

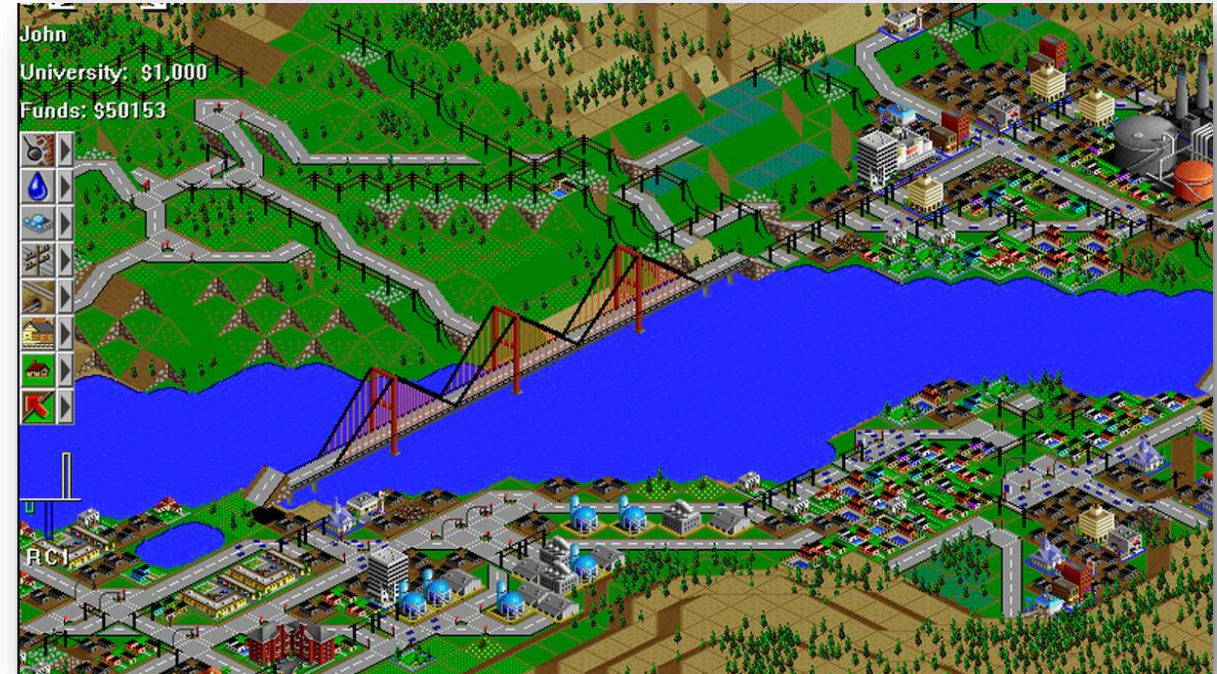
Automated identification of soil sealing hotspots based on Sentinel-2 time-series

EODC Forum 2022

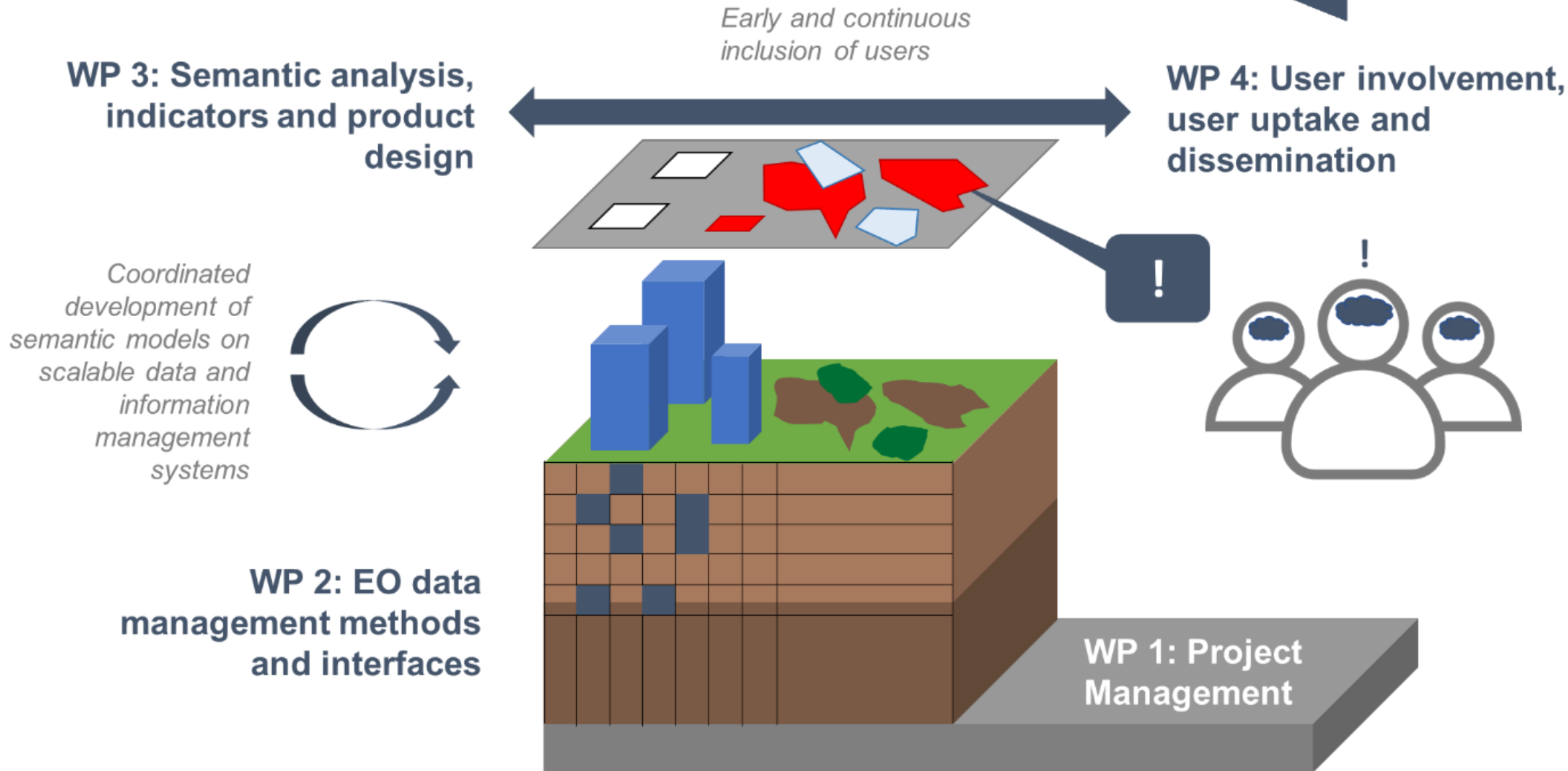
The SIMS project

SIMS - Soil sealing identification and monitoring system

- Technological progress of Earth observation and cloud infrastructure offer new options to detect changes regularly
- Challenges:
 - Easy-to-use workflows, which are adapted to the technological progress
 - Include Copernicus data into existing workflows at institutions
- SIMS: Use Sentinel-2 time series to indicate soil sealing and offer it as **complementarily with integrations into existing workflows**, e.g. with dynamic analyses (i.e. not replacing existing workflows)

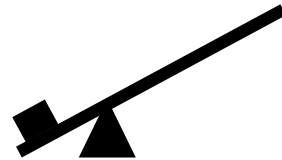


The SIMS project

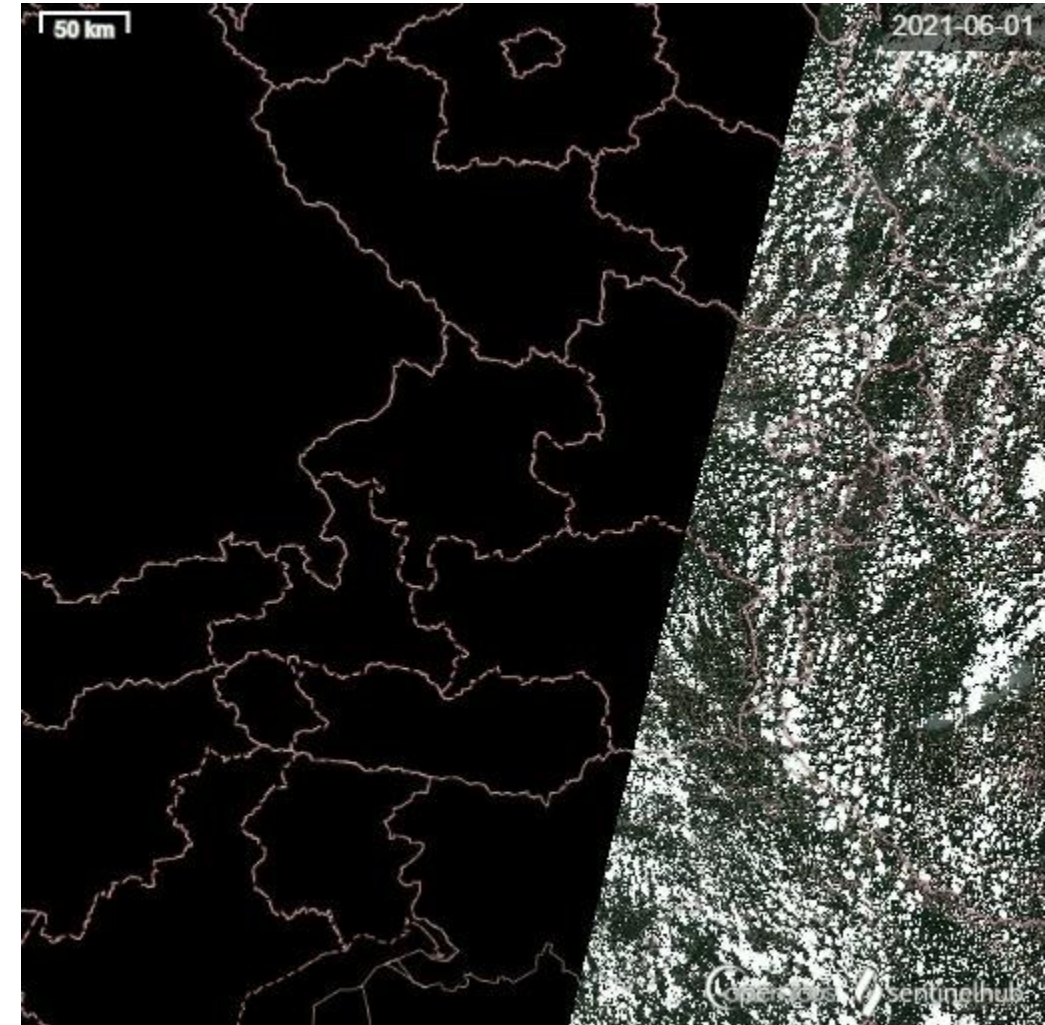


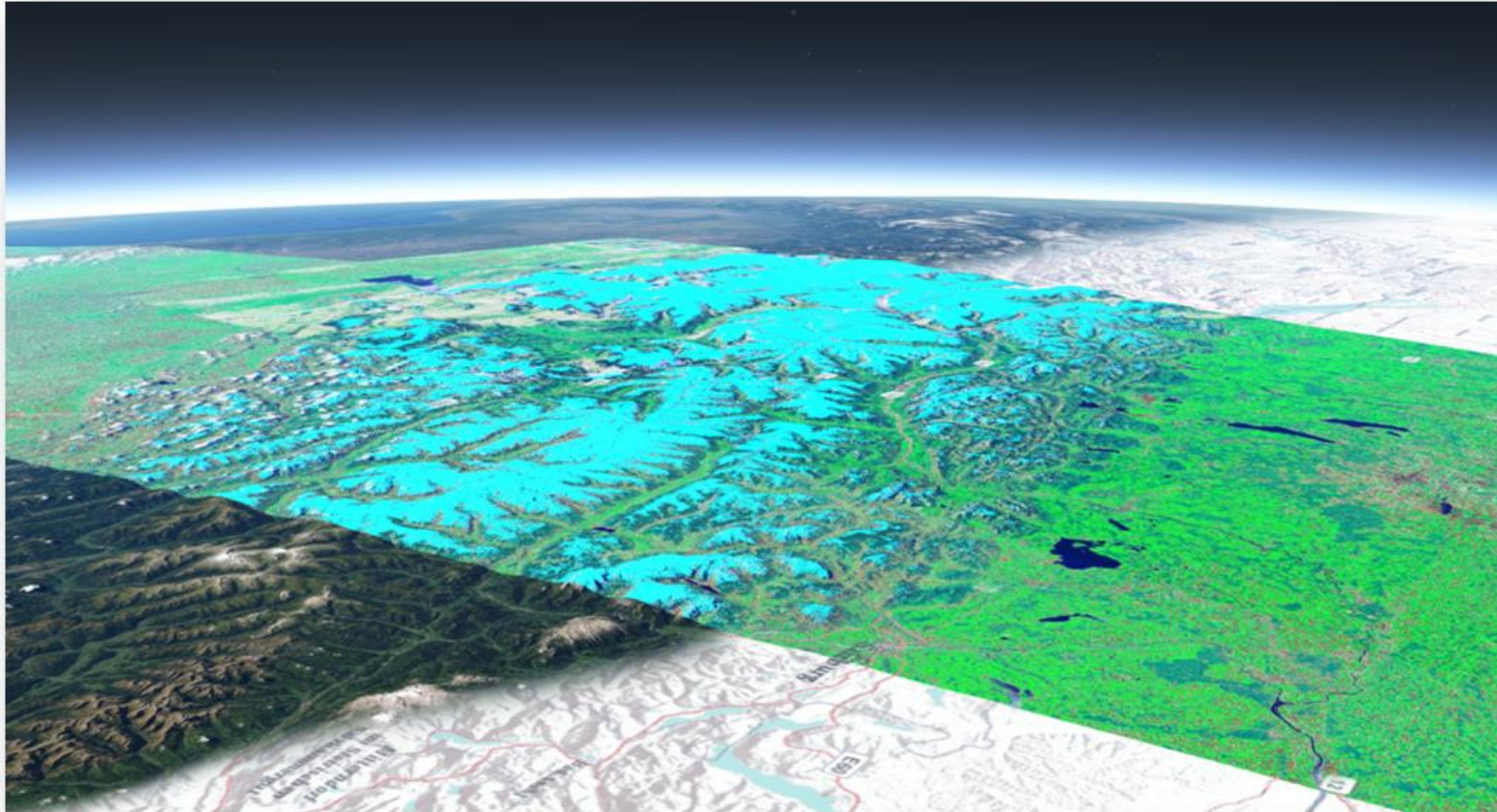
Our Sen2Cube.at semantic EO data cube for Austria uses EODC infrastructure & supports downstream research projects:

1. We are a **small team** at a University (4 + students) with limited resources
2. The **data access** provides access to all Sentinel-2 images that are required for our tasks
3. The **computational resources** provided to us allow conducting **significant analysis** and be part of a wider big EO data community
4. The **infrastructure and services are flexible** enough to create and deploy our own solution (in comparison to other providers) and scale it up
5. It leveraged a lot of our work in the last years, supported by additional grants (ORCRE, C-SCALE)



Sentinel-2 Coverage of Austria (Summer 2021), at least every 5 days a new image with 10 meter resolution



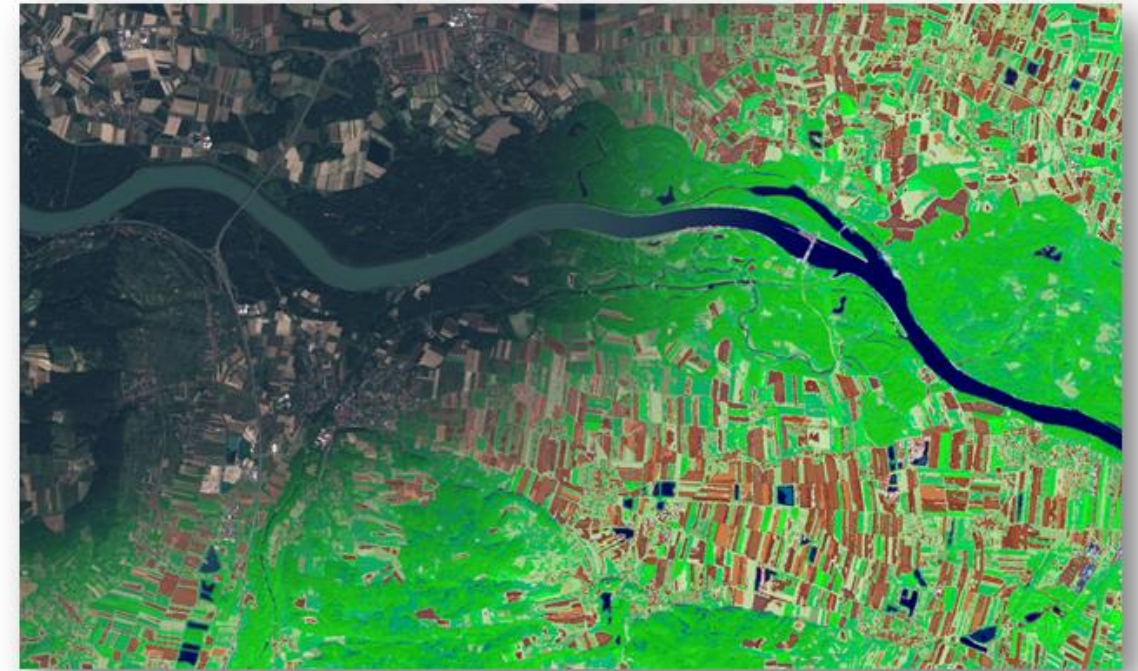


- Every Sentinel-2 image **has a semantic skin/layer:**
 - Reflectance values are associated to **spectral categories**
 - **Transferrable generic:**
 - Time-series of categories allow specification of classes downstream
 - complex, **graphical analyses** are possible
- **Multidimensional** data organization
- Rule-based: No black box

Semantic Enrichment

SIAM (Satellite Image Automatic Mapper) "multi-spectral colour naming"

- Fully automated, based on a physical model
- **No parameter, no training-samples**
- near real-time (approx. 5 min. for a Sentinel-2 granule)
- Scalable, parallelisable ←
- multi-sensor support (at least TOA calibration) ←



"High" leaf area index (LAI) vegetation types (LAI values decreasing left to right)	[Color-coded cells]									
"Medium" LAI vegetation types (LAI values decreasing left to right)	[Color-coded cells]									
Shrub or herbaceous rangeland	[Color-coded cells]									
Other types of vegetation (e.g., vegetation in shadow, dark vegetation, wetland)	[Color-coded cells]									
Bare soil or built-up	[Color-coded cells]									
Deep water, shallow water, turbid water or shadow	[Color-coded cells]									
Thick cloud and thin cloud over vegetation, or water, or bare soil	[Color-coded cells]									
Thick smoke plume and thin smoke plume over vegetation, or water, or bare soil	[Color-coded cells]									
Snow and shadow snow	[Color-coded cells]									
Shadow	[Color-coded cells]									
Flame	[Color-coded cells]									
Unknowns	[Color-coded cells]									

96 spectral categories

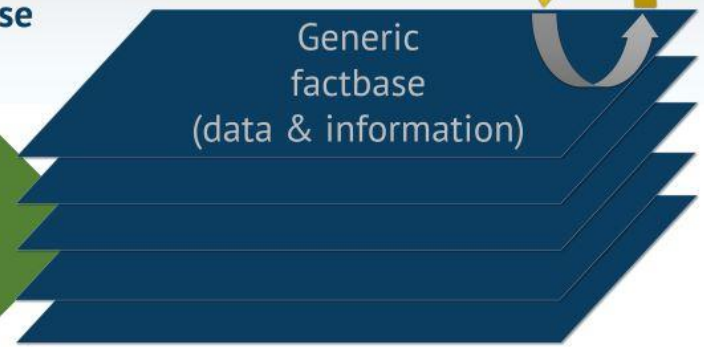
Baraldi, A., Humber, M.L., Tiede, D., Lang, S., 2018. GEO-CEOS stage 4 validation of the Satellite Image Automatic Mapper lightweight computer program for ESA Earth observation level 2 product generation – Part 2: Validation. Cogent Geosci. 4, 1–52. <https://doi.org/10.1080/23312041.2018.1467254>

The Sen2Cube.at national semantic Earth observation data cube for Austria



- SCBIR
- Cloud-free composite
- Phenology through time
- ...

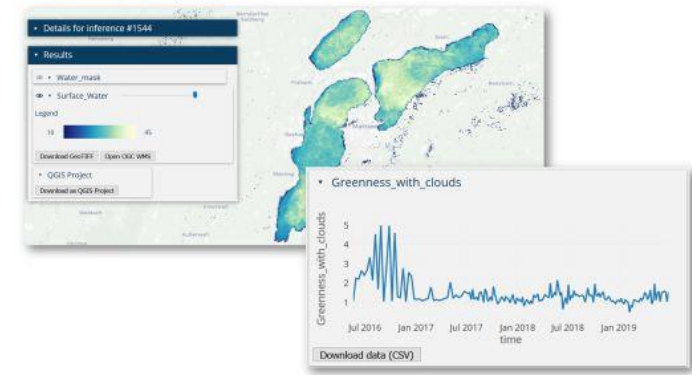
3 Web-based graphical inference engine translates semantic models from the knowledgebase into data cube queries against the factbase



4 Semantic querying language with application-specific visual models and custom outputs:

```

name: 01 - Count Water Presence
semantic concepts
  Define a water entity based on appearance
  of SIAM categories.
entity
  name: water
properties
  property: name (colour)
  rules
    with do: evaluate in: value list
      in 1: category: Deep water or shadow
      in 2: category: Shallow water or shadow
      in 3: category: Turbid water or shadow
      in 4: category: Slightly Shallow Water
application
  Use the water entity and reduce the cube over time
  using count. The result is a map indicating
  for every pixel the occurrence of water.
result
  name: water_count
instructions
  with do: entity: water
  using: reduce over time using count
export: yes
  
```



1 Worldwide applicable automatic semantic enrichment in different granularities with SIAM™

2 EO data cube in a scalable Docker infrastructure as application-agnostic, generic factbase

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Thick cloud and thin cloud over vegetation, or water, or bare soil	
Thick smoke plume and thin smoke plume over vegetation, or water, or bare soil	
Snow and shadow snow	
Shadow	
Flame	
Unknowns	

2015 today

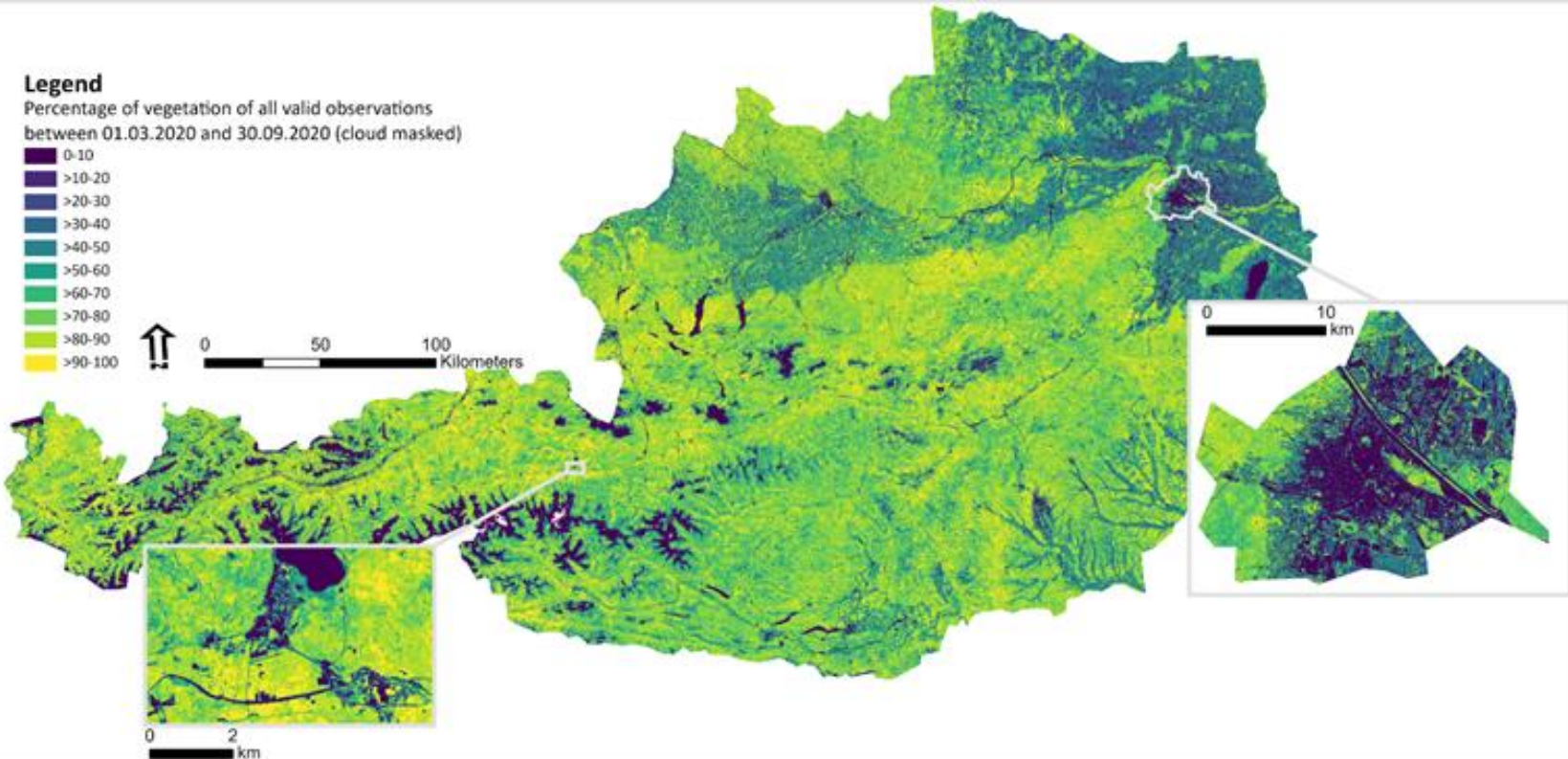
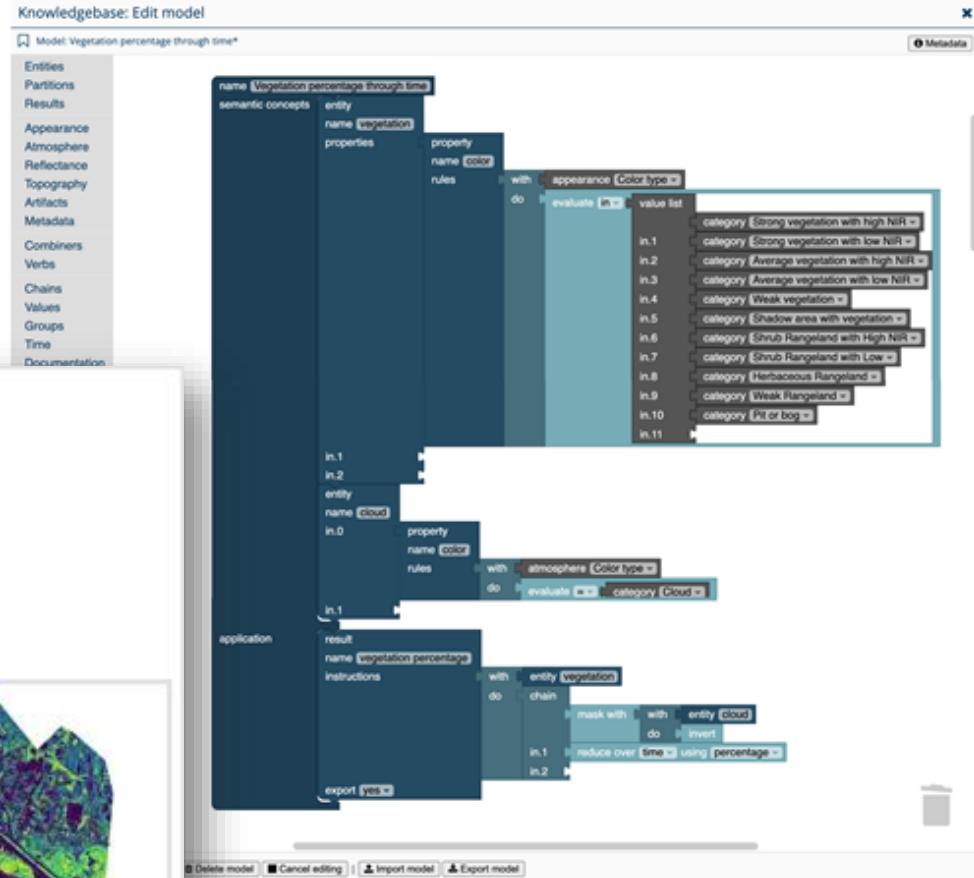
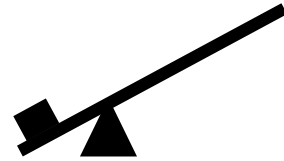
20 TB data

13.000 images



Example: How green is Austria?

Percent of vegetation observations between March and September 2020 (without clouds) for entire Austria



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

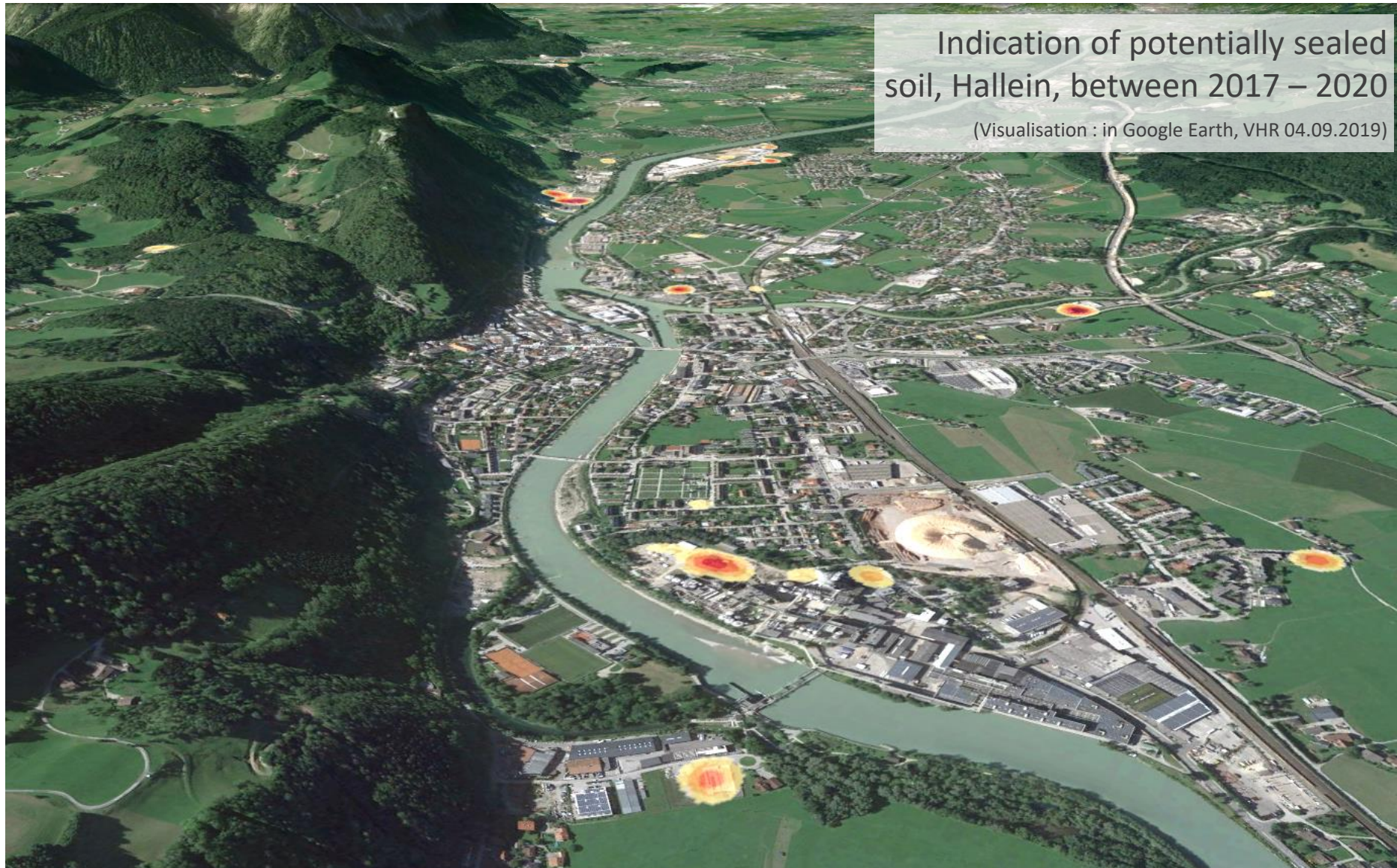
Detecting soil sealing

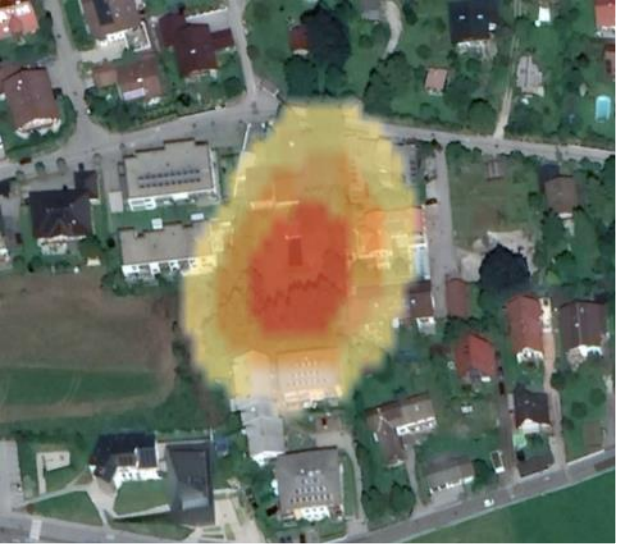
Example

- **Inter- and intra-annual analyses** to identify changes of the Earth's surface (i.e., clouds need to be masked out)
- Time series of **spectral categories** allow formulating several assumptions, e.g.
 - A pixel time series that had consistently a category associated to vegetation is stable
 - A pixel time series that had never a category associated to vegetation is stable
 - If a pixel time series shows a change from categories indicating vegetation to categories indicating built-up or barren land, it shows potentially soil sealing
 - The reverse could be de-sealing
 - A potential soil sealing that becomes vegetated again can still have significant influence on soil parameters (greened roof, compaction, ...)
 - ...

Example: Soil sealing indicators in Hallein

Example





2019



2020



2019



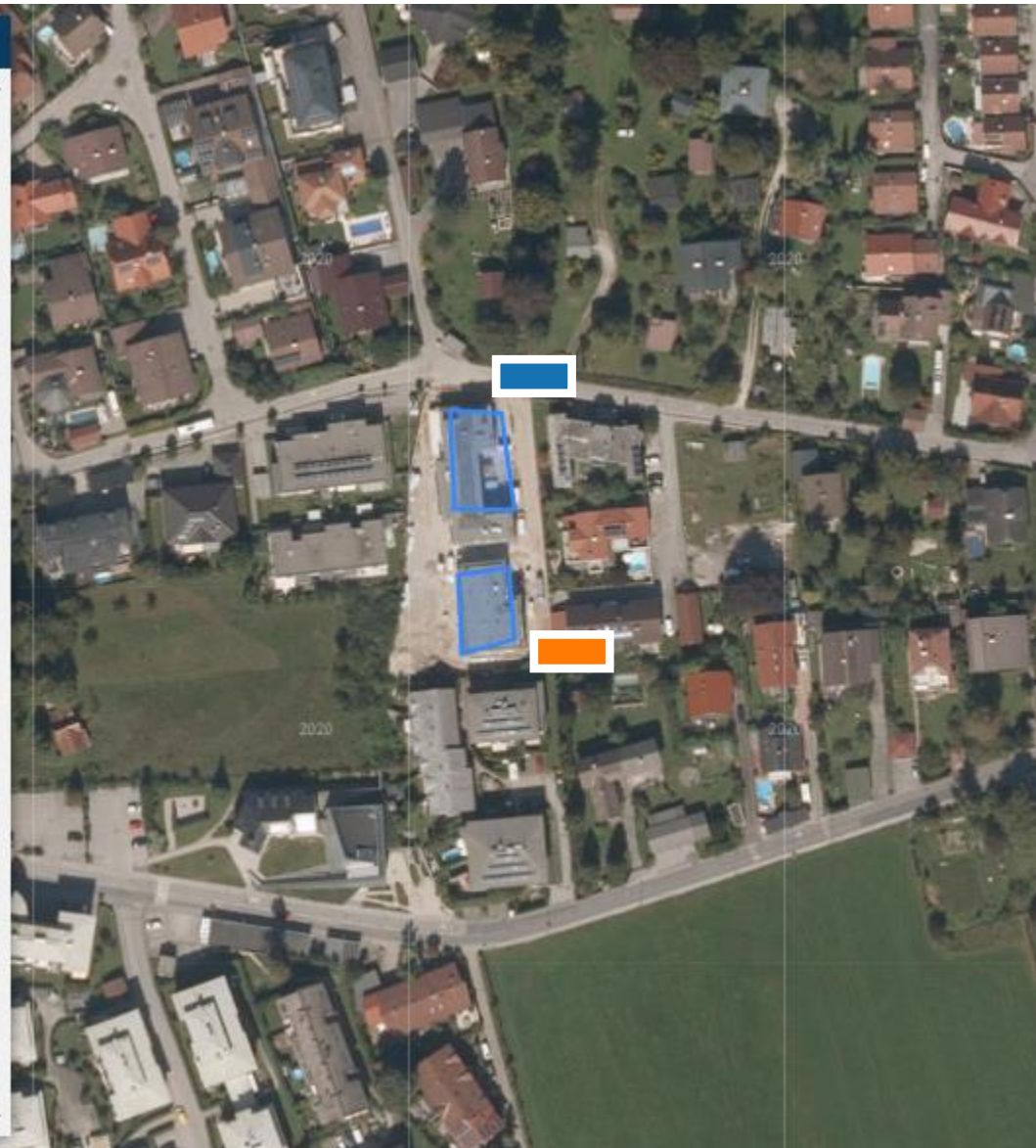
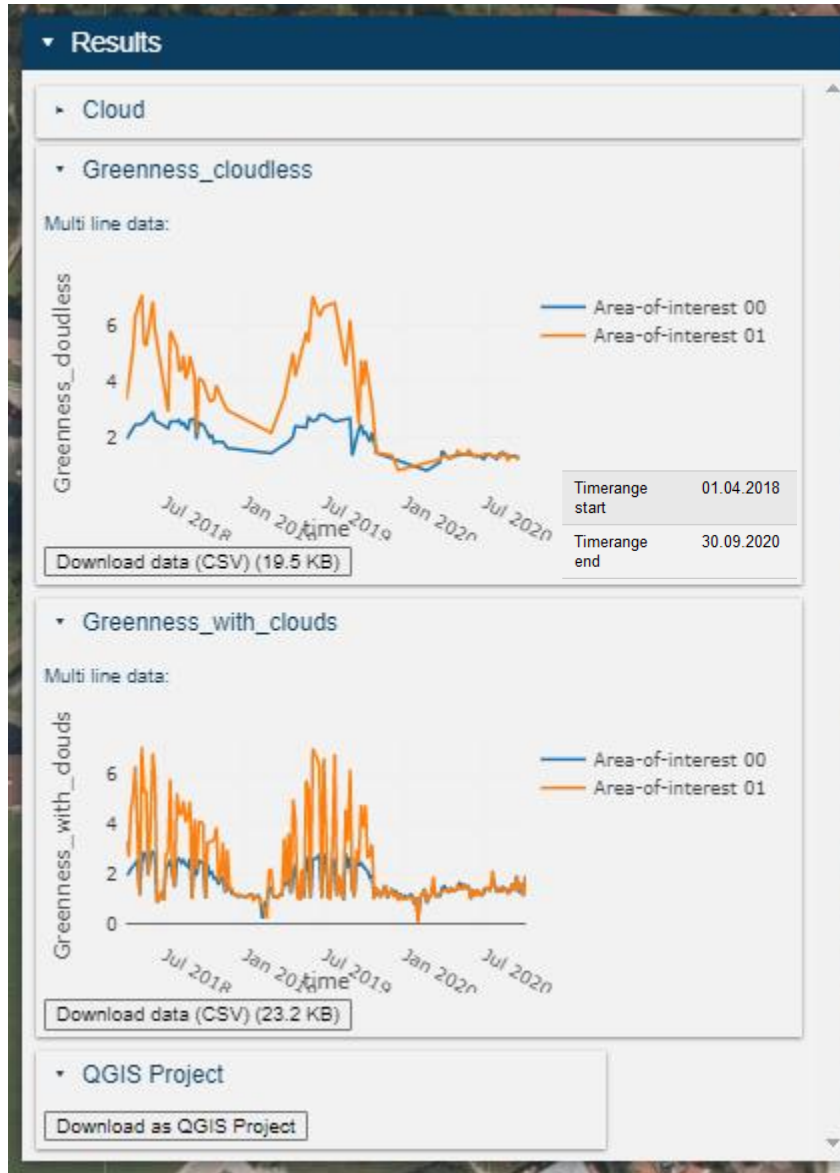
2020



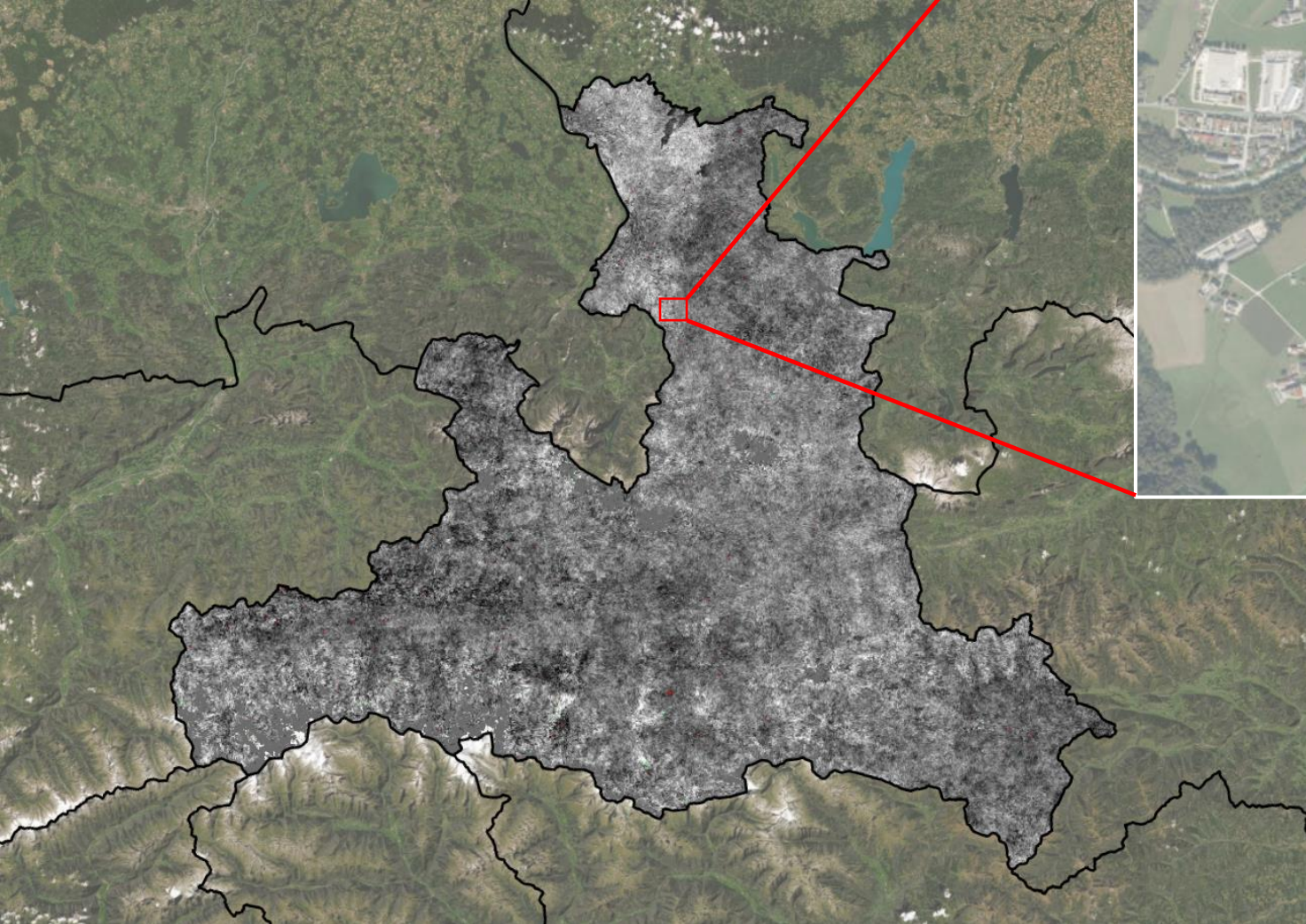
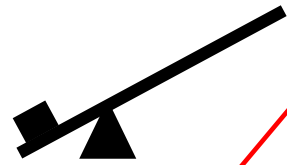
Pléiades

2019

2020



Upscaling



2019 vs. 2020: Change in Vegetation

Example workflow: No black box

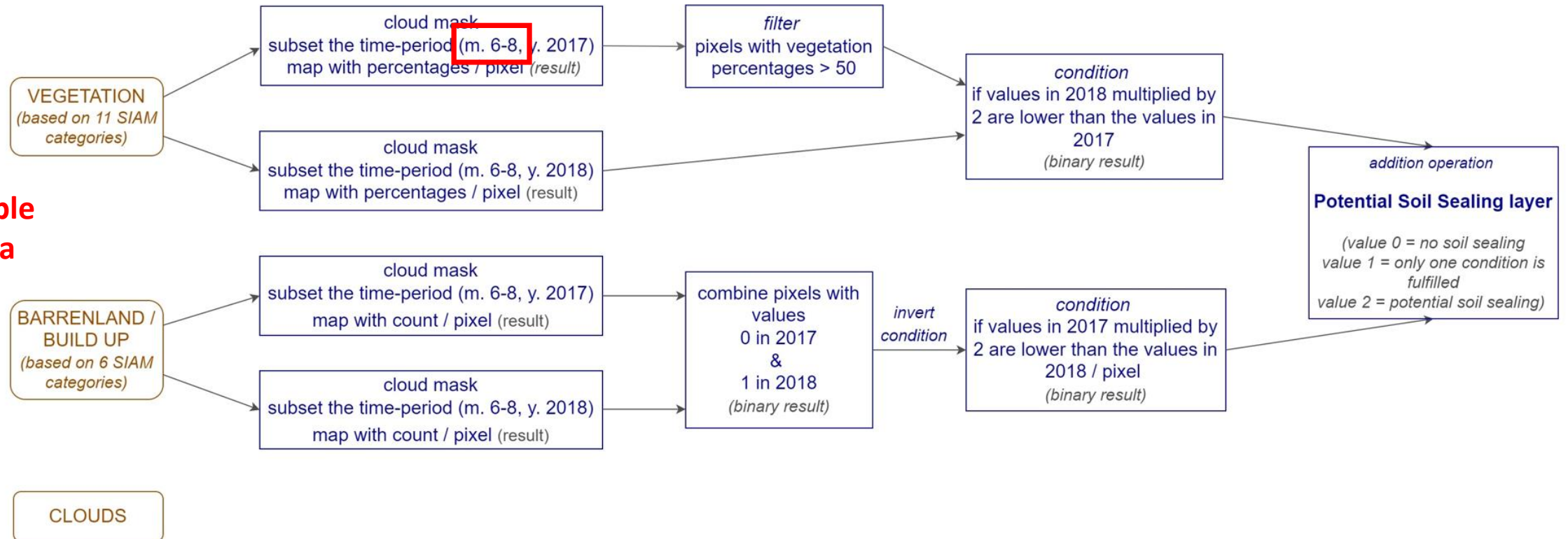
Example

SEMANTIC CONCEPT

Time series of only 3 months

APPLICATION

Multiple criteria



SIMS: Outlook

- **Additional research:** Semantic Models (in Development)
 - What can be detected with Sentinel-2 time series?
 - Identify (additional) limitations
- **Scaling:** regular analyses on provincial or country level
- **Evaluation:** robustness and applicability of semantic models
- **Providing** semantic models (on-demand analysis) and results (pre-calculated)
 - Different platforms will be supported, e.g., Web-browser, ArcGIS, QGIS...



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