## Heuristic Analysis

Load(C2, P2, JFK)

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Provide an optimal plan for Problems 1, 2, and 3.
Solving ACP 1 using breadth_first_search...
Expansions
             Goal Tests
                          New Nodes
    43
                56
                           180
Plan length: 6 Time elapsed in seconds: 0.0422343909740448
Load(C1, P1, SF0)
Load(C2, P2, JFK)
Fly(P2, JFK, SF0)
Unload(C2, P2, SFO)
Fly(P1, SFO, JFK)
Unload(C1, P1, JFK)
Solving ACP 2 using astar_search with h_ignore_preconditions...
             Goal Tests
                          New Nodes
Expansions
    4853
                4855
                           44041
Plan length: 9 Time elapsed in seconds: 16.03822832100559
Load(C1, P1, SF0)
Load(C2, P2, JFK)
Load(C3, P3, ATL)
Fly(P1, SFO, JFK)
Fly(P2, JFK, SF0)
Fly(P3, ATL, SFO)
Unload(C3, P3, SF0)
Unload(C2, P2, SF0)
Unload(C1, P1, JFK)
Solving ACP 3 using astar_search with h_ignore_preconditions...
Expansions
             Goal Tests
                          New Nodes
   18223
                           159618
               18225
Plan length: 12 Time elapsed in seconds: 68.17411388404435
Load(C1, P1, SF0)
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Fly(P1, SF0, ATL)
Load(C3, P1, ATL)
Fly(P2, JFK, ORD)
Load(C4, P2, ORD)
Fly(P2, ORD, SF0)
Fly(P1, ATL, JFK)
Unload(C4, P2, SF0)
Unload(C3, P1, JFK)
Unload(C2, P2, SF0)
Unload(C1, P1, JFK)
```

Compare and contrast non-heuristic search result metrics (optimality, time elapsed, number of node expansions) for Problems 1,2, and 3. Include breadth-first, depth-first, and at least one other uninformed non-heuristic search in your comparison; Your third choice of non-heuristic search may be skipped for Problem 3 if it takes longer than 10 minutes to run, but a note in this case should be included.

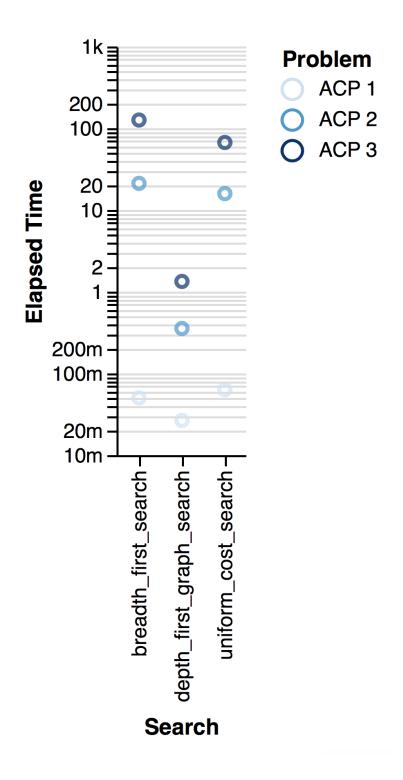
When running breadth first search (1), depth first graph search (3) and uniform-cost-search (5) on all three problems we see the following results:

Prob	Search	t (s)	#	N. Exp.	G. Tests	New N.
ACP 1	breadth_first	0.05	6	43	56	180
ACP 1	$depth\_first\_graph$	0.03	20	21	22	84
ACP 1	$uniform\_cost$	0.06	6	55	57	224
ACP 2	$breadth\_first$	21.20	9	3346	4612	30534
ACP 2	$depth\_first\_graph$	0.36	105	107	108	959
ACP 2	$uniform\_cost$	15.61	9	4853	4855	44041
ACP 3	$breadth\_first$	122.78	12	14120	17673	124926
ACP 3	$depth\_first\_graph$	1.36	288	292	293	2388
ACP 3	$uniform\_cost$	65.68	12	18223	18225	159618

When looking at the results it becomes fairly obvious that depth-first search stands out from the others.

As it expands one path at a time, and does so until it reaches a valid goal, any valid goal, or backtracks and then expands until it reaches a goal it doesn't need much state to keep track off. Therefore it comes up with a result quickly without looking at a large part of the problem space.

The other two approaches come up with an optimal solution in contrast, but need more time and space to evaluate the problem space.



Compare and contrast heuristic search result metrics using A-Star with the "ignore preconditions" and "level-sum" heuristics for Problems 1, 2, and 3.

Looking at the specific issue of planning the cargo flights we can make use if the independence of the goals, therefore levelsum was applicable.

When running the three different heuristics we are presented with the following results for our three problems:

Prob	Search	t (s)	#	N. Exp.	G. Tests	New N.
ACP 1	1	0.04	6	55	57	224
ACP 1	$ignore\_preconditions$	0.07	6	41	43	170
ACP 1	$pg\_levelsum$	1.55	6	11	13	50
ACP 2	1	16.19	9	4853	4855	44041
ACP 2	$ignore\_preconditions$	6.48	9	1450	1452	13303
ACP 2	$pg\_levelsum$	319.86	9	86	88	841
ACP 3	1	64.73	12	18223	18225	159618
ACP 3	$ignore\_preconditions$	24.95	12	5040	5042	44944
ACP 3	$pg\_levelsum$	1811.00	12	315	317	2902

As expected as even the dummy heuristic  $h_1$  is admissable we get an optimal result from all three heuristics.

However we can then further see the efficiency of a relatively domain-stupid heuristic, h\_ignore\_preconditions, that was applicable because the goals in our cargo planning were independent and therefore relaxing the constraints was admissable.

Also we were able to see that the h\_pg\_levelsum was performing much better in terms of accuracy, i.e. lower unneeded expansion into the problem space, but this accuracy came at the price that half of the problem was already solved during the heuristically approximation.

So it seems this is a case where legwork pays off instead of cleverness.

What was the best heuristic used in these problems? Was it better than non-heuristic search planning methods for all problems? Why or why not?

The heuristic search planning methods were the clear winner. It was further interesting to see that an elaborate heuristic, while more accurately guiding the search process, was overall not as efficient as a relatively dumb heuristic, that exploits not domain knowledge, but structural knowledge of how the problem was expressed, i.e. here dropping the pre-conditions.

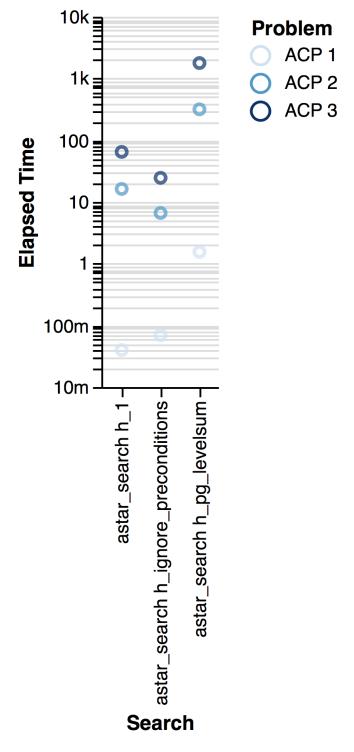


Figure 1: Heuristic 5