



# SENTINEL-2 SEMANTIC DATA & INFORMATION CUBE AUSTRIA

Project partners



Dirk Tiede, Martin Sudmanns, Hannah Augustin, Christian Werner, Stefan Lang

Department of Geoinformatics – Z\_GIS

University of Salzburg, Austria

[dirk.tiede@sbg.ac.at](mailto:dirk.tiede@sbg.ac.at)

& Andrea Baraldi

Italian Space Agency (ASI)



## Yet another data cube?



Source: ODC



# Sentinel-2 Semantic Data & Information Cube Austria

- goes **beyond state-of-the-art ARD** and the use of data cubes solely as data storage by **incorporating semantic enrichment** (i.e. initial, data-driven information extraction)
- we aim for a **generic, semantic EO data cube** concept driven by automatic integration of optical EO data and automatic generic semantic enrichment **in contrast to application-driven solutions** (e.g. forest application, crop cycles, specific composites etc.).
- **generic concept enables diverse queries and analysis possibilities directly within data cubes**, including semantic queries for replicable extraction of EO-based indicators /EO-based analysis from big EO data.



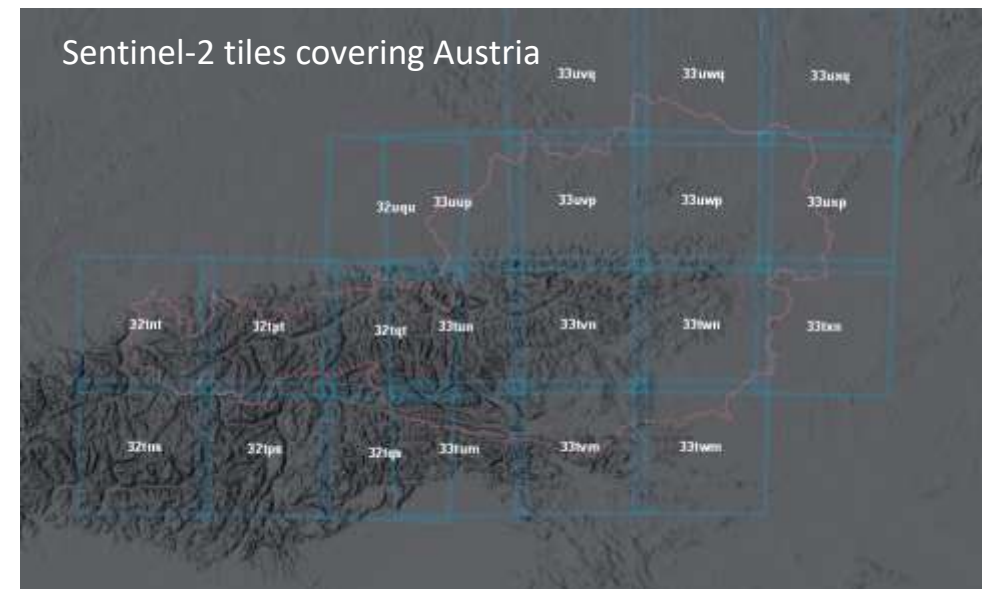
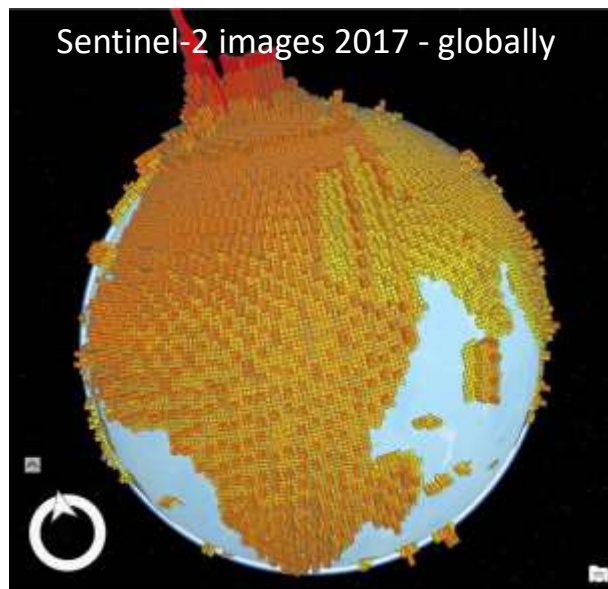
# What are the differences?

Feature	File-based EO image hubs (e.g. Copernicus open access hub)	State-of-the-art data cubes	Sen2Cube.at data & information cube approach
Image download	✓	✓	✓
Metadata-based search	✓	✓	✓
Image-wide processing	✓	✓	✓
AOI-based processing	✗	✓	✓
Time series analysis (statistical)	✗	✓	✓
AOI-based cloud-free image search & mosaicking	✗	✗	✓
Time series analysis (semantic)	✗	✗	✓
Semantic content-based image retrieval (SCBIR)	✗	✗	✓
Content-based best pixel selection for cloud-free composites	✗	✗	✓
No expert-knowledge required to produce information on a higher level	✗	✗	✓
Generic approach with re-usable and sharable tools	✗	✗	✓
Additional data (e.g. DEM) can be used in the high-level queries	✗	✗	✓



# Sentinel-2 Semantic Data & Information Cube Austria

- overarching goal: build an **Austrian data & information cube**
- exemplarily show that it is possible to:
  - conduct **semantic content-based image and information retrieval (SCBIR)** through time in big EO databases
  - **allow human users to query and analyse EO data on a higher semantic level** (i.e. based on at least basic land cover units and encoded ontologies)

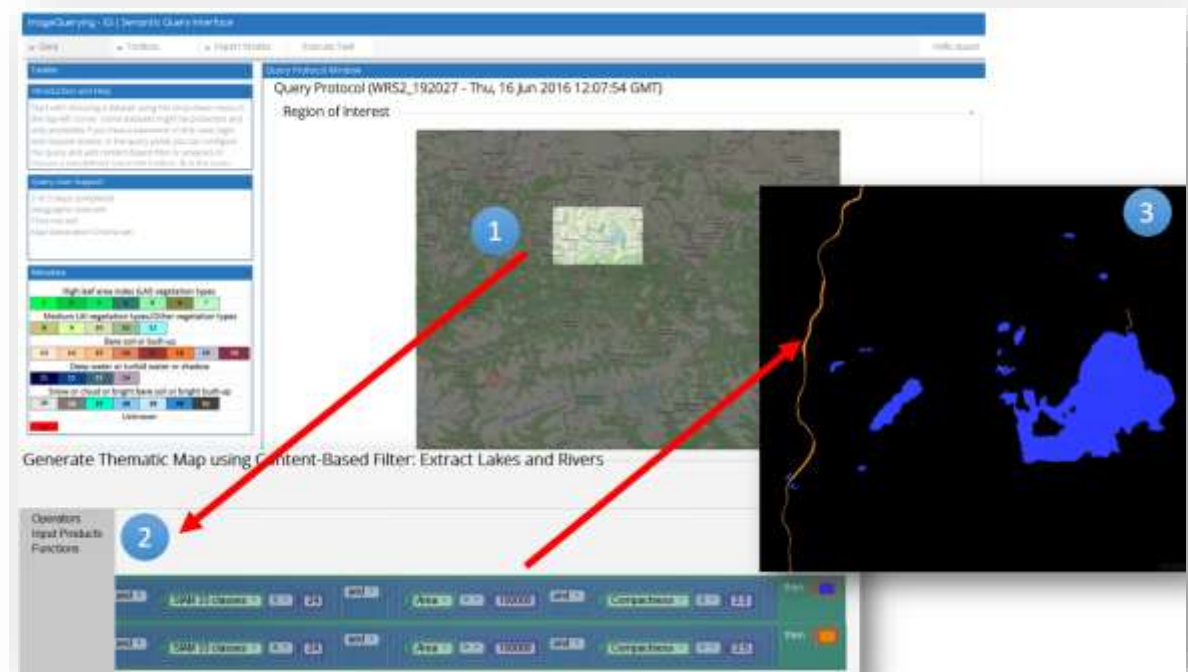




# Semantic Content Based Image Retrieval and Analysis

## Semantic Content Based **Image and Information Retrieval** System through time

- expected to cope with spatiotemporal **semantic queries**, such as:
  - “retrieve all images where a lake is not covered by clouds and larger than a certain area”
- information retrieval (**semantic analysis**) within the system is also possible, such as:
  - “retrieve all pixels in the AOI flooded as least once in the selected time span”
- Such an **SCBIR system must rely on image understanding as a pre-condition.**
- **No SCBIR system in operating mode is available to date.**

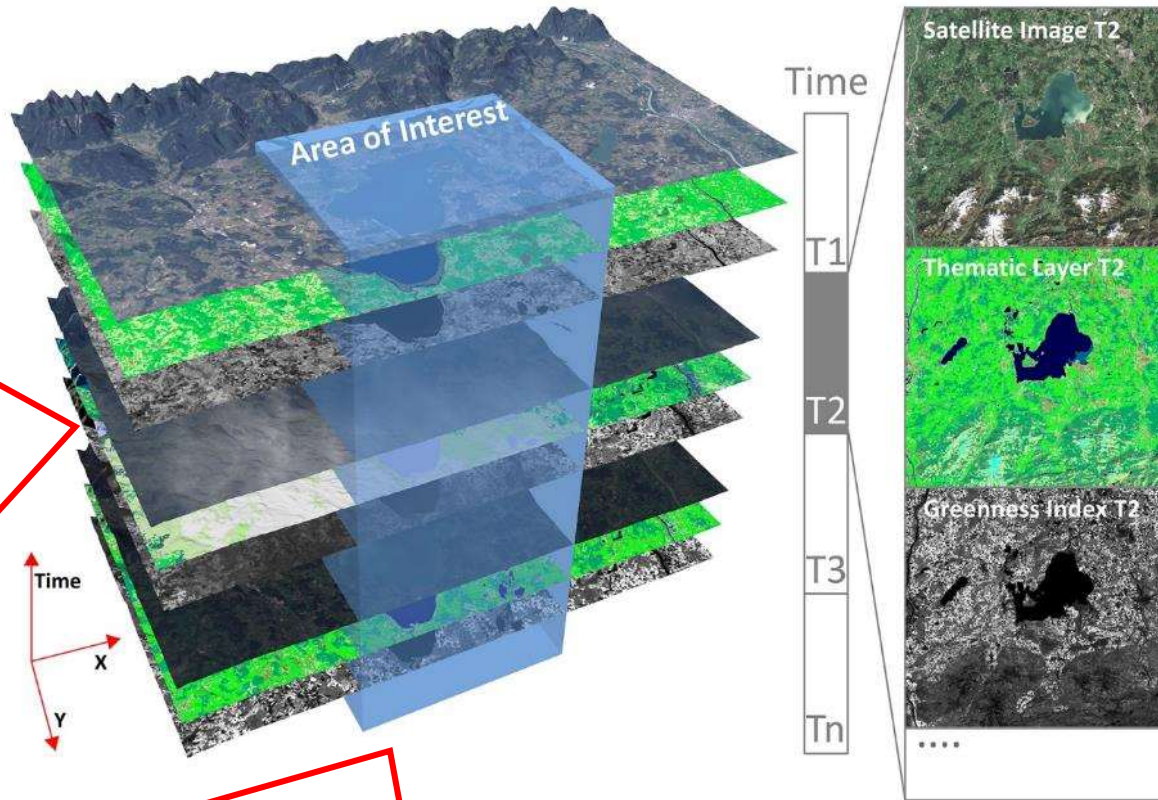




# Key concept of Sen2Cube.at for spatiotemporal analytics of multi-source EO big data

2

**Data cube technologies:**  
Data cube system storing images and image derived products query-optimised not acquisition-optimised



1

**Automatic semantic enrichment:**  
Optical satellite image and associated *fully automatic data-derived* information layers  
+ additional (open) data like e.g. DEMs

3

**Web-based inference engine:** Semantic content-based queries through time and space in user defined AOIs

from Tiede, D., Baraldi, A., Sudmanns, M., Belgiu, M., Lang, S., 2017. Architecture and Prototypical Implementation of a Semantic Querying System for Big Earth Observation Image Bases. Eur. J. Remote Sens. 50, 452–463. doi:10.1080/22797254.2017.1357432



1

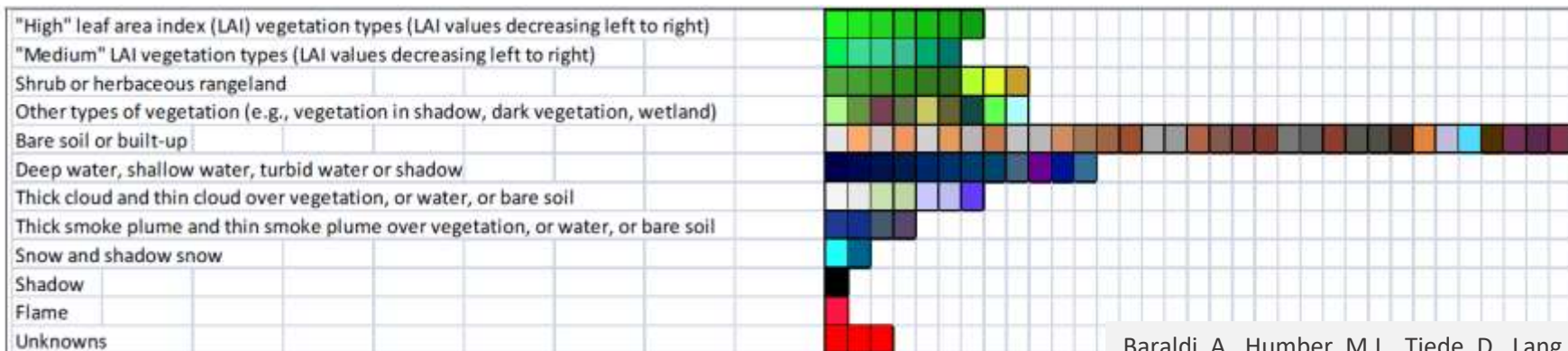
## SIAM (Satellite Image Automatic Mapper) spectral categorization

- fully automated, physical model based
- parameter-free, no samples needed
- near real-time (ca. 5 min. per Sentinel-2 granule)
- scalable and parallelisable
- multi-sensor support (at least TOA calibrated)

→ Expert system - GOFAI

Automatically generated information layers:

- **pre-classification/spectral categorization**: 18, 33, 48 and 96 classes
- multi-spectral **greenness index**
- binary **vegetation mask**
- 5 category **haze mask**



96 spectral classes (pre-classes) represented by pseudo-colours and associated semantics.

Baraldi, A., Humber, M.L., Tiede, D., Lang, S., 2018. GEO-CEOS stage 4 validation of the Satellite Image Automatic Mapper lightweight computer program for ESA Earth observation level 2 product generation – Part 2: Validation. Cogent Geosci. 4, 1–52. <https://doi.org/10.1080/23312041.2018.1467254>





1

# SIAM spectral categorization

Sentinel-2 scene  
(Austrian/German border)  
27 August 2016



10

0 5 10 20 30 40 Kilometers

1

# SIAM spectral categorization

96 spectral categories  
(Austrian/German border)  
27 August 2016

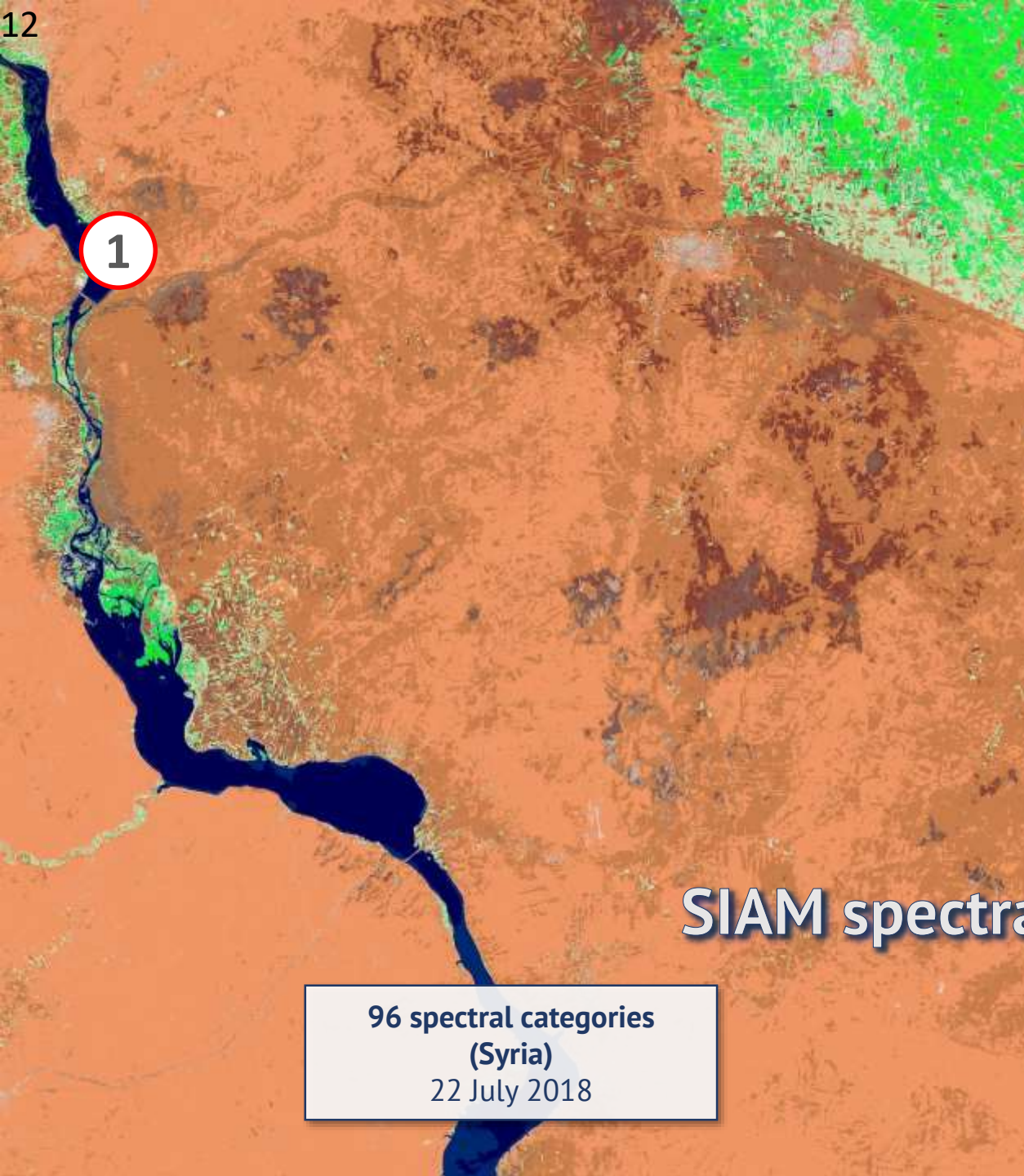


1

## SIAM spectral categorization

Sentinel-2 scene  
(Syria)  
22 July 2018

Sentinel-2 scene  
(Cambodia)  
21 April 2017



1

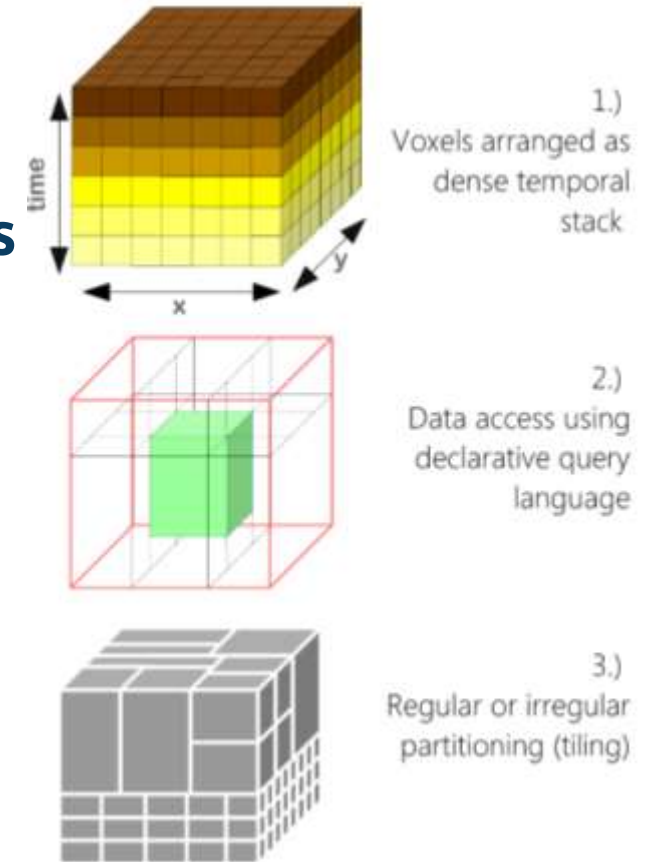
96 spectral categories  
(Syria)  
22 July 2018

## SIAM spectral categorization



96 spectral categories  
(Cambodia)  
21 April 2017

- store data **query-optimised, not acquisition-optimised**
- **different** access methods (API, query language) data cubes as **infrastructure**
- provide a **logical view** on the data
  - index external files
  - data as multi-dimensional array
- different solutions are considered in the approach (here: rasdaman or ODC)



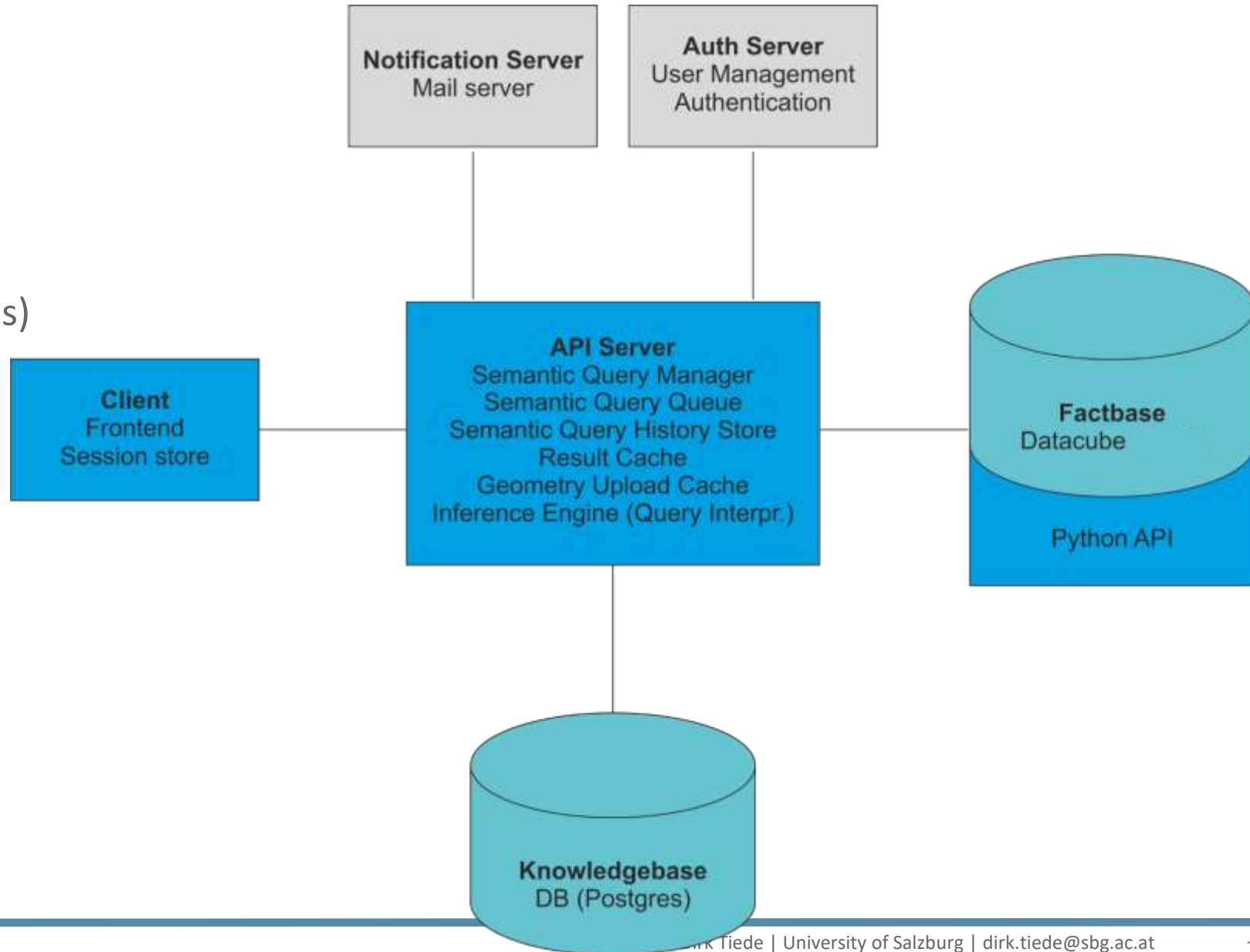
Tiede, Dirk; Baraldi, Andrea; Sudmanns, Martin; Belgiu, Mariana; Lang, Stefan (2017): Architecture and prototypical implementation of a semantic querying system for big Earth observation image bases. In European journal of remote sensing 50 (1), pp. 452–463. DOI: 10.1080/22797254.2017.1357432.

3

## Server structure

- Client
- Central API server
- Knowledgebase (Expert/User Queries)
- Factbase (data + information layers)
- Future:
  - Auth Server, User Mgmt
  - Notification Server

## Web-based inference engine



3

Generic Web-Interface  
(access to different data  
cubes possible)

# Web-based inference engine

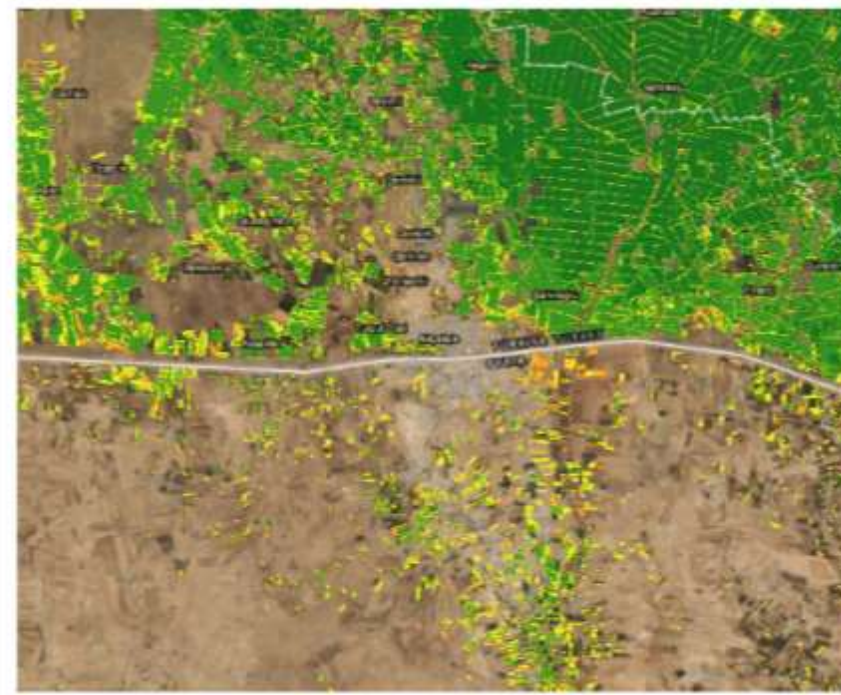
The screenshot displays the sen2cube web application interface. At the top, the browser address bar shows 'zgis20828/app'. The page header includes the 'sen2cube.at' logo and the text 'IntelligentQuerying of Earth observation data and information'. On the right, the user 'ChristianWerner' from 'Salzburg University' is logged in.

The main interface is divided into several sections:

- Knowledgebase:** Contains 'Frequently used models' (Water through time, Vegetation) and 'Available models' (Browse all models).
- Factbase:** Includes a 'Spatial Subset' section with 'Draw Area of Interest' tools and an 'Inference' section with 'Start Inference' and 'Stop' buttons.
- Map:** A central map showing a geographical area with a red rectangular selection box.
- Target area (Datacube):** A section at the bottom left showing two datacube samples: 'Salzburg DC' (A datacube of Salzburg) and 'Syria DC' (Syrian datacube sample).

An inset window titled 'Knowledgebase: Edf model' is open in the bottom right, showing a workflow for creating an Edf model. It includes a menu with 'Action', 'Condition', 'Data', and 'Other'. The workflow consists of two main steps: 'Condition images of Layer [ ] using mode [ ]' and 'When Layer [ ] changes to [ ] then [ ]', with a 'Save' button at the bottom.

- 30,000 km<sup>2</sup>, vegetation change from 2017-08-15 to 2017-09-15
- < 20 minutes analysis time on a basic VM, which included areas with 5 up to 11 temporal images
- data cube: ~750 Sentinel-2 images + associated information layers (permanently growing – fully automated download, processing and ingestion pipeline)

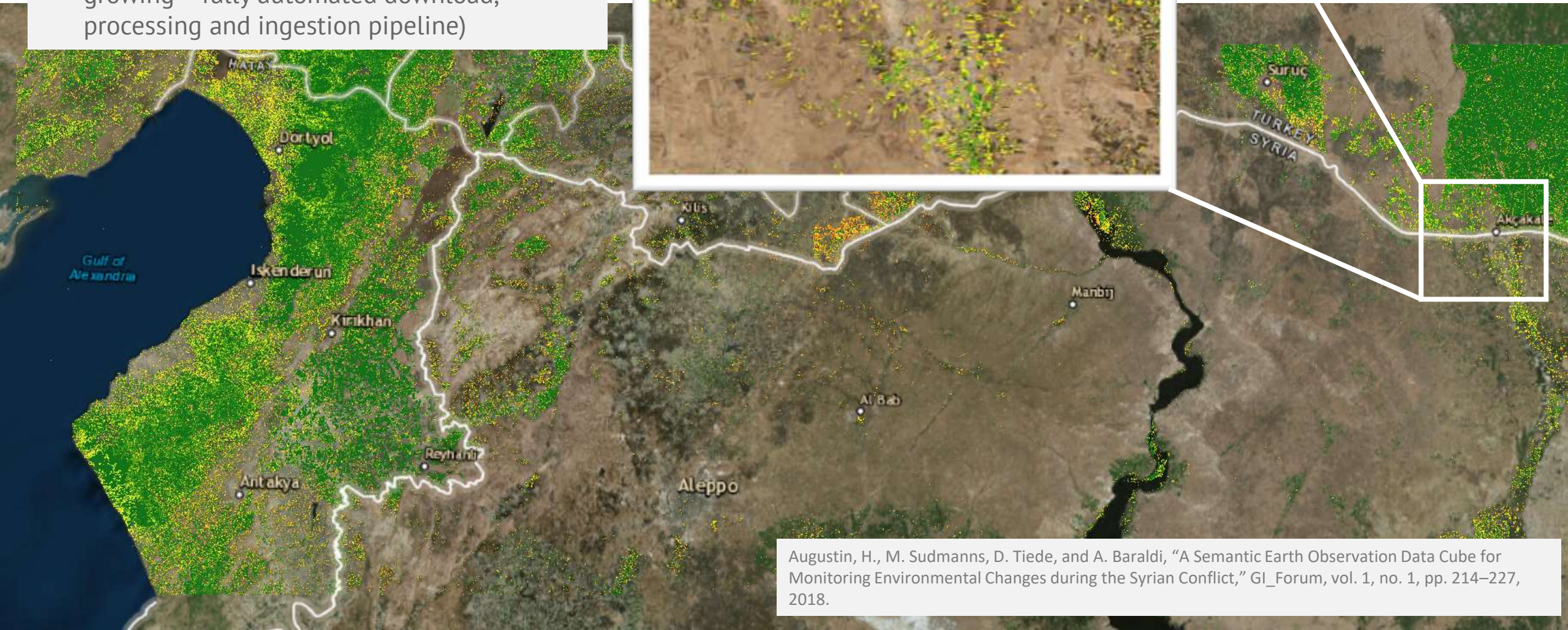


**Example of a generic data and information data cube up and running (Northern Syria)**

**EO data:** Sentinel-2

**Data cube:** ODC

**Interface:** Jupyter Notebook



Augustin, H., M. Sudmanns, D. Tiede, and A. Baraldi, "A Semantic Earth Observation Data Cube for Monitoring Environmental Changes during the Syrian Conflict," *GI\_Forum*, vol. 1, no. 1, pp. 214–227, 2018.





Services based on the generic approach.....

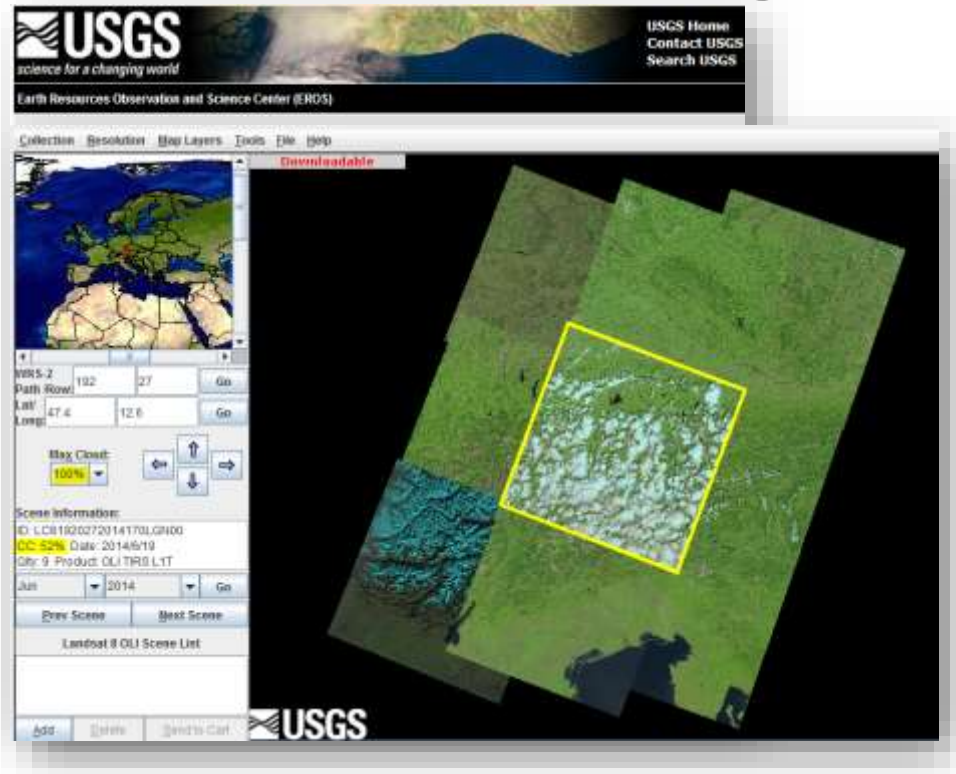
→ a broad application range can benefit from Sen2Cube.at's innovation of a generic data & information cube.

→ the following service demonstrations will be derived and developed from different use cases

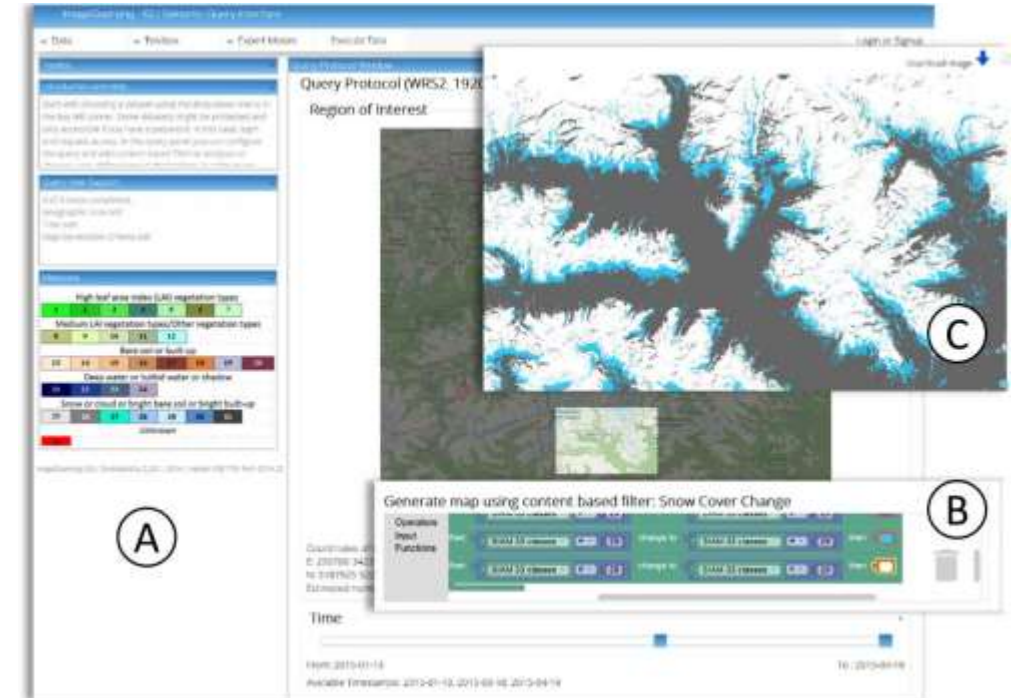


# Demo 1: semantic queries for content-based image retrieval

- develop knowledge-based semantic queries for SCBIR
- search and select Sentinel-2 scenes (several thousand) based on their content – including "dark" data



An inference engine for enhanced querying will be programmed as a Web interface in a client-server solution.





## Demo 2: user-defined cloud-free mosaics and composites

Mosaics and composites

- apply pre-defined semantic queries through time
- user-defined areas-of-interest and timeframes
- better selection of best-suited pixels (from all available data) on the fly using semantics



Source: Sentinel-2



## Demo 3: location-based access

- historical data-derived trends where you are (or elsewhere)
  - location-based access on-the-fly
  - mobile App
- example prototype already developed in IQ4Sen
  - ZAMG project
  - implemented by SpatialServices





# Demo 3: location-based access

**IQ mobile**

With this app you ask for information based on Earth observation data. Your question has to include your current position, a time span which you can choose and a topic which you can select.

Question progress monitor

100%

What was the status of Snow

Topic

Vegetation

Snow

during 01.12.2016 and 05.04.2017

Time Span

Begin: 01. Dec 2016

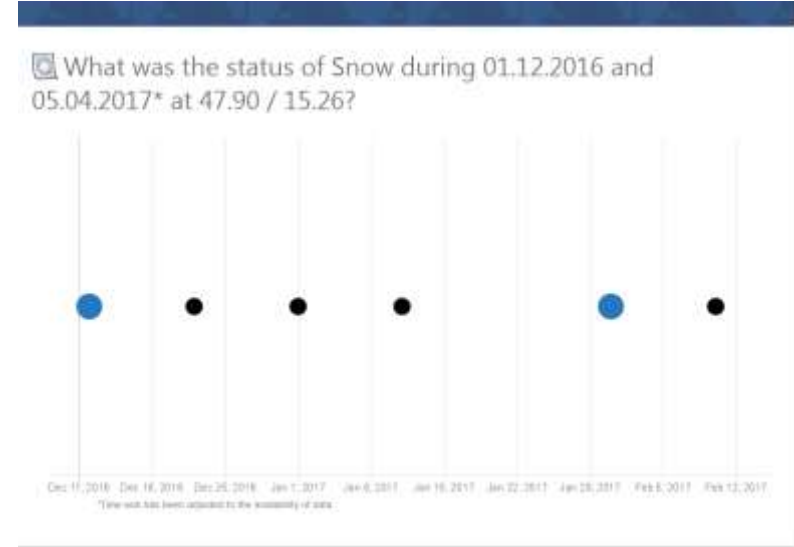
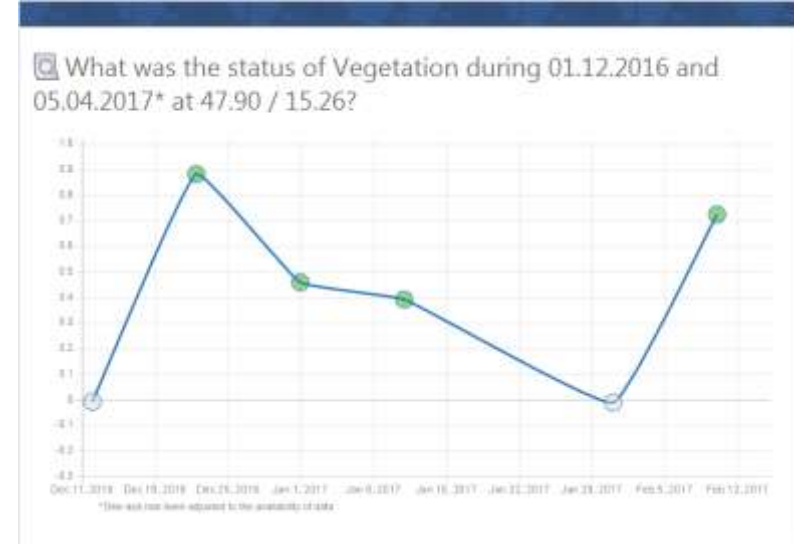
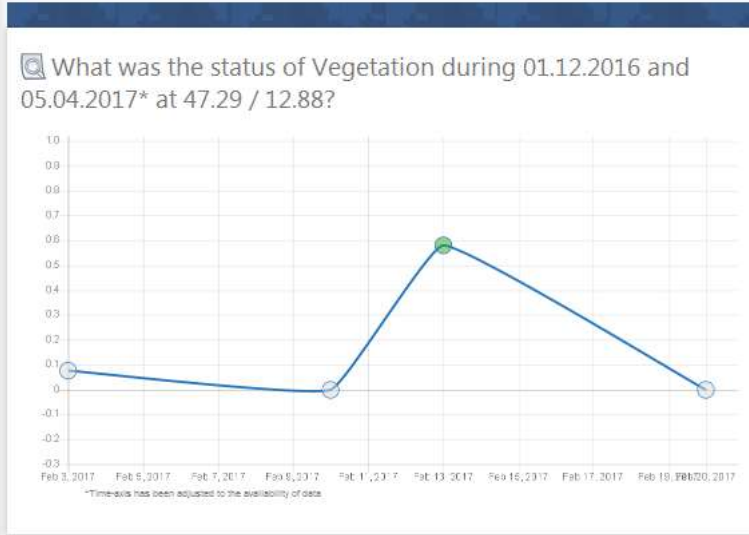
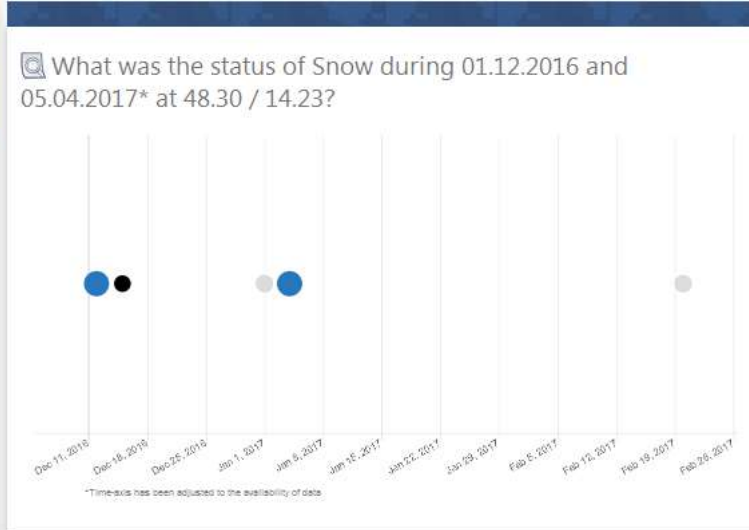
End: 05. Apr 2017

at 47.29 / 12.88

Location

Leaflet | Map from OpenStreetMap

?



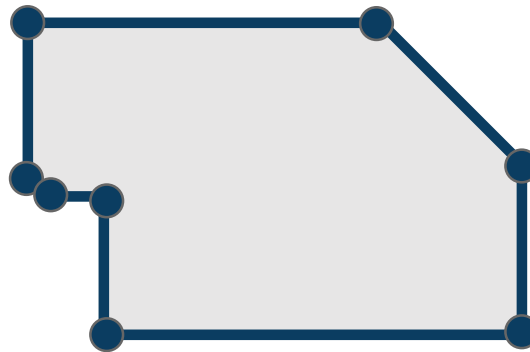


## Demo 4: per-parcel statistics

- allow user-defined parcel calculations for spectral and semantic profiles through time (upload of user defined geometry)
- particularly relevant for forestry and agricultural domains



Source: Sentinel-2



- vegetation trends
- event detection
- when snow was last detected
- ...



# Thank you for your attention!

<http://sen2cube.at/>

Dr Dirk Tiede

[dirk.tiede@sbg.ac.at](mailto:dirk.tiede@sbg.ac.at)

Assistant Professor

Department of Geoinformatics - Z GIS, [www.zgis.at](http://www.zgis.at)

University of Salzburg, Austria



Sen2Cube.at is a project funded under the Austrian Space Applications Programme (ASAP 14)



39<sup>th</sup> European Association of Remote Sensing Laboratories Symposium & 43<sup>rd</sup> General Assembly

 **DIGITAL | EARTH | OBSERVATION**

01-04 JULY 2019 IN SALZBURG / AUSTRIA [www.zgis.at/earsel2019](http://www.zgis.at/earsel2019)



 **Z GIS**   