

EUMETSAT

Data-driven EO for ML

Dr Lauren Biermann
obo Dr Roope Tervo



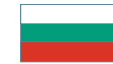
- EU•MET•SAT is an operational organisation formed in 1986, services the needs of member states for timely, accurate weather and climate data.
- Currently:
 - ▶ 30 member states
 - ▶ India, China, Japan, Korea, Canada and the USA.
 - ▶ 12 active satellites



AUSTRIA



BELGIUM



BULGARIA



CROATIA



CZECHIA



DENMARK



ESTONIA



FINLAND



FRANCE



GERMANY



GREECE



HUNGARY



ICELAND



IRELAND



ITALY



LATVIA



LITHUANIA



LUXEMBOURG



NETHERLANDS



NORWAY



POLAND



PORTUGAL



ROMANIA

SLOVAK
REPUBLIC

SLOVENIA



SPAIN



SWEDEN



SWITZERLAND



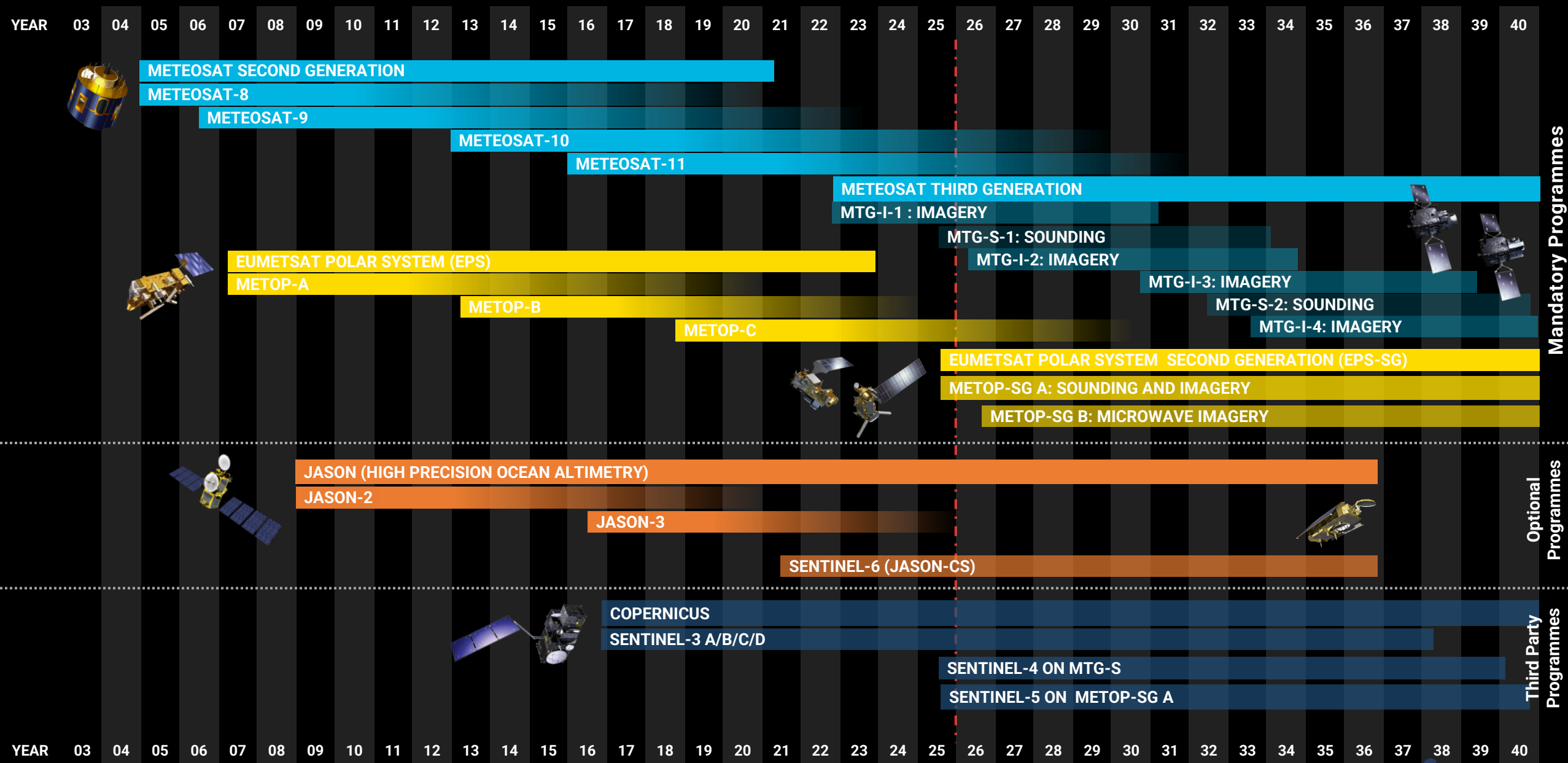
TURKEY



UNITED KINGDOM



EUMETSAT Mission Planning:



Polar Orbiting LEO and Geostationary Satellite Fleet:

METOP -B, -C , SGA1
(Local Equator Crossing Time - 9:30 AM)

LOW EARTH, SUN-SYNCHRONOUS ORBIT

EUMETSAT POLAR SYSTEM (EPS) /
FIRST AND SECOND GENERATION

SENTINEL-3A & -3B (98.65° incl.)

LOW EARTH, SUN-SYNCHRONOUS ORBIT

COPERNICUS SATELLITES DELIVERING
MARINE AND LAND OBSERVATIONS



JASON-3 & SENTINEL-6 (63° incl.)

LOW EARTH, NON-SYNCHRONOUS ORBIT

OCEAN SURFACE TOPOGRAPHY MISSION,
SHARED WITH CNES/NOAA/EU

METEOSAT-10, 11, 12, 13

GEOSTATIONARY ORBIT	MULTI-SATELLITE SYSTEM
METEOSAT 2 ND GENERATION	FULL DISC IMAGERY MISSION (15 MINS) (METEOSAT-11 (9.5°E)) RAPID SCAN SERVICE OVER EUROPE (5 MINS) (METEOSAT-10 (0.5° W))
METEOSAT 3 RD GENERATION	FULL DISC IMAGERY MISSION (10 MINS) (METEOSAT-12 (0°)) ATMOSPHERIC SOUNDING IR (30 MINS) UV (60 MINS) (METEOSAT-13 (0°))

METEOSAT-9 (46° E)

GEOSTATIONARY ORBIT
METEOSAT 2 ND GENERATION: PROVIDING INDIAN OCEAN DATA COVERAGE SERVICE (IODC)



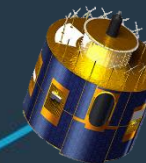
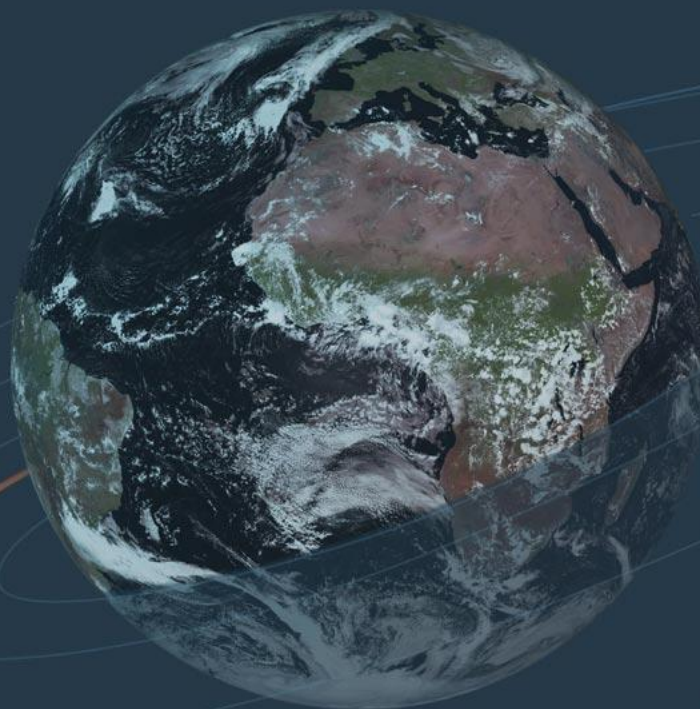
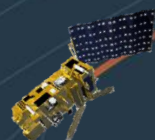
The need for two types of EUMETSAT satellites

www.eumetsat.int

Low-Earth orbit

650-850 km altitude

Critical for forecasts
up to 10 days in
advance



Geostationary orbit

Vital for forecasts up
to a few hours ahead



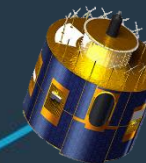
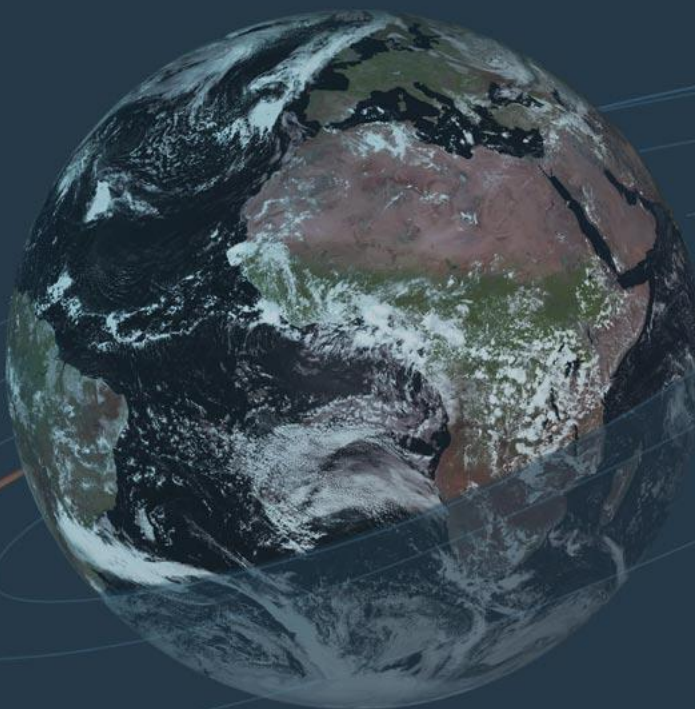
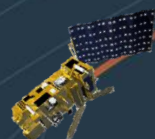
The need for two types of EUMETSAT satellites

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Low-Earth orbit

650-850 km altitude

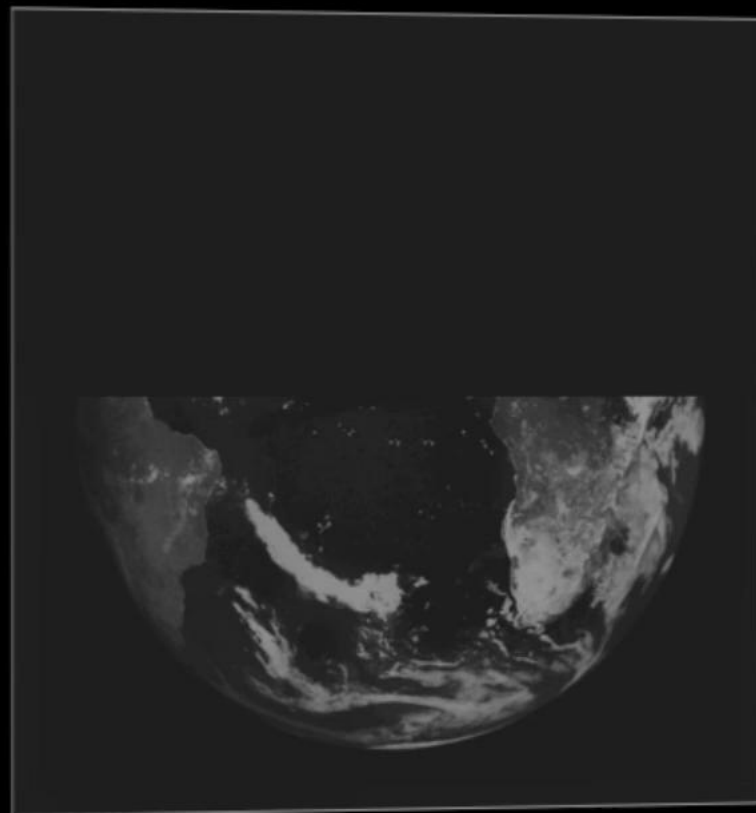
Critical for forecasts
up to 10 days in
advance



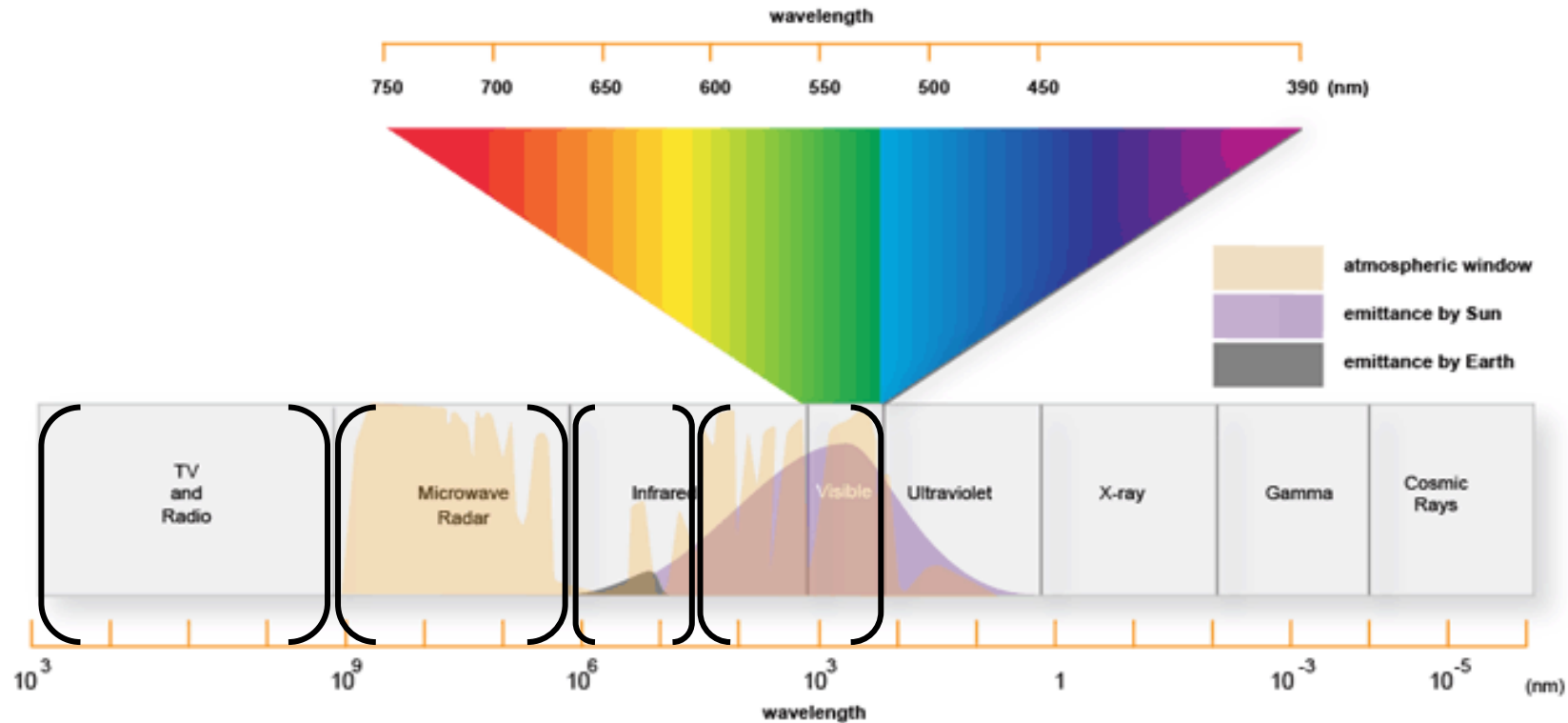
Geostationary orbit

36,000 km altitude

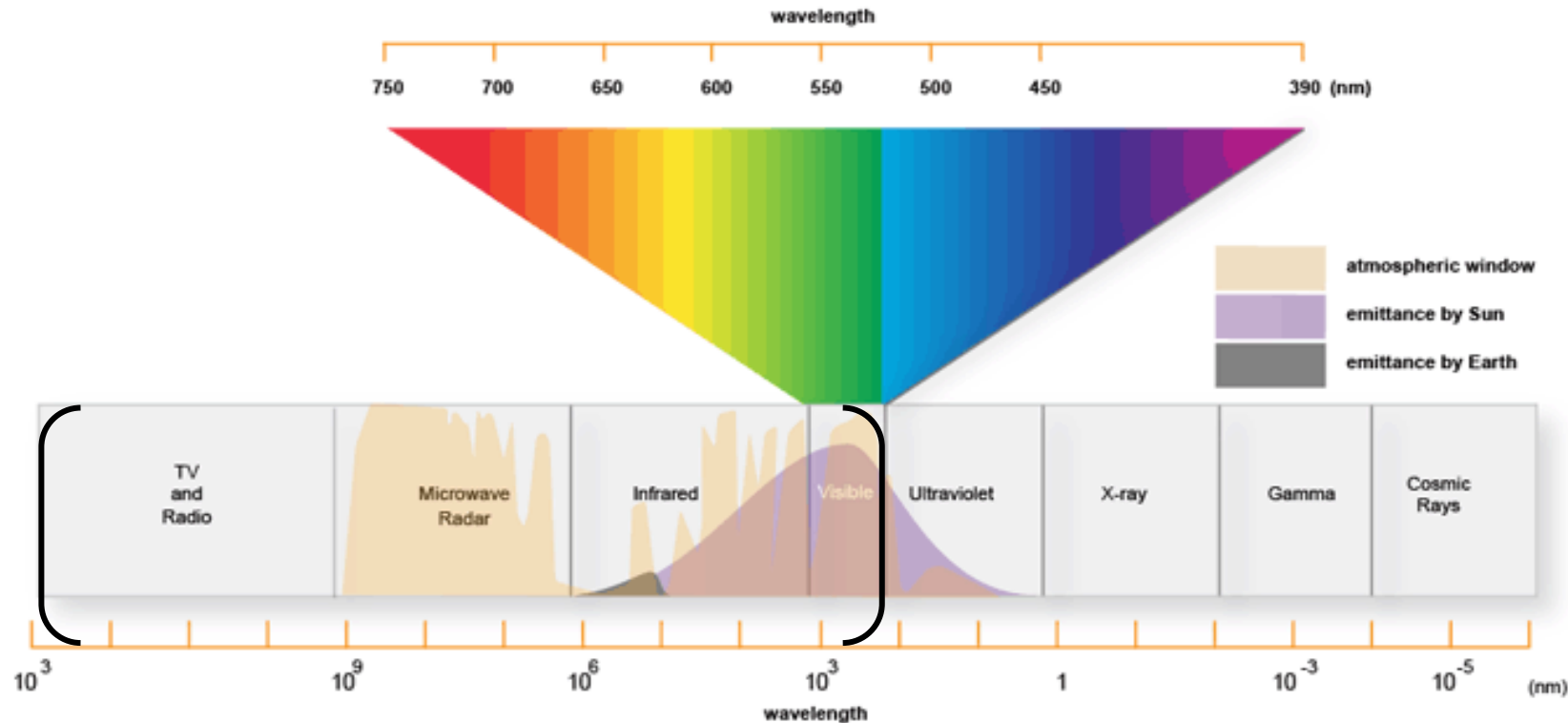
Vital for forecasts up
to a few hours ahead



All satellite-based EO uses sections of the electromagnetic spectrum, and each region tells us different things about the properties of surfaces being observed.



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- **Passive** and **active** sensors are used for Earth Observation applications.
- Different bands can be used to observe different features in unique ways



HOW IT ALL BEGAN...

Sputnik 1 the first satellite

S- ('fellow') -putnik ('traveler') corresponding to Latin root satelles ('guard' or 'companion'), which is the origin of English word "satellite".





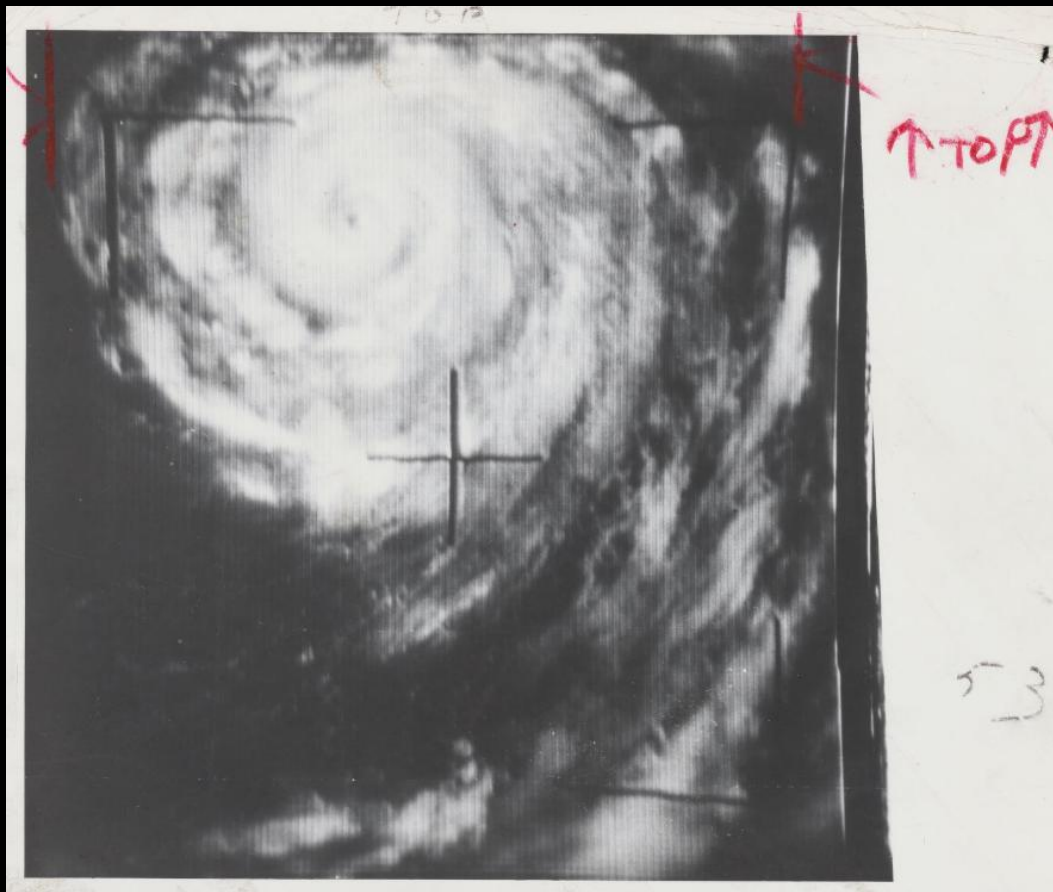
TIROS 1
the first meteorological satellite

FIRST TELEVISION PICTURE FROM SPACE
TIROS I SATELLITE APRIL 1, 1960



TIROS 1
the first meteorological satellite





TIROS 1
the first meteorological satellite

NIMBUS foundation for Earth Observation

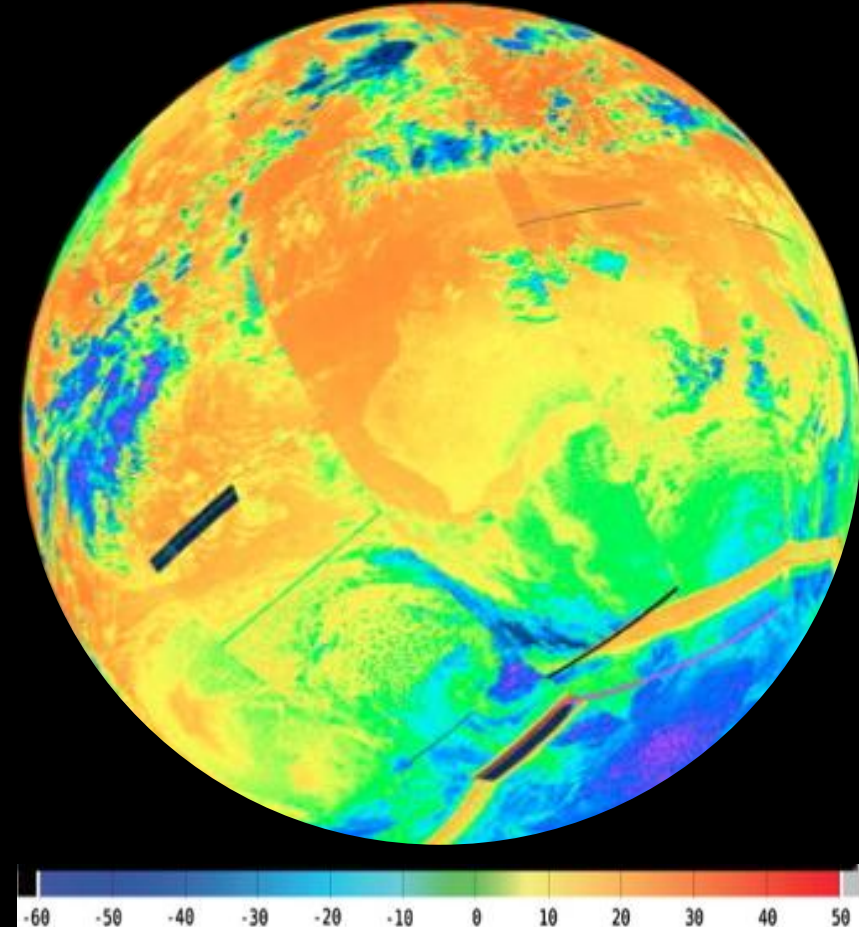


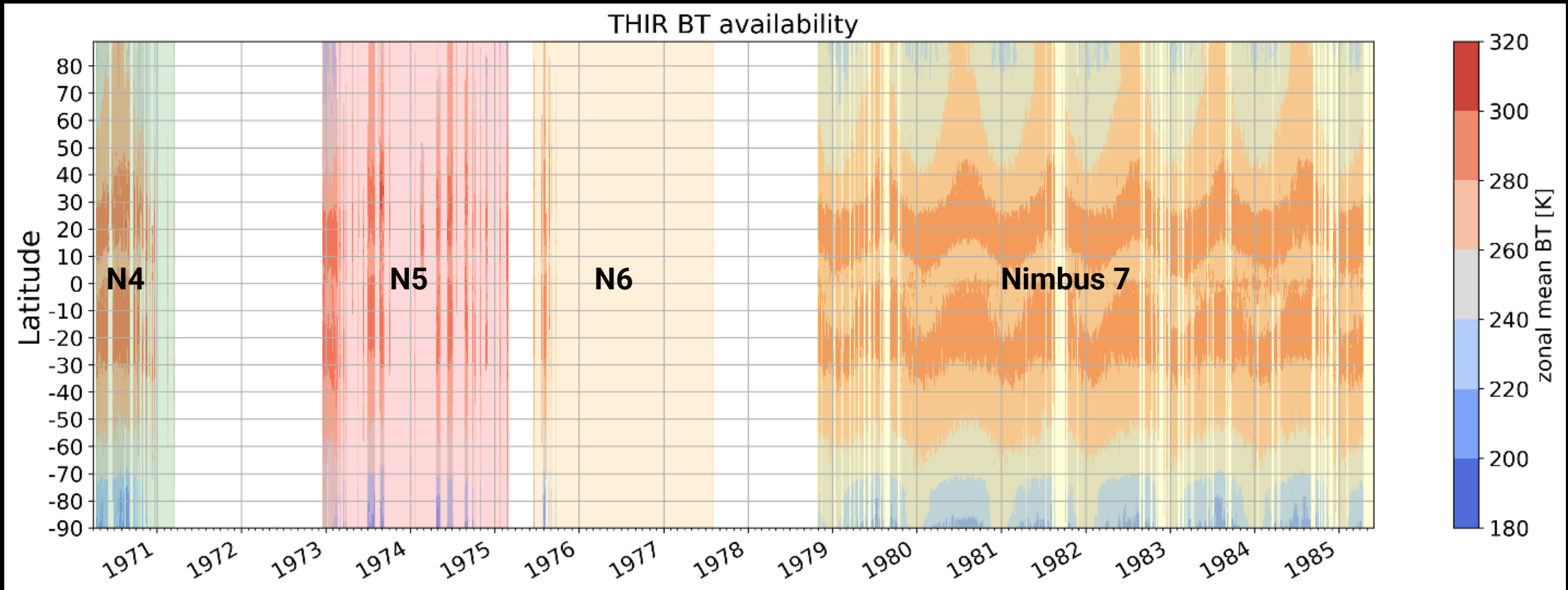
Figure from Gallaher et al. "The rescue of the early Nimbus satellite data". 2015.

NIMBUS foundation for Earth Observation

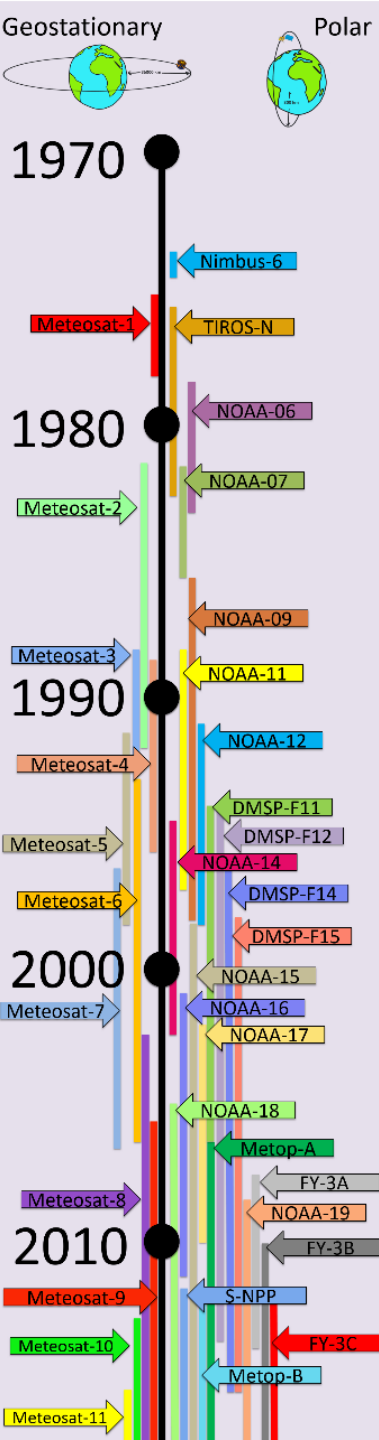


- From the mid-1970s, EO datasets (esp. over data-sparse oceans) have substantially improved numerical weather predictions.
- WMO reports that improved early warning systems have contributed to a decline in global weather-related deaths:
 - >50,000 per year in the 1970s
 - <20,000 per year in the 2010s

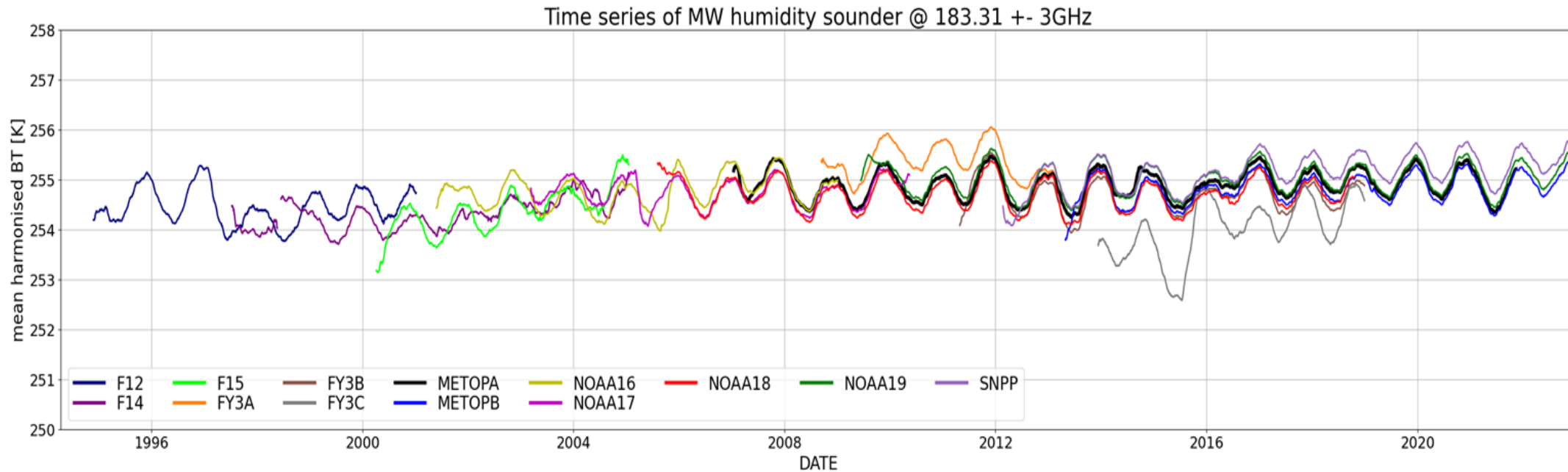
THIR Temperature Humidity Infrared Radiometer



- From Nimbus-4 onwards, wind estimates were derived from experimental cloud tracking, demonstrating the feasibility of satellite-derived Atmospheric Motion Vectors.

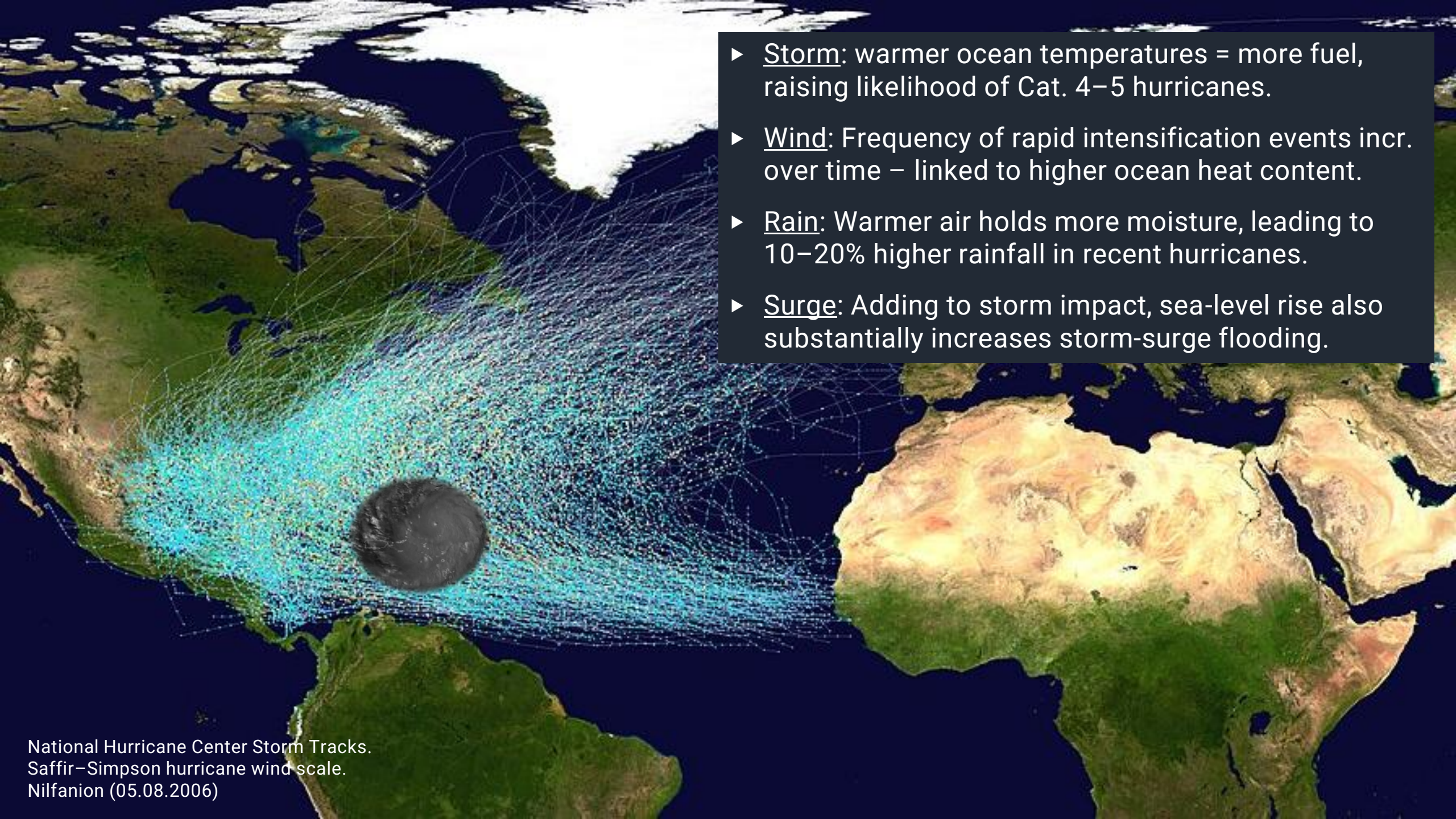


Harmonisation: 183.31 ± 3 GHz



Common reference definition:

Mapping of all observations onto an agreed “virtual channel” centered on the 183.31 ± 3 GHz water vapour absorption line.

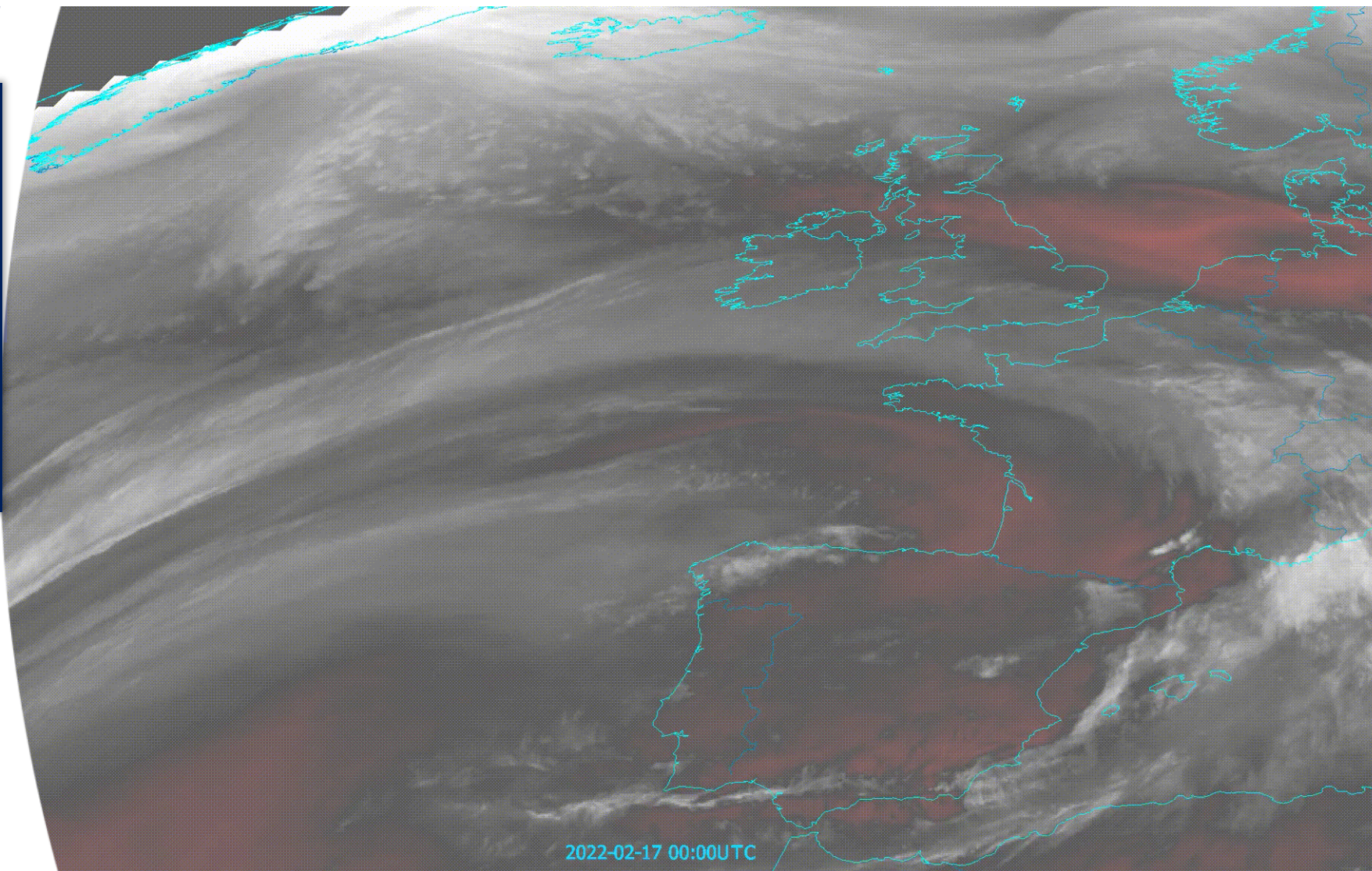
- 
- A map of the Atlantic Ocean showing the historical tracks of hurricanes. The tracks are represented by a dense field of blue and cyan lines, indicating the paths of storms. A small, dark, circular satellite image of Earth is positioned in the center of the Atlantic. The surrounding landmasses, including North America, South America, and Africa, are visible in a naturalistic color palette.
- ▶ Storm: warmer ocean temperatures = more fuel, raising likelihood of Cat. 4–5 hurricanes.
 - ▶ Wind: Frequency of rapid intensification events incr. over time – linked to higher ocean heat content.
 - ▶ Rain: Warmer air holds more moisture, leading to 10–20% higher rainfall in recent hurricanes.
 - ▶ Surge: Adding to storm impact, sea-level rise also substantially increases storm-surge flooding.



Storm Eunice over Europe in February 2022

Very severe Atlantic storm, Storm Eunice, hit parts of Western Europe 17-18 February 2022.

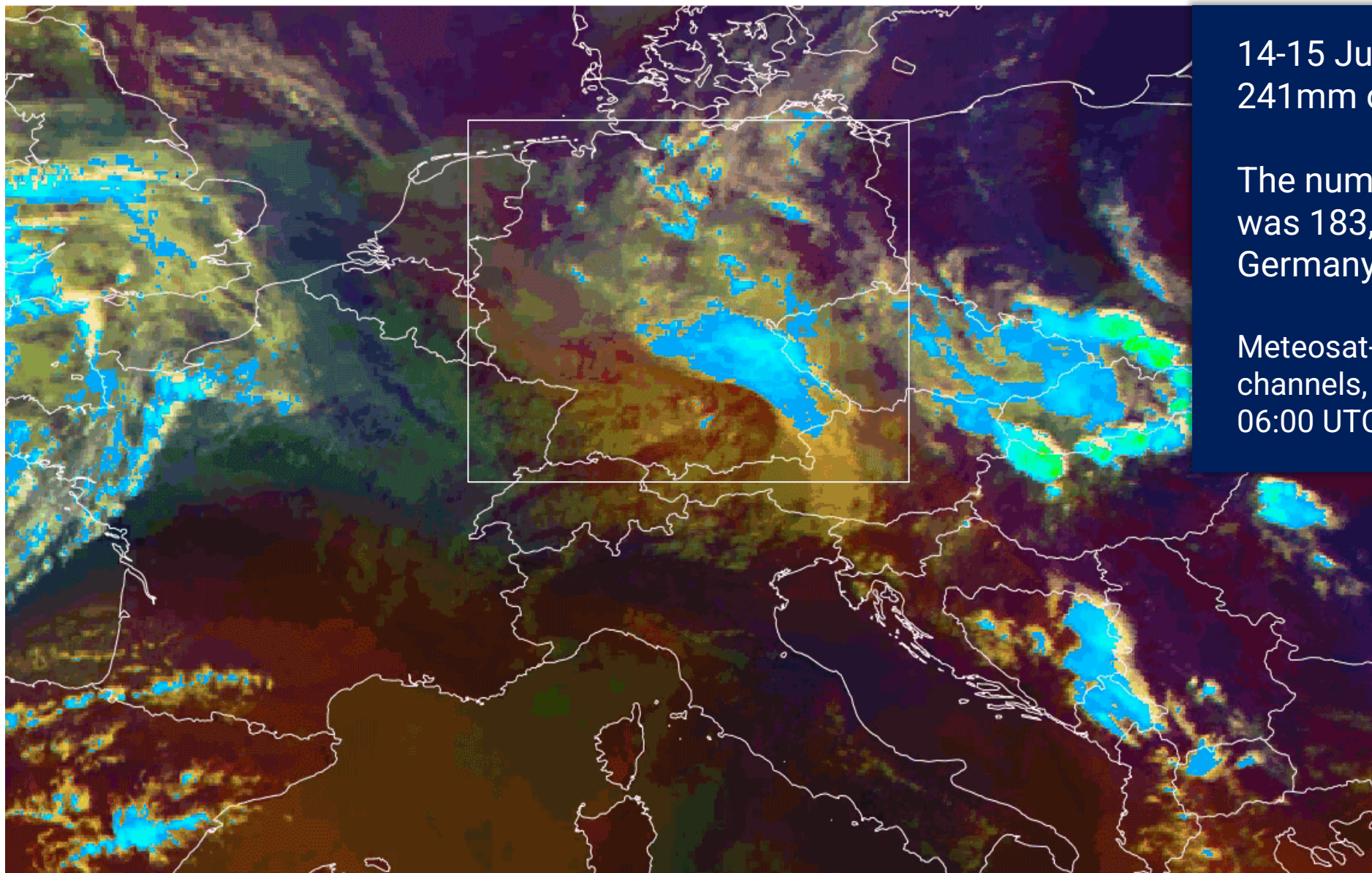
Viewed by Meteosat-11 water vapour channel, 17 February 00:00 – 18 February 10:00 UTC





Devastating floods in Western Europe in July 2021

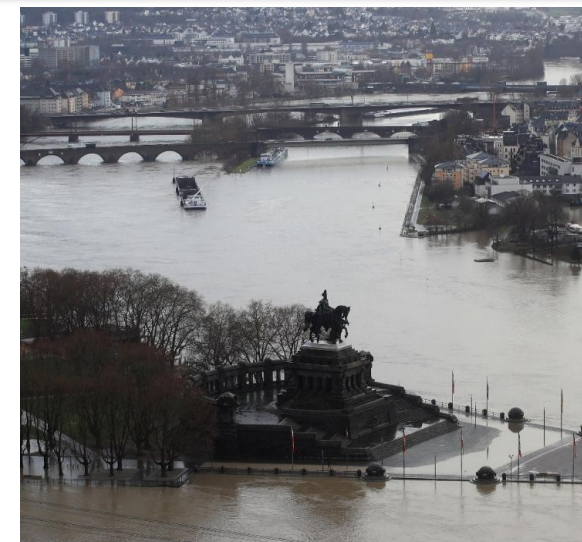
www.eumetsat.int



14-15 July 2021 Germany received 241mm of rainfall in 22 hours.

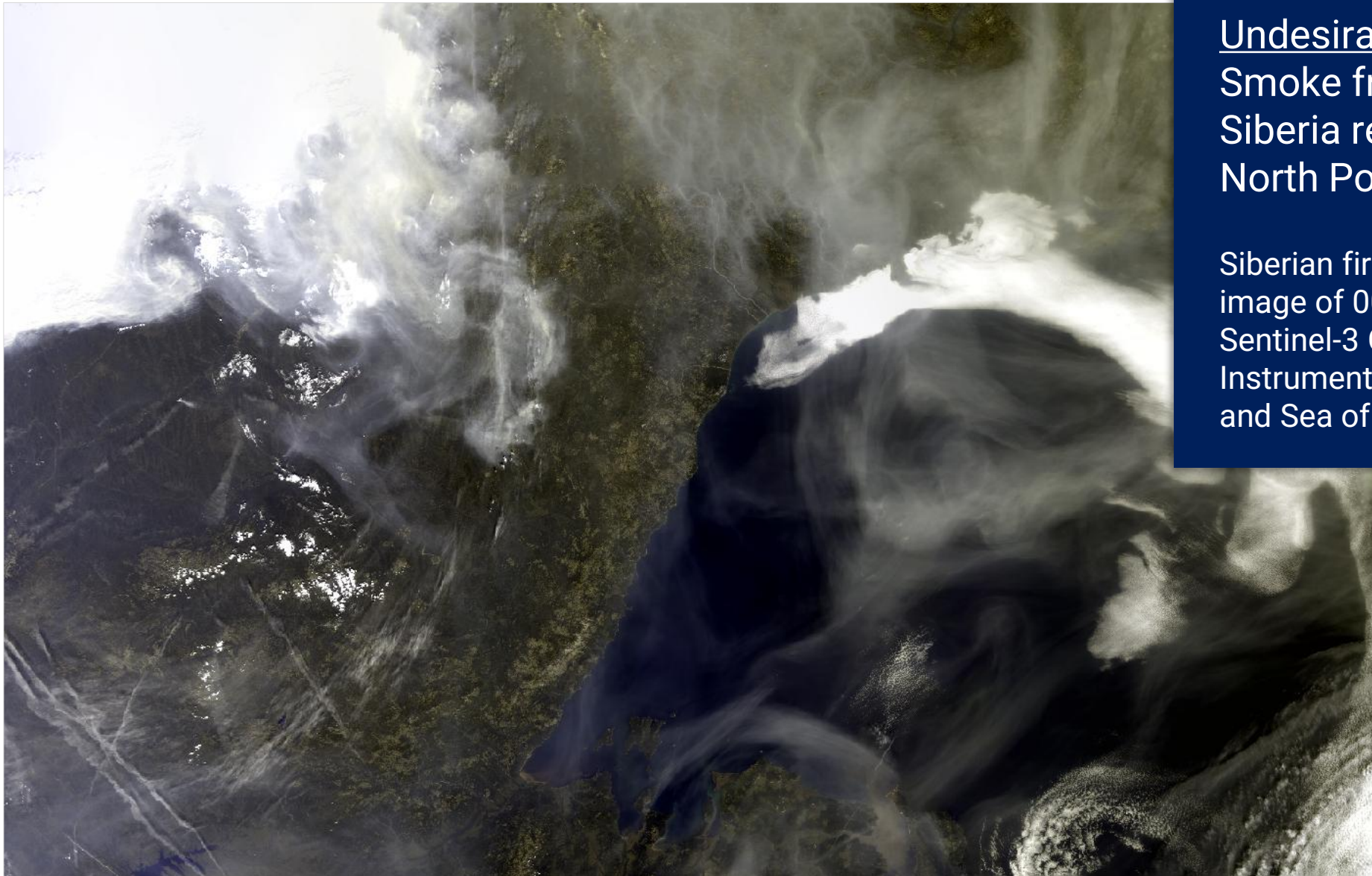
The number of deaths reported was 183, with economic losses in Germany exceeding US\$20 billion.

Meteosat-11 precipitation rate from IR channels, 11 July 12:00 UTC – 16 July 06:00 UTC (Credit: H SAF)



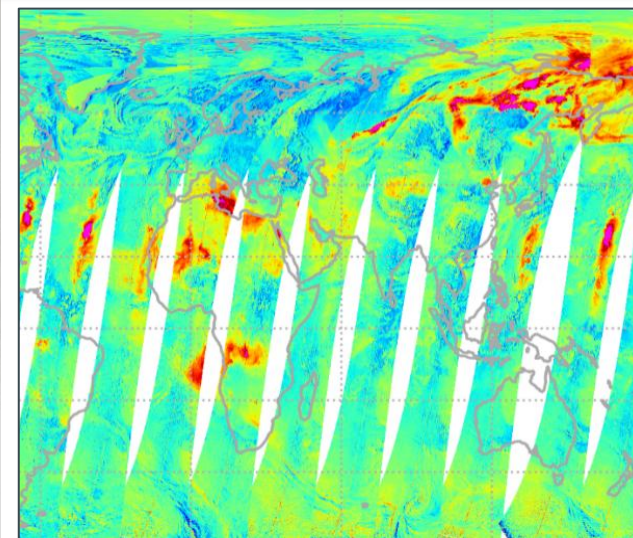


Unprecedented wildfires in Siberia spread smoke over the Arctic



Undesirable world first:
Smoke from wildfires in part of Siberia reached the geographic North Pole in August 2021.

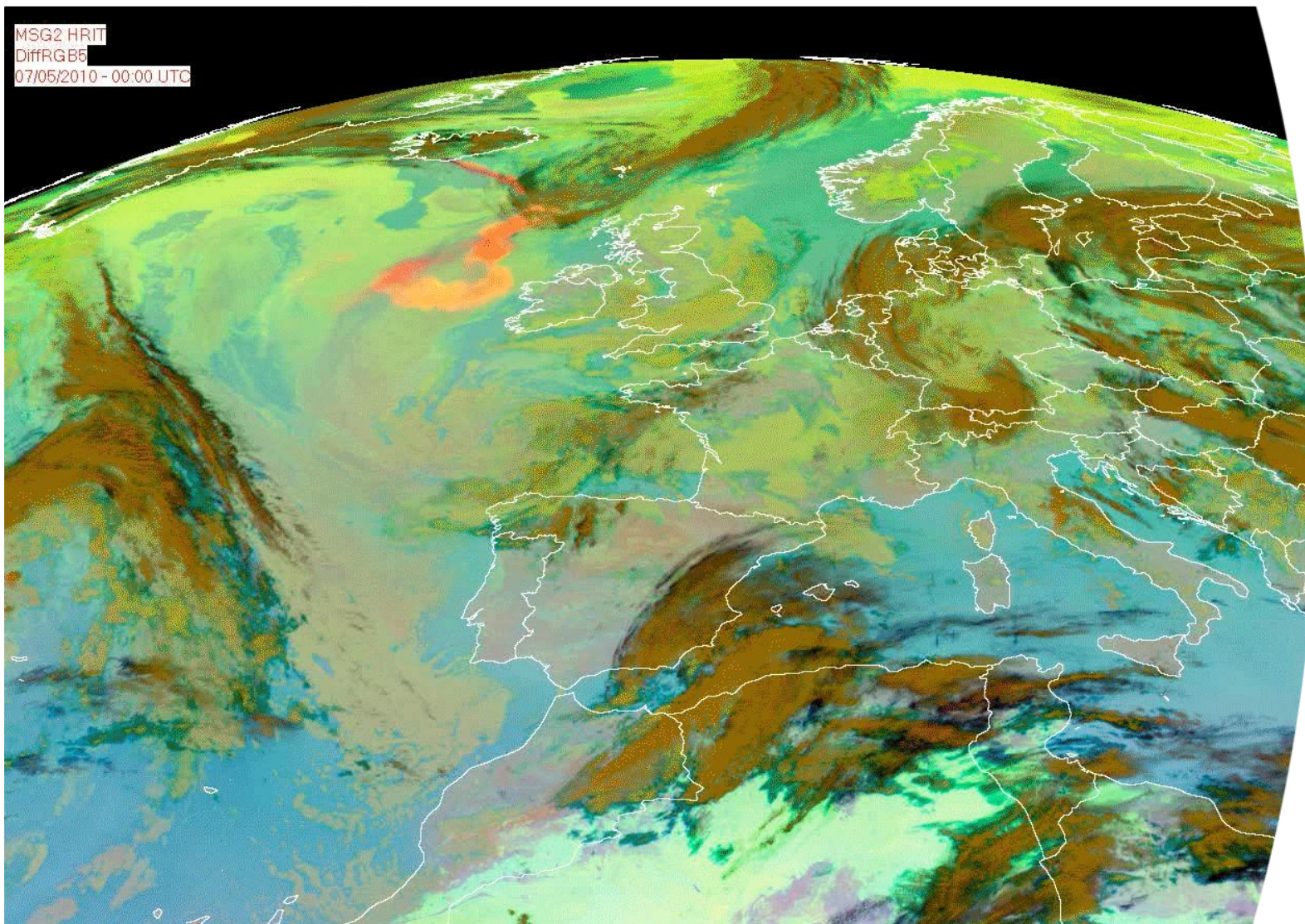
Siberian fires, 12 August 2021, Composite image of 00:30 and 01:32 UTC Copernicus Sentinel-3 OLCI (Ocean and Land Colour Instrument), showing the Dzhigda region and Sea of Okhotsk.





Meteosat for transport safety in aviation

www.eumetsat.int



Iceland 7-11 May 2010

Volcanic ash cloud (orange)
from the second eruption of
Eyjafjallajökull tracked by MSG
geostationary satellites.



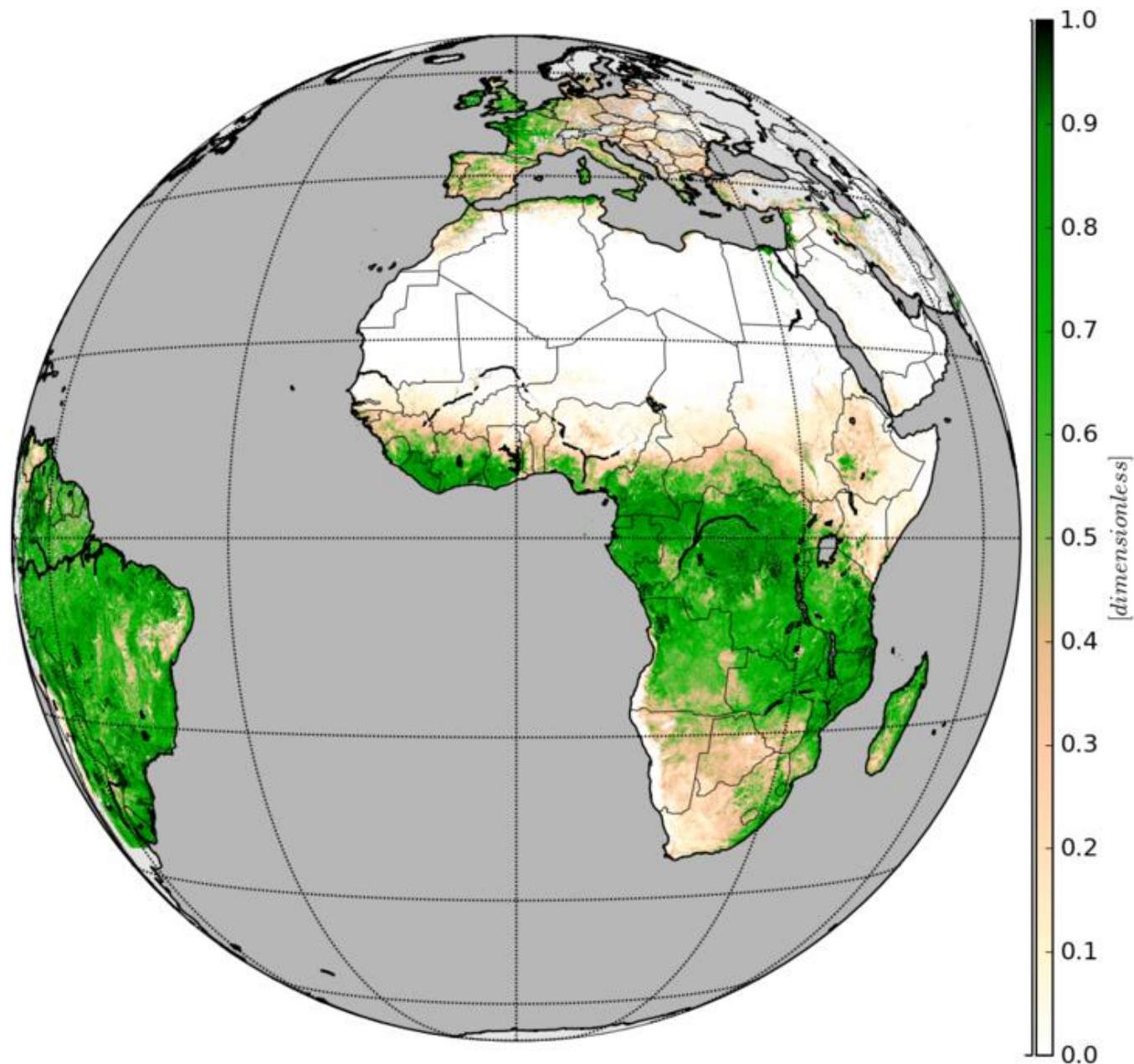


In western Africa, tracking droughts by satellite saves lives



In combination with in-situ measures, Meteosat-11 data is supporting local organisations to monitor rainfall. Most crises in the Sahel region are linked to drought.

The Land Surface Analysis Satellite Application Facility's **fractional vegetation** product can be used to track the progress of growing seasons.



Where we are today: MSG



The main instruments carried by the MSG satellites include:

- ▶ Geostationary Earth Radiation Budget **GERB**
- ▶ Spinning Enhanced Visible and Infrared Imager **SEVIRI**.

GERB observes the reflected sunlight and thermal emissions from the Earth in 2 broadband channels.

Meteosat 2nd Generation (MSG)
'Next Gen' EUMETSAT geostationary satellites

Where we are today: MSG



- SEVIRI has 12 spectral channels:
- ▶ Thermal IR to measure cloud, land, sea surface temperature.
 - ▶ Channels for ozone, water vapour, and CO₂ to analyse air masses and reconstruct 3D a view of the atmosphere.
 - ▶ Visible channel at 1 km horizontal resolution to help weather forecasters detect, track, predict severe weather.

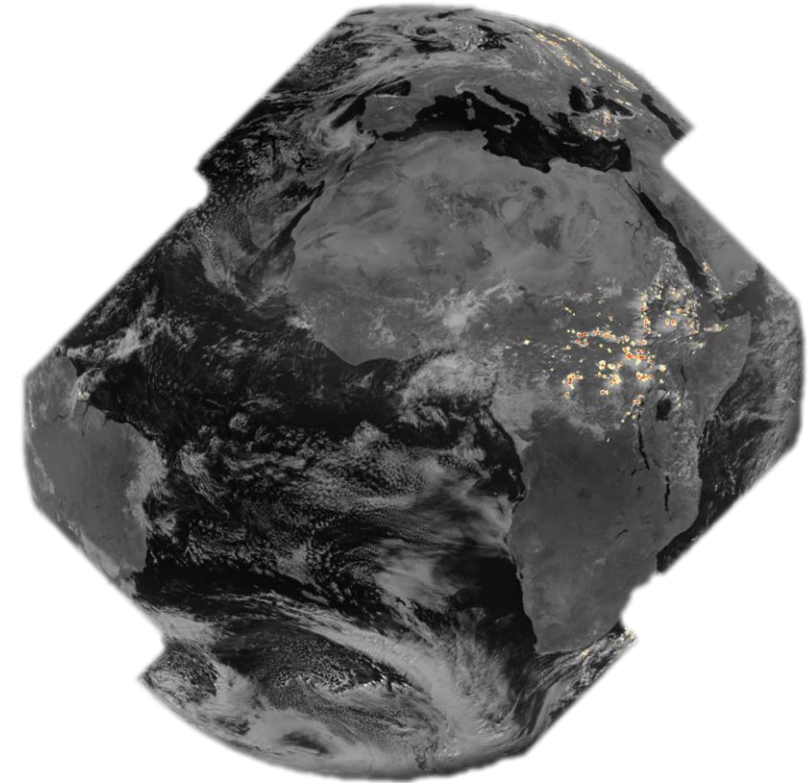
Meteosat 2nd Generation (MSG)
'Next Gen' EUMETSAT geostationary satellites

Where we are today: MTG-I



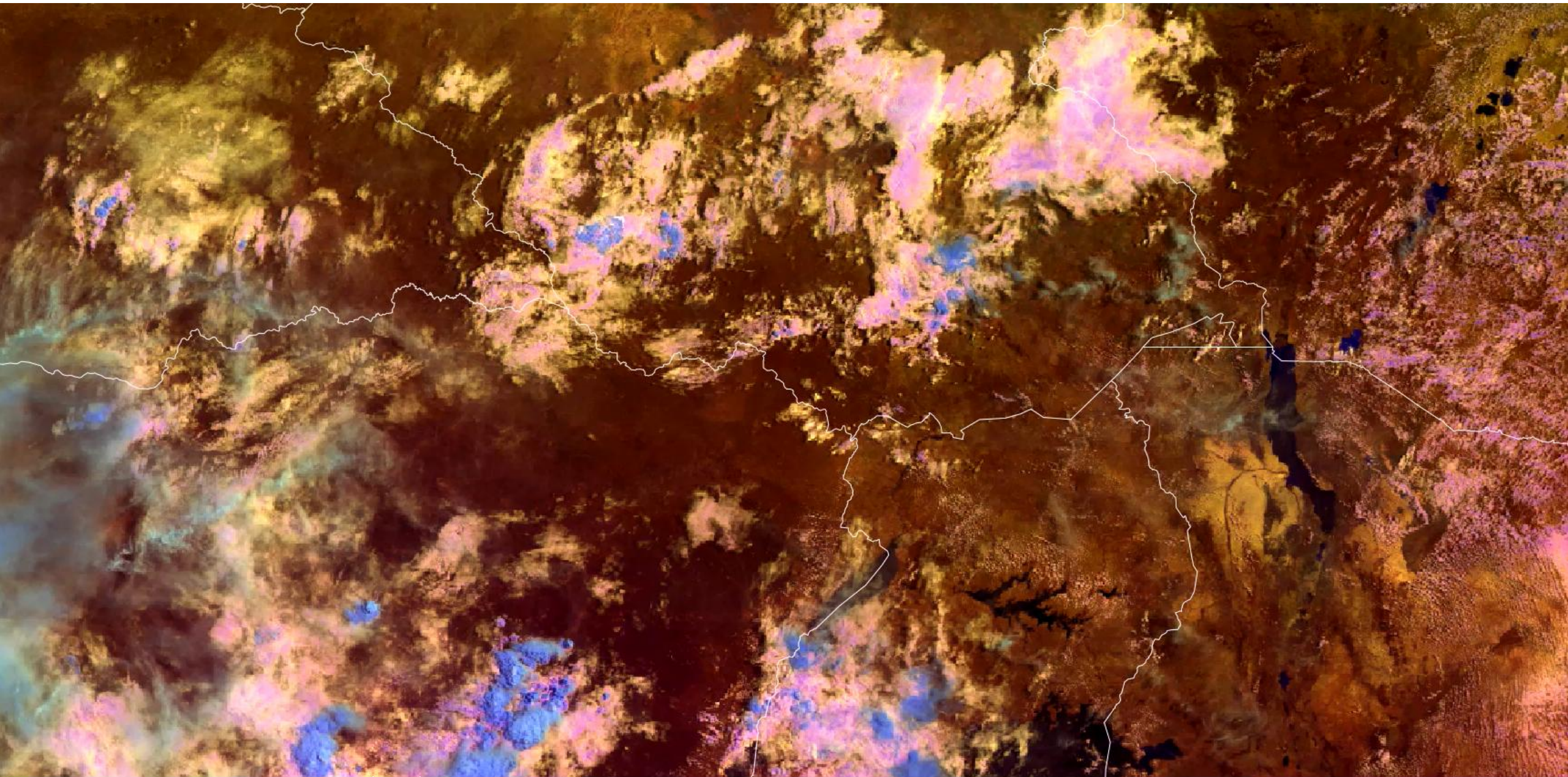
Meteosat Third Generation (MTG)
'Next Gen' EUMETSAT geostationary satellites

FCI bands	
VIS 0.4	1.0 km
VIS 0.5	1.0 km
VIS 0.6	1.0 km 0.5 km (HR)
VIS 0.8	1.0 km
VIS 0.9	1.0 km
NIR 1.3	1.0 km
NIR 1.6	1.0 km
NIR 2.2	1.0 km 0.5 km (HR)
IR 3.8	2.0 km 1.0 km (HR)
WV 6.3	2.0 km
WV 7.3	2.0 km
IR 8.7	2.0 km
IR 9.7	2.0 km
IR 10.5	2.0 km 1.0 km (HR)
IR 12.3	2.0 km
IR 13.3	2.0 km



Lightning Imager

Where we are today: FCI Vis 0.6

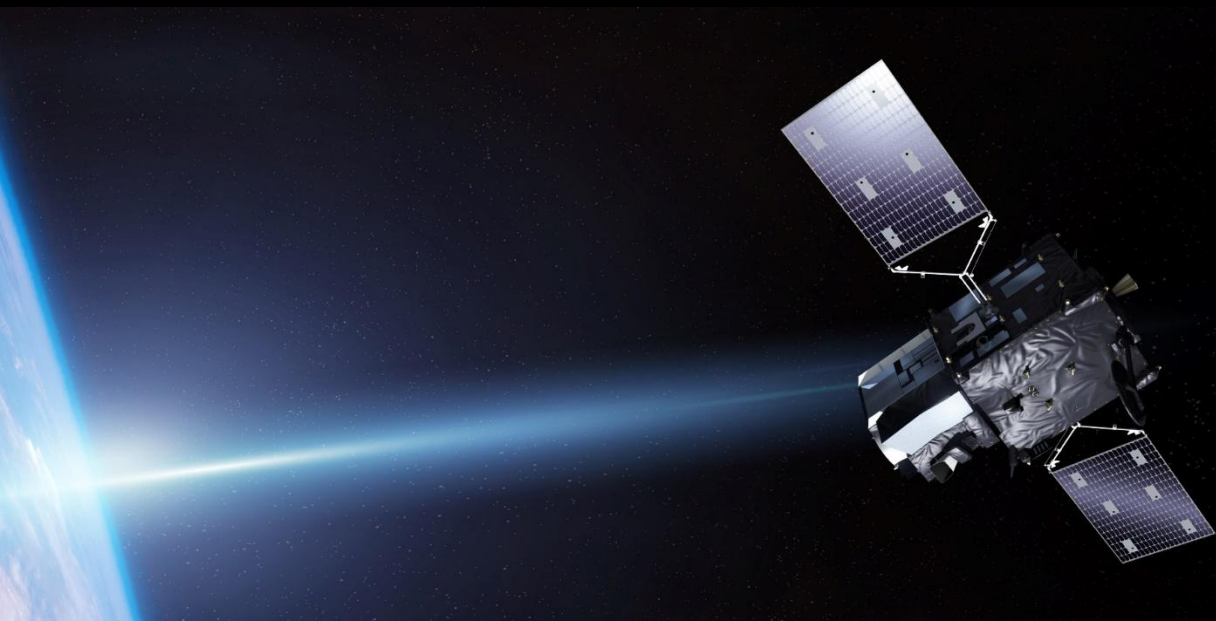


Where we are today: LI



Where we are today: MTG-S

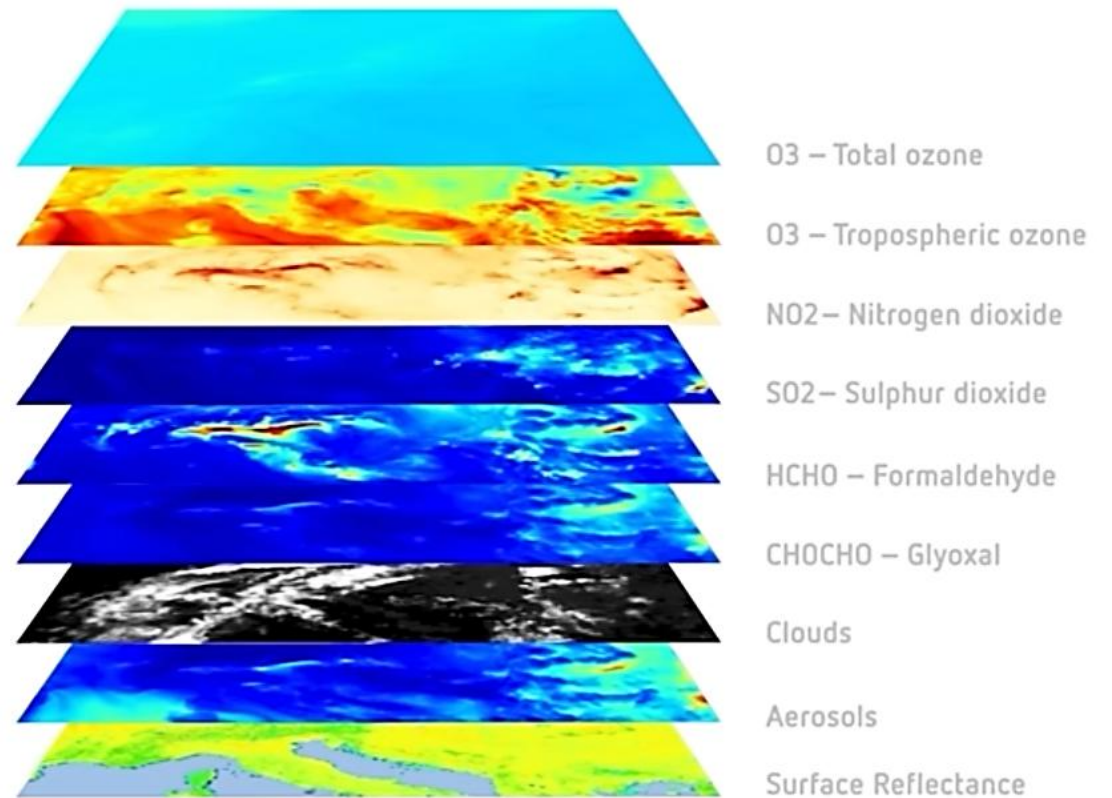
- Carries two key missions: Infrared Sounder and Copernicus Sentinel-4 Ultraviolet Visible Near-infrared spectrometer.
- **Infrared Sounder** will scan nearly 2,000 thermal IR wavelengths every 30 minutes to build vertical profiles of temperature, humidity, trace gases.
- Crucial for detecting fast-developing convective weather by revealing sudden shifts in instability, moisture, wind – before clouds begin to form.



Combined with data from MTG's imager satellites, the IR Sounder will offer a continuous view of a storm's full life cycle, enhancing nowcasts, forecasts, models, and long-term climate monitoring.

Where we are today: Sentinel-4 UVN

- Hourly data on pollutants and aerosols – including from wildfires and volcanic eruptions.
- Measurements will enhance monitoring of emissions and air quality forecasts, as well as support public health and environmental policy.

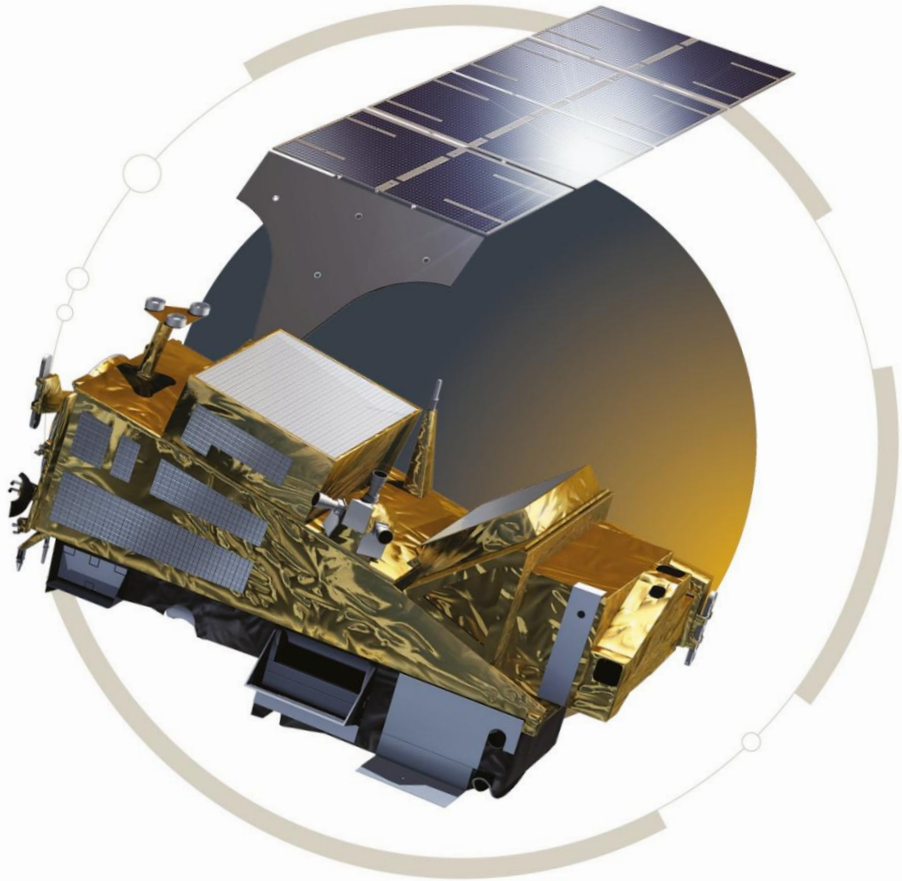


<https://www.youtube.com/watch?v=sMW62W-0G78>

Where we are today:

EUMETSAT Polar System Second Generation (EPS-SG)

Metop-SG



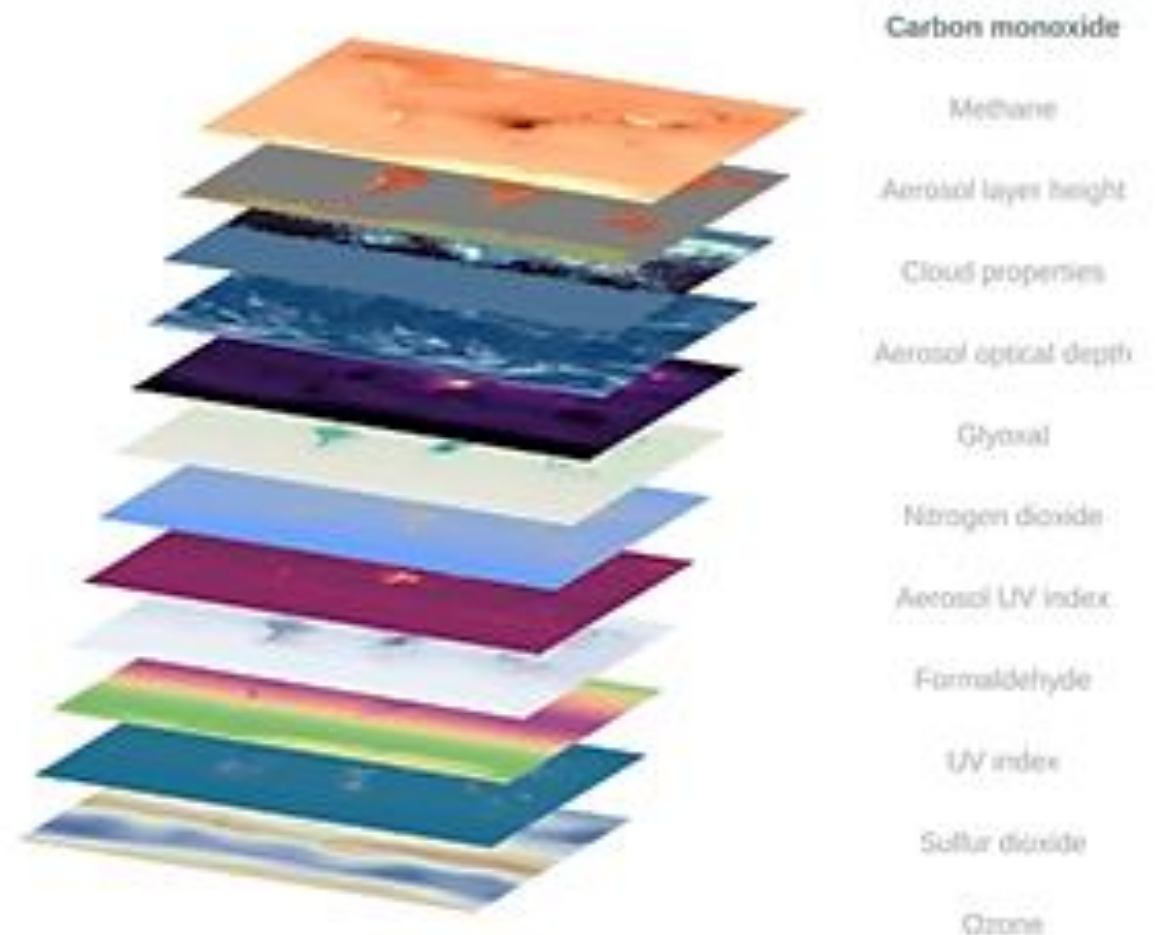
Data to improve global weather monitoring and predictions:

- ▶ Enhanced IR, MW, and radio-occultation soundings of temperature and humidity.
- ▶ Polar atmospheric motion vectors extracted from optical imagery.
- ▶ Novel precipitation and cloud measurements in the optical, sub mm and MW spectra.
- ▶ High-resolution ocean surface wind-vector and soil moisture measurements extracted from scatterometer observations.

Metop Second Generation (Metop-SG)
'Next Gen' EUMETSAT polar-orbiting satellites

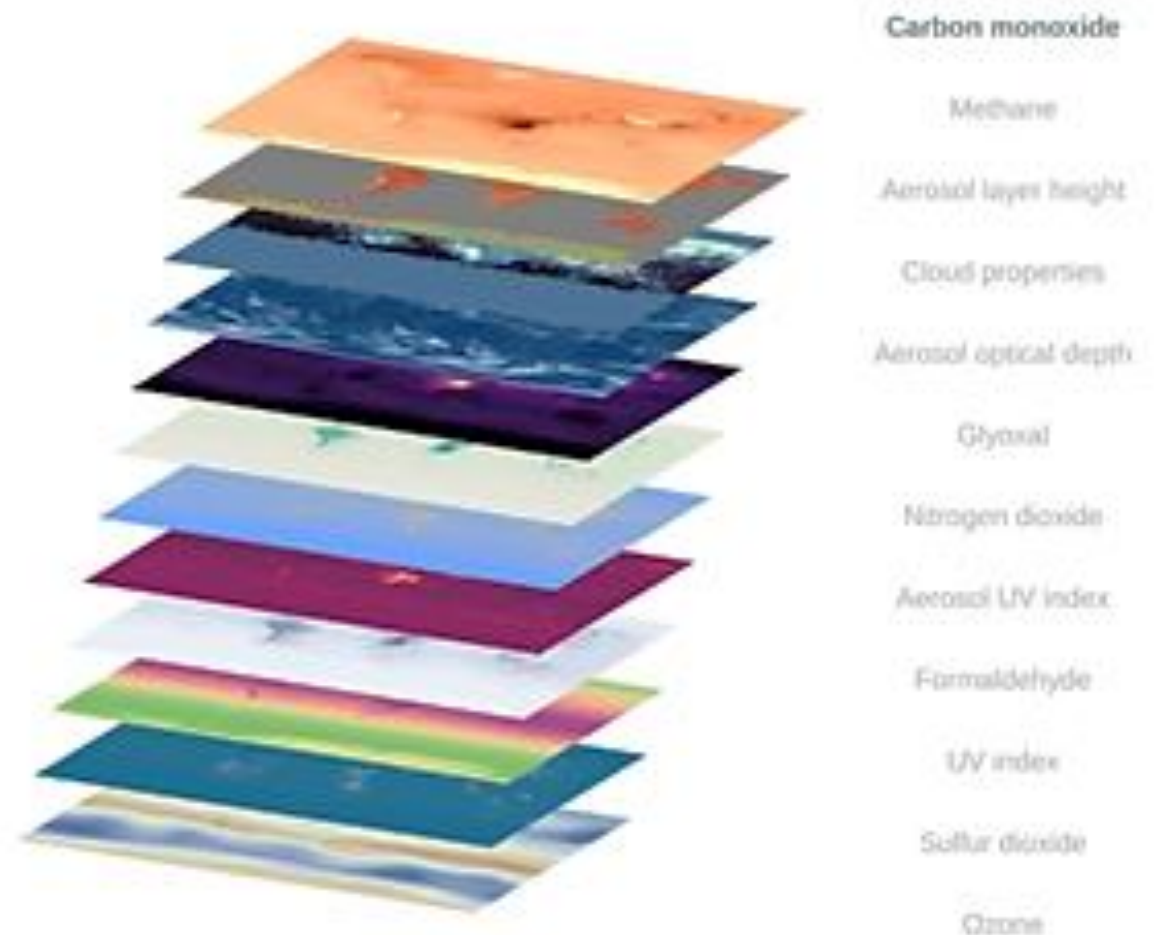
Where we are today: Sentinel-5 UVNS

- Daily snapshot of pollutants and aerosols – including wildfires and volcanic eruptions.
- Measurements will enhance monitoring of emissions and air quality forecasts, as well as support public health and environmental policy.



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**EPS-Sterna secures support
of all member states**

E-AI Data Curation WG “Gap Analysis”

*Lauren Biermann, Roope Tervo and
EUMETNET community contributors*

- GAP ANALYSIS: structured questionnaire to capture information on **data challenges that were preventing or slowing domain experts** from seamless ML-driven workflows.
- Via the E-AI mailing list, a request was sent to **400+** members to participate in a 1-hour interview, during which time I would ask structured questions and complete the questionnaire “in real time”.
- Six months later, I have responses from **18 domain experts** across nowcasting and forecasting (n=10), products and services (n=5) and climate (n=3)... a response rate that reflects the universal scarcity of expert time.

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- ▶ Belgium
- ▶ Czechia
- ▶ Denmark
- ▶ Finland
- ▶ France
- ▶ Germany
- ▶ Ireland
- ▶ Portugal
- ▶ Spain
- ▶ Switzerland
- ▶ United Kingdom
- ▶ IBM, Innoflair

Blocker

■ Substantial

Minor

[illegible]

Destination Earth Framework for Preparing AI-Ready Data (DEFAIR)



Motivation for DEFAIR

- **Preparing EO data for AI/ML** is often complex and time-consuming.
- Datasets differ in **format, structure, projection, and metadata** conventions.
- Multi-source analysis requires **harmonisation** and **data collocation**.
- Large-scale datasets require **scalable processing** methods that can fit into memory.
- Data preparation **workflows** are often difficult to reuse, **integrate** into processing chains, and deploy at scale across different environments.



Destination Earth data lake Framework for preparing AI-Ready Data (DEFAIR)

Key Design Features

Dask Lazy Evaluations

YAML / Python API

Pipeline Definition

Plugin Architecture

Modular

Example pipeline

```
pipeline = (  
    Dataset.from_source(input_mtg, auto_discover_chunks=True)  
    .transform("content_filter", include_vars=["ir_3.8", "wv_7.3"]),  
    .transform("spatial_filter", lat_min=30.0, lat_max=60.0, lon_min=-10.0,  
        lon_max=30.0, drop=True)  
    .transform("reprojection", target="EPSG:4326", resolution=0.1,  
        resampling="bilinear", drop=True)  
)
```

Key Components

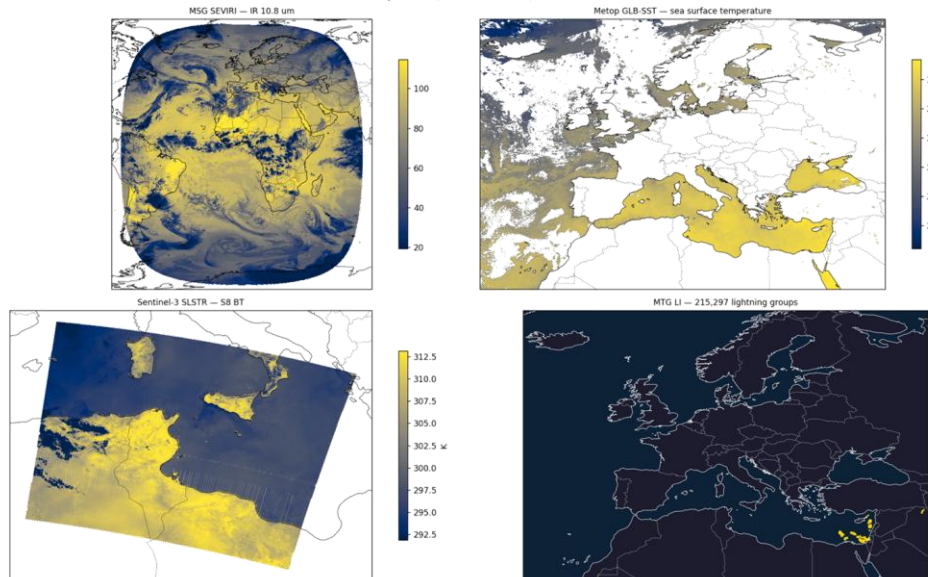
DEFAIR provides a unified API for reading EUMETSAT satellite data from DestinE Data Portfolio, from different data origins and applying operations to generate AI-Ready data cubes, which can be exported to variety of output formats.

Data Sources	Data Products & Formats	Operations	Output Formats
❑ Local Network File Systems ❑ S3 Object Storage ❑ DEDL Harmonised Data Access API (STAC-compliant)	❑ Operational feed & reprocessed data ❑ MSG SEVIRI ❑ MTG FCI & LI ❑ METOP ❑ Sentinel-3	❑ Content filtering ❑ Temporal filtering ❑ Spatial filtering ❑ Reprojection (WGS84, HEALPix, Lambert, ...) ❑ Collocation & Alignment (under testing)	❑ NetCDF ❑ Zarr V2 & V3 ❑ GeoTIFF ❑ PNG ❑ JPEG ❑ ...

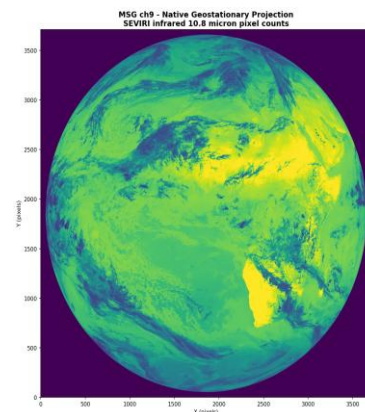


DEFAIR Processing Tool - Capabilities

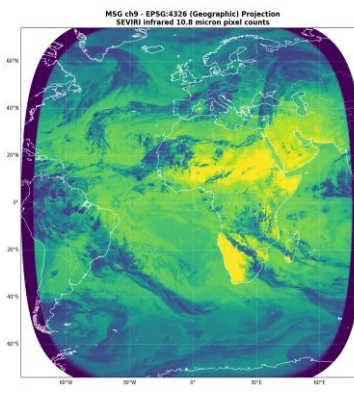
Four products, four structures, one API



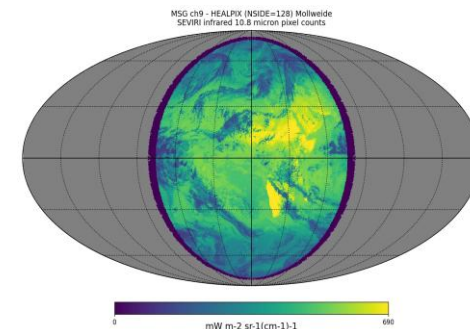
Reprojections



Native Geostationary

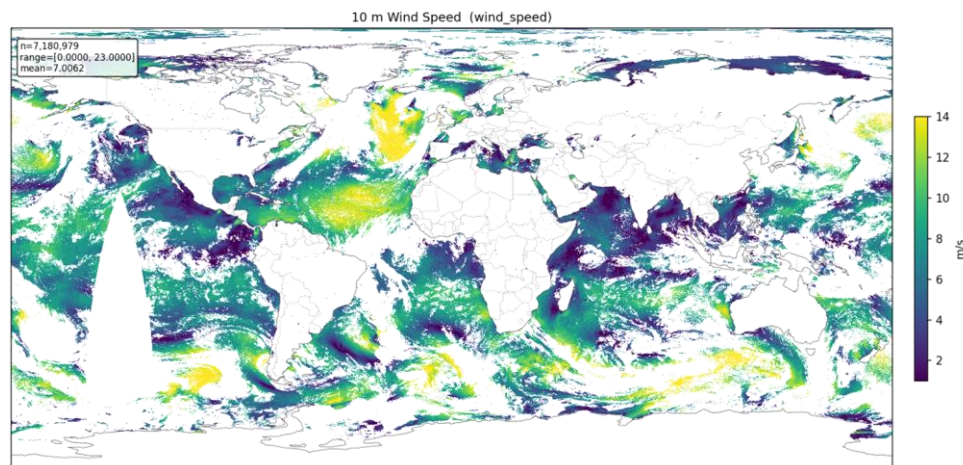


EPSG:4326 Geographic

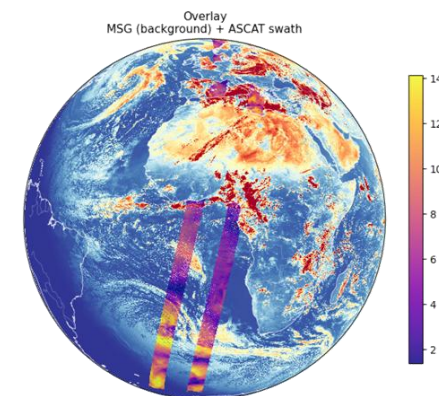
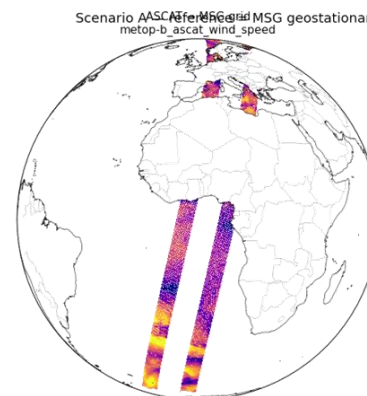
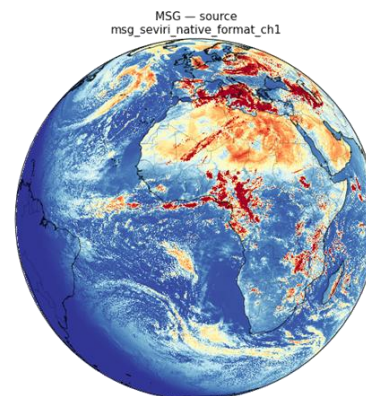


HEALPix (Equal Area)

50+ Readers



Collocation Plugin



Extraordinary datasets: CDRs

- EUMETSAT and our SAFs generate Climate Data Records from past and current satellite data.
- State-of-art data processors ensure the data coming from different sources form a coherent series.
- Equivalent to Level-3 data.

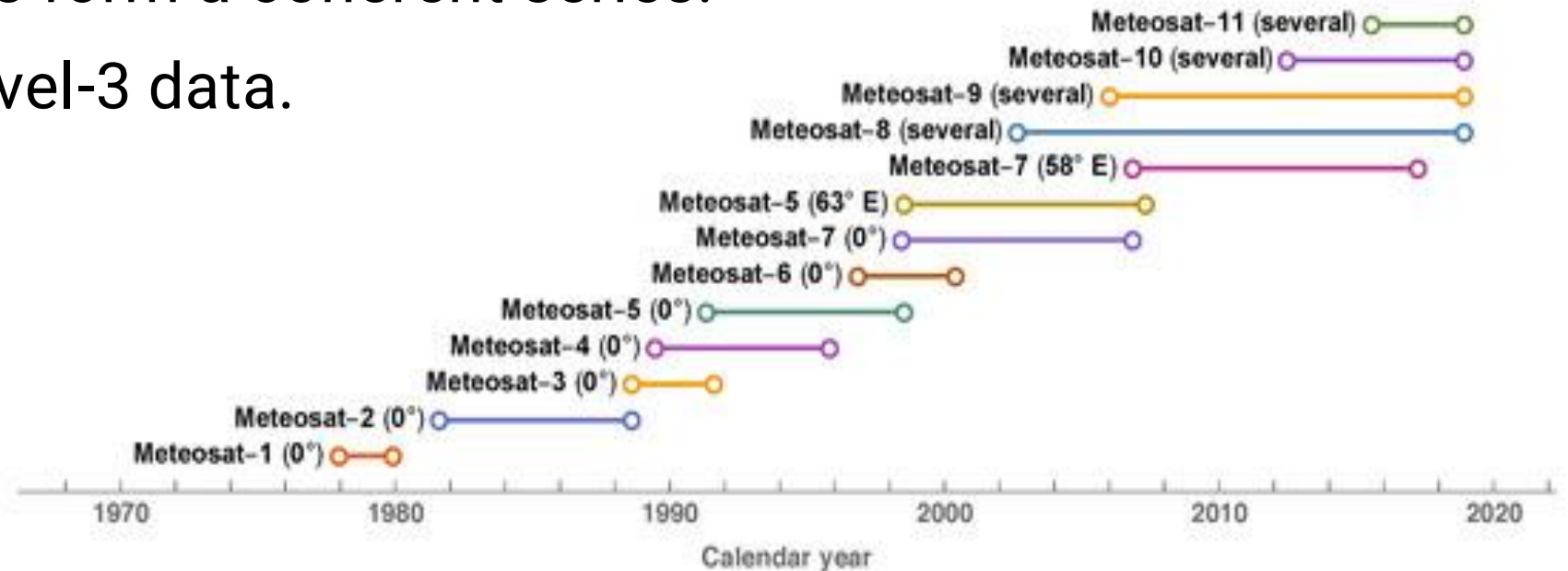


Fig. from Quast et al. (2019). Climate Data Records from Meteosat First Generation Part II: **Retrieval of the In-Flight Visible Spectral Response.**

Extraordinary datasets: CDRs

LEO	IASI	Ozone (O3)	Metop-A and B	2007 - 2023
LEO	IASI	All Sky Temperature and Humidity Profiles	Metop-A and B	2007 - 2023
LEO	IASI	Sulphur Dioxide (SO2)	Metop-A and B	2007 - 2023
LEO	IASI	Carbon Monoxide FORLI-CO	Metop-A and B	2007 - 2023
LEO	AVHRR	CLARA-A3 cLoud, Albedo, surface RAdiation	Metop + NOAA	1979 - 2020
LEO	SSMIS	Global Sea Ice Concentration	Metop + NOAA	2023 - 2026
GEO	SEVIRI	Cloud Properties	MSG	2004 - 2019
GEO	GEOring	GIRAFE Global Interpolated RAinFall	Multi	2002 - 2022
GEO	MVIRI + SEVIRI	SARAH Surface Radiation DataSet Heliosat	MSG + MFG	1983 - 2020
GEO	SEVIRI	Atmospheric Motion Vectors	MSG	2008 - 2020



EUMETSAT network of satellite application facilities (SAFs)

www.eumetsat.int

EUMETSAT SAFs are dedicated centres of excellence for EO data processing, making use of specialist expertise in our member states.

EUMETSAT's SAFs provide operational data and software products, each one for a dedicated user community and application area.

EUMETSAT OSISAF
Ocean and Sea Ice (OSISAF)
led by Météo France, France

EUMETSAT LSA SAF
Land Surface Analysis (LSA SAF)
led by Instituto Português do Mar e da Atmosfera, Portugal

EUMETSAT ROM SAF
Radio Occultation Meteorology (ROM SAF)
led by the Meteorologiske Institut, Denmark

EUMETSAT NWP SAF
Numerical Weather Prediction (NWP SAF)
led by the Met Office, United Kingdom

EUMETSAT NWCSAF
Nowcasting and Very Short-Range Forecasting (NWCSAF)
led by Agencia Estatal de Meteorología, Spain

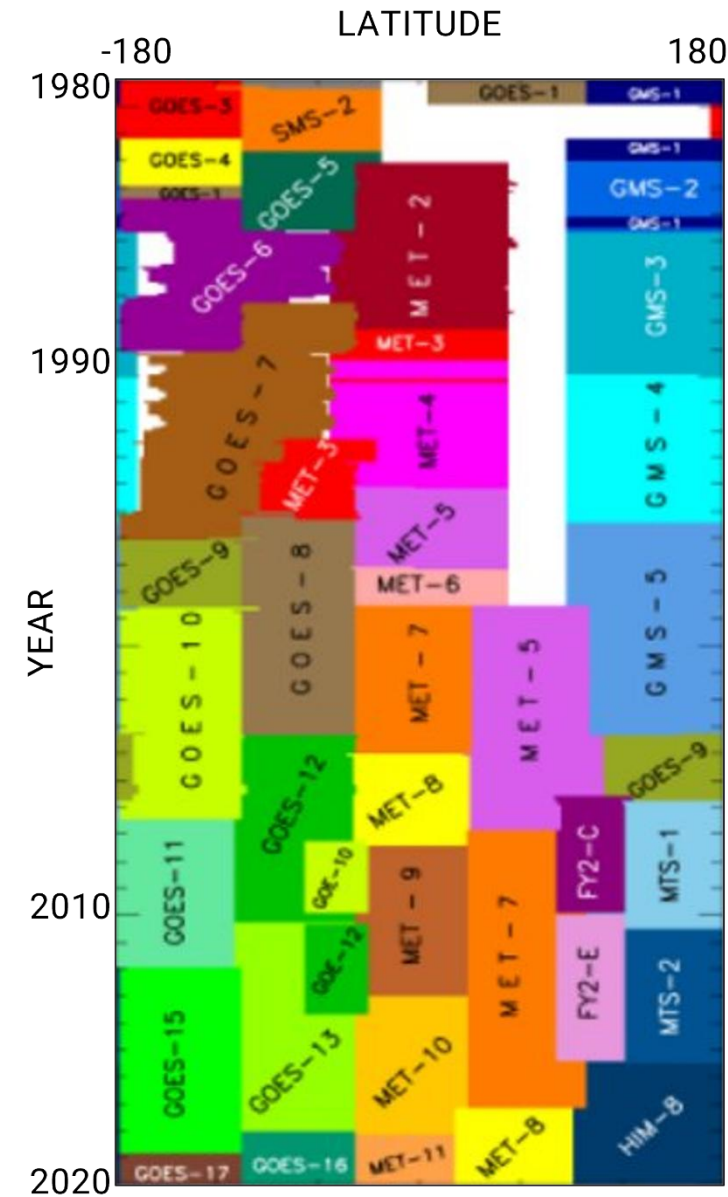
EUMETSAT CMSAF
Climate Monitoring (CMSAF)
led by Deutscher Wetterdienst, Germany

EUMETSAT ACSAF
Atmospheric Composition Monitoring (AC SAF)
led by the Ilmatieteen laitos, Finland

EUMETSAT H SAF
Operational Hydrology and Water Management (H SAF)
led by Servizio Meteorologico Aeronautica Militare, Italy

Extraordinary datasets: GEO-Ring

- 1983: Int. Satellite Cloud Climatology Project (ISCCP) pioneered use of the GEO-Ring by combining all GEOstat data.
- We are currently working to produce GEO-Ring CDRs by addressing consistent quality control and recalibration.
- Basis for gridded level-1 data record (L1g) composed of radiance measurements.



Extra-ordinary datasets: GeoRing

Data Rescue



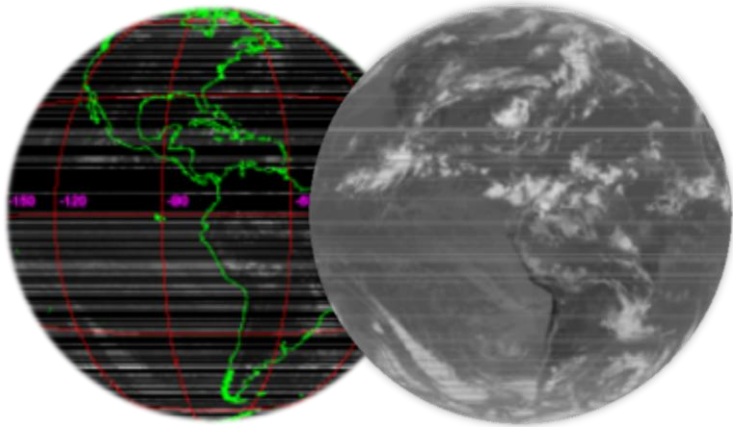
Quality
Control



Recalibration
Cross-Calibration



Validation
Evaluation

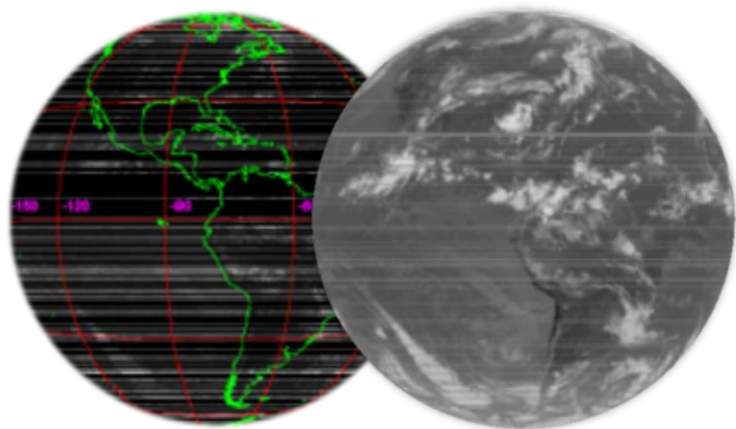


NOAA CLASS
GOES-5 IR
17.08.1981

SSEC reprocessed
GOES-5 IR
17.08.1981

Extra-ordinary datasets: GeoRing

Data Rescue



NOAA CLASS
GOES-5 IR
17.08.1981

SSEC reprocessed
GOES-5 IR
17.08.1981

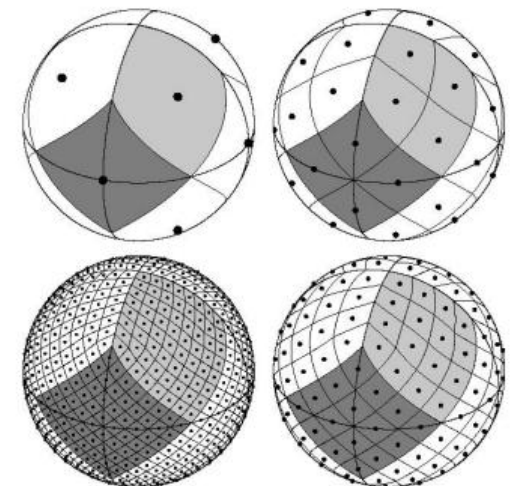
→ Quality
Control

→ Recalibration
Cross-Calibration

→ Validation
Evaluation

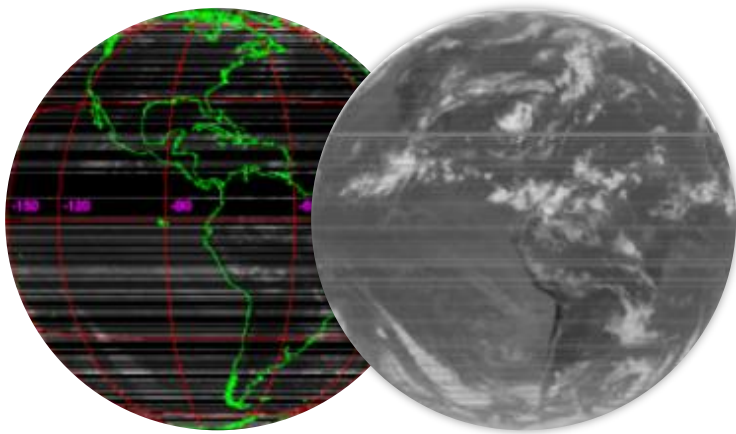


Product
Generation



Extra-ordinary datasets: GeoRing

Data Rescue



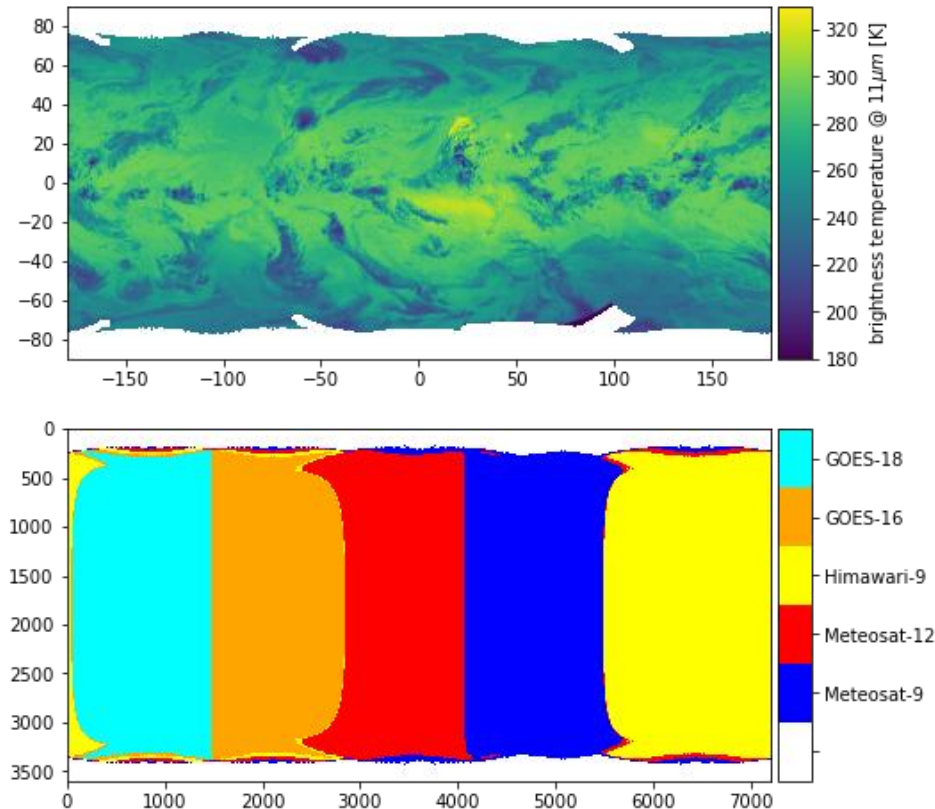
NOAA CLASS
GOES-5 IR
17.08.1981

SSEC reprocessed
GOES-5 IR
17.08.1981

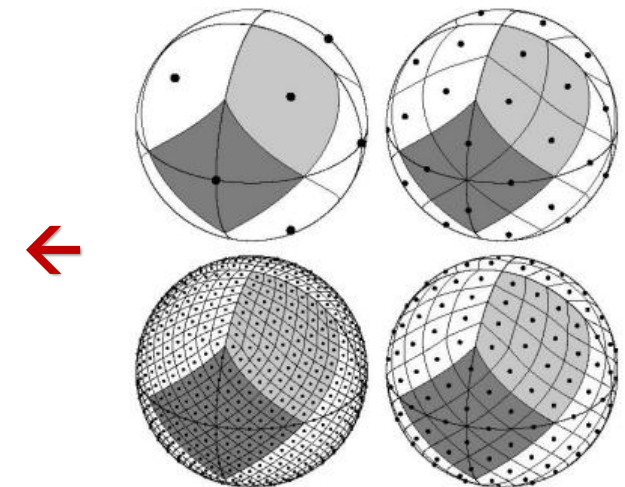
→ Quality
Control

→ Recalibration
Cross-Calibration

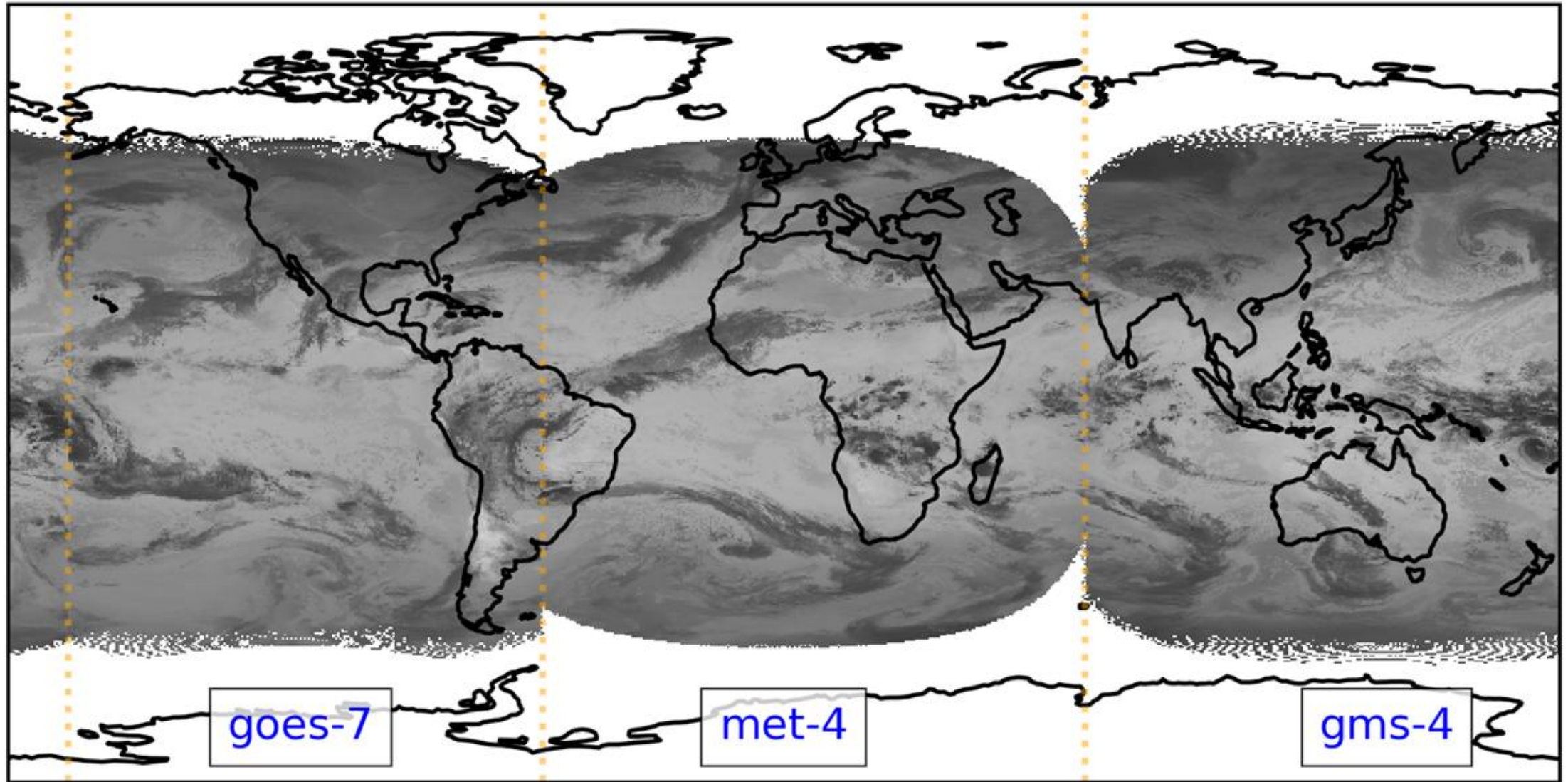
→ Validation
Evaluation



Product
Generation

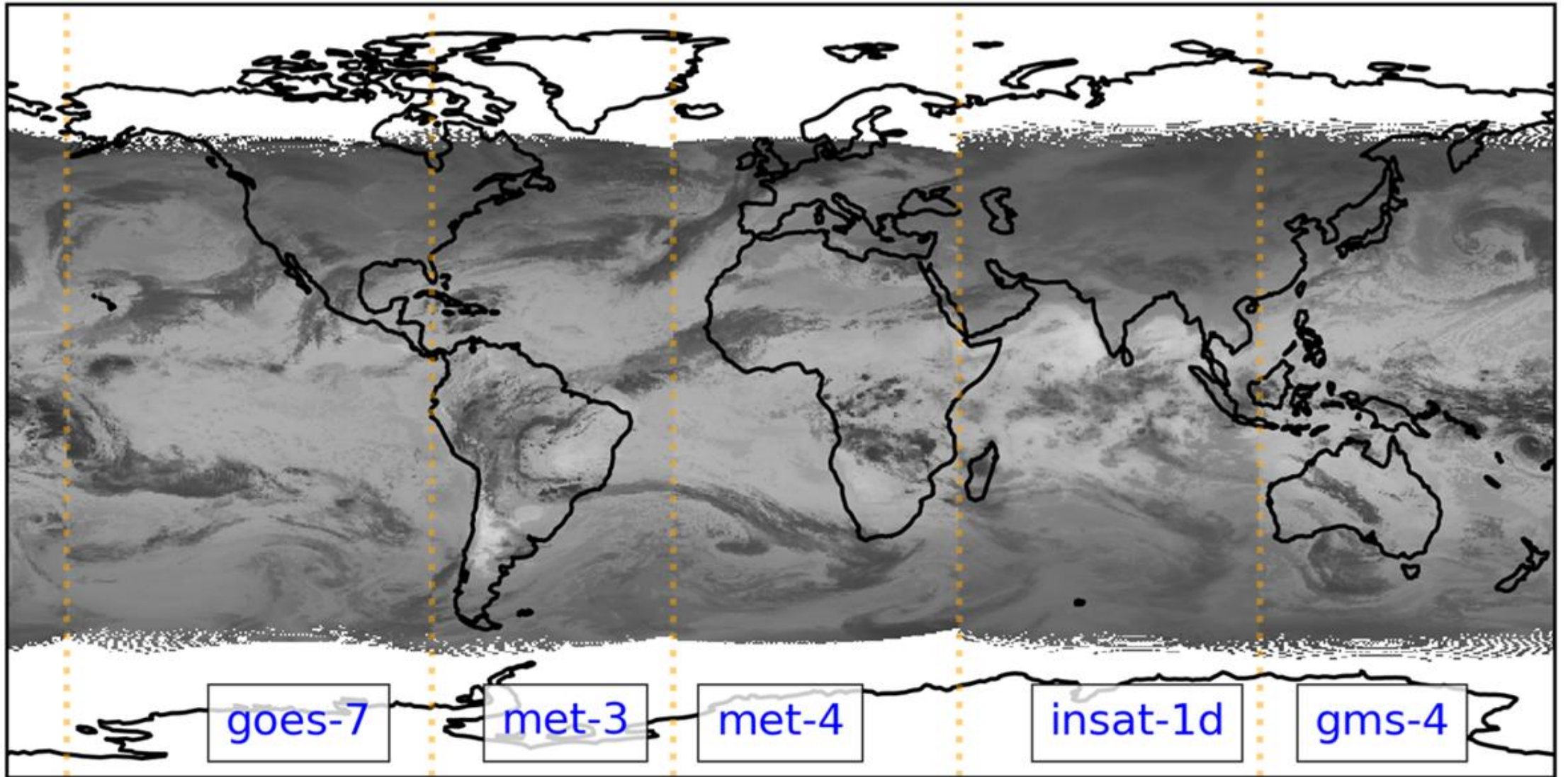


Classical Geostationary Coverage



1993-01-01T18:00

Enhanced Geostationary Coverage

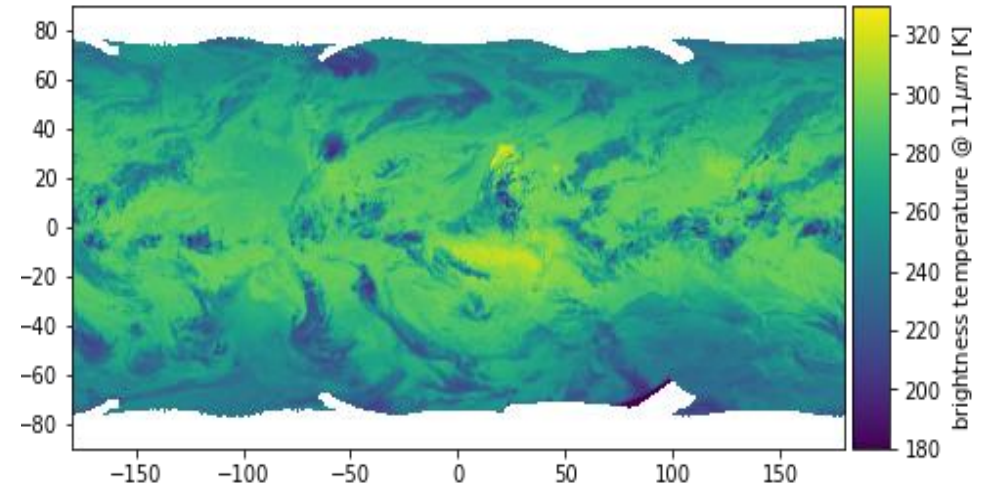


1993-01-01T18:00

Extraordinary datasets: L1 GEO-Ring

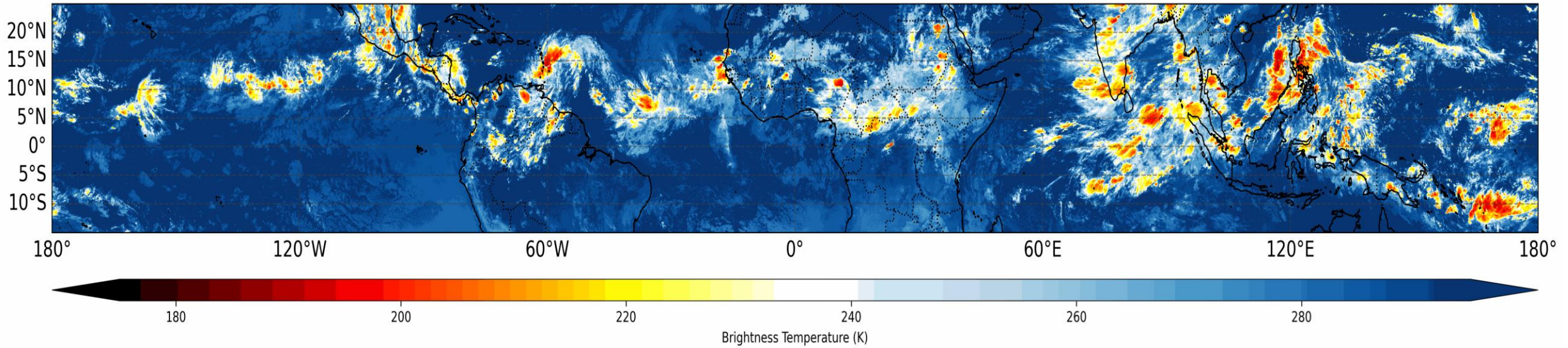
Static test data set is available.

- ▶ 6 years: 2019 – 2024
- ▶ All channels: ABI, AHI and SEVIRI
- ▶ 5 km²/ 0.05° 30-minute sampling
- ▶ Equal area HEALPix grid in NetCDF and Zarr, and equal angle grid in NetCDF.
- ▶ EWC and EUMETSAT Data Store distribution, NOAA cloud is expected as well.
- ▶ Use of data is free of charge, but redistribution isn't permitted.

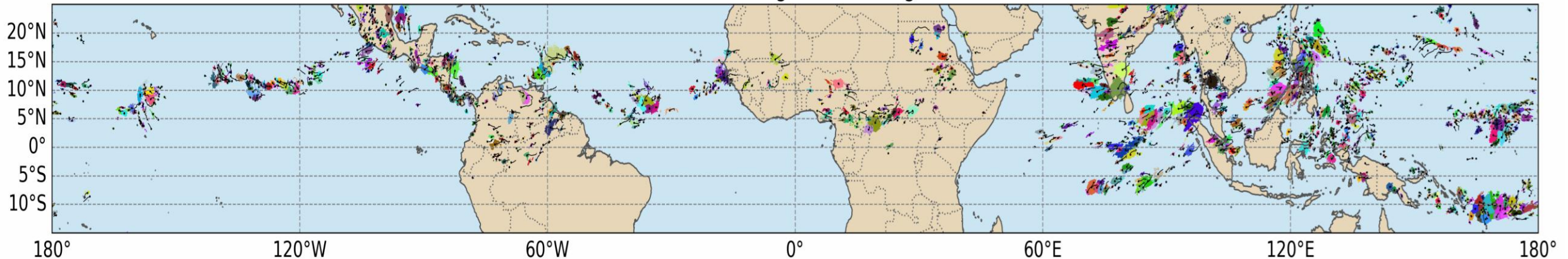


Extra-ordinary datasets: MCS climatology

ISCCP-NG L1G 0.05°/30min



TOOCAN Segmented Image



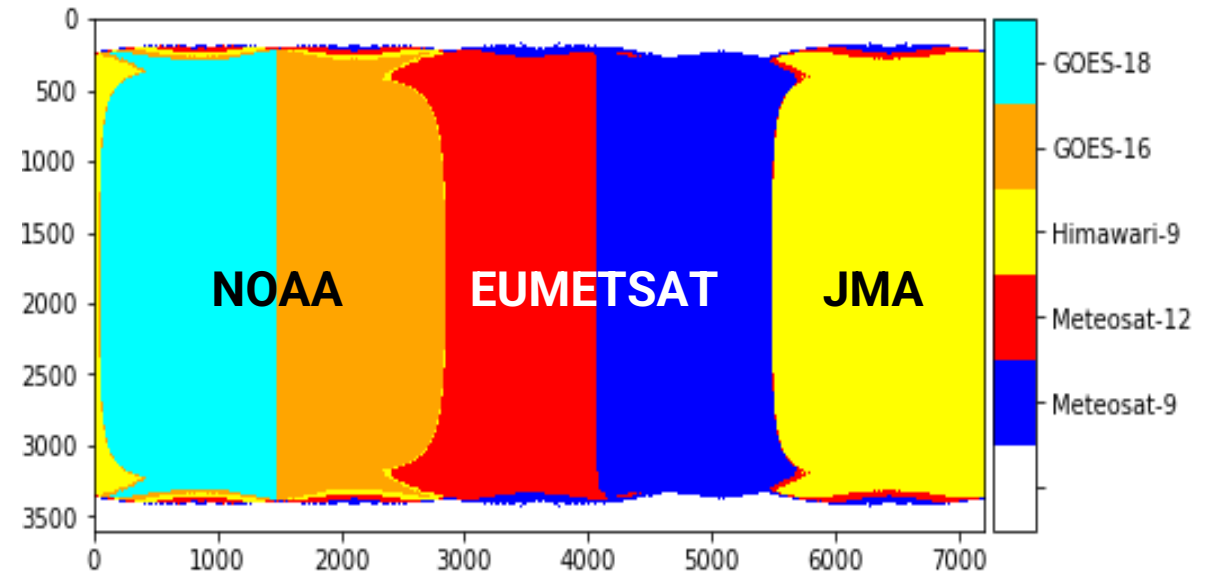
2020-07-29 00:00:00

T. Fiolleau, R.Roca, L. Gouttesoulard, LEGOS/CNRS, Toulouse, France

Extra-ordinary datasets: L1 GEO-Ring

Looking ahead:

- ▶ Full L1g product spanning 1981-2026 planned for late 2027.
- ▶ Low latency delivery planned for ICDR (~5 day)
- ▶ Requests for NRT have also been received; this is under consideration.



Feature•Space

Collaborative Feature Labelling
Platform for ML Applications



EUMETSAT FeatureSpace for Collaborative Labelling

Darmstadt

25 - 27 March 2026

As part of Machine learning (ML) activities for detection and forecasting of extreme events, EUMETSAT is committed to support its member states by providing data, tools, and community platforms. This includes the development of the Joint Working Environment for Feature Identification in the European Weather Cloud, including a Collaborative Label Space for global atmospheric and Earth surface feature tracking.

This in-person training workshop will take place 25-27 March 2026, and will be hosted by EUMETSAT at the headquarters in Darmstadt. After a general introduction to the Joint Working Environment, two sessions will run in parallel — one for developers, the other for labelers.

The event aims to bring together researchers, developers, and stakeholders from the domains of climate and weather from EUMETSAT member states. Preference will be given to national meteorological services, but all meteorological organisations may nominate participants. Researchers from marine, terrestrial, and atmosphere domains are also welcome.

Workshop

VI Europe

English

Target Audience

Primary: Researchers, developers, and stakeholders from the domains of climate and weather from EUMETSAT member states. Secondary: Researchers from marine, terrestrial, and atmosphere domains.

Hosted by

EUMETSAT

Contact

EUMETSAT

FeatureSpace for Collaborative Labelling

Darmstadt

25 - 27 March 2026

Expected Learning Outcomes

- Leverage the European Weather Cloud for Earth Observation data preparation using S3 buckets.
- Navigate and use tools on the **LabelStudio** platform, including SAM2.
- Accurately label key features in the prepared Earth Observation data.
- Export Feature labels for downstream ML model development on the European Weather Cloud.



Germany



Bulgaria



Norway



Romania



Spain



Italy



Denmark



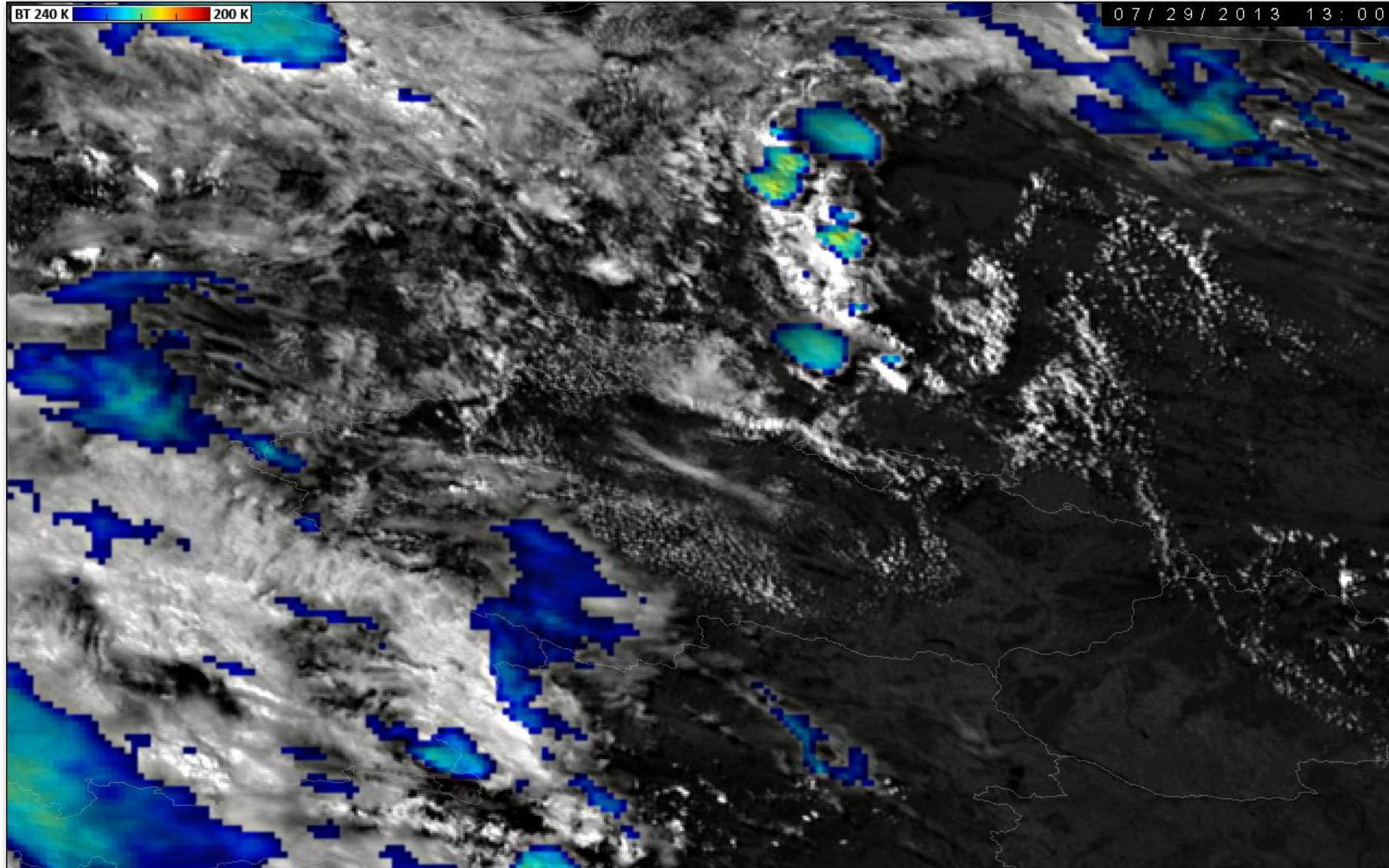
Czechia



Croatia

EUMETSAT

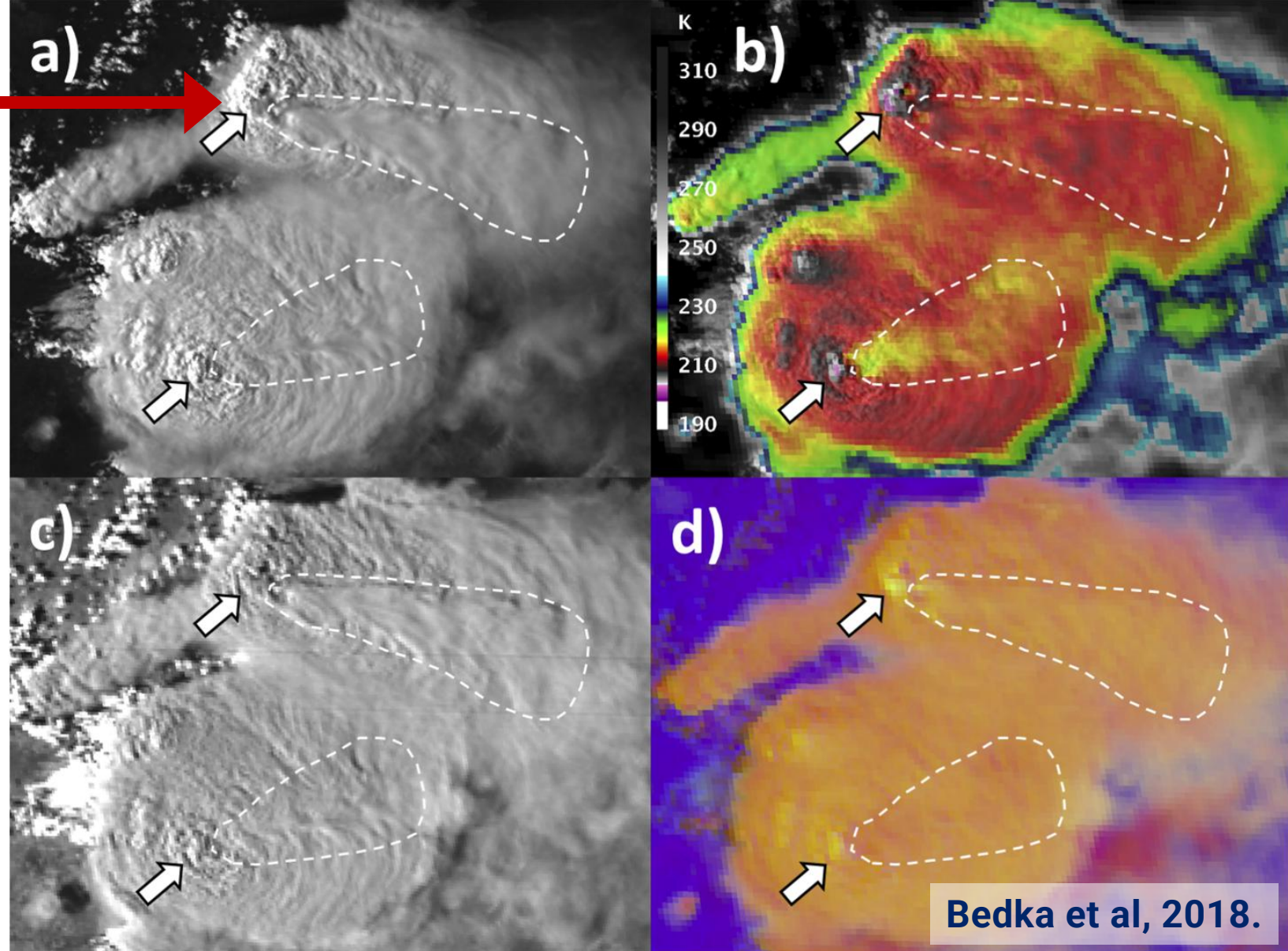
FeatureSpace for Collaborative Labelling

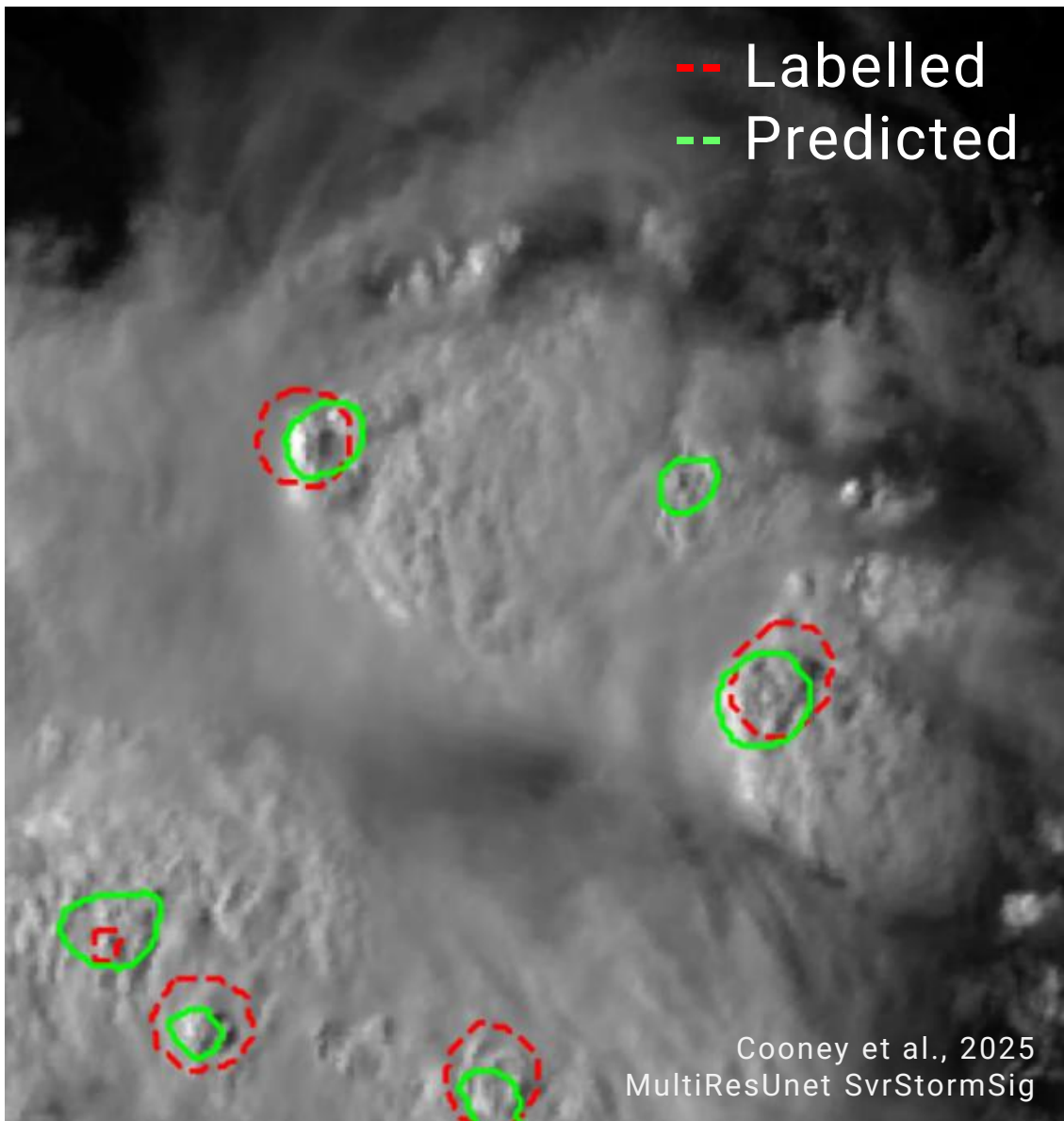


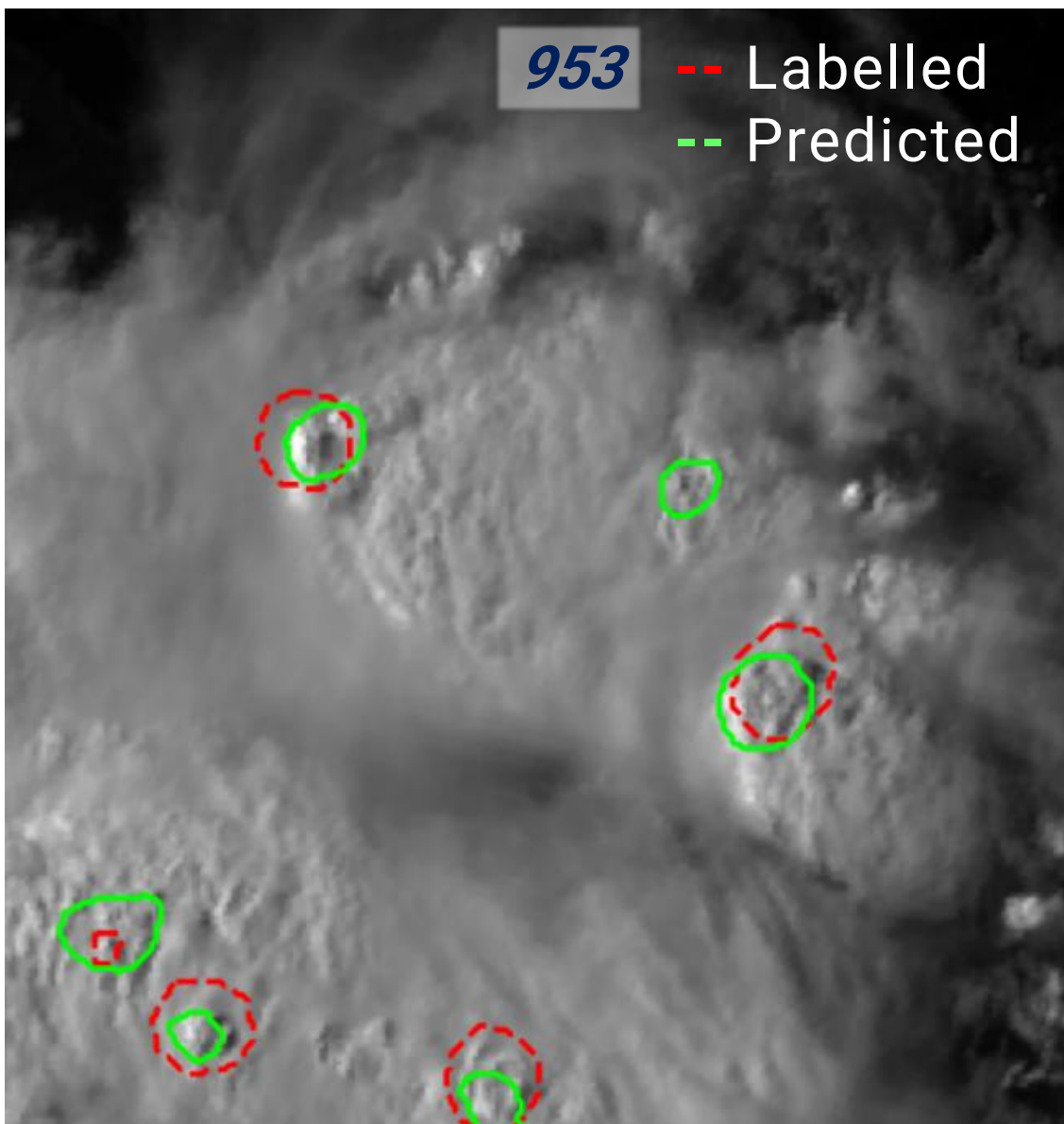
This storm produced hail
over 18 cm in diameter...



Photo by Victoria Druetta, Argentina,
08.02.2018







1. Access to long time series of expert-labelled features, together with the tools to explore them, adds value across weather and climate research domains.
2. These are high-quality training data for ML; supporting more accurate warning generation, improved medium-range forecasting, refined climate research, and robust evaluation of different model outputs.
3. Expert labelling of features in freely available EO data should be collaborative where possible.

- It is not up to EUMETSAT to decide which features are ‘important’
 - if a member user has flagged a feature as valuable, it’s valuable.
- Through Label Studio, the EWC Feature Space provides **data**, **platform**, and **tools** by which users can label their priority features [*and pull into models*].
- EWC Research & Development calls →

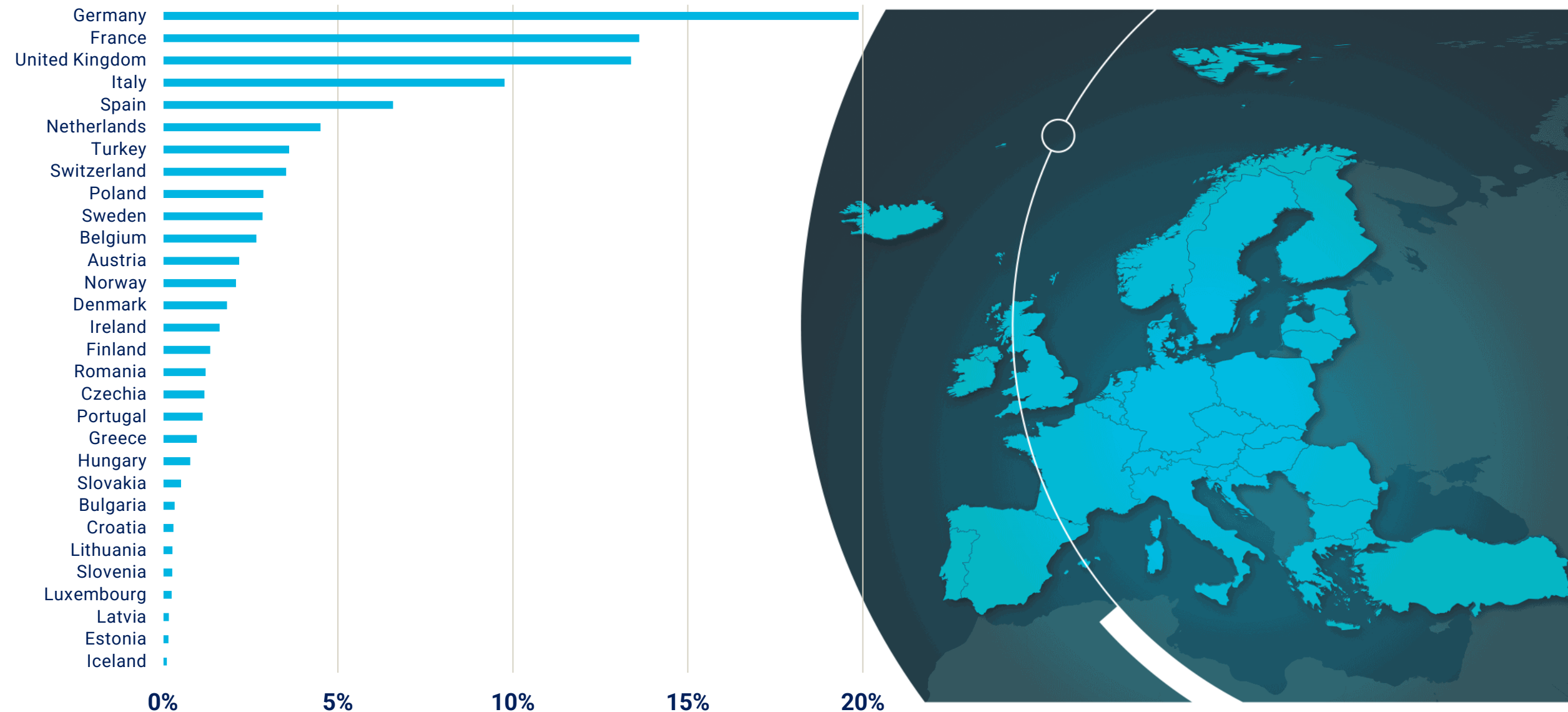




Member States Contributions to EUMETSAT

www.eumetsat.int

Scale of Contributions 2024-2026





Thank you!
Questions are welcome.