



Founder of Google

Larry Page → Ranking → Page Ranking

1. Hi how are you! bro

2. I am good bro

3. I am very very good

hi how you bro

I good bro

I very very good

	hi	how	you	bro	I	good	Very
1	1	1	1	1	0	0	0
2	0	0	0	1	1	1	0
3	0	0	0	0	1	1	2

Indexing

bro

Millions of website  
tokens

Index

millions word

result optimized

algorithm AI

Phonetic wordcup

sorted

Page Ranking

query

Limitation

Frequency

1. Count is not captured ✓

2. Order is not captured ✓

word 1 : { 0, 2, 5, 6 } ✓

word 2 : { 1, 3, 5, 6 } ✓

word 3 : { 2, 5, 8, 9 } ✓

— movie is very bad ✓  
— movie is very very bad ✓ —ve

3. Context is not captured

4. meaning is not captured

8.

1. Count vectorizer ✓ One hot

Doc1 = I like cats. do you like?

Doc2 = I like dogs to

Vocabulary = [I, like, cats, dogs, to, do, you]

	I	like	cats	dogs	to	do	you
doc1	1	1	1	0	0	1	1
doc2	1	1	0	1	1	0	0

Structured

2. Bag of words

	I	like	cats	dogs	to	do	you
<u>doc1</u>	1	<u>2</u>	1	0	0	1	1
<u>doc2</u>	1	1	0	1	1	0	0

Structured

### 3. Term Frequency - Inverse Document Frequency TF-IDF

Doc1 = 1 like cats do you like ?  
Doc2 = 1 like dogs to

Term	Frequency TF(Doc1)	Doc1 $\Rightarrow 5$ Doc2 $\Rightarrow 4$ TF(Doc2)	log IDF
<u>1</u> ✓	$1/5$	$1/4$	$2/2 = 1 \Rightarrow 0$
<u>like</u>	$2/5$	$1/4$	$2/2 = 1 \Rightarrow 0$
<u>Cats</u> ✓	$1/5$	$0/4$	$2/1 = 2 = -3$
<u>do</u>	$1/5$	$0/4$	$2/1 = 2 = 0.3$
<u>you</u>	$1/5$	$0/4$	$2/1 = 2 = 0.3$
<u>dogs</u>	$0/5$	$1/4$	$2/1 = 2 = 0.3$
<u>to</u>	$0/5$	$1/4$	$2/1 = 2 = 0.3$

Inverse document Frequency  
 (Total number of documents) / (Number of doc which has word)

$$IDF \Rightarrow \log \left( \frac{\text{Tot nos doc}}{\text{nos of doc which has word}} \right)$$

TF-IDF

$$\Rightarrow \frac{\text{Doc1}}{\text{Doc2}} = \frac{1}{1} \frac{\text{like cats. do you like?}}{\text{like dogs to}}$$

0.3

TF-IDF

DOC 1

$$TF-IDF(I) \Rightarrow$$

$$\frac{1}{5} * 0 = 0 \checkmark$$

like

$$TF-IDF(\text{like}) =$$

$$\frac{2}{5} * 0 = 0 \checkmark$$

$$TF-IDF(\text{cats}) =$$

$$\frac{1}{5} * 0.3 = \underline{0.06}$$

$$TF-IDF$$

$$* TF-IDF$$

$$= TF * \log(IDF) \checkmark$$

$$= TF * (1 + \log(IDF))$$

why?

1000 document

10000 The

$$\left( \frac{1000}{1000} \right) = 1$$

$$\log(i) = 0$$