

Assignment 1: Fast Trajectory Re-planning

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Part 0 – Set Up Your Environments:

For the set-up grid world environments, we use pygame. In the cell.py we use similar method that is describe in the assignment. The cell.py has Boolean value that can indicate whether a cell is blocked or not. If the value is blocked then mark the cell as blocked cell and return the blocked cell. Then, we import cell in the grid to set-up the blocked and unblocked cells. In the grid.py under the generate method, we have sup-up the probability of 70% being unblocked and adding the neighbors to stack, and also some members related to heuristic search algorithms: f,g,h ($f(x) = g(x) + h(x)$), bool visited, bool expanded.

For more information, please see our implementation.

Part 1 – Understand the methods:

- a. The main reason why the problem search from the east rather than the north because of the heuristic search method. The purpose of heuristic function is to guide the search process in the most profitable path among all that are available. From the problem we can see that the A is in the east of T. so the most profitable path is east rather than north.

- b. According from our book, in the agent search terminates $\text{key}(S_{goal}, 0) \leq \text{key}(u, 0)$, for all u in the open set of agent search, then:

$$g_0(S_{goal}) \leq w_1 * g^*(g_{goal}) \text{ when } w_2 \geq 1.0.$$

if a search other than the agent terminates in the i^{th} search, then:

$$g_i(S_{goal}) \leq w_2 * \text{OPEN}_0.\text{Minkey}() \leq w_2 * w_1 * g^*(g_{goal}).$$

Therefore the cost of moves of the agent is always bounded within the factor of $w_1 * w_2$. Now, If the numbers of moves of the agent is impossible is bounded from above by the number of unblocked cells squared, then we will have the following:

$$\text{We know that } \text{OPEN}_0.\text{Minkey}() \leq w_1 * g^*(g_{goal})$$

$$\text{Since } \text{OPEN}_0.\text{Minkey}() \geq \infty = g^*(g_{goal}) \geq \infty.$$

When the pseudo code run into an infinite time, the agent will stack in the loop and unable to modified or bounded back.

Part 2 – The Effects of Ties:

In the first, the higher g-score value tends outperforming the lower g-score value, and it was more observable when we run the algorithm and display the speed and efficiency. To know the performant in speed and efficiency of the algorithm. Let that the f-score value of the sum of the g-score and the heuristic cost for each cell. Cells with the same f-score, but having a lower g-score will therefore have a higher heuristic cost, meaning a higher

estimate of the moves needed to reach the goal. Cells that have higher g-score will have a lower heuristic time cost and of course will have a better path to the goal cell. So, if we are choosing the higher g-score as the tiebreaker, the agent will move towards the goal cell with reducing the time and distance that will needed, in other word a better performant.

Part 3 – Forward vs. Backward:

The compile time for Forward A* is very similar for every maps(environments). The main difference for our Repeated Forward A* and Repeated Backward A* is that the Repeated Forward A* works fine and have a similar result, but the Repeated Backward A* seems to take very long time on 101x101 map to compile and we did not get a result from it, sometimes it will have a memory error. So, in this situation we can said that the Repeated Forward A* is performing better regarding to the same f-value with larger g-values.

Part 4 – Proving Heuristics in the Adaptive A*:

First, we need to figure out how the heuristic functions affect the performance. As from the book, $h = |\text{goal.x} - \text{current.x}| + |\text{goal.y} - \text{current.y}|$. We use this idea of Manhattan distances,

we find that when the heuristic function is admissible, we can find the lowest cost path from start to goal. However, the number of expanded cell and the time cost will become larger. On the contrary, when the heuristic function is not admissible, they will have less number of expanded cells and time but the path they lead to will have more cost than the admissible heuristics ones. The reason for this phenomenon is that when the heuristic function is not admissible, it is an over-estimate and thus able to dominate the evaluation function. When the heuristic is dominating the function, the cost will have less influence to the function. In this case, the path will more likely to follow the heuristic's guidance rather than the actual cost. Thus, the cost will become higher and the time and number of expanded cell will become lower. Second, we need to figure out how the different algorithms affect the final path. From the table, we find out that when the A* algorithm uses an admissible heuristic, the cost of the final path is very close to what we get from uniform cost algorithm. However, the performance of inadmissible heuristic A* is worse than uniform cost search. This shows that when the A* has admissible heuristic, it can get the shortest path from any cell to the goal cell while exploring way less cells.

Part 5 – Comparing Heuristics in the Adaptive A* and Repeated Forward A*:

When we are comparing the Adaptive A* and Repeated Forward A*, we can see the main differences in compile time and number of expanded cells. The Adaptive A* tends to have better performance than Repeated Forward A*. The reason is that the Adaptive A* once it compiled the future A* searches do not have to spend the time on heuristic costs. The previous heuristic costs of the cells would have their heuristics be passed into current search to reduce the compile time on current search. As the agent moves toward the goal,

the Adaptive A* cells and time will decrease compare to Repeated Forward A*. So, the Repeated Forward A* is better perform then Adaptive A* because adaptive A* decrease the performance from each cell.

Part 6 - memory Issues:

When we talk about memory issues, we already have a problem on Repeated Backward A* Search on 101x101 map. The compiler will take very long time, and finally crash in the end. If we have a size of 1001 x 1001 large gridworld, I don't think that 4 Mbytes memories is enough to run the gridworld. However, our algorithm might be wrong, if this is the case, the amount of memory should be close to 4 Mbytes.

Tables:

| Repeated Adaptive A* Test cases | Time taken | Expanded Cells |
|------------------------------------|------------|----------------|
| 1 | 1.562000 | 16335 |
| 2 | 2.077000 | 18962 |
| 3 | 3.397000 | 21539 |
| 4 | 2.616000 | 17670 |
| 5 | 5.647000 | 32049 |
| 6* | 6.220000 | 30495 |
| 7 | 2.522000 | 16699 |
| 8* | 7.178000 | 28178 |
| 9* | 5.719000 | 28681 |
| 10 | 4.146000 | 27378 |
| 11* | 7.350000 | 29533 |
| 12 | 2.421000 | 20237 |
| 13 | 2.462000 | 19475 |
| 14 | 2.475000 | 16920 |
| 15 | 1.442000 | 15993 |
| 16* | 6.015000 | 30526 |
| 17 | 4.897000 | 33662 |
| 18 | 1.853000 | 15402 |
| 19 | 2.839000 | 22645 |
| 20* | 7.813000 | 29323 |
| 21 | 2.282000 | 15739 |
| 22 | 1.636000 | 18510 |
| 23* | 5.476000 | 26016 |
| 24 | 3.508000 | 29311 |
| 25* | 0.015000 | 153 |
| 26* | 5.632000 | 28856 |
| 27 | 2.090000 | 19052 |
| 28 | 1.437000 | 21681 |
| 29* | 6.258000 | 30789 |

| | | |
|-----|----------|-------|
| 30* | 10.09900 | 42917 |
| 31* | 6.125000 | 27309 |
| 32* | 6.843000 | 29411 |
| 33 | 2.432000 | 16104 |
| 34 | 2.123000 | 15062 |
| 35* | 6.977000 | 30623 |
| 36 | 1.450000 | 16392 |
| 37 | 4.024000 | 21707 |
| 38 | 2.208000 | 18094 |
| 39 | 3.413000 | 20966 |
| 40 | 1.877000 | 16078 |
| 41* | 19.19800 | 88944 |
| 42 | 1.459000 | 17025 |
| 43* | 6.594000 | 29506 |
| 44 | 2.704000 | 17841 |
| 45* | 0.015000 | 153 |
| 46 | 1.683000 | 19868 |
| 47 | 3.991000 | 25104 |
| 48 | 2.119000 | 15466 |
| 49* | 18.36100 | 43091 |
| 50 | 2.910000 | 21258 |

(no path = *)

| Repeated Forward A* | Time taken | Expanded Cells |
|---------------------|---------------|----------------|
| 1 | 0.919000 | 15723 |
| 2 | 1.190000 | 18962 |
| 3 | 1.318000 | 21181 |
| 4 | 1.051000 | 18305 |
| 5 | 1.994000 | 42972 |
| 6 | No path-6.808 | No path-32093 |
| 7 | 0.992000 | 16563 |
| 8 | No path-7.4 | No path-28562 |
| 9 | No path-6.801 | No path-31060 |
| 10 | 1.488000 | 28909 |
| 11 | No path-6.448 | No path-30138 |
| 12 | 1.207000 | 21385 |
| 13 | 1.143000 | 19296 |
| 14 | 1.053000 | 17106 |
| 15 | 0.944000 | 16388 |
| 16 | No path-7.609 | No path-40641 |
| 17 | 1.970000 | 38787 |
| 18 | 1.202000 | 18997 |
| 19 | 3.216000 | 62521 |
| 20 | No path-8.242 | No path-29541 |
| 21 | 1.002000 | 15822 |

| | | |
|----|----------------|---------------|
| 22 | 1083000 | 20210 |
| 23 | No path-6.785 | No path-26781 |
| 24 | 1.768000 | 34325 |
| 25 | No path-0.022 | No path-153 |
| 26 | No path-6.538 | No path-25998 |
| 27 | 1.162000 | 20333 |
| 28 | 0.892000 | 14554 |
| 29 | No path-7.213 | No path-34281 |
| 30 | No path-8.432 | No path-40071 |
| 31 | No path-6.91 | No path-27629 |
| 32 | No path-6.677 | No path-28598 |
| 33 | 0.999000 | 16275 |
| 34 | 0.972000 | 15094 |
| 35 | No path-7.072 | No path-28885 |
| 36 | 1.003000 | 16913 |
| 37 | 1.369000 | 20786 |
| 38 | 1.111000 | 18281 |
| 39 | 1.454000 | 22541 |
| 40 | 0.982000 | 16272 |
| 41 | No path-13.146 | No path-67116 |
| 42 | 1.035000 | 17238 |
| 43 | No path-7.039 | No path-29744 |
| 44 | 1.174000 | 17784 |
| 45 | No path-0.022 | No path-153 |
| 46 | 1.111000 | 18830 |
| 47 | 1.712000 | 32650 |
| 48 | 1.098000 | 18039 |
| 49 | No path-21.324 | No path-46715 |
| 50 | 1.407000 | 21640 |