

# A Delayed Column Generation Approach for Solving a Cargo Crew Scheduling Problem

Junhong Guo<sup>1</sup>, Theodore Endresen<sup>1</sup>, Amy Cohn<sup>1</sup>

<sup>1</sup>Industrial and Operations Engineering, University of Michigan, Ann Arbor, MI.

#### Introduction

Given a set of flights in the planning horizon for the goods delivery, the crew scheduling problem here is to generate a set of *crew pairings* and assign each of them to a crew to operate in practice, such that the flights scheduled in the planning horizon are covered as many as possible while no flight is covered by more than one crew.

A crew pairing is a sequence of flights, where rules categorized into the following three types must be respected:

- Basic "lows" of physics
- Regulatory policies
- Corporate policies

To achieve higher flight coverage, we consider allowing a "break" to take place in the "middle" of the crew pairing, where the crew will fly commercially home to have a short vacation. However, this relaxation to the basic "laws" of physics prevents us from solving our problem in a direct manner, as tons of valid crew pairing will exist (Table 1).

- 1. Enumerating all valid crew pairings takes a great amount of time.
- 2. The math programming becomes too large to be solved explicitly.

Table 1: General information of three real-world datasets

Dataset	#Flights	#Arcs	#Valid Pairings	Enum. Time
No.1	606	123,612	142,777,637	3day 02hr
No.2	541	97,716	79,648,029	1day 21hr
No.3	644	134,907	133,208,846	3day 02hr

min 
$$\sum_{p \in P} -n_p \cdot x_p$$
  
s.t.  $\sum_{p \in P} a_{f,p} \cdot x_p \leq 1 \quad \forall f \in F$   
 $x_p \in \{0,1\} \quad \forall p \in P$ 

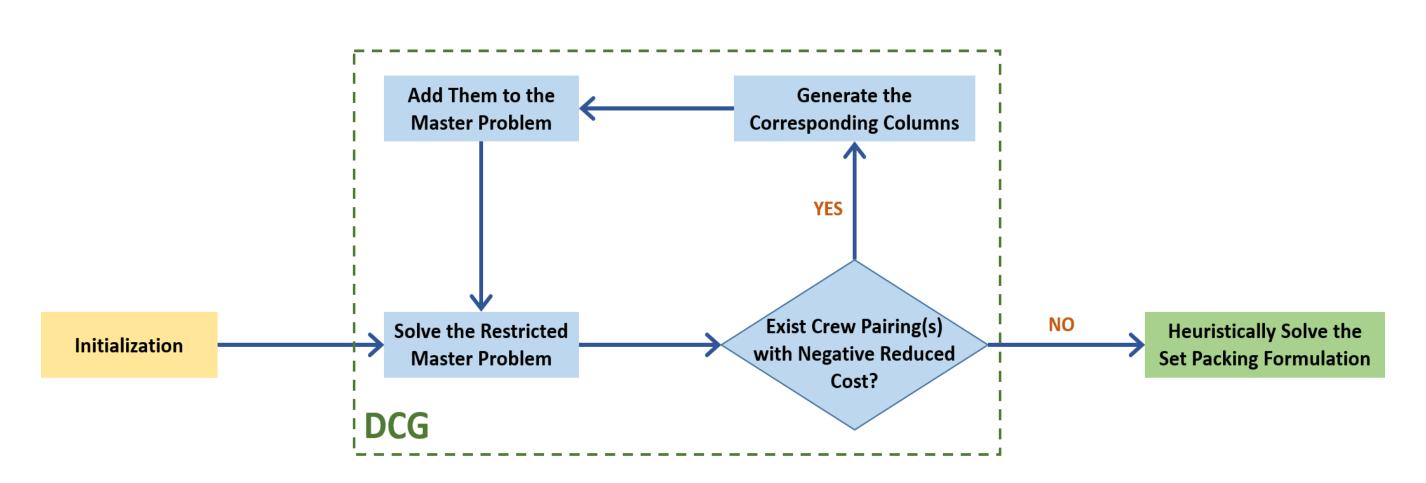
Figure 1: The math programming, a set packing formulation, for our problem

## Objectives

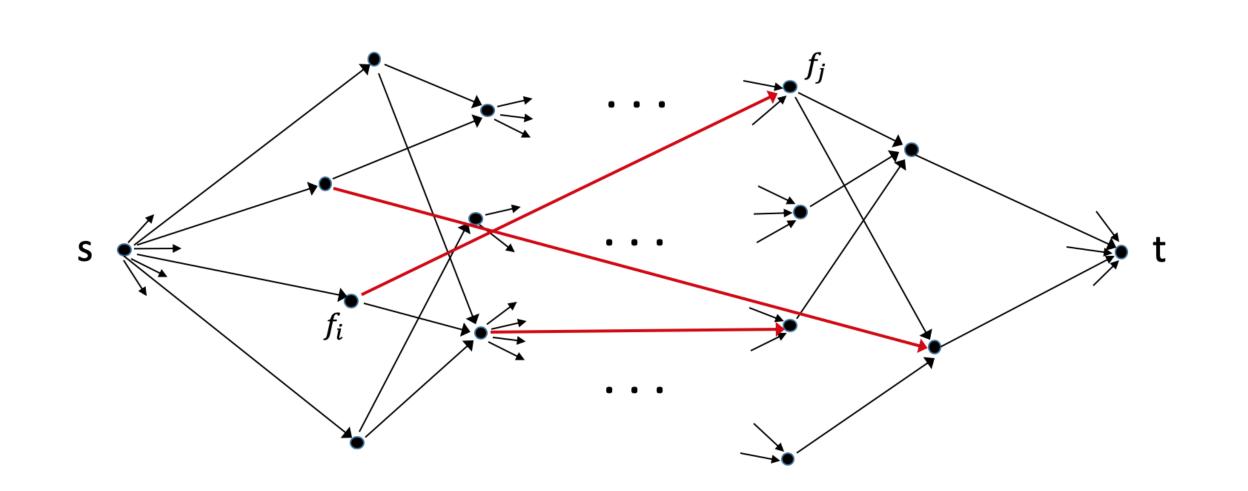
- 1. Evaluate whether incorporating the break feature into the pairing generation can improve the flight coverage to a desirable rate.
- 2. Develop efficient frameworks and approaches for solving the relaxed problem with the break feature incorporated.

#### **Solution Framework**

- 1. Solve the LP-relaxation of the set packing formation (Figure 1) to optimality via a delayed column generation (DCG) approach.
- 2. Heuristically solve the original integrality-constrained formulation with pairings limited to those generated during the previous step.

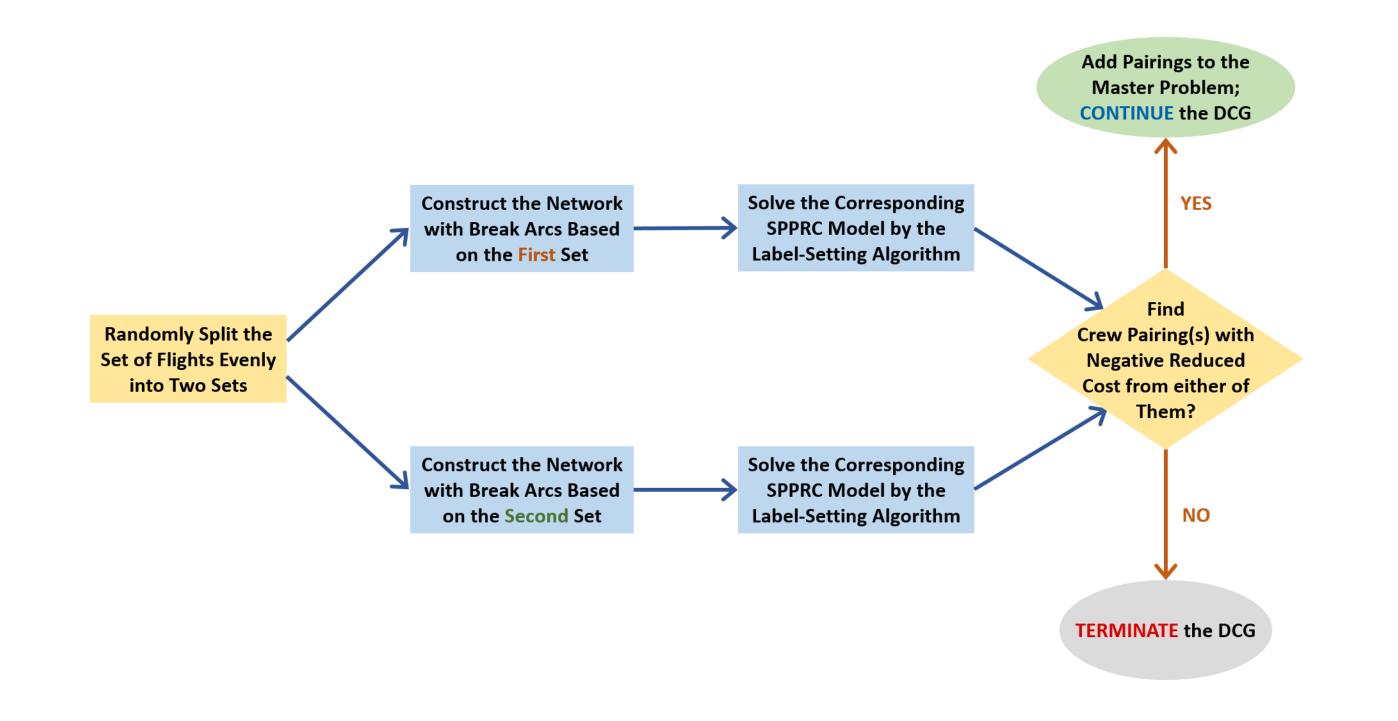


The pricing problem of the DCG is modeled as a shortest path problem with resource constraints (SPPRC) on a flight-based network.

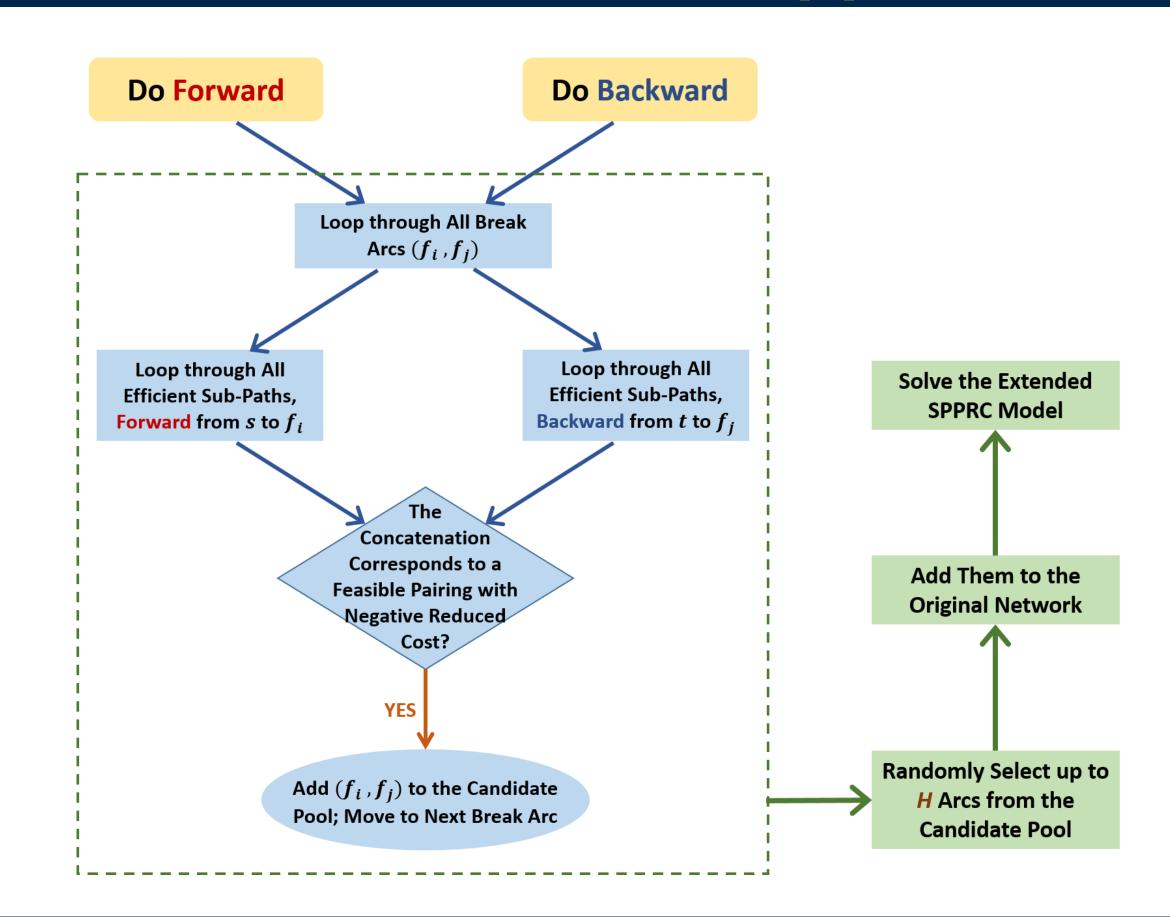


Solving the SPPRC model completely, by a label-setting algorithm even with a handful speed-up improvements, will take a long time.

### A Flight Partitioning Heuristic



### An Arc Selection Exact Approach



#### Results and Conclusions

#### The Flight Partitioning Heuristic

Dataset	LP-obj	#Itr.	LP Time	#Pairings Gen.
No.1	551.53 (0.70)	129.5 (4.5)	4.0hr (0.00)	61,600 (4,809)
No.2	475.28 (4.13)	133.2 (29.5)	1.7hr (0.37)	46,363 (4,393)
No.3	569.37 (2.71)	132.4 (22.1)		58,888 (3,425)

Dataset	IP-obj	IP Time	B&C Gap (%)	Coverage (%)
No.1	494.20 (4.64)	2hr (0)	10.89 (1.07)	81.55 (0.77)
No.2	426.90 (5.96)	2hr (0)	9.93 (1.21)	78.91 (1.10)
No.3	510.30 (6.83)	2hr (0)	10.85 (1.12)	79.24 (1.06)

#### The Arc Selection Exact Approach

	Dataset	LP-obj	#Itr.	LP Time	#Pairings Gen.
	No.1	563.29	41	2hr 09min	79,730
	No.2	492.10	35	1hr 14min	58,448
	No.3	584.42	37	1hr 57min	85,050
D	ataset	IP-ohi IF	P Time	B&C Gan (%)	Coverage (%)

Dataset	IP-obj	IP Time	B&C Gap (%)	Coverage (%)
No.1	521	2hr	7.81	85.97
No.2	454	2hr	7.89	83.92
No.3	551	2hr	5.72	85.56

#### Acknowledgement

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