

# Processing PACE data with Python: get a polarized hyperspectral view of the Earth

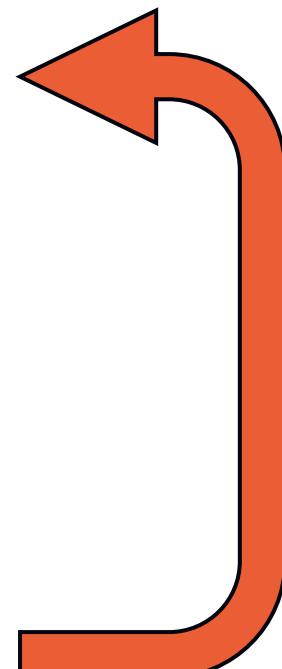
*Laura van der Schaaf & Jeroen Rietjens*

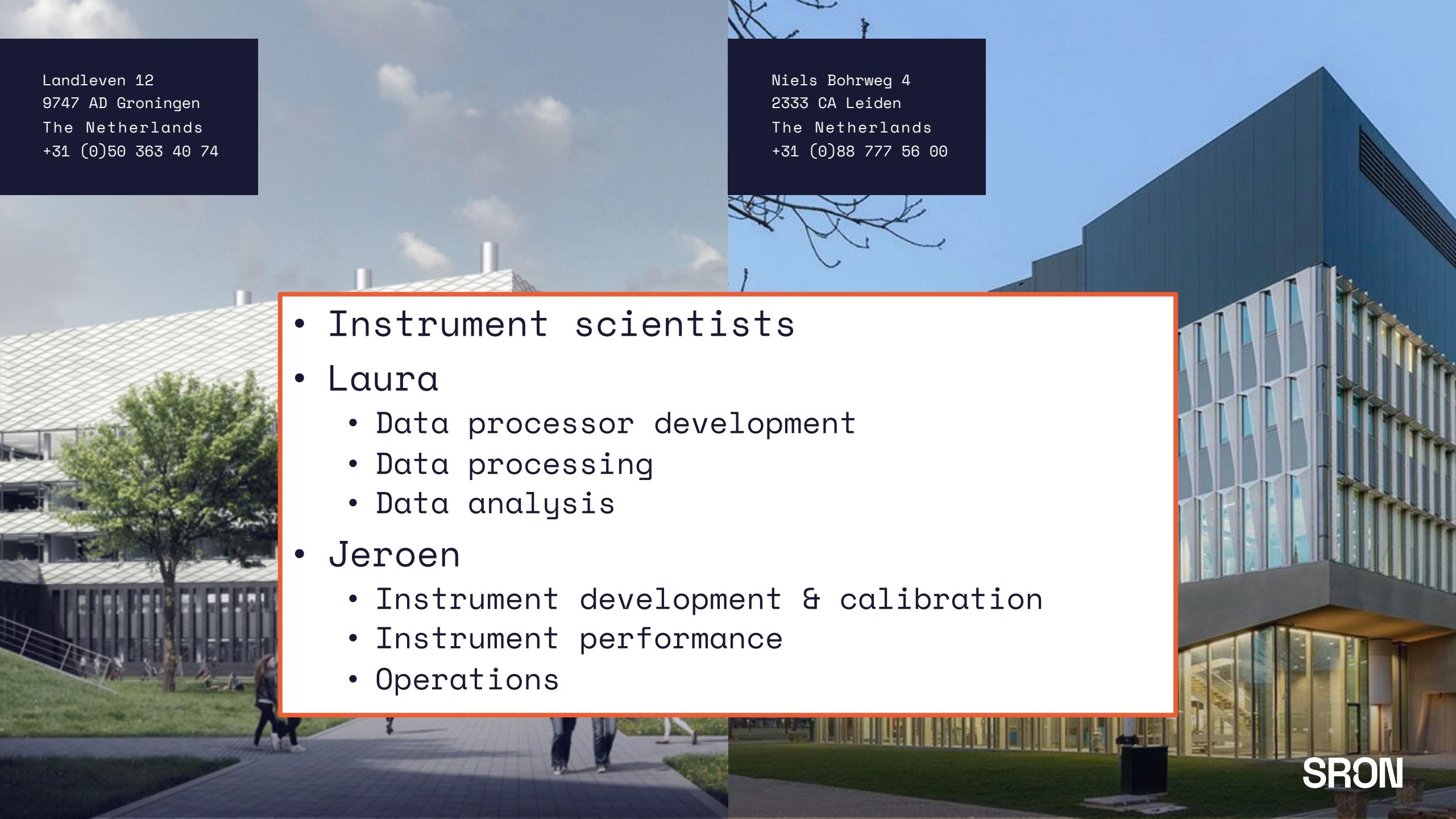


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- SRON Space Research Organisation Netherlands (NWO-I)
- ~200 people: (instrument) scientists, engineers, staff
- Scientist using satellite data
  - Earth observation
  - X-ray astrophysics
  - Far-infrared astrophysics
- Satellite instrument requirements definition
- Technology development
  - X-ray & far-infrared detectors
  - Space optics (immersed grating, meta-optics, ...)
  - Coronagraphs for high-contrast imaging
- Satellite instrument development and calibration





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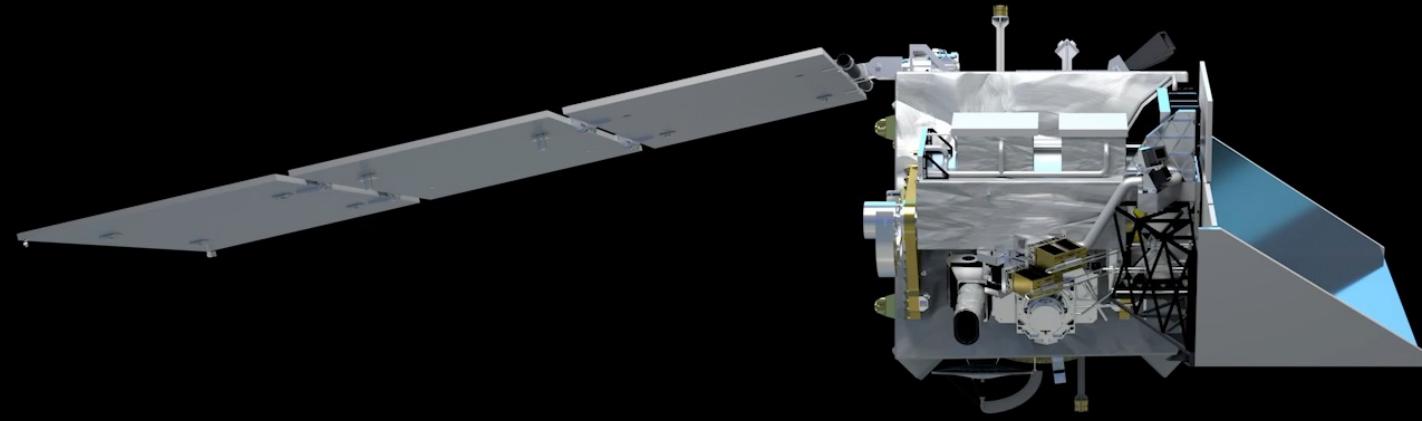
- Instrument scientists
- Laura
  - Data processor development
  - Data processing
  - Data analysis
- Jeroen
  - Instrument development & calibration
  - Instrument performance
  - Operations

**SRON**

# Outline

- What is PACE?
  - Tutorial 1: accessing PACE data
- What is SPEXone?
  - Tutorial 2: visualizing SPEXone L1 data
  - What science does PACE address?
  - Tutorial 3: working with SPEXone L2 data



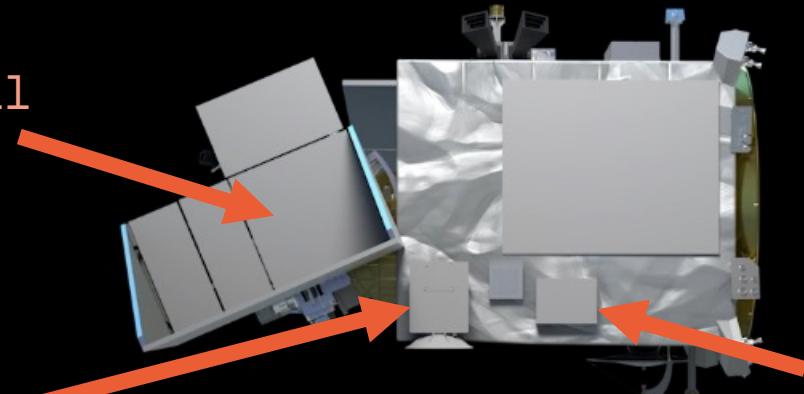


# PACE

## Plankton, Aerosol, Cloud, ocean Ecosystem

**OCI**  
UV-NIR-SWIR hyper-spectral  
imaging radiometer

**HARP-2**  
Hyper-angular wide swath  
VIS-NIR-4-band polarimeter

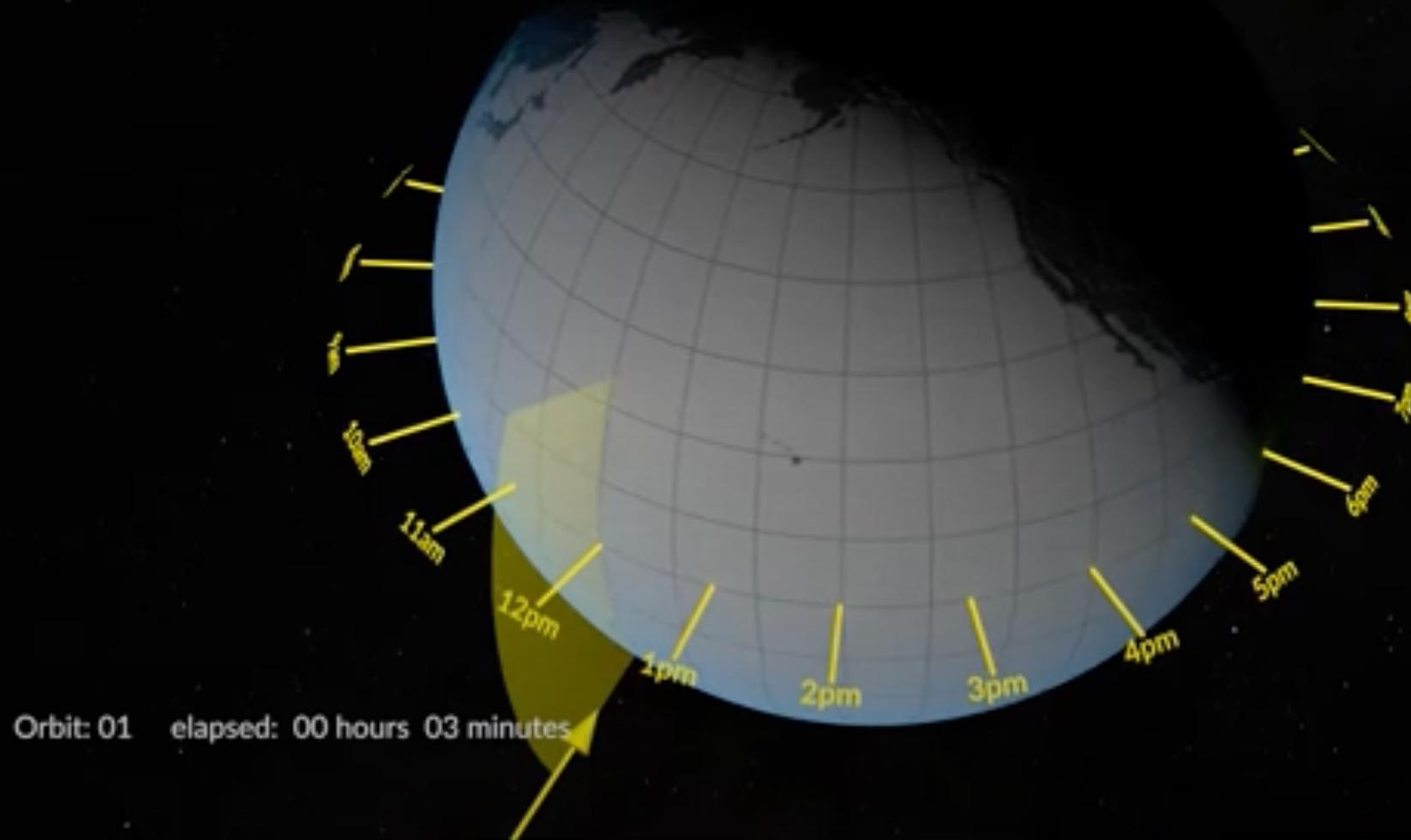


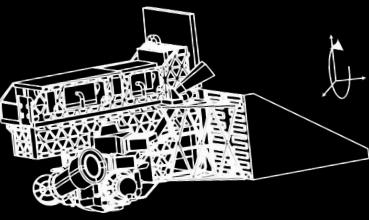
**SPEXone**  
Hyper-spectral UV-VIS narrow swath  
5-angle spectropolarimeter

**PACE:**

**OCI + HARP2 + SPEXone:**

Hyperspectral + Hyperangular + Highly accurate radiometric and polarimetric observations  
PACE is yielding unprecedented information content for ocean color, aerosol and clouds





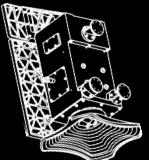
### OCI

Radiometer

340-890 nm; 5 nm resolution

7 SWIR-bands between 940-2260 nm

1-2 day coverage;  $\pm 20^\circ$  tilt; 1km



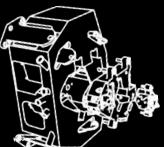
### HARP2

Multi-angle polarimeter

440, 550, 670, 870 nm

10-60 viewing angles

wide swath; 5 km resolution



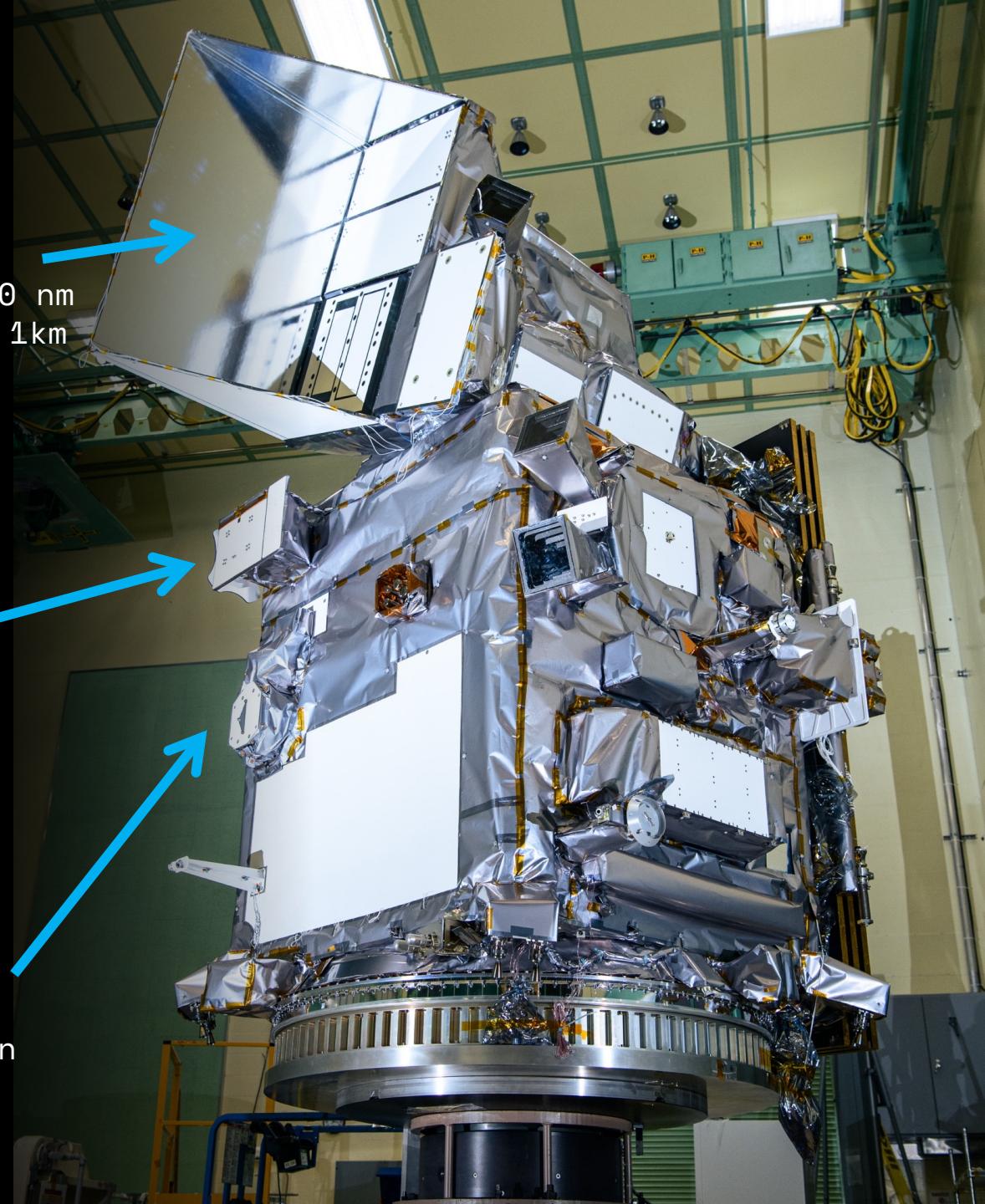
### SPEXone

Multi-angle polarimeter

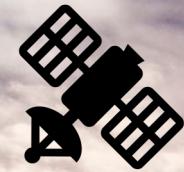
380-770 nm; 2 nm resolution

5 viewing angles

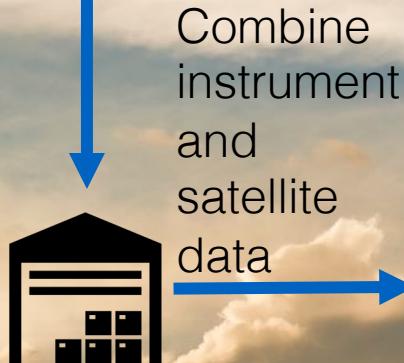
narrow swath; 5 km resolution



# Overview of SPEXone data stream – hands-on with notebook 1!



12 to 15 times each day data is downlinked from the satellite to the NASA operations centers on Earth



operations center



L0  
(NASA DB)



L1A  
(NASA DB)



L1B  
(NASA DB)



L1C  
(NASA DB)



L2  
(NASA DB)

request

Decode

Calibrate

response

Regrid

Analyze

It goes on!

How to decode, calibrate, regrid and analyze data is SRON's responsibility

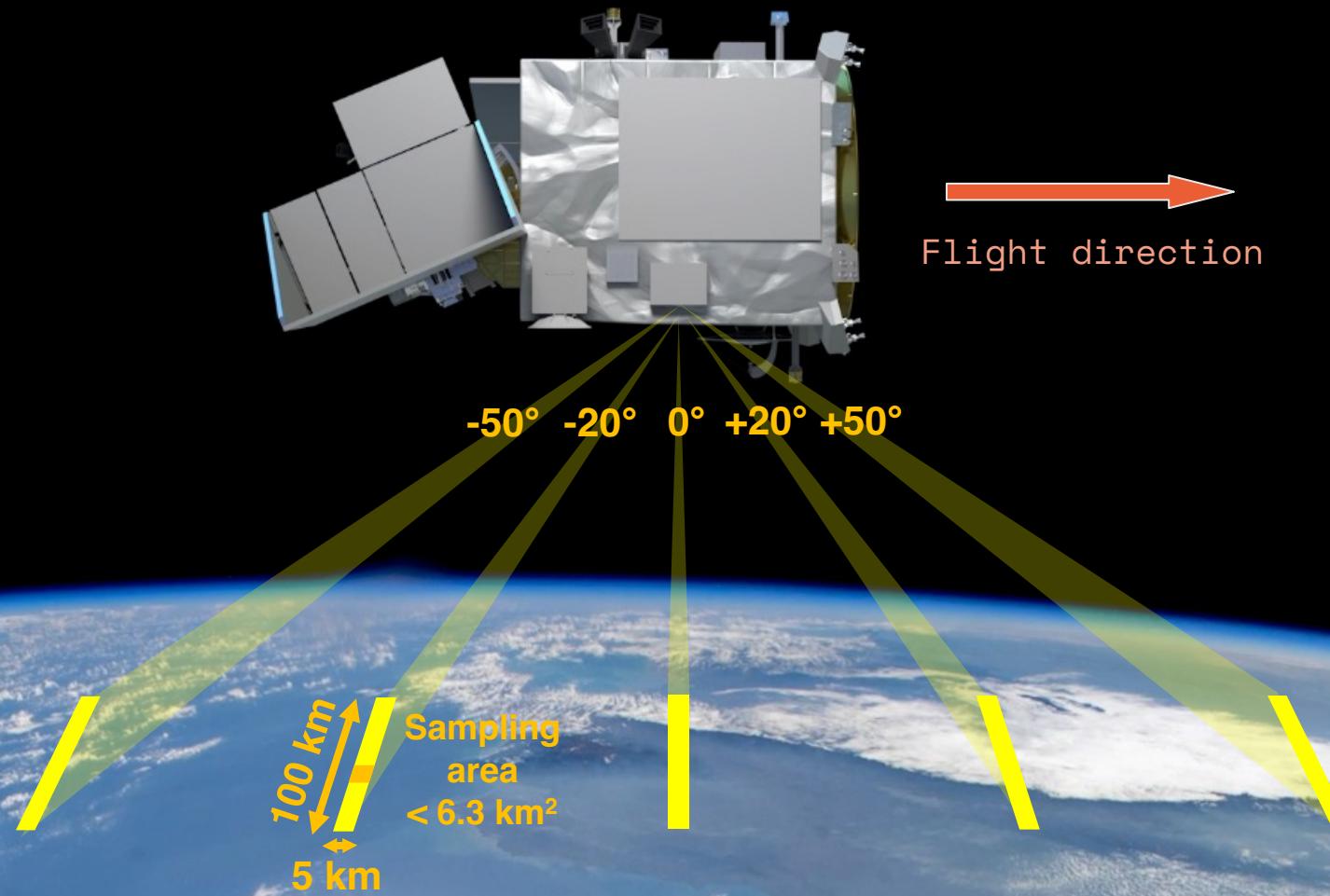
Getting the data, processing the data, and providing the data to end users such as us in this tutorial is NASA's responsibility

Store to your machine for speed up (and in case of little data)

Meta data for data selection  
Full data for analysis (slow!)

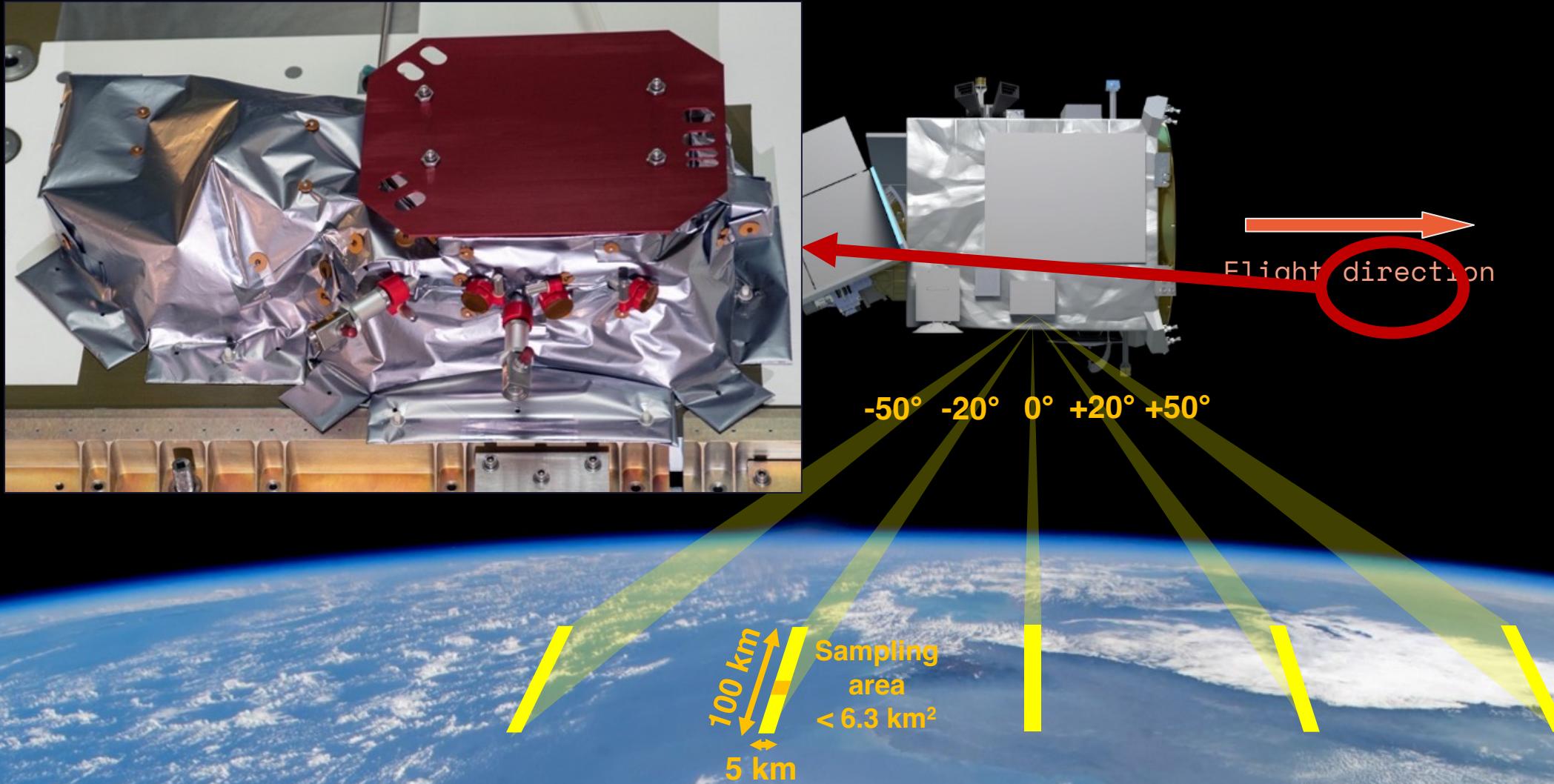
# SPExone

Multi-angle spectropolarimetry between 385 – 770 nm using dual beam spectral polarization modulation  
5 instantaneous footprints yielding snapshot pushbroom measurements of radiance and polarization



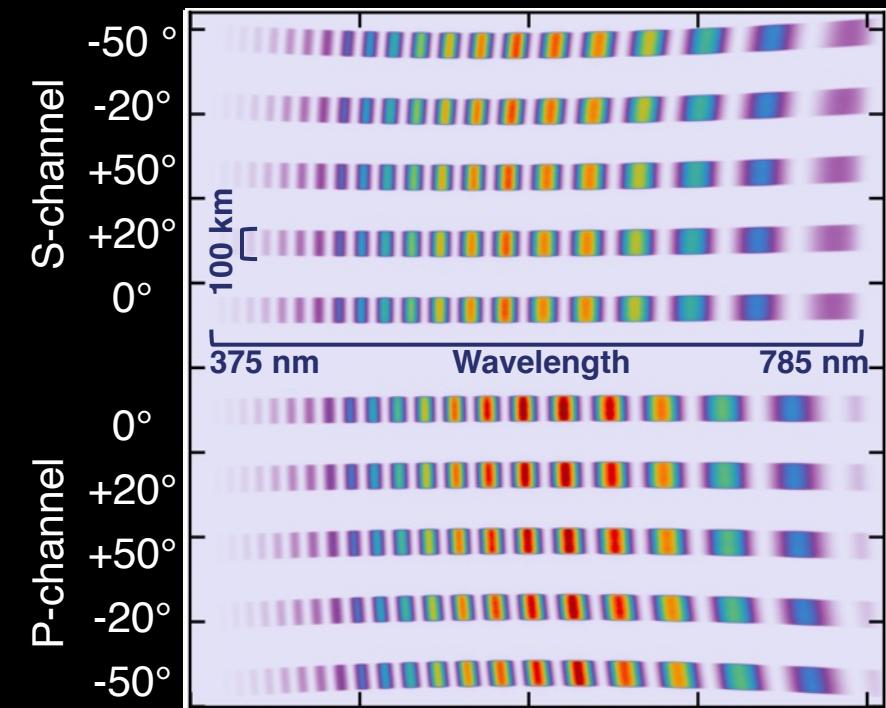
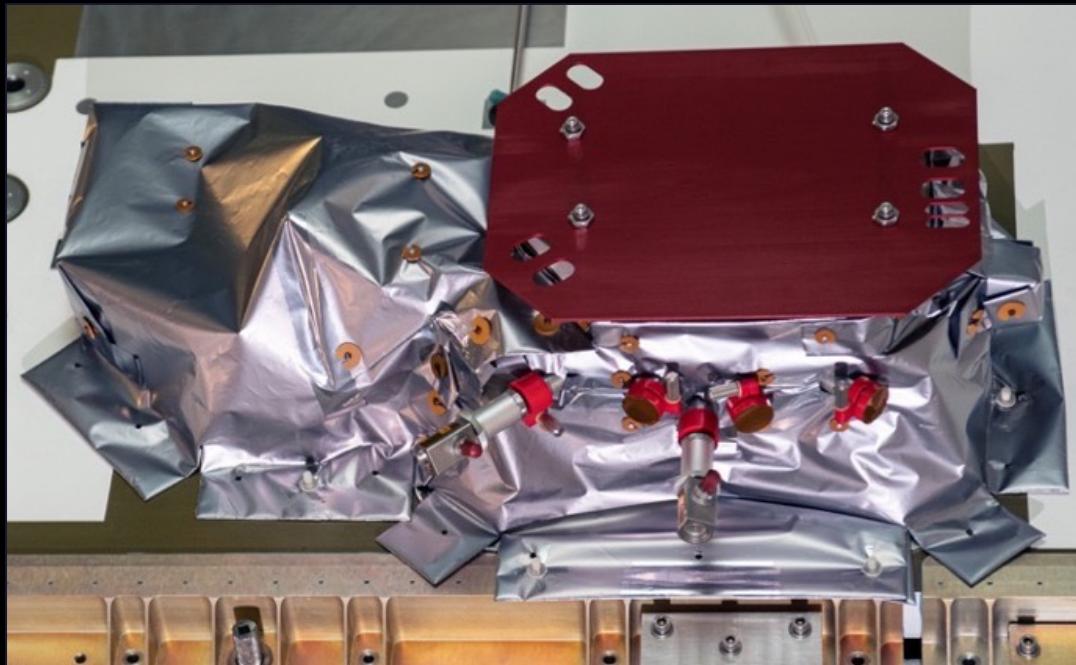
# SPExone

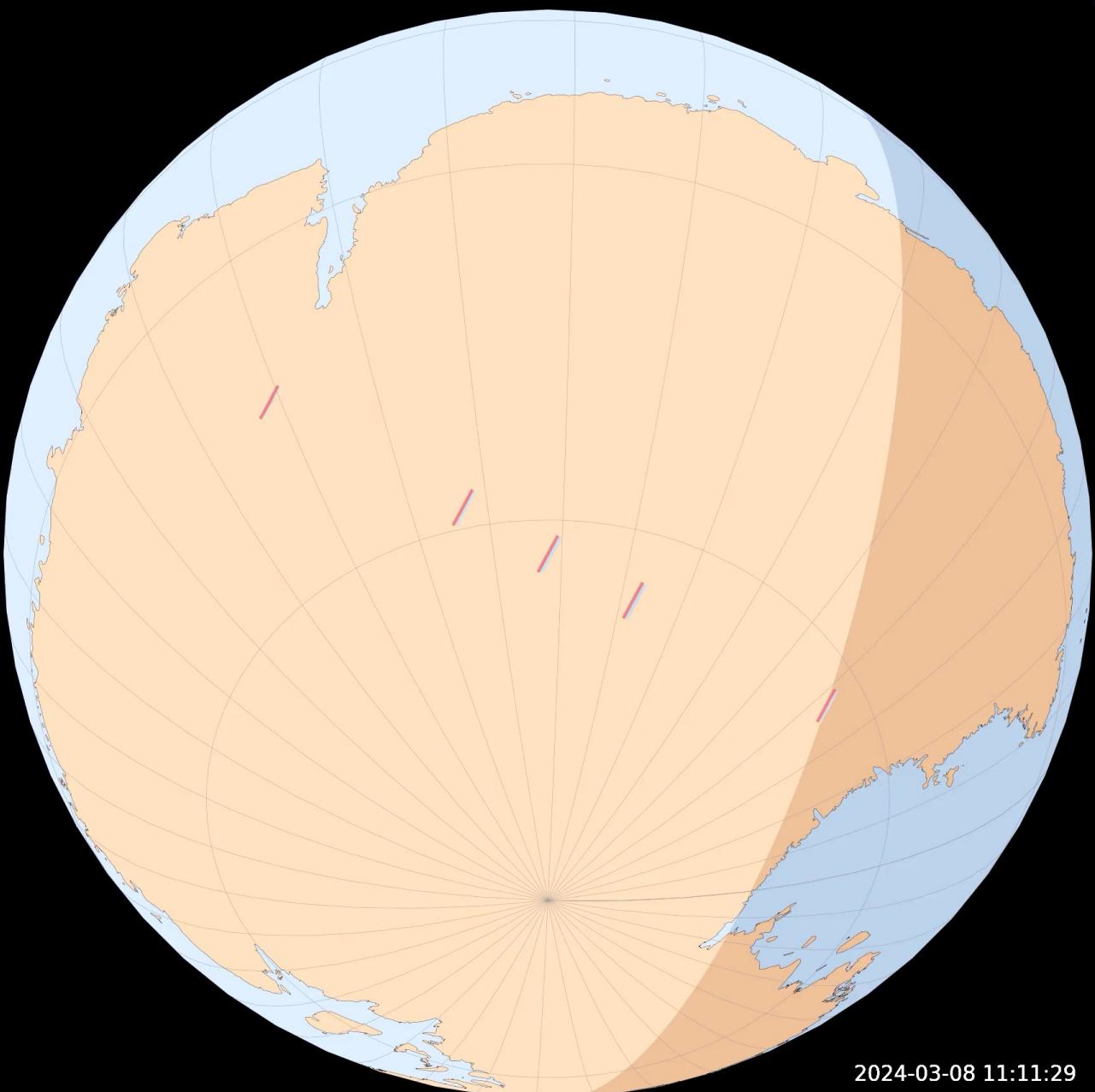
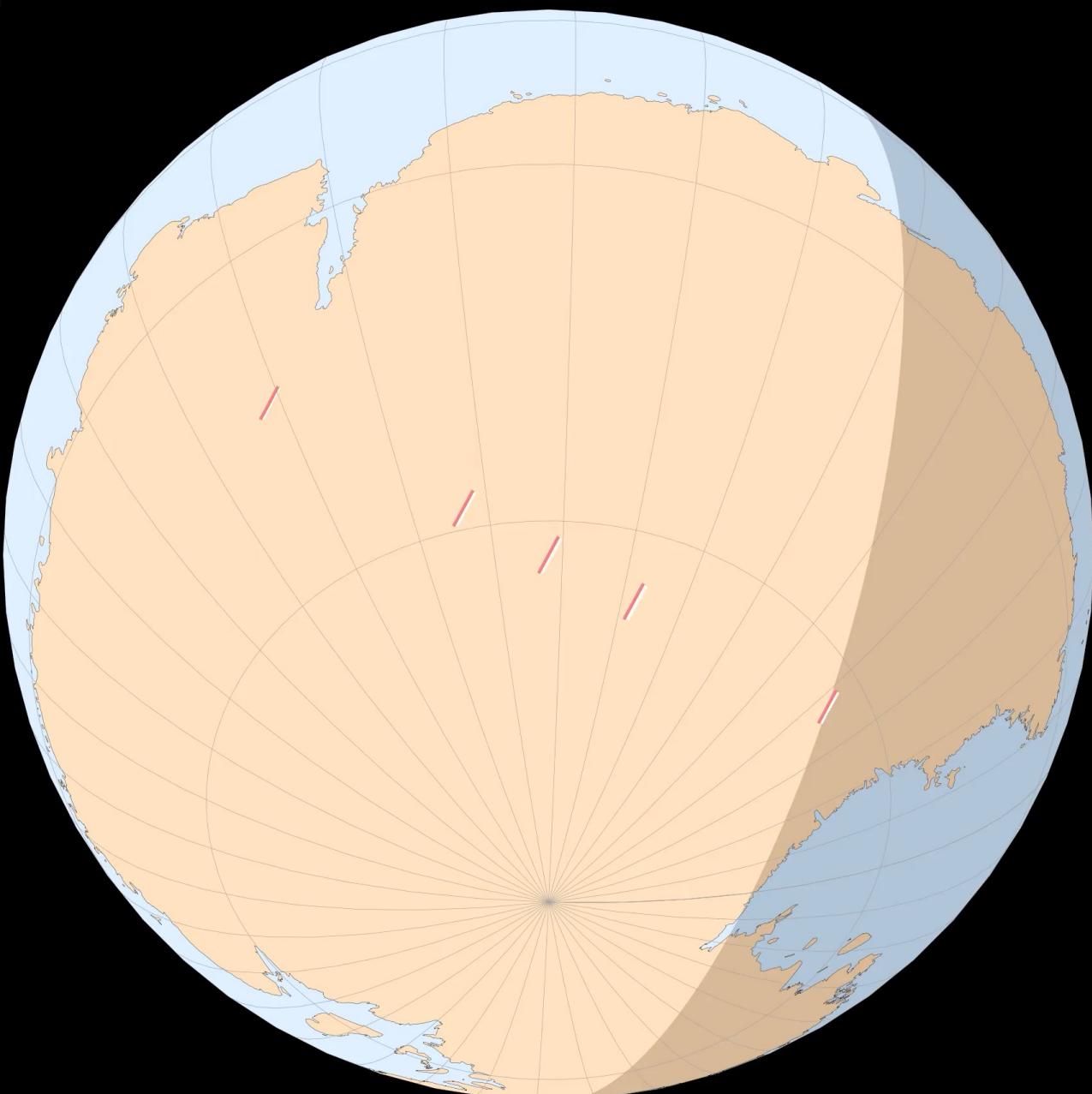
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# SPEXone

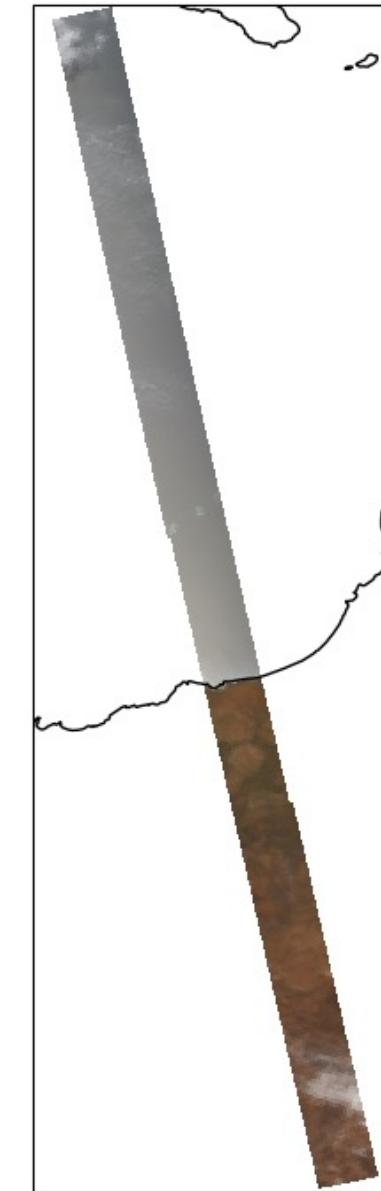
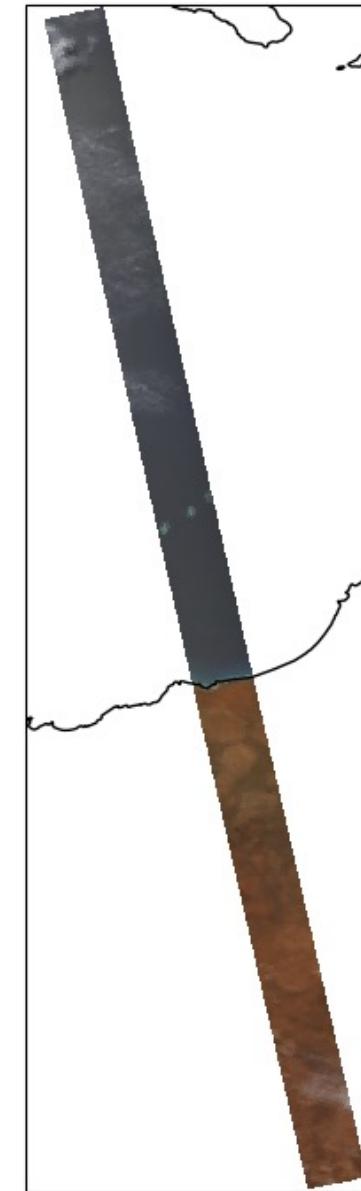
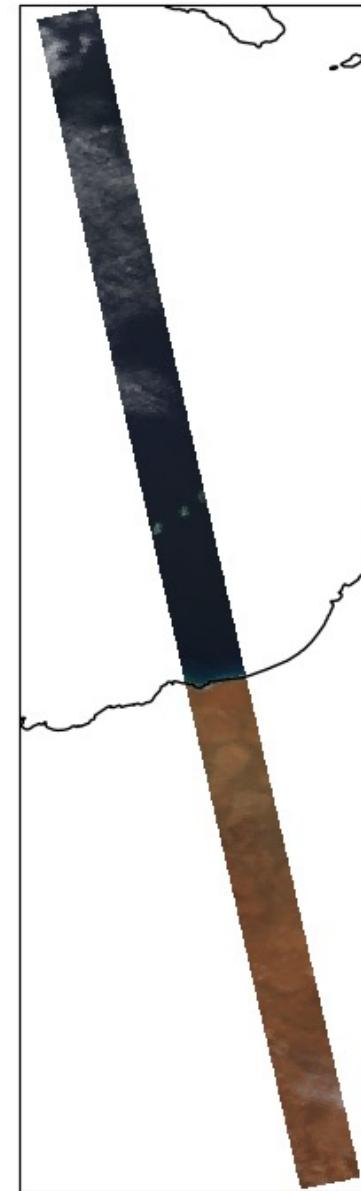
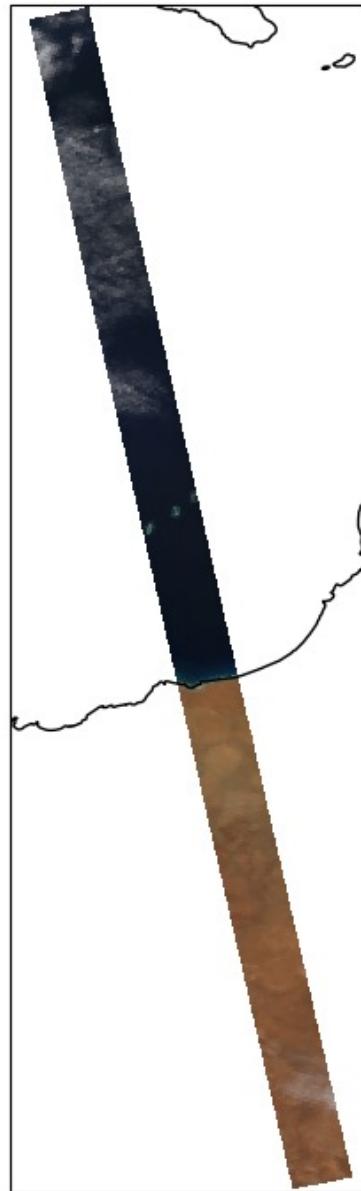
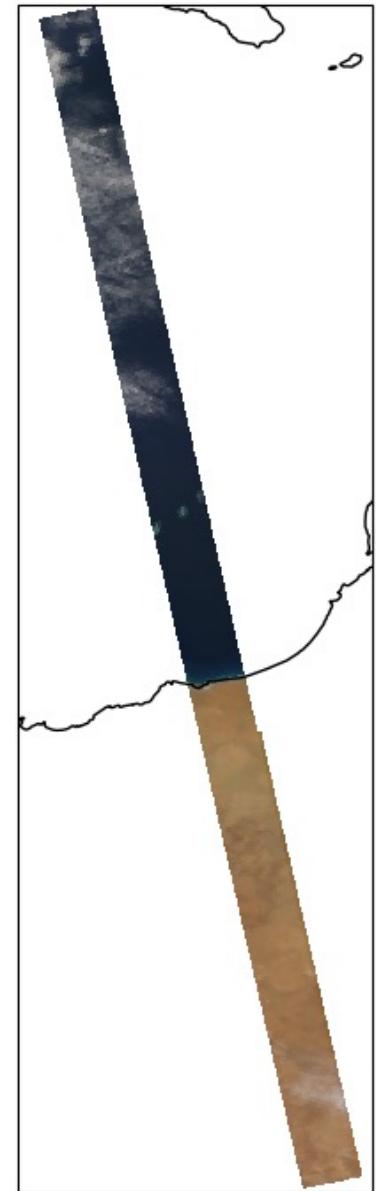
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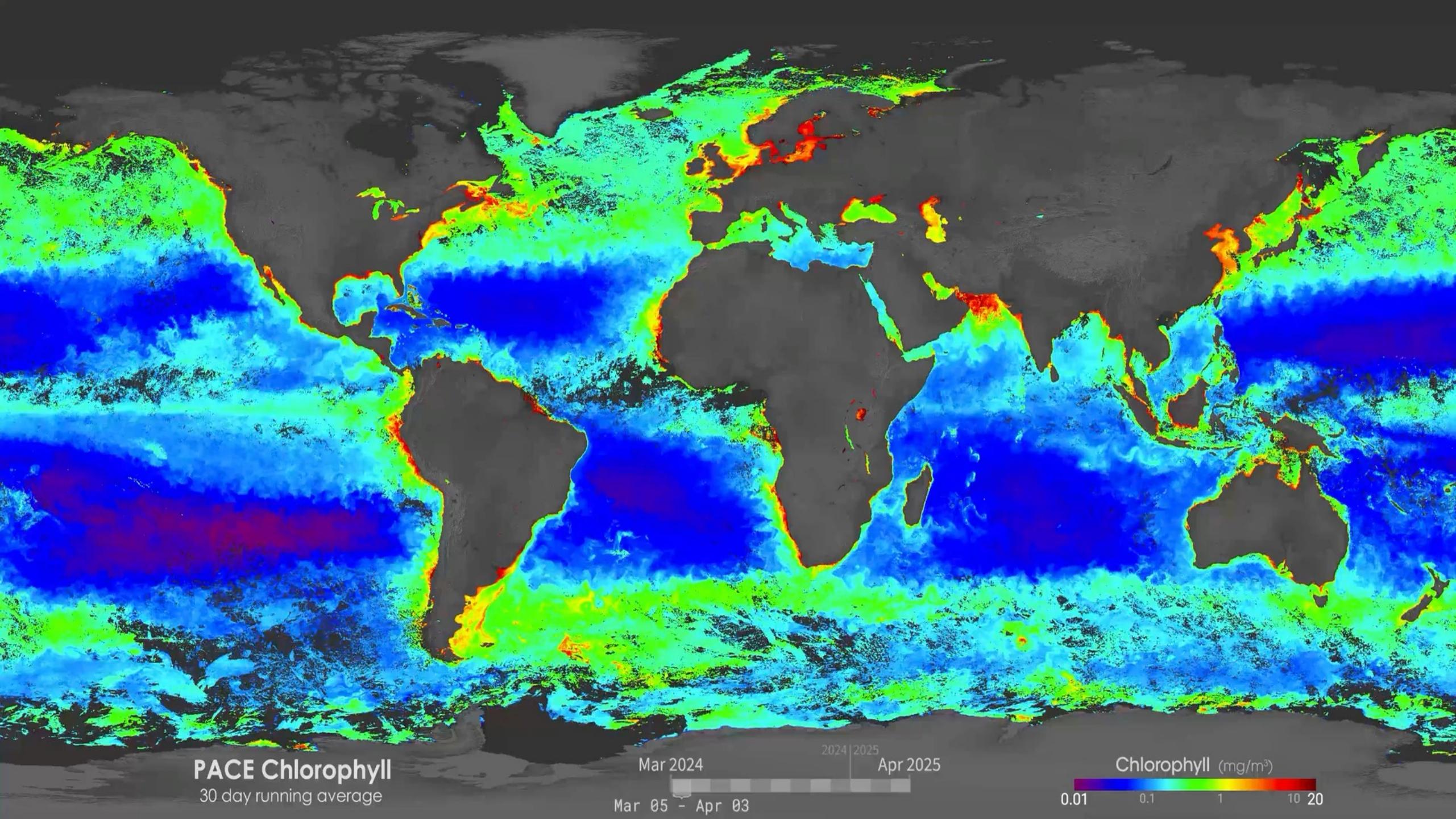


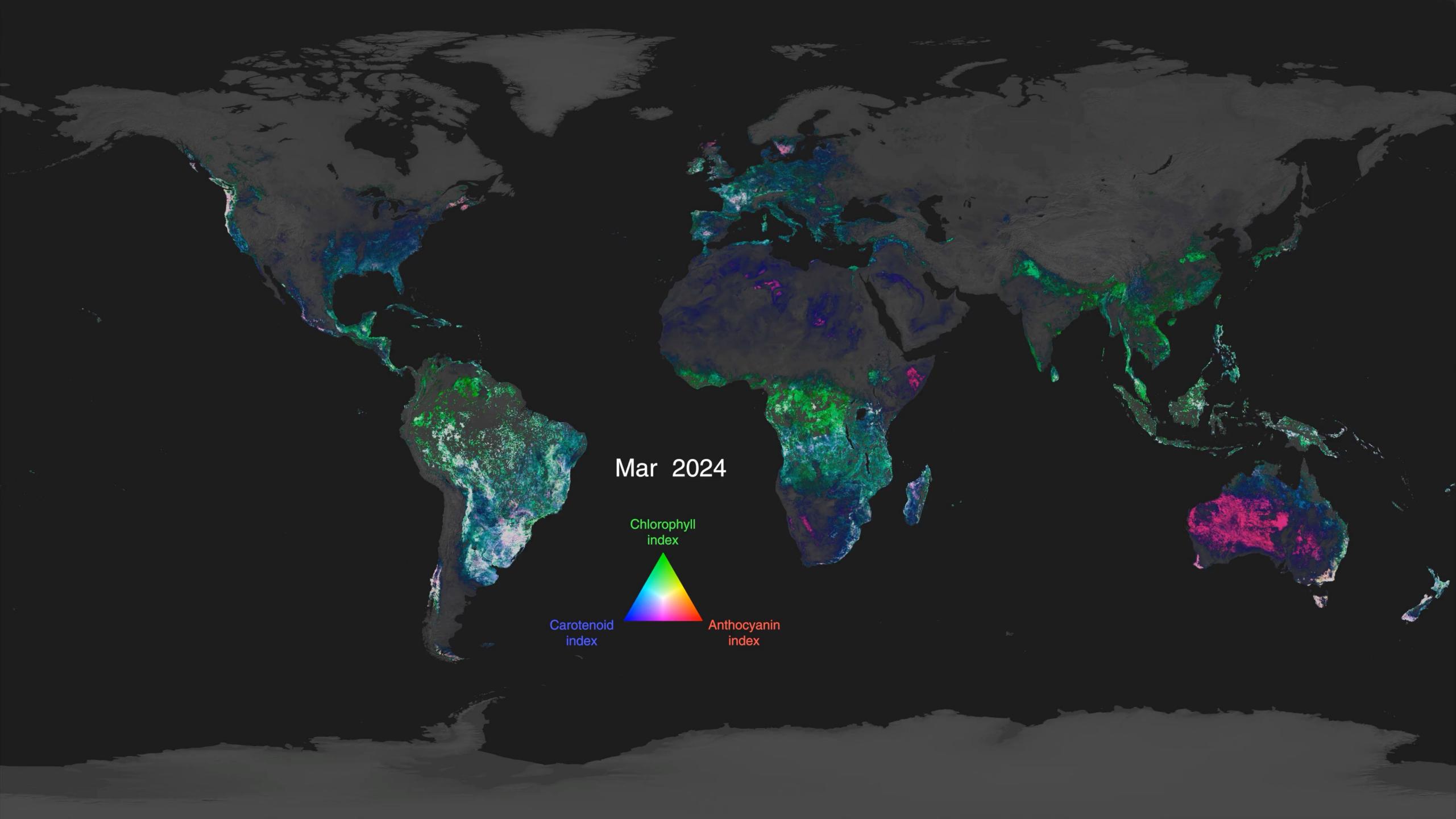


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# What do we see? Find out in notebook 2!







Mar 2024

Chlorophyll  
index

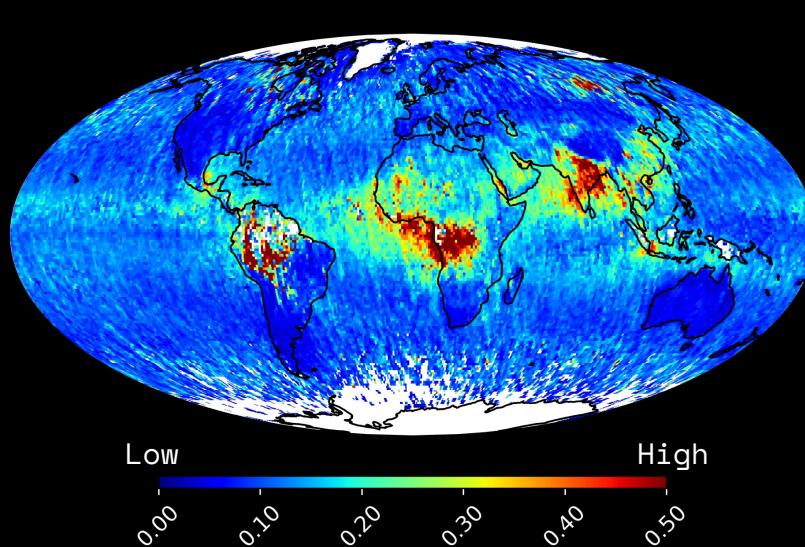


Carotenoid  
index

Anthocyanin  
index

# 1 year of science data

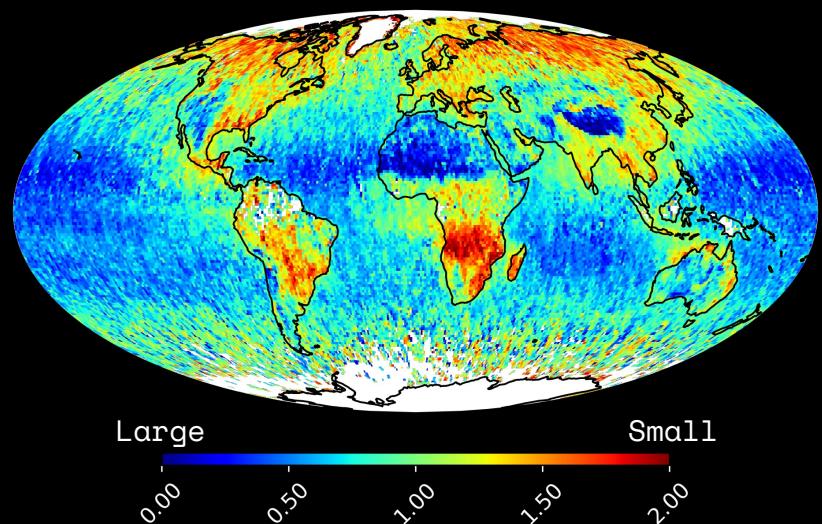
# Aerosol optical depth (amount of aerosol)



## Regions with high aerosol:

- Pollution
    - India, SE-Asia, M-America
  - Dust
    - Sahara summer
  - Biomass burning (BB)
    - Africa, S-America, Canada, Siberia

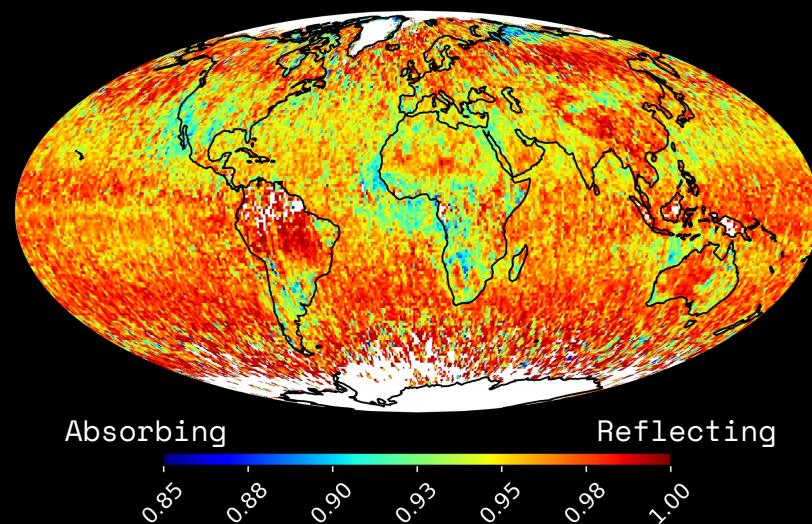
# Ångstrom exponent (particle size)



## Patterns in particle size:

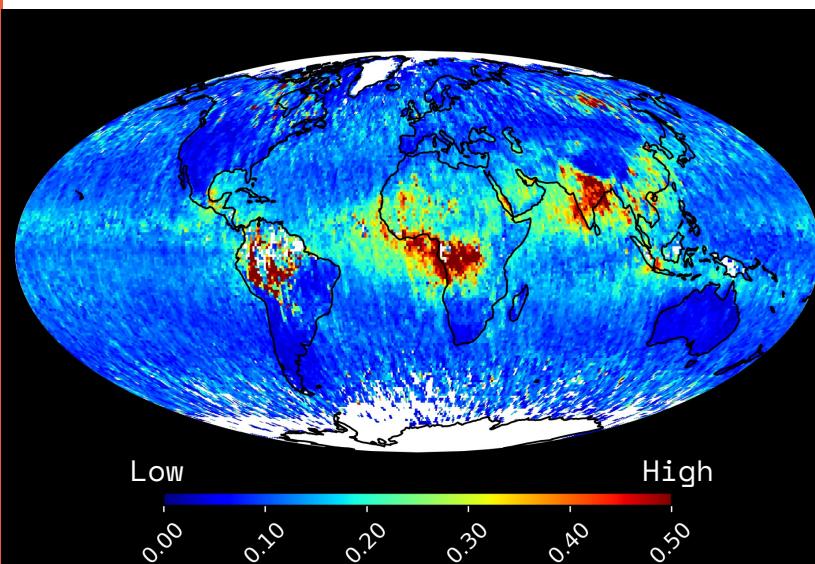
- Smallest over BB regions
  - Also small over industrial regions
  - Large over desert
  - Large over (most) remote ocean

## Single Scattering Albedo (particle absorption)



# 1 year of science data

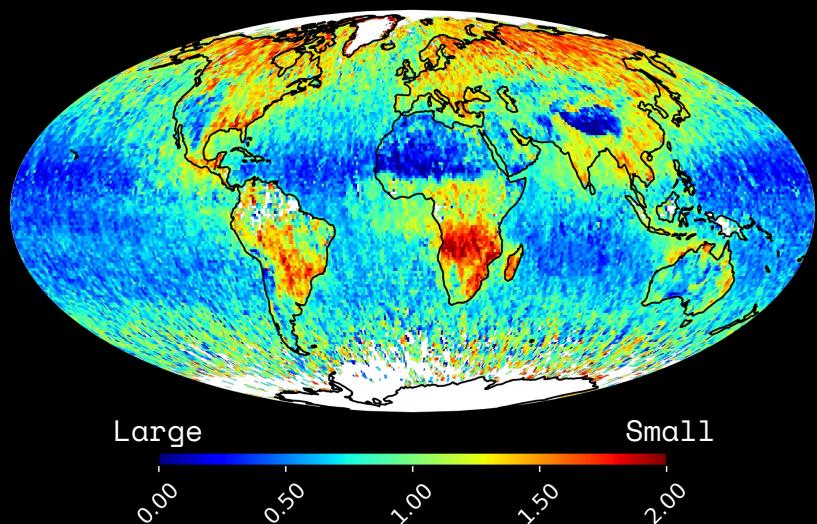
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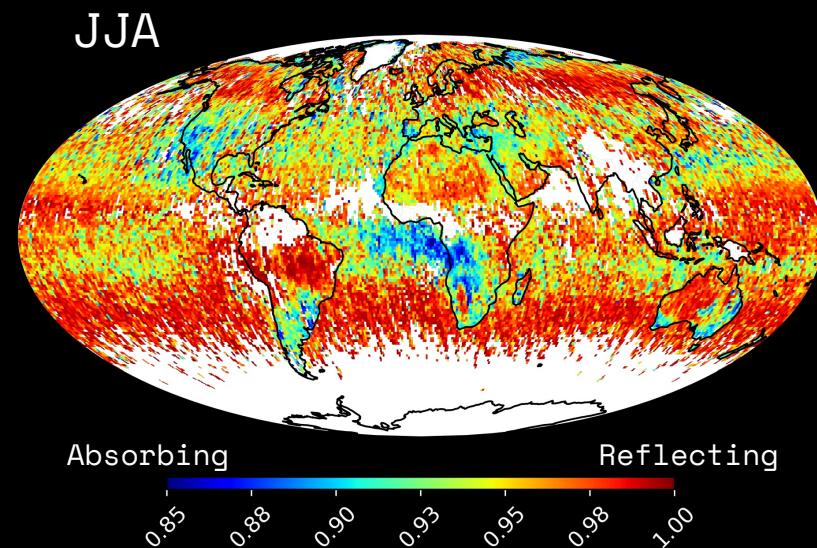
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## Single Scattering Albedo (particle size)

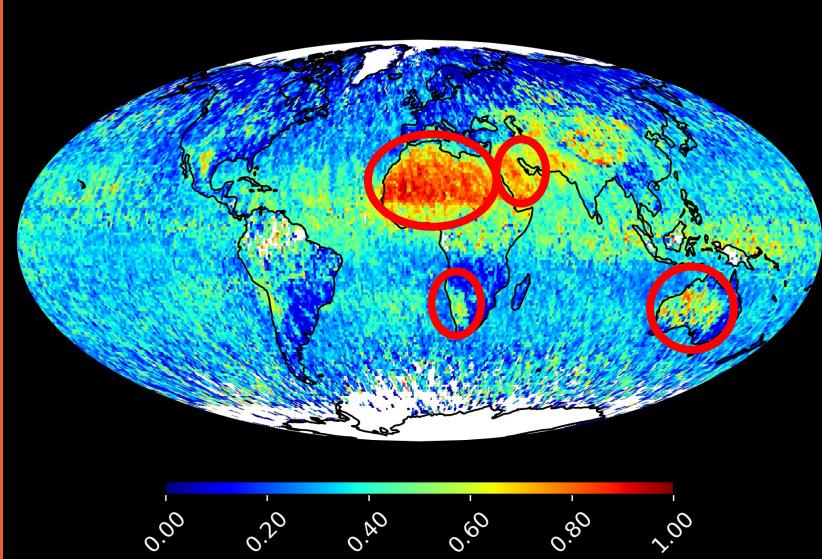


## Patterns in absorption:

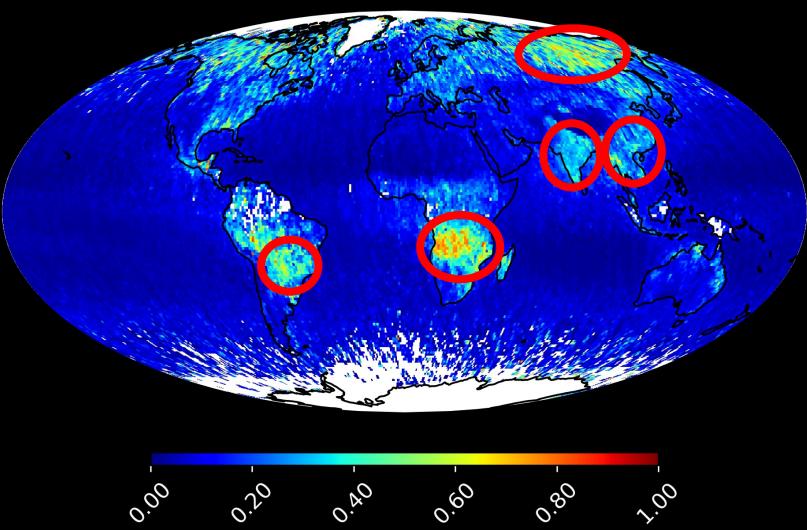
- High for BB in Africa
  - High over California
  - Much less for BB over Amazone and Siberia
  - Low for dust (Sahara)
  - Low over ‘clean’ ocean

# 1 year of science data

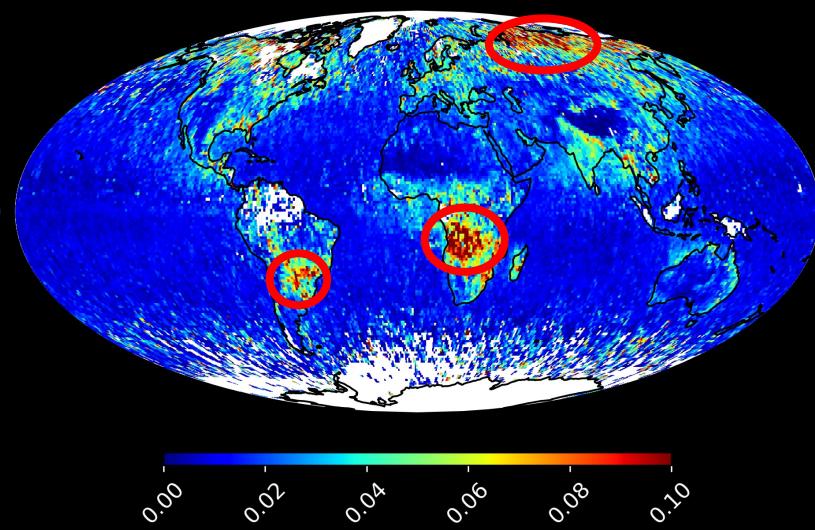
Dust fraction



Small particles  
Non-absorbing (in)organic



Black carbon & brown carbon



## Deserts regions:

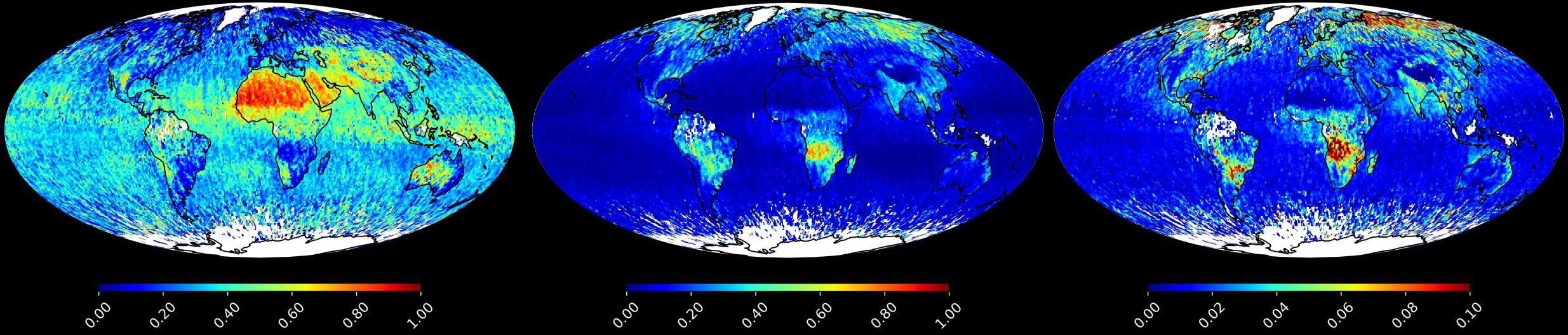
- Sahara
- Middle-East
- Namibia
- Australia

## Industrial and biomass burning regions:

- India & South-East Asia
- Africa, South-America & Siberia

## Biomass burning regions:

- Africa, South-America & Siberia



Explore aerosol products in notebook 3!



# Useful links

- <https://pace.oceansciences.org/>
- [https://pace.oceansciences.org/pace\\_result\\_spotlight.htm](https://pace.oceansciences.org/pace_result_spotlight.htm)
- <https://pace.oceansciences.org/data.htm>
- <https://oceandata.sci.gsfc.nasa.gov/>
- <https://oceancolor.gsfc.nasa.gov/resources/docs/tutorials/>



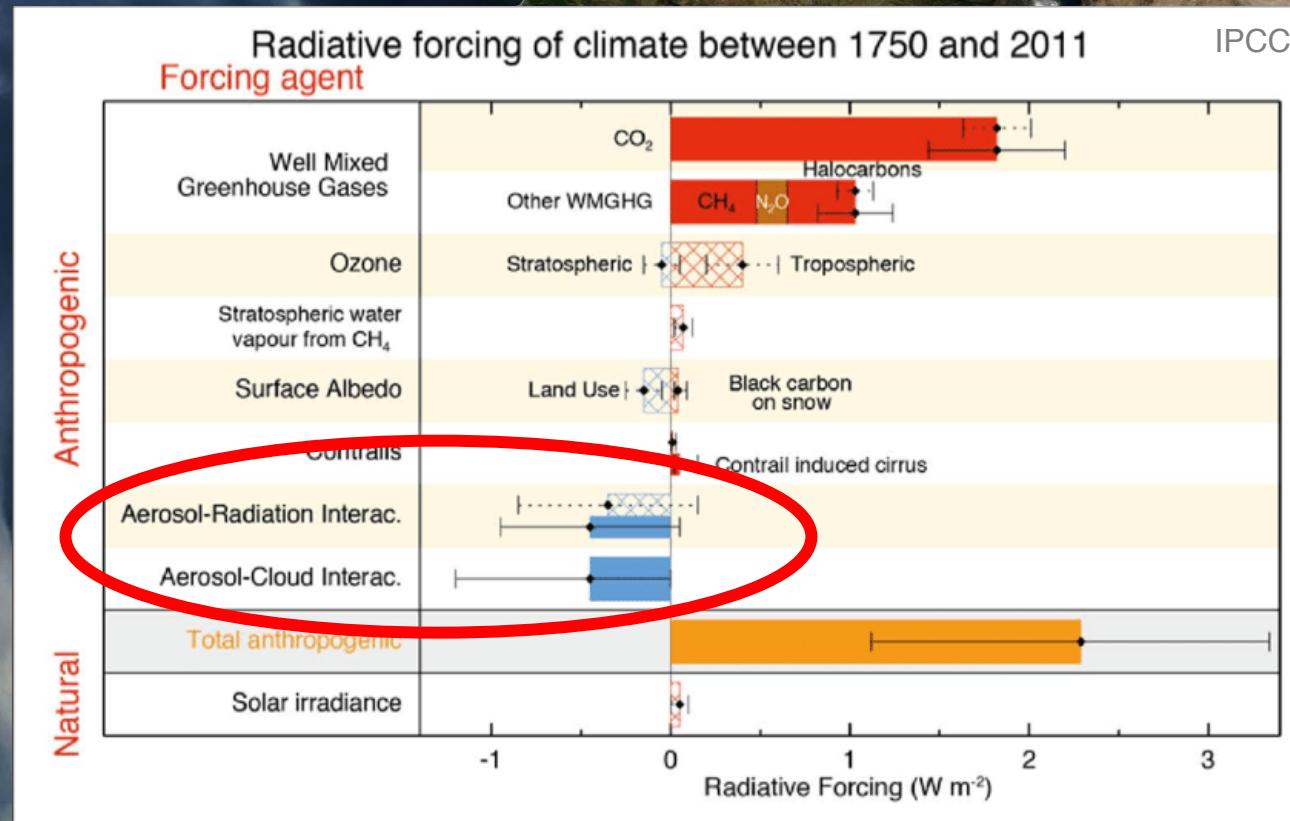
SPACE  
RESEARCH  
ORGANISATION  
NETHERLANDS

SRON is part of NWO-I  
Institutes Organisation  
of NWO  
**WWW.SRON.NL**

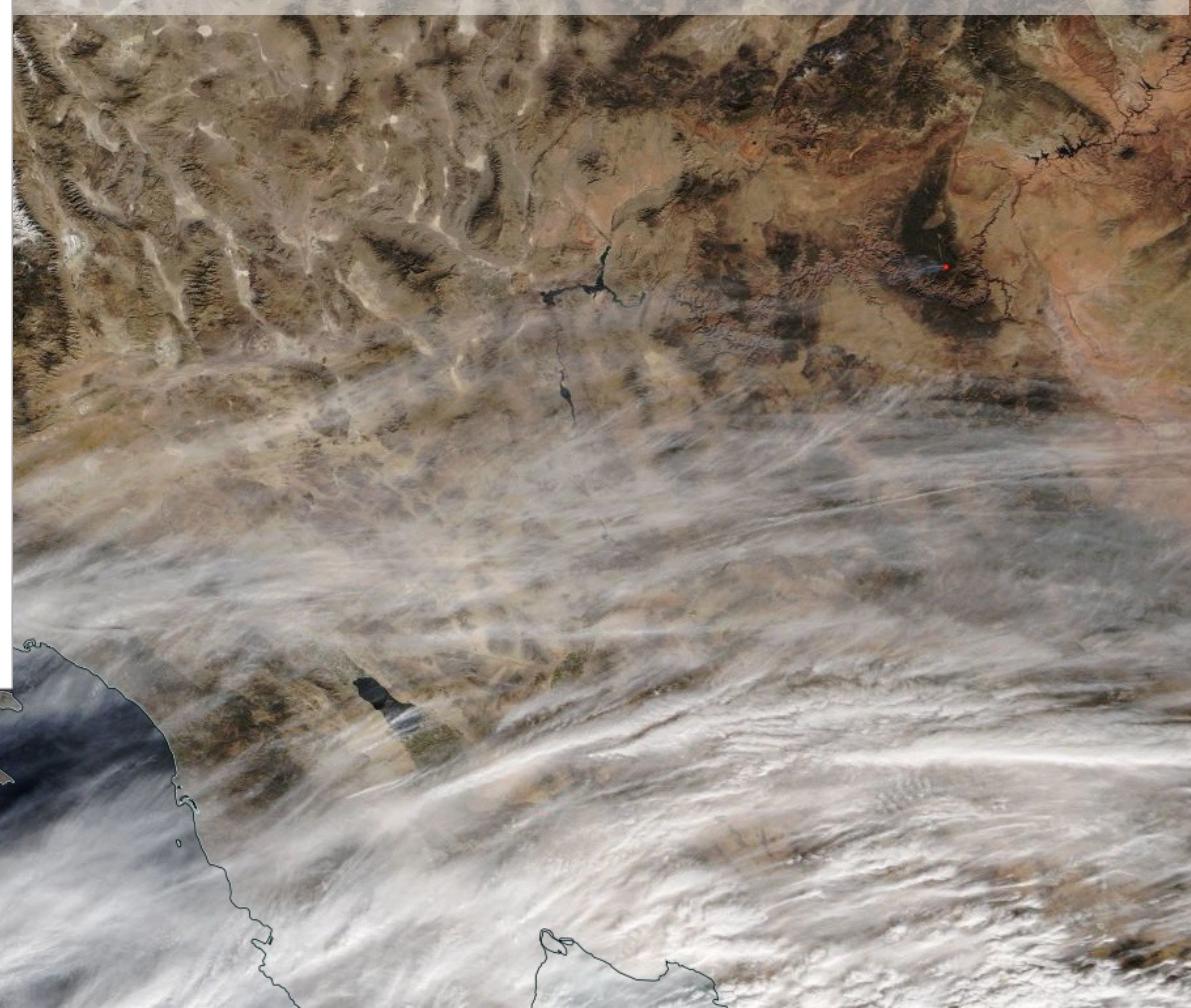
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# The need for atmospheric aerosol characterization



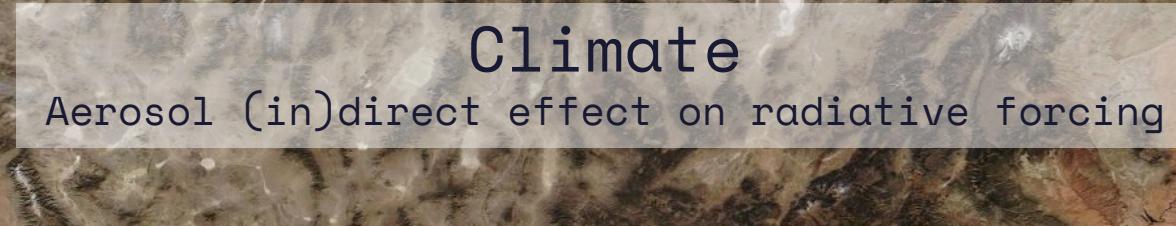
Climate  
Aerosol (in)direct effect on radiative forcing



# The need for atmospheric aerosol characterization



USA Today



Climate

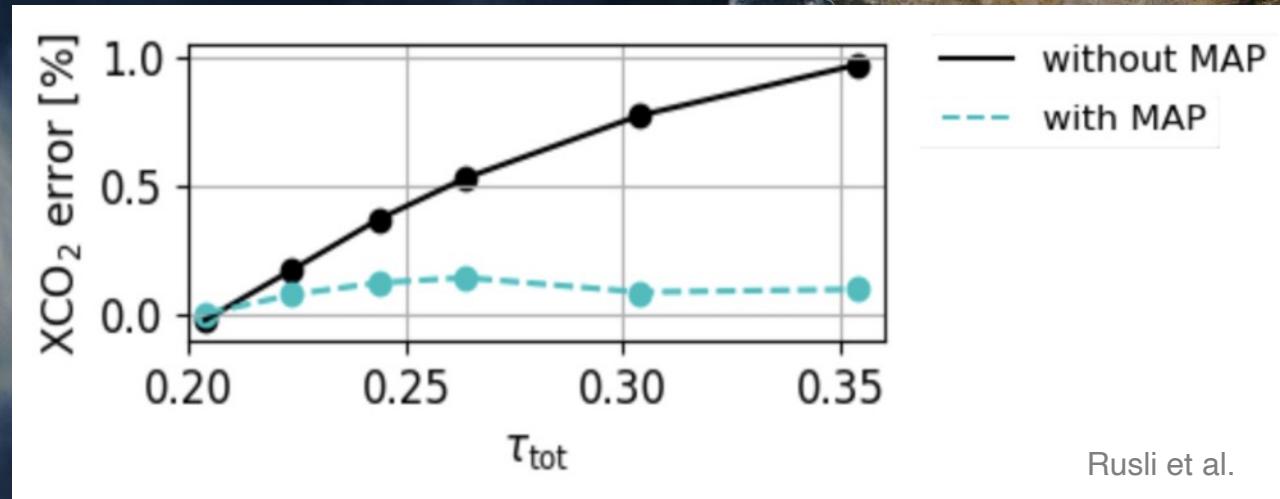
Aerosol (in)direct effect on radiative forcing



Air quality

Human health

# The need for atmospheric aerosol characterization

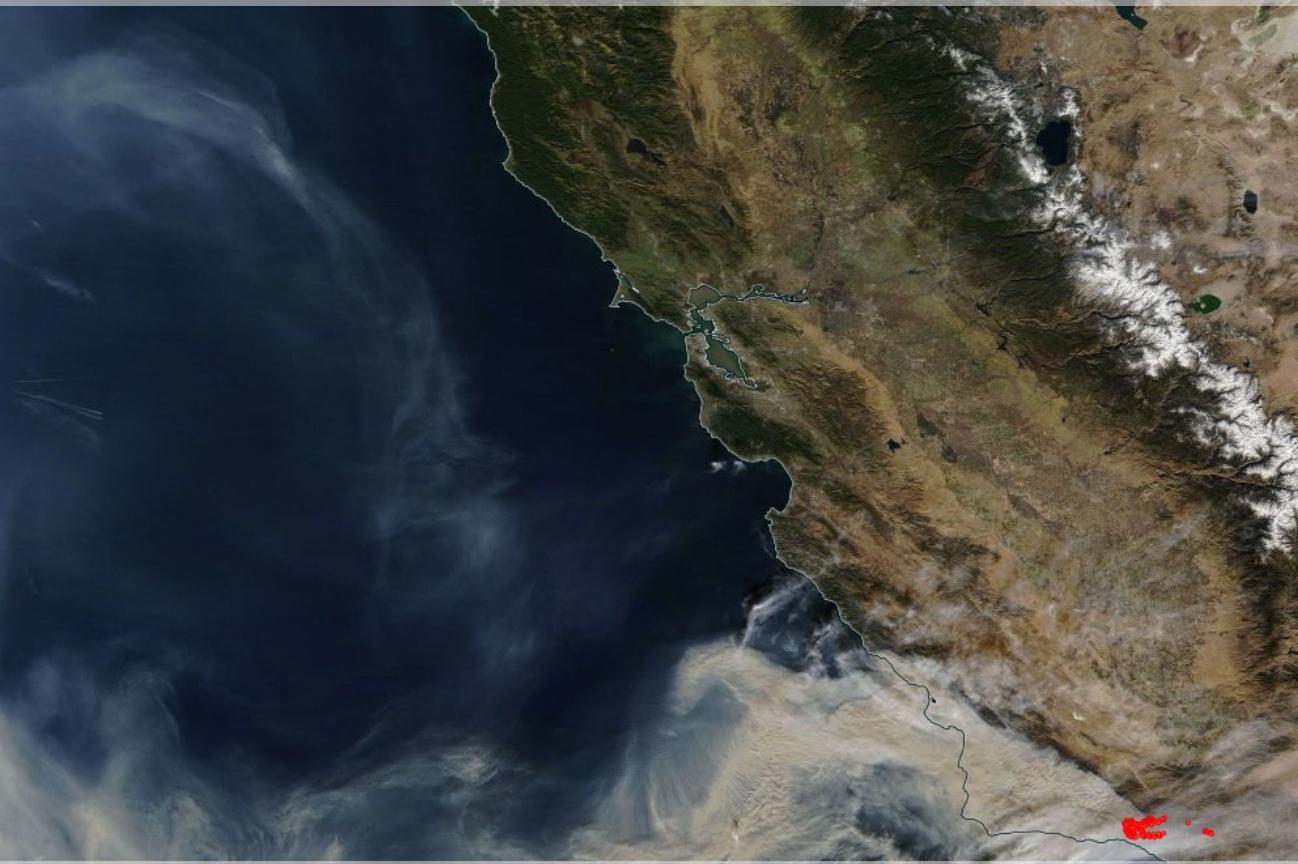


**Climate**  
Aerosol (in)direct effect on radiative forcing

**Air quality**  
Human health

**Light path correction**  
Ocean color and trace gas retrievals

# The need for atmospheric aerosol characterization



Multi-angle photo-polarimetry is essential to retrieve relevant aerosol properties: AOT, SSA, refractive index, size, shape, concentration



Mishchenko and Travis, JGR, 2007  
Hasekamp and Landgraf, Appl. Opt., 2007  
Kokhanovsky et al, AMT, 2010