



A Computational Study of Benders Decomposition for the Integrated Aircraft Routing and Crew Scheduling Problem

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Tactical Planning

Flight Scheduling



Fleet Assignment



Aircraft Routing



Crew Scheduling



Individual Monthly
Schedules

Tactical Planning

Flight Scheduling



Fleet Assignment



Aircraft Routing



Crew Scheduling

} short
connections



Individual Monthly
Schedules

Integrated Model

Benefits and Drawback

Benefits :

- Increased flexibility
- Lower costs

Drawback :

- Large size of model

| Instance | Legs | Constraints | Short Connections | SC in % of Constraints |
|----------|------|-------------|-------------------|------------------------|
| D95 | 196 | 519 | 89 | 17.15% |
| D9S | 523 | 1622 | 502 | 30.95% |
| MD80LA | 707 | 2647 | 1183 | 44.69% |

For the largest instance:

The integrated model contains almost 4 times the number of constraints of each of the individual problems.

Integrated Routing and Scheduling

Literature Review

Partial Integration

Klabjan et al. (2002)

Crew scheduling with plane count constraints and time windows

Total Integration

Cordeau et al. (2001)

Complete formulation solved by Benders decomposition

Cohn and Barnhart (2003)

Extended crew scheduling model with aircraft solutions as variables (unique and maximal maintenance feasible SC set)

Integrated Model

Robustness

- Upper bound on number of short connections used
 - Penalties on short connections
 - Penalties on restricted connections
- more linking constraints**

Integrated Model

Assumptions

- Daily problem
- Aircraft routing constraints
 - Number of aircraft
 - Maintenance (routine checks)
- Approximate crew costs
 - Waiting and deadhead costs
- Crew scheduling constraints
 - Duty:** Max on duty time, flight time, nb. of landings
 - Min on avg. duty time
 - Pairing:** Max on nb. of duties, nb. of days

Solution Methodology

3-phase Approach

PHASE I : Solve LP relaxation of integrated model with Benders Decomposition.

Reverse natural solution sequence:

Benders MP : Crew Scheduling

Benders SP : Aircraft Routing

Both solved by Column Generation

PHASE II : Introduce integrality constraints on MP variables and solve the resulting MIP by generating additional cuts.

PHASE III : Introduce integrality constraints on SP variables and solve SP with MP variables held fixed.

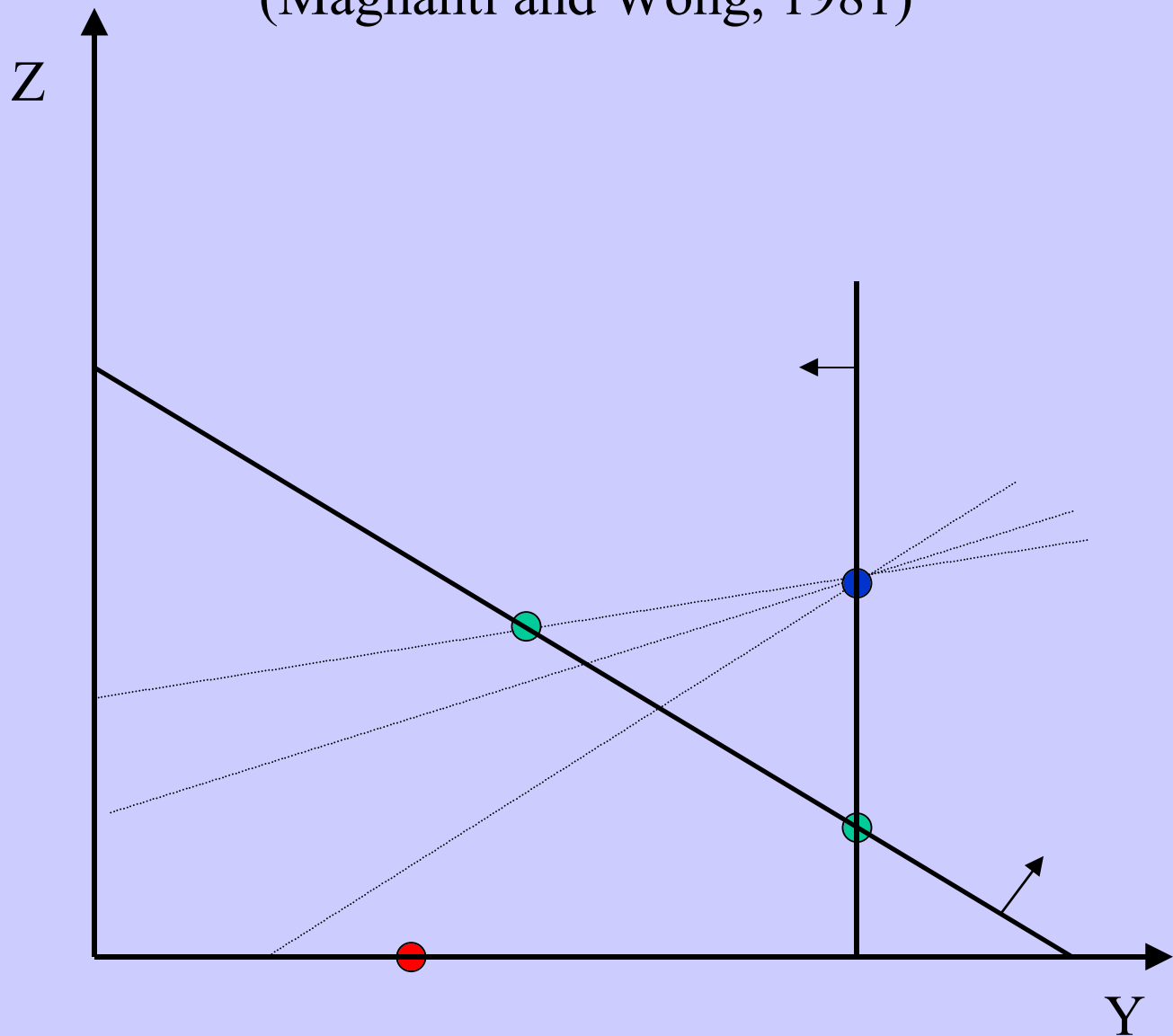
If infeasible: go back to phase II

An additional constraint is added to forbid the same set of SC to be chosen.

Solution Methodology

Strong Cuts

Pareto-Optimal Cuts
(Magnanti and Wong, 1981)



Solve an auxiliary SP at every iteration in
Phase I and II

Solution Methodology

Heuristic Branch-and-Bound

Branching is done mainly on CG MP variables :

- At each node of the tree, some variables having a value close to 1 are sequentially fixed to 1 and the resulting LPs are evaluated.
- The strategy is modified towards the end of the tree where complete enumeration is performed.

Variance in solution quality and CPU time decreases

Computational Experiments

Description of Data Sets

Daily fleet assignment solutions from two major airlines

| Instance | Number of Legs | Number of Aircraft | Number of Constraints |
|----------|----------------|--------------------|-----------------------|
| B767R | 151 | 38 | 579 |
| B757A | 184 | 60 | 564 |
| A320B | 258 | 80 | 877 |
| D9SA | 525 | 116 | 1893 |
| D9SB | 508 | 116 | 2217 |
| B767S | 510 | 130 | 2053 |
| MD80L | 707 | 143 | 3537 |

Computational Experiments

Summary of Results

Phase I Results

Robust Integrated Model

| 767SA 510 legs | Optimality Tolerance | MP Aircraft | MP Crew | % Change | MP Crew P.-O. Cuts | % Change |
|-------------------|-------------------------|-------------|---------|-------------|-----------------------|-------------|
| Cuts | 1% | 28 | 25 | -10.71% | 2 | -92.86% |
| CPU (min) | | 50.26 | 33.11 | -34.12% | 7.37 | -85.34% |
| Cuts | 0.1% | 286 | 165 | -42.31% | 3 | -98.95% |
| CPU (min) | | 498.31 | 165.98 | -66.69% | 11.14 | -97.76% |

Optimality Tolerance: Benders stopping criterion

% Change: MP Crew vs MP Aircraft

MP Crew P.-O. Cuts vs MP Aircraft

Computational Experiments

Summary of Results

3-Phase Results - Integrated Model

| | MP Aircraft | MP Crew P.-O. Cuts | % Change |
|------------------|-------------|-----------------------|-------------|
| B757A (184 legs) | | | |
| Gap | 1.34% | 1.29% | |
| Total CPU (min) | 15.41 | 6.28 | -59.25% |
| B767R (151 legs) | | | |
| Gap | 1.43% | 1.45% | |
| Total CPU (min) | 7.02 | 1.86 | -73.50% |
| A320B (258 legs) | | | |
| Gap | 1.73% | 1.81% | |
| Total CPU (min) | 99.12 | 50.18 | -49.37% |
| D9SA (525 legs) | | | |
| Gap | 0.05% | 0.00% | |
| Total CPU (min) | 78.22 | 20.63 | -73.63% |
| D9SB (508 legs) | | | |
| Gap | 0.87% | 0.87% | |
| Total CPU (min) | 530.80 | 54.45 | -89.74% |
| B767S (510 legs) | | | |
| Gap | 2.85% | 1.78% | |
| Total CPU (min) | 373.6 | 42.05 | -88.74% |
| MD80L (707 legs) | | | |
| Gap | 1.20% | 0.68% | |
| Total CPU (min) | 1171.97 | 81.55 | -93.04% |

Computational Experiments

Summary of Results

3-Phase Results - Robust Integrated Model

| | MP Aircraft | MP Crew P.-O. Cuts | % Change |
|------------------|-------------|-----------------------|-------------|
| B757A (184 legs) | | | |
| Gap | 1.73% | 1.49% | |
| Total CPU (min) | 44.03 | 4.76 | -89.19% |
| B767R (151 legs) | | | |
| Gap | 1.21% | 1.23% | |
| Total CPU (min) | 21.07 | 5.45 | -74.13% |
| A320B (258 legs) | | | |
| Gap | 1.72% | 1.89% | |
| Total CPU (min) | 557.19 | 7.95 | -98.57% |
| D9SA (525 legs) | | | |
| Gap | 0.18% | 0.18% | |
| Total CPU (min) | 222.15 | 44.99 | -79.75% |
| D9SB (508 legs) | | | |
| Gap | | 1.17% | |
| Total CPU (min) | + 30 hours | 110.17 | |
| B767S (510 legs) | | | |
| Gap | | 1.00% | |
| Total CPU (min) | + 30 hours | 52.07 | |
| MD80L (707 legs) | | | |
| Gap | | 1.53% | |
| Total CPU (min) | + 30 hours | 173.91 | |