation"

H_0 is true
 H_a is false

Q) Why H_0 is the default Assumption? [VVI]

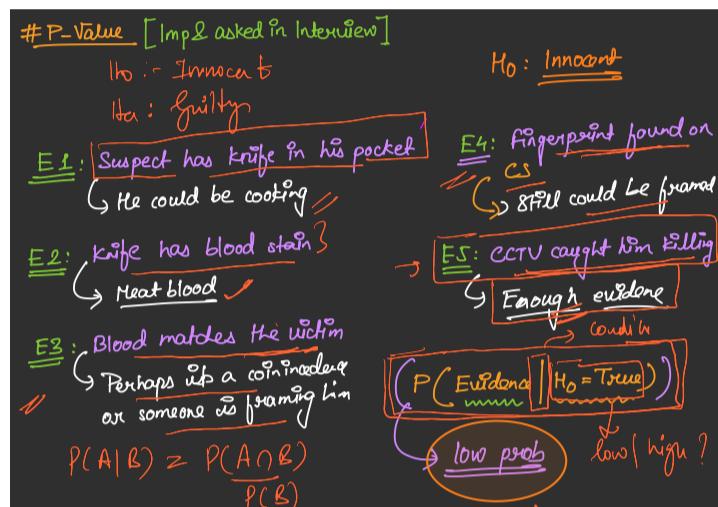
Coin Fair Example

H_0 : Coin is fair / Coin is unfair

↳ for which you can calculate the probability

$\checkmark P(H) = 0.5$ (given that coin is fair)

$\checkmark P(H) = \begin{cases} \text{Can't} \\ \text{Calculate} \end{cases}$ (given that coin is unfair)



$$P(\text{Evidence} | H_0 = \text{True})$$

↳ low or high?

↳ low

$$P(\text{Evidence} | H_0 = \text{True}) = \frac{P(\text{Evidence} \cap H_0)}{P(H_0 \text{ is true})}$$

$$P(E_1, E_2, E_3 | H_0 \text{ is True})$$

→ P value is the probability of obtaining the observed results given that your null hypothesis is true

$$P(A|B) = \frac{P(A \cap B)}{P(B)}$$

$$\rightarrow P(\text{Evidence} | H_0 = \text{True}) = \frac{P(\text{Evidence} \cap H_0 = \text{True})}{P(H_0 = \text{True})}$$

He is innocent but has been seen
committing a murder ↓

P-value → $P(\text{Data} \mid H_0 = \text{True})$

P-value

H_0 : Suspect is innocent
 $\underbrace{\hspace{10em}}$
(True)

$H_0 \rightarrow$ True / False

Medical domain

$$\alpha = 1\%$$

$$CI = 99\%$$

$$CI = 1 - \alpha$$

$$= 1 - 5\% = 95\%$$

295%

→ How to decide? [threshold]

5%

p value

low prob
in

(Assumption was wrong)
(H_0 is True)

$$\alpha = 5\%$$

↑ ↓
easier chance of

committing an error

95% I will

be accurate

Step 1:

Come up with H_0 & H_a

Step 2:

Collect Data & evidence

Step 3:- Calculate p value

② Take significance level

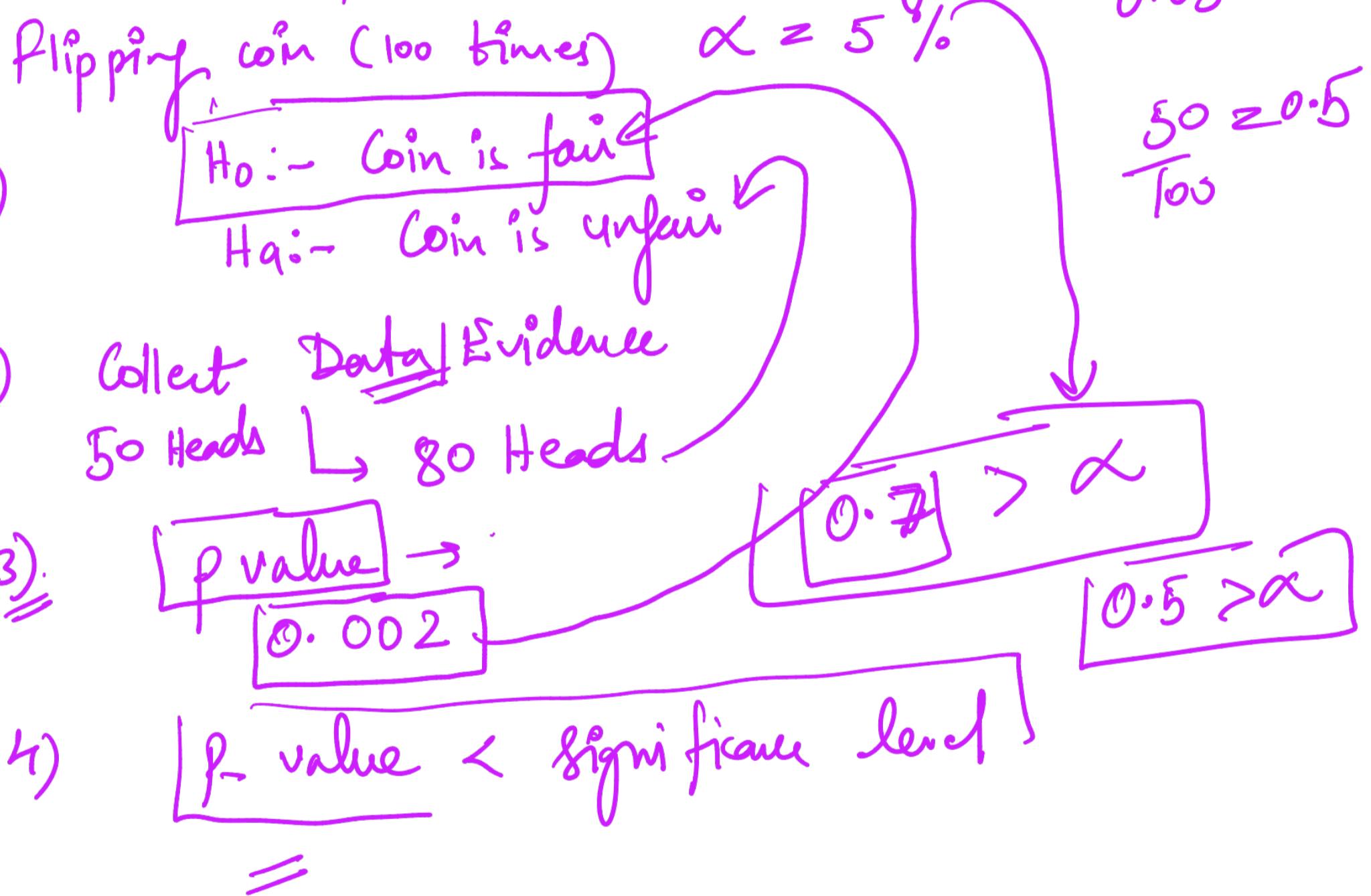
$$CI = 1 - \alpha$$

p-value < significance level

Step 4:
reject null hypothesis

fail to reject null hypothesis

I want to predict whether coin is fair or not



Quiz

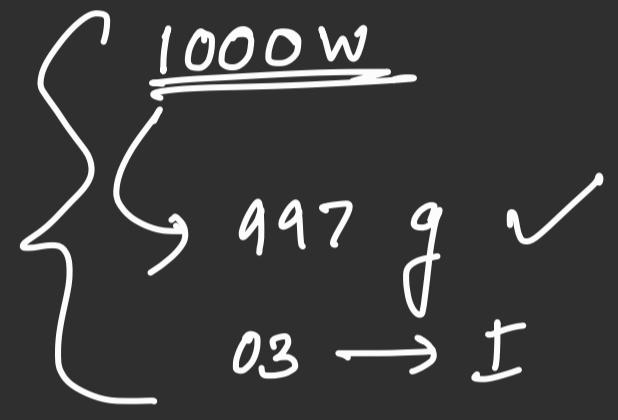
$$\begin{cases} H_0: SC \geq 8g \\ H_a: SC < 8g \end{cases}$$

Claim → New Manufacturing process helps produce SC less than 8g

Significance & Confidence Level

p-value $\Rightarrow [0, 1]$

threshold \rightarrow "significance level" (α)



Court

100 W
 \rightarrow 50% Suspect \rightarrow guilty
 \rightarrow 50% Suspect \rightarrow innocent

("Can't say")

100 W
 \rightarrow 75 \rightarrow guilty
 \rightarrow 25 \rightarrow innocent

[Can't say we still need more evidence]

1000 W

- 1) 99.7 → guilty
- 2) 0.3 → innocent

$$\begin{cases} CL = 99.7 \\ \alpha = 0.3 \end{cases}$$

We want to keep the threshold in such a way that
chances of error is less

$p\text{-value} < \underbrace{\text{threshold}}$

\hookrightarrow significance level

$CL = 95\% = \underbrace{\text{---}}$

$$CL = 1 - \alpha(\text{sig level})$$

$$95\% \Rightarrow 1 - \underbrace{5\%}_{\text{sig level}}$$

$$p\text{value} \rightarrow 0.06$$

$$\alpha \rightarrow 0.05$$

$\left. \begin{array}{l} \text{if } p\text{-value} < \alpha : \\ \quad \text{reject } H_0 \\ \text{else} \\ \quad \underline{\text{accept } H_0} \end{array} \right\}$

$0.06 < 0.05 \times$

pvalue $\rightarrow [0, 1]$

$\alpha \rightarrow [0, 1]$

(pvalue with alpha)

$$CL = 1 - \alpha$$

$$\left\{ \begin{array}{l} \alpha = \underbrace{1 - CL}_{1 - 1 = 0} \\ \alpha = 1 - 0 = 1 \end{array} \right.$$

Quiz

$$p\text{value} \Rightarrow 0.001$$

$$\alpha = 0.05$$

$$p\text{value} < \alpha :$$

→ Reject H_0 / Accept H_a

→ else: Accept H_0 / Reject H_a

$\boxed{O \rightarrow FP}$ → retain $\rightarrow \boxed{O O} \xrightarrow{\text{TN}} \boxed{PP}$

$O \rightarrow \text{happily} \Rightarrow \text{fn (Life zone)} \xrightarrow{\text{TN}} \text{fn} \quad | O$

10 → it's not

| # Types of Error | | Judge in the court | |
|-----------------------|---|-------------------------------|---------------------------------------|
| | | (Predicted) | H ₀ : - Person is Innocent |
| Detecting Cancer | | Judge says | H ₁ : - Person is Guilty |
| Able to detect cancer | | I | G. |
| | I | No Error (TP) | Type 2 Error (FN) |
| Actual person | G | Type 1 Error (FP) | No Error (TN) |
| | | α (Significance level) | |
| | | Confusion Matrix | Confusion matrix |
| | | | $FN \rightarrow$ Sanction FP ? |

Actual 1

Predicted 1 → FN ✓ TN

FN

TN

Actual 1

Predicted 1 → O1

Judge says

| | | I | G |
|---------------|---|----------------|----------------|
| | | True Positive | False Negative |
| Actual person | I | True Positive | |
| | G | False Positive | True Negative |

Annotations:

- True Positive: Person is Innocent → Positive
- False Negative: Person is Guilty → Negative
- False Positive: Type I error (α) → Sig level
- True Negative: Type II error

predicted (Judge says)

I

q

I

Actual

q

$\begin{cases} I \rightarrow \text{Negative} \\ q \rightarrow \text{Positive} \end{cases}$

Quiz

$\checkmark H_0$: There is no Intruder

$\checkmark H_a$: There is a Intruder

What is Type 2 Error

| | | Intruder | |
|--------|----|----------|----|
| | | NI | I |
| Normal | NI | TN | FP |
| | I | FN | TP |

NI → Negative Statement
I → Positive Statement

→ Type II