

# Homework 2: Route Finding

## Part I. Implementation (6%):

- **BFS**

```
5 def bfs(start, end):
6     '''
7     1. read all the data from .csv
8     2. do bfs with a queue iteratively until end is found:
9         pop first element -> add the path adjacent to the point into queue and fromNode
10    3. trace back the path and compute the total distant
11    '''
12    # Begin your code (Part 1)
13    data = []
14    queue = []
15    queue.append(start)
16    fromNode = tuple()
17    visited = [start]
18    path = []
19    done = False
20    count = 0
21    with open(edgeFile, newline='') as csvfile:                # read from csv
22        reader = csv.reader(csvfile, delimiter=',', quotechar='\"')
23        next(reader)
24        for row in reader:
25            data.append(tuple(row))
26
27    while(done == False):                                       # loop & do bfs
28        now = queue.pop(0)                                     # pop a point from queue
29        visited.append(now)                                    # add it to visited
30        for i in data:
31            if (int(i[0]) == now and int(i[1]) not in visited and int(i[1]) not in queue):
32                fromNode = fromNode + ((int(i[0]),int(i[1]),float(i[2])),) # add possible path
33                queue.append(int(i[1]))                                # add the dest. node into queue
34                if int(i[1]) == end:                                  # found end -> break
35                    done = True
36
37    now = end
38    num_visited = len(visited)
39    dist = 0
40    while now != start:                                         # trace back
41        for way in fromNode:
42            if way[1] == now:                                     # if it is the path
43                path.insert(0,now)                                # add to path
44                dist += way[2]                                     # add the distance
45                now = way[0]                                       # renew dest. point
46                break
47    path.insert(0,start)                                         # insert the start point
48    return path,dist,num_visited
49    # End your code (Part 1)
```

### variable explanation:

(\$variableName means the variable in the code)

\$data : 2D array of the content of edgeFile.csv

\$queue : 1D array of the integer for node numbers in queue

\$fromNode : tuple of possible path (int,int,float)

- DFS

```

5 def dfs(start, end):
6     """
7     1. read all the data from .csv
8     2. do bfs with a stack iteratively until end is found:
9     |   pop last element -> add the path adjacent to the point into stack and fromNode
10    3. trace back the path and compute the total distant
11    """
12    # Begin your code (Part 2)
13    data = []
14    stack = []
15    stack.append(start)
16    fromNode = tuple()
17    visited = [start]
18    path = []
19    done = False
20    with open(edgeFile, newline='') as csvfile:                # read .csv
21        reader = csv.reader(csvfile, delimiter=',', quotechar='\"')
22        next(reader)
23        for row in reader:
24            data.append(tuple(row))
25
26    while(done == False):
27        now = stack.pop()                                       # pop the last element
28        visited.append(now)
29        for i in data:
30            if (int(i[0]) == now and int(i[1]) not in visited and int(i[1]) not in stack):
31                fromNode = fromNode + ((int(i[0]),int(i[1]),float(i[2])),)    # add to possible path
32                stack.append(int(i[1]))    # add to stack
33                if int(i[1]) == end:    # break if end is found
34                    done = True
35
36    now = end    # trace back
37    num_visited = len(visited)
38    dist = 0
39    while now != start:
40        for way in fromNode:
41            if way[1] == now:
42                path.insert(0, now)
43                dist += way[2]
44                now = way[0]
45            break
46    path.insert(0, start)
47    return path, dist, num_visited
48    # End your code (Part 2)

```

### variable explanation:

(\$variableName means the variable in the code)

\$data : 2D array of the content of edgeFile.csv

\$stack : 1D array of the integer for node numbers in stack

\$fromNode : tuple of possible path (int,int,float)

- UCS

```

5 def ucs(start, end):
6     """
7     1. read from the .csv
8     2. push the point adjacent to the starting point with lengths
9     3. loop: pop the smallest element, add to visited and path, and push element into priority queue
10    4. trace back to get the path.
11    """
12    # Begin your code (Part 3)
13    data = []
14    queue = []
15    visited = [start]
16    fromNode = tuple()
17    path = []
18    with open(edgeFile, newline='') as csvfile:
19        reader = csv.reader(csvfile, delimiter=',', quotechar='"')
20        next(reader)
21        for row in reader:
22            data.append(tuple(row))
23
24    for i in data:
25        if(int(i[0]) == start):
26            queue.append((i[0],i[1],i[2],i[2]))
27
28    minis = 0
29
30    while(1):
31        minindex = 0
32        minis = float(queue[0][2])
33        for i in range(len(queue)):
34            if(float(queue[i][2])<minis):
35                minis = float(queue[i][2])
36                minindex = i
37
38        now = queue.pop(minindex)
39        visited.append(int(now[1]))
40        fromNode = fromNode + (now,)
41
42        if int(now[1])==end:
43            break
44        count = 0
45        for i in range(len(queue)):
46            if(queue[i-count][1]==now[1]):
47                queue.pop(i-count)
48                count+=1
49
50        for i in data:
51            if (i[0] == now[1] and int(i[1]) not in visited):
52                queue.append((i[0],i[1],str(float(i[2])+float(now[2])),i[2]))
53
54    now = end
55    num_visited = len(visited)
56    dist = 0
57
58    while now!=start:
59        #print(str(now)+"\n")
60        for way in fromNode:
61            if int(way[1]) == now:
62                path.insert(0,now)
63                dist += float(way[3])
64                now = int(way[0])
65                break
66    path.insert(0,start)
67    return path,dist,num_visited
68    # End your code (Part 3)

```

### variable explanation:

\$queue : array of edge in a tuple(starting node, destination node, total length from starting point, the length of edge)

When adding node into priority queue, append it with the total length (adding total length of previous node and the length of the edge), so when popping, you can use it directly.

- A\* search

```

6 def astar(start, end):
7     """
8     1. read data from the 2 csv
9     2. push nodes for starting point
10    3. loop:
11        pop the min g(n) + h(n) -> break if dest. is end -> add to visited and fromNode -> push adjacent nodes into queue
12    4. trace back
13    """
14    # Begin your code (Part 4)
15    data = []
16    heuristicData = []
17    queue = []
18    visited = [start]
19    fromNode = tuple()
20    path = []
21    with open(edgefile, newline='') as csvfile:
22        reader = csv.reader(csvfile, delimiter=',', quotechar='"')
23        next(reader)
24        for row in reader:
25            data.append(tuple(row))
26    with open(heuristicFile, newline='') as csvfile:
27        reader = csv.reader(csvfile, delimiter=',', quotechar='"')
28        next(reader)
29        for row in reader:
30            heuristicData.append(tuple(row))
31
32    for i in data:
33        if int(i[0]) == start:
34            indexNew = next((j for j, x in enumerate(heuristicData) if x[0] == i[1]), None)
35            if end == 1079387396:
36                queue.append((i[0], i[1], str(float(i[2]) + float(heuristicData[indexNew][1])), i[2], i[2]))
37            elif end == 1737223506:
38                queue.append((i[0], i[1], str(float(i[2]) + float(heuristicData[indexNew][2])), i[2], i[2]))
39            elif end == 8513026827:
40                queue.append((i[0], i[1], str(float(i[2]) + float(heuristicData[indexNew][3])), i[2], i[2]))
41
42    minis = 0
43
44    while(1):
45        minindex = 0
46        minis = float(queue[0][2])
47        for i in range(len(queue)):
48            if float(queue[i][2]) < minis:
49                minis = float(queue[i][2])
50                minindex = i
51
52        now = queue.pop(minindex)
53        visited.append(int(now[1]))
54        fromNode = fromNode + (now,)
55
56        if int(now[1]) == end:
57            break
58        count = 0
59        for i in range(len(queue)):
60            if (queue[i-count][1] == now[1]):
61                queue.pop(i-count)
62                count += 1
63
64        for i in data:
65            if (i[0] == now[1] and int(i[1]) not in visited):
66                indexNew = next((j for j, x in enumerate(heuristicData) if x[0] == i[1]), None)
67                if end == 1079387396:
68                    queue.append((i[0], i[1], str(float(now[4]) + float(i[2]) + float(heuristicData[indexNew][1])), i[2], str(float(i[2]) + float(now[4]))))
69                elif end == 1737223506:
70                    queue.append((i[0], i[1], str(float(now[4]) + float(i[2]) + float(heuristicData[indexNew][2])), i[2], str(float(i[2]) + float(now[4]))))
71                elif end == 8513026827:
72                    queue.append((i[0], i[1], str(float(now[4]) + float(i[2]) + float(heuristicData[indexNew][3])), i[2], str(float(i[2]) + float(now[4]))))
73
74        now = end
75        num_visited = len(visited)
76        dist = 0
77
78        while now != start:
79            # print(str(now) + "\n")
80            for way in fromNode:
81                if int(way[1]) == now:
82                    path.insert(0, now)
83                    dist += float(way[3])
84                    now = int(way[0])
85                    break
86        path.insert(0, start)
87        return path, dist, num_visited
88    # End your code (Part 4)

```

queue : (string startNode, string destNode, string g(destNode) + h(destNode), string lengthBetween2Node, string lengthFromStartToNode )

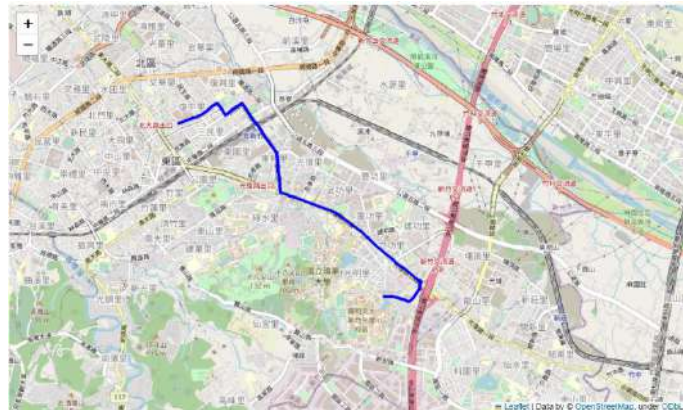
f(n) = g(n) + h(n) is in the queue and used when choosing the node for popping  
use the content in heuristic.csv directly (3 cases)



## Part II. Results & Analysis (12%):

**Test 1: from National Yang Ming Chiao Tung University (ID: 2270143902) to Big City Shopping Mall (ID: 1079387396)**

BFS: The number of nodes in the path found by BFS: 88  
Total distance of path found by BFS: 4978.881999999998 m  
The number of visited nodes in BFS: 4131



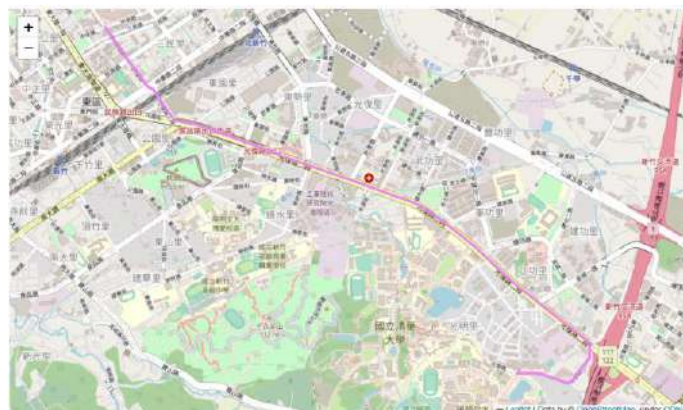
DFS (stack):

The number of nodes in the path found by DFS: 1718  
Total distance of path found by DFS: 75504.31500000001 m  
The number of visited nodes in DFS: 4712



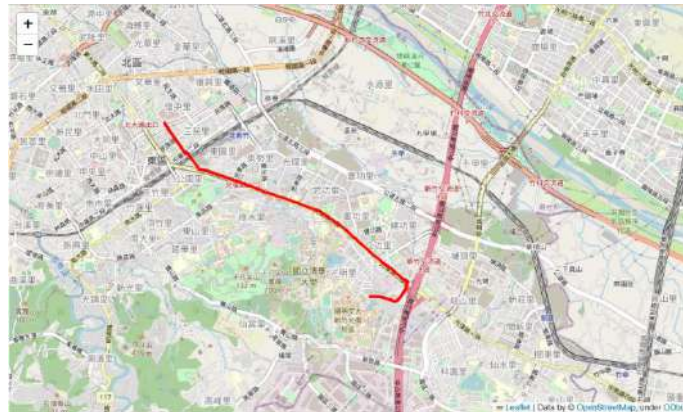
UCS :

The number of nodes in the path found by UCS: 89  
Total distance of path found by UCS: 4367.8809999999985 m  
The number of visited nodes in UCS: 5086



A\* :

The number of nodes in the path found by A\* search: 89  
Total distance of path found by A\* search: 4367.8809999999985 m  
The number of visited nodes in A\* search: 1319

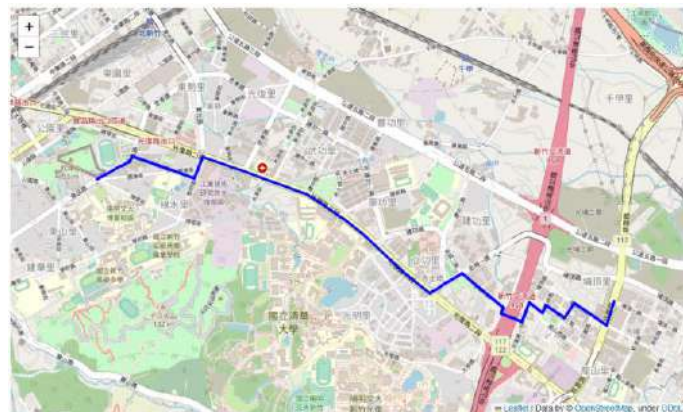


**Test 2: from Hsinchu Zoo (ID: 426882161)**

**to COSTCO Hsinchu Store (ID: 1737223506)**

BFS :

The number of nodes in the path found by BFS: 60  
Total distance of path found by BFS: 4215.521000000001 m  
The number of visited nodes in BFS: 4469



DFS (stack) :

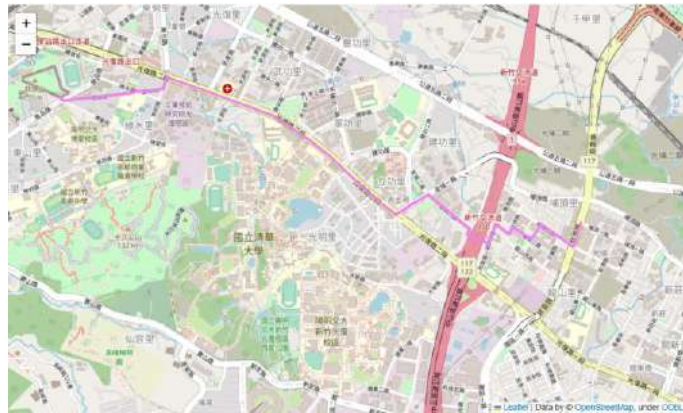
The number of nodes in the path found by DFS: 930  
Total distance of path found by DFS: 38752.3079999999895 m  
The number of visited nodes in DFS: 9366





UCS :

The number of nodes in the path found by UCS: 63  
Total distance of path found by UCS: 4101.84 m  
The number of visited nodes in UCS: 7213



A\* :

The number of nodes in the path found by A\* search: 63  
Total distance of path found by A\* search: 4101.84 m  
The number of visited nodes in A\* search: 1172



### Test 3: from National Experimental High School At Hsinchu Science Park (ID: 1718165260) to Nanliao Fighting Port (ID: 8513026827)

BFS :

The number of nodes in the path found by BFS: 183  
Total distance of path found by BFS: 15442.394999999995 m  
The number of visited nodes in BFS: 11217



DFS (stack) :

The number of nodes in the path found by DFS: 900  
Total distance of path found by DFS: 39219.993000000024 m  
The number of visited nodes in DFS: 2248



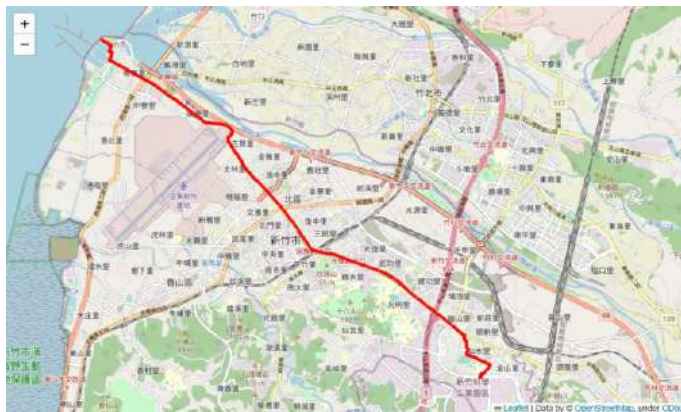
UCS :

The number of nodes in the path found by UCS: 288  
Total distance of path found by UCS: 14212.413 m  
The number of visited nodes in UCS: 11926



A\* :

The number of nodes in the path found by A\* search: 288  
Total distance of path found by A\* search: 14212.413 m  
The number of visited nodes in A\* search: 7073





## Bonus part

Test 1:

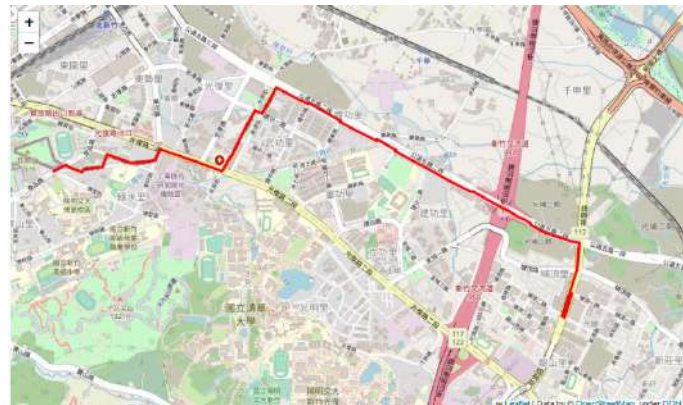
The number of nodes in the path found by A\* search: 119  
Total second of path found by A\* search: 418.09889263002117 s  
The number of visited nodes in A\* search: 263



(multiplier = 2)

Test 2

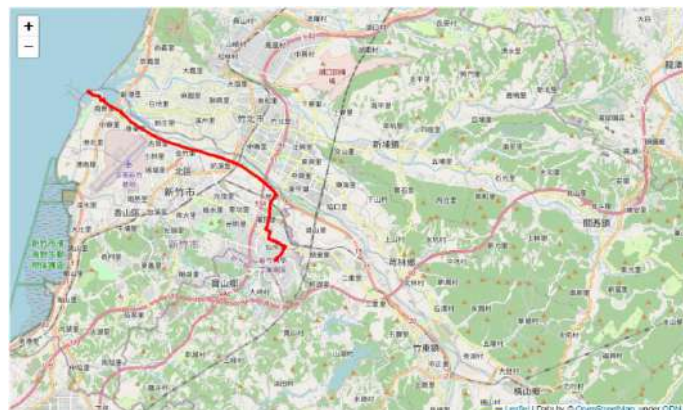
The number of nodes in the path found by A\* search: 70  
Total second of path found by A\* search: 348.73111329006076 s  
The number of visited nodes in A\* search: 130



(multiplier = 2)

Test 3:

The number of nodes in the path found by A\* search: 186  
Total second of path found by A\* search: 792.2234071776189 s  
The number of visited nodes in A\* search: 227



(multiplier = 1)

code:

```
6 def astar_time(start, end, multiplier):
7     # Begin your code (Part 6)
8     ...
9     1. read from edges.csv
10    2. use bfs to know how many edges a node is to the end
11    3. use the length computed by the bfs in 2 as heuristic function to conduct A* search
12    ...
13
14    if end == 8513026827:
15        heuristicFile = 'bfsHeuristic3.csv'
16    elif end == 1737223586:
17        heuristicFile = 'bfsHeuristic2.csv'
18    else:
19        heuristicFile = 'bfsHeuristic1.csv'
20
21    data = []
22    heuristicData = []
23    queue = []
24    visited = [start]
25    fromNode = tuple()
26    path = []
27
28    with open(edgeFile, newline='') as csvfile:
29        # read from csv
30        reader = csv.reader(csvfile, delimiter=',', quotechar='"')
31        next(reader)
32        for row in reader:
33            data.append(tuple(row))
34
35    bfsqueue = []
36    bfsvisited = [end]
37    bfsqueue.append((end,0))
38    while(len(bfsqueue)>0):
39        # loop & do bfs
40        now = bfsqueue.pop(0)
41        # pop a point from queue
42        heuristicData.append(now)
43        bfsvisited.append(int(now[0]))
44        # add it to visited
45        for i in data:
46            if (int(i[1]) == now[0] and int(i[0]) not in bfsvisited and int(i[0]) not in [x[0] for x in bfsqueue]):
47                # add the dest. node into queue
48                bfsqueue.append((int(i[0]),now[1]+1))
49
50    with open(heuristicFile, 'a', newline='') as csvfile:
51        writer = csv.writer(csvfile)
52        for row in heuristicData:
53            writer.writerow(row)
54
55    with open(heuristicFile, newline='') as csvfile:
56        # read from csv
57        reader = csv.reader(csvfile, delimiter=',', quotechar='"')
58        next(reader)
59        for row in reader:
60            heuristicData.append(tuple(row))
61
62    # astar search
63    for i in data:
64        # push all the node for start point
65        if(int(i[0]) == start):
66            indexNew = next((j for j, x in enumerate(heuristicData) if int(x[0]) == start), None)
67            queue.append((i[0],i[1],str(float(i[2])/float(i[3]))*multiplier*float(heuristicData[indexNew][1]),str(float(i[2])/float(i[3]))))
68
69    while(1):
70        # loop
71        minindex = 0
72        # choose the one with min length
73        minis = float(queue[0][2])
74        for i in range(len(queue)):
75            if(float(queue[i][2])<minis):
76                minis = float(queue[i][2])
77                minindex = i
78
79        now = queue.pop(minindex)
80        # pop the min one
81        visited.append(int(now[1]))
82        # add the dest. of the way to visited
83        fromNode = fromNode + (now,)
84        # add it to possible path
85
86        if int(now[1])==end:
87            # break if end is found
88            break
89
90        count = 0
91        for i in range(len(queue)):
92            # pop unnecessary element in priority queue
93            # (the point is visited)
94            if(queue[i-count][1]==now[1]):
95                queue.pop(i-count)
96                count+=1
97
98        for i in data:
99            # push element into priority queue
100            if (i[0] == now[1] and int(i[1]) not in visited):
101                indexNew = -1
102                for j in range(len(heuristicData)):
103                    if(heuristicData[j][0] == now[1]):
104                        indexNew = j
105                queue.append((i[0],i[1],str(float(now[3])+float(i[2])/float(i[3]))*multiplier*float(heuristicData[indexNew][1]),str(float(i[2])/float(i[3]))))
106
107    now = end
108    num_visited = len(visited)
109    time = 0
110
111    while now!=start:
112        # trace back from end to start
113        #print(str(now)+"\n")
114        for way in fromNode:
115            # if the dest. of a way is the end
116            if int(way[1]) == now:
117                # add it to path
118                path.insert(0,now)
119                time += float(way[3])
120                # add the destination
121                now = int(way[0])
122                # update the end
123                break
124
125    path.insert(0, start)
126    # insert start in the path
127    time = time*3600/1000
128
129    return path,time,num_visited
130
131    # End your code (Part 6)
```

### **heuristic function design & analysis:**

my design:

$$f(x) = g(x) + h(x) = \text{distance} / \text{timeLimit} + \text{multiplier} * \text{bfs result}$$

I used the number of bfs path as heuristic function to implement A\* search. When the bfs result shows that it take more step to reach the ending node, the bfs result will be bigger. (the multiplier is used to adjust the size of bfs result)

I add a multiplier into the function to fitune the bfs result with a multiplier. I've tried several multipliers for the function, but it seems that there isn't a particular multiplier that can make the three test cases fast.

I think it might be because of the design of my heuristic function. When the distance of the destination is far away, the bfs result will be absolutely huge comparing to the  $g(x)$ , and if we have a big multiplier for that, the difference of heuristic function value will have a huge affect on the edge choice, which is not I wanted, so I set the multiplier to be 1 for test3. In contrast, if we have small multiplier for short distances, the  $h(x)$  wouldn't have appropriate affect on the choices, so I choosed the multiplier 1 for test1 and test2.

### **code explanation:**

The commented part is to get the heuristic function with the process of bfs and save it to a .csv file so that you wouldn't need to do the bfs all the time. The other things are almost the same as A\* search.

## **Part III. Question Answering (12%):**

1. Please describe a problem you encountered and how you solved it.

I had a trouble finding the value in the heuristic data same as the popped node. In my opinion, using a loop to find the corresponding node is time comsuming, and it will make my code more ugly. So I look it up on the Internet and found some advanced python syntax like “`index = next((j for j, x in enumerate(heuristicData) if x[0] == i[1]), None)`” and some simple ways to do a particular task without using a loop (e.g. when I want to get first element of a tuple from a list of tuple, I can use “`[x[0] for x in list]`”), and it made my code a little easier to read.



2. Besides speed limit and distance, could you please come up with another attribute that is essential for route finding in the real world? Please explain the rationale.

Traffic lights.

When you are driving, the most time-consuming thing is the red light. Most traffic lights have a red light for about 45 seconds, and some will have more than 1 minutes, e.g. the traffic light on road next to 西門町 has a 100 sec. red light. In one minute, if you have the speed of 40km/hr, you can move a distance of 666 meters, which is longer than most of the edges we used, so traffic lights is also a attribute that will affect the route finding result.

3. As mentioned in the introduction, a navigation system involves mapping, localization, and route finding. Please suggest possible solutions for **mapping** and **localization** components?

Mapping can be done by satellites, and radar or some mobile devices. For satellites, you can take a picture directly and construct the map using several pictures. For radar or some mobile devices, if you have a lot of time or human resource, you can collect a lot of data by wandering on the street and put it on your device. You can construct the map by leveraging all the data collected.

Localization can be done by GPS or a compass. With GPS, you can know exactly where you are and the direction you are heading toward, and with a compass, you can know the direction you are going.

4. The estimated time of arrival (ETA) is one of the features of Uber Eats. To provide accurate estimates for users, Uber Eats needs to dynamically update ETA based on their mechanism. Please define a **dynamic heuristic equation** for ETA and explain the rationale of your design. Hint: You can consider meal prep time, delivery priority, multiple orders, etc.

$$ETA = \text{Meal preparation time} + \text{Delivery time} + \text{Time for pickup and drop-off}$$
  
Meal preparation time :

you have to wait for the restaurant when they are preparing the order you are delivering, so the time will be included in the ETA.

Delivery time :

you should consider several factors in delivering time. For example, you have to know the path with shortest time, traffic, red lights, the weather, or even there is a car accident or not.

Time for pickup and drop-off :

when the restaurant finish making the food, the restaurant have to check whether the food is yours, so the pick-up process takes some time. For the drop-off, since you might have many orders at the same time, if you arrived the destination of the first order, and the buyer did not show up on time, you will have to wait to get paid, so the drop-off process will also take some time and you will have to add the time in the next buyer's ETA.