

Shortest Path Algorithm with Heaps

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Chapter 1 Introduction

1.1 Background

Shortest Path Algorithm, which is the algorithm to find the shortest distance from one point to another, is one of the most classic and basic algorithms in computer science; and it is also the basis of many other algorithms, so we It is necessary to study how to optimize this basic algorithm.

1.2 Problem Description

In this project, we are to solve the “Shortest Path Algorithm with Heaps” problem. We are supposed to compute the shortest paths using Dijkstra's algorithm. The implementation shall be based on a min-priority queue, such as a Fibonacci heap. The goal of the project is to find the best data structure for the Dijkstra's algorithm.

We are to solve 3 sub-problems.

1. Implement Dijkstra's algorithm based on a min-priority queue.
2. Repeat the algorithm with random source and target for 1000 times.
3. Count the total time of 1000 runs.

Here are the heaps we test.

1. Fibonacci heap, invented by [Michael L. Fredman](#) and [Robert E. Tarjan](#).
2. Binomial heap, invented by [Jean Vuillemin](#).

Chapter 2 Algorithm Specification

2.1 Dijkstra

It is used to find the shortest path between two points specified in the figure, or the shortest path between one point and all other points. It is essentially a greedy algorithm.

Basic idea:

1. Consider the initial point on the graph as a set S , and other points as another set
2. According to the initial point, find the distance $d[i]$ from other points to the initial point
3. Select the smallest $d[i]$ (denoted as $d[x]$), and add the point corresponding to this $d[i]$ edge (denoted as x) to the set S
4. According to x , update the $d[y]$ value of the point y adjacent to x : $d[y] = \min(d[y], d[x] + \text{edge weight } w[x][y])$, because the distance may be reduced, so this update operation is called a slack operation.
5. Repeat steps 3 and 4 until the target point is also added to the set. At this time, $d[i]$ corresponding to the target point is the shortest path length.

```
1 distance[s] ← 0
2 for i ← 1 to n
3   t ← unmarked point that has the minimum distance // (use heap!!)
4   for every edge (t, v)
5     update the distance of v
6   mark vertex t
```

2.2 Introduction of Heaps

2.2.1 Binomial heap

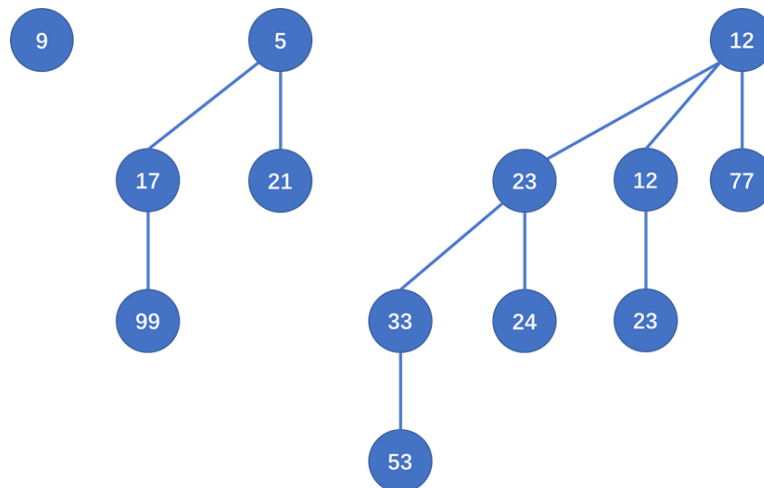


Figure1 Sample of Binomial Heap

The binomial heap is different from the common heap. Instead of being an unordered heap, it is better to say that it is a collection of ordered heaps, or a forest of multi-fork trees. Each of these trees is a binomial tree, and trees of the same height can only appear once. If we mark the tree of height k with the symbol B_k and specify the height of a single node to be 0, it is not difficult to find that B_k is actually composed of two trees B_{k-1} , so when two trees of the same height appear, we will proceed Merge to generate a new tree, where the root with a small root node value will continue to be the root, and the root of another tree will be hung in the form of a son, and the height of the new tree will be increased by one; the new tree If you encounter trees of the same height again, This process will be

repeated. The process of merging this tree is also similar to the carry process of addition of binary numbers. Therefore, we call this data structure a binomial heap.

The overall structure and internal nodes of the binomial heap are defined as follows:

```
1 struct node{
2     ElementType data;
3     node* left;
4     node* next;
5 };
6 struct binHeap{
7     int cursize;
8     node* tree[treenum];
9 };
```

Each node is connected to other nodes in the tree by "left son, right brother", and the root nodes of all trees are stored in the array *trees* of the structure *BinomialHeap*.

In the binomial heap, almost all operations are achieved through merging, and the process of merging is exactly the same as binary addition:

1. Directly merge the two forests.
2. Starting from the height $h = 0$, check whether there is only one tree at the height h , if not, merge two of them to generate a height of $h + 1$ and check the height of the same height.
3. Repeat until all heights have been checked.

```
1 function merge(BinomialHeap H1,BinomialHeap H2)
2 begin
3     for height :=0 to MaxHeight begin
4         if(hasTwoTrees(height)) begin
5             combineTwoTrees()
6         end if
7     end for
8 end
```

With the merge operation, the heap operation can be regarded as merging the original heap and the heap with only one node.

The top element of the heap, which is our commonly used *top()* operation, needs to be searched on the roots of all trees every time, because the elements on the root, and the prime element is the smallest element in the entire tree.

The operation to delete the top element actually only needs the following steps:

1. Find the top of the pile, the smallest element
2. Remove the tree from the forest, delete its roots, and leave the remaining nodes as a new forest
3. The two forests are merged and you get a heap with the top element removed

The pseudo code of the delete operation is as follows:

```
1 function pop(BinomialHeap H)
2 begin
3     MinTree := findMin();
4     H1 := H - MinTree;
5     H2 := MinTree - MinTree.top();
6     merge(H1,H2);
7 end
```

2.2.2 Fibonacci heap

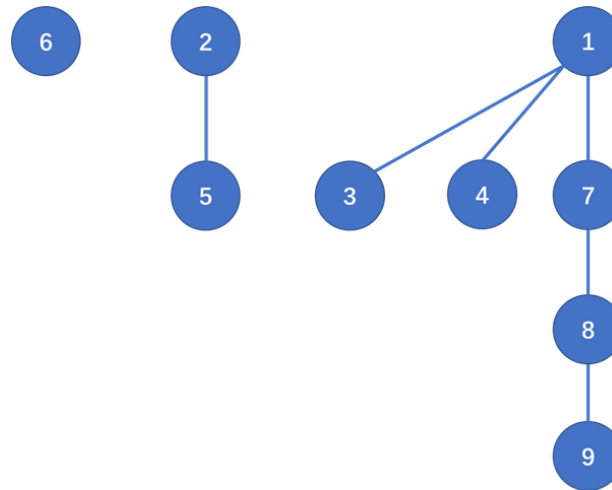


Figure2 Sample of Fibonacci Heap

The initial idea of the Fibonacci heap is similar to the binomial heap, and it is also to maintain a forest. Each tree in the forest meets the most basic nature of the heap, that is, the value of the parent node must be greater than the value of all nodes in its subtree.

The difference with the binomial heap is that the Fibonacci heap does not force every root degree to meet certain requirements, but only stores all root nodes in a doubly linked list, and uses a pointer *minNode* to maintain the minimum node information. . And the Fibonacci heap does not maintain the balanced nature of the heap when inserting, merging, and finding the smallest node. The structure of the heap is only modified when the smallest node is deleted.

In addition, the child nodes of each node of the Fibonacci heap are also stored through a doubly linked list. The information stored in the node includes the key value of the node, the pointer to the node's parent node, the node on the left and the right. The two pointers of the node, the pointer to the starting node of the doubly linked list, the tag variable (the variable used to maintain and modify the value of the node), and the degree of the node. The structure is defined as follows:

```
1  typedef struct fib_node* ptr_fib_node;
2  struct fib_node {
3      int distance;           //The length of path from the source node to this node
4      int degree;            //The number of its children
5      int index;             //The index of this node
6      bool mark;             //Whether its child had been removed or not.
7      ptr_fib_node parent;    //The pointer to its parent
8      ptr_fib_node child;     //The pointer to its child
9      ptr_fib_node left;      //The pointer to its left sibling
10     ptr_fib_node right;     //The pointer to its right sibling
11 };
12
13 //This structure is used in fibonacci method
14 struct {
15     int tree_num;           //The number of trees in the fibonacci heap
16     ptr_fib_node fib_temp_node; //Only used as a temporary pointer in variable
17     ptr_fib_node fib_min_node; //The pointer to the node with minimum
18     int distance;
19     ptr_fib_node fib_temp_stack[MAX_NODE/2 + 1]; //A temp array, used to reconstruct fib_heap
20     struct fib_node fib_node[MAX_NODE]; //All the fibonacci nodes
21 }fib_heap;
```

The insertion operation of the Fibonacci heap is very simple. You only need to insert the node to be inserted as a root node with no child nodes into the doubly linked list of the root node, and update the *minNode* if necessary. In the same way, the merging operation is also very simple. Just merge the linked lists of the root nodes of the two Fibonacci heaps, and remember to update *minNode* as well. The operation to find the minimum value is to return the key value of the node pointed to by *minNode*.

None of the above operations change the overall structure of the heap, but simply operate on the

root doubly linked list. This makes the insertion of the Fibonacci heap and the time complexity of the operation of finding the minimum value both linear, and the time complexity of a merge is linearly related to the number of roots in the heap.

The difference between the Fibonacci heap and the binomial heap is that the Fibonacci heap does not necessarily have at most two nodes with the same degree, so the code must also be adjusted. We call this operation **consolidate**. There are many ways to achieve consolidation, but the mainstream method is to use $A[deg]$ to record the node with the smallest key value of degree deg that has been found so far. When a new node is found, if $A[deg]$ is empty, assign $A[deg]$ to this node, if not, combine this node with the node stored in $A[deg]$ into one node, merge $A[deg]$ is set to null and the merged nodes are used as new nodes to operate with $A[deg + 1]$.

The pseudo code is as follows:

```

1  function consolidate()
2  begin
3      pointer ptr := minNode
4      pointer startP := ptr
5      do begin
6          deg := ptr->degree
7          while A[deg] is not null begin
8              ptr2 := A[deg]
9              if ptr->key > ptr2->key begin
10                 swap ptr ptr2
11             end if
12             if ptr2 is the minimum node so far begin
13                 minNode := ptr2
14             end if
15             if ptr2 == startP begin
16                 startP point to the next node of *startP
17             end if
18             Link ptr2 to ptr's child list
19             A[deg] := null
20             deg := deg + 1
21         end while
22         A[deg] := ptr
23         ptr point to the right node of *ptr
24     end while ptr != startP
25     update minNode with the minimum node in heap
26 end

```

The operation to be described below is the modified value operation of the Fibonacci heap. If the value after the increase is smaller than the previous value, all the child nodes of the added node will be linked to the root linked list, and the added node will also be connected Go to the root linked list and cascade its parent node.

If the modification value is a decrease value operation, it is necessary to judge whether the value decrease is smaller than the value of its parent node, if it is smaller than the value of the node, connect it to the root linked list and cascade the parent node. And update *minNode* at any time.

2.3 Sketch of Algorithms

2.3.1 Sketch of Algorithm Using Binomial Heap

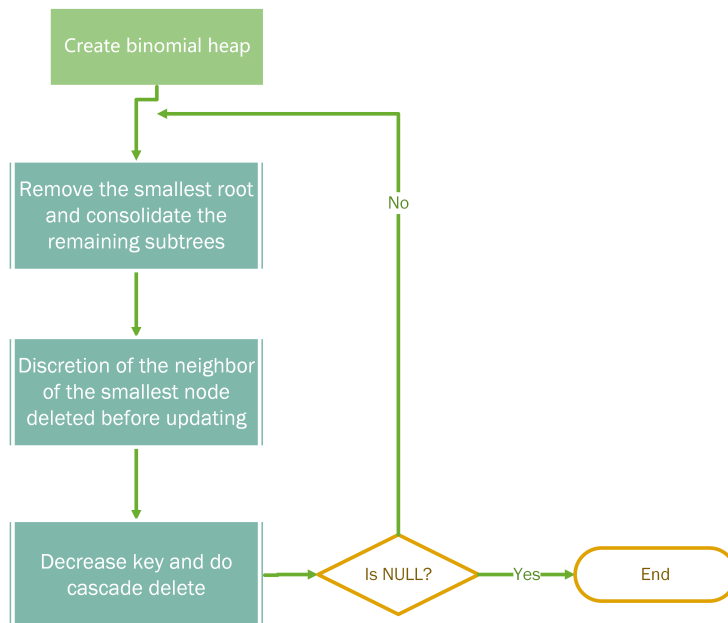


Figure3 Sketch of Algorithm Using Binomial Heap

2.3.2 Sketch of Algorithm Using Fibonacci Heap

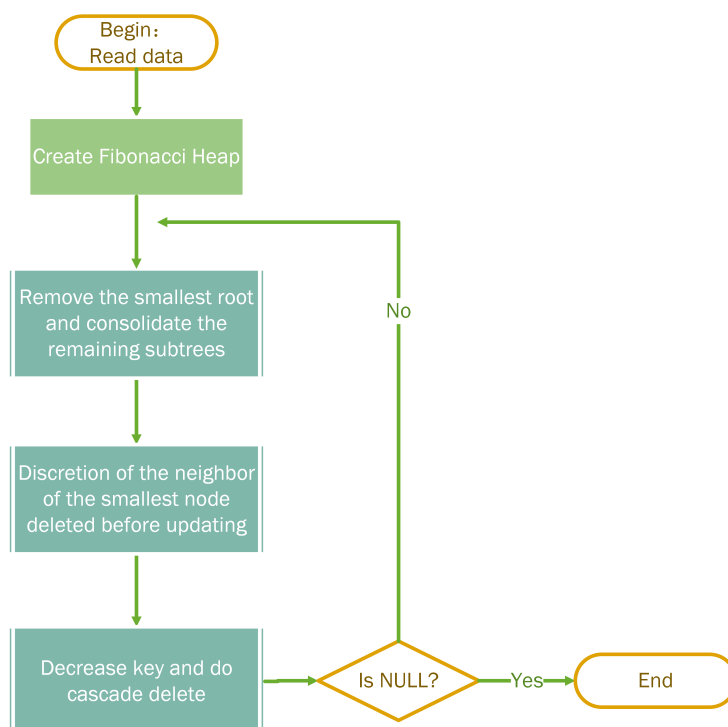


Figure4 Sketch of Algorithm Using Fibonacci Heap

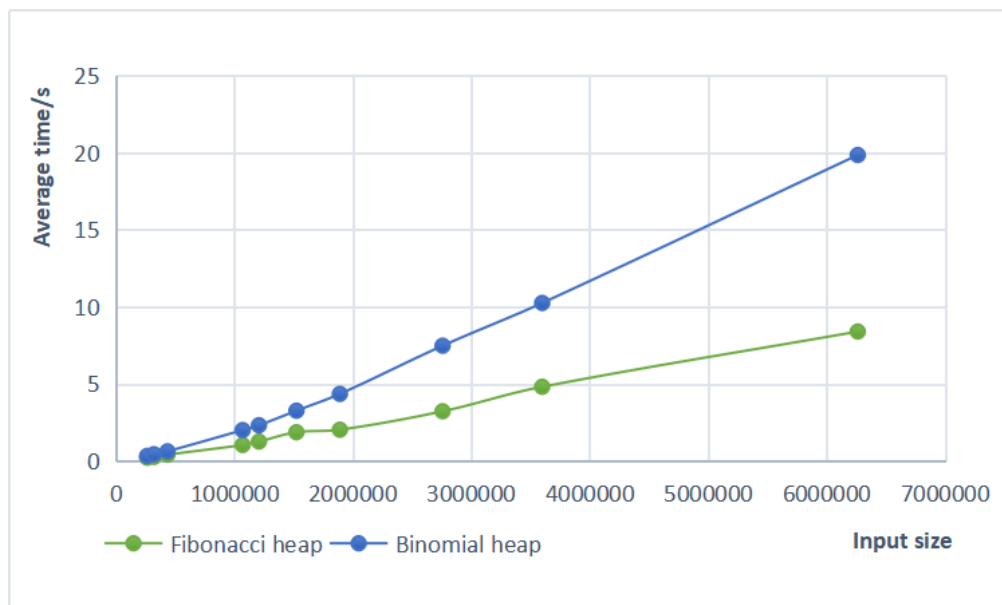
Chapter 3 Testing Results

3.1 Testing Results in Table

Table1 Average Time with Queries=10000					
Case	Name	Nodes	Arcs	Fibonacci heap/s	Binomial heap/s
0	test.txt	264,346	733,846		
1	USA-road-d.NY.gr	264,346	733,846	0.239	0.353
2	USA-road-d.BAY.gr	321,270	800,172	0.287	0.460
3	USA-road-d.COL.gr	435,666	1,057,066	0.433	0.649
4	USA-road-d.FLA.gr	1,070,376	2,712,798	1.062	2.026
5	USA-road-d.NW.gr	1,207,945	2,840,208	1.283	2.340
6	USA-road-d.NE.gr	1,524,453	3,897,636	1.887	3.282
7	USA-road-d.CAL.gr	1,890,815	4,657,742	2.049	4.371
8	USA-road-d.LKS.gr	2,758,119	6,885,658	3.245	7.493
9	USA-road-d.E.gr	3,598,623	8,778,114	4.833	10.263
10	USA-road-d.W.gr	6,262,104	15,248,146	8.411	19.849

3.2 Testing Results in Graph

Figure5 Run times vs. Input sizes



Chapter 4 Analysis and Comments

4.1 Analysis on Time Complexity

4.1.1 Binomial Heap

Merge

The time complexity of merging two binomial heaps is $T = O(\log N)$, which can be very easily proven because the merging of Binomial Heaps is exactly the same as the addition of two binary numbers. Each bit of the binary number corresponds to a tree, and the two trees are merged. So the complexity of merging two trees is $O(1)$ and the number of merging operations is no more than the bits of the binary number. Therefore, the time complexity of merging is $T = O(\log N)$.

Inset

Insertion is essentially merging the original heap with a heap with only one node, so the worst-case time complexity is $O(\log N)$. However, this worst-case scenario does not occur every time, so we analyze the amortized complexity below.

Define the potential energy function of the binomial reactor as:

$$\Phi(D_i) = \text{The number of trees after the } i\text{-th insertion}$$

We assume that the cost of creating a new forest (obviously this is a constant) is 1, so we can get the cost per operation:

$$c_i = 1 + \text{Rounding times}$$

Each carry will trigger a tree merge, the cost of tree merge is $O(1)$, so the total carry cost is proportional to the number of carry.

At the same time, it is noted that each carry will cause the number of trees to increase by one, so each time the number of trees decreases is equal to the number of carry -1, it needs to be reduced by 1, This is because the newly inserted node will initially introduce a tree. If we replace the number of carry with c_i , it can be known that the reduction in the number of trees is $2 - c_i$.

$$c_i + (\phi_i - \phi_{i-1}) = 2$$

Accumulate the equation to get:

$$\sum_{i=1}^N c_i + \phi_N - \phi_0 = 2N$$
$$\sum_{i=1}^N c_i = 2N + \phi_0 - \phi_n \leq 2N = O(N)$$

Therefore, the amortized complexity of the insert operation is $O(1)$.

FindMin

The minimum value will only appear at the root of the tree, so you only need to traverse the tree root and update the minimum value when inserting and deleting elements. So the time complexity of finding the minimum value is $O(1)$.

Delete

Deletion consists of the above three steps, so the time complexity of the delete operation is $O(\log N)$.

4.1.2 Fibonacci Heap

FindMin

When finding the minimum, since the minimum heap property is satisfied, it is only necessary to find the root node of the binomial tree. Since there are $\log N$ subtrees in total, the time taken is $O(\log N)$. We can save a pointer to the smallest element, so it takes $O(1)$ to find the node where the smallest keyword is. This pointer needs to be modified when performing other operations.

Delete Min

When deleting the minimum, first find the node where the smallest keyword is located, then delete it from its binomial tree and get its subtree. Think of these subtrees as separated binomial heap, and then merge this heap into the original heap. Since each tree has at most $\log N$ subtrees, the time to create a new heap is $O(\log N)$. At the same time, the time to merge the heap is also $O(\log N)$, so the time required for the entire operation is $O(\log N)$.

Decrease

When decreasing a certain key, after reducing the value of a specific node, the minimum heap property may not be satisfied. At this time, the node where it is located is exchanged with the parent node, and if the minimum heap property is not satisfied, then it is exchanged with the grandfather node until the minimum heap property is satisfied. The time required for the operation is $O(\log N)$.

Insert

In Binomial Heap, when inserting, create a binomial heap containing only the elements to be inserted, and then merge this heap with the original binomial heap to get the inserted heap. Because of the need to merge, the insert operation takes $O(\log N)$ time. The time complexity of the amortized analysis is $O(1)$.

Extracting Min

In Binomial Heap, when inserting, we have $t(H') = t(H) + 1, m(H') = m(H)$, so there exists:

$$((t(H) + 1) + 2m(H)) - (t(H) + 2m(H)) = 1$$

As a consequence, we know that the real complexity is $O(1)$, and the amortized complexity is $O(1)$.

While merging:

$$\phi(H) - (\phi(H_1) + \phi(H_2)) = (t(H) + 2m(H)) - ((t(H_1) + 2m(H_1)) + (t(H_2) + 2m(H_2)))$$

This equation equals to 0, which is also fits the prediction.

When extracting the smallest node, we have potential:

$$\phi(pre) = t(H) + 2m(H)$$

And then the potential increases to $D(n) + 1 + 2m(H)$. Therefore, there are at most $D(n) + 1$ roots after operation with no nodes to be marked. So:

$$O(D(n) + t(H)) + (D(n) + 1 + 2m(H)) - (t(H) + 2m(H)) = O(D(n)) + O(t(H)) - t(H) = O(D(n))$$

As we can know, $D(m) = O(\log n)$, so the time complexity of extracting minimum element is $O(\log N)$.

4.2 Analysis on Space Complexity

4.2.1 Binomial Heap

Each tree in the binomial heap is stored using a link structure, each key value is stored in a node, and all the trees are passed a linear number which is based on the array structure, so the space complexity is $O(N)$

4.2.2 Fibonacci Heap

The space required for the Fibonacci heap is $O(N)$ to store the contents of all nodes and $O(\log N)$ to store the auxiliary array required for consolidation operation. So the total time complexity is $O(N)$.

4.3 Time and Space Complexity of Dijkstra Algorithm

In Dijkstra's algorithm, the number of inserting nodes into the heap, querying the smallest node, and deleting the smallest node are the same. The number of insert operations determines the number of the last two operations. Below we explore how many nodes can be inserted into the heap in the algorithm.

Although a node can be taken out of the heap multiple times, it can only relax other nodes when it is taken out for the first time. How many nodes a node can relax depends on how many edges are connected to it. If the relaxation is successful, a node will be inserted into the heap.

An edge is connected to two nodes, therefore, an edge can correspond to at most two insertion operations, so the number of insertion operations is $O(M)$, and M is the number of edges in the graph. Therefore, the total number of nodes in the heap is at most $O(M)$, and the number of various heap operations is also $O(M)$.

Time Complexity

As we know, the upper bound of the time complexity of a heap operation is $O(\log M)$, so we can deduce the worst case of the combined time complexity of the algorithm is $M \log M$. The best case is that each node will only be added to the heap once, so the overall time complexity is $O(N \log N)$. According to common sense, M and N are of the same order, so the best time complexity and the worst time complexity are of the same order.

Space Complexity

The space required by the algorithm is mainly divided into four parts:

1. $O(M)$ to store the information on the edges in the graph
2. $O(N)$ to store the value of distance
3. $O(N)$ to store whether the node is in the white dot set or black dot set
4. $O(M)$ to store the heap

So the total space complexity is $O(M + N)$

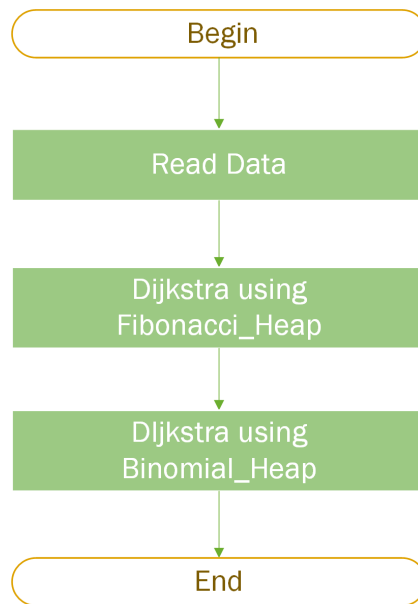
4.4 Comments

Based on the previous analysis and the actual test results, the Fibonacci heap is more suitable for Dijkstra's algorithm. We find that although the time complexity constant of the Fibonacci heap may be relatively large, it is still the highest.

Our guess may be that the deletion of the smallest node in the shortest path algorithm is used more frequently, and the unused merge operation and node value reduction operation that are likely to cause instability factors. This makes the Dijkstra heap the most time-consuming operation-the average time complexity of each deletion, and will not face the situation of consolidating multiple unconsolidated nodes at the same time. The operation without reducing the node value also makes the actual internal structure of the Fibonacci heap very similar to the binomial heap, without imbalances and complicated merges.

Appendix

Appendix I Sketch of the Program



Appendix II Source Code in C

```
1  #include <stdio.h>
2  #include <stdlib.h>
3  #include <limits.h>
4  #include <time.h>
5  #define MAX_NODE 265000    //Must be greater than the nodes number
6  #define MAX_TEMP_STACK 50 //Used in bin_heap, this means 2^50 - 1 nodes are allowed
7  typedef enum{false, true}bool;
8
9  //This structure stores the information of edges, used in both Fibonacci and adjacent list
10 typedef struct adj_list_node* ptr_adj_list_node;
11 struct adj_list_node {
12     int to; //The start node index
13     int weight; //The destination node index
14     ptr_adj_list_node next; //The pointer to next adjacent node
15 };
16
17 //This structure maintains a visited array
18 typedef struct adj_found_node* ptr_adj_found_node;
19 struct adj_found_node{
20     int index; //The index of the node
21     int distance; //The distance from the source node
22     bool visited; //Whether this node is visited or not
23 };
24
25 //This structure stores the information of edges, used in both Fibonacci and adjacent list
26 struct {
27     int nodes; //The number of nodes in the graph
28     int edges; //The number of edges in the graph
29     int found_num; //The number of valid items in the
30     visit array
31     struct adj_list_node adj_list_node[MAX_NODE]; //Contains each node
32     struct adj_found_node adj_found_list[MAX_NODE]; //Contains possible next-nodes,
33     used in Dijkstra using adj list.
34 }adj_list;
35
36 //This structure is a formal one of a binomial heap node
37 typedef struct bin_node* ptr_bin_node;
38 struct bin_node {
39     int index; //The index of the node
40     int distance; //The distance from the source node
41     ptr_bin_node parent; //The pointer to its parent
42     ptr_bin_node left_child; //The pointer to its child
43     ptr_bin_node right_sibling; //The pointer to its right sibling
44 };
45
46 //This structure is used in binomial method
47 struct {
```

```

46     ptr_bin_node bin_temp_node;           //Only used as a temporary pointer
47     ptr_bin_node bin_stack[MAX_TEMP_STACK]; //Pointer array of all trees
48     ptr_bin_node bin_temp_stack[MAX_TEMP_STACK]; //Used when merging
49     ptr_bin_node bin_node_ptr[MAX_NODE]; //Pointer to every node
50     struct bin_node bin_node[MAX_NODE]; //All the binomial nodes
51 }bin_heap;
52
53 //This structure is a formal one of a fibonacci heap node
54 typedef struct fib_node* ptr_fib_node;
55 struct fib_node {
56     int distance; //The length of path from the source node to this node
57     int degree; //The number of its children
58     int index; //The index of this node
59     bool mark; //Whether its child had been removed or not.
60     ptr_fib_node parent; //The pointer to its parent
61     ptr_fib_node child; //The pointer to its child
62     ptr_fib_node left; //The pointer to its left sibling
63     ptr_fib_node right; //The pointer to its right sibling
64 };
65
66 //This structure is used in fibonacci method
67 struct {
68     int tree_num; //The number of trees in the fibonacci heap
69     ptr_fib_node fib_temp_node; //Only used as a temporary pointer in
variable deliver
70     ptr_fib_node fib_min_node; //The pointer to the node with minimum
distance
71     ptr_fib_node fib_temp_stack[MAX_NODE/2 + 1]; //A temp array, used to reconstruct fib_heap
72     struct fib_node fib_node[MAX_NODE]; //All the fibonacci nodes
73 }fib_heap;
74
75 void read_data();
76
77 void dijkstra_using_fibonacci_heap();
78
79 void fib_construct(int source);
80
81 int fib_delete_min();
82
83 void fib_reconstruct();
84
85 ptr_fib_node fib_combine_two_nodes_in_temp_stack(ptr_fib_node new_node);
86
87 void fib_update_distance(int index);
88
89 void fib_decrease(int index);
90
91 void dijkstra_using_adjacent_list();
92
93 void adj_construct(int source);
94
95 ptr_adj_found_node adj_find_next();
96
97 void adj_update_distance(ptr_adj_found_node found_node);
98
99 void dijkstra_using_binomial_heap();
100
101 void bin_construct(int source);
102
103 void bin_merge();
104
105 void bin_decrease(int source);
106
107 void bin_combine_two_nodes(ptr_bin_node *node_adder_1, ptr_bin_node *node_adder_2);
108
109 int bin_delete_min();
110
111 void bin_update_distance(int index);
112
113 int main() {
114     //load information from xxx.gr. NOTE THAT #define MAX_NODE must be greater than the number
of nodes!
115     read_data();
116
117     //traverse the whole graph using fibonacci heap
118     dijkstra_using_fibonacci_heap();
119
120     //traverse the whole graph using binomial heap
121     dijkstra_using_binomial_heap();
122
123     //traverse the whole graph using adjacent list
124     // dijkstra_using_adjacent_list();
125     return 0;
126 }
127
128 /*
129  * This function will using one input as source node, traverse the whole graph.

```

```

130  * After that, the total time will be printed to the console.
131  */
132  void dijkstra_using_binomial_heap() {
133      clock_t start, total;
134      int source;
135      int index;
136      printf("Enter Source x (1 <= x <= %d):\n", adj_list.nodes);
137      scanf("%d", &source);
138      start = clock();
139      //Build the initial heap.
140      bin_construct(source);
141      for (int i = 0; i < adj_list.nodes; i++) {
142          //Delete the node that contains the minimal distance.
143          index = bin_delete_min();
144          //Update that node's neighbors.
145          bin_update_distance(index);
146      }
147      total = clock() - start;
148      printf("Using Binomial Heap to do Dijkstra needs %.3f seconds\n", (double)total /
(double)CLOCKS_PER_SEC);
149  }
150
151  /*
152  * This function will update all the node which are connected to the given node.
153  */
154  void bin_update_distance(int index) {
155      int neighbor_index;
156      ptr_adj_list_node temp;
157      temp = &adj_list.adj_list_node[index];
158      //This loop will traverse all the nodes that connect to the given node
159      do {
160          neighbor_index = temp->to;
161          //If the updated distance is smaller than its parent, then swap them iteratively
162          if (bin_heap.bin_node_ptr[neighbor_index]->distance > bin_heap.bin_node_ptr[index]-
>distance + temp->weight) {
163              bin_heap.bin_node_ptr[neighbor_index]->distance = bin_heap.bin_node_ptr[index]-
>distance + temp->weight;
164              bin_decrease(neighbor_index);
165          }
166          temp = temp->next;
167      }while (temp != NULL);
168  }
169
170  /*
171  * This function will remove the minimal node from the binomial heap,
172  * push all its child to temp_stack, and then merge back.
173  */
174  int bin_delete_min() {
175      int position = 0;
176      int index;
177      bin_heap.bin_temp_node = NULL;
178      //This loop will save the node with minimal distance in the temp_node
179      for (int i = 0; i < MAX_TEMP_STACK; i++) {
180          if (bin_heap.bin_stack[i] == NULL) continue;
181          //If temp_node is NULL, then fill it with a node in the stack
182          if (bin_heap.bin_temp_node == NULL) {
183              bin_heap.bin_temp_node = bin_heap.bin_stack[i];
184              position = i;
185          }
186          //This procedure maintains previous property that temp_node saves the minimal node
187          if (bin_heap.bin_temp_node->distance > bin_heap.bin_stack[i]->distance) {
188              bin_heap.bin_temp_node = bin_heap.bin_stack[i];
189              position = i;
190          }
191      }
192      //Count the number of children of this tree
193      int count = 0;
194      ptr_bin_node temp;
195      temp = bin_heap.bin_temp_node->left_child;
196      while (temp != NULL) {
197          count++;
198          temp = temp->right_sibling;
199      }
200      //Delete minimal node from the stack, push all its children to temp stack, and then merge
them.
201      temp = bin_heap.bin_temp_node->left_child;
202      index = bin_heap.bin_temp_node->index;
203      while (count > 0) {
204          count--;
205          bin_heap.bin_temp_stack[count] = temp;
206          temp = temp->right_sibling;
207          bin_heap.bin_temp_stack[count]->parent = NULL;
208          bin_heap.bin_temp_stack[count]->right_sibling = NULL;
209      }
210      //Set this slot NULL to remove the minimal node
211      bin_heap.bin_stack[position] = NULL;
212      bin_merge();

```



```

213     return index;
214 }
215
216 /*
217  * This function will initiate the binomial heap and build up index array in bin_node_ptr
218  * By doing so, it will be much more easier to locate one node in key-decrease part.
219  */
220 void bin_construct(int source) {
221     for (int i = 1; i <= adj_list.nodes; i++) {
222         bin_heap.bin_node[i].index = i;
223         bin_heap.bin_node[i].distance = INT_MAX;
224         bin_heap.bin_node[i].parent = NULL;
225         bin_heap.bin_node[i].left_child = NULL;
226         bin_heap.bin_node[i].right_sibling = NULL;
227         bin_heap.bin_node_ptr[i] = &bin_heap.bin_node[i];
228         bin_heap.bin_temp_stack[0] = &bin_heap.bin_node[i];
229         //Use merge to do "insertion"
230         bin_merge();
231     }
232     bin_heap.bin_node[source].distance = 0;
233     bin_heap.bin_temp_node = NULL;
234     //Find the entrance
235     bin_decrease(source);
236 }
237
238 /*
239  * This function will swap ALL information of two nodes.
240  */
241 void bin_decrease(int source) {
242     ptr_bin_node temp;
243     temp = bin_heap.bin_node_ptr[source];
244     int temp_int_for_swap;
245     //This loop will swap a node whose distance is smaller than its parent iteratively
246     while (temp->parent != NULL && temp->distance < temp->parent->distance) {
247         //Keep the property that bin_node_ptr is an index array
248         bin_heap.bin_node_ptr[temp->index] = temp->parent;
249         bin_heap.bin_node_ptr[temp->parent->index] = temp;
250         //swap data
251         temp_int_for_swap = temp->distance;
252         temp->distance = temp->parent->distance;
253         temp->parent->distance = temp_int_for_swap;
254
255         temp_int_for_swap = temp->index;
256         temp->index = temp->parent->index;
257         temp->parent->index = temp_int_for_swap;
258         //go up to the parent
259         temp = temp->parent;
260     }
261 }
262
263 /*
264  * This function will merge two binomial heaps into one.
265  */
266 void bin_merge() {
267     //Denote :
268     // bin_heap.bin_stack[i]      => A      Original stack
269     // bin_heap.bin_temp_node     => B      Stores temp addition result
270     // bin_heap.bin_temp_stack[i] => C      Another stack, a temp stack
271     bin_heap.bin_temp_node = NULL;
272     for (int i = 0; i < MAX_TEMP_STACK; i++) {
273         if (bin_heap.bin_temp_node == NULL) {
274             if (bin_heap.bin_temp_stack[i] == NULL) continue; //A = null or not null | B = null
275             | C = null;
276             if (bin_heap.bin_stack[i] == NULL) { //A = null | B = null | C = not null
277                 bin_heap.bin_stack[i] = bin_heap.bin_temp_stack[i];
278                 bin_heap.bin_temp_stack[i] = NULL;
279                 continue;
280             }
281             //A = not null | B = null | C = not null
282             bin_combine_two_nodes(&bin_heap.bin_stack[i], &bin_heap.bin_temp_stack[i]);
283             bin_heap.bin_stack[i] = NULL;
284             bin_heap.bin_temp_stack[i] = NULL;
285         } else {
286             if (bin_heap.bin_stack[i] == NULL) {
287                 if (bin_heap.bin_temp_stack[i] == NULL) { //A = null | B = not null | C = null
288                     bin_heap.bin_stack[i] = bin_heap.bin_temp_node;
289                     bin_heap.bin_temp_node = NULL;
290                 } else { //A = null | B = not null | C = not null
291                     bin_combine_two_nodes(&bin_heap.bin_temp_stack[i], &bin_heap.bin_temp_node);
292                     bin_heap.bin_temp_stack[i] = NULL;
293                 }
294             } else {
295                 if (bin_heap.bin_temp_stack[i] == NULL) { //A = not null | B = not null | C =
296                     null
297                     bin_combine_two_nodes(&bin_heap.bin_stack[i], &bin_heap.bin_temp_node);
298                     bin_heap.bin_stack[i] = NULL;
299                 } else { //A = not null | B = not null | C = not null

```

```

298         bin_combine_two_nodes(&bin_heap.bin_temp_stack[i], &bin_heap.bin_temp_node);
299         bin_heap.bin_temp_stack[i] = NULL;
300     }
301 }
302 }
303 }
304 }
305
306 /*
307  * This function is used while doing merging in the way of adding two binary numbers.
308  */
309 void bin_combine_two_nodes(ptr_bin_node *node_adder_1, ptr_bin_node *node_adder_2) {
310     ptr_bin_node big_node, small_node;
311     big_node = ((*node_adder_1)->distance > (*node_adder_2)->distance) ? (*node_adder_1) :
312     (*node_adder_2);
313     small_node = ((*node_adder_1)->distance <= (*node_adder_2)->distance) ? (*node_adder_1) :
314     (*node_adder_2);
315     //Let the big node become the left_child of the small one.
316     big_node->right_sibling = small_node->left_child;
317     small_node->left_child = big_node;
318     big_node->parent = small_node;
319     bin_heap.bin_temp_node = small_node;
320 }
321
322 /*
323  * This function will using one input as source node, traverse the whole graph.
324  * After that, the total time will be printed to the console.
325  */
326 void dijkstra_using_adjacent_list() {
327     clock_t start, total;
328     start = clock();
329     int source ;
330     ptr_adj_found_node next = NULL;
331     printf("Enter Source x (1 <= x <= %d):\n",adj_list.nodes);
332     scanf("%d",&source);
333     adj_construct(source);
334     for (int i = 0; i < adj_list.nodes; i++) {
335         //Find the tree whose root node contains the minimal distance.
336         next = adj_find_next();
337         //Update all the nodes that connect to that node.
338         adj_update_distance(next);
339     }
340     total = clock() - start;
341     printf("Using Adjacent List to do Dijkstra needs %.3f seconds\n",(double)total /
342     (double)CLOCKS_PER_SEC);
343 }
344
345 /*
346  * This function will update all the nodes that connect to the given node.
347  */
348 void adj_update_distance(ptr_adj_found_node found_node) {
349     int find;
350     int i;
351     ptr_adj_list_node temp_node;
352     temp_node = &adj_list.adj_list_node[found_node->index];
353     do { // The loop will traverse all the nodes that connect to this node.
354         find = temp_node->to;
355         for (i = 1; i <= adj_list.found_num; i++) {
356             if (adj_list.adj_found_list[i].index == find) {
357                 //If the node that to be updated is already been found, then update in the
358                 array.
359                 if (adj_list.adj_found_list[i].distance > found_node->distance + temp_node->
360                 >weight)
361                     adj_list.adj_found_list[i].distance = found_node->distance + temp_node->
362                     >weight;
363                 break;
364             }
365         }
366         //If the node that to be updated hasn't been found before, then add it to the array.
367         if (i > adj_list.found_num) {
368             adj_list.adj_found_list[i].distance = found_node->distance + temp_node->weight;
369             adj_list.adj_found_list[i].index = find;
370             adj_list.adj_found_list[i].visited = false;
371             adj_list.found_num++;
372         }
373         temp_node = temp_node->next;
374     }while (temp_node != NULL);
375 }
376
377 /*
378  * This function will find the node with the minimal distance in the visited list, then return
379  it's pointer.
380  */
381 ptr_adj_found_node adj_find_next() {
382     int min = INT_MAX; //This will make "Find minimum" more convenient.
383     int index_in_found_list = -1;
384     ptr_adj_found_node index = NULL;

```

```

378 //This loop will find the minimal distance and corresponding node.
379 for (int i = 1; i <= adj_list.found_num; i++) {
380     //If the node has been visited before, the skip it.
381     if (adj_list.adj_found_list[i].visited == true) continue;
382     //Otherwise, record its index.
383     if (adj_list.adj_found_list[i].distance < min) {
384         min = adj_list.adj_found_list[i].distance;
385         index_in_found_list = i;
386     }
387 }
388 //Mark this newly found node.
389 adj_list.adj_found_list[index_in_found_list].visited = true;
390 index = &adj_list.adj_found_list[index_in_found_list];
391 return index;
392 }
393
394 /*
395  * This function is used to initiate the adjacent list
396  */
397 void adj_construct(int source) {
398     adj_list.found_num = 1;
399     adj_list.adj_found_list[1].visited = false;
400     adj_list.adj_found_list[1].index = source;
401     adj_list.adj_found_list[1].distance = 0;
402 }
403
404 /*
405  * This function will using one input as source node, traverse the whole graph.
406  * After that, the total time will be printed to the console.
407  */
408 void dijkstra_using_fibonacci_heap() {
409     clock_t start, total;
410     int source;
411     int index;
412     printf("Enter Source x (1 <= x <= %d):\n", adj_list.nodes);
413     scanf("%d", &source);
414     start = clock();
415     //Build the initial heap.
416     fib_construct(source);
417     for (int i = 0; i < adj_list.nodes; i++) {
418         //Delete the node that contains the minimal distance.
419         index = fib_delete_min();
420         //Update that node's neighbors.
421         fib_update_distance(index);
422     }
423     total = clock() - start;
424     printf("Using Fibonacci Heap to do Dijkstra needs %.3f seconds\n", (double)total /
425 (double)CLOCKS_PER_SEC);
426 }
427
428 /*
429  * This function will update all the nodes that connect to the previously deleted node.
430  */
431 void fib_update_distance(int index) {
432     ptr_adj_list_node temp = &adj_list.adj_list_node[index];
433     int fib_index;
434     do {
435         //Traverse all the neighbors of that node.
436         fib_index = temp->to;
437         if (fib_heap.fib_node[fib_index].distance > fib_heap.fib_node[index].distance + temp-
438 >weight) {
439             fib_heap.fib_node[fib_index].distance = fib_heap.fib_node[index].distance + temp-
440 >weight;
441             //More details will be done in the fib_decrease function
442             fib_decrease(fib_index);
443         }
444         temp = temp->next;
445     }while (temp != NULL);
446     //Fresh the min_node
447     fib_heap.fib_temp_node = fib_heap.fib_min_node;
448     for (int i = 0; i < fib_heap.tree_num; i++) {
449         if (fib_heap.fib_min_node->distance > fib_heap.fib_temp_node->distance) {
450             fib_heap.fib_min_node = fib_heap.fib_temp_node;
451         }
452         fib_heap.fib_temp_node = fib_heap.fib_temp_node->right;
453     }
454 }
455
456 /*
457  * This function will decrease the distance of the nodes that are connected to the deleted node.
458  * Denote the node whose distance is decrease "A"
459  * After decrease, if A's distance is smaller than that of A's parent, then A must be move to
460  * be a new root instantly, and A's parent should be marked.
461  * If A's parent has been marked before, then this procedure will be done cascadingly.
462  * All the nodes that are roots are not marked.
463  */
464 void fib_decrease(int index) {

```

```

462 ptr_fib_node fib_decreased = &fib_heap.fib_node[index];
463 ptr_fib_node temp_parent = fib_decreased->parent;
464 if (temp_parent == NULL || temp_parent->distance <= fib_decreased->distance) return;
465 while(1) {
466     //If the node is a root, then we are done.
467     if (temp_parent == NULL){
468         fib_decreased->mark = false;
469         break;
470     }
471     //Otherwise, this node will be moved to the root chain.
472     //Before that, parent's degree should be check.
473     if (temp_parent->degree == 1) {
474         temp_parent->child = NULL;
475     } else {
476         //The moved node has some siblings.
477         temp_parent->child = fib_decreased->right;
478         fib_decreased->right->left = fib_decreased->left;
479         fib_decreased->left->right = fib_decreased->right;
480     }
481     //Common changes.
482     temp_parent->degree--;
483     fib_decreased->mark = false;
484     fib_decreased->right = fib_heap.fib_min_node;
485     fib_decreased->left = fib_heap.fib_min_node->left;
486     fib_heap.fib_min_node->left->right = fib_decreased;
487     fib_heap.fib_min_node->left = fib_decreased;
488     fib_decreased->parent = NULL;
489     fib_heap.tree_num++;
490     if (temp_parent->mark == false) {
491         //If it's parent hasn't been marked before, then we are done.
492         temp_parent->mark = true;
493         break;
494     } else {
495         //If it's parent has been marked before, then we have to repeat the previous
496         procedure.
497         fib_decreased = temp_parent;
498         temp_parent = fib_decreased->parent;
499     }
500     //Find the new min_node.
501     fib_heap.fib_temp_node = fib_heap.fib_min_node;
502     for (int i = 0 ; i < fib_heap.tree_num; i++) {
503         if (fib_heap.fib_min_node->distance > fib_heap.fib_temp_node->distance) {
504             fib_heap.fib_min_node = fib_heap.fib_temp_node;
505         }
506         fib_heap.fib_temp_node = fib_heap.fib_temp_node->right;
507     }
508 }
509
510 // This function will delete a tree whose root contains the minimum distance.
511 int fib_delete_min() {
512     if (fib_heap.fib_min_node == NULL) return 0;
513     int previous_index = fib_heap.fib_min_node->index;
514     //Denote some nodes for convenience.
515     ptr_fib_node temp_deleted = fib_heap.fib_min_node;
516     ptr_fib_node temp_child = temp_deleted->child;
517     ptr_fib_node temp_left = temp_deleted->left;
518     if (temp_deleted->left == temp_deleted) { //Fibonacci heap only has one tree
519         fib_heap.fib_min_node = temp_child;
520         for (int i = 0; i < temp_deleted->degree; i++) {
521             temp_child->parent = NULL;
522             temp_child->mark = false;
523             temp_child = temp_child->right;
524         }
525     } else { //The deleted node is not the only node in root chain.
526         //This is not really updating fib_min_node. True node will be updated in reconstruct
527         function.
528         fib_heap.fib_min_node = temp_left;
529         for (int i = 0; i < temp_deleted->degree; i++) {
530             //Move all the children to the root chain.
531             temp_left->right = temp_child;
532             temp_child->left = temp_left;
533             temp_child->parent = NULL;
534             temp_child->mark = false;
535             temp_child = temp_child->right;
536             temp_left = temp_left->right;
537         }
538         temp_left->right = temp_deleted->right;
539         temp_deleted->right->left = temp_left;
540     }
541     //Update the number of nodes in root chain.
542     fib_heap.tree_num = fib_heap.tree_num - 1 + temp_deleted->degree;
543     fib_reconstruct();
544     return previous_index;
545 }
546

```

```

547  /*
548  * This function is to modify the fibonacci heap after deletion and is VERY important.
549  * A temp stack will be used to combine the nodes with the same degree to maintain fibonacci
    heap's properties
550  */
551  void fib_reconstruct() {
552      if (fib_heap.fib_min_node == NULL) return;
553      int max_occupy_index = INT_MIN; //Stores the maximal index of temp stack that are used for
    faster traversal.
554      ptr_fib_node this, next;
555      this = fib_heap.fib_min_node;
556      //This loop will traverse the root chain and try to put them to the temp stack.
557      //If collision happens, then these two will be combined. This will be done in iteration
558      for (int i = 0; i < fib_heap.tree_num; i++) {
559          next = this->right;
560          if (fib_heap.fib_temp_stack[this->degree] == NULL) {
561              //This slot hasn't been occupied, then will continue.
562              fib_heap.fib_temp_stack[this->degree] = this;
563          } else { //Otherwise, combine them in iteratively
564              while (fib_heap.fib_temp_stack[this->degree] != NULL) {
565                  this = fib_combine_two_nodes_in_temp_stack(this);
566              }
567              fib_heap.fib_temp_stack[this->degree] = this;
568          }
569          max_occupy_index = (this->degree > max_occupy_index) ? this->degree : max_occupy_index;
570          this = next;
571      }
572      fib_heap.fib_min_node = NULL;
573      fib_heap.tree_num = 0;
574      //Combine all the node to form the new fibonacci heap.
575      for (int i = 0; i <= max_occupy_index; i++) {
576          if (fib_heap.fib_temp_stack[i] == NULL) continue;
577          fib_heap.tree_num++;
578          if (fib_heap.fib_min_node == NULL) {
579              fib_heap.fib_min_node = fib_heap.fib_temp_stack[i];
580              fib_heap.fib_min_node->left = fib_heap.fib_min_node;
581              fib_heap.fib_min_node->right = fib_heap.fib_min_node;
582          } else {
583              fib_heap.fib_temp_stack[i]->right = fib_heap.fib_min_node;
584              fib_heap.fib_temp_stack[i]->left = fib_heap.fib_min_node->left;
585              fib_heap.fib_min_node->left->right = fib_heap.fib_temp_stack[i];
586              fib_heap.fib_min_node->left = fib_heap.fib_temp_stack[i];
587              fib_heap.fib_min_node = (fib_heap.fib_min_node->distance >
    fib_heap.fib_temp_stack[i]->distance) ?
588                  fib_heap.fib_temp_stack[i] : fib_heap.fib_min_node;
589          }
590          //Empty the temp stack
591          fib_heap.fib_temp_stack[i] = NULL;
592      }
593  }
594
595  /*
596  * This function handles collision in the temp stack
597  */
598  ptr_fib_node fib_combine_two_nodes_in_temp_stack(ptr_fib_node new_node) {
599      ptr_fib_node old_node; //The node that is already in the stack
600      old_node = fib_heap.fib_temp_stack[new_node->degree];
601      ptr_fib_node big_node = (new_node->distance > old_node->distance) ? new_node : old_node;
602      ptr_fib_node small_node = (new_node->distance <= old_node->distance) ? new_node : old_node;
603      fib_heap.fib_temp_stack[new_node->degree] = NULL;
604      //Always combine the greater one to the smaller one.
605      if (small_node->child == NULL) {
606          small_node->child = big_node;
607          big_node->left = big_node;
608          big_node->right = big_node;
609      } else {
610          big_node->right = small_node->child;
611          big_node->left = small_node->child->left;
612          small_node->child->left->right = big_node;
613          small_node->child->left = big_node;
614      }
615      small_node->degree++;
616      big_node->parent = small_node;
617      fib_heap.fib_temp_node = small_node;
618      return fib_heap.fib_temp_node;
619  }
620
621  /*
622  * This function will initiate the fibonacci heap.
623  */
624  void fib_construct(int source) {
625      ptr_fib_node temp = &fib_heap.fib_node[1];
626      temp->right = temp;
627      temp->left = temp;
628      temp->parent = NULL;
629      temp->child = NULL;
630      temp->degree = 0;

```

```

631     temp->distance = INT_MAX;
632     temp->mark = false;
633     temp->index = 1;
634     for (int i = 2; i <= adj_list.nodes; i++) {
635         fib_heap.fib_node[i].right = &fib_heap.fib_node[i - 1];
636         fib_heap.fib_node[i - 1].left = &fib_heap.fib_node[i];
637         fib_heap.fib_node[i].left = &fib_heap.fib_node[1];
638         fib_heap.fib_node[1].right = &fib_heap.fib_node[i];
639         fib_heap.fib_node[i].parent = NULL;
640         fib_heap.fib_node[i].child = NULL;
641         fib_heap.fib_node[i].mark = false;
642         fib_heap.fib_node[i].distance = INT_MAX;
643         fib_heap.fib_node[i].degree = 0;
644         fib_heap.fib_node[i].index = i;
645     }
646     fib_heap.fib_node[source].distance = 0;
647     fib_heap.fib_min_node = &fib_heap.fib_node[source];
648     fib_heap.tree_num = adj_list.nodes;
649 }
650
651 /*
652  * This function will read data.
653  */
654 void read_data() {
655     char in[200]; //Used to absorb nonsense
656     clock_t start, total;
657     start = clock();
658     int from, to, weight;
659     freopen("USA-road-d.NY.gr", "r", stdin); //Read data from a file
660     // freopen("test.txt", "r", stdin); //Read data from a file
661     for (int i = 0; i < 4; i++) gets(in); //filter. The first four lines are not needed
662     scanf("%s", in);
663     scanf("%s", in);
664     scanf("%d%d", &adj_list.nodes, &adj_list.edges);
665     for (int i = 0; i < 2; i++) gets(in); //filter. The following two lines are not needed
666     //Initiate part of data
667     for (int i = 0; i < MAX_NODE; i++) {
668         adj_list.adj_list_node[i].to = 0;
669         adj_list.adj_list_node[i].next = NULL;
670         fib_heap.fib_temp_stack[i/2] = NULL;
671     }
672     for (int i = 0; i < MAX_TEMP_STACK; i++) {
673         bin_heap.bin_stack[i] = NULL;
674         bin_heap.bin_temp_stack[i] = NULL;
675     }
676     ptr_adj_list_node temp_node;
677     //Read all the possible infomation.
678     while (scanf("%s%d%d%d", in, &from, &to, &weight) != EOF) {
679         temp_node = &adj_list.adj_list_node[from];
680         while (temp_node->next != NULL) temp_node = temp_node->next;
681         if (temp_node->to != 0) {
682             temp_node->next = (ptr_adj_list_node)malloc(sizeof(struct adj_list_node));
683             temp_node = temp_node->next;
684         }
685         temp_node->to = to;
686         temp_node->weight = weight;
687         temp_node->next = NULL;
688     }
689     freopen("CON", "r", stdin);
690     total = clock() - start;
691     printf("finish read. Running time : %.3f s\n", (double)total/(double)CLOCKS_PER_SEC);
692 }

```

Appendix III Declaration and Signatures

Declaration

*We hereby declare that all the work done in this project titled "**Shortest Path Algorithm with Heaps**" is of our independent effort as a group.*

Signatures

1. XXX
2. XXX
3. XXX