# Project 4: Suffix arrays and BW-match

### Status of work

We have implemented the binary search and the burrows wheeler based search algorithms. Everything is working as expected.

### Description of implementation

The programs are fragmented into two parts.

- I. The first part preprocesses the input (genome). For binary search, this implies creating the suffix array which is done in a naive manner with pythons built-in sort-function. For Burrows wheeler based search, preprocessing implies calculating the suffix array (shared code with binary search), computing the c-table, bwt-string and the o-table. When all preprocessing steps have been completed, the collection of data structures used in each program which resides in a python object, is serialized by the built-in python module 'pickle' and saved to disk.
- II. The second parts of the programs, reads the serialized objects from disk and rebuilds python objects that contain all data structures and functions needed to perform searching for a read that can be specified without recalculating the preprocessed data.

In order to save on memory usage when computing the suffix array, we tried to implement a pointer in python. Instead of creating a list of all the suffix-strings, we created a list, containing memoryview objects to the part of the genome that the suffix consists of. This greatly reduces the relative memory usage for large inputs, as the maximum size of a suffix is now the size of a memoryview object, instead of a potentially long string. This implementation detail is important, because our 8GB machine would run out of memory in a matter of minutes without it.

# Insight during implementation

One should not make a function  $L(\alpha w)$  and evaluate that recursively. Because then the search is done one can save computational time by saving the last result and using that to evaluate the new  $L(\beta \alpha w)$ .

Python when using reverse on a list does not actually reverse the list but gives an iterator that runs in reverse.

# How to run the program

#### search\_bs.py

```
python3 search_bs.py -p data/seqs.fasta && \
python3 search_bs.py -i data/reads.fastq
```

### search\_bw.py

```
python3 search_bw.py -p data/seqs.fasta && \
python3 search_bw.py -i data/reads.fastq
```

### Common for both programs:

- The -p option tells the program that it should <u>preprocess</u> the sequences in the supplied .fasta-file, and save the data to disk. This data is saved in preprocessed\_sequences\_bs.pickle and preprocessed\_sequences\_bw.pickle respectively.
- The -i option tells the program that it should <u>i</u>mport earlier preprocessed sequences and map the reads from the supplied .fastq-file.

# Description of the machine

The running time analysis was done on a laptop running mac os 10.12, with a fifth generation intel-i5 (two physical cores), 2.40GHz CPU with 8 GB 1600 MHz DDR3 RAM.

# Correctness of program

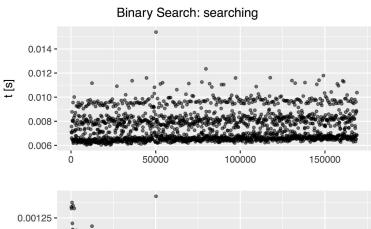
We have tested that the program works with "mississippi" and checked against the output given in the exercise.

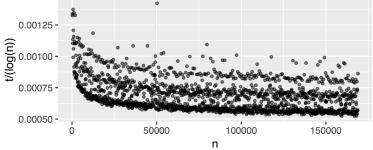
We also used a set of strings to test edge cases.

### Description of tests

We tested the average case by using a real life representative sequence: Enterobacteria phage T4, complete genome from NCBI. The genome has a length of 168K basepairs. For both programs, search\_bs.py and search\_bw.py, we tested the search time by searching for a 'read' which is an incrementally larger part of the whole genome. Such that when n = 1, the read is the first character of the genome, and when n = 168K, the read is equal to the complete genome.

### **Binary search**

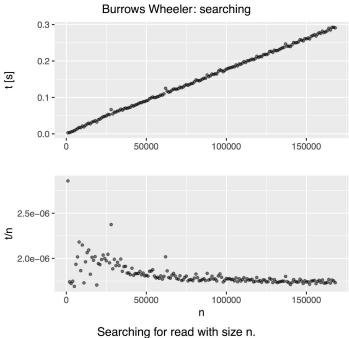




Searching for read with size n. Enterobacteria phage T4 genome.

Binary search has a theoretical running time of  $O(n \log(|genome|))$ , where n is the size of the read. From our test, i looks like our algorithm could be performing better than that. This might be because the genome used is not a worst case input.

#### Burrows wheeler transform based search



Searching for read with size n. Enterobacteria phage T4 genome.

The theoretical search time for BW based search is o(n), where n is the size of the read. From our test, it looks like it could be performing better than that. This could be because the genome used is not a worst case input.

# Conclusion

We have successfully implemented binary search and burrows wheeler based search as command line programs in python. Further analysis should include a discussion of whether the test-inputs are worst case or not.