CS111-Design and Analysis of Algorithms

2nd Semester, 2024-2025

Programming Project 1 - Empirical Analysis of Sorting Algorithms

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This project involves conducting an empirical analysis of six sorting algorithms—Selection Sort, Bubble Sort, Insertion Sort, Mergesort, Quicksort, and Heapsort—by sorting randomly generated integers and evaluating their performance.

1. Program and Code Documentation

a. Sorting Headers

'Sorting Headers' is a folder that contains all the sorting functions used in the experiment. Each header file includes the implementation of a specific algorithm.

- Selection-Insertion.h file includes both the Selection sort and Insertion sort functions.
- QuickSort.h file implements the Quicksort algorithm and includes its utility functions such as medianOfThree(), which selects the pivot by finding the median of the first, middle, and last elements to optimize the partitioning, and partition(), which rearranges the array.
- MergeSort.h file contains the Merge sort function along with its utility function merge().
- HeapSort.h file includes the Heap sort function along with its utility functions such as maxHeapify(), and buildMaxHeap().
- BubbleSort.h file contains the Bubble sort function.

b. runtime.c

- void generate_n_randoms(int arr[], unsigned long int n, unsigned long int max_range)
 - Generates n random values to store in arr[]. Uses the rand() function in stdlib.h, a pseudo RNG that needs to be seeded with srand() for each new input.
- void generate_n_sequence(int arr[], unsigned long int n, int X)
 - Generates n values in a sequence starting from X, X+1, X+2... and so on.
- extern int selection, insertion, bubble, merges, heap, quick;
 extern int output_to_file, output_arr_to_file;
 - Global variables declared from main. Used as boolean values.

- void **generate_random_runtimes**(int arr[], unsigned long int n, int max_range, FILE* outfile, char* arr_out_name, int num_of_runs)
 - Executes all of the six sorting algorithms (or only some based on user filter) on arrays with randomized values and computes the average from the total num_of_runs.
 - Start timer for runtime is started after declaring variables and printing, and ends immediately after the sorting algorithm finishes.
 - Prints the output in table form in the terminal, and also in an output file specified by the user.
- void generate_sequenced_runtimes(int arr[], unsigned long int n, int seq_start,
 FILE* outfile, char* arr_out_name, int num_of_runs) {
 - Does the same as the function above but performs the sorting on arrays with sequenced/sorted values. All arrays start with seq_start as their first element.

c. main.c

• Flow of the program

- First, the user calls the program on a terminal and supplies it with appropriate arguments. If the arguments were formatted wrong, **print_usage** will be called and the program will exit.
- The program reads the values passed by the user through argv[].
- Based on if the user wanted to test with random or sorted values, either generate_random_runtimes or generate_sequenced_runtimes will be called.
- A result of the runtimes will be printed on the terminal, and it is optional to the user if they want it to be outputted to a file as well.
- void print_usage(char *prog_name)
 - Will print the info on how to properly use the program on the terminal. Immediately ends the program thereafter.

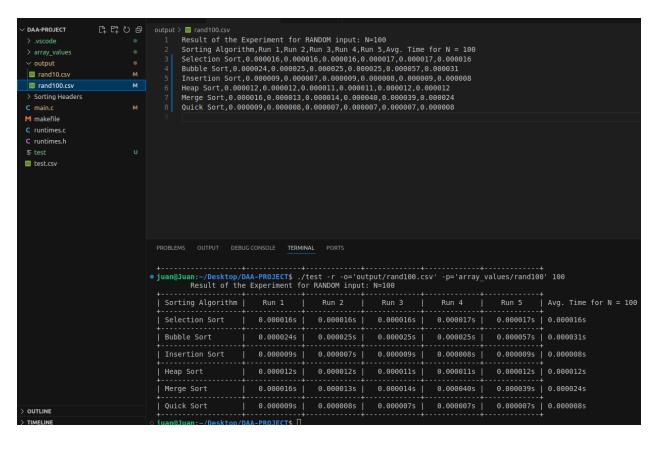
2. Program Execution & Experiment Methodology

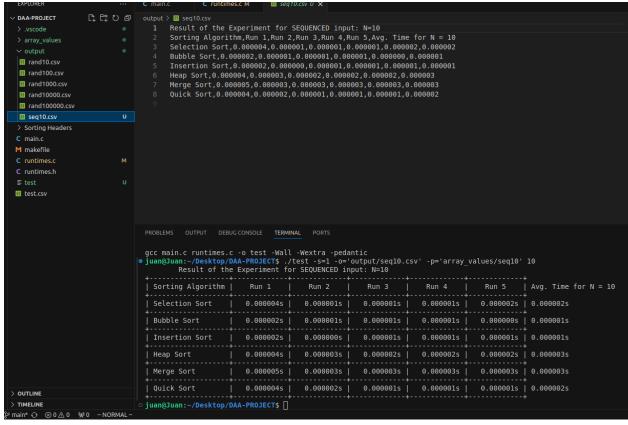
The usage information for the program can be seen by either calling it in the terminal with no other arguments or with incorrect arguments:

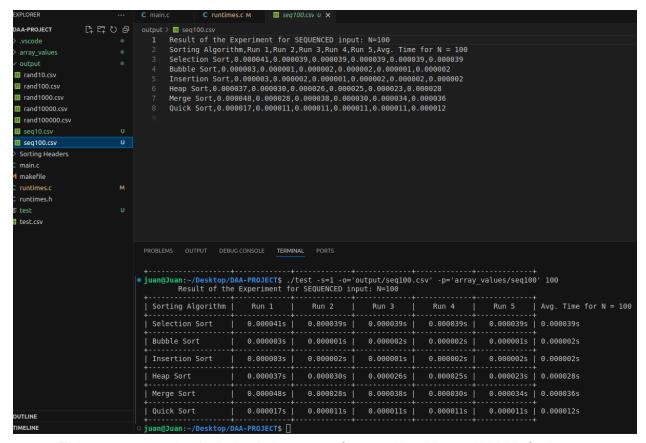
Before running the experiment, it was made sure that the host computer for running the program had no other non-essential background apps running, as sharing processing power and memory with these apps could cause the runtime of the program to fluctuate.

The experiment was done by calling the following arguments on the terminal and yielding the following results:

, 9 9									
<pre>juan@Juan:~/Desktop/DAA-PROJECT\$./test -r -o='output/rand10.csv' -p='array_values/rand10' 10 Result of the Experiment for RANDOM input: N=10</pre>									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time for N = 10			
Selection Sort	0.000005s	0.000003s	0.000002s	0.000003s	0.000002s	0.000003s			
Bubble Sort	0.000005s	0.000003s	0.000003s	0.000003s	0.000002s	0.000003s			
Insertion Sort	0.000003s	0.000002s	0.000002s	0.000002s	0.000002s	0.000002s			
Heap Sort	0.000006s	0.000004s	0.000003s	0.000004s	0.000004s	0.000004s			
Merge Sort	0.000009s	0.000006s	0.000005s	0.000005s	0.000005s	0.000006s			
Quick Sort	0.000006s	0.000003s	0.000002s	0.000003s	0.000002s	0.000003s			
iuan@Juan:~/Desktop/I	DAA-PROJECTS [+	F	+			







This was repeated to include all the results from n=10, 100, ..., 100000; for both random and sorted array values. The exception was for n=1000000, which had the following program arguments.

```
./test -r -i=1 -o='output/rand1Mrun1.csv' -p='array_values/rand1Mrun1' 1000000
      Result of the Experiment for RANDOM input: N=1000000
                                | Avg. Time for N = 1000000
Sorting Algorithm |
                       Run 1
                  | 935.098947s | 935.098947s
Selection Sort
                  | 2352.128961s | 2352.128961s
Bubble Sort
Insertion Sort
                  | 527.147945s | 527.147945s
Heap Sort
                      0.292246s | 0.292246s
Merge Sort
                      0.328007s | 0.328007s
Quick Sort
                      0.148575s | 0.148575s
```

The program took too long in computing the runtimes for the sorting algorithm (mainly for bubble and selection sort), so it was decided that each run would be performed separately just in case a problem arises in the computer environment and all progress would have been lost.

The results in output/*.csv files were then imported to google sheets by doing the following: File > Import > Upload > Append to current sheet. The raw results can be seen from the link:

https://docs.google.com/spreadsheets/d/14G79f53YTWPvP0Sz406DUxAarVmX6L4-TEttr4MYTDA/edit?usp=sharing.

3. Results and Analysis

a. System Specification

System (Oracle VM VirtualBox Manager)

OS: Ubuntu (64-bit) Base Memory: 8192MB

Processors: 4

b. Results

Result of the experiment for RANDOM N = 10									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time			
Selection Sort	0.000005	0.000003	0.000002	0.000003	0.000002	0.000003			
Bubble Sort	0.000005	0.000003	0.000003	0.000003	0.000002	0.000003			
Insertion Sort	0.000003	0.000002	0.000002	0.000002	0.000002	0.000002			
Heap Sort	0.000006	0.000004	0.000003	0.000004	0.000004	0.000004			
Merge Sort	0.000009	0.000006	0.000005	0.000005	0.000005	0.000006			
Quick Sort	0.000006	0.000003	0.000002	0.000003	0.000002	0.000003			

Result of the experiment for RANDOM N = 100									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time			
Selection Sort	0.000016	0.000016	0.000016	0.000017	0.000017	0.000016			
Bubble Sort	0.000024	0.000025	0.000025	0.000025	0.000057	0.000031			
Insertion Sort	0.000009	0.000007	0.000009	0.000008	0.000009	0.000008			
Heap Sort	0.000012	0.000012	0.000011	0.000011	0.000012	0.000012			
Merge Sort	0.000016	0.000013	0.000014	0.00004	0.000039	0.000024			
Quick Sort	0.000009	0.000008	0.000007	0.000007	0.000007	0.000008			

Result of the experiment for RANDOM N = 1 000									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time			
Selection Sort	0.001092	0.00136	0.001043	0.001155	0.001114	0.001153			
Bubble Sort	0.001564	0.001923	0.005412	0.002474	0.00477	0.003229			
Insertion Sort	0.000564	0.000668	0.000555	0.000609	0.000678	0.000615			
Heap Sort	0.000134	0.000132	0.000133	0.000131	0.000133	0.000133			
Merge Sort	0.000138	0.000144	0.000135	0.000143	0.000137	0.000139			
Quick Sort	0.000081	0.000082	0.000081	0.00008	0.000187	0.000102			

Result of the experiment for RANDOM N = 10 000									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time			
Selection Sort	0.186278	0.096572	0.096741	0.096888	0.095748	0.114445			
Bubble Sort	0.225802	0.196132	0.205495	0.210652	0.197679	0.207152			
Insertion Sort	0.061771	0.057683	0.056974	0.054652	0.066415	0.059499			
Heap Sort	0.001858	0.001847	0.001992	0.001868	0.001754	0.001864			
Merge Sort	0.001845	0.002001	0.002084	0.001654	0.002517	0.00202			
Quick Sort	0.002697	0.001632	0.001121	0.001031	0.001246	0.001545			

Result of the experiment for RANDOM N = 100 000									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time			
Selection Sort	9.346858	9.224904	9.254818	9.263143	9.240119	9.265968			
Bubble Sort	22.614967	22.773977	22.736748	22.631775	22.663411	22.684176			
Insertion Sort	5.24579	5.394252	5.400657	5.384738	5.342609	5.353609			
Heap Sort	0.025432	0.032659	0.031213	0.025219	0.023949	0.027694			
Merge Sort	0.027336	0.032359	0.022259	0.022132	0.022706	0.025358			
Quick Sort	0.013557	0.025006	0.013662	0.022425	0.012846	0.017499			

	Result of the experiment for RANDOM N = 1 000 000										
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time					
Selection	935.098947	945.07975	952.040744	1001.646494	997.521166	966.2774202					
Bubble	2352.128961	2349.700774	2355.738694	2478.15056	2483.83615	2403.911028					
Insertion	527.147945	535.271002	538.242525	563.652755	578.98706	548.6602574					
Heap Sort	0.292246	0.30272	0.296546	0.311755	0.363257	0.3133048					
Merge Sort	0.328007	0.72895	0.261541	0.299041	0.291257	0.3817592					
Quick Sort	0.148575	0.153774	0.151448	0.151535	0.157244	0.1525152					

Result of the experiment for SEQUENCED N = 10									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time			
Selection Sort	0.000004	0.000001	0.000001	0.000001	0.000002	0.000002			
Bubble Sort	0.000002	0.000001	0.000001	0.000001	0	0.000001			
Insertion Sort	0.000002	0	0.000001	0.000001	0.000001	0.000001			
Heap Sort	0.000004	0.000003	0.000002	0.000002	0.000002	0.000003			
Merge Sort	0.000005	0.000003	0.000003	0.000003	0.000003	0.000003			
Quick Sort	0.000004	0.000002	0.000001	0.000001	0.000001	0.000002			

Result of the experiment for SEQUENCED N = 100									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time			
Selection Sort	0.000041	0.000039	0.000039	0.000039	0.000039	0.000039			
Bubble Sort	0.000003	0.000001	0.000002	0.000002	0.000001	0.000002			
Insertion Sort	0.000003	0.000002	0.000001	0.000002	0.000002	0.000002			
Heap Sort	0.000037	0.00003	0.000026	0.000025	0.000023	0.000028			
Merge Sort	0.000048	0.000028	0.000038	0.00003	0.000034	0.000036			
Quick Sort	0.000017	0.000011	0.000011	0.000011	0.000011	0.000012			

Result of the experiment for SEQUENCED N = 1 000									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time			
Selection Sort	0.004233	0.004055	0.006781	0.003958	0.009006	0.005607			
Bubble Sort	0.000002	0.000002	0.000002	0.000002	0.000002	0.000002			
Insertion Sort	0.000003	0.000004	0.000003	0.000003	0.000003	0.000003			
Heap Sort	0.000116	0.000116	0.000116	0.00041	0.000159	0.000183			
Merge Sort	0.000107	0.000117	0.000099	0.000097	0.000116	0.000107			
Quick Sort	0.000038	0.000037	0.000037	0.000036	0.000036	0.000037			

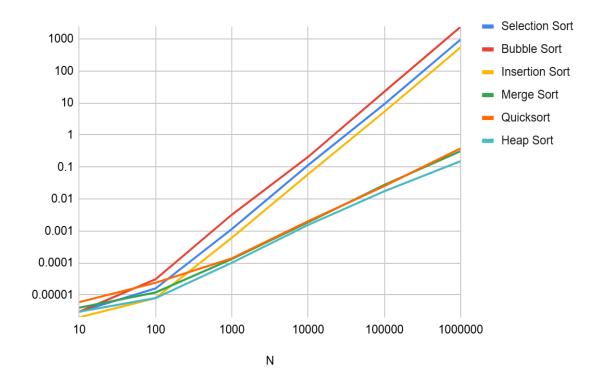
Result of the experiment for SEQUENCED N = 10 000									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time			
Selection Sort	0.138308	0.12332	0.135592	0.157248	0.11696	0.134286			
Bubble Sort	0.000019	0.00002	0.000023	0.000021	0.000018	0.00002			
Insertion Sort	0.000029	0.000029	0.000029	0.000029	0.000029	0.000029			
Heap Sort	0.001473	0.00178	0.001865	0.001512	0.001453	0.001617			
Merge Sort	0.001182	0.001182	0.001223	0.001262	0.001258	0.001221			
Quick Sort	0.000561	0.000471	0.000642	0.000542	0.000495	0.000542			

Result of the experiment for SEQUENCED N = 100 000									
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time			
Selection Sort	9.452802	9.322537	9.275455	9.26268	9.253998	9.313494			
Bubble Sort	0.000191	0.000206	0.000239	0.000188	0.000193	0.000203			
Insertion Sort	0.000297	0.00031	0.000295	0.000302	0.000302	0.000301			
Heap Sort	0.019228	0.022516	0.017898	0.017642	0.018221	0.019101			
Merge Sort	0.016794	0.016426	0.013451	0.01385	0.013842	0.014873			
Quick Sort	0.006055	0.006315	0.006107	0.006636	0.005925	0.006208			

Result of the experiment for SEQUENCED N = 1 000 000							
Sorting Algorithm	Run 1	Run 2	Run 3	Run 4	Run 5	Avg. Time	
Selection Sort	967.150653	942.296004	952.652591	952.96163	951.613835	953.3349426	
Bubble Sort	0.001875	0.002078	0.001931	0.002037	0.00206	0.0019962	
Insertion Sort	0.002895	0.002974	0.003151	0.00289	0.003267	0.0030354	
Heap Sort	0.215287	0.220629	0.219291	0.229867	0.223469	0.2217086	
Merge Sort	0.178892	0.63852	0.69768	0.738449	0.637546	0.5782174	
Quick Sort	0.066537	0.068741	0.067741	0.068276	0.067827	0.0678244	

c. Analysis

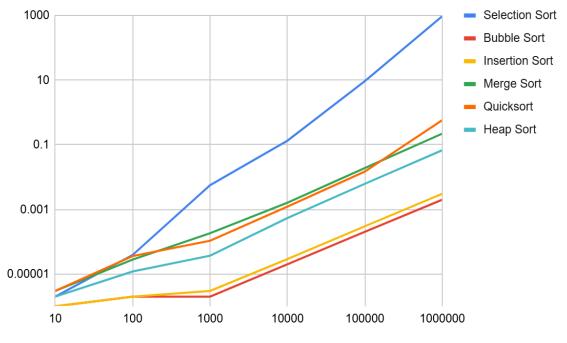
Average Running Time for an Input Array that is Random						
N	Selection Sort	Bubble Sort	Insertion Sort	Merge Sort	Quicksort	Heap Sort
10	0.000003	0.000003	0.000002	0.000004	0.000006	0.000003
100	0.000016	0.000031	0.000008	0.000012	0.000024	0.000008
1000	0.001153	0.003229	0.000615	0.000133	0.000139	0.000102
10000	0.114445	0.207152	0.059499	0.001864	0.00202	0.001545
100000	9.265968	22.684176	5.353609	0.027694	0.025358	0.017499
1000000	966.2774202	2403.911028	548.6602574	0.3133048	0.3817592	0.1525152



Based on the data that had been gathered for all the sorting algorithms, starting from an input array that is random. **Quadratic sorting algorithms** performed at minimal speed as expected when the input size is small, particularly at 10,100, and 1000. However, starting from the 1000th input size, it is where linear sorting algorithms' speed started to **gradually decline as more swapping and searching operations are needed to be done** when there are an increasing number of inputs, hence the reason that they grow quadratically because of these excessive data movements that occur on larger inputs. On the other hand,

recursive algorithms throughout their runs and average time had consistent efficient speed even at larger inputs. Their divide-and-conquer mechanisms allowed them to perform efficiently and more faster unlike the quadratic sorting algorithms due to minimizing the redundancy of the swapping and searching operations. Instead of the quadratic operations, they divide the array into smaller sub-arrays repeatedly that explain the log n division where they are then multiplied to the linear operations such as merging, partitioning, and comparisons—producing an n log n time complexity.

Average Running Time for an Input Array that is Sorted							
N	Selection Sort	Bubble Sort	Insertion Sort	Merge Sort	Quicksort	Heap Sort	
10	0.000002	0.000001	0.000001	0.000003	0.000003	0.000002	
100	0.000039	0.000002	0.000002	0.000028	0.000036	0.000012	
1000	0.005607	0.000002	0.000003	0.000183	0.000107	0.000037	
10000	0.134286	0.00002	0.000029	0.001617	0.001221	0.000542	
100000	9.313494	0.000203	0.000301	0.019101	0.014873	0.006208	
1000000	953.3349426	0.0019962	0.0030354	0.2217086	0.5782174	0.0678244	



Following on the results for an input array that is sorted. It is observed that the quadratic sorting algorithms had an improvement regarding their running time. The principle behind this development was caused by the reduction of comparing adjacent elements to perform swaps, shifts, and search operations. Mainly because the array is already sorted as mentioned earlier, thus if it is in the right order already. Insertion sort and (Modified) Bubble sort in particular, would know that there are lesser comparisons needed to be done resulting in n time complexity. This is also the reason why compared to the selection sort amongst quadratic algorithms, insertion and modified bubble sort had significant improvement speeds because of flags and insertion's left sorted array. While selection sort needs to search in the entire N array even if it is sorted already, hence having miniscule differences for better or worse on its running time. Recursive algorithms in this scenario had also little to no differences on their running time at all. There are no flags or any indicators on how they are programmed to know if the array is already sorted, hence despite the array's sorted order. A recursive algorithm will still divide the array into subarrays just like in a random array, making their n log n time complexity as the same as before

4. Conclusion

The main variables for quadratic sorting algorithms are the N size of the array and an array's ordered disposition (whether it is sorted or not). It is evident in the results that these are the factors that mainly affect their running times. In contrast, recursive algorithms stay almost consistent and efficient throughout their running times primarily because it is independent of an array's initial order of elements. Moreover, their divide-and-conquer systematic process allowed their algorithms to be optimized and scalable in larger data inputs as shown in the tables compared to the quadratic algorithms.

Nevertheless there is an exception in selecting quicksort's pivot element, in the initial testing of its running time. Quicksort was unable to sort an array of 100,000 elements in sequence order, because of its pivot being the last element (a very large X element) resulting in the worst case time complexity $O(n^2)$. It was inferred to have caused a memory stack overflow due to the recursive function calls. Changing its pivot to median of three successfully allowed us to sort the array due to having a balanced partition in the even distribution of elements, leading to fewer recursive calls. That is why it is important to take note of your situation and a computer's hardware capabilities, as this test solely focuses on the behaviors of each sorting algorithm. This gives us the insight to take in account on what proper sorting algorithm we are going to use in a certain problem. The running time is one of the many aspects to consider in implementing a sorting algorithm, as there are also space complexities and cpu efficiency that plays a role in determining their best performances—that could vary on different environments.

5. Challenges & Contributions

a. Challenges

Program Structure

- Deciding on how the user would have to instruct the program either with a dynamic user interface or a static Command Line Interface (CLI), similar to programs like git, grep, make, etc. Ultimately, it was decided that the former was too cumbersome and takes longer as inputs would be in a sequence, as with the current interface, it's all in one go.
- Structuring the runtime outputs was also hard as just copying the prints from the terminal would just prove to be useless and redundant. The solution was the format, Comma-separated values(csv), as it was easy to produce and is convenient for importing the table to spreadsheet programs like Excel and Google Sheets.

Coding

- The code written in runtime.c could certainly have been more simple and cleaner. The file got long very quickly because it had to repeat all the computations, all the printing and everything for all six sorting algorithms. It could have been solved simply by including the sorting algorithms as arguments to the functions computing the runtime, but this realization had arrived too late as most of the program was already done.

Data Gathering

- There were many problems in getting the output results for very high values for n (n=100k and n=1M). First, was that for the functions that use recursion a lot like merge sort, and quicksort that chooses the first or last element as pivot, the memory stack would overflow thus causing the program to end prematurely. The case for merge sort was solved by allocating the auxiliary array values to the heap, and the case for quicksort was solved by using the median of three in choosing the pivot.
- The second problem for very high values of n, was that the algorithms with quadratic time complexity can take as long as 40 minutes making each run long for n=1M. No alternative solution was found other than plainly waiting.

Documentation

The file sizes for the values of the original and sorted arrays used in each test grew too big to be placed in a project repository like Github. No solution was found other than removing all array value files from the repository and just keeping them in the host computer.

b. Contributions

- Juan Miguel B. Zurbito
 - Authored 'main.c', 'runtimes.c' and 'runtime.h', which included the CLI, I/O, array generation and runtime computation.
 - Performed the experiment on my laptop.
 - Formatted the results to the tables.
 - Code documentation and report writing.
- Raymond C. Balingbing
 - Coded the Bubble Sort algorithm in C.
 - Formatted the results in the tables into graphical representation.
 - Data documentation and report writing of the 'Results and Analysis' and 'Sorting Headers' section.
- Gerik Jed L. Abion
 - Coded the Quick Sort and Heap Sort.
 - Writing of data analysis and conclusion.
- Jayson Tripulca
 - Coded the Merge Sort.
- Renz Kirby Onia
 - Coded the Selection and Insertion Sort.