



Training event “Climate change and air quality: challenges and objectives for the atmospheric research.”

Long term archiving and harmonization: CCI

Thomas Popp –

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IR0000032 – ITINERIS, Italian Integrated Environmental Research Infrastructures System
(D.D. n. 130/2022 - CUP B53C22002150006) Funded by EU - Next Generation EU PNRR-
Mission 4 “Education and Research” - Component 2: “From research to business” - Investment
3.1: “Fund for the realisation of an integrated system of research and innovation infrastructures”



German Aerospace Center - DLR
German Remote Sensing Data Center – DFD
Department Atmosphere / Group „Aerosol and Radiation“

Thomas Popp

ESA Climate Change Initiative (CCI) Science Leader Aerosol_cci



Copernicus Climate Change Initiative (C3S): PI Atmospheric Composition



Knowledge for Tomorrow



climate change initiative

→ **AEROSOL**

Algorithm development, benchmarking, user case studies



aerosol
cci

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Atmospheric Composition ECVs



Climate Change

Greenhouse gases

Ozone

Aerosol properties

An operational service



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A question to start with ...

To monitor climate change:

Which measurements do we need?

Essential Climate Variables

An **Essential Climate Variable (ECV)** is a physical, chemical or biological variable or a group of linked variables that critically contributes to the **characterization of Earth's climate**. GCOS currently specifies [55 ECVs](#).

ECV datasets provide the **empirical evidence** needed to **understand** and **predict** the evolution of climate, to guide **mitigation** and **adaptation** measures, to assess **risks** and enable **attribution** of climate events to underlying causes, and to underpin climate services. They are required to support the work of the **UNFCCC** and the **IPCC**.

ECV are identified based on the following criteria:

- **Relevance:** The variable is critical for characterizing the climate system and its changes.
- **Feasibility:** Observing or deriving the variable on a global scale is technically feasible using proven, scientifically understood methods.
- **Cost effectiveness:** Generating and archiving data on the variable is affordable, mainly relying on coordinated observing systems using proven technology, taking advantage where possible of historical datasets.

ECV Observation Requirements

- ... are defined by **application** and are **independent from measurements**
- Different measurement types offer **complementary capabilities**

GCOS Global Climate Observing System



Global Climate Observing System (GCOS)

Upper-air Atmosphere



Surface Atmosphere



Atmospheric Composition



Cryosphere



Anthroposphere



Surface Ocean Physics



Biosphere



Ocean Biology / Ecosystems



Ocean Biogeochemistry



Subsurface Ocean Physics

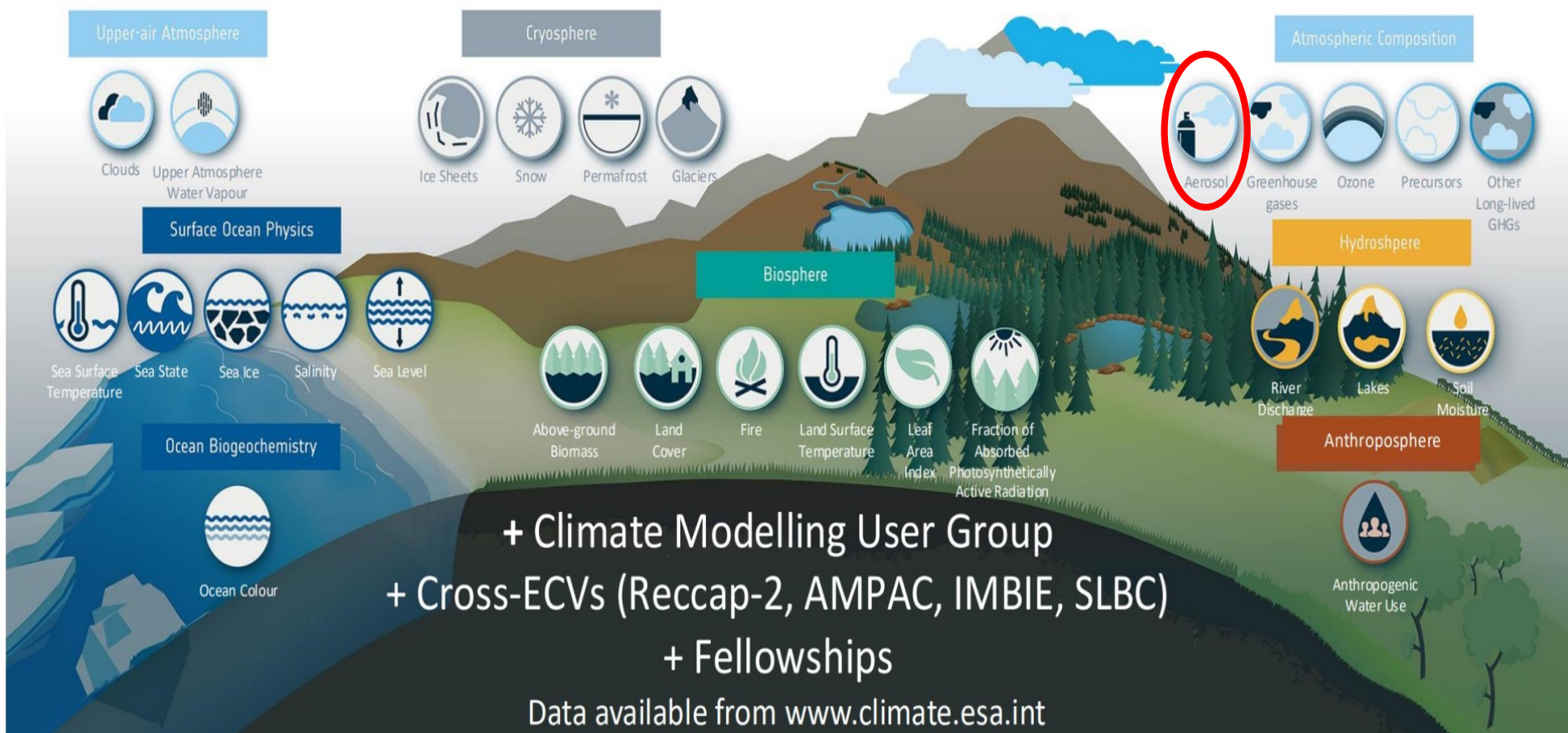


Hydrosphere



ESA's CLIMATE CHANGE INITIATIVE

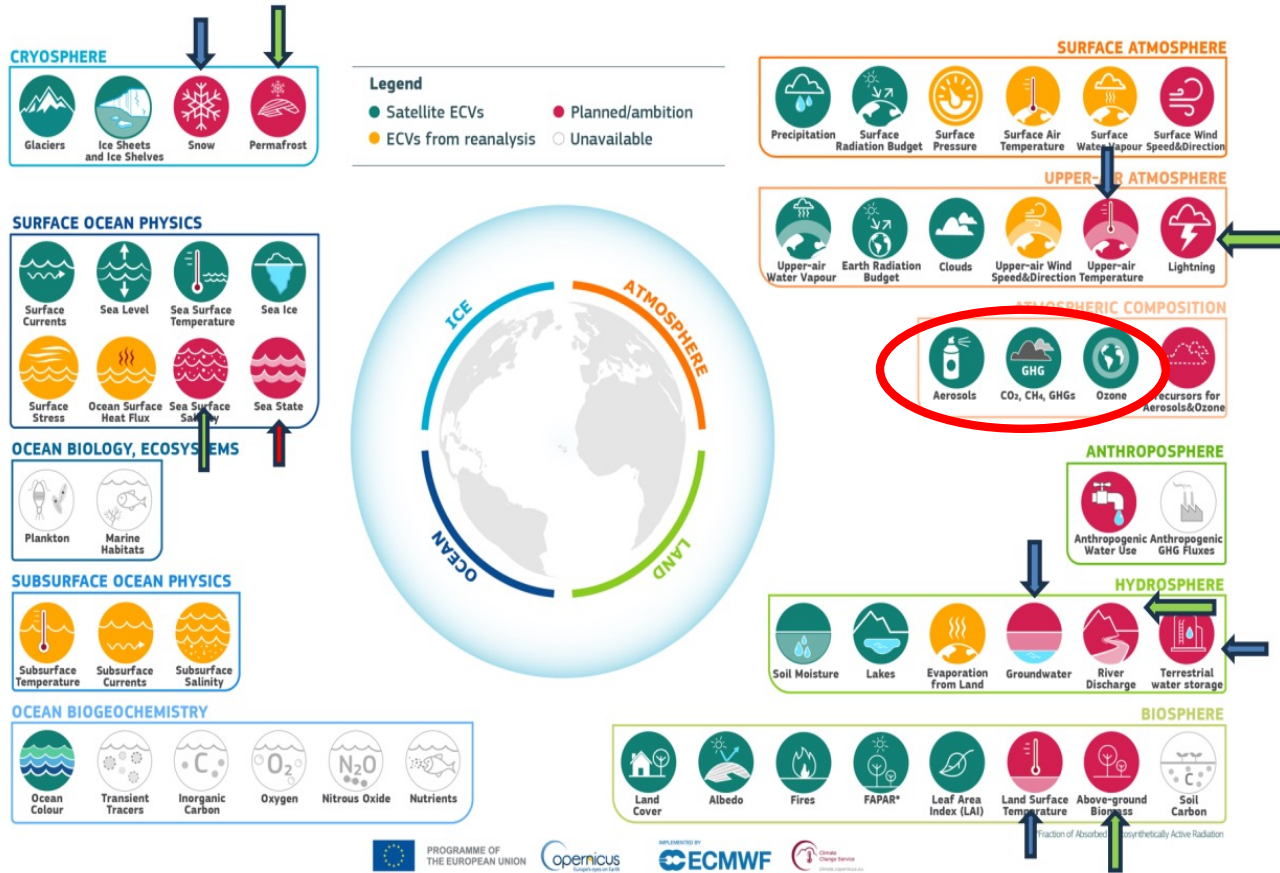
GCOS defined **55** Essential Climate Variables | **36** benefit from space observations | **27** generated by ESA Climate Change Initiative



Copernicus Climate Change Service C3S



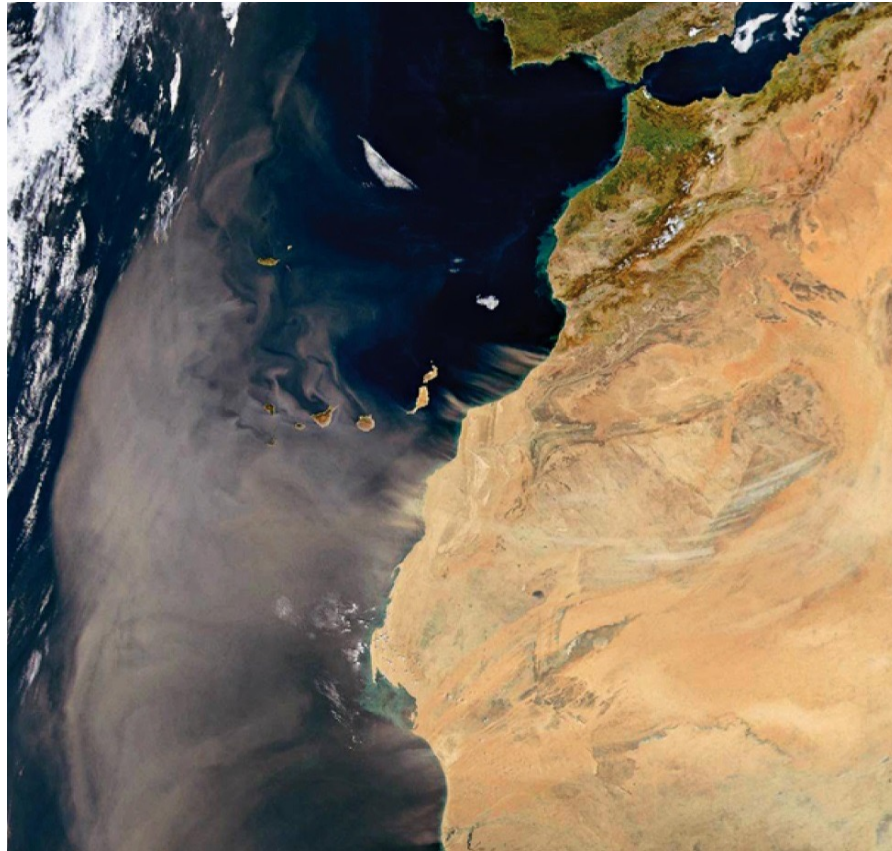
ECV programme – status & evolution



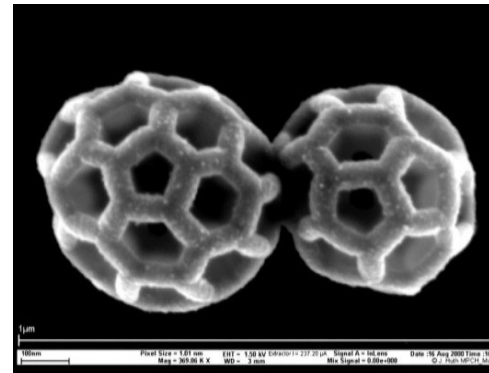
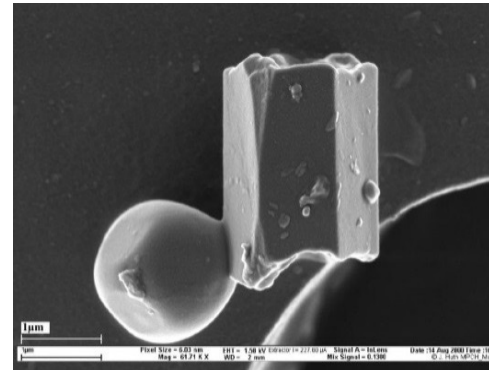
- New ECVs in C3S2-phase II
- Requested ECVs in C3S2-phase II
- Potential additional ECVs from 2025

Atmospheric aerosols: A zoo of tiny particles

... visible from space



... example images

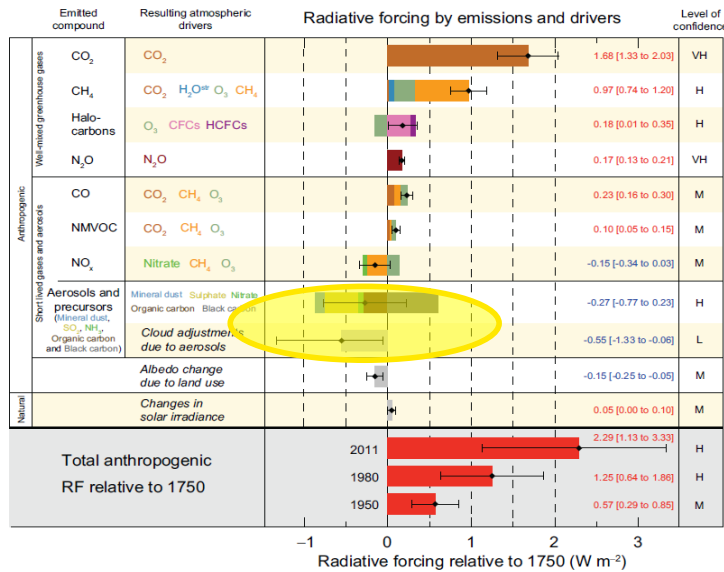


... different sources

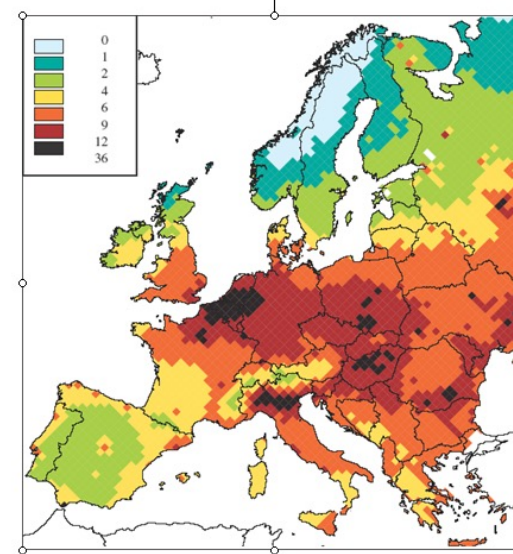


Tiny particles in the atmosphere are relevant

... IPCC forcing

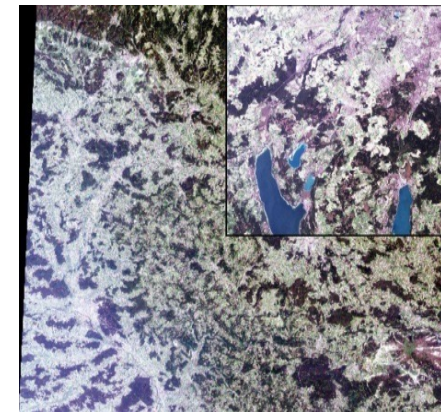
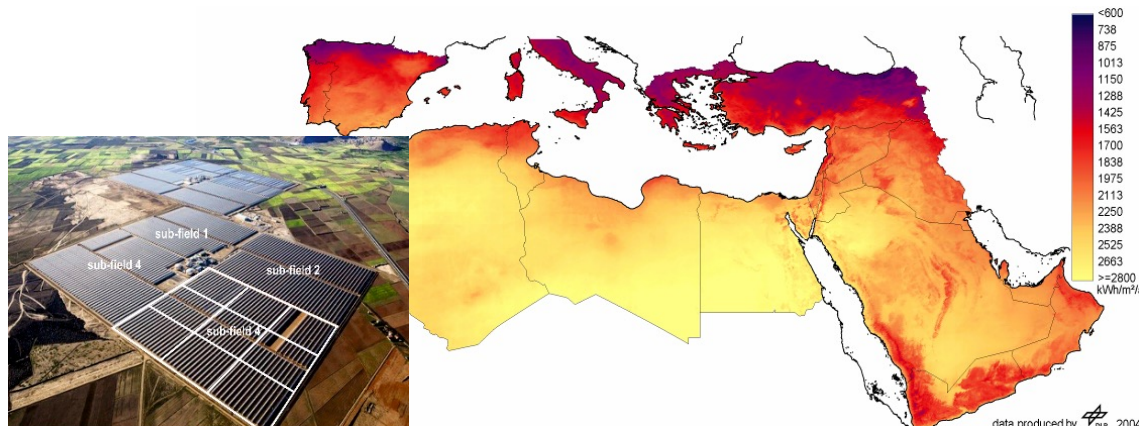


... air quality

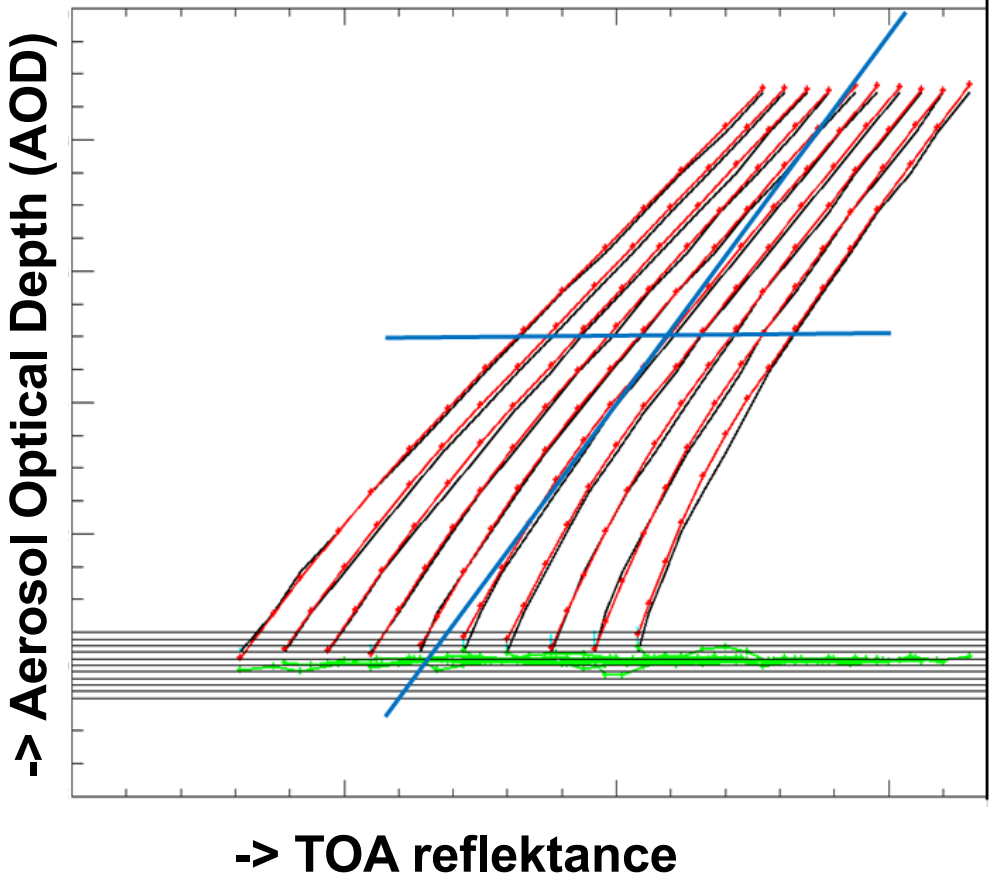
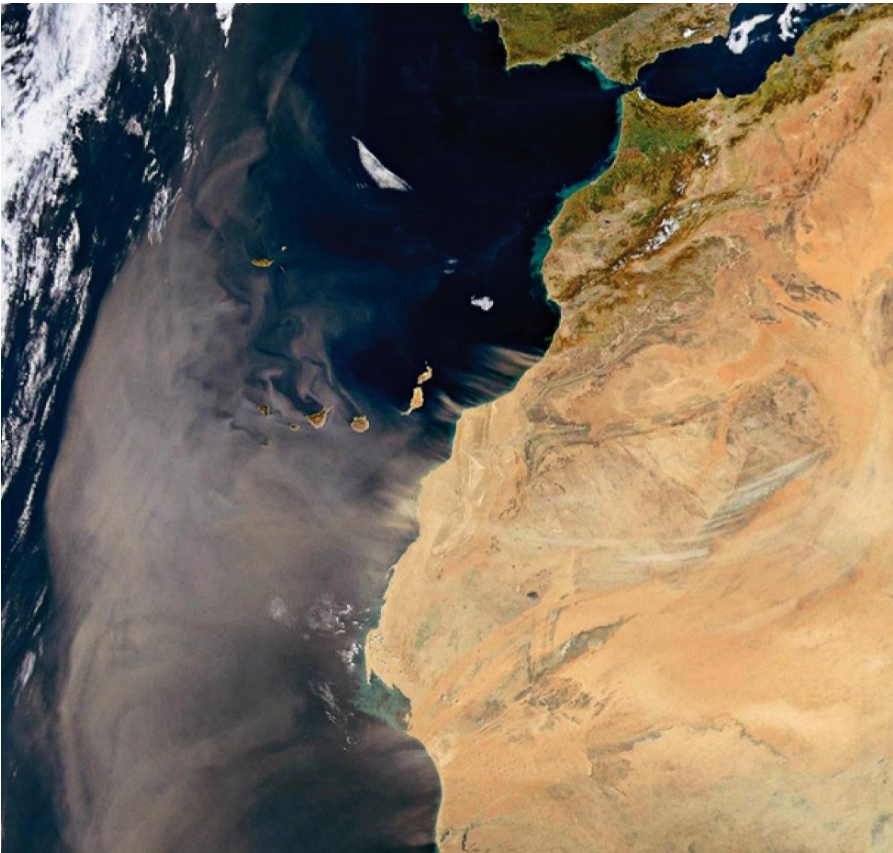


... solar energy

... atmospheric correction



Aerosol inversion – principle



A question on data portals ...

To access climate data:

Which user wishes do you have?



Long-term archiving

- ESA CCI
 - Algorithm development, benchmarking, initial CDR processing
 - started 2010 with initial 10 ECV projects
 - analysis of de-central vs central archiving concept
 - CCI portal as common platform (+ toolbox)
 - <https://climate.esa.int/en/data/#/dashboard>
- Copernicus Climate Change Service
 - started in 2016 (proof of concept phase)
 - transfer of operational tasks for mature CCI ECVs from 2018
 - Climate Data Store + jupyter notebooks
 - <https://cds.climate.copernicus.eu#!/home>
 - Observations (Satellite ECVs, in-situ)
 - Reanalysis
 - Predictions and projections



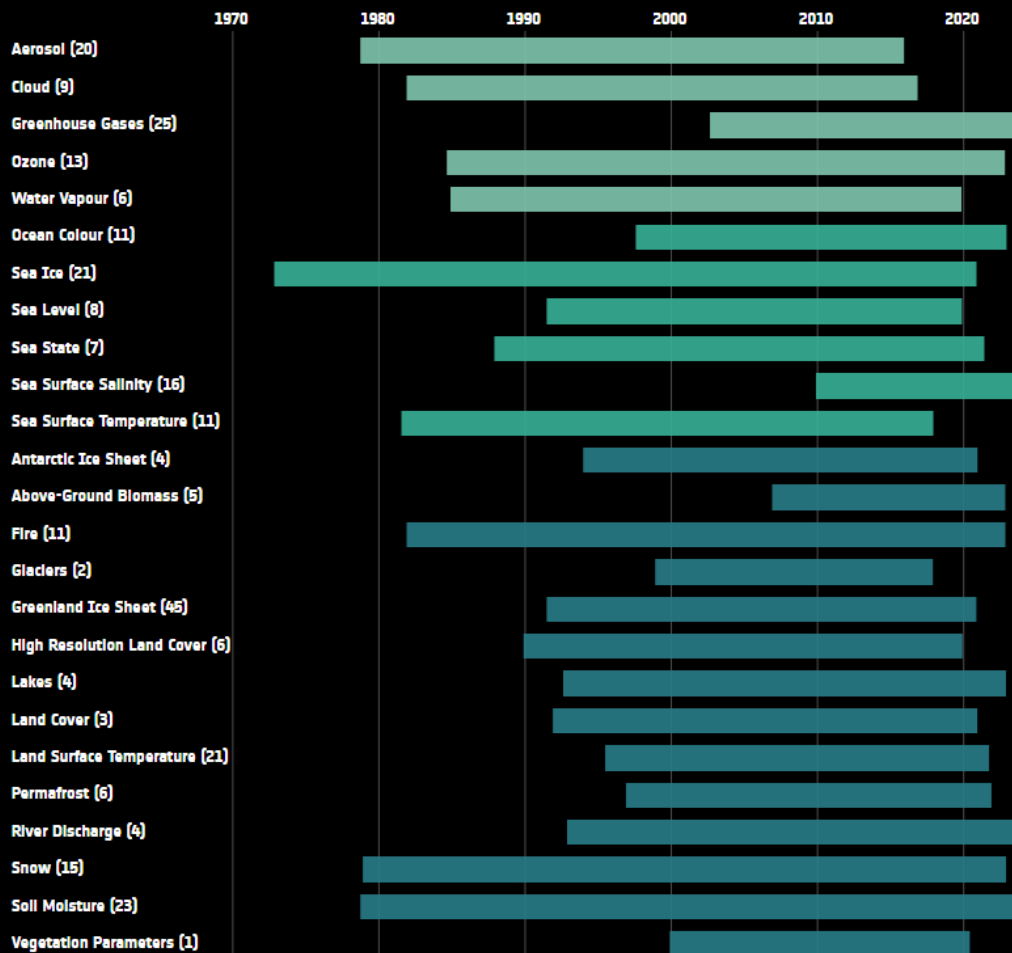


DATA

The climate record

Get free and open access to all Essential Climate Variable data products developed by the ESA Climate Change Initiative.

Source: C3S —



Get data

Climate Data Store

Aerosol properties gridded data from 1995 to present derived from satellite observations

Overview

Download

Quality

Documentation

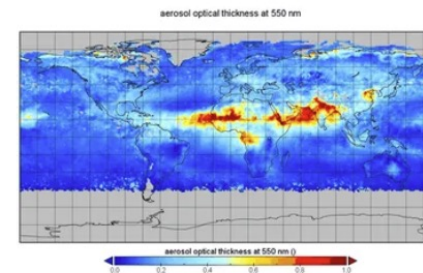
Info

1 Apr 2022

GOMOS on ENVISAT version 5.00 data have been deprecated. Consult Known Issues in the Documentation tab.

This data set provides observational records of aerosol properties obtained from observations collected by various satellite instruments. Aerosols are minor constituents of the atmosphere by mass, but critical components in terms of impact on climate. Aerosols influence the global radiation balance directly by scattering and absorbing radiation, and indirectly through influencing cloud reflectivity, cloud cover and cloud lifetime.

The main variables provided by this dataset are: aerosol optical depth, fine mode aerosol optical depth, dust aerosol optical depth, single scattering albedo, aerosol layer height and aerosol extinction coefficient. These variables are derived from observations from several sensors using a set of different processing techniques. This provides the possibility to derive a large set of complementary aerosol properties needed to describe the complex nature of atmospheric aerosols. Furthermore, different algorithms have their specific strengths and weaknesses, meaning that datasets originating from the same sensor but processed by different algorithms provide a way to evaluate uncertainties (e.g. areas of good or bad agreement between them). Altogether, the aerosol properties dataset is very extensive and offers a choice of complementary options – which is appropriate depends on the intended application.



Quality Assurance

[Data Management](#) ▼

[Data records](#) ▼

[Metadata](#) ▼

[Documentation](#) ▼

References

[Citation and attribution](#)

DOI: [10.24381/cds.239d815c](https://doi.org/10.24381/cds.239d815c)

Licence

[Licence to use Copernicus Products](#)

Publication date

2019-12-11





CCI portal - connect to C3S



DATA

The climate record

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Source: C3S ✓



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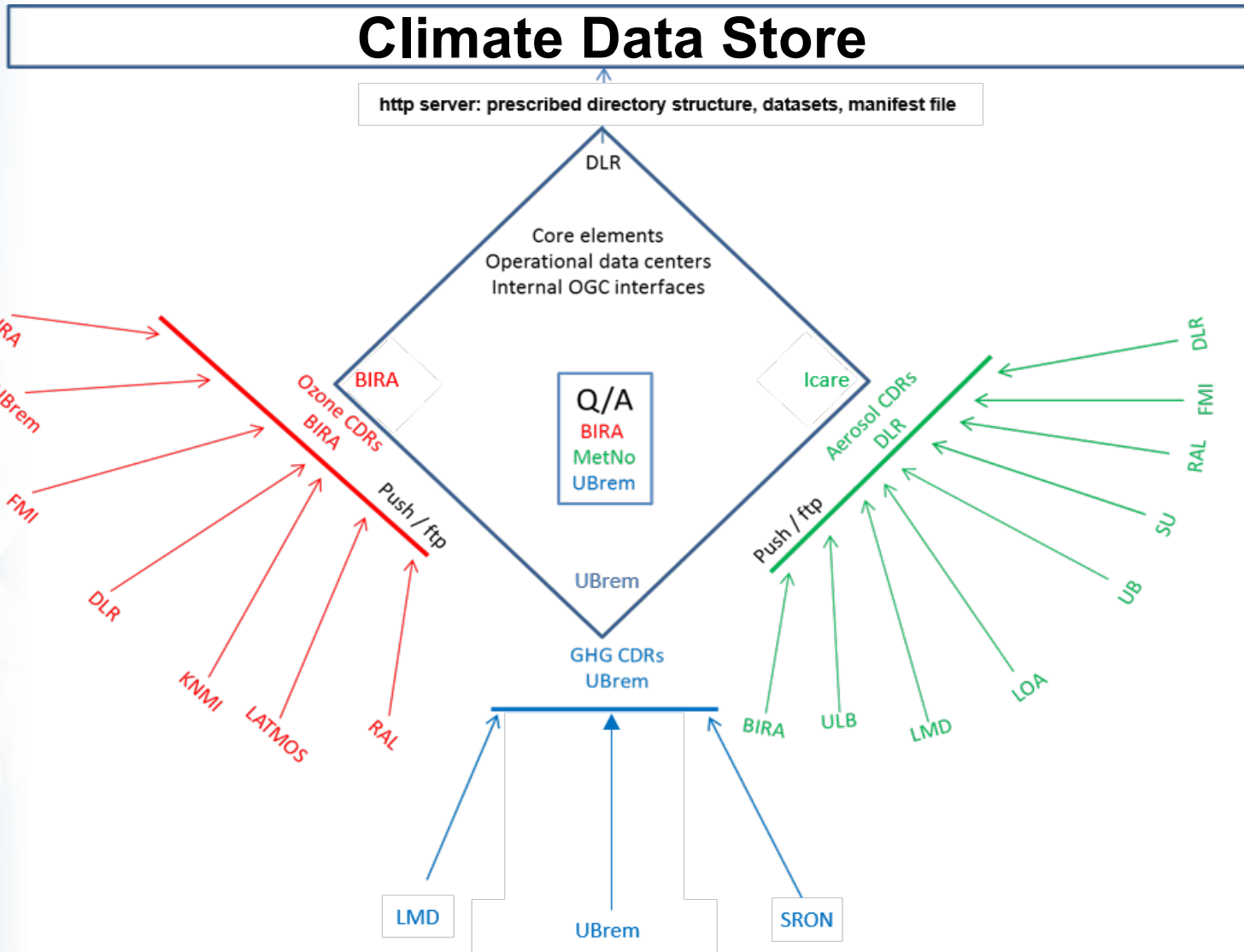
Get data

European Space Agency



Climate Change

Climate Data Store



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A question on satellite data for climate ...

To create
a long record
of an Essential Climate Variable
for Atmospheric Aerosol
from satellite data

Which challenges can you imagine?



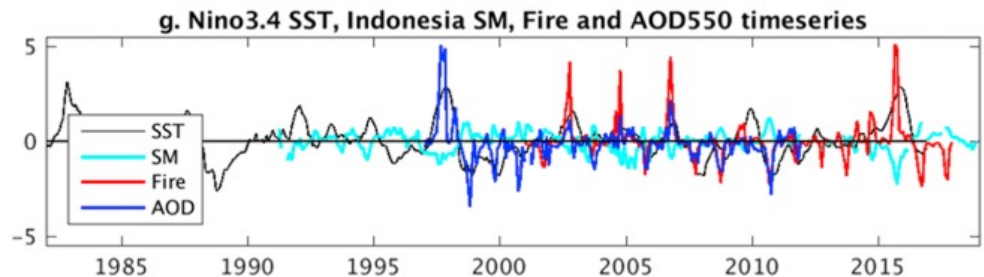
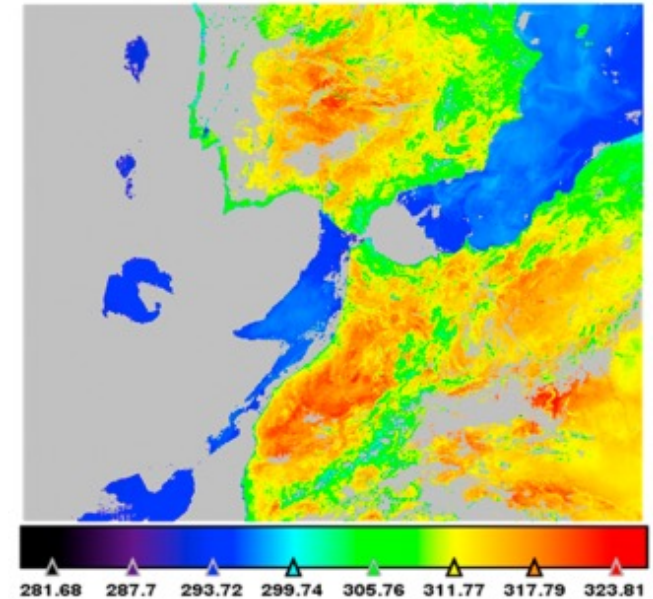
Harmonization: Consistency



- “independent measurements compatible within their individual uncertainties”
- 3-level definition applicable to single and multiple variables
 - Technical: harmonized format, metadata, access
 - Retrieval: use the same auxiliary datasets
 - Scientific: compatible ECVs and reference

• Concept for testing consistency

Consistency type	Required background knowledge	Assessment method
Retrieval level		
Categorical auxiliary data (masks)	Incompatible mask classes	Visual: Combined images Contingency matrix Class combination maps
Continuous auxiliary data	Target variable sensitivity to auxiliary variable	Visual: Homogeneity Difference maps Statistical comparison
Scientific level		
Self-consistency (single quantity)	Behavior of one quantity Known record features Known map features Physical equation	Visual: Features as expected Quantitative variability Trend analysis
Mutual consistency (multiple quantities)	Linkage between quantities Physical model Understood Earth system phenomena	Difference maps Trend comparisons Correlations and other measures of covariability



Popp Thomas, Michaela I. Hegglin, Rainer Hollmann, Fabrice Arduin, Annett Bartsch, Ana Bastos, Victoria Bennett, Jacqueline Boutin, Michael Buchwitz, Emilio Chuvieco, Philippe Ciais, Wouter Dorigo, Darren Ghent, Richard Jones, Thomas Lavergne, Christopher Merchant, Benoit Meyssignac, Frank Paul, Shaun Quegan, Tracy Scanlon, Marc Schröder, Stefan Simis, Ulrika Willén, Consistency of satellite climate data records for Earth system monitoring, Bull. Am. Met. Soc., 101, E1948–E1971, DOI10.1175/BAMS-D-19-0127.1, 2020



Consistency and CDR best practices



- **CDR best practices**
 - Aerosol_cci experiences + AEROCOM / AEROSAT community dialogue
 - Practical implementation of the GCOS principles
 - Full validation: global + regional, stratified by AOD
 - Comparing algorithms: coverage + statistics + correlations
 - Long time series: stability + consistency
 - Open development approach to co-benefit in the community
 - Involvement of users to meet their needs
 - Reference data: AERONET + more capable satellite retrievals
 - Uncertainties in the products - need to be validated
 - Ensembles enable combining strengths of different algorithms

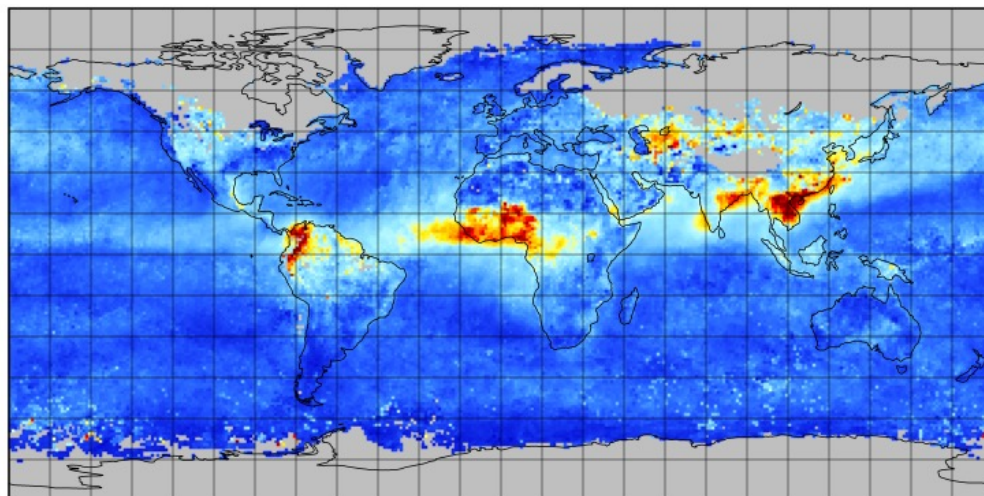
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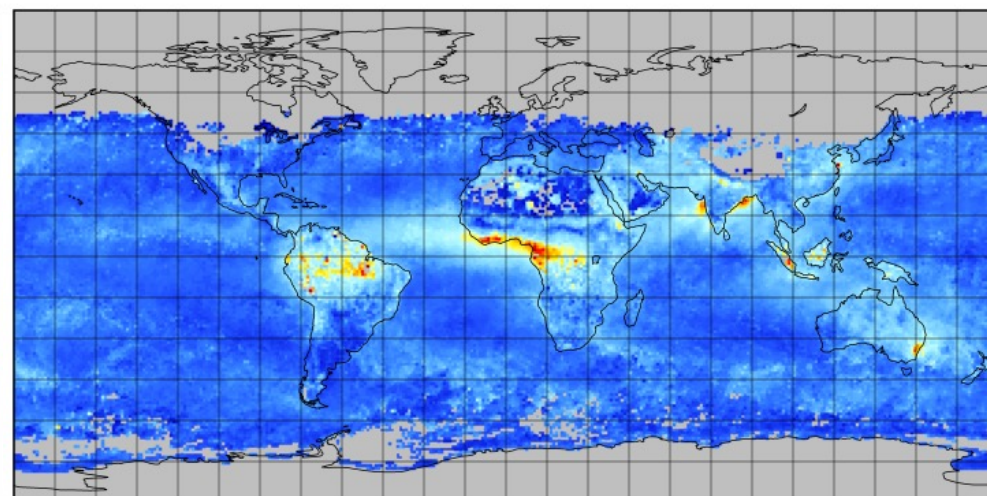
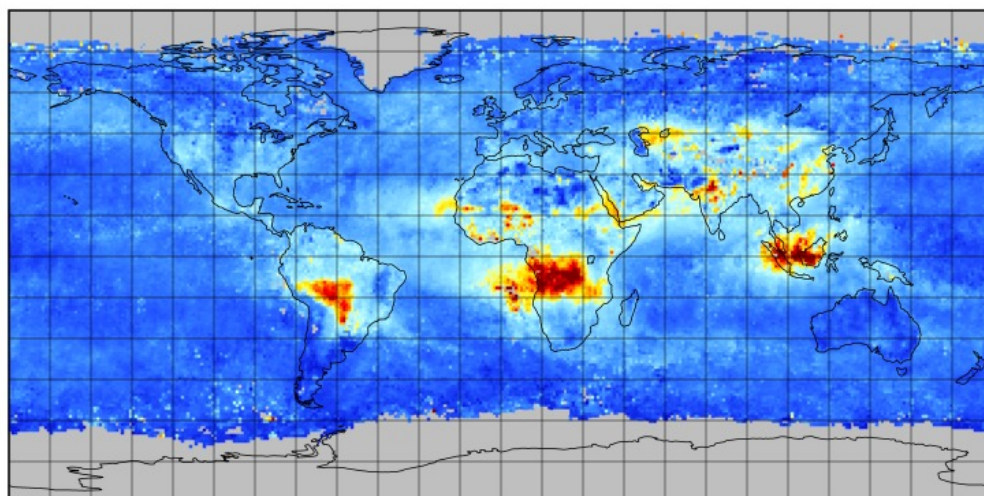
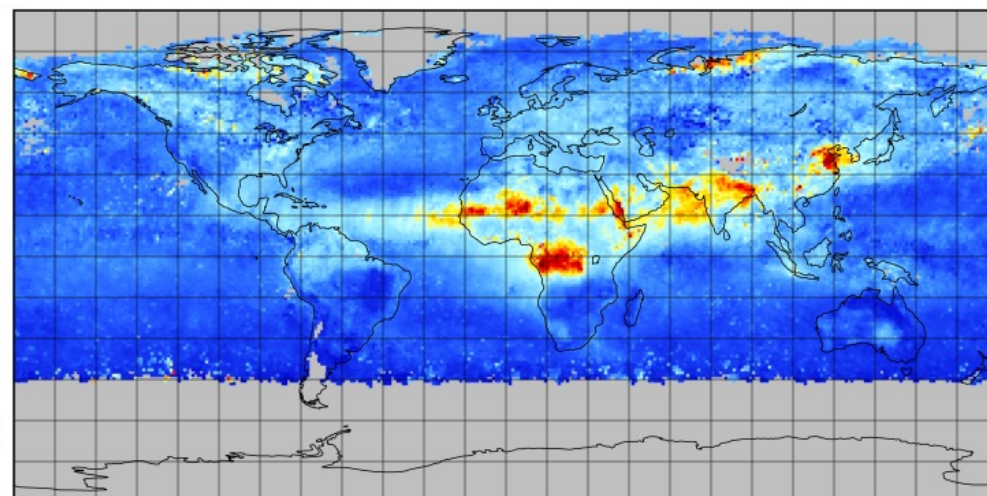
SLSTR: Monthly Aerosol Optical Depth (2019)



March

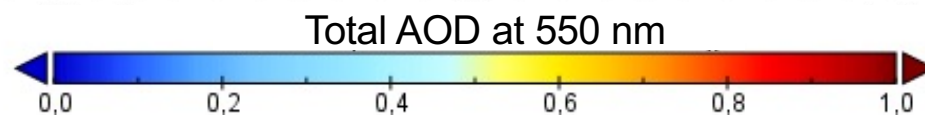


June



September

December

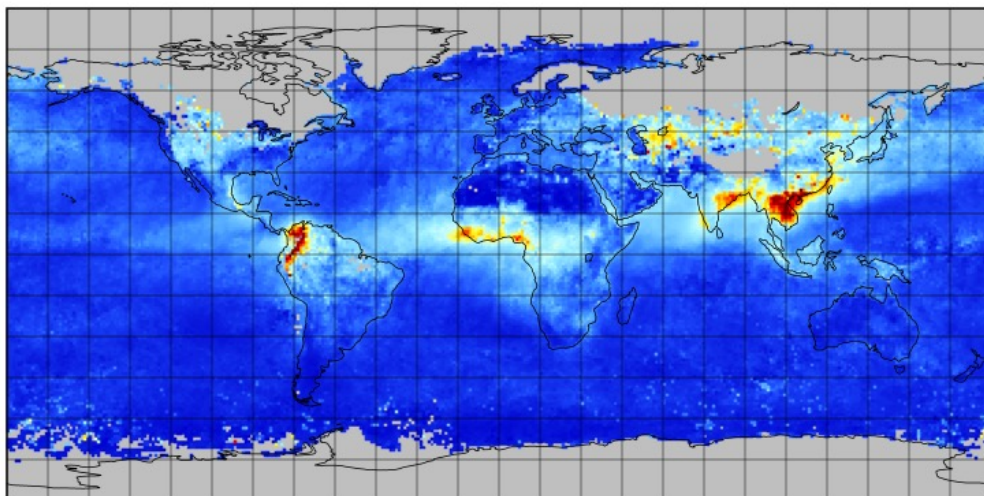




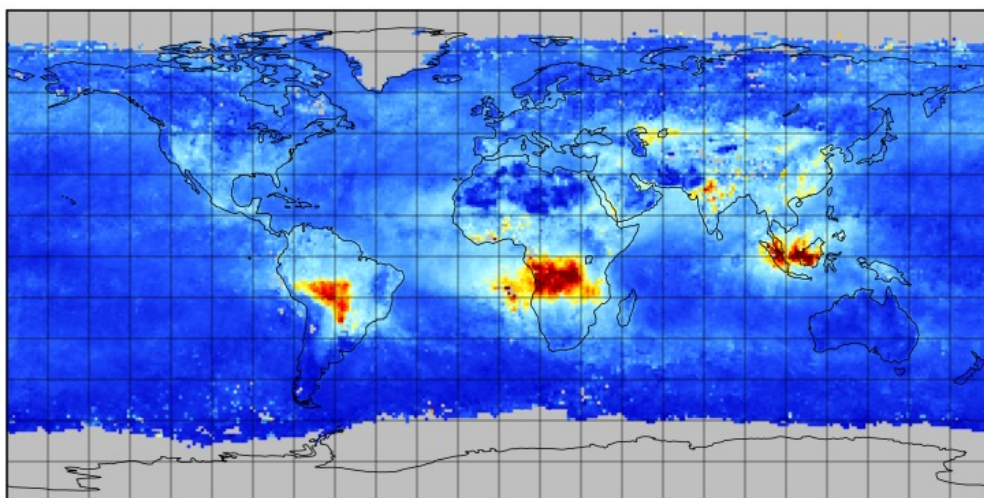
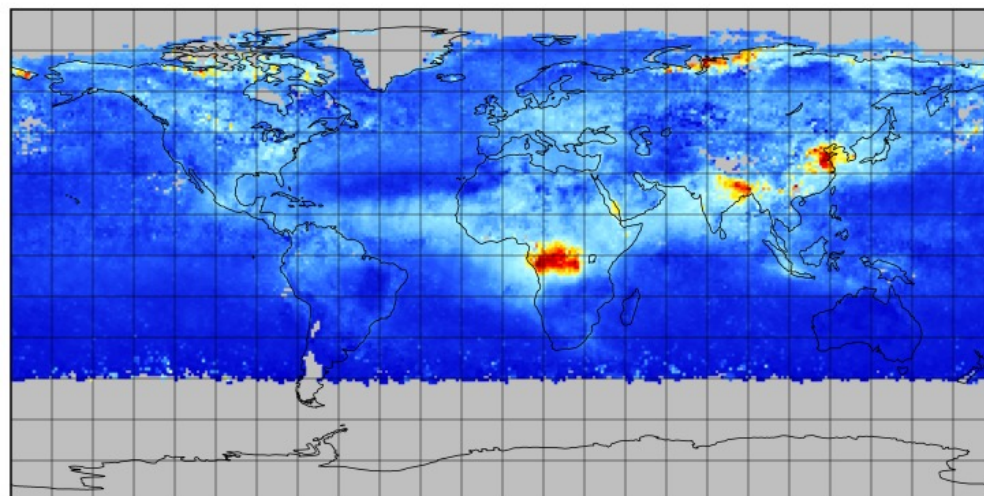
SLSTR Fine Mode AOD (2019)



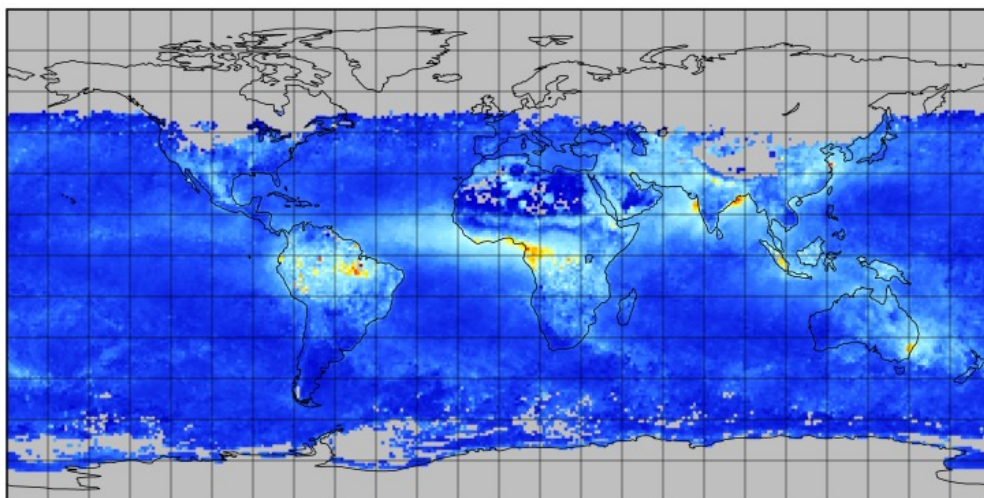
March



June



September



December

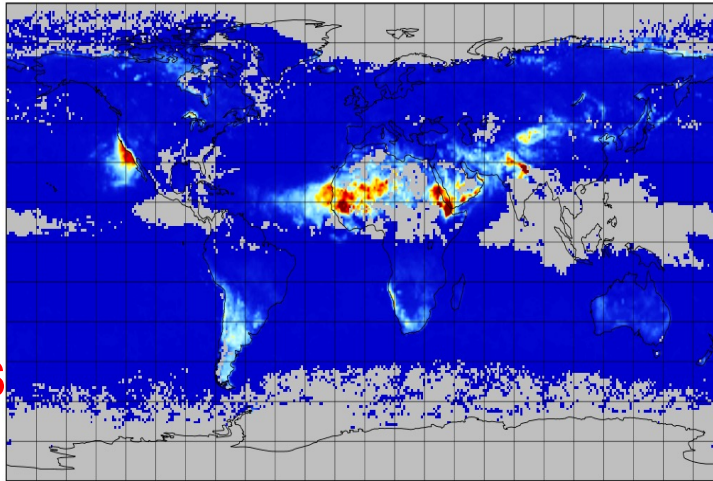




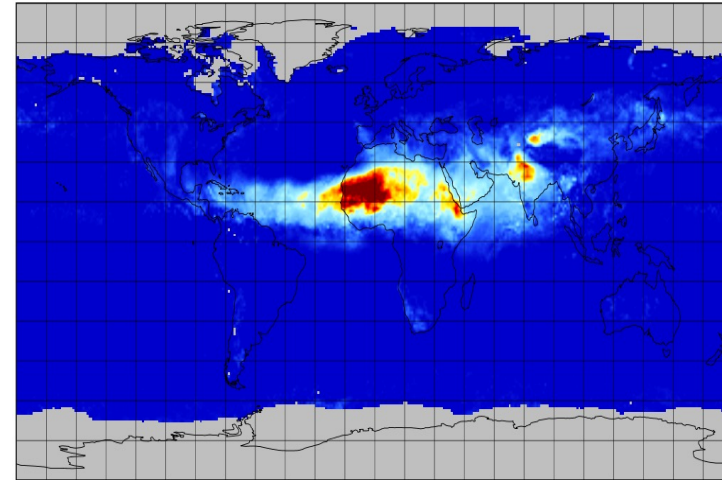
IASI Dust AOD ensemble (June 2018)



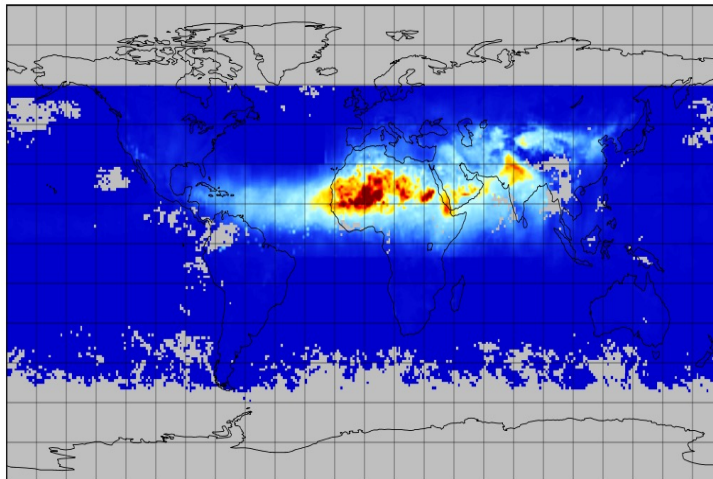
**DLR
IMARS**



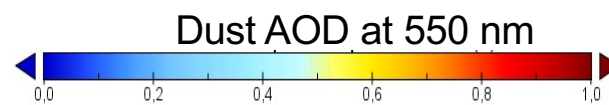
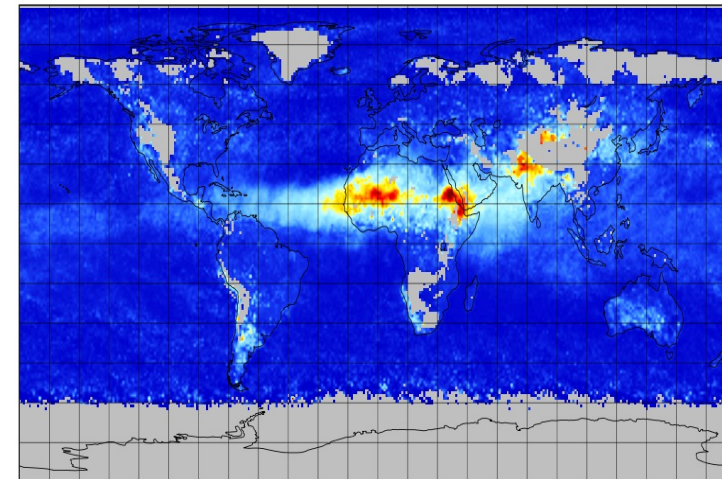
ULB



BIRA

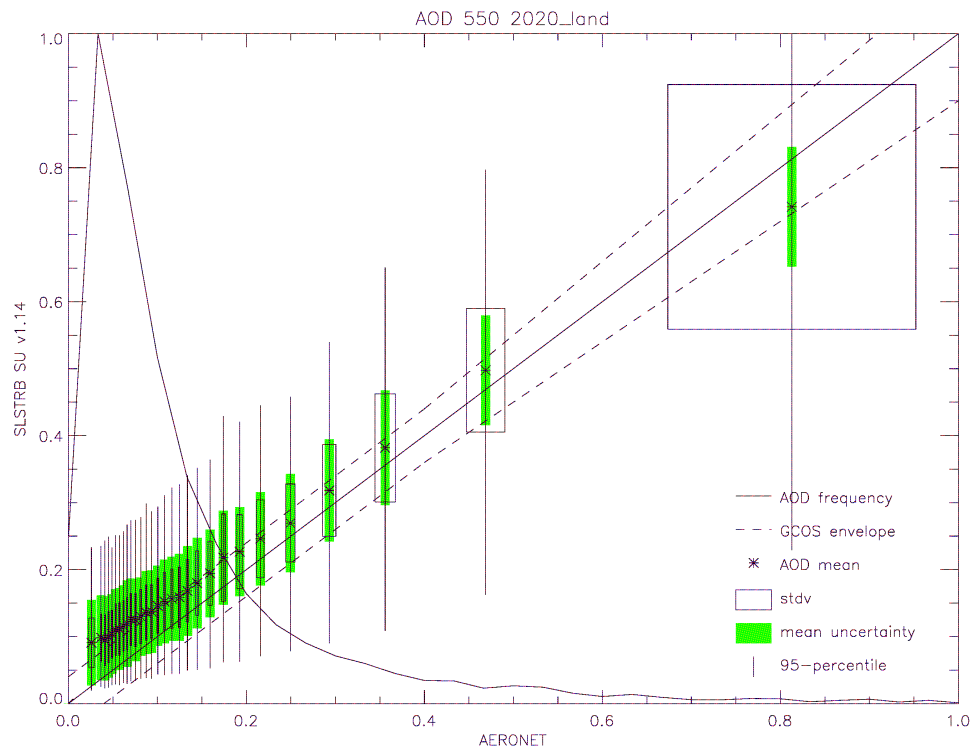


LMD

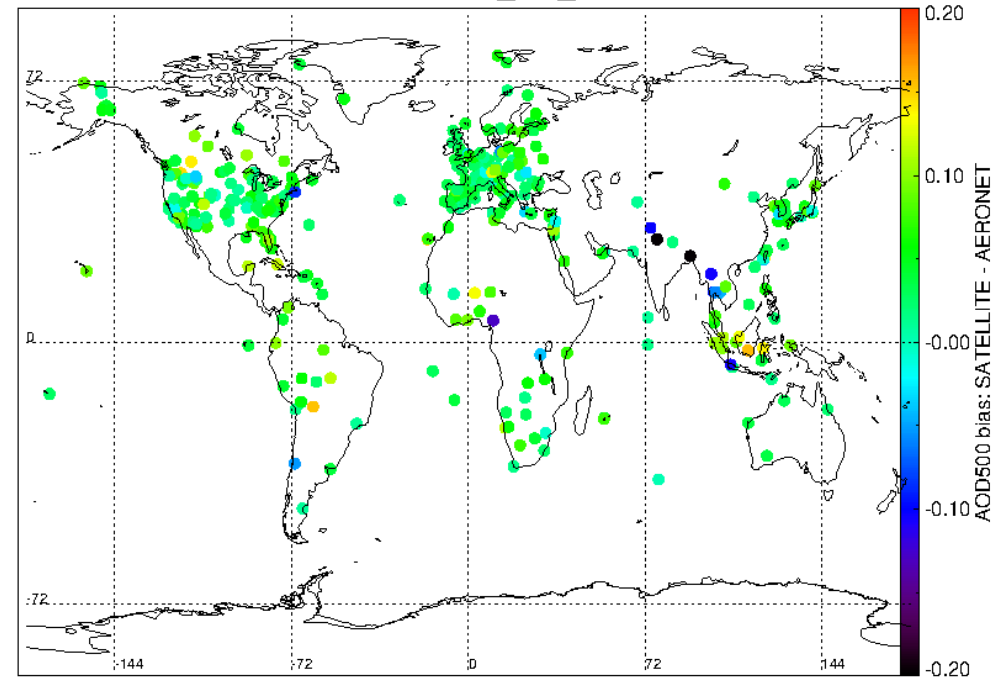




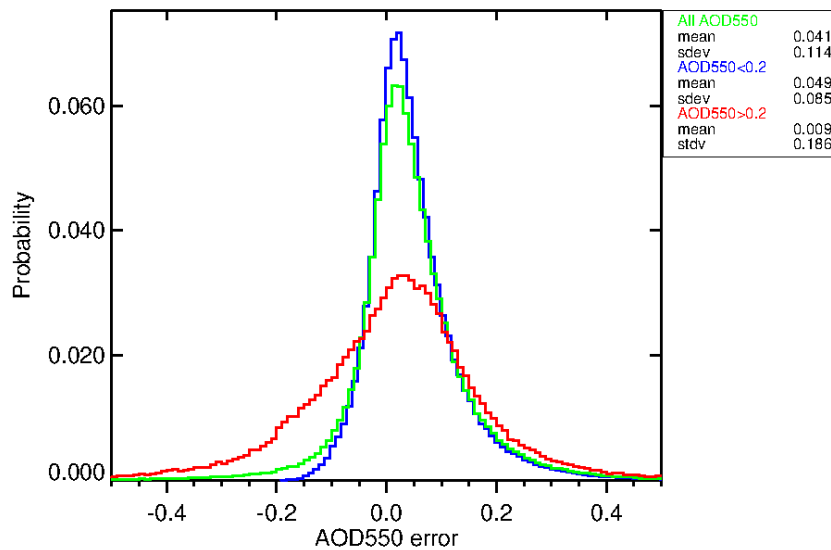
Benchmarking Swansea SLSTR algorithm



Mean absolute bias: 2020 SLSTRB_SU_v1.14



number of stations with more than 100 pairs: 353



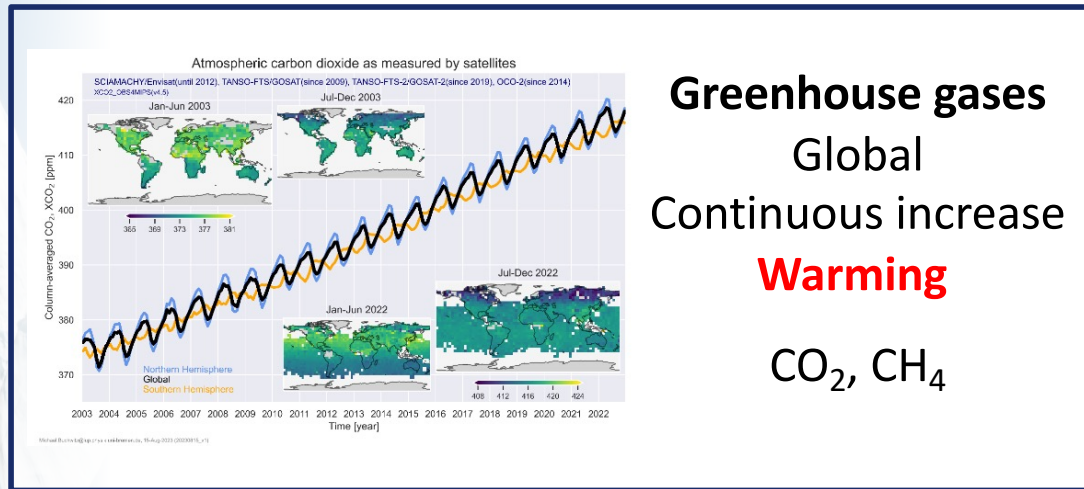
A question on operational user support ...

Which support as a user would you need?

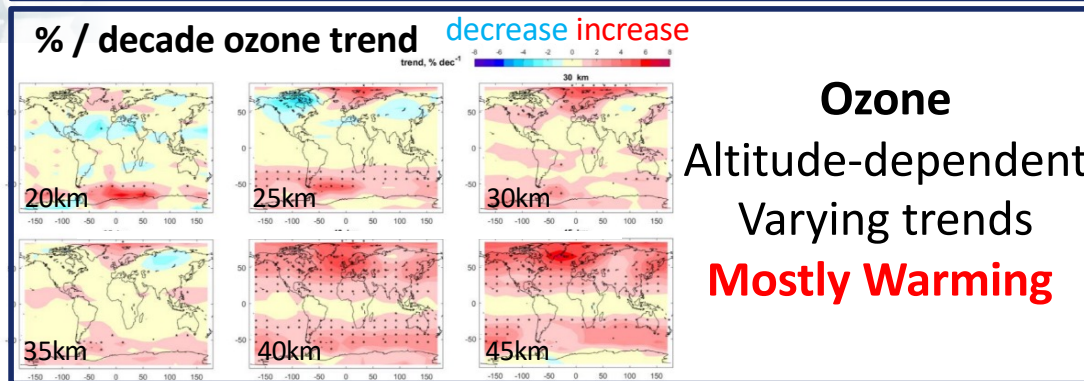


Climate
Change

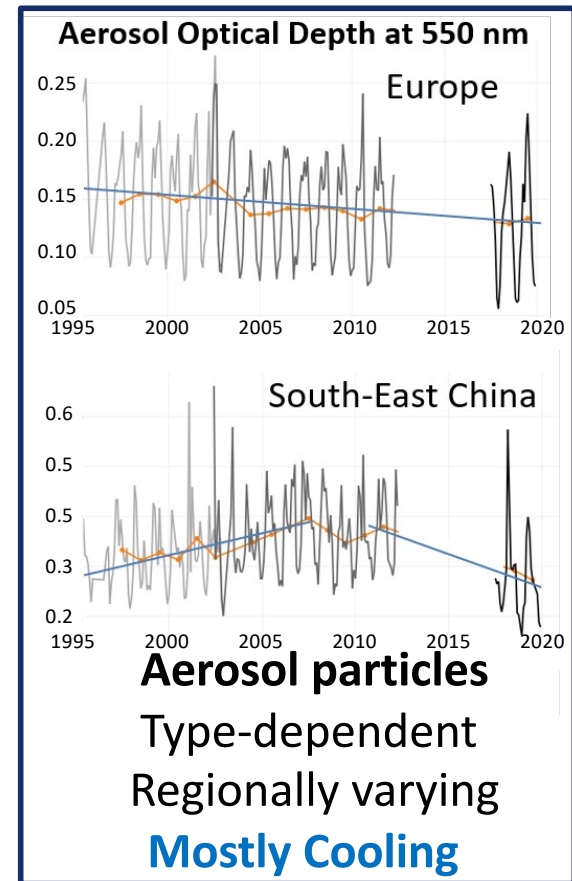
Atmospheric composition ECVs: Motivation



Greenhouse gases
Global
Continuous increase
Warming
CO₂, CH₄



Ozone
Altitude-dependent
Varying trends
Mostly Warming



Aerosol particles
Type-dependent
Regionally varying
Mostly Cooling



Other relevance: ozone hole,
air quality, renewable energy, ...



Climate
Change

Main achievements: Aerosol Climate Data Records

<u>sensor</u>	<u>satellite</u>	<u>period</u>	<u>algorithms</u>	<u>mode</u>	<u>variables</u>
Nadir radiometer line					
MERIS	ENVISAT	2002 - 2012	XBAER S4M	Ensemble	AOD
OLCI	Sentinel-3A	2016 -	XBAER S4O	Ensemble	
Dual-view radiometer line					
ATSR-2	ERS-2	1995 - 2003	ADV ORAC SU	Ensemble	AOD, Fine Mode AOD
AATSR	ENVISAT	2002 - 2012	ADV ORAC SU	Ensemble	
SLSTR	Sentinel-3A	2016 -	SDV ORAC SU	Ensemble	
Thermal infrared spectrometer line					
IASI	METOP-A	2007-2021	IMARS MAPIR LMD ULB	Ensemble	Dust AOD, Dust Layer Height
IASI	METOP-C	2019 -	IMARS MAPIR LMD ULB	Ensemble	
Multi-angle polarimeter line					
POLDER	PARASOL	2005 - 2013	GRASP	CDR	AOD, Fine Mode AOD, Single Scattering Albedo, Aerosol Layer Height
Star occultation spectrometer line					
GOMOS	ENVISAT	2002 - 2012	AERGOM	CDR	Aerosol <u>extinction profiles (stratosphere)</u>



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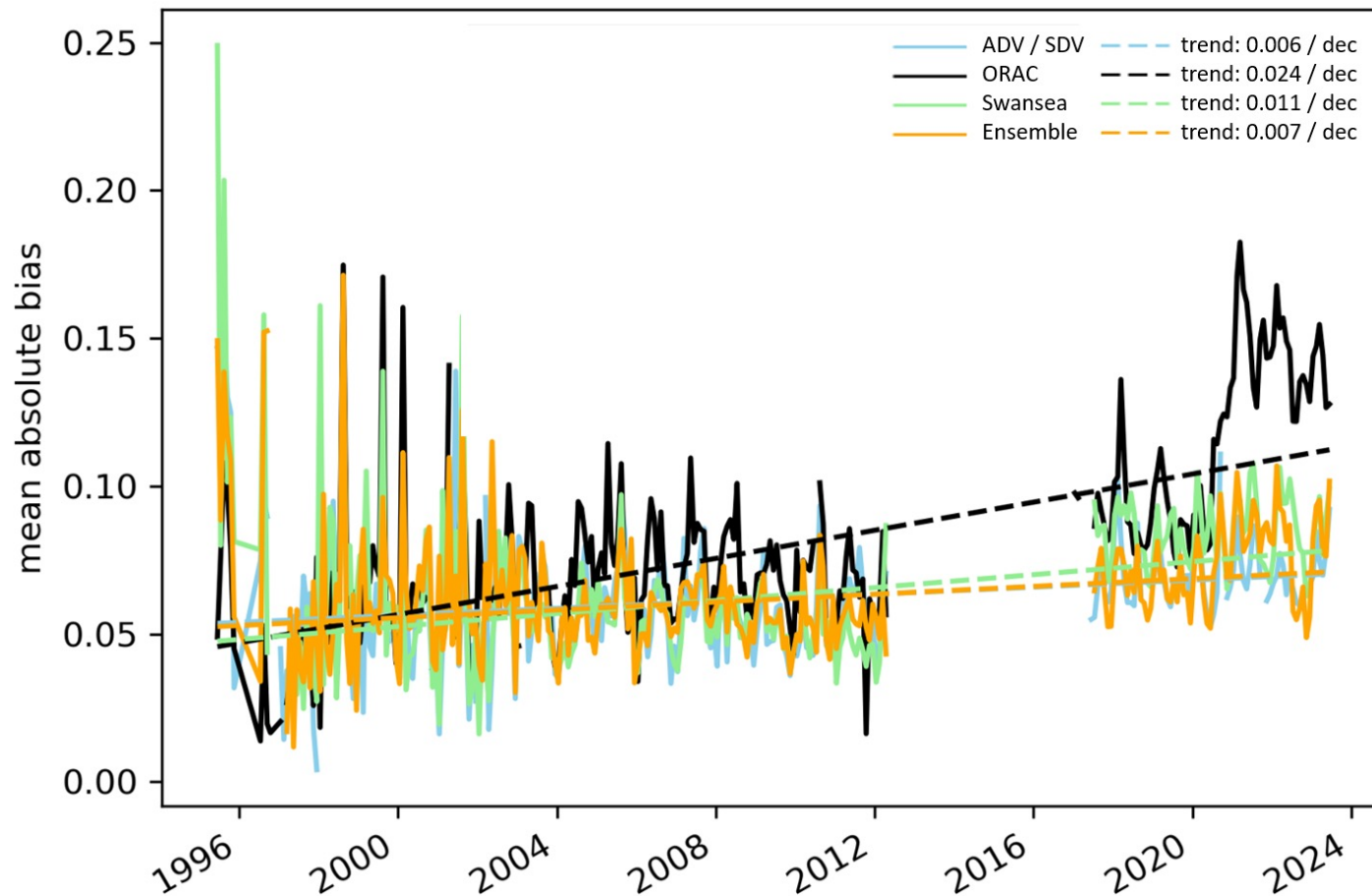




Climate
Change

Main achievements: Aerosol record stability

- FM-AOD multi-sensor records from the dual view instrument series ATSR-2, AATSR, SLSTR vs AERONET
- All 4 CDRs pass the GCOS threshold criterion (0.04 / decade); ADV and ensemble pass the goal criterion (0.01 / decade); pvalues confirm the significance of all 4 trends





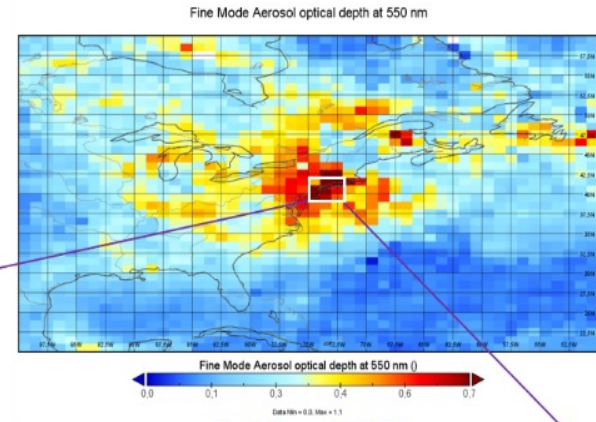
Climate
Change

Main achievements: Aerosol extreme event

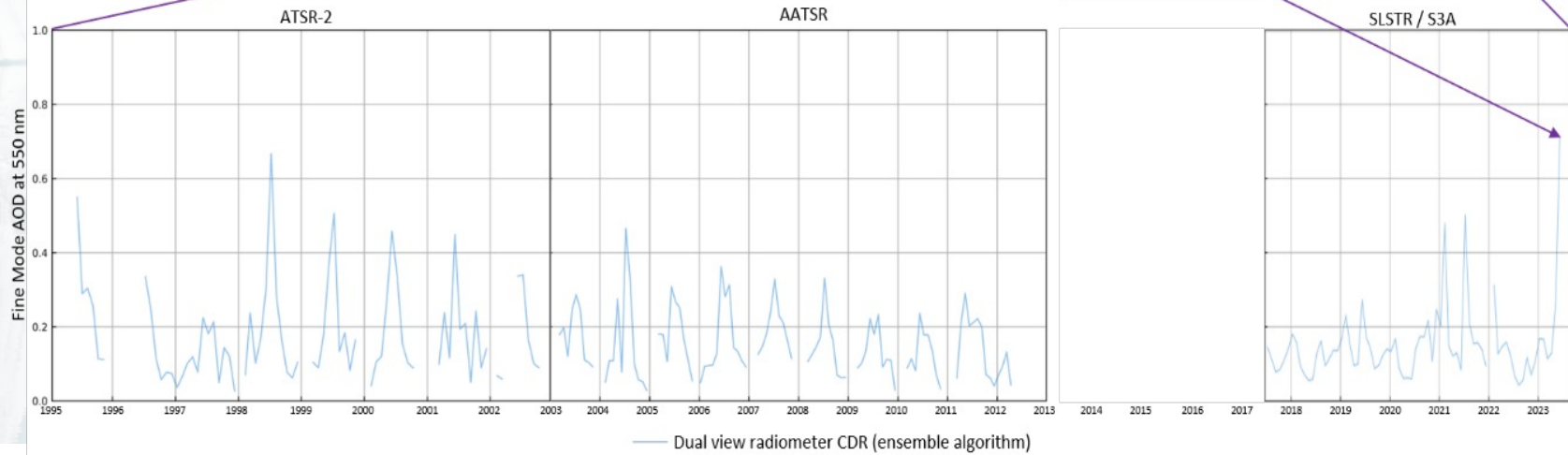


7 June 2023

Greater New York

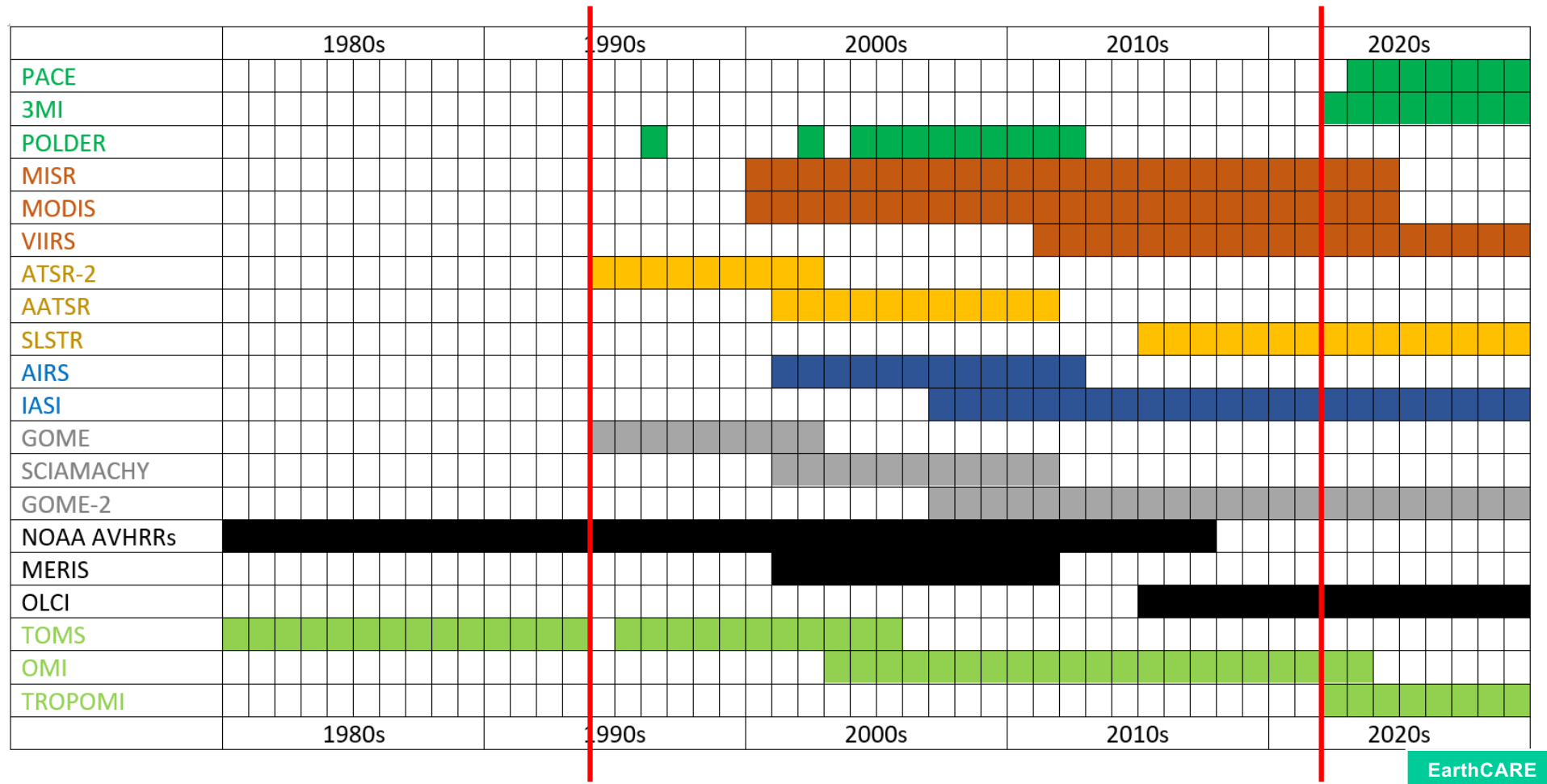


Monthly mean 06/2023



Aerosol CDRs: suitable instruments

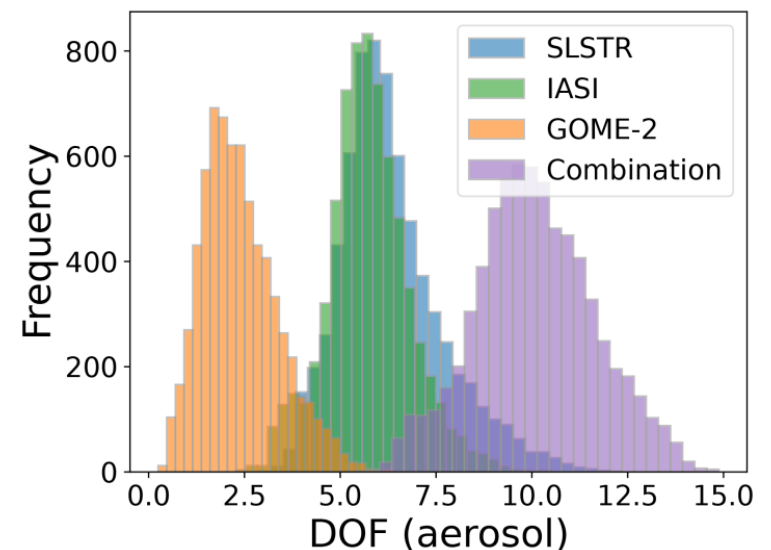
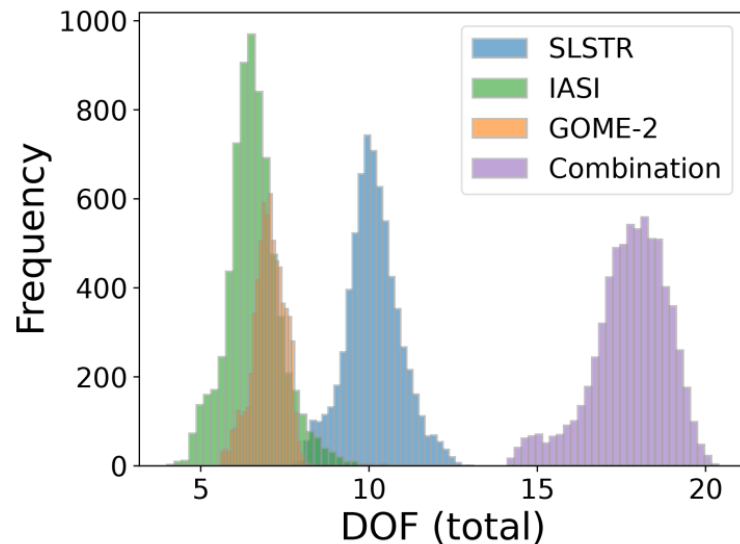
Satellite sensor line(s) for long aerosol records



Higher information content of synergetic retrieval

- **Multi-sensor algorithm**

- Optimal estimation approach SLSTR + IASI + GOME-2
- AOD + aerosol properties
- Exploit comprehensive information content of UV + VIS + TIR + dual view



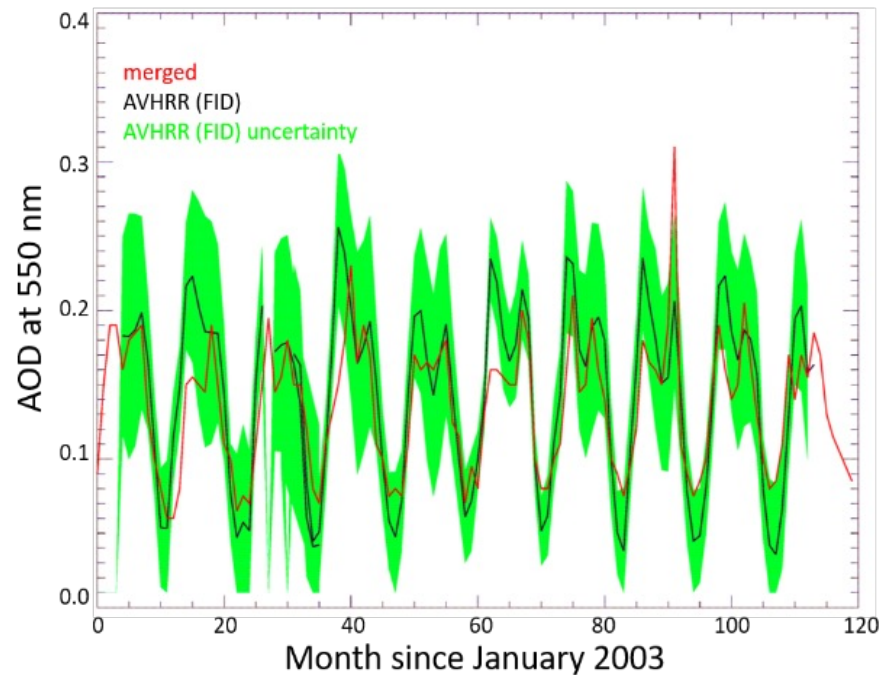
Ulrike Stöffelmair, Thomas Popp, Marco Vountas, and Hartmut Bösch, Satellite Aerosol Retrieval from a combination of three different Instruments: Information content analysis, accepted for publication, AMT, 2025



Systematic error propagation L2 –L3

- Standards, demonstration
- Utilization for uncertainty-weighted ensemble
- Input: Level1 error characterization,

AERONET



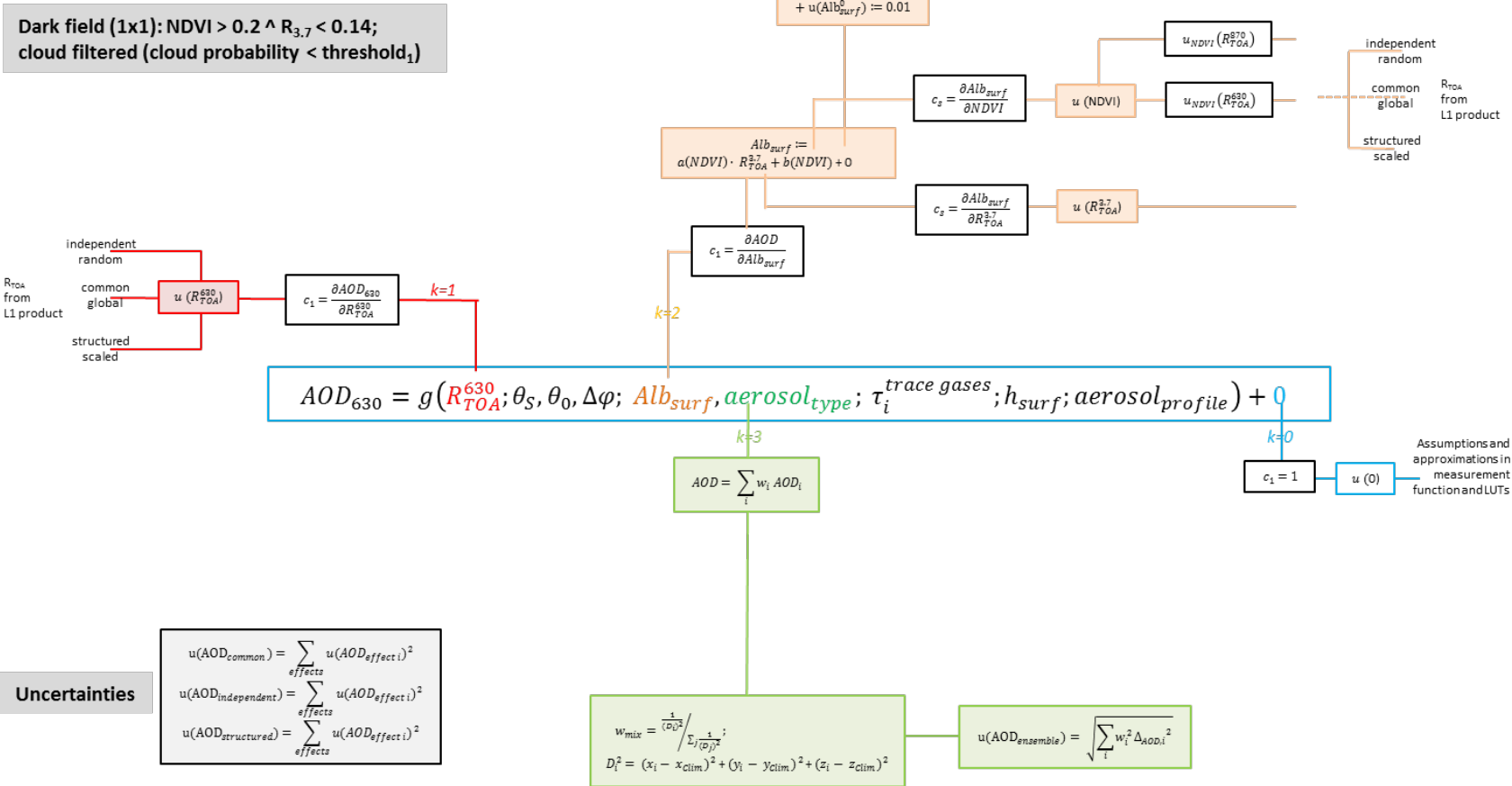
Fiduceo



Popp T., Mittaz J., Systematic propagation of AVHRR AOD uncertainties - a case study to demonstrate the FIDUCEO approach, Rem. Sens., 2022, 14, 875, <https://doi.org/10.3390/rs14040875>



Analysis tree L2A



A question on consistency ...

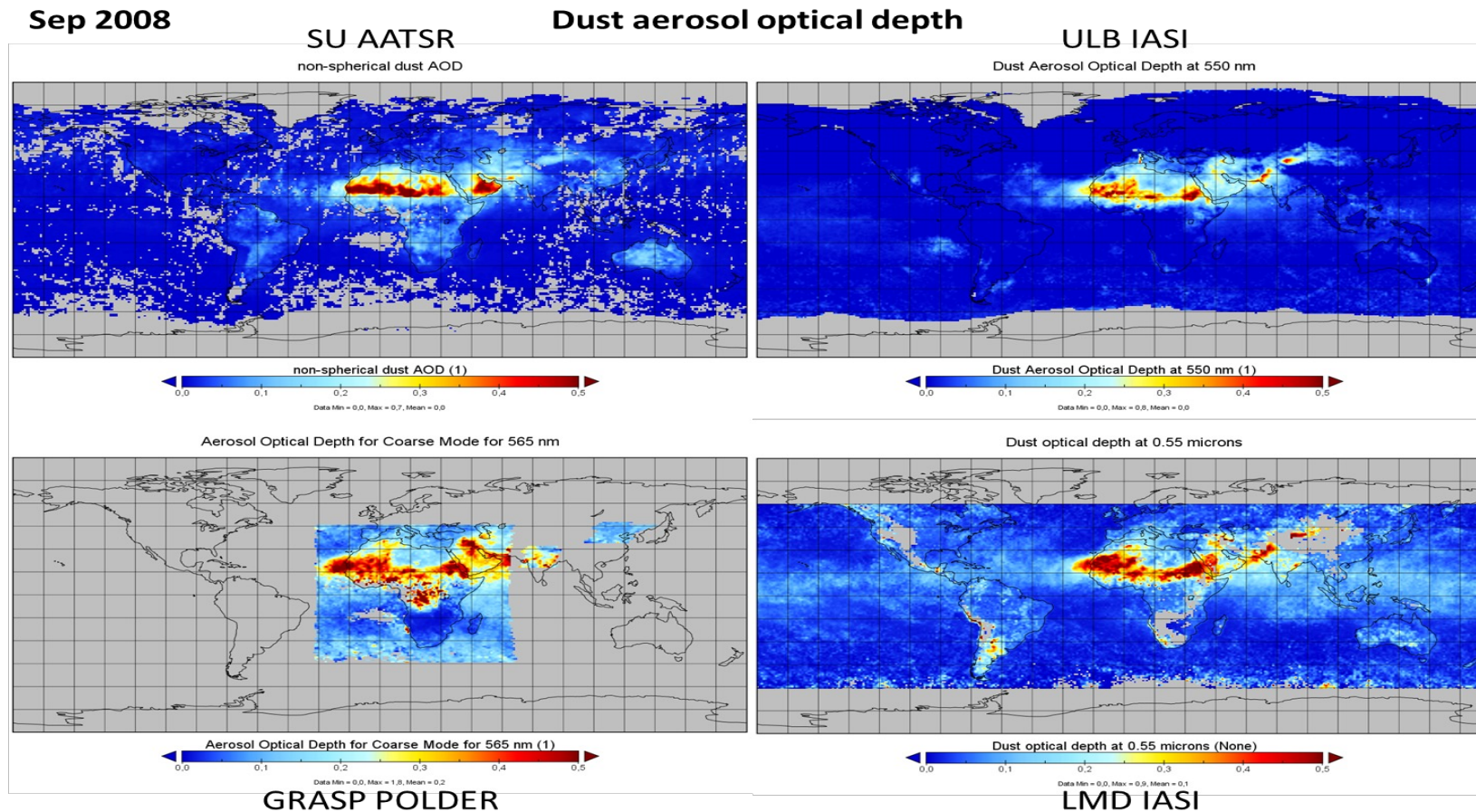
Which types of inconsistency in satellite records can you imagine?



■ Possible inconsistencies

- Different sensors have different **sensitivities and sampling**
- Different retrievals use different **pre-defined aerosol components + cloud masking**
- CDR composed from **separate pieces from subsequent similar sensors**
 - Possibly with larger uncertainties in earlier pieces
- **Different aerosol parameters** are obtained from different sensors

Sep 2008

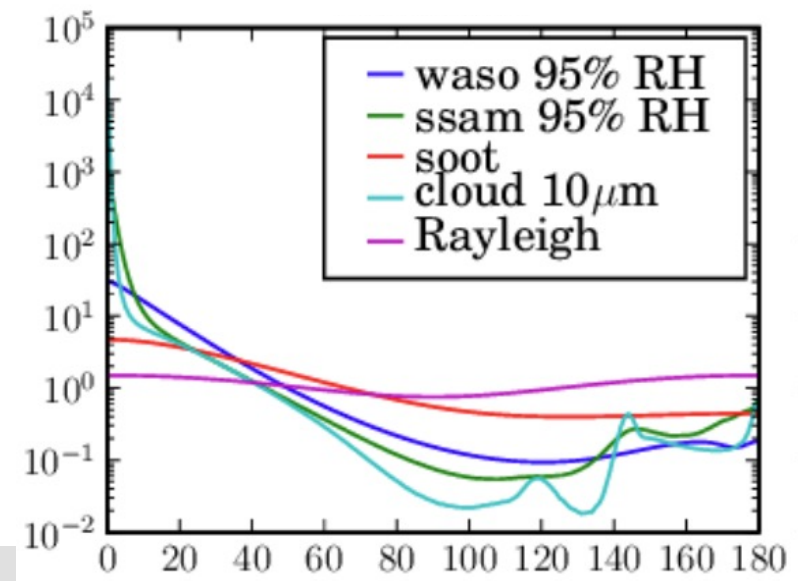
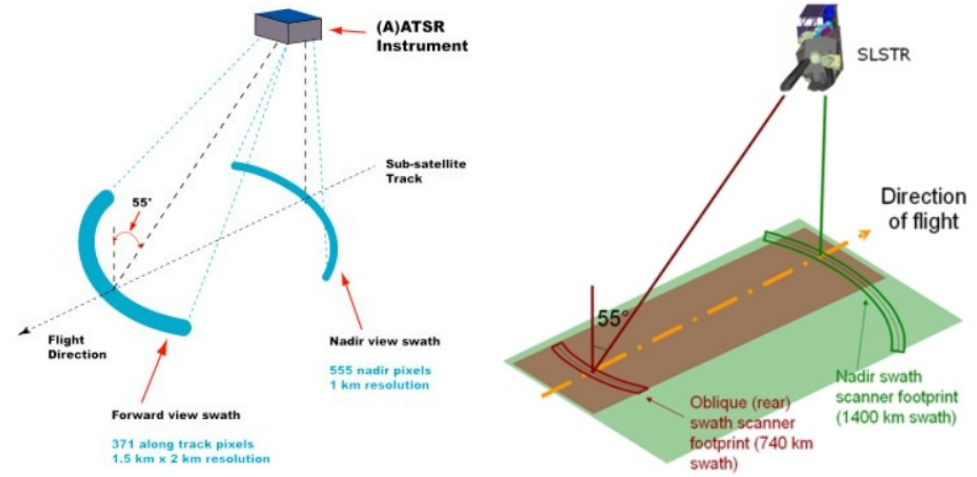




Dual view record – opposing viewing directions



- Dual view sensor line
- ATSR instruments / SLSTR instruments
- Have opposing oblique viewing directions
- Aerosol / Mie scattering anisotropy
 - Larger with larger particle size
 - Very large forward peak
- Consequences: Swansea algorithm open issues
 - SLSTR bias
 - despite major efforts for consistency
 - Fine Mode fraction bias
 - adaptation of dust properties?

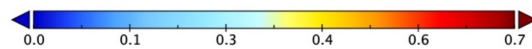
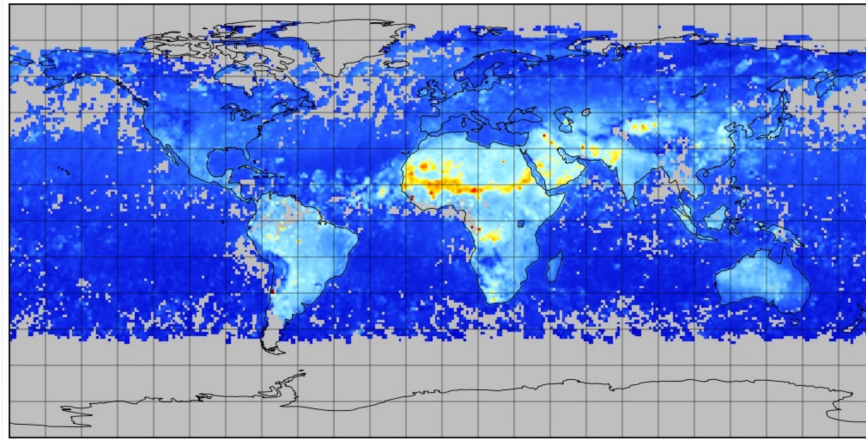




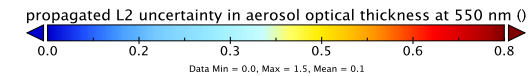
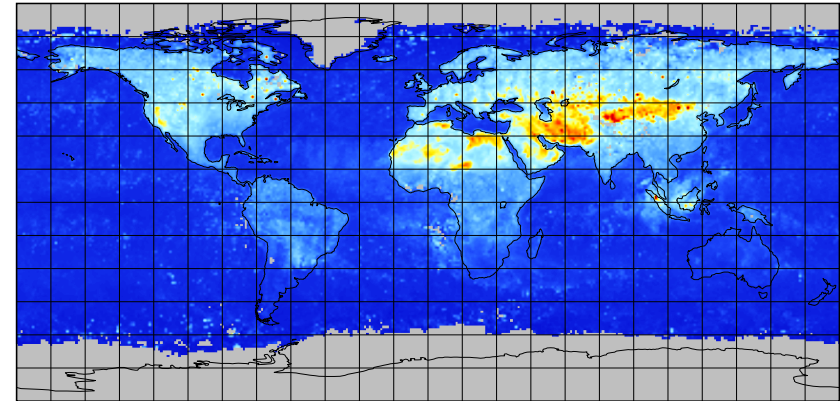
SU CCI: AATSR vs SLSTR Uncertainty



AATSR



SLSTR



- Propagated L2 Uncertainty in retrieval
- High in 'backscatter' direction
- Opposite hemispheric pattern (A)ATSR vs SLSTR
- Recommended for S3NGO ASLSTR revert to original geometry, additional channels for aerosol



Aerosol_cci: Aerosol components

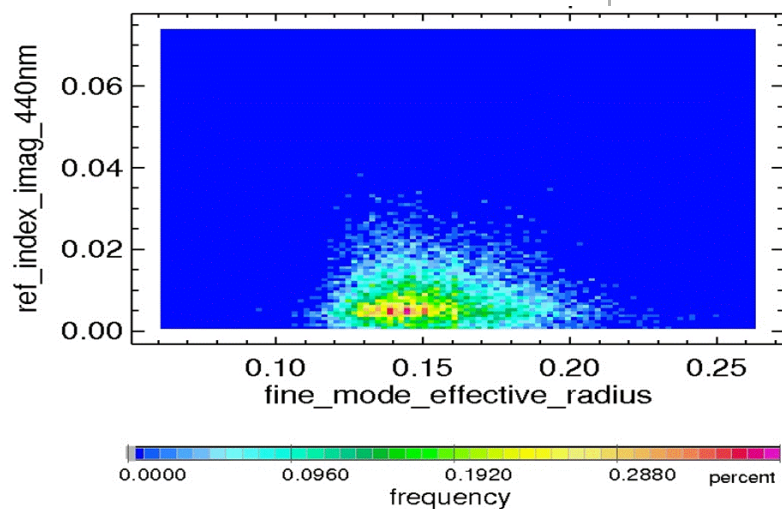


Simple

natural variability – information content

Mean Aeronet

global statistics

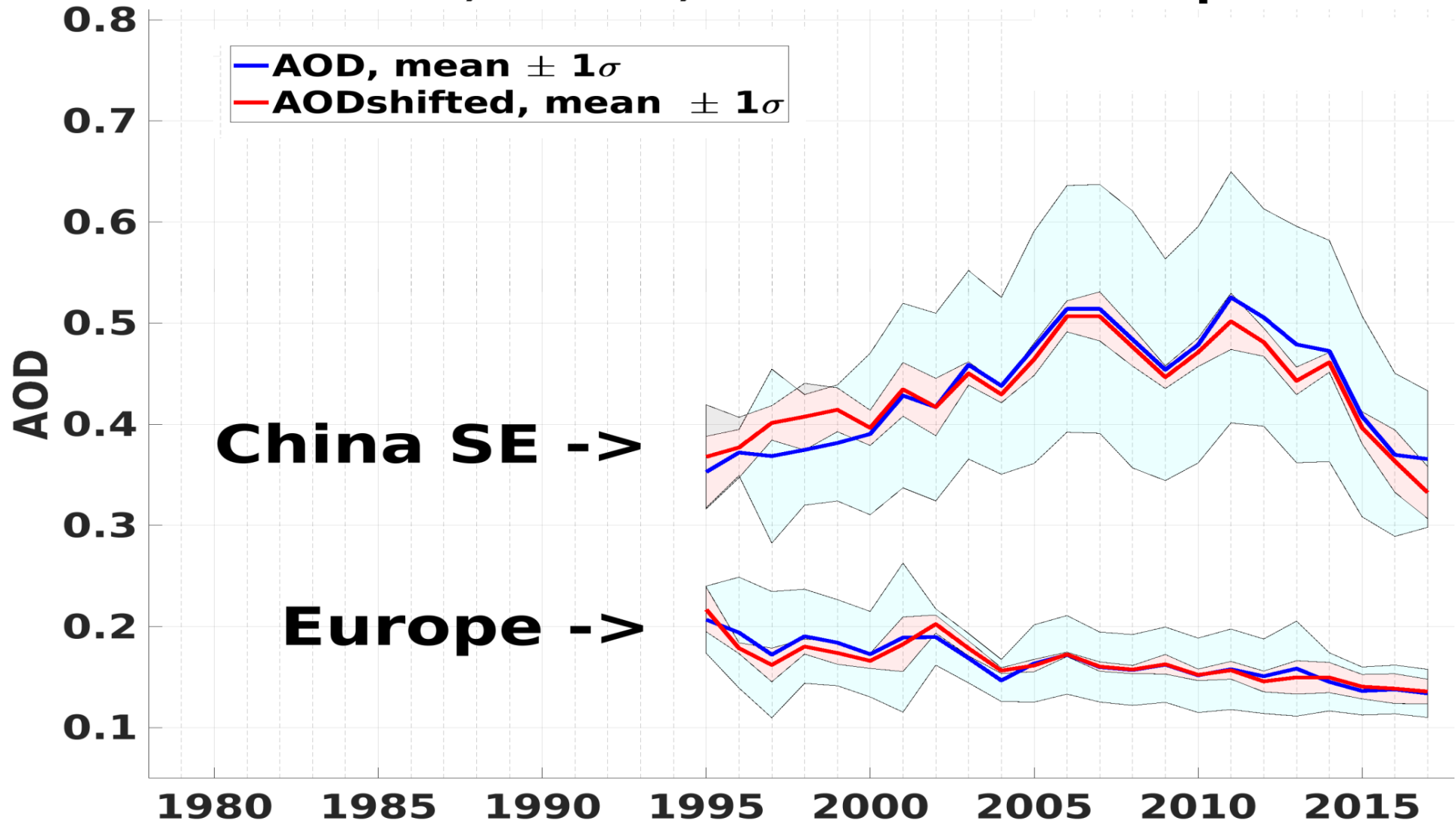


aerosol component	Refr. index, real part (55 μ m)	Refr. Index, imag part (.55 μ m)	reff (μ m)	geom. st dev (σ_i)	variance ($\ln \sigma_i$)	mode. radius (μ m)	comments	aerosol layer height
Dust	1.56	0.0018	1.94	1.822	0.6	0.788	non-spherical	2-4km
	1.4	0	1.94	1.822	0.6	0.788	AOD threshold constraint	0-1 km
	1.4	0.003	0.140	1.7	0.53	0.07	(ss-albedo at 0.55 μ m: 0.98)	0-2 km
	1.5	0.040	0.140	1.7	0.53	0.07	(ss-albedo at 0.55 μ m: 0.802)	0-2 km



Multi-satellite time series experiment about consistency

AOD, annual, SE China and Europe



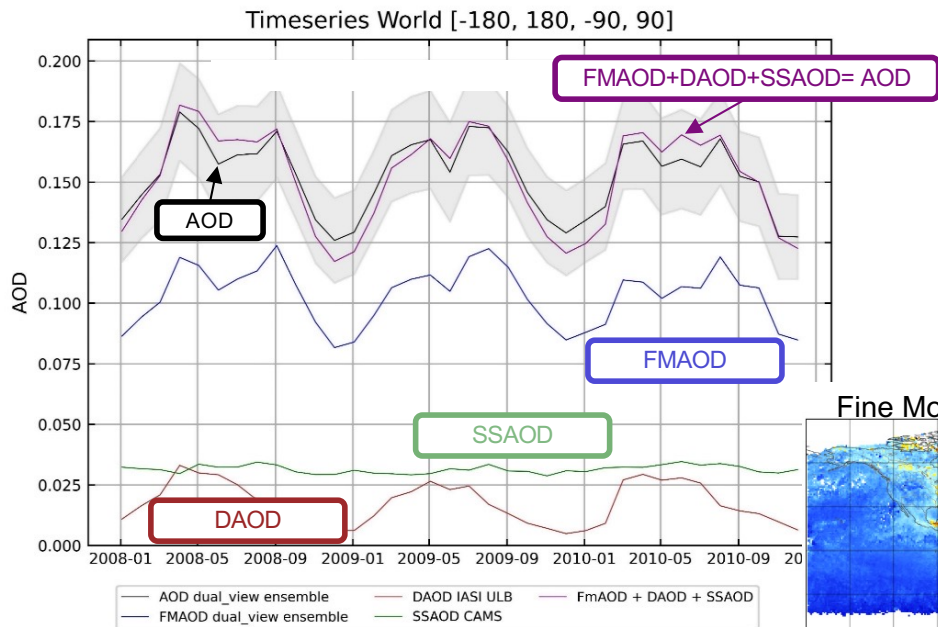
Aerosol satellite dataset consistency

Copernicus Climate Change Service

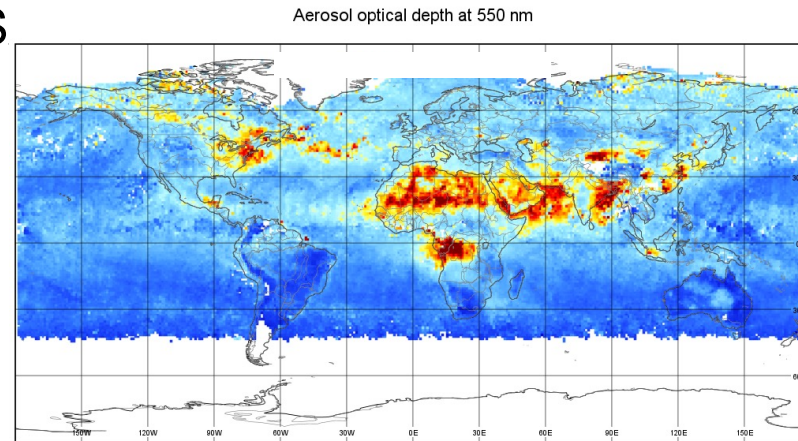


June 2023 (3 ensemble algorithms)
Total AOD at 550 nm (SLSTR)

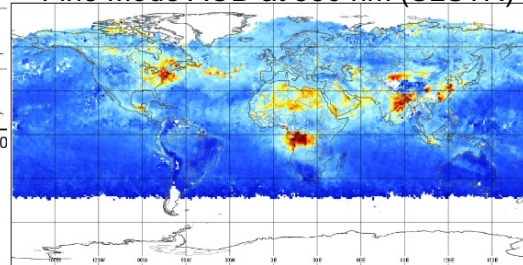
Consistency: $AOD = FMAOD + DAOD + SSAOD$
Global mean



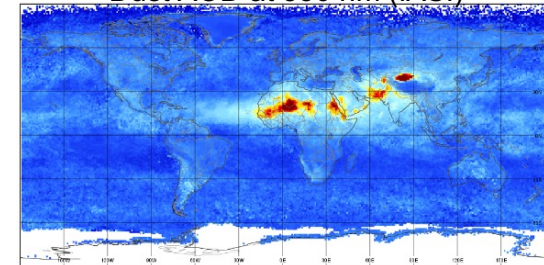
Courtesy: U. Stöffelmair, Master's Thesis



Fine Mode AOD at 550 nm (SLSTR)



Dust AOD at 550 nm (IASI)



Wrap-up

- Long-term archiving
 - CCI and C3S provide operational capabilities
 - Together they guide users between their portals
- Harmonization
 - Large efforts in both programs to assure consistency
 - This is a challenging task – shown with example aerosol
 - Technical aspects (e.g. dual view instrument inconsistency)
 - Algorithm limitations: mathematically ill-posed problem
 - Validation challenges – gaps in reference data:
 - open clean ocean areas
 - Changing number of stations over long term
 - CDR best practices to implement GCOS principles
 - Have been defined to safeguard CDR quality



A final question ...

What was new for you / what surprised you?

