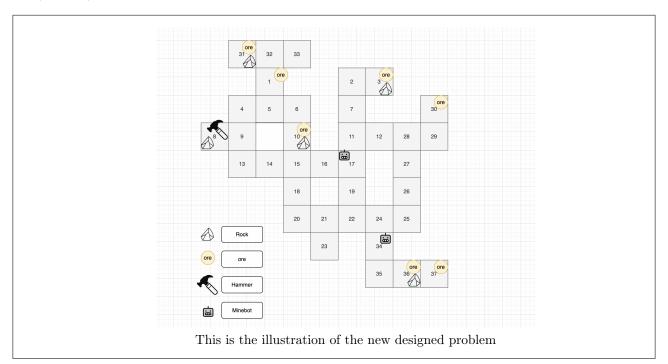
## Informatics 2D Coursework 2 Report

## 1. (5 marks) Task 2.1 Design



In order to devise a harder problem for the ff planner a few given strategies were utilized and a harder problem called problem - hard.pdll was constructed as follows (Note: the major theme of each strategy involved increasing the search space):

Additional MineBots: By assessing the domain file domain-1.pddl, it can clearly be seen that arguments of type robot is being passed onto every action. We already know that a planning problem is more challenging if it has a greater search space, which is the case when there are large number of types, predicates or possible actions present that can be executed. Thus it is a no-brainer to increase the number of robots as it exponentially increases the number of possible search states. This in turn increases the runtime for which the ff planner must run in order to provide a viable plan. Futhermore the planner must also consider which minebot would be best suited to get certain ores based on their location, in turn increases the number of possible states thus makes the problem more challenging. For my problem, I decided to add one extra robot and placed it at cell c34.

Additional Cells: In order to make the problem more difficult another thing that can be done is to increase the number of possible cells, I expanded mine to a total of 37 cells as arranged below. This increases the total number of possible paths that the minebot can take to reach a particular object or ore, thus increases the difficulty of the planning process as the planner has to now evaluate more possible states in order to find a solution. Once again the state space required to be searched to achieve the goal increases.

Increasing the number of Ores, rocks and altering the goal state: Finally in order to make the problem even more difficult for the planner, I increased the number of goal states which in this case were the number of ores to be mined and strategically blocked some of them like the ores at cell c10, c31 and c36, so that in some cases a blocked and unblocked ore are located nearby each other but far away from the initial position of the hammer. This way the planner has to make choices on

how the robot maneuvers and carries the hammer to break rocks in the cases where the ore is blocked. This condition makes the problem more complicated and requires the planner to search through a variety of states to find a solution, especially an optimal one, and allows the scope for improvement in the optimally department.

In order to illustrate the change in difficulty of the problem, two images have been attached below: The first showing the run time of the problem - 1.pddl and the second showing the run time of problem - hard.pddl with the run configuration: ./ff -o domain-1.pddl -f problem-hard.pddl -E

```
37: MOVE C18 C20 RM
38: MOVE C20 C21 RM
39: MOVE C21 LIFT RM
                                            40: LIFTON C RM
41: MOVE LIFT C21 RM
42: MOVE C21 C20 RM
43: MOVE C20 C18 RM
44: MOVE C18 C15 RM
45: MOVE C15 C10 RM
                                            45: MOVE C15 C10 RM
46: PICKUP C10 RM
47: MOVE C10 C15 RM
48: MOVE C15 C16 RM
49: MOVE C15 C17 RM
50: MOVE C17 C11 RM
51: MOVE C17 C17 RM
52: MOVE C7 C2 RM
53: MOVE C2 C3 RM
                                              54: BREAKROCK C3 B RM
55: DROPHOLDABLE C3 HAMMER RM
                                           55: DROPHOLDABLE C3
56: GETORE C3 B RM
57: MOVE C3 C2 RM
58: MOVE C2 C7 RM
59: MOVE C7 C11 RM
60: MOVE C11 C17 RM
61: MOVE C17 C19 RM
62: MOVE C19 C22 RM
63: MOVE C22 C21 RM
64: MOVE C21 LTET RM
                                                                        MOVE C21 LIFT RM
                                                                                              0.00 seconds instantiating 235 easy, 0 hard action templates
0.00 seconds reachability analysis, yielding 87 facts and 102 actions
0.00 seconds creating final representation with 65 relevant facts, 0 relevant fluents
0.00 seconds computing LNF
0.00 seconds building connectivity graph
0.00 seconds searching, evaluating 184 states, to a max depth of 11
0.00 seconds total time
time spent:
                                      0.00 seconds

169: MOVE C31 C32 RM
170: MOVE C32 C1 RM
171: MOVE C3 C5 RM
172: MOVE C5 C6 RM
173: MOVE C5 C6 RM
173: MOVE C6 C10 RM
174: MOVE C10 C15 RM
175: MOVE C10 C15 RM
176: MOVE C18 C20 RM
177: MOVE C20 C21 RM
177: MOVE C20 C21 RM
178: MOVE C11 C12 RM
188: MOVE C11 LIFT RM
188: MOVE C21 C20 RM
183: MOVE C21 C20 RM
183: MOVE C10 C18 RM
183: MOVE C10 C6 RM
184: MOVE C10 C6 RM
186: MOVE C10 C6 RM
187: MOVE C10 C6 RM
188: GETORE C1 A RM
189: MOVE C10 C5 RM
191: MOVE C10 C15 RM
192: MOVE C10 C15 RM
193: MOVE C10 C15 RM
193: MOVE C10 C15 RM
194: MOVE C10 C15 RM
195: MOVE C10 C15 RM
196: MOVE C10 C15 RM
197: MOVE C10 C15 RM
198: MOVE C10 C15 RM
199: MOVE C10 C21 RM
199: MOVE C21 LIFT RM
197: LIFTON A RM
                                                                                              0.00 seconds instantiating 1354 easy, 0 hard action templates
0.00 seconds reachability analysis, yielding 194 facts and 340 actions
0.00 seconds creating final representation with 160 relevant facts, 0 relevant fluents
0.00 seconds computing LNF
0.00 seconds building connectivity graph
2.77 seconds searching, evaluating 48275 states, to a max depth of 0
2.77 seconds total time
   time spent:
```

As seen from the images above, the problem has clearly been made more challenging as now 48275 states are being evaluated as compared to 339 previously, hence with the new configuration the planner is taking more time to devise a legal plan under best first search.

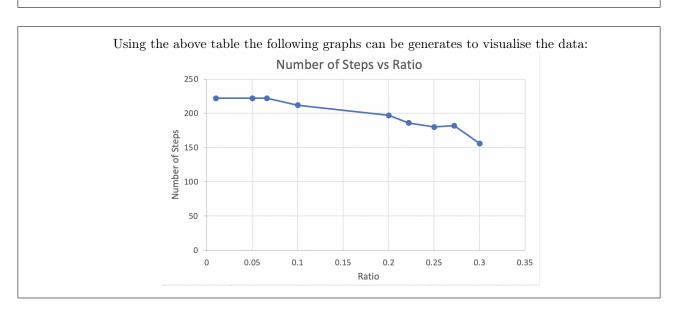
## 2. (10 marks) Task 2.2 Evaluation

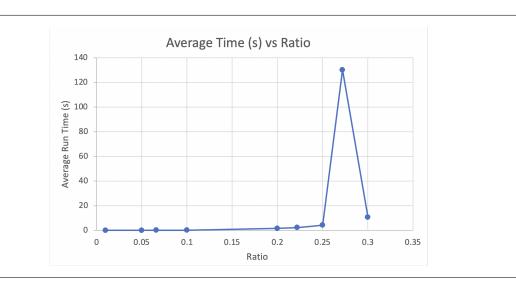
The aim of this task is to design an experiment to evaluate the effect of different values of  $w_g$  and  $w_h$  on the planner's performance under the best-first search configuration. Thus in order to do some experimentation, the planner was first ran on problem-hard.pdll using random  $w_g$  and  $w_h$  values on doing so a key observation was made that the planner's performance somehow related to the ration between  $w_g$  and  $w_h$ . In order to explore this the following experiment was devised:

- Values of  $w_g$  and  $w_h$  were selected such that the ratio  $w_g/w_h$  varied from 0 and moved towards 1.
- Values of the number of steps and the time taken for each run was noted, in fact each configuration of  $w_h$  and  $w_g$  was run three times and its average run time was computed and compared with the rest of the runs.
- The observations from the experiment will then be tabulated and graphed, in order to analyse and draw conclusions.

The experiment values after running the *problem* through the panner with various  $w_g$  and  $w_h$  configurations are :

$W_g$	$W_h$	Ratio	Time1 (S)	Time2 (s)	Time3 (s)	Average Time (s)	Number of Steps
1	100	0.01	0.13	0.11	0.11	0.1166	222
1	50	0.05	0.12	0.13	0.13	0.1266	222
3	45	0.066	0.14	0.14	0.13	0.205	222
1	10	0.1	0.25	0.26	0.26	0.256	212
2	10	0.1	0.25	0.27	0.26	0.26	212
2	10	0.2	1.68	1.75	1.66	1.696	197
2	9	0.222	2.25	2.32	2.58	2.383	186
1	4	0.25	4.17	4.45	4.32	4.313	180
3	11	0.272	129.19	129.77	130	129.65	182
3	10	0.3	11.2	10.58	10.63	10.8	156
1	3	0.33	-	-	-	Too long	-





Earlier we had mentioned that the planner's performance under the best-first search configuration was somehow related to the ratio of  $w_g$  and  $w_h$ , this can be formally verified as the original paper on the FF planner uses  $w_g$  and  $w_h$  as heuristic weight values that balance the heuristic and the goal distance components in the computation of the heuristic value for best-first search. That is  $w_g$  value is the weight given to the heuristic estimate of the remaining cost to reach the goal state from the current state. A higher  $w_g$  value will result in a more greedy search, focusing more on the heuristic estimate and less on the actual cost of reaching the goal state, where as the  $w_h$  value is the weight given to the actual cost of reaching the current state from the start state. A higher  $w_h$  value will result in a more conservative search, considering the actual cost of reaching the current state more strongly. Thus the ratio of these 2 components determines how much of the heuristic is based on the remaining cost to reach the goal state from the current state and how much of it is based on the cost of reaching the current state from the goal state.

Referring to the figures above for the Number of Steps vs ratio and Average Time vs ratio, and by other random experiments, the following conclusions or observations can be drawn:

- 1. In general for lower ratios of  $w_g: w_h$  the search was less optimal and the planner took less time to figure our a legal plan as compared to the higher ratios where the planner seemed to have become more optimal but the running time significantly increased.
- 2. The running time of the algorithm increased as we moved towards a greater ratio, this basically meant that the search became more greedy, and as a result the number of states the planner had to evaluate increased as many states may have had similar heuristic function evaluations. As for this problem, it is easier to rank based on the distance from the start to the current state vs the distance from the current to the goal state, since many states have similar distances to the goal state and it isnt clear how much this might be, as evaluating this requires a lot of work. Hence the long running times.
- 3. In this case, and I believe this can be extended to others as well, the optimally only started increasing after a certain ratio (0.1), and all other ratios like 0.01 vs 0.066 gave the same number of steps even though it took almost twice the time to run for the higher ratio (0.1 sec more).
- 4. The optimality increased or the number of steps in the solution decreased as the ratio increased, as it can be seen from the graph. However the experiment only continued up until a ratio of 0.3, above that all other configurations took too long to complete and was thus not included in the analysis. A fair guess would be that the most optimal results are obtained by taking more or less around 1:1 ratio between the 2 weights, as the costs of reaching the current state from the start and start to goal are both equally important in most cases. However this would require tremendous running time and in most use cases this ratio must be experimented with in different planning problems to find the ratio that provides the maximum optimality.
- 5. From the previous point, around the ratio 0.3 was when the ff planner was producing an optimal solution in decent time ( 10 seconds ) for this problem, even though for some ratios like 0.272 which

is lower than 0.3, it still ran for about 2 minutes and failed to produce a very optimal solution. Thus it really shows that experimenting with various  $w_g$  and  $w_h$  values are required regardless of the trends in order to find the best ratio suitable for providing an optimal enough solution in an acceptable time. However we can use these analysis to make educated guesses about the  $w_h$  and  $w_g$  values which will speed up the experimentation process greatly.

## 3. (25 marks) Task 3.4 Your Extension

Your answer here.