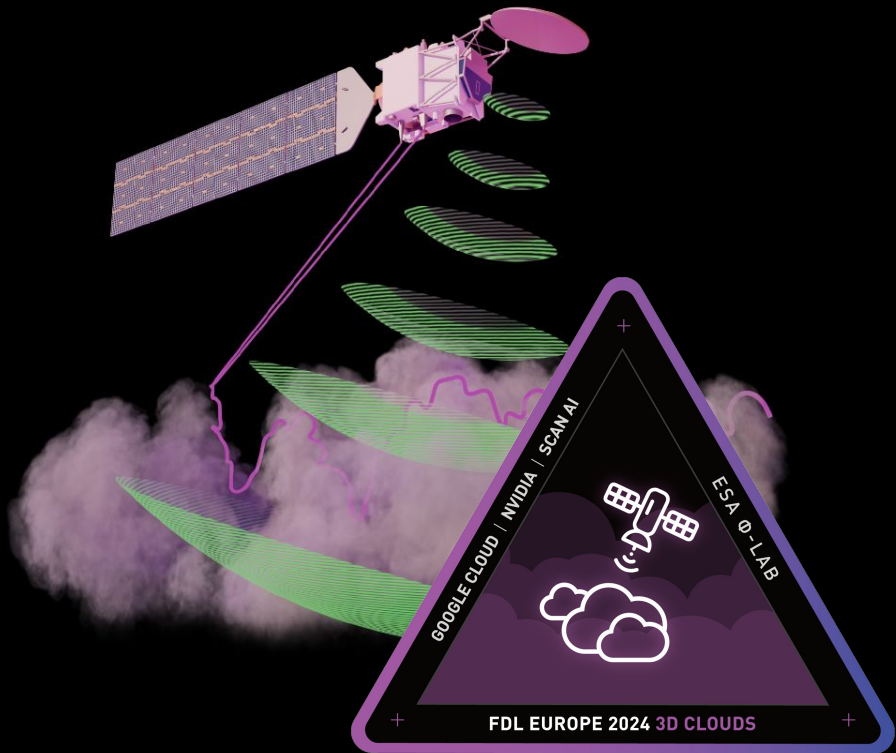




EARTH  
SYSTEMS  
LAB

TRILLIUM EUROPE



# 3D Clouds

## 9 August 2024

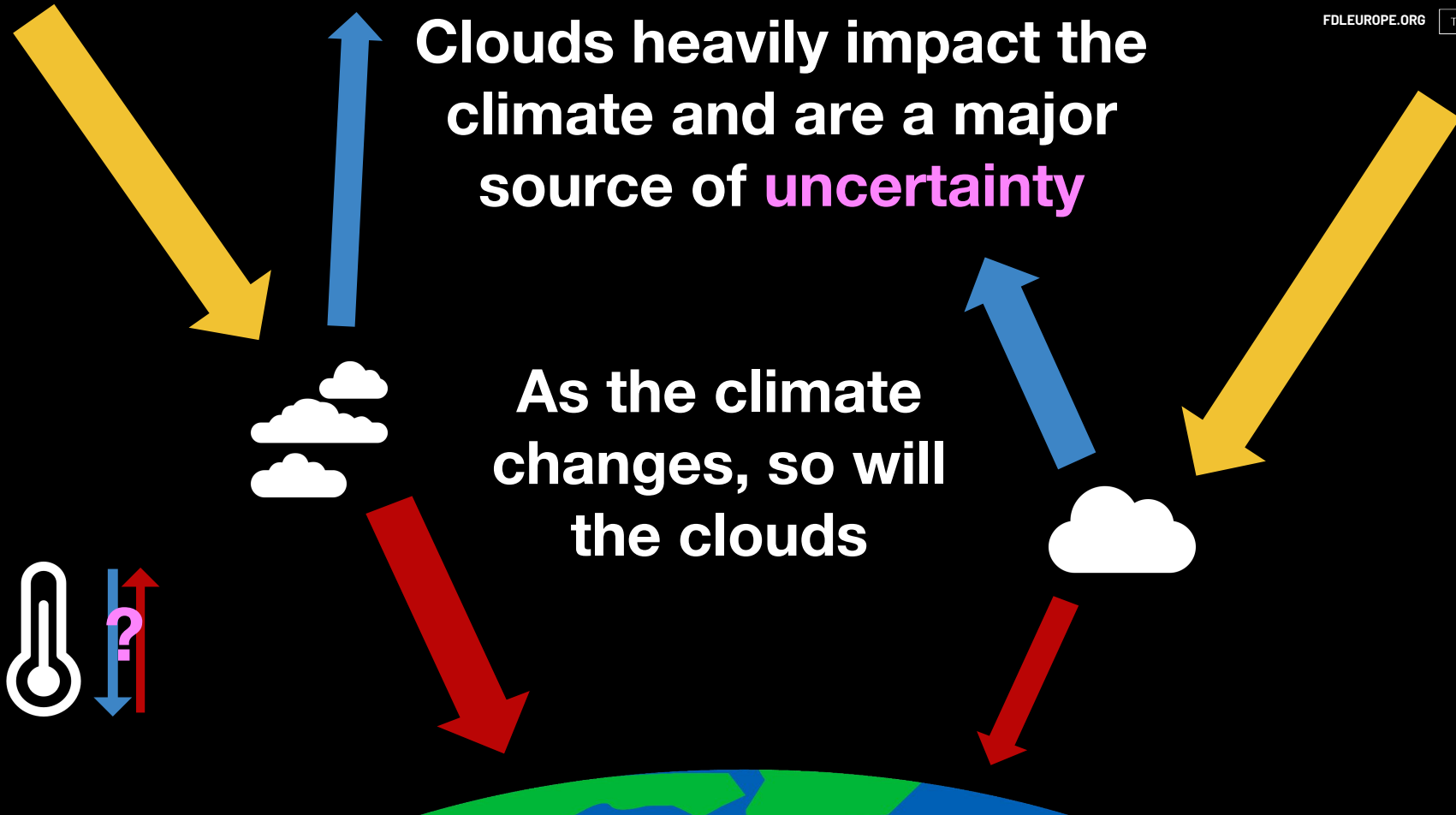


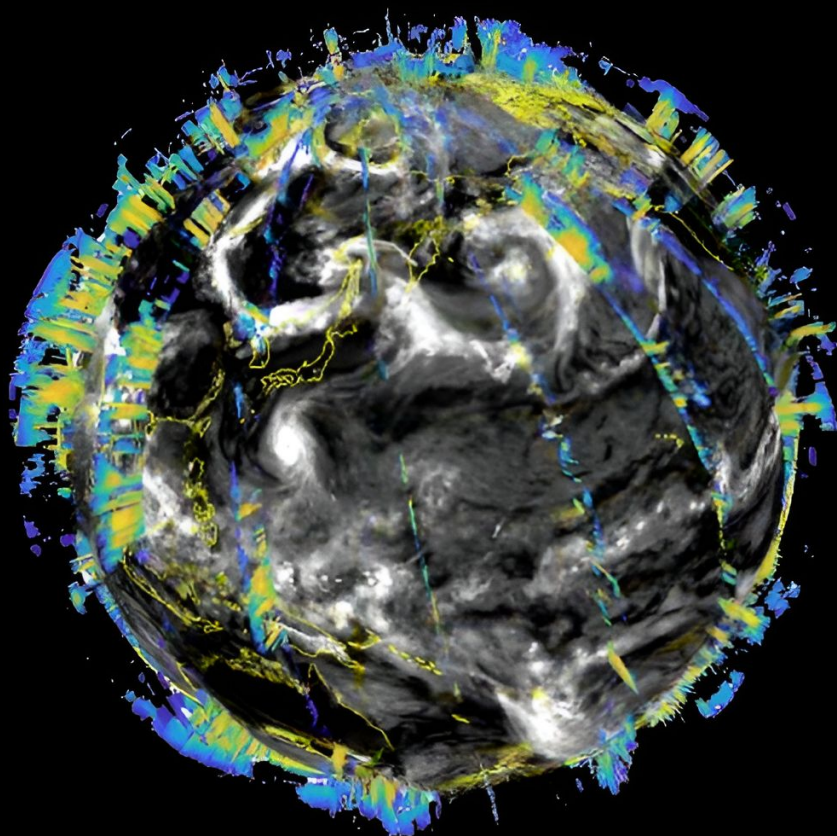


Climate change is “a distant problem that requires  
decisions now to avoid **uncertain** losses far in the future”  
- Daniel Kahneman

Clouds heavily impact the climate and are a major source of **uncertainty**

As the climate changes, so will the clouds





**Real-time 3D** global  
cloud maps are a  
**missing piece** of the  
climate puzzle

# How do we measure clouds?



Global coverage every 25 days

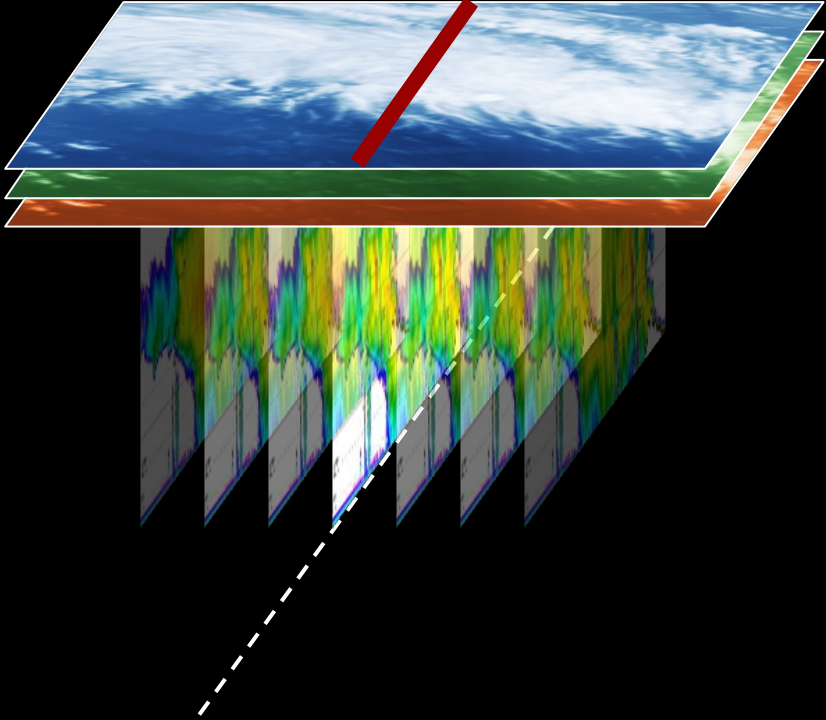
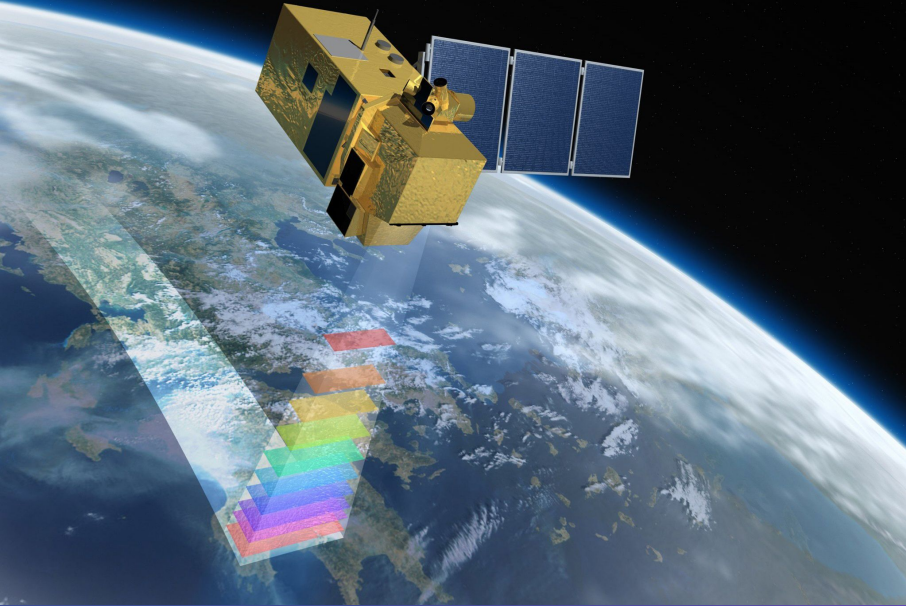
Satellites image the  
entire Earth many  
times per day





# Is it possible to get the cloud profile from imaging satellites?

## Can this be extended to 3D?





EARTH SYSTEMS LAB



3D CLOUDS USING MULTI-SENSING . 2024

RESEARCHERS



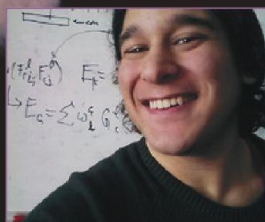
Stella Girtsou



Lilli Freischem



FACULTY



Giuseppe Castiglione



FACULTY



Margarita Bintsi



ADVISOR



J. Emmanuel Johnson



Emiliano Díaz



Joppe Massant



William Jones



ADVISOR



Anna Jungbluth



ADVISOR



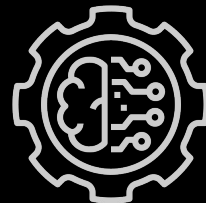
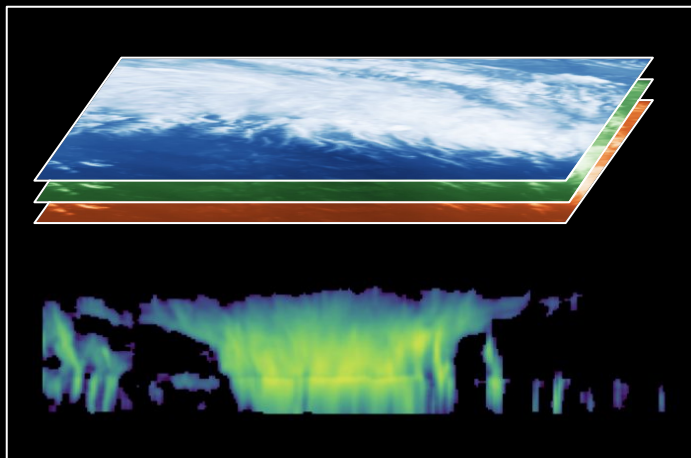
Michael Eisinger





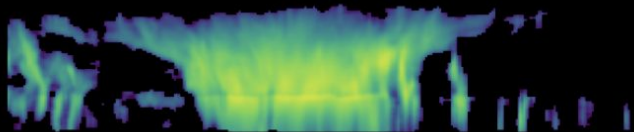
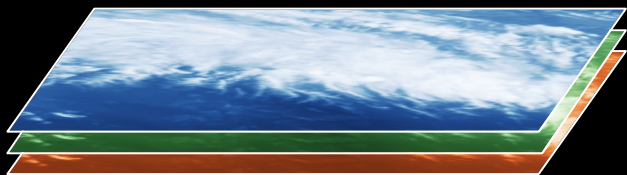
# N3FOS

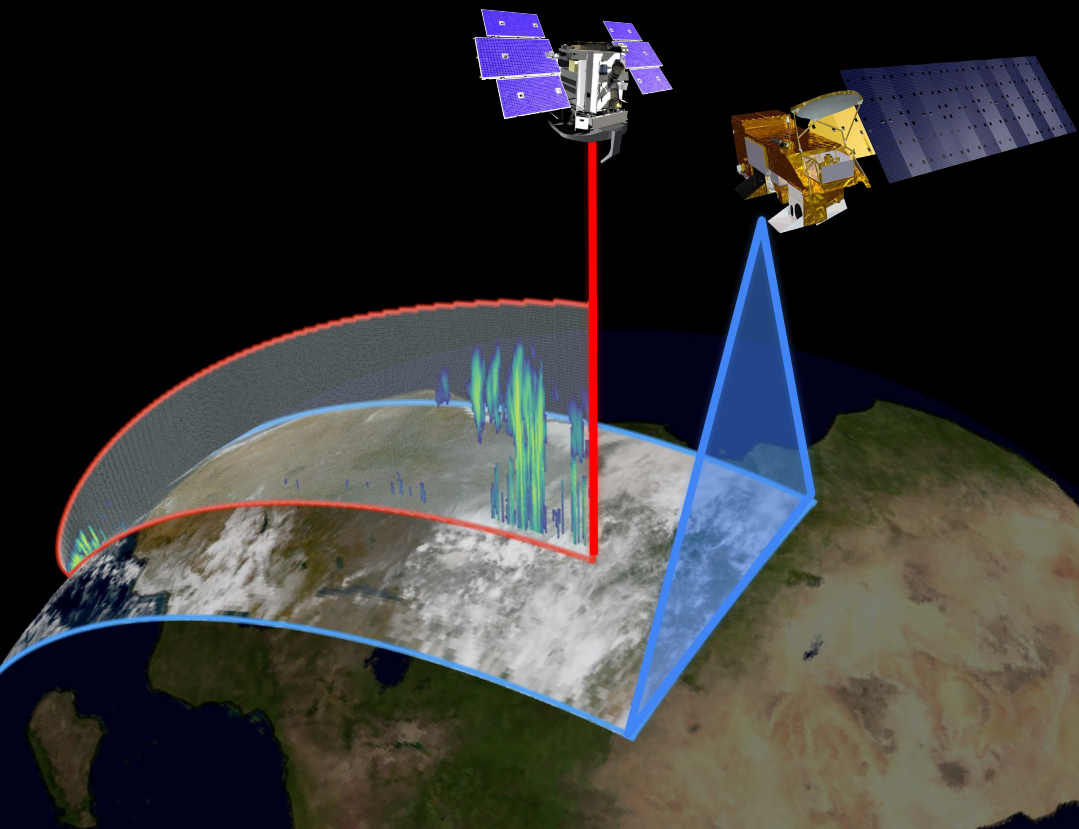
Satellite Images



3D map of clouds



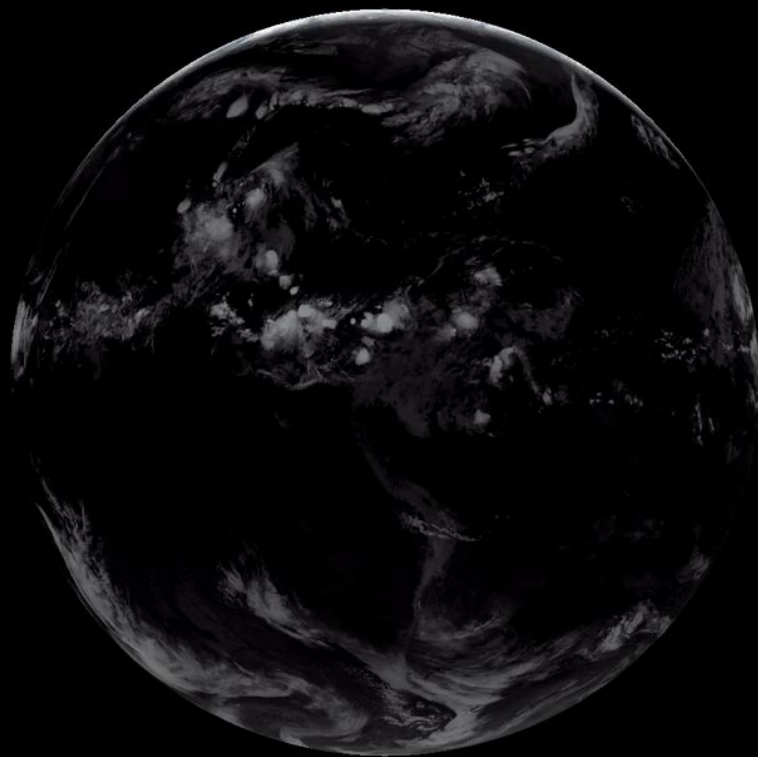




Satellites in same orbit



Cloud profiles with  
corresponding satellite  
images



Satellites measuring  
every 15 minutes

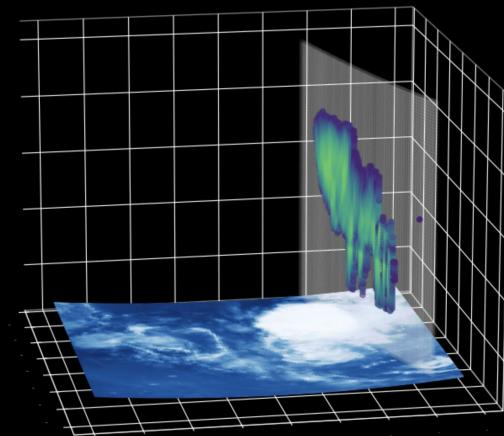
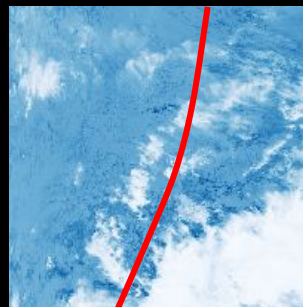
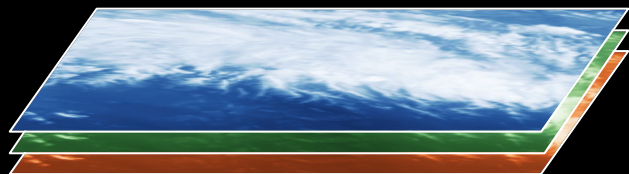


Possibility for real-time  
global map

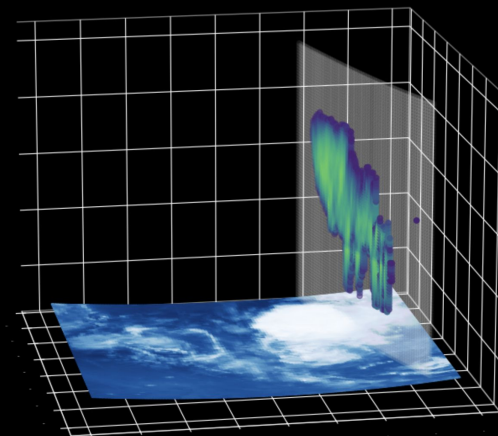
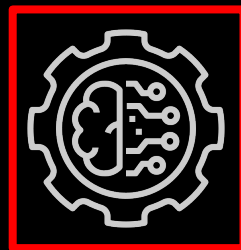
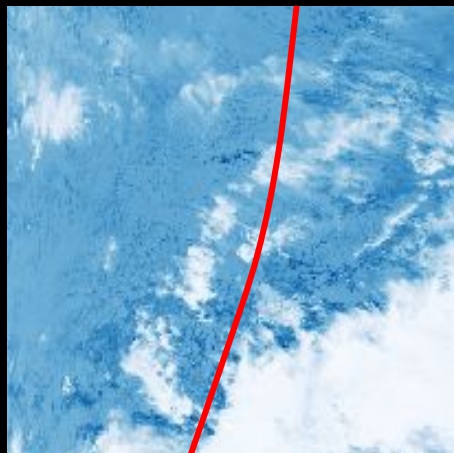


Align in space  
and time

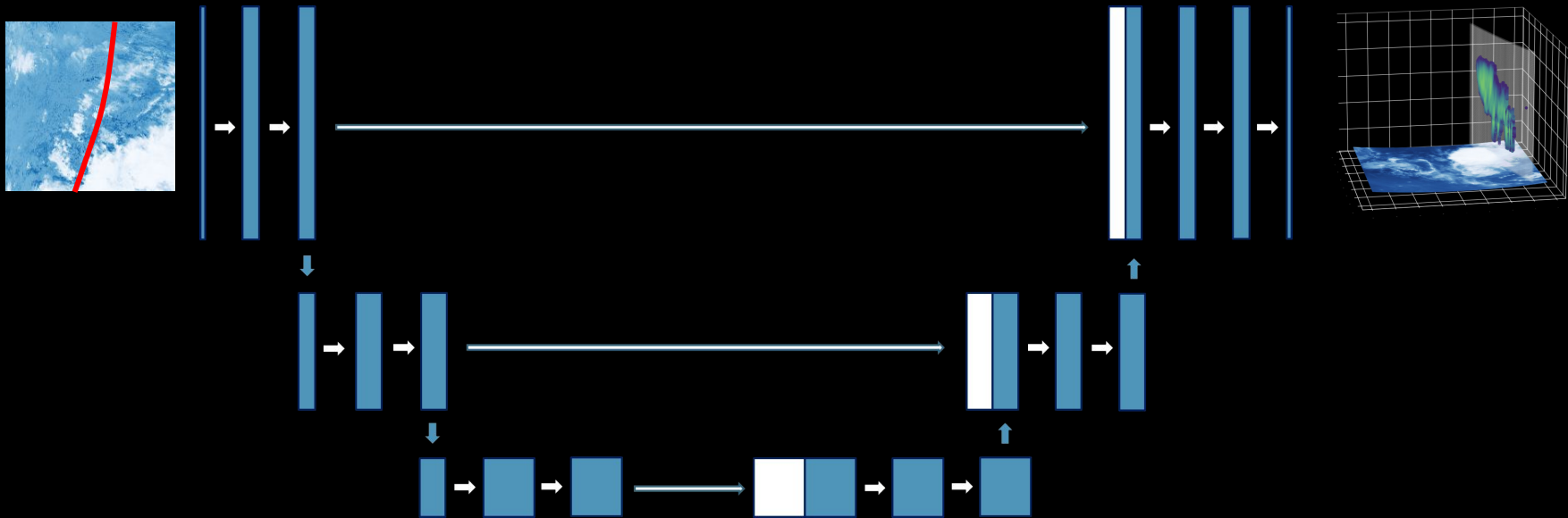
Transform to  
3D cube



# AI models to translate 2D satellite images to cloud profiles

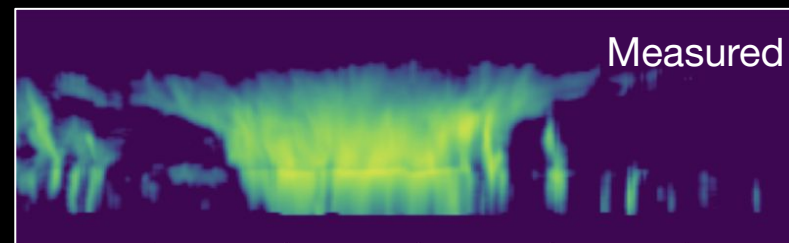
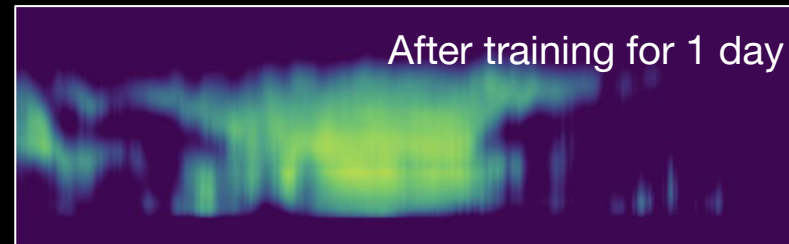
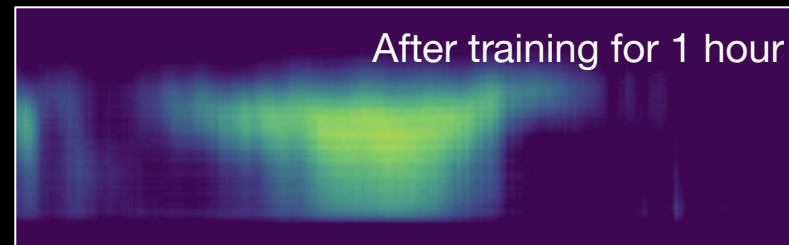
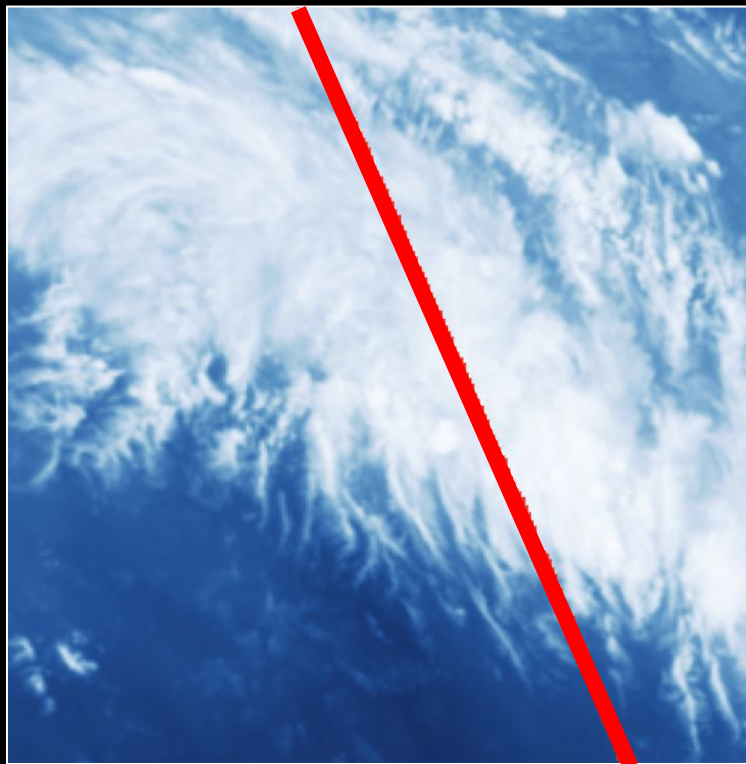


# State-of-the-art approach: U-NET neural network

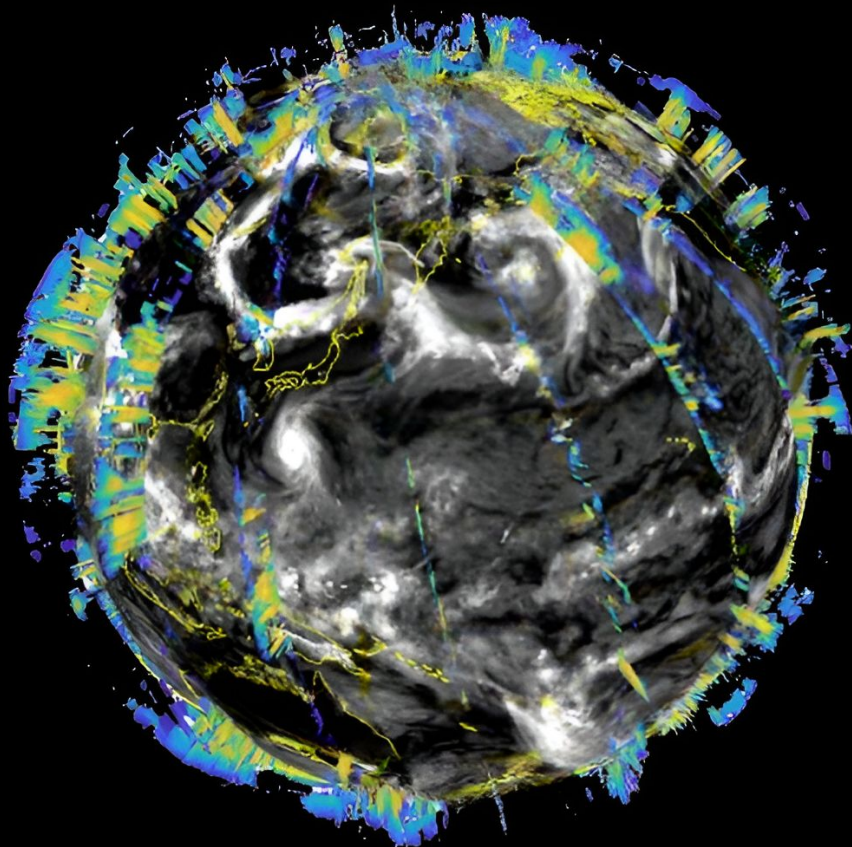


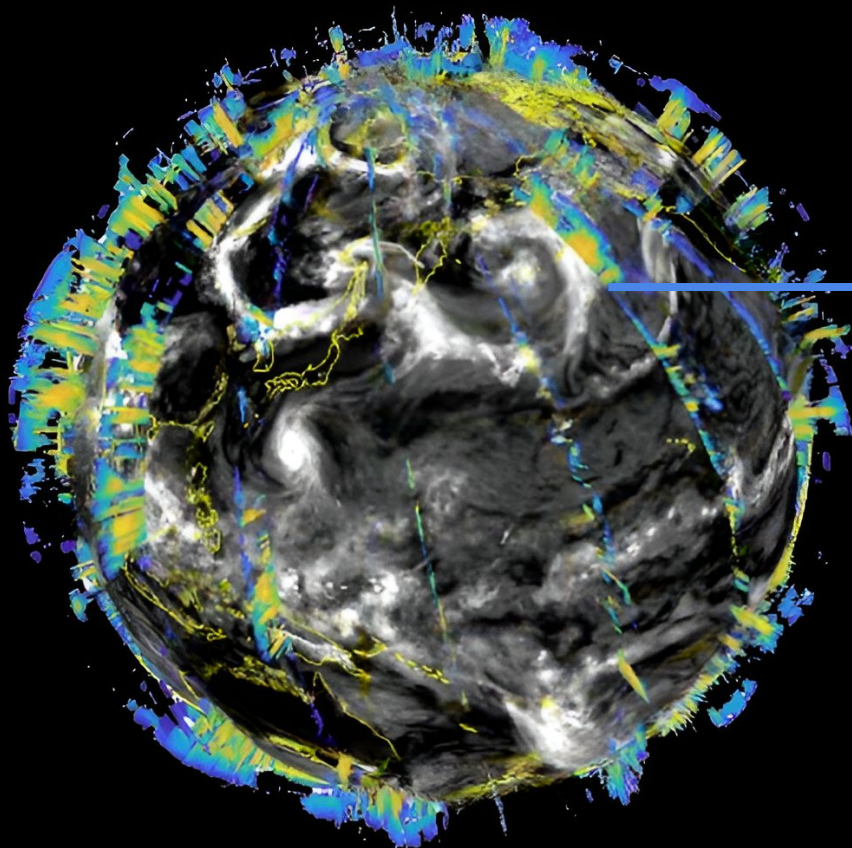
Model based on Brüning, et. al. (2023). AI-derived 3D cloud tomography from geostationary 2D satellite data

# Results of state-of-the-art model

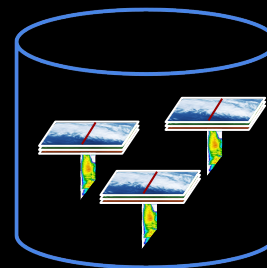
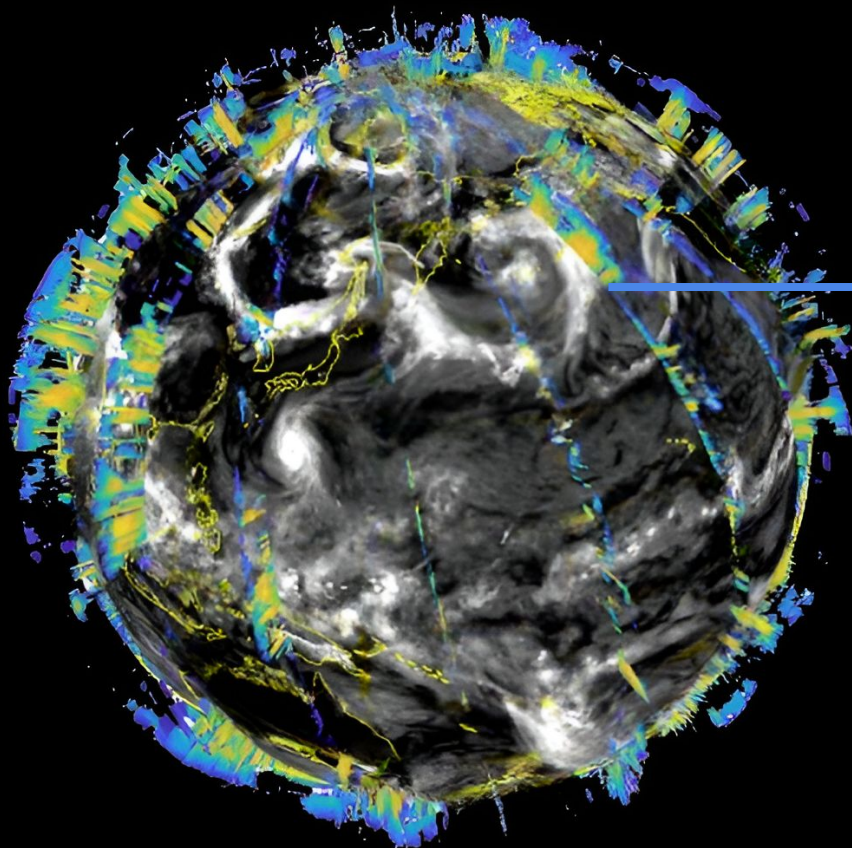




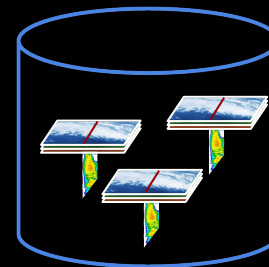
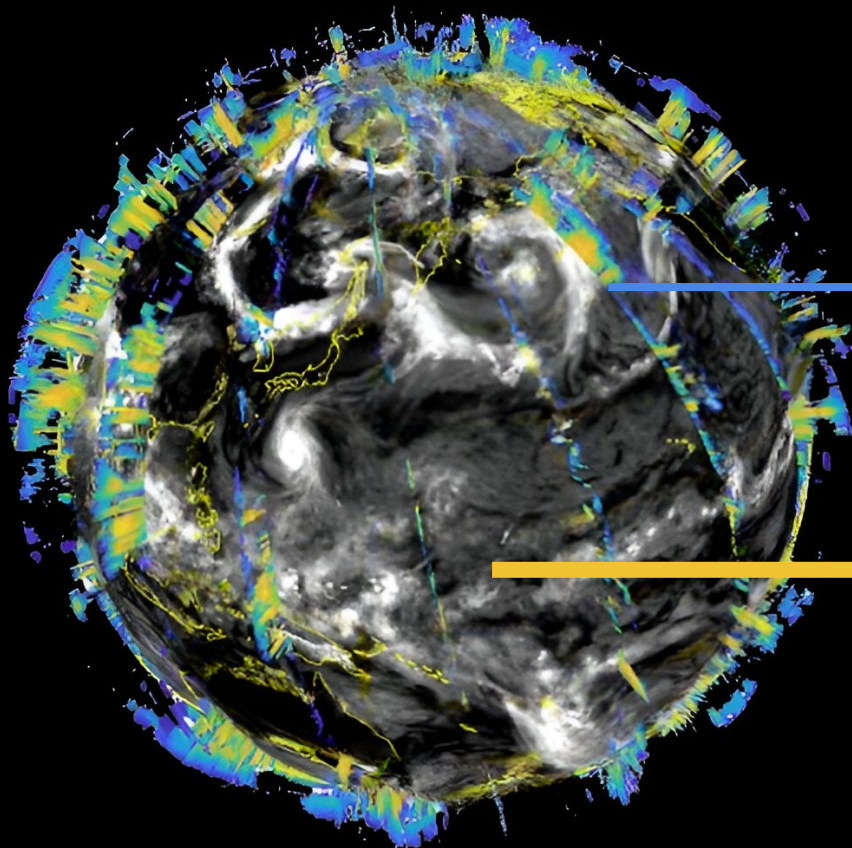





Limited coverage  
of vertical profiles



Gigabytes of  
Image-Profile  
Pairs

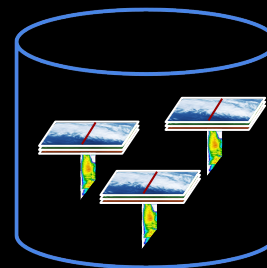
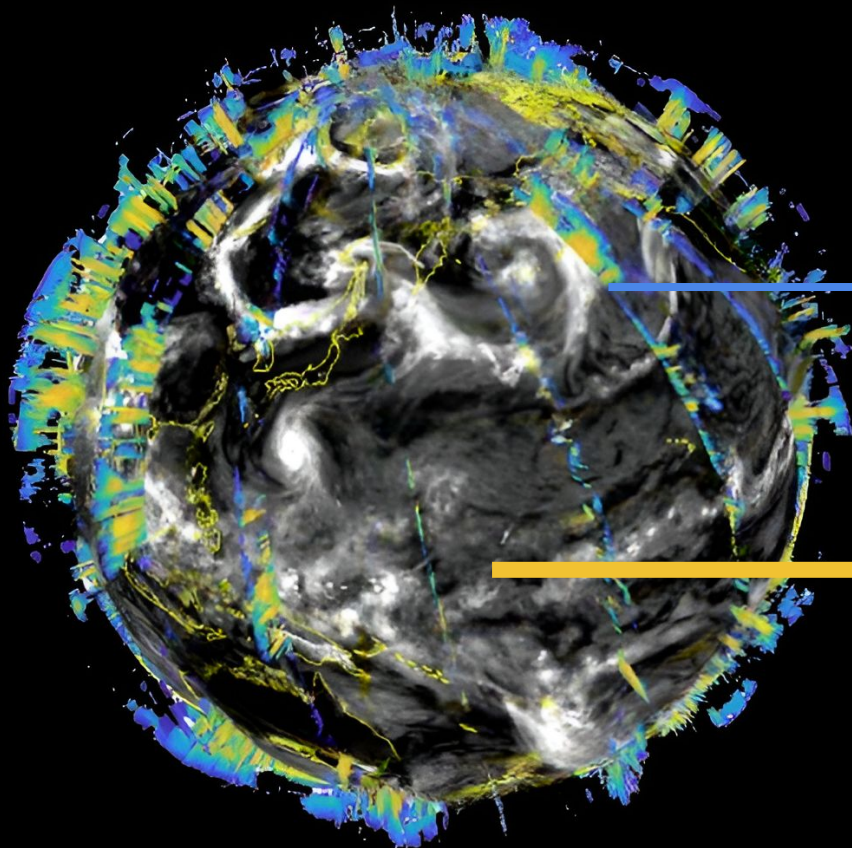


Gigabytes of  
Image-Profile  
Pairs



Satellite images  
without profiles





Gigabytes of  
**Image-Profile  
Pairs**



Terabytes of  
**Unpaired  
Images**

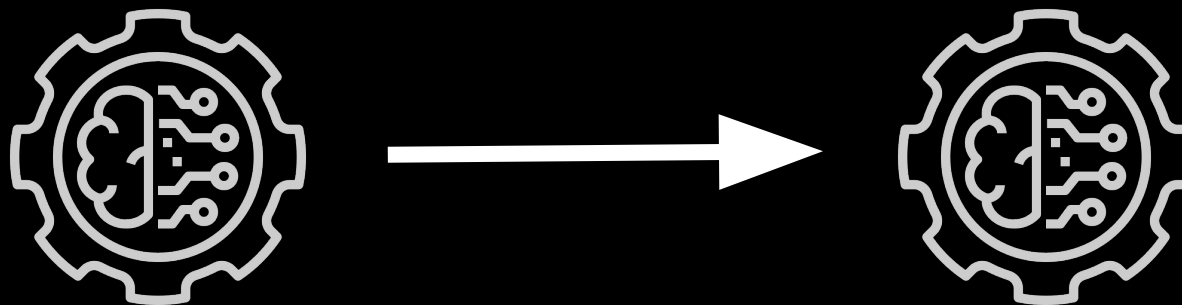
# N3FOS

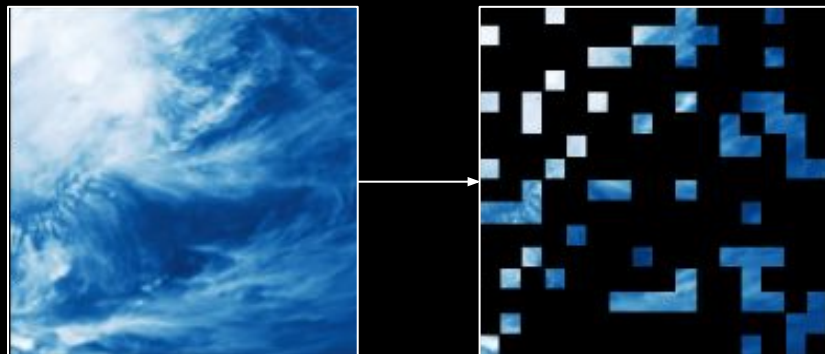
## Step 1:

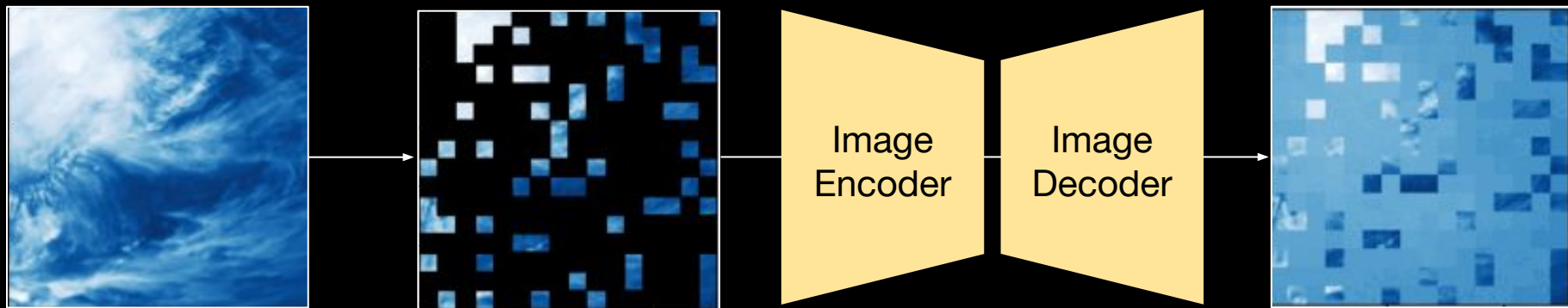
Learn from terabytes  
of unpaired images

## Step 2:

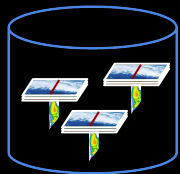
Specialize to predict 3D  
using image-profile pairs









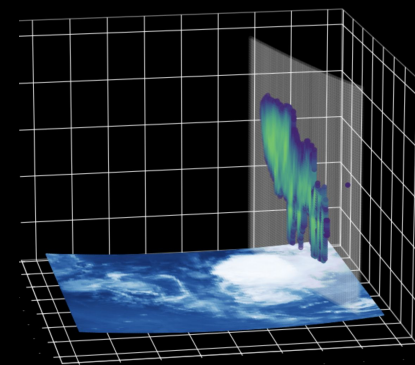


# N3FOS

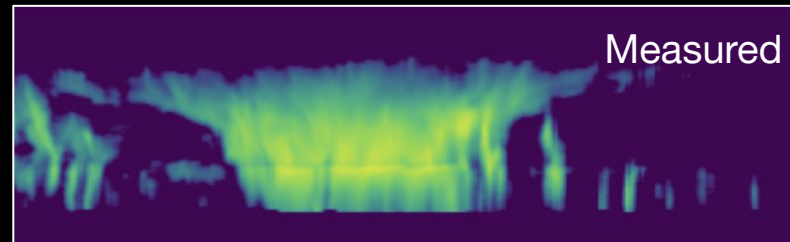
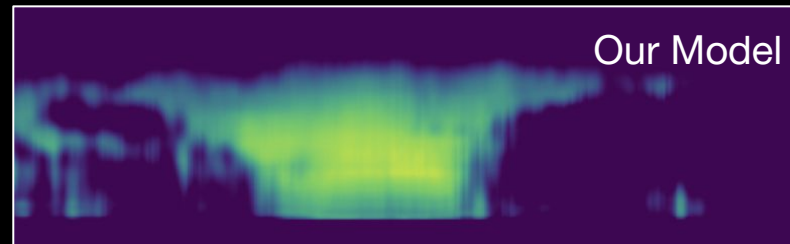
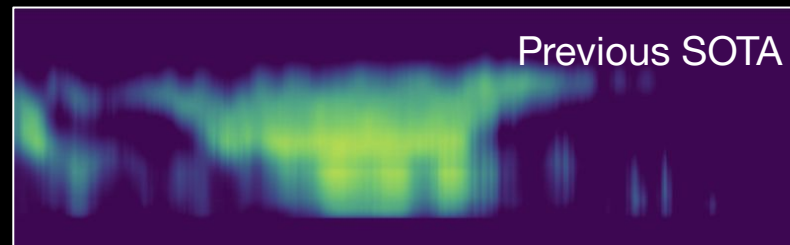
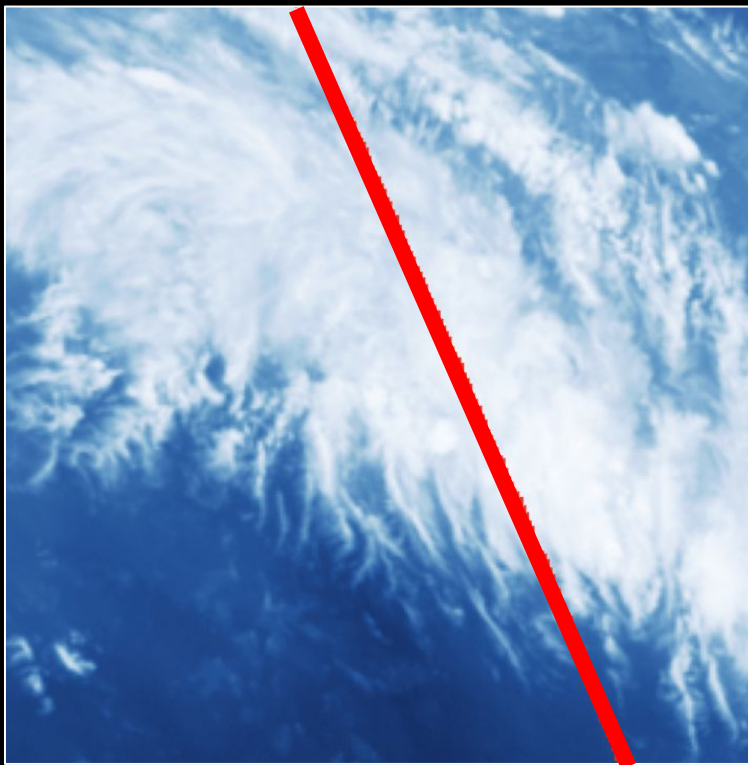
## AI Model

Image  
Encoder

3D  
Decoder



# Results after pretraining



# Predicting cloud type

Input



Predicted

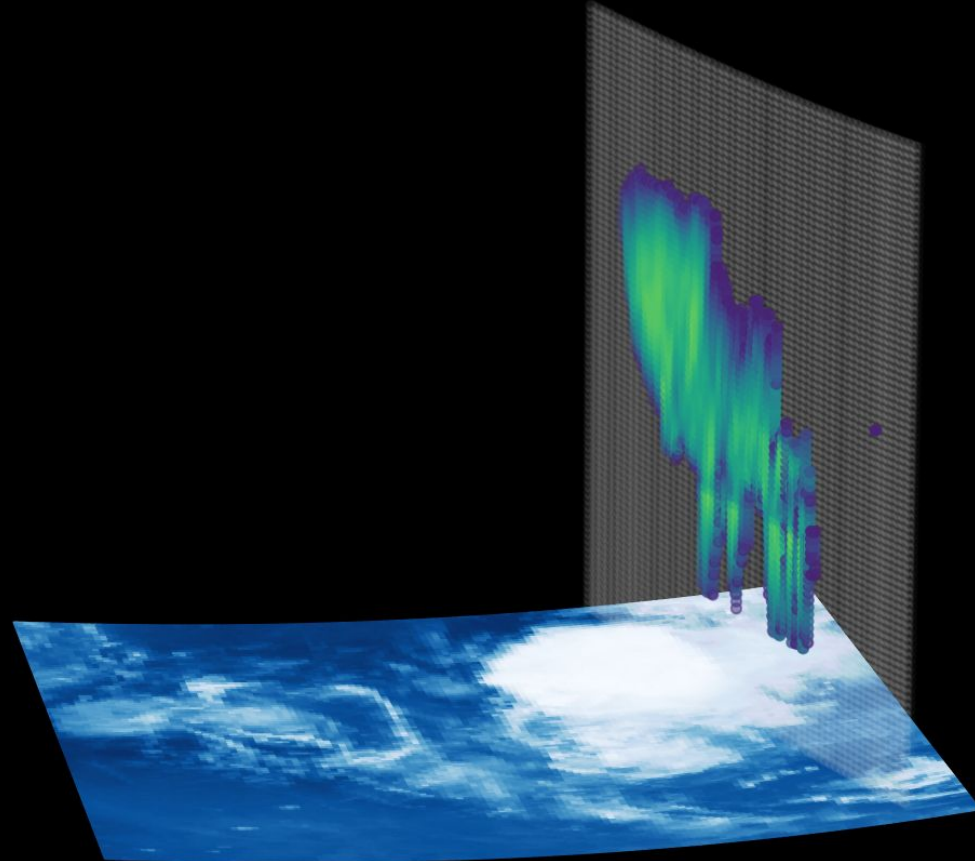


True



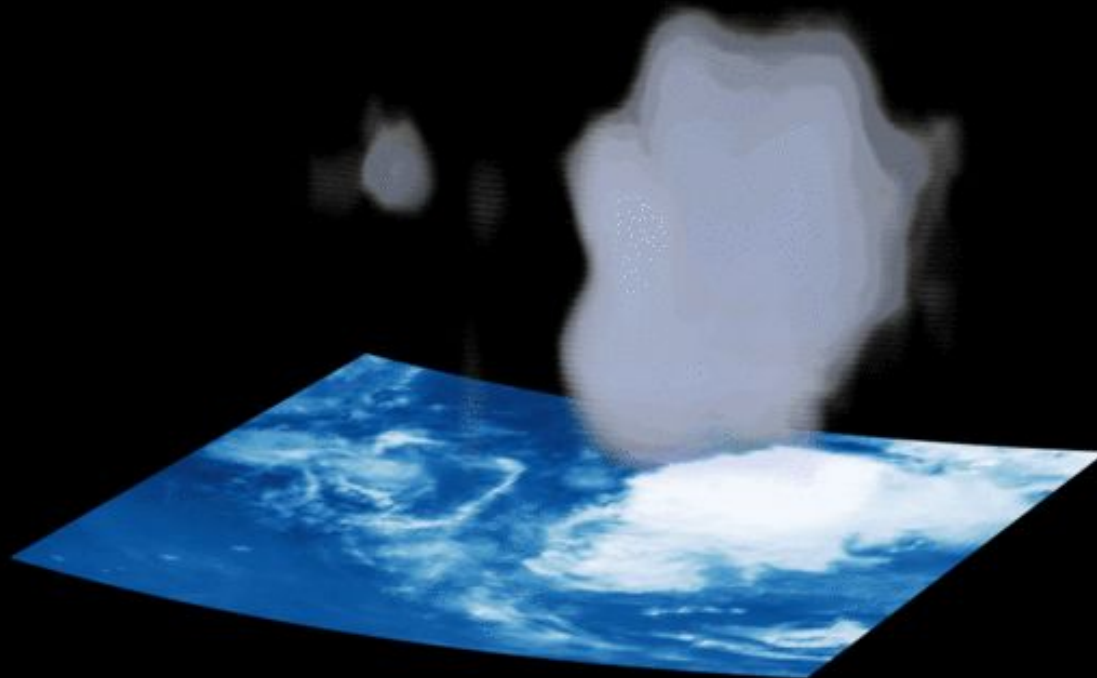
Cloud Type











# N3FOS

Near real-time  
global satellite data



Modular Data  
Processing



Near real-time  
global 3D cloud maps

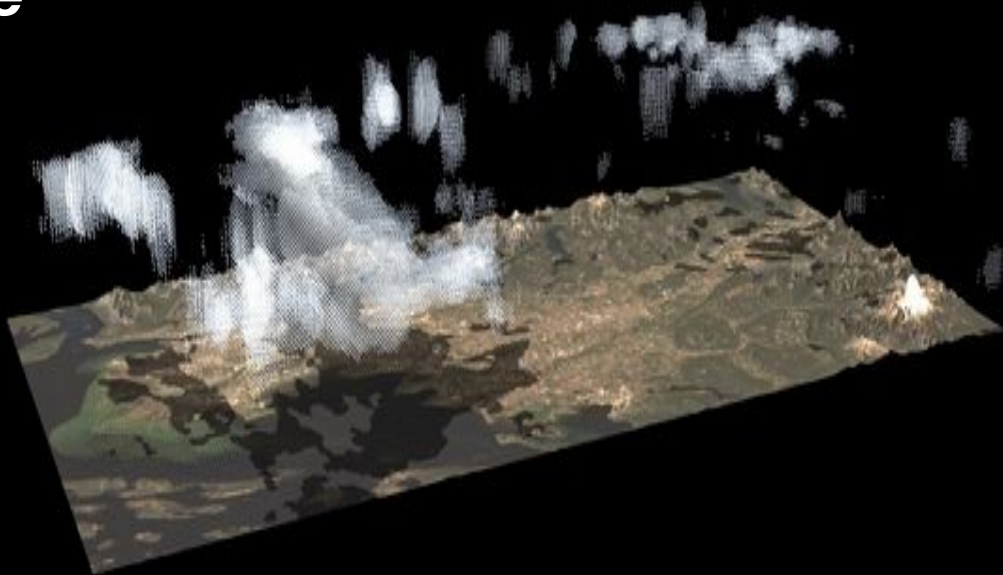


Ready for  
EarthCARE

Provide **N3FOS** as a tool the community can build upon

Advance climate science via **3D cloud** data

One step closer to solving the **climate puzzle**



Check it out yourselves!

<https://3dclouds.vercel.app/>