



# Robust Scheduling and Flight Delays

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# Outline

- Aircraft and passenger delays
- Delay propagation
  - Role of aircraft rotations
  - Role of flight schedules
- Optimization models to minimize delay propagation and its impact on passengers

# DOT On-Time Performance Metric

- Sources of passenger delays
  - Cancellations
  - Missed connections
  - Delayed flight
- DOT 15-minute on-time performance metric
  - Does not include passenger delays resulting from cancellations or from missed connections
  - An inadequate measure of passenger delays

# Comparison of Passenger and Flight Delays

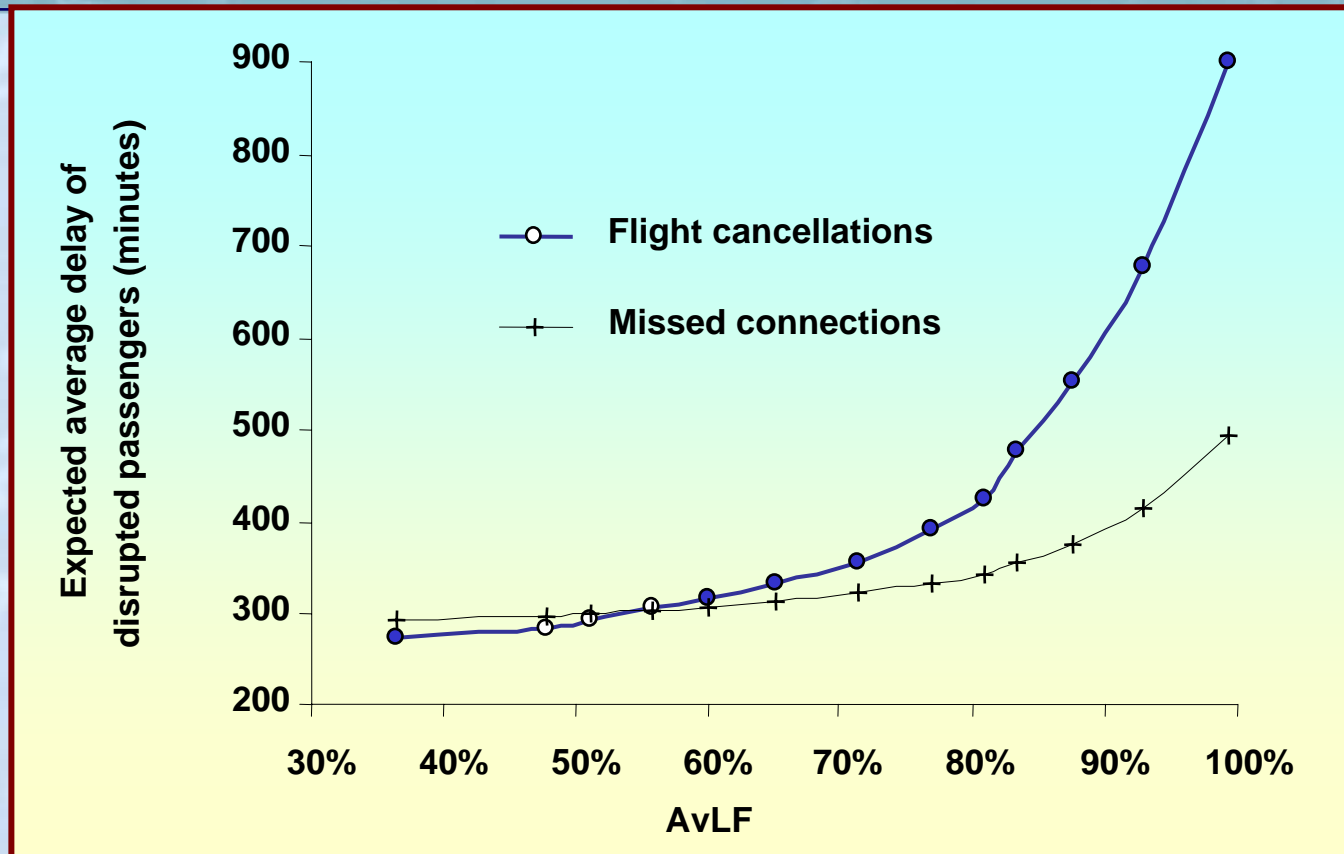
	Average delay (minutes)
Passengers	25.6
Flights	15.4
Ratio	166%

Passenger	Average delay	% Passengers	% Total passenger delays
Disrupted	303 minutes	3.2%	39%
Non-disrupted	16 minutes	96.8%	61%

Passenger	Average delay	% disrupted passengers	% of disrupted passenger delays
Same day (SD)	185 minutes	78%	48%
Overnight (OV)	721 minutes	22%	52%

# The Effect of Load Factor on Passenger Delay



Passengers, disrupted because of a flight cancellation, become increasingly more difficult to re-accommodate as load factors increase

# What Can Be Done?

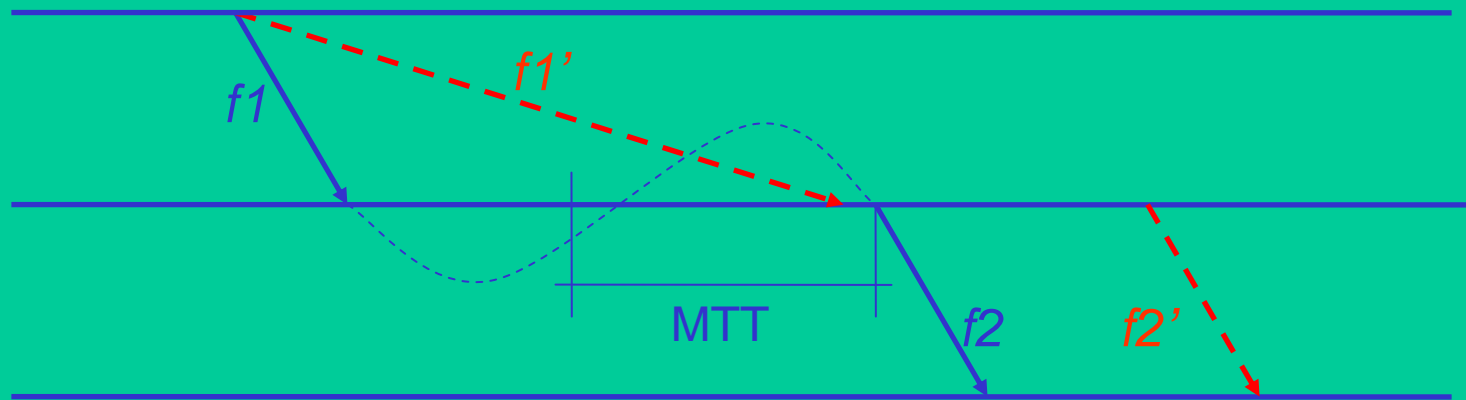
- Many things...
- One approach: create schedules less impacted by and/ or easier to recover from disruptions
  - Robust aircraft routing and scheduling
    - Reduce the propagation of delays by re-designing aircraft routings
    - Reduce the number of passenger misconnections by adjusting departure times so that passenger connection times are correlated with the likelihood of a missed connection (disruption)
      - Add connection slack where it is need most

# Robust Aircraft Routing and Scheduling

- Objective
  - Reduce the propagation of delays by re-designing aircraft routings
- Solution Approach
  - Formulate and solve maintenance routing model that minimizes the expected propagation of delays subject to maintenance feasibility

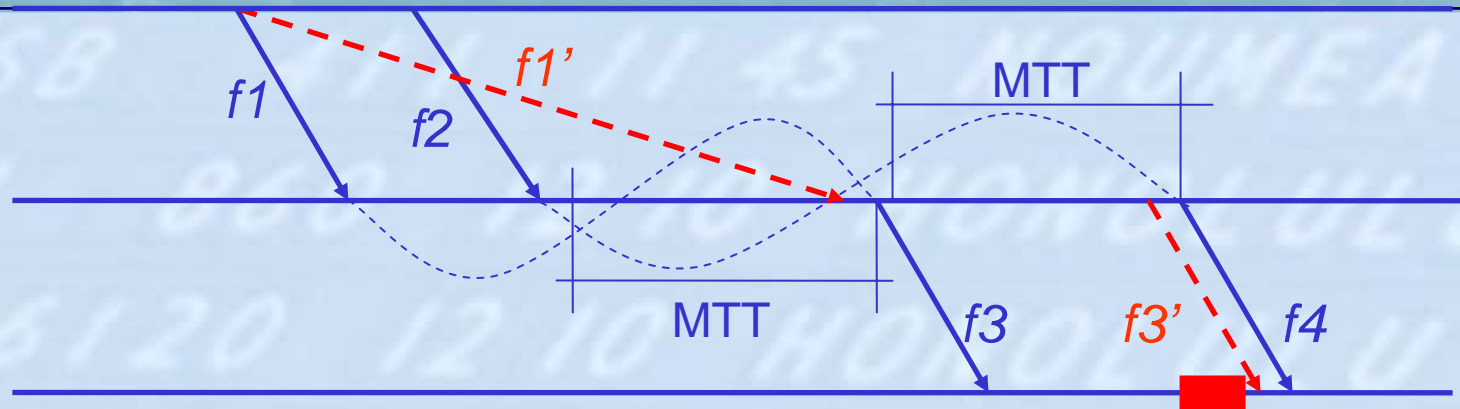
# Delay Propagation

- Arrival delay might cause departure delay for the next flight leg that is using the same aircraft if there is not enough slack between consecutive flight legs
- Delay propagation might cause downstream schedule, passenger and crew disruptions (especially at hubs)

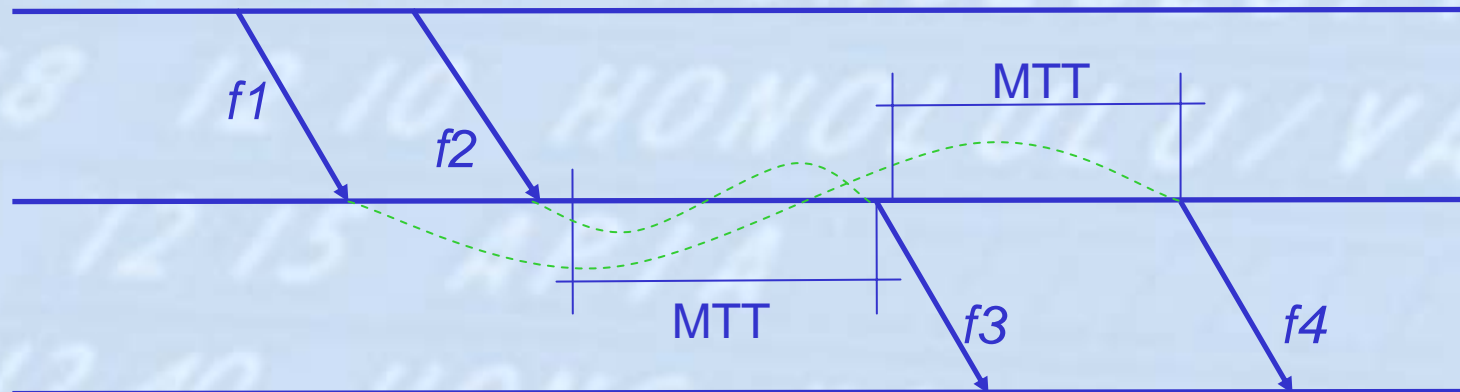




# Dampening Delay Propagation through Routing



Original routing



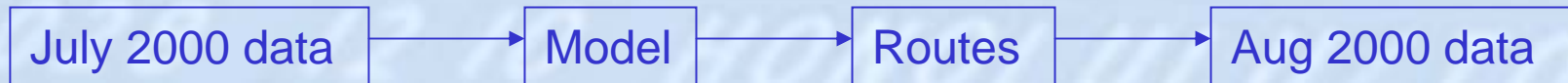
New routing

# Computational Results

## Test Networks

Network	Num of flights	Num of strings
N1	20	7,909,144
N2	59	614,240
N3	97	6,354,384
N4	102	51,730,736

### □ Model Building and Validation



### □ Propagated delays (August 2000)

Network	Old PD	New PD	PD reduced	% of PD reduced
N1	6749	4923	1826	27%
N2	4106	2548	1558	38%
N3	8919	4113	4806	54%
N4	14526	9921	6940	48%
Total	34300	21505	15130	44%

# Results - Delays

## Total delays and on-time performance

	Total delay			on-time performance		
	> 15 min	> 60 min	> 120 min	15 min	60 min	120 min
Old	22.3%	7.9%	2.9%	77.7%	92.1%	97.1%
New	20.7%	6.9%	2.6%	79.3%	93.1%	97.4%

## Passenger misconnects

Network	Total num of D-pax	D-pax reduces	D-pax reduced (%)
N1	986	147	14.9%
N2	1070	79	7.4%
N3	1463	161	11.0%
N4	3323	355	10.7%
Total	6842	742	10.8%

# Flight Schedule Re-Timing

- **Objective**

- Reduce the number of passenger misconnections by adjusting departure times so that passenger connection times are correlated with the likelihood of a missed connection (disruption)
  - Add connection slack where it is need most

- **Solution Approach**

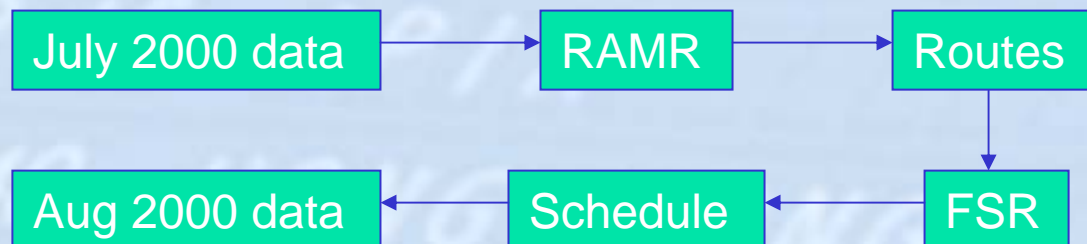
- Derive distributions from historical data for number of passengers disrupted for each connection
- Formulate and solve re-timing model that minimizes the number of disrupted passengers

# Computational Results

- **Network**

- We use the same four networks, but add all flights together and form one network with total 278 flights.

- **Model Building and Validation**



# Computational Results

- **Estimated reduction (30 minutes MCT) in total passenger delays:**
  - 20% (30 minute time window)
  - 16% (20 minute time window)
  - 10% (10 minute time window)

Time window	Tot num of D-pax	Output	D-pax reduced	Improve (%)
±15min(7 copies)	17,459	10,899	6,560 (37.6%)	
±15min(31 copies)	17,459	10,865	6,594 (37.8%)	0.52%
±10min(5 copies)	17,459	12,070	5,389 (30.9%)	
±10min(21 copies)	17,459	12,056	5,403 (30.9%)	0.26%
±5min(3 copies)	17,459	14,069	3,390 (19.4%)	
±5min(11 copies)	17,459	14,058	3,401 (19.5%)	0.28%

# Conclusions

- Robustness considerations-
  - Same optimization techniques, new models and objectives, potentially significant impacts without increased planned costs
- Much more that can be done with robustness modeling and optimization, in many areas of schedule planning and recovery