# **Heuristic Analysis**

All problems are in the Air Cargo domain. They have the same action schema defined, but different initial states and goals.

Air Cargo Action Schema:

```
Action(Load(c, p, a),
    PRECOND: At(c, a) Λ At(p, a) Λ Cargo(c) Λ Plane(p) Λ Airport(a)
    EFFECT: ¬ At(c, a) Λ In(c, p))
Action(Unload(c, p, a),
    PRECOND: In(c, p) Λ At(p, a) Λ Cargo(c) Λ Plane(p) Λ Airport(a)
    EFFECT: At(c, a) Λ ¬ In(c, p))
Action(Fly(p, from, to),
    PRECOND: At(p, from) Λ Plane(p) Λ Airport(from) Λ Airport(to)
    EFFECT: ¬ At(p, from) Λ At(p, to))
```

#### Problem I:

#### **Initial State and Goal**

```
Init(At(C1, SF0) A At(C2, JFK)
    A At(P1, SF0) A At(P2, JFK)
    A Cargo(C1) A Cargo(C2)
    A Plane(P1) A Plane(P2)
    A Airport(JFK) A Airport(SF0))
Goal(At(C1, JFK) A At(C2, SF0))
```

#### **Metrics**

| Algorithm                              | Node<br>Expansion | Goal<br>Tests | New<br>Nodes | Plan<br>Length | Time Elapsed<br>[seconds] |
|--|-------------------|---------------|--------------|----------------|---------------------------|
| breadth_first_search                   | 43                | 56            | 180          | 6              | 0.0211                    |
| breadth_first_tree_search              | 1458              | 1459          | 5960         | 6              | 0.5877                    |
| depth_first_graph_search               | 21                | 22            | 84           | 20             | 0.0103                    |
| depth_limited_search                   | 101               | 271           | 414          | 50             | 0.0602                    |
| uniform_cost_search                    | 55                | 57            | 224          | 6              | 0.0258                    |
| recursive_best_first_search h_1        | 4229              | 4230          | 17023        | 6              | 1.6969                    |
| greedy_best_first_graph_search<br>h_1  | 7                 | 9             | 28           | 6              | 0.0047                    |
| astar_search h_1                       | 55                | 57            | 224          | 6              | 0.0268                    |
| astar_search<br>h_ignore_preconditions | 41                | 43            | 170          | 6              | 0.0243                    |
| astar_search h_pg_levelsum             | 11                | 13            | 50           | 6              | 0.6113                    |

## **Optimal Plan**

```
Load(C1, P1, SF0)
Load(C2, P2, JFK)
Fly(P1, SF0, JFK)
Fly(P2, JFK, SF0)
Unload(C1, P1, JFK)
Unload(C2, P2, SF0)
```

## **Problem II**

#### **Initial State and Goal**

```
Init(At(C1, SF0) \( \Lambda \) At(C2, JFK) \( \Lambda \) At(C3, ATL)
\( \Lambda \) At(P1, SF0) \( \Lambda \) At(P2, JFK) \( \Lambda \) At(P3, ATL)
\( \Lambda \) Cargo(C1) \( \Lambda \) Cargo(C2) \( \Lambda \) Cargo(C3)
\( \Lambda \) Plane(P1) \( \Lambda \) Plane(P2) \( \Lambda \) Plane(P3)
\( \Lambda \) Airport(JFK) \( \Lambda \) Airport(SF0) \( \Lambda \) Airport(ATL))

Goal(At(C1, JFK) \( \Lambda \) At(C2, SF0) \( \Lambda \) At(C3, SF0))
```

#### **Metrics**

| Algorithm                              | Node<br>Expansion | Goal<br>Tests | New<br>Nodes | Plan<br>Length | Time Elapsed<br>[seconds] |
|--|-------------------|---------------|--------------|----------------|---------------------------|
| breadth_first_search                   | 3343              | 4609          | 30509        | 9              | 5.4061                    |
| breadth_first_tree_search              | Timed Out         |               |              |                |                           |
| depth_first_graph_search               | 624               | 625           | 5602         | 619            | 2.1287                    |
| depth_limited_search                   | 222719            | 2053741       | 2054119      | 50             | 618.0923                  |
| uniform_cost_search                    | 4853              | 4855          | 44041        | 9              | 7.5371                    |
| recursive_best_first_search h_1        | Timed Out         |               |              |                |                           |
| greedy_best_first_graph_search<br>h_1  | 998               | 1000          | 8982         | 21             | 1.5554                    |
| astar_search h_1                       | 4853              | 4855          | 44041        | 9              | 7.6248                    |
| astar_search<br>h_ignore_preconditions | 1450              | 1452          | 13303        | 9              | 2.7769                    |
| astar_search h_pg_levelsum             | 86                | 88            | 841          | 9              | 133.0823                  |

## **Optimal Plan**

```
Load(C3, P3, ATL)
Fly(P3, ATL, SF0)
Unload(C3, P3, SF0)
Load(C2, P2, JFK)
Fly(P2, JFK, SF0)
Unload(C2, P2, SF0)
Load(C1, P1, SF0)
Fly(P1, SF0, JFK)
Unload(C1, P1, JFK)
```

## **Problem III**

#### **Initial State and Goal**

```
Init(At(C1, SF0) \( \Lambda \) At(C2, JFK) \( \Lambda \) At(C3, ATL) \( \Lambda \) At(C4, ORD)
\( \Lambda \) At(P1, SF0) \( \Lambda \) At(P2, JFK)
\( \Lambda \) Cargo(C1) \( \Lambda \) Cargo(C2) \( \Lambda \) Cargo(C3) \( \Lambda \) Cargo(C4)
\( \Lambda \) Plane(P1) \( \Lambda \) Plane(P2)
\( \Lambda \) Airport(JFK) \( \Lambda \) Airport(SF0) \( \Lambda \) Airport(ATL) \( \Lambda \) Airport(ORD))
\( \Lambda \)
Goal(At(C1, JFK) \( \Lambda \) At(C3, JFK) \( \Lambda \) At(C2, SF0) \( \Lambda \) At(C4, SF0))
```

#### **Metrics**

| Algorithm                              | Node<br>Expansion | Goal<br>Tests | New<br>Nodes | Plan<br>Length | Time Elapsed<br>[seconds] |
|--|-------------------|---------------|--------------|----------------|---------------------------|
| breadth_first_search                   | 14663             | 18098         | 129631       | 12             | 28.1912                   |
| breadth_first_tree_search              | Timed Out         |               |              |                |                           |
| depth_first_graph_search               | 408               | 409           | 3364         | 392            | 1.1158                    |
| depth_limited_search                   | Timed Out         |               |              |                |                           |
| uniform_cost_search                    | 18223             | 18225         | 159618       | 12             | 39.6525                   |
| recursive_best_first_search h_1        | Timed Out         |               |              |                |                           |
| greedy_best_first_graph_search<br>h_1  | 5578              | 5580          | 49150        | 22             | 10.6234                   |
| astar_search h_1                       | 18223             | 18225         | 159618       | 12             | 33.6784                   |
| astar_search<br>h_ignore_preconditions | 5040              | 5042          | 44944        | 12             | 11.0498                   |
| astar_search h_pg_levelsum             | 318               | 320           | 2934         | 12             | 770.2634                  |

### **Optimal Plan**

```
Load(C2, P2, JFK)
Fly(P2, JFK, ORD)
Load(C4, P2, ORD)
Fly(P2, ORD, SFO)
Unload(C4, P2, SFO)
Load(C1, P1, SFO)
Fly(P1, SFO, ATL)
Load(C3, P1, ATL)
Fly(P1, ATL, JFK)
Unload(C3, P1, JFK)
Unload(C1, P1, JFK)
Unload(C2, P2, SFO)
```

### **Observations**

The initial problem is simple enough for most algorithms to have a good performance. The worst performer is recursive\_best\_first\_search h\_1 at 1.6969 seconds and expanding 4229 nodes. Although the plan length is still good enough with 6 paths. The increasing complexity has a positive correlation with the time it takes for each algorithm to find a solution.

Its also surprising to see how breadth first search takes longer than depth first search considering that depth first search would expand much more nodes. Also important to note that both have very bad performance making them timeout during the third problem or even the second one for breadth first search.

Heuristics where not as useful as expected, the result where not the fastest ones but all of them did provide the minimum amount of steps.

Overall the depth\_first\_graph\_search would be my method of choice followed by astar\_search\_h\_ignore\_preconditions.