

# Information Retrieval

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அட பாடல் போல தேடல் கூட ஒரு சுகமே  
Search, like a song, is also a joy.

- From the movie, Thulladha Manamum Thullum. Lyrics by Vaali.



Evaluation

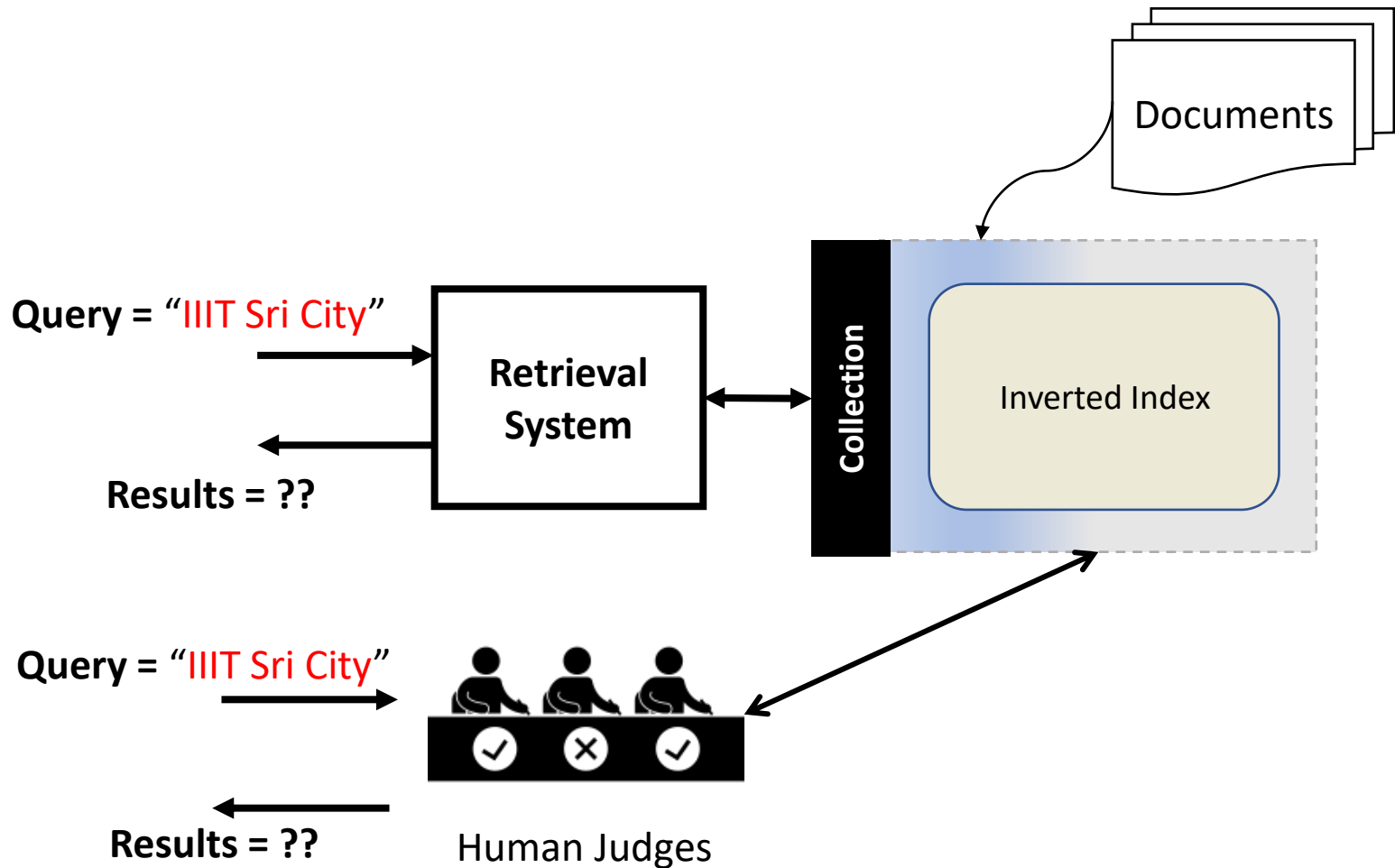
# How Good is Our System?

- A **collection** having the following contents
  - d1: IIIT ALLAHABAD
  - d2: IIIT DELHI
  - d3: IIIT GUWAHATI
  - d4: ISI
  - d5: IIIT SRI CITY
  - d6: KREA SRI CITY
- **Query** is
  - SRI CITY
- **Result** is
  - IIIT SRI CITY
  - KREA SRI CITY



**Very  
Good!**

# Evaluation



# How Good is Our System?

- A **collection** having the following contents
  - d1: IIIT ALLAHABAD
  - d2: IIIT DELHI
  - d3: IIIT GUWAHATI
  - d4: ISI
  - d5: IIIT SRI CITY
  - d6: KREA SRI CITY
- **Query** is
  - IIIT
- **Result** is
  - IIIT SRI CITY
  - KREA SRI CITY



Not so  
Good!

# Objective

We want all relevant documents and  
only relevant documents

# Relevance

- How many **relevant** documents?
  - Four (IIIT SRI CITY, IIIT ALLAHABAD, IIIT DELHI, IIIT GUWAHATI)
- How many **retrieved** documents?
  - Two (IIIT SRI CITY, KREA SRI CITY)

How to quantify the “goodness” of our system?

# Terminology

- Documents we see in results are “**positive**”
  - Positive
    - + IIIT SRI CITY,
    - + KREA SRI CITY
  - Negative
    - - IIIT ALLAHABAD
    - - IIIT DELHI
    - - IIIT GUWAHATI
    - - ISI



# Terminology

- Documents that we correctly classify are “**true**”
  - Positive
    - + IIIT SRI CITY (**true**)
    - + KREA SRI CITY
  - Negative
    - - IIIT ALLAHABAD
    - - IIIT DELHI
    - - IIIT GUWAHATI
    - - ISI (**true**)

Here, query is “IIIT”

# Quiz

• All retrieved results =

1.  $tp + fp$

2.  $tp + fn$

3.  $tn + fp$

4.  $tn + fn$

## Legend

$tp$  = true positive

$tn$  = true negative

$fp$  = false positive

$fn$  = false negative

# Quiz

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## Legend

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tn = true negative

fp = false positive

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# Quiz

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## Legend

$tp$  = true positive

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$fp$  = false positive

$fn$  = false negative

# You have 100% Precision

- Everything you retrieved were relevant.
  - $tp + fp = tp$
  - $fp = 0$

# You have 100% Recall when

- You retrieved everything that were relevant. (Note: You could have retrieved more).
  - $fn = 0$
  - $tp = \text{all relevant documents}$

# Quiz

- R refers to Relevant Document
- N refers to Nonrelevant Document.
- Collection has 10,000 documents.
- Assume that there are 8 relevant documents in total in the collection. Calculate Precision and Recall.
- Retrieved Documents:  
**RRNNN NNNRN RNNNR NNNNR**



# Precision and Recall

- Precision =  $6/20$
- Recall =  $6/8$

# Precision and Recall

**Precision:** fraction of retrieved docs that are relevant =  $P(\text{relevant} | \text{retrieved})$

**Recall:** fraction of relevant docs that are retrieved  
=  $P(\text{retrieved} | \text{relevant})$

	Relevant	Nonrelevant
Retrieved	tp	fp
Not Retrieved	fn	tn

- Precision  $P = tp / (tp + fp)$
- Recall  $R = tp / (tp + fn)$

# Exercise

**Suppose, a document is relevant only if both judges agree that it is relevant. Assume (0 = nonrelevant, 1 = relevant). What is the Precision and Recall?**

Query = "Taj"

Document ID	Judge 1	Judge 2	Our System
d1 = Bru	0	0	Retrieved
d2 = 3Roses	0	0	No
d3 = Taj	1	1	Retrieved
d4 = Taj Tea	1	1	No
d5 = Taj Mahal	1	0	No

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False positive

True positive

# Exercise

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True Negative

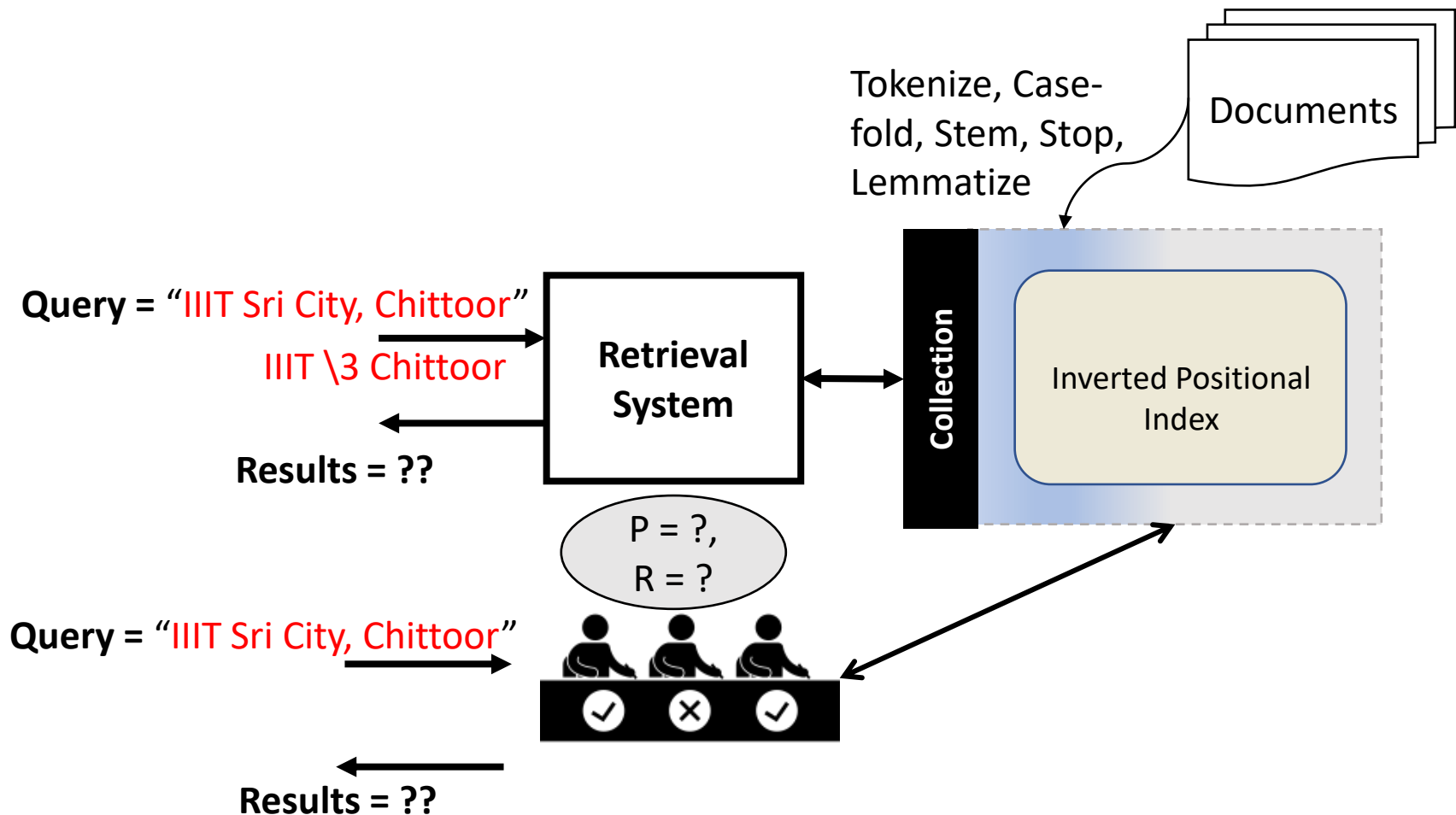
False Negative

True Negative

# Answer

- Precision =  $1/2$
- Recall =  $1/2$

# How does a Search Engine Work?



Thank You