

Construction of Unified Global 3D Cloud Fields

Combining Multiple Satellite Products and AI/ML-Derived Environmental Data

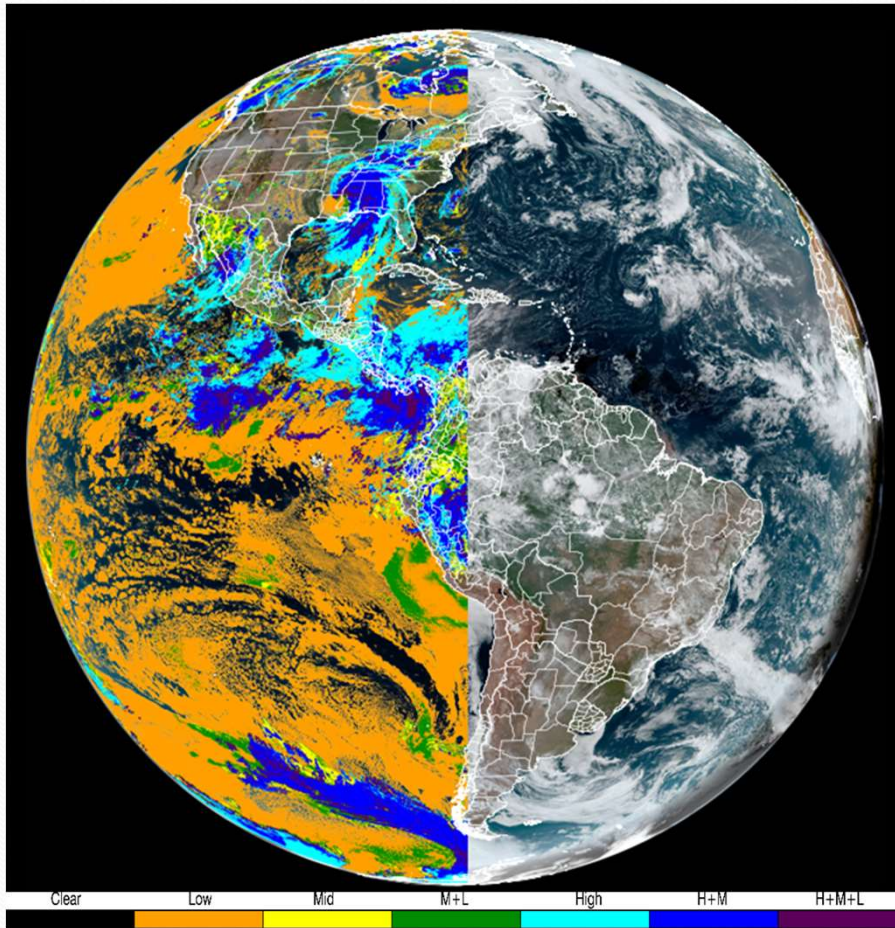
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with

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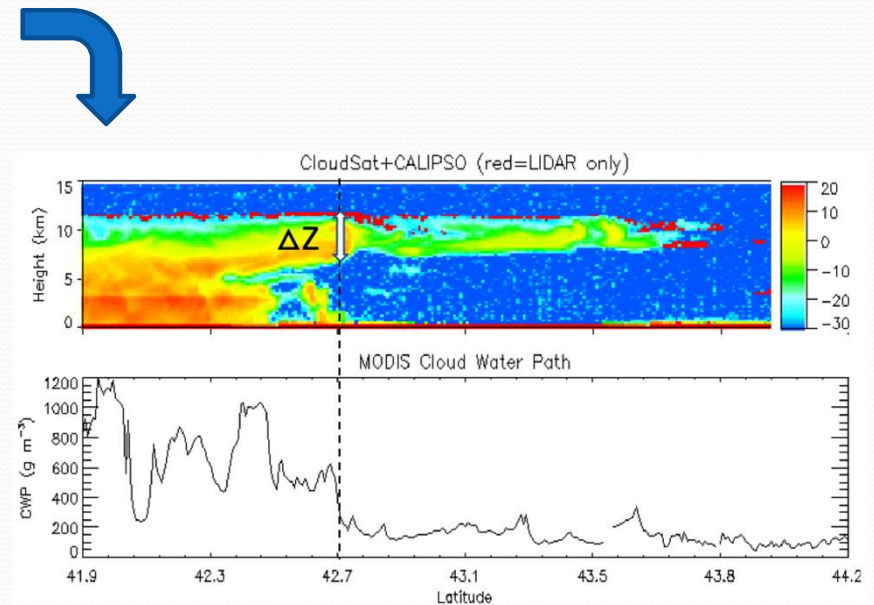
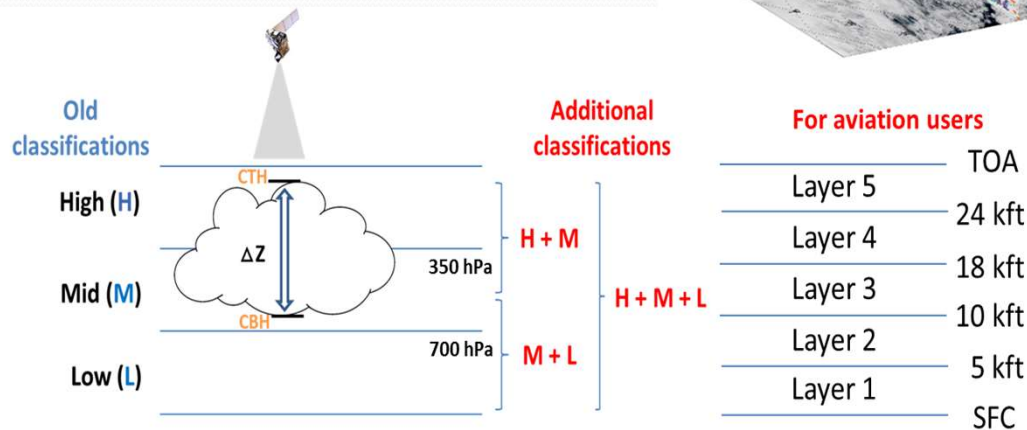
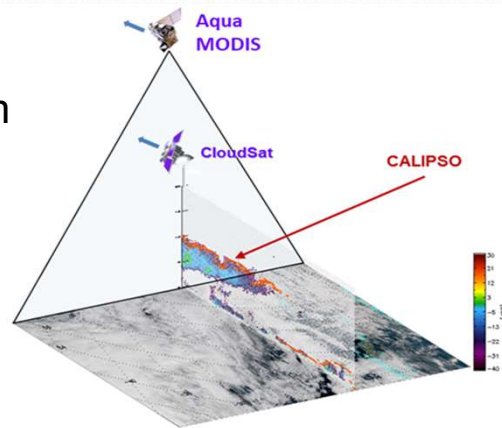




- Knowledge of 3D cloud structures is important for weather/climate studies
- Satellites have provided valuable cloud observations. But the information from conventional sensors (passive radiometers such as ABI and VIIRS) is often limited to 2D cloud top views
- Our goal is to extend the benefit of satellite cloud data into the vertical dimension for aviation users

Satellite-Based Cloud Base/Layer Algorithms

- Operational part of the **NOAA Enterprise Cloud algorithms** (GOES ABI and JPSS VIIRS)
- CIRA developed a statistical cloud base height / cloud geometric thickness algorithm using NASA A-Train data (Noh et al.; Seaman et al. 2017)



$$CBH = CTH - \Delta Z \text{ (CGT; Cloud Geometric Thickness)}$$

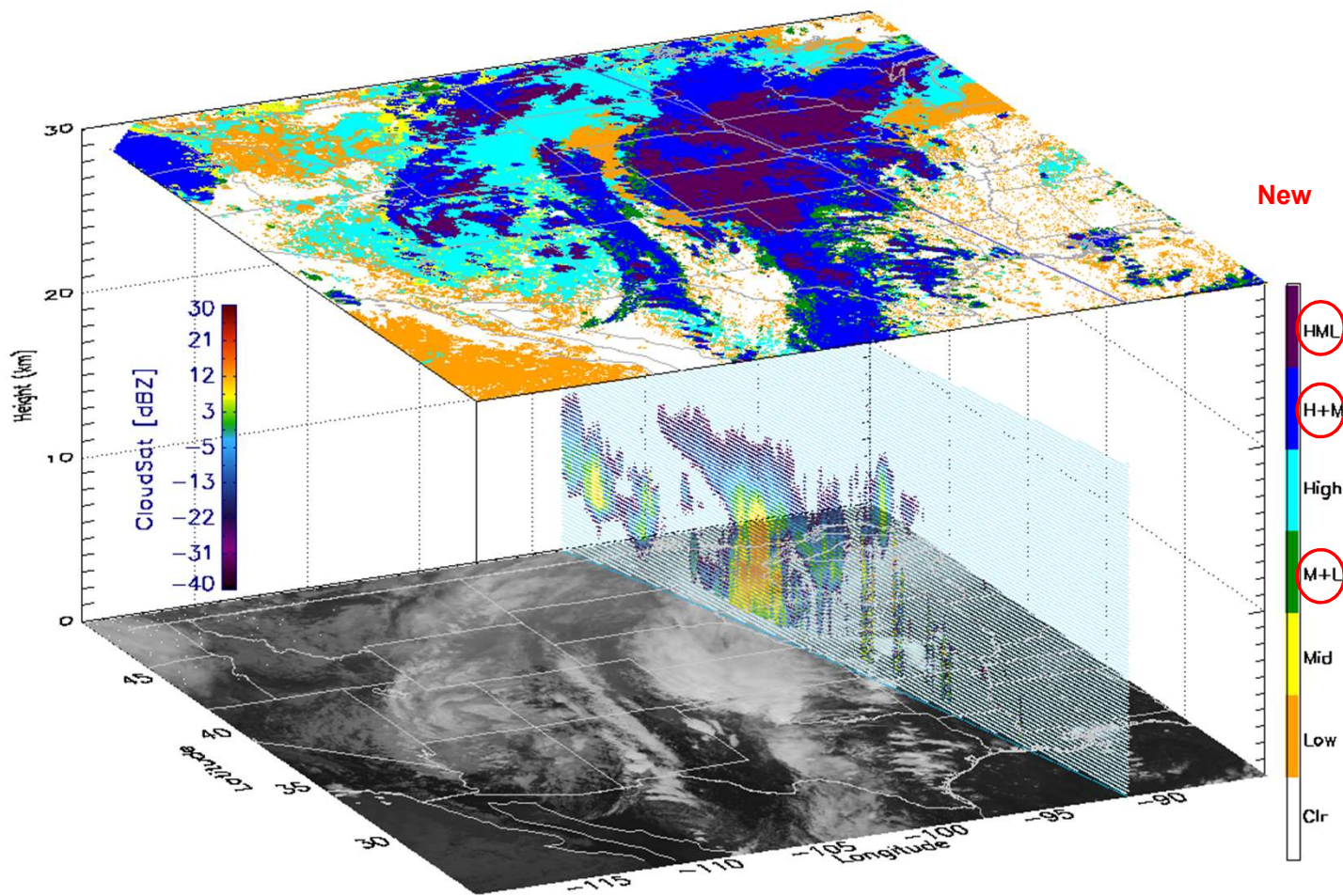
$$\text{where } \Delta Z = a(CWP) + b \text{ (} a, b \text{ based on A-Train data)}$$

Optimal for single layers

+ supercooled liquid & convective cloud layer flags

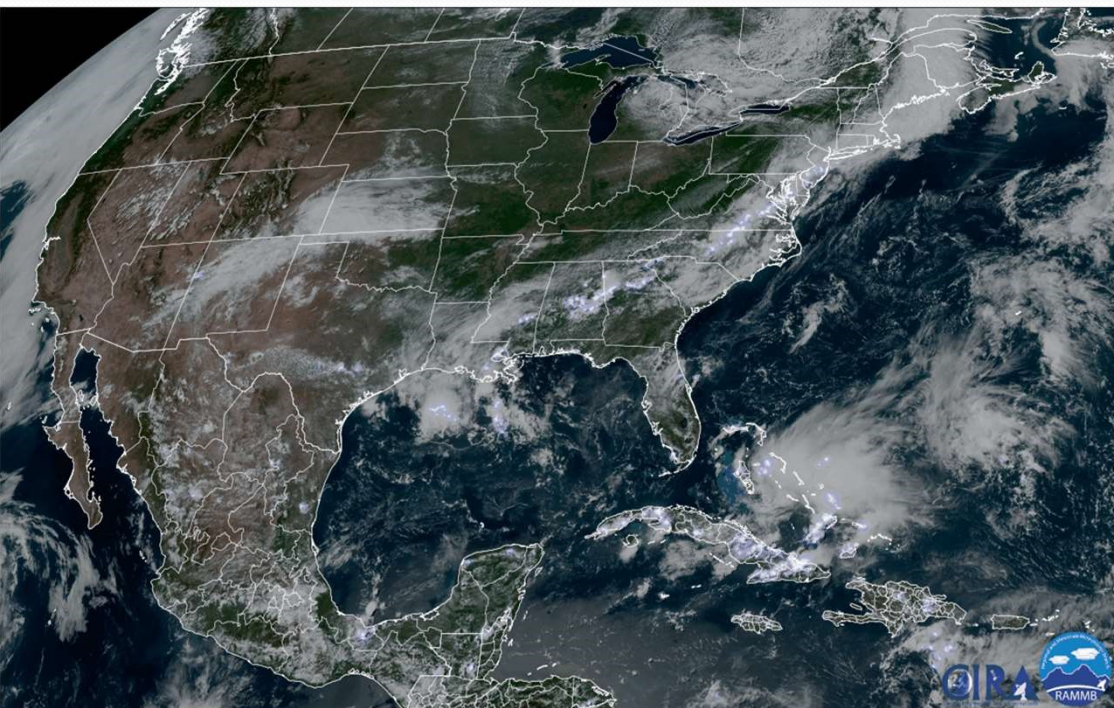
GOES-16 ABI

Applicable to both GEO and LEO



Improved Multilayer Clouds with ML/AI

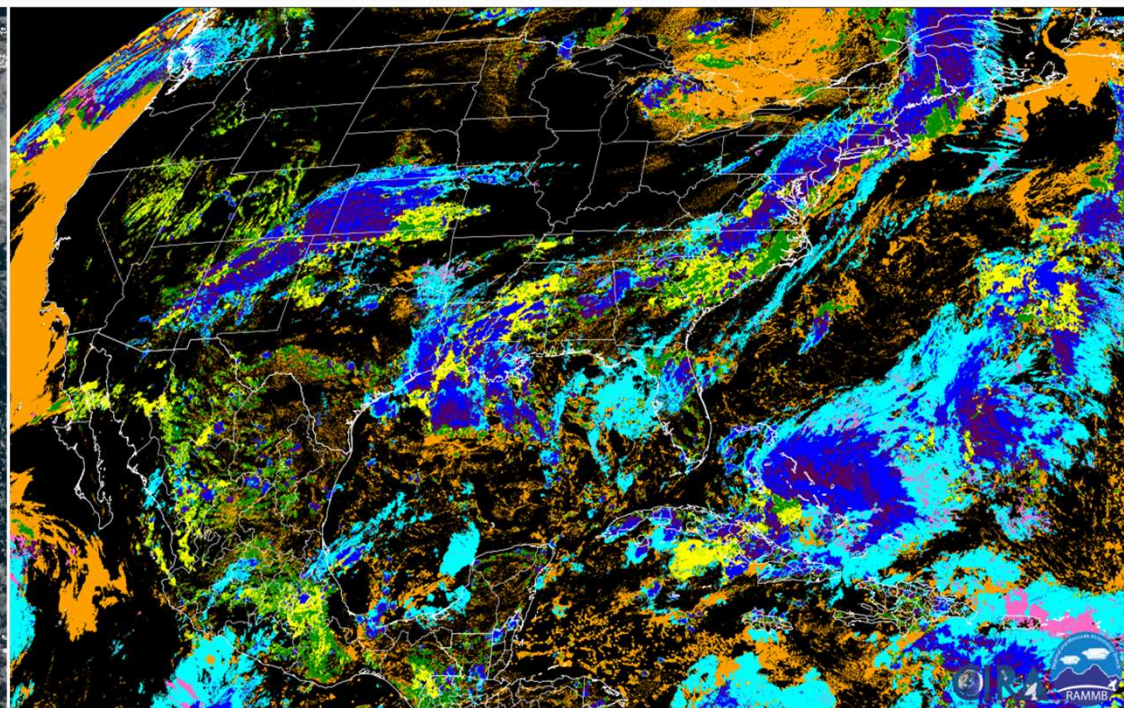
- AI model trained with ABI data and NWP humidity using ‘truth’ from CloudSat radar and CALIPSO lidar
- Applicable to both polar and geostationary satellite sensors



GOES-16 ABI GeoColor with GLM overlay (L2 group energy)

1851 – 1951 UTC (every 10 min) 27 June 2022

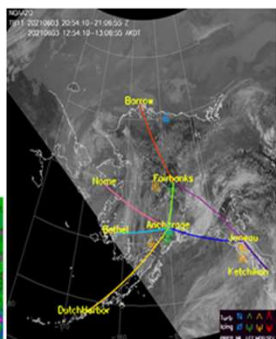
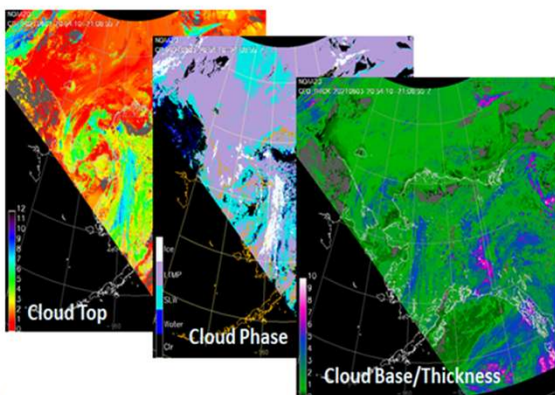
CIRA's SLIDER (<http://rammb-slider.cira.colostate.edu>)



(Haynes et al. (2022 JTECH))

Gridded 3D Cloud Data for Aviation

NOAA Enterprise Cloud products
(2D pixel data for the individual granules)



Additional information

- Temperatures (NUCAPS/NWP)
- PIREPs (Icing/Turb)
- Terrain



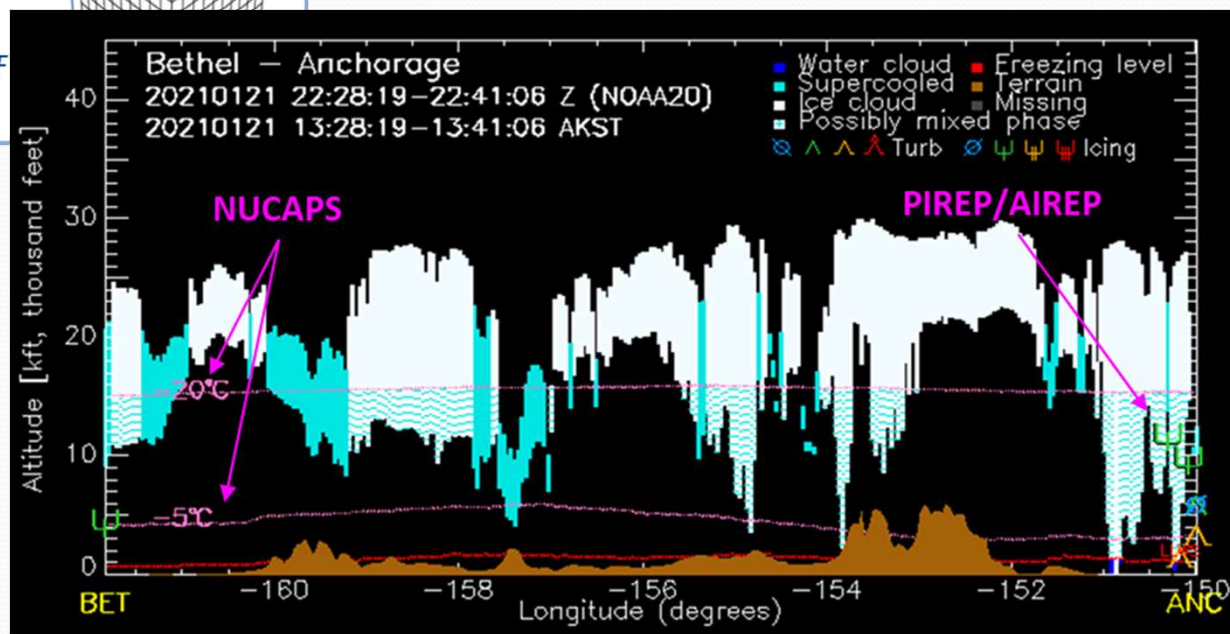
Gridded 3-D Cloud Data



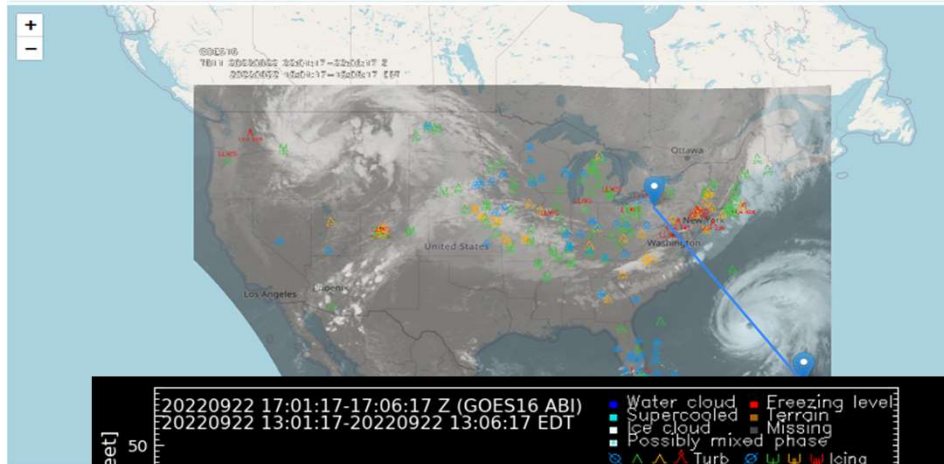
Compact integers into NetCDF

- 3D gridded cloud data using NOAA Enterprise satellite cloud products, leveraging CIRA's JPSS/GOES research

- A comprehensive package to extend the benefit of satellite data into the vertical dimension for users: *Cloud Cross-sections*

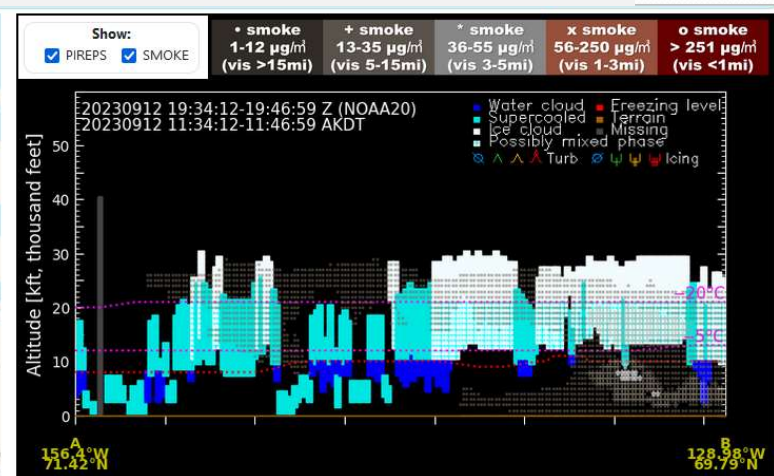
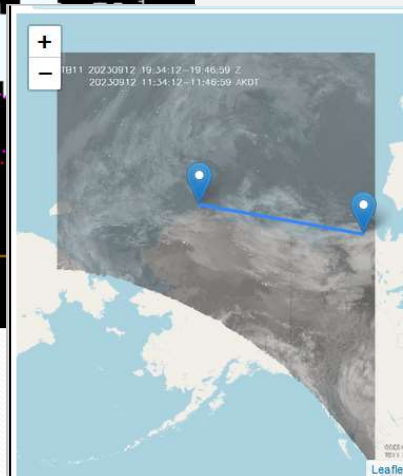
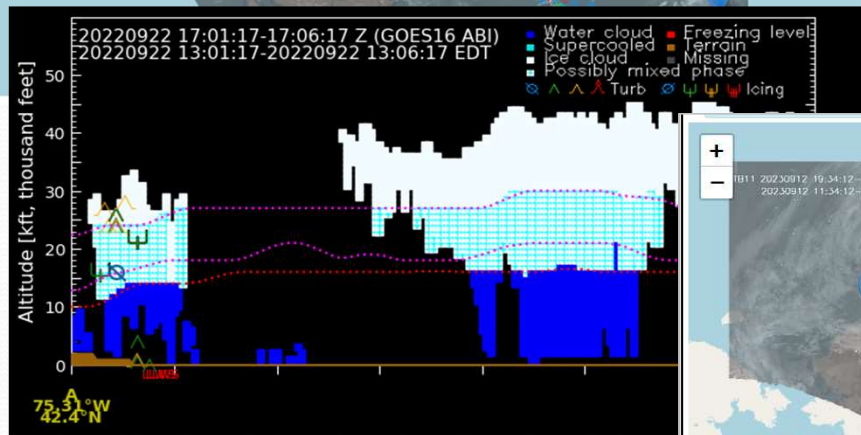


Gridded 3D Cloud Data for Aviation



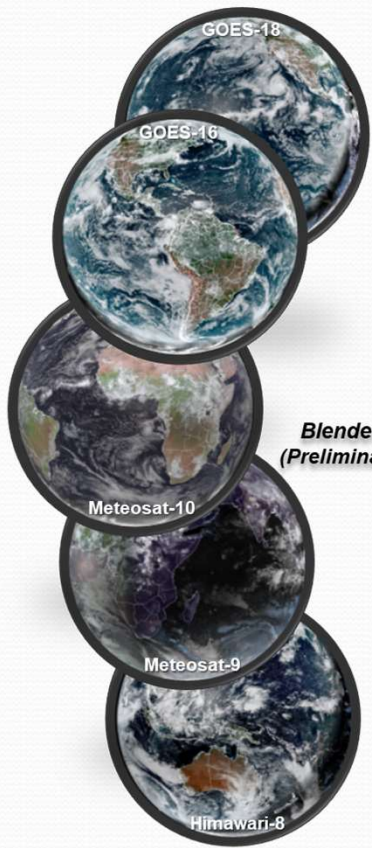
- CIRA's aviation website for custom cloud cross-sections: <https://aviation.cira.colostate.edu>
- Active user engagement in support of NOAA Aviation Initiative efforts
- Continue to improve the products based on user feedback
- smoke data addition – HRRR model

Updated with the smoke visibility information

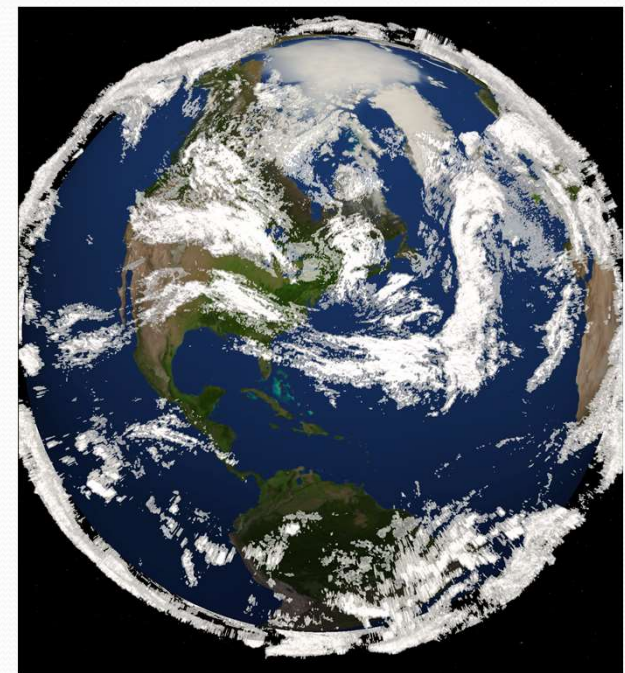
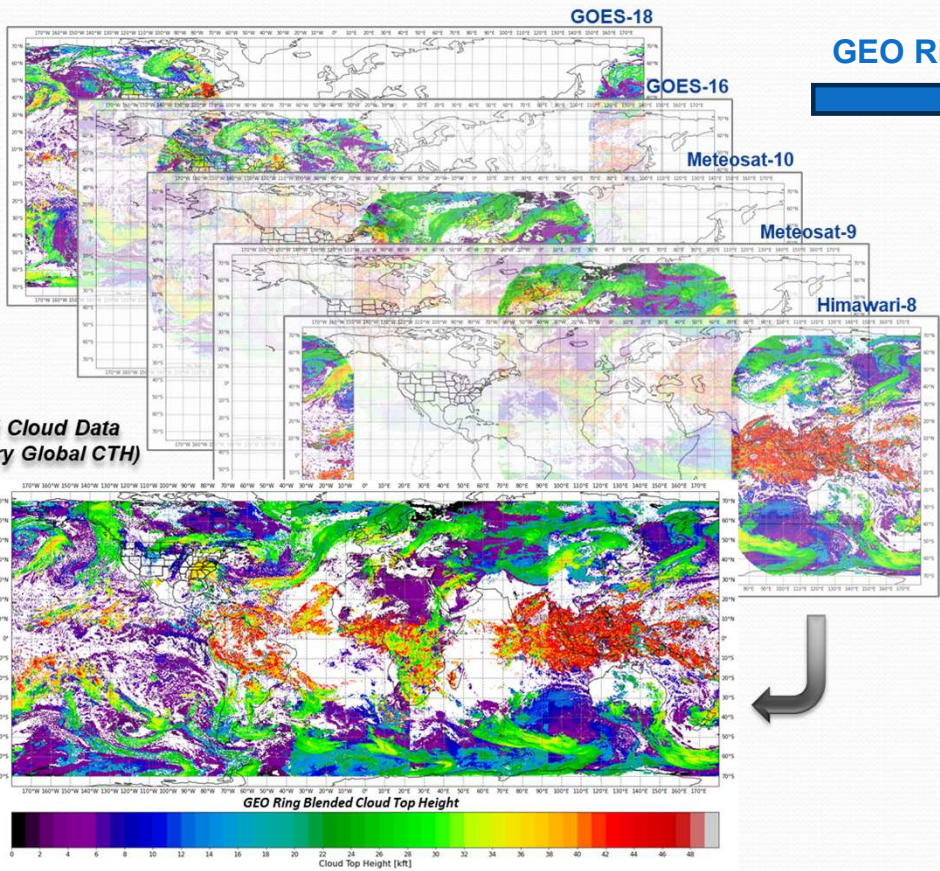


General Feedback Feedback for This Image

Expansion Toward Global 3D Cloud Data



Blended Cloud Data
(Preliminary Global CTH)



CIRA's OVERCAST:

A Satellite-Based 3D Global Cloud Field Analysis + Time

Generate quantitative global, near real-time 3D satellite cloud analysis based on:

- Interfaces with NOAA Enterprise Cloud algorithms (CLAVR-x)
- **Cloud Geometric Thickness** (developed using NASA A-Train data, operational at NOAA)
- Combines physical retrievals and Machine Learning for advanced 3D-blended product
Hidden layer estimation, Ice/Water profile estimation

A global cloud analysis rendered via:

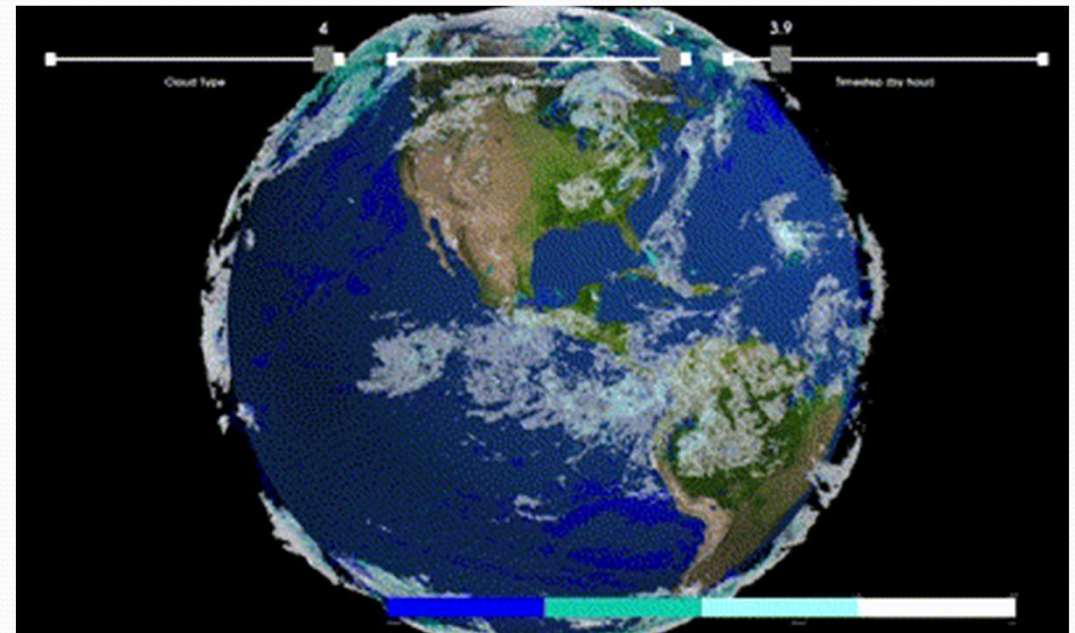
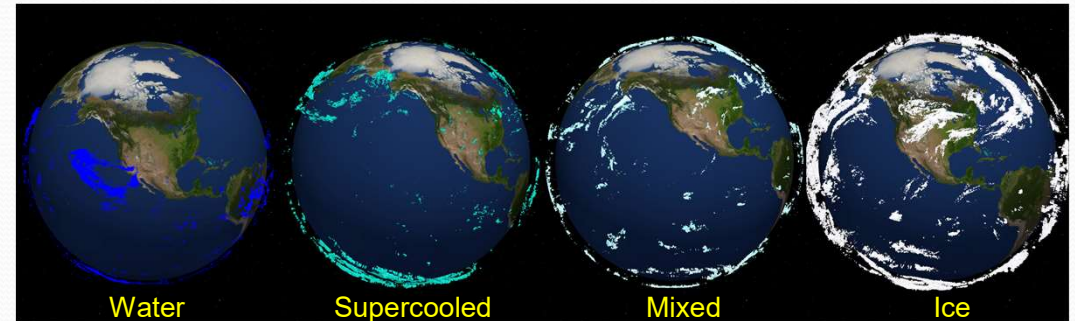
- Geostationary + polar-orbiting satellite sensors (ABI, AHI, SEVIRI/FCI, VIIRS, AVHRR), blended at seams
- Nowcasting to advent and evolve the 3D cloud field forward in time
- Potentially expand to other cloud/environmental fields

Be mindful of the past, present, and future of global cloud data development activities in parallel:

- WWMCA (World Wide Merged Cloud Analysis) by Air Force Weather
- ISCCP-NG (International Satellite Cloud Climatology Product—Next Generation)

Gridded 3D Cloud Data

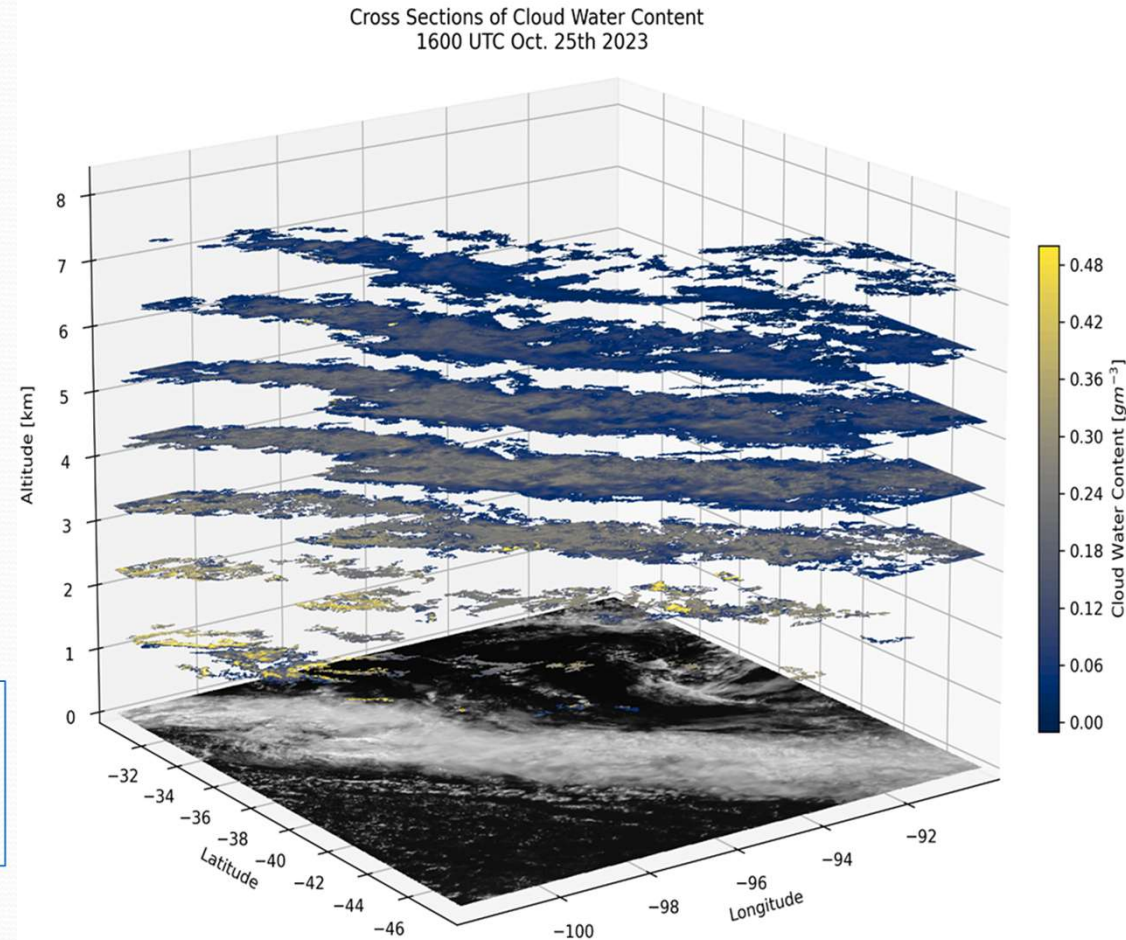
- Our current, *experimental near real-time product* features
 - GOES-16 & 18, Meteosat-9 & 10, and Himawari-9 (work in progress: MTG and GK-2A)
 - $0.02 \times 0.02^\circ$ coverage from GEO-ring sensors, between 70° N/S latitude
 - 250 m vertical resolution
 - Produced hourly (target: 10-15 min)
- Cloud vertical extent mask, including cloud phase
- Polar orbiters and additional AI/ML products: coming soon



Credit: Evan Rose

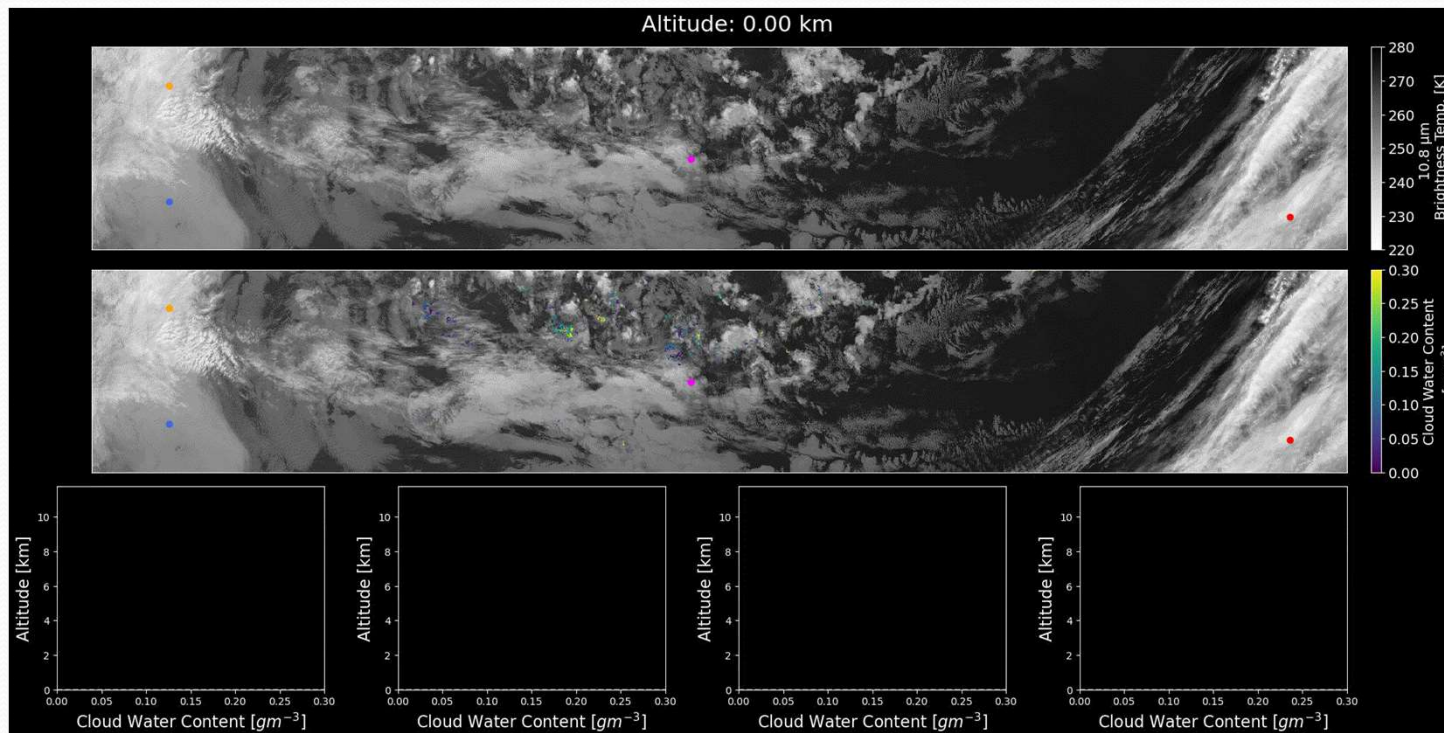
- NASA CloudSat radar offers detailed **vertical profiles of cloud water content**
 - Building a neural network to estimate the shape of the cloud water profile based on VIIRS/ABI observations matched with CloudSat
- *To complete the 3D cloud structure information*
 - *Potentially to help improve cloud visibility information and aircraft icing potential detection*

(Chuck White et al.)



GOES-16 ABI cross sections of cloud water content displayed on top of $0.65 \mu\text{m}$ reflectance (25 October 2023)

AI-based Cloud Water Profile Estimation

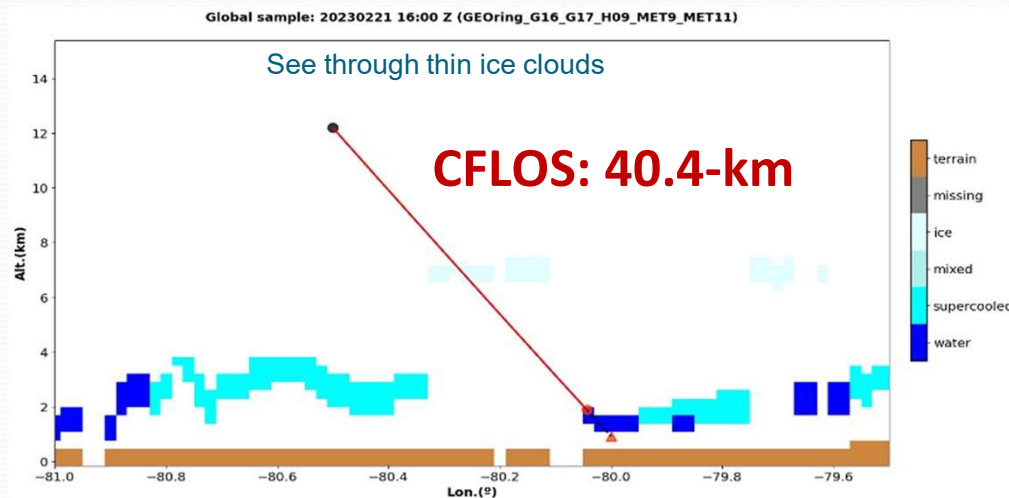


	Mean Profile	Cloud-Type LUT	CTH/CWP LUT	Neural Network
Earth Mover's Distance	0.74	0.69	0.70	0.60
Mean Absolute Error	0.046	0.043	0.044	0.039

Deterministic Cloud-Free Line of Sight (D-CFLOS)

(Hungjui Yu et al.)

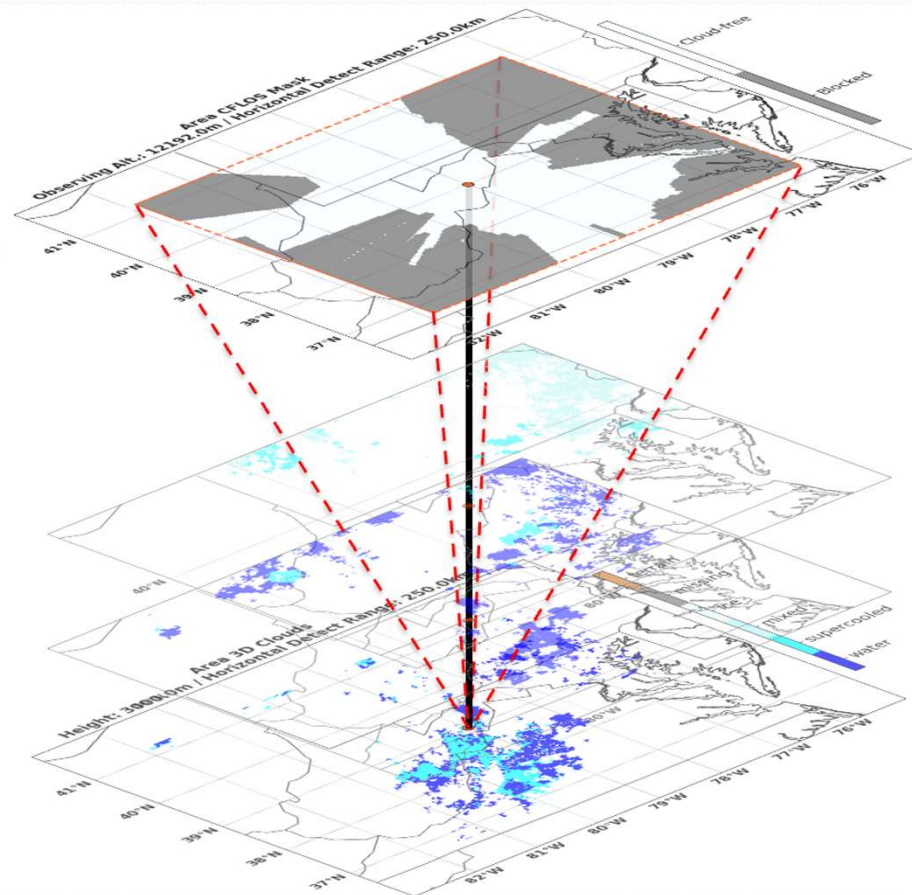
- CFLOS is a tool to calculate the probability that a visible line-of-sight exists between an observer and a target potentially obstructed by clouds
- Help determine the safest altitude to fly while still maintaining a view of ground targets



Upper levels
(CFLOS mask)

⋮
⋮
⋮
⋮

Lower levels

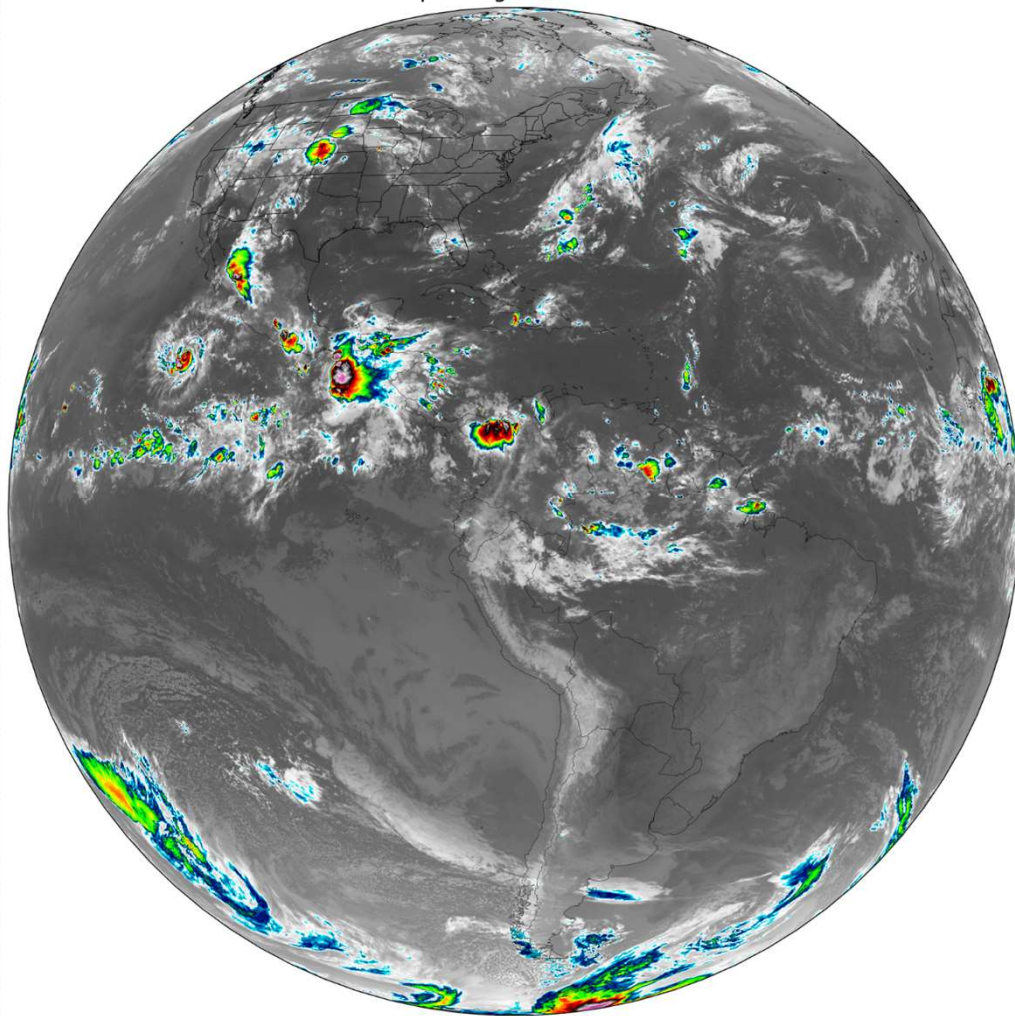


CFLOS describing *all regions* at an altitude (within an area) that can view a target on another level

Optical Flow – Nowcasting Example

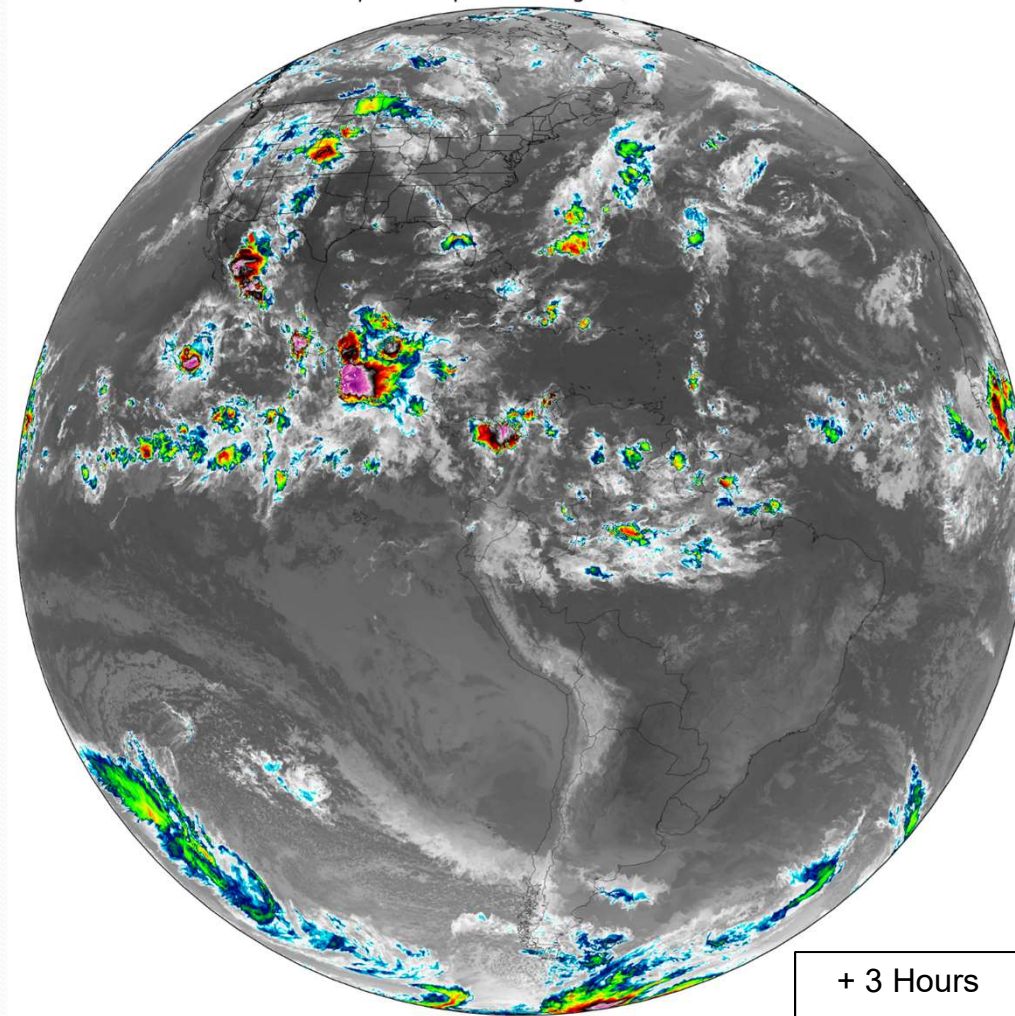
Truth Imagery

GOES-16 10.3 μm Aug 02, 2023 05:10:20 UTC

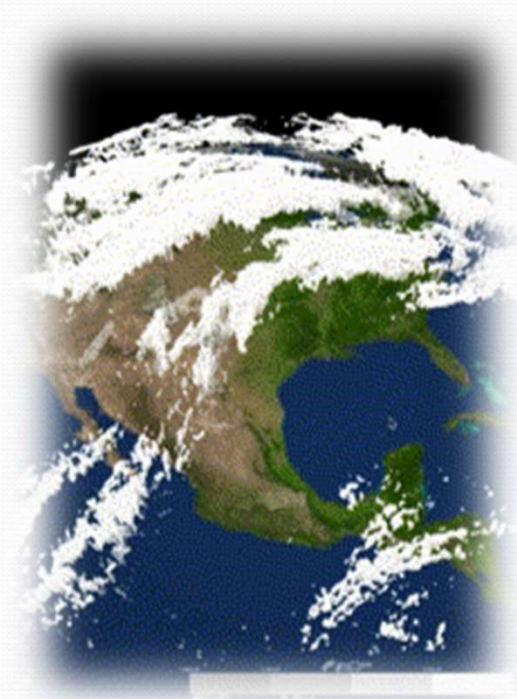


Optical Flow Nowcasted Imagery

GOES-16 10.3 μm Interpolated Aug 02, 2023 05:10:00 UTC



+ 3 Hours



- Introduced Cloud Vertical Cross-section products to provide satellite-based 3D cloud information for aviation users, leveraging JPSS and GOES research
- CIRA's OVERCAST to provide a real-time, **global 3D cloud** analysis
 - A world-wide cloud analysis
 - Improve science algorithms and validation with applications related to visibility
 - A number of AI/ML-based advanced products, including refined multilayer clouds, vertical cloud water content profiles, global synthetic radar, proxy visible imagery, and synthetic passive microwave, and short-term advection to enable 4D applications



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