

# Evaluation of Flight Efficiency for Stockholm Arlanda Airport Arrivals

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# Stockholm Arlanda Airport

## Stockholm Arlanda (ESSA)



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## Stockholm Arlanda (ESSA)

Major international airport

Largest in Sweden

Serves ~ 27 million passengers

# IFWHEN project

Impact of Fleet Diversity and Weather on Emissions, Noise and Predictability

Supported by the Swedish Transport Agency (**Transportstyrelsen**) and in-kind participation of **LFV (Swedish ANSP)**

## Targets:

- evaluate flight efficiency at Arlanda airport during the year 2018 in horizontal and vertical domains
- evaluate environmental impact (emissions, noise)
- capture inefficiencies
- understand the causes (impact or weather, staffing, scheduling, ...)
- suggest the areas for improvement

# Arrival Flight Efficiency

## Horizontal

delays and additional time in TMA  
due to deviations from the flight  
plans

associated extra fuel burn

## Vertical

level flights due to deviation from  
CDO

associated extra fuel burn

# KPIs

## Horizontal

ICAO 14.1b - % delayed  $\leq$  5 min

ICAO 14.2b - % delayed  $\leq$  15 min

Average delay

Additional time in TMA

## Vertical

% level flights

Average number of level segments

KPI 19.1 - average distance flown in level flight inside TMA

KPI 19.2 - average time flown in level flight inside TMA

Fuel-based

# Data

- EUROCONTROL **DDR2** (m1, m3 formats)



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- **OpenSky Network** (states, tracks)

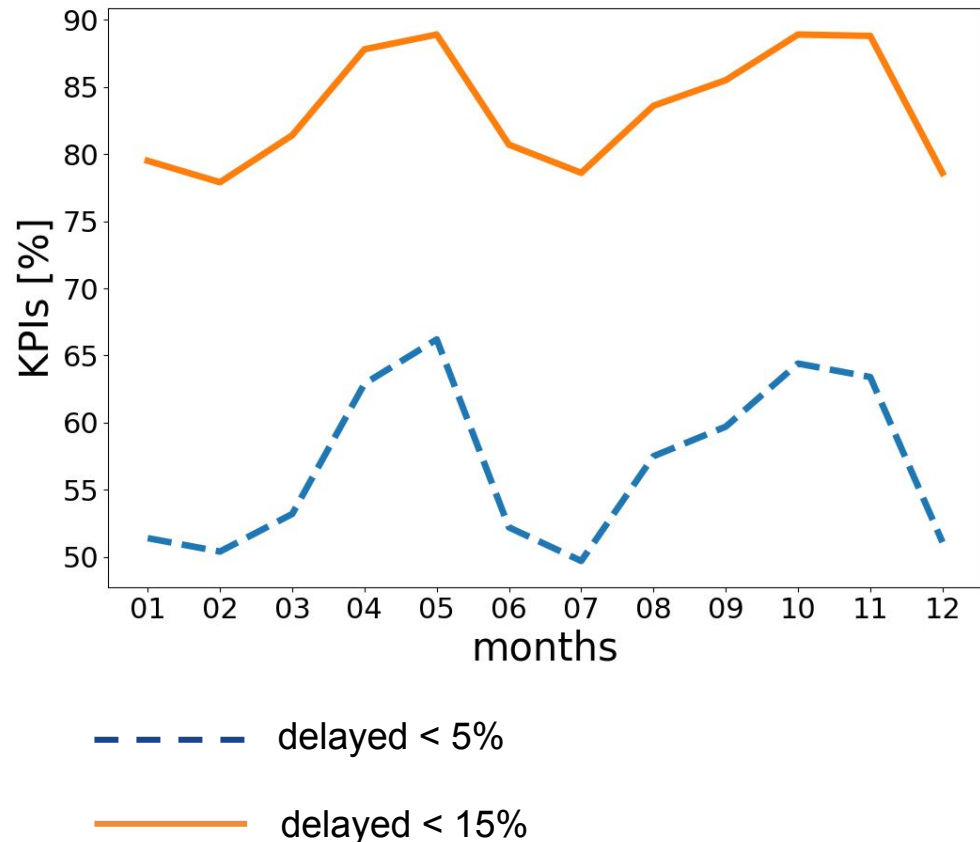
# Data

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- EUROCONTROL **DDR2** (m1, m3 formats)
- **OpenSky Network** (states, tracks)
- BADA 4 for fuel consumption
- NOAA weather data

# Punctuality of Arrivals in 2018 <sup>11</sup>

- Data source - DDR2  
m1 - flightplans  
m3 - actual  
  
Opensky - incomplete (~84%)
- Problematic months: January, February, July
- Correlation with traffic density and different weather conditions and other factors will be investigated further

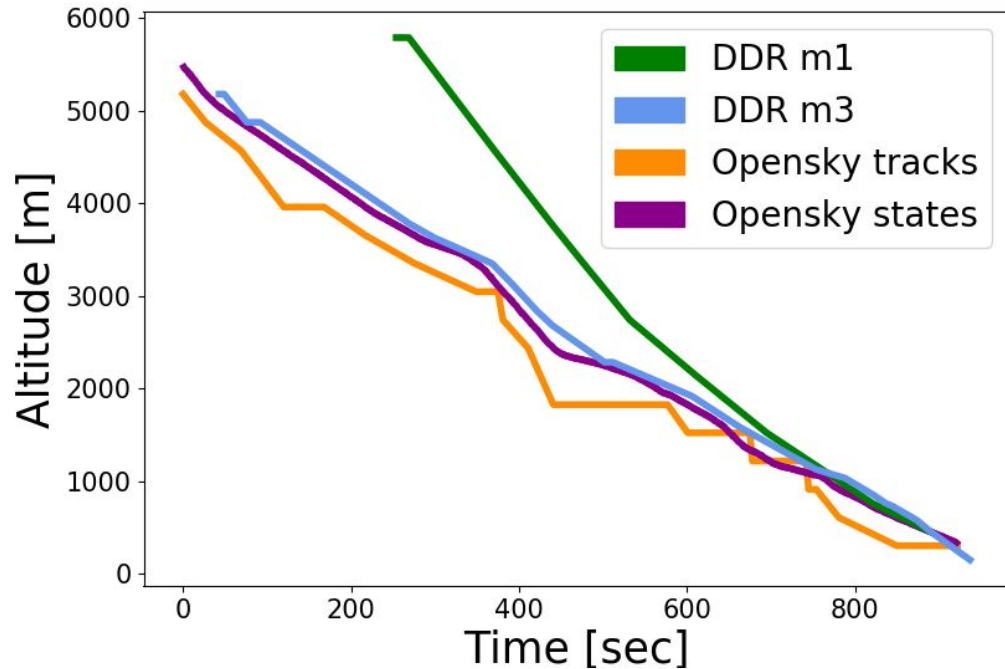


# Vertical Flight Efficiency

Data source - Opensky states (more accurate)

\*Problems with Opensky tracks

VFE by EUROCONTROL  
Level segment=  
vertical speed below  
300 feet per minute  
time flown level is  
minimum 30 seconds



SAS410 in Stockholm Arlanda airport TMA on January 01, 2018

# Vertical Flight Efficiency

Months in 2018	Number of arrival flights	Percents of level flights, %	Average number of level segments	KPI 19.1, NM	KPI 19.1 <sub>perc</sub> , %	KPI 19.2, min	KPI 19.2 <sub>perc</sub> , %
1	7721	55	1	2.8	5	0.72	5
2	7419	52	0.87	2.72	4	0.7	5
3	8131	56	1.08	2.99	5	0.77	6
4	8944	54	1	2.77	4	0.69	5
5	9552	50	0.88	2.22	4	0.52	4
6	8923	51	0.9	2.68	4	0.69	5
7	8426	46	0.68	2.38	4	0.61	4
8	8915	47	0.73	2.25	3	0.56	4
9	8779	48	0.79	2.28	3	0.59	4
10	9162	51	0.8	2.4	4	0.64	4
11	8558	41	0.59	1.91	3	0.49	3
12	6954	49	0.73	2.68	4	0.71	5

# Comparison vs. Others

Source	Month, year	Number of arrival flights	Percentage of level flights, %	Average number of level segments	KPI 19.1, NM	KPI 19.2, min
Correia'17	02/2017	7332	54	1.58	3.31	0.79
<b>This work</b>	<b>02/2018</b>	<b>7419</b>	<b>52</b>	<b>0.87</b>	<b>2.72</b>	<b>0.70</b>
Correia'17	06/2017	9317	51	1.49	3.46	0.75
<b>This work</b>	<b>06/2018</b>	<b>8923</b>	<b>51</b>	<b>0.90</b>	<b>2.68</b>	<b>0.69</b>



P. D. Correia. Analysis of Vertical Flight Efficiency During Climb and Descent. Master's thesis, Técnico Lisboa, 2017.

- + EUROCONTROL PRU Report 2018:  
about 50% - the share of level flights during descent  
average time flown level at Arlanda ~ 1.1 min, does not contradict with our results

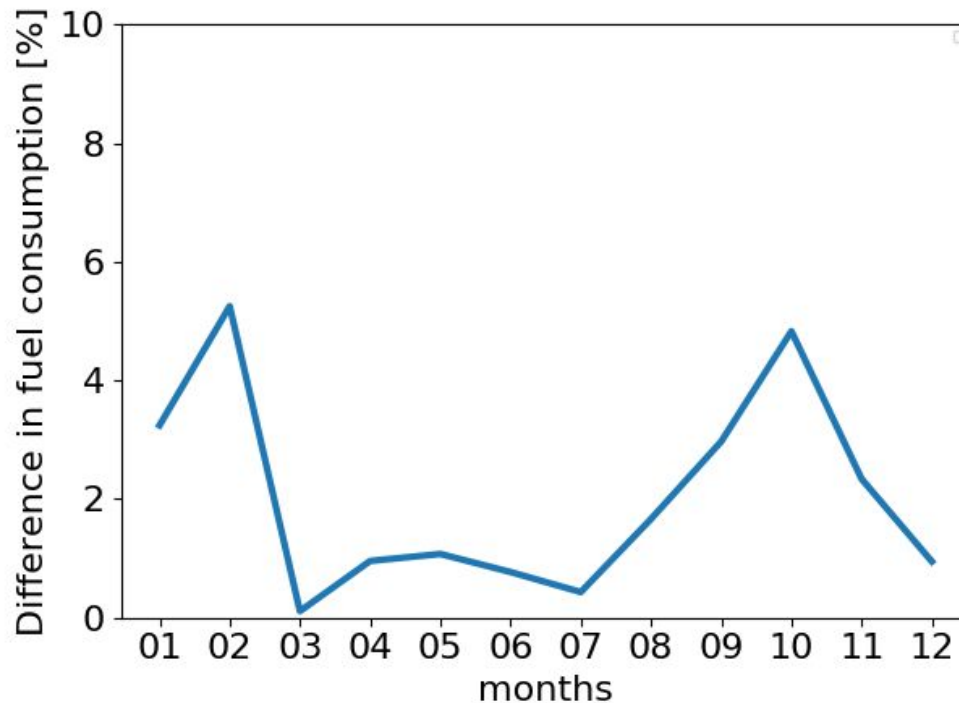
# Fuel Consumption

- Calculated using BADA v4 methodology
- Different models depending on engine type and engine rating (max climb, max cruise, idle, no rating)
- General formula: 
$$F = \delta \cdot \theta^{\frac{1}{2}} \cdot W_{mref} \cdot a_0 \cdot L_{HV}^{-1} \cdot C_F$$

$\delta$  - pressure ratio,  
 $\theta$  - temperature ratio,  $W_{mref}$  - weight force  
 $a_0$  - speed of sound ,  $L_{HV}$  - fuel lower rating,  $C_F$  - fuel coefficient
- xml file with aircraft performance data
- Thrust computation 
$$T = \delta \cdot W_{mref} \cdot C_T$$
- 90% of maximum landing mass is considered
- Idle thrust at descent

# Fuel Burn in Horizontal Plane <sup>16</sup>

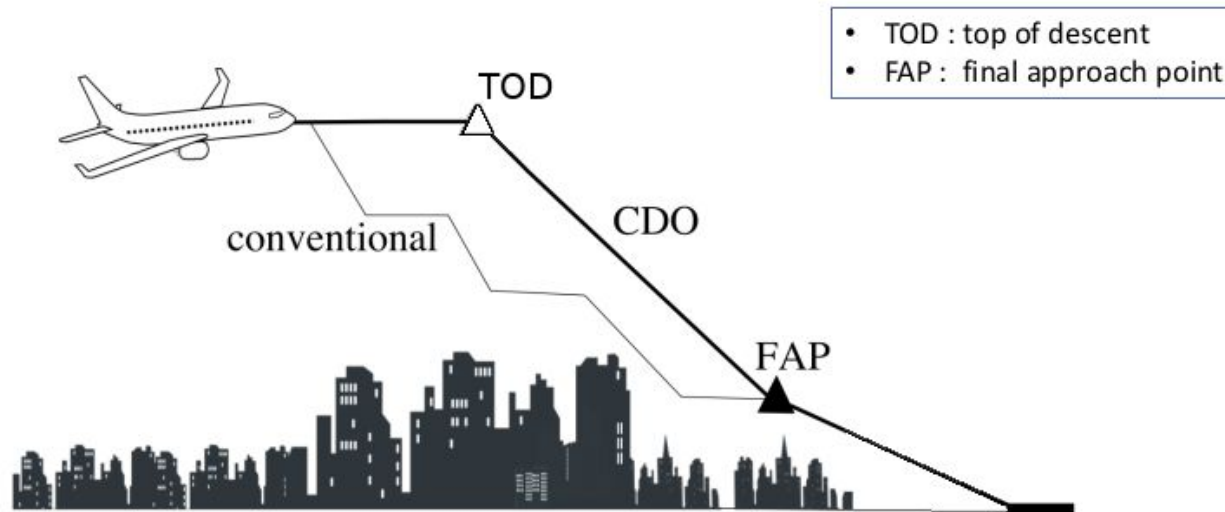
- Due to deviations from the flight plans
- DDR2 m1 used for reference trajectory, m3 for actual





# Fuel Consumption

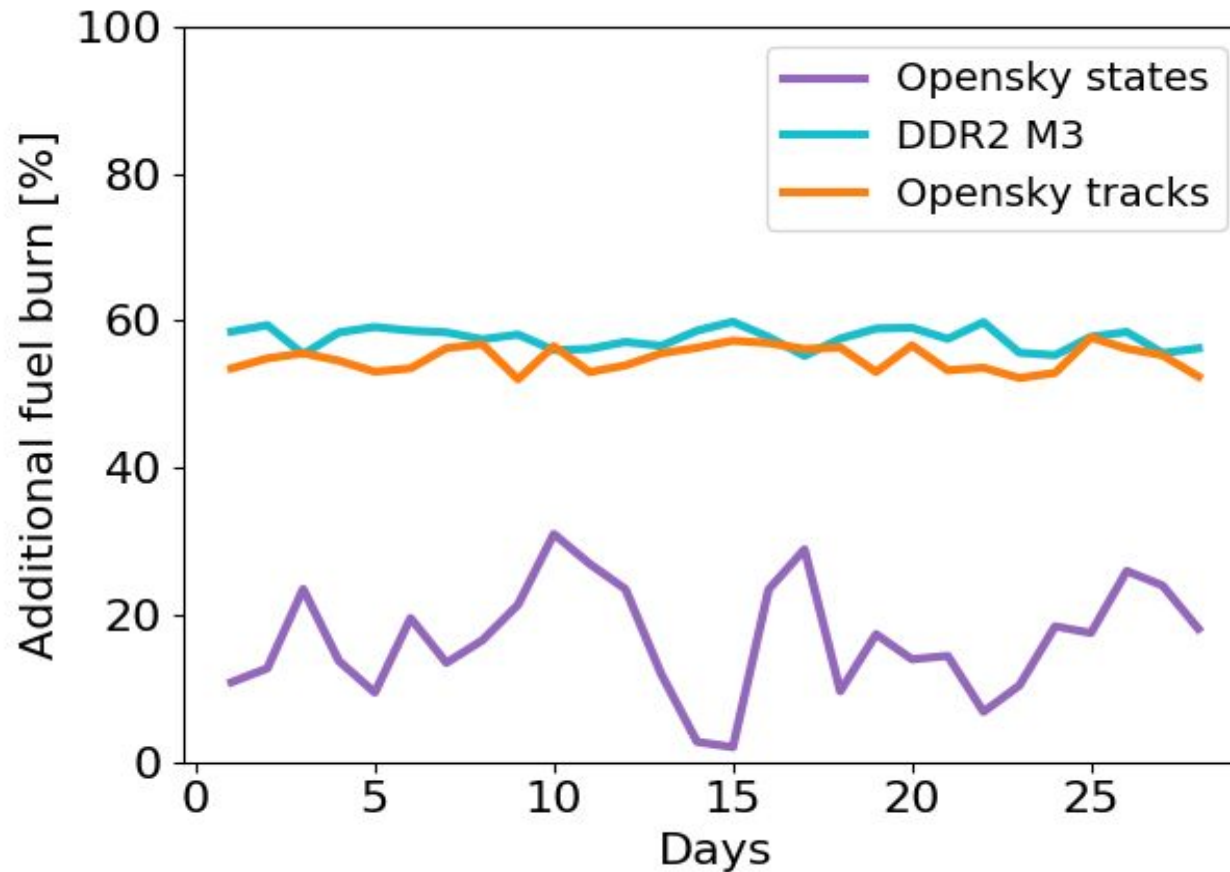
- CDO are used as a reference trajectory (explained in Sáez et al. 2019)  
CDO have shown important environmental benefits w.r.t. conventional (step-down) approaches in TMAs



R. Sáez, X. Prats, T. Polishchuk, V. Polishchuk C. Schmidt. Automation for Separation with CDOs: Dynamic Aircraft Arrival Routes In ATM Seminar 2019.

# Fuel Burn in Vertical Plane

- Average fuel consumption over the arrivals in February 2019

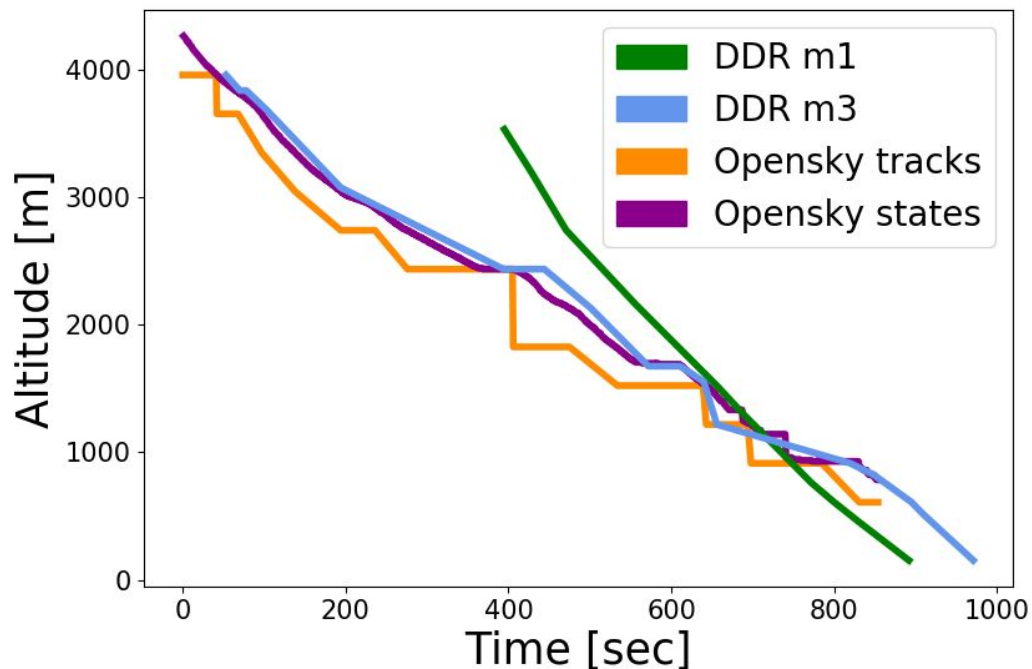


# Vertical Profile

Data source - Opensky states - more accurate: ~900 waypoints inside TMA

Opensky tracks: about 60-80 waypoints

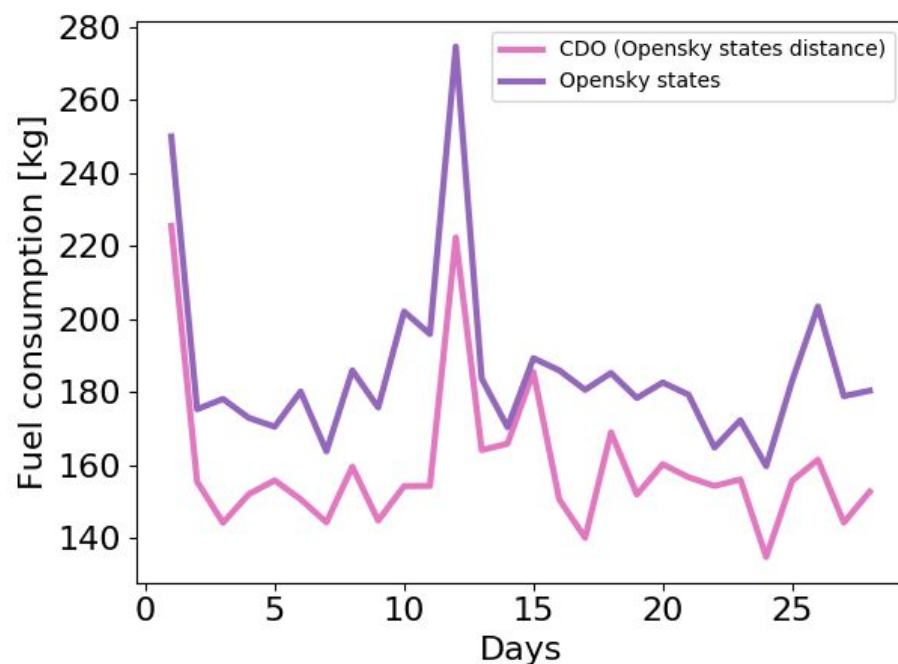
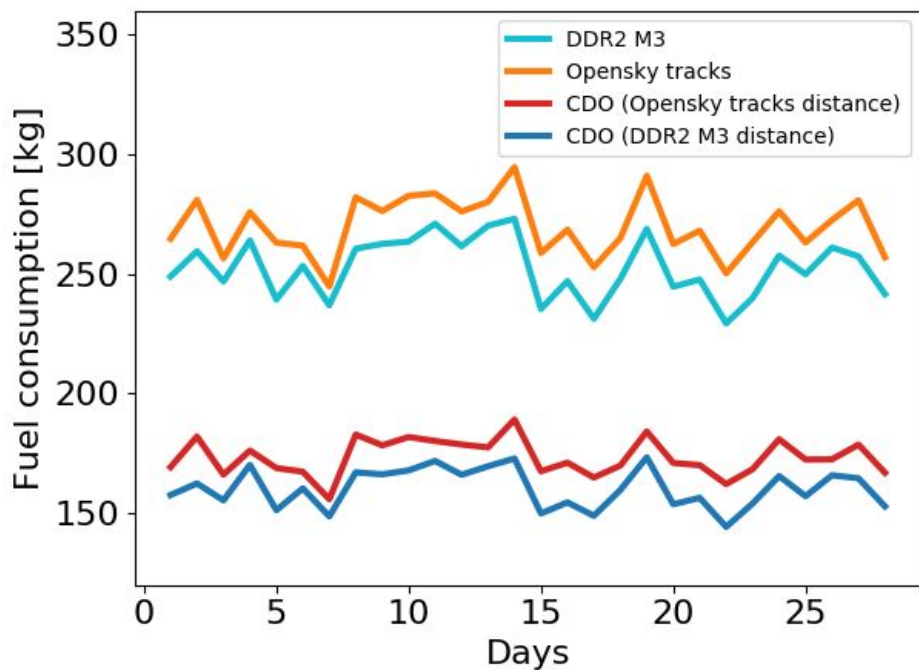
DDR2 - about 10-15 points



AFL2386 in Stockholm Arlanda airport TMA from on January 03, 2018

# Fuel Burn in Vertical Plane

- Absolute values (in kg) for the average fuel consumption over the arrivals in February 2018



# OpenSky data: Pros and Cons <sup>21</sup>

Open source

**Accurate three-dimensional aircraft positions**

Precise timestamps

Incomplete

**Time consuming for fuel calculations (states)**

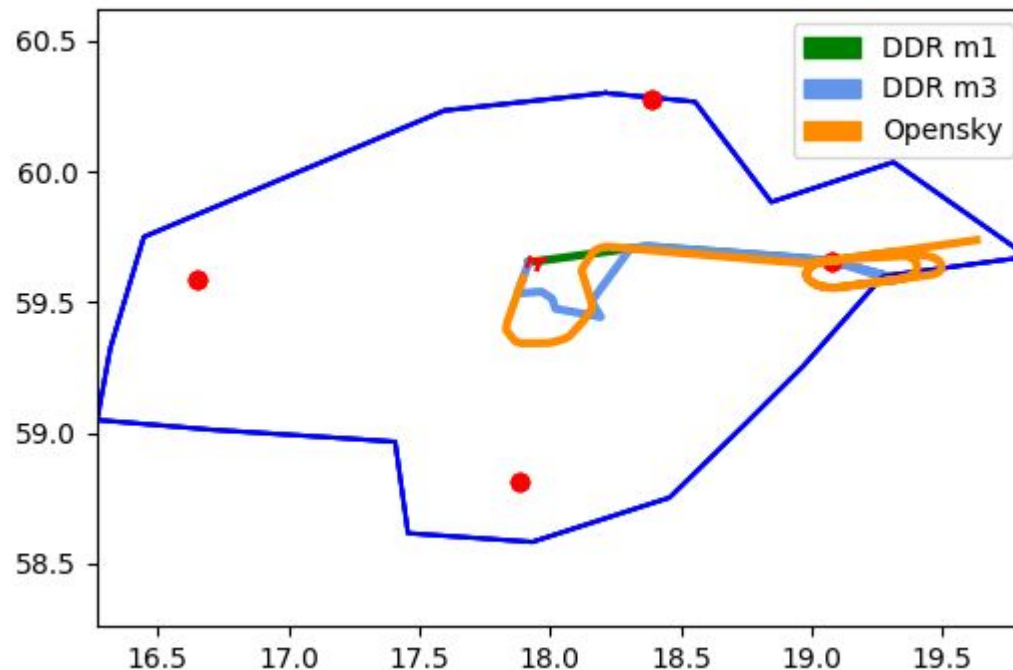
Not clean (mistakes)

Tracks methodology to be revised

Flight Id is missing in states, need for fuel calculation

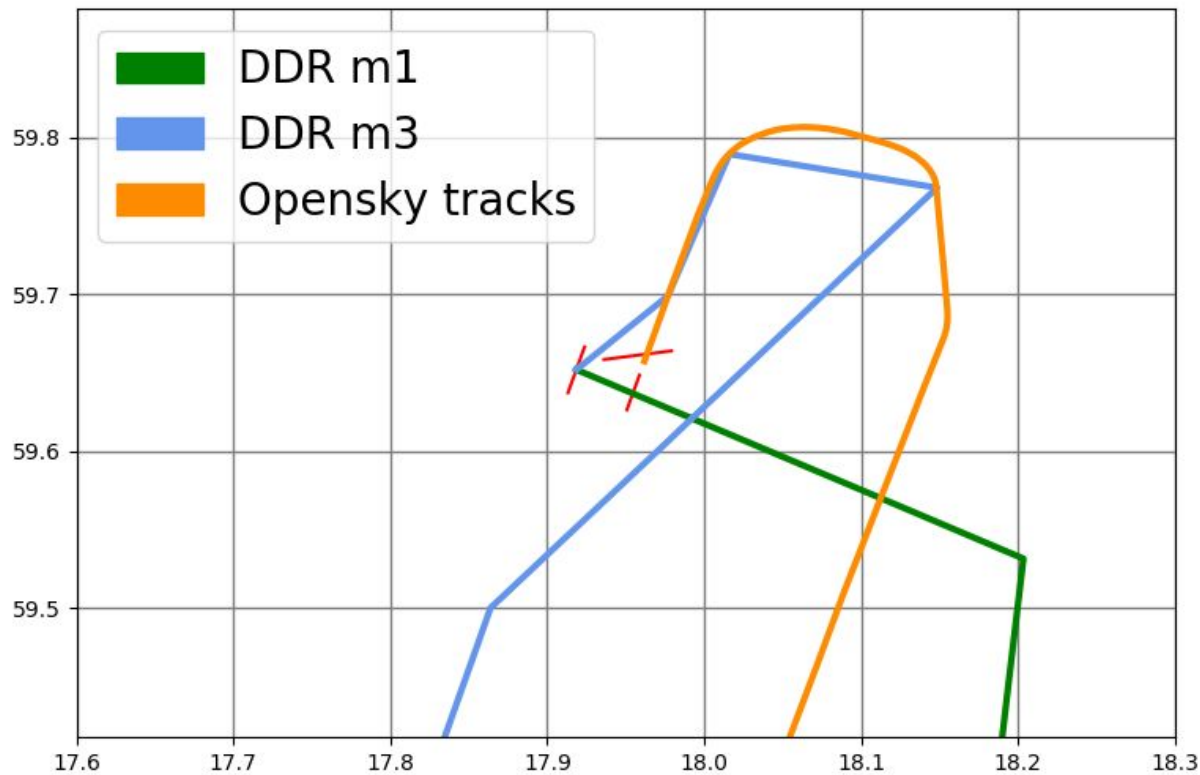
# Horizontal Inefficiencies

- SAS 964
- Snowy day on February 26, 2018



# Landing accuracy

- SAS 410
- January 01, 2018



# Conclusions

- Evaluated performance of Stockholm Arlanda airport in horizontal and vertical domain
- Quantified the impact of vertical inefficiencies with additional fuel burn
- Shared our experience working with DDR2 and Opensky data
- Created a base to study the impact of different factors (weather conditions, traffic intensity, ATM) on different airport PIs



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## THANK YOU!