



**COMPUTER SCIENCE  
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**PROJECT REPORT**

**ANALYSIS OF ALGORITHMS**

**CSCE 629**

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# 1 Introduction

A Maximum Bandwidth pass problem deals with finding a path between two vertices such that the path contains the maximum bandwidth. This project is implemented using Python and includes the following main functions:

- A random graph generation which takes degree of each vertex and number of nodes as input and returns a fully connected random undirected weighted graph.
- A Heap Structure responsible for heapsort and also to store the fringe nodes in the case of Dijkstra with Heap implementation.
- A Union and Find algorithm which is used in the generation of Maximum Spanning Tree generation
- Depth First Search Algorithm to find the path from one vertex to another in the maximum spanning tree.
- Three Routing Algorithm
  - Dijkstra's without Heap Implementation
  - Dijkstra's with Heap Implementation
  - Kruskal's Algorithm

The report is organized as follows; Section 2 involves with Implementation Details, Section 3 deals with Performance Analysis of the algorithms and Section 4 explains about the Conclusion for this project report.

## 2 Implementation

### 2.1 Random Graph Generation

A random graph generator function is written which takes the number of vertices, degree of each vertex and seed for the random generator as input. This function returns an object of the Graph class. Here the predefined graph class is being used which is part of the networkx library in python.

Firstly a full circle is created with edges connecting all the nodes in a circle with random weights being assigned to each edge. An adjacency list is being maintained to keep track of the edges between the vertices. Next, for each vertex until the degree of the vertex reaches the required degree, edges are being added with random weights and are connected to random vertices. The range of weights is from 1 to 5000 to avoid repetition of edge weights. When the degree being passed to the generator is 1000, it is equivalent to the generation of the graph where each vertex is adjacent to about 20% of the other vertices.

## 2.2 Heap

The heap being implemented for this project is MaxHeap. The heap structure is used twice, one in Dijkstra with Heap Implementation to store the fringe nodes and in Kruskal's Algorithm to HeapSort the edges for the generation of the Maximum Spanning Tree. In the Heap implementation, Maximum, Insert, Delete, Swap, Siftup, SiftDown and ReplaceKey subroutines are defined. For the Dijkstra algorithm usage, ReplaceKey function is very useful to update the bandwidth. This function basically updates the bandwidth of that vertex and puts the vertex in the correct position as per its bandwidth.

## 2.3 Dijkstra Algorithm

Dijkstra algorithm uses greedy method to find the maximum bandwidth pass provided all the weights are positive. In this project two implementation of Dijkstra are done i.e., on using Heap implementation to store fringe node and other without using Heap. The main algorithm in both the cases remains the same but only the running time differs. For the heap implementation of Dijkstra we use the heap function defined before with Maximum, Delete and ReplaceKey methods being extensively used. The heap is used to store the fringe vertex names and the maxheap is implemented based on the bandwidth of the fringe vertices. The root would then be the fringe vertex with the highest bandwidth. For the implementation of Dijkstra without Heap we run a while loop until all the status of the vertices turns to *intree*. The time complexity of Dijkstra Algorithm without Heap is more than that of Dijkstra Algorithm with Heap.

## 2.4 Kruskal Algorithm

For the implementation of Kruskal Algorithm a UnionFind class is being defined. This class helps in path compression. The find method is used to find the root of the vertex and union is used to combine various disjoint trees into 1 maximum spanning tree. For the sorting of the edges HeapSort is used. Once a MST is generated, using Depth First Search we find the path from the given source to the destination.

## 3 Performance Analysis

### 3.1 Sample Graph

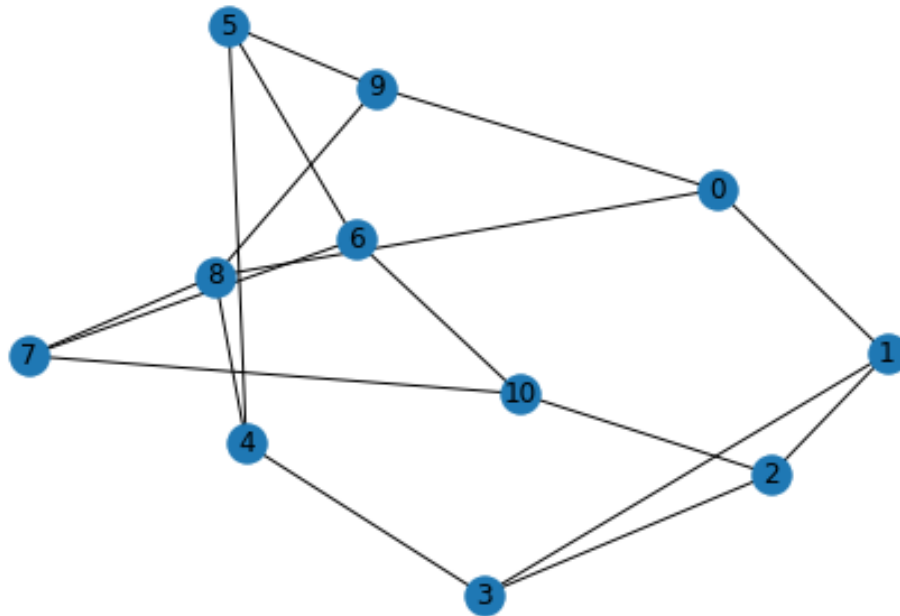


Figure 1: Random Graph with 10 vertices and degree 3

The Fig.1 represents a random graph generated with 10 nodes with degree of each node being 3. This is just of representation showing that the graph is being generated as expected.

### 3.2 Sample Output

```
1 Source: 600
2 Destination: 2410
```

```
3 Path without Heap:
4 [2410, 3118, 411, 4701, 2378, 653, 2135, 2822, 3300, 1000, 2974, 1316, 204, 140, 1869,
   1602, 1829, 3858, 2471, 469, 4986, 4204, 285, 1056, 489, 1656, 3651, 2832, 2876, 1323,
   4300, 4965, 2150, 600]
5 Maximum Bandwidth Dijkstra: Without Heap 4989
6 Path with Heap:
7 [2410, 3118, 411, 4745, 35, 3209, 3712, 2507, 1267, 4143, 545, 389, 2475, 2693, 3648,
   3550, 4354, 3608, 690, 3496, 3858, 2471, 469, 4986, 4204, 285, 1056, 489, 1656, 3651,
   2832, 2876, 1323, 4300, 4965, 2150, 600]
8 Maximum Bandwidth Dijkstra: Heap 4989
9 Kruskal Path:
10 [2410, 3118, 411, 4701, 2378, 653, 2135, 2822, 3300, 1000, 2974, 1316, 204, 140, 1869,
    1602, 1829, 3858, 2471, 469, 4986, 4204, 285, 1056, 489, 1656, 3651, 2832, 2876, 1323,
    4300, 4965, 2150, 600]
11 Maximum Bandwidth Kruskal: 4989
12 Timing Analysis
13 Graph Generation: 60.52343034744263
14 Time for Dijkstra Without Heap: 11.5385103225708
15 Time for Dijkstra With Heap: 8.447573900222778
16 Total Time Kruskal: 16.60581064224243
```

This is a sample output giving Path from destination to source for all 3 algorithms along with the maximum bandwidth. We can observe that the maximum bandwidth returned by all 3 algorithms is the same but the maximum bandwidth pass differs for each algorithm. The output also has the running time of each algorithm being displayed.

### 3.3 Timing Analysis for Sparse Graph

#### 3.3.1 Graph Generation

Graph	Graph1	Graph2	Graph3	Graph4	Graph5
Duration	0.090954304	0.105186224	0.097897053	0.096430302	0.164721966

### 3.3.2 Dijkstra without Heap

Duration	Pair1	Pair2	Pair3	Pair4	Pair5
Graph1	3.933715105	4.233586311	4.1036129	4.259529591	4.113918066
Graph2	4.810223103	4.12529707	4.211987019	4.224545956	4.291259289
Graph3	4.284241915	4.184536695	4.249397993	4.199856043	3.965998411
Graph4	4.029652119	4.242292881	4.183971405	4.038101435	4.398355961
Graph5	4.069397449	4.224159241	4.128736973	4.198780298	4.319262266

### 3.3.3 Dijkstra With Heap

Duration	Pair1	Pair2	Pair3	Pair4	Pair5
Graph1	0.243809223	0.268352985	0.265566111	0.26983285	0.2698946
Graph2	0.319811106	0.258093357	0.266513586	0.270230293	0.270822287
Graph3	0.310579538	0.2722826	0.253706217	0.270066261	0.226960897
Graph4	0.267971992	0.281337023	0.275892258	0.270857811	0.325409174
Graph5	0.273793697	0.288200617	0.267091036	0.274477482	0.26757288

### 3.3.4 Kruskal Algorithm

Graph	Graph1	Graph2	Graph3	Graph4	Graph5
Duration	0.125549126	0.123049593	0.119797039	0.130824137	0.12173295

MST Build Time

Duration	Pair1	Pair2	Pair3	Pair4	Pair5
Graph1	0.025768757	0.059503078	0.080115795	0.06618309	0.094055176
Graph2	0.097825289	0.058978558	0.0885396	0.081089973	0.151168108
Graph3	0.093871117	0.030666113	0.080920696	0.088834524	0.077366114
Graph4	0.057703972	0.076043844	0.074041605	0.096882582	0.11514473
Graph5	0.050774813	0.108473301	0.046176672	0.045380116	0.101308823

DFS Path Time

Duration	Pair1	Pair2	Pair3	Pair4	Pair5
Graph1	0.180866003	0.156195402	0.239415646	0.161786079	0.247546196
Graph2	0.278862715	0.150232792	0.180722237	0.235738993	0.246048927
Graph3	0.200816631	0.194551945	0.177006721	0.243169785	0.171486616
Graph4	0.149168491	0.242821217	0.165160418	0.254041672	0.224181414
Graph5	0.143975735	0.205111504	0.206474543	0.13775444	0.258444548

Total Time

### 3.4 Timing Analysis for Dense Graph

#### 3.4.1 Graph Generation

Graph	Graph1	Graph2	Graph3	Graph4	Graph5
Duration	58.98736835	60.90540886	59.47075152	58.49494171	60.234025

### 3.4.2 Dijkstra Without Heap

Duration	Pair1	Pair2	Pair3	Pair4	Pair5
Graph1	11.2545867	10.45073462	11.01199841	12.51237202	10.5702095
Graph2	11.15364408	11.06088352	11.17029309	11.38336825	11.29249835
Graph3	11.05792451	11.75624418	12.04945111	11.56264257	12.54632187
Graph4	12.58334613	11.48749709	10.75620127	11.10832119	11.39596725
Graph5	11.31051612	11.51912165	11.55561805	12.05622864	12.25940847

### 3.4.3 Dijkstra With Heap

Duration	Pair1	Pair2	Pair3	Pair4	Pair5
Graph1	8.054227829	7.950505733	8.114288568	8.534822464	9.047904253
Graph2	8.10699749	8.219291449	8.423859358	8.308233261	8.176138639
Graph3	8.033660173	8.233247757	8.329352856	8.515664101	8.026985645
Graph4	8.069142818	8.356496334	8.370652676	8.274383545	8.225543976
Graph5	8.277152538	7.964969158	8.432705879	8.372105837	8.449433804

### 3.4.4 Kruskal Algorithm

Graph	Graph1	Graph2	Graph3	Graph4	Graph5
Duration	17.43509665	17.55303402	17.77852368	16.74237704	16.17882357

MST Build Time



Duration	Pair1	Pair2	Pair3	Pair4	Pair5
Graph1	0.054023504	0.151445866	0.097405434	0.052339077	0.072049856
Graph2	0.101567507	0.08053565	0.059229851	0.11239624	0.107078314
Graph3	0.105113745	0.137387991	0.053827763	0.052511454	0.081958294
Graph4	0.067979336	0.073587179	0.107208252	0.042102814	0.079879761
Graph5	0.092291594	0.056953192	0.079370975	0.089389086	0.06570816

DFS Path Time

Duration	Pair1	Pair2	Pair3	Pair4	Pair5
Graph1	22.47302389	21.13967872	22.54795623	18.17994547	17.23893452
Graph2	17.40424252	15.39398742	17.96434426	17.39454412	15.4269433
Graph3	16.23631096	17.26502752	14.41450381	16.89396977	16.5409832
Graph4	15.99625611	17.09899616	18.15328217	16.89459133	16.9670155
Graph5	15.48662543	17.36739016	16.20957422	14.69757318	15.12691569

Total Time

### 3.5 Discussion on the Outputs

#### 3.5.1 Theoretical Time Complexity

Algorithm	Time Complexity
Dijkstra Without Heap	$O(n^2)$
Dijkstra with Heap	$O((n + m)\log n)$
Maximum Spanning Tree Build Time	$O(m\log n)$
Path Find Time	$O(m)$

### 3.5.2 Dijkstra's Algorithm

From the theoretical Complexities, we can observe that Dijkstra Implementation with Heap is faster than that without Heap and this can also be seen in the output table. This is because insertion and deletion in Heap takes  $O(\log n)$  time. In non-heap implementation, it takes  $O(n)$  time to find the fringe vertex with the maximum bandwidth. Therefore, the performance of Dijkstra with heap is better than Dijkstra without heap. This results holds true for both sparse as well as dense random graphs. We can observe that the trend remains the same as the number of nodes increases the running time increases. This is because we have more number of edges to be examined now.

### 3.5.3 Kruskal's Algorithm

Maximum Spanning Tree build time is  $O(m \log n)$  as per the theory. Since building of an MST involves many operations like to find the edges in decreasing order and creating an tree, we can see that the time to build a MST is larger. And, the time to find the source to destination path is very less than the build time as it just involves going through the parent array got from DFS which takes linear time. We can observe that Kruskal is faster than Dijkstra with Heap for graph with 6 degree. And, for the dense graph, Dijkstra with Heap is faster than that of Kruskal Algorithm. The reason behind this might be that since more number of edges are to be inserted in the heap and are to be sorted each time in the case of Kruskal Algorithm.

## 4 Conclusion

From the outputs, we can observe that although the theoretical time complexity are the same, the running time for each algorithm differs for each case. This is because the graphs are random in nature and each graph won't let the algorithm reach its worst case scenario which is being represented by the theoretical complexities. Dijkstra performs better when we need to find a single path between two vertices. Kruskal algorithm gives us an advantage of generating a given MST once and determining the path based on that MST in linear time.