

## **Programming Assignment 2**

Nathan Friend

COM S 535: Algorithms for Large Data Sets:  
Theory and Practice

2018/10/28

## MinHash

**Your procedure to collect all terms of the documents and the data structure used for this.**

I built a class named `TermExtractor` that is responsible for extracting terms from a particular document. The class contains a method named `extractFromFile` that takes a `File` object as input as returns a multiset of terms (in the form of a `List<String>`) that appear in the document.

An instance of `TermExtractor` holds a number of preprocessing classes that implement the `IFilter` interface. Each `IFilter` accepts a list of terms as input and outputs a list of processed terms. In its current form, the `TermExtractor` class uses these `IFilters` in the following order:

- `PatternExtractorFilter`: Extracts terms using a regular expression
- `LowercaseFilter`: Converts all terms to lowercase
- `RemovePatternFilter`: Remove characters from the provided tokens
- `WordLengthFilter`: Remove terms of a certain length
- `StopFilter`: Removes specific terms

The output of these `IFilters` is piped into my `TermDocumentMatrix` class using the `loadTerms` method. This method stores the terms in a `HashMap<String, HashMap<String, Integer>>`, where the first `String` is the name of the document, the second `String` is the term, and the `Integer` is the term frequency. This data structure is then converted into an `int[][]` once all files have been processed.

**Your procedure to assign an integer to each term.**

To convert a term to an integer, I use Java's built-in `String.hashCode()` method.

**The permutations used, and the process used to generate random permutations.**

To generate  $k$  hash functions, I use the hash function  $(ax + b) \% p$  with  $k$  randomly chosen values for  $a$  and  $b$ . These random constants are validated to ensure there are no duplicate hash functions. These  $k$  values of  $a$  and  $b$ , along with the prime  $p$ , are stored in an instance of `PermutationParams`.

## MinHashAccuracy

**Run the program with following choices of NumPermutations: 400, 600, 800 and following choices for  $\epsilon$ : 0.04, 0.07, 0.09. Run the program on the files from space.zip. Report the number of pairs for which approximate and exact similarities differ by more than  $\epsilon$  for each combination.**

Here is the output of `MinHashAccuracy` using the specified parameters:

```

Number of bad approximations with numPermutations=400 and epsilon=0.040000: 11505
Number of bad approximations with numPermutations=600 and epsilon=0.040000: 6847
Number of bad approximations with numPermutations=800 and epsilon=0.040000: 1628
Number of bad approximations with numPermutations=400 and epsilon=0.070000: 182
Number of bad approximations with numPermutations=600 and epsilon=0.070000: 70
Number of bad approximations with numPermutations=800 and epsilon=0.070000: 46
Number of bad approximations with numPermutations=400 and epsilon=0.090000: 14
Number of bad approximations with numPermutations=600 and epsilon=0.090000: 3
Number of bad approximations with numPermutations=800 and epsilon=0.090000: 6

```

### What can you conclude from these numbers?

The quality of the Jaccard similarity approximations is directly related to the number of permutations used to construct a MinHash matrix. The more permutations, the better the estimates.

## MinHashTime

**Use 600 permutations on files from space.zip. Report the total run time to calculate exact Jaccard similarities and approximate Jaccard similarities (between all possible pairs).**

Here is the output of `MinHashTime` using the specified parameters:

```

Number of seconds to construct a MinHashSimilarities instance: 43.939
Number of seconds to compute the exact Jaccard similarity between all documents: 5.925
Number of seconds to compute the approximate Jaccard similarity between all documents: 2.074

```

## NearDuplicates

**Finally, run `nearDuplicateDetector` on the files from F17PA2.zip (with at least two choices of `s`). Run the program on at least 10 different inputs. For each input: List all the files that are returned as near duplicates in your report.**

Below is the output from the `nearDuplicateDetector` method. The program was run against five different files (space-0.txt, baseball0.txt, hockey0.txt, space91.txt, hockey53.txt) and with two different threshold values (0.85 and 0.4):

```

Found the following near duplicates of file space-0.txt using 600 permutations and threshold
value 0.85: space-0.txt.copy1, space-0.txt.copy2, space-0.txt.copy3, space-0.txt.copy4, space-
0.txt.copy5, space-0.txt.copy6, space-0.txt.copy7

Found the following near duplicates of file baseball0.txt using 600 permutations and threshold
value 0.85: baseball0.txt.copy1, baseball0.txt.copy2, baseball0.txt.copy3,
baseball0.txt.copy4, baseball0.txt.copy5, baseball0.txt.copy6, baseball0.txt.copy7

Found the following near duplicates of file hockey0.txt using 600 permutations and threshold
value 0.85: hockey0.txt.copy1, hockey0.txt.copy2, hockey0.txt.copy3, hockey0.txt.copy4,
hockey0.txt.copy5, hockey0.txt.copy6, hockey0.txt.copy7

```

Found the following near duplicates of file space-91.txt using 600 permutations and threshold value 0.85: space-91.txt.copy1, space-91.txt.copy2, space-91.txt.copy3, space-91.txt.copy4, space-91.txt.copy5, space-91.txt.copy6, space-91.txt.copy7

Found the following near duplicates of file hockey53.txt using 600 permutations and threshold value 0.85: hockey53.txt.copy1, hockey53.txt.copy2, hockey53.txt.copy3, hockey53.txt.copy4, hockey53.txt.copy5, hockey53.txt.copy6, hockey53.txt.copy7

Found the following near duplicates of file space-0.txt using 600 permutations and threshold value 0.40: space-0.txt.copy1, space-0.txt.copy2, space-0.txt.copy3, space-0.txt.copy4, space-0.txt.copy5, space-0.txt.copy6, space-0.txt.copy7, space-531.txt, space-531.txt.copy1, space-531.txt.copy2, space-531.txt.copy3, space-531.txt.copy4, space-531.txt.copy5, space-531.txt.copy6, space-531.txt.copy7

Found the following near duplicates of file baseball0.txt using 600 permutations and threshold value 0.40: baseball0.txt.copy1, baseball0.txt.copy2, baseball0.txt.copy3, baseball0.txt.copy4, baseball0.txt.copy5, baseball0.txt.copy6, baseball0.txt.copy7

Found the following near duplicates of file hockey0.txt using 600 permutations and threshold value 0.40: hockey0.txt.copy1, hockey0.txt.copy2, hockey0.txt.copy3, hockey0.txt.copy4, hockey0.txt.copy5, hockey0.txt.copy6, hockey0.txt.copy7

Found the following near duplicates of file space-91.txt using 600 permutations and threshold value 0.40: space-537.txt, space-537.txt.copy1, space-537.txt.copy4, space-537.txt.copy5, space-537.txt.copy6, space-537.txt.copy7, space-91.txt.copy1, space-91.txt.copy2, space-91.txt.copy3, space-91.txt.copy4, space-91.txt.copy5, space-91.txt.copy6, space-91.txt.copy7, space-950.txt, space-950.txt.copy1, space-950.txt.copy2, space-950.txt.copy3, space-950.txt.copy4, space-950.txt.copy5, space-950.txt.copy6, space-950.txt.copy7

Found the following near duplicates of file hockey53.txt using 600 permutations and threshold value 0.40: hockey53.txt.copy1, hockey53.txt.copy2, hockey53.txt.copy3, hockey53.txt.copy4, hockey53.txt.copy5, hockey53.txt.copy6, hockey53.txt.copy7

## Documentation

Documentation for all classes can be found in Javadoc format in the `doc` folder. To view the Javadoc documentation, open `doc/index.html` in a web browser.