



# OptiFrame for Trajectory Based Operations (TBO) Decisions Support

OptiFrame Consortium



Brussels, 14<sup>th</sup> February 2018



Founding Members



# Objectives of this presentation



Demonstrate the OptiFrame's decision support capabilities

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1. The nature of the OptiFrame solutions
2. Description of test instances
3. Exact versus heuristic solutions
4. Using OptiFrame for Decisions Support

# The nature of the OptiFrame solutions

# The nature of the OptiFrame solutions (1/3)

An OptiFrame **solution** provides a 4D trajectory for each flight:

- a trajectory in 3D space,
- the departure time.

Each solution achieves specific values of the three objective functions (delay, flight efficiency, route charges).

In the presence of a trade-off between objectives, there are multiple **efficient solutions**.

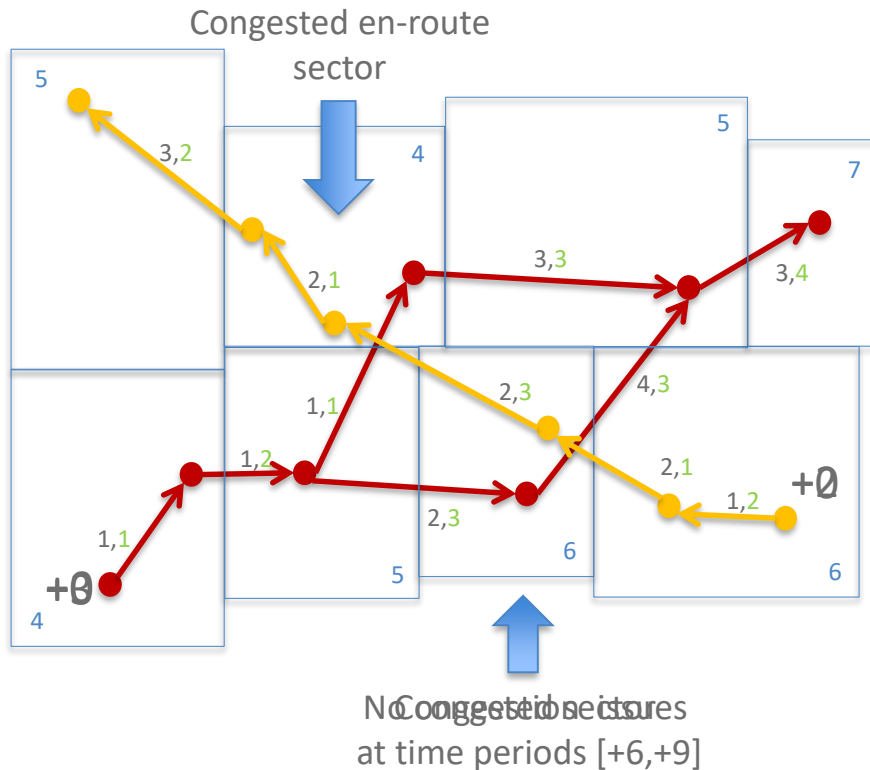
## **Non-dominated (efficient) solution:**

solution that is not outperformed by any other solution in terms of all objectives

# The nature of the OptiFrame ... (2/3)



OptiFrame

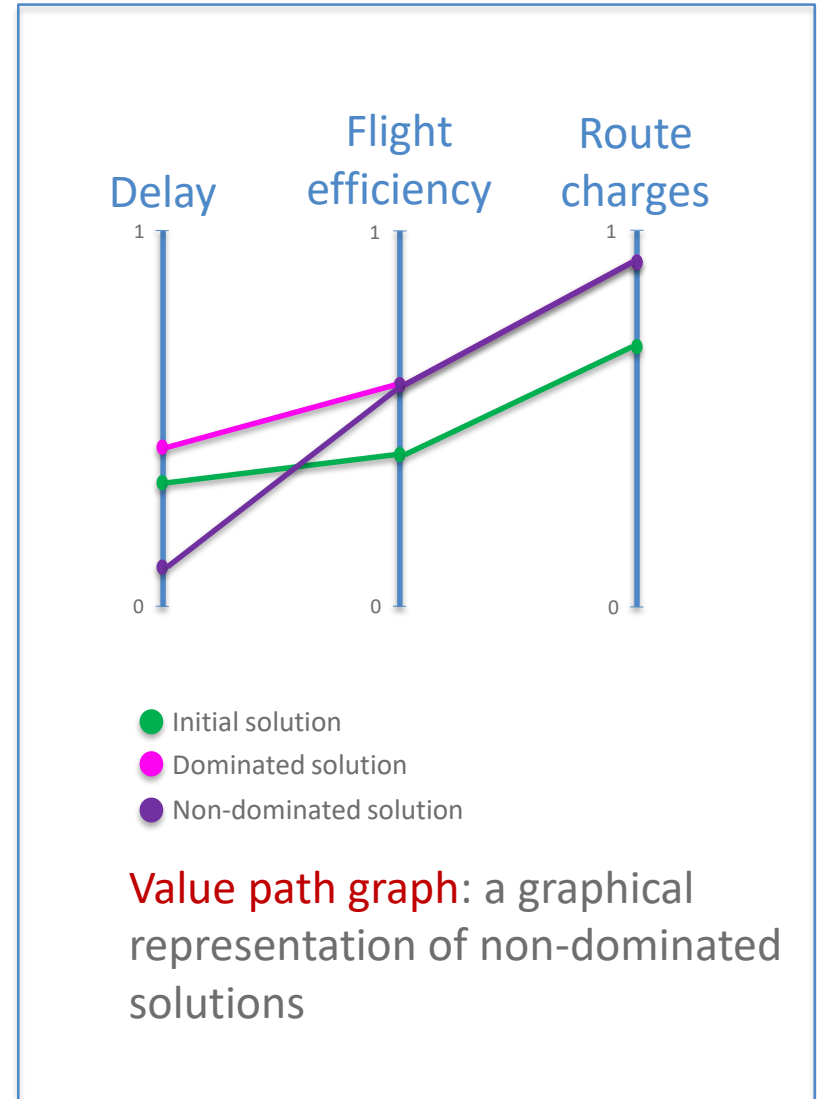


$\Delta$  Delay = +0

$\Delta$  Efficiency = +0

$\Delta$  Route charges = +0 ✓

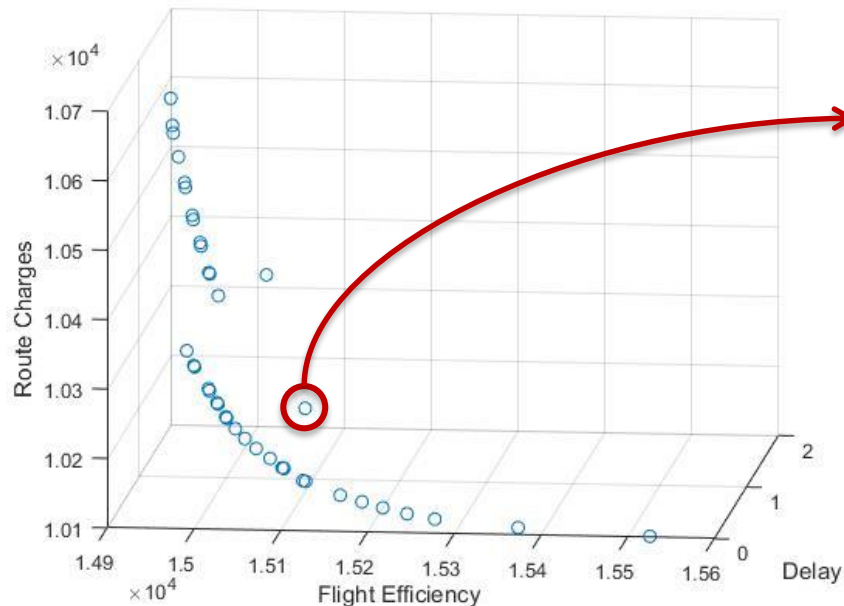
$n, m$  = cost, time to travel through arc  
 $h$  = contribution to route charges



# The nature of the OptiFrame solutions (3/3)

Pareto Frontier: the collection of all non-dominated solutions.

Each point in the 3D plot – identified by total delay, total flight efficiency, total route charges for all flights – is a non-dominated solution.



Each solution assigns a 4D trajectory to each flight.

Once a solution is selected, all flights' trajectories are identified

# Description of the test instances



# Description of test instances (1/2)



## Data extracted from DDR2 database :

- Choice of a busy day (3<sup>rd</sup> October 2016)
- two major airports:
  - EGLL & EDDF
- **10 flights** operated at peak hours (9am - 3pm)
- **21 sectors**
- **269** relevant waypoints
- **2** airlines
- **Sectors and airports capacity** profiles over time horizon
- four major airports:
  - EGLL, LFCG, EHAM, EDDF
- **186 flights** operated during the whole day
- **60 sectors**
- **694** relevant waypoints
- **6** airlines

# Description of test instances (1/2)



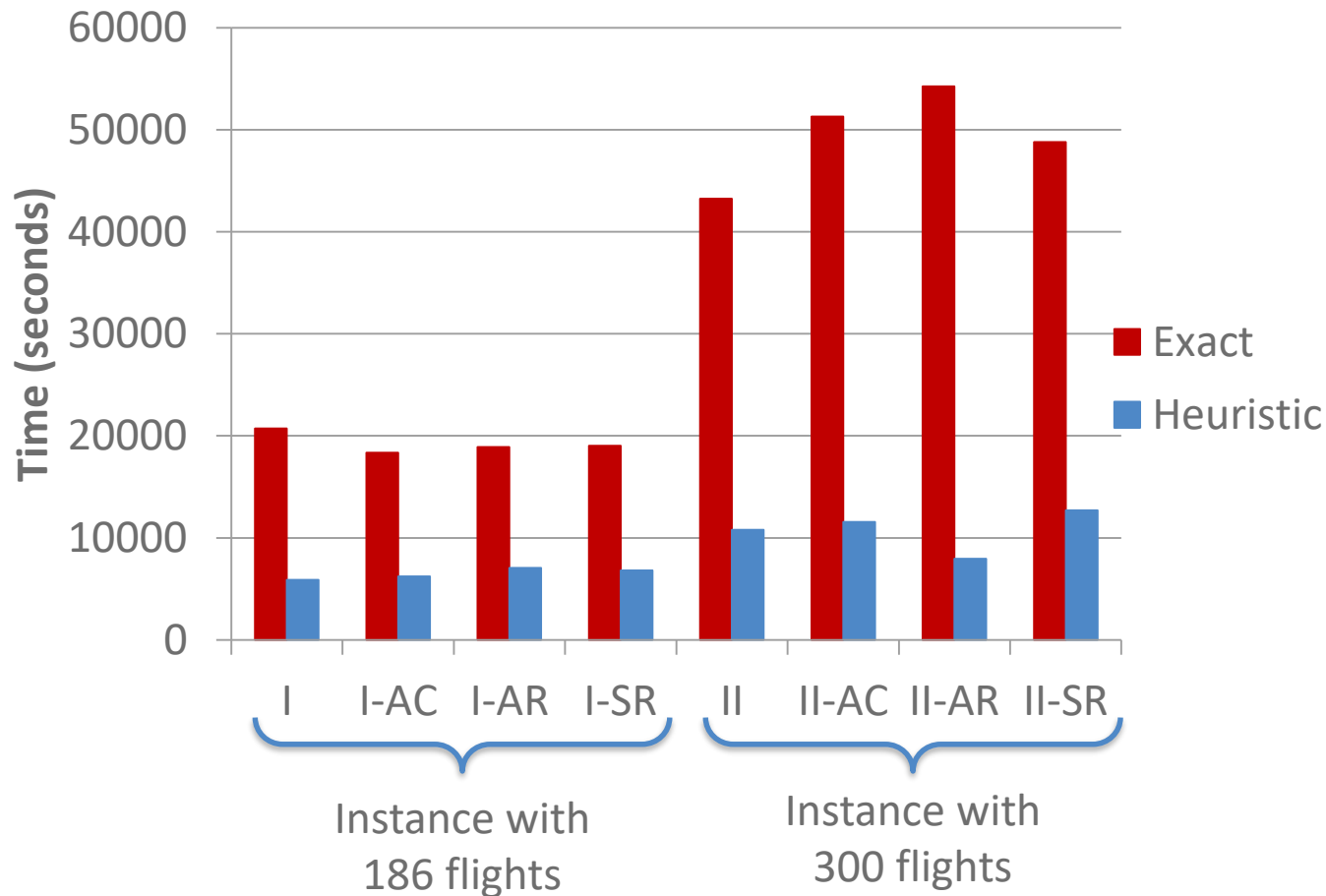
Realistic instances: built on the basis of real data.

- 4 airports
- 694 waypoints
- 60 sectors
- 24 hours time horizon (10 minutes intervals)
  
- Instance I: 186 flights
- Instance II: 300 flights (~ +50%)

# Exact versus heuristic solutions

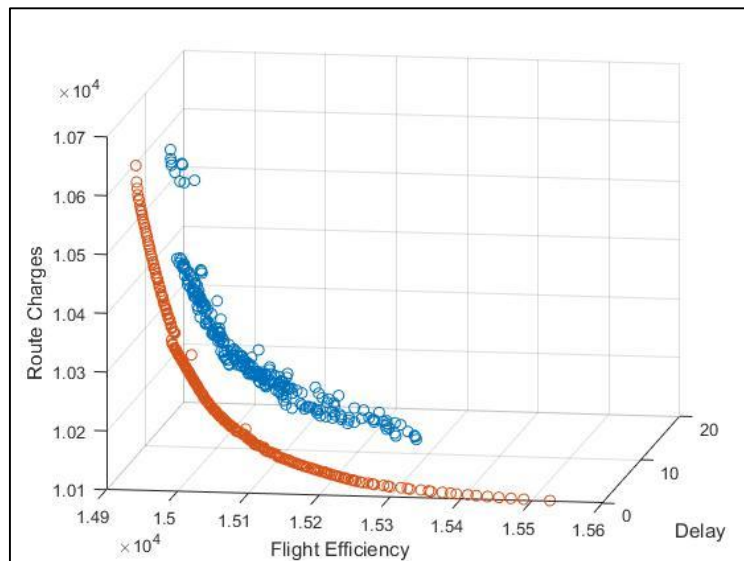
# Exact vs heuristic solutions (1/3)

Comparison of computational times



# Exact vs heuristic solutions (2/3)

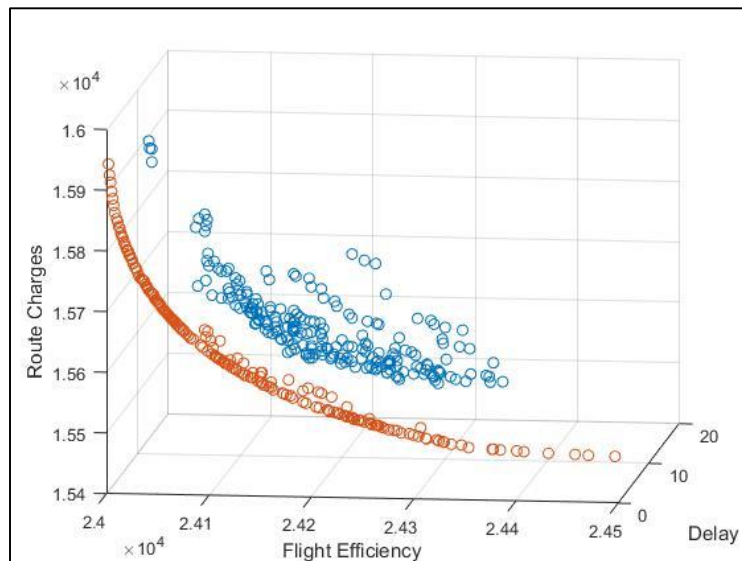
## Comparison of quality of solutions



- Instance with 186 flights
- 4 airports
- 232 exact solutions
- 257 heuristic solutions
- Good coverage of the frontier (in terms of spread)
- Fairly close to the exact solutions values
- Consistent number of solutions with Pareto Frontier

# Exact vs heuristic solutions (3/3)

## Comparison of quality of solutions



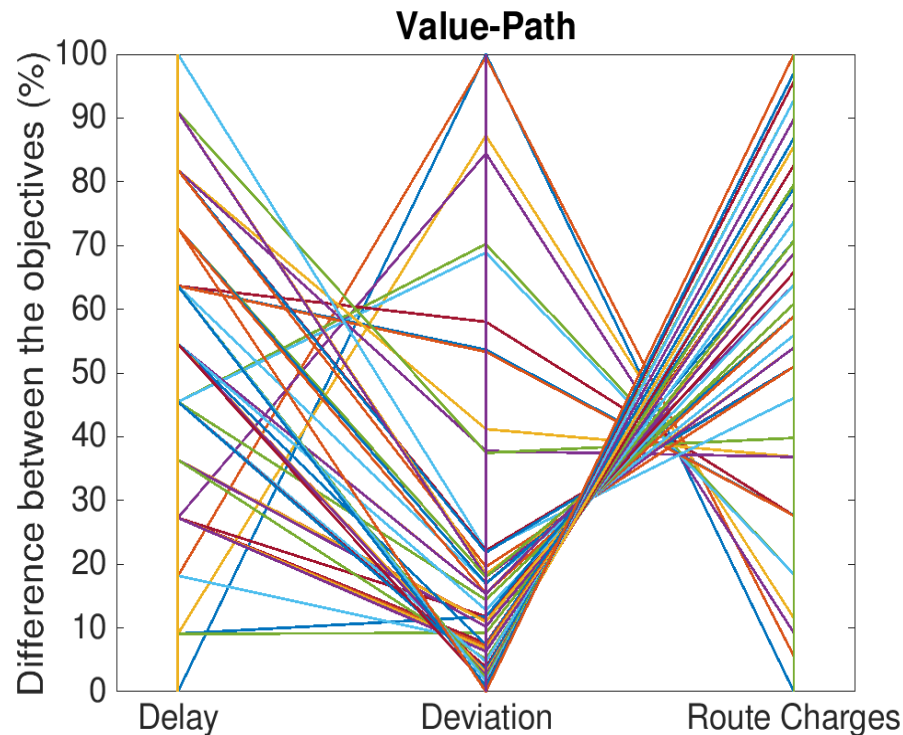
- Instance with 300 flights
- 4 airports
- 185 exact solutions
- 216 solutions
- Good coverage of the frontier (in terms of spread)
- Fairly close to the exact solutions values
- Consistent number of solutions with Pareto Frontier

# Using OptiFrame for Decisions Support

# OptiFrame for decisions support (1/17)

## Results for EGLL and EDDF instance

- 56 efficient solutions



- (Min, Max) Delay: (0, 11)
- (Min, Max) Deviation: (4620, 10764)
- (Min, Max) Route Charges: (800, 1126)



# OptiFrame for decisions support (2/17)

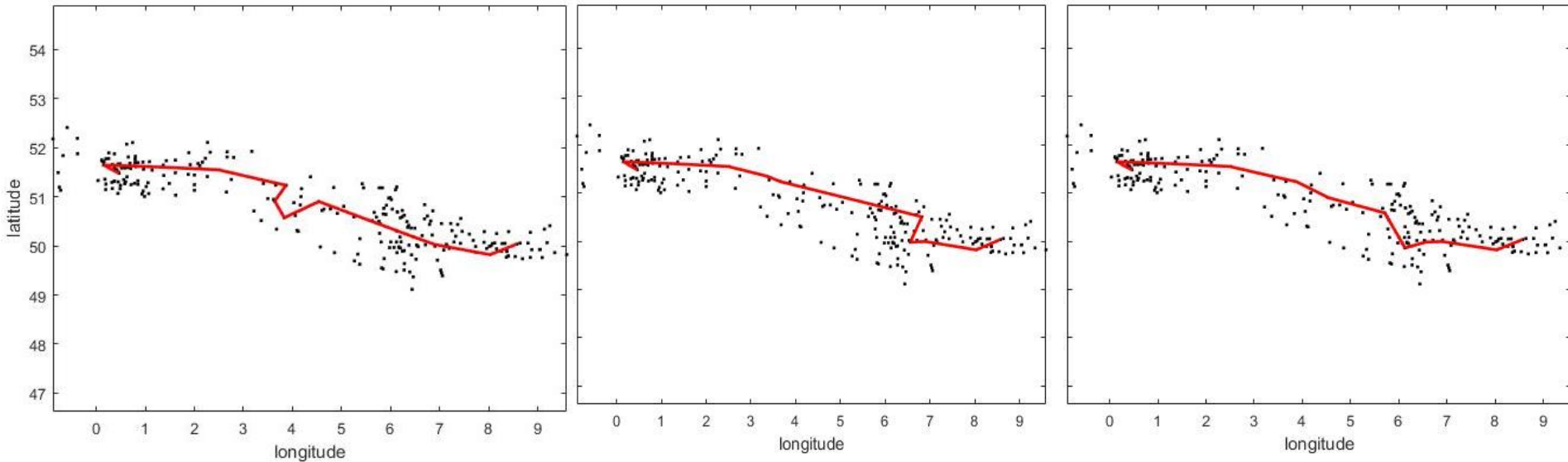


## Trajectories for a flight

Trajectory A: 5/56

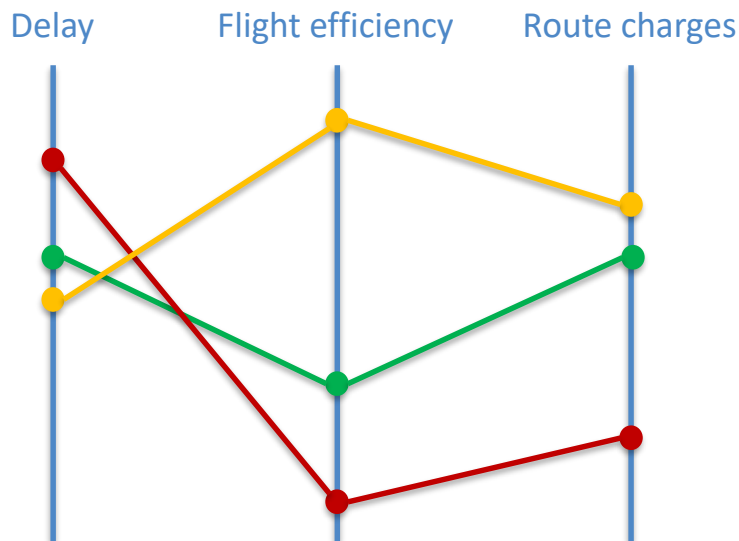
Trajectory B: 19/56

Trajectory C: 32/56



## Advantages of the multi-objective approach

- The importance to be given to each objective is not decided in advance
- Trade-off between objectives can be investigated to better choose a solution to be implemented



A priori choice: give a **reasonable importance** to all objectives, according to goals of Stakeholders

A posteriori evaluation: if I give **less importance** to the minimization of **delay, efficiency, or charges**, the graph shows that to gain objectives in the other objectives



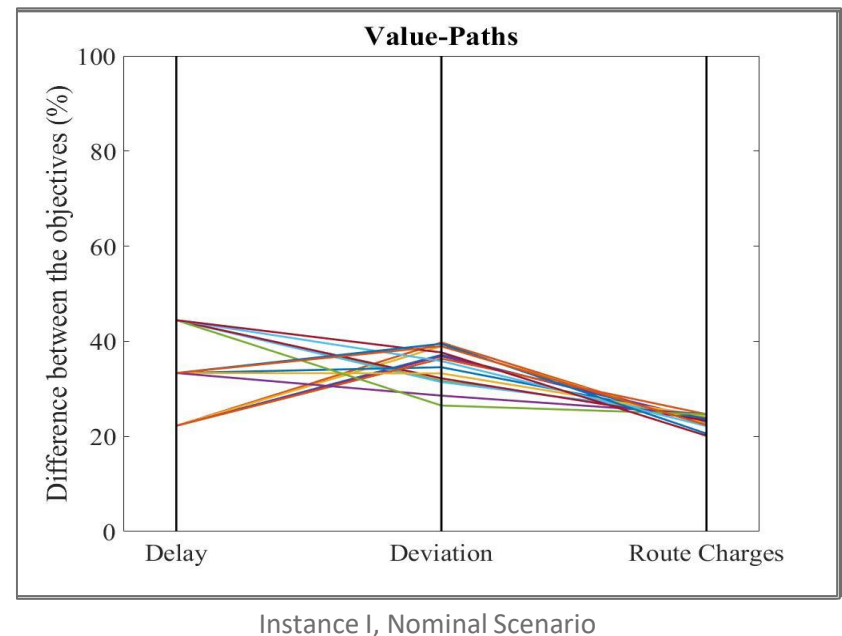
Stakeholders may adjust their views on objectives' importance according to the solutions.

## A guide to results

- Pareto frontiers identify a large number of candidate solutions.
- Filtering criteria can be used to limit the set candidate solutions.

### Examples:

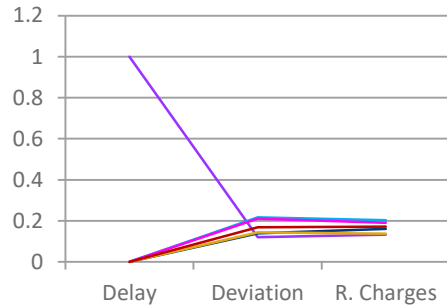
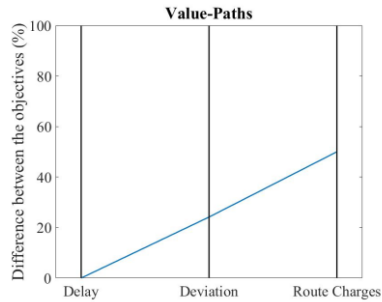
- All objectives between 10% and 90% of extreme values
- All objectives between 20% and 80% of extreme values
- Sequential restriction of objectives
  - delay between 20% and 50% of extreme values
  - deviation between 20% and 40%
  - route charges between 20% and 25%



# OptiFrame for decisions support (5/17)

## Instance I

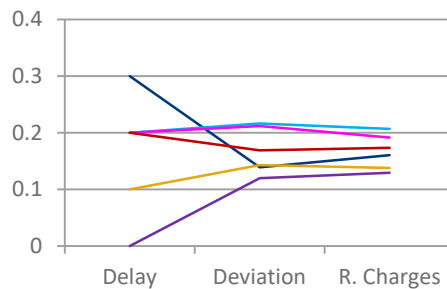
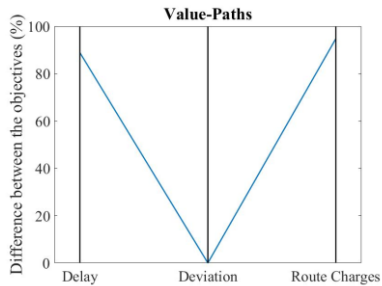
**Minimum Delay. Total: Delay = 2, Deviation = 15029, R. Charges = 10392**



- Airline 1
- Airline 2
- Airline 3
- Airline 4
- Airline 5
- Airline 6

	#flights	Delay	Deviation	RouteCharges
Airline 1	25	2	1805	1387
Airline 2	29	0	2088	1676
Airline 3	38	0	3257	2114
Airline 4	36	0	3176	1984
Airline 5	27	0	2155	1439
Airline 6	31	0	2548	1792

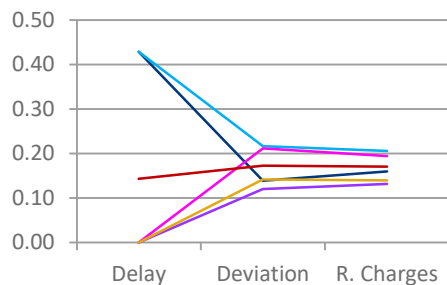
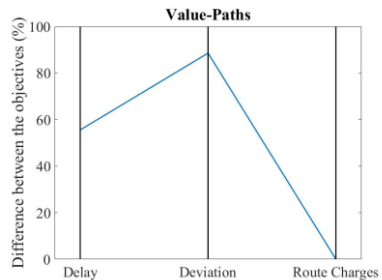
**Minimum Deviation. Total: Delay = 10, Deviation = 14936, R. Charges = 10590**



- Airline1
- Airline2
- Airline3
- Airline4
- Airline5
- Airline6

	#flights	Delay	Deviation	RouteCharges
Airline 1	25	0	1795	1369
Airline 2	29	3	2077	1698
Airline 3	38	2	3237	2189
Airline 4	36	2	3167	2032
Airline 5	27	1	2136	1464
Airline 6	31	2	2524	1838

**Minimum Route Charges. Total: Delay = 7, Deviation = 15277, R. Charges = 10171**



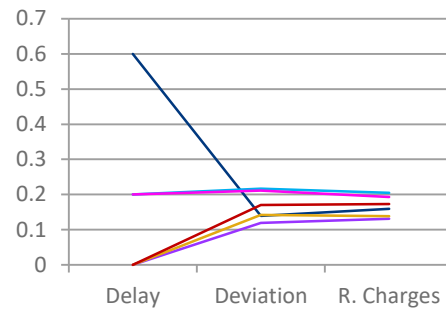
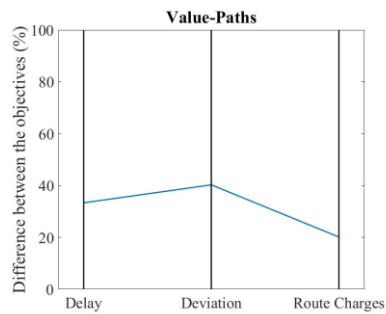
- Airline 1
- Airline 2
- Airline 3
- Airline 4
- Airline 5
- Airline 6

	#flights	Delay	Deviation	RouteCharges
Airline 1	25	0	1837	1335
Airline 2	29	3	2115	1619
Airline 3	38	3	3302	2090
Airline 4	36	0	3224	1973
Airline 5	27	0	2167	1421
Airline 6	31	1	2632	1733

# OptiFrame for decisions support (6/17)

## Instance I

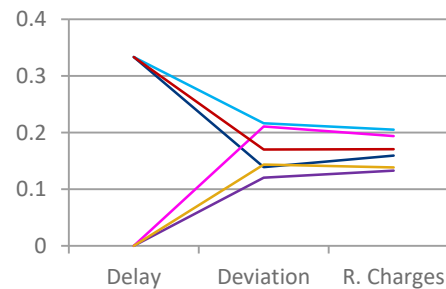
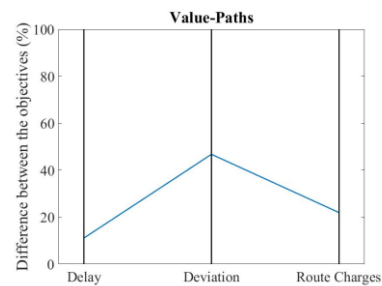
**Random1. Total: Delay = 5, Deviation = 15091, R. Charges = 10260**



- Airline 1
- Airline 2
- Airline 3
- Airline 4
- Airline 5
- Airline 6

	#flights	Delay	Deviation	RouteCharges
Airline 1	25	0	1809	1344
Airline 2	29	3	2103	1635
Airline 3	38	1	3272	2104
Airline 4	36	1	3193	1983
Airline 5	27	0	2149	1422
Airline 6	31	0	2565	1772

**Random2. Total: Delay = 3, Deviation = 15116, R. Charges = 10268**



- Airline1
- Airline2
- Airline3
- Airline4
- Airline5
- Airline6

	#flights	Delay	Deviation	RouteCharges
Airline 1	25	0	1820	1361
Airline 2	29	1	2099	1637
Airline 3	38	1	3272	2104
Airline 4	36	0	3182	1989
Airline 5	27	0	2174	1424
Airline 6	31	1	2569	1753

# OptiFrame for decisions support (7/17)



## Instance I : airlines perspective

Airlines' share in total objectives for different solutions



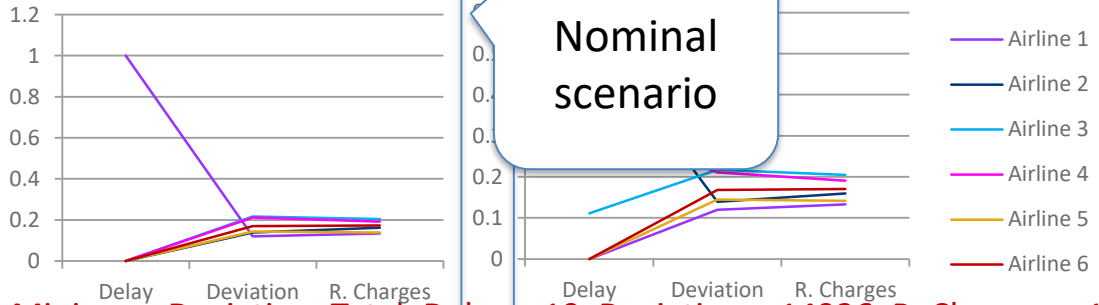
## Disturbance Scenarios

- Airport Closure (AC): one airport is closed for one hour, both for departures and arrivals.
- Airport Restriction (AR): the capacity at one airport is reduced for one hour at take off and landing.
- Sector Restriction (SR): a sector has reduced capacity throughout the day.

# OptiFrame for decision support (9/17)

## Instance I: Airport Closure

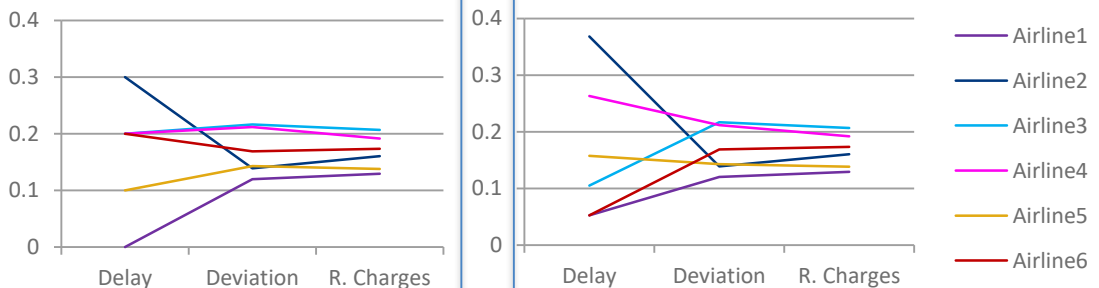
Minimum Delay. Total: Delay = 9, Deviation = 1808, R. Charges = 10447



**Airport Closure**

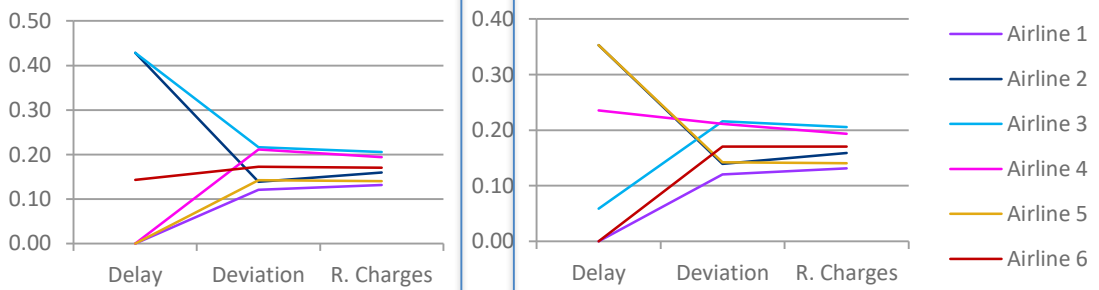
		Deviation	RouteCharges
		1805	1387
		1808	1389
		2088	1676
		2110	1666
		3257	2114
		3281	2138
Airline 4	0	3	3176
		3189	1984
Airline 5	0	0	2155
		2185	1439
Airline 6	0	0	2548
		2545	1792

Minimum Deviation. Total: Delay = 19, Deviation = 14936, R. Charges = 10590



	Delay	Deviation	RouteCharges
Airline 1	0	1	1795
		1795	1369
Airline 2	3	7	2077
		2077	1698
Airline 3	2	2	3237
		3237	2189
Airline 4	2	5	3167
		3167	2032
Airline 5	1	3	2136
		2136	1464
Airline 6	2	1	2524
		2524	1838

Minimum Route Charges. Total: Delay = 17, Deviation = 15245, R. Charges = 10198



	Delay	Deviation	RouteCharges
Airline 1	0	0	1837
		1839	1335
Airline 2	3	6	2115
		2127	1619
Airline 3	3	1	3302
		3289	2090
Airline 4	0	4	3224
		3221	1973
Airline 5	0	6	2167
		2166	1421
Airline 6	1	0	2632
		2603	1733

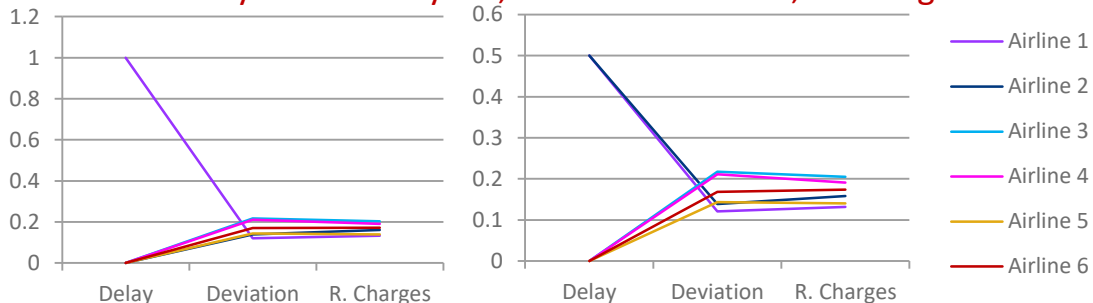


# OptiFrame for decisions support (10/17)



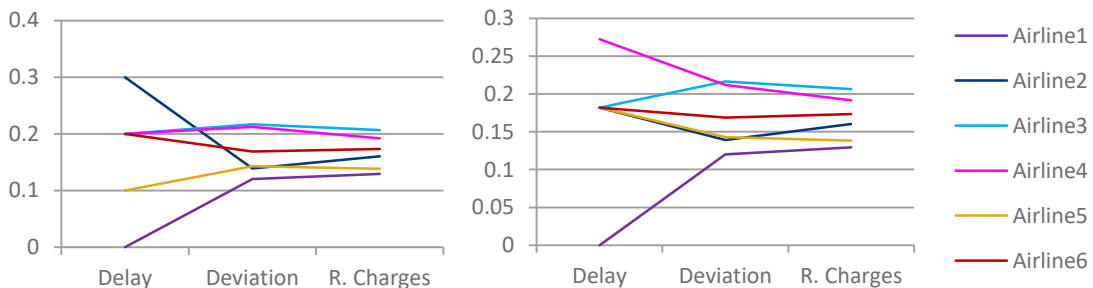
## Instance I: Airport Restriction

Minimum Delay. Total: Delay = 2, Deviation = 15078, R. Charges = 10355



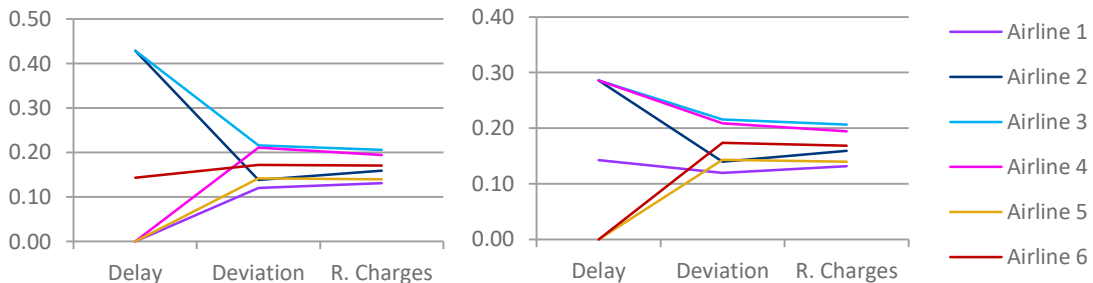
	Delay	Deviation	RouteCharges
Airline 1	2	1	1361
Airline 2	0	1	1640
Airline 3	0	0	2122
Airline 4	0	0	1977
Airline 5	0	0	1455
Airline 6	0	0	1800

Minimum Deviation. Total: Delay = 11, Deviation = 14936, R. Charges = 10590



	Delay	Deviation	RouteCharges
Airline 1	0	0	1369
Airline 2	3	2	1698
Airline 3	2	2	2189
Airline 4	2	3	2032
Airline 5	1	2	1464
Airline 6	2	2	1838

Minimum Route Charges. Total: Delay = 7, Deviation = 15243, R. Charges = 10173



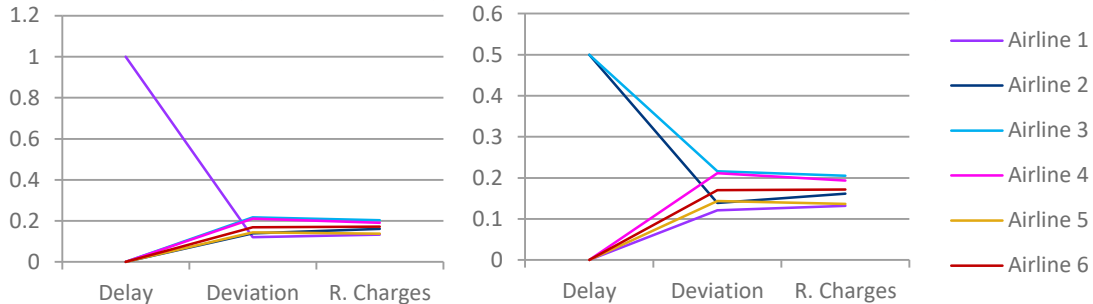
	Delay	Deviation	RouteCharges
Airline 1	0	1	1337
Airline 2	3	2	1620
Airline 3	3	2	2103
Airline 4	0	2	1977
Airline 5	0	0	1420
Airline 6	1	0	1716

# OptiFrame for decisions support (11/17)



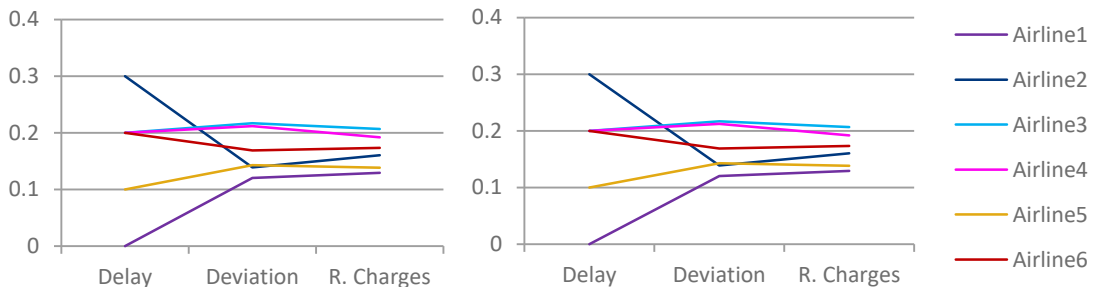
## Instance I: Sector Restriction

Minimum Delay. Total: Delay = 2, Deviation = 150293 R. Charges = 10457



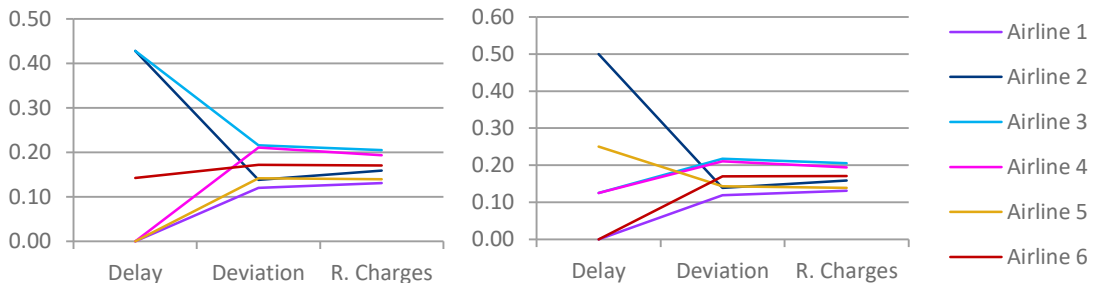
	Delay	Deviation	RouteCharges
Airline 1	2	0	1805 1812 1387 1378
Airline 2	0	1	2088 2080 1676 1692
Airline 3	0	1	3257 3250 2114 2144
Airline 4	0	0	3176 3173 1984 2024
Airline 5	0	0	2155 2156 1439 1425
Airline 6	0	0	2548 2552 1792 1794

Minimum Deviation. Total: Delay = 10, Deviation = 14936, R. Charges = 10590



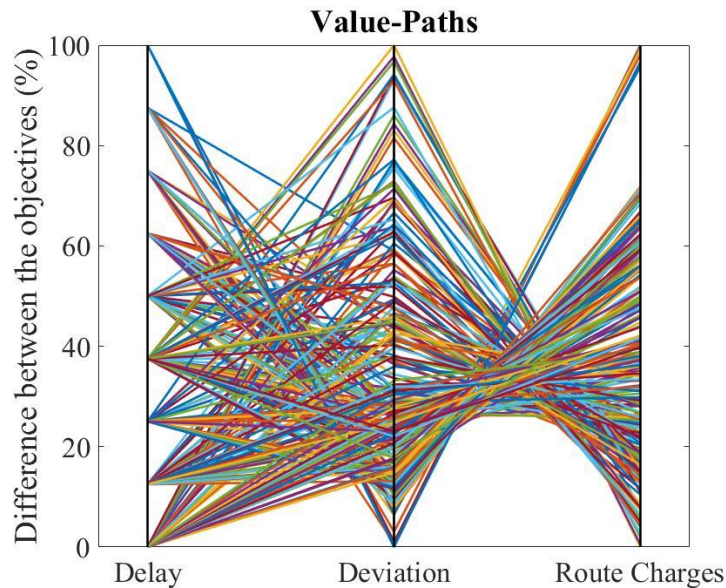
	Delay	Deviation	RouteCharges
Airline 1	0	0	1795 1795 1369 1369
Airline 2	3	3	2077 2077 1698 1698
Airline 3	2	2	3237 3237 2189 2189
Airline 4	2	2	3167 3167 2032 2032
Airline 5	1	1	2136 2136 1464 1464
Airline 6	2	2	2524 2524 1838 1838

Minimum Route Charges. Total: Delay = 8, Deviation = 15278, R. Charges = 10170

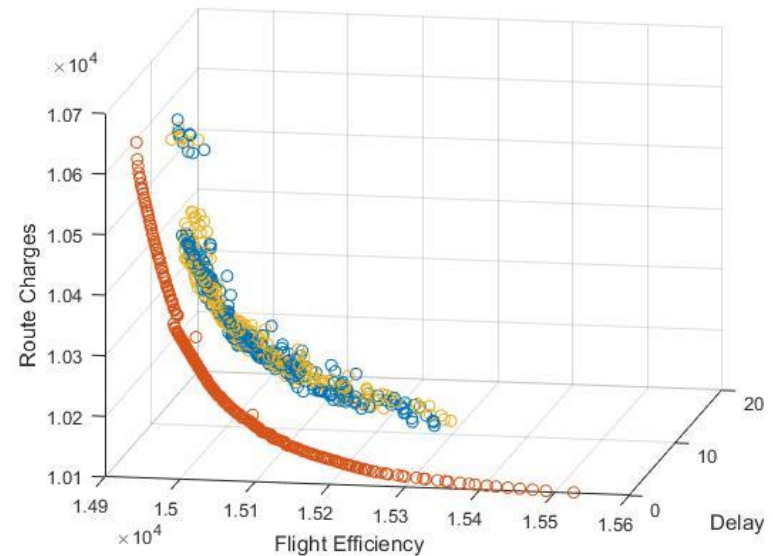


	Delay	Deviation	RouteCharges
Airline 1	0	0	1837 1819 1335 1337
Airline 2	3	4	2115 2130 1619 1614
Airline 3	3	1	3302 3318 2090 2089
Airline 4	0	1	3224 3221 1973 1974
Airline 5	0	2	2167 2196 1421 1416
Airline 6	1	0	2632 2594 1733 1740

# Application of the FDR priorities scheme (1/2)

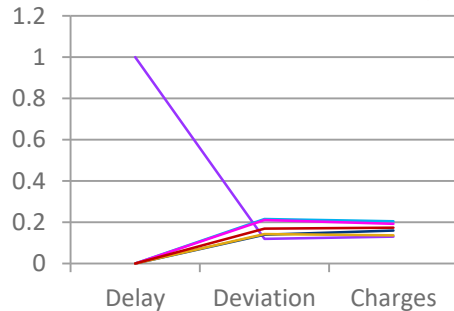
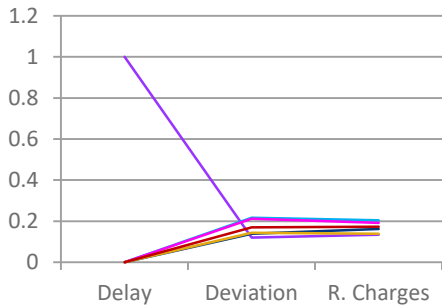


- Pareto Frontier
- Efficient frontier – no priorities
- Efficient frontier – FDR



# Application of the FDR priorities scheme (2/2)

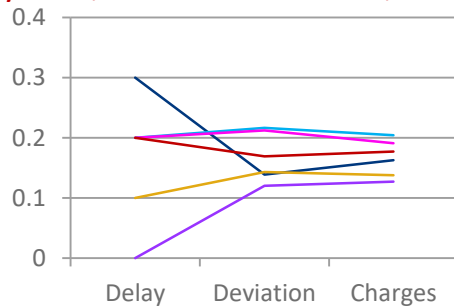
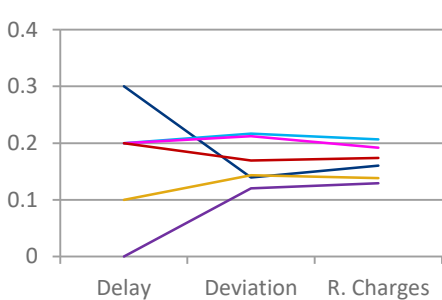
Minimum Delay. Total: Delay = 2, Deviation = 15093 R. Charges = 10321



- Airline1
- Airline2
- Airline3
- Airline4
- Airline5
- Airline6

	Delay	Deviation	RouteCharges
Airline 1	2	1805	1387
Airline 2	0	2088	1676
Airline 3	0	3257	2114
Airline 4	0	3176	1984
Airline 5	0	2155	1439
Airline 6	0	2548	1792

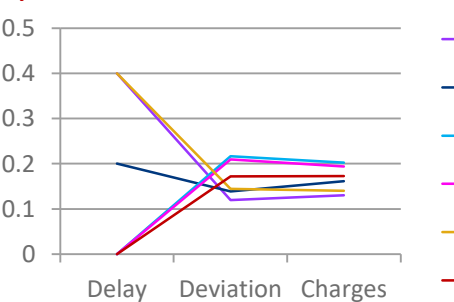
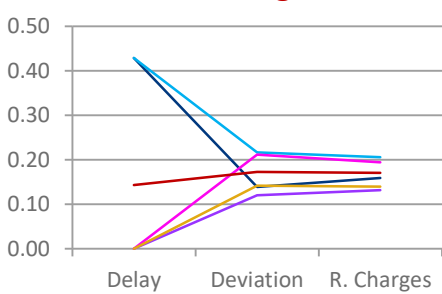
Minimum Deviation. Total: Delay = 10, Deviation = 14936, R. Charges = 10590



- Airline1
- Airline2
- Airline3
- Airline4
- Airline5
- Airline6

	Delay	Deviation	RouteCharges
Airline 1	0	1795	1369
Airline 2	3	2077	1698
Airline 3	2	3237	2189
Airline 4	2	3167	2032
Airline 5	1	2136	1464
Airline 6	2	2524	1838

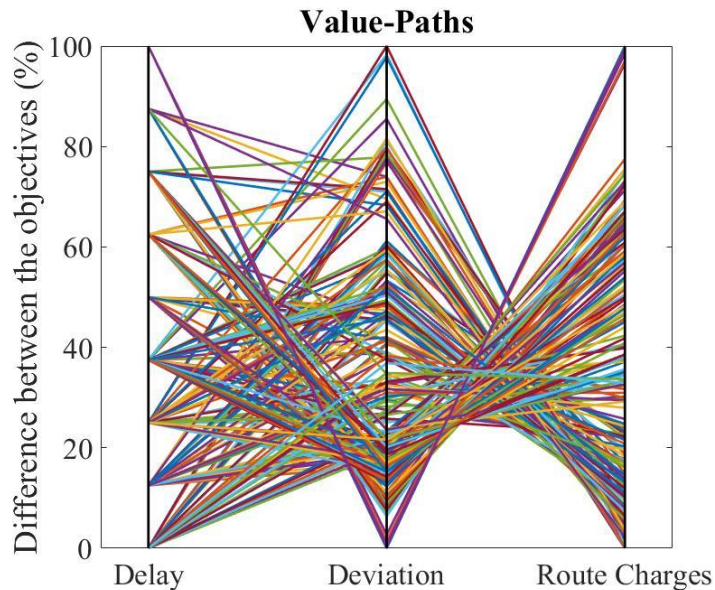
Minimum R. Charges. Total: Delay = 5, Deviation = 15331, R. Charges = 10168



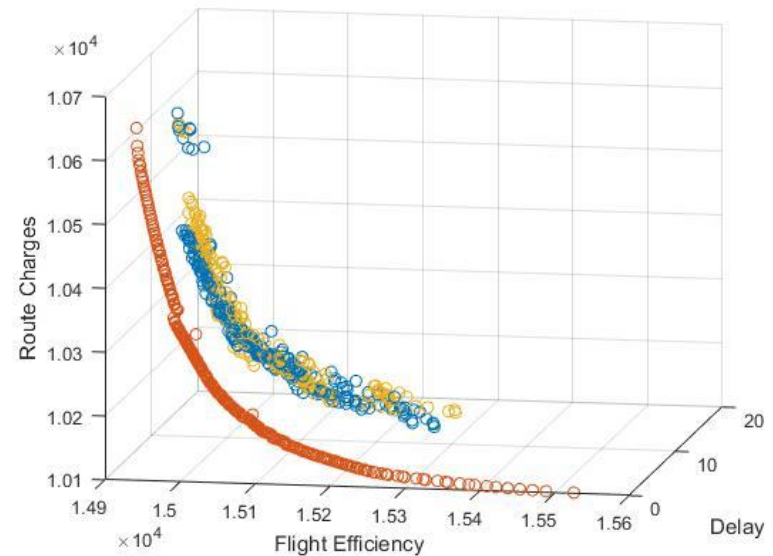
- Airline1
- Airline2
- Airline3
- Airline4
- Airline5
- Airline6

	Delay	Deviation	RouteCharges
Airline 1	0	1837	1335
Airline 2	3	2115	1619
Airline 3	3	3302	2090
Airline 4	0	3224	1973
Airline 5	0	2167	1421
Airline 6	1	2632	1733

# Application of the “Margins” priorities scheme (1/2)

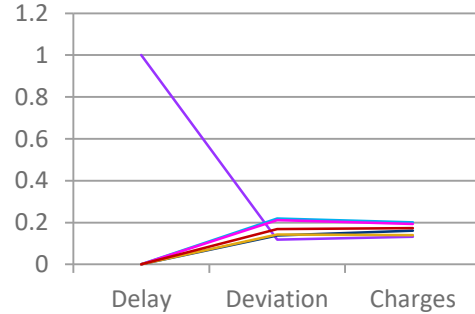
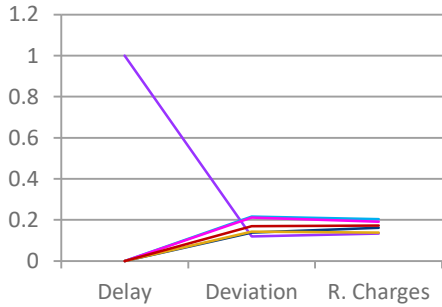


- Pareto Frontier
- Efficient frontier – no priorities
- Efficient frontier – Margins



# Application of the “Margins” priorities scheme (2/2)

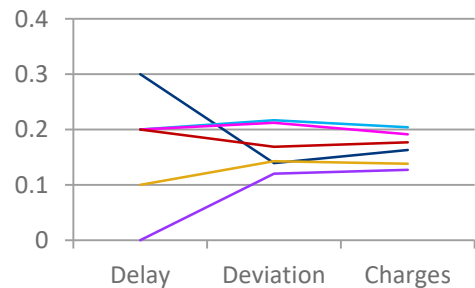
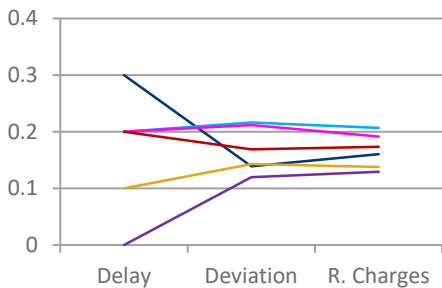
Minimum Delay. Total: Delay = 2, Deviation = 15249 R. Charges = 10246



- Airline1
- Airline2
- Airline3
- Airline4
- Airline5
- Airline6

	Delay	Deviation	RouteCharges
Airline 1	2	1805	1387
Airline 2	0	2088	1676
Airline 3	0	3257	2114
Airline 4	0	3176	1984
Airline 5	0	2155	1439
Airline 6	0	2548	1792

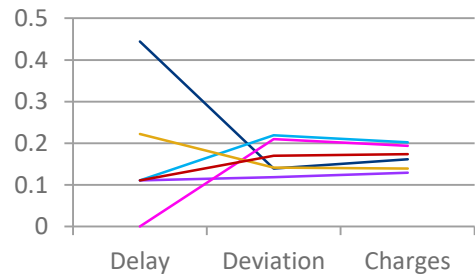
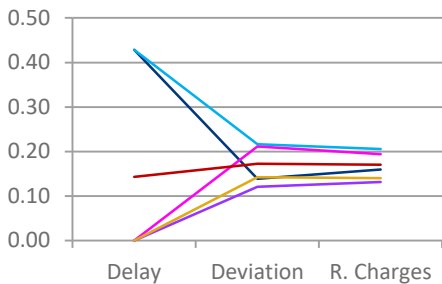
Minimum Deviation. Total: Delay = 10, Deviation = 14936, R. Charges = 10590



- Airline1
- Airline2
- Airline3
- Airline4
- Airline5
- Airline6

	Delay	Deviation	RouteCharges
Airline 1	0	1795	1369
Airline 2	3	2077	1698
Airline 3	2	3237	2189
Airline 4	2	3167	2032
Airline 5	1	2136	1464
Airline 6	2	2524	1838

Minimum R. Charges. Total: Delay = 9, Deviation = 15237, R. Charges = 10186



- Airline1
- Airline2
- Airline3
- Airline4
- Airline5

	Delay	Deviation	RouteCharges
Airline 1	0	1837	1335
Airline 2	3	2115	1619
Airline 3	3	3302	2090
Airline 4	0	3224	1973
Airline 5	0	2167	1421
Airline 6	1	2632	1733

# Conclusions



- The OptiFrame framework is able to solve the ATFM problem with preferences and priorities incorporated.
- Recent priorities mechanisms are taking into account via a pre-processing phase.
- Computational results provide a set of non-dominated solutions, among which Stakeholders can identify the most suitable solution.
- A set of a posteriori criteria must be identified to select the solution to be implemented.

# Discussion

1. Data availability for further testing the framework
2. Other potential prioritization schemes
3. How the choice of the preferred solution should be made?
4. How useful is the presentation of information at different level of details?
5. Do you see any barrier for the implementation of the proposed approach?





## OptiFrame for Trajectory Based Operations (TBO) Decisions Support

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# Thank you very much for your attention!



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Founding Members



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