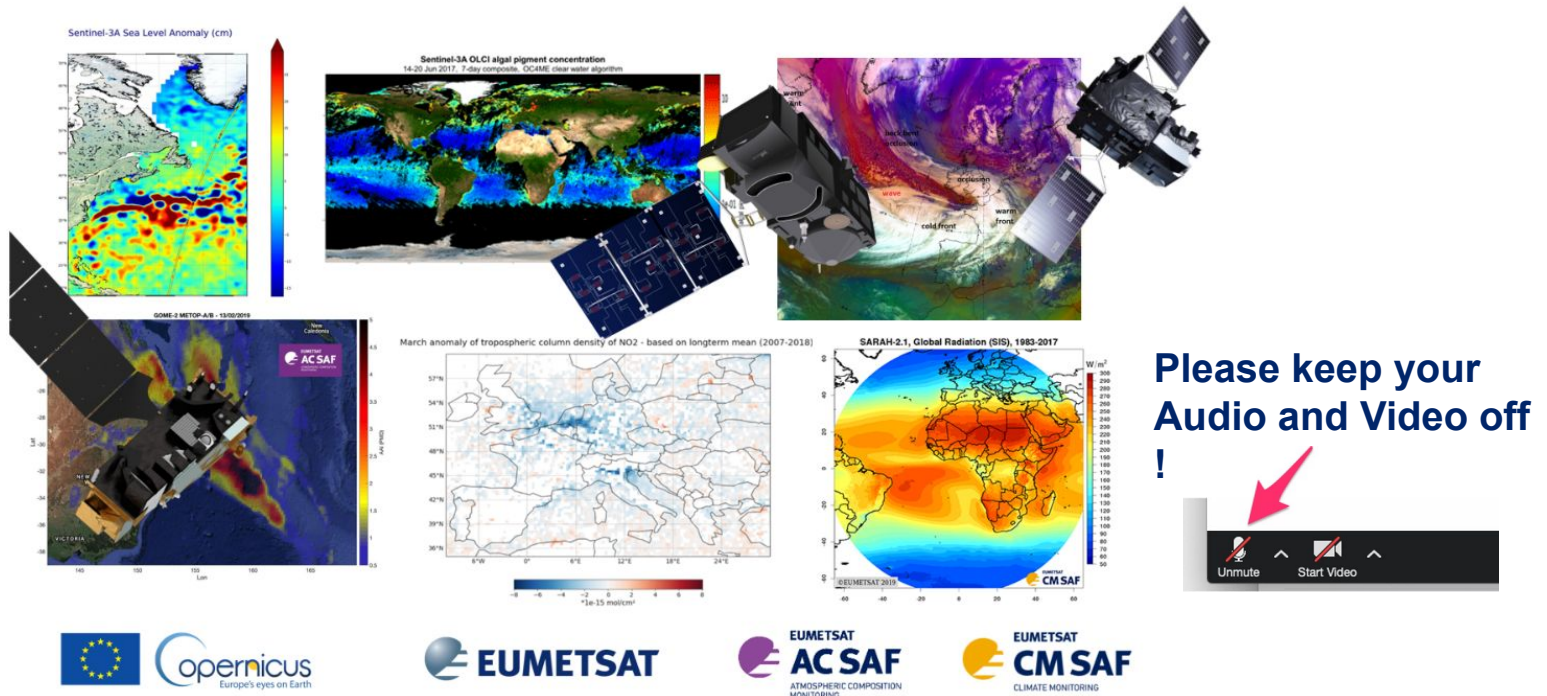


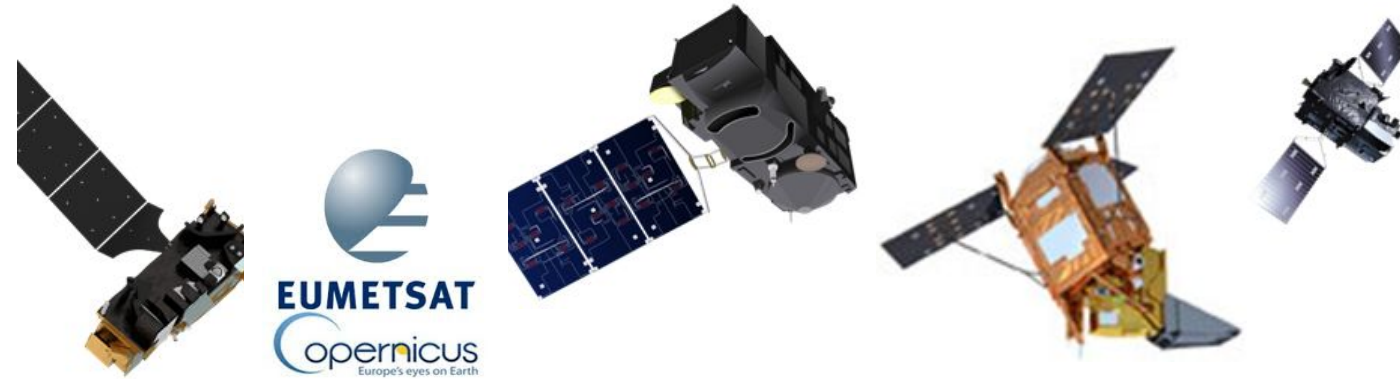
Welcome - The session will begin at 12 UTC - 13 CET



If you have technical issues, please send a message in the chat box to **Support**.

For **Q&A**: go to Slido.com – event code: **#EUMSC25**

What is EUMETSAT ? Satellite Monitoring of Climate & Weather for Europe ...



EUMETSAT programs

- METOP (1-3)
- Meteosat
- Meteosat III Gen
- Polar II Gen
- Monitor CO₂

	SENTINEL-1: 4-40m resolution, 3 day revisit at equator	S1A and 1B in orbit
	SENTINEL-2: 10-60m resolution, 5 days revisit time	S2A and 2B in orbit
	SENTINEL-3: 300-1200m resolution, <2 days revisit	S3A and S3B in orbit
	SENTINEL-4: 8km resolution, 60 min revisit time	1st Launch 2022
	SENTINEL-5p: 7-68km resolution, 1 day revisit	SSP in orbit
	SENTINEL-5: 7.5-50km resolution, 1 day revisit	1st Launch 2023
	SENTINEL-6: 10 day revisit time	1st Launch 2020

Make data available at best

- Gather (and satisfy) needs
- Grant data access
- Help and support Users
- Training (also on-line)
- Explore applications
- Communicate - outreach



AI for atmospheric composition - how to enhance resolution using satellite data

M. Houet – MEEO @EUMETSAT
F. Fierli - EUMETSAT



(1) Webinar & Data discovery

12:00 - 12:25: Intro

12:25 - 12:50: AI approach

12:50 - 13:30: Practical + Q&A

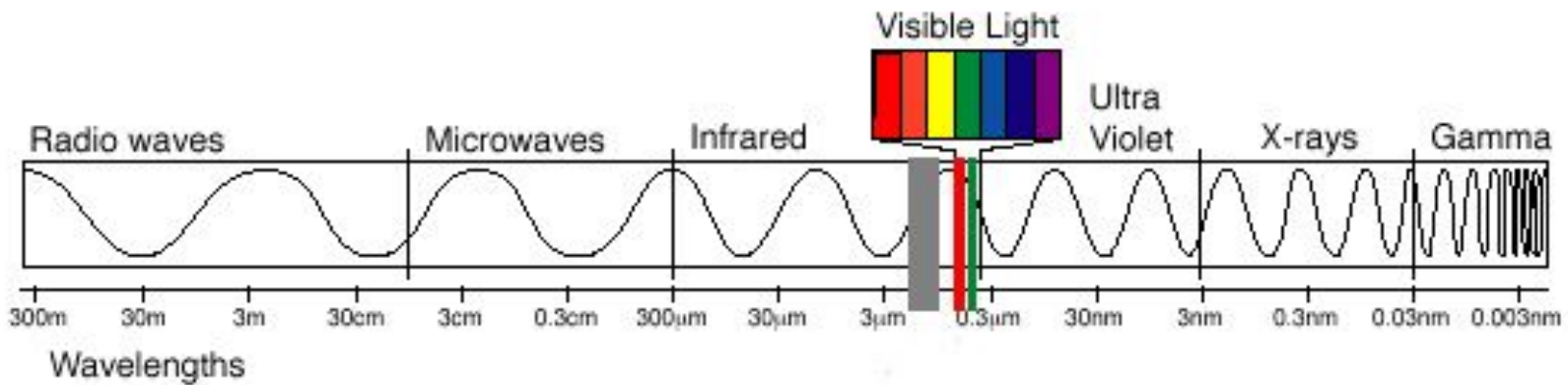
□ **Discussion Q&A on:**

slido.com #EUMSC25

□ **Access the data / handling tools**

<https://training.eumetsat.int/course/view.php?id=438>

The Electromagnetic Spectrum



- Remote sensing uses the radiant energy that is reflected and emitted from Earth at various “wavelengths” of the electromagnetic spectrum
- Our eyes are only sensitive to the “visible light” portion of the EM spectrum

Satellite orbits

Advantages:

More near to Earth -> Higher spatial resolution

Used also for Active Obs.(Radar/Lidar) and PMW

Disadvantages:

Poorer time resolution -> needs of constellation

Advantages:

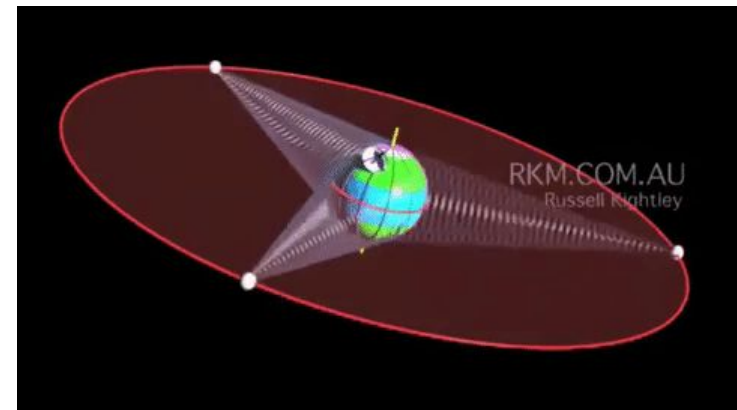
Better time resolution

Disadvantages:

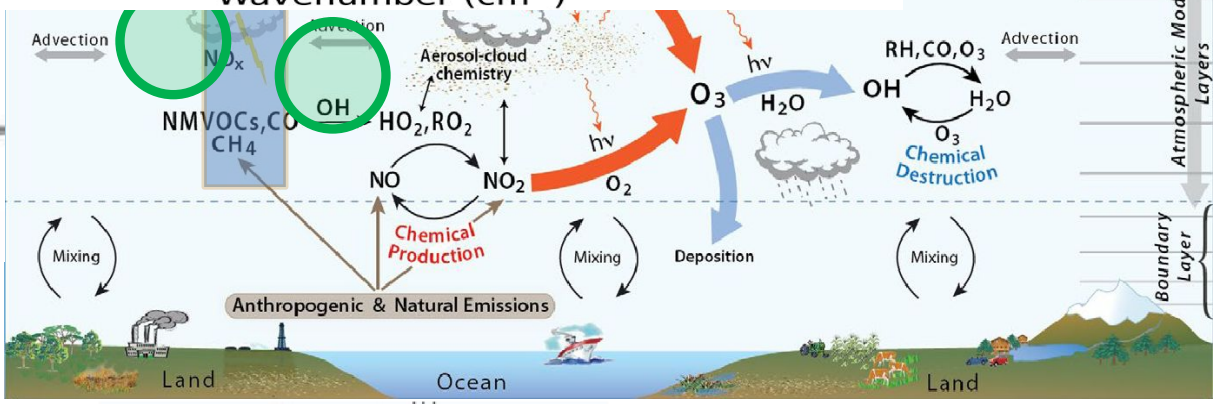
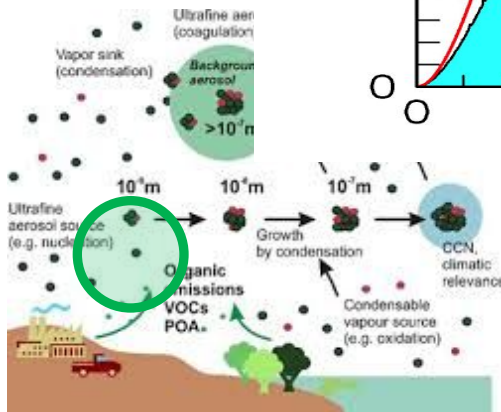
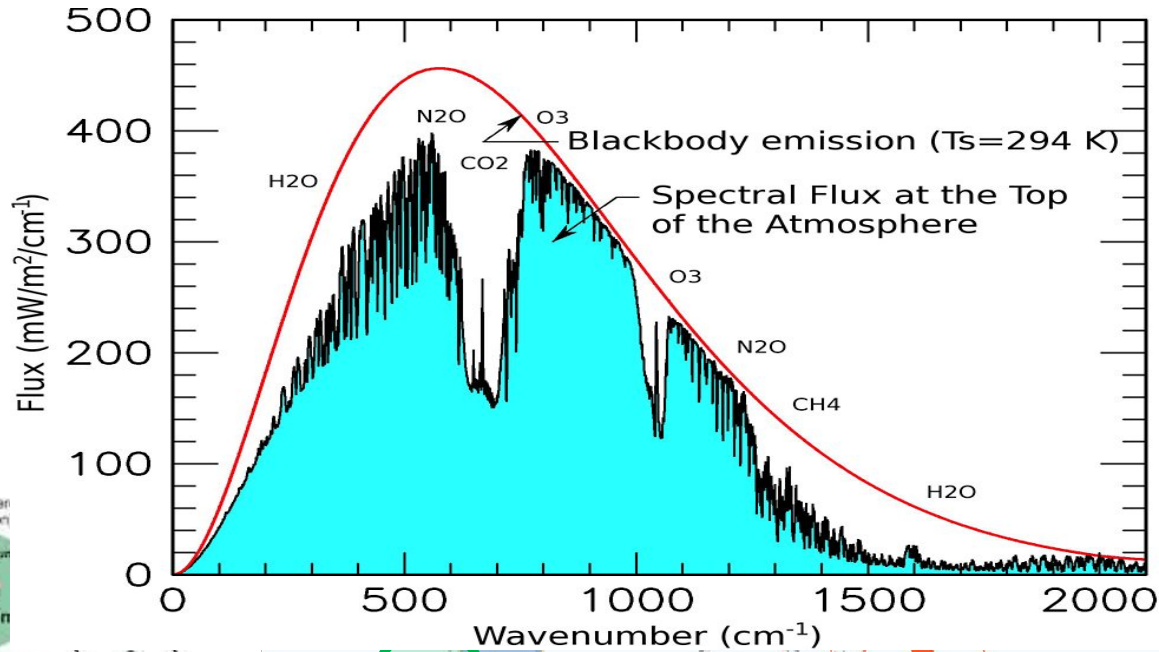
One side of the Earth -> needs of constellations

large viewing angles at the borders -> geometrical distortions

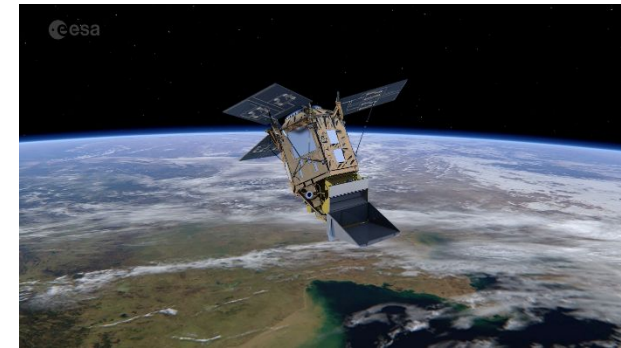
Only VIS/IR and passive Obs.



What we see and what Satellites see



Aggregate data of polar satellite: example of Sentinel5P



Main parameters:

- S5p is the first **atmospheric Sentinel** mission focusing on global observations of the atmospheric composition for **air quality** and **climate monitoring**;
- Launched on **Oct. 13 2017**; **7 years** design lifetime;
- **Daily overpass** ~13:30 hrs; **Swath** ~2600 km;
- **Spatial resolution** at nadir ~5.5x3.5 km² in UVVIS, ~7x7 km² in SWIR;
- **Use case**: Investigate signatures of the human **emission reductions** due to COVID19 lockdown measures;
- Target datasets: tropospheric columns of **NO₂** and **CO**;
- Match-up with **ground-based** data and **models**.

Related publications:

- http://www.esa.int/Applications/Observing_the_Earth/Copernicus/SentinelP/Air_pollution_remains_low_as_Europeans_stay_at_home
- <https://physicstoday.scitation.org/doi/10.1063/PT.6.2.20200501a/full/>
- <https://news.agu.org/press-release/covid-19-lockdowns-significantly-impacting-global-air-quality/>
- <https://news.agu.org/files/2020/05/2020GL087978-Stavrakou.pdf>

Aggregate data of polar satellite: example of Sentinel5P

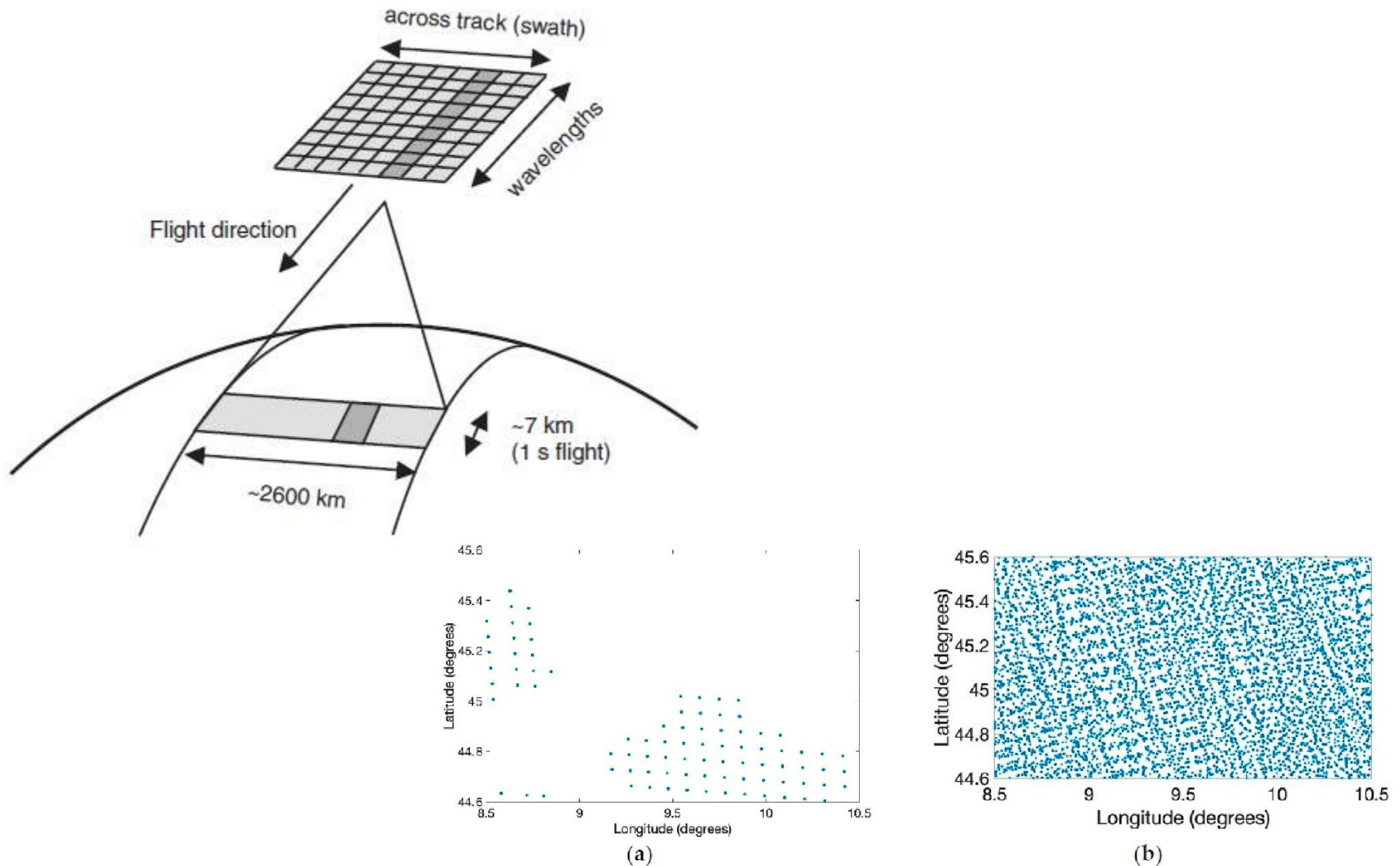
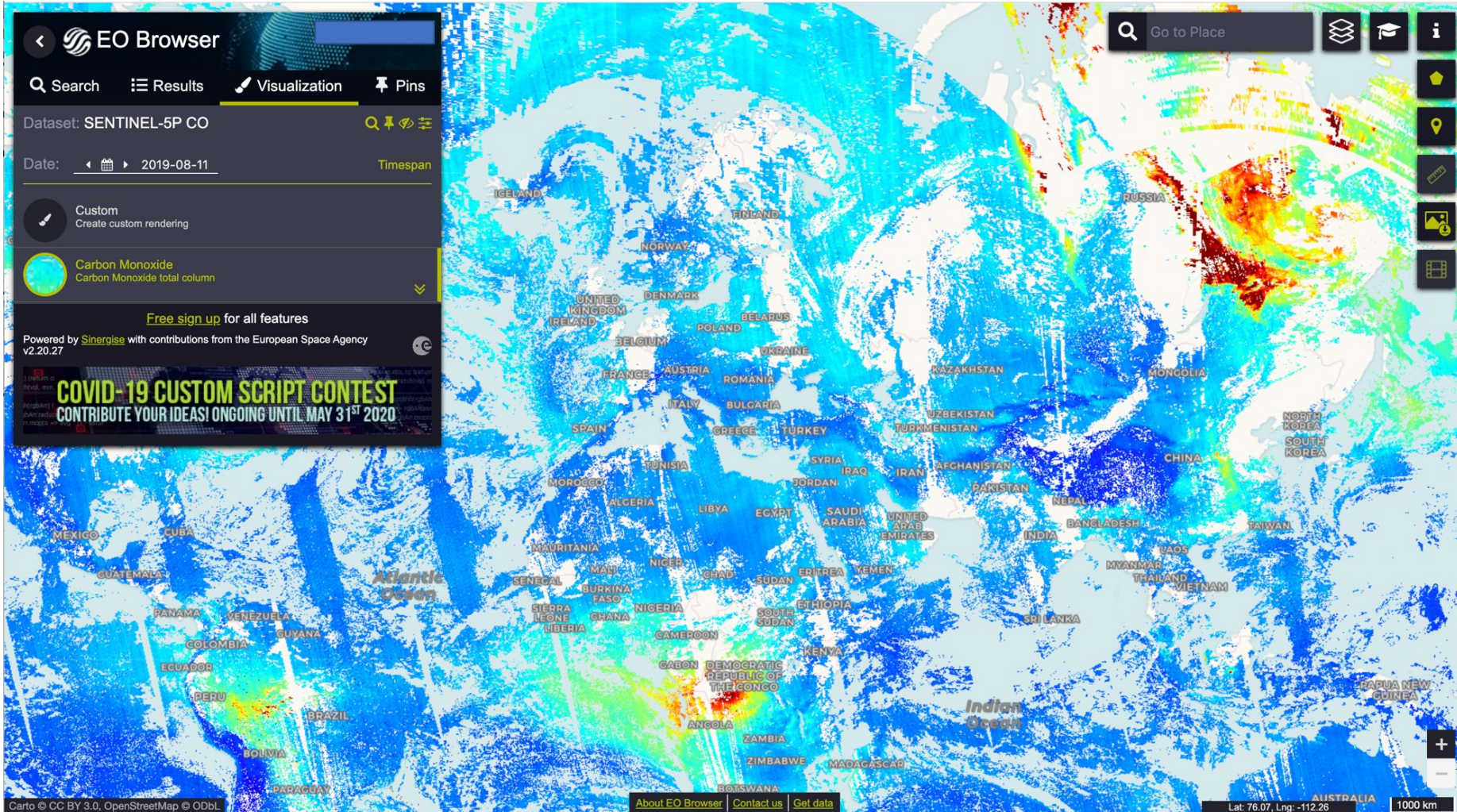


Figure 3. Clear sky Tropospheric Monitoring Instrument (TROPOMI) satellite footprints (whose centers are shown with a dot) for one single overpass (a) and after one month of overpasses (b).

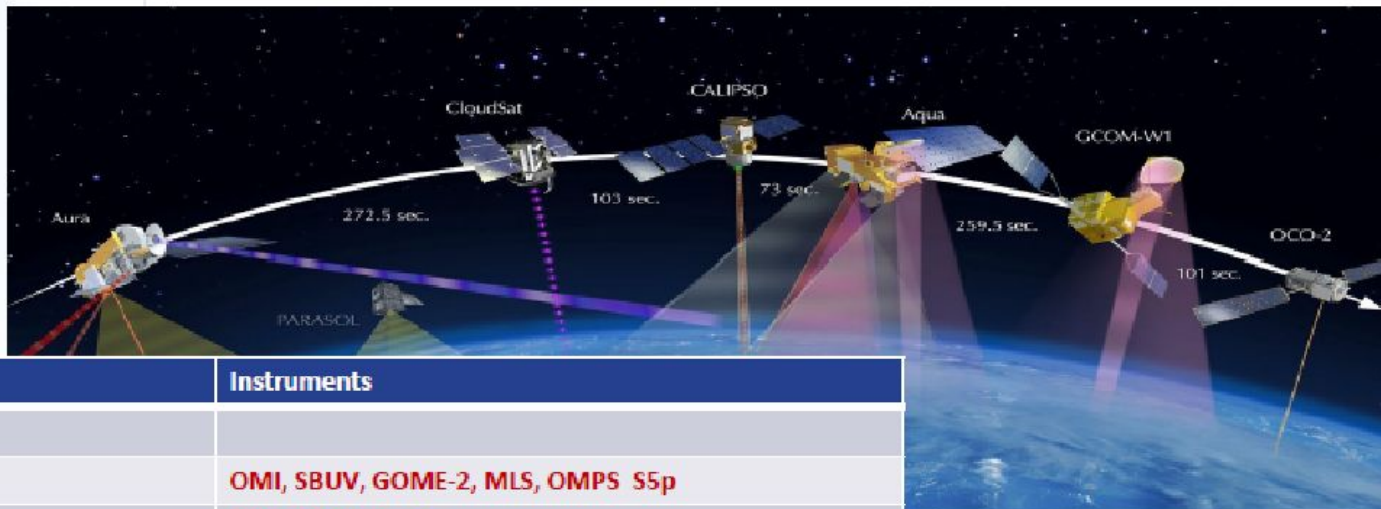


CAMS Service (2)



Atmosphere
Monitoring

Earth Observation satellites



Species	Instruments
Global system	
O ₃	OMI, SBUV, GOME-2, MLS, OMPS S5p
CO	IASI, MOPITT, S5p
NO ₂	OMI, GOME-2, S5p
SO ₂	OMI, GOME-2, S5p
Aerosol	MODIS, PMAp, VIIRS, S3
CO ₂	GOSAT, OCO-2
CH ₄	GOSAT, IASI, S5p
GFAS fire emissions	MODIS, SEVIRI*, VIIRS, Sentinel-3, GOES-E/W*, HIMAWARI-8*

Assimilated **Monitored** Under development

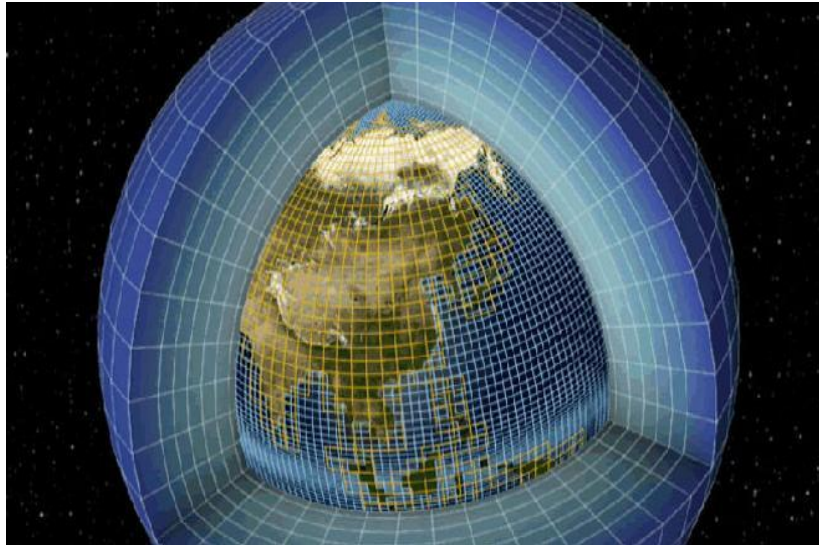
*Geostationary platform

CAMS uses Earth Observation data from many satellites for atmospheric composition and weather.

What is a model ?

(crucial for large-scale, complex atmospheric models)

- Global models have 3D domain with finite number of **gridboxes**. Typical global models: horizontal resolution of $\sim 100\text{km}$, vertical of $\sim 1\text{km}$ \rightarrow total of $\sim 10^6$ gridboxes. **Equation then solved for all gridboxes.**



Conservation of mass (mass balance equation) for a gas/aerosol constituent

$$\frac{\partial n}{\partial t} = -\nabla \cdot (n\mathbf{U}) + D\nabla^2 n + P - L$$

Change of concentration of constituent with time (in molec. $\text{m}^{-3} \text{s}^{-1}$).

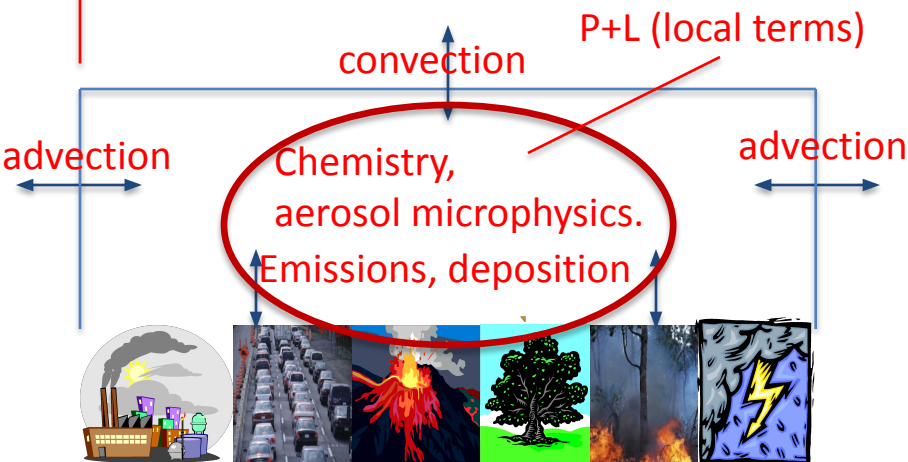
Flux divergence due to transport (advection/convection). \mathbf{U} is the wind velocity vector (m s^{-1}).

Flux divergence due to molecular diffusion. D is the molecular diffusion coefficient ($\text{m}^2 \text{s}^{-1}$).

Local production term: Emission, chemical production, microphysics (in $\text{kg m}^{-3} \text{s}^{-1}$).

Local loss term: Chemical loss, wet and dry deposition, microphysics (in $\text{kg m}^{-3} \text{s}^{-1}$).

Small in trop/strat



- This equation is for number concentration, but equivalent equations can be written for **mass**, **mass concentration** etc.

Recent advances that revolutionized atmospheric science

Models have advanced a lot in the last 2-3 decades, with higher and higher resolution and more and more processes included (increasing computational power has been crucial).

Satellite observations of atmospheric constituents have produced a wealth of data that helps us constrain our models in a way that we could not have done before!



ECMWF supercomputers

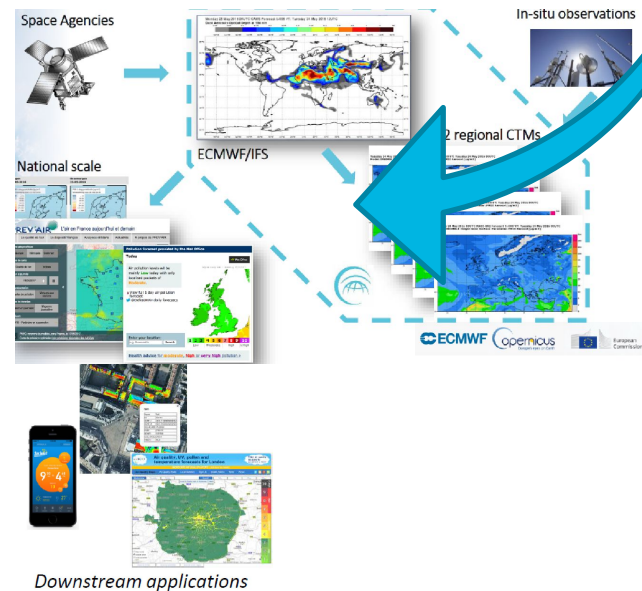
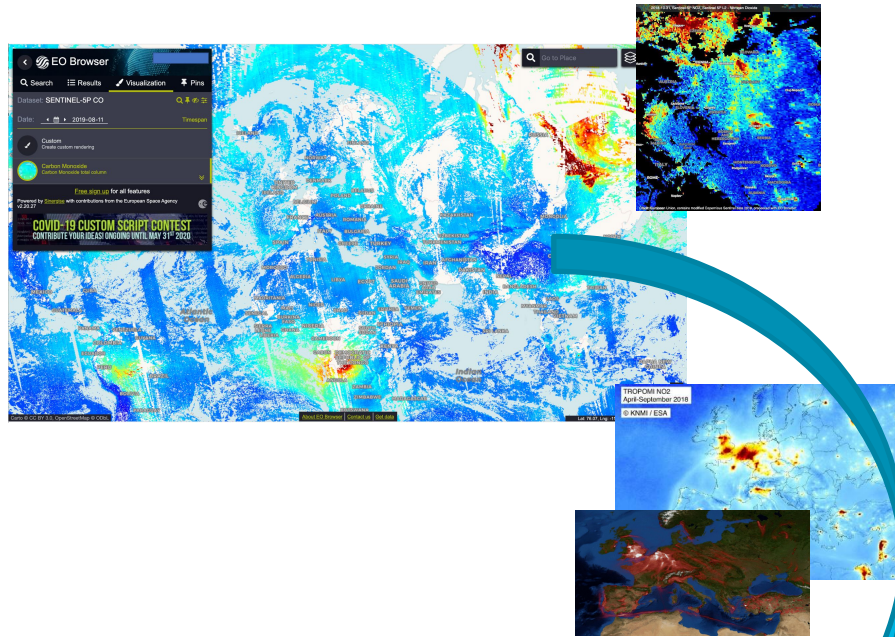


Sentinel-5P satellite



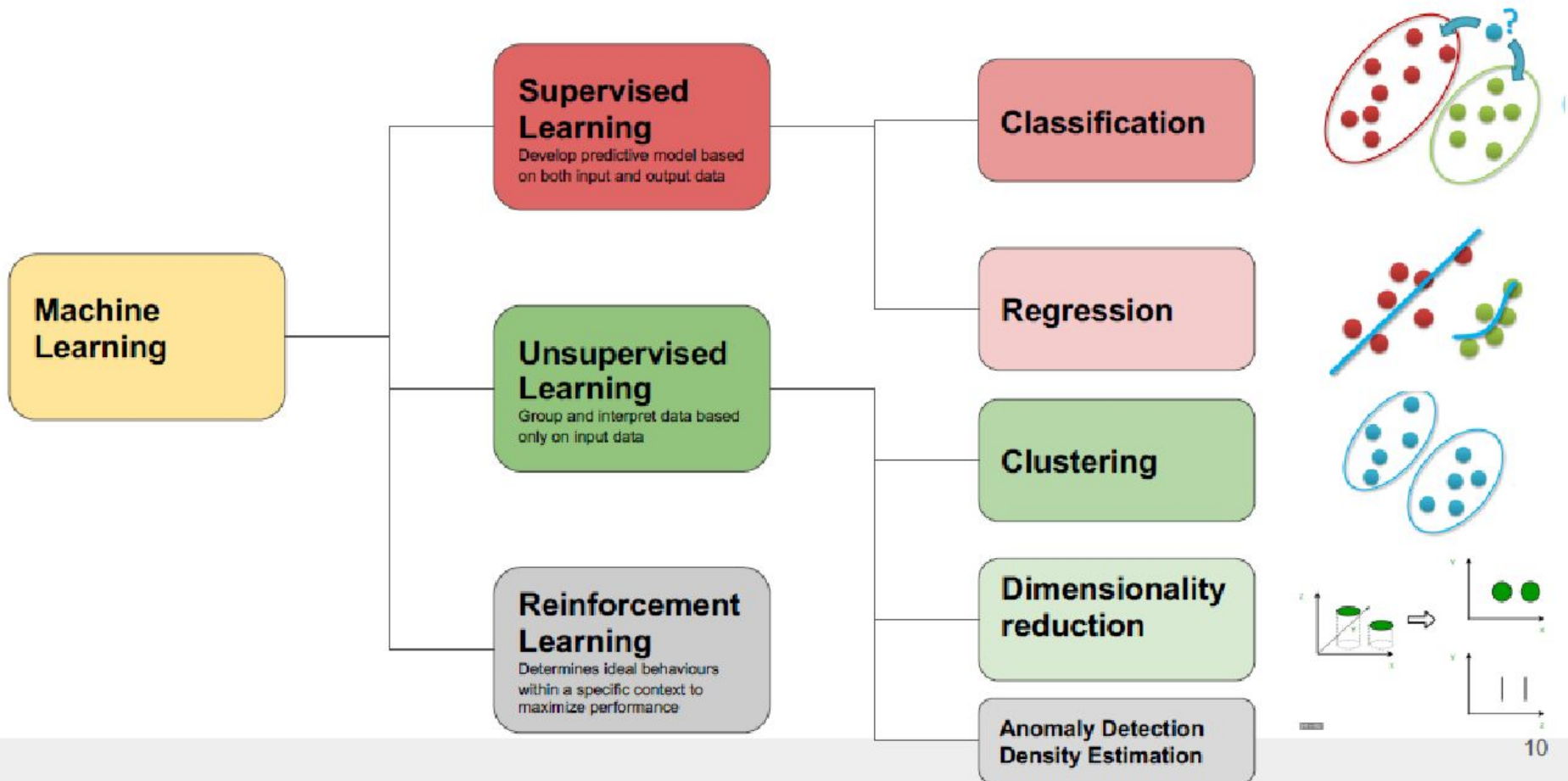
Merge Model and Observations - downscaling

copernicus.eumetsat.int



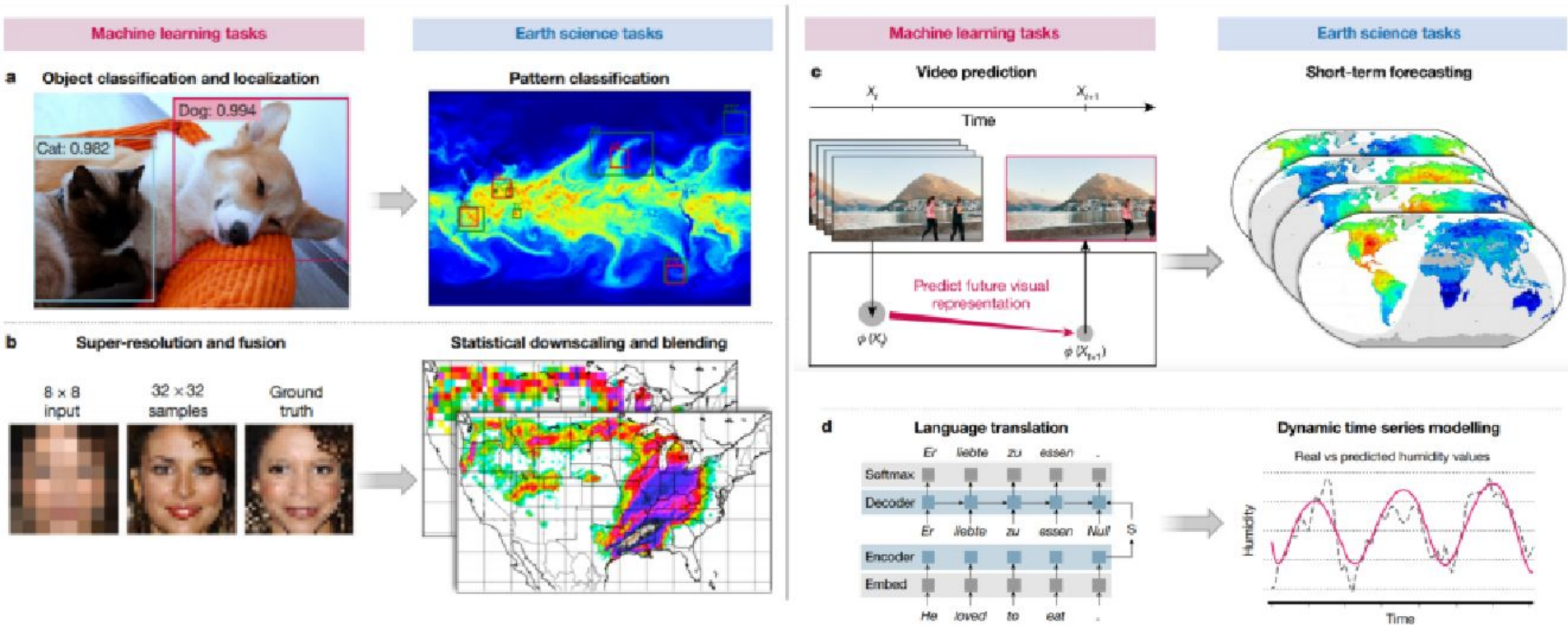
Principles ML - EO

The main branches of Machine Learning (ML)



Principles ML - EO

ML applied to Earth sciences... quick examples (I)



Example of Downscaling

Spatio temporal estimation of satellite-borne and ground-level NO₂

- **Goal:** impute missing satellite-borne NO₂ data (OMI-NO₂) and estimate ground-level NO₂ with uncertainty at a high spatial (1 × 1 km²) and daily resolution
- **Method:** full residual deep network
- **Input data:** OMI NO₂ Columns and hourly ground measurements
- **Output:** daily NO₂ column and ground estimations
- **Finding:** the final 1 × 1 km² grids show natural and smooth spatial transitions between the observed and imputed OMI-NO₂. Good results achieved between predicted and ground-level NO₂ concentrations
- **Added value:** infer missing observations

ML for Earth systems observation

Regression

