

# ICAO Symposium on Non-CO<sub>2</sub> Aviation Emissions

16 — 18 September 2024  
Montréal, Canada



## Peter de Bock

Program Director

US Department of Energy, Advanced Research  
Projects Agency – Energy (APRA-E)

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Speaker

Session 3: Mitigating Non-CO<sub>2</sub> Aviation Emissions –  
What is possible  
Part I – Innovative Technologies



# Predictive Real-time Emissions Technologies Reducing Aircraft Induced Lines in the Sky (PRE-TRAILS)




Dr. Peter de Bock, Program Director

US Department of Energy

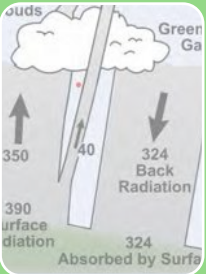
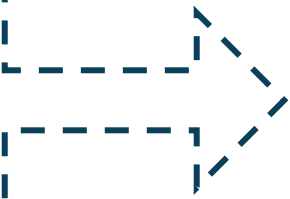
Advanced Research Projects Agency - Energy



# PRE-TRAILS, Can we predict with high certainty, if a contrail will be persistent ~5-10 hours later and form Aircraft



**1. Contrail formation**  
Does it lead to persistent Aircraft Induced Cirrus clouds?



**2. Is the persistent contrail leading to additional radiative forcing?**



**3. Mitigation**

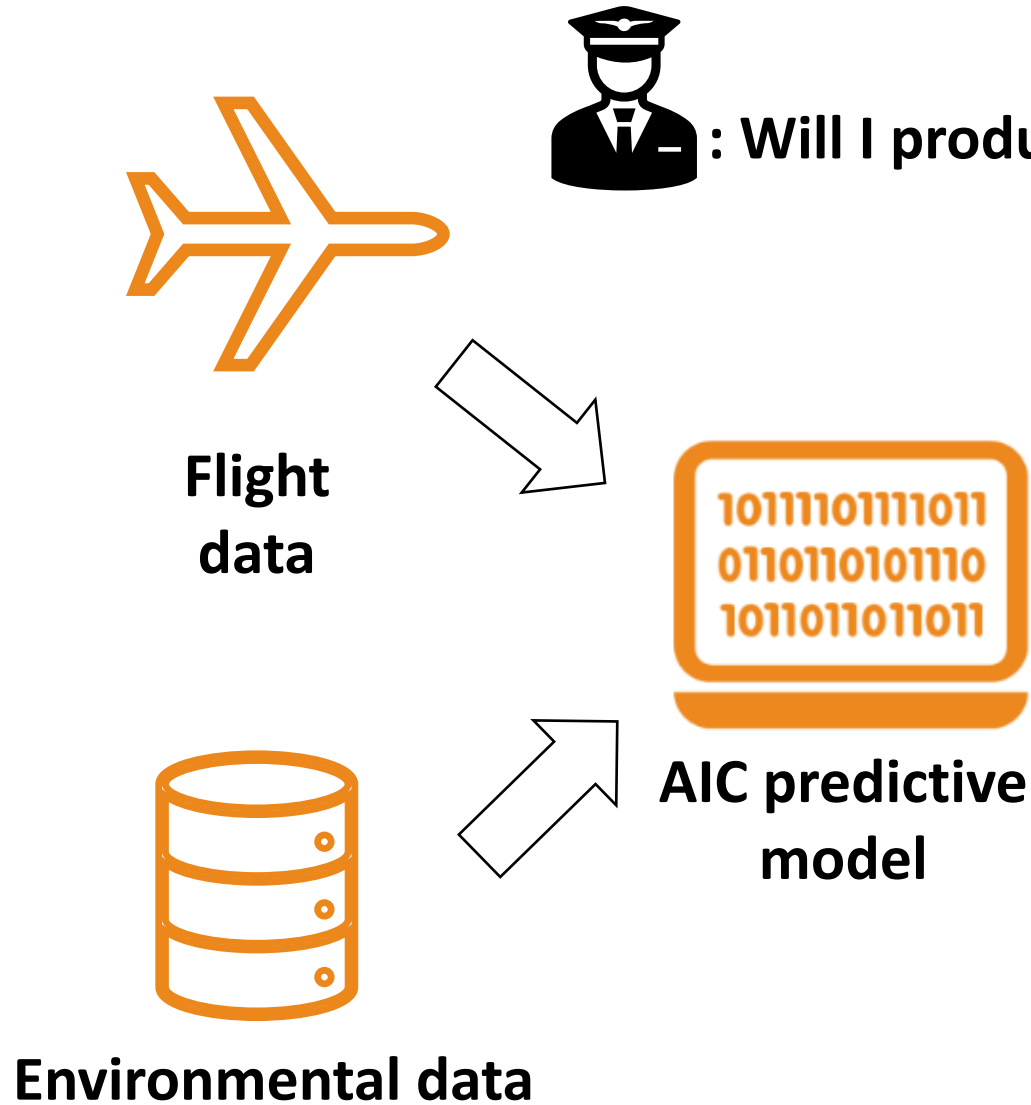


Boeing 787 at high altitude— big contrails but are they persistent or dissipate?

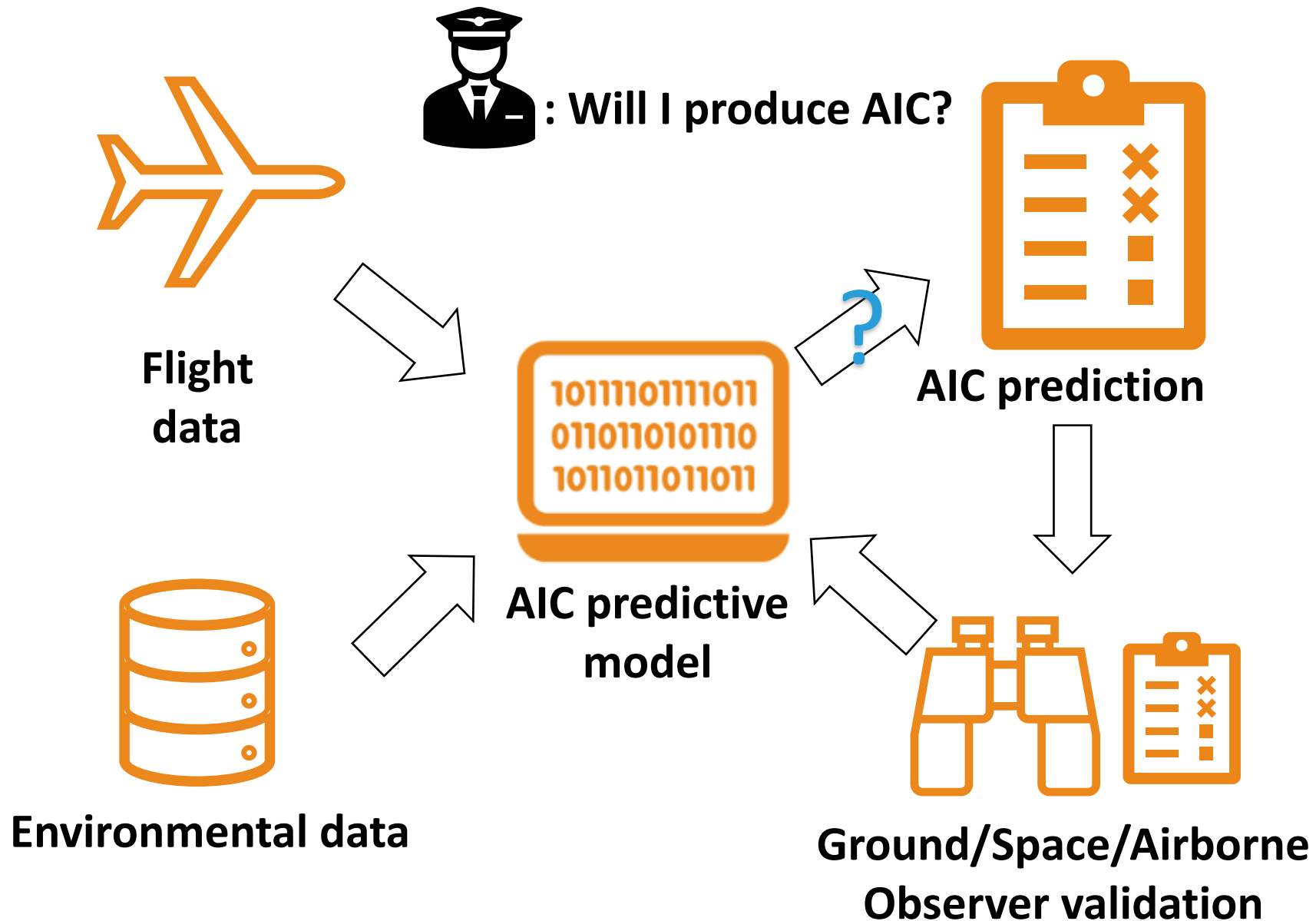
# Will the flight produce Aircraft Induced Cirrus 5hrs later?



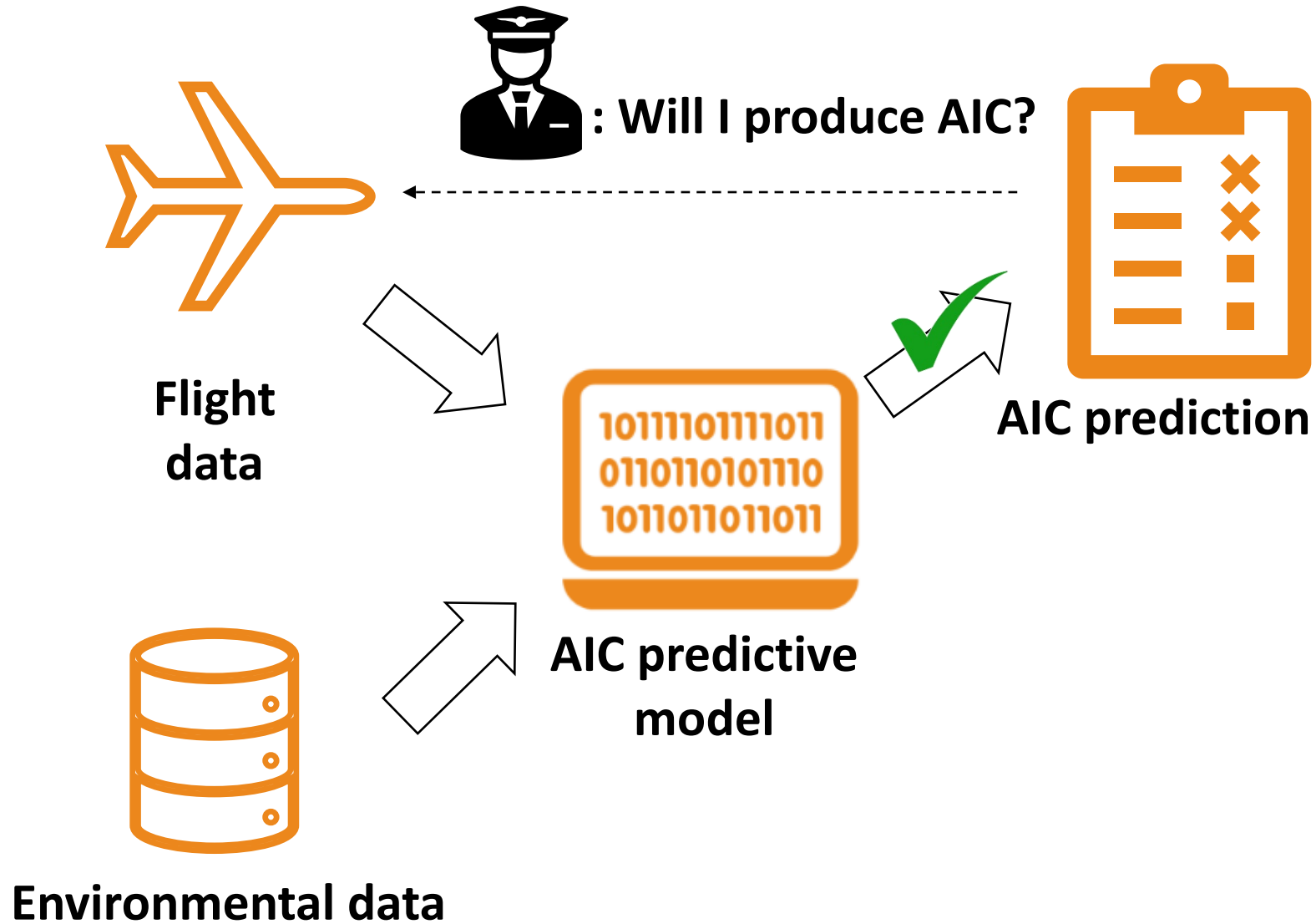
: Will I produce AIC?



Use the Aircraft  
as a  
Sensor



# Achieve $F_1$ -score > 0.8: accurate prediction



# Contrail Information for Collaborative Operations (CINCO)

[Ann.R.Guthrie@boeing.com](mailto:Ann.R.Guthrie@boeing.com)

[Timothy.F.Rahmes@boeing.com](mailto:Timothy.F.Rahmes@boeing.com)



## Innovative Sensor Approach

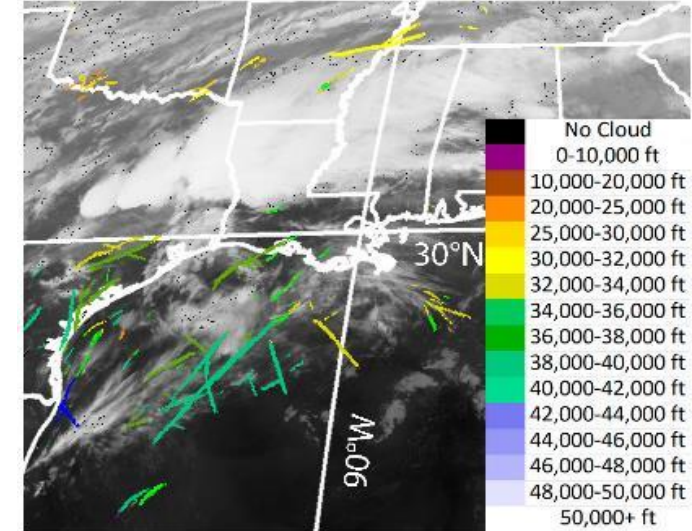
*Develop water vapor sensors that meet upper tropospheric requirements, remaining cost effective in order to enter the commercial carrier market. Sensors should run unattended in extreme environments.*

## Observation method approach

*Satellite-observation-based regression model with input from numerical weather prediction model(s) including ice supersaturated regions (ISSRs) and other variables as inputs. Ground based observations combined with ADS-B data.*

## Data Fusion Approach

*Blend aircraft, satellite, and ground-based observations, deep learning and emerging observations from water vapor sensors*



Hoffman et al., *Remote Sensing*, 2023, 15, 2854.

<https://doi.org/10.3390/rs15112854>

## High level targets:

*F1 score*

*Accuracy*

## Desired outcome &/or Partnering Opportunities:

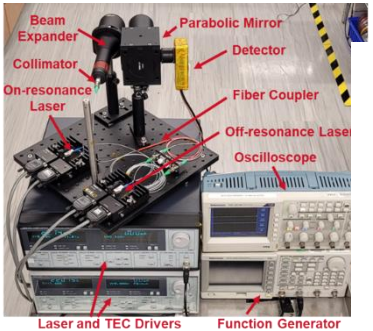
***Boeing encourages collaboration with other companies as well!***





## Innovative Sensor Approach

*Seamless data integration and physics-informed real-time forecasting together with LIDAR-based stand-off humidify measurement*



Collins OID Prototype (potential path to integration)



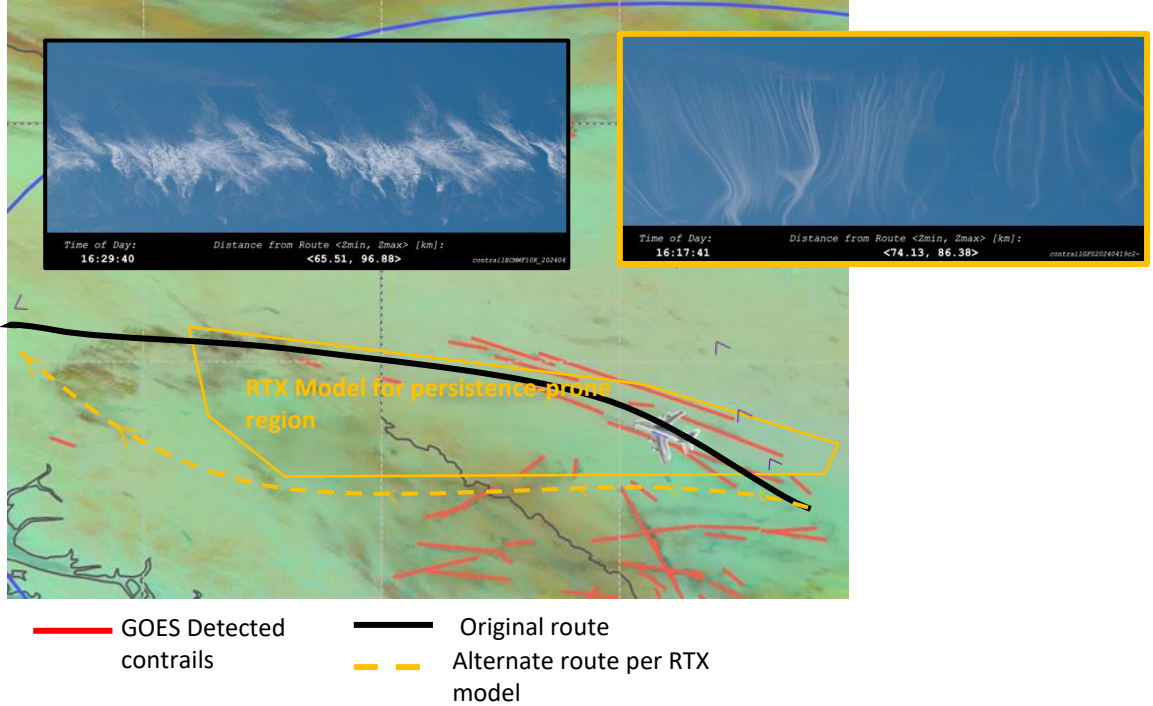
## Observation method approach

*GOES satellite observation for PIML validation and enhancement*

## Data Fusion Approach



*On-board sensors fused with forecast data data for formation prediction and GFS and ECMWF forecast data to bound uncertainty of persistence prediction*



## High level targets:

*F1 score: > 0.8*

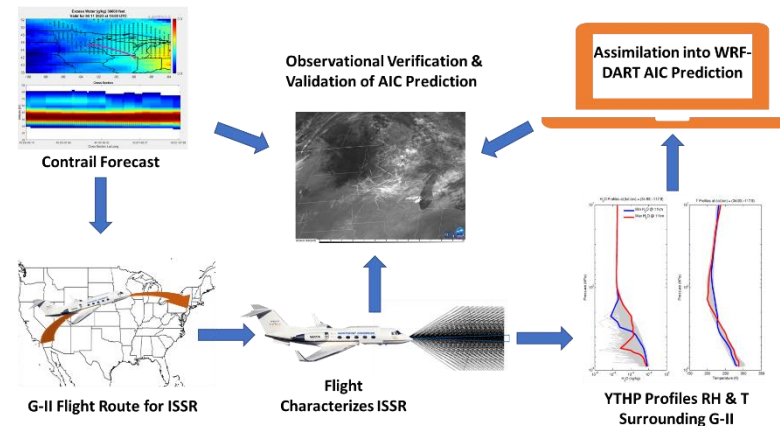
*Accuracy: >80% confidence in persistence time and AIC optical depth over >6hr lifetime*

## Desired outcome &/or Partnering Opportunities:

*High-confidence persistence prediction and high-accuracy stand-off humidity measurement Public*

## Innovative Sensor Approach

*We use forward, vertically scanned microwave radiometer to measure a vertical temperature and humidity profile in front of the aircraft to provide vertical knowledge of contrail formation conditions*



## Observation method approach

*Dedicated test flights will monitor temperature conditions. Human observers will be stationed along flight path to monitor AIC formation during multiple validation test flights*

## Data Fusion Approach

*Predictive model will combine WRF data with aircraft engine signature and contrail formation model for initial flight planning. Fully designed system would update forecast with real-time sensor data to avoid contrail formation (post processing for Pre-Trails)*

## High level targets:

*F1 score: >0.8*

*Accuracy: <1 Kelvin Temperature*

*<10 ppmv Water Vapor*

## Desired outcome &/or Partnering Opportunities:

- Demonstration of YTHP and other sensors in AIC prediction and avoidance*
- Partnering with FAA, airlines, NASA and sensor providers*

## Innovative (virtual) Sensor Approach

Develop Virtual Humidity Sensor (VHS):

- use internal engine cycle simulations to examine sensor responses to humidity variations,
- use field data (engine data merged with humidity data) to build ML models to predict humidity

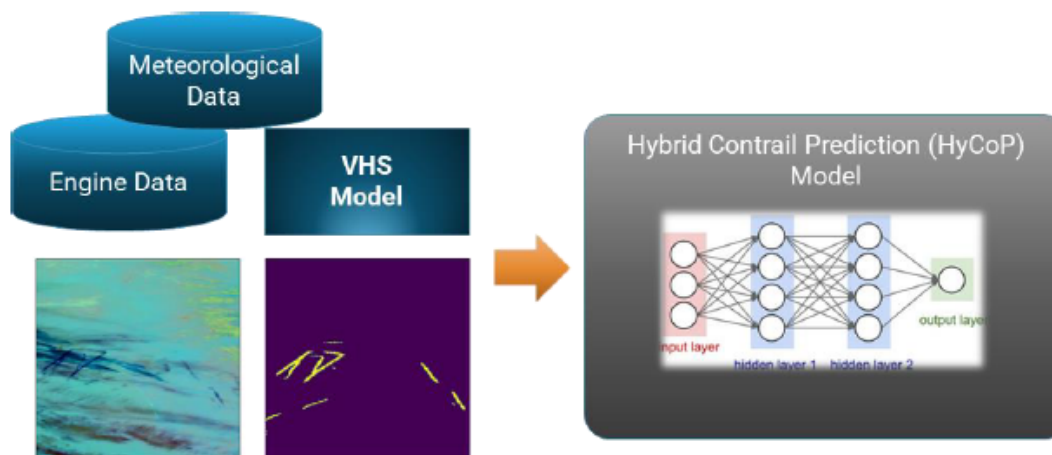
## Observation method approach

Geostationary Satellite GOES-16 & GOES-18 + Meteorological data:

- Contrail detection
- Contrail matching & tracking
- Flight attribution

## Data Fusion Approach

Contrail/plume physics models + multi-resolution geostationary satellite data + existing engine-specific sensor data with engine-specific NPSS => Hybrid Physics ML Model



## High level targets:

- At scale accurate observational validation of contrails
- F1-score  $\geq 0.8$  for up to 5-hours long-lived (LL) Aviation-Induced-Cirrus (LL-AIC)

## Desired outcome &/or Partnering Opportunities:

- Facilitate development of engine-informed contrail, LL-AIC mitigation technology and commercialization of such systems.
- Enable scalable, low cost, robust virtual humidity and ISSR sensors.
- Enable novel contrail mitigation strategies that help reach our nation's net-zero goals.

# Physics & Machine Learning Based Contrail Prediction & Observation System

PI: Dr. David Bell ([dbell@usra.edu](mailto:dbell@usra.edu)), Universities Space Research Association (USRA)

## Project Team

- **USRA Research Institute for Advanced Computer Science (RIACS)**  
40+ year history developing Artificial Intelligence (AI) solutions with NASA for Earth science, space science, space exploration & aeronautics
- **NASA's Ames Research Center – Aviation Systems Division**  
Decades of history developing Airspace Operations & Safety solutions including aviation contrail simulation
- **NASA's Langley Research Center – Climate Science Branch**  
Decades of history developing atmospheric science solutions including aviation contrail forecasts

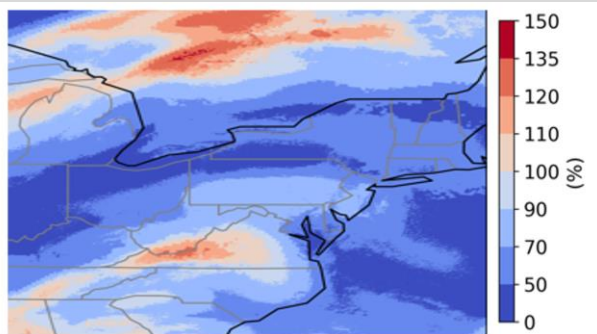
## Project Team Contributions

- **USRA Research Institute for Advanced Computer Science (RIACS)**  
Developing integrated contrail prediction & observation services including development of advanced AI solutions
- **NASA's Ames Research Center – Aviation Systems Division**  
Providing access to the NASA Ames Contrail Simulation Model (ACSM)  
Providing access to the NASA Digital Information Platform (DIP)
- **NASA's Langley Research Center – Climate Science Branch**  
Developing environmental data nowcasts and forecasts of key atmospheric variables as inputs for contrail prediction and observation

## Contrail Prediction

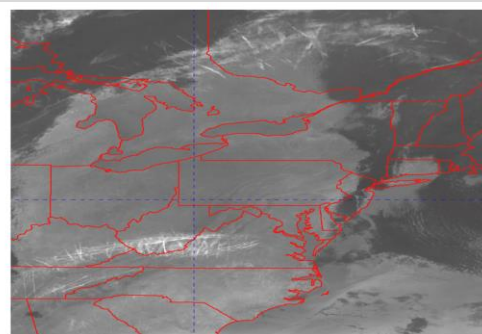
*(Informed by Satellites)*

Satellite-Based Forecasts



Max RH<sub>i</sub> above 30 Kft - 10/28/2019 18 UTC

Persistent Contrails

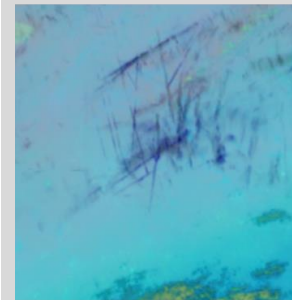


GOES-16 Imagery - 10/28/2019 18 UTC

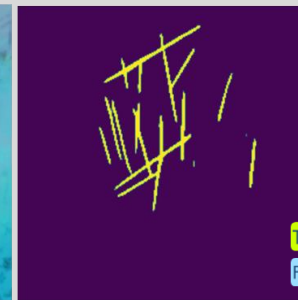
## Contrail Observation

*(Informed by Satellites)*

Image



Prediction



Ground Truth



F1 Score

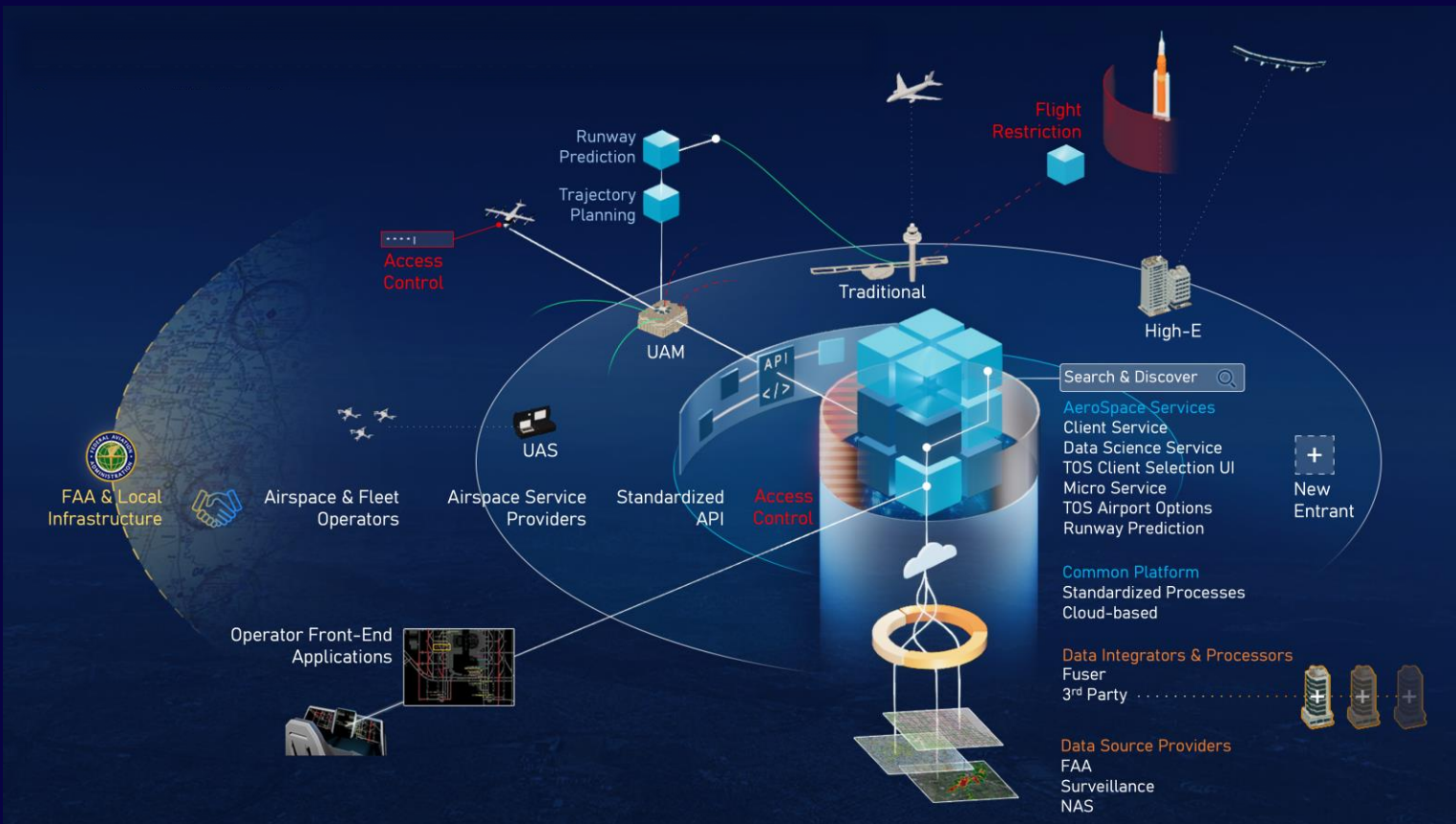


# Physics & Machine Learning Based Contrail Prediction & Observation System

*Technology To Market (T2M) Path: Integration with the NASA Digital Information Platform (DIP)*

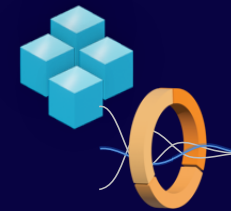
Development and demonstration of a digital service-oriented framework to enable increasingly safe and sustainable operations for today and the future airspace system

## Service-Oriented Cloud Based Infrastructure



### Reference Platform

*Informing platform interoperability requirements and best practices to enable innovative ecosystems*



### Predictive Services with ML Capabilities

*Building reusable data integration services and AI/ML based predictive services for safe and sustainable operations.*



### SFNP Operations Demos

*Demonstrating sustainability benefits derived using DIP services in today's NAS*



# Predictive Real-time Emissions Technologies Reducing Aircraft Induced Lines in the Sky (PRE-TRAILS)

## Time of program: 2024Q2 – 2025Q4

- Novel sensors of unprecedented accuracy for troposphere measuring humidity and other gasses
  - Community of performers working on understanding contrails and ISSR. Some open source/public
  - Demonstration of  $F_1$ -score  $> 0.8$  by 5 positive Aircraft Induced Cirrus cloud prediction
  - Potential adjacent benefit: improved global warming and weather modeling & prediction
- ▶ Aircraft in program: RTX Challenger, NGC Hawker, Boeing EcoDemonstrator, Southwest Airlines
- ▶ PIs POC: <https://arpa-e.energy.gov/technologies/exploratory-topics/aviation-contrails>

Thank you: FAA, NASA, NOAA, ICAO



## ARPA-E Team:

Program Director Peter de Bock, [Peter.Debock@hq.doe.gov](mailto:Peter.Debock@hq.doe.gov)

Team: Calden Stimpson [Calden.Stimpson@hq.doe.gov](mailto:Calden.Stimpson@hq.doe.gov), Vivien LeCoustre [Vivien.Lecoustre@hq.doe.gov](mailto:Vivien.Lecoustre@hq.doe.gov)

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# Thank You

