

VIETNAM NATIONAL UNIVERSITY, HO CHI MINH

UNIVERSITY OF SCIENCE

INFORMATION TECHNOLOGY

KNOWLEDGE ENGINEERING DEPARTMENT

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**Report: Sorting Research**

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**Course: CSC10004 — Data Structures & Algorithms**

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# Contents

<b>1</b>	<b>Information Page</b>	<b>2</b>
<b>2</b>	<b>Introduction Page</b>	<b>3</b>
<b>3</b>	<b>Algorithm Presentation</b>	<b>4</b>
3.1	Selection sort . . . . .	4
3.2	Insertion sort . . . . .	4
3.3	Bubble sort . . . . .	5
3.4	Shaker sort (Cocktail sort) . . . . .	6
3.5	Shell sort . . . . .	6
3.6	Heap sort . . . . .	7
3.6.1	Heap data structure . . . . .	7
3.6.2	Build a min-heap . . . . .	8
3.6.3	Build a max-heap . . . . .	8
3.6.4	Pseudocodes . . . . .	8
3.7	Merge sort . . . . .	9
3.8	Quick sort . . . . .	10
3.9	Counting sort . . . . .	11
3.10	Radix sort . . . . .	12
3.11	Flash sort . . . . .	12
3.11.1	Stage 1: Classification of elements of the array . . . . .	13
3.11.2	Stage 2: Partition of elements . . . . .	13
3.11.3	Stage 3: Sort the elements in each partition . . . . .	14
3.11.4	Complexity . . . . .	14
<b>4</b>	<b>Experimental Result and Comments</b>	<b>15</b>
4.1	Tables of running time and comparisons count . . . . .	15
4.2	Line graphs of running time . . . . .	19
4.3	Bar charts of comparisons . . . . .	22
4.4	Comments . . . . .	24
<b>5</b>	<b>Project organization and Programming notes</b>	<b>24</b>
5.1	Project organization . . . . .	24
5.2	Programming notes . . . . .	25
<b>6</b>	<b>List of References</b>	<b>26</b>

# 1 Information Page

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**Subject:** Data Structures And Algorithms

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**Topic:** Sorting Algorithms Overview

## 2 Introduction Page

I have completed 11/11 required algorithms, including selection sort, insertion sort, bubble sort, shaker sort, shell sort, heap sort, merge sort, quick sort, counting sort, radix sort, and flash sort. I have completed 5/5 commands for output specifications, 3 for algorithm mode, and 2 for comparison mode.

Below are the hardware specifications of the computer I used to run these algorithms:

- Intel(R) Core(TM) i7-8750H CPU @ 2.20GHz
- RAM: 8 GB
- OS: Ubuntu 22.04

## 3 Algorithm Presentation

Most of pseudocodes in this section will be presented in Pascal, with the 1-base array.

### 3.1 Selection sort

Selection sort is one of the simplest sorting algorithms.

Basic ideas of this algorithm is as followed:

- In the first turn, choose the minimum element in  $a[1..n]$ , then swap it with  $a[1]$ , that means  $a[1]$  becomes the minimum element of the array.
- In the second turn, choose the minimum element in  $a[2..n]$ , then swap it with  $a[2]$ , so that  $a[2]$  becomes the second lowest element of the array.
- ...
- In the  $i$ -th turn, choose the minimum in  $a[i..n]$ , then swap it with  $a[i]$ .
- In the  $(n-1)$ -th turn, choose the lower between  $a[n-1]$  and  $a[n]$ , then swap it with  $a[n-1]$ .

**Pseudocodes:** [1]

```

1 begin
2   for i := 1 to n - 1 do
3     begin
4       jmin := i;
5       for j := i + 1 to n do
6         if (a[j] < a[jmin]) then jmin := j;
7       if (jmin != i) then swap(a[jmin], a[i]);
8     end
9 end

```

Listing 1: Selection sort

**Time complexity:** [3]

- Worst case:  $O(n^2)$ .
- Best case:  $O(n^2)$ .
- Average case:  $O(n^2)$ .

**Space complexity:**  $O(1)$ . [3]

### 3.2 Insertion sort

**Ideas:** Consider the array  $a[1..n]$ .

We see that the subarray with only one element  $a[1]$  can be seen as sorted.

Consider  $a[2]$ , we compare it with  $a[1]$ , if  $a[2] \geq a[1]$ , we insert it before  $a[1]$ .

With  $a[3]$ , we compare it with the sorted subarray  $a[1..2]$ , find the position to insert  $a[3]$  to that subarray to have an ascending order.

In a general speech, we will sort the array  $a[1..k]$  if the array  $a[1..k-1]$  is already sorted by inserting  $a[k]$  to the appropriate position.

**Pseudocodes:** [1]

```
1 begin
2   for i := 2 to n do
3     begin
4       temp := a[i];
5       j := i - 1;
6       while (j > 0) and (temp < a[j]) do
7         begin
8           a[j + 1] = a[j];
9           dec(j);
10        end
11        a[j + 1] = temp;
12    end
13 end
```

Listing 2: Insertion sort

**Time complexity:** [4]

- Worst case:  $O(n^2)$ .
- Best case:  $O(n)$ , in case the array is already sorted.
- Average case:  $O(n^2)$ .

**Space complexity:**  $O(1)$ . [4]

**Improvements:**

- Binary insertion sort — find the position to insert using binary search, which reduces the number of comparisons. Details at link: [5].
- Another improvement of insertion sort is shell sort, which will be presented in section 3.5

### 3.3 Bubble sort

**Ideas:** Bubble sort is the simplest sorting algorithm, which swaps the adjacent elements if they are in wrong order, repeatedly  $n$  times.

After the  $i$ -th turn, the  $i$ -th smallest element will be swapped to position  $i$ .

**Pseudocodes:** [1]

```
1 begin
2   for i := 2 to n do
3     for j := n downto i do
4       if (a[j - 1] > a[j]) then swap(a[j - 1], a[j]);
5   end
```

Listing 3: Bubble sort

**Time complexity:**  $O(n^2)$ , not mentioned how the input data is. [1]

**Space complexity:**  $O(1)$ . [4]

**Variations:** There are some variations in the implementation.

- Instead of top-down with  $j$ , we can iterate from the bottom up, from  $i + 1$  to  $n$ .
- Another variation is  $j$  iterates from 1 to  $n - i$ . This is the version that I choose in my project.

**Improvements:** An improvement of bubble sort is shaker sort, which we will research in section 3.4.

### 3.4 Shaker sort (Cocktail sort)

**Ideas:** Shaker sort, also called cocktail sort or bi-directional bubble sort, is an improvement of bubble sort. In bubble sort, elements are traversed from left to right, i.e. in one direction only. But shaker sort will traverse in both direction, from left to right and from right to left, alternatively. [7]

**Pseudocode:** [2]

```

1 begin
2   left := 2;
3   right := n;
4   k := n;
5   repeat
6     begin
7       for j := right downto left do
8         if (a[j - 1] > a[j]) then
9           begin
10            swap(a[j - 1], a[j]);
11            k = j;
12          end
13       left = k + 1; //the last swap position
14       for j := left to right do
15         if (a[j - 1] > a[j]) then
16           begin
17            swap(a[j - 1], a[j]);
18            k = j;
19          end
20       right = k - 1;
21     end
22   until left > right;
23
24
25 end

```

Listing 4: Shaker sort

**Time complexity:** [8]

- Worst case:  $O(n^2)$ .
- Best case:  $O(n)$ , in case the array is already sorted.
- Average case:  $O(n^2)$ .

**Space complexity:**  $O(1)$ . [8]

### 3.5 Shell sort

A drawback of insertion sort is that we always have to insert an element to a position near the beginning of the array. In that case, we use shell sort.

**Ideas:** Consider an array  $a[1..n]$ . For an integer  $h : 1 \leq h \leq n$ , we can divide the array into  $h$  subarrays:

- Subarray 1:  $a[1], a[1 + h], a[1 + 2h] \dots$
- Subarray 2:  $a[2], a[2 + h], a[2 + 2h] \dots$

- ...
- Subarray  $h$ :  $a[h]$ ,  $a[2h]$ ,  $a[3h]$  ...

Those subarrays are called subarrays with step  $h$ . With a step  $h$ , shell sort will use insertion sort for independent subarrays, then similarly with  $\frac{h}{2}, \frac{h}{4}, \dots$  until  $h = 1$ .

**Pseudocodes:**

```

1 begin
2   gap := n div 2;
3   while (gap > 0) do
4     begin
5       for i := gap to n do
6         begin
7           j := i - gap;
8           k := a[i];
9           while (j > 0 and a[j] > k) do
10            begin
11              a[j + gap] := a[j];
12              j = j - gap;
13            end
14            a[j + gap] := k;
15          end
16          gap := gap div 2;
17        end
18      end

```

Listing 5: Shell sort

**Time complexity:** [9]

- Worst case:  $O(n^2)$ .
- Best case:  $O(n \log n)$ .
- Average case: depends on the gap sequence.

**Space complexity:**  $O(1)$ . [9]

## 3.6 Heap sort

Heap sort was invented by J. W. J. Williams in 1981, this algorithm not only introduced an effective sorting algorithm but also built an important data structures to represent priority queues: heap data structure.

### 3.6.1 Heap data structure

Heap is a special binary tree. A binary tree is said to follow a heap data structure if:

- it is a complete binary tree,
- all nodes in the tree satisfy that they are greater than their children, i.e. the greatest element is the root. Such a heap is called a max-heap. If instead, all nodes are smaller than their children, it is called a min-heap. [10]



Figure 1: Max-heap and min-heap. Source: [10]

### 3.6.2 Build a min-heap

To build a min heap, we: [11]

- Create a new child node at the end of the heap (last level).
- Add the new key to that node (append it to the array).
- Move the child up until we reach the root node and the heap property is satisfied.

To remove/delete a root node in a min heap, we: [11]

- Delete the root node.
- Move the key of last child to root.
- Compare the parent node with its children.
- If the value of the parent is greater than its children, swap them, and repeat until the heap property is satisfied.

### 3.6.3 Build a max-heap

Building a max-heap is similar to building a min-heap.

### 3.6.4 Pseudocodes

```

1 heapify(a[1..n], i)
2 begin
3   max = i;
4   left = 2 * i;
5   right = 2 * i + 1;
6   if (left <= n and a[left] > a[max]) then max = left;
7   if (right <= n and a[right] > a[max]) then max = right;
8   if (max != i) then
9     begin
10      swap(a[i], a[max]);
11      heapify(a, n, max);
12    end
13  end
14
15 heapsort(a[1..n])
16 begin
17   for i := n div 2 - 1 downto 1 do heapify(a, i);
18   for i := n downto 1 do
19     begin
20      swap(a[0], a[i]);
21      heapify(a[1..i], 0)
22    end

```

23 **end**

## Listing 6: Heap sort

**Time complexity:** [10]

- Worst case:  $O(n \log n)$ .
- Best case:  $O(n \log n)$ .
- Average case:  $O(n \log n)$ .

**Space complexity:**  $O(1)$ . [10]

### 3.7 Merge sort

Merge sort is a divide-and-conquer algorithm that was invented by John von Neumann in 1945. This is one of the most popular sorting algorithms.

**Ideas:**

- Divide the array into two subarrays at the middle position.
- Try to sort both subarrays, if we have not reached the base case yet, continue to divide them into subarrays.
- Merge the sorted subarrays.

**Pseudocodes:**

```

1 mergeSort(a[1..n])
2 begin
3   if (n <= 1) do return;
4   mid := n div 2;
5   left[1..mid] := a[1..mid];
6   right[1..n - mid] := a[mid + 1..n];
7
8   mergeSort(left[1..mid]);
9   mergeSort(right[1..n - mid]);
10
11  i := 1; j := 1; k := 1;
12  while (i <= mid and j <= n - mid)
13  begin
14    if (left[i] < right[j]) do
15    begin
16      a[k] := left[i];
17      k := k + 1;
18      i := i + 1;
19    end
20    else
21    begin
22      a[k] := right[j];
23      k := k + 1;
24      j := j + 1;
25    end
26  end

```

```

27  while (i <= mid) do
28  begin
29      a[k] := left[i];
30      k := k + 1;
31      i := i + 1;
32  end
33  while (j <= n - mid) do
34  begin
35      a[k] := right[j];
36      k := k + 1;
37      j := j + 1;
38  end
39  end

```

Listing 7: Merge sort

**Time complexity:** [12]

- Worst case:  $O(n \log n)$ .
- Best case:  $O(n \log n)$ .
- Average case:  $O(n \log n)$ .

**Space complexity:**  $O(n)$ . [12]

### 3.8 Quick sort

Quicksort is a divide-and-conquer algorithm, introduced by C. A. R. Hoare, an English computer scientist, in 1960. It has become widely used due to its efficient, and is now one of the most popular sorting algorithms.

**Ideas:**

- Sorting the array  $a[1..n]$  can be seen as sorting the segment from index 1 to index  $n$  of that array.
- To sort a segment, if that segment has less than 2 elements, then we have to do nothing, else we choose a random element to be the "pivot". All elements that are less than pivot will be arranged to a position before pivot, and all ones that are greater than pivot will be arranged to a position after pivot.
- After that, the segment is divided into two segments, all elements in the first segment are less than pivot, and all elements in the second segment are greater than pivot. And now we have to sort two new segments, which have lengths smaller than the length of the initial segment.

In this project, I will choose the middle elements of the segments to be the pivot.

**Pseudocodes:** [2].

```

1  partition(a[1..n], l, r)
2  begin
3      mid := (l + r) div 2;
4      pivot := a[mid];
5      i := l - 1, j := r + 1;
6      repeat

```

```

7     repeat
8         inc(i);
9     until (a[i] >= p);
10    repeat
11        dec(j);
12    until (a[j] <= p)
13    swap(a[i], a[j]);
14 until (i >= j);
15 swap(a[i], a[j]);
16 swap(a[mid], a[j]);
17 return j;
18 end
19
20 quicksort(a[1..n], l, r)
21 begin
22     if (l < r) then
23     begin
24         s := partition(a, l, r);
25         quicksort(a, l, s - 1);
26         quicksort(a, s + 1, r);
27     end
28 end

```

Listing 8: Quick sort

**Time complexity:** [13]

- Worst case:  $O(n^2)$ .
- Best case:  $O(n \log n)$ .
- Average case:  $O(n \log n)$ .

**Space complexity:**  $O(1)$ . [13]

**Variations:** Below is the implementation of quicksort using recursion. There is also an iterative algorithms, which can be found at: [14]

### 3.9 Counting sort

Counting sort is a sorting algorithm working by counting the number of objects having distinct key values (a kind of hashing). [15]

**Ideas:** Iterate through the input, count the number of times each item occurs, then use those results to calculate an item's index in the sorted array. [16]

This algorithm works when the array contains of nonnegative integers in range  $[l, u]$ . The case that array is negative, the algorithms can also work but I will not mention it here.

**Pseudocodes:** [2]

```

1 countingsort(a[1..n])
2 begin
3     f[0..u] := {0};
4     for i:= 1 to n do inc(f[a[i]]);
5     for i:= 1 to u do f[i] := f[i - 1] + f[i];
6     //after this step, f[i] will be the number of elements that are less
7     than or equal to i.

```

```

8  b[1..n];
9  for i := n downto 1 do
10 begin
11     b[f[a[i]]] = a[i];
12     dec(f[a[i]]);
13 end
14 a := b;
15 end

```

Listing 9: Counting sort

Counting sort works well when  $n \approx u$ , but it will be "disastrous" if  $u \gg n$ . [2]

**Time complexity:**  $O(n + u)$ . [15]

**Space complexity:**  $O(n + u)$ . [15]

### 3.10 Radix sort

Like counting sort mentioned in section 3.9, radix sort only works with integer.

**Ideas:** sort the array using counting sort (or any stable algorithms) according to the  $i$ -th digit. [17]

Let  $d$  be the maximum number of digits of elements in the array, and  $b$  be the base used to represent array, for example, for decimal system,  $b = 10$ .

**Pseudocodes:** [2]

```

1  sort(a[1..n], k)
2  begin
3      f[0..b - 1] := {0};
4      for i := 1 to n do inc(f[digit(a[i], k)]);
5      for i := 1 to b - 1 to f[i] := f[i] + f[i - 1];
6      b[1..n]
7      for i := n downto 1 do
8          begin
9              j := digit(a[i], k);
10             b[f[j]] = a[i];
11             f[j]--;
12         end
13     a := b;
14 end
15
16 LSDradixsort(a[1..n], d)
17 begin
18     for k := 0 to d do sort(a, k);
19 end

```

Listing 10: Radix sort

**Time complexity:**  $O(d(n + b))$ . [17]

**Space complexity:**  $O(n)$ . [17]

### 3.11 Flash sort

Flash sort is a distribution sorting algorithm, which has the time complexity approximately linear complexity. [18] Flash sort was invented by Dr. Neubert in 1997. He named the algorithm "flash"

sort because he was confident that this algorithm is very fast.

**Ideas:** The algorithm is divided into three stages. [2] [19]

- Stage 1: Classification of elements of the array.
- Stage 2: Partition of elements.
- Stage 3: Sort the elements in each partition.

### 3.11.1 Stage 1: Classification of elements of the array

Let  $m$  be the number of classes. The element  $a_i$  will be in the  $k$ -th class with:

$$k_{a_i} = \left\lfloor \frac{(m-1)(a_i - \min_a)}{\max_a - \min_a} \right\rfloor + 1.$$

**Pseudocodes:** [2]

```

1 L[1..m] := {0};
2 for i := 1 to n do
3 begin
4   k := (m - 1) * (a[i] - min) div (max - min);
5   inc(L[k]);
6 end
7 for k:= 2 to n do
8 begin
9   L[k] := L[k] + L[k - 1];
10 end

```

Listing 11: Flash sort - stage 1

After this stage,  $L[k]$  will point to the right boundary of the  $k$ -th class.

### 3.11.2 Stage 2: Partition of elements

The elements are sorted by *in situ permutation*. During the permutation, the  $L[k]$  are decremented by a unit step at each new placement of an element of class  $k$ . A crucial aspect of this algorithm is identifying new cycle leaders. A cycle ends, if the vector  $L[k]$  points to the position of an element below boundary of class  $k$ . The new cycle leader is the element situated in the lowest position complying to the complimentary condition, i.e. for which  $L[k]$  points to a position with  $i \leq L_{k_{a_i}}$ . [19]

**Pseudocodes:** [2]

```

1 count := 1;
2 i := 1;
3 k := m;
4 while (count <= n) do
5 begin
6   while (i > L[k]) do
7     begin
8       inc(i);
9       k := (m - 1) * (a[i] - min) div (max - min) + 1;
10    end
11    x := a[i];

```

```

12  while (i <= L[k]) do
13  begin
14      k := (m - 1) * (x - min) div (max - min) + 1;
15      y := a[L[k]];
16      a[L[k]] := x;
17      x := y;
18      dec(L[k]);
19      inc(count);
20  end
21 end

```

Listing 12: Flash sort - stage 2

### 3.11.3 Stage 3: Sort the elements in each partition

A small number of partially distinguishable elements are sorted locally within their classes either by recursion or by a simple conventional sort algorithm. [19]

In this project, I will choose insertion sort for this stage.

**Pseudocodes:** [2]

```

1  for k := 2 to m do
2  begin
3      for i := L[k] - 1 to L[k - 1] do
4          begin
5              if (a[i] > a[i + 1]) then
6                  begin
7                      t := a[i];
8                      j := i;
9                      while (t > a[j + 1]) do
10                     begin
11                         a[j] := a[j + 1];
12                         inc(j);
13                     end
14                     a[j] := t;
15                 end
16             end
17         end

```

Listing 13: Flash sort - stage 3

This code is written correctly because the last class only contains of maximum element of the array, therefore it has been already sorted.

### 3.11.4 Complexity

**Time complexity:**  $O\left(\frac{n^2}{m}\right)$ .

Experiments has shown that  $m \approx 0.43n$  will be the best for this algorithm. In that case, time complexity of the algorithm is linear. [2]

**Space complexity:**  $O(m)$ .

## 4 Experimental Result and Comments

### 4.1 Tables of running time and comparisons count

Data order: Randomized						
Data size	10000		30000		50000	
Resulting statics	Running time	Comparisons	Running time	Comparisons	Running time	Comparisons
Selection sort	0.125588	100019998	1.02347	90059998	2.81835	2500099998
Insertion sort	0.060877	50096183	0.53271	452071438	1.46487	1250497473
Bubble sort	0.275781	100009999	2.70246	900029999	8.1757	2500049999
Shaker sort	0.221612	66920546	2.01225	602416029	5.53941	1668740213
Shell sort	0.001633	630438	0.00589	2331067	0.013429	4629303
Heap sort	0.009767	89996	0.007112	269996	0.018274	449996
Merge sort	0.003842	337226	0.010604	1104458	0.018144	1918922
Quick sort	0.001064	268649	0.003564	918072	0.006575	1571763
Counting sort	0.000272	50004	0.00088	150004	0.001899	250004
Radix sort	0.000581	140058	0.003068	510072	0.00367	850072
Flash sort	0.000342	98814	0.001074	301965	0.002341	479127

Table 1: Data order: Randomized - table 1

Data order: Randomized						
Data size	100000		300000		500000	
Resulting statics	Running time	Comparisons	Running time	Comparisons	Running time	Comparisons
Selection sort	11.2068	10000199998	98.3619	90000599998	298.723	250000999998
Insertion sort	5.781	5019075369	52.6586	44979677317	145.002	124933091986
Bubble sort	31.7843	10000099999	290.83	90000299999	805.643	250000499999
Shaker sort	22.3527	6684229390	203.353	59984439772	564.835	166525795318
Shell sort	0.025796	10033440	0.085129	36188397	0.153476	67911677
Heap sort	0.027132	899996	0.116084	2699996	0.179792	4499996
Merge sort	0.018512	4037850	0.060769	13051418	0.105907	22451418
Quick sort	0.013801	3302209	0.042058	10782282	0.073066	19032583
Counting sort	0.001915	500004	0.005841	1500004	0.012324	2500004
Radix sort	0.007252	1700072	0.025703	6000086	0.0458	10000086
Flash sort	0.00513	1019156	0.017335	3047744	0.036041	4843142

Table 2: Data order: Randomized - table 2



Data order: Sorted						
Data size	10000		30000		50000	
Resulting statics	Running time	Comparisons	Running time	Comparisons	Running time	Comparisons
Selection sort	0.113015	100019998	1.00498	900059998	2.81835	2500099998
Insertion sort	$3.6 \cdot 10^{-5}$	29998	0.0001	89998	0.000169	149998
Bubble sort	0.114492	100009999	1.00117	900029999	2.77147	2500049999
Shaker sort	$3 \cdot 10^{-5}$	20002	$6.7 \cdot 10^{-5}$	60002	0.000445	100002
Shell sort	0.000429	360042	0.00177	1170050	0.002384	2100049
Heap sort	0.003071	89996	0.005536	269996	0.010559	449996
Merge sort	0.000969	337226	0.002866	1104458	0.009389	1918922
Quick sort	0.000245	154959	0.000815	501929	0.001504	913850
Counting sort	0.000188	50004	0.000448	150004	0.000998	250004
Radix sort	0.000579	140058	0.003068	510072	0.00367	850072
Flash sort	0.000286	127992	0.000863	383992	0.001465	639992

Table 3: Data order: Sorted - table 1

Data order: Sorted						
Data size	100000		300000		500000	
Resulting statics	Running time	Comparisons	Running time	Comparisons	Running time	Comparisons
Selection sort	11.2068	10000199998	98.3619	90000599998	298.723	250000999998
Insertion sort	0.000325	299998	0.00099	899998	0.001617	1499998
Bubble sort	11.0277	10000099999	102.55	90000299999	278.658	250000499999
Shaker sort	0.000561	200002	0.000648	600002	0.001081	1000002
Shell sort	0.005229	4500051	0.018094	15300061	0.030237	25500058
Heap sort	0.032474	899996	0.072256	2699996	0.121933	4499996
Merge sort	0.011628	4037850	0.034167	13051418	0.059151	22451418
Quick sort	0.003875	1927691	0.01214	6058228	0.017523	10310733
Counting sort	0.001403	500004	0.004284	1500004	0.007221	2500004
Radix sort	0.007746	1700072	0.030804	6000086	0.045303	10000086
Flash sort	0.002968	1279992	0.00882	3839992	0.014181	6399992

Table 4: Data order: Sorted - table 2

Data order: Reversed						
Data size	10000		30000		50000	
Resulting statics	Running time	Comparisons	Running time	Comparisons	Running time	Comparisons
Selection sort	0.10871	100019998	0.959207	900059998	2.79584	2500099998
Insertion sort	0.119653	100009999	1.04109	900029999	2.95031	2500049999
Bubble sort	0.261722	100009999	2.17328	900029999	6.11784	2500049999
Shaker sort	0.252528	100005001	2.24013	900015001	6.17515	2500025001
Shell sort	0.000561	475175	0.003068	1554051	0.003583	2844628
Heap sort	0.003353	89996	0.005536	269996	0.010559	449996
Merge sort	0.001244	337226	0.003341	1104458	0.00547	1918922
Quick sort	0.00028	164975	0.000948	531939	0.001639	963861
Counting sort	0.000137	50004	0.000929	150004	0.000998	250004
Radix sort	0.000598	140058	0.002213	510072	0.003443	850072
Flash sort	0.000267	110501	0.000806	331501	0.001302	552501

Table 5: Data order: Reversed - table 1

Data order: Reversed						
Data size	100000		300000		500000	
Resulting statics	Running time	Comparisons	Running time	Comparisons	Running time	Comparisons
Selection sort	10.7125	10000199998	95.9219	90000599998	267.031	250000999998
Insertion sort	11.5629	10000099999	103.857	90000299999	291/045	250000499999
Bubble sort	24.4371	10000099999	221.602	90000299999	616.86	250000499999
Shaker sort	24.8658	10000050001	226.276	90000150001	628.922	250000250001
Shell sort	0.007358	6089190	0.023358	20001852	0.04012	33857581
Heap sort	0.021055	899996	0.068389	2699996	0.123764	4499996
Merge sort	0.011581	4037850	0.033862	13051418	0.058475	22451418
Quick sort	0.00334	2027703	0.01059	6358249	0.017891	10810747
Counting sort	0.001819	500004	0.0049	1500004	0.007136	2500004
Radix sort	0.007137	1700072	0.025565	6000086	0.042483	10000086
Flash sort	0.002797	1105001	0.009906	3315001	0.013324	5525001

Table 6: Data order: Reversed - table 2

Data order: Nearly sorted						
Data size	10000		30000		50000	
Resulting statics	Running time	Comparisons	Running time	Comparisons	Running time	Comparisons
Selection sort	0.114235	100019998	1.01536	900059998	2.79563	2500099998
Insertion sort	0.00027	219622	0.000755	595570	0.001001	858990
Bubble sort	0.113966	100009999	0.98869	900029999	2.76097	2500049999
Shaker sort	0.000583	219726	0.001456	603170	0.001938	873634
Shell sort	0.000578	416560	0.00194	1321108	0.005379	2380925
Heap sort	0.002457	89996	0.00639	269996	0.011723	449996
Merge sort	0.001216	337226	0.004687	1104458	0.006034	1918922
Quick sort	0.000246	154999	0.000826	501973	0.001523	913898
Counting sort	0.000152	50004	0.00046	150004	0.000718	250004
Radix sort	0.000592	140058	0.002119	510072	0.003794	850072
Flash sort	0.000289	127968	0.000882	383962	0.001456	639962

Table 7: Data order: Nearly sorted - table 1

Data order: Nearly sorted						
Data size	100000		300000		500000	
Resulting statics	Running time	Comparisons	Running time	Comparisons	Running time	Comparisons
Selection sort	11.5729	10000199998	97.5573	90000599998	278.073	250000999998
Insertion sort	0.002272	1975946	0.005013	4436926	0.00916	8122834
Bubble sort	11.0646	10000099999	99.9988	90000299999	279.598	250000499999
Shaker sort	0.011098	1970942	0.009868	4528281	0.01822	8481121
Shell sort	0.008393	5163287	0.030022	16635275	0.035062	27752013
Heap sort	0.022278	899992	0.097582	2699999	0.121831	4499996
Merge sort	0.011873	4037850	0.033909	13051418	0.059821	22451418
Quick sort	0.003395	1927735	0.010117	6058260	0.017855	10310769
Counting sort	0.001416	500004	0.004279	1500004	0.008047	2500004
Radix sort	0.007354	1700072	0.025246	6000086	0.045863	10000086
Flash sort	0.003038	1279962	0.008703	3839958	0.014624	6399962

Table 8: Data order: Nearly sorted - table 2

## 4.2 Line graphs of running time

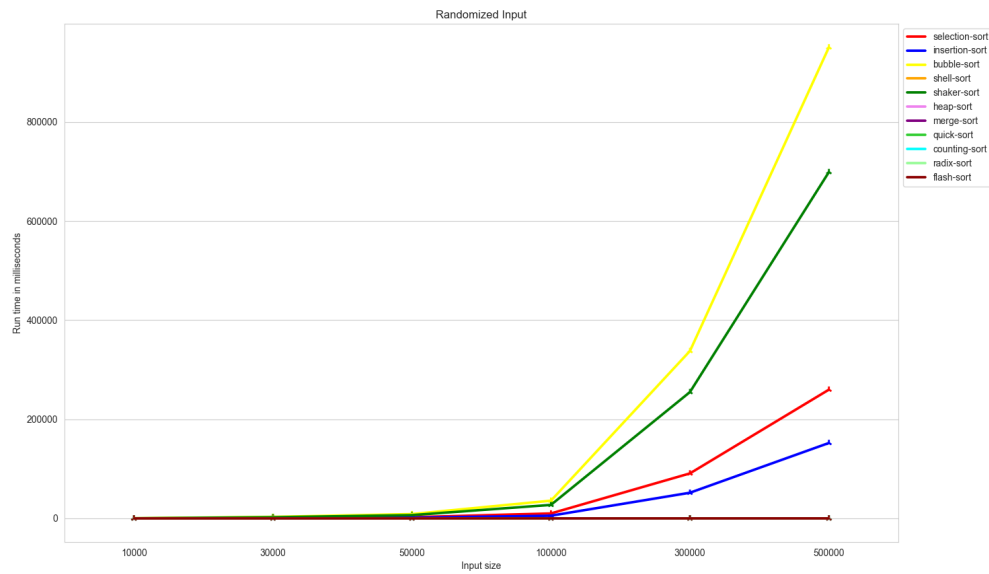


Figure 2: Line graph of running time for randomized input

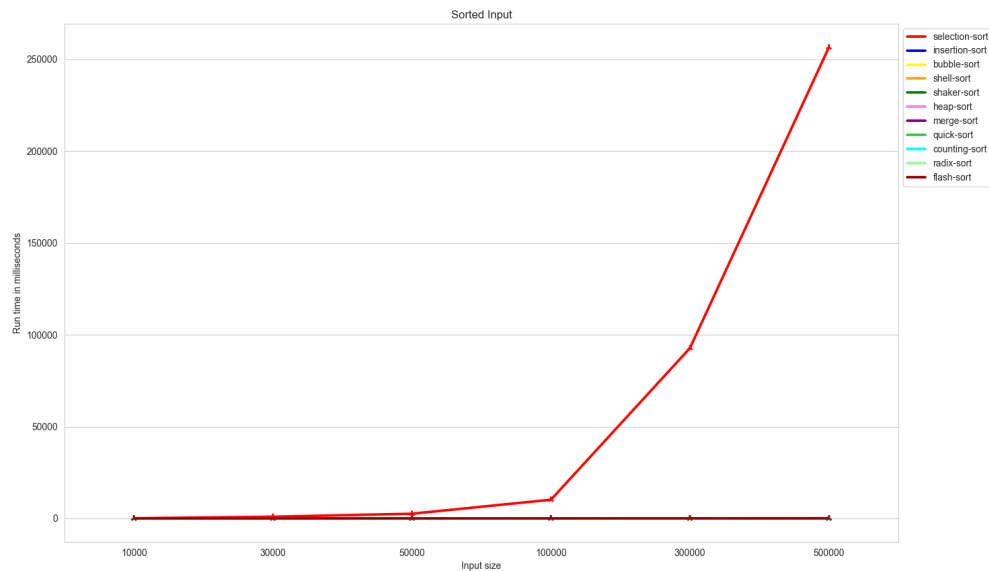


Figure 3: Line graph of running time for sorted input

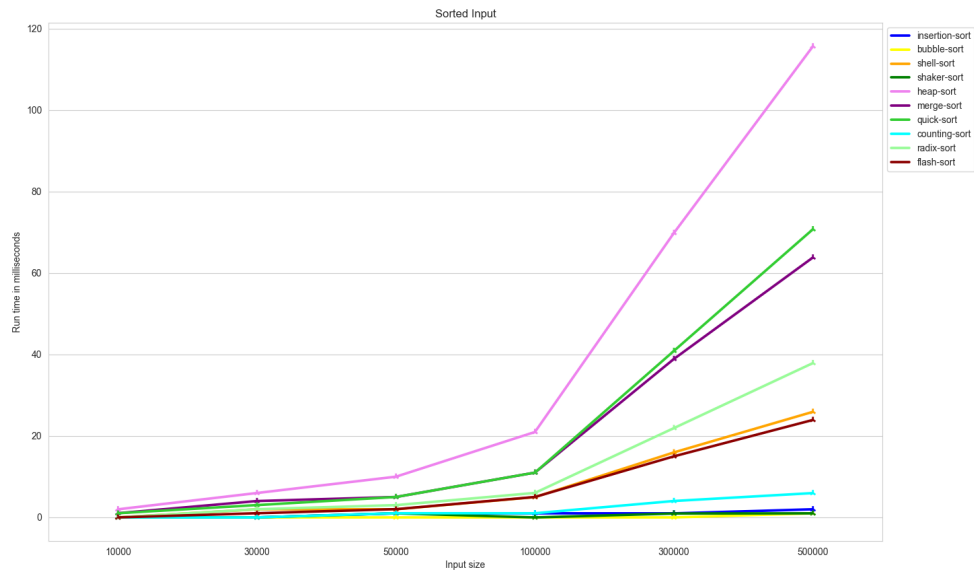


Figure 4: Line graph of running time for sorted input (without SELECTION SORT)

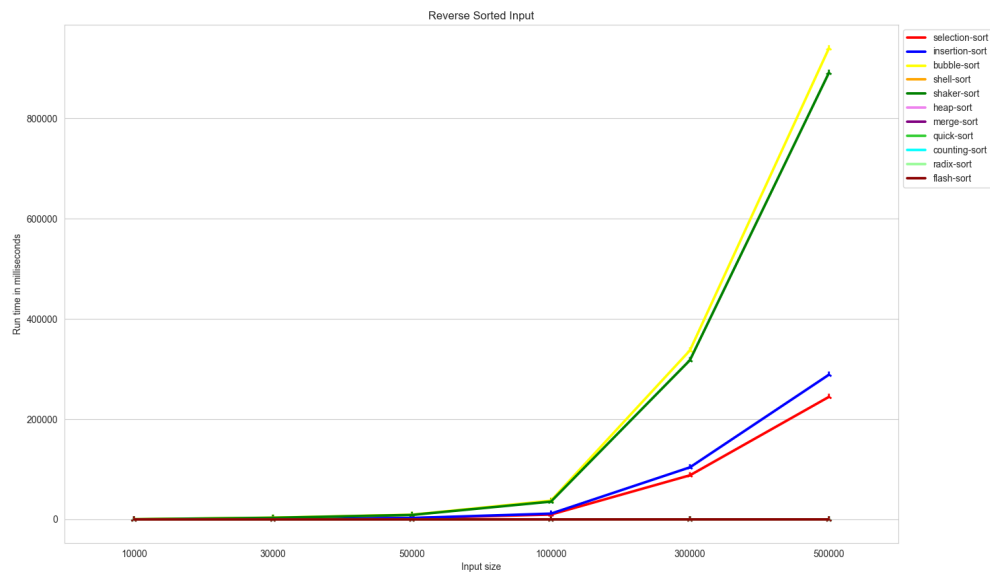


Figure 5: Line graph of running time for reversed input

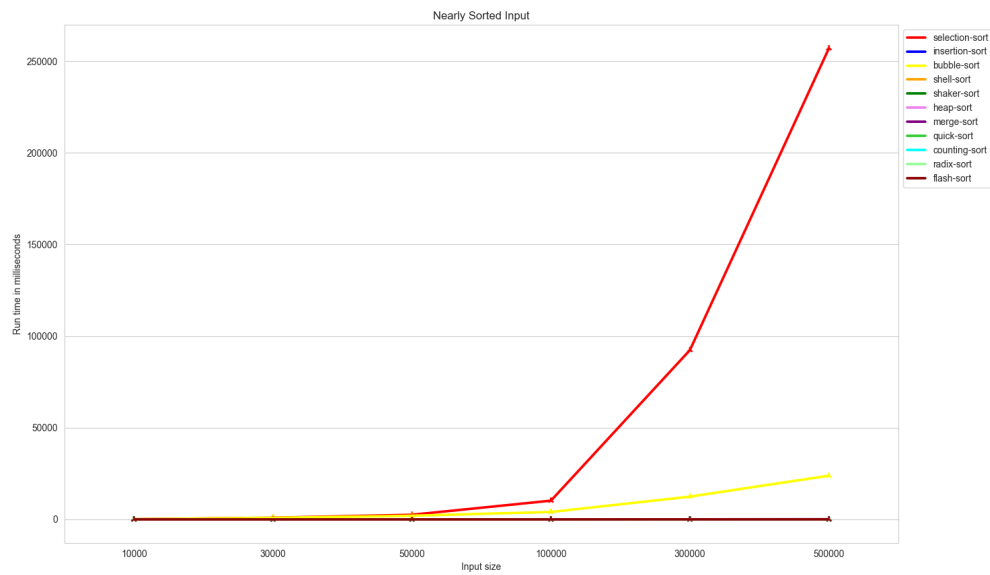


Figure 6: Line graph of running time for nearly sorted input

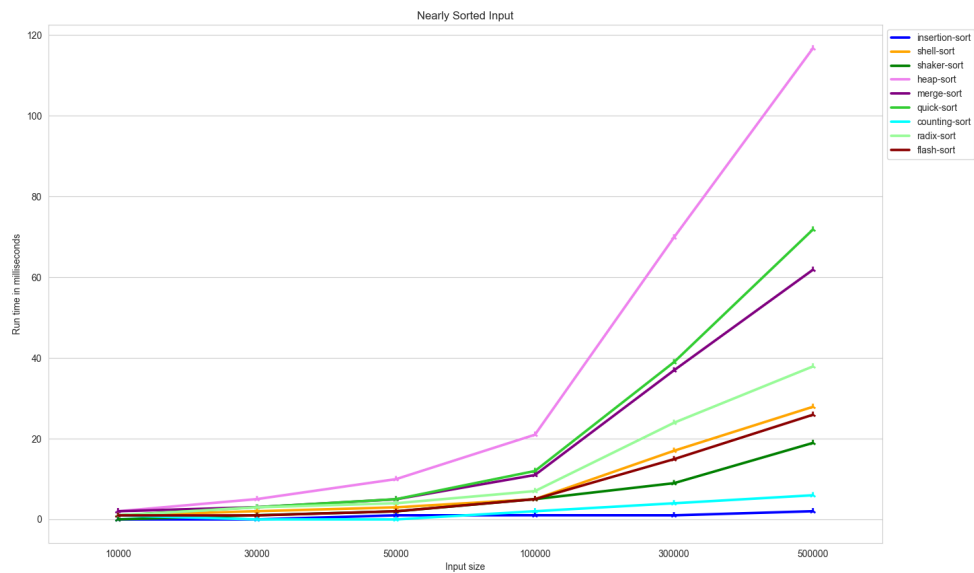


Figure 7: Line graph of running time for nearly sorted input (WITHOUT Selection Sort & Bubble Sort)

### 4.3 Bar charts of comparisons

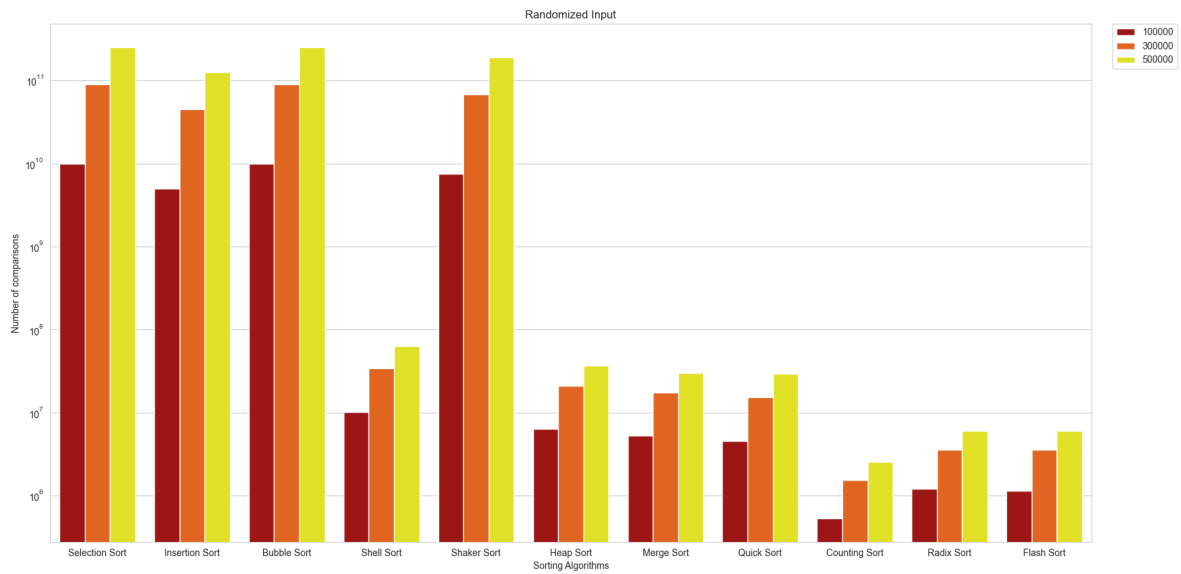


Figure 8: Bar chart of comparisons for randomized input

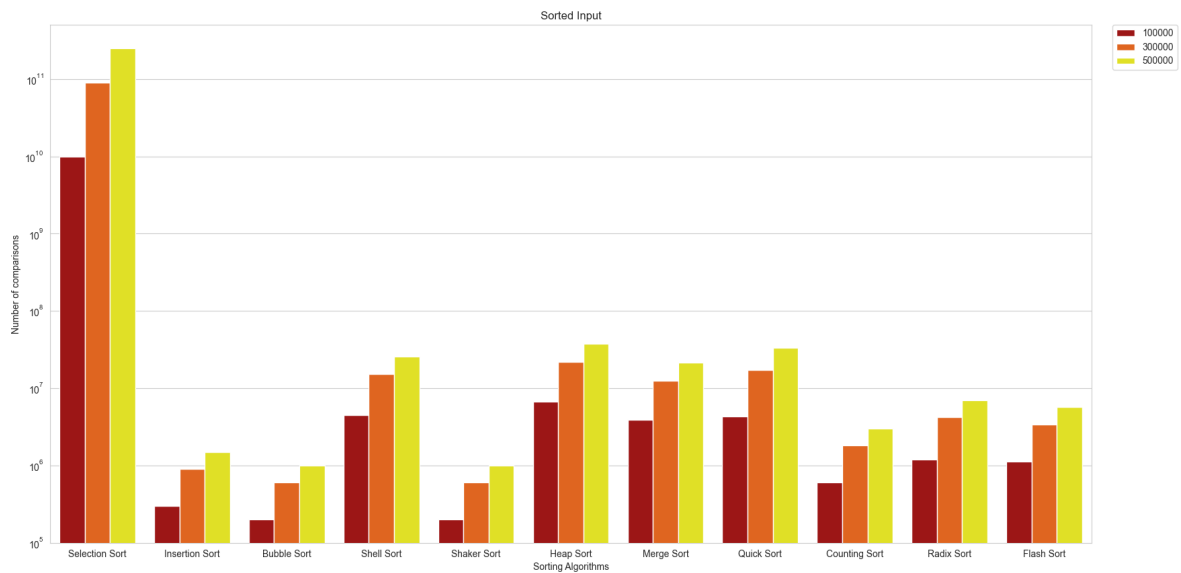


Figure 9: Bar chart of comparisons for sorted input

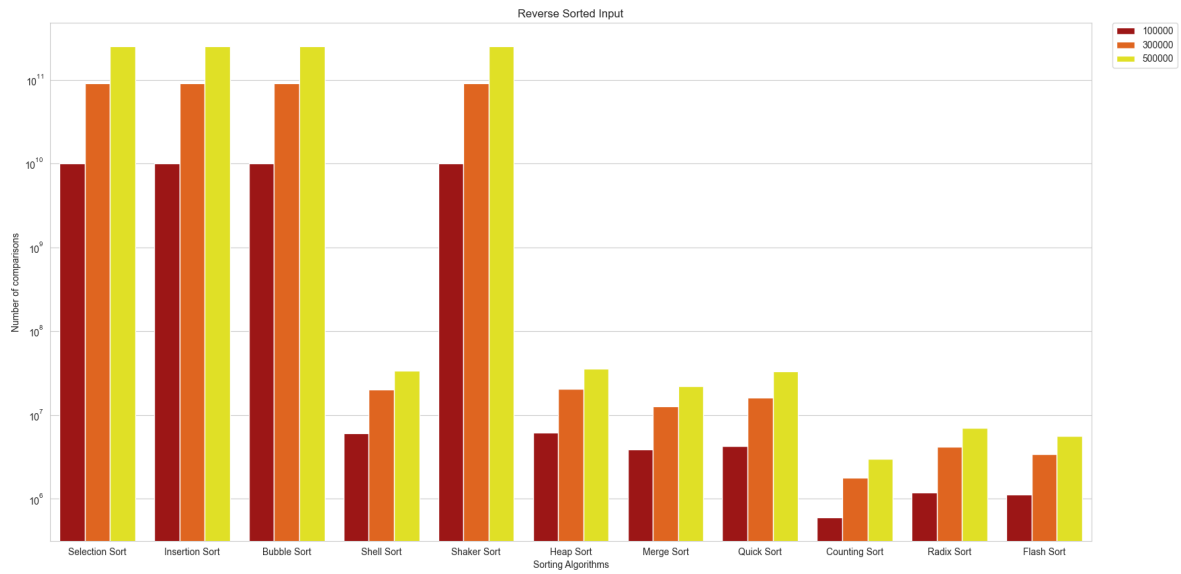


Figure 10: Bar chart of comparisons for reversed input

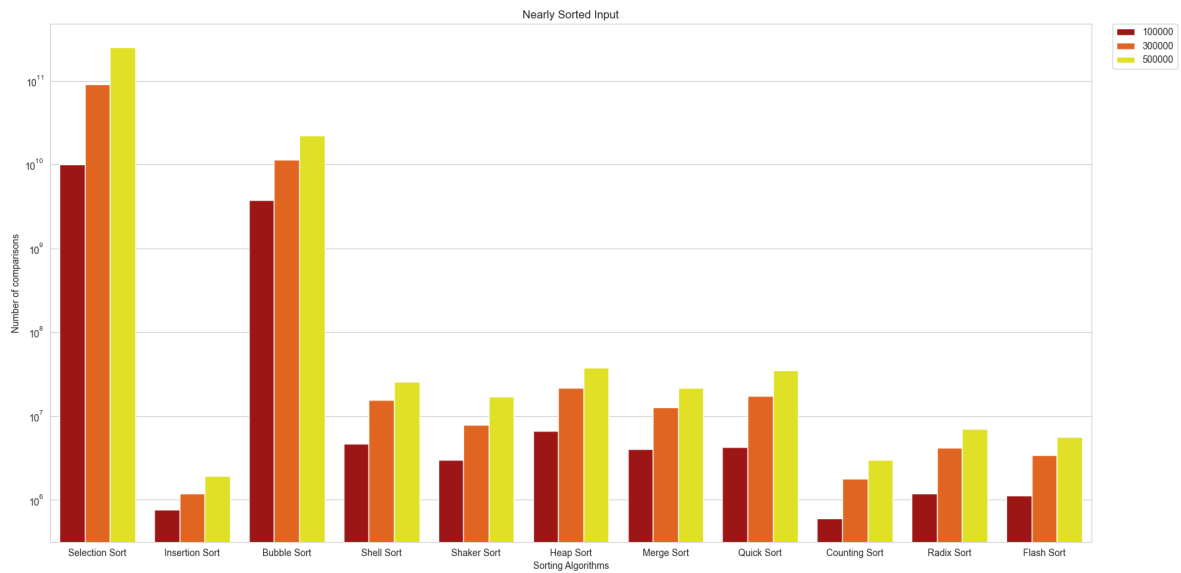


Figure 11: Bar chart of comparisons for nearly sorted input



## 4.4 Comments

Observing the graphs and charts, it becomes evident that flash sort performs as the fastest and most effective algorithm due to its optimized parameter selection ( $m = 0.43n$ ). On the other hand, bubble sort consistently displays the slowest and least effective performance across various input cases, primarily due to its large number of comparisons.

Among the sorting algorithms that do not rely on comparisons, such as counting sort, radix sort, and flash sort, they demonstrate significantly fewer comparisons compared to other algorithms.

A common observation is that most algorithms exhibit their shortest running time with sorted input.

Based on stability, the algorithms can be categorized as follows:

- Stable algorithms:
  - Selection sort — Shows consistent performance with different input orders.
  - Shell sort — Demonstrates stability across various input orders
  - Heap sort — Building a heap incurs the same cost regardless of input order.
  - Merge sort — Similarly to heap sort, merge sort performs uniformly across input orders.
  - Radix sort — Proves effective on integers, as seen in experimental results.
  - Flash sort — With its approximate linear complexity, flash sort stands as an effective and stable algorithm.
- Unstable algorithms:
  - Insertion sort — Inefficient with reversed or randomized data, but very fast with sorted or nearly sorted data.
  - Bubble sort — Always slow with large input sizes and displays varying running times with different input orders.
  - Shaker sort — Fast with sorted or nearly sorted data, but performs poorly with random or reversed data.
  - Quick sort — Although it uses a small number of comparisons and runs quickly in many cases, it's considered unstable due to its sensitivity to pivot selection. For example, choosing the leftmost elements of each segment as pivots when the input is already sorted can lead to poor performance.
  - Counting sort — Demonstrates fast performance on certain inputs but becomes highly ineffective when the range of elements ( $u$ ) significantly exceeds the input size ( $n$ ) as I mentioned in 3.9, it will be very ineffective when  $u \gg n$ .

## 5 Project organization and Programming notes

### 5.1 Project organization

Figure below shows files in my project.

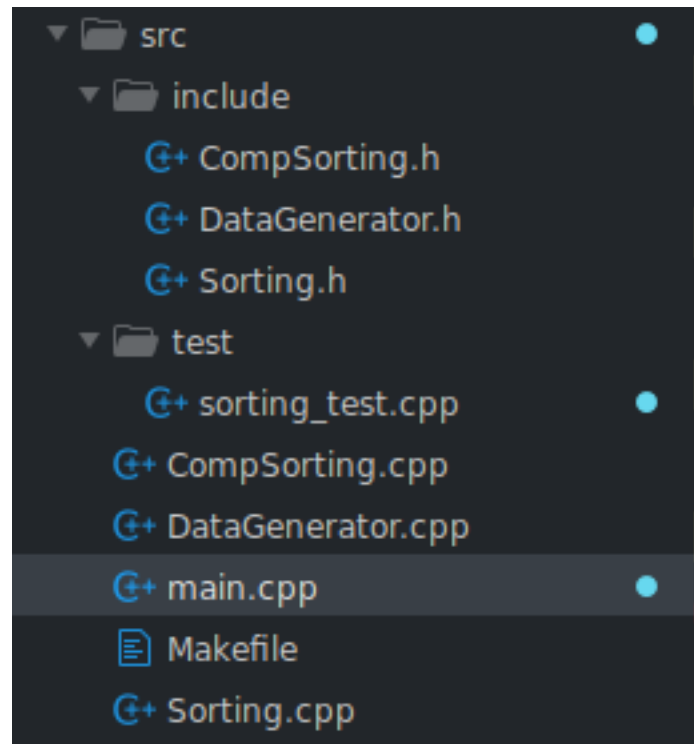


Figure 12: Files in project

- In the include folder, all header files(.h) of Project.
- In Sorting.cpp, contains all sort algorithms
- In CompSorting.cpp, be like Sorting.cpp with counting comparison of each algorithm
- In DataGenerator.cpp files, I used my lecture file for data generating for input
- In main.cpp, We have to process arguments and run the program.
- I use Makefile to compile, test and clean the stuff.

## 5.2 Programming notes

My project does not use any special libraries or data structures. All are included in basic C++ 17.

## 6 List of References

### References

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