# Contrail Avoidance Decision Support and Evaluation Project 78

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Massachusetts Institute of Technology

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# **Introduction**

 Contrails are consistently found to be an important contributor to aviation climate impacts

Large uncertainties regarding the impact of contrails remain, making it an active research area

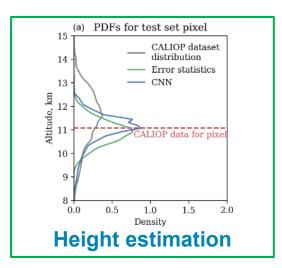
Observation-based contrail avoidance (amongst other operational techniques)
may be a near-term option to reduce this impact substantially

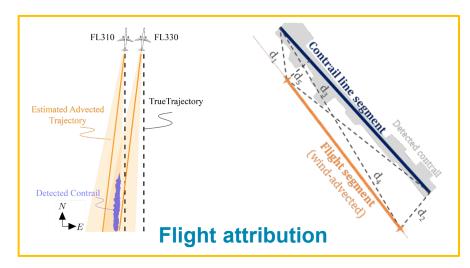


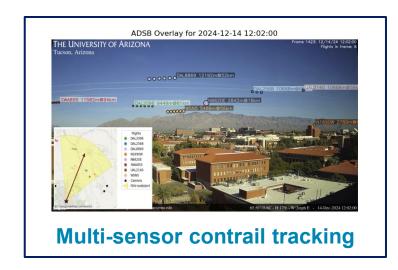


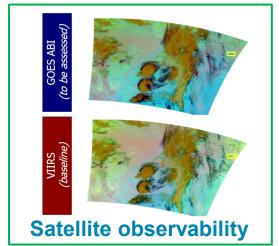
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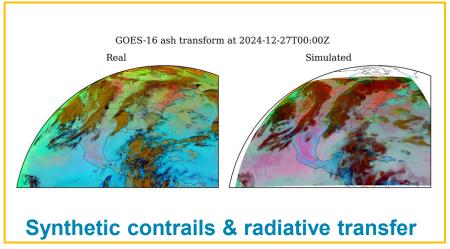
TOOLS & METHODS

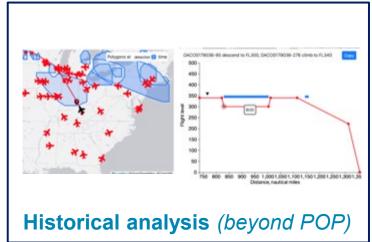












Completed work

Ongoing progress

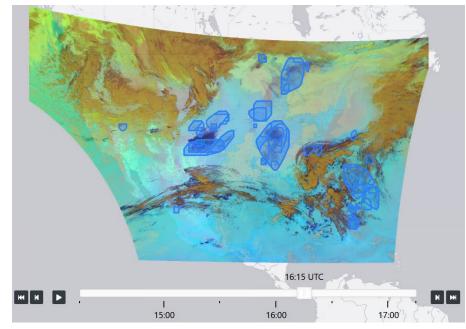




# **Recent Accomplishments and Contributions**

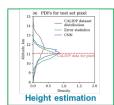
Continued development on **MCAST** (MIT Contrail Avoidance Support Tool)

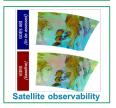
- Contrail detection through real-time processing of satellite imagery
- Nowcasting pipeline to identify avoidance opportunities via vertical flight rerouting



#### **Publications**

- Meijer, V.R., Eastham, S.D., Waitz, I.A., & Barrett, S.R.H. 2024. *Contrail altitude estimation using GOES-16 ABI data and deep learning*. Atmospheric Measurement Techniques.
- Euchenhofer, M.V., Prashanth, P., Parke, S.A., Eastham, S.D., Waitz, I.A. 2025. *Contrail observation limitations using geostationary satellites*. Geophysical Research Letters. Under Review.

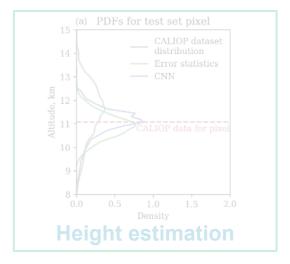


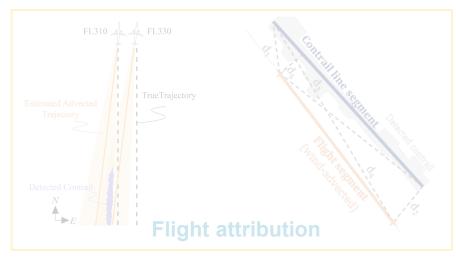


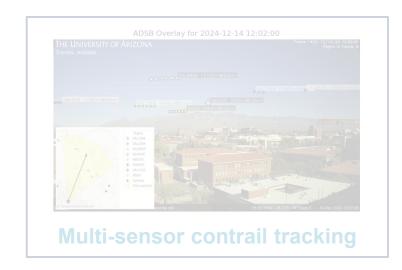


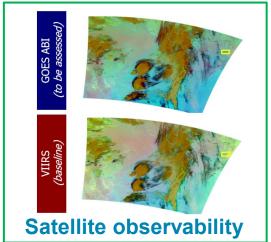


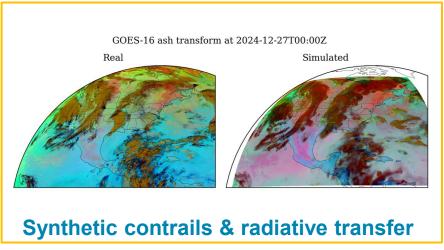
## **Schedule and Status**

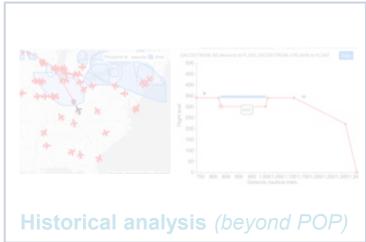












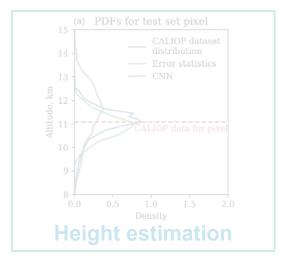
Completed work

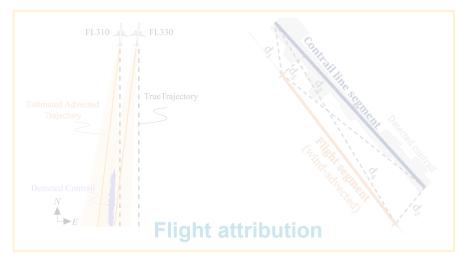
Ongoing progress

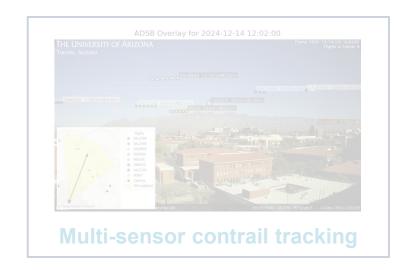


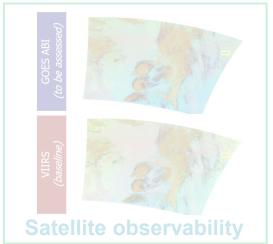


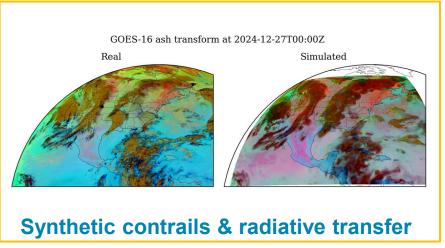
## **Schedule and Status**











Historical analysis (beyond POP)

Completed work

Ongoing progress

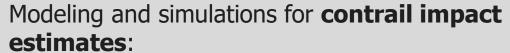




# Contrail process models need new validation approaches







- → Need validation against observation
- → Complex to compare current model outputs against satellite instruments.



Identification of assumed contrail regions for operational contrail avoidance:

- → Often based on GEO observations.
- → Trade-off of limited spatial resolution, thus potentially missing contrail regions.

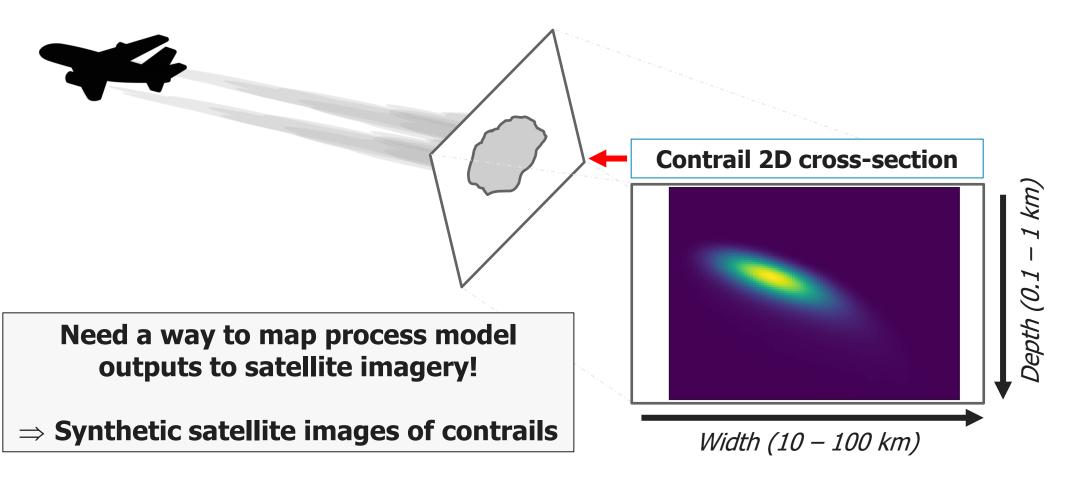
- → Existing approaches focused on bulk statistics, visual inspection or have a few samples
- → Satellites improved in spatial resolution and provide large temporal and spatial coverage
- → But comparing model outputs to satellite imagery is not trivial





# What do contrail plume scale models model?









# Goals



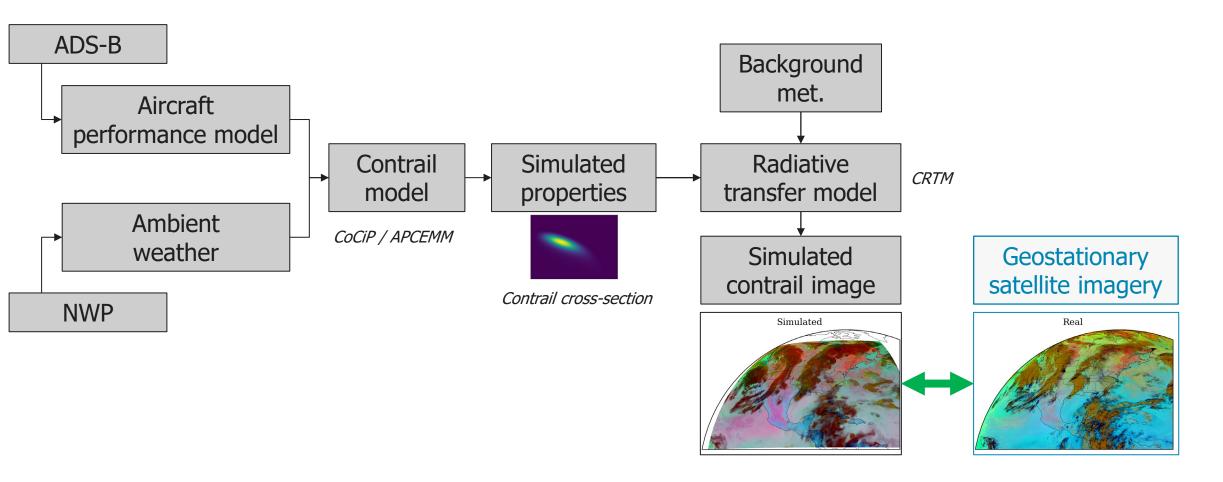
- Can models reproduce observed properties of contrails?
  - Current models are expected to have correct estimates "on average" but not at the scale of individual contrails
  - Can analyze this at 3 levels:
    - Individual contrails: flight by flight analysis
    - Contrail cluster: ISSR analysis
    - US annual: regional analysis
  - → Verifying that current models mirror average contrail radiative properties in visible / mid-IR bands will inform the accuracy of their RF estimates





# Generating physics-based synthetic contrail imagery









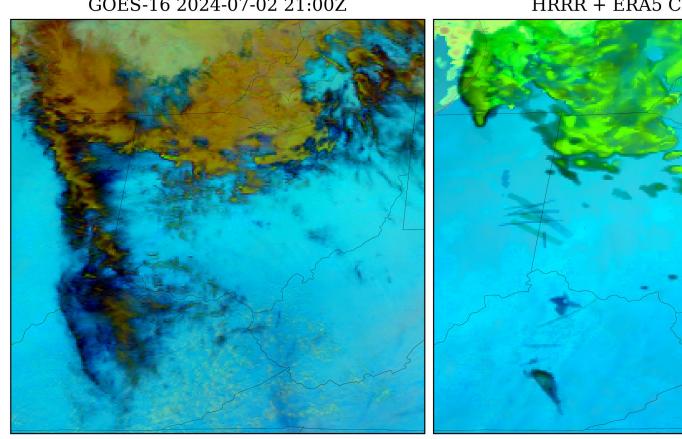
# **Preliminary simulations**

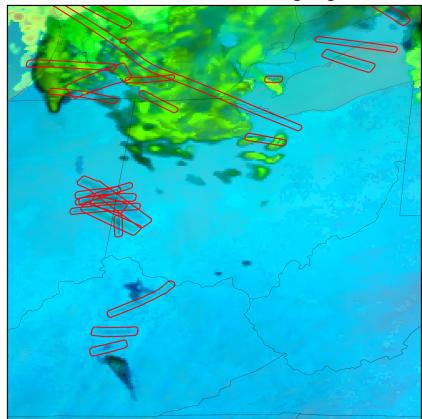


GOES-16 2024-07-02 21:00Z

HRRR + ERA5 Contrails

HRRR + ERA5 Contrails highlighted



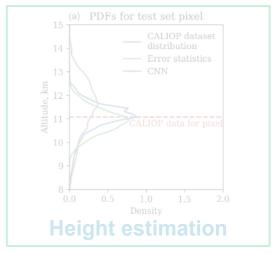


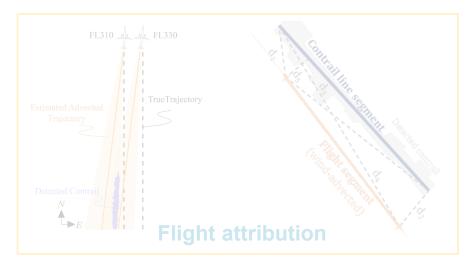
- → Background cloudiness representation needs work
- Contrails are clearly visible and can be evaluated for observability / brightness temperatures...

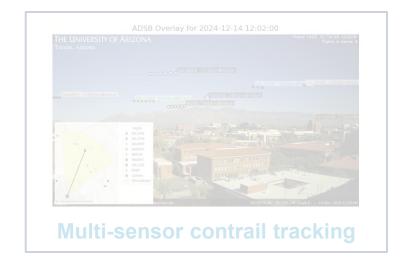


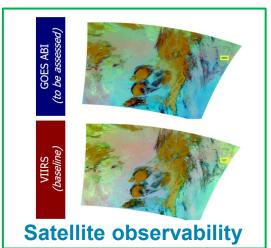


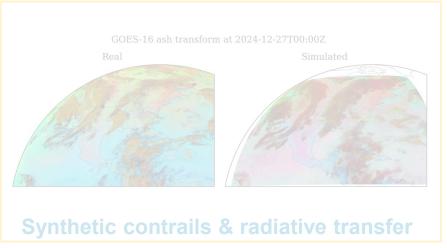
## **Schedule and Status**

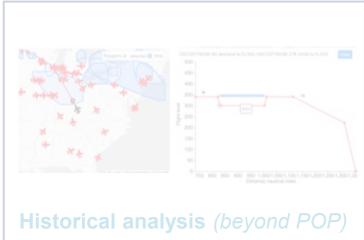












Completed work

Ongoing progress





# **Observability limits of contrails from geostationary orbit**







# Modeling and simulations for **contrail impact estimates**:

- → Need validation against observation
- → Complex to compare current model outputs against satellite instruments.

# Identification of assumed contrail regions for **operational contrail avoidance**:

- → Often based on GEO observations.
- → Trade-off of limited spatial resolution, thus potentially missing contrail regions.

- → Reliance on accuracy of observational input data.
- → Integrity of observations needs to be assessed to bound validity of actions and derived quantities!



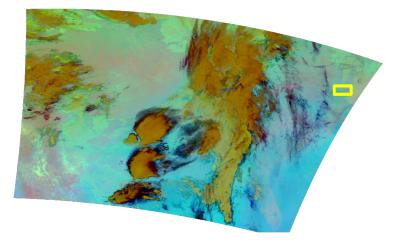


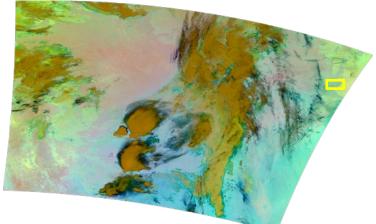
# **Data generation**



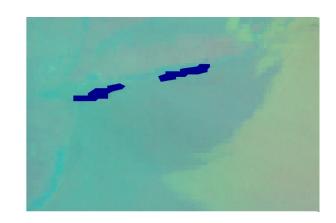
# GOES ABI (to be assessed)

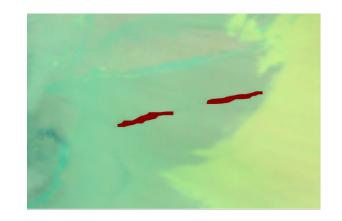
#### False color images





# Visually identified contrails





#### Dataset:

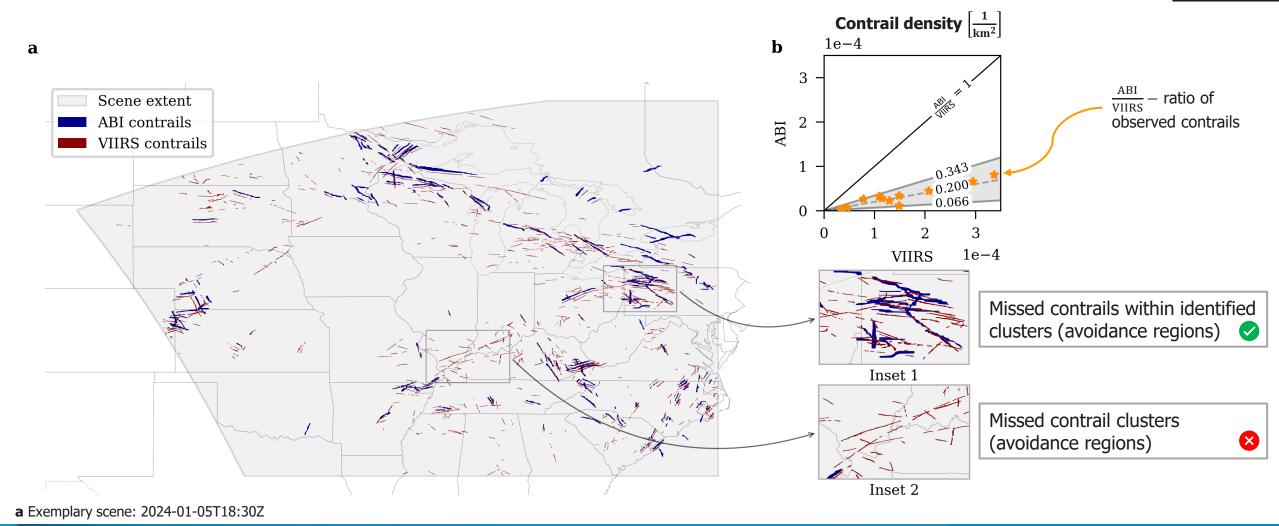
- Twelve scenes over CONUS (varying in extent and location) between Dec 2023 – Nov 2024
- Scenes cover a range of conditions regarding clouds and contrail cover
- Analysis of static scenes (no temporal evolution considered)
- Total number of contrail labels:
  - 1,667 (ABI)
  - 7,731 (VIIRS)





# **Big picture – number of observed contrails**

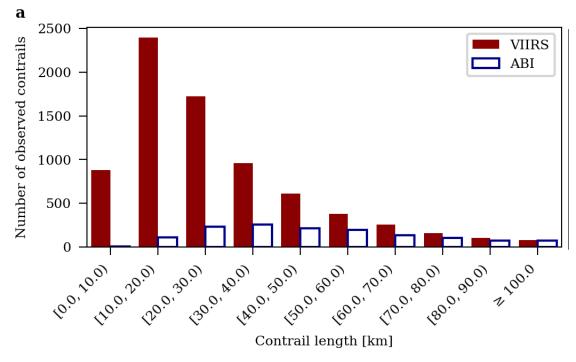


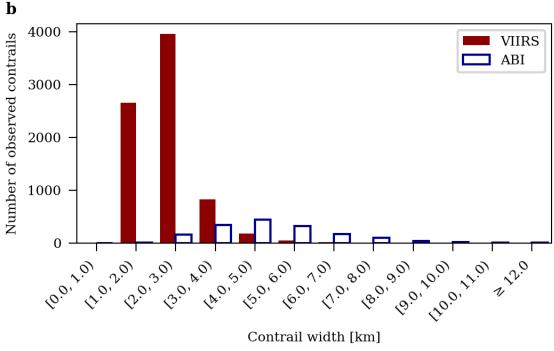




# **Characteristics of (un-)observed contrails**







Significantly more shorter contrails observed with VIIRS

- → earlier observation
- → non-persistent contrails

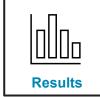
Narrower range of contrail widths observed with VIIRS, and same contrails appear wider when observed with ABI

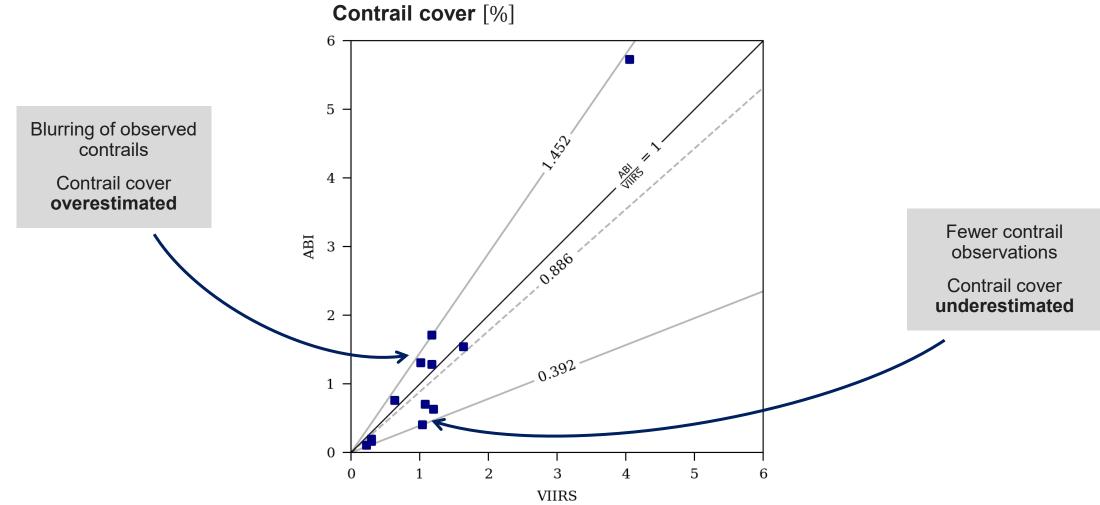
→ individual widths overestimated





## Effect of instrument resolution on observed contrail cover



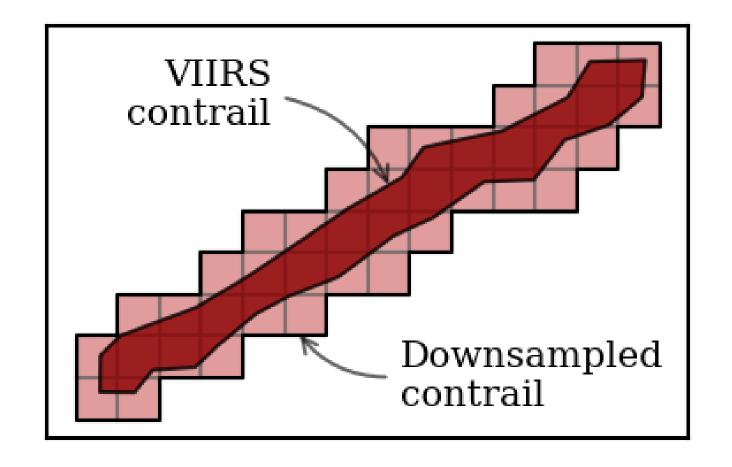






# **Downsampling of VIIRS contrails**







# **Downsampling of VIIRS contrails**

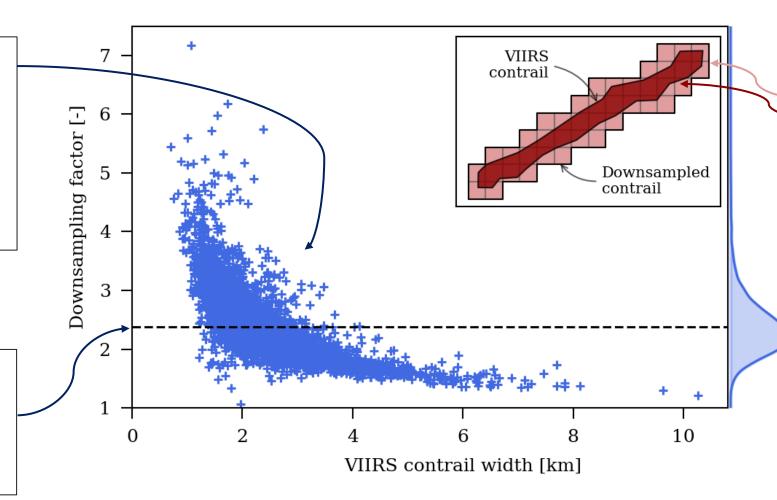


Inverse relationship between downsampling factor and input contrail width:

Narrower contrails (closer to ABI resolution) expected to experience stronger blurring

Average downsampling factor 2.27:

Overestimate of the width (area) of an individual contrail by factor of 127%.



#### **Downsampling factor**

 $A_{\text{VIIRS contrail}}$  downnsampled  $A_{\text{VIIRS contrail}}$ 

#### Caveat:

Downsampling factor largest for contrails unobserved by ABI.

\* Conservative upper limit.





# **Summary – Satellite observabiliy**



ABI misses 80% of all contrails observable with VIIRS.

The lower resolution results in a non-systematic error for the derived contrail cover.

This results in **implications for** both

- **operational contrail avoidance** (early and comprehensive identification of ISSRs, ability to verify contrail avoidance trials), and
- **contrail climate modeling** (impact assessment, model calibration and validation of individual contrail behavior, assessment of model predictions of RH).

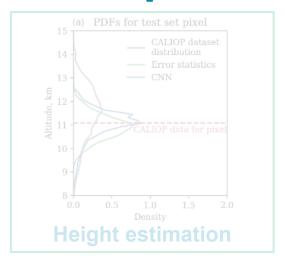
However, contrail observations from GEO imagers **provide important and continuously sampled information** for navigational avoidance.

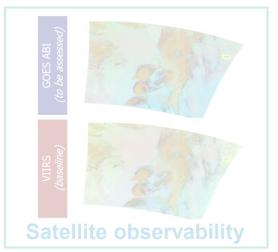
Limitations can be addressed by consolidating data from multiple sensors into single pipeline.

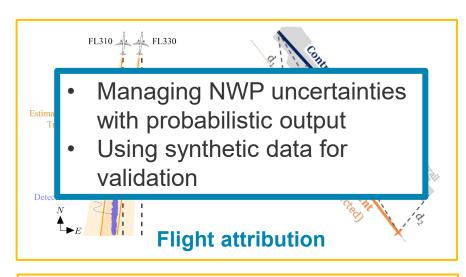


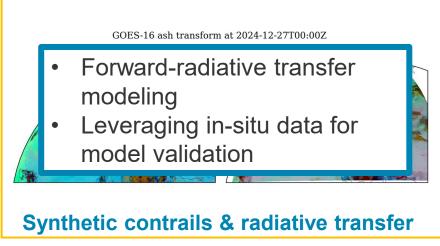


# **Next steps**









ADSB Overlay for 2024-12-14 12:02:00

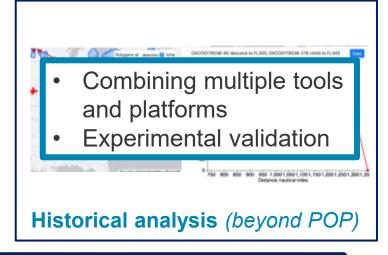
THE UNIVERSITY OF ARIZONA
Tucson, Arizona

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Calibration of cameras

Attribution & tracking across platforms

Multi-sensor contrail tracking



Completed work

Ongoing progress





#### **Project 78**

## **Contrail Avoidance Decision Support and Evaluation**

#### **Massachusetts Institute of Technology**

PI: Ian A. Waitz

Co-PI: Prakash Prashanth

Team: Marlene Euchenhofer, Louis Robion, Olivier

Kigotho, Florian Allroggen

PM: Kenisha V. Ford

Cost Share Partner(s): Earth Force Technologies Inc.

#### **Research Approach:**

- Develop **software modules** as follows:
- **Contrail forecasting** to predict contrail-forming conditions prior to and during flight
- Real-time **contrail identification** in satellite images based on existing deep learning approaches
- Contrail **radiative forcing estimation** based on recent work at MIT
- Trajectory planning and forecast fuel burn and emissions for a spectrum of flight paths

#### **Objective:**

- **Decision support tool** for aircraft routing to avoid formation of warming contrails by evaluating the likely costs and benefits of a contrail avoidance action.
- Evaluate the decision support tool under real-world conditions.

#### **Project Benefits:**

- **Rapid evaluation** of contrail formation and impacts for different strategies
- Demonstration of benefits, cost, and practicality of contrail avoidance to relevant stakeholders
- Advancement of US-built tools and leveraging US leadership in insitu measurement campaigns to maintain **global competitiveness**

#### **Major Accomplishments (to date):**

- Instantaneous contrail identification module completed
- ML technique to estimate contrail heights
- Preliminary attribution algorithm developed to match flights to contrails and to derive probabilistic contrail height estimation
- Computer vision-based technique to simultaneously attribute and localize contrails
- Quantification of observability limits of geostationary satellites

#### **Future Work / Schedule:**

- Ongoing tool development and continuous integration
- Improve contrail identification module and models for forecasting and radiative forcing assessments
- Rigorous historical analysis