



Transitioning contrail science into practice

National Academy of Sciences
August 19, 2024

Overview

1. Motivation
2. Contrail avoidance in practice
3. Recent progress
4. Call to action: An ambitious national research agenda on contrails

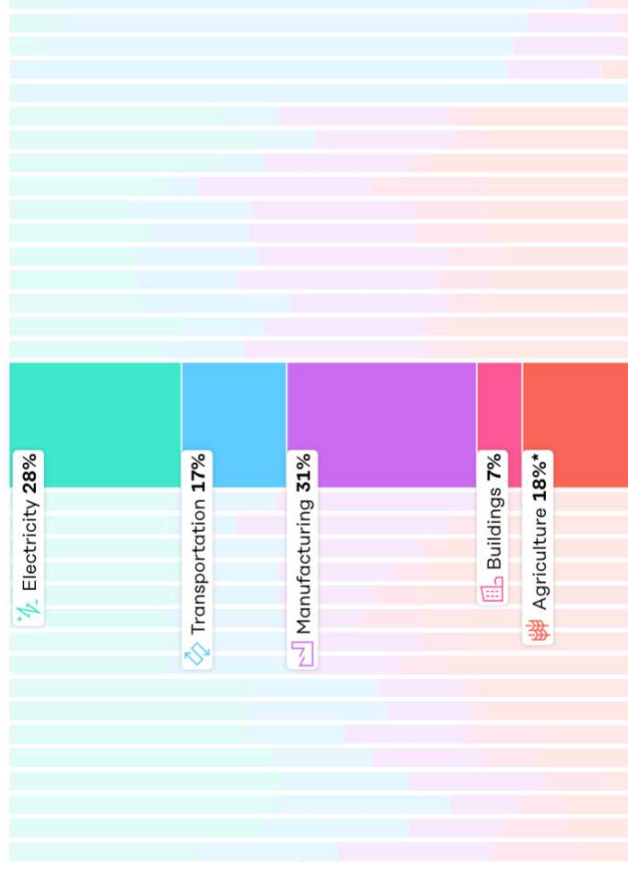
Breakthrough Energy

Accelerating climate progress across:

- **Technology.** Climate technologies our world will need to meaningfully reduce emissions.
- **Markets.** Bring together public and private sectors to accelerate market formation, spur further innovation, and reduce Green Premiums.
- **Policy.** Advocate public policies that will give new technologies a chance in the marketplace, incentivize investment, and drive down clean technology costs.

Emissions

Global ▾



Breakthrough Energy

Accelerating climate progress across:

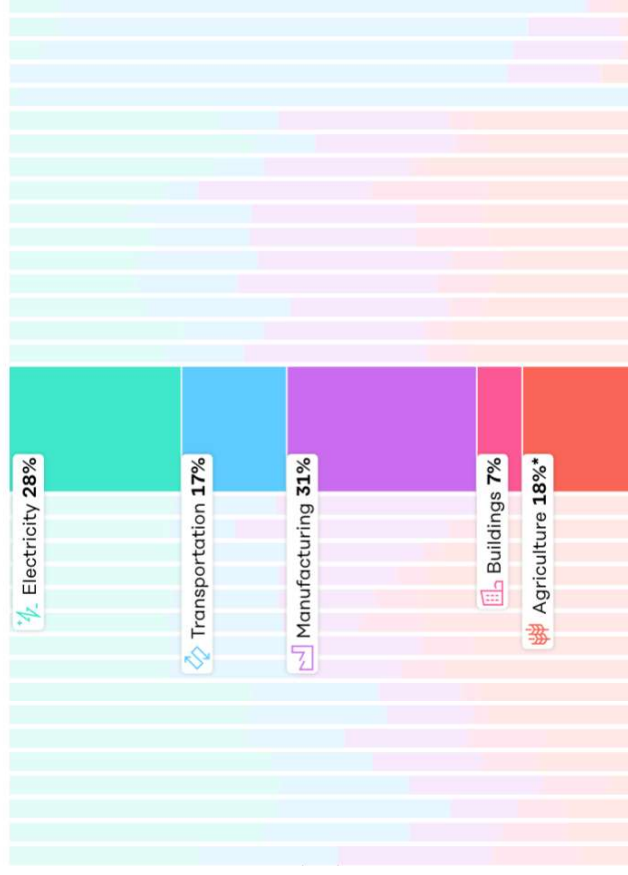
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BE Contrails established in 2021
to support contrail research and transition

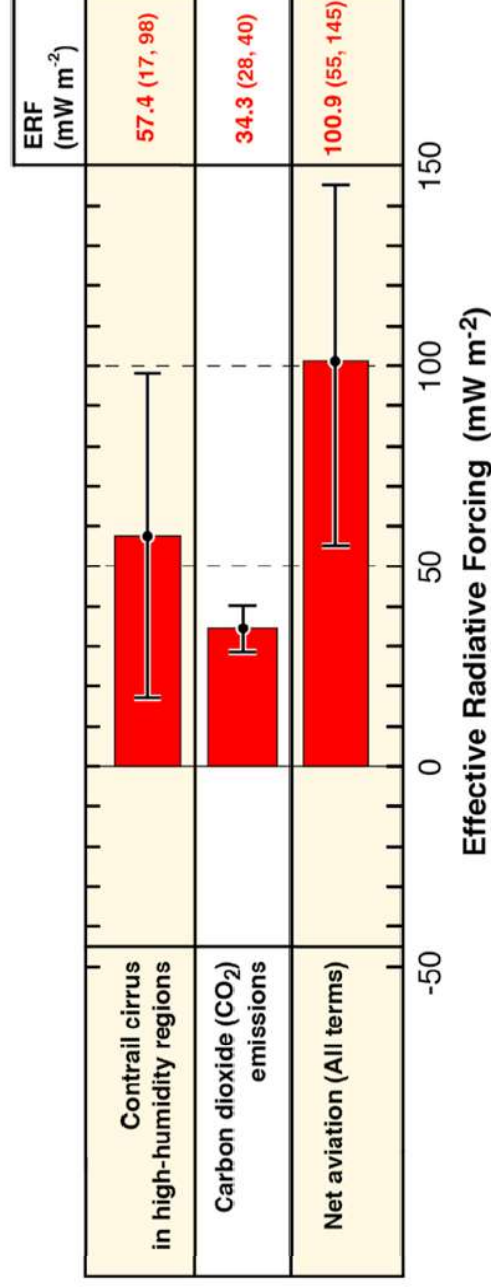
Emissions

Global ▾

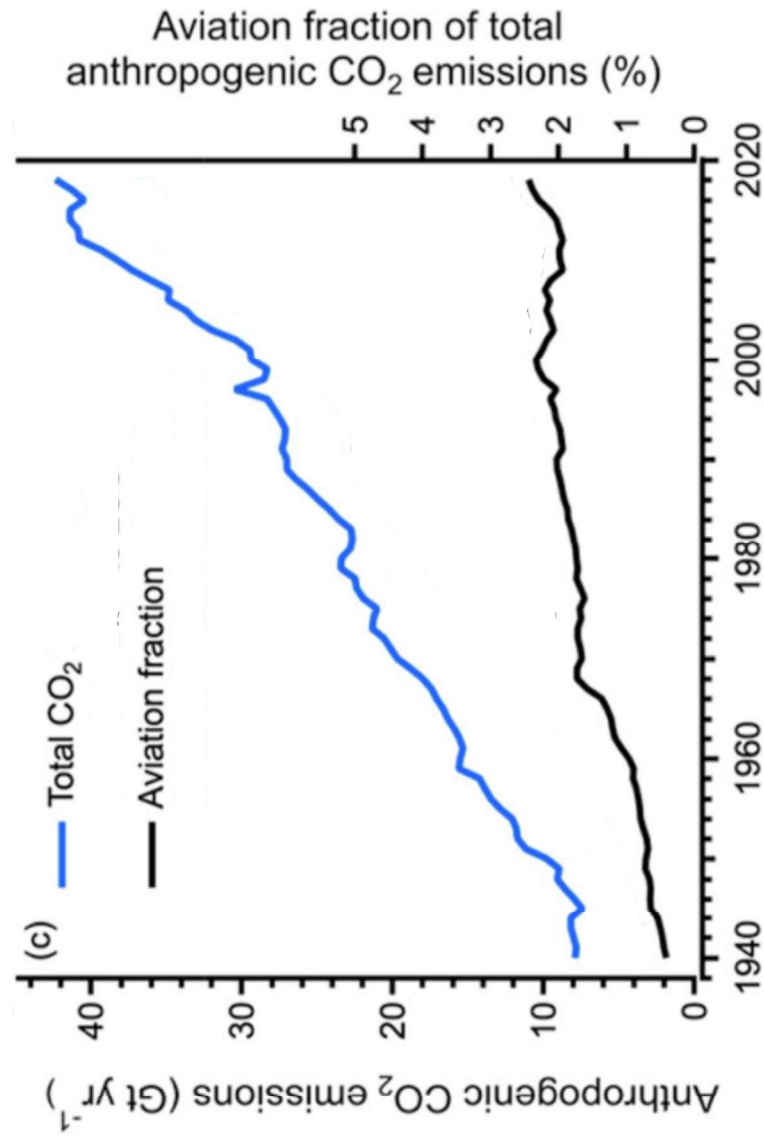


Motivation

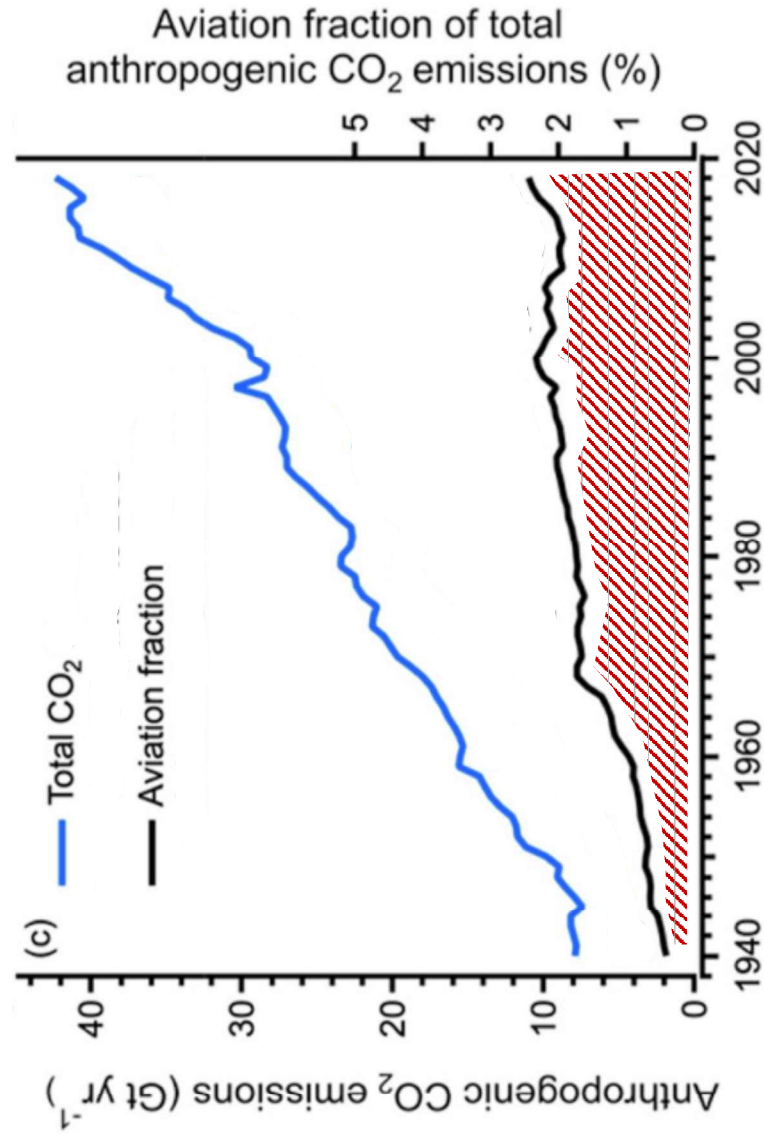
Effective radiative forcing from aviation



Aviation started emitting CO₂ in the 1940s



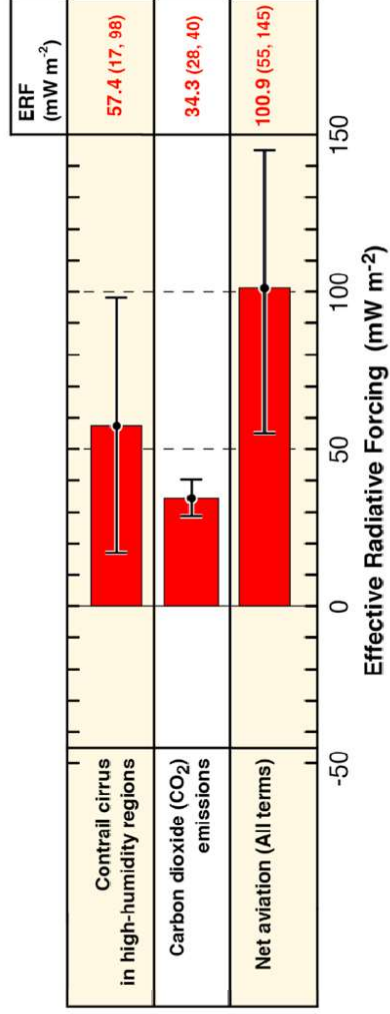
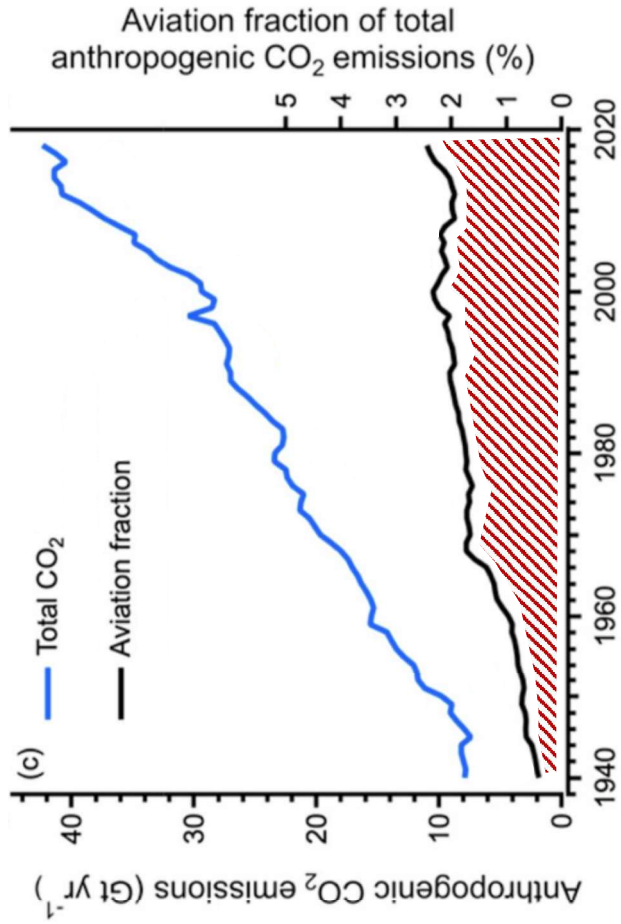
Aviation started emitting CO₂ in the 1940s



CO₂ emissions
~32 Gtonnes

Effective radiative forcing from aviation

Central estimate for contrail forcing (in 2018): **54.7 mW m⁻²** [17, 98]
Greater than the 2018 forcing from accumulated aviation emissions



Quantify by the social cost of additional CO₂

What is the social cost of an additional CO₂ mW m⁻² forcing?

A constant tonne of CO₂ additional in the atmosphere is worth the same as 1.5 to 2 tonnes of CO₂ emission for a 2 – 3% discount rate

Estimate of radiative forcing per tonne of atmospheric CO₂ = $1.6 \times 10^{-12} \text{ W m}^{-2}$

For a social cost of carbon is \$190/tCO₂ (EPA)

→ a constant radiative forcing of 1 W m^{-2} is worth ~\$200T in NPV terms.

Each additional CO₂ mW m⁻² is ~\$200B in NPV → central value for contrails ~\$11T

If we were willing to spend 1% of this NPV per year on contrail avoidance, we should be willing to spend ~\$100B per year

Estimate of radiative forcing per tonne CO₂

$$\text{RF} = 5.35 \text{ W m}^{-2} \text{ in } (\text{CO}_2/\text{CO}_{2\text{ref}})$$

$$\text{CO}_{2\text{ref}} = 3300 \times 10^9 \text{ tCO}_2$$

$$\text{RF per ton} = 1.6 \times 10^{-12} \text{ W m}^{-2}$$

The potential benefits far outweigh the risks

Sources of uncertainty

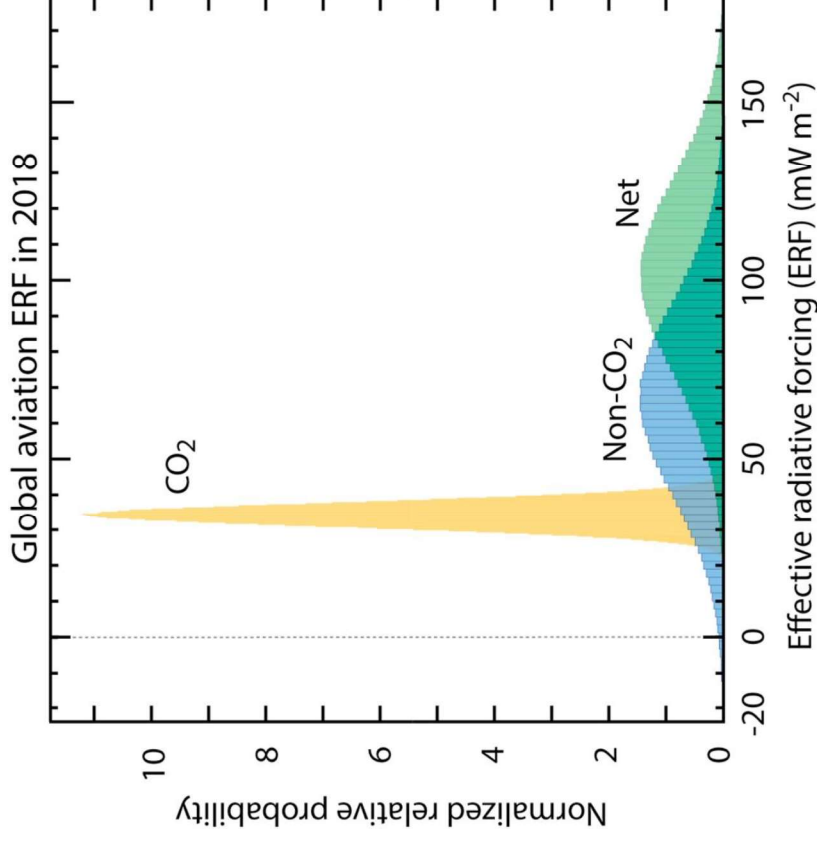
1. Predicting ice-supersaturated regions of the atmosphere
2. Aviation aerosol effects on natural cirrus
3. Forcing efficacy & climate feedback
4. Counterfactuals in mitigation

But even amid mitigation uncertainty, benefits far outweigh the costs

Minimal added fuel ($<1\%$) $\sim 0.01 \text{ mK / yr}$

Potential benefit $\sim 50 \text{ mW m}^{-2} \sim 10 \text{ mK}$

~ 1000 years for cost to outweigh benefits



Raising ambition

We can aim to avoid > 80% of contrail caused warming by modestly re-routing < 5% of aircraft at a fleet-average cost of < \$5 per flight

Remove 1 – 2% of human caused warming at a cost of < \$1 per ton CO2 equivalent in years

But there is a lot of work to do!

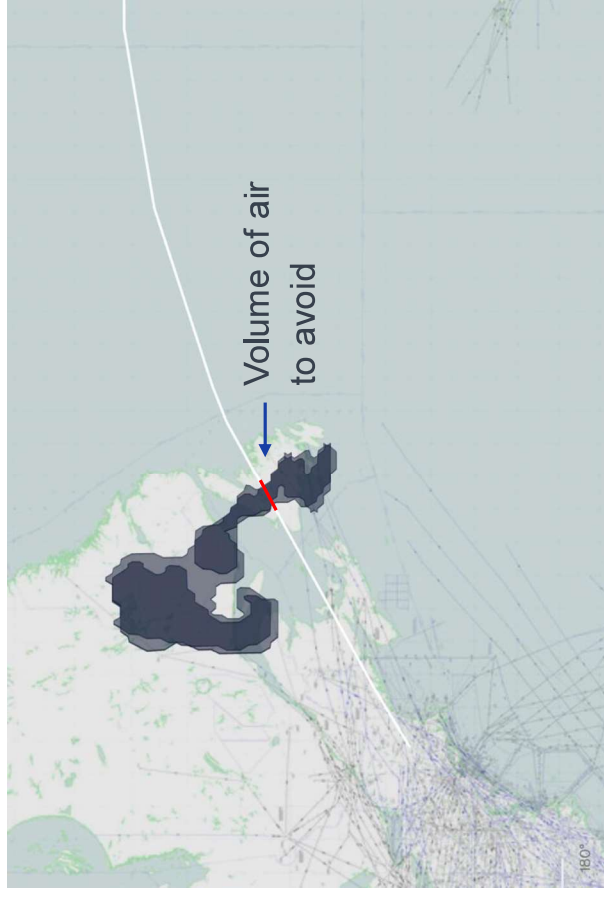
Contrail avoidance in practice

Navigation contrail avoidance

Re-routing to avoid key contrail forming regions at specific times

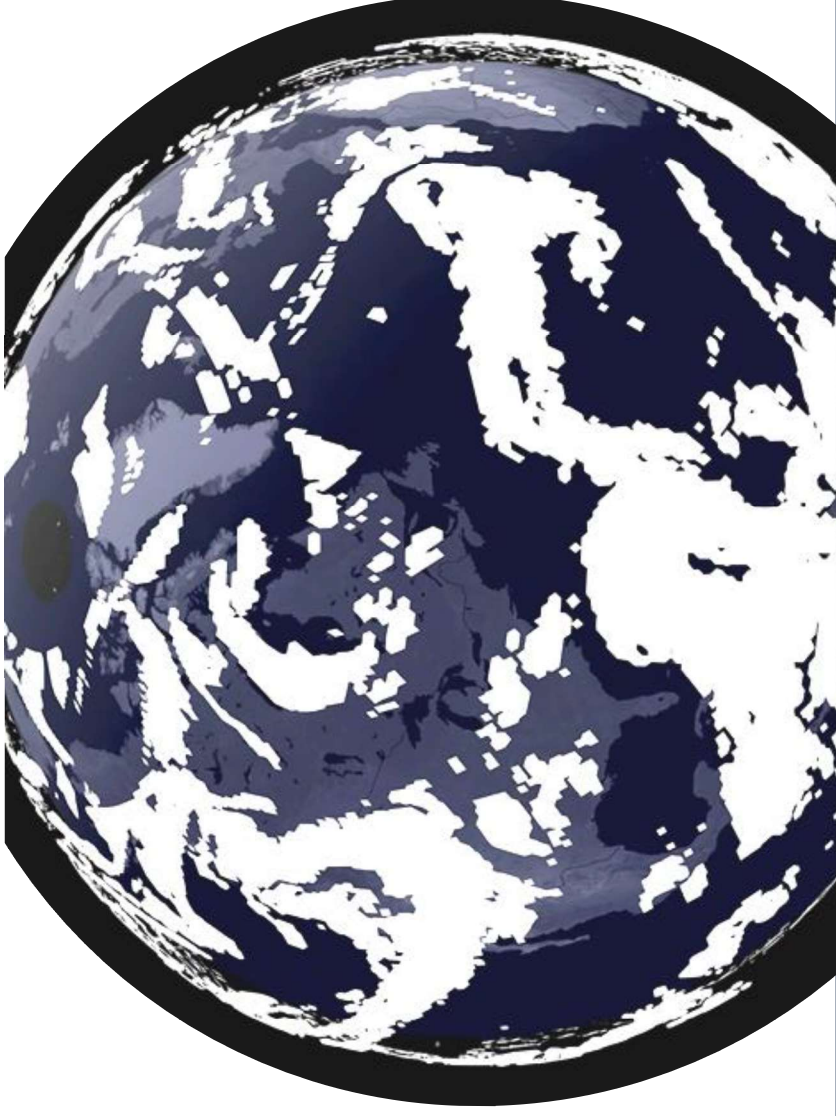
High level approach

1. Understand where contrail-cirrus will likely form
2. Characterize the expected climate effects
3. Integrate into flight planning and management
4. Verify actual outcomes



Contrails form in cold, humid regions of the atmosphere

Categorical avoidance would be effective, but completely avoiding persistent contrails regions is impractical to start



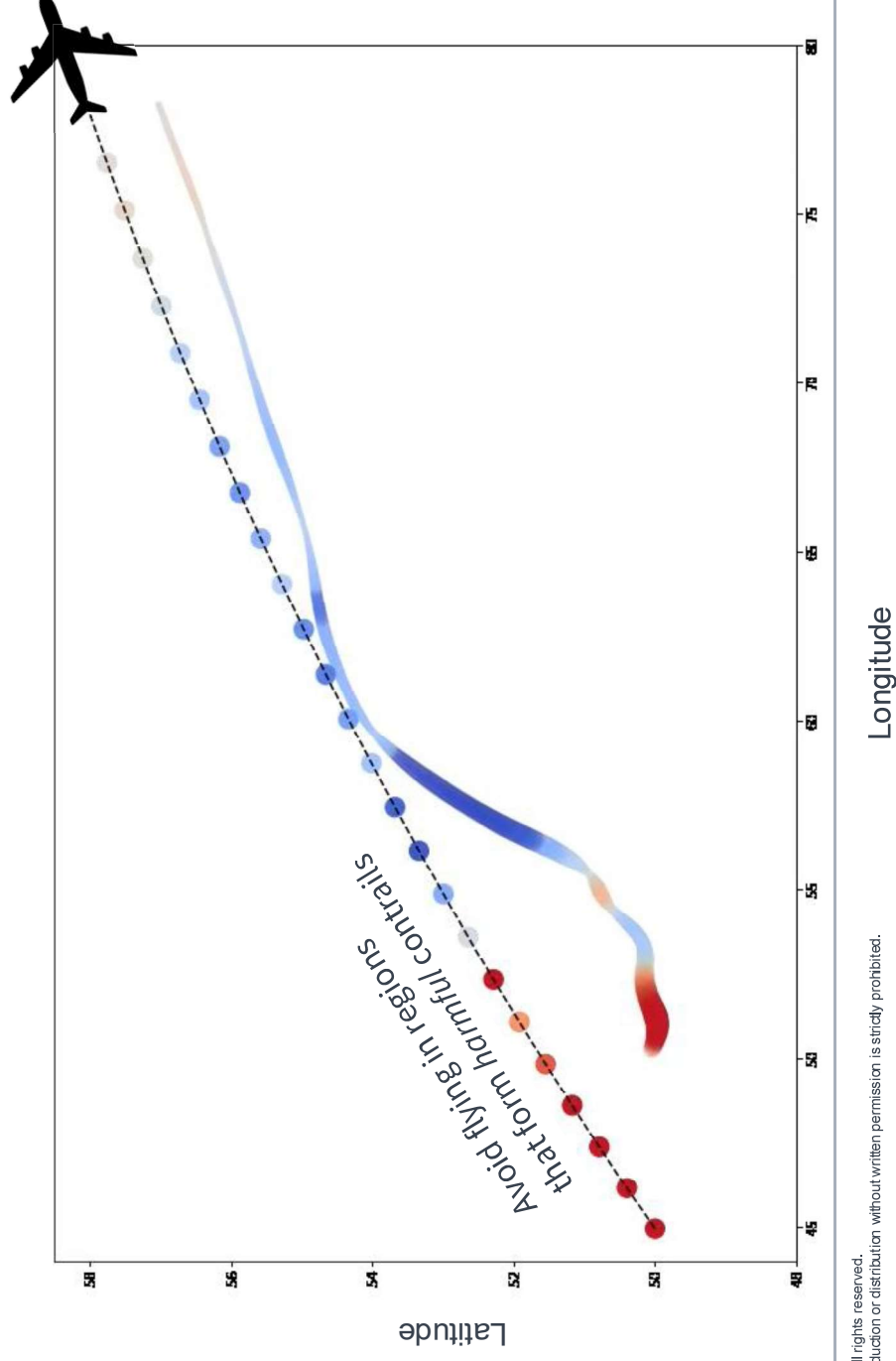
Not all contrail regions are created equal

Meteorology, engine emissions, albedo, diurnal / seasonal cycles – all dramatically affect radiative forcing



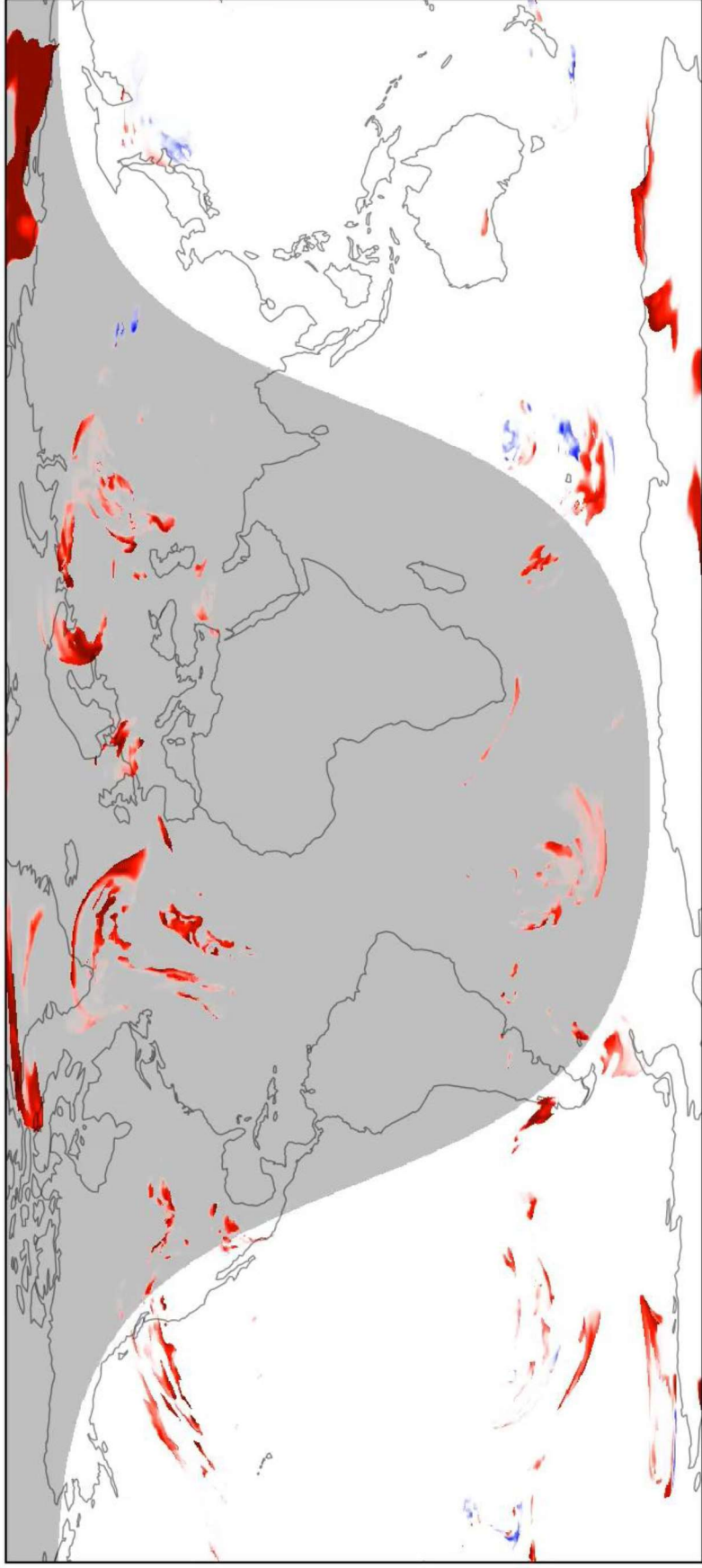
Track contrail evolution to understand climate effects

Avoid harmful regions by understanding persistence and downstream forcing



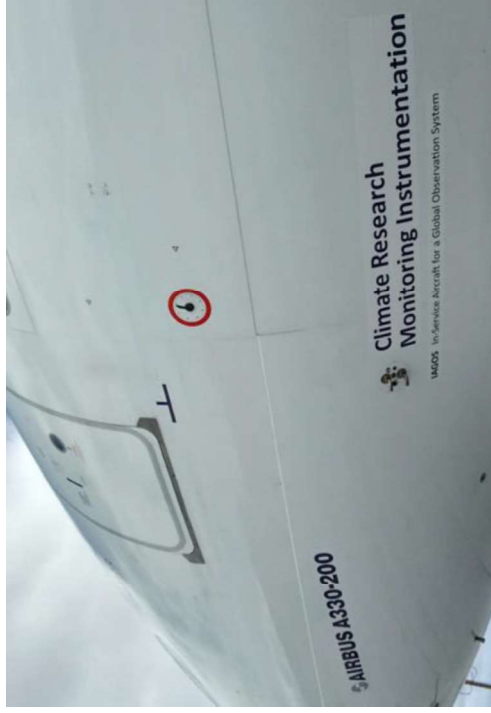
Contrail forecast + nowcast enables trajectory co-optimization

Planning tools can ingest and analyze contrail climate-forcing as any other “weather-like” data (e.g. icing, turbulence)



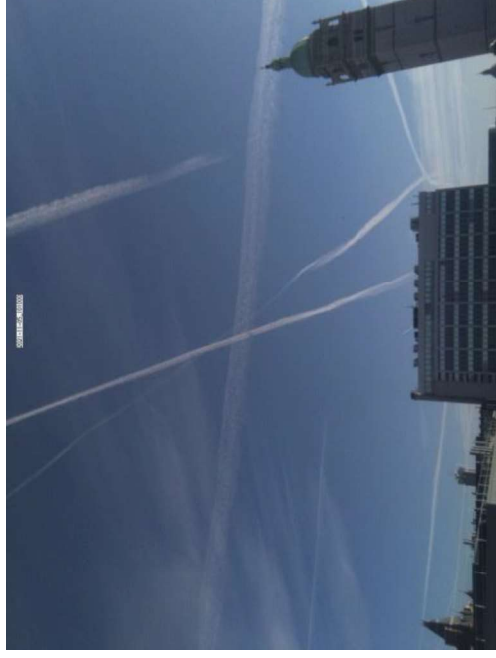
Contrail observations inform forecasts, nowcasts

Satellite and ground-based observations improve model accuracy and feed into contrail forecasts / nowcasts



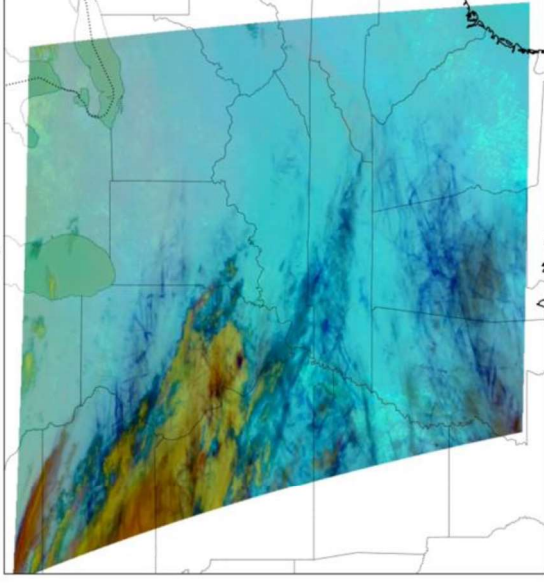
In-situ measurements

Airframe sensors
(IAGOS, WVSS-II)



Ground-based

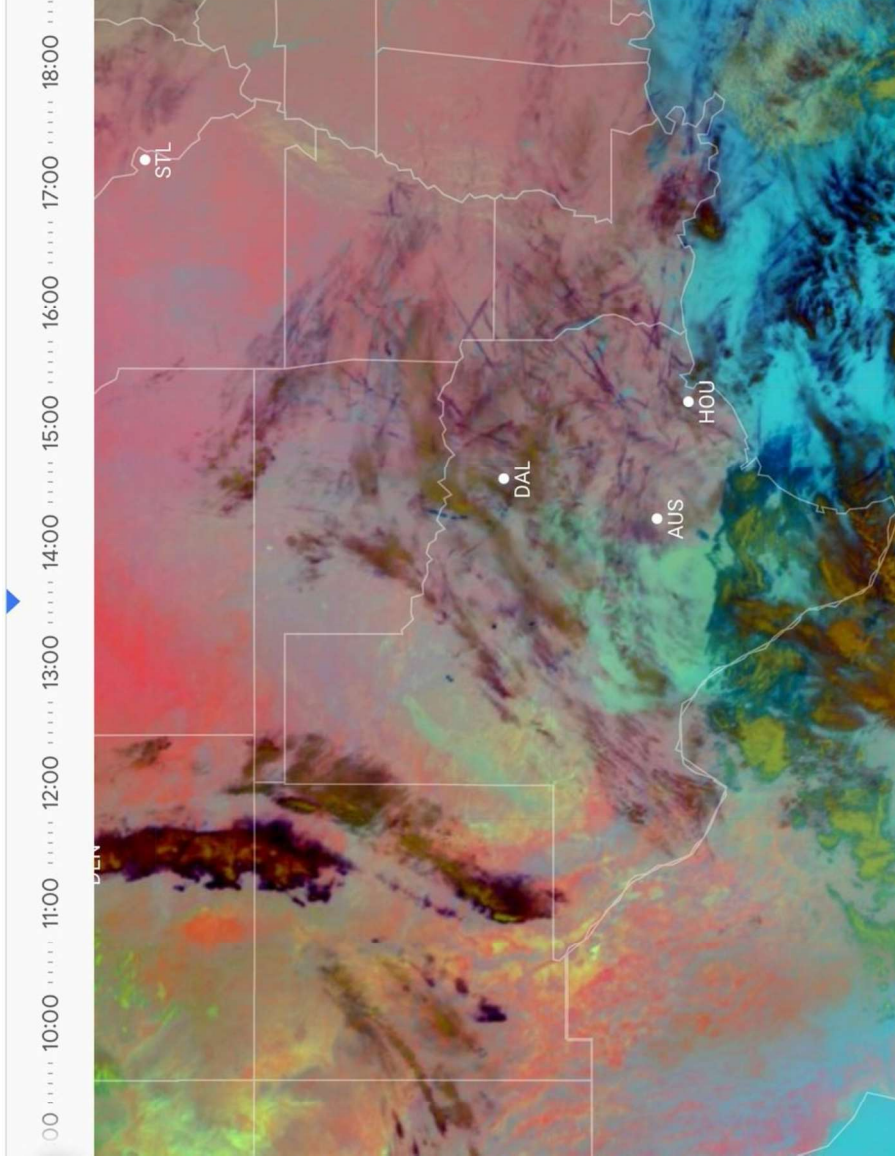
Fixed sky-observing cameras,
LIDAR (MPLNet)



Satellite

Radiometers, LIDAR, Sounders
(GOES, Meteosat, Landsat,
CALIPSO, CLOUDSAT)

Satellites detect contrail outbreaks in real time

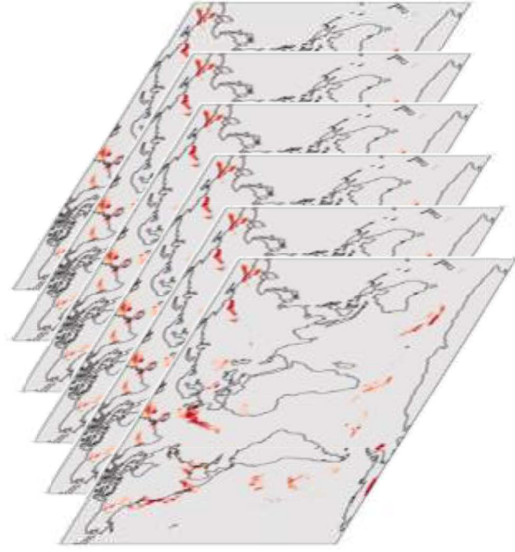


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<https://contrails.webapps.google.com/main>

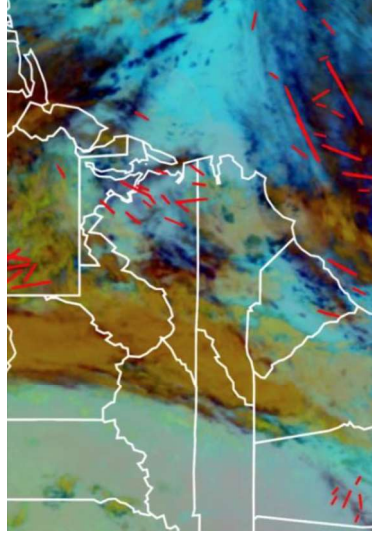
Focus on high-probability high-forcing regions in forecast

Use model ensembles and observations to generate expected values of contrail warming



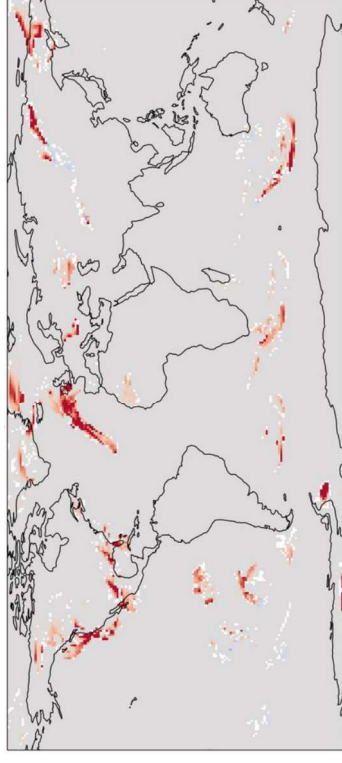
Generate contrail forecast ensembles

+



Assimilate observation sources

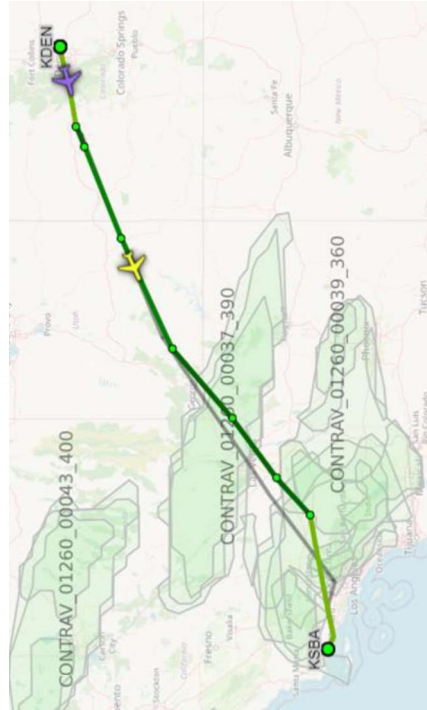
↑



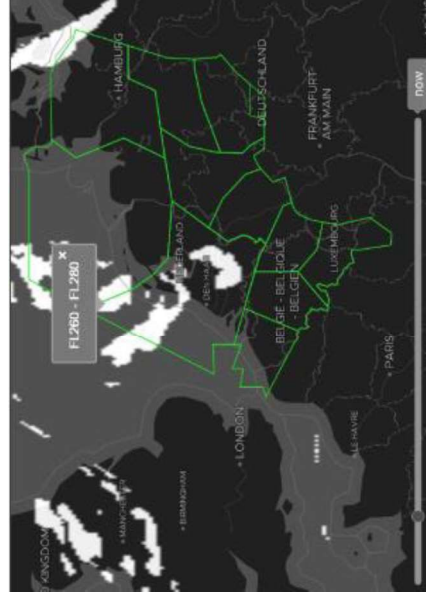
High-probability high impact contrail regions

Distribute at scale with aviation weather

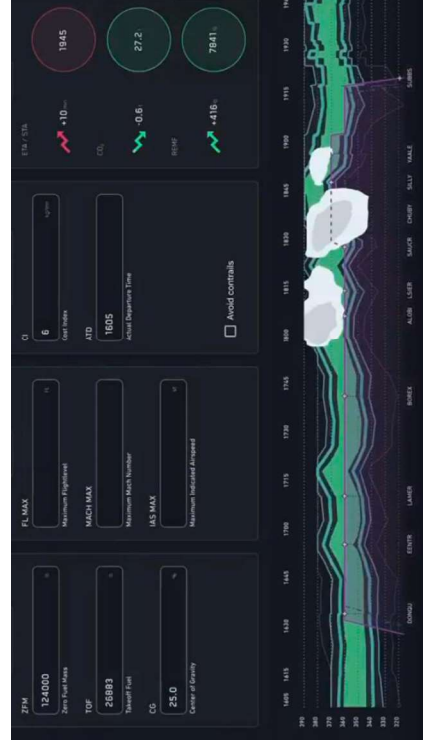
Low overhead, scalable integration into aviation planning cycle



Flight Planning

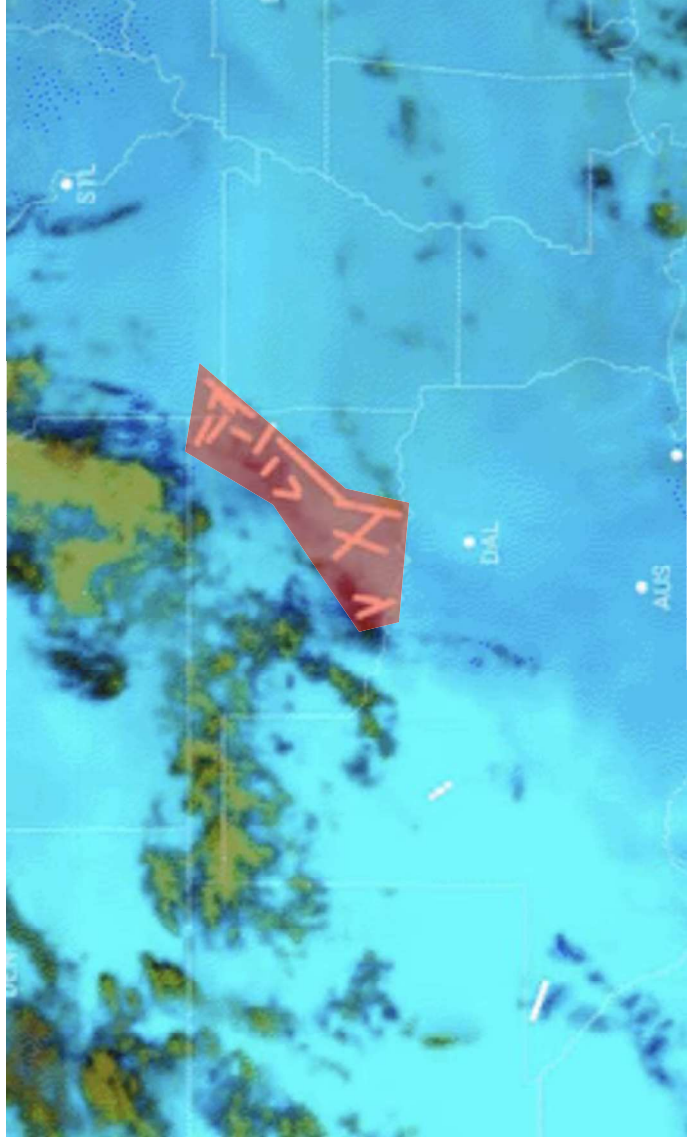
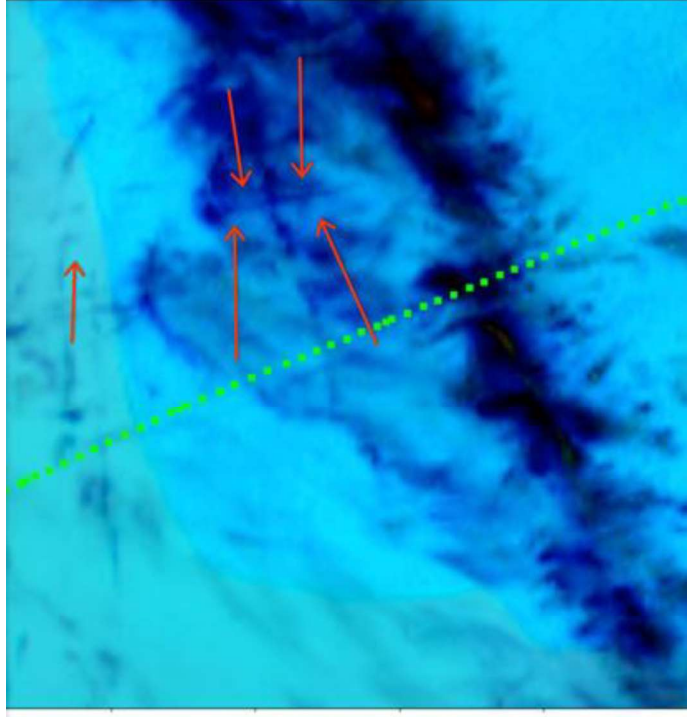


Air Traffic Control



Verify interventions with observational data

Ensure forecast / nowcast pipelines lead to reduction in contrail formation and contrail outbreaks overall

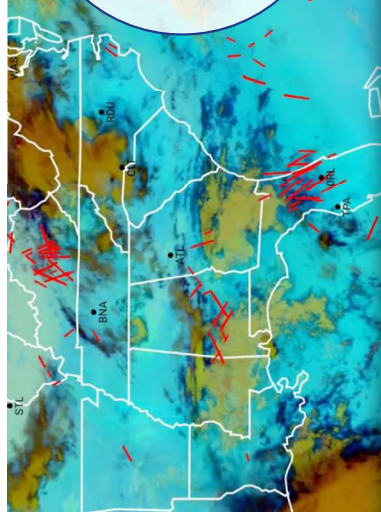


Continuously Improved

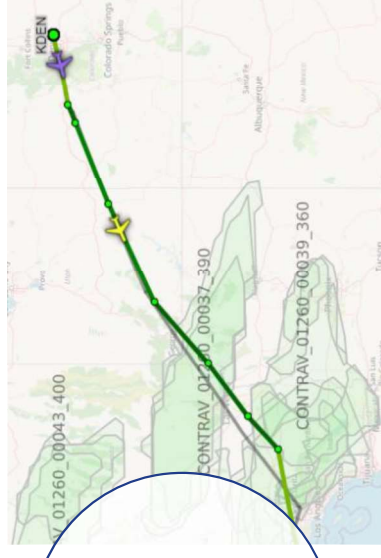
Observations assimilated in near-real-time



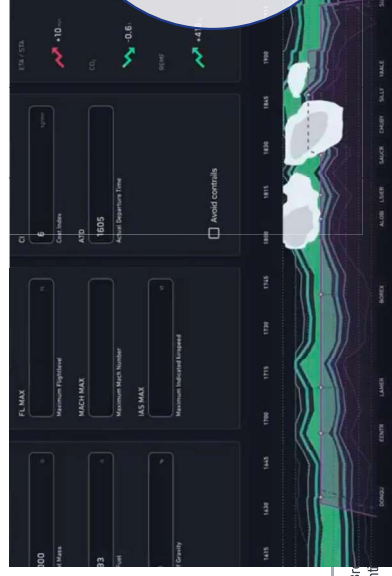
Contrail
forecast



Contrail
observations



Flight
planning



EFB
(Cockpit)



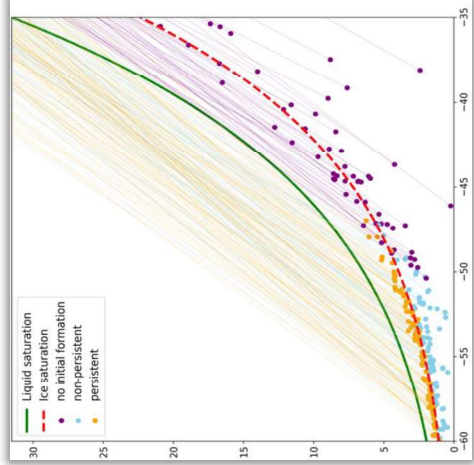
ATC

Recent progress



BE Contrails

Accelerating contrail research into action



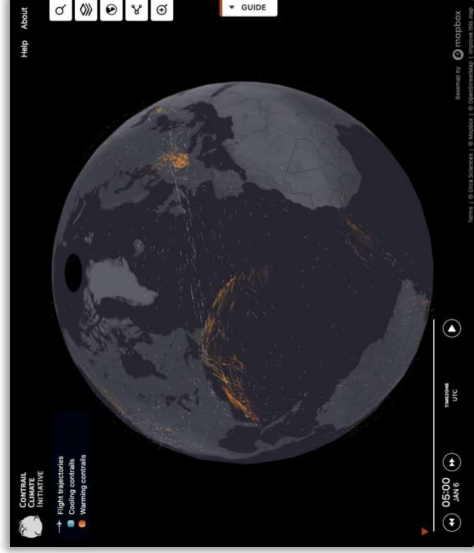
Contrails API OpenAPI
Model and data interface for contrail mitigation
Terms of service
Contact the developer

Trajectory Trajectory API

POST	/v0/trajectory/isar	Ice Super Saturated Regions
POST	/v0/trajectory/sac	Schmidt Appleman Contrail Formation Criteria
POST	/v0/trajectory/pcr	Persistent Contrail Regions
POST	/v0/trajectory/emissions	Emissions
POST	/v0/trajectory/cocip	Contrail Cloud Predictions

Grid Grid API

GET	/v0/grid/isar	Ice Super Saturated Regions
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EASA
EUROPEAN AVIATION SAFETY AND SUSTAINABLE AVIATION

FINAL REPORT
Updated analysis of the non-CO2 climate impacts of aviation and potential policy measures pursuant to the EU Emissions Trading System Directive Article 30(4)

Contract reference: MOVE/ESA/2019-475/512.817062
Date: September 2020

Science

Advance understanding of contrail climate impacts

Open Tools

Build open standards and capability for avoidance

Outreach

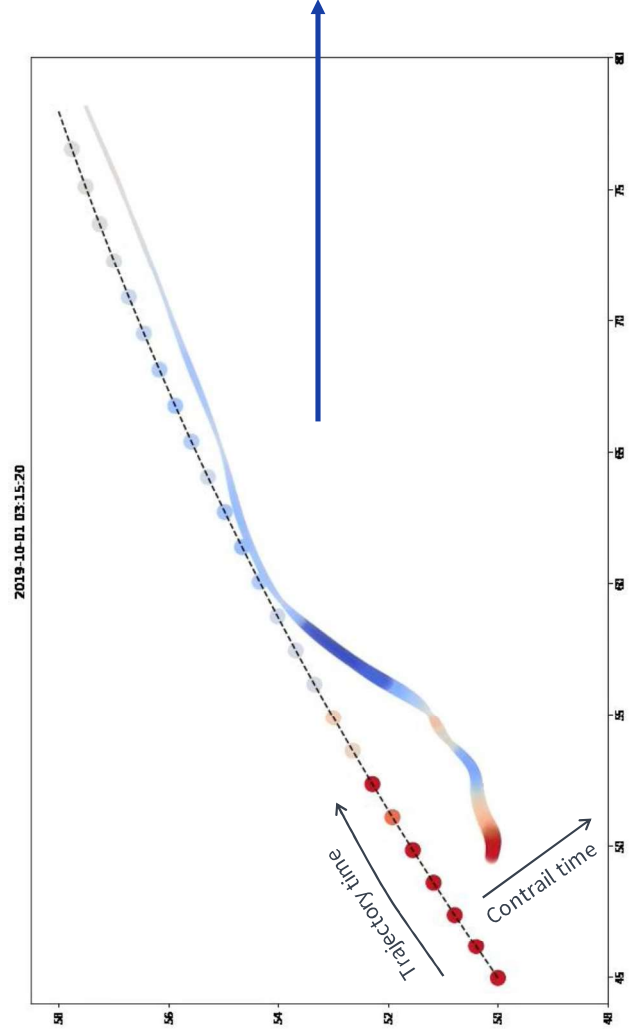
Educate and engage the industry and public

Policy

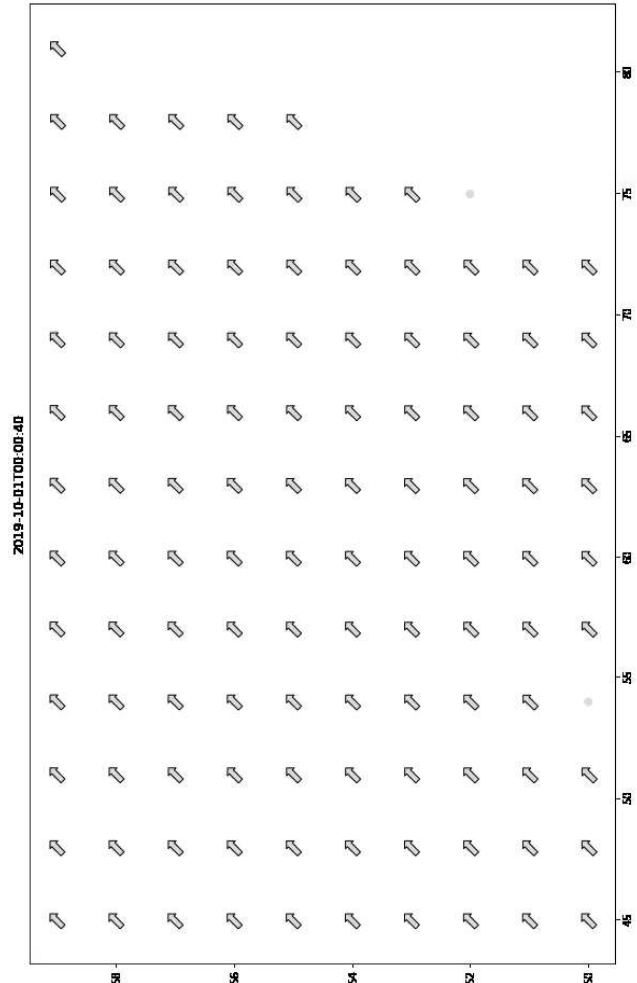
Inform regulations and incentive development

Establish prototype contrail forecast and implementation

Engberg et al (under review) "Forecasting Contrail Climate Forcing for Flight Planning and Air Traffic Management Applications: The CocipGrid Model in Pycontrails 0.51.0" *Geoscientific Model Development* <https://doi.org/10.5194/egusphere-2024-1361>



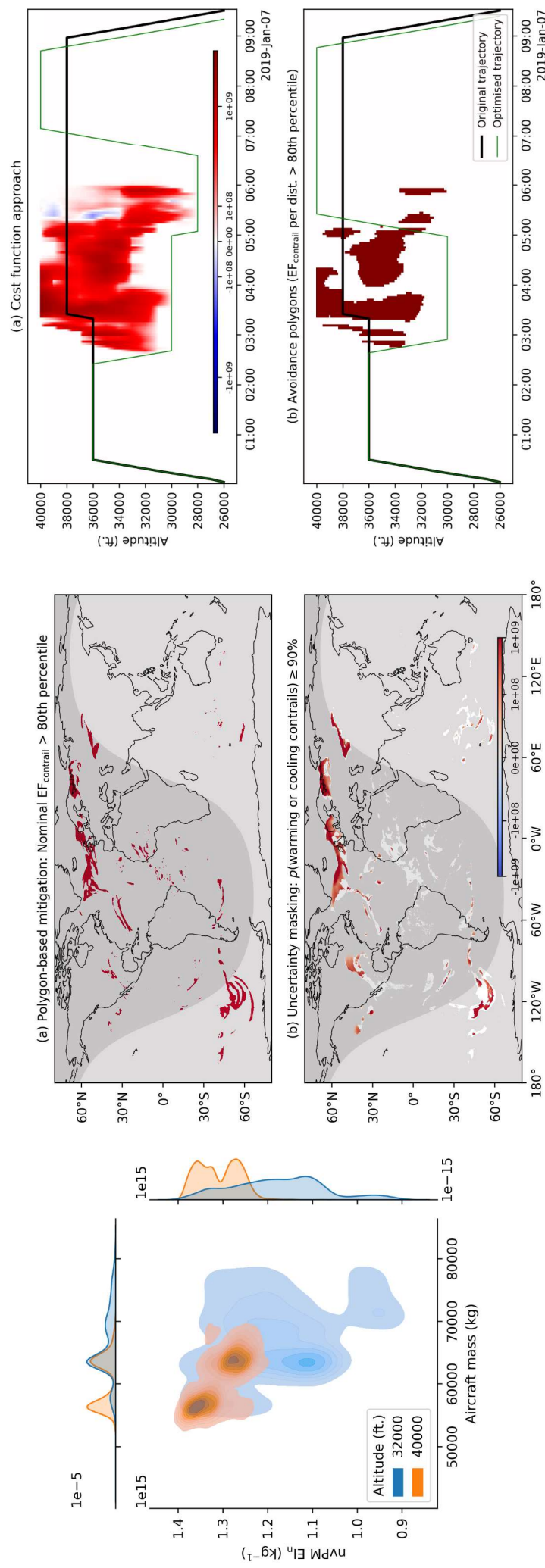
Contrail evolution for flight segments



Contrail evolution for grid of infinitesimal segments

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Engberg et al (under review) "Forecasting Contrail Climate Forcing for Flight Planning and Air Traffic Management Applications: The CocipGrid Model in Pycontrails 0.51.0" *Geoscientific Model Development* <https://doi.org/10.5194/egusphere-2024-1361>



Aircraft classes

Uncertainty masking

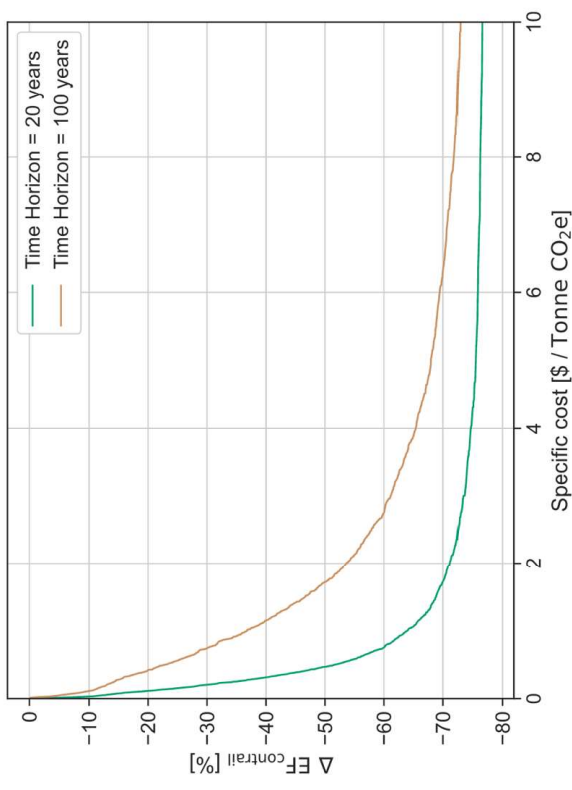
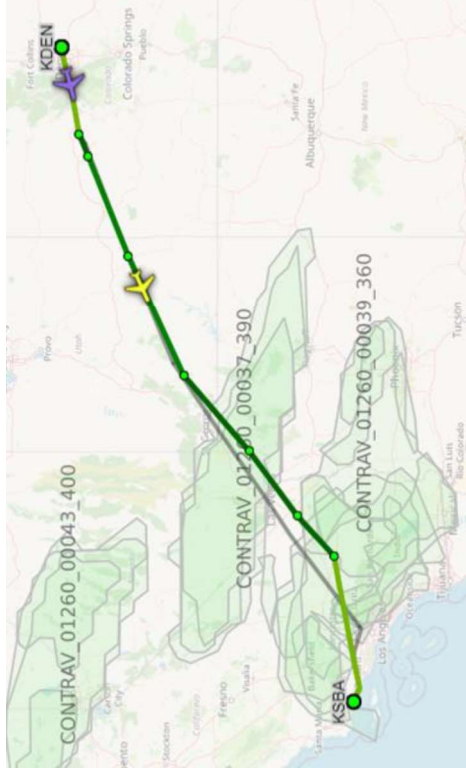
Trajectory optimization

Quantify cost and feasibility in flight planning system

Frias et al (2024) "Feasibility of Contrail Avoidance in a Commercial Flight Planning System: An Operational Analysis." *Environmental Research: Infrastructure and Sustainability* <https://doi.org/10.1088/2634-4505/ad310c>

High-fidelity contrail avoidance simulation on 84,839 flights in commercial flight planning system

Total cost to the airline **+0.08%** (or +0.11% CO₂ emissions)



Trial forecast model in live trials

(→ Google presentation to follow)

“Pilot” project w. American Airlines

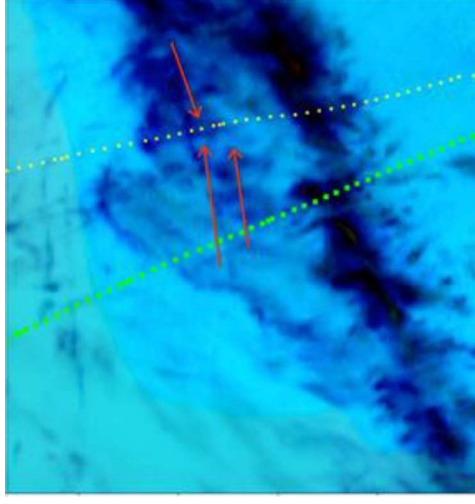
- Jan – Jun 2023
- Manually communicated flights levels forecast to generate contrails
- Evaluate contrail formation manually from GOES

Next step is automated trials via flight planning

Developing additional trials with multiple other airlines and w. Airbus in the CICONIA project



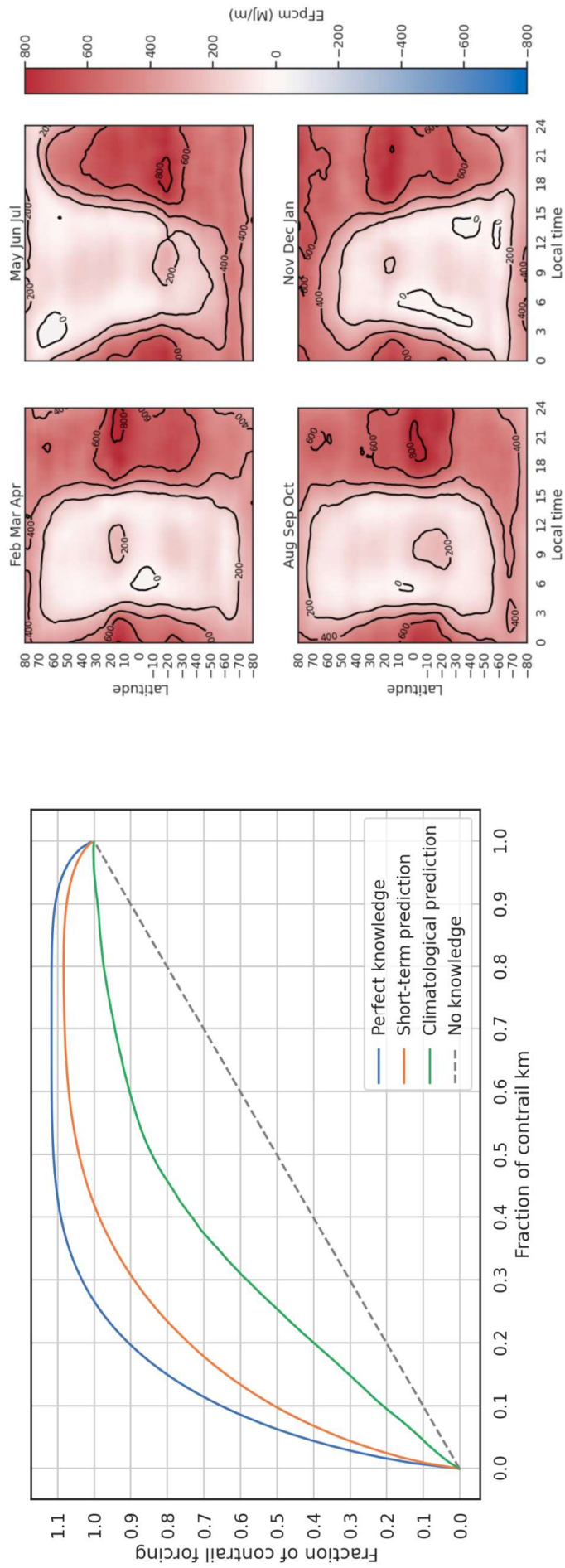
Contrail forecast on pilot iPad



Verification using GOES and advected emissions path

Evaluate the effect of uncertainty on forecast skill

Platt et al (2024) "The Effect of Uncertainty in Humidity and Model Parameters on the Prediction of Contrail Energy Forcing." *Environmental Research Communications*. <https://doi.org/10.1088/2515-7620/ad6ee5>



Seasonal maps of
contrail climatology

Open-source aviation climate impact models

Contrail model implementations (CoCiP, aCCF), comparison with observations (GOES), integration with climate models, utilities

2023-02-10 18:05:00

contrailcyrus / pycontrailsPublic

< Code

Issues 23

Pull requests 4

Discussions 0

Actions

Security

Insights

Settings

main 6 branches 16 tags

Go to file

Add file

Code

tdream1 Updates CHANGELOG

9a55788 1 hour ago 406 commits

github

docs

pycontrails

tests

gligignore

pre-commit-config.yaml

zenodo.json

CHANGELOG.md

CONTRIBUTING.md

LICENSE

Makefile

NOTICE

README.md

RELEASE.md

pyproject.toml

setup.py

Update test.yaml to include pwif

Add Eckel reference

Fixes typing issues

Fixes typing issues

Add tests, example for airports

Remove nb-clean, re-run all notebooks, fix broken links

Add ORCID id to zenodo reference

Updates CHANGELOG

Remove link to napolean docstring example

Remove extraneous license info, add to public API, add more met...

fix link

Update NOTICE

add zenodo badge

Add note about release action

Addresses all of Zeb's comments

remove nogil

1 hour ago

last week

1 hour ago

1 hour ago

3 weeks ago

2 months ago

last month

1 hour ago

3 weeks ago

2 months ago

last month

last month

2 months ago

2 months ago

1 hour ago

last month

About

Python library for aviation climate impacts

pycontrails.org

Readme

Apache-2.0 license

10 stars

2 watching

4 forks

Report repository

Releases 10

v0.42.0 Latest 3 weeks ago

+ 9 releases

Contributors 4

zabergberg

mishapiro Marc Shapiro

tdream1 Tom Dean

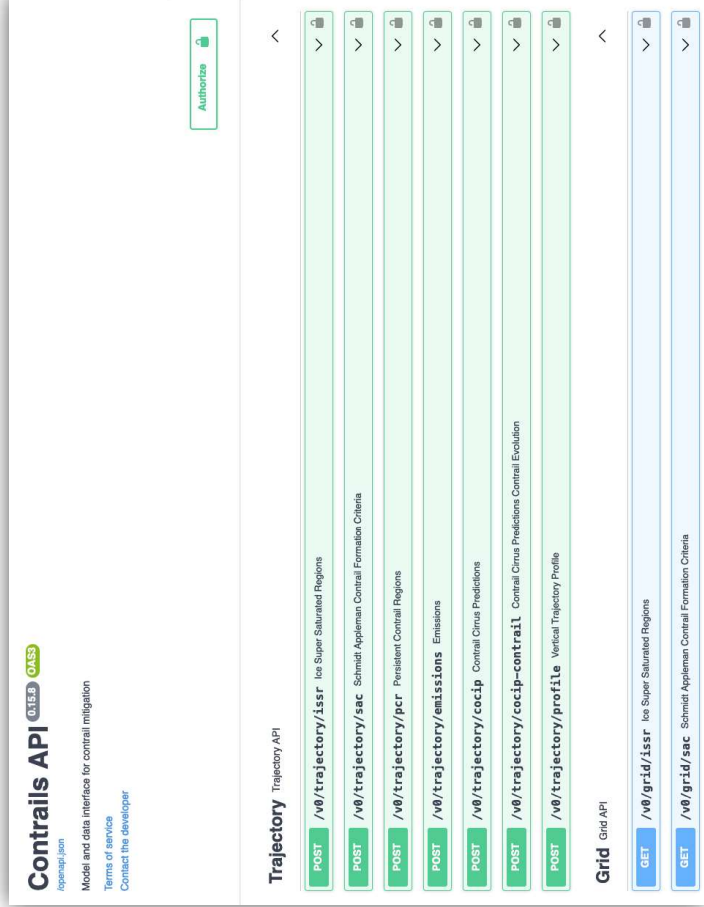
marcstettler Marc Stettler

<https://py.contrails.org>

Dry-advection of aircraft emissions

Develop standard interface for contrail data

API access to forecast data, verification tools, and historical impact data. Dashboard presents data visually.



<https://api.contrails.org>

<https://forecast.contrails.org>

Flight Emissions Report

Flight by flight estimates of aircraft emissions, flight length with persistent contrails, climate forcing, satellite verification

icao_address	callsign	tail_number	flight_number	engine_uid	aircraft_type	ef_mj	fuel_burn_kg	co2_kg	total_nox_kg	h2o_kg	so2_kg
484560	KL604	PH-BVC	KL604	01P21GE217	B77W	1050212822	72019	227509	1416.86728	88584	86.42348674
484445	KL618	PH-AOF	KL618	01P14RR102	A332	439032747	30732	97084	416.297248	37801	36.87924148
4851F5	KL172	PH-BVR	KL172	01P21GE217	B77W	26977685	60267	190385	1197.50777	74129	72.32105243
485ECC	KL758	PH-BVV	KL758	01P21GE217	B77W	3744199	72850	230134	1545.4705	89606	87.42050485
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4850F6	KL226	PH-BVN	KL882	01P21GE217	B77W	210974093	59253	187181	1161.75788	72881	71.10391038
484F73	KL765	PH-AKD	KL765	01P14RR101	A333	-14101903	43343	136923	578.950543	53313	52.01289047
48436E	KL706	PH-BQG	KL706	2RR027	B772	5900514	65112	205691	1061.58094	80088	78.13553767
486072	KL644	PH-BKM	KL644	01P17GE213	B78X	25637975	31810	100490	501.440326	39127	38.17292012
4851B3	KL168	PH-BVP	KL168	01P21GE217	B77W	136086591	53141	167874	1025.84987	65364	63.77003547
485788	KL258	PH-BHP	KL258	01P17GE212	B789	33237115	50286	158856	752.126157	61852	60.34422425
484F18	KL46D	PH-BCB	KL1952	01P11CM116	B738	0	6206	19606	65.9145071	7634	7.447911649
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484558	KL1266	PH-BGA	KL1266	01P11CM116	B738	0	1311	4142	15.1252669	1613	1.573714708
48418D	KL1248	PH-BXS	KL1248	01P11CM121	B739	0	4230	13362	50.2690645	5203	5.076140307
484550	KL1162	PH-BGF	KL1162	01P11CM114	B737	-27856816	1873	5916	19.7887309	2303	2.247645371
3C5D43	KL1838	D-AKJC	KL1838	8GE116	E190	0	908	2870	9.19735684	1117	1.090534493
485A35	KL708	PH-BCL	KL1350	01P11CM116	B738	-75827	1603	5065	17.6494917	1972	1.924242737
484C54	KL1708	PH-EZP	KL1708	8GE116	E190	0	342	1081	2.97187228	421	0.410958423
3C76EF	KL1282	D-AMWO	KL1282	8GE116	E190	0	929	2935	9.2662464	1142	1.115118352
484132	KL490J	PH-BXC	KL1770	01P11CM116	B738	0	1304	4120	14.6392234	1604	1.565154218
484163	KL492B	PH-BXK	KL1228	01P11CM116	B738	0	1648	5208	18.8749505	2028	1.978692551
484B31	KL1982	PH-EZD	KL1982	8GE116	E190	0	2529	7990	24.470164	3111	3.035381263
484B30	KL1150	PH-EZC	KL1150	8GE116	E190	0	2266	7158	22.8454289	2787	2.719424558
484CC3	KL1184	PH-F7S	KL1184	8GE116	F190	0	1038	3281	10.8770764	1277	1.245366486

Transition research into industry action



Contrail Science & Technology Network

Global NGO cohering research, standards, and advocacy

<https://www.contrails.org>

Mission

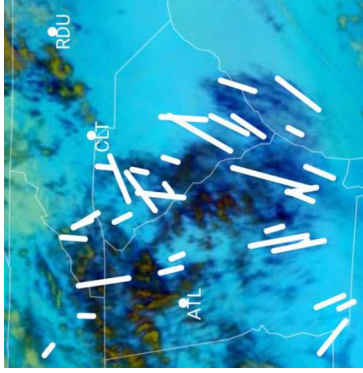
Avoid > 80% of contrail caused warming by modestly re-routing < 5% of aircraft at an average cost of <\$5 per flight

Remove 1 – 2% of human caused warming at a cost of < \$1 per ton CO₂ equivalent

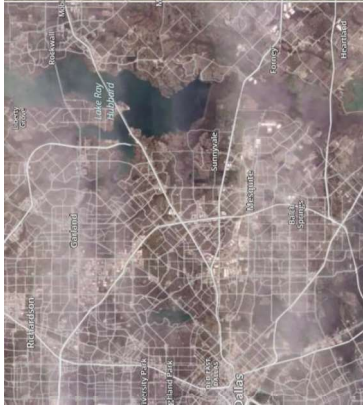
Call to action

Critical gaps

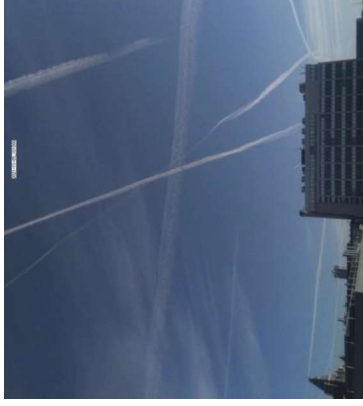
1) Contrail observations need to be improved to inform and verify avoidance



Geostationary (GEO) too coarse to resolve flights



Low-earth orbit (LEO) too sparse to track evolution



Ground cameras sparse



Very few humidity sensors in service

2) No incentive exists to drive testing and adoption

Submit grant to the EU Innovation Fund (€20M) to fund trials, but not enough to support ongoing mitigation

3) Air Navigational Service Providers (ANSPs) are missing from the development

The need for an ambitious research agenda on contrails

Negative contrail climate effects are avoidable

A major portion of these effects are avoidable in a short timeframe (years)

We have the tools to test and learn how to do this today – and improve over time

The need for an ambitious research agenda on contrails

Negative contrail climate effects are avoidable

A major portion of these effects are avoidable in a short timeframe (years)

We have the tools to test and learn how to do this today – and improve over time

→ Contrail avoidance is likely the cheapest and fastest way to mitigate the climate effects of aviation

“We know of no comparable climate investment with a similarly high likelihood of success.”

— Caldeira & McKay, 2021, *Nature*

The need for an ambitious research agenda on contrails

Researchers, regulators, and industry are lacking the resources to prioritize this today

- We need **airlines** to run trials and build contrail awareness into dispatch and pilot workflows
- We need **meteorologists (NOAA, AWC, WMO) and climate scientists (DoE)** to improve upper-troposphere weather prediction, data assimilation, ice microphysics, atmospheric feedback, and long-term impacts
- We need **regulators (FAA, Eurocontrol)** to support airspace-wide trials, and provide historical flight data for climate model testing and emissions assessment
- We need **new sensing platforms (NASA, EUMETSAT)** to improve remote sensing of contrail cover and radiative impacts
- We need **global coordination (particularly N. America and Europe)**
 - **Contrail free zones in N. Atlantic?**



More info
contrails.org

Contact

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BE Contrails core team

Accelerating the transition of contrail research into actionable climate solutions



Marc Shapiro



Zeb Engberg



Tom Dean



Tristan Abbott



Nick Masson



Matteo Mirolo

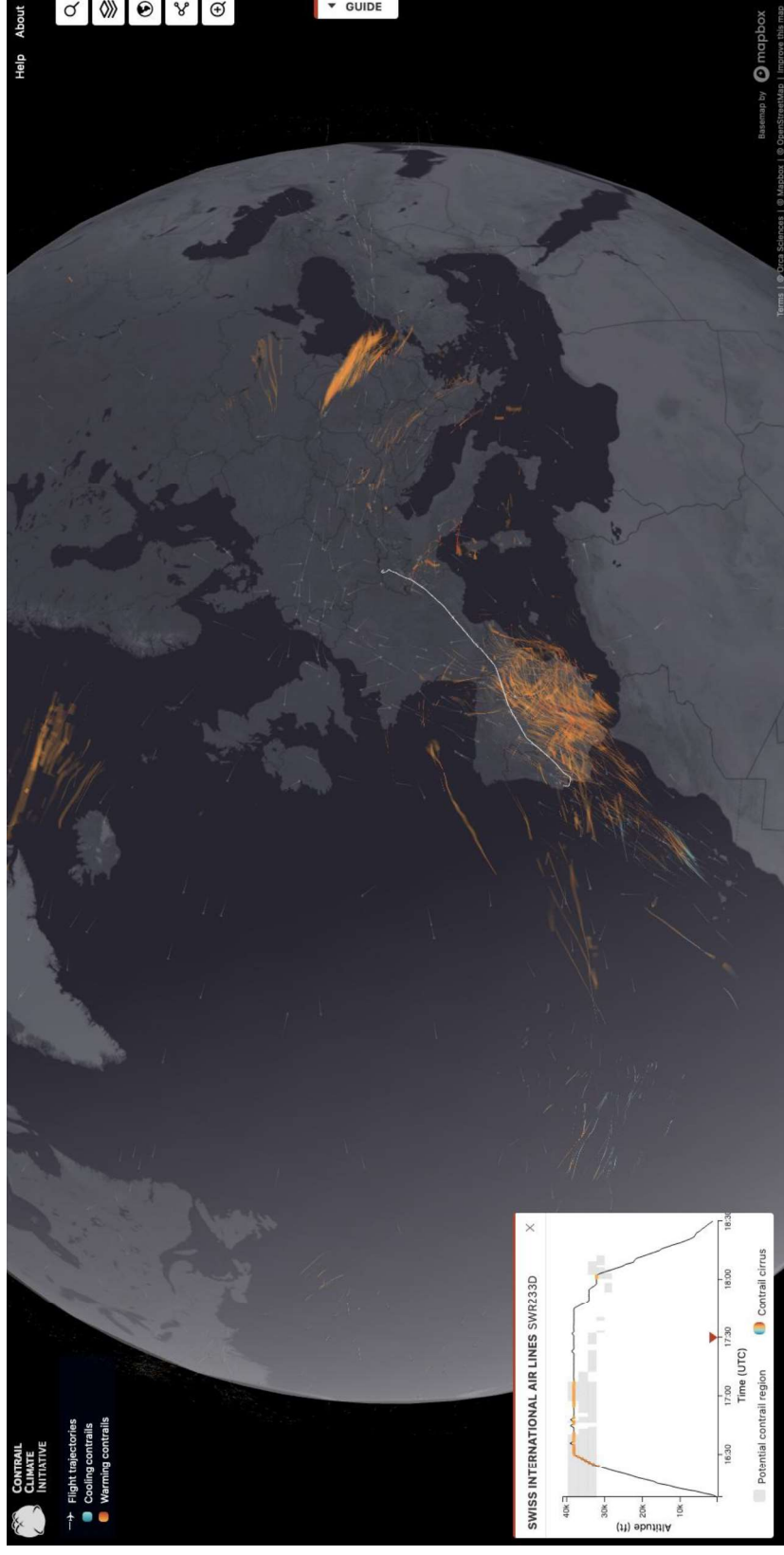
Advisors

- Eric Toone (BE), Ian McKay (Orcas), Ken Caldeira (Carnegie Sciences), Dick Benschop (Mission Possible)

Details

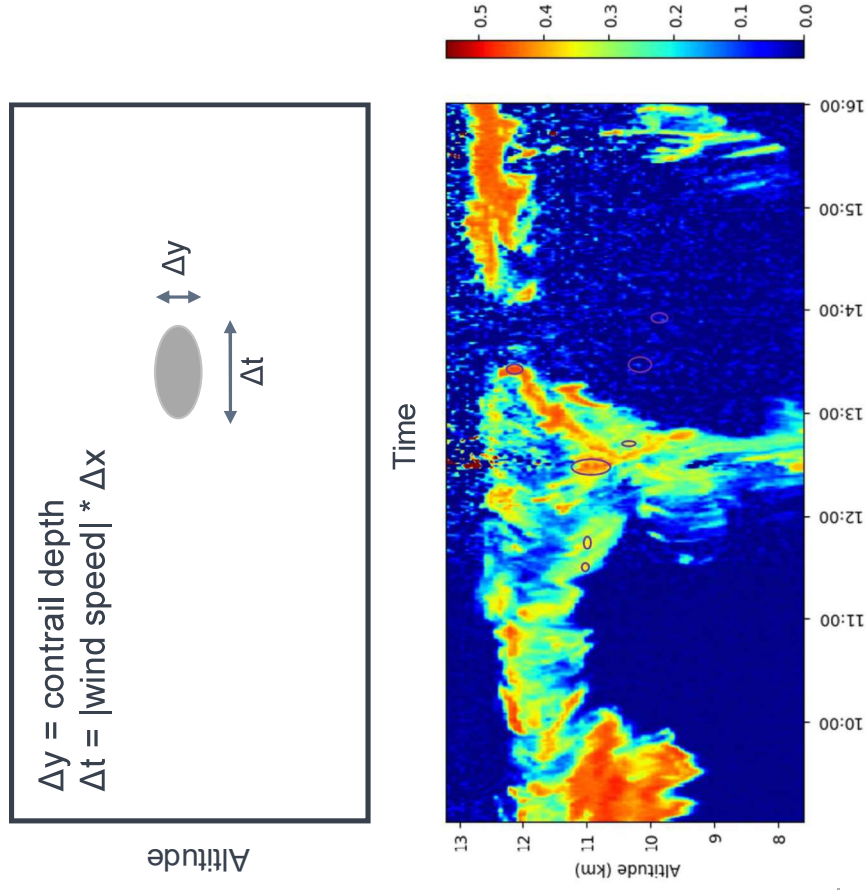
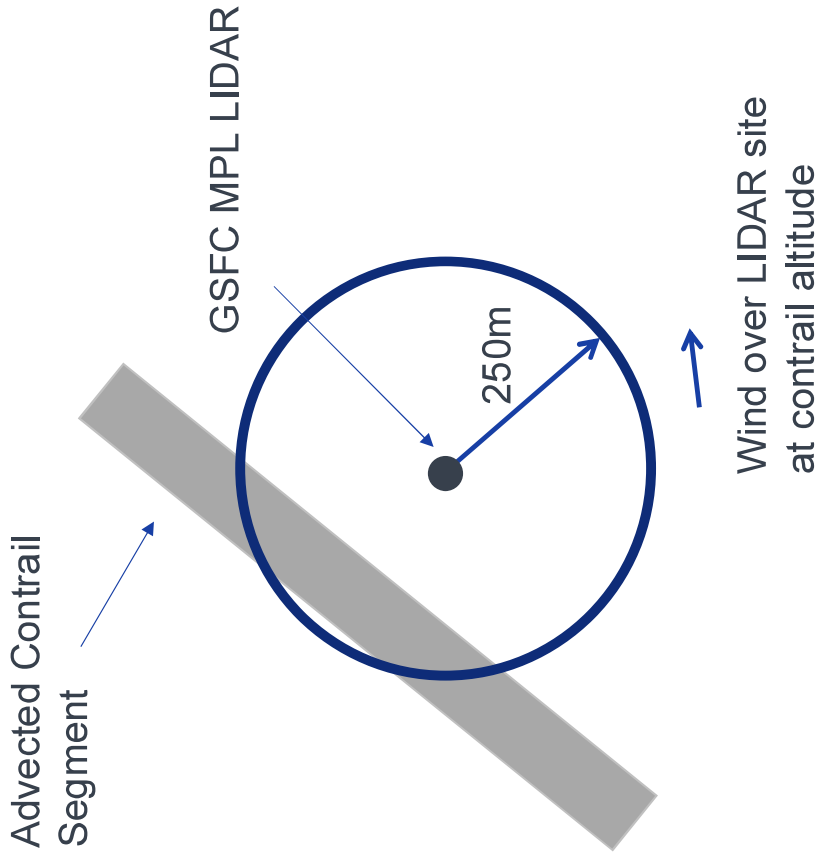
Visualize global contrails on interactive map

<https://map.contrails.org>



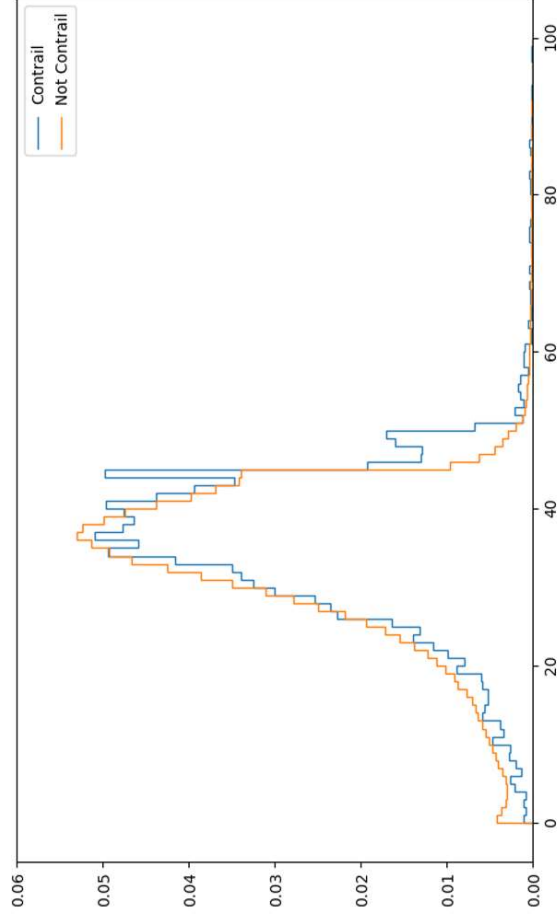
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Investigate LIDAR returns for contrail observations

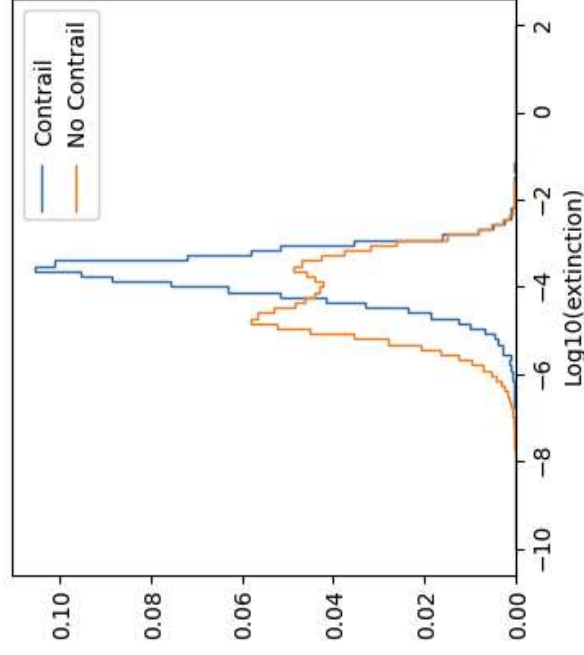


Investigate LIDAR returns for contrail observations

High depolarization ratio and extinction attributed to relatively high optical absorption of contrails
Related to the mechanism of their formation (i.e., nucleation on black carbon).



Empirical PDF estimates of the depolarization ratio



Empirical PDF estimates of extinction from aerosols

AA “pilot” study

Structure

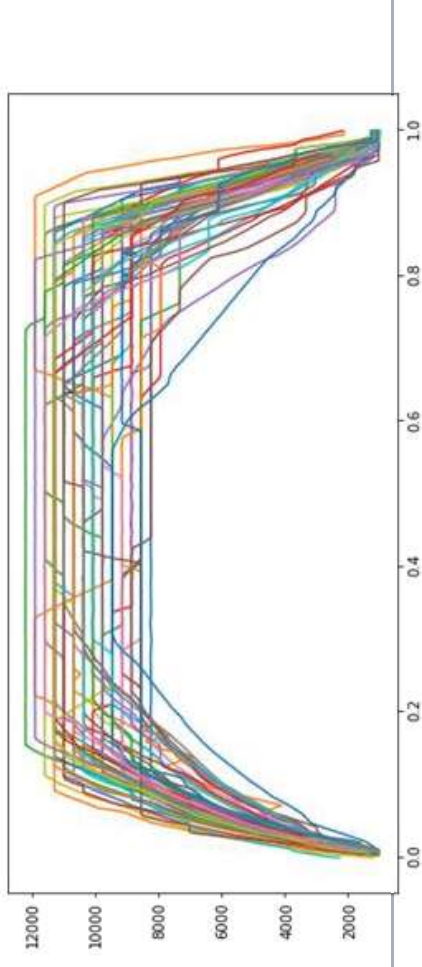
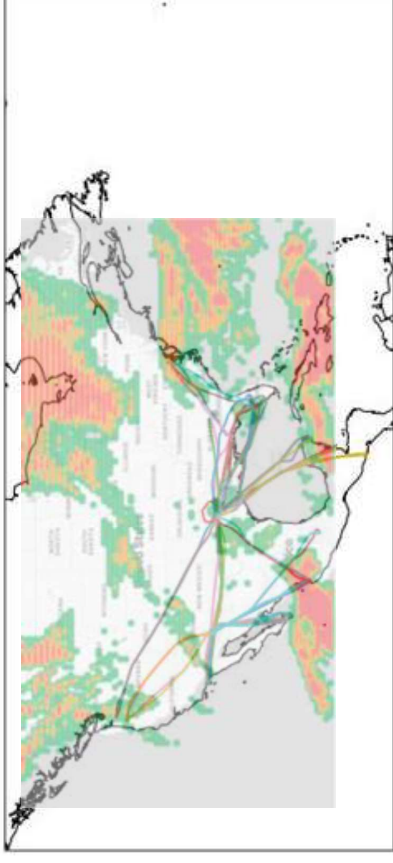
- 10 pilots participated
- Between Jan 1 and early June, 2023

Turns

- City A to City B, back the same day
- Contrail Likely Zone (CLZ) on flightpath in/out of city A or B
- Contrail avoidance on arrival or departure (random choice)
- Avoidance only **early descent or late ascent**

Input

- Manual presentation of Google / BE contrail predictions
- PACE-integrated Google predictions



AA “pilot” study

35 turns, of which 22 included in analysis (44 flight segments)

	No detectable contrail created	Detectable contrail created	Contrail length [km]	Total flight length [km]
Control	11	11	726	36802
Experiment	18	4	321	35729

64% fewer contrails observed in treatment group

54% reduction in contrail length per flight kilometer

Average of **2% more fuel per adjusted flight** (without using an optimizer)

AA “pilot” study

