

Mobile Robotics Homework 9

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1 Introduction

1.1 Background

The A* algorithm is a graph traversal and path searching algorithm which is often useful in related problems owing to its optimality, completeness and efficiency. It was first proposed at the Stanford Research Institute in 1968 by Peter Hart, Nils Nilsson and Bertram Raphael. It is not the most efficient algorithm out there due to its space complexity which can burden memory resources due to the need for storing generated nodes in memory. Nevertheless, the A* algorithm still offers a useful tool for mobile robots in traversing their environments.

Without delving into too much detail, the A* algorithm uses a heuristic function in the form of a cost estimate of the path from the current node where the object of interest is located to the goal location. By minimizing the cost estimate, the algorithm can selectively choose the nodes which would enable it to go to its goal in the most efficient route possible that it can determine. The heuristic function can be Euclidean or Mahattan distance.

1.2 Task

The goal is to implement the A* path traversal algorithm by considering an increasing number of neighbors of the central node. Increasing the number of neighbors of consideration of the current node enables more angles to be accommodated in the traversed path leading to potentially shorter paths and smoother turns. The task is to compare the performances of the A* algorithm with increasing numbers of neighbors by considering the time taken for the algorithm to run with different neighbor sizes.

The tic/toc functions of MATLAB are used to determine the running time for the algorithm. Note that the times obtained in the results depend on where the tic and toc functions are placed in the code. In the case of this assignment, they are placed at the beginning and ending of the map generation and route calculation code segments. For each neighbor size, the algorithm is run 100 times to obtain a hundred running times in order to have a larger dataset for analysis.

2 Results

The following plots demonstrate the resulting paths and running times over 100 iterations for different neighbor sizes of the A* algorithm. These results are discussed in the Analysis section.

2.1 No. of Neighbors = 4

The number of neighbors is set to 4 with the following matrix configuration:

0	0	0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0	0	0
0	0	0	0	1	0	0	0	0	0
0	0	0	1	0	1	0	0	0	0
0	0	0	0	1	0	0	0	0	0
0	0	0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0	0	0

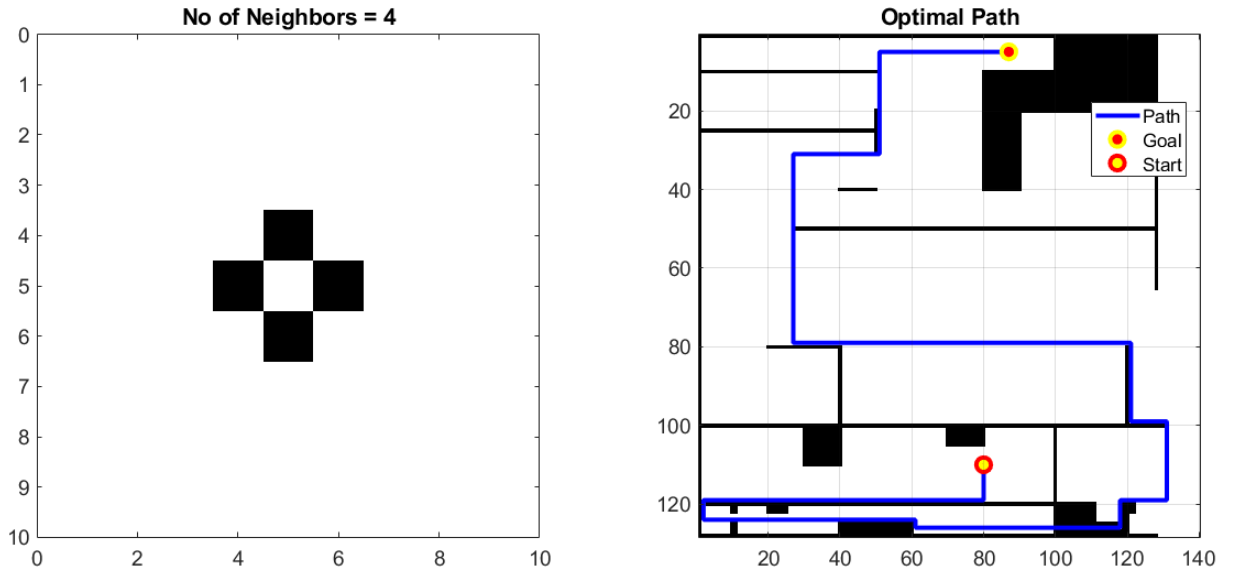


Figure 1: Optimal Path with No. of Neighbors = 4

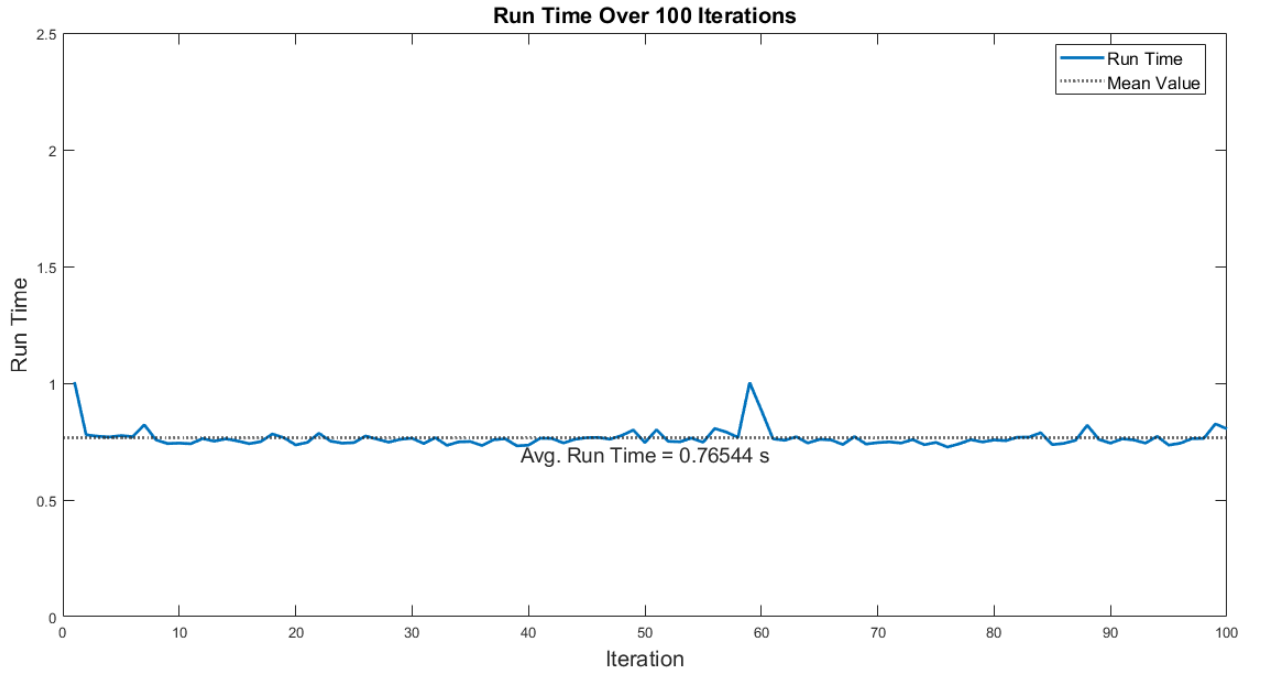


Figure 2: Algorithm Run Time with No. of Neighbors = 4

2.2 No. of Neighbors = 8

The number of neighbors is set to 8 with the following matrix configuration:

$$\begin{bmatrix}
 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\
 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\
 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\
 0 & 0 & 0 & 1 & 1 & 1 & 0 & 0 & 0 \\
 0 & 0 & 0 & 1 & 0 & 1 & 0 & 0 & 0 \\
 0 & 0 & 0 & 1 & 1 & 1 & 0 & 0 & 0 \\
 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\
 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\
 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0
 \end{bmatrix}$$

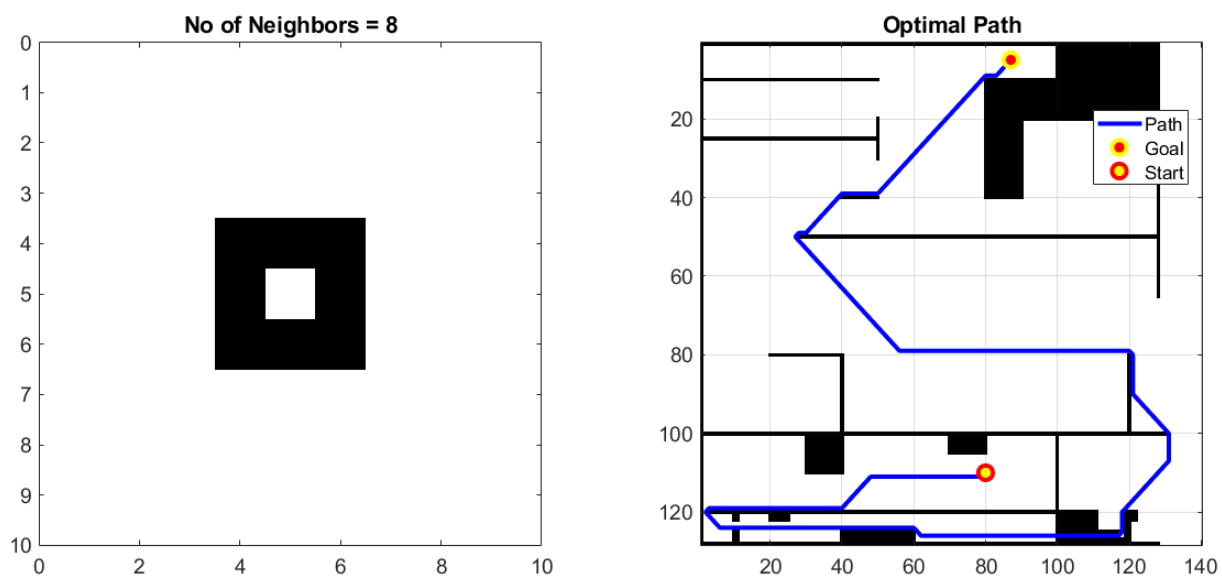


Figure 3: Optimal Path with No. of Neighbors = 8

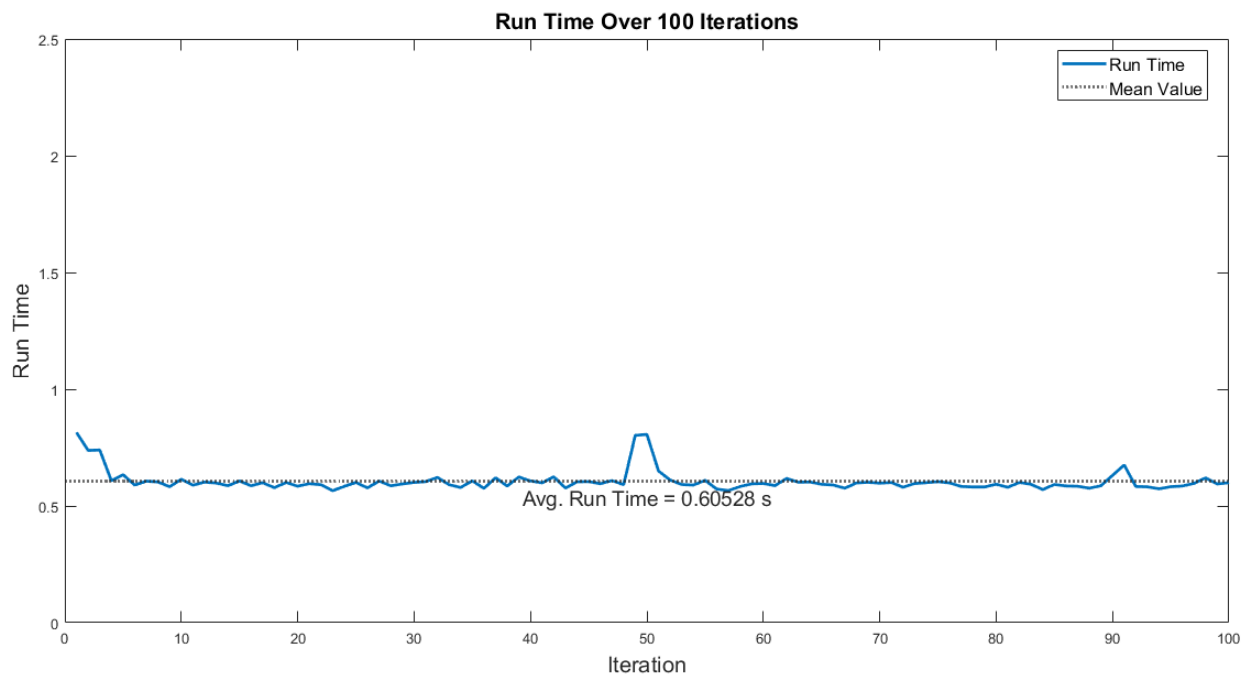


Figure 4: Algorithm Run Time with No. of Neighbors = 8

2.3 No. of Neighbors = 16

The number of neighbors is set to 16 with the following matrix configuration:

$$\begin{bmatrix} 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 & 1 & 1 & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 & 1 & 1 & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \end{bmatrix}$$

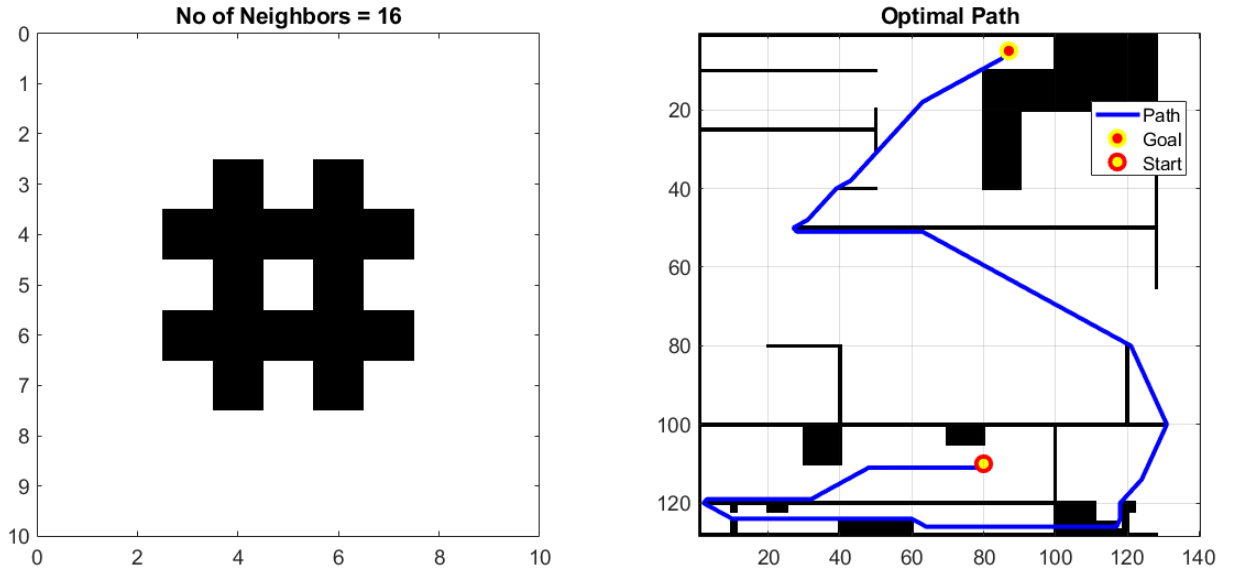


Figure 5: Optimal Path with No. of Neighbors = 16

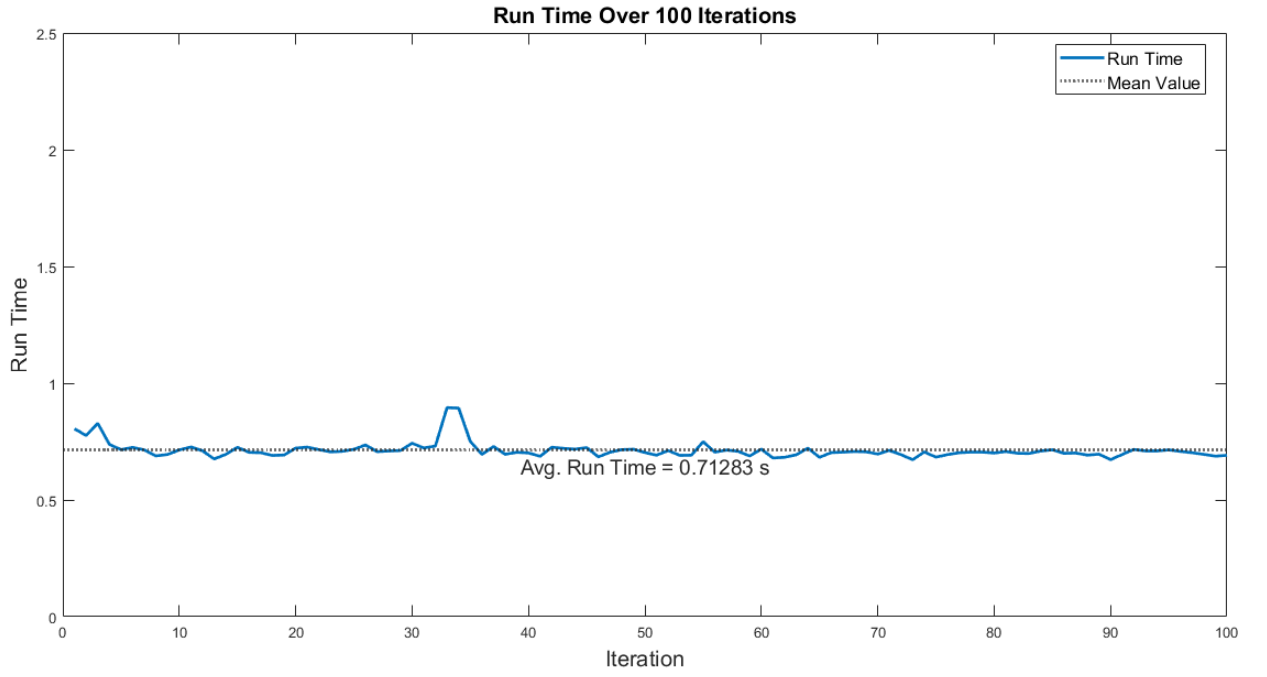


Figure 6: Algorithm Run Time with No. of Neighbors = 16

2.4 No. of Neighbors = 40

The number of neighbors is set to 40 with the following matrix configuration:

$$\begin{bmatrix} 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 0 \\ 0 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 0 \\ 0 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 0 \\ 0 & 0 & 0 & 1 & 0 & 1 & 0 & 0 & 0 \\ 0 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 0 \\ 0 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 0 \\ 0 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \end{bmatrix}$$

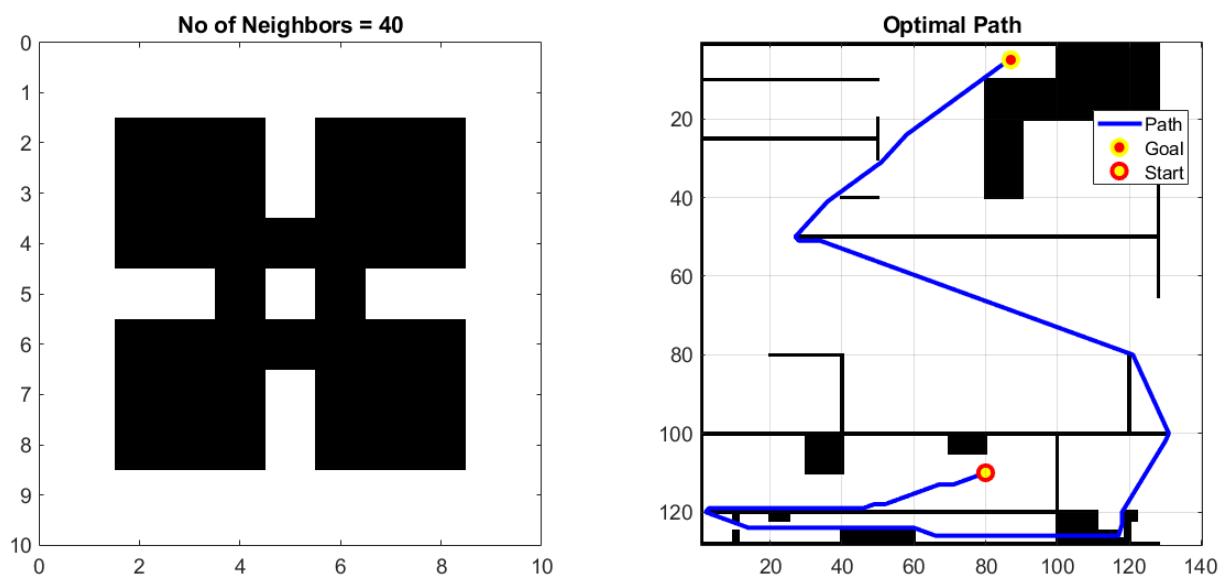


Figure 7: Optimal Path with No. of Neighbors = 40

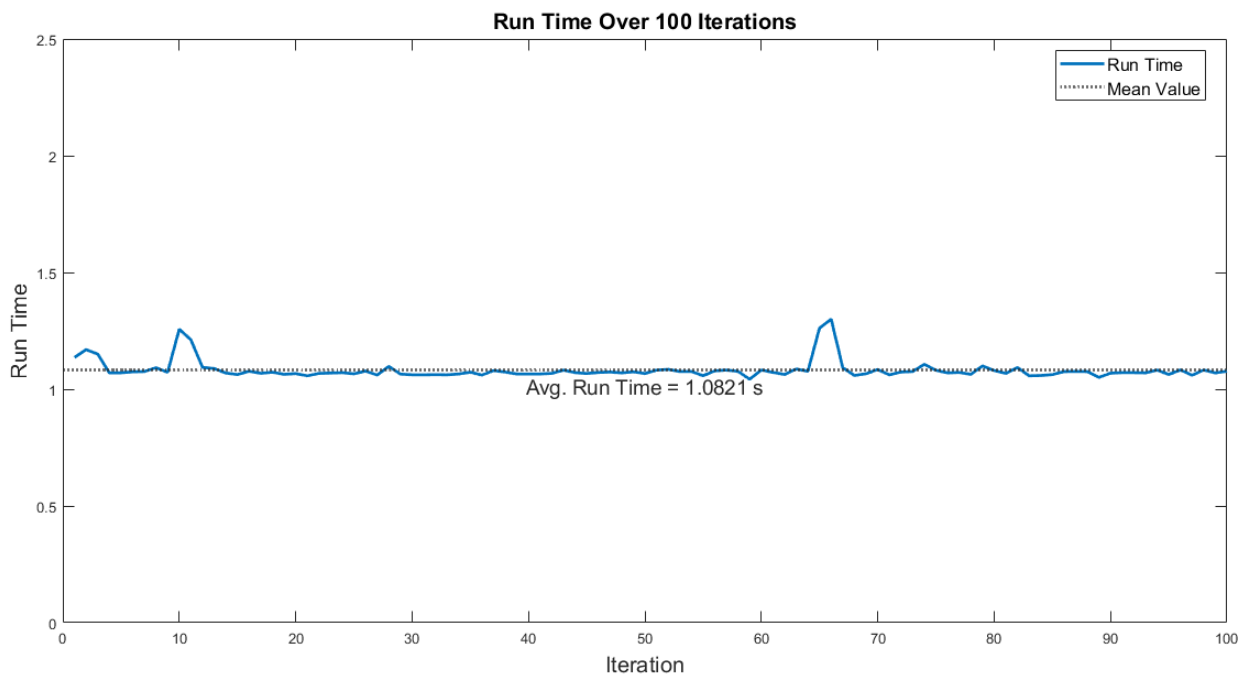


Figure 8: Algorithm Run Time with No. of Neighbors = 40

2.5 No. of Neighbors = 68

The number of neighbors is set to 68 with the following matrix configuration:

$$\begin{bmatrix} 1 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 0 & 0 & 0 & 1 & 0 & 1 & 0 & 0 & 0 \\ 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 1 \end{bmatrix}$$

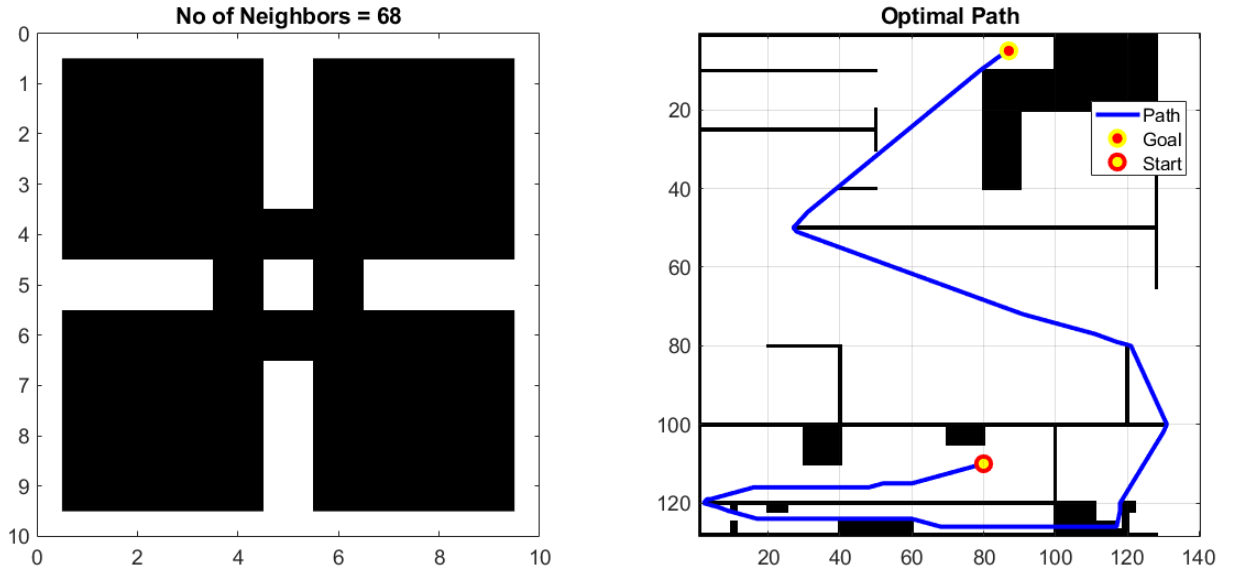


Figure 9: Optimal Path with No. of Neighbors = 68

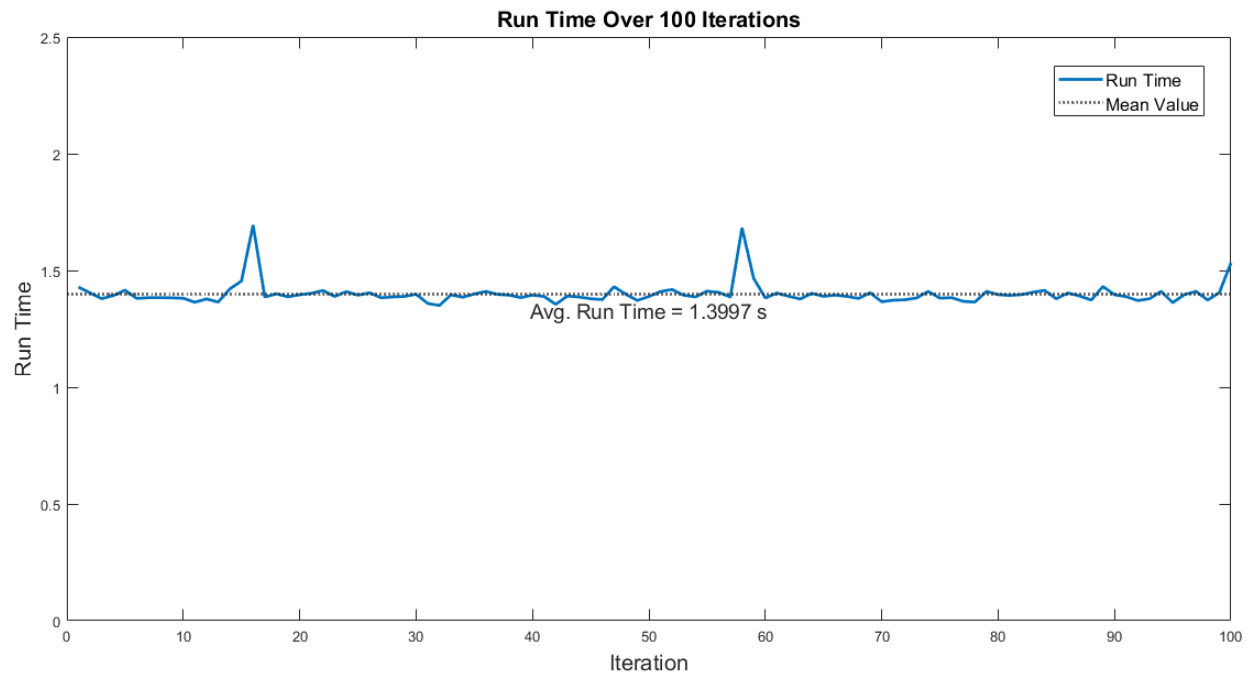


Figure 10: Algorithm Run Time with No. of Neighbors = 68

3 Analysis and Conclusion

The running times for the algorithm with different neighbor sizes can be compared with each other. Refer to the following plot which displays the running time of the algorithm over 100 iterations for different neighboring node sizes.

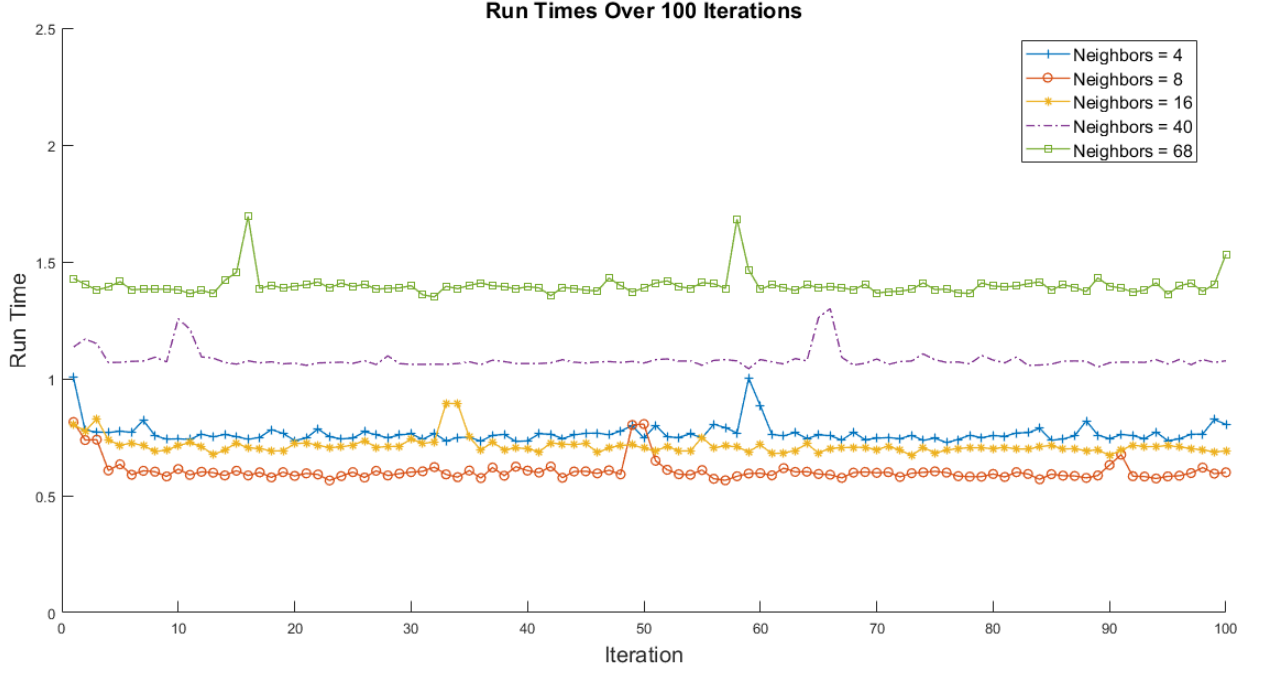


Figure 11: A* Algorithm Run Times with Different Neighboring Node Sizes

As it can be observed, the average running time increases with the size of the matrix that contains the number of neighboring nodes. This result may be expected due to the added overhead of additional computations when traversing over the matrix of neighboring nodes. The anomalous case, however, occurs with the matrix of least neighboring node size, i.e. No. of Neighbors = 4. It may be due to the nature of the central 4-connected sub-matrix within the larger matrix however it cannot be gauged, simply via simulation results, why the algorithm takes a comparatively longer time with No. of Neighbors = 4. The expected trend of increasing running times continues from No. of Neighbors = 8 onward.

From the images of the paths that are obtained, it can be observed that the path becomes much smoother as additional angles are able to be considered when deciding traversal path. Overall, the experiment yielded a good insight into how the A* algorithm can be applied to path traversal problems for mobile robots.

4 MATLAB Code

4.1 A* Algorithm

```
1 function times = AStarAlgo40c(neighbors)
2 % A-Star Algorithm in an occupancy grid
3 clc; close all;
4 LoadMap % map of obstacles and available space
5 %Start Positions
6 StartX=80;
7 StartY=110;
8 %End Positions
9 TargetX=5;
10 TargetY=87;
11 %Height and width of matrix
12 [Height,Width]=size(MAP);
13 %Matrix keeping track of G-scores
14 GScore=zeros(Height,Width);
15 %Matrix keeping track of F-scores (only open list)
16 FScore=inf(Height,Width);
17 %Heuristic matrix
18 Hn=zeros(Height,Width);
19 %Matrix keeping of open grid cells
20 OpenSet=zeros(Height,Width);
21 %Matrix keeping track of closed grid cells
22 ClosedSet=zeros(Height,Width);
23 %Adding object-cells to closed matrix
24 ClosedSet(MAP==1)=1;
25 %Matrix keeping track of X position of parent
26 ParentX=zeros(Height,Width);
27 %Matrix keeping track of Y position of parent
28 ParentY=zeros(Height,Width);
29 %% Setting up matrices representing neighbors to be investigated
30
31 NeighborCheck=int8(neighbors);
32 [row,col]=find(NeighborCheck==1);
33 Neighbors=[row col]-5;
34 N.Neighbors=size(col,1);
35
36 % timing code
37 t = 0;
38 times = [];
39 for ii = 1:100
40 % Creating Heuristic-matrix based on distance to nearest goal node
41 for k=1:size(MAP,1)
42     for j=1:size(MAP,2)
43         if MAP(k,j)==0
44             % Difference of coordinates, finding distance
45             Hn(k,j)=norm([TargetX TargetY]-[k j]);
46         end
47     end
48 end
49
50 %Initializign start node with FValue and opening first node.
51 FScore(StartY,StartX) = Hn(StartY,StartX);
52 OpenSet(StartY,StartX) = 1; RECONSTRUCTPATH=1;
53
```

```

54 while l==1 %Code will break when path found or when no path exist
55 tic %starting stopwatch timer
56 MINOpenFScore=min(min(FScore));
57 if MINOpenFScore==inf;
58     %Failuere!
59     OptimalPath=[inf];
60     RECONSTRUCTPATH=0;
61     break
62 end
63
64 [CurrentX,CurrentY]=find(FScore==MINOpenFScore);
65 CurrentX=CurrentX(1);
66 CurrentY=CurrentY(1);
67 FScore(CurrentX,CurrentY)=inf;
68
69 if CurrentX==TargetX && CurrentY==TargetY
70     break
71 end
72
73 for p=1:N_Neighbors
74     i=Neighbors(p,1); %X
75     j=Neighbors(p,2); %Y
76     % Checking if neighbor is inside or outside the MAP
77     % the neighbor is outside the MAP, ignore it,
78     % and move to next neighbor (use continue)
79     if CurrentX+i<1 || CurrentX+i>Height ...
80         || CurrentY+j<1 || CurrentY+j>Width
81         continue
82     end
83     % Now checking obstacle
84     Flag=1;
85     if (ClosedSet(CurrentX+i,CurrentY+j)==0) %Neighbor is open to move
86         if (abs(i)>1||abs(j)>1)
87             JumpCells_i=(1:abs(i))*sign(i);
88             JumpCells_j=(1:abs(j))*sign(j);
89             for Ki=1:length(JumpCells_i)
90                 for Kj=1:length(JumpCells_j)
91                     if (MAP(CurrentX+JumpCells_i(Ki),...
92                         CurrentY+JumpCells_j(Kj))==1)
93                         Flag=0;
94                     end
95                 end
96             end
97         end
98         %End of checking that the path does not pass an object
99         if Flag==1;
100             Dist_Curr_Neighb=sqrt(i^2+j^2);
101             Tentative_GScore = GScore(CurrentX,CurrentY)+Dist_Curr_Neighb;
102             if OpenSet(CurrentX+i,CurrentY+j)==0
103                 OpenSet(CurrentX+i,CurrentY+j)=1;
104             elseif GScore(CurrentX+i,CurrentY+j) < Tentative_GScore
105                 continue
106             end
107             % This path to neighbor is better than any previous one; record it!
108             ParentX(CurrentX+i,CurrentY+j)=CurrentX;
109             ParentY(CurrentX+i,CurrentY+j)=CurrentY;
110             GScore(CurrentX+i,CurrentY+j)=Tentative_GScore;
111             FScore(CurrentX+i,CurrentY+j)= ...
112                 GScore(CurrentX+i,CurrentY+j) ...

```

```

113             + Hn(CurrentX+i,CurrentY+j);
114         end
115     end
116 end
117 t = t + toc;
118 end
119 times = [times t];
120 t = 0;
121 end
122
123 if RECONSTRUCTPATH
124     k=1; OptimalPath(1,:)=[CurrentX CurrentY];
125     while 1==1
126         k=k+1;
127         CurrentYDummy=ParentY(CurrentX,CurrentY);
128         if CurrentYDummy==0; break; end
129         CurrentX=ParentX(CurrentX,CurrentY);
130         CurrentY=CurrentYDummy;
131         OptimalPath(k,:)=[CurrentX CurrentY];
132         if CurrentX==StartX && CurrentY==StartY
133             break
134         end
135     end
136 end
137 r=size(NeighborCheck,1);
138 figure; subplot 121; imagesc(NeighborCheck);colormap(flipud(gray));
139 axis([0 r+1 0 r+1]);title(['No of Neighbors = ' num2str(N_Neighbors)])
140 axis square; set(gca,'fontsize',14);
141 if size(OptimalPath,2)>1
142     subplot 122;imagesc(MAP);colormap(flipud(gray)); hold on
143     plot(OptimalPath(:,2),OptimalPath(:,1),'b','linewidth',3)
144     plot(OptimalPath(1,2),OptimalPath(1,1),'o',...
145         'color','y','markerfacecolor','r','markersize',10,'linewidth',3)
146     plot(OptimalPath(end,2),OptimalPath(end,1),'o',...
147         'color','r','markerfacecolor','y','markersize',10,'linewidth',3)
148     legend('Path','Goal','Start','Location','Best');
149     axis square; set(gca,'fontsize',14);grid
150     title('Optimal Path')
151 else
152     pause(1);
153     h=msgbox('Sorry, No path exists to the Target!','warn');
154     uiwait(h,5);
155 end

```

4.2 Main Script

```

1 % Neighbor Matrices
2 n4 = [ ...
3     0 0 0 0 0 0 0 0 0;
4     0 0 0 0 0 0 0 0 0;
5     0 0 0 0 0 0 0 0 0;
6     0 0 0 0 1 0 0 0 0;
7     0 0 0 1 0 1 0 0 0;
8     0 0 0 0 1 0 0 0 0;
9     0 0 0 0 0 0 0 0 0;
10    0 0 0 0 0 0 0 0 0;

```

```

11     0 0 0 0 0 0 0 0 0 0];
12 n8 = [ ...
13     0 0 0 0 0 0 0 0 0 0;
14     0 0 0 0 0 0 0 0 0 0;
15     0 0 0 0 0 0 0 0 0 0;
16     0 0 0 1 1 1 0 0 0 0;
17     0 0 0 1 0 1 0 0 0 0;
18     0 0 0 1 1 1 0 0 0 0;
19     0 0 0 0 0 0 0 0 0 0;
20     0 0 0 0 0 0 0 0 0 0;
21     0 0 0 0 0 0 0 0 0 0];
22 n16 = [ ...
23     0 0 0 0 0 0 0 0 0 0
24     0 0 0 0 0 0 0 0 0 0;
25     0 0 0 1 0 1 0 0 0 0;
26     0 0 1 1 1 1 1 0 0 0;
27     0 0 0 1 0 1 0 0 0 0;
28     0 0 1 1 1 1 1 0 0 0;
29     0 0 0 1 0 1 0 0 0 0;
30     0 0 0 0 0 0 0 0 0 0;
31     0 0 0 0 0 0 0 0 0 0];
32 n40 = [ ...
33     0 0 0 0 0 0 0 0 0 0;
34     0 1 1 1 0 1 1 1 0 0;
35     0 1 1 1 0 1 1 1 0 0;
36     0 1 1 1 1 1 1 1 0 0;
37     0 0 0 1 0 1 0 0 0 0;
38     0 1 1 1 1 1 1 1 0 0;
39     0 1 1 1 0 1 1 1 0 0;
40     0 1 1 1 0 1 1 1 0 0;
41     0 0 0 0 0 0 0 0 0 0];
42 n68 = [
43     1 1 1 1 0 1 1 1 1 1;
44     1 1 1 1 0 1 1 1 1 1;
45     1 1 1 1 0 1 1 1 1 1;
46     1 1 1 1 1 1 1 1 1 1;
47     0 0 0 1 0 1 0 0 0 0;
48     1 1 1 1 1 1 1 1 1 1;
49     1 1 1 1 0 1 1 1 1 1;
50     1 1 1 1 0 1 1 1 1 1;
51     1 1 1 1 0 1 1 1 1 1];
52
53 times4 = AStarAlgo40c(n4);
54 times8 = AStarAlgo40c(n8);
55 times16 = AStarAlgo40c(n16);
56 times40 = AStarAlgo40c(n40);
57 times68 = AStarAlgo40c(n68);
58
59 % individual plot generation
60 figure; hold on
61 plot(times4,'-+', 'LineWidth', 1)
62 plot(times8,'-o', 'LineWidth', 1)
63 plot(times16,'-*', 'LineWidth', 1)
64 plot(times40,'-.', 'LineWidth', 1)
65 plot(times68,'-s', 'LineWidth', 1)
66 ylim([0 2.5])
67 title('Run Times Over 100 Iterations','FontSize', 15)
68 xlabel('Iteration','FontSize', 15)
69 ylabel('Run Time','FontSize', 15)

```

```

70 av4 = mean(times4)
71 av8 = mean(times8)
72 av16 = mean(times16)
73 av40 = mean(times40)
74 av68 = mean(times68)
75 str4 = num2str(av4)
76 str8 = num2str(av8)
77 str16 = num2str(av16)
78 str40 = num2str(av40)
79 str68 = num2str(av68)
80 legend('Neighbors = 4','Neighbors = 8','Neighbors = 16','Neighbors = 40','Neighbors = ...
      68','FontSize',12,'Location','Best')
81 % yline(mean(times68),':',['Avg. Run Time = ',str,' ...
      s'],'LineWidth',2,'LabelHorizontalAlignment','center','LabelVerticalAlignment','bottom','FontSize
      14)

```