Seasonal Variability of Aircraft Trajectories reducing  $NO_x$ -climate Impacts under a Multitude of Weather Patterns

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# Introduction





*Figure*: Aviation-induced Radiative Forcing terms from different components (*from Grewe et al., 2017, updating Lee et al., 2010*).

- Aviation climate impact is due to CO<sub>2</sub> and non-CO<sub>2</sub> effects, including:
  - →NO<sub>x</sub> emissions (ozone and methane perturbations)
  - $\rightarrow$ Water vapour
  - $\rightarrow$  Formation of contrails

Non-CO<sub>2</sub> effects of aviation are highly dependent on time and location of emission

 $\rightarrow$  potential of mitigating the climate impact of aviation by optimizing the aircraft trajectories.





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2

# **Motivation**



Previous projects results:

- REACT4C: 25% reduction in the climate impact with 0.5% increase in the operational costs (one winter day, westbound trans-Atlantic flights)<sup>1</sup>.
- ATM4E: 75% 85% of the overall climate impact mitigation potential can already be achieved modifying 25% of the routes (one winter day, European air traffic)<sup>2</sup>.



*Figure:* Optimal climate-cost relations obtained optimizing the trans-Atlantic air traffic, under the weather conditions of a representative winter day<sup>1</sup>.

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<sup>1</sup>Grewe, V. et al. (2014), <sup>2</sup>Lührs, B. et al. (2021)





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# **Objective**



• Objective of this study:

**Enhance the understanding** of the relation between NO<sub>x</sub>-climate impacts and routing strategies considering a multitude of weather patterns.

- In particular, here we focus on:
  - 1. the **effects** of optimizing aircraft trajectories w.r.t. the impact of their  $NO_x$  emissions on climate.
  - 2. the **seasonal variability** of these optimised trajectories, caused by the **natural atmospheric variability**.
- Initial step towards objective of FlyATM4E project:

Identify trajectories leading to a **significant reduction** of aviation **climate impact**, while leaving the **economic costs nearly unchanged**.

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4

# Methods – EMAC and ACCFs



- **Base model:** ECHAM5/MESSy2 Atmospheric Chemistry Model (EMAC).
- A set of prototype algorithmic Climate Change Functions (aCCFs) estimate the flight climate impact in terms of Average Temperature Response over a time horizon of 20 years (ATR20):
- Example: NO<sub>x</sub>- climate impact on ozone\*:

$$\begin{split} aCCF_{O_3} &= -\; 5.20 \cdot 10^{-11} + 2.30 \cdot 10^{-13}T \\ &+ 4.85 \, \cdot 10^{-16} \Phi \, - \, 2.04 \, \cdot 10^{-18}T \Phi, \\ &\text{if } aCCF_{O_3} > 0 \text{ (} = 0 \text{ otherwise)} \end{split}$$

where T is atm. temp., and  $\Phi$  is the geopotential.

$$\Rightarrow$$
 ATR20<sub>03</sub> = aCCF<sub>03</sub> × emitted NO<sub>x</sub>

aCCFs of NO<sub>x</sub>- O<sub>3</sub>  $\rightarrow$ aCCFs of NO<sub>x</sub>- CH<sub>4</sub>  $\rightarrow$ aCCFs of NO<sub>x</sub>- CH<sub>4</sub>  $\rightarrow$ 

 $[K/kg(NO_2)]$ 

*Figure:* Values computed with EMAC at FL350 ( $\sim$ 10.7 km) on 1 Dec. 2015 at 12:00:00 UTC (supplement of \*).







# Methods - AirTraf 2.0



- AirTraf: air traffic simulator coupled with EMAC.
- Optimizer: Genetic algorithm (ARMOGA)

#### • Design variables:

- 6 coordinates (x<sub>1</sub>, ..., x<sub>6</sub>)
- 5 altitudes (x<sub>7</sub>, ..., x<sub>11</sub>)

8 control points define the B-spline curve representing the trajectory.

• Available strategies minimise e.g. flight time, fuel use, simple operating cost, climate impact (using aCCFs)\*.



*Figure:* Geometry definition of flight trajectory. From H. Yamashita et al. (2016).

\*Yamashita et al., 2020.



6

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# Methods - Simulations set-up



	ECHAM5
Horizontal resolution	T42 (2.81°× 2.81°)
Vertical resolution	L31ECMWF (31 vertical pressure levels up to 10 hPa $\sim$ 30 km)
Time step	20 min
Duration	1 year (from 1 Dec. 2015 to 1 Dec. 2016)
	AirTraf
Flight-plan	85 flights in the European airspace (ATM4E flight plan on 2015-12-18 with all A33x aircraft models)
Waypoints	101



Figure: Location of the origindestination pairs.

• Trajectory optimization strategies:

▷  $NO_x$ -climate optimal traj. → minimize:  $ATR20_{NO_x} = ATR20_{O_3} + ATR20_{CH_4}$ 

- $\succ$  Cost-optimal trajectories  $\rightarrow$  minimize: SOC =  $c_t \sum_{i=1}^{n_{wp}-1} TIME_i + c_f \sum_{i=1}^{n_{wp}-1} FUEL_i$ 
  - $c_t = 0.75$  [\$/s] is the unit time cost and  $c_f = 0.51$  [\$/kg] is the unit fuel cost (Burris, 2015)
  - $n_{wp}$ = 101 is the number of waypoints
  - $TIME_i$  and  $FUEL_i$  are flight time and fuel used at the  $i^{th}$  flight segment.

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#### **Results** - seasonal mean horizontal paths







Annual zonal mean aCCFs of NO<sub>x</sub>-O<sub>3</sub> (10<sup>-12</sup> K/kg(NO<sub>2</sub>) \*

- Left figure: Comparison of winter (DJF) seasonal mean horizontal paths.
- In general, northward shift of aircraft location.
- Warming effects from ozone are reduced moving to higher latitudes.
- Other seasons: similar behavior, effects have lower magnitude.

\*Yin et al., 2021, in preparation.





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#### **Results** - seasonal mean flight profiles







Annual zonal mean aCCFs of  $NO_x$ - $O_3$  (10<sup>-12</sup> K/kg( $NO_2$ )\*

- Figure: Comparison of winter (DJF) seasonal mean flight altitude vs. latitude.
- $NO_x$ -climate optimal trajectories flying at lower altitudes  $\rightarrow$  relation with tropopause height.
- Warming effects of O<sub>3</sub> is lower at lower altitudes, with larger gradients at higher latitudes.

\*Yin et al., 2021, in preparation.





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#### **Results** - variability throughout 1 year





- Figure: The thick lines indicate the median values over the 85 flights. The shaded areas extend from the first to the third quartile.
- Reduction in the cruise altitude is smaller in summer.

→ Elevation of the average height of the tropopause during the summer season / lower mitigation potential.

- Fuel increase driven by the increase in aerodynamic drag caused by flying at lower altitudes.
- Larger variability in flight time during winter/spring.



10

## **Results** - changes in NO<sub>x</sub>-climate impact





Figure:

- Relative change in NO<sub>x</sub>-climate impact.
- Baseline: yearly mean NO<sub>x</sub>-climate impact of cost-optimal trajectories.

- NO<sub>x</sub>-climate optimal trajectories successfully reduce the aviation climate impact from NO<sub>x</sub> emissions.
- Larger mitigation potential in winter and spring.
- Interpretation: in winter jet stream stronger and located further south, leading to larger vertical and latitudinal gradients in temperature and geopotential.



11

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#### **Results** - changes in NO<sub>x</sub>-climate impact





- NO<sub>x</sub>-ozone climate impact reaches a maximum in summer due to a higher photochemical activity (both optimization strategies).
- Seasonality of NO<sub>x</sub>-ozone climate impact drives total NO<sub>x</sub>-climate impact seasonality → dominant over methane effects.
- Cooling effects from methane depletion are always enhanced.





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#### **Conclusion**



- The air traffic simulator AirTraf coupled with the Atmospheric Chemistry Model EMAC allowed us to analyze different routing strategies under the atmospheric conditions computed during one year of simulation.
- NO<sub>x</sub>-climate optimal trajectories are:
  - flying at lower altitudes
  - and
  - affected by larger temporal and latitudinal dependencies than cost-optimal trajectories.
- The mitigation potential of NO<sub>x</sub>-climate optimal trajectories is larger in winter/spring.



13

# **On-going research**



- In this study, we employ prototype algorithmic Climate Change Functions.
- On-going research to extend the simulations in the following aspects:
  - Take into account all main components of aviation climate impact (CO<sub>2</sub> and non-CO<sub>2</sub> effects, i.e. NO<sub>x</sub>, water vapour, and contrail cirrus)
  - Identify trajectories leading to a significant reduction of aviation climate impact, while leaving the economic costs nearly unchanged
  - Include uncertainty ranges.

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14

# **References and links**



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- LinkedIn <u>https://www.linkedin.com/company/flyatm4e</u>
- Project Homepage: <u>www.flyatm4e.eu</u>

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# Thank you very much

# for your attention!



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