

CSCE 629

Analysis of Algorithms

Project Report

Due Date : 2<sup>nd</sup> December, 2014

Submitted By:

Deep Desai

124001412

## **Implementation:**

### Algorithms:

#### 1) Max Bandwidth path using Dijkstra's algorithm

- a) for each vertex  $v = 1$  to  $n$  do  
     $\text{status}[v] = \text{unseen}$
- b)  $\text{status}[s] = \text{intree}$   
     $d[s] = 0$   
     $\text{dad}[s] = -1$
- c) for each edge  $[s, v]$  do  
     $\text{status}[v] = \text{fringe}$   
     $\text{dad}[v] = s$   
     $d[v] = \text{wt}(s, v)$
- d) while there are fringes do  
    let  $v$  be the fringe with  $\max(d[v])$   
    // For array it goes through all the  $d[v]$   
    // To find out the max for heap it does  $\text{delMax}()$   
     $\text{status}[v] = \text{intree}$   
    for each edge  $[v, t]$  do  
        if  $\text{status}[t] == \text{unseen}$   
        then  $\text{status}[t] = \text{fringe}$   
             $\text{dad}[t] = v$   
             $d[t] = \min(d[v], \text{wt}(v, t))$   
        else if  $\text{status}[t] == \text{fringe}$  and  $d[t] < \min(d[v], \text{wt}(v, t))$   
        then  $d[t] = \min(d[v], \text{wt}(v, t))$   
             $\text{dad}[t] = v$

#### 2) Max Bandwidth path using Kruskal's Algorithm

- a) Sort all edges in decreasing order
- b)  $T = \phi$
- c) for each edge  $e_i = [v_i, w_i]$  do  
     $r1 = \text{find}(v_i)$   
     $r2 = \text{find}(w_i)$   
    if  $r1 \neq r2$   
    then  $T = T + e_i$   
         $\text{union}(r1, r2)$
- d) return  $T$

#### 3) Union-Find

##### Union( $s1, s2$ )

- a) if  $\text{rank}[s1] > \text{rank}[s2]$   
    then  $\text{dad}[s2] = s1$   
         $\text{rank}[s1] += \text{rank}[s2]$   
    else  
    then  $\text{dad}[s1] = s2$   
         $\text{rank}[s2] += \text{rank}[s1]$

Find(i)

```
a)   s = stack
b)   while (i != dad[i]) do
        s.push(i)
        i = dad[i]
c)   while (s not empty) do
        dad[s.pop()] = i
d)   return i
```

I have implemented this project in JAVA.

The flow of the program is as given below:

MainProgram -> GraphGenerator -> DoStuffForSparse, DoStuffForDense {5 times each}  
DoStuffForSparse and DoStuffForDense functions take an EdgeWeightedGraph as an argument, then it adds a path from s to t that goes through all vertices in the graph and then makes instances of MaxBandwidthPathHeapDijkstras, MaxBandwidthPathArrayDijkstras and MaxBandwidthKruskal class one by one.

Implementation of Graph:

class EdgeWeightedGraph (class for Graph, each graph is an instance of this class)  
class Edge (class for Edges, each edge is an instance of this class)  
class SET (each list in the adjacency list is an instance of this class)  
Edge weights are assigned random weight from 0 to 9999

Implementation of making Graph:

```
->   for i = 0 to V do          //V = no. of vertices
        make integer array arrlist[V]
        for j = 0 to V do
            if degree[j] < density and j != i
                then add j to arrlist
        left = density - degree[i]      //density = 6 or 20%(V)
        n = sizeof(arrlist)
        for k = 0 to n or left > 0 do //till left > 0 or whole arrlist (if n < left)
            find random number r in between 0 to n-k-1
            swap(arrlist[r], arrlist[n-k-1])
            w = arrlist[n-k-1]
            add edge [i, w] with random weight
            degree[i]++
            degree[w]++
```

Implementation of Heap:

I have used a private class Node which has variables vertex and value, value is the value of edge weight and the vertex is the corresponding vertex. I then make an array of instances of node class and implement heap using this array. I also keep a vertex to index mapping for example  $vi[v] = i$  means the index of vertex v in the heap is i, I do this to make update  $O(1)$ .

## **Time Complexity and Performance of Algorithms:**

### **1. Time Complexity**

#### **A. MaxBandwidthPath using Dijkstra's Algorithm(array implementation) : $O(n^2+m)$**

The inner loop to find max runs  $n$  times and the outer loop can also run maximum of  $(n-1)$  times. Hence,  $O(n^2)$ . The inner for loop runs for total of  $m$  times in whole program. Hence,  $O(m)$ . Thus overall time complexity is  $O(n^2+m)$

#### **B. MaxBandwidthPath using Dijkstra's Algorithm(heap implementation) : $O(m\log n + n\log n)$**

The inner for loop in whole program runs for total number of edges,  $m$ , and the insert in the heap takes  $\log n$  times. Hence,  $O(m\log n)$ . The outer loop can run maximum of  $(n-1)$  times and the delete in heap takes  $O(n\log n)$ . Hence  $O(n\log n)$ . Thus overall time complexity comes to  $O(n\log n + m\log n)$

#### **C. MaxBandwidthPath using Kruskal Algorithm : $O(m\log^*n + m\log m)$**

Sorting  $m$  edges takes time  $O(m\log m)$  and  $m$  find operations with path compression in the for loop takes  $O(m\log^*n)$  time. Hence,  $O(m\log m + m\log^*n)$

### **2. Performance**

#### **A. Sparse Graph**

**Kruskal < Dijkstra's(Heap) < Dijkstra's(Array)**

This is quite obvious because in sparse graph  $m$  is less, so kruskal's time complexity becomes  $O(m\log^*n)$ , Dijkstra's(heap) time complexity becomes  $O(n\log n)$  and Dijkstra's(array) time complexity becomes  $O(n^2)$   
 $O(m\log^*n) < O(n\log n) < O(n^2)$  {for  $n = 5000$  and  $m = 15000$ }

#### **B. Dense Graph**

**Dijkstra's(Heap) < Dijkstra's(Array) < Kruskal**

In dense graph the value of  $m$  is very high compared to  $n$ , so kruskal's time complexity becomes  $O(m\log m)$ , Dijkstra's(heap) time complexity becomes  $O(m\log n)$  and Dijkstra's(array) time complexity becomes  $O(n^2)$   
 $O(m\log n) < O(n^2) < O(m\log m)$  {for  $n = 5000$  and  $m = 2500000$ }

## **Future Improvements:**

The swap operations in the Heap and HeapSort can be reduced which can improve time taken for the algorithm. Merge sort can be used instead of heap sort because Merge sort on arrays has considerably better data cache performance, often outperforming heapsort on modern desktop computers because merge sort frequently accesses contiguous memory locations (good locality of reference); heapsort references are spread throughout the heap.

## **Output:**

deepdesai:~ deep\$ java -jar ~/CSCE629.jar

Making Sparse Graph : 1

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For 2434 to 46

KRUSKAL :- Time: 39ms Bandwidth: 7465

DIJKSTRAS-HEAP :- Time: 101ms Bandwidth: 7465

DIJKSTRAS-ARRAY :- Time: 201ms Bandwidth: 7465

For 4229 to 3535

KRUSKAL :- Time: 19ms Bandwidth: 7314

DIJKSTRAS-HEAP :- Time: 124ms Bandwidth: 7314

DIJKSTRAS-ARRAY :- Time: 157ms Bandwidth: 7314

For 2204 to 57

KRUSKAL :- Time: 15ms Bandwidth: 7500

DIJKSTRAS-HEAP :- Time: 91ms Bandwidth: 7500

DIJKSTRAS-ARRAY :- Time: 109ms Bandwidth: 7500

For 2405 to 1245

KRUSKAL :- Time: 15ms Bandwidth: 7775

DIJKSTRAS-HEAP :- Time: 77ms Bandwidth: 7775

DIJKSTRAS-ARRAY :- Time: 120ms Bandwidth: 7775

For 1434 to 1243

KRUSKAL :- Time: 24ms Bandwidth: 7724

DIJKSTRAS-HEAP :- Time: 77ms Bandwidth: 7724

DIJKSTRAS-ARRAY :- Time: 104ms Bandwidth: 7724

Making Sparse Graph : 2

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For 4312 to 2420

KRUSKAL :- Time: 10ms Bandwidth: 7079

DIJKSTRAS-HEAP :- Time: 28ms Bandwidth: 7079

DIJKSTRAS-ARRAY :- Time: 98ms Bandwidth: 7079

For 640 to 1671

KRUSKAL :- Time: 14ms Bandwidth: 6478

DIJKSTRAS-HEAP :- Time: 28ms Bandwidth: 6478

DIJKSTRAS-ARRAY :- Time: 82ms Bandwidth: 6478

For 2899 to 1413

KRUSKAL :- Time: 16ms Bandwidth: 7952

DIJKSTRAS-HEAP :- Time: 30ms Bandwidth: 7952

DIJKSTRAS-ARRAY :- Time: 104ms Bandwidth: 7952

For 4191 to 447

KRUSKAL :- Time: 8ms Bandwidth: 7403

DIJKSTRAS-HEAP :- Time: 28ms Bandwidth: 7403

DIJKSTRAS-ARRAY :- Time: 94ms Bandwidth: 7403

For 3341 to 3743

KRUSKAL :- Time: 44ms Bandwidth: 6007

DIJKSTRAS-HEAP :- Time: 40ms Bandwidth: 6007

DIJKSTRAS-ARRAY :- Time: 68ms Bandwidth: 6007

Making Sparse Graph : 3

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For 1376 to 855

KRUSKAL :- Time: 10ms Bandwidth: 5468

DIJKSTRAS-HEAP :- Time: 35ms Bandwidth: 5468

DIJKSTRAS-ARRAY :- Time: 95ms Bandwidth: 5468

For 4781 to 3200

KRUSKAL :- Time: 7ms Bandwidth: 7425

DIJKSTRAS-HEAP :- Time: 35ms Bandwidth: 7425

DIJKSTRAS-ARRAY :- Time: 101ms Bandwidth: 7425

For 4589 to 4672

KRUSKAL :- Time: 11ms Bandwidth: 5749

DIJKSTRAS-HEAP :- Time: 38ms Bandwidth: 5749

DIJKSTRAS-ARRAY :- Time: 100ms Bandwidth: 5749

For 3689 to 450

KRUSKAL :- Time: 10ms Bandwidth: 7540

DIJKSTRAS-HEAP :- Time: 34ms Bandwidth: 7540

DIJKSTRAS-ARRAY :- Time: 112ms Bandwidth: 7540

For 4546 to 1179

KRUSKAL :- Time: 14ms Bandwidth: 8133

DIJKSTRAS-HEAP :- Time: 39ms Bandwidth: 8133

DIJKSTRAS-ARRAY :- Time: 117ms Bandwidth: 8133

Making Sparse Graph : 4

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For 1349 to 3925

KRUSKAL :- Time: 7ms Bandwidth: 6127

DIJKSTRAS-HEAP :- Time: 29ms Bandwidth: 6127

DIJKSTRAS-ARRAY :- Time: 66ms Bandwidth: 6127

For 1549 to 3866

KRUSKAL :- Time: 8ms Bandwidth: 6721

DIJKSTRAS-HEAP :- Time: 30ms Bandwidth: 6721

DIJKSTRAS-ARRAY :- Time: 102ms Bandwidth: 6721

For 1181 to 2642

KRUSKAL :- Time: 8ms Bandwidth: 7882

DIJKSTRAS-HEAP :- Time: 29ms Bandwidth: 7882

DIJKSTRAS-ARRAY :- Time: 110ms Bandwidth: 7882

For 586 to 780

KRUSKAL :- Time: 7ms Bandwidth: 6812

DIJKSTRAS-HEAP :- Time: 27ms Bandwidth: 6812

DIJKSTRAS-ARRAY :- Time: 89ms Bandwidth: 6812

For 4990 to 4465

KRUSKAL :- Time: 9ms Bandwidth: 7245

DIJKSTRAS-HEAP :- Time: 30ms Bandwidth: 7245

DIJKSTRAS-ARRAY :- Time: 77ms Bandwidth: 7245

Making Sparse Graph : 5

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For 369 to 4804

KRUSKAL :- Time: 13ms Bandwidth: 6801

DIJKSTRAS-HEAP :- Time: 36ms Bandwidth: 6801

DIJKSTRAS-ARRAY :- Time: 121ms Bandwidth: 6801

For 3299 to 4275

KRUSKAL :- Time: 12ms Bandwidth: 8031  
DIJKSTRAS-HEAP :- Time: 35ms Bandwidth: 8031  
DIJKSTRAS-ARRAY :- Time: 122ms Bandwidth: 8031  
For 2591 to 4088  
KRUSKAL :- Time: 9ms Bandwidth: 5381  
DIJKSTRAS-HEAP :- Time: 30ms Bandwidth: 5381  
DIJKSTRAS-ARRAY :- Time: 96ms Bandwidth: 5381  
For 3484 to 4237  
KRUSKAL :- Time: 10ms Bandwidth: 8227  
DIJKSTRAS-HEAP :- Time: 31ms Bandwidth: 8227  
DIJKSTRAS-ARRAY :- Time: 106ms Bandwidth: 8227  
For 275 to 1896  
KRUSKAL :- Time: 8ms Bandwidth: 8300  
DIJKSTRAS-HEAP :- Time: 32ms Bandwidth: 8300  
DIJKSTRAS-ARRAY :- Time: 126ms Bandwidth: 8300  
Making Dense Graph : 1  
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For 4589 to 3050  
DIJKSTRAS-HEAP :- Time: 533ms Bandwidth: 9981  
DIJKSTRAS-ARRAY :- Time: 545ms Bandwidth: 9981  
KRUSKAL :- Time: 5569ms Bandwidth: 9981  
For 1344 to 4968  
DIJKSTRAS-HEAP :- Time: 538ms Bandwidth: 9982  
DIJKSTRAS-ARRAY :- Time: 532ms Bandwidth: 9982  
KRUSKAL :- Time: 6801ms Bandwidth: 9982  
For 860 to 4462  
DIJKSTRAS-HEAP :- Time: 557ms Bandwidth: 9981  
DIJKSTRAS-ARRAY :- Time: 642ms Bandwidth: 9981  
KRUSKAL :- Time: 7672ms Bandwidth: 9981  
For 358 to 4144  
DIJKSTRAS-HEAP :- Time: 542ms Bandwidth: 9986  
DIJKSTRAS-ARRAY :- Time: 543ms Bandwidth: 9986  
KRUSKAL :- Time: 7280ms Bandwidth: 9986  
For 2838 to 4720  
DIJKSTRAS-HEAP :- Time: 552ms Bandwidth: 9983  
DIJKSTRAS-ARRAY :- Time: 632ms Bandwidth: 9983  
KRUSKAL :- Time: 7368ms Bandwidth: 9983  
Making Dense Graph : 2  
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For 241 to 3018  
DIJKSTRAS-HEAP :- Time: 512ms Bandwidth: 9971  
DIJKSTRAS-ARRAY :- Time: 550ms Bandwidth: 9971  
KRUSKAL :- Time: 7551ms Bandwidth: 9971  
For 4333 to 2976  
DIJKSTRAS-HEAP :- Time: 500ms Bandwidth: 9984  
DIJKSTRAS-ARRAY :- Time: 552ms Bandwidth: 9984  
KRUSKAL :- Time: 7398ms Bandwidth: 9984  
For 1188 to 2530  
DIJKSTRAS-HEAP :- Time: 611ms Bandwidth: 9982

DIJKSTRAS-ARRAY :- Time: 554ms Bandwidth: 9982  
KRUSKAL :- Time: 6785ms Bandwidth: 9982  
For 1915 to 294  
DIJKSTRAS-HEAP :- Time: 511ms Bandwidth: 9983  
DIJKSTRAS-ARRAY :- Time: 551ms Bandwidth: 9983  
KRUSKAL :- Time: 7298ms Bandwidth: 9983  
For 108 to 3262  
DIJKSTRAS-HEAP :- Time: 519ms Bandwidth: 9987  
DIJKSTRAS-ARRAY :- Time: 535ms Bandwidth: 9987  
KRUSKAL :- Time: 7344ms Bandwidth: 9987  
Making Dense Graph : 3  
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For 3285 to 1144  
DIJKSTRAS-HEAP :- Time: 517ms Bandwidth: 9984  
DIJKSTRAS-ARRAY :- Time: 558ms Bandwidth: 9984  
KRUSKAL :- Time: 7216ms Bandwidth: 9984  
For 3029 to 4214  
DIJKSTRAS-HEAP :- Time: 481ms Bandwidth: 9986  
DIJKSTRAS-ARRAY :- Time: 536ms Bandwidth: 9986  
KRUSKAL :- Time: 7049ms Bandwidth: 9986  
For 3014 to 4970  
DIJKSTRAS-HEAP :- Time: 510ms Bandwidth: 9985  
DIJKSTRAS-ARRAY :- Time: 555ms Bandwidth: 9985  
KRUSKAL :- Time: 7046ms Bandwidth: 9985  
For 692 to 4695  
DIJKSTRAS-HEAP :- Time: 509ms Bandwidth: 9973  
DIJKSTRAS-ARRAY :- Time: 525ms Bandwidth: 9973  
KRUSKAL :- Time: 6971ms Bandwidth: 9973  
For 3167 to 3964  
DIJKSTRAS-HEAP :- Time: 511ms Bandwidth: 9985  
DIJKSTRAS-ARRAY :- Time: 667ms Bandwidth: 9985  
KRUSKAL :- Time: 6973ms Bandwidth: 9985  
Making Dense Graph : 4  
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For 3919 to 3055  
DIJKSTRAS-HEAP :- Time: 511ms Bandwidth: 9981  
DIJKSTRAS-ARRAY :- Time: 520ms Bandwidth: 9981  
KRUSKAL :- Time: 7391ms Bandwidth: 9981  
For 927 to 1961  
DIJKSTRAS-HEAP :- Time: 528ms Bandwidth: 9987  
DIJKSTRAS-ARRAY :- Time: 560ms Bandwidth: 9987  
KRUSKAL :- Time: 6780ms Bandwidth: 9987  
For 3876 to 1701  
DIJKSTRAS-HEAP :- Time: 487ms Bandwidth: 9975  
DIJKSTRAS-ARRAY :- Time: 509ms Bandwidth: 9975  
KRUSKAL :- Time: 6998ms Bandwidth: 9975  
For 1088 to 3789  
DIJKSTRAS-HEAP :- Time: 510ms Bandwidth: 9987  
DIJKSTRAS-ARRAY :- Time: 549ms Bandwidth: 9987



KRUSKAL :- Time: 6966ms Bandwidth: 9987  
For 1331 to 1965  
          DIJKSTRAS-HEAP :- Time: 502ms Bandwidth: 9983  
          DIJKSTRAS-ARRAY :- Time: 563ms Bandwidth: 9983  
          KRUSKAL :- Time: 6868ms Bandwidth: 9983  
Making Dense Graph : 5  
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For 3115 to 3766  
          DIJKSTRAS-HEAP :- Time: 484ms Bandwidth: 9980  
          DIJKSTRAS-ARRAY :- Time: 496ms Bandwidth: 9980  
          KRUSKAL :- Time: 7158ms Bandwidth: 9980  
For 4495 to 1311  
          DIJKSTRAS-HEAP :- Time: 507ms Bandwidth: 9974  
          DIJKSTRAS-ARRAY :- Time: 502ms Bandwidth: 9974  
          KRUSKAL :- Time: 6884ms Bandwidth: 9974  
For 4754 to 4885  
          DIJKSTRAS-HEAP :- Time: 484ms Bandwidth: 9980  
          DIJKSTRAS-ARRAY :- Time: 514ms Bandwidth: 9980  
          KRUSKAL :- Time: 8622ms Bandwidth: 9980  
For 121 to 3670  
          DIJKSTRAS-HEAP :- Time: 517ms Bandwidth: 9984  
          DIJKSTRAS-ARRAY :- Time: 551ms Bandwidth: 9984  
          KRUSKAL :- Time: 6907ms Bandwidth: 9984  
For 911 to 2245  
          DIJKSTRAS-HEAP :- Time: 499ms Bandwidth: 9985  
          DIJKSTRAS-ARRAY :- Time: 562ms Bandwidth: 9985  
          KRUSKAL :- Time: 7478ms Bandwidth: 9985