


Hypothesis Testing →

- What is this?
- Z Test, T Test, Chi-square, Anova Test
- Feature Engineering

⇒ YouTube data Scientist →

→ Every 15min → 1 Ads
→ |
 ↓
 2 Ads

Case1 → Move out of YouTube

Case2 → You will buy Premium

⇒ Assumption → More Premium users will be there
 ↓
 Collecting Data
 ↓
 We can confirm/deny our assumption

\Rightarrow Flipkart DS \rightarrow

Product \rightarrow Add to Cart $\xrightarrow{\times \times \times}$ Checkout \rightarrow place order
 \Rightarrow Product Page

\Rightarrow Product Page \rightarrow Buy Now $\xrightarrow{\quad}$ Checkout

\Rightarrow ① Nothing Changes \leftarrow

② Checkout conversion will increase \leftarrow

③ Everything will go down \leftarrow

\Rightarrow When we go for a toss \rightarrow we make certain assumption.

\Rightarrow H vs T \rightarrow 50% - 50% Coin is fair

\rightarrow Is there a way we can prove that coin is fair?

| | | | | |
|----|------------------------------|------------------------|-----------|--|
| 1) | Toss Coin 10 times | \rightarrow 6 Head | 4 Tails | $\left \frac{11:3}{\underline{\underline{}}}$ |
| 2) | Toss \rightarrow 100 times | \rightarrow 60 Head | 40 Tails | $\left \frac{12:6}{\underline{\underline{}}}$ |
| 3) | \rightarrow 1000 times | \rightarrow 600 Head | 400 Tails | $\left \frac{8:7}{\underline{\underline{}}}$ |
| 4) | \rightarrow 100000 times | \rightarrow 60000 H | 40000 T | $\left \frac{0:15}{\underline{\underline{}}}$ |

⇒ Because we got large data to support that
Crim is biased.

⇒ How much data do we need?

⇒ Accused is Presented in Court?

⇒ "Innocent Until Proven Guilty" →
Guilty until Proven Innocent

⇒ Police Lawyer → provide evidence| data
→ Fingerprints, bloodied knife, CCTV

After enough data is presented → My assumption (Innocent)
↓ was wrong
The accused is a criminal

⇒ Amazon|Netflix DS → A

→ A legacy model has been working for the website for last 1 year

→ Our team created Model → B which you claim to be better than
A.

\Rightarrow Assumption \rightarrow ① A is same as B (Initial assumption)

② B is better than A (Claim)



I will provide data to support my claim.

- \rightarrow user feedback
- \rightarrow performance
- \rightarrow Edge Cases

Third Umpire \rightarrow

\Rightarrow usually checks the onfield umpire decision

\rightarrow Assumption \rightarrow On field umpire is correct

Claim \rightarrow Umpire is wrong \rightarrow

- \hookrightarrow Slow motion video
- Ultra edge
- Ball tracking.

\Rightarrow Covid Virus \rightarrow

Assumption \rightarrow Does not have disease.

Claim \rightarrow I have a disease

- \hookrightarrow Symptom
- \hookrightarrow Blood cell counts

Hypothesis Testing Terminologies →

- ① Null Hypothesis (H_0) → Inherent assumption
 - 1) Accused is Innocent
 - 2) No virus
 - 3) Previous Model is similar
- ② Alternate Hypothesis (H_a) → Claim for which data is provided
 - 1) Criminal
 - 2) have disease
 - 3) B is better than A

⇒ If null hypothesis is rejected (enough data to reject null hypothesis is provided) - does it mean H_a is true →

⇒ Criminal Case →

$H_0 \rightarrow$ Innocent'

$H_a \rightarrow$ Criminal

- A) Accused have a knife in pocket
- B) knife has blood
- C) Blood matches the victim
- D) Knife also have fingerprint
- E) CCTV footage shows the crime

\Rightarrow Probability of seeing such extreme data if the person is innocent is very low.

$P(\text{data} | H_0)$ is very low

$\boxed{\text{P-value}}$

\Rightarrow When to reject your null hypothesis \rightarrow
we reject H_0 when P-value is low

A juice brand claims that its new manufacturing process has reduced the sugar content in its juice boxes to 8 gms.

Now, the Food Safety and Standards Authority of India (FSSAI) wants to test the claim of the juice brand. Set up the null (H_0) and alternate (H_1) hypotheses for this claim, and choose the correct option:

A \rightarrow Reduced to 8 gm

B \rightarrow Not Reduce to 8 gm

For FSSAI

$H_0 \rightarrow$ Reduce to 8 gm

$H_a \rightarrow$ Not Reduce to 8 gm

If the question would have been \rightarrow

Brand is asked to proof their claim that they have reduced the sugar to less than 8gm

$H_0 \rightarrow$ The sugar content is still 28gm (Industry level)

$H_a \rightarrow$ _____ has decreased.

A coffee shop makes amazing coffee.

Once, a coffee maker salesperson challenges the shopkeeper that his machine makes better coffee.

Set up the null (H_0) and alternate (H_1) hypotheses for this claim, and choose the correct option:

A \rightarrow Coffee shop makes good coffee

B \rightarrow Machine makes better coffee

↳ B will be providing data to support their claim.

$H_0 \rightarrow$ Coffee shop makes better coffee

$H_a \rightarrow$ Machine makes better coffee

\Rightarrow Slightly diff example \rightarrow

① $H_0 \rightarrow$ Innocent $H_a \rightarrow$ Criminal

~~100 witness~~ \rightarrow 50 says \rightarrow Criminal
50 says \rightarrow Not Criminal

B \rightarrow 70 says \rightarrow Criminal

30 says \rightarrow Not Criminal

C \rightarrow 95 \rightarrow 95% Criminal
5 \rightarrow public is 5%
 \rightarrow "Innocent until proven guilty beyond a reasonable doubt"

\Rightarrow Confidence and Significance level \rightarrow

Threshold value (α) \rightarrow If p value is less than α
we can reject your null hypothesis.
↓
Significance level

If not mentioned $\rightarrow \alpha = 0.05$

Confidence level $\rightarrow 1 - \alpha = 1 - 0.05 = \underline{\underline{0.95}}$

Repat

\rightarrow If p-value is low \rightarrow Reject H_0

\rightarrow threshold value \rightarrow
(0.05) (Probability(data | H_0) < 5%)
↓
Significance level (α) \rightarrow (0.05)

\rightarrow Confidence level $\rightarrow 1 - \alpha = \underline{\underline{0.95}}$

95% sure that H_0 is not true \rightarrow Reject $\underline{\underline{H_0}}$

Quick Ques When do we reject Null Hypothesis \rightarrow

P-value is less than significance level (α)

$\Rightarrow p\text{-value } P(\text{data} | H_0)$ is low \rightarrow reject H_0
 $\Rightarrow \cancel{p\text{-value}} \quad P(\text{data} | H_0)$ is high \rightarrow accept H_0

Local people claim that the river water quality is good.
 An environmental agency wants to test their claim. Upon testing, they obtained a p-value of 0.001.
 The significance level (α) is set at 0.05. What is the appropriate conclusion?

$$\rightarrow p\text{-value} = 0.001$$

$$\alpha = 0.05$$

$\underline{p < \alpha} \rightarrow \text{reject your } H_0$

\Rightarrow Criminal
 $\underline{p\text{-value}} \rightarrow 0.04 \quad \underline{\alpha = 0.05}$
 \rightarrow guilty test \rightarrow Yes, he is a criminal

| | | The Person is | | Reality |
|----------------|----------|---|--|---------|
| | | Innocent | Guilty | |
| The Judge Says | Innocent | True -ve No Error | False -ve Type 2 error (β) | Reality |
| | Guilty | False +ve Type 1 error (α) | True +ve No Error | |

[Outcome of Judge]

Test $\rightarrow H_0 \rightarrow$
 $\rightarrow H_a \rightarrow$

Covid $\xrightarrow{+ve}$

+ve } \rightarrow Test Result $\left(+ve \rightarrow \text{reject } H_0 \right)$
-ve }

False
and
True \rightarrow Comparing reality \rightarrow

\Rightarrow Covid Test

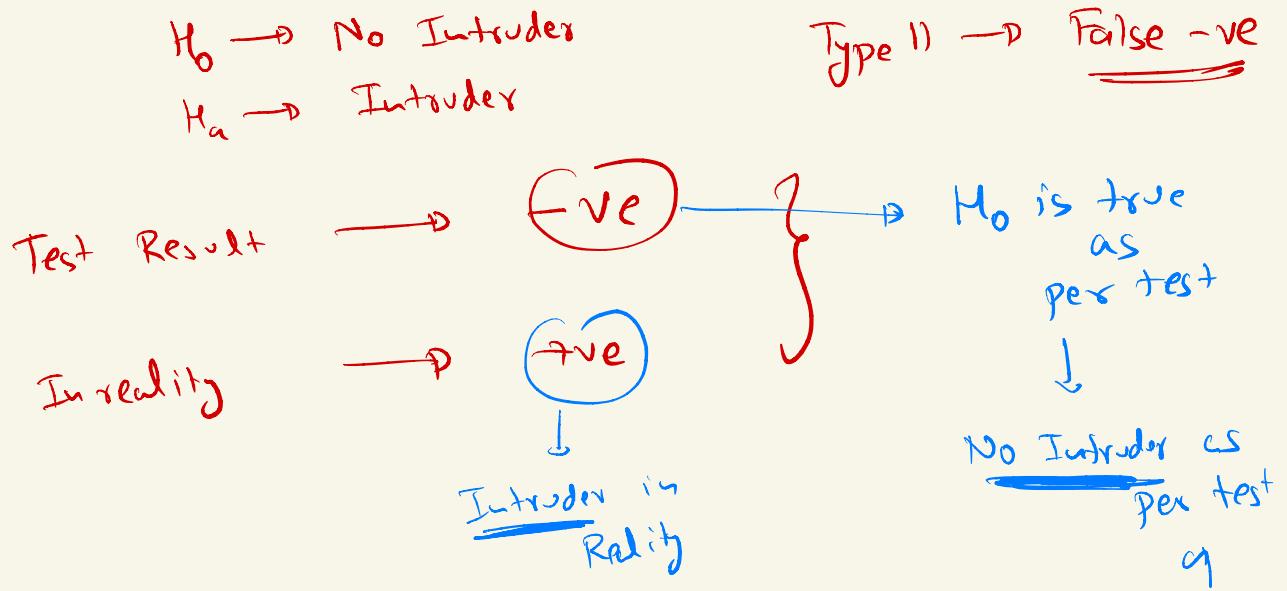
$H_0 \rightarrow$ No disease

$H_a \rightarrow$ Have disease

| | | Reality | |
|-------------|-----|--------------|--------------|
| | | -ve | +ve |
| Test result | -ve | True -ve | False -ve |
| | +ve | False +ve | True +ve |

+ve test result \rightarrow I have disease

A security system is designed to detect intruders in a restricted area. The null hypothesis (H_0) is that there is no intruder, and the alternate hypothesis (H_a) is that there is an intruder. What is a Type II error in this context?



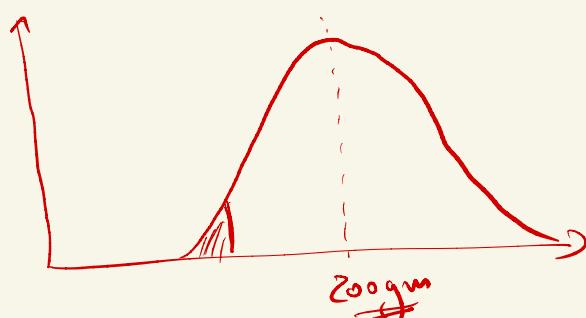
\Rightarrow My test failed to identify the Intruder

\Rightarrow A Burger Company is known to have ~~to have~~ ^{to have} each burger is of weight 200gm!

\rightarrow A customer claims that burger are lighter \rightarrow

$$H_0 \rightarrow \text{Burger} = 200\text{gm} \Rightarrow \mu = 200\text{gm}$$

$$H_a \rightarrow \text{Burger} < 200\text{gm} \Rightarrow \underline{\mu < 200\text{gm}}$$

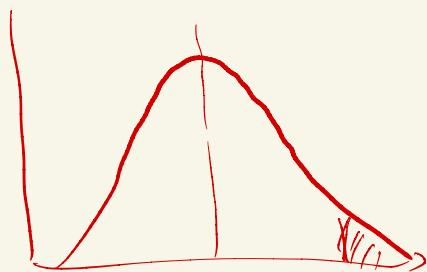


\rightarrow Left tailed test

Q Legacy model \rightarrow 90% accuracy
 New ML model \rightarrow 95% accuracy (claim)

$$H_0 \rightarrow \text{avg-perm} = 90\%$$

$$H_a \rightarrow \underline{\text{avg-perm}} > 90\%$$



Right tailed test

$$(\text{mean } H_a > \text{mean of } H_0)$$

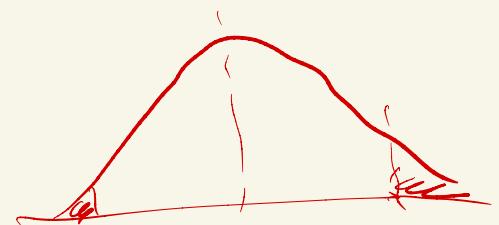
\Rightarrow

Q Avg weight in India = 68 inch

\rightarrow Claim \rightarrow It is not?

$$H_0 \rightarrow \mu = 68 \text{ inch}$$

$$H_a \rightarrow \mu \neq 68 \text{ inch}$$



Two-Tailed test

A restaurant says that its new menu item has a mean waiting time of less than equal to 10 minutes.

You claim that the mean wait time is greater than 10 minutes.

What should be the null and alternate hypotheses to test their claim?

$$H_0 \rightarrow \mu \leq 10 \text{ min}$$

$$H_a \rightarrow \mu > 10 \text{ min}$$

Q Coin Toss

$H_0 \rightarrow$ Fair Coin

$H_a \rightarrow$ unfair

\rightarrow Toss the coin 10 times \rightarrow 7 Head
3 Tails

$$\alpha = \underline{\underline{0.05}}$$

Q Is my Hypothesis true \rightarrow

$$p\text{-value} \rightarrow P(\text{data} | H_0) \rightarrow$$

$\rightarrow P(\left. \begin{array}{l} \text{Get 7 Heads} \\ \text{or more} \end{array} \right\} \text{Coin is fair}) \rightarrow$

\rightarrow Prob of getting 7 or more Heads if coin is fair?

$$\Rightarrow \text{Prob of } H=7 \\ H=8 \\ H=9 \\ H=10 \quad \left. \begin{array}{c} \\ \\ \\ \end{array} \right\} \rightarrow 1 - \text{cdf}(6)$$

$H/T \rightarrow 2 \text{ possibilities} \rightarrow \text{Binomial}$

Fix number of events

$$p\text{-value} = 1 - \text{binom. cdf} (K=6, n=10, P=0.5)$$

$$\Rightarrow \underline{\underline{0.017}} \rightarrow p\text{-value} \geq \underline{\underline{\alpha}}$$

$\Rightarrow H_0$ is still true

100 tosses \rightarrow 70 Head

$$p\text{-value} = 1 - \text{binom.cdf}(n=100, p=0.5, k=69)$$

$$\approx 4 \times 10^{-5}$$

$p\text{-value} < \alpha \rightarrow$ reject H_0
coin is unfair.

Conclusion

\rightarrow First Create Assumption (H_0 & H_a)

Collect data (e.g. evidence
70 H out of 100 tosses)

\rightarrow distribution
 \rightarrow which tail
 \rightarrow test statistic

Calculate $p\text{-value}$

Conclude

Doubts

Types of Error →

↳ If test Result \neq Reality

Type 1 Error → False +ve

Type 2 Error → False -ve

⇒ +ve -ve is defined by test result.

What is +ve test →

H_0 was rejected →

- 1) Accused is Guilty
- 2) Person has a virus

| | | Reality | |
|-----|-----|--------------|--------------|
| | | +ve | -ve |
| +ve | +ve | True +ve | False -ve |
| | -ve | False -ve | True +ve |

↑ Test results

← Type 1 Error

→ Type 2 Error

Doubts

→ Assumption → H_0
 H_A

→ Test / Experiment data →
Experiment (7 out of 10 tosses are Head)

⇒ How likely is this experiment data for a H_0 being true.

⇒ If H_0 is true (Coin is fair) what are the chances
that I will see 7 or more Heads.

$$\Rightarrow P(X=7, 8, 9, 10 \mid H_0)$$

$$\Rightarrow 1 - \text{cdf}(k=6, n=10, p=0.5)$$
$$= \underline{\underline{0.17}}$$

⇒ 70 out of 100 →

$1 - \text{cdf}(k=6, n=100, p=0.5)$ enough evidence
 $\Rightarrow \underline{\underline{3.92 \times 10^{-5}}}$ → reject H_0 .

