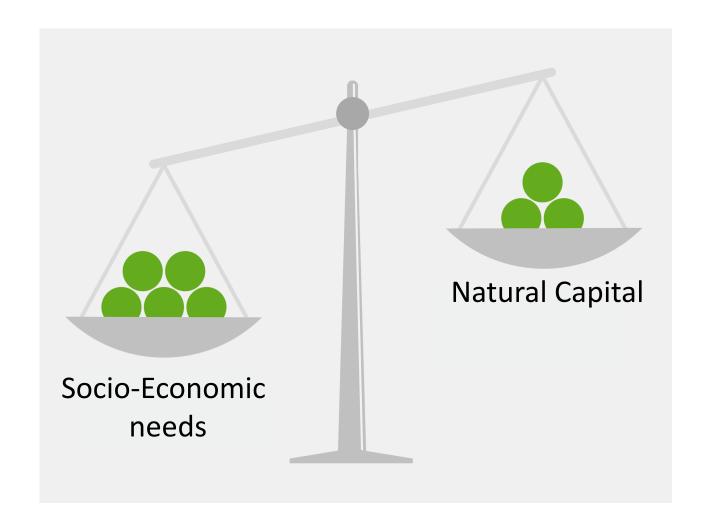
# The Swiss Data Cube: EO Data Science for Sustainable Development

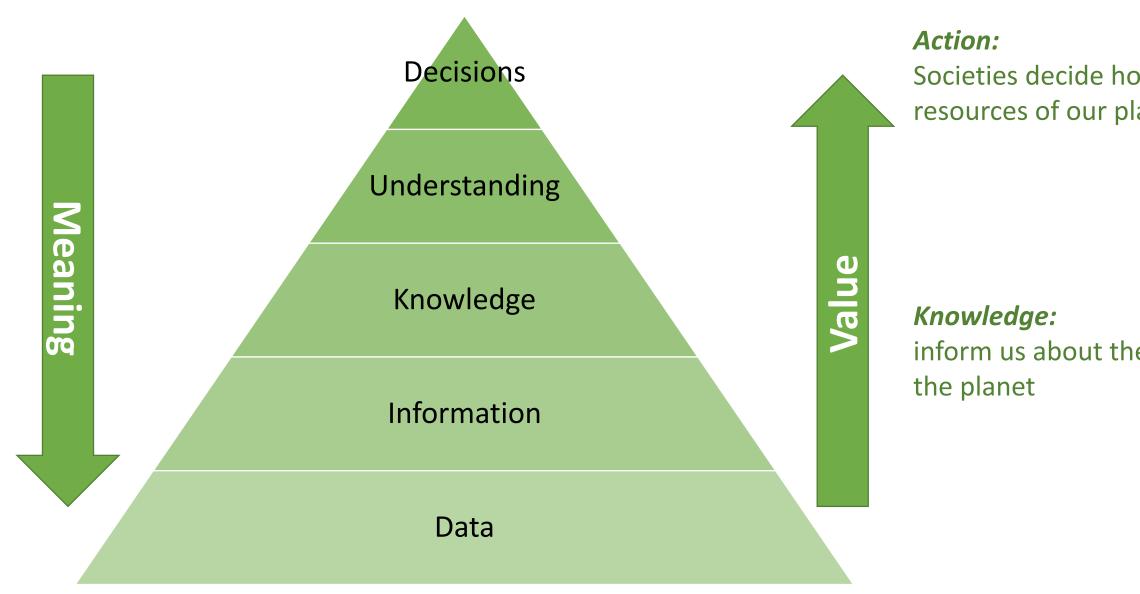


# The key to sustainable development...

...is achieving a balance between the exploitation of natural resources for socioeconomic development, and conserving ecosystem services that are critical to everyone's wellbeing and livelihoods.



# The Challenge: Evidence-based policy-making

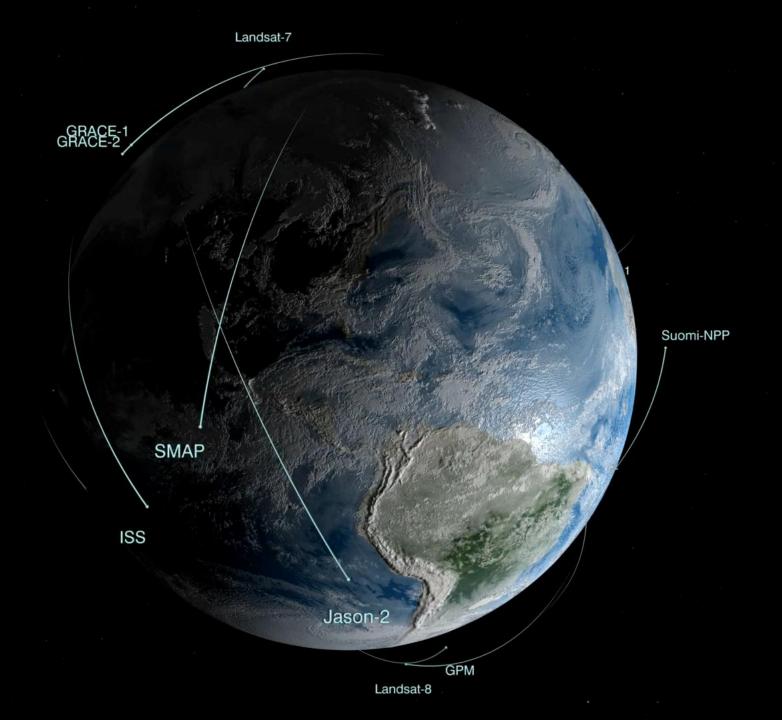


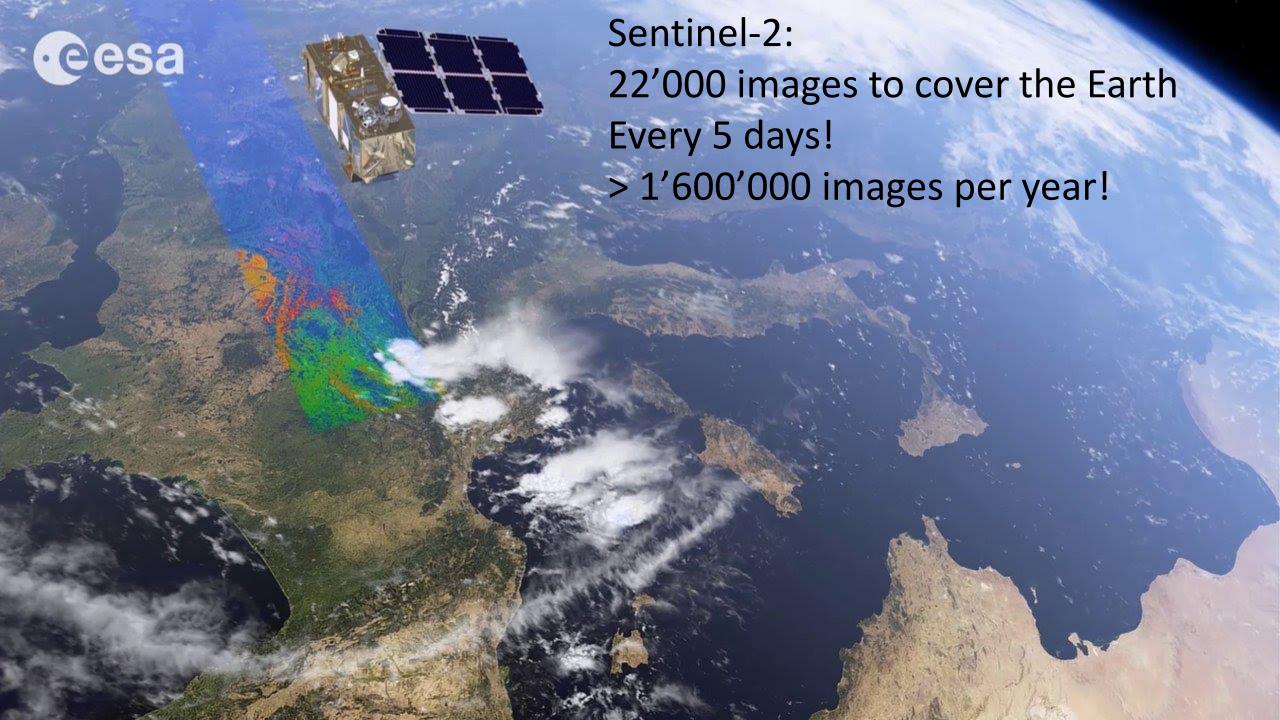
Societies decide how to use resources of our planet

inform us about the limits of

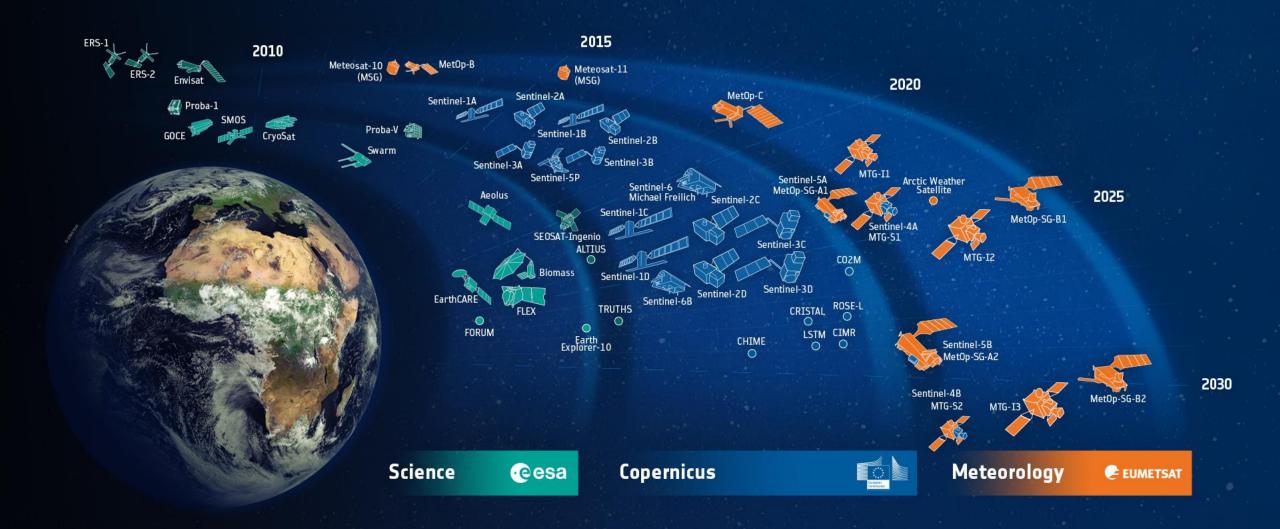
To better understand these changes...

Our planet is under continuous observation from satellites





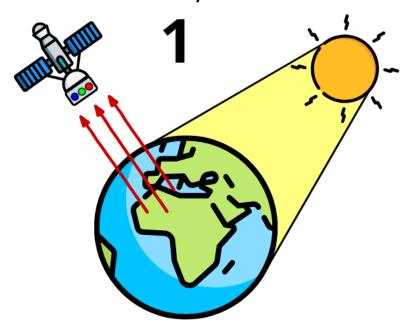
Copernicus – Europe's Eye on Earth Largest EO data provider in the World: 250TB/day data Archive: 250PB of data stored, daily growth rate: 220TB



# **Types of satellites**

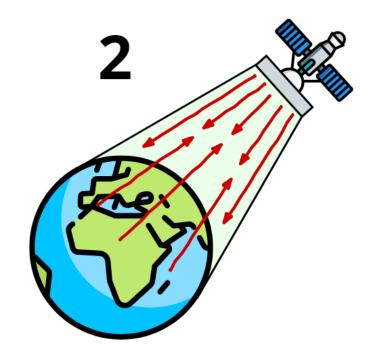


Passive radiation from sunlight (Sentinel-2&-3, Landsat, MODIS...)



Active transmit radiation

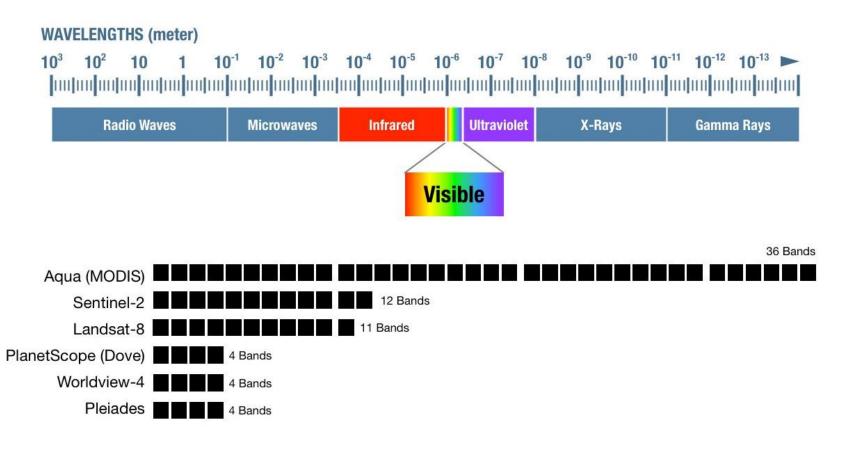
(Sentinel-1&-6, Jason, Tandem-X...)



## Not just photos...

The number of bands of radiation in the electromagnetic spectrum that a satellite can sample (visible, infrared, ultraviolet, microwave, x-ray, etc.)

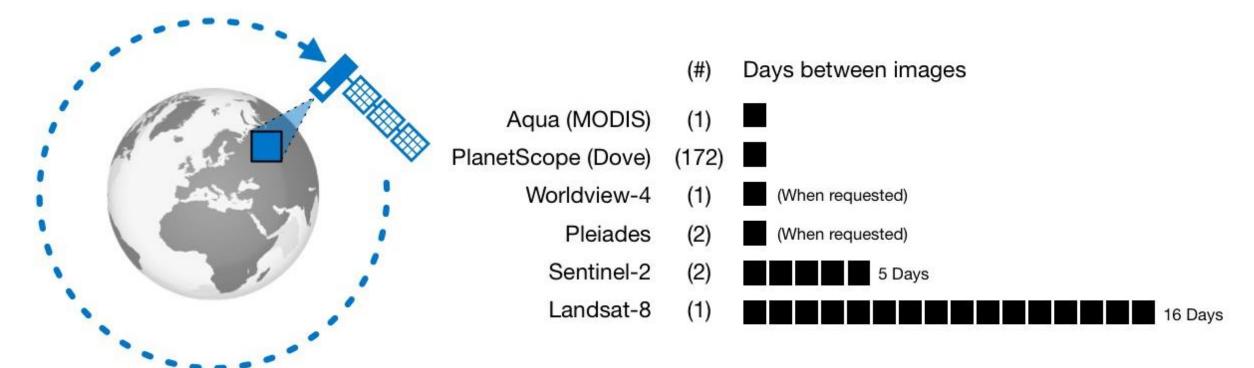
### Electromagnetic Radiation Spectrum





## **Temporal resolution**

Temporal resolution varies by satellite and describes the time it takes for an individual satellite to orbit and revisit a specific area. Some satellites operate as a constellation with multiple satellites working together to increase their global coverage daily.

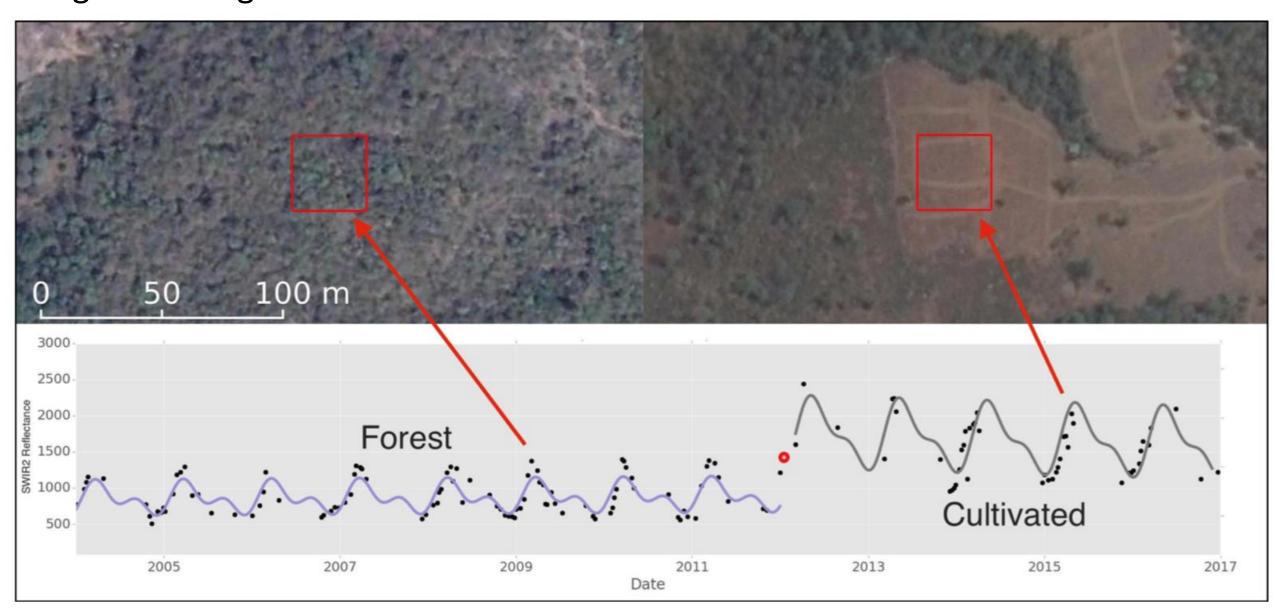






# Temporal resolution...

...A game changer



# Monitoring the Earth in (near) real-time is now a reality!





# Big Data Challenges in EO Science...

- Data Volume
- Data Variety/Heterogeneity (e.g., sensors, spatial-temporal-spectral resolution)
- It requires scientific knowledge to understand what data is needed... optical (which resolution?), radar (which type?)
- It is hard to access or download
- It is hard to prepare... atmospheric correction, grid formats, pixel alignment, speckle filtering
- It requires capacity building and training



How to transform this large amount of data in useful information and support evidencebased decisions?

# Traditional remote sensing product process

# Petabyte heirarchical archive:



Millions of individual scenes. Tape store accessed by robot.













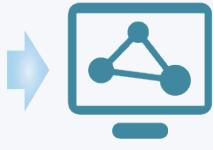


Search catalogue order scenes.

Identify footprint of product in space or time.

Client requests product.





Orthorectification calibration, cloud masking, atmospheric correction, mosaicing.

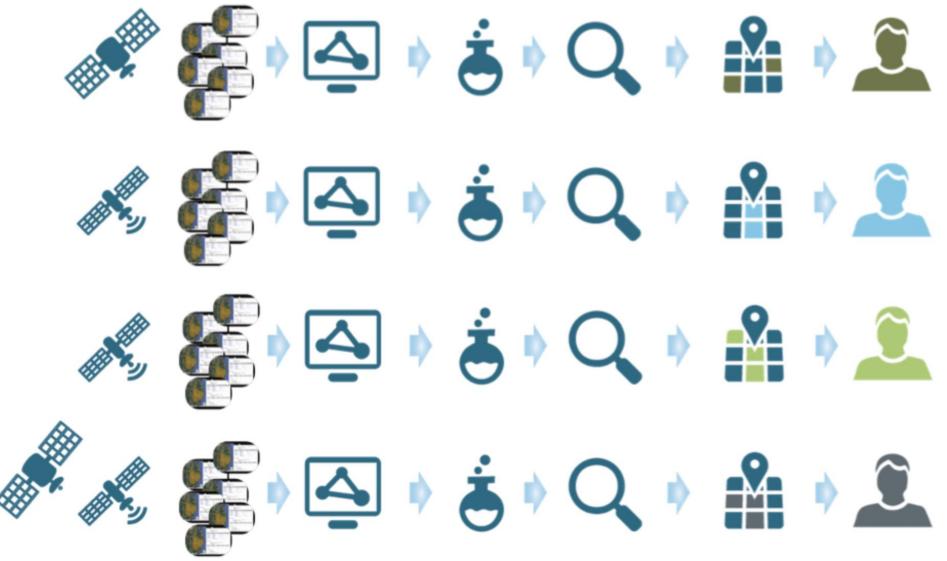


Feature extraction, algorithm application spectral unmixing.

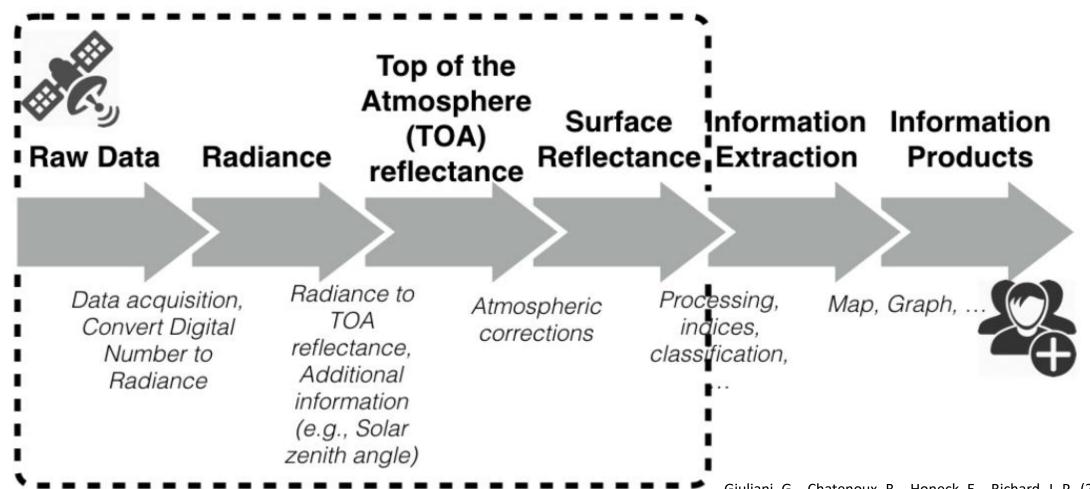


Product packaging and delivery.

# Various users needs the same data for various purposes... ... investing in the entire value chain!



# Analysis Ready Data are key to reduce the burden on EO data users! Spending more time in analyzing data than searching & pre-processing data...

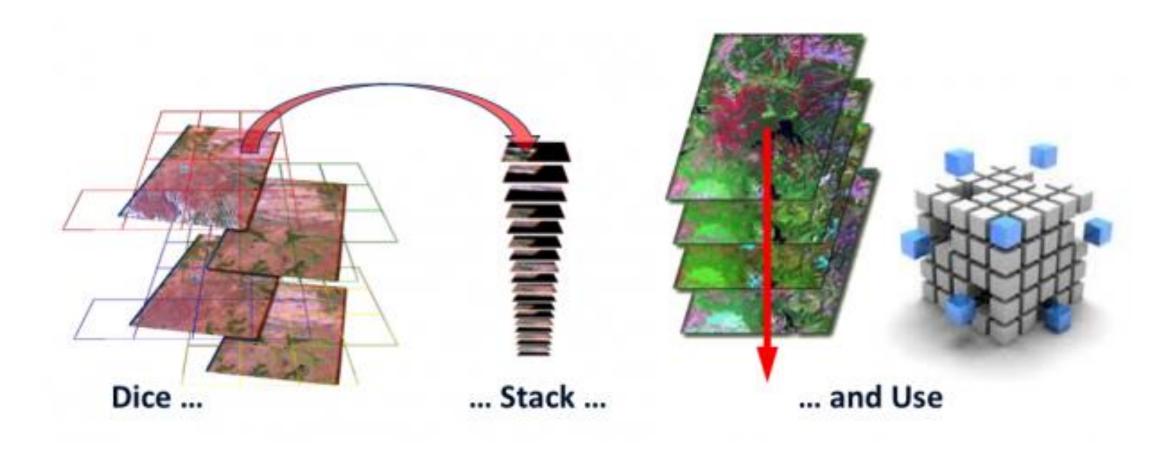


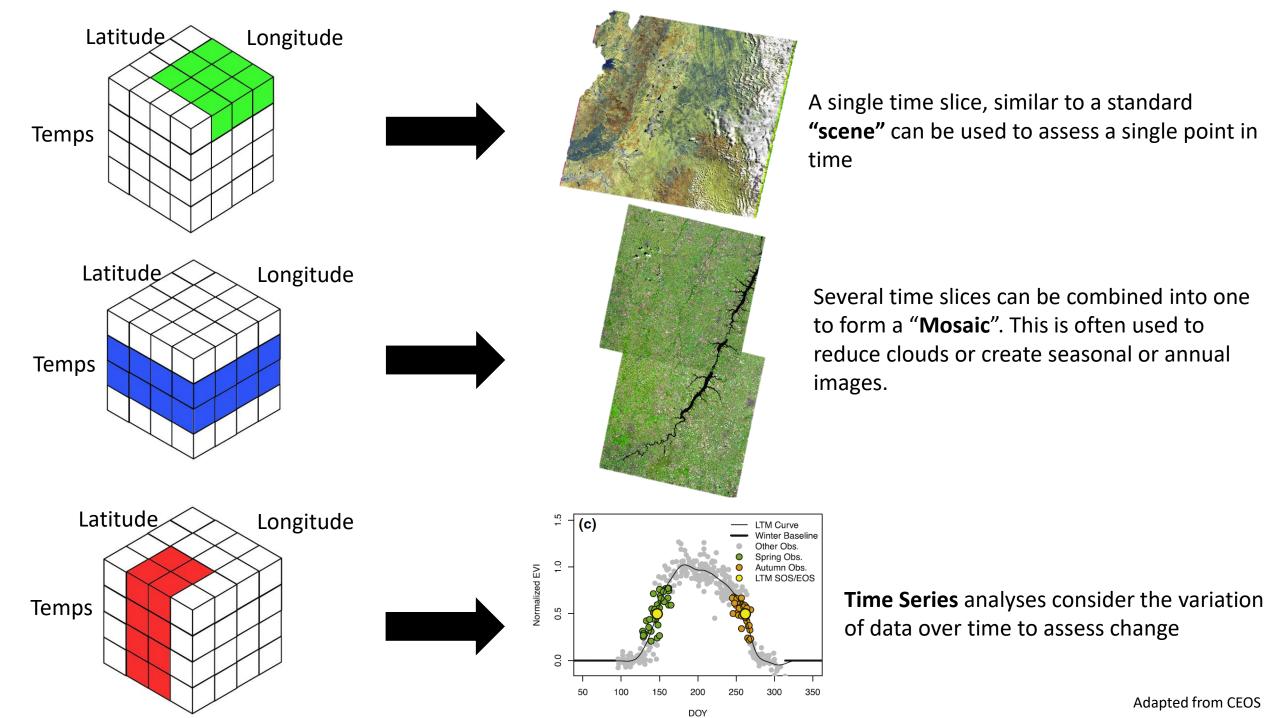
Analysis Ready Data production

Giuliani G., Chatenoux B., Honeck E., Richard J.-P. (2018) Towards Sentinel 2 Analysis Ready Data: A Swiss Data Cube Perspective. *In: IGARSS 2018 - IEEE International Geoscience and Remote Sensing Symposium. Valencia (Spain). p. 8668-8671* 

## What are Data Cubes?

Time-series multi-dimensional (space, time, data type) stack of spatially aligned pixels used for efficient and effective access and analysis.





Governments have **national and international reporting commitments** and obligations as well as national environmental programs.

They all **need information that is synoptic, consistent, spatially explicit**, sufficiently detailed to **capture anthropogenic impacts**, and national in scope.

EO Data Cubes can provide the **long baseline required** to determine trends, define present, and inform future. This can fit these interests to inform programs and communities.



2020 | Info Environnement Recherche

### Plan directeur de recherche Environnement 2021-2024

Domaines et thèmes de recherche prioritaires





Confederaziun svizra

Office fédéral de l'environnement OFEV

### Thèmes de recherche prioritaires 2021-2024

### Perspectives d'avenir: relevé de données et modélisation fondée sur celles-ci

- 1.1 Étude et modélisation quantitatives de l'incidence des grandes tendances globales sur l'environne-
- 1.2 Modélisation de tendances et de perspectives pour divers domaines environnementaux, à partir de données rétrospectives, en particulier de séries chronologiques spatialement distribuées.
- 1.3 Élaboration de méthodes pour la prise en compte des aspects écologiques et régionaux dans l'élaboration d'une vue d'ensemble systémique servant de base à la prise de décision.
- 1.4 Optimisation des réseaux et des méthodes de mesure, en particulier en ce qui concerne la combinaison de la télédétection et des mesures in situ, le développement des méthodes de télédétection des changements, l'analyse des opportunités et des risques des nouvelles méthodes d'observation environnementale.
- 1.3 Étaboration de bases pour le monitoring systématique à long terme des polluants persistants et des métaux lourds dans les organismes et les milieux environnementaux,
- 1.6 Détermination des facteurs pertinents pour l'examen des indicateurs utilisés actuellement dans le cadre des comptes rendus sur l'environnement et mise au point d'un système de veille (radar) pour les questions environnementales qui devraient être étudiées à l'avenir.
- 1.7 Développement de la bibliothèque de données environnementales et de la science ouverte («open science»): analyse des effets des stratégies de libre accès («open access») et de transparence des données gouvernementales («open government data») sur la recherche dans le secteur environnemental.

### 2 Diffusion d'informations, communication et mutation des valeurs

2.1 Évaluation et optimisation du système de rapports sur l'environnement pour chaque média (supports imprimés, voie électronique) et public cible, et étude de la manière dont les groupes cibles pertinents peuvent être identifiés et atteints.

- 2.2 Élaboration de méthodes d'agrégation et de regroupement des informations pour une communication optimale des données environnementales.
- 2.3 Élaboration d'approches pour communiquer les impacts environnementaux invisibles, intangibles et imperceptibles, tels que la perte de biodiversité ou la micropollution.
- 2.4 Analyses de l'efficacité des mesures de communication (médias sociaux, campagnes, etc. et élaboration d'un modèle d'impact pour la communication sur les questions environnementales complexes.
- .5 Enregistrement des paramètres démographiques pertinents (connaissances, attitudes, etc.) pour une communication axée sur les groupes cibles.
- .6 Étude des possibilités d'influencer la mutation des valeurs en vue d'une transformation sociale.

### Promotion des compétences environnementales chez les professionnels

- 3.1 Identification des facteurs pertinents pour l'acquisition et l'application des compétences environnementales chez les professionnels.
- 3.2 Mesure de l'efficacité des actions choisies dans les domaines professionnels pertinents en matière environnementale.
- 3.3 Étude de la contribution possible de la numérisation à la promotion des compétences environnementales.

#### 4 Transformation numérique

- 4.1 Étude des opportunités et des risques de la numérisation en termes d'impact sur l'environnement et les ressources, et identification des conditions-cadres nécessaires pour que la numérisation puisse exercer un effet majoritairement positif sur l'environnement.
- 4.2 Étude du potentiel de la transformation numérique de la société et de l'économie pour l'observation de l'environnement (monitoring, programme Copernicus), l'exécution de la législation environnementale et la communication environnementale.

## **SWISS DATA CUBE in Numbers**

A unique Analysis Ready Data Archive

**37** years

FROM 1984 to 2021

**7** sensors

LANDSAT 5/7/8; SENTINEL-1/2 A-B **Updated every week!** 

**10-30-90**m

**PIXEL RESOLUTION** 

> 450 million

**PIXELS** 

> 1000 billion

**OBSERVATIONS** 

~ **15000** images

**INGESTED** 

~**7** TB

**ANALYSIS READY DATA** 

# ~10 millions CHF

**COST OF DATA WITHOUT OPEN DATA ACCESS POLICY** 

Giuliani G., Chatenoux B., De Bono A., Rodila D., Richard J.-P., Allenbach K., Dao H., Peduzzi P. (2017) Building an Earth Observations Data Cube: lessons learned from the Swiss Data Cube (SDC) on generating Analysis Ready Data (ARD). Big Earth Data 1(1):1-18









# Open Data Cube - https://www.opendatacube.org





About

Overview

Install

**Applications** 

Resources

News

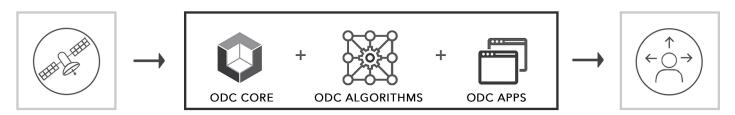
Contact

### Open Data Cube

The Open Data Cube (ODC) is an Open Source Geospatial Data Management and Analysis Software project that helps you harness the power of Satellite data. At its core, the ODC is a set of Python libraries and PostgreSQL database that helps you work with geospatial raster data. See our GitHub repository here>>.

The ODC seeks to increase the value and impact of global Earth observation satellite data by providing an open and freely accessible exploitation architecture. The ODC project seeks to foster a community to develop, sustain, and grow the technology and the breadth and depth of its applications for societal benefit.

### ODC ECOSYSTEM GEOSPATIAL DATA MANAGEMENT & ANALYSIS SOFTWARE



### SATELLITE DATA

### **Examples:**

- Landsat
- Sentinel
- MODIS

#### FLEXIBLE DEPLOYMENT

Depending on your application, the Open Data Cube can be deployed on HPC, Cloud, and local installations. Typical installations run on Llnux, MacOS, and Windows.

#### **INFORMED DECISIONS**

#### Examples:

- Deforestation
- Water Quality
- Illegal Mining

Learn More











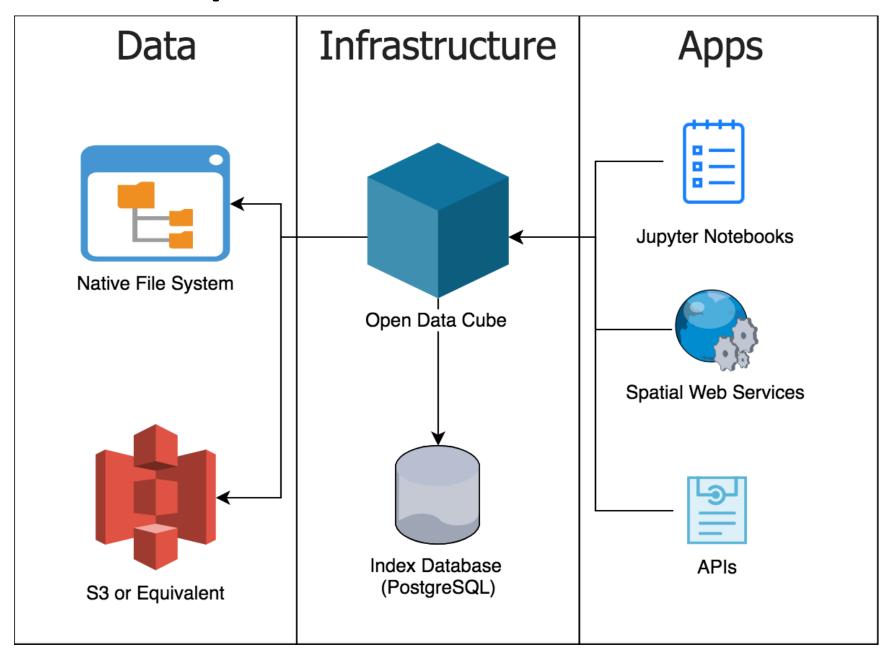


# What is the Open Data Cube?



# A Python Library that facilitates working with raster data

# **Technical components**



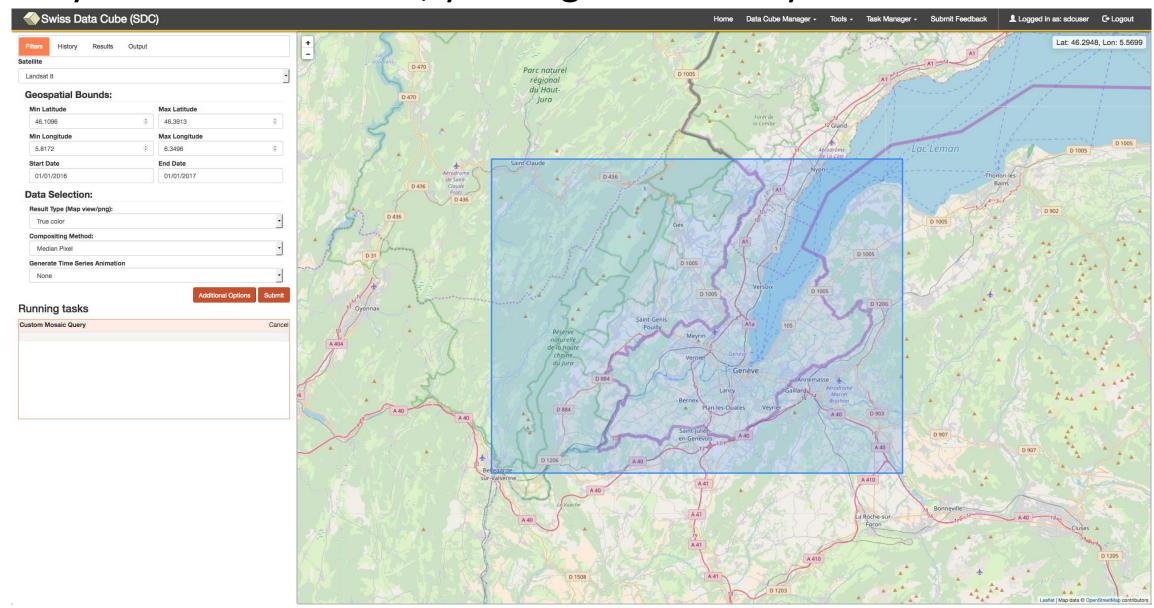


### In a nutshell:

- Data
- An Index
- Software

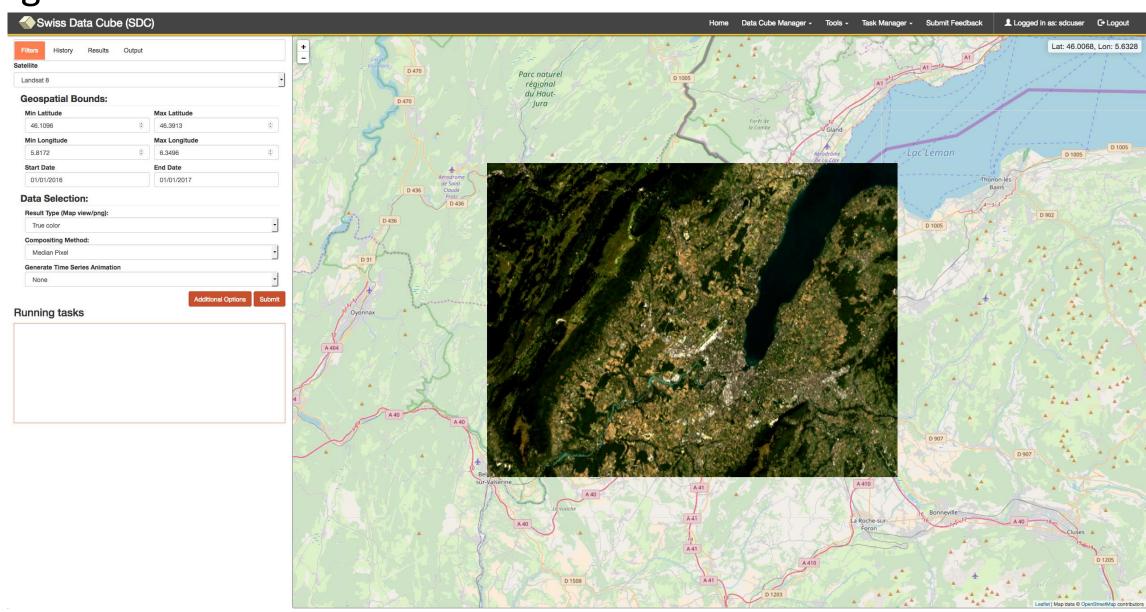
### How to use the Swiss Data Cube?

Define your area of interest, your algorithm and your time-frame



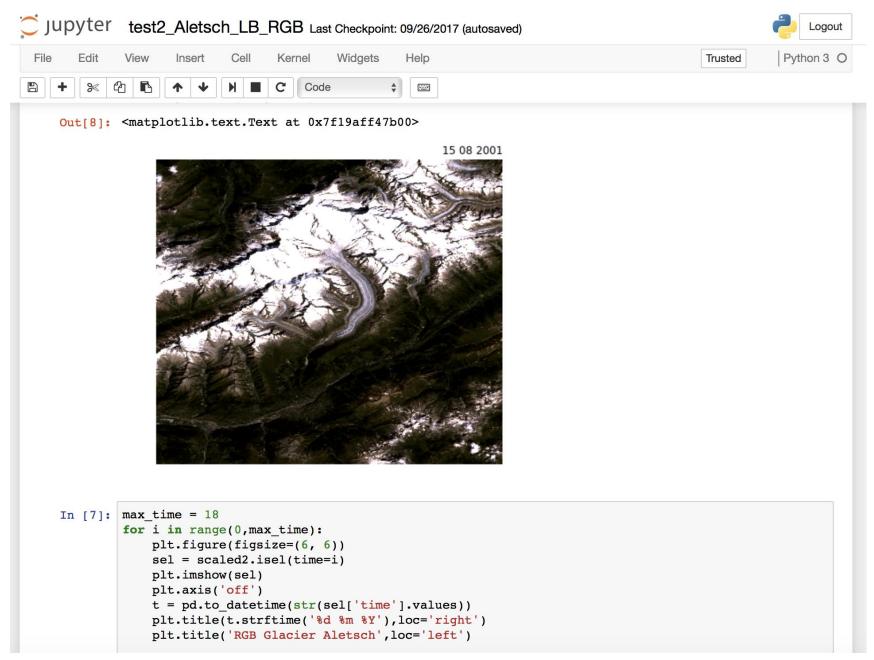
## How to use the Swiss Data Cube?

# And get the result!



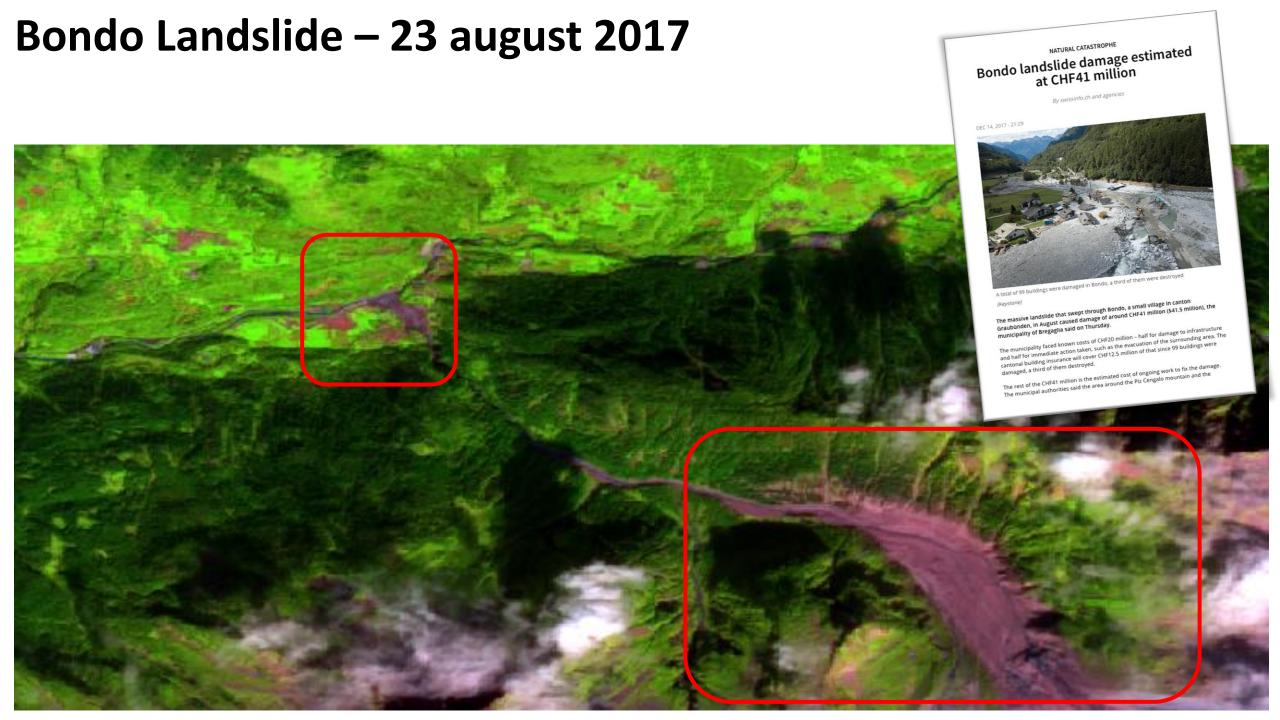
# Or use the Python API

Jupyter Notebook

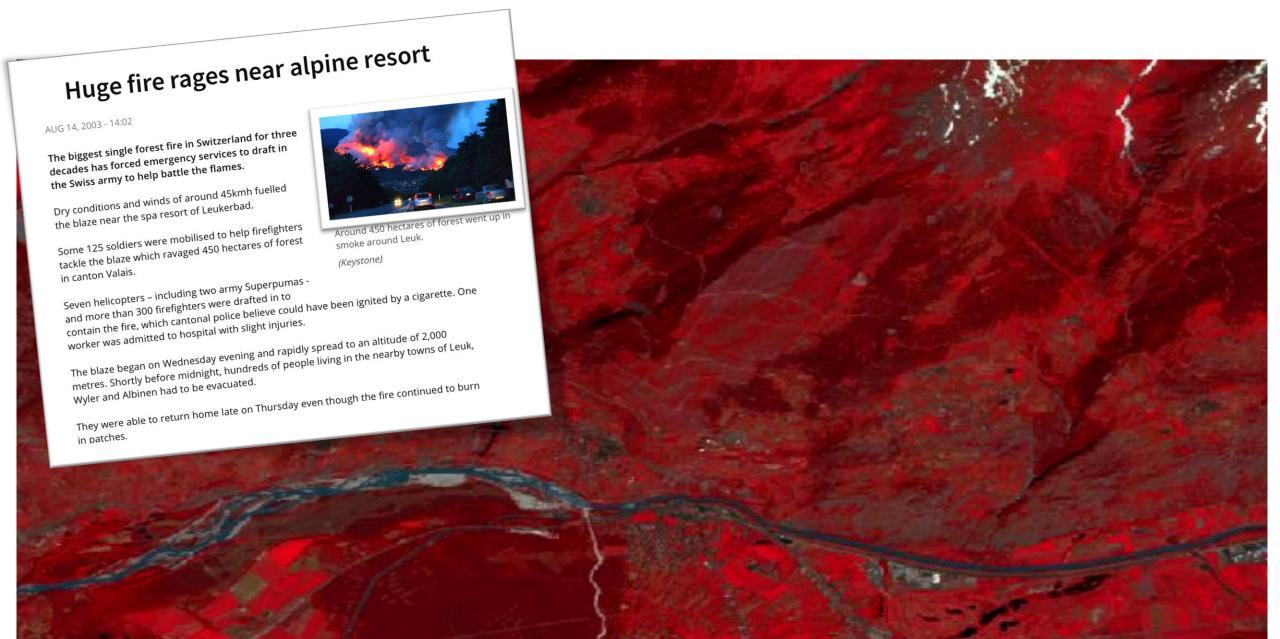


# Covering more than Switzerland...



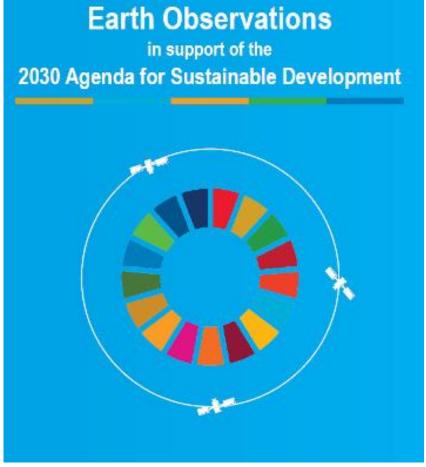


# Leuk forest fire – 13 august 2003



# Earth Observations is useful for monitoring SDG's



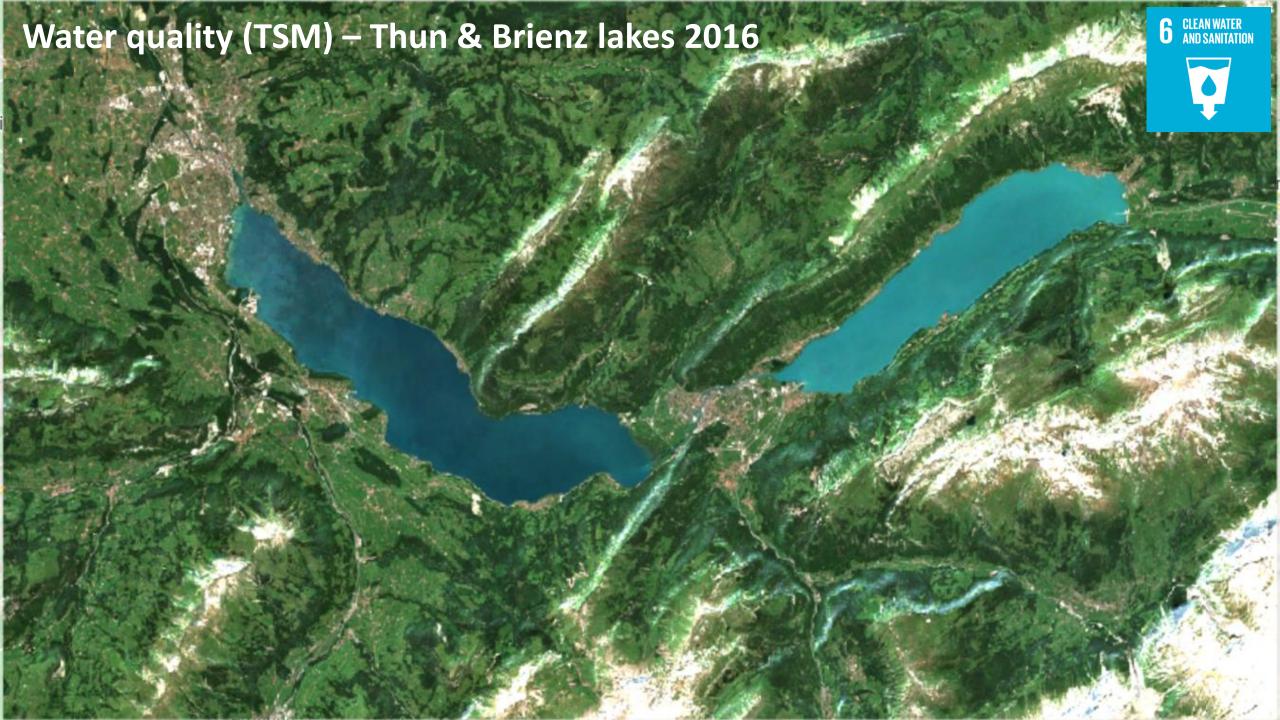


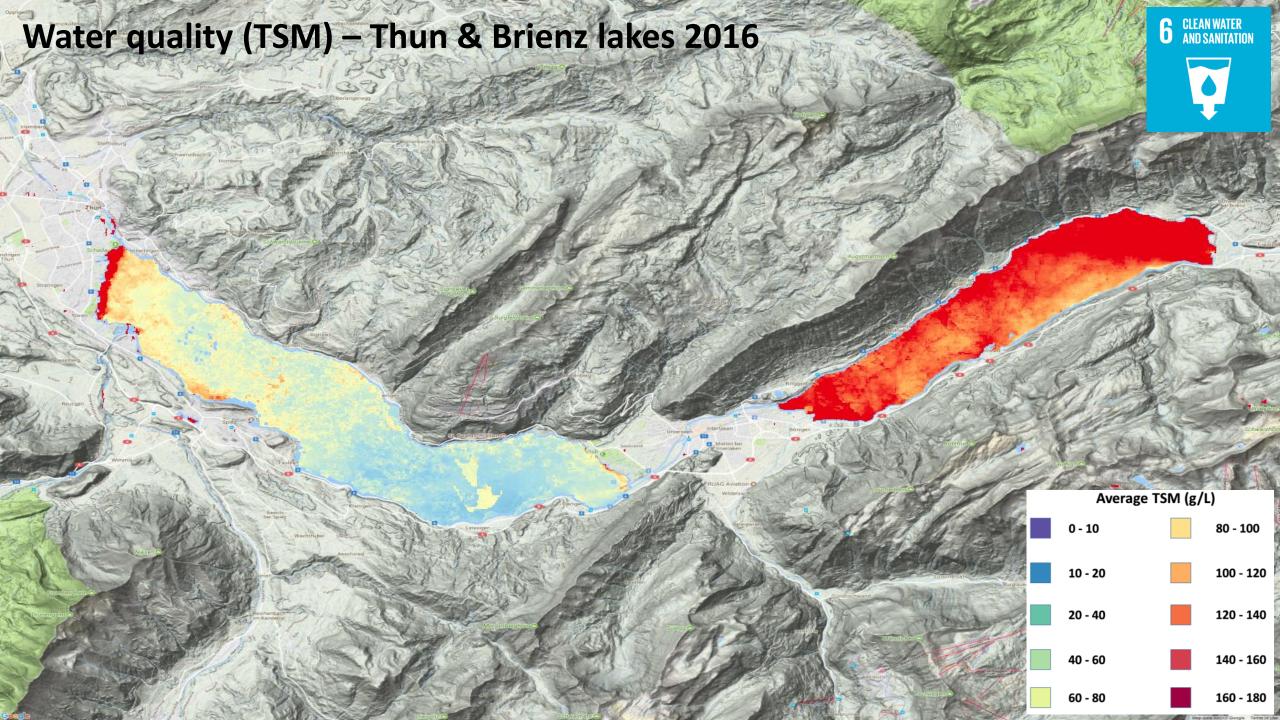
http://earthobservations.org/geo\_sdgs.php

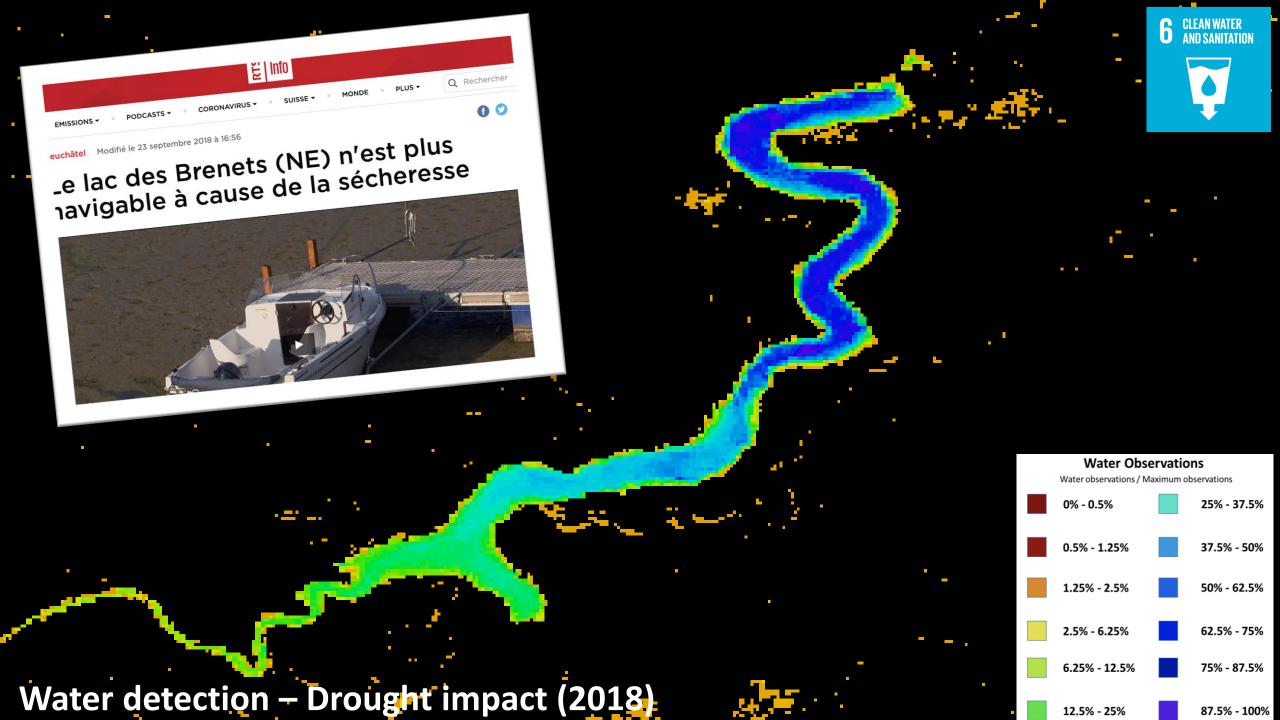
EARTH OBSERVATION AND GEOSPATIAL INFORMATION LINKAGES TO SDG GOALS, TARGETS AND INDICATORS



Target Contribute to progress on the Target, not necessarily the Indicator										Goal	Indicator  Direct measure or indirect  support to the Indicator					
							1.4	1.5	1	No poverty	1.4.2					
						2.3	2.4	2.c	2	Zero hunger	2.4.1					
					3.3	3.4	3.9	3.d	3	Good health and well-being	3.9.1					
									4	Quality education						
								5.a	5	Gender equality	5.a.1					
		6.1	6.3	6.4	6.5	6.6	6.a	6.b	6	Clean water and sanitation	6.3.1	6.3.2	6.4.2	6.5.1	6.6.1	
					7.2	7.3	7.a	7.b	7	Affordable and clean energy	7.1.1					
								8.4	8	Decent work and economic growth						
					9.1	9.4	9.5	9.a	9	Industry, innovation and infrastructure	9.1.1	9.4.1				
						10.6	10.7	10.a	10	Reduced inequalities						
	11.1	11.3	11.4	11.5	11.6	11.7	11.b	11.c	11	Sustainable cities and communities	11.1.1	11.2.1	11.3.1	11.6.2	11.7.1	
				12.2	12.4	12.8	12.a	12.b	12	Responsible consumption and production	12.a.1					
					13.1	13.2	13.3	13.b	13	Climate action	13.1.1					
		14.1	14.2	14.3	14.4	14.6	14.7	14.a	14	Life below water	14.3.1	14.4.1	14.5.1			
	15.1	15.2	15.3	15.4	15.5	15.7	15.8	15.9	15	Life on land	15.1.1	15.2.1	15.3.1	15.4.1	15.4.2	
								16.8	16	Peace, justice and strong institutions						
17.2	17.3	17.6	17.7	17.8	17.9	17.16	17.17	17.18	17	Partnerships for the goals	17.6.1	17.18.1				





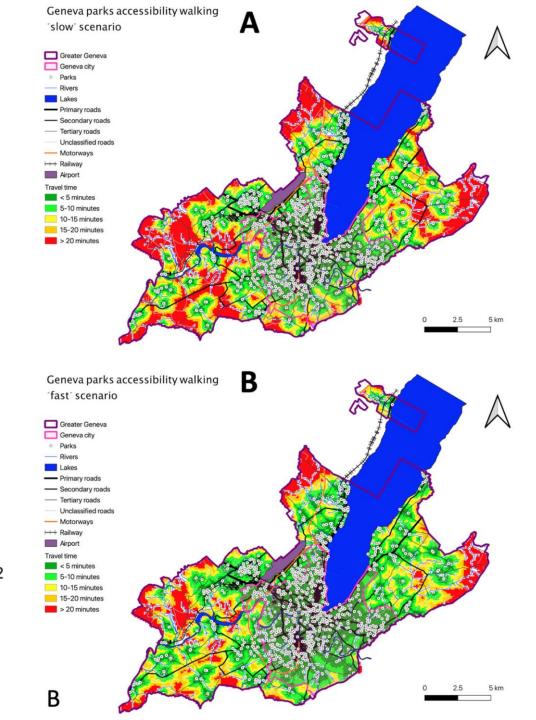


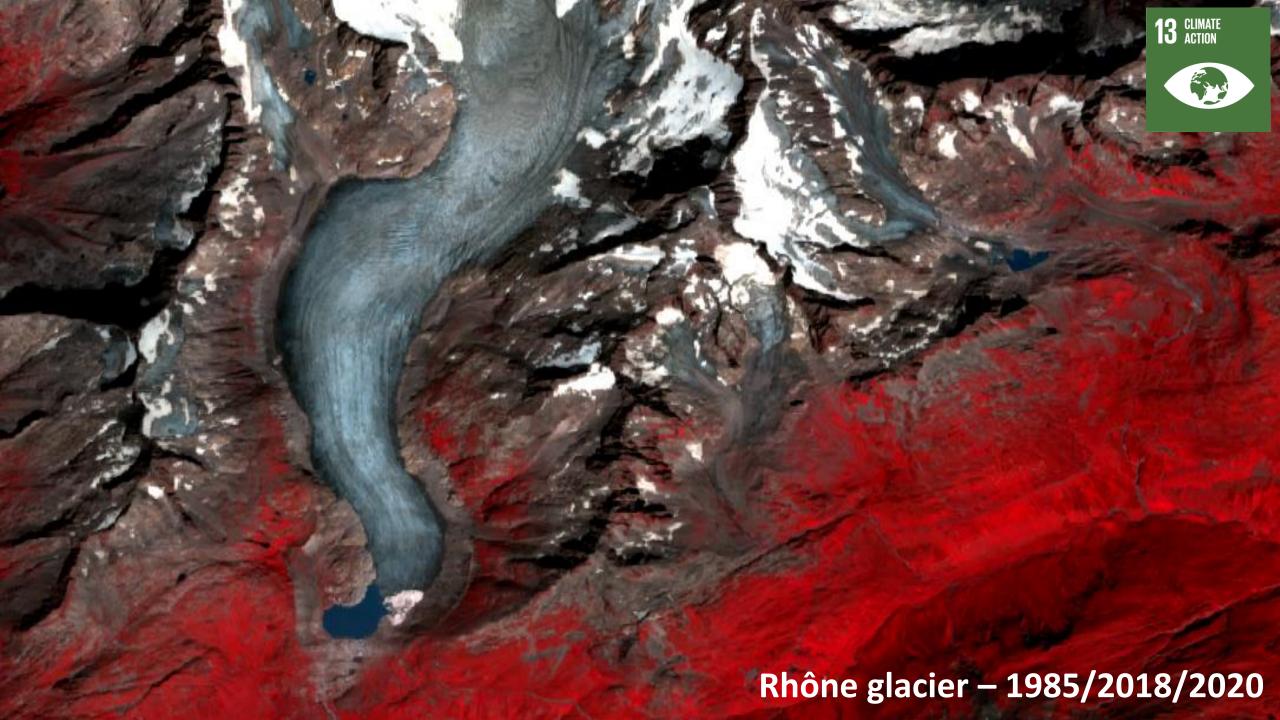


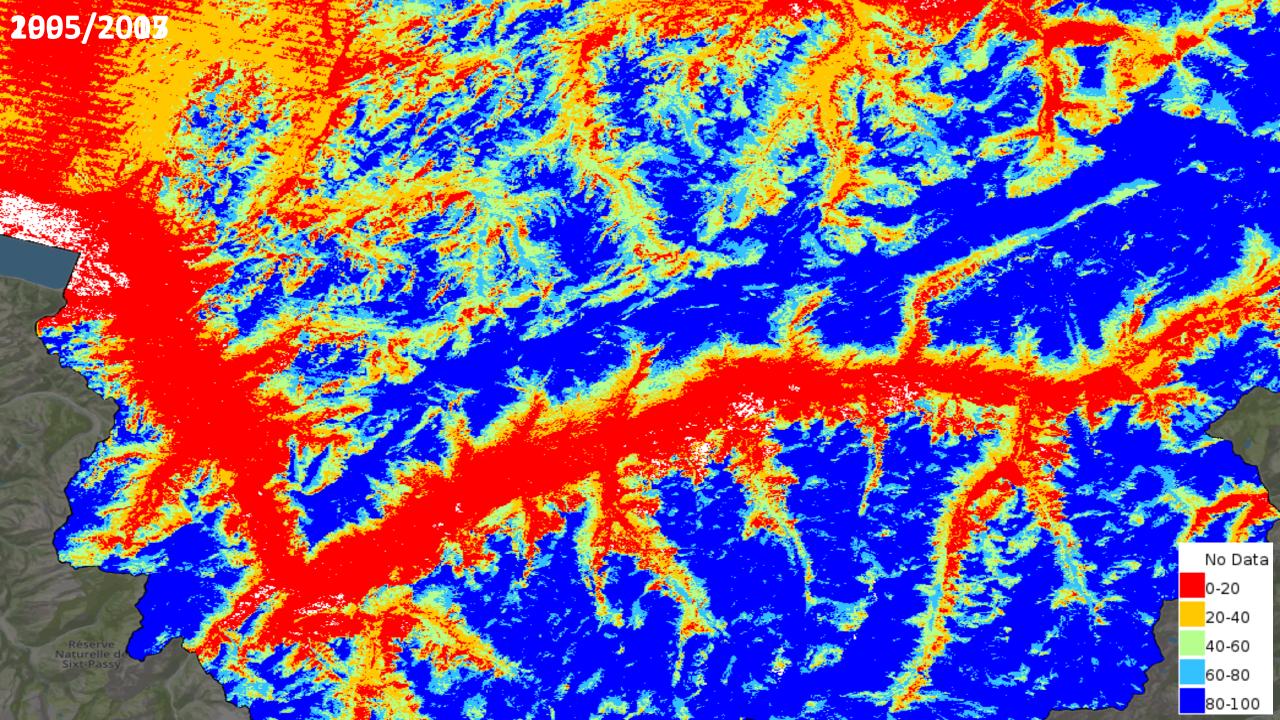
# Modelling Accessibility to Urban Green Areas Using Open Earth Observations Data: A Novel Approach to Support the Urban SDG in Four European Cities

by Cregory Giuliani <sup>1,2,\*</sup> D, Ekkehard Petri <sup>3</sup> D, Eduard Interwies <sup>4</sup> D, Veronika Vysna <sup>3</sup> D, Yaniss Guigoz <sup>1,2,5</sup> D, Nicolas Ray <sup>1,5</sup> D and In Dickie <sup>6</sup> D

- Institute for Environmental Sciences, University of Geneva, Bd Carl-Vogt 66, CH-1205 Geneva, Switzerland
- United Nations Environment Programme, GRID-Geneva, 11 chemin des Anémones, CH-1211 Châtelaine, Switzerland
- <sup>3</sup> European Commission—Eurostat, 5 Rue Alphonse Weicker, L-2721 Luxembourg, Luxembourg
- <sup>4</sup> Intersus—Sustainability Services, Chodowieckistr. 2, 10405 Berlin, Germany
- GeoHealth Group, Institute of Global Health, University of Geneva, 9 chemin des Mines, CH-1202 Geneva, Switzerland
- <sup>6</sup> Eftec—Economics for the Environment, 4 City Road, London EC1Y 2AA, UK
- \* Author to whom correspondence should be addressed.



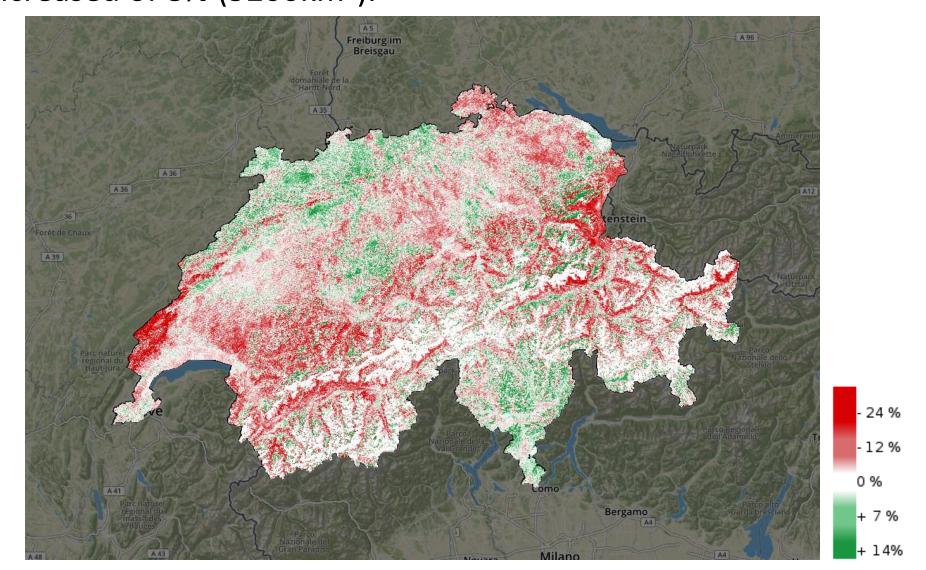




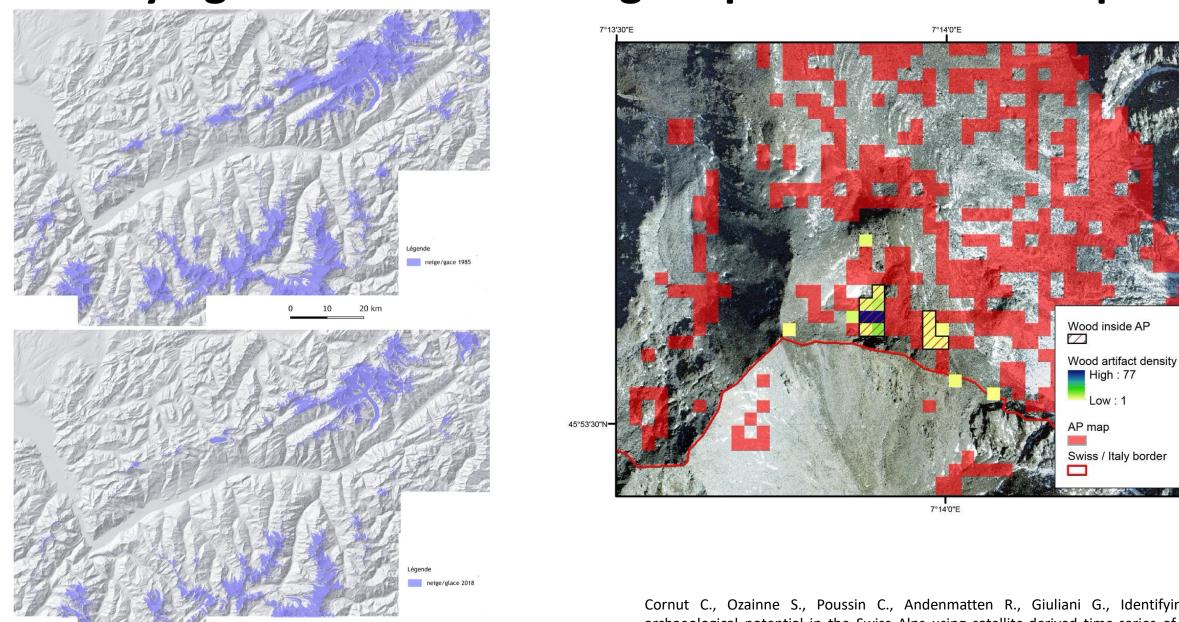
## Snow Cover changes for the last 20 years!

Permanent snow area decreased of 4% (2100km<sup>2</sup>) while surface where snow is rare has increased of 8% (5200km<sup>2</sup>).





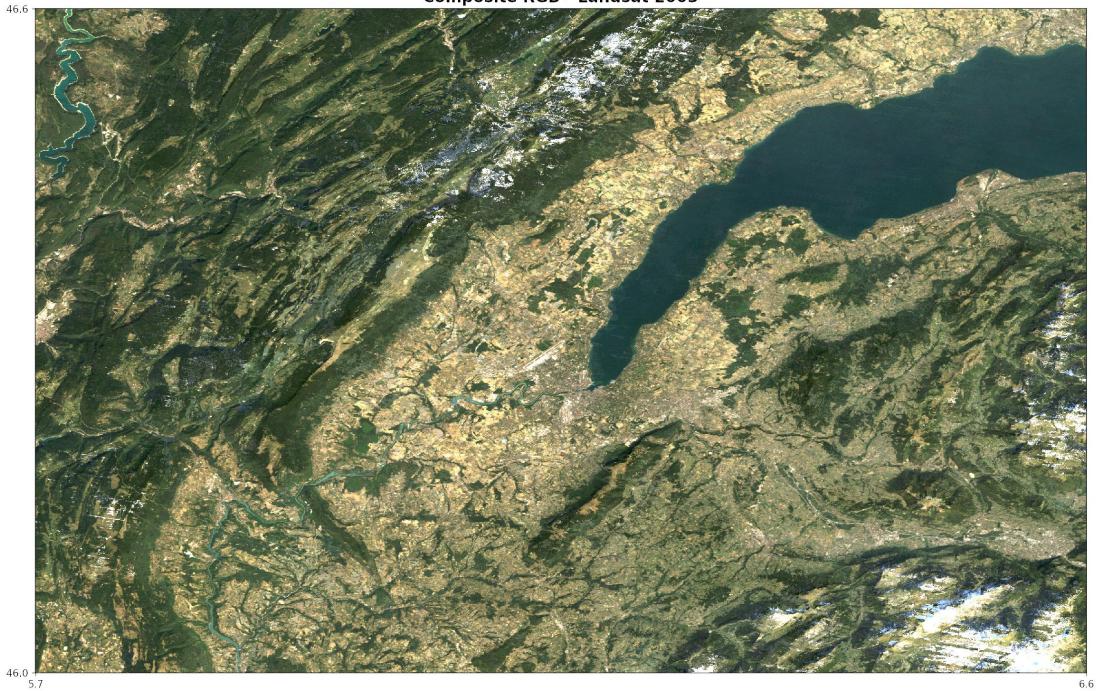
## Identifying areas of archaeological potential in the Alps

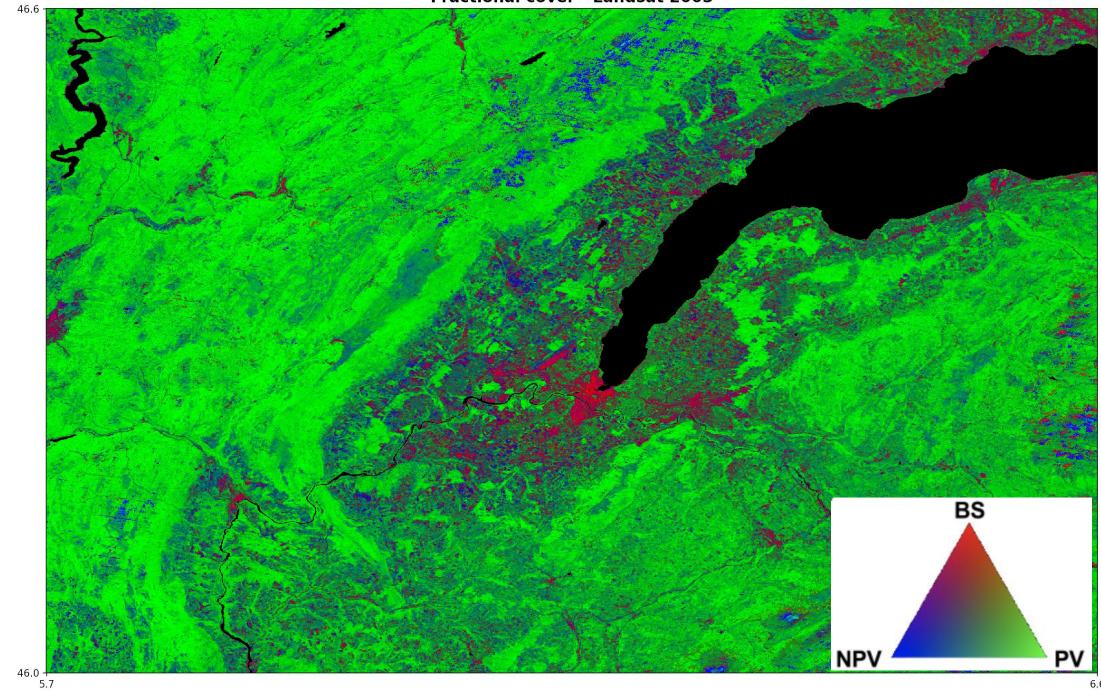


Cornut C., Ozainne S., Poussin C., Andenmatten R., Giuliani G., Identifying areas of archaeological potential in the Swiss Alps using satellite-derived time-series of snow cover estimates, Submitted to Remote Sensing Applications: Society and Environment

Low: 1

-45°53'30"N

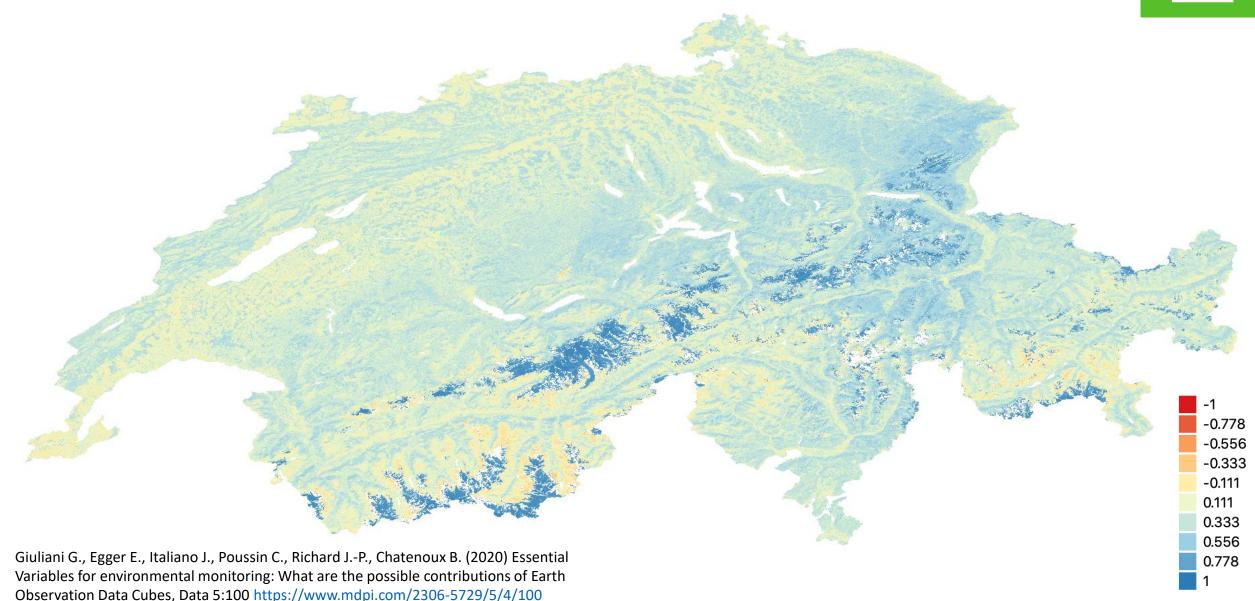




## Normalized Difference Water Index (NDWI)...

Water content of vegetation (2014 vs. 2003)

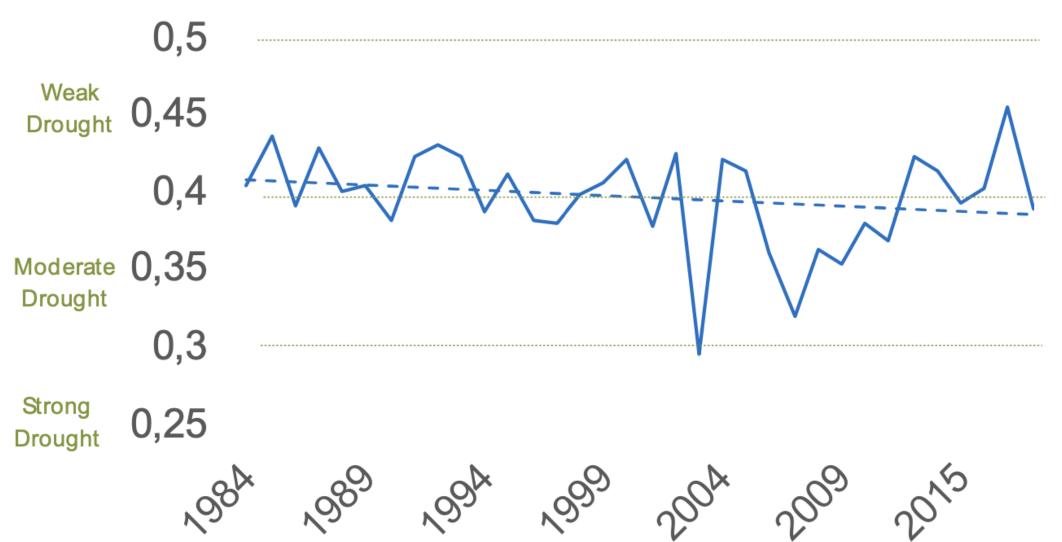




## Trends in vegetation water content

15 LIFE ON LAND

NDWI time-series from 35 years of Landsat observations – Annual mean

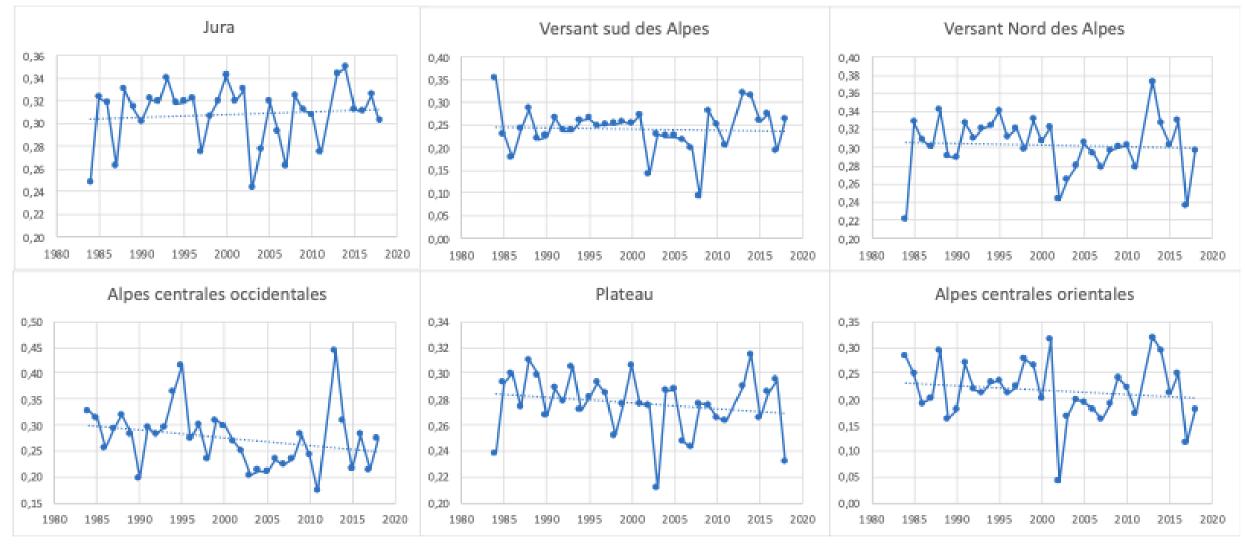


Poussin C., Massot A., Ginzler C., Weber D., Chatenoux B., Lacroix P., Piller T., Nguyen L., Giuliani G., Drying conditions in Switzerland - Indication from a 35-year Landsat trend analysis of vegetation water content estimates to support SDG15, *Submitted to Big Earth Data* 

## Trends in vegetation water content

Statistics by biogeographical zones – mean summer season

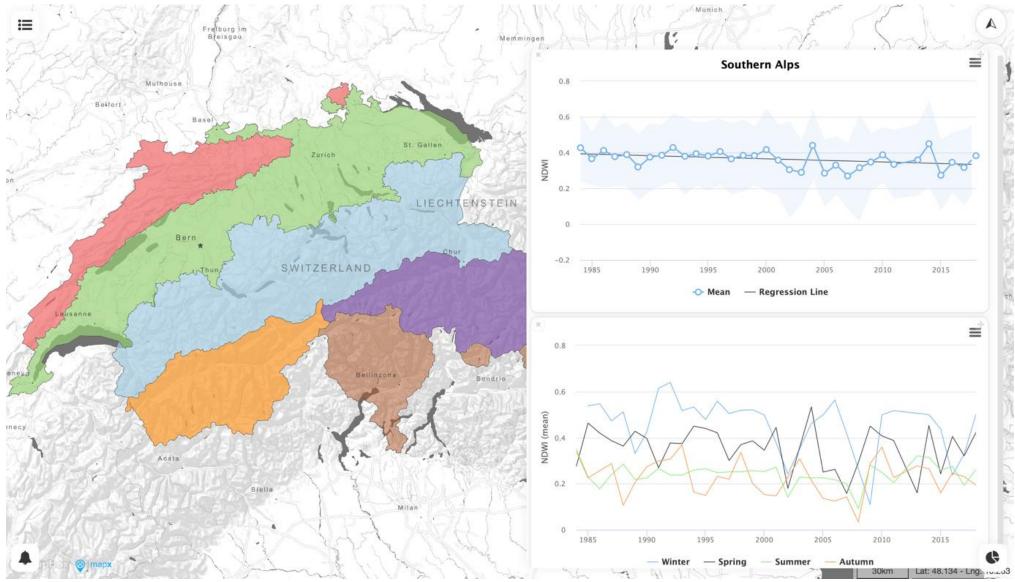




### Soon...

## A dedicated service/dashboard to follow trends by regions & cantons

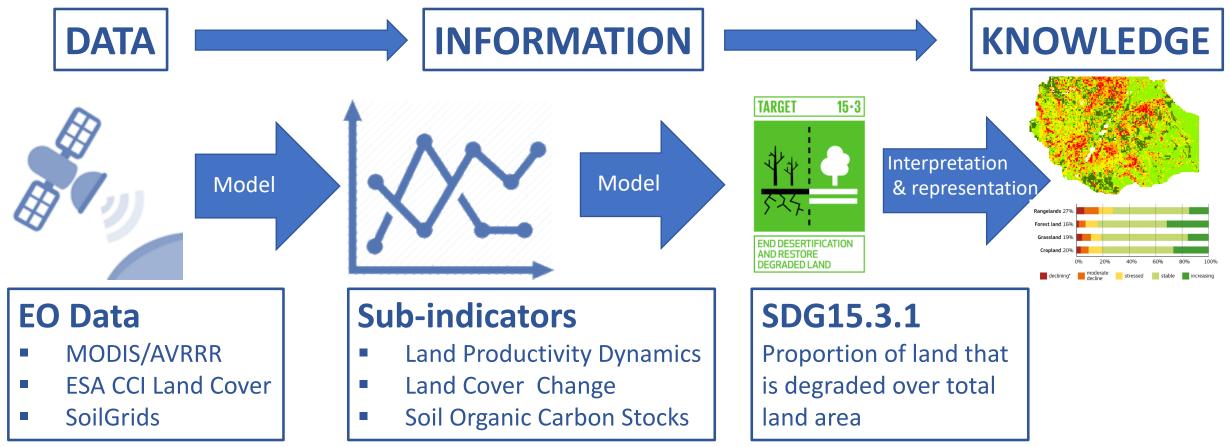




## SDG 15.3.1 Land Degradation...

...is undermining the well-being of 3.2 billion people (IPBES)



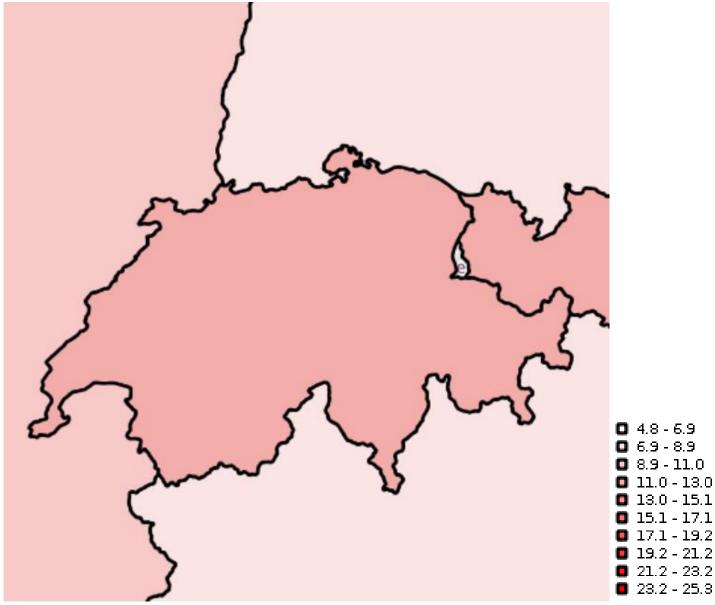


Giuliani G., Mazzetti P., Santoro M., Nativi S., Van Bemmelen J., Colangeli G., Lehmann A. (2020) Knowledge generation using satellite Earth Observations to support Sustainable Development Goals (SDG): a use case on Land Degradation, International Journal of Applied Earth Observation and Geoinformation 88:102068 https://doi.org/10.1016/j.jag.2020.102068

## Aggregated indicators...

... are not enough for public policy!



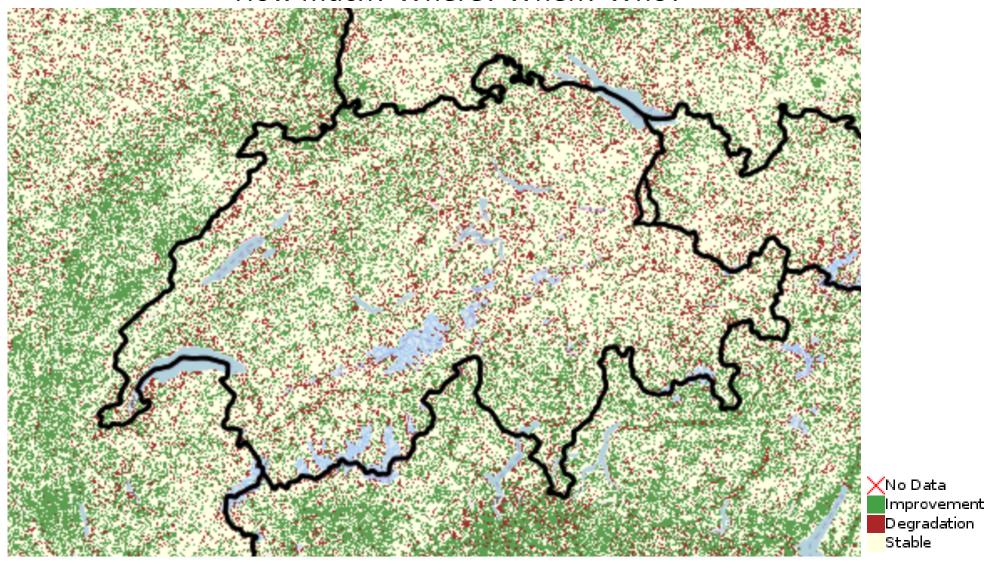


## Disaggregation of indicators...

## ... to capture spatial (maps) and temporal dynamics (graphs)

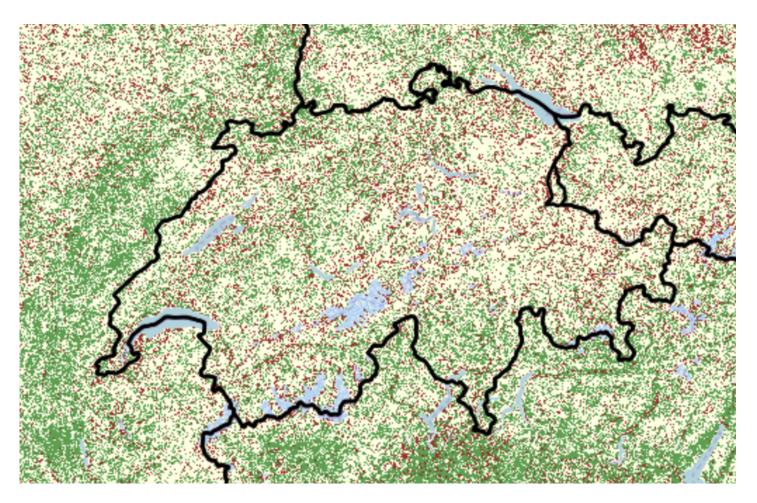


How much? Where? When? Who?



### SDG15.3.1 – Results from Switzerland





Official value: 4.7%

**SDC value: 9.7%** 

Official definition in Switzerland is based only on soil sealing and do not consider land productivity!

Do not comply with the official UN definition!

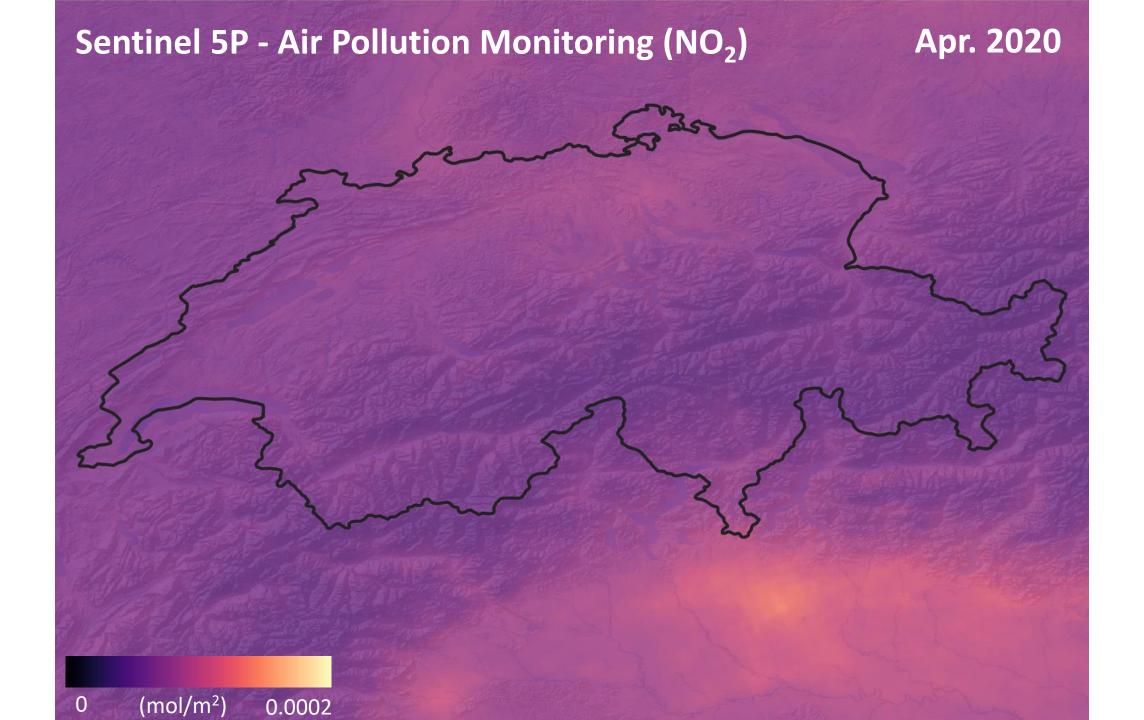
No data
Degradation
Stable
Improvement

Giuliani G., Chatenoux B., Benvenuti A., Lacroix P., Santoro M., Mazzetti P., Monitoring Land Degradation at national level using satellite EO time-series data to support SDG15 – Exploring the potentiation of Data Cube, Big Earth Data, https://doi.org/10.1080/20964471.2020.1711633

# Potential (other) applications

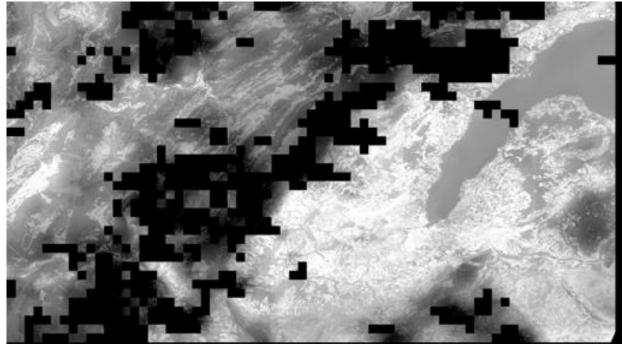
- Monitoring land cover change
- Glacier monitoring, ice extent mapping, snow cover monitoring
- Agricultural applications: crop monitoring, food security
- Vegetation and forest monitoring, parameter generation (chlorophyll concentration, carbon mass estimations)
- Water quality monitoring
- Flood mapping and management
- Urban mapping & monitoring





## Sentinel-2/Sentinel-3 Data fusion Land Surface Temperature





The black pixels represent locations with unreliable surface temperature measurements in the original, low-resolution LST map

## Implemented standards in the Swiss Data Cube

### Upstream services

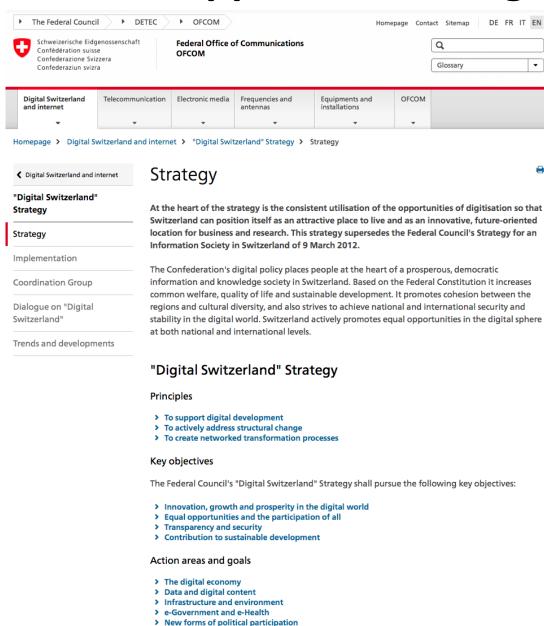
- Discovery: ISO19115-2 and ISO19139-2; OGC CSW, STAC (under evaluation)
- View & Download: OGC WMS & WCS
- Processing: Python API; OGC WPS (under test)

#### Downstream services

- Discovery: CSW; OpenSearch; OAI
- View: WMS with EO extension, WMTS, TMS, WMS-C, ncWMS
- Download: WCS with EO extension



## The SDC supports the « Digital Switzerland » strategy



Development of the knowledge-based society

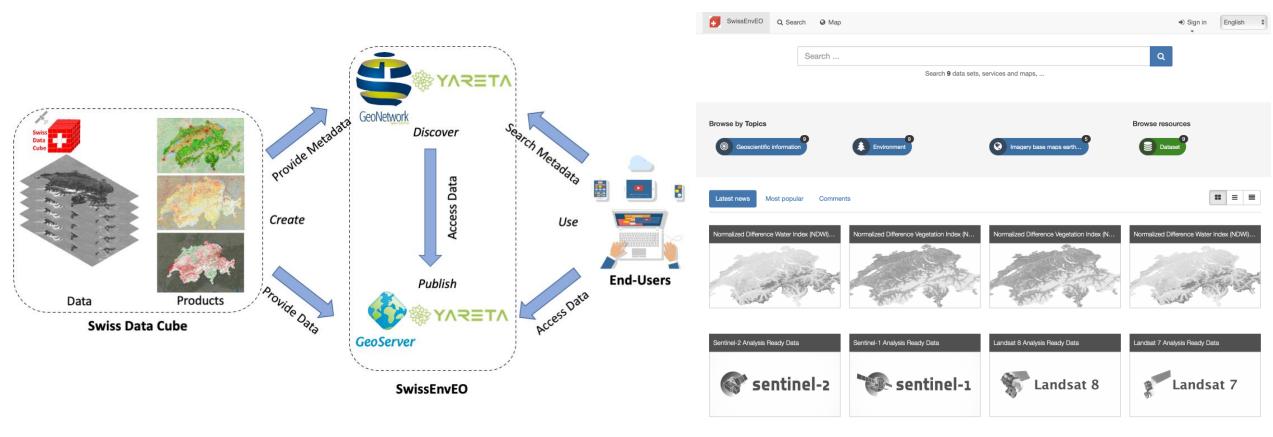
> Switzerland's international position

Security and trust

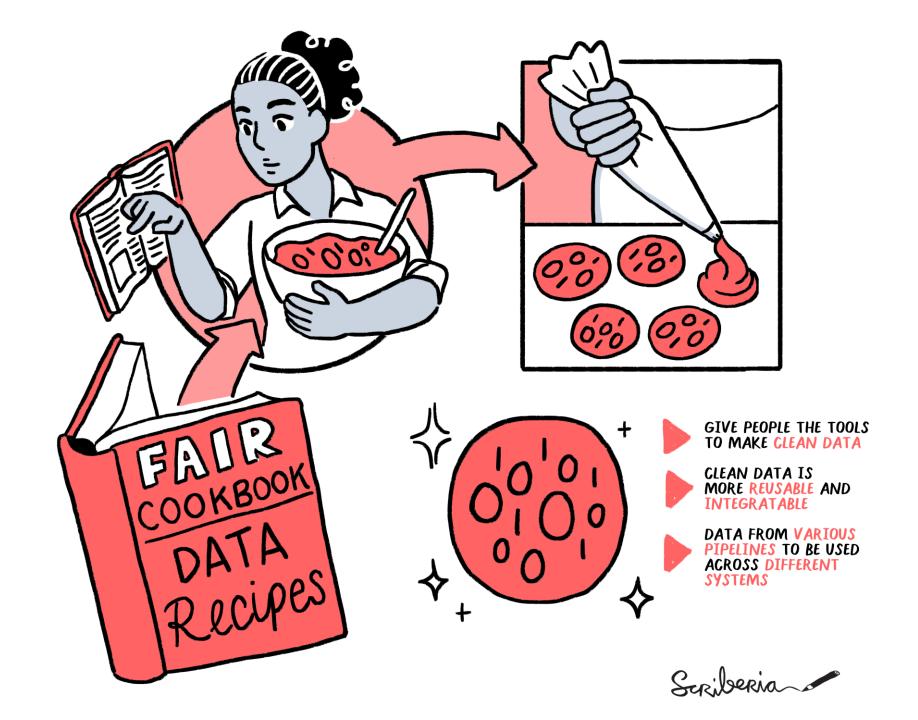
- Support innovation and growth in the digital economy
- Improve efficiency and effectiveness of government investments
- Improve management of natural resources
- Stimulate research
- Effective monitoring mechanism
- Generate information products
- Improve data access and use & enable no products/services that can transform everyday life

### SwissEnvEO: a FAIR national EO environmental database

http://geonetwork.swissdatacube.org



Giuliani G., Cazeaux H. Burgi P.-Y., Poussin C., Richard J.-P., Chatenoux B. (2021) SwissEnvEO: a FAIR national environmental data repository for Earth Observation Open Science, CODATA Data Science Journal 20(1):2 <a href="http://doi.org/10.5334/dsj-2021-022">http://doi.org/10.5334/dsj-2021-022</a>



## Achieving reproducible knowledge... ... exposing all parts of an application



### **Good application:**

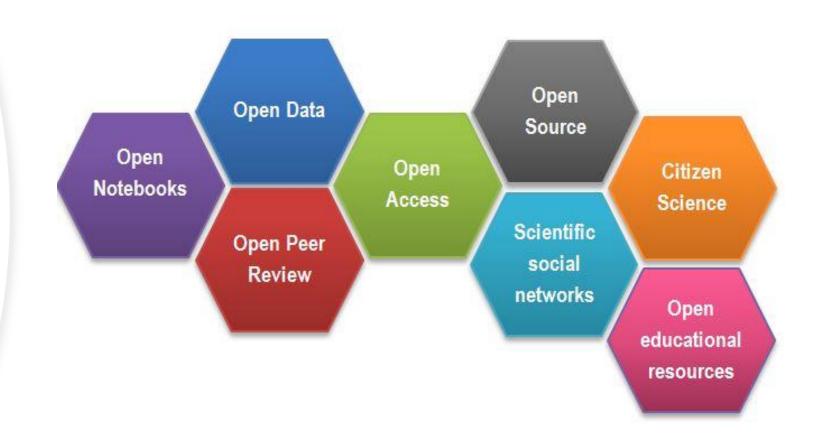
Good in-situ, satellite data & models > produce new knowledge

### Trust is the key (data):

For decision makers

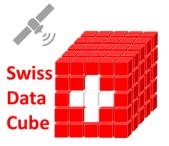
# SDC Open & Reproducible EO Science

- Open Data: Landsat 5,7, 8 ARD; Sentinel 1-2 ARD + All scientific/decisionready products are freely, openly available & FAIR compliant
- Open Notebooks: All algorithms are documented and openly available
- Open Access: All publications
- Open Source: All applications
- Open Educational Resources: Bringing ODC into practice



## Open to collaboration!





### Follow us

### http://www.swissdatacube.ch

Swiss Data Cube (SDC) **ABOUT PRODUCTS** TEAM **PUBLICATIONS** 

EO for monitoring the environment of Switzerland in space and time

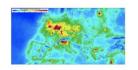
#### Latest News



Climate Change in the Alps - Rhône Glacier Melting

September 30, 2020

The Rhône Glacier is located in the Swiss Alps (Valais) and is known for being the source of the Rhône river, the primary tributary of Lake Léman (the largest lake in Switzerland). This glacier is a perfect example of the ongoing impacts of climate change in the Alps. Increasing temperatures are gradually melting the ice [...]



Sentinel-5P data for studying air pollutants: soon available for Switzerland

April 8, 2020

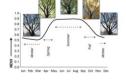
The Swiss Data Cube team. in collaboration with the Institute of Global Health and the Institute for Environmental Sciences of the University of Geneva. has started working in ingesting Level 2 data from the Copernicus Sentinel-5P satellite (a mission dedicated to monitoring air pollution). It is a mission dedicated to monitoring air pollution. We will [...]



Launch of the Atlas of Changing Switzerland

September 27, 2019

Today, for the 10th anniversary of the Institute for Environmental Sciences of the University of Geneva, we are launching an interactive atlas allowing anyone to explore different sites across Switzerland looking at how the landscape has changed over the last two-three decades. This can help visualising and understanding environmental changes such as climate, natural [...]



PhenoSwiss: Monitoring Land Surface Phenology over Switzerland using the Swiss Data Cube satellite Earth Observations time-series

August 16, 2019

We have received the good news that the project "PhenoSwiss: Monitoring Land Surface Phenology over Switzerland using the

have used #SwissDataCube to explore what are the possible contributions of #EssentialVariables #Environmental Monitoring #mdpidata @MDPIOpenAccess http://doi.org/10.3390/data50... @UNIGEnews @unige\_ise @UZH\_en @WSL\_research @GRIDava #EO4impact #EVs

HELP

Q 171 01

CONTACT

UZH University of Zurich 9 Oct



#SwissDataCube About the use of satellite remote sensing data to tackle environmental challenges. Claudia Röösli, group leader at the UZH Remote Sensing Laboratories, took part in yesterday's Conversations with Academia with @UZH\_Science @UZHspacehub @unige\_en @UNOG @GRIDgva.

Q 11 05

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