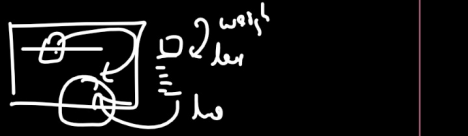
TF - IDF (Term frequency - Inverse Document frequency)

To evaluate the importance of Word in document or corpus
↓
set

(1) TF-IDF is a statistical measure used to evaluate the importance of Word in document relative to a collection of document

(2) It helps to weigh down common words that occur frequently across documents but are less informative, while giving more weights to rarer words that might be more significant for specific document



$$TF = \frac{\text{No of occ of words in sentence}}{\text{No of words in sentence}}$$ — measures how frequently a word appear in a document

$$IDF = \log_e\left(\frac{\text{No of sentences}}{\text{No of sentences containing the word}}\right)$$ — Measures how important a word in given corpus

IDF ↑ - rare

TF-IDF = Term frequency × Inverse document frequency

Example

Doc1 : "Cat eats fish"

Doc2 : "dog eats fish"

Doc3 : "dog chases Cat"

Term frequency

Step-1

Term	Doc-1 (cat eats. fish)	doc 2 (dog eats fish)	Doc3 (dog chases cat)
Cat	$\frac{1}{3}$	0	$\frac{1}{3}$
eats	$\frac{1}{3}$	$\frac{1}{3}$	0
fish	$\frac{1}{3}$	$\frac{1}{3}$	0
dog	0	$\frac{1}{3}$	$\frac{1}{3}$
chases	0	0	$\frac{1}{3}$

Step 2 - Calculate inverse Document frequency

[# of document Containing Word]

Cat	2
eats	2
fish	2
dog	2
chases	1

$\log\left(\frac{3}{2}\right) = 0.18$

$\log\left(\frac{3}{2}\right) = 0.18$

$\log\left(\frac{3}{2}\right) = 0.18$

$\log\left(\frac{3}{2}\right) = 0.14$

$\log\left(\frac{3}{1}\right) = 0.40$

TF - IDF

Doc 1

TF - IDF (Cat) $= \frac{1}{3} \times 0.18 = 0.06$

eats $= \frac{1}{3} \times 0.18 = 0.06$

fish $= \frac{1}{3} \times 0.18 = 0.06$

Doc 2

dog $= \frac{1}{3} \times 0.18 = 0.06$

cats = $\frac{1}{3} \times 0.18 = 0.06$

fish = $\frac{1}{3} \times 0.18 = 0.06$

Doc3

$$\text{TF} \times \text{IDF}$$

dog = $\frac{1}{2} \times 0.18 = 0.06$

chair = $\frac{1}{3} \times 0.48 = 0.16$

cat = $\frac{1}{3} \times 0.18 = 0.06$

cat, cats, fish, dog, chair

Doc1 → [0.06, 0.06, 0.06, 0, 0] ←

Doc2 → [0, 0.06, 0.06, 0.06, 0]

Doc3 → [0.06, 0, 0, 0.06, 0.16]

Advantages

1. Intuitive
2. fixed size
3. Word Importance is getting Capture

Disadvantages

1. sparsity
2. Huge vocabulary