

# HOMework 2

## CMU 16-782 : PLANNING AND DECISION MAKING IN ROBOTICS

### 1 Compilation Details

You can compile the code by :

```
"mex planner.cpp plannerRRT.cpp treeRRT.cpp plannerPRM.cpp graphPRM.cpp"
```

Additionally, these are some of important hyper-parameters in "common\_header.h". These are constants which are defined at the start of the header file.

1. P\_G : Probability with which RRT and RRT-Star planners sample goal configuration.
2. MAX\_EPSILON : Maximum number of steps for extend function. Currently 10.
3. MAX\_STEP\_SIZE : Maximum step size for collision check. Currently at PI/90.
4. NEAR\_RADIUS : Near radius is used in both PRM and RRT-Star. In RRT-Star, it is used in the repair function for finding the near by configurations in the graph and reconnecting them in a more optimal way. In PRM, it's used to connect a new point to the graph.
5. MAX\_ITERATIONS\_PRM : Maximum number of configurations(nodes) added to the PRM graph. Currently at 40000.
6. K : Maximum possible neighbors for PRM. Currently at 5.
7. MAX\_TIME : Maximum time for searching for a plan in RRT, RRT-Connect and RRT-Star. Currently at 20 seconds. Please increase it to 40 seconds when testing edge cases.

### 2 Discussions

I think the RRT-Connect was able to show the best performance out of all the planners. For different test cases which I tried, RRT-Connect was almost always able to find a feasible path within a second. Performance of RRT and RRT-Star were also satisfactory. My implementations of RRT, RRT Connect and RRT star are pretty fast but they can be improved by using a KD tree for storing the configurations in the tree. In my opinion, RRT connect works the best for these kinds of maps as it almost always produces a solution within a second. There are some cases where I found that RRT Connect actually performed worse than RRT or RRT-Star. These are the cases where start position might be surrounded by obstacles. In such a case, RRT and RRT-Star always keep exploring near the start position and are therefore able to find a path earlier.

My implementation of PRM performed the worst. There were many cases where my implementation of PRM was not able to produce a path. It is also the slowest performing planner

out of all the planners. I tried changing a lot of hyper-parameters for PRM but was not able to obtain a 100 percent success rate of finding a path. One drawback of the way in which I have implemented PRM is that I can only have a certain number of points in the graph. I think implementing it in a way such that it the solution is bounded by some maximum time rather than being bounded by number of nodes in the graph would have been more useful. Here is a table comparing average results of different planners:

|                             | <b>RRT</b> | <b>RRT-Connect</b> | <b>RRT-Star</b> | <b>PRM</b> |
|-----------------------------|------------|--------------------|-----------------|------------|
| <b>Planing Time Average</b> | 1.36       | 1.21               | 1.31            | 12.36      |
| <b>Path Cost Average</b>    | 8.24       | 14.203             | 6.89            | 20.07      |
| <b>Size of tree/graph</b>   | 622        | 846                | 536             | 10000      |

The start and goal configurations which I used for testing my planners can be found in the table below :

| <b>Qstart</b>                             | <b>Qgoal</b>                             |
|---|--|
| 1.56566 6.03025 2.13871 3.67735 1.40625   | 0.954219 2.39178 5.15862 1.07671 2.0733  |
| 1.09951 1.23524 1.57761 3.87072 2.97376   | 0.954219 2.39178 5.15862 1.07671 2.0733  |
| 1.53703 2.12195 5.65521 2.32005 0.698708  | 0.954219 2.39178 5.15862 1.07671 2.0733  |
| 1.71848 1.86184 4.67904 1.18724 4.31514   | 0.954219 2.39178 5.15862 1.07671 2.0733  |
| 0.652642 1.89279 2.9589 1.4482 5.30495    | 0.954219 2.39178 5.15862 1.07671 2.0733  |
| 0.977357 5.80177 2.70307 1.16124 5.68553  | 0.954219 2.39178 5.15862 1.07671 2.0733  |
| 1.86892 1.64753 3.78777 4.4687 1.39328    | 0.954219 2.39178 5.15862 1.07671 2.0733  |
| 0.368878 1.86407 2.00294 2.66512 3.19097  | 0.954219 2.39178 5.15862 1.07671 2.0733  |
| 0.822693 2.10711 4.27086 0.857989 4.53161 | 0.954219 2.39178 5.15862 1.07671 2.0733  |
| 0.333688 2.33992 1.24481 3.0768 2.1331    | 0.954219 2.39178 5.15862 1.07671 2.0733  |
| 1.56566 6.03025 2.13871 3.67735 1.40625   | 1.34002 2.40607 0.186408 2.96768 2.09464 |
| 1.09951 1.23524 1.57761 3.87072 2.97376   | 1.34002 2.40607 0.186408 2.96768 2.09464 |
| 1.53703 2.12195 5.65521 2.32005 0.698708  | 1.34002 2.40607 0.186408 2.96768 2.09464 |
| 1.71848 1.86184 4.67904 1.18724 4.31514   | 1.34002 2.40607 0.186408 2.96768 2.09464 |
| 0.652642 1.89279 2.9589 1.4482 5.30495    | 1.34002 2.40607 0.186408 2.96768 2.09464 |
| 0.977357 5.80177 2.70307 1.16124 5.68553  | 1.34002 2.40607 0.186408 2.96768 2.09464 |
| 1.86892 1.64753 3.78777 4.4687 1.39328    | 1.34002 2.40607 0.186408 2.96768 2.09464 |
| 0.368878 1.86407 2.00294 2.66512 3.19097  | 1.34002 2.40607 0.186408 2.96768 2.09464 |
| 0.822693 2.10711 4.27086 0.857989 4.53161 | 1.34002 2.40607 0.186408 2.96768 2.09464 |

### 3 RRT

I tried 20 random start and goal positions. These random start and goal positions were same for all the planners.I have mentioned these configurations at the last of this document.

### 3.1 Results

I obtained the following results with RRT :

| Path Cost | Size of Tree | Plan Time |
|-----------|--------------|-----------|
| 17.756    | 2219         | 2         |
| 7.48414   | 66           | 1         |
| 3.01882   | 13           | 1         |
| 3.28066   | 53           | 1         |
| 16.4977   | 2715         | 2         |
| 15.0137   | 228          | 1         |
| 6.62544   | 361          | 1         |
| 6.62657   | 172          | 1         |
| 3.80931   | 38           | 1         |
| 14.7993   | 3795         | 3         |
| 8.77058   | 230          | 1         |
| 3.48089   | 20           | 1         |
| 10.4955   | 91           | 1         |
| 9.63021   | 1104         | 1         |
| 5.66426   | 27           | 1         |
| 12.8462   | 503          | 1         |
| 6.20473   | 153          | 1         |
| 2.58107   | 18           | 1         |
| 2.12041   | 20           | 1         |

### 3.2 Implementation Details

I have implemented my RRT planner in the file `plannerRRT.cpp`. This file also has RRT-connect and RRT-star implementations. I have created a tree class in the file `treeRRT.cpp` for handling the tree generated by my RRT planner. A vector `NodesPtrList` contains all the nodes in the tree. In this implementation of RRT, I sample the goal configuration 20 percent of the time, and a random configuration otherwise. The RRT planner tries to extend towards the sampled configuration but can only move with a maximum step size of  $\pi/9$  radians. This extend method is implemented in "extend" function within the tree object. The planner finds a plan if it samples the goal configuration and it happens to be within  $\pi/9$  radians of the nearest point in the tree. If the planner is not able to find a path within 15 seconds, it quits and responds with a "time out" message. Except for some edge cases(not included in the results), RRT is able to generate a plan within 20 seconds.

## 4 RRT Connect

I tried 20 random start and goal positions. These random start and goal positions were same for all the planners. I have mentioned these configurations at the last of this document.

## 4.1 Results

The results which I obtained for random start and goal positions for RRT-Connect are in the table below:

| Path Cost | Size of Tree | Plan Time |
|-----------|--------------|-----------|
| 36.3028   | 2922         | 2         |
| 3.35103   | 25           | 1         |
| 4.11898   | 4            | 1         |
| 4.95674   | 16           | 1         |
| 4.60767   | 15           | 1         |
| 57.9232   | 6084         | 5         |
| 9.84366   | 305          | 1         |
| 4.39823   | 19           | 1         |
| 9.84366   | 96           | 1         |
| 7.47001   | 33           | 1         |
| 34.2085   | 1820         | 1         |
| 4.39823   | 4            | 1         |
| 16.7552   | 143          | 1         |
| 12.2871   | 119          | 1         |
| 4.46804   | 6            | 1         |
| 33.3009   | 4303         | 3         |
| 14.591    | 160          | 1         |
| 4.39823   | 4            | 1         |
| 2.58309   | 4            | 1         |

## 4.2 Implementation Details

My implementation of RRT Connect planner is very similar to my implementation of the RRT planner. In this planner, I maintain two instances of the tree object. The pointers to these trees are "ForwardTreePtr" and "BackwardTreePtr". In one iteration, I extend one of the trees towards a randomly sampled configuration while I connect the other tree directly to the newly added configuration in the extended tree. I swap the pointers in the next iteration and so in the next iteration I extend the backward tree, The "extend" function in tree object also works as "connect" function with just a boolean to set the step size to infinity. Except for some edge cases(not included in the results), RRT Connect is able to generate a plan within 20 seconds.

## 5 RRT Star

I tried 20 random start and goal positions. These random start and goal positions were same for all the planners. I have mentioned these configurations at the last of this document.

## 5.1 Results

The results which I obtained for random start and goal positions for RRT-Star are in the table below:

| Path Cost | Tree Size | Plan Time |
|-----------|-----------|-----------|
| 10.8275   | 325       | 1         |
| 6.89865   | 104       | 1         |
| 2.07521   | 14        | 1         |
| 2.55218   | 12        | 1         |
| 7.38969   | 865       | 1         |
| 18.4055   | 754       | 2         |
| 9.39121   | 1168      | 2         |
| 5.63531   | 3578      | 4         |
| 2.87779   | 18        | 1         |
| 7.61687   | 1593      | 1         |
| 10.5631   | 401       | 1         |
| 2.26829   | 19        | 1         |
| 7.34984   | 79        | 1         |
| 6.08119   | 67        | 1         |
| 4.75957   | 30        | 1         |
| 13.6508   | 923       | 2         |
| 8.6082    | 196       | 1         |
| 2.49129   | 18        | 1         |
| 1.46652   | 24        | 1         |

## 5.2 Implementation Details

Implementation of RRT-Star is similar to RRT and RRT-Connect. Like RRT, in RRT-Star, I have sampled the goal configuration for 20 percent of the time. I have implemented an extra repair function in tree object which repairs the tree and makes the path more optimal. Except for some edge cases(not included in the results), RRT star is able to generate a plan within 20 seconds.

# 6 PRM

I tried 20 random start and goal positions. These random start and goal positions were same for all the planners. I have mentioned these configurations at the last of this document.

## 6.1 Results

The results which I obtained for random start and goal positions for RRT-Star are in the table below:

| Path Cost | Plan Time | No. of points in graph |
|-----------|-----------|------------------------|
| 26.3735   | 9         | 10000                  |
| 23.3303   | 8         | 10000                  |
| fail      | 8         | 10000                  |
| fail      | 12        | 10000                  |
| 12.654    | 12        | 10000                  |
| 18.3915   | 12        | 10000                  |
| 7.2489    | 13        | 10000                  |
| fail      | 12        | 10000                  |
| 8.67617   | 12        | 10000                  |
| 15.7253   | 21        | 10000                  |
| 25.5912   | 12        | 10000                  |
| fail      | 12        | 10000                  |
| 22.5397   | 13        | 10000                  |
| 19.3632   | 12        | 10000                  |
| fail      | 16        | 10000                  |
| 27.205    | 13        | 10000                  |
| 24.7251   | 12        | 10000                  |
| 23.6541   | 15        | 10000                  |
| 26.0943   | 11        | 10000                  |

## 6.2 Implementation Details

In my implementation of PRM, I always generate a fixed number of points (in collision free space) to generate a graph. I then locally connect my start and goal configuration to this graph and apply A-star to find the most optimum path from start position to goal position. In my current implementation, I sample around 10,000 points and then try to find a path between start and goal.