## Takahiro Ishikawa

AIND: Implement a Planning Search

# Heuristic Analysis

## Non-heuristic planning solution

Results of number of expansion required, number of goal tests, new nodes, time elapsed, plan length and optimal solution are below,

## 1. Air Cargo Problem 1

	Expansion	Goal Tests	New Nodes	Time Elapsed	Plan Length	Optimal Solution
breadth_first_search	43	56	180	0.0413	6	TRUE
breadth_first_tree_search	1458	1459	5960	1.2215	6	TRUE
depth_first_graph_search	21	22	84	0.0201	20	FALSE
depth_limited_search	101	271	414	0.1198	50	FALSE
uniform_cost_search	55	57	224	0.0497	6	TRUE

## 2. Air Cargo Problem 2

	Expansion			Time Elapsed		
breadth_first_search	3063	4274	25442	15.2185	9	TRUE
breadth_first_tree_search	-	-	-	-	-	-
depth_first_graph_search	82	83	511	0.2080	77	FALSE
depth_limited_search	-	-	-	-	-	-
uniform_cost_search	4296	4398	36069	13.0588	9	TRUE

-: Stopped search because of taking longer than 10 min

Priya: Very neat comparison of all the different search results on problems 1, 2 and 3.

#### 3. Air Cargo Problem 3

	Expansion			Time Elapsed		Optimal Solution
breadth_first_search	14663	18098	129631	127.6693	12	TRUE
breadth_first_tree_search	-	-	-	-	-	-
depth_first_graph_search	408	409	3364	2.2969	392	FLASE
depth_limited_search	-	-	-	-	-	-
uniform_cost_search	18151	18153	159038	67.9362	12	TRUE

-: Stopped search because of taking longer than 10 min

For all problems, breadth\_first\_search and uniform\_cost\_search provide optimal solution, but other metrics are not minimum values. On the other hand, depth\_first\_graph\_search don't provide optimal solution, but other metrics are minimum values. These means breath\_first\_search and uniform\_cost\_search can find optimal solution because the search radiate in all directions first, but using more space consumption, and depth\_first\_graph can reach goal at not of deep location because the search advances along one branch, but few space consumption [1].

Priya: Suggestion: The link below has an interesting comparison of the BFS and DFS methods on when to chose

one vs the other: http://stackoverflow.com/que stions/3332947/when-is-it-practical-to-use-dfs-vs-bfs

HEURISTIC ANALYSIS

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## A\* searches with heuristic

Results of number of expansion required, number of goal tests, new nodes, time elapsed, plan length and optimal solution are below,

## 1. Air Cargo Problem 1

	Expansion			Time Elapsed		
A* search h_1	55	57	224	0.0564	6	TRUE
A* search h_ignore_preconditions	41	43	170	0.0595	6	TRUE
$egin{aligned} A^* & \text{search} \\ h\_pg\_levelsum \end{aligned}$	11	13	50	0.9291	6	TRUE

## 2. Air Cargo Problem 2

	Expansion	Goal Tests	New Nodes	Time Elapsed	Plan Length	Optimal Solution
A* search h_1	4396	4398	36069	12.6857	9	TRUE
A* search h_ignore_preconditions	1294	1296	10927	4.7433	9	TRUE
A* search h_pg_levelsum	252	254	2054	195.1564	9	TRUE

#### 3. Air Cargo Problem 3

	Expansion	Goal Tests	New Nodes	Time Elapsed	Plan Length	Optimal Solution
A* search h_1	18151	18153	159038	66.2141	12	TRUE
A* search h_ignore_preconditions	5038	5040	44926	20.4705	12	TRUE
A* search h_pg_levelsum	-	-	-	-	-	-

-: Stopped search because of taking longer than 10 min

Priya: Well done! All algorithms have been implemented properly

h\_pg\_levelsum, h\_ignore\_preconditions and h\_1 are in ascending order for expansion, goal tests and new nodes. h\_ignore\_preconditions, h\_1 and h\_pg\_levelsum are in ascending order for time elapsed. Few expansion, goal tests and new nodes mean using few space. For example, h\_pg\_levelsum uses few space but it takes a long time elapsed. A\* search with heuristic perform better as the problem complexity increased [1].

Priya: This is an important point. Better heuristics like level sum

may be more efficient in reducing the no. of expansions but costly in terms of taking more time.

#### The Best heuristic

The best heuristic is h\_ignore\_preconditions. Because this space consumption is lower than maximum one and time elapsed is the shortest of three heuristics. Non-heuristic providing optimal solution is not good because of using more space consumption for example breath\_first\_search.

Priya: I agree with your conclusion

#### Optimal Plans by using the best heuristic (h\_ignore\_preconditions)

#### 1. Air Cargo Problem 1

	Optimal Plan
1	Load(C1, P1, SFO)
2	Fly(P1, SFO, JFK)
3	Load(C2, P2, JFK)
4	Fly(P2, JFK, SFO)
5	Unload(C1, P1, JFK)
6	Unload(C2, P2, SFO)

## 2. Air Cargo Problem 2

	Optimal Plan
1	Load(C2, P2, JFK)
2	Fly(P2, JFK, ATL)
3	Load(C3, P2, ATL)
4	Fly(P2, ATL, SFO)
5	Load(C1, P1, SFO)
6	Fly(P1, SFO, JFK)
7	Unload(C1, P1, JFK)
8	Unload(C2, P2, SFO)
9	Unload(C3, P2, SFO)

## 3. Air Cargo Problem 3

	Optimal Plan
1	Load(C2, P2, JFK)
2	Fly(P2, JFK, ORD)
3	Load(C4, P2, ORD)
4	Fly(P2, ORD, SFO)
5	Load(C1, P1, SFO)
6	Fly(P1, SFO, ATL)
7	Load(C3, P1, ATL)
8	Fly(P1, ATL, JFK)
9	Unload(C1, P1, JFK)
10	Unload(C2, P2, SFO)
11	Unload(C3, P1, JFK)
12	Unload(C4, P2, SFO)

## Reference

[1] Stuart J. Russell, Peter Norvig (2010), Artificial Intelligence: A Modern Approach (3rd Editions).

Priya: Awesome: Good work! You have identified the

optimal no. of steps for each of the 3 problems.