

Optimizations in Airline Industry



Ground Holding Policy Problem(GHPP)

- Airport landing capacity varies due to weather
- Forecasts of a particular day known
- Expected delay at **destination** airport => **depart lately**
- **Ground delay** better than **airborne delay**
- Need to minimise total **Ground + air** delay cost
- Two versions: Single & Multi airport

Assumptions

We assumed a simple single Airport model to start with

Assume **N** flights

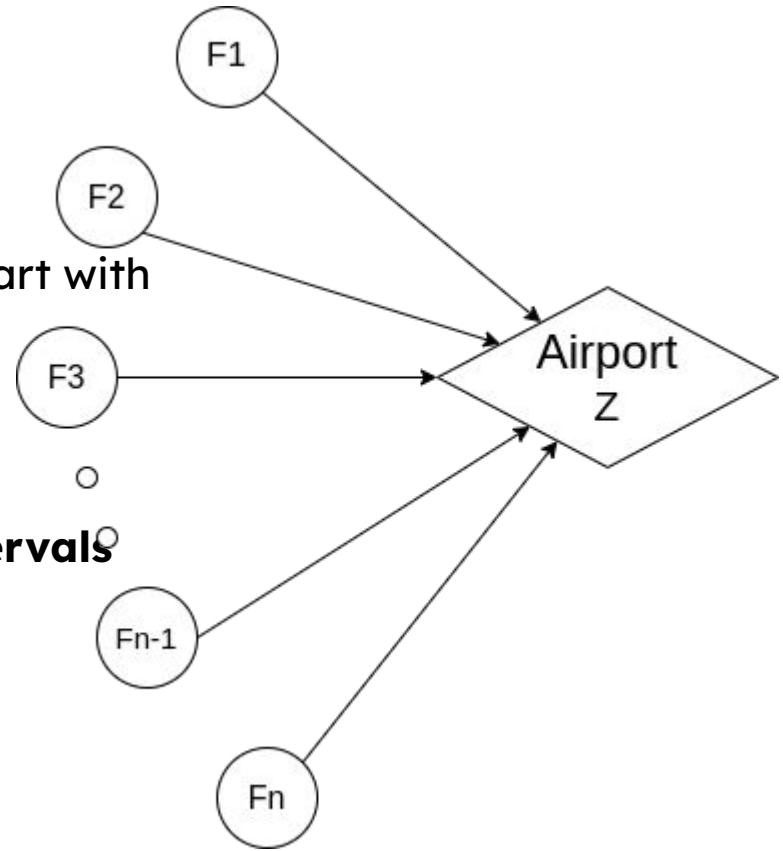
Each flight has a scheduled arrival time at **Z**.

Time period of Interest $[0, B]$ divided into **T intervals**

- Simplifies the objectives, constraints

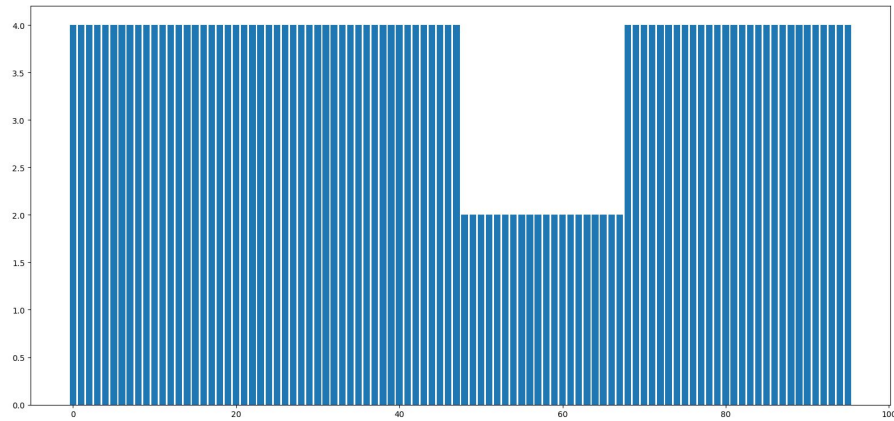
Delaying the departure causes **Ground Delay**

Delaying the landing causes **Air Delay**



Assumptions

- Delay \propto Time interval
- Ground delays less costly
- Airport landing capacity $[C_1, C_2, \dots, C_T]$ known through forecasts
- Assume all flights can land by the end of time period
- Schedule of the flights is fixed, and known



X_{ij} : # of flights scheduled to land at i , but landed at j

W_i : # of flights delayed in air at time slot i , due to capacity limitations

Problem formulation

Decision Variables : $\mathbf{X}_{ij}, \mathbf{W}_i \in \mathbb{Z} \quad 1 \leq i \leq T, j \geq i$

$$\sum_{j \text{ in } [i, T+1]} \mathbf{X}_{ij} = \mathbf{N}_i \quad \forall \quad 1 \leq i \leq T$$

$$\mathbf{W}_i \geq \sum_{j \text{ in } [1, i]} \mathbf{X}_{ji} + \mathbf{W}_{i-1} - \mathbf{C}_i \quad \forall \quad 1 \leq i \leq T$$

$$\mathbf{X}_{ij}, \mathbf{W}_i \geq 0$$

$$\mathbf{Min} \sum_{i \text{ in } [1, T]} \sum_{j \text{ in } [i+1, T+1]} \mathbf{X}_{ij} (j - i) \mathbf{G} + \sum_{i \text{ in } [1, T]} \mathbf{W}_i \mathbf{A}$$

Probabilistic Version

Decision Variables : $\mathbf{X}_{ij}, \mathbf{W}_{iq} \in \mathbb{Z} \quad 1 \leq i \leq T, j \geq i, 1 \leq q \leq Q,$
 $\mathbf{X}_{ij}, \mathbf{W}_{iq} \geq 0$

- \mathbf{X}_{ij} remains the same
- But waiting constraints, variables differ for each forecast bcz landing capacities are different.
- The forecast is $[C_{1q}, C_{2q}, \dots, C_{Tq}]$ with probability p_q , where $1 \leq q \leq Q$.

Formulation

Decision Variables : $X_{ij}, W_{iq} \in \mathbb{Z} \quad 1 \leq i \leq T, j \geq i$

$$\sum_{j \in [i, T+1]} X_{ij} = N_i \quad \forall 1 \leq i \leq T$$

$$W_{iq} \geq \sum_{j \in [1, i]} X_{ji} + W_{(i-1)q} - C_{iq} \quad \forall 1 \leq i \leq T$$

$$X_{ij}, W_{iq} \geq 0$$

$$\text{Min } G \sum_{i \in [1, T]} \sum_{j \in [i+1, T+1]} X_{ij} (j - i) + A \sum_q p_q \left(\sum_{i \in [1, T]} W_{iq} \right)$$

Introducing Aircraft Types

Decision Variables will be indexed by extra “k” denoting the type of aircraft : $X_{ijk}, W_{iq} \in \mathbb{Z} \quad 1 \leq i \leq T, j \geq i, 1 \leq q \leq Q, 1 \leq k \leq K$
 $X_{ijk}, W_{iq} \geq 0$

- All the constraints have to include “k”

Formulation

Decision Variables : $X_{ijk}, W_{iq} \in \mathbb{Z} \quad 1 \leq i \leq T, j \geq i$

$$\sum_{j \in [i, T+1]} X_{ijk} = N_{ki} \quad \forall 1 \leq i \leq T$$

$$W_{iq} \geq \sum_k \sum_{j \in [1, i]} X_{jik} + W_{(i-1)q} - C_{iq} \quad \forall 1 \leq i \leq T$$

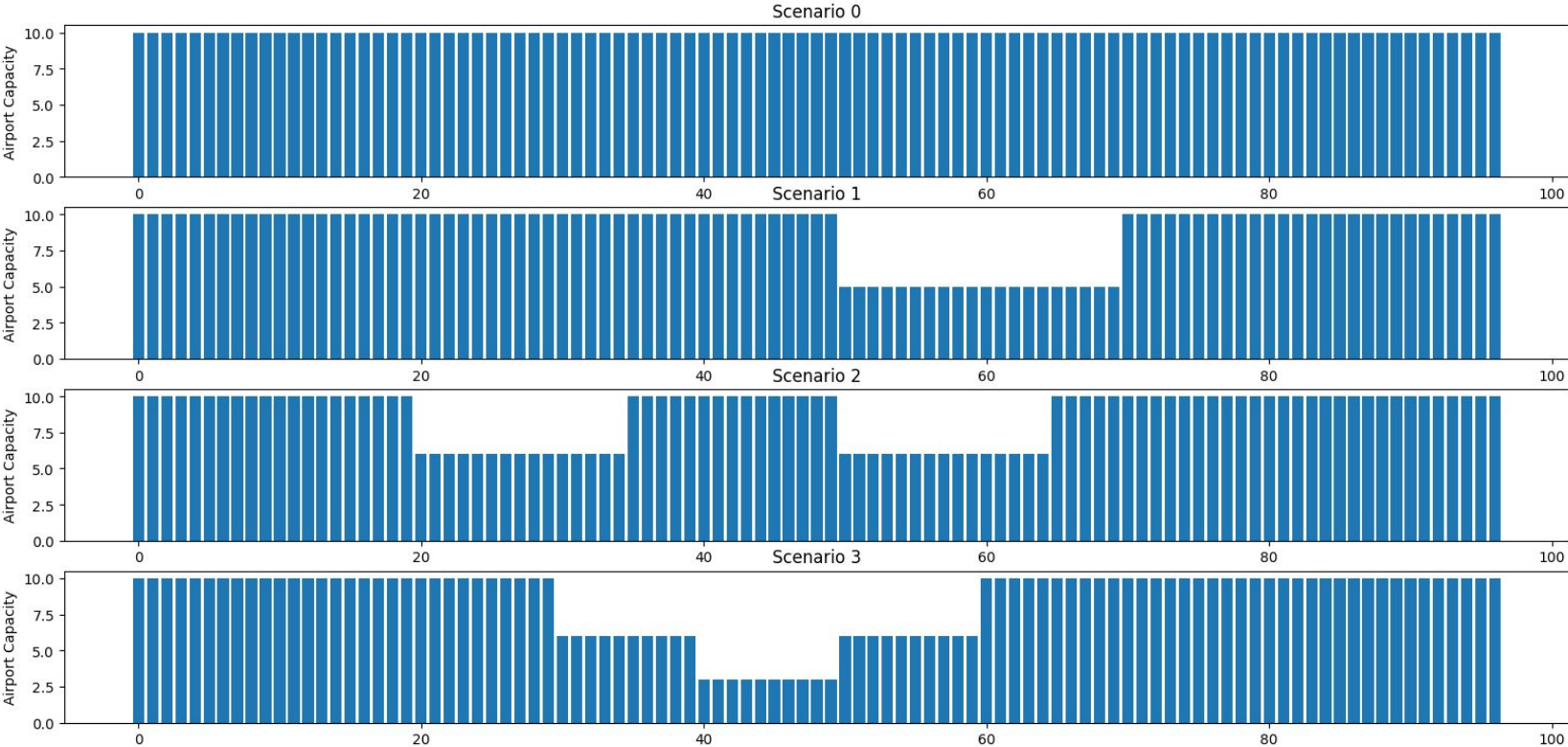
$$X_{ijk}, W_{iq} \geq 0$$

$$\text{Min } \sum_k G_k \sum_{i \in [1, T]} \sum_{j \in [i+1, T+1]} X_{ijk} (j - i) + A \sum_q p_q \left(\sum_{i \in [1, T]} W_{iq} \right)$$

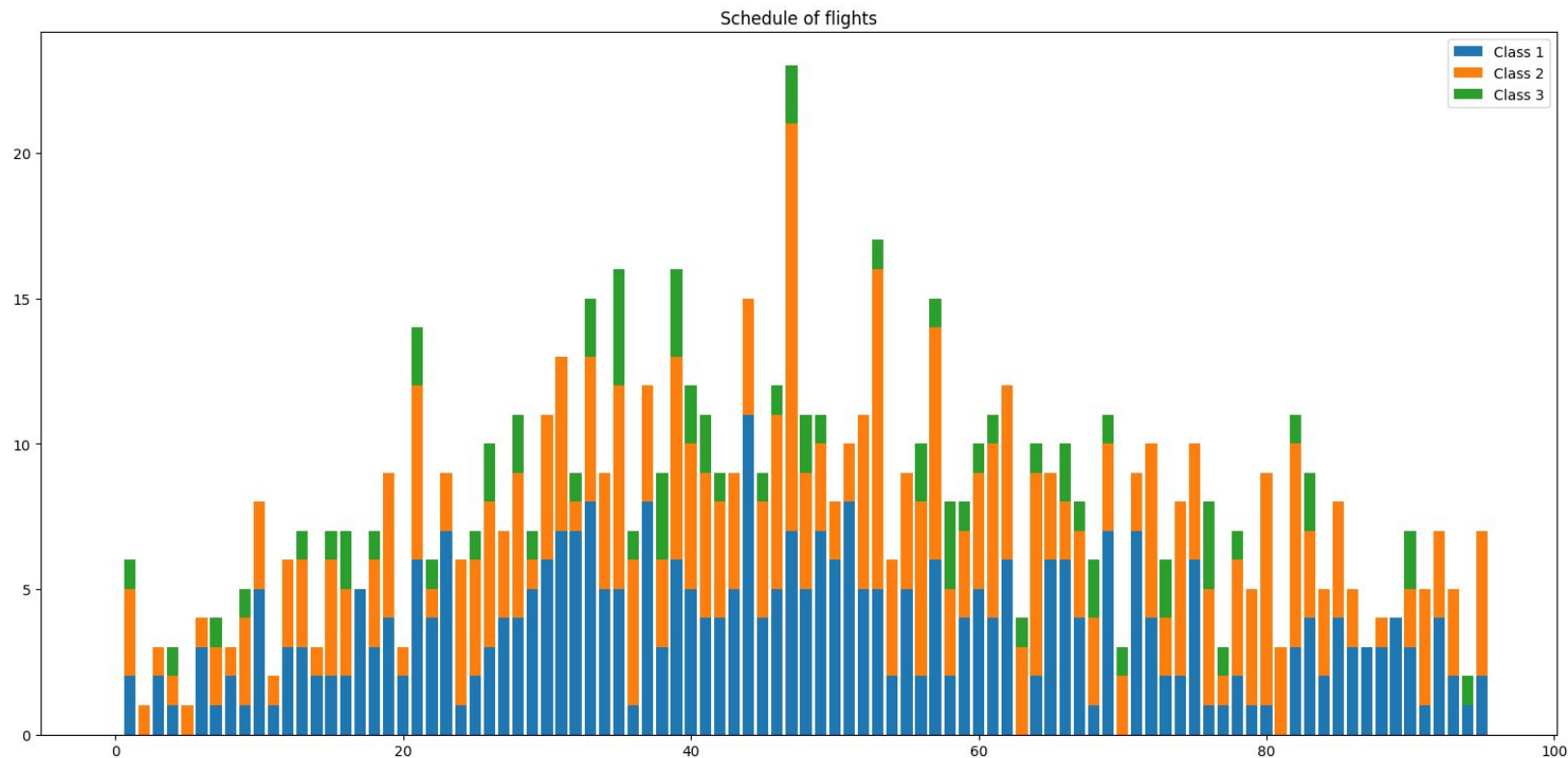
Assumptions & Implementation

- Time intervals of 15 min each (96 Intervals)
- $Q = 4$ Capacity Scenarios
- $K = 3$ Aircraft classes: small, medium, large 45 : 45 : 10%
- Generated a Random schedule, slightly concentrated towards the center to almost 80% of the Maximum capacity
- Compared the algorithm with 3 other algorithms
 - PASSIVE : No ground Holding
 - AVERAGE : considers an average scenario
 - Most Likely : most likely weather scenario
- Ground Costs: [150, 200, 400]
- Air costs per period : 500, 600, 750

Capacity Scenarios



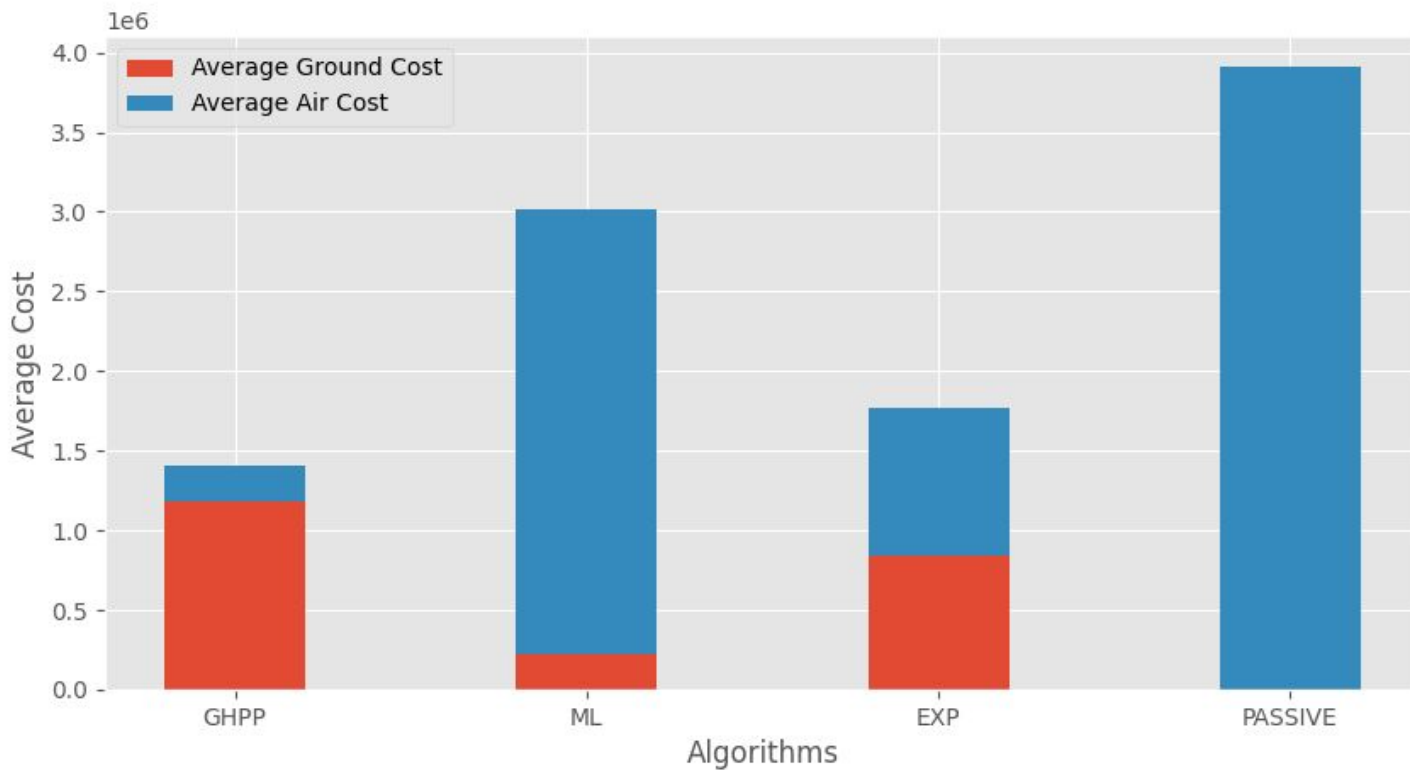
Generated Schedule



RESULTS

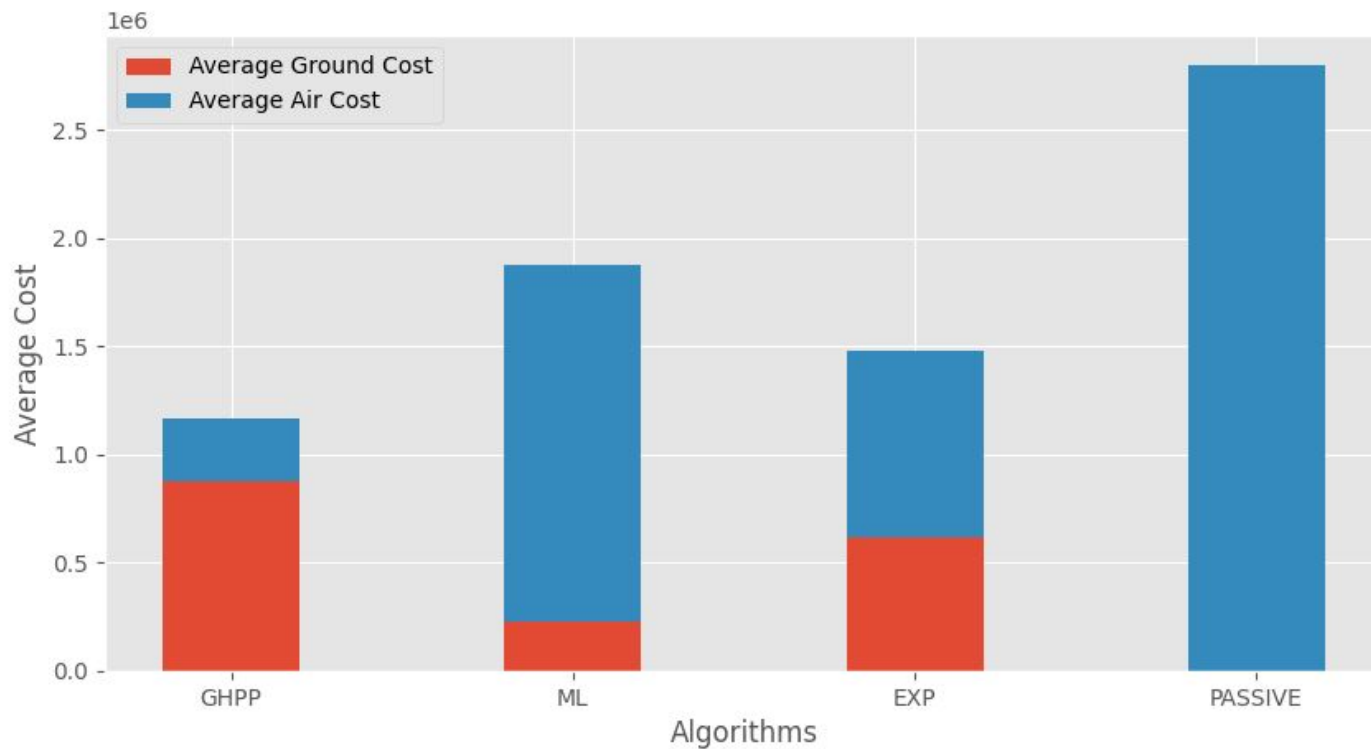
Probability Scenario 1

0.25 0.25 0.25 0.25



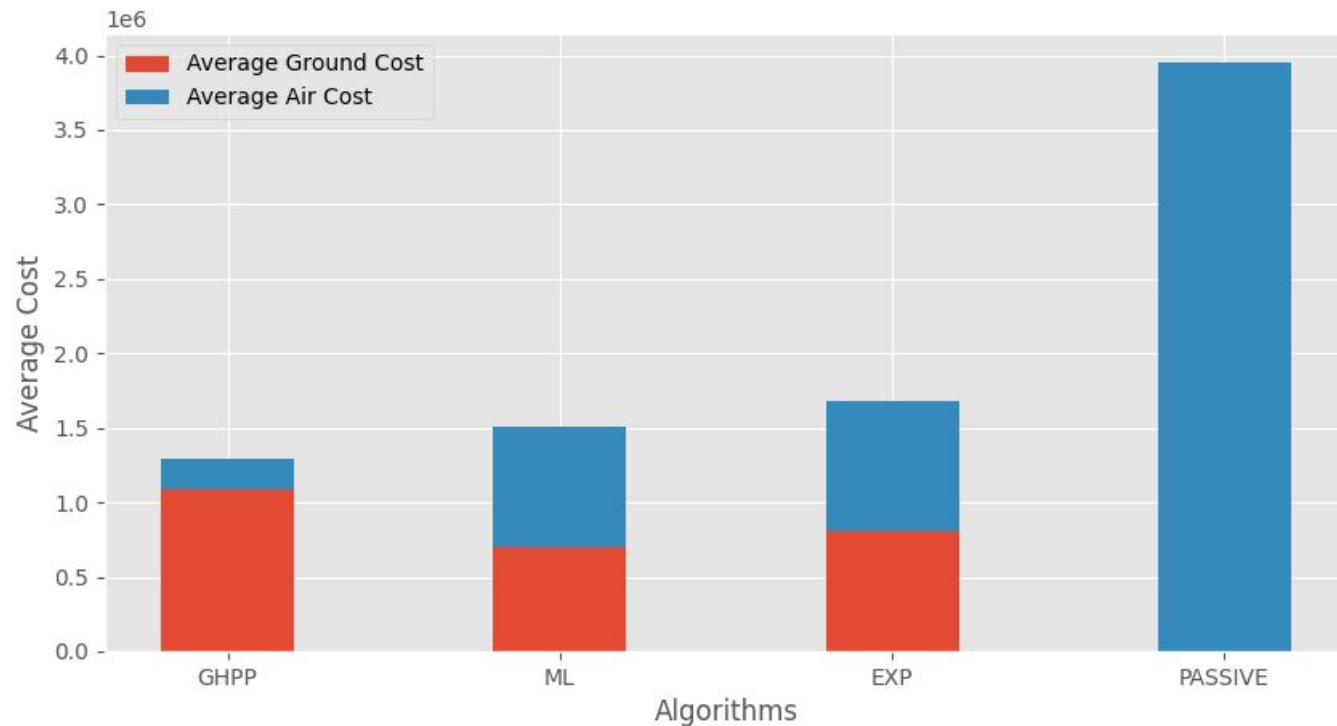
Probability Scenario 2

0.5 0.2 0.2 0.1



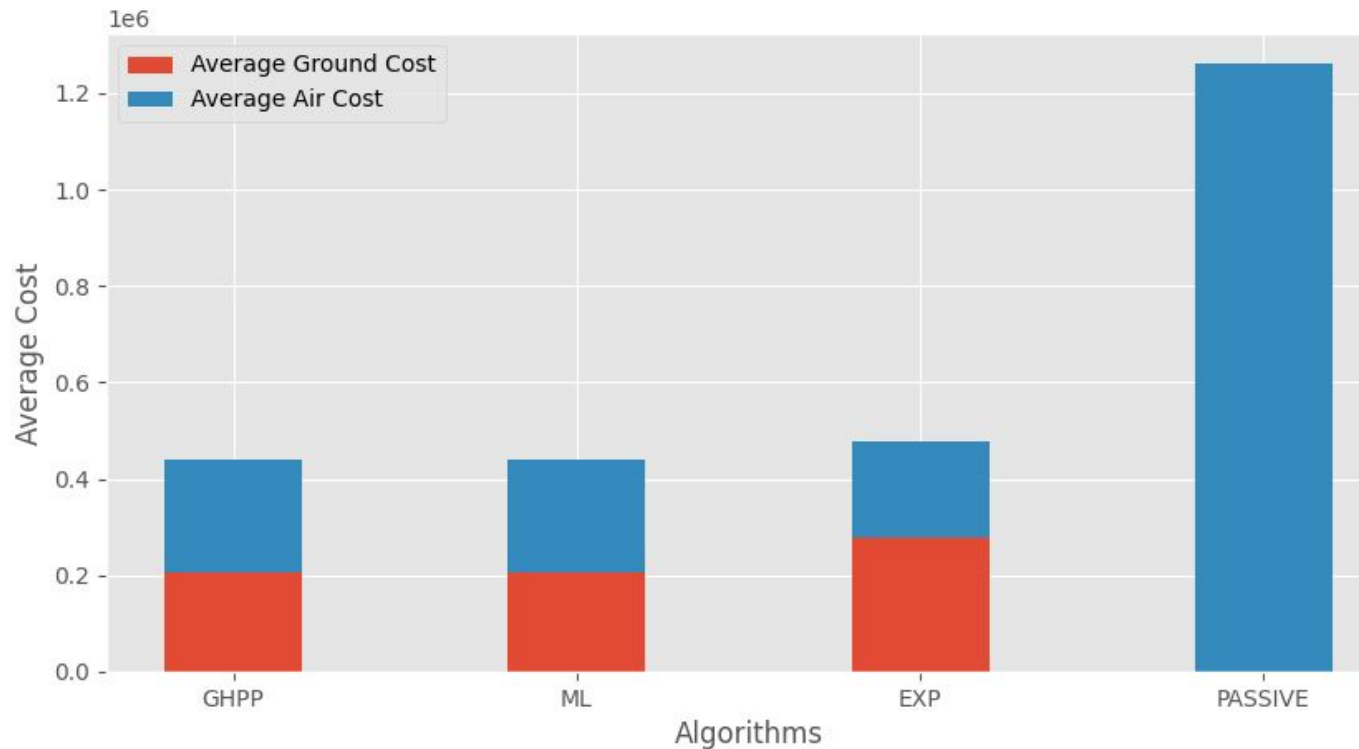
Probability Scenario 3

0.1 0.4 0.3 0.2



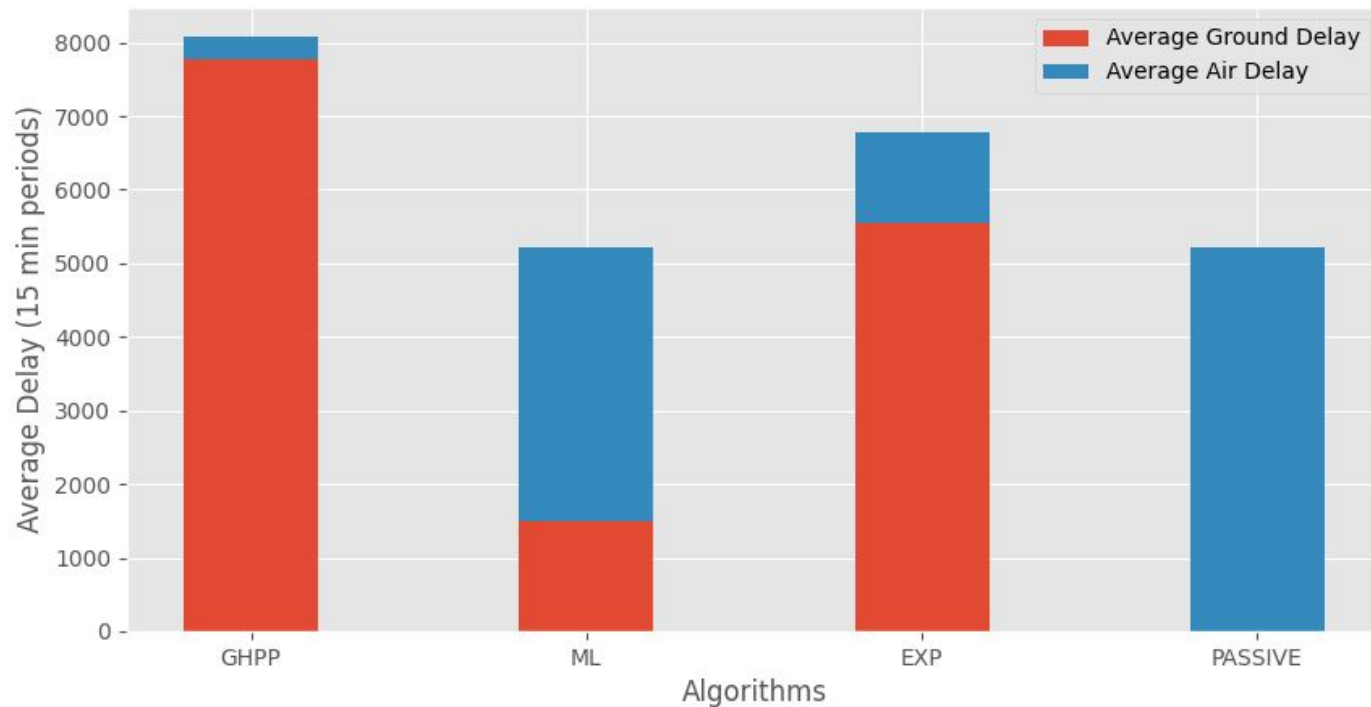
Probability Scenario 4

0.9 0.1 0.0 0.0

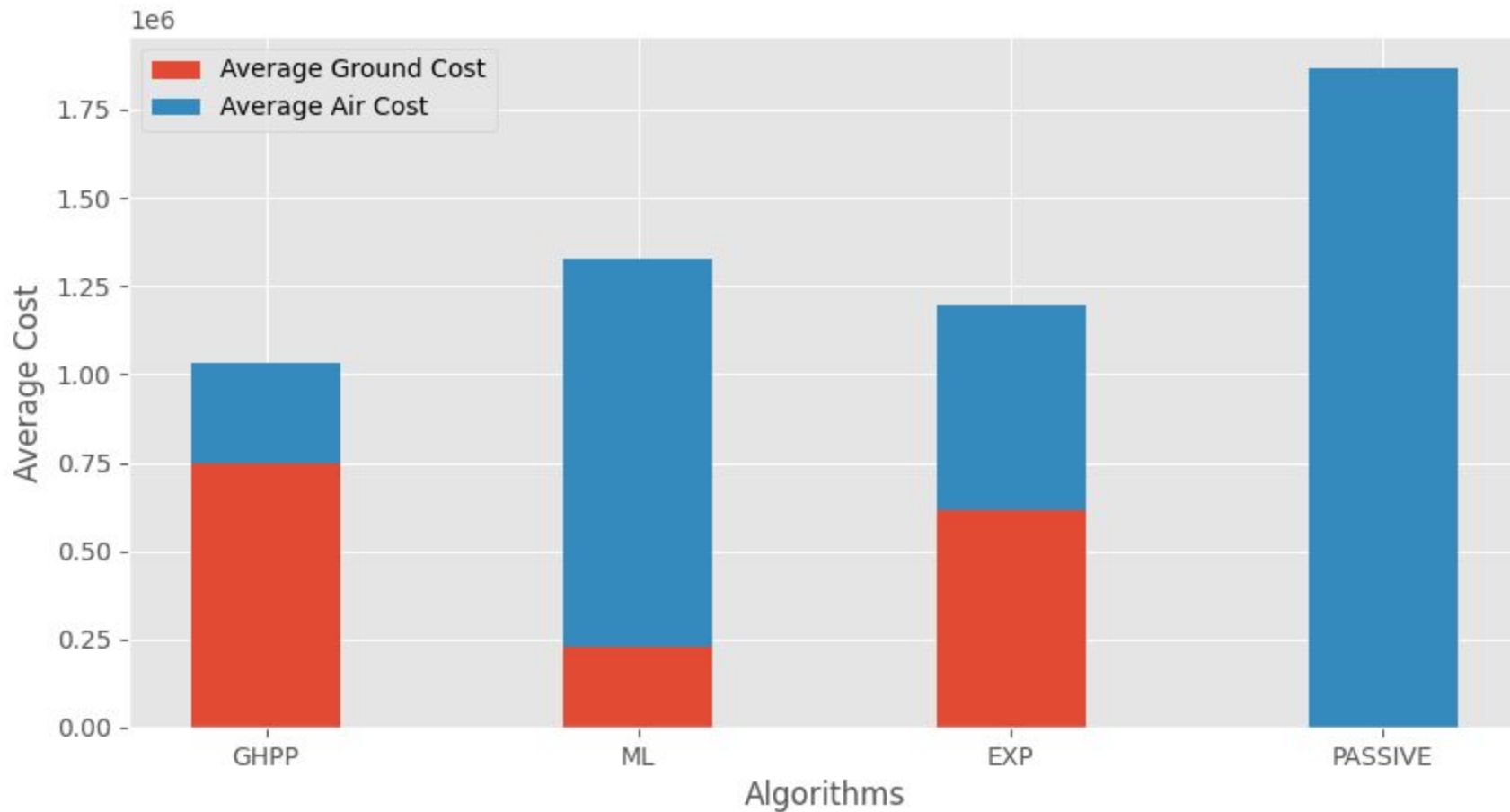


Average Delay [Case 1]

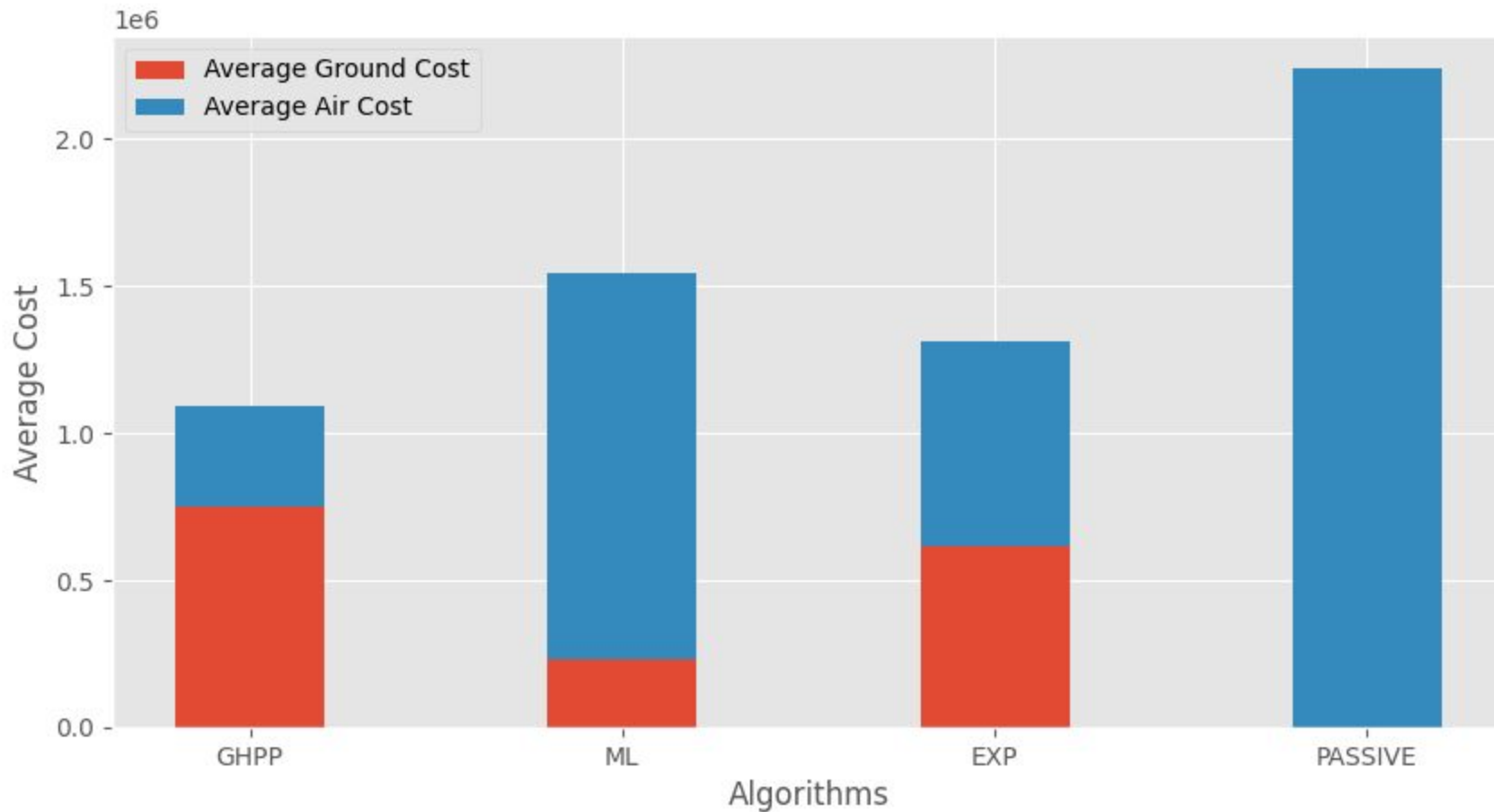
0.25 0.25 0.25 0.25



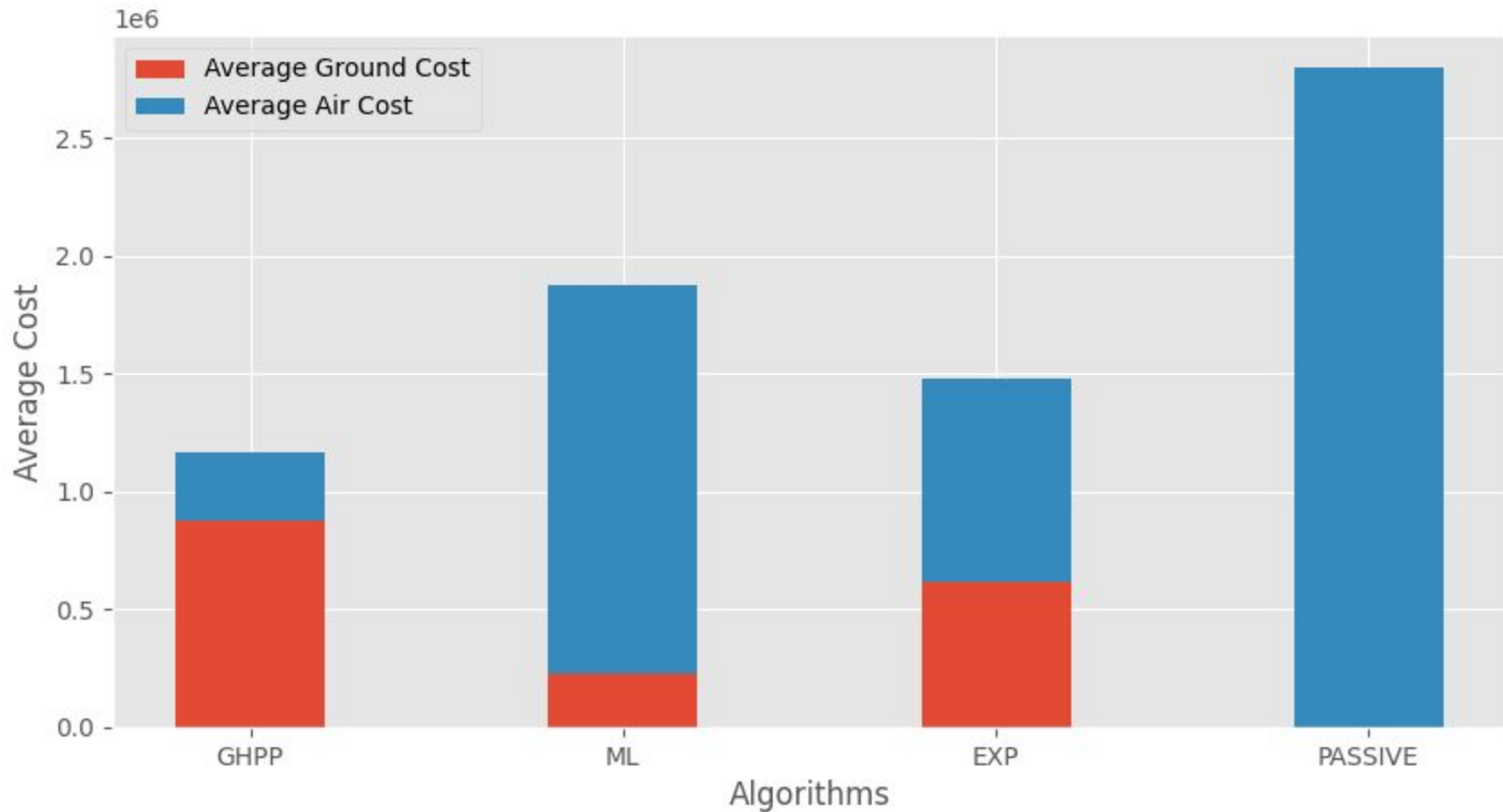
Effect of Cost : 500\$/period



Effect of Cost : 600\$/period



Effect of Cost : 750\$/period



Distribution of Ground Holding

Scenario 1

