

Integrated Traffic Flow Based Optimization of Airport and Terminal Area

9th SESAR Innovation Days



Ying HUO

Daniel DELAHAYE, Ji MA, Mohammed SBIHI

ENAC – Université de Toulouse
Toulouse France

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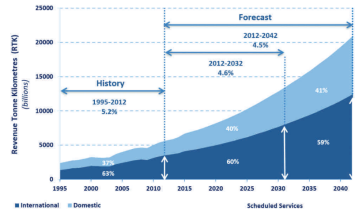
1. Background and problem description
2. Problem modeling
3. Solution approach
4. Results
5. Conclusion and perspective

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Air traffic evolution

- ✈ A continuous growth of the air traffic:
- ▶ Annual growth rate: 4.5%.
- ▶ Will be doubled in the following 15 years.



- ✈ Airport and TMA (Terminal Manoeuvring Area) Congestion.
- ▶ Safety issues.
- ▶ Operating costs.

Integrated research



✈ Arrival Management Problem

- ▶ Landing sequencing
- ▶ Mitigate congestion and conflicts resolution workload



✈ Surface Management Problem

- ▶ Arriving aircraft taxi-in routes



✈ Departure Management Problem

- ▶ Take-off times and sequences for departing flights

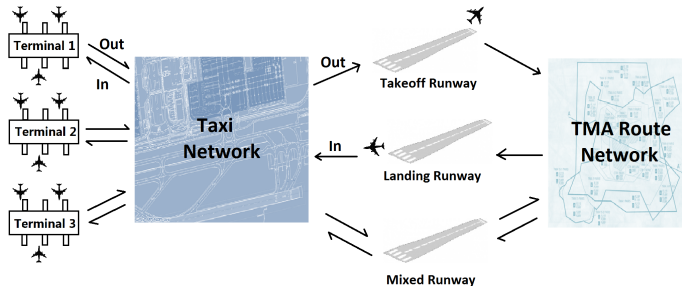
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Integrated optimization of TMA and airport

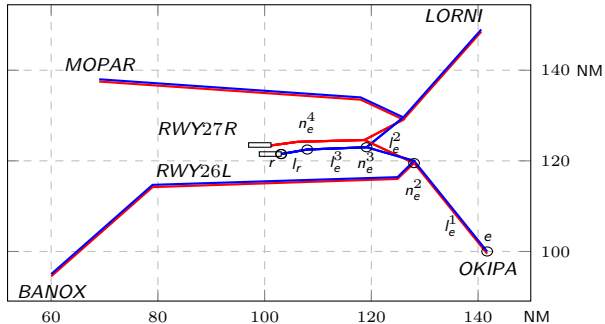
✈ Network abstraction:

- ▶ Airside: runways, taxiway network and terminals
- ▶ TMA: nodes and links



Network abstraction in TMA

Paris-CDG airport route network for arrivals: $\text{Graph}(\mathcal{N}, \mathcal{L})$.



Given data for optimization

Given a flight $f \in \mathcal{F}$, the flight can be operated with three operations.

Information	Arrival	Departure	Connected flight
Wake turbulence category C_f	✓	✓	✓
Assigned terminal number M_f	✓	✓	✓
Entry node E_f	✓		✓
TMA entry time T_f^o	✓		✓
TMA entry speed V_f^o	✓		✓
Arrival runway R_f^a	✓		✓
Departure runway R_f^d		✓	✓
Scheduled off-block time T_f^d		✓	✓
Turn around time t_f^{ad}			✓

Decision Variables

- ▶ TMA entry time t_f :

$$t_f = T_f^o + j\Delta T, \quad j \in [\Delta T_{min}/\Delta T, \Delta T_{max}/\Delta T], \quad j \in \mathbb{Z}$$

- ▶ TMA entry speed v_f :

$$v_f = V_f^{min} + j\Delta_f^v, \quad j \in [0, (V_f^{max} - V_f^{min})/\Delta_f^v], \quad j \in \mathbb{N}$$

- ▶ Arrival runway r_f^a .

- ▶ Pushback delay p_f :

$$p_f = \{P_f^o + j\Delta T\}, \quad j \in [0, \Delta T_{max}^p/\Delta T], \quad j \in \mathbb{N}$$

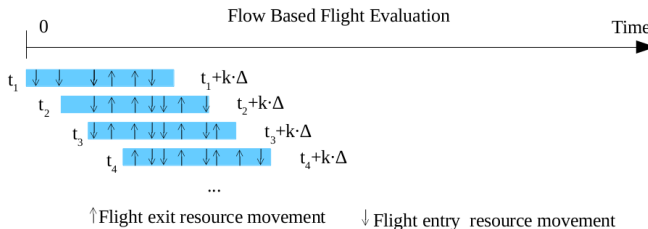
$$\mathbf{x}_f = (t_f, v_f, r_f^a, p_f)$$

Traffic flow-based model

We measure the **evaluation values distribution** of each resource.

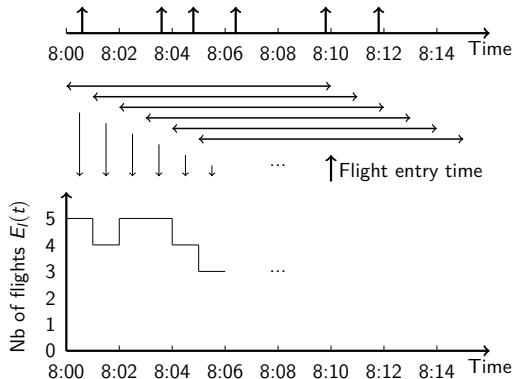
Evaluation parameters:

- ▶ Time step/unit: Δ (1 min).
- ▶ Evaluation time parameter: k .
- ▶ Evaluation time interval: $L = k \cdot \Delta$.
- ▶ Evaluation start time t , $t_i = t_{i-1} + \Delta$.



Link evaluation and runway evaluation

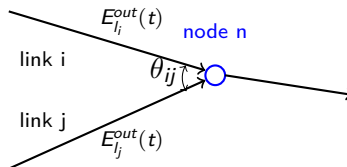
We evaluate the **number of flights** that enters a link/runway during evaluation time interval t to $t + L$.



- ▶ $k=10$.
- ▶ $L=10$ mins.

Node evaluation

We estimate the **conflicts resolution workload**.



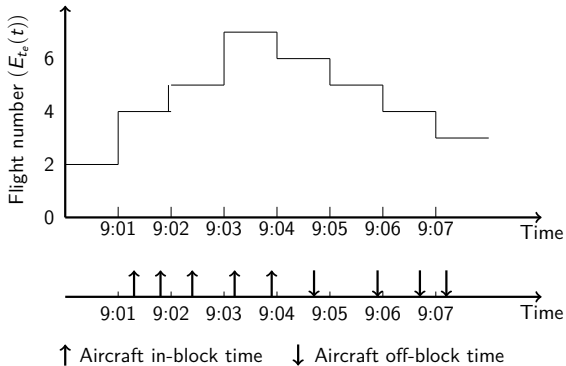
- ▶ N_s : standard separation requirement of flights.
- ▶ $E_l^{out}(t)$: number of flights that exits link l during t to $t + L$.

$$E_n(t) = \frac{2N_s \sqrt{v_{l_i}^2 - 2v_{l_i}v_{l_j} \cos \theta_{ij} + v_{l_j}^2}}{v_{l_i}v_{l_j} \sin \theta_{ij}} \cdot E_{l_i}^{out}(t) E_{l_j}^{out}(t) \quad n \in \mathcal{N}$$

Airside evaluation

We evaluate the **number of flights** at each time interval.

- ▶ $k=1$.
- ▶ $L= 1\text{min}$.



Capacities constraints

► Link capacity:

$$C_l = \frac{M \cdot v_l}{K}$$

- M: link separation 1 flight/ 5NM.
- K= 1 hour/ L: time scale.
- v_l : average speed on link l .

► Node capacity: $C_n = 6$ conflicts resolutions / hour.

► Airside capacity.

Landing Runway	Departure Runway	Terminal 1	Terminal 2	Terminal 3	Taxiway
30/h	40/h	20	130	25	19



Objective function

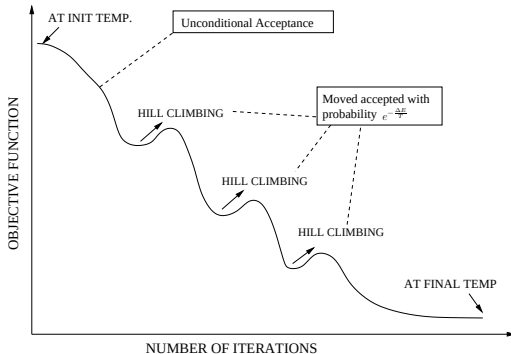
- ▶ First metric: **average congestion** during time horizon T .
- ▶ Second metric: the **maximum overload** during time horizon T .

$$G(\mathbf{x}) = \sum_{s \in \mathcal{S}} \gamma_s \left[\frac{1}{T} \sum_{t \in T} [\max(E_s(t) - C_s, 0) \cdot \Delta] \right] \\ + \sum_{s \in \mathcal{S}} \gamma_s \left[\max_{t \in T} [\max(E_s(t) - C_s, 0)] \right]$$

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Simulated annealing



- ▶ Temperature
- ▶ Objective function
- ▶ Neighborhood
- ▶ Stopping criterion

Neighborhood solution selection

	Airspace performance	Ground performance	Total performance	
f_1	a_1	g_1	m_1	
f_2	a_2	g_2	m_2	$p_a^f = a_f / m_f$
...	...	...	...	$p_g^f = g_f / m_f$
f_N	a_N	g_N	m_N	

- We choose a random number $n \in [0, 1]$ for the decision variable choosing:

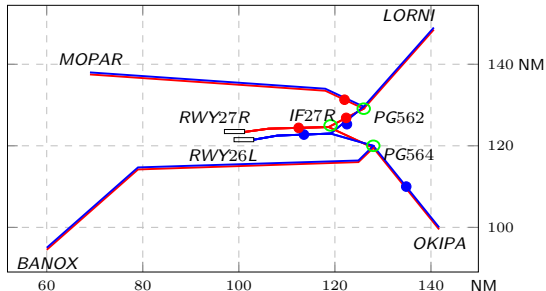
$f \in \mathcal{A}$		$f \in \mathcal{AD}$		$f \in \mathcal{D}$
$n < p_a^f$	$n > p_a^f$	$n < p_a^f$	$n > p_a^f$	—
t_f, v_f	t_f, v_f, r_f^a	t_f, v_f	t_f, v_f, r_f^a, p_f	p_f

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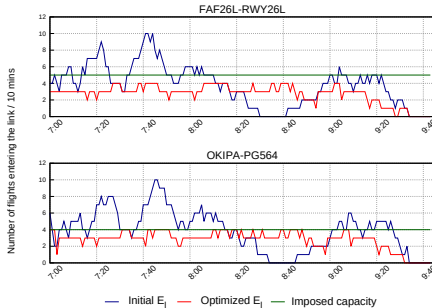
Case study

- ▶ Paris-CDG airport, real data of 18th February 2016 from 7:00 AM to 9:40 AM.
- ▶ Heavy and medium flights with a mix ratio of 23% : 77%.

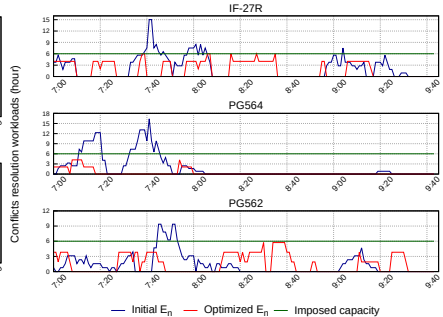


Link and node optimization results

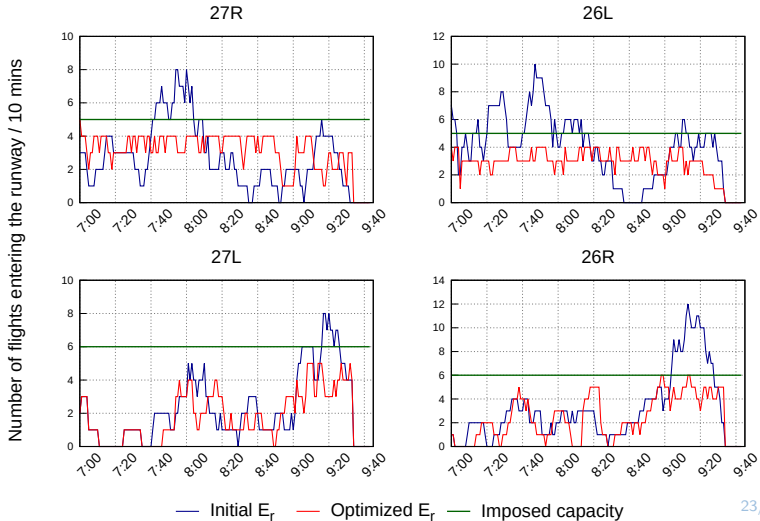
Link optimization results



Node optimization results

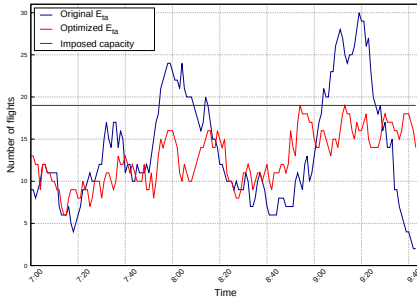


Runway optimization results

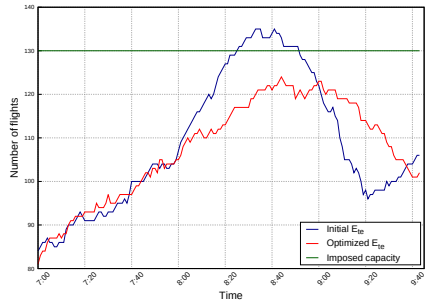


Terminal and taxiway occupancy

Taxiway



Terminal 2



Robustness test

- ▶ Reference case: flight by flight conflicts evaluation.
- ▶ Perturbations are implemented on TMA entry time.
- ▶ Average values of objective and sub-objectives of each model.

	Traffic flow-based model			Flight by flight conflict evaluation model		
	Perturbations			Perturbations		
Average congestion conflicts	$\pm 0.5\text{min}$	$\pm 1\text{min}$	$\pm 2\text{mins}$	$\pm 0.5\text{min}$	$\pm 1\text{min}$	$\pm 2\text{min}$
Node	6.585	10.1	16.56	21.07	44.882	78.37
Link	0.474	0.963	1.62	4.94	43.975	144.55
Runway	0	0.064	0.47	14.998	31.05	52.86
Taxiway	0	0.00134	0.033	0.519	0.596	0.835
Terminal	0	0	0	0	0	0
Sum	7.06	11.136	18.69	41.54	120.5	276.6



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Conclusions

An optimization approach to solve the integrated management problem of airport and terminal area on macroscopic level.

- ▶ Network abstraction.
- ▶ Traffic flow-based model.
- ▶ Adapted simulated annealing algorithm.

Mitigating the network congestion as well as the potential conflicts resolution workload in TMA.



Perspectives

- ▶ Test more scenarios with the proposed model.
- ▶ Extend the approach to multiple airports.



Thank you for your attention!

