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Complex data, *made easy*

DL4EO: Deep Learning for Earth Observation

European Students Space Hackathon
October 8th-9th, 2021
Juan B. Pedro Costa
juan@earthpulse.es

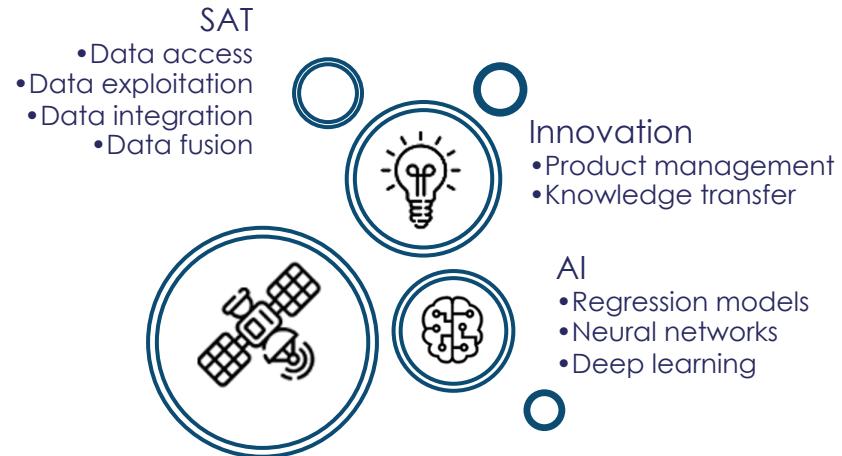


Knowledge
innovation
marketbcn

•esa
space solutions



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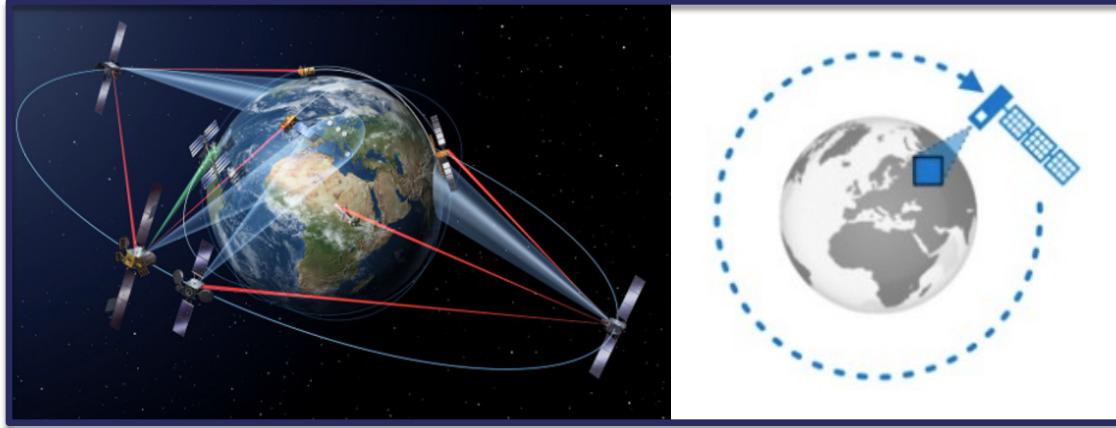


Our mission is to unlock the value of **Earth Observation data** leveraging the **power of AI** to absorb complexity and cost, providing **actionable knowledge** to our users.

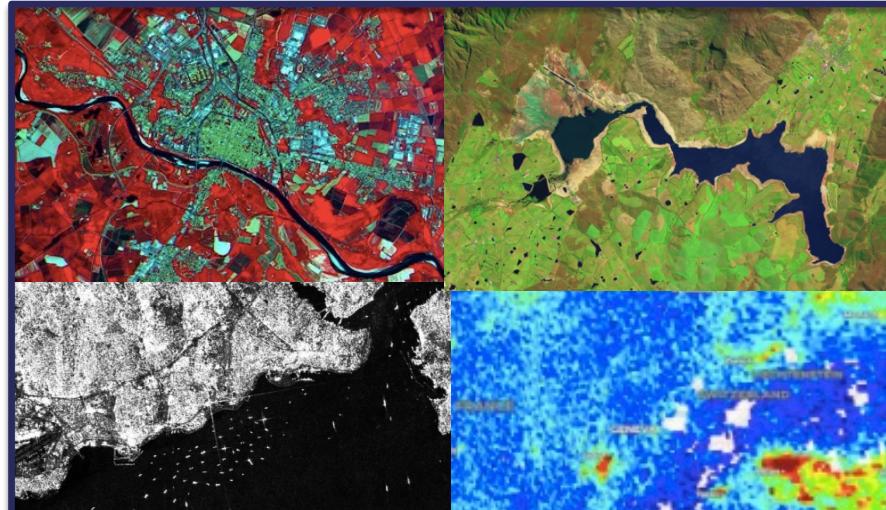
Complex data made easy

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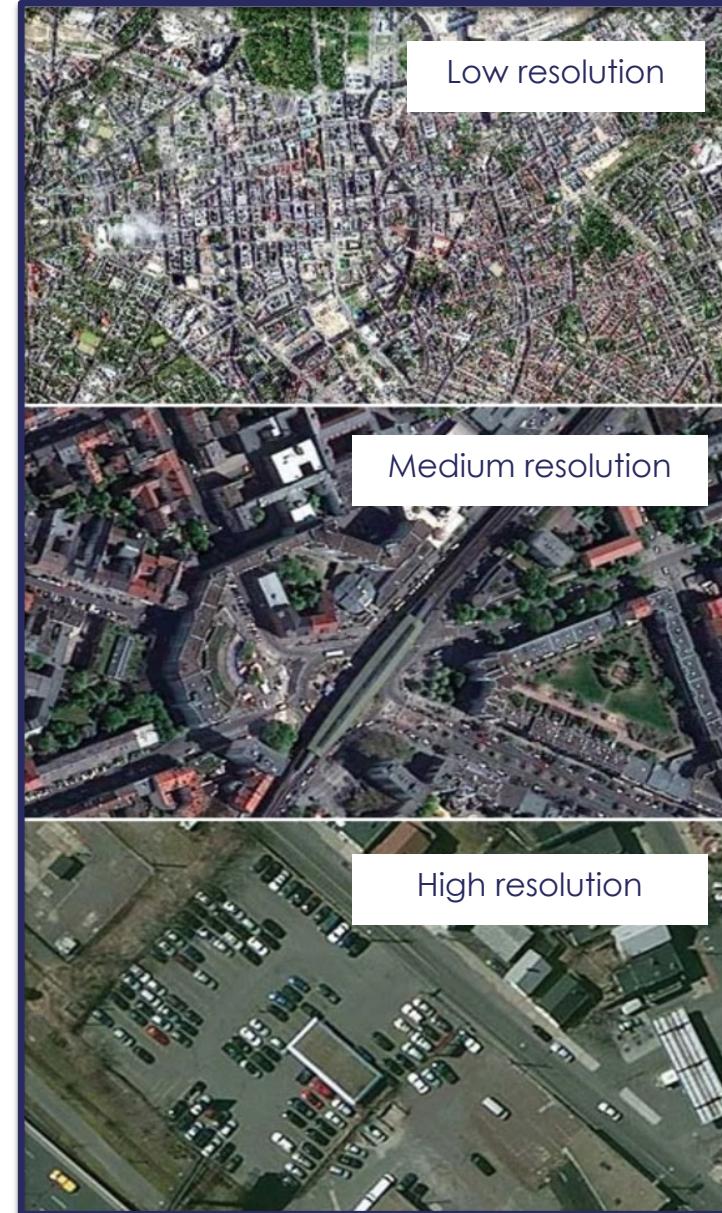
Global coverage, daily



Multisource, variety of sensors



Closer & closer

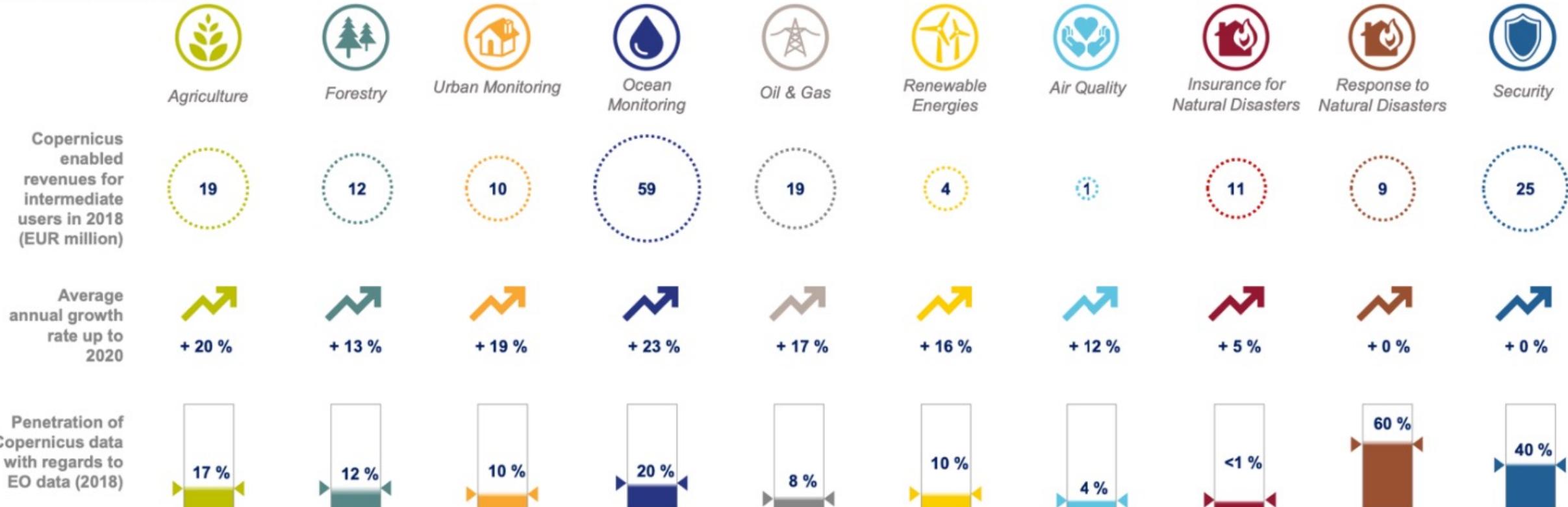


DigitalGlobe data

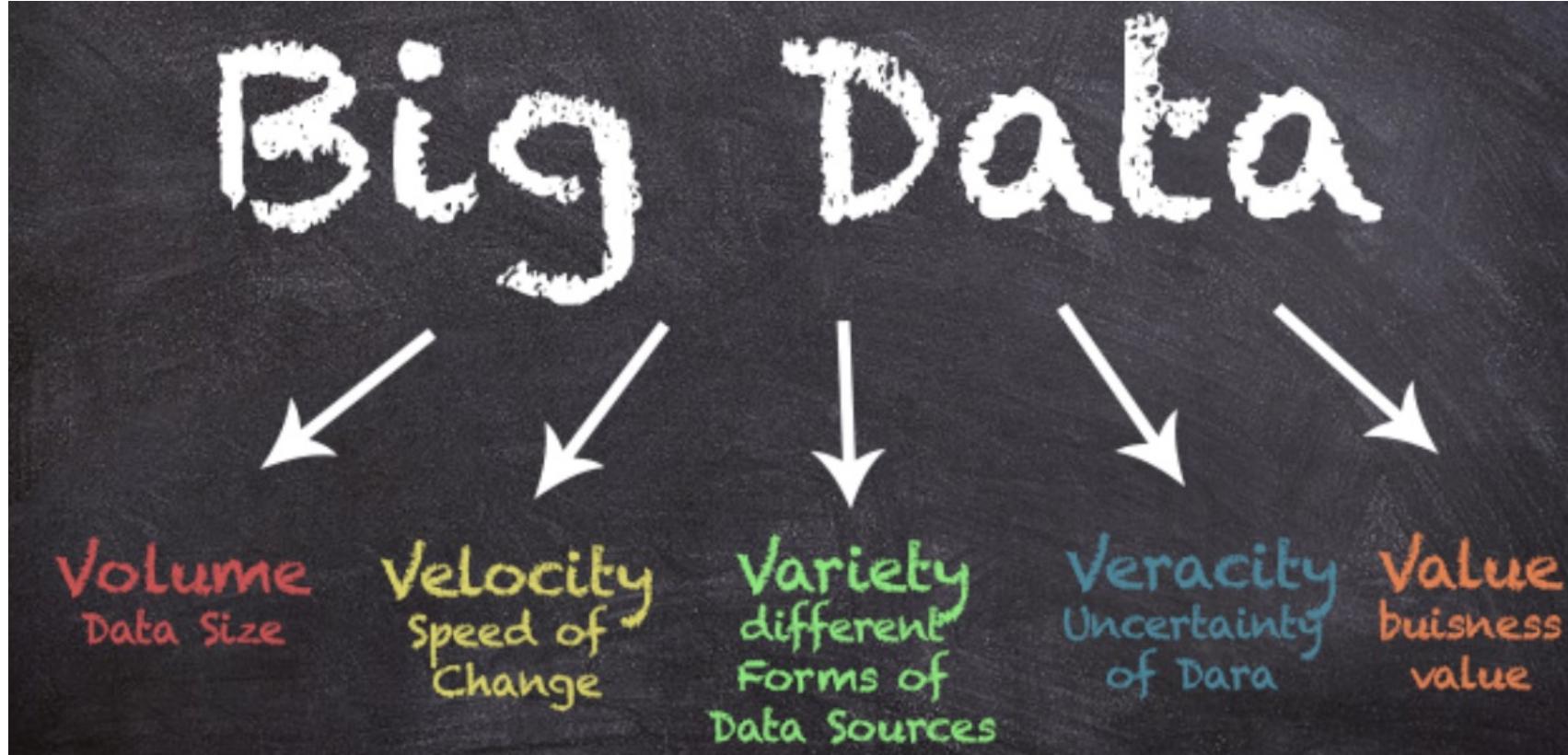
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► Copernicus Market Report (Issue 2, February 2019).

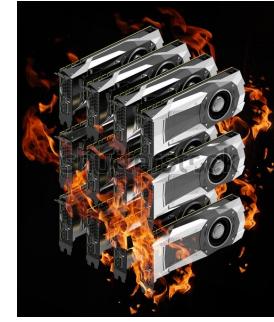
DETAIL PER VALUE CHAIN



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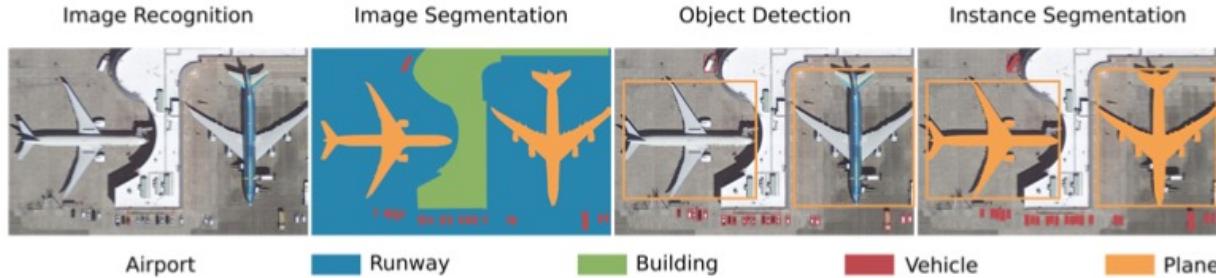


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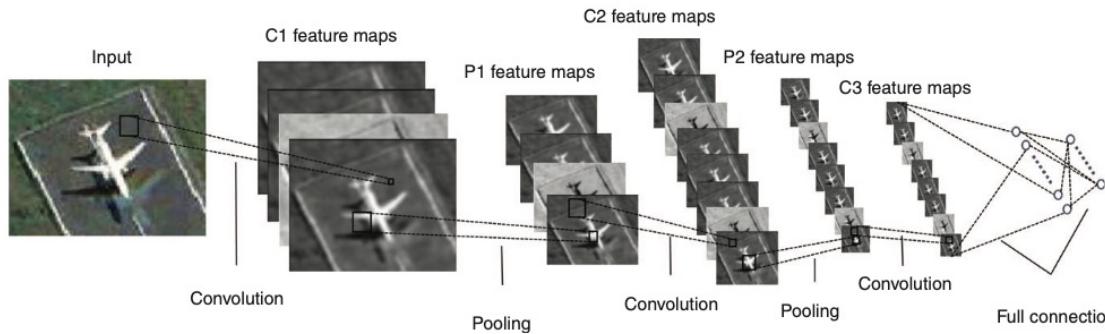


PyTorch

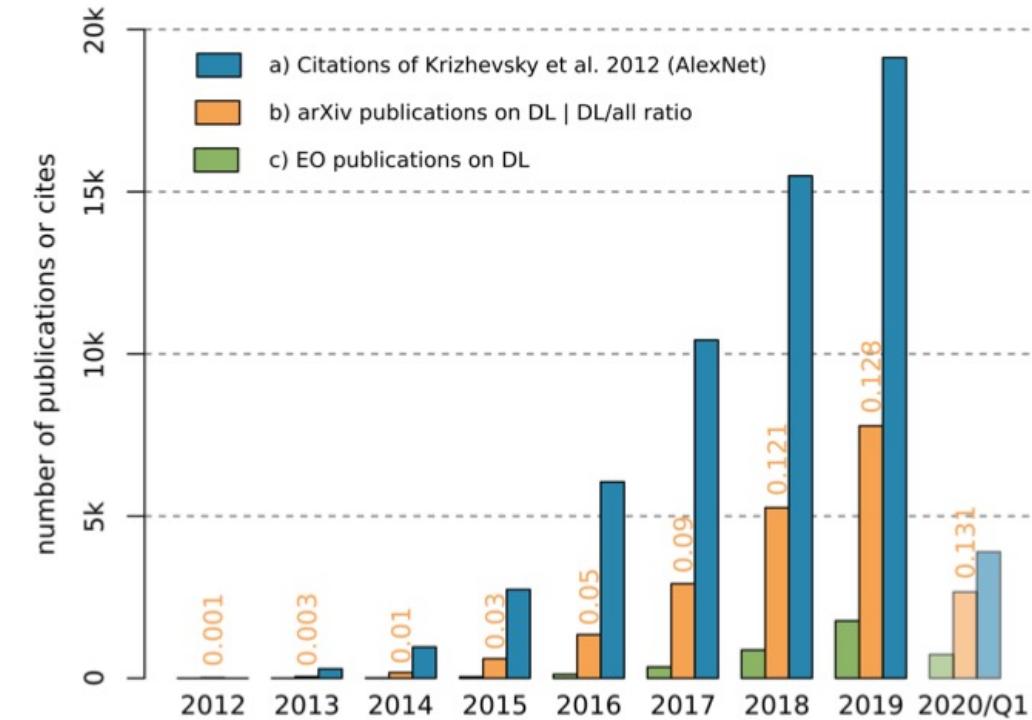
- ▶ Deep Learning for Earth Observation.
- ▶ Mainly, Computer Vision with CNNs.



<https://doi.org/10.3390/rs12101667>



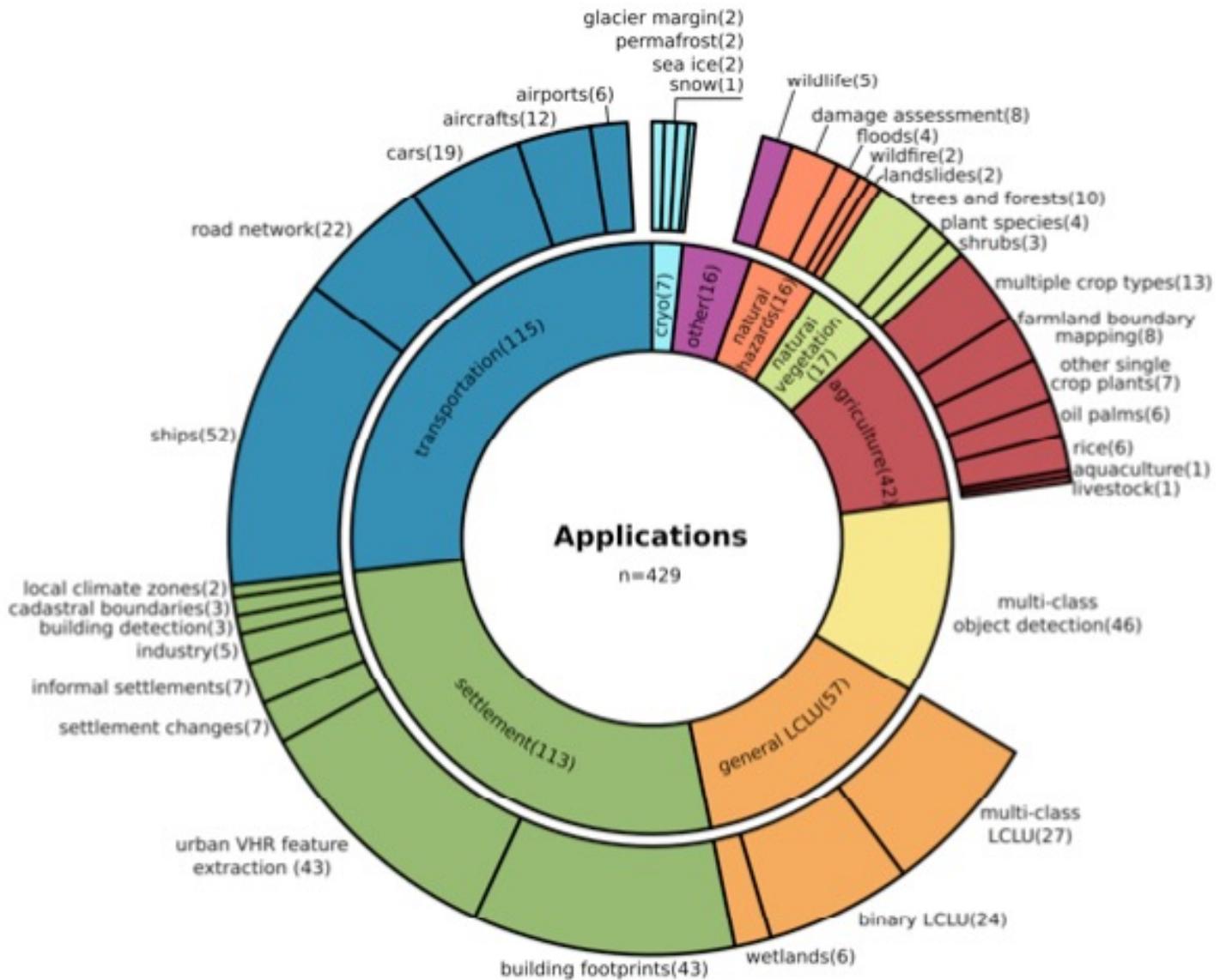
<https://doi.org/10.1002/widm.1264>



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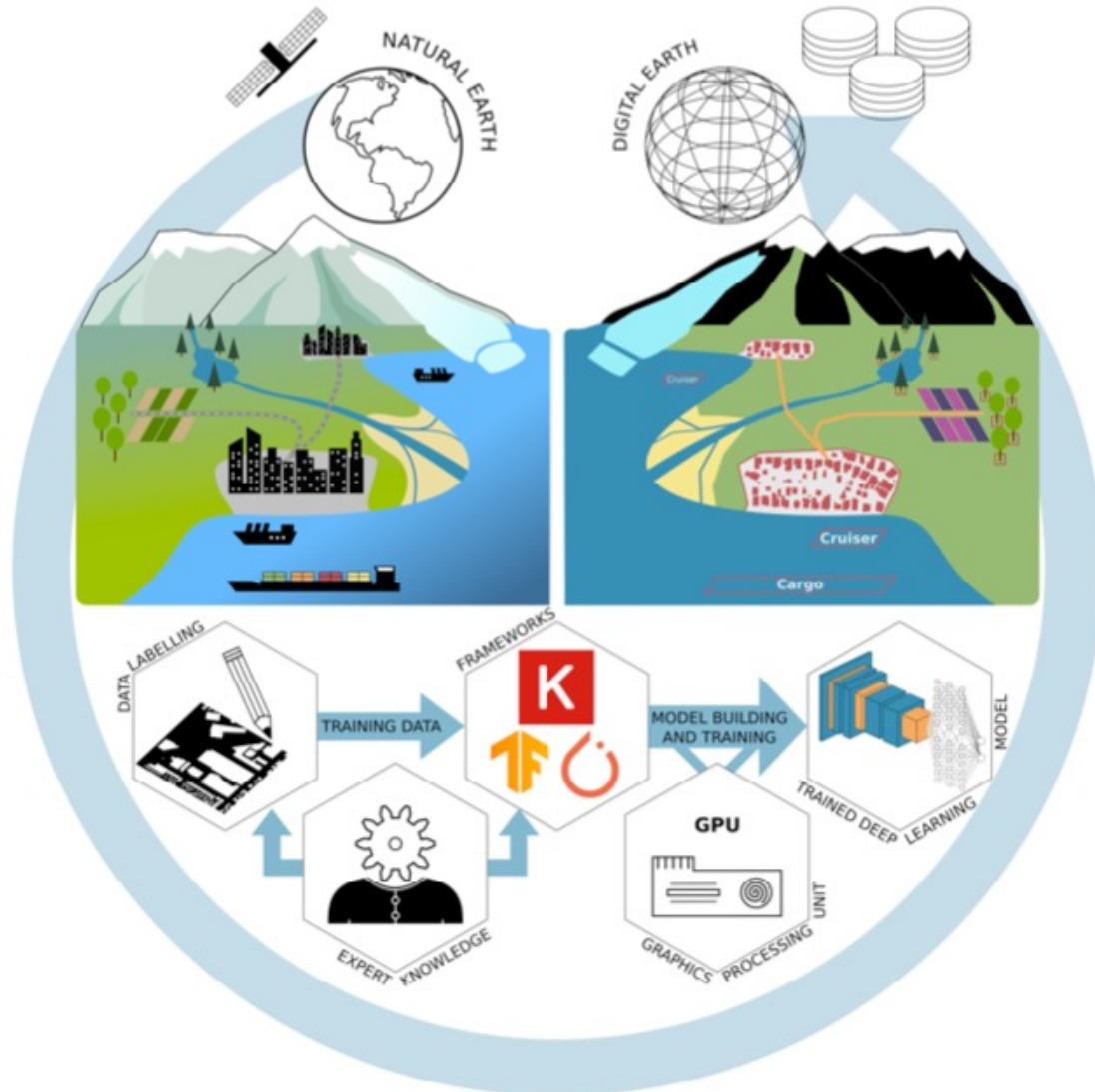
Success stories

- ▶ Transportation (ship, car, aircraft detection on optical and radar HR imagery).
 - ▶ Settlement (building footprint, road extraction, infrastructure management, mapping, ...)
 - ▶ LULC (built-up areas, water bodies, river networks, ...)
 - ▶ Agriculture (crop monitoring, field mapping, ...)
 - ▶ Hazards (floods, fires, landslides, ...)
 - ▶ Others



Why DL4EO ?

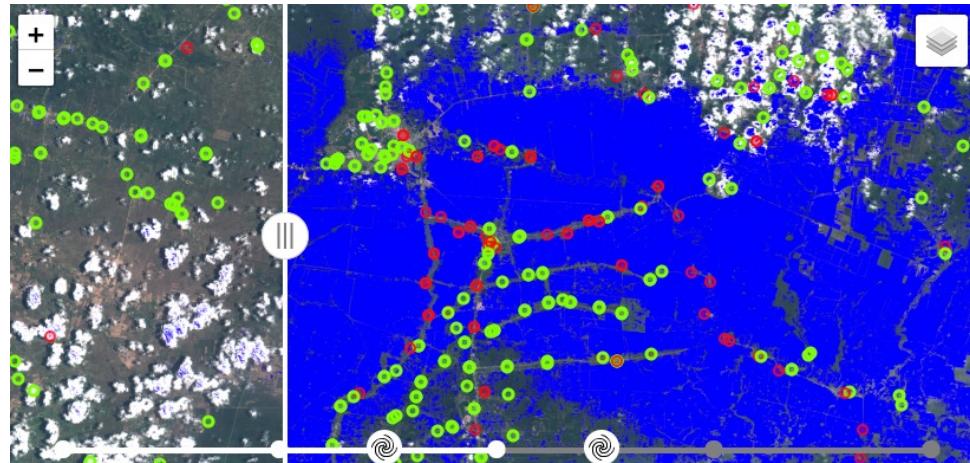
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- ▶ The Digital Twin Earth (DTE)
- ▶ Cloud-based information retrieval and forecasting entity.
- ▶ Without EO data associated complexity.
- ▶ Connect any device (smartphones, cars, games, other AIs, ...)

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- ▶ SPAI: Satellite Processing Application Interface.
 - ▶ API for data access and information retrieval.
- ▶ Pulses: Our solution for non-experts.
- ▶ SCAN: Satellite Collaborative ANnotation tool.
 - ▶ AI-assisted labelling tool.
- ▶ Pytorch EO: OS library for easy DL4EO.
 - ▶ Data fusion, SSL, Multi-task, custom models, ...
- ▶ Models Universe: DL models repository for EO applications.
- ▶ AI4EO: challenges <https://platform.ai4eo.eu/>
- ▶ Know more → <https://earthpulse.ai/>



Impact Pulse example



Bare soil Crops Forest River-vegetation Urban River

Vulnerability Pulse example

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- ▶ The Challenge: Train a Neural Network to classify Satellite Images with the EuroSAT dataset (<https://github.com/phelber/EuroSAT>).

- ▶ Data: Sentinel 2 imagery + labels.
- ▶ Task: Image classification in 10 classes.
- ▶ O1: maximize accuracy on test set.
- ▶ O2: Can you build something interesting with it?



(a) Industrial Buildings



(b) Residential Buildings



(c) Annual Crop



(d) Permanent Crop



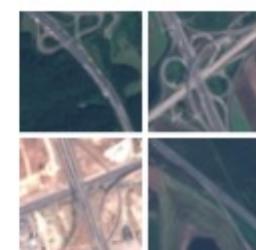
(e) River



(f) Sea & Lake



(g) Herbaceous Vegetation



(h) Highway



(i) Pasture

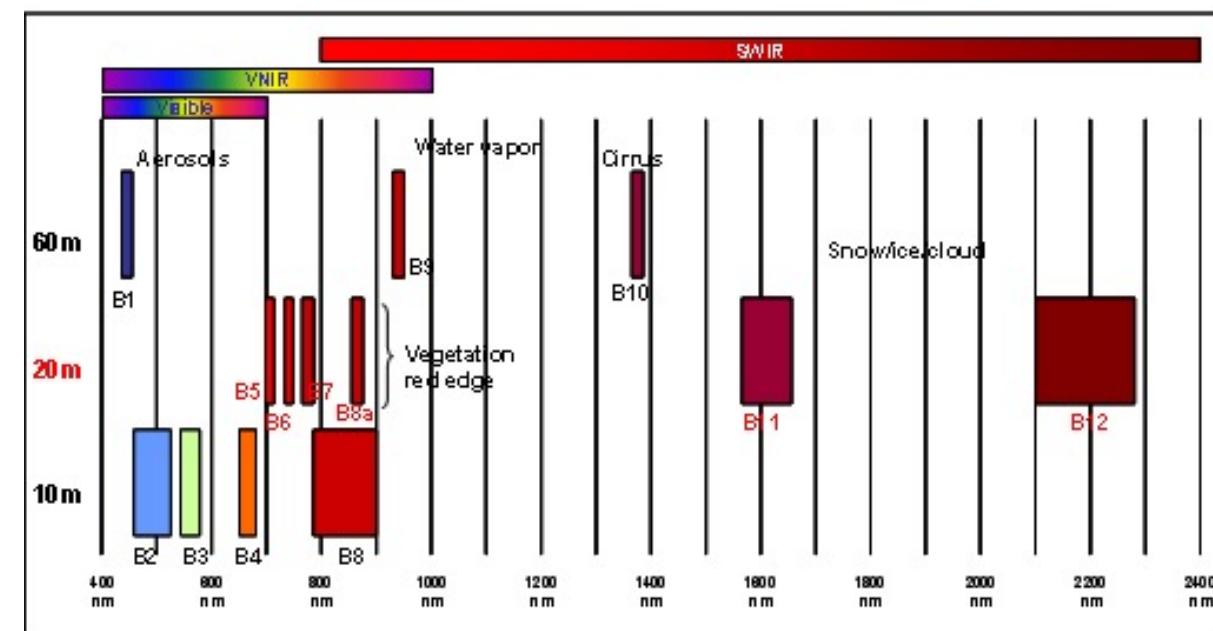


(j) Forest

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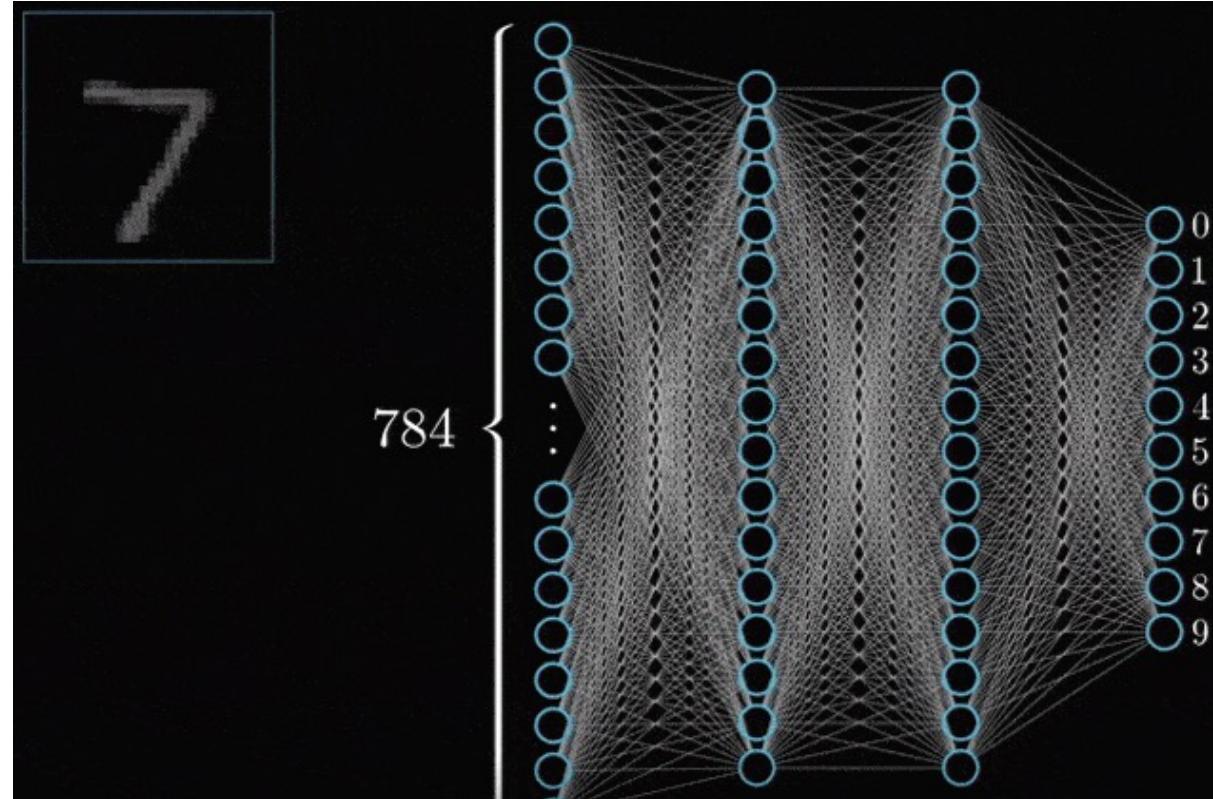
- The Data: Sentinel 2 is multispectral satellite with 13 bands.
 - Q1: What is the best combination of bands ?

Sentinel-2 bands	Central wavelength (μm)	Resolution (m)
Band 1 – Coastal aerosol	0.443	60
Band 2 – Blue	0.490	10
Band 3 – Green	0.560	10
Band 4 – Red	0.665	10
Band 5 – Vegetation red edge	0.705	20
Band 6 – Vegetation red edge	0.740	20
Band 7 – Vegetation red edge	0.783	20
Band 8 – NIR	0.842	10
Band 8A – Vegetation red edge	0.865	20
Band 9 – Water vapour	0.945	60
Band 10 – SWIR – Cirrius	1.375	60
Band 11 – SWIR	1.610	20
Band 12 – SWIR	2.190	20



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- ▶ The Task: Image classification in 10 classes.
 - ▶ Q2: What architecture to use (hint, a CNN is a good start) ?
 - ▶ Q3: What hyperparameters work best with our data ?



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- ▶ Objective 1: maximize accuracy on test set.
 - ▶ R1: Use the provided test set.
 - ▶ R2: Your solution should be reproducible.
- ▶ Objective 2: Can you build something interesting with it?
 - ▶ Example: <https://youtu.be/6RPe0VI4zm4>
- ▶ How to start?
 - ▶ Baseline: https://colab.research.google.com/github/earthpulse/pytorch_eo/blob/master/challenges/euroavia_hackathon_21/baseline.ipynb
 - ▶ Resources:
 - ▶ PytorchEO: https://github.com/earthpulse/pytorch_eo (docs are coming soon... Contact me for any question!)
 - ▶ Pytorch: <https://pytorch.org/tutorials/>
 - ▶ Pytorch Lightning: <https://pytorch-lightning.readthedocs.io/en/latest/>
 - ▶ Learn AI (in Spanish): <https://www.youtube.com/c/sensio-ia>

$$\text{Accuracy} = \frac{\text{TP} + \text{TN}}{\text{TP} + \text{TN} + \text{FP} + \text{FN}}$$

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Thank you ! Questions ?

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