

# Homework #2 (Data Mining)

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## 1 Creating k-Grams

(A) When k-gram is 2 characters (G1):

D1: 263

D2: 262

D3: 269

D4: 255

When k-gram is 3 characters (G2):

D1: 765

D2: 762

D3: 828

D4: 698

When k-gram is 2 words (G3):

D1: 279

D2: 278

D3: 337

D4: 232

(B) When k-gram is 2 characters (G1):

D1, D2 Jaccard similarity is: 0.9811320754716981

D1, D3 Jaccard similarity is: 0.8156996587030717

D1, D4 Jaccard similarity is: 0.6444444444444445

D2, D3 Jaccard similarity is: 0.8

D2, D4 Jaccard similarity is: 0.6412698412698413

D3, D4 Jaccard similarity is: 0.6529968454258676

When k-gram is 3 characters (G2):

D1, D2 Jaccard similarity is: 0.977979274611399

D1, D3 Jaccard similarity is: 0.5803571428571429

D1, D4 Jaccard similarity is: 0.3050847457627119

D2, D3 Jaccard similarity is: 0.5680473372781065  
D2, D4 Jaccard similarity is: 0.30590339892665475  
D3, D4 Jaccard similarity is: 0.31212381771281167

When k-gram is 2 words (G3):

D1, D2 Jaccard similarity is: 0.9407665505226481  
D1, D3 Jaccard similarity is: 0.18234165067178504  
D1, D4 Jaccard similarity is: 0.03024193548387097  
D2, D3 Jaccard similarity is: 0.1736641221374046  
D2, D4 Jaccard similarity is: 0.0303030303030304  
D3, D4 Jaccard similarity is: 0.01607142857142857

## 2 Min Hashing

(A) The Jaccard similarity for D1 and D2 using min-hash:

t=20 is: 1.0

Time = 0.04724971282323295

t=60 is: 0.9666666666666667

Time = 0.11190287143923389

t=150 is: 0.98

Time = 0.2625936968086635

t=300 is: 0.9766666666666667

Time = 0.5599774528262382

t=600 is: 0.975

Time = 1.0814925145189511

t=1000 is: 0.977

Time = 2.0303672496142924

t=2000 is: 0.978

Time = 4.057545379676835

t=4000 is: 0.9775

Time = 7.205715043464481

t=10000 is: 0.9782  
Time = 17.6952514633904

- (B) I did a few extra values for  $t$  on Part 2(B), and I would say that the best value for  $t$  in terms of time and accuracy would be 600 because the Jaccard similarity is only 0.002 off of the original Jaccard similarity from Part 1(B) and the time is only 0.56 seconds.

### 3 LSH

- (A) First off,  $b = -\log_{\tau}(t)$

We know that  $\tau$  is 0.7 because it is the threshold and  $t$  is 160 hash functions. So we can say the following about  $b$ :

$$b = -\log_{0.7}(160)$$

We then know that:

$$b = \frac{t}{r}$$

so:

$$r = \frac{t}{b}$$

$$r = \frac{160}{-\log_{0.7}(160)}$$

I then get the following for  $r$  and  $b$  but it is not the final answer because you cannot take a fraction of a hash:

$$b = 14.22912908$$

$$r = 11.24453922$$

I will use the following formula to make sure that I get the best values for  $b$  and  $r$ :

$$\tau = \left(\frac{1}{r}\right)^{\frac{1}{b}}$$

We need  $\tau$  to be set to 0.7 so:

$$0.7 = \left(\frac{1}{r}\right)^{\frac{1}{b}}$$

I then wrote a program that I tested the range for  $b$  and  $r$  to be from 8 to 17 (getting every possibility between). The following are the results that I got for all the possible combinations for  $b$  and  $r$  that was within the range given where  $b * r$  was between 150 and 170. I do  $r * b$  because  $t = r * b$  and we want the  $t$  that is closest to 160. Below shows the closest to  $t$  to 160 and  $\tau$  to 0.7 that is in bold text.

b = 9, r = 17, T = 0.73  
b \* r = 153

**b = 10, r = 16, T = 0.758**  
**b \* r = 160**

b = 11, r = 14, T = 0.787  
b \* r = 154

b = 11, r = 15, T = 0.782  
b \* r = 165

b = 12, r = 13, T = 0.808  
b \* r = 156

b = 12, r = 14, T = 0.803  
b \* r = 168

b = 13, r = 12, T = 0.826  
b \* r = 156

b = 13, r = 13, T = 0.821  
b \* r = 169

b = 14, r = 11, T = 0.843  
b \* r = 154

b = 14, r = 12, T = 0.837  
b \* r = 168

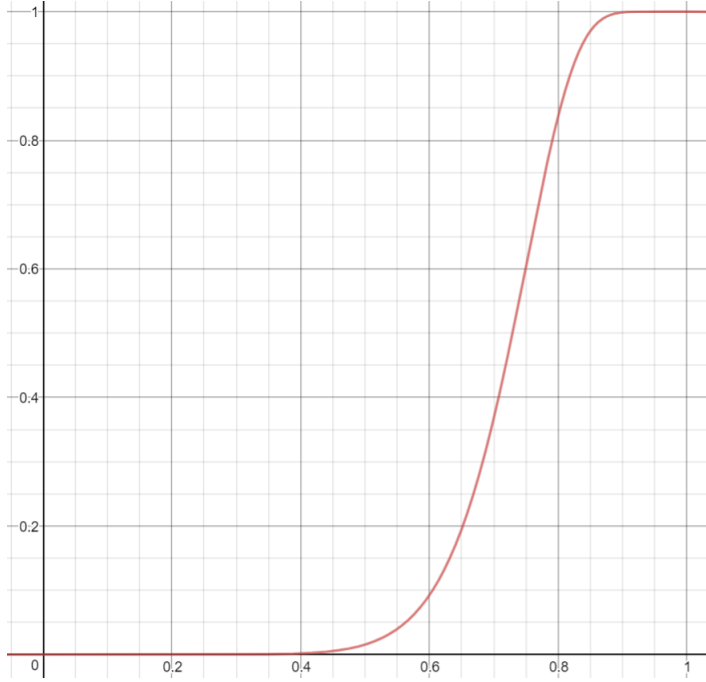
b = 15, r = 11, T = 0.852  
b \* r = 165

b = 16, r = 10, T = 0.866  
b \* r = 160

b = 17, r = 9, T = 0.879  
b \* r = 153

I then plotted the following where b = 10, r = 16:

$$f(s) = 1 - (1 - s^b)^r$$
$$f(s) = 1 - (1 - s^{10})^{16}$$



As you can see in the plot, the steepest part of the graph is really close to 0.7, so we can conclude that our **b = 10** and our **r = 16**.

- (B) The following are the probabilities when k-gram is 3 characters (G2) from the Jaccard similarities from Part 1(B) using the following formula (which was shown in the previous problem) where the  $s$  is the Jaccard similarity:

$$f(s) = 1 - (1 - s^{10})^{16}$$

The following is for D1 and D2 where  $s$  is 0.977979274611399:

$$f(s) = 1 - (1 - (0.977979274611399)^{10})^{16}$$

$$f(s) = 0.9999999999936431 \approx \mathbf{100.0000\%}$$

The following is for D1 and D3 where  $s$  is 0.5803571428571429:

$$f(s) = 1 - (1 - (0.5803571428571429)^{10})^{16}$$

$$f(s) = 0.06714456597772245 \approx \mathbf{6.7145\%}$$

The following is for D1 and D4 where  $s$  is 0.3050847457627119:

$$f(s) = 1 - (1 - (0.3050847457627119)^{10})^{16}$$

$$f(s) = 0.0001117640584525903 \approx \mathbf{0.0112\%}$$

The following is for D2 and D3 where  $s$  is 0.5680473372781065:

$$f(s) = 1 - (1 - (0.5680473372781065)^{10})^{16}$$

$$f(s) = 0.05452649364333684 \approx \mathbf{5.4526\%}$$

The following is for D2 and D4 where  $s$  is 0.30590339892665475:

$$f(s) = 1 - (1 - (0.30590339892665475)^{10})^{16}$$

$$f(s) = 0.00011479940476699646 \approx \mathbf{0.0115\%}$$

The following is for D3 and D4 where  $s$  is 0.31212381771281167:

$$f(s) = 1 - (1 - (0.31212381771281167)^{10})^{16}$$

$$f(s) = 0.00014039786464037363 \approx \mathbf{0.0140\%}$$