

Semantic Earth Observation Data Cube of AVHRR and Sentinel-3 SLSTR Data for Exploratory EO Analysis

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Slides created February 2023.

We can see changes, interpret and understand them, but we cannot **operationally** query EO imagery archives for them.

e.g. Google Earth Timelapse



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We can see changes, interpret and understand them, but we cannot **operationally** query EO imagery archives for them.

Cloud: Bring the user to the data, rather than data to the user.

Big EO archives aren't the most user friendly, even for experts.

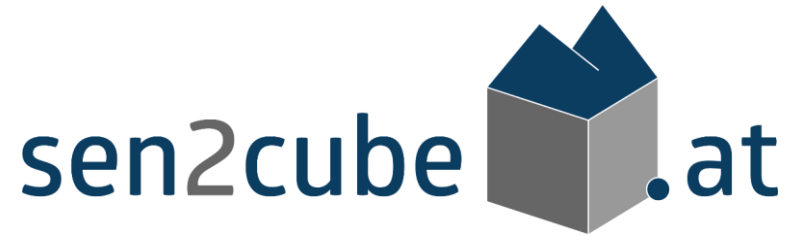
How does our relationship to satellite-based big EO archives and analysis change if an archive is semantically enabled?



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Context



- Earth Observation Analytics research group
 - Department of Geoinformatics Z_GIS
- **Sentinel-2** semantic Earth Observation data cube(s)
- Web-based GUI + **semantic querying language** + jupyter notebooks
 - Top-of-Atmosphere reflectance + derived information / interpretation
 - Drag-and-drop blockly interface for access and analysis
- Programming-free, (exploratory) EO imagery analysis
- Towards increasingly explainable **big EO data analysis**
 - repeatable and **sharable semantic models**
- multiple sensors, imagery interpretations and information layers



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AVHRR Archive: Remote Sensing Research Group University of Bern

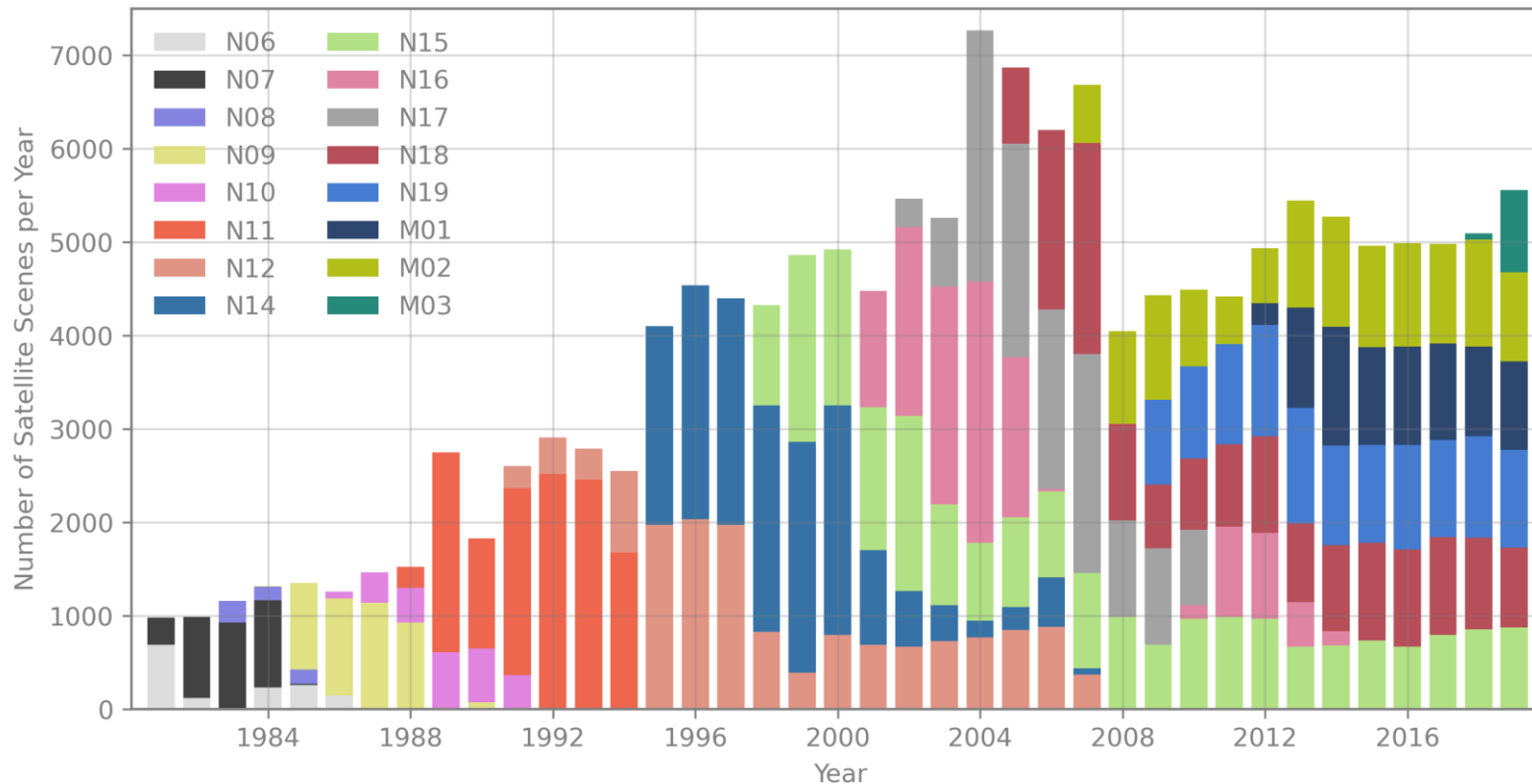


Figure: Number of AVHRR scenes per year color-coded by satellite platform (Weber & Neuhaus, 2020)



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a cross-sensor semantic EO data cube to open and leverage AVHRR time-series and essential climate variables with scientists and the public

... retrieve, curate, facilitate



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AVHRR Archive: Remote Sensing Research Group University of Bern

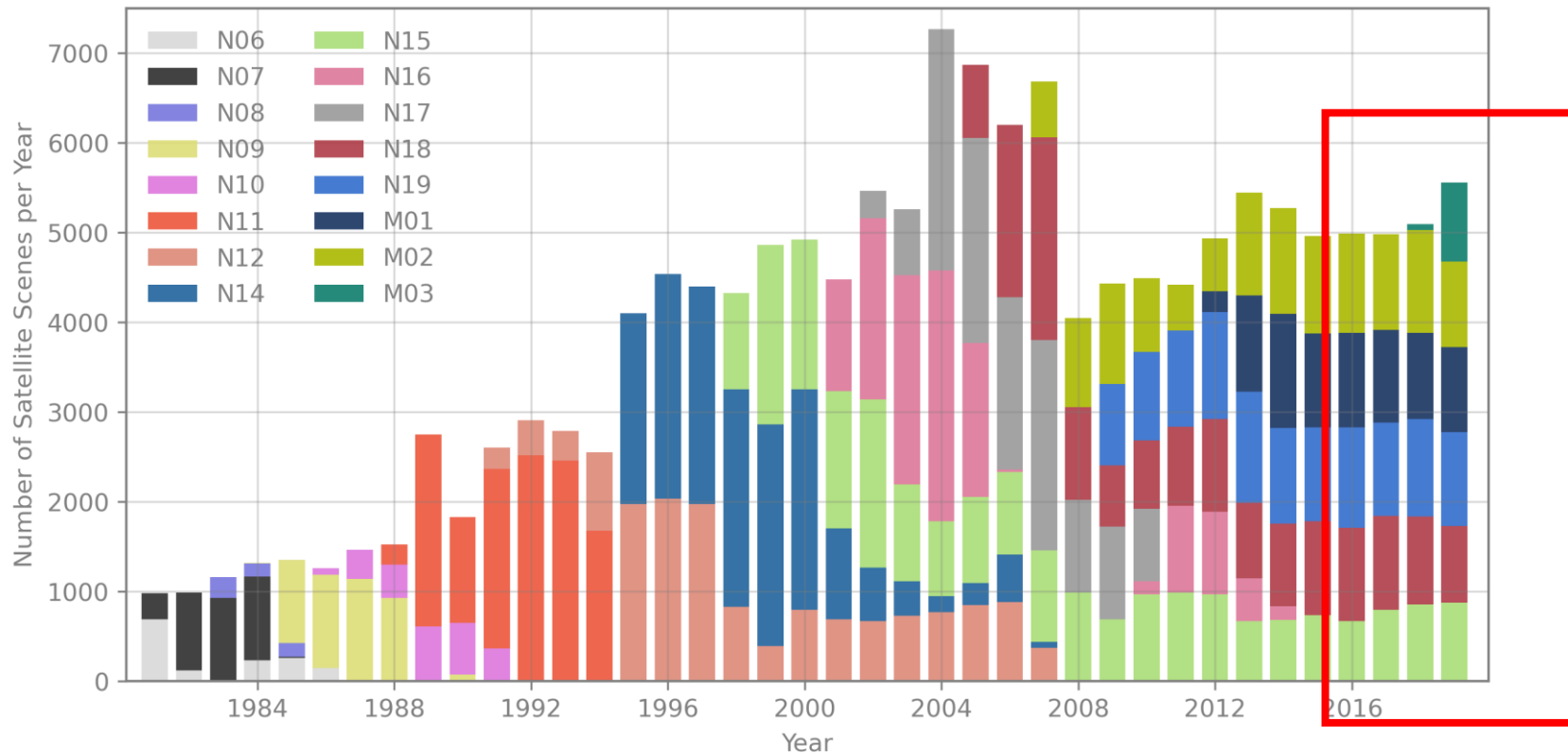


Figure: Number of AVHRR scenes per year color-coded by satellite platform (Weber & Neuhaus, 2020)



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Relative spectral response between AVHRR and Sentinel-3 SLSTR

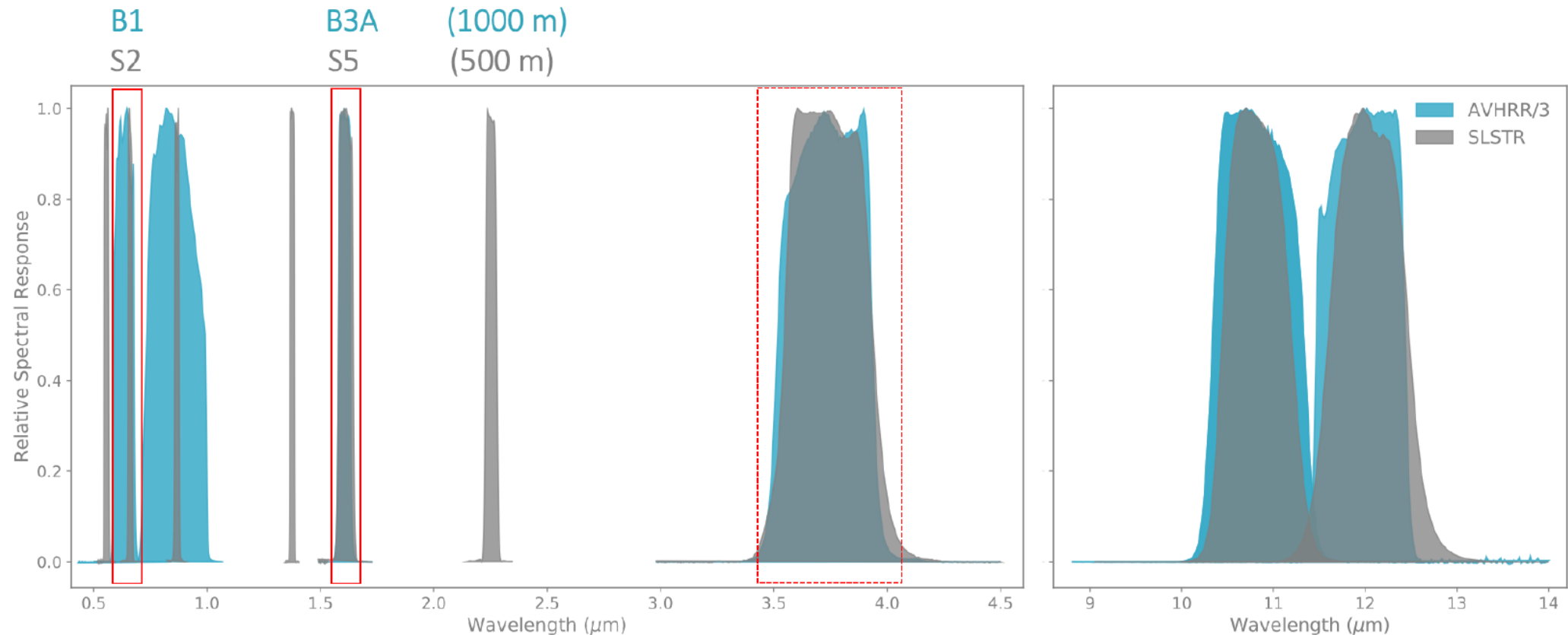


Figure: relative spectral response between AVHRR and S3 (H. Weber, 2020). Data sources: [star.nesdis.noaa](https://star.nesdis.noaa.gov/), sentinels.copernicus.eu



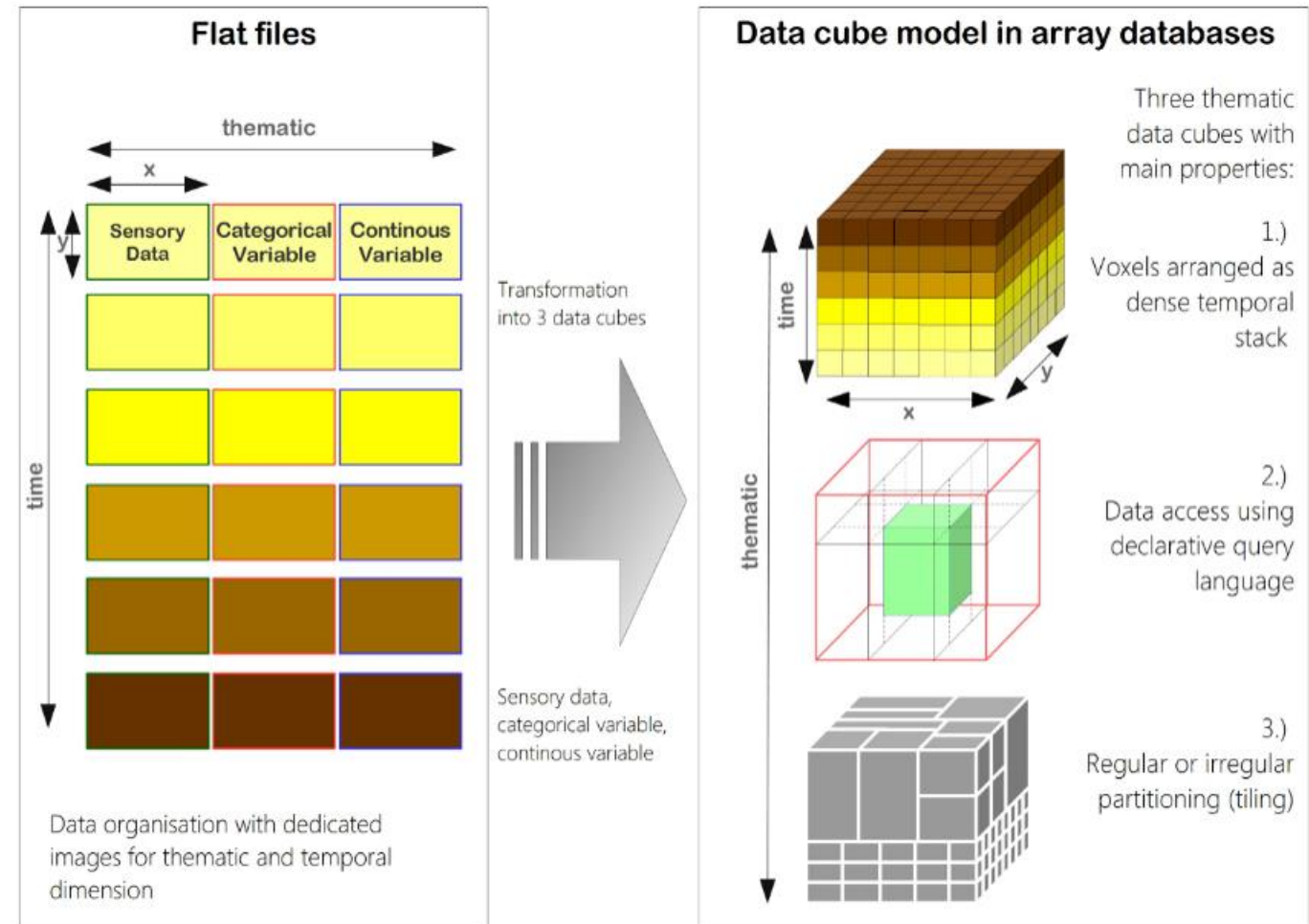
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EO Data Cube

- Data access ...
 - independent of file naming, location and structure
 - using coordinates in space and time!
 - e.g. OpenDataCube



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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.



Semantic EO data cube

“[...] a data cube, where for each observation at least one nominal (i.e. categorical) **interpretation** is available and can be queried in the same instance.”



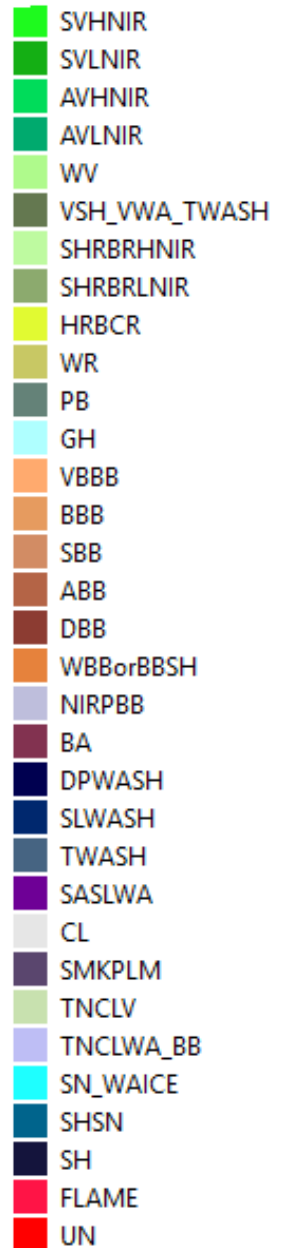
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Augustin, H., Sudmanns, M., Tiede, D., Lang, S., & Baraldi, A. (2019). Semantic Earth Observation Data Cubes. *Data*, 4(3), 102. <https://doi.org/10.3390/data4030102>

SIAM: multi-spectral colour naming

- fully automated, physical-model-based decision tree
- parameter-free, no samples needed
- near real-time (ca. 3 min. per AVHRR scene)
- scalable and parallelisable
- multi-sensor support (at least TOA calibrated)
- ➔ Expert system – good old-fashioned AI
- **stable spectral categories with semantic association(s)**

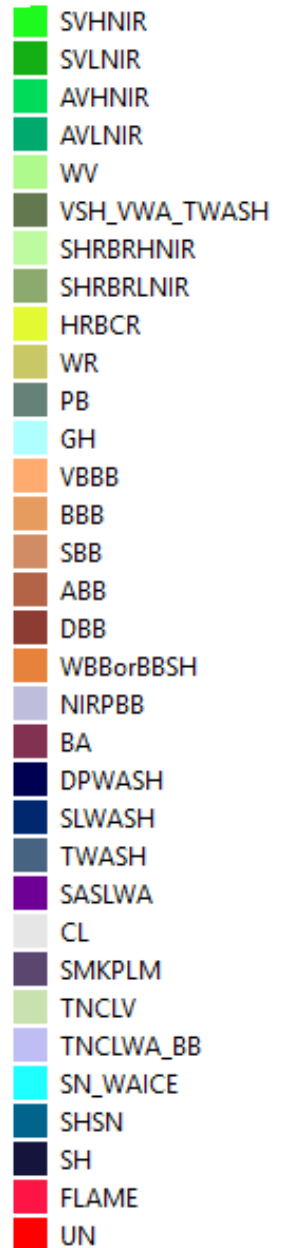
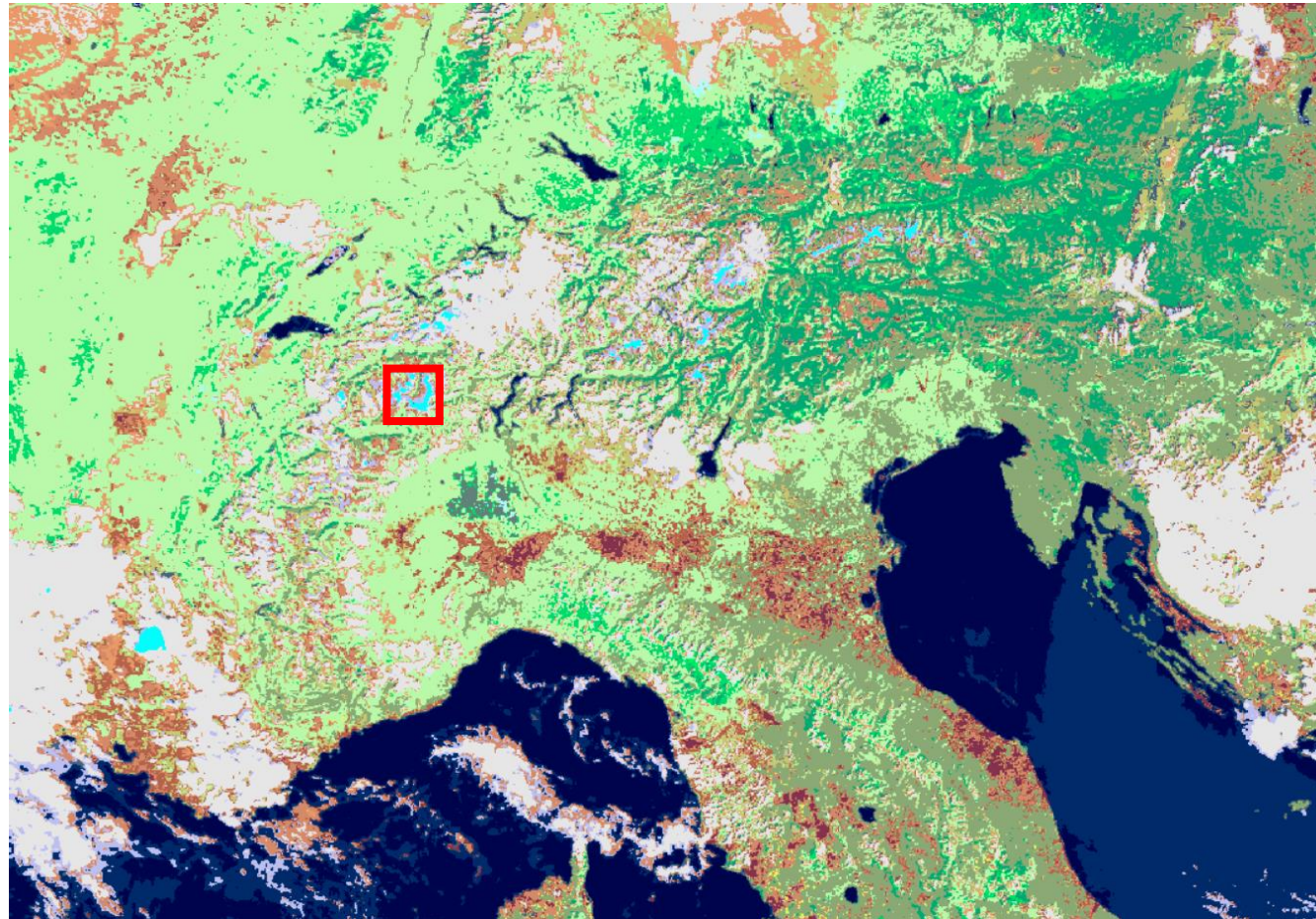


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First look: 8 September 2014, METOP1

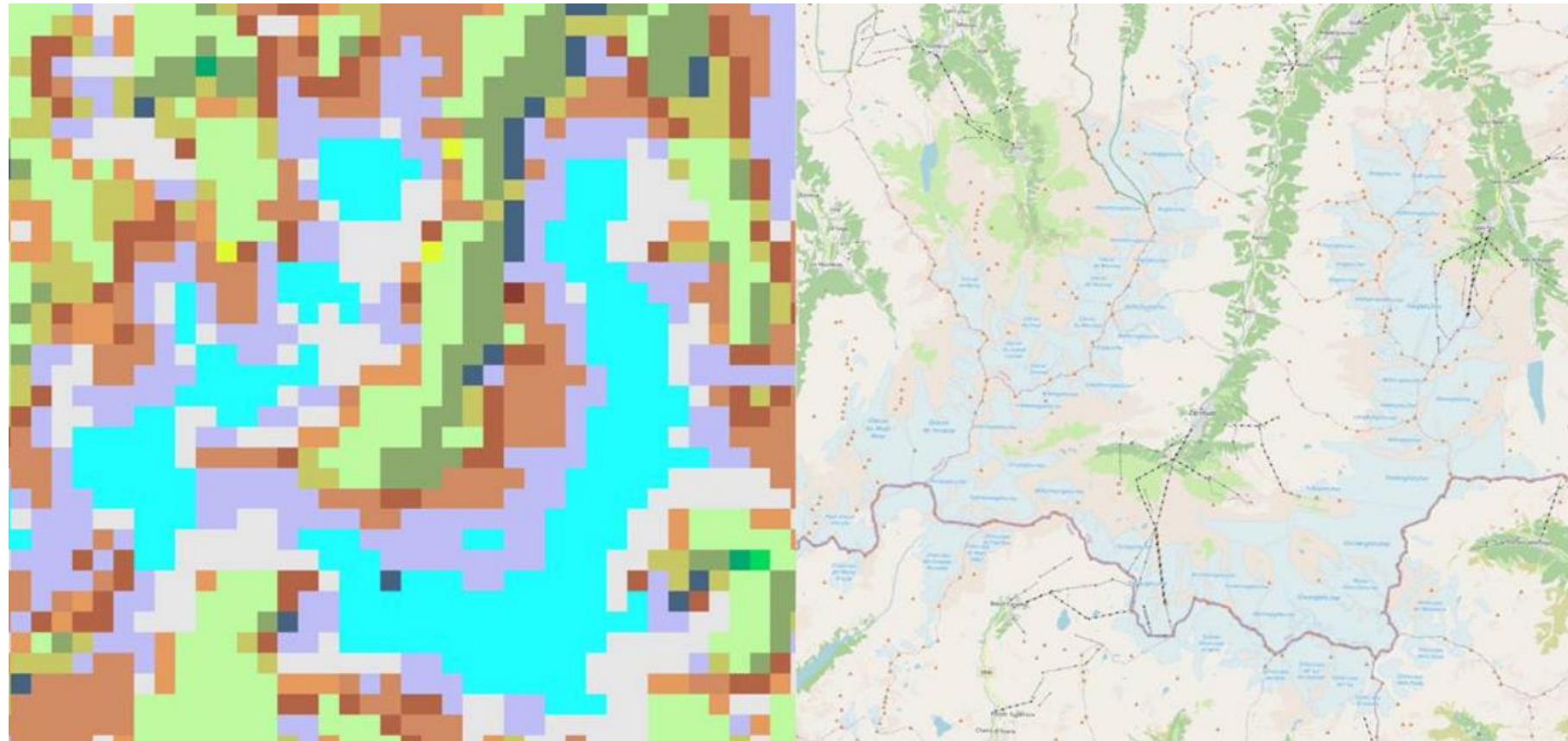
33 spectral categories



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First look: 8 September 2014, METOP1



OpenStreetMap data

- SVHNIR
- SVLNIR
- AVHNIR
- AVLNIR
- WV
- VSH_VWA_TWASH
- SHRBRHNIR
- SHRBRLNIR
- HRBCR
- WR
- PB
- GH
- VBBB
- BBB
- SBB
- ABB
- DBB
- WBBorBBSH
- NIRPBB
- BA
- DPWASH
- SLWASH
- TWASH
- SASLWA
- CL
- SMKPLM
- TNCLV
- TNCLWA_BB
- SN_WAICE
- SHSN
- SH
- FLAME
- UN



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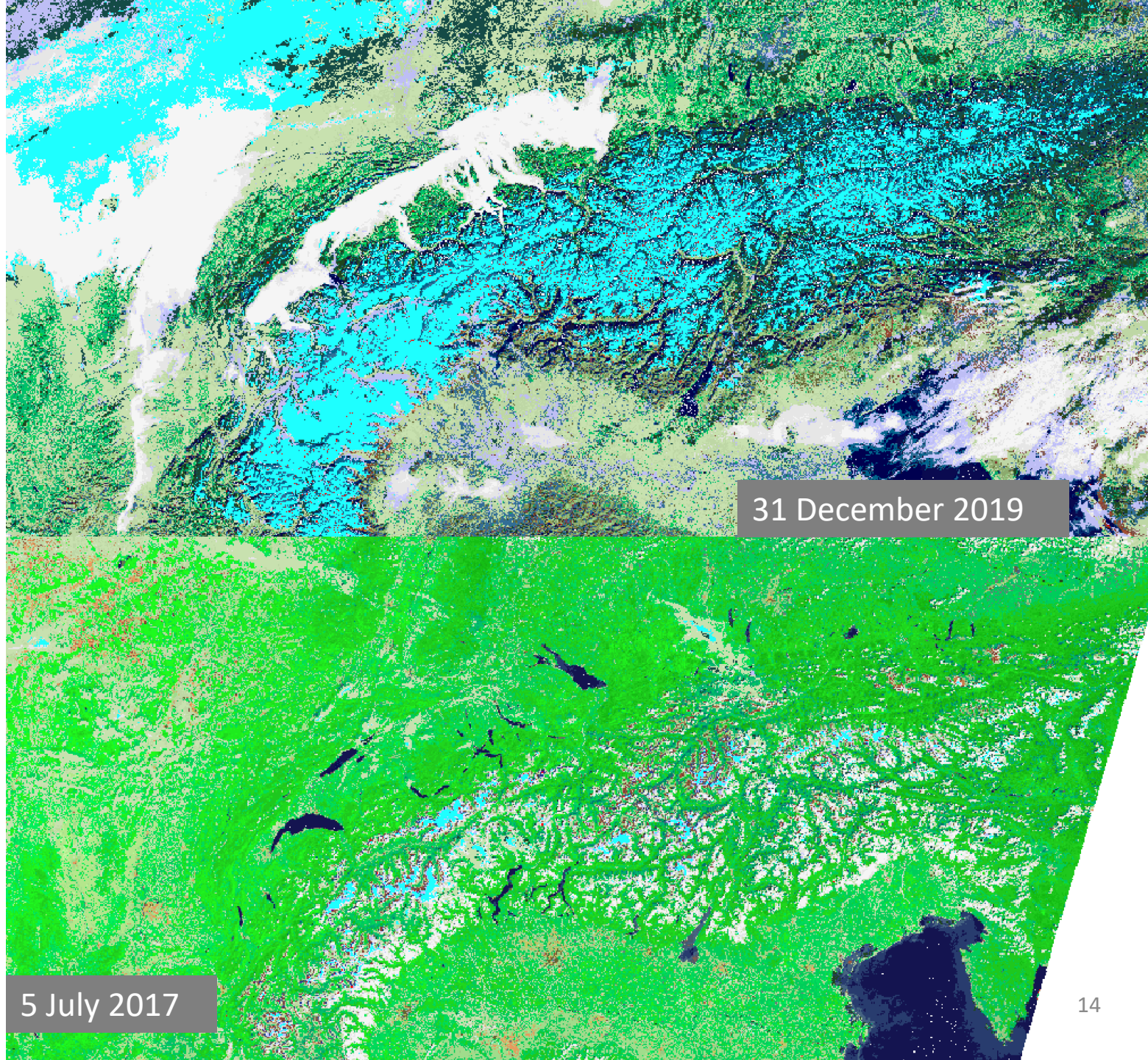
Sentinel-3 SLSTR

- all available data covering most of Switzerland
 - processed to L1C and to better match AVHRR data (Dr. H. Weber, Uni Bern, 2022)



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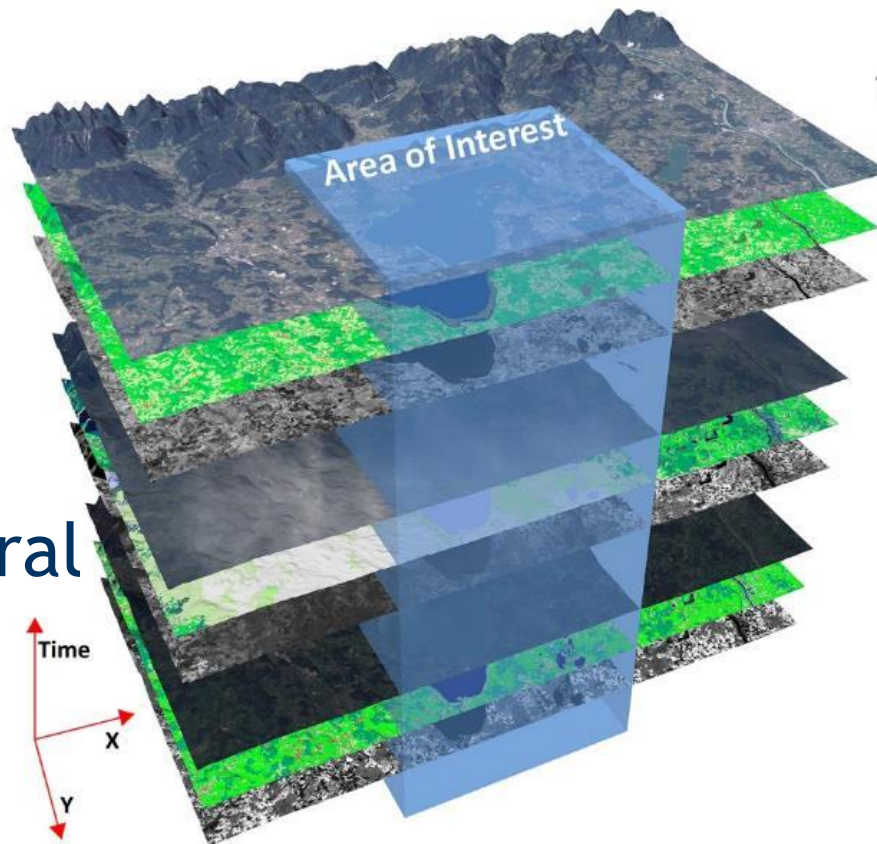


31 December 2019

5 July 2017

Semantic EO data cube

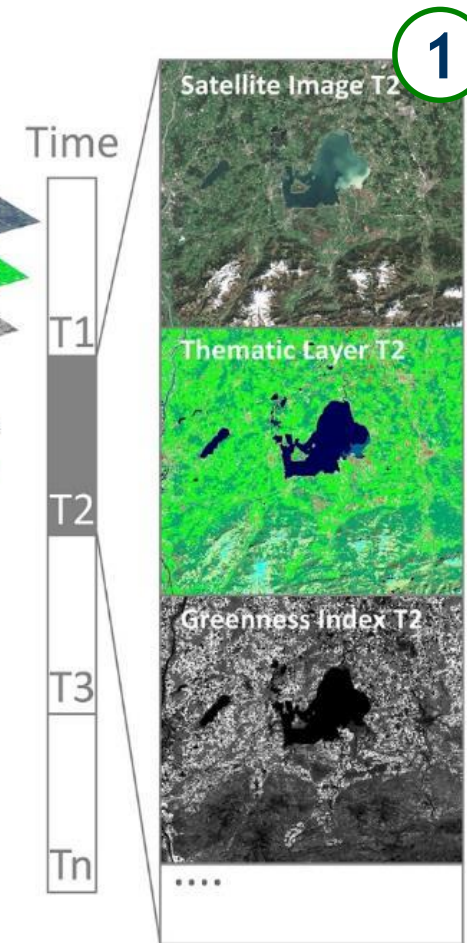
② Data cube technology: spatio-temporal coordinates



③ Web-based inference engine: user-defined AOI + query



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Imagery: reflectance and geometry AVHRR and S3-SLSTR (5+ yrs)

Automated **semantic enrichment:** SIAM (5+ yrs)

EO-derived **ECVs:** NDVI, FSC, LSWT (40+ years)

+ additional (open) information (e.g. DEM, CLC)

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.

Spatial Extent: COSMO-1E by MeteoSwiss

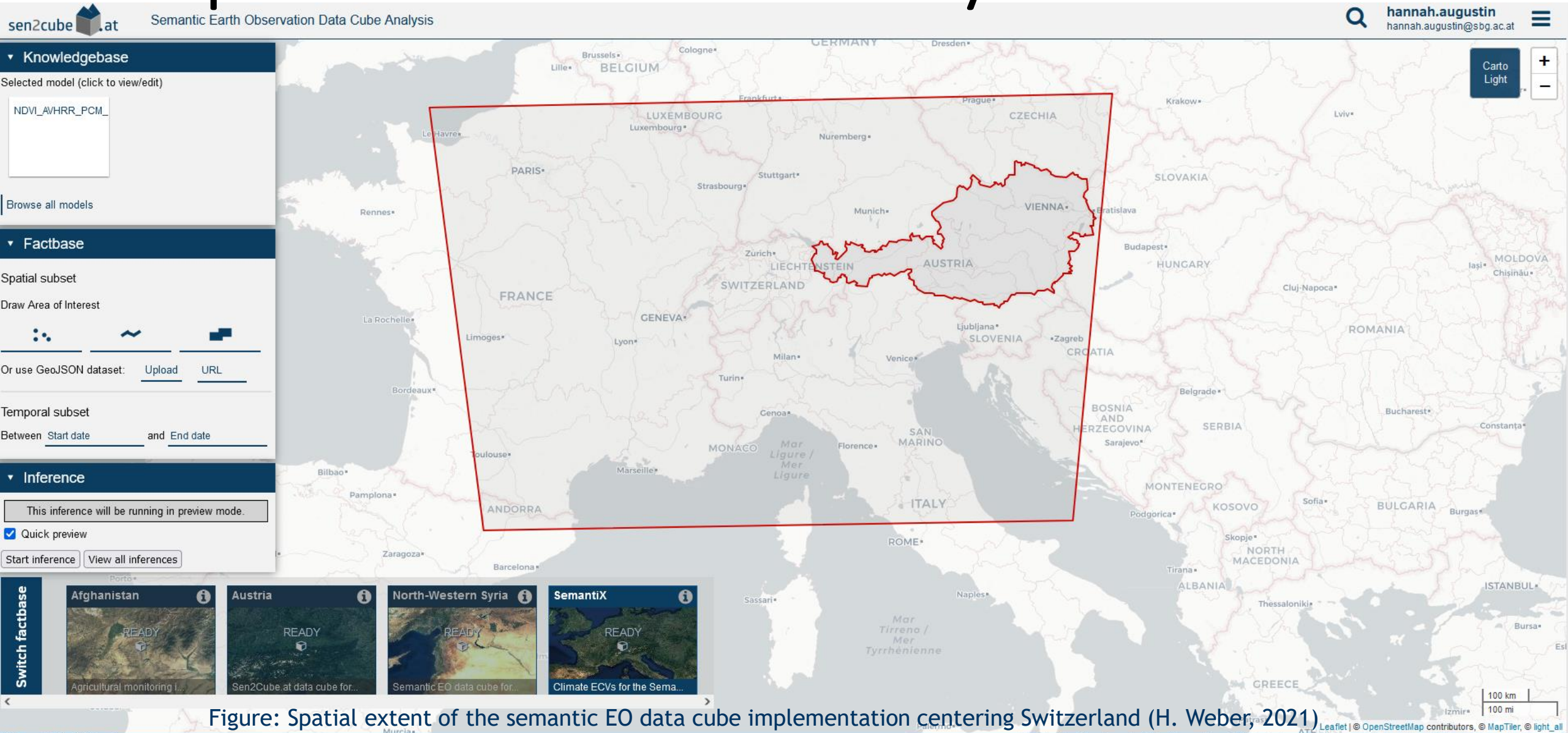
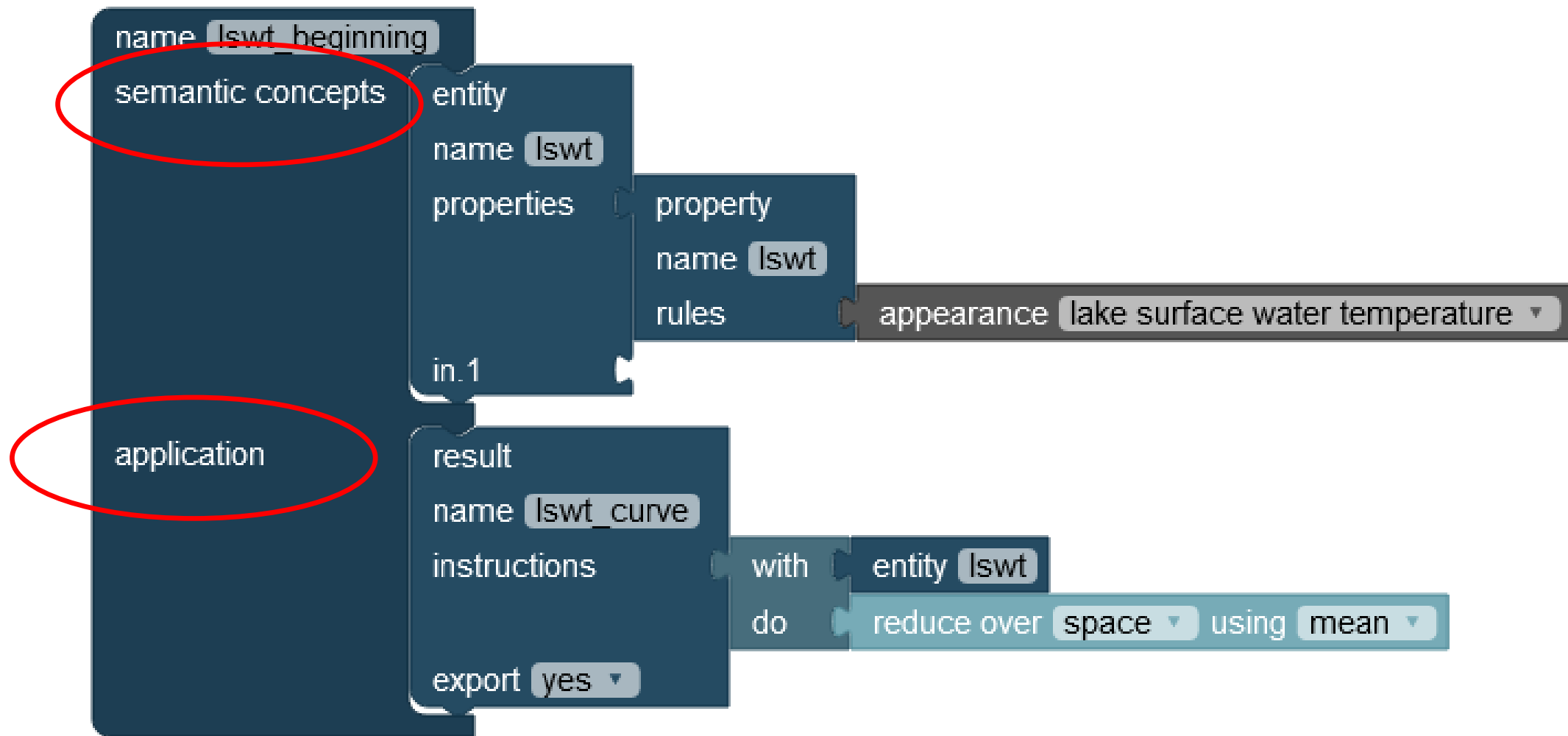


Figure: Spatial extent of the semantic EO data cube implementation centering Switzerland (H. Weber, 2021)

Sudmanns, M., Augustin, H., van der Meer, L., Baraldi, A., & Tiede, D. (2021). The Austrian Semantic EO Data Cube Infrastructure. *Remote Sensing*, 13(23), 4807. <https://doi.org/10.3390/rs13234807>



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App integration

- citizen science mobile app
- location-based queries
- long-term trends based on the AVHRR ECVs

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What does this have to do with land ice and snow?

While currently geographically focused on the Alps ...
... the approach is **generic**, applicable anywhere there is optical EO data.



▶ Details for inference #6248

2010-2019

▼ Results

👁️ Average fractional snow cover over time

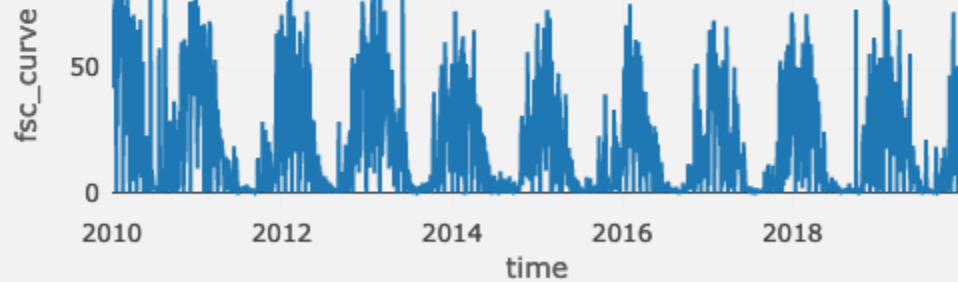
Legend

0 100

Download GeoTIFF (610.9 KB)

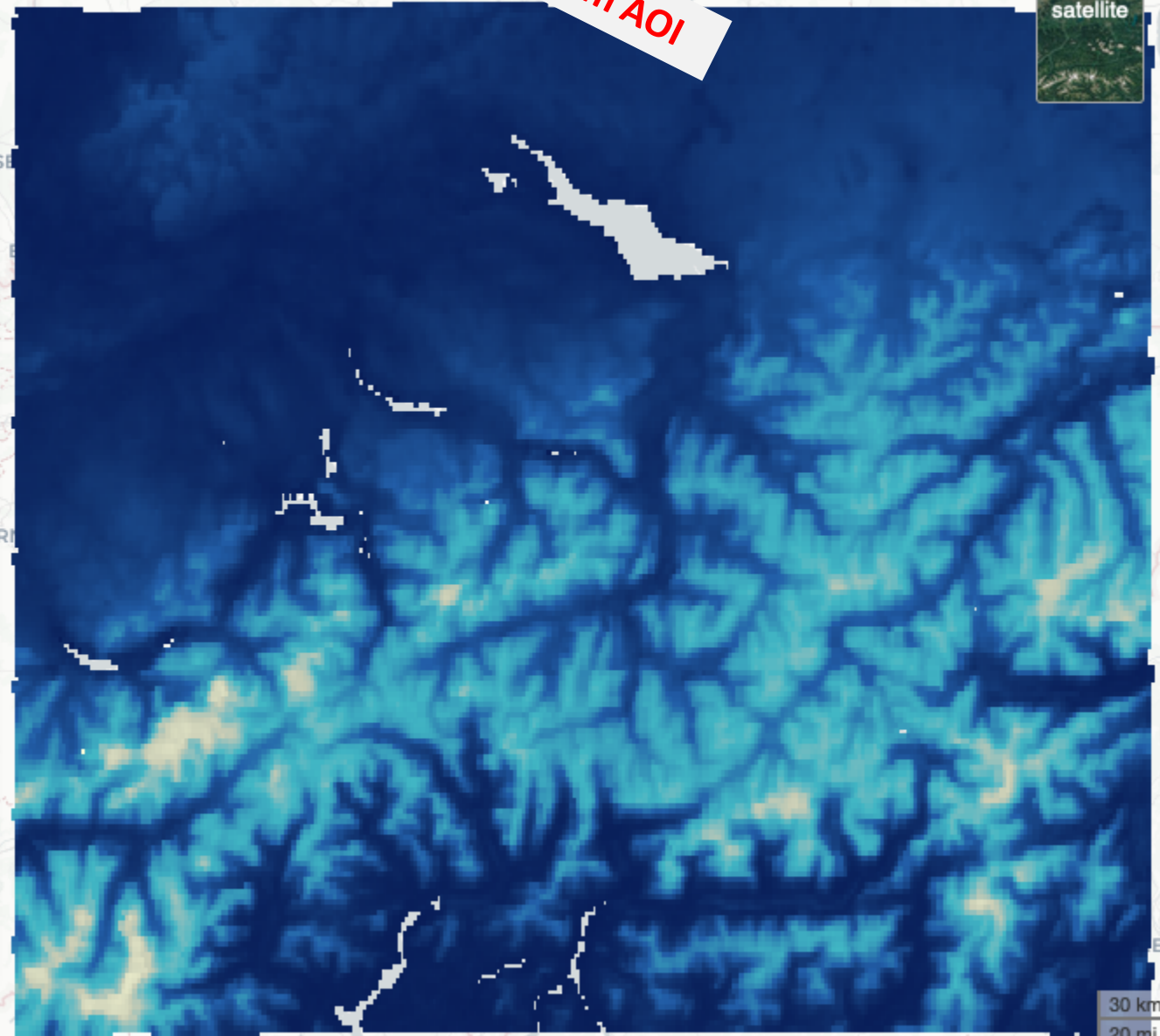
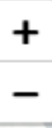
Copy OGC WMS Link

▼ Average fractional snow cover over AOI



Download data (CSV) (107.1 KB)

Custom AOI

30 km
20 mi

► Details for inference #6208

2004

▼ Results

👁️ Average fractional snow cover over time

Legend

0

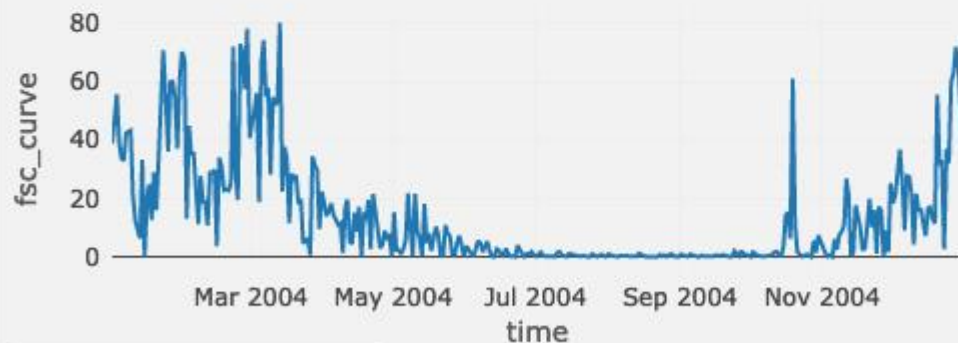


98

Download GeoTIFF (2.6 MB)

Copy OGC WMS Link

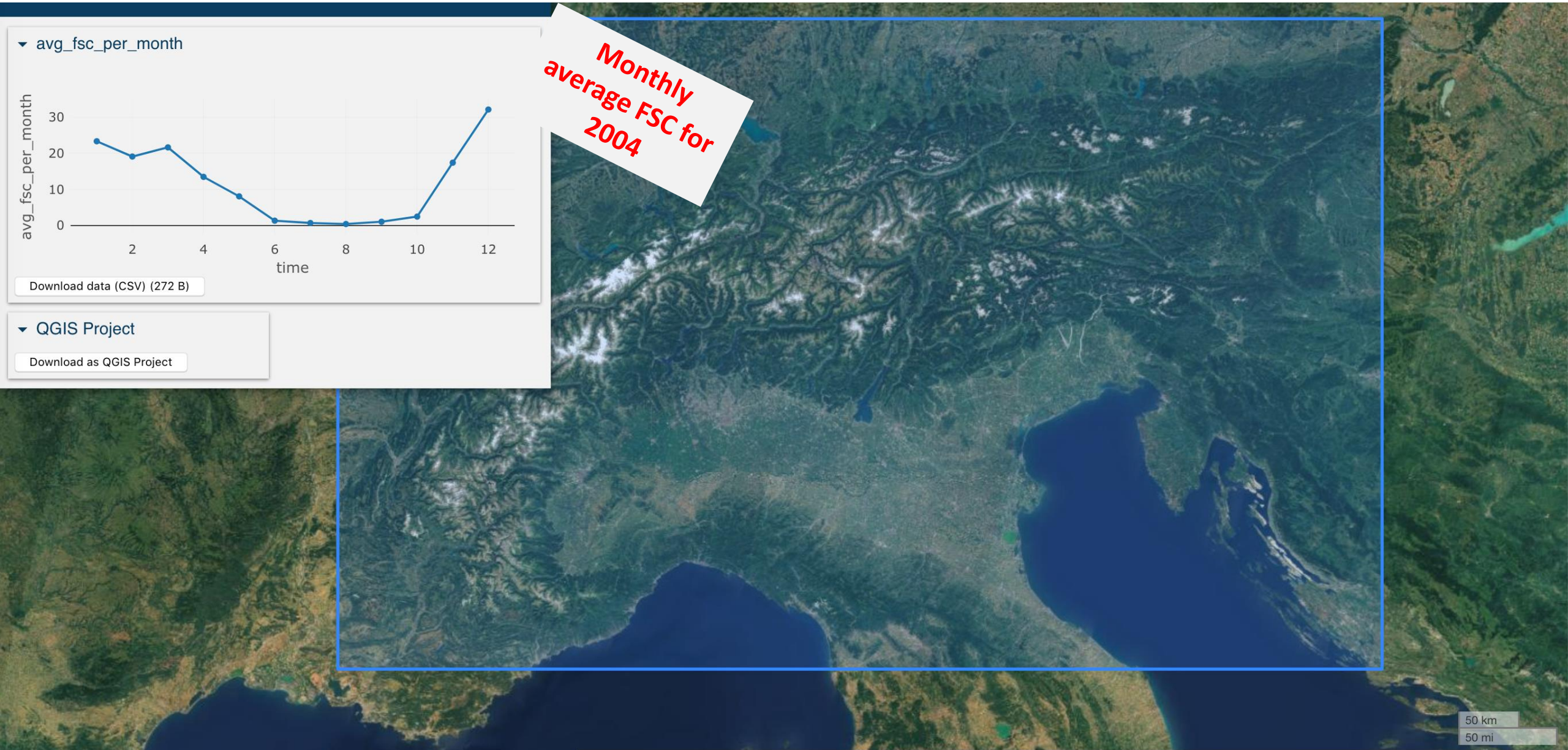
▼ Average fractional snow cover over AOI



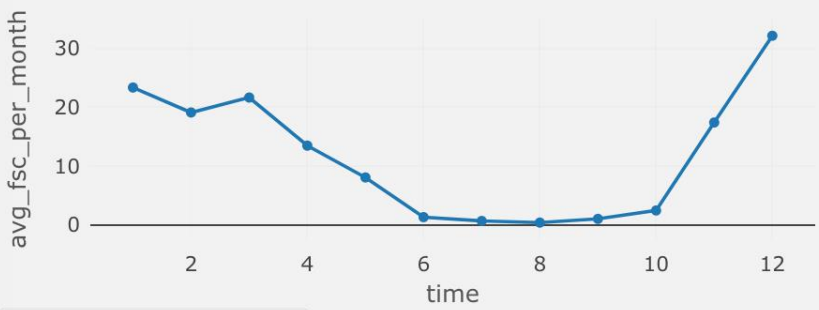
Download data (CSV) (13.4 KB)

Custom AOI





▼ avg_fsc_per_month



Download data (CSV) (272 B)

▼ QGIS Project

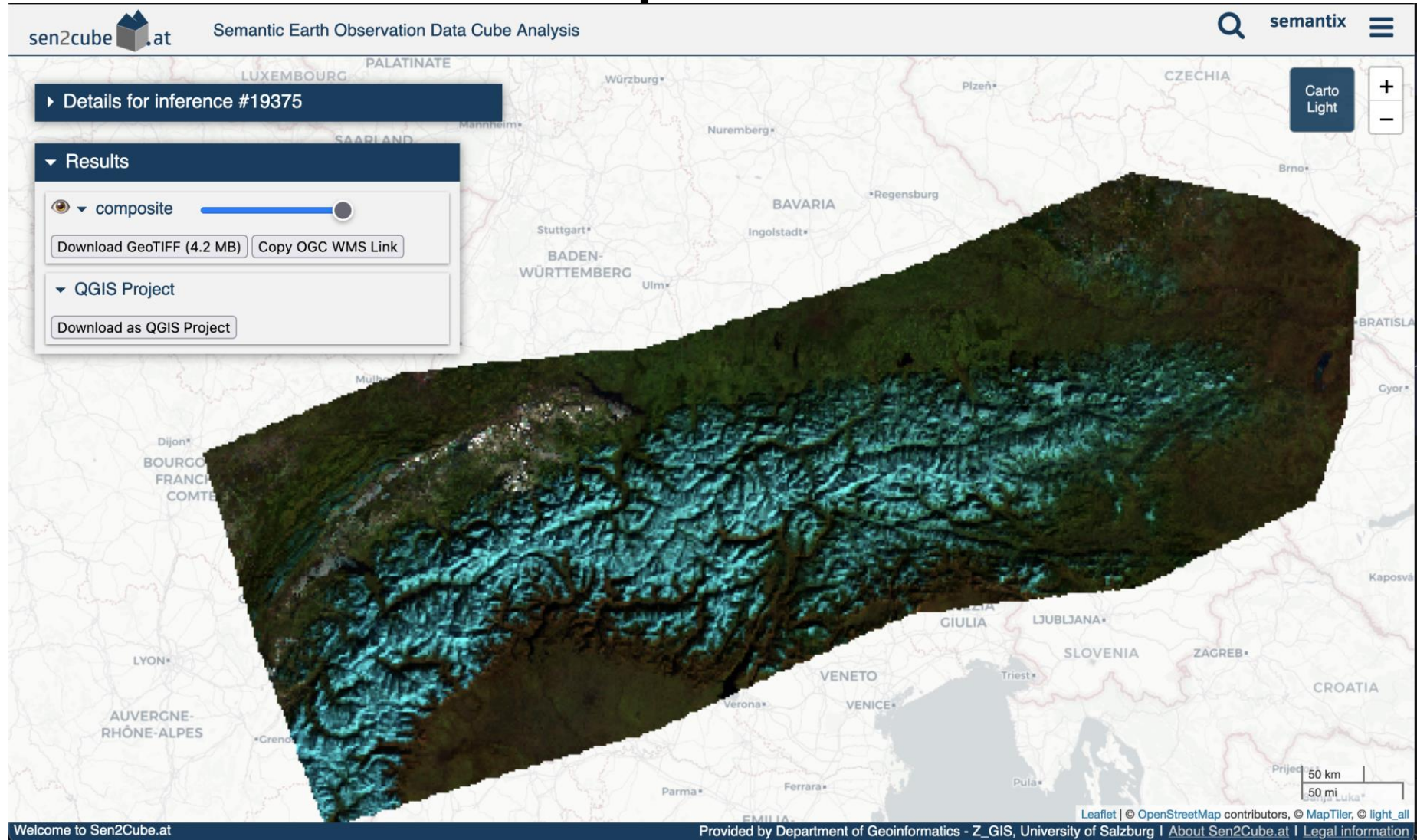
Download as QGIS Project



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on-the-fly user-defined composites

- TOA reflectance for both sensors in combined access
- e.g. cloud-free 22-31.12.2019 (10 days, median TOA)



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More concretely:

- selection of cloud-free scenes beyond existing scene-wide metadata
 - **search** for suitable (optical) imagery
- physical-model-based enrichment can inform common indices
 - threshold setting – add semantically enabled pixel selection before calculating an index
 - categorical variability may be informative enough rather than identity
- ability to integrate other information, interpretations, uncertainty
 - ... but also other products



Take-Aways

- Potential **facilitator** for EO-data access, exploration and analysis
 - convergence-of-evidence approaches
- semantic focus and **semantic querying language** offer different possibilities
 - e.g. stratification or pixel selection based on interpretations or user-defined entities
- **multiple sensors**, image-derived interpretations and other data or information
- towards a lower barrier of entry to multiple optical EO sensors
 - accessing data
 - conducting and sharing analysis towards transferable and repeatable queries/analysis
- We need more **open** solutions in the big EO data domain

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