Abstract

I distinguished between five sorting algorithms in the **SortingLab** class using existing knowledge about the algorithms and empirical timing data. I determined that the identities of the sorting algorithms are the following:

• Sort1: Merge Sort

• Sort2: Randomized Quicksort

• Sort3: Selection Sort

Sort4: non-randomized Quicksort

• Sort5: Insertion Sort

1 Problem Overview

Our task was to experimentally distinguish between five sorting algorithms in the SortingLab class using both existing knowledge about the algorithms and by collected empirical timing data. Each of the five sorting algorithms were implemented as methods in the SortingLab class: Sort1, Sort2, Sort3, Sort4, Sort5. Each method manipulates a SortingLab<T super Comparable> object and returns void. The implemented algorithms included merge sort, randomized quicksort, non-randomized quicksort, selection sort, and insertion sort.

2 Experimental Procedure

- 1. To distinguish between the different algorithms, I employed existing knowledge about both their time complexity and stability. Given that average cases for selection sort and insertion sort run in $O(N^2)$ time while the average cases for quick sort and merge sort run in $O(N\log N)$ time, I can separate the five algorithms into a *slow group* and a *fast group*.
- 2. To distinguish between the algorithms in the *slow group* (insertion sort and selection sort), I employed existing knowledge about the best case time complexity of each algorithm. Given that selection sort has a best case of $O(N^2)$ and that insertion sort has a best case of O(N), I can determine the identities of the two algorithms by timing their completion of a sorted array.
- 3. To distinguish between merge sort and the two quick sort algorithms, I employed existing knowledge about the stability of the two algorithms. Given that merge sort is stable while quick sort is not stable, I can determine which of the three *fast* algorithms is merge sort by analyzing the order of *equal* elements before and after the sort. I used String objects and sorted them by length.
- 4. To distinguish between the randomized quicksort and the non-randomized quicksort, I employed existing knowledge about the time complexity of their worst cases. Given that each of the algorithms selects pivots from the

beginning of the array, I can determine the identity of the two algorithms by testing an array in reverse order.

2.1 Experimental materials

The experimental materials include the SortingLabClient class and the resources.jar files. The SortingLabClient is used to collect timing data by accessing the hidden SortingLab class located in the resources.jar file. To instantiate a SortingLab object, I was required to input my Banner ID as a parameter, serving as a key.

2.2 Collecting running time data

Using the given SortingLabClient, I timed the completion of the different sorting algorithms at exponentially scaled input sets (10000 < N < 2000000). The code implementing the timing is below.

```
SortingLab<Integer> sli = new SortingLab<Integer>(key);
  int M = 2000000; // max capacity for array
  int N = 10000; // initial size of array
  double start;
  double elapsedTime;
  for (; N < M; N = 2) {
        Integer[] ai = getIntegerArray(N, Integer.MAX_VALUE);
        start = System.nanoTime();
        sli.sort1(ai);
        elapsedTime = (System.nanoTime() - start) / 1_000_000_000d;
        System.out.print(N + "\t");
        System.out.printf("%4.3f\n", elapsedTime);
    }</pre>
```

I used this algorithm to acquire all of the timing data needed for each step in the Experimental Procedure above. The only variable that I modified between the different tests was the contents and data type of the Integer[] and the contents of the print statements.

2.3 Analyzing running time data

I primarily analyzed the scalability of the sorting algorithms by analyzing the run time of large data sets.

3 Data Collection and Analysis

The timing data was gathered by using the **SortingLabClient** class. The computer environment in which the data was collected is described below.

• Computer: Microsoft Surface Book (13.5 in. 2015), 2.6GHz Intel i7 Processor,

• Operating System: Microsoft Windows 10 Pro

• Java: 1.8.0

- javac -version: javac 1.8.0

- java -version: java version \1.8.0" Java(TM) SE Runtime Environment (build 1.8.0-b132) Java HotSpot(TM) 64-Bit Server VM (build 25.0-b70, mixed mode)
- System.nanoTime(): used to measure elapsed time

3.1 Timing Data

Timing Data was generated using the **SortingLabClient** class. For each test at every step, I timed the completion of each sorting algorithm using data sizes ranging from N = 10,000 to N = 2,000,000 elements with each successive trial containing 2N elements when compared to the previous trial.

$3.1.1\ Slow\ { m and}\ Fast\ { m group\ data}$

As noted in step 1 of the Experimental Process, I first separated the five algorithms into two groups: the *slow group* and the *fast group*.

Table 1: Random Set: Sort1

Trial	Data Size (N)	Time (s)
1	10000	0.007
2	20000	0.009
3	40000	0.022
4	80000	0.047
5	160000	0.103
6	320000	0.229
7	640000	0.447
8	1280000	1.02

Table 2: Random Set: Sort2

Trial	Data Size (N)	Time (s)
1	10000	0.004
2	20000	0.008
3	40000	0.020
4	80000	0.037
5	160000	0.180
6	320000	0.310
7	640000	0.638
8	1280000	1.742

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Table 3: Random Set: Sort3

Trial	Data Size (N)	Time (s)
1	10000	0.414
2	20000	1.612
3	40000	6.871
4	80000	28.343
5	160000	191.407
6	320000	1065.986
7	640000	14179.546
8	1280000	

Table 4: Random Set: Sort4

Trial	Data Size (N)	Time (s)
1	10000	0.007
2	20000	0.010
3	40000	0.021
4	80000	0.053
5	160000	0.092
6	320000	0.178
7	640000	0.427
8	1280000	1.031

Table 5: Random Set: Sort5

Trial	Data Size (N)	Time (s)
1	10000	0.372
2	20000	1.661
3	40000	6.576
4	80000	35.584
5	160000	209.364
6	320000	4898.029
7	640000	10190.337
8	1280000	

I stopped ${\tt Sort5}$ and ${\tt Sort3}$ after several hours due to their prolonged run time.

Given that there are two of the algorithms that process with $O(N^2)$ and three algorithms process with O(N), the *slow* algorithms are **Sort3** and **Sort5** and the *fast* algorithms are **Sort1**, **Sort2**, and **Sort4**.

3.1.2 Insertion sort versus selection sort

As noted in step 2 of the Experimental Procedure, I differentiated between the insertion sort algorithm and the selection sort algorithm by timing their respective completions of a sorted array.

Table 6: Best Case: Sort3

Trial	Data Size (N)	Time (s)
1	10000	0.672
2	20000	2.715
3	40000	10.940
4	80000	46.385
5	160000	187.843
6	320000	1220.590
7	640000	6041.340
8	1280000	11482.717

Table 7: Best Case: Sort5

Trial	Data Size (N)	Time (s)
1	10000	0.002
2	20000	0.002
3	40000	0.001
4	80000	0.001
5	160000	0.003
6	320000	0.005
7	640000	0.009
8	1280000	0.018

Given that insertion sort has a best case of $\mathcal{O}(\mathcal{N})$ and that selection sort has a best case of $\mathcal{O}(N^2)$, Sort5 is obviously insertion sort due to its fast completion when compared to Sort3 which is selection sort.

3.1.3 Distinguish Merge Sort Using Stability

Given that merge sort does not affect the order of equal elements (stable), I distinguished merge sort from the two quicksorts by checking if equal elements changed position from the algorithm. Because time was not a factor in this test, I was able to use a smaller data set (N = 10).

Table 8: Stability Test

Algorithm	Input	Output	Stability
Sort1 Sort2 Sort4	[A, B, C, D, E, F, G] [A, B, C, D, E, F, G] [A, B, C, D, E, F, G]	[A, B, C, D, E, F, G] [A, G, C, B, E, D, F] [F, E, G, A, B, D, C]	Stable Unstable Unstable

Given that merge sort is stable while quicksort is not stable, Sort1 is merge sort while Sort2 and Sort4 are versions of quicksort.

3.1.4 Distinguish Quicksorts

Given that non-randomized quicksort has a worst case of $\mathcal{O}(N^2)$ while randomized quicksort has a worst case of $\mathcal{O}(\mathcal{N})$, I could distinguish between the two algorithms by inputing a descending array.

Table 9: Worst Case: Sort2

Trial	Data Size (N)	Time (s)
1	10000	0.008
2	20000	0.012
3	40000	0.032
4	80000	0.063
5	160000	0.102
6	320000	0.188
7	640000	0.527
8	1280000	1.123

Table 10: Worst Case: Sort4

Trial	Data Size (N)	Time (s)
1	10000	0.235
2	20000	0.572
3	40000	1.300
4	80000	2.698
5	160000	5.912
6	320000	12.904
7	640000	19.048
8	1280000	41.078

Because Sort4 was significantly slower than Sort2, I can determine that Sort4 is the non-randomized quicksort while Sort2 is the randomized quicksort.

4 Interpretation

As outlined in Timing data, I distinguished between the different sorting algorithms using both knowledge about the algorithms and experimental data. The identities that I have determined for the algorithms are as follows:

• Sort1: Merge Sort

• Sort2: Randomized Quicksort

• Sort3: Selection Sort

• Sort5: Insertion Sort