

# EUMETSAT's Drought & Vegetation Data Cube

## A prototype

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# Why a Data Cube?

## What is a Data Cube?

### Lessons learnt from building the D&V Cube

### Status and Outlook



# Why a data cube?

## Satellite Application Facilities

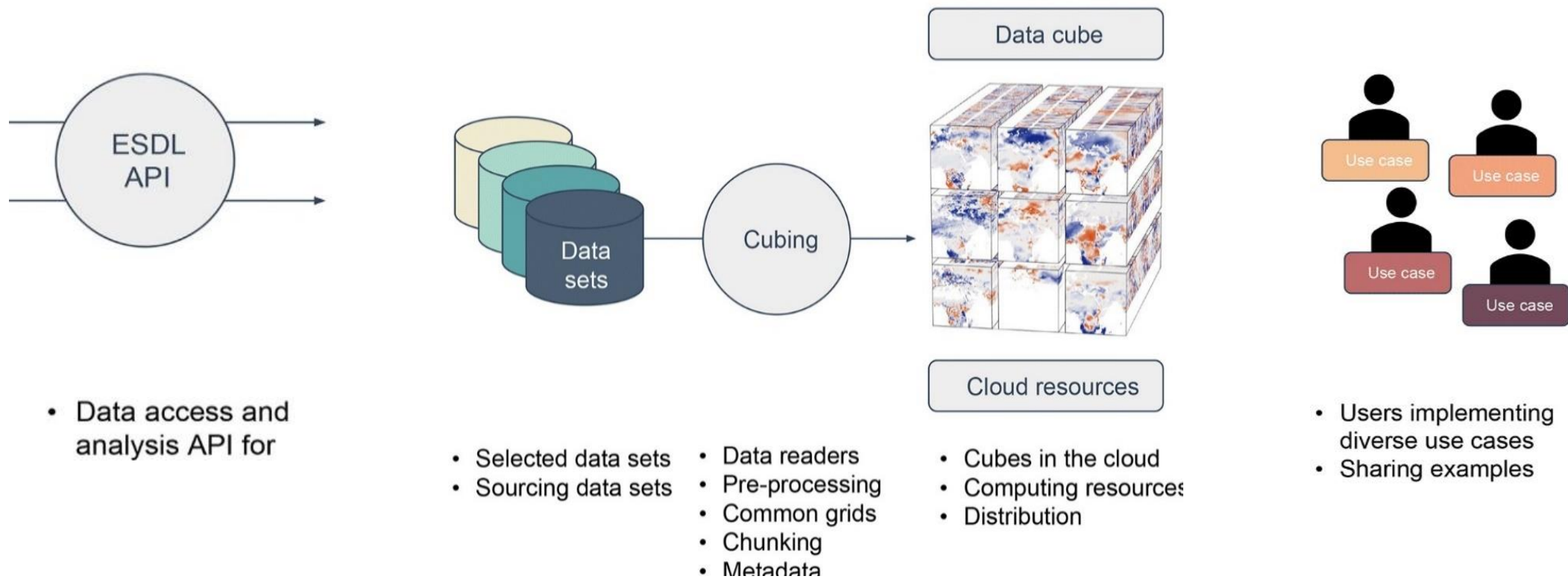
- EUMETSAT has a network of different Satellite Application Facilities (SAFs)
- Each SAF is a consortium of entities from EUMETSAT member states
- SAFs are dedicated centers of excellence for processing satellite data
  - research, development and operational activities
  - each SAF is specialized in a different applications
- SAFs provide 80% of EUMETSAT's product portfolio
- Many (climate) data records → real treasure



# Status



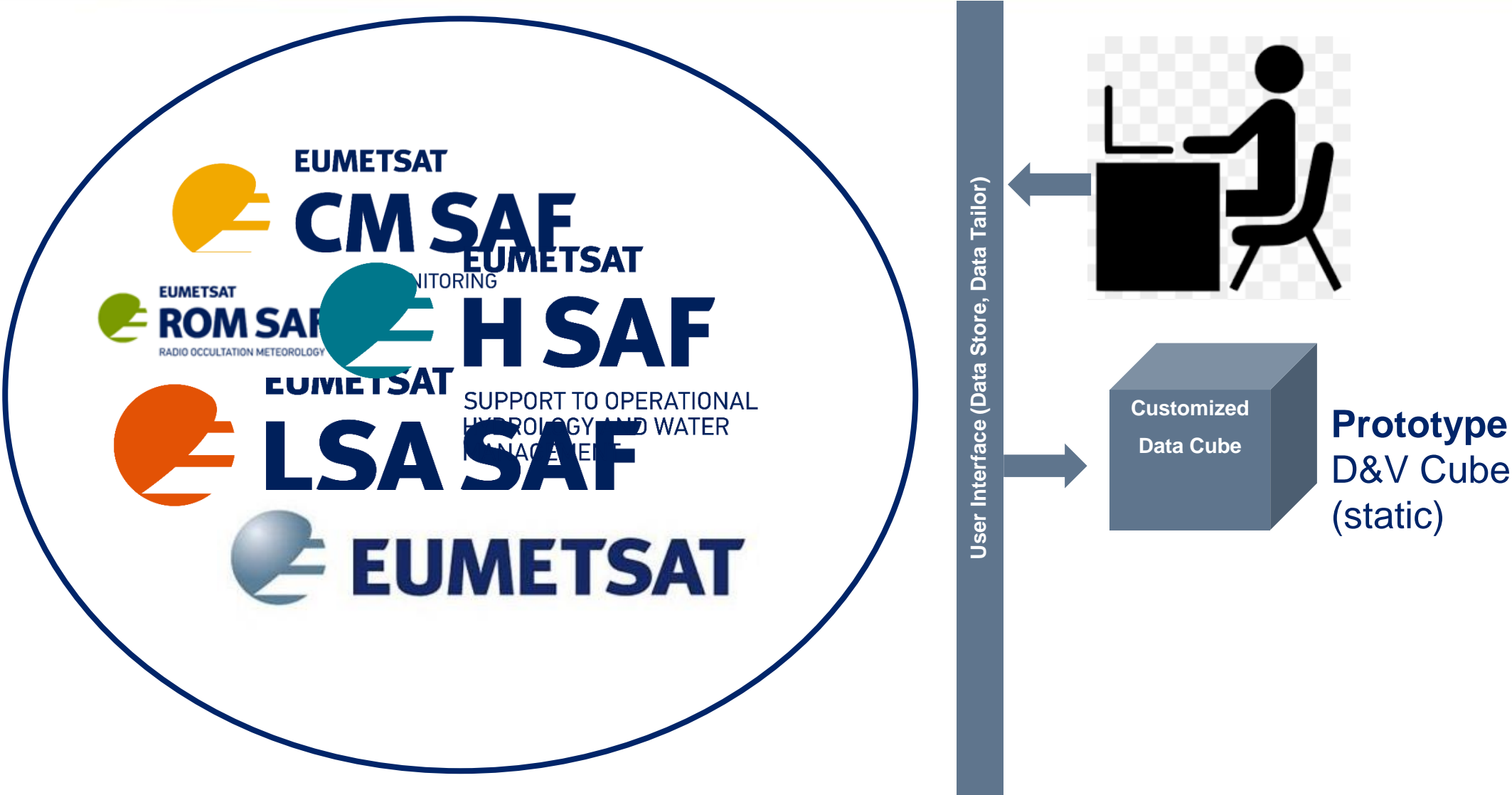
# The idea of Data Cubes



Earth system data cubes unravel global multivariate dynamics Miguel D. Mahecha et al.; <https://doi.org/10.5194/esd-11-201-2020>

Facilitating data access and data handling saves time, which can be used to answer scientific questions.

# Idea / Vision



# Prototype D&V Cube at glance

Variable		Datasource	Temporal Coverage	Spatial Resolution	Temporal Resolution
Global Radiation		Satellite	Jan 1983 – Dec 2020	0.05°	Daily & monthly
Direct normal Solar Radiation		Satellite	Jan 1983 – Dec 2020	0.05°	Daily & monthly
Sunshine Duration		Satellite	Jan 1983 – Dec 2020	0.05°	Daily & monthly
Land Surface Temperature		Satellite	Jan 2004 – Dec 2020	0.05°	Hourly
Reference Evapotranspiration		Satellite	Jan 2004 – Dec 2020	0.05°	Daily
NDVI		Satellite	Mar 2007 – Dec 2020	0.01°	10-daily
Fractional Vegetation Cover		Satellite	Jan 2004 – Dec 2020	0.05°	Daily
Leaf Area Index		Satellite	Jan 2004 – Dec 2020	0.05°	Daily
Fraction of absorbed photosynthetically active radiation		Satellite	Jan 2004 – Dec 2020	0.05°	Daily
Soil Wetness Index (root zone)		Satellite	Jan 1992 – Dec 2020	0.1°	Daily
Precipitation		In situ	Jan 1982 – Dec 2020	1°	Monthly
T2m		Re-analysis	Jan 1979 – Oct 2020	0.1°	Monthly

<b>Spatial Coverage:</b>	<b>Europe</b>
<b>Grid:</b>	<b>Regular Lat / Lon</b>
<b>Data Format:</b>	<b>CF compliant netCDF4</b>

Users are able to

- access via THREDDS
- download the entire cube (3TB) or subsets / subsamples
- analyse the data on the VM using the CM SAF R Toolbox (and other Tools, e.g. Jupyter Notebooks)  
→ work in progress

**11 May 2021**

**Information Day**

**May 2021 – August 2021**

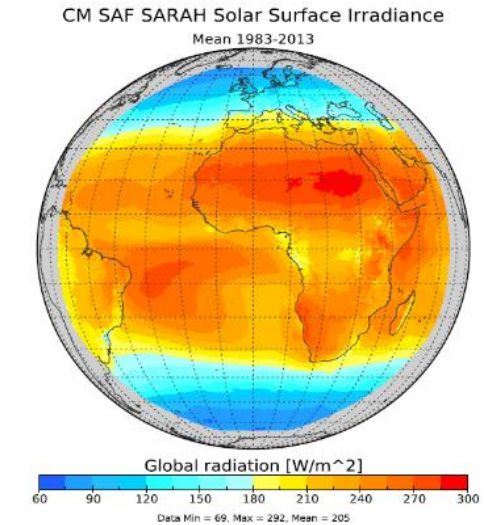
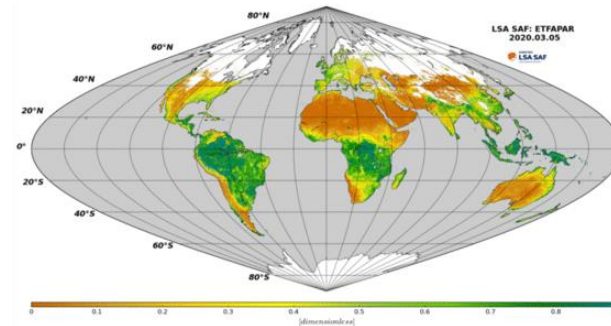
**Exploration Phase**

**SALGEE meeting November 2021**

**D&V session during**

# Creating the cube

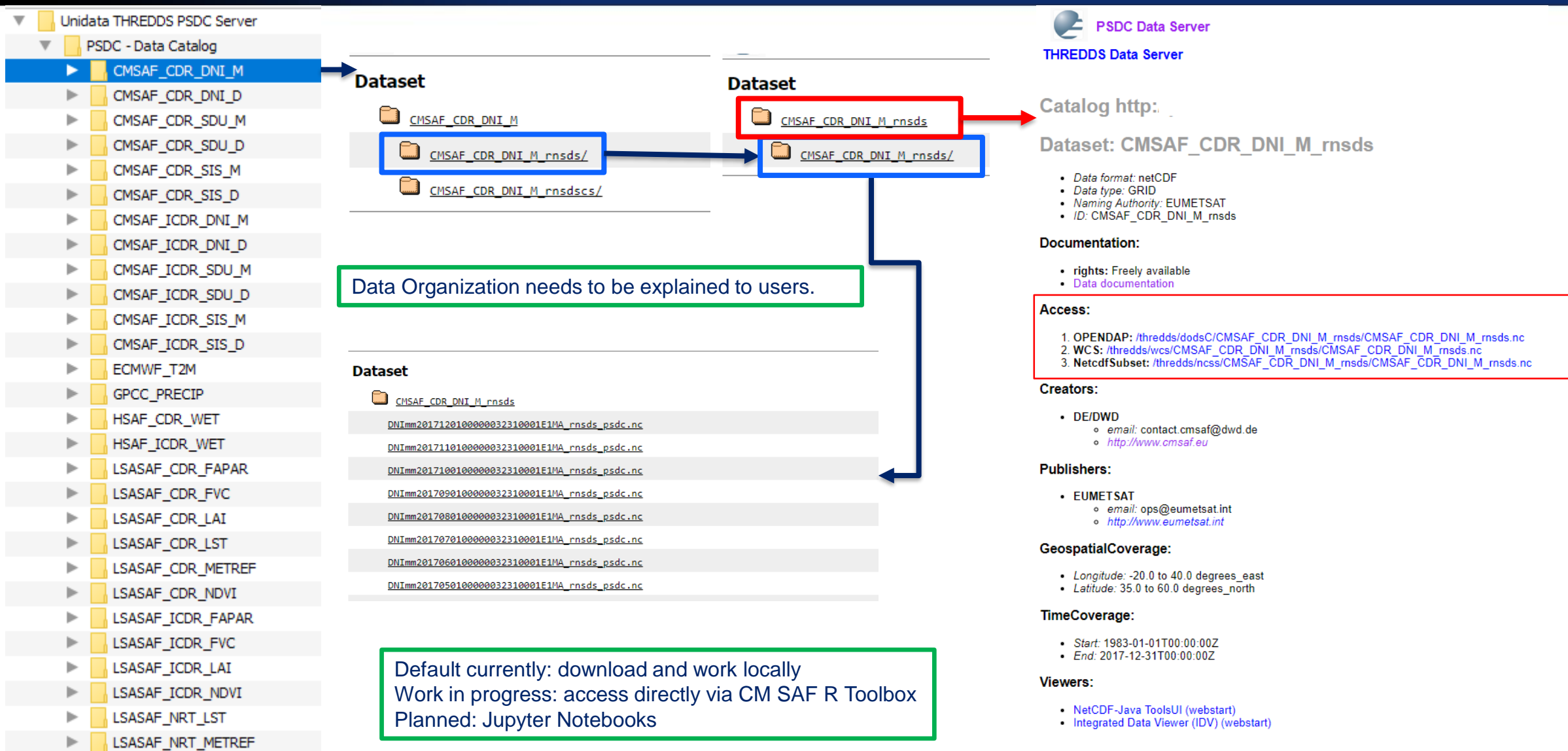
- Collecting the data from different providers
- Harmonize grid → re-gridding
  - Different methods available
  - Changing the data!
  - Impact on accuracy
  - Error measures and flags!!
- Harmonize metadata
  - Not trivial
  - cf-conventions helpful, but additional standard names needed
- Harmonize file format



- Issues to consider:
  - Data are changed while re-gridding
    - Documentation not strictly applicable
    - Who is the provider of the data? EUMETSAT or the SAF?
  - ...



# Accessing the D&V Cube

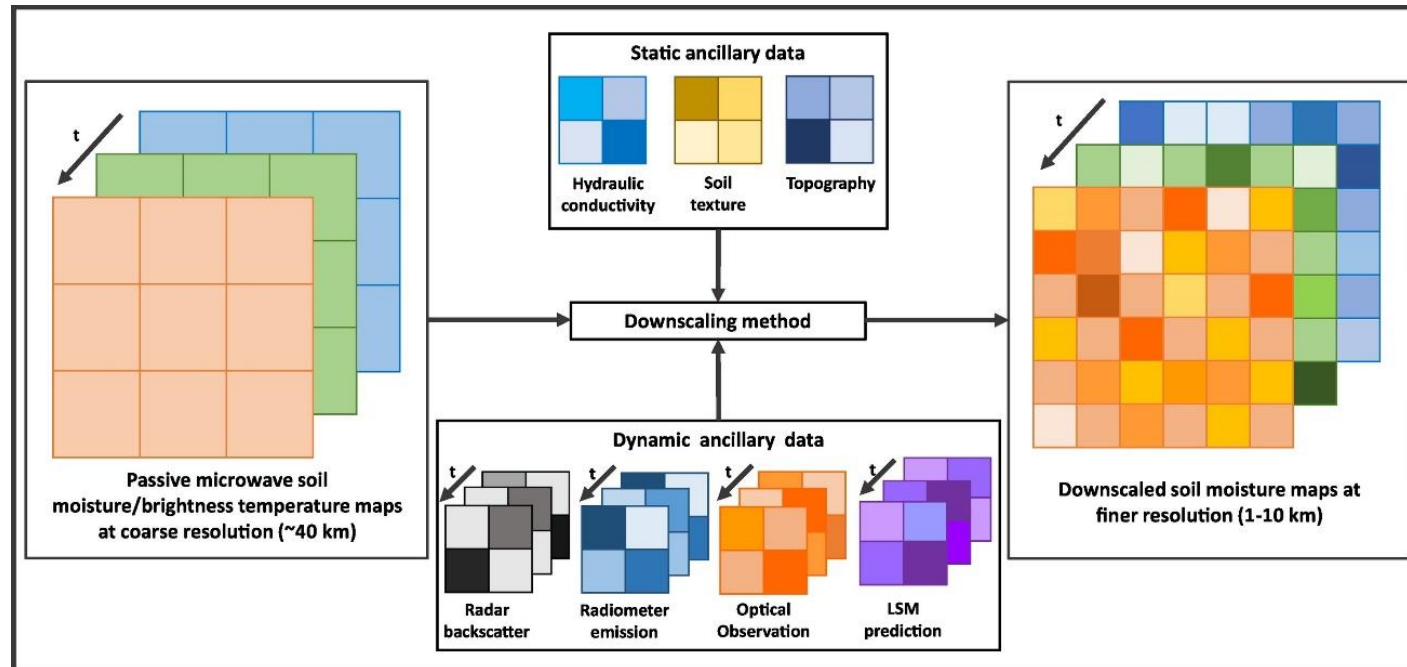


# The Exploration Phase

- Cube Information Page
- Information Day: well attended
- Live-Touch Points
- Exchange with other Cube Explorers
- Get support from data experts

# Example Application: Downscaling Soil Moisture

**Agricultural and hydrological applications would benefit from SM with a sub-kilometer spatial resolution and daily revisit time**



**Idea:**

**Combine coarse resolution SM products and high resolution ancillary data, which drive/influence SM to get a high resolution SM.**

**Goal:**

**Downscale SSI SM from 25km to 5km spatial resolution**

**Dorigo et al. 2017 (*Remote Sens. Environ*)**

**Sabaghy et al. 2018 (*Remote Sens. Environ*)**

Courtesy: Luca Zappa, TU Vienna

# Example Application: Downscaling Soil Moisture

DATASET	Spatial res	Temporal res	Start date	End date	Source
Global radiation	0.05°	Daily	2018-01-01	2020-12-01	EUMETSAT DC
Direct normal solar radiation	0.05°	Daily	2018-01-01	2020-12-01	EUMETSAT DC
LAI	0.05°	Daily	2016-01-01	2020-12-31	EUMETSAT DC
Land cover (% of level 1 CLC)	100 m → 0.05°	Daily	2018		CLC
SM (combined, v05.2)	0.25°	~Daily	1978	2019-12-31	CCI

**Datasets (predictors) used to feed and train the Random Forest regression**

Courtesy: Luca Zappa, TU Vienna



# Status & Outlook

- Still issues around data access via THREDDS
- Tutorials on accessing the D&V Cube using Python, R-based tools are being made available
- **Collect user feedback**
- **Discuss applications with subject matter experts**
- Continue the Exploration Phase
- Further cubes for other application areas
  - Atmospheric Composition
  - Marine Applications
  - ....

# Participating in the Exploration Phase

- D&V Cube Page (moodle course): <https://training.eumetsat.int>

The screenshot shows the Moodle course page for 'Land Applications'. The 'Courses' menu is highlighted with a red circle. The 'Land Applications' category is also highlighted with a red circle. Below this, the 'Enrol in the Exploration phase' page is shown. The page has a header with 'Home', 'Courses', 'Events', 'Groups', and 'Centres of Excellence'. The main content area is titled 'Administration' and includes a search bar for 'Land Applications [LAND]'. Below the search bar, there is a table of 'Data Cube Information page' with columns for 'Variable', 'Satellite', 'Temporal Coverage', 'Spatial Resolution', and 'Temporal Resolution'. The table lists various variables like Global Radiation, Direct normal Solar Radiation, Sunshine Duration, Land Surface Temperature, Reference Evapotranspiration, NDVI, and Global Vegetation Index. To the right of the table, there is a text box titled 'Enrol in the Exploration phase' with instructions on how to join the exploration phase. The instructions are divided into two steps: '1. Step' (create an account) and '2. Step' (use Enrol me with key provided during the Info day). The enrolment key is 'explored&vcube21'. The page also mentions that users can un-enrol any time.

**1. Step**

- create an account

**2. Step**

- use Enrol me with key provided during the Info day

Enrolment key: **explored&vcube21**

You can un-enrol any time

or e-mail [training@eumetsat.int](mailto:training@eumetsat.int)