Information Retrieval

Homework - 2

Problem 1

Document 1 : You say goodbye, I say hello

term-count will be

you - 1
say - 1
goodbye - 1
i - 1
hello - 1

Document 2 : You say stop, I say go

you - 1
say - 2
stop - 1
i - 1
go - 1

Document 3 : Hello, hello, you say goodbye

hello - 2

you - 1

say - 1

goodbye - 1

Document 4 : I say yes, you say no

i - 1

say - 2

yes - 1

you - 1

no - 1

D1 : say goodbye

say - 1

goodbye - 1

D2 : you hello

you - 1

hello - 1

(a) Binary Term Matrix.

	you	say	hello	i	stop	goodbye	yes	no	go
Document 1	1	1	1	1	0	1	0	0	0
Document 2	1	1	0	1	1	0	0	0	1
Document 3	1	1	1	0	0	1	0	0	0
Document 4	1	1	0	1	0	0	1	1	0

(b) Raw Term Frequency

	you	say	hello	i	stop	goodbye	yes	no	go
Document 1	1	2	1	1	0	1	0	0	0
Document 2	1	2	0	1	1	0	0	0	1
Document 3	1	1	2	0	0	1	0	0	0
Document 4	1	2	0	1	0	0	1	1	0

c) Normalized Term Frequency

	you	Say	hello	i	Stop	goodbye	yes	no	go
Document 1	0.16	0.33	0.16	0.16	0	0.16	0	0	0
Document 2	0.16	0.33	0	0.16	0.16	0	0	0	0.16
Document 3	0.2	0.2	0.4	0	0	0.2	0	0	0
Document 4	0.16	0.33	0	0.16	0	0	0.16	0.16	0

d)

Inverse document Frequency (idf)

$$= \left[\ln\left(N/(n_j+1)\right)+1\right]$$

Document 1 :

① For term 'you' :

$$idf = \left[\ln\left(N/(n_j+1)\right)+1\right]$$

$$= \left[\ln\left(4/(4+1)\right)+1\right]$$

$$= \left[\ln\left(\frac{4}{5}\right)+1\right] = -0.22 + 1$$

$$= 0.77$$

idf('you') = 0.77

$tf('you') = 1$

$tf\text{-}idf('you')_{D1} = tf_{D1}('you') * idf_{D1}('you')$

$= 1 * 0.7768$

$tf\text{-}idf('you')_{D1} = 0.7768$

2) $idf('Bay') = \ln(4/5) + 1 = 0.77$

$idf('Bay') = 0.77$

$tf\text{-}idf('Bay') = tf('Bay') * idf('Bay')$

$tf\text{-}idf('Bay') = 2 * 0.77$

$tf\text{-}idf('Bay') = 1.54$

3) $idf('Hello') = 1.28$

$tf\text{-}idf('Hello') = tf('Hello') * idf('Hello')$

$tf\text{-}idf('Hello') = 1 * 1.28$

$tf\text{-}idf('Hello') = 1.28$

4) $idf('i') = \ln(4/4) + 1$

$idf('i') = 1$

$tf\text{-}idf('i') = tf('i') * idf('i')$

$= 1 * 1$

$tf\text{-}idf('i') = 1$

5) $idf('stop') = \ln(4/2) + 1$

$= 1.69$

$tf\text{-}idf('stop') = 0 * 1.69$

$tf\text{-}idf('stop') = 0$

6) $idf('goodbye') = \ln(4/3) + 1 =$

$= 1.28$

$tf\text{-}idf('goodbye') = 1 * 1.28$

$tf\text{-}idf('goodbye') = 1.28$

7) $idf('yes') = \ln(4/2) + 1 = 1.69$

$tf\text{-}idf = 0 * 1.69 = 0$

$\boxed{tf\text{-}idf = 0}$

8) $idf('no') = \ln(4/2) + 1 = 1.69$

$tf\text{-}idf = 0 * 1.69$

$\boxed{tf\text{-}idf('no') = 0}$

9) $idf('go') = \ln(4/2) + 1 = 1.69$

$tf\text{-}idf('go') = 0 * 1.69$

$\boxed{tf\text{-}idf('go') = 0}$

d) tf-idf weights

	you	Bay	hello	i	Stop	goodbye	yes	no	go
Document 1	0.77	1.54	1.28	1	0	1.28	0	0	0
Document 2	0.77	1.54	0	1	1.69	0	0	0	1.69
Document 3	0.77	0.77	2.56	0	0	1.28	0	0	0
Document 4	0.77	1.54	0	1	0	0	1.69	1.69	0

Problem 2

Q1 : Say goodbye

Q2 : you hello.

Q1 :

Say - 1

goodbye - 1

Q2 :

you - 1

hello - 1

a) Binary Term Matrix

	Say	goodbye	you	hello.
Q1	1	1	0	0
Q2	0	0	1	1

b) Raw Term Frequency.

	Say	goodbye	you	hello.
Q1	1	1	0	0
Q2	0	0	1	1

Problem Normalized Term Frequency

c)

	Bay	goodbye	you	hello.
d1	0.5	0.5	0	0
d2	0	0	0.5	0.5

d) tf-idf weight.

	Bay	you.	goodbye	hello
d1	0.77	0	1.28	0
d2	0.	0.77	0	1.28

d1: tf-idf('Bay') = 0.77 * 1 = 0.77

d1: tf-idf('you') = tf('you') * idf('you')
= 0 * 0.77 = 0.

d2: tf-idf('goodbye') = 1.28 * 1 = 1.28

d1: tf-idf('hello') = tf('hello') * idf('hello')
= 0 * 1.28 = 0.

d2: tf-idf('Bay') = 0.77 * 0 = 0.
tf-idf('you') = 0.77 * 1 = 0.77
tf-idf('goodbye') = 1.28 * 0 = 0
tf-idf('hello') = 1.28 * 1 = 1.28.

Problem 3

(a) Inner Product

term 'Bay' in Q2 = 0.77 * 1.54

+

term 'goodbye' in Q1 = 1.28 * 1.28.

in Document 1 = 2.82

Q1 & D1 = 2.82

term 'you' & 'Hello' in Q1 = 0

term 'Bay' & 'goodbye' in Q2 = 0

term 'you' & 'Hello' in Q2 = 0.77 * 0.77

+

in Document 2 0 * 1.28

= 0.59.

Q2 & D2 = 0.59

b) Cosine Similarity

$$\cos(d_i, d_j) = \frac{\sum_{k=1}^{n} w_{ik} w_{jk}}{|d_i||d_j|}$$

$|d_1|$ = Sum of squares of all tf-idf weights for Document 1

$$= \sqrt{(0.77)^2 + (1.54)^2 + (1.28)^2 + (1)^2 + (0)^2 + (1.28)^2 + 0^2 + 0^2 + 0^2}$$

$$= 2.705$$

$|d_2| = 3.123$ $\quad |q_1| = 1.49$

$|d_3| = 3.061$ $\quad |q_2| = 1.49.$

$|d_4| = 3.123$

$$\cos(d_1, q_1) = \frac{\text{Inner Product}}{|d_1||q_1|} = \frac{2.82}{2.705 * 1.49}$$

$$= \frac{2.82}{4.03} = \boxed{0.699.}$$

Problem

$$\cos(d_1, q_1) = 0.699$$

$$\cos(d_2, q_1) = \frac{\text{Inner Product}}{|d_2||q_1|} = \frac{0.998}{3.12 * 1.49}$$

$$\cos(d_2, q_1) = 0.21$$

$$\cos(d_3, q_1) = \frac{\text{Inner Product}}{|d_3||q_1|} = \frac{2.24}{3.066 * 1.49}$$

$$\cos(d_3, q_1) = 0.49$$

$$\cos(d_4, q_1) = \frac{\text{Inner Product}}{|d_4||q_1|} = \frac{1.21}{3.123 * 1.49}$$

$$\cos(d_4, q_1) = 0.24$$

$$\cos(d_1, q_2) = 0.567$$

$$\cos(d_2, q_2) = 0.13$$

$$\cos(d_3, q_2) = 0.70$$

$$\cos(d_4, q_2) = 0.13$$

Problem 4

For query 1, we will rank documents based on Cosine Similarity.

q_1

	$Cos(d_i, q_i)$
D_1	0.699
D_2	0.21
D_3	0.49
D_4	0.24

Rank = D_1, D_3, D_4, D_2.

q_2

D_1	= 0.56
D_2	= 0.13
D_3	= 0.70
D_4	= 0.13

Rank = D_3, D_1, D_4, D_2

Observing the ranking achieved here, we can say that, for query Q_1 and Q_2 Documents D_1 and D_3 were <u>much relevant</u> compared to D_2 and D_4