



CS-202 HOMEWORK 1

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Section: 1

Assignment: 1

Question 1 - Part (a)

Question 1 - Part (d)

$$\underline{T(n) = 3n^3 + 4n^2 + 2n, \quad O(T(n)) = ?}$$

$$0 \leq \underbrace{3n^3 + 4n^2 + 2n}_{T(n)} \leq c \underbrace{n^3}_{f(n)}, \text{ for all } n \geq n_0$$

$$3 + \frac{4}{n} + \frac{2}{n^2} \leq c, \text{ for all } n \geq n_0$$

$$\text{Let } \left. \begin{matrix} c = 9 \\ n_0 = 1 \end{matrix} \right\} 0 \leq 3n^3 + 4n^2 + 2n \leq 9n^3 \text{ for all } n \geq 1$$

$$\text{Therefore } T(n) = O(n^3) \text{ as } T(n) \leq \underbrace{9n^3}_{f(n)} \text{ for } n \geq 1$$

Question 1 - Part (b)

$$T(n) = T(n-1) + n^2$$

Question 1 - Part (b)

$$T(n) = T(n-1) + n^2, T(1) = 1$$

$$= (T(n-2) + (n-1)^2) + n^2$$

$$= (T(n-3) + (n-2)^2) + (n-1)^2 + n^2$$

\vdots

$$= T(n-k) + \sum_{i=n-k+1}^n i^2$$

\Downarrow

$$T(n) = \underbrace{T(1)}_1 + \underbrace{\sum_{i=2}^n i^2}_{\frac{n(n+1)(2n+1)}{6} - 1^2} \Rightarrow \boxed{T(n) = \frac{n(n+1)(2n+1)}{6}}$$

$$T(n) = \frac{n(n+1)(2n+1)}{6} = \frac{n^3}{3} + \frac{n^2}{2} + \frac{n}{6}$$

$$c_1(n^3) \leq \frac{n^3}{3} + \frac{n^2}{2} + \frac{n}{6} \leq c_2(n^3), \text{ for all } n \geq n_0$$

$$c_1 \leq \frac{1}{3} + \frac{1}{2n} + \frac{1}{6n^2} \leq c_3, \text{ for all } n \geq n_0$$

$$\text{Let } \left. \begin{array}{l} c_1 = \frac{1}{3} \\ c_2 = 1 \\ n_0 = 1 \end{array} \right\} \frac{\frac{1}{3} n^3}{f(n)} \leq \underbrace{\frac{n(n+1)(2n+1)}{6}}_{T(n)} \leq \underbrace{n^3}_{f(n)}, \text{ for all } n \geq 1$$

$$\text{There } \Theta(T(n)) = \Theta(n^3)$$

Question 1 - Part (b)

$$T(n) = 2 T(n/2) + n/2$$

Question 1 - Part (b)

$$T(n) = 2 T\left(\frac{n}{2}\right) + \frac{n}{2}, \quad T(1) = 1$$

$$= 2 \left(2 T\left(\frac{n}{4}\right) + \frac{n}{4} \right) + \frac{n}{2}$$

$$= 2 \left(2 \left(2 T\left(\frac{n}{8}\right) + \frac{n}{8} \right) + \frac{n}{4} \right) + \frac{n}{2}$$

\vdots

$$= 2^k T\left(\frac{n}{2^k}\right) + k \cdot \frac{n}{2}$$

$$\Downarrow$$

$$T(n) = n \cdot \underbrace{T(1)}_1 + \log_2 n \cdot \frac{n}{2} \Rightarrow \boxed{T(n) = n + \frac{n \log_2 n}{2}}$$

$$T(n) = n + \frac{\log_2 n}{2} \quad c_1(n + n \log_2 n) \leq n + \frac{n \log_2 n}{2} \leq c_2(n + n \log_2 n) \quad \text{for all } n \geq n_0$$

$$\left. \begin{array}{l} \text{Let } c_1 = \frac{1}{2} \\ c_2 = 1 \\ n_0 = 1 \end{array} \right\} \quad \frac{n + \log_2 n}{2} \leq \overbrace{n + \frac{n \log_2 n}{2}}^{T(n)} \leq n + \log_2 n \quad \text{for all } n \geq 1$$

$$\text{Therefore } \Theta(T(n)) = \Theta(n + \log_2 n)$$


Question 1 - Part (c)


Selection Sort

Question 1 - Part (c)

Selection Sort

Pass										
Initial	21	9	58	28	36	18	27	19	4	25
1	21	9	25	28	36	18	27	19	4	58
2	21	9	25	28	4	18	27	19	36	58
3	21	9	25	19	4	18	27	28	36	58
4	21	9	25	19	4	18	27	28	36	58
5	21	9	18	19	4	25	27	28	36	58
6	4	9	18	19	21	25	27	28	36	58
7	4	9	18	19	21	25	27	28	36	58
8	4	9	18	19	21	25	27	28	36	58
9	4	9	18	19	21	25	27	28	36	58

 = Largest element in unsorted region marker

Unsorted  Sorted = Separator

Question 1 - Part (c)

Insertion Sort

Question 1 - Part (c)

Insertion Sort

Pass										
Initial	21	9	58	28	36	18	27	19	4	25
1	21	9	58	28	36	18	27	19	4	25
2	9	21	58	28	36	18	27	19	4	25
3	9	21	58	28	36	18	27	19	4	25
4	9	21	28	58	36	18	27	19	4	25
5	9	21	28	36	58	18	27	19	4	25
6	9	18	21	28	36	58	27	19	4	25
7	9	18	21	27	28	36	58	19	4	25
8	9	18	19	21	27	28	36	58	4	25
9	4	9	18	19	21	27	28	36	58	25
10	4	9	18	19	21	25	27	28	36	58

□ = Key element to be compared and inserted into sorted region

Unsorted | Sorted = Separator

Question 2 - Part (c)

```
[arda.iynem@dijkstra hwl]$ ./hwl
Analysis of Bubble Sort
12, 23, 24, 25, 26, 27, 29, 31, 32, 33, 35, 37, 38, 40, 56, 79
Data move count: 204
Key comparison count: 114

After merge sort:
12, 23, 24, 25, 26, 27, 29, 31, 32, 33, 35, 37, 38, 40, 56, 79
Data move count: 128
Key comparison count: 46

After quicksort:
12, 23, 24, 25, 26, 27, 29, 31, 32, 33, 35, 37, 38, 40, 56, 79
Data move count: 114
Key comparison count: 48
```


Question 2 - Part (d)

Randomly Created Arrays

RANDOMLY CREATED ARRAYS:

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Analysis of Bubble Sort

Array Size	Elapsed Time (ms)	compCount	moveCount
4000	78	7995225	12048096
8000	357	31992514	47974338
12000	857	71979635	109502193
16000	1585	127973855	191839524
20000	2515	199980130	301834467
24000	3666	287916747	431389797
28000	5034	391899680	589179015
32000	6613	511848019	769467843
36000	8406	647977344	967671630
40000	10447	799958264	1193508219
44000	12727	967951665	1450571304
48000	15146	1151972345	1720010772

Analysis of Merge Sort

Array Size	Elapsed Time (ms)	compCount	moveCount
4000	1	42875	95808
8000	2	93584	207616
12000	4	147579	327232
16000	5	203384	447232
20000	6	260846	574464
24000	8	319408	702464
28000	9	378659	830464
32000	11	438501	958464
36000	12	500096	1092928
40000	14	561955	1228928
44000	15	624036	1364928
48000	16	686870	1500928

Analysis of Quick Sort

Array Size	Elapsed Time (ms)	compCount	moveCount
4000	1	54070	87684
8000	2	127365	189581
12000	3	200702	339847
16000	4	256978	395503
20000	5	341802	567767
24000	6	434622	662939
28000	7	484386	751208
32000	8	578225	1049390
36000	9	632732	1022989
40000	10	696099	1052474
44000	12	820081	1228687
48000	13	936977	1617909

Question 2 - Part (d)

Ascending Order Arrays

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ASCENDING ARRAYS:
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Analysis of Bubble Sort
Array Size Elapsed Time (ms) compCount moveCount
4000 0 3999 0
8000 0 7999 0
12000 0 11999 0
16000 0 15999 0
20000 0 19999 0
24000 0 23999 0
28000 0 27999 0
32000 0 31999 0
36000 0 35999 0
40000 0 39999 0
44000 0 43999 0
48000 0 47999 0
-----
Analysis of Merge Sort
Array Size Elapsed Time (ms) compCount moveCount
4000 1 24352 95808
8000 1 52735 207616
12000 2 84702 327232
16000 3 113472 447232
20000 4 148864 574464
24000 4 181404 702464
28000 5 213961 830464
32000 6 242998 958464
36000 7 280953 1092928
40000 8 317686 1228928
44000 9 353687 1364928
48000 9 386867 1500928
-----
Analysis of Quick Sort
Array Size Elapsed Time (ms) compCount moveCount
4000 34 7998000 15996
8000 135 31996000 31996
12000 303 71994000 47996
16000 539 127992000 63996
20000 842 199990000 79996
24000 1212 287988000 95996
28000 1650 391986000 111996
32000 2155 511984000 127996
36000 2727 647982000 143996
40000 3367 799980000 159996
44000 4074 967978000 175996
48000 4849 1151976000 191996

```

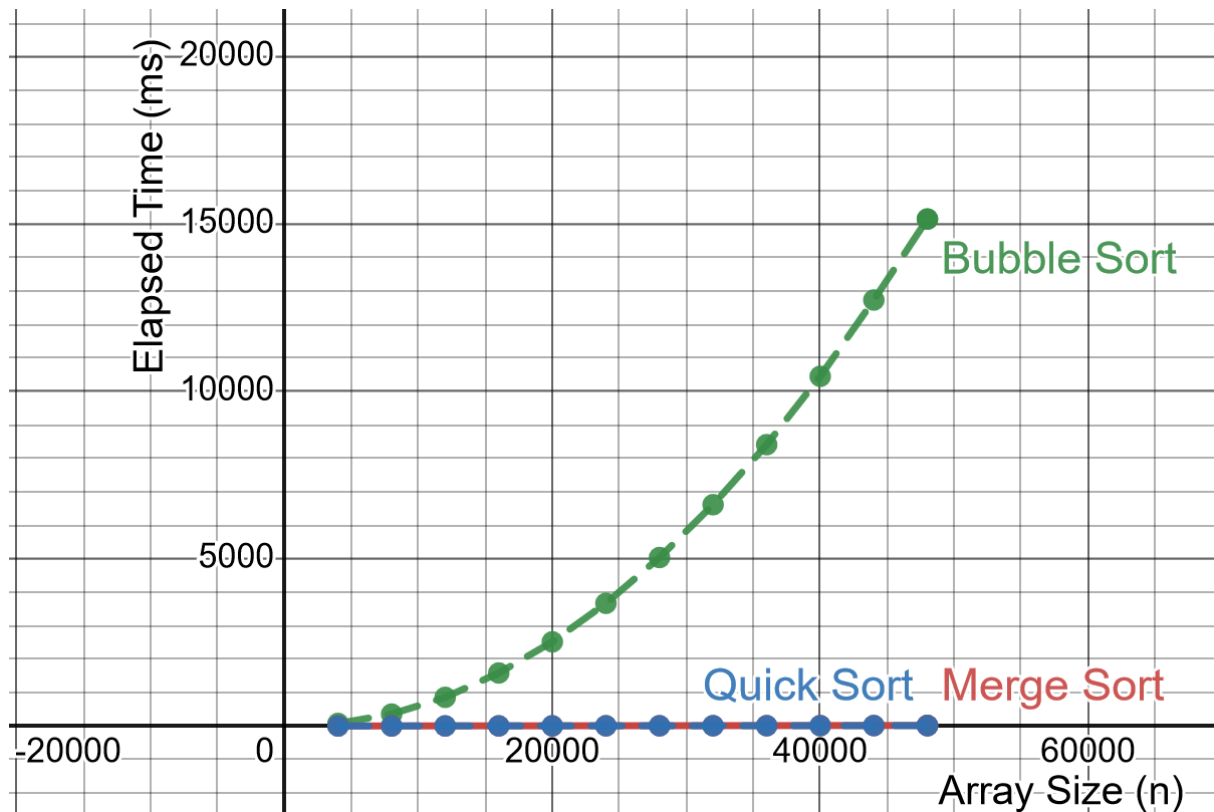
Question 2 - Part (d)

Descending Order Arrays

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DESCENDING ARRAYS:
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Analysis of Bubble Sort
Array Size Elapsed Time (ms) compCount      moveCount
4000        84              7998000      23992770
8000       335             31996000     95985399
12000      759            71994000    215978157
16000     1347           127992000    383970708
20000     2109           199990000    599963322
24000     3059           287988000    863955651
28000     4145           391986000    1175949027
32000     5409           511984000    1535941089
36000     6827           647982000    1943934087
40000     8427           799980000    2399926518
44000    10196           967978000    2903919333
48000    12126          1151976000    3455911602
-----
Analysis of Merge Sort
Array Size Elapsed Time (ms) compCount      moveCount
4000         1             23728        95808
8000         1             51456       207616
12000        2             79312       327232
16000        3            110912       447232
20000        4            139216       574464
24000        4            170624       702464
28000        5            202512       830464
32000        6            237824       958464
36000        7            267280      1092928
40000        8            298432      1228928
44000        8            330416      1364928
48000        9            365248      1500928
-----
Analysis of Quick Sort
Array Size Elapsed Time (ms) compCount      moveCount
4000         51           7568042     11369832
8000        202          30266187     45434636
12000       457          68400836    102654569
16000       810         121410256    182186390
20000      1264         189369439    284142911
24000      1818         272416504    408731107
28000      2484         371891122    557961183
32000      3233         483887141    725972334
36000      4105         614434773    921812050
40000      5060         757638899    1136635639
44000      6125         917468270    1376397664
48000      7279        1090510201    1635977891
```

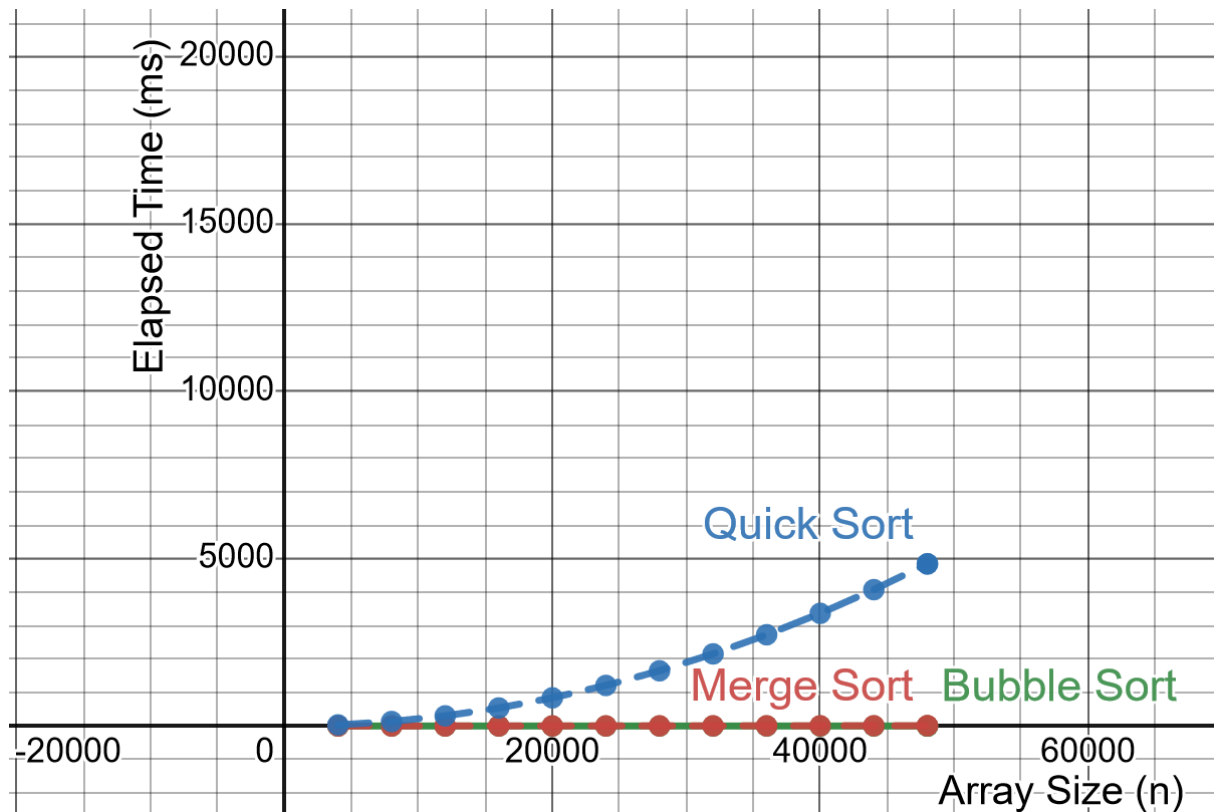
Question 3

Elapsed Time - Array Size Performance Analysis Graph with Randomly Created Arrays



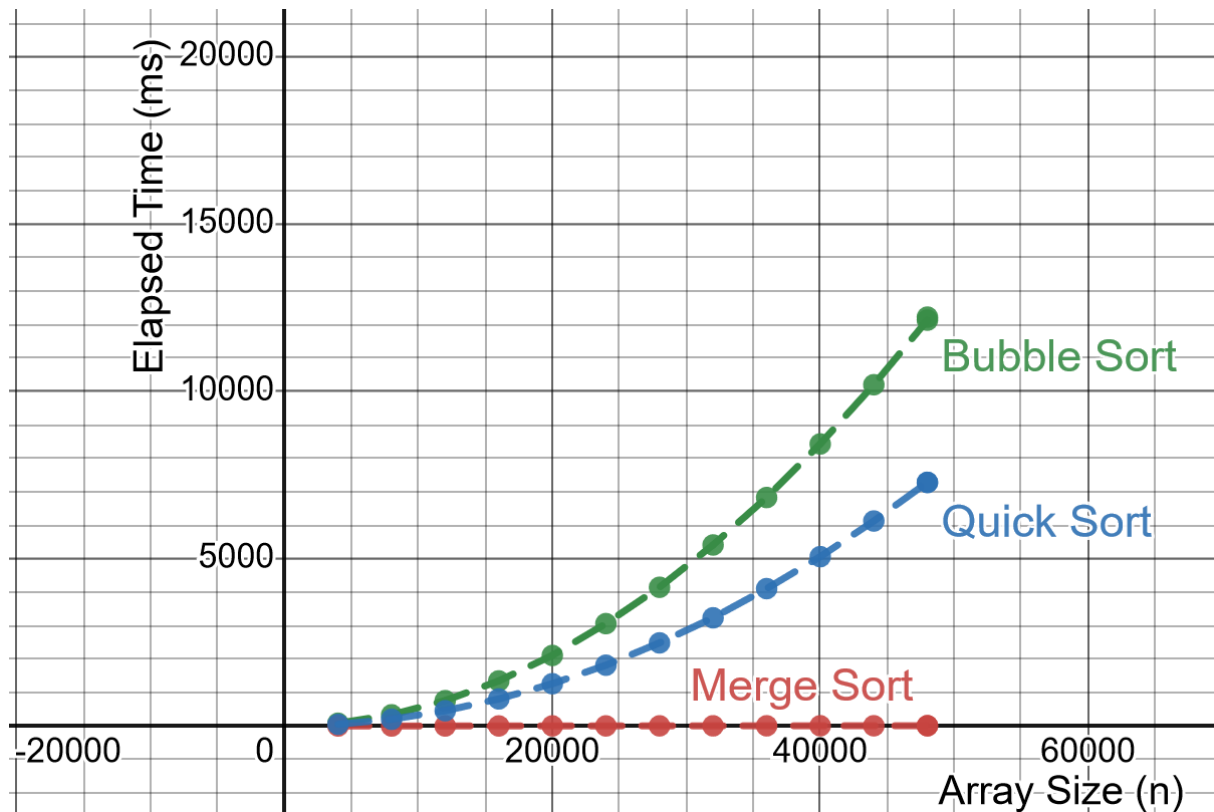
Question 3

Elapsed Time - Array Size Performance Analysis Graph with Ascending Order Arrays



Question 3

Elapsed Time - Array Size Performance Analysis Graph with Descending Order Arrays



Question 3 - Discussion

Randomly Created Arrays

Obtained empirical performance analysis results significantly resemble the theoretical results. Bubble sort was the slowest among all as expected while having a parabolic increase as its graph line is almost identical that of $O(n^2)$. Both Quick sort and Merge sort were remarkably fast and their plot line were almost identical to each other whereas they are similar to that of $O(n \cdot \log n)$ (Data result confirms this while graph's proportions make it hard to see). Conclusively empirical results were very similar to theoretical ones.

Ascending Order Arrays

This time Bubble sort is the fastest due to the fact that $n-1$ key comparison and zero data movements have been done since the array is already sorted. Instead of theoretical $O(n)$, a flat line has been plotted due to low cost of key comparisons with this size of data. Conversely, Quick sort is known to perform poorly when the array is sorted and its impact reflected on the graph since Quick sort was the slowest due to very high amount of key comparison even though its data movement was similar to that of Merge sort. And as expected its plot line resembles that of $O(n^2)$ which is also the theoretical result. Finally merge sort again performed well, it was almost as fast as bubble sort as its worst case theoretical result is $O(n \cdot \log n)$ by contrast with quick sort.

Descending Order Arrays

As expected Bubble sort is the slowest because its worst case is a descending sorted array, and its graph corresponds to the theoretical result $O(n^2)$. Not much changed for Quick sort since its array is still sorted and worst case $O(n^2)$ continuous, however even though its key comparisons amount was similar to that of Bubble sort, its data movements were almost half which made Quick sort the second worst after Bubble sort. And as expected its plot line resembles that of $O(n^2)$ which is also the theoretical result. As expected Merge sort again performed best, since its both worst and best case is $O(n \cdot \log n)$ nothing much changed through to different ordered arrays for merge sort. It kept its empirical results very similar to theoretical results in each case.

In conclusion

Each algorithm performed as expected for each different case, which has shown that their performance may vary depending on the array to be sorted. However, it is hard to ignore Merge sort's consistent and great performance in each case as it performs with same time complexity in each best and worst case $O(n \cdot \log n)$. Quick sort also performs with $O(n \cdot \log n)$ time complexity in best case (randomly sorted arrays) however it performs quite poorly compared to other 2 algorithms in its worst case (ascending/descending order arrays) with time complexity $O(n^2)$. Finally Bubble sort performs poorly except in its best case (randomly sorted arrays) with time complexity $O(n)$ while it performs with time complexity $O(n^2)$ in worst and average cases. Merge sort seems to be the most efficient algorithm in general among all.