

# **Analysis of Algorithms I**

## **Assignment II**

### **Report**

In this assignment, we were supposed to implement quick sort and use it for given data set for different cases. I used pseudo code from lecture slides and this what I wrote:

```
int partition(Residence *R, int first, int last){
    Residence temp;
    Residence pivot = R[last];
    int i = first-1;
    for(int j=first; j<last; j++){
        if(R[j].population< pivot.population ||
(R[j].population==pivot.population && R[j].geo_id<pivot.geo_id)){
            i++;
            //swapping A[i] and A[j]
            temp = R[i];
            R[i] = R[j];
            R[j] = temp;
        }
    }
    //swapping A[i+1] and A[last]
    temp = R[i+1];
    R[i+1] = R[last];
    R[last] = temp;
    return i+1;
}

void quickSort(Residence *R,int first_index, int last_index){
    if (first_index < last_index){
        int q = partition(R,first_index,last_index);
        quickSort(R, first_index, q-1);
        quickSort(R, q+1, last_index);
    }
}
```

For finding the asymptotic upper bound on the running time for Quicksort, we should consider worst case for it. **Worst-case is splitting arrays every time to 0:n-1 sized subarrays.** So, we can calculate upper bound with this recursive equation:

$T(n) = T(0) + T(n-1) + O(n)$   $O(n)$  absorbs  $T(0) = 1$ . So equation becomes to

$$T(n) = T(n-1) + O(n)$$

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

$$T(n-2) = T(n-3) + O(n-2)$$

$$\begin{array}{l} \cdot \\ \cdot \\ \cdot \end{array}$$

$$T(2) = T(1) + O(2)$$

When we sum all of these equations, it returns to the equation below:

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

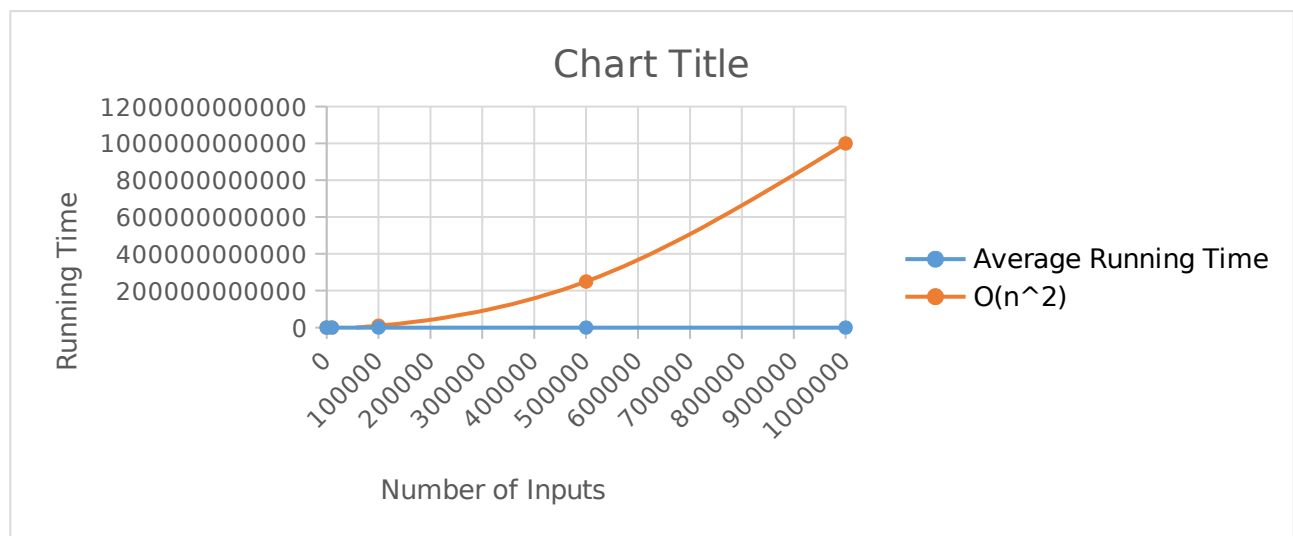
**As a result, asymptotic upper bound on the running time for Quicksort is  $O(n^2)$ .**

## Testing

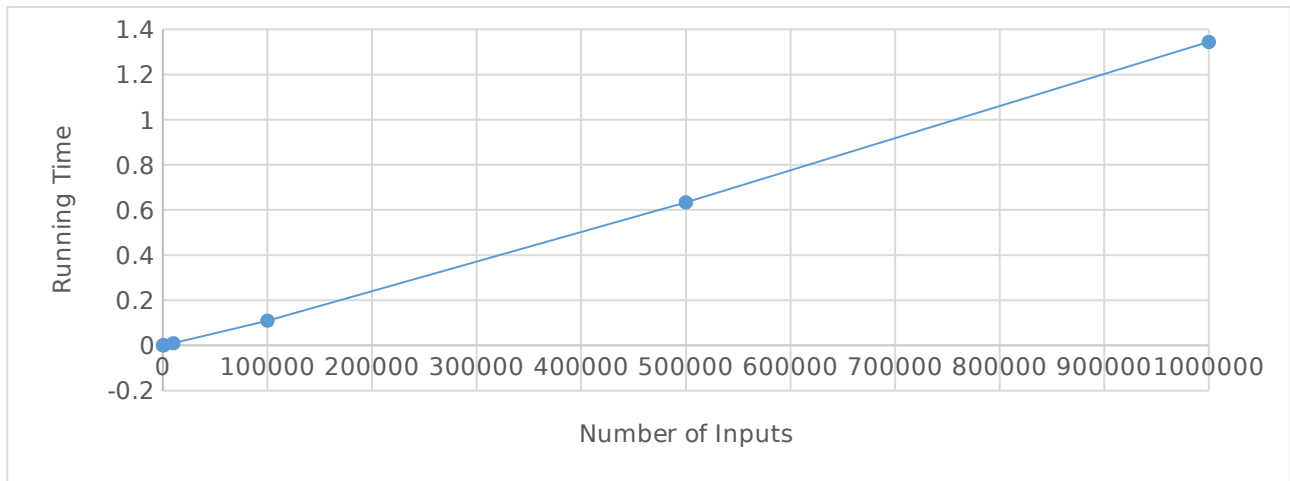
We're asked to test our code for different size of arrays and calculate average running times. The table which contains measured running times is:

N=10	N=100	N=1000	N=10000	N=100000	N=500000	N=1000000	
5e-06 s	3.5e-05 s	0.000551 s	0.008749 s	0.11142 s	0.62968 s	1.34036 s	
5e-06 s	6e-05 s	0.000627 s	0.008448 s	0.110808 s	0.616328 s	1.27995 s	
4e-06 s	5.4e-05 s	0.000548 s	0.00897 s	0.107126 s	0.643067 s	1.34887 s	
4e-06 s	4e-05 s	0.000656 s	0.012251 s	0.112127 s	0.649626 s	1.32986 s	
5e-06 s	4.5e-05 s	0.00054 s	0.009335 s	0.111306 s	0.623603 s	1.30351 s	
7e-06 s	5e-05 s	0.000696 s	0.009195 s	0.106286 s	0.631918 s	1.39136 s	
6e-06 s	4.1e-05 s	0.00068 s	0.008689 s	0.10962 s	0.635592 s	1.38084 s	
4e-06 s	4.7e-05 s	0.00065 s	0.008188 s	0.110874 s	0.630514 s	1.46867 s	
3e-06 s	4.6e-05 s	0.000642 s	0.008875 s	0.108794 s	0.616693 s	1.3269 s	
5e-06 s	3.9e-05 s	0.000627 s	0.008241 s	0.105706 s	0.656643 s	1.27093 s	
<b><u>4,8*10<sup>-6</sup>s</u></b>	<b><u>4,57*10<sup>-5</sup>s</u></b>	<b><u>6,217*10<sup>-4</sup>s</u></b>	<b><u>0,0090941 s</u></b>	<b><u>0,1094067 s</u></b>	<b><u>0,6333664 s</u></b>	<b><u>1,344125 s</u></b>	<b>Average</b>

Note: For taking different array groups, I skipped lines arbitrarily from the beginning and then parsed N lines. After that, I sorted the data and measured running time during the Quicksort process. When we translate these measured values to a graph, it looks like below:



Pay attention that, average running time is always beneath of worst case  $O(n^2)$ . When we look at closer to Average running time:

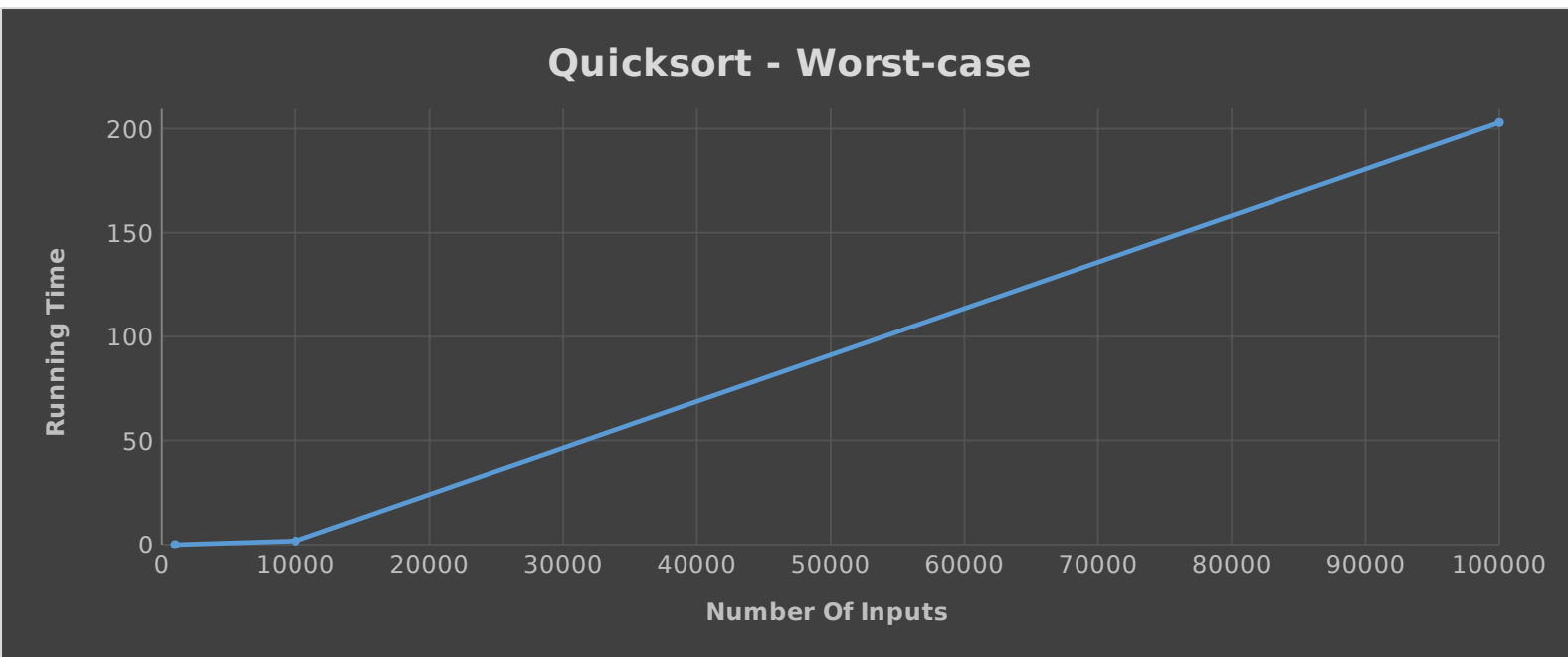


For the second part of testing, I created new data sets for simulating worst-case for Quicksort. **Every time, partition split 0:n-1 size of subarrays.** Here is the measured running time for this case:

N=10	N=100	N=1000	N=10000	N=100000	N=500 K	N=1 M	
6e-06 s	5.1e-05 s	0.005256 s	0.463531 s	63.2568 s			
6e-06 s	6e-05 s	0.00818 s	0.385319 s	100.464 s			
7e-06 s	6.6e-05 s	0.001477 s	0.980894 s	292.312 s			
8e-06 s	4.7e-05 s	0.008431 s	2.95864 s	290.773 s			
10e-06 s	10.3e-05 s	0.035456 s	2.9792 s	221.948 s			
9e-06 s	62.5e-05 s	0.036195 s	2.27637 s	258.004 s			
12e-06 s	39.5e-05 s	0.024403 s	2.69917 s	137.782 s			
6e-06 s	25.5e-05 s	0.02909 s	1.18646 s	185.237 s			
7e-06 s	34.3e-05 s	0.01241 s	1.81208 s	198.188 s			
9e-06 s	15.9e-05 s	0.020548 s	0.590088 s	281.859 s			
<b><u>8*10<sup>-6</sup>s</u></b>	<b><u>21.04*10<sup>-5</sup>s</u></b>	<b><u>0,0157043 s</u></b>	<b><u>1,7031752 s</u></b>	<b><u>202,98238 s</u></b>			<b>Average</b>

I couldn't find any results for 500K and 1M for the worst-case because I faced with the error of segmentation fault. I tried 2 times for 500K and once for 1M, but after 4-5 hours, program stopped executing. That's why last 2 columns of the table aren't filled.

The graph below is plotted according to the obtained data:



Although the runtime for inputs of 10-100-1000 is only about 10 times higher, execution time for sorting rises almost 1000 times for 10K and 100K inputs. **For handling worst-case situation, we should select random pivot rather than first or last element.** It's called randomized Quicksort and it gives better result than normal Quicksort algorithm.

## Stability

Quicksort is not a stable sort algorithm. We can prove that by illustrating how it works for sorting 10 inputs.

I used this data for showing that Quicksort is not stable;

```
0,5,9,male,99927,8600000US99927
24,5,9,male,62356,8600000US62356
1,21,21,male,786,8600000US00786
24,40,44,male,62355,8600000US62355
1,0,0,female,906,8600000US00906
0,25,29,female,99927,8600000US99927
24,30,34,male,62355,8600000US62355
2,60,61,female,12738,8600000US12738
2,22,24,male,12738,8600000US12738
24,40,44,female,62358,8600000US62358
3,70,74,female,49863,8600000US49863
```

I printed the array in each iteration and this is the result:

Note: This table doesn't have gender and geo\_id values.

Note-2 : The last element, 3,70,74,49863 , is selected as a pivot.

1,21,21,786	1,21,21,786	1,21,21,786	1,21,21,786	1,21,21,786	1,21,21,786
24,5,9,62356	1,0,0,906	1,0,0,906	1,0,0,906	1,0,0,906	1,0,0,906
24,40,44,62355	24,40,44,62355	0,25,29,99927	0,25,29,99927	0,25,29,99927	0,25,29,99927
1,0,0,906	24,5,9,62356	24,5,9,62356	2,60,61,12738	2,60,61,12738	2,60,61,12738
0,25,29,99927	0,25,29,99927	24,40,44,62355	24,40,44,62355	2,22,24,12738	2,22,24,12738
24,30,34,62355	24,30,34,62355	24,30,34,62355	24,30,34,62355	24,30,34,62355	3,70,74,49863
2,60,61,12738	2,60,61,12738	2,60,61,12738	24,5,9,62356	24,5,9,62356	24,5,9,62356
2,22,24,12738	2,22,24,12738	2,22,24,12738	2,22,24,12738	24,40,44,62355	24,40,44,62355
24,40,44,62358	24,40,44,62358	24,40,44,62358	24,40,44,62358	24,40,44,62358	24,40,44,62358
3,70,74,49863	3,70,74,49863	3,70,74,49863	3,70,74,49863	3,70,74,49863	24,30,34,62355

The result of residences with equal number of population, 24, proves the Quicksort isn't stable.

Because after the sort, they are rearranged in each other.