



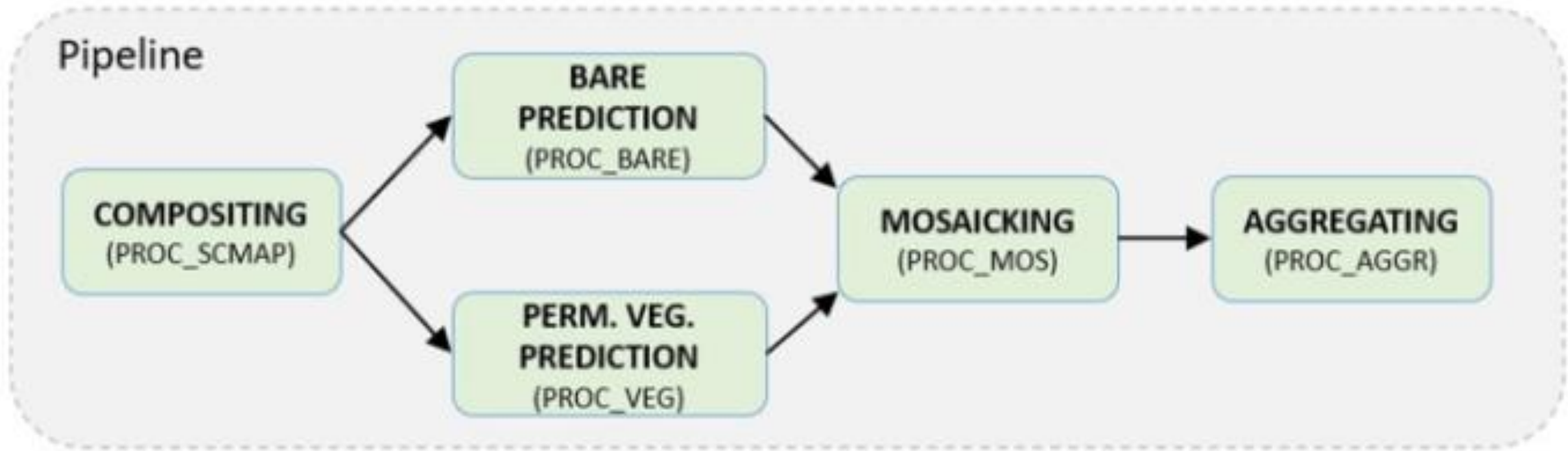
Session 3 – SOC prediction algorithms for Vegetated areas

Laura Poggio

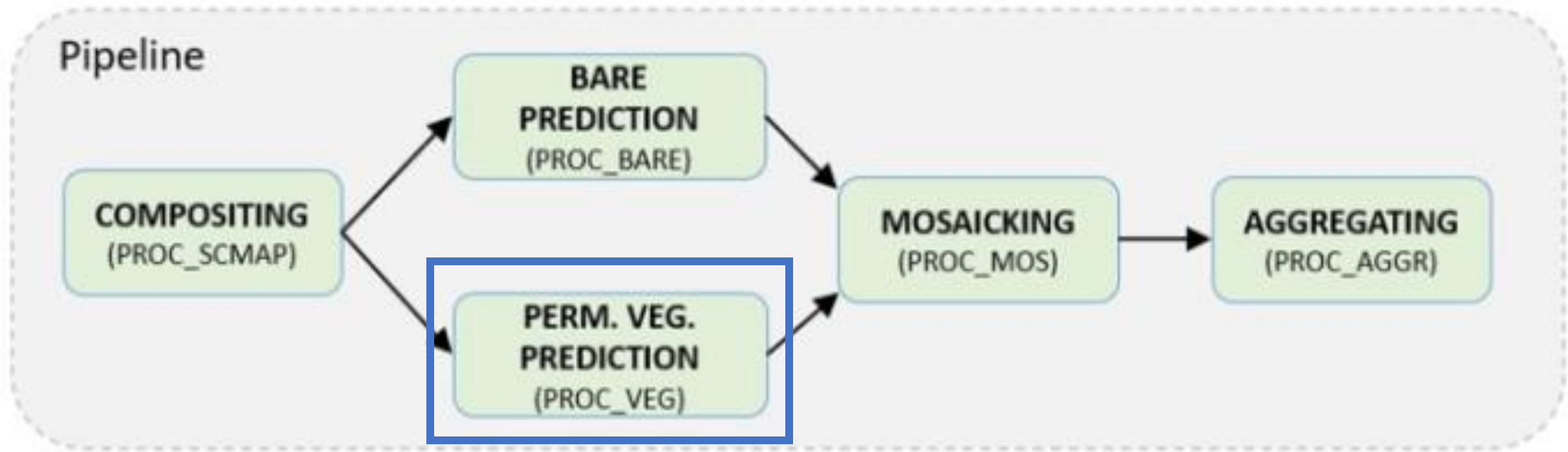


ESA Symposium on Earth Observation for Soil Protection and Restoration

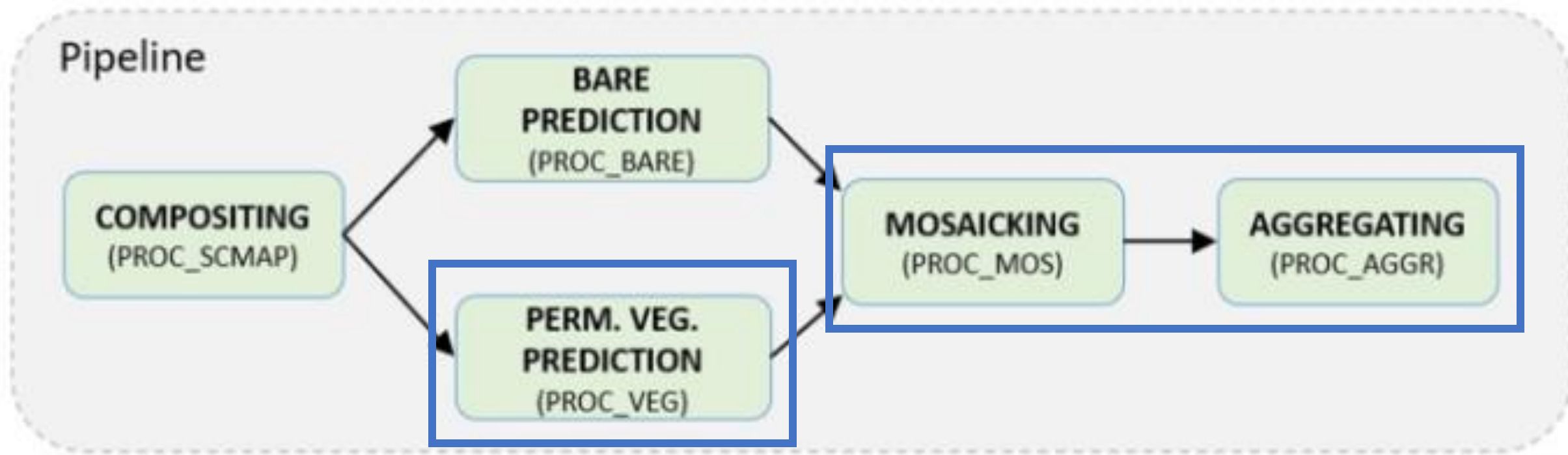
WorldSoils – general framework



WorldSoils – general framework



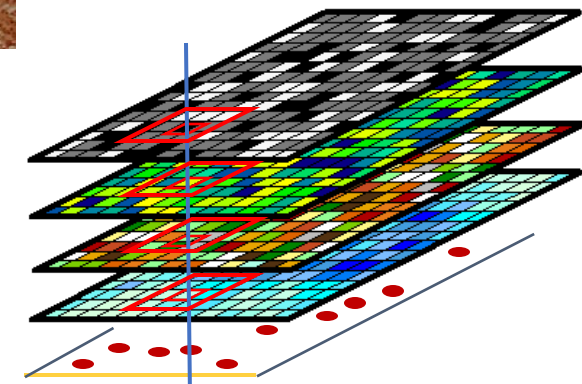
WorldSoils – general framework



Digital Soil Mapping

- Statistical model between soil observations and environmental variable
- Not a direct link but via proxies representing the soil forming factors: vegetation, management, climate,...
- Uses covariates that are available for the region of interest.
- Few studies considering EO temporal composites as covariates

Environmental variables

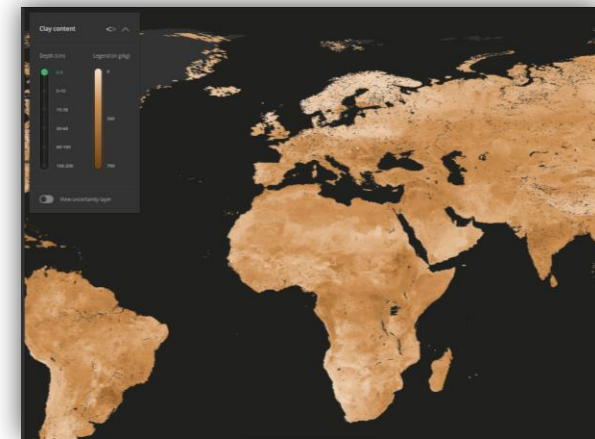


Soil observations

Model



Soil property maps



SCMaP Product suite

Sentinel-2 mean reflectance composite (2017 – 2019), East of Munich



Environmental covariates

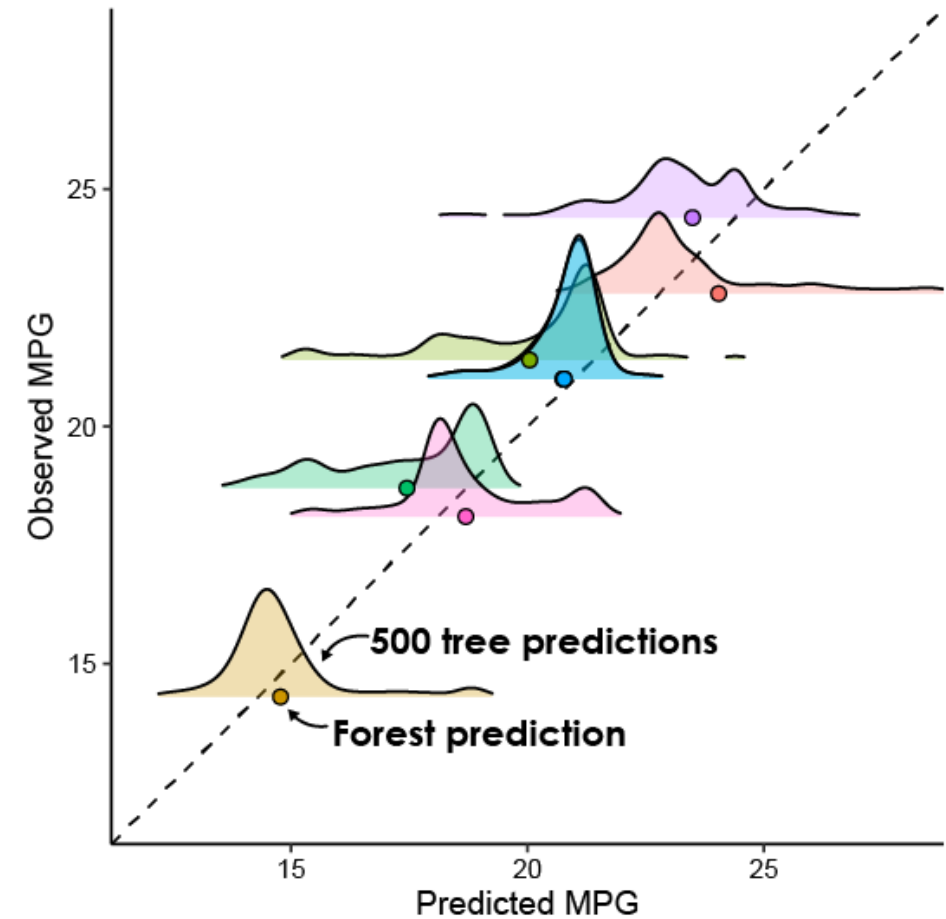
- **Sentinel 2** (just described in previous presentation)
- Copernicus **Digital Elevation Model**:
 - Elevation from sea level (m)
 - Slope
 - Topographic wetness index
 - Multi-resolution Valley Bottom Flatness
- **Climate data (ERA5)**:
 - temperature (2m), total precipitation, runoff, total evaporation, surface net solar radiation.



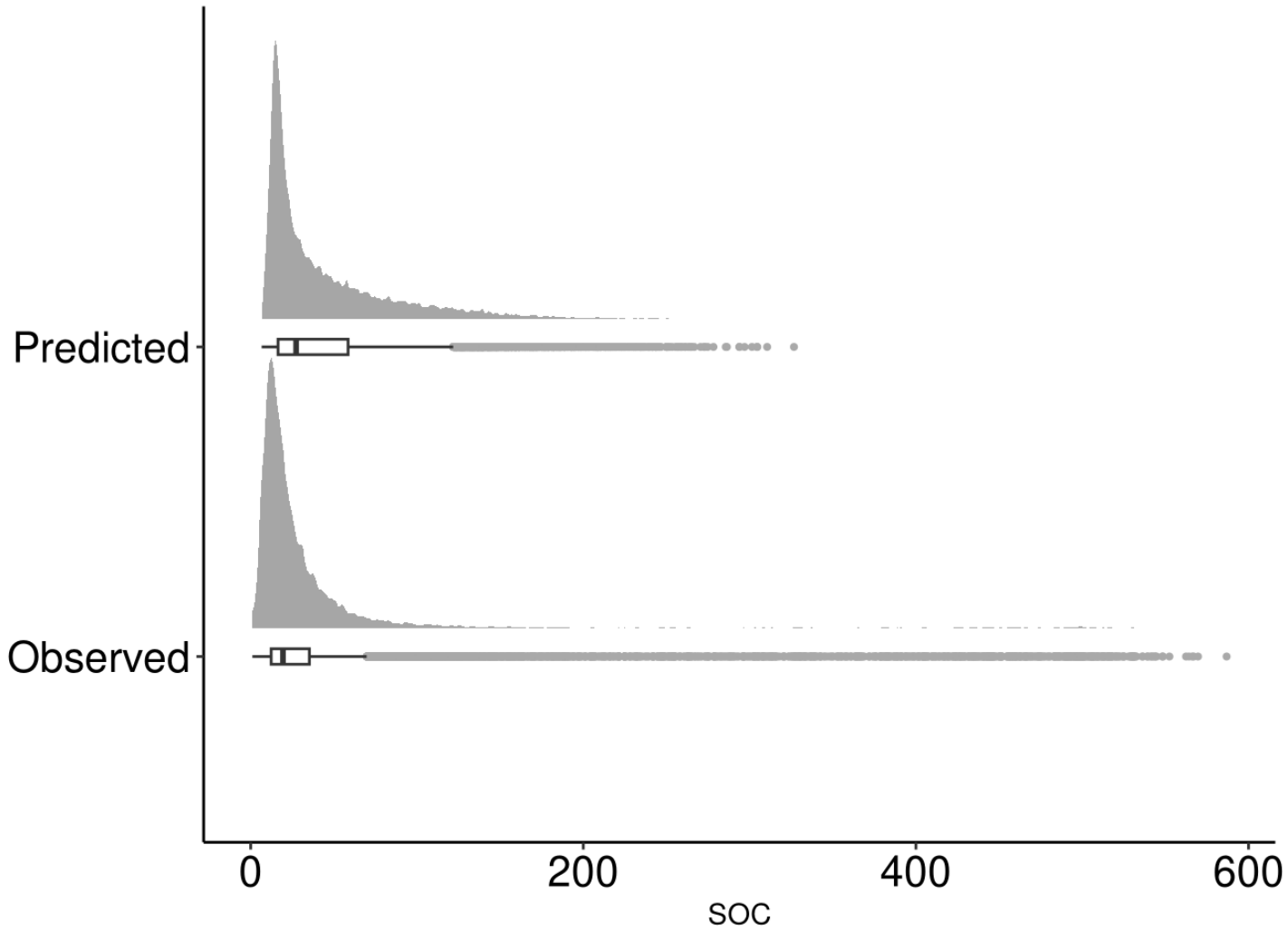
Modelling

- Quantile RandomForest
- 10 folds cross-validation
- Hyper-parameters optimisation (including Recursive feature elimination)
- Predictions
- Pixel based uncertainty (quantiles):
 $(Q095-Q005)/(Q050)$

Seeing the (Random) Forest for the Trees



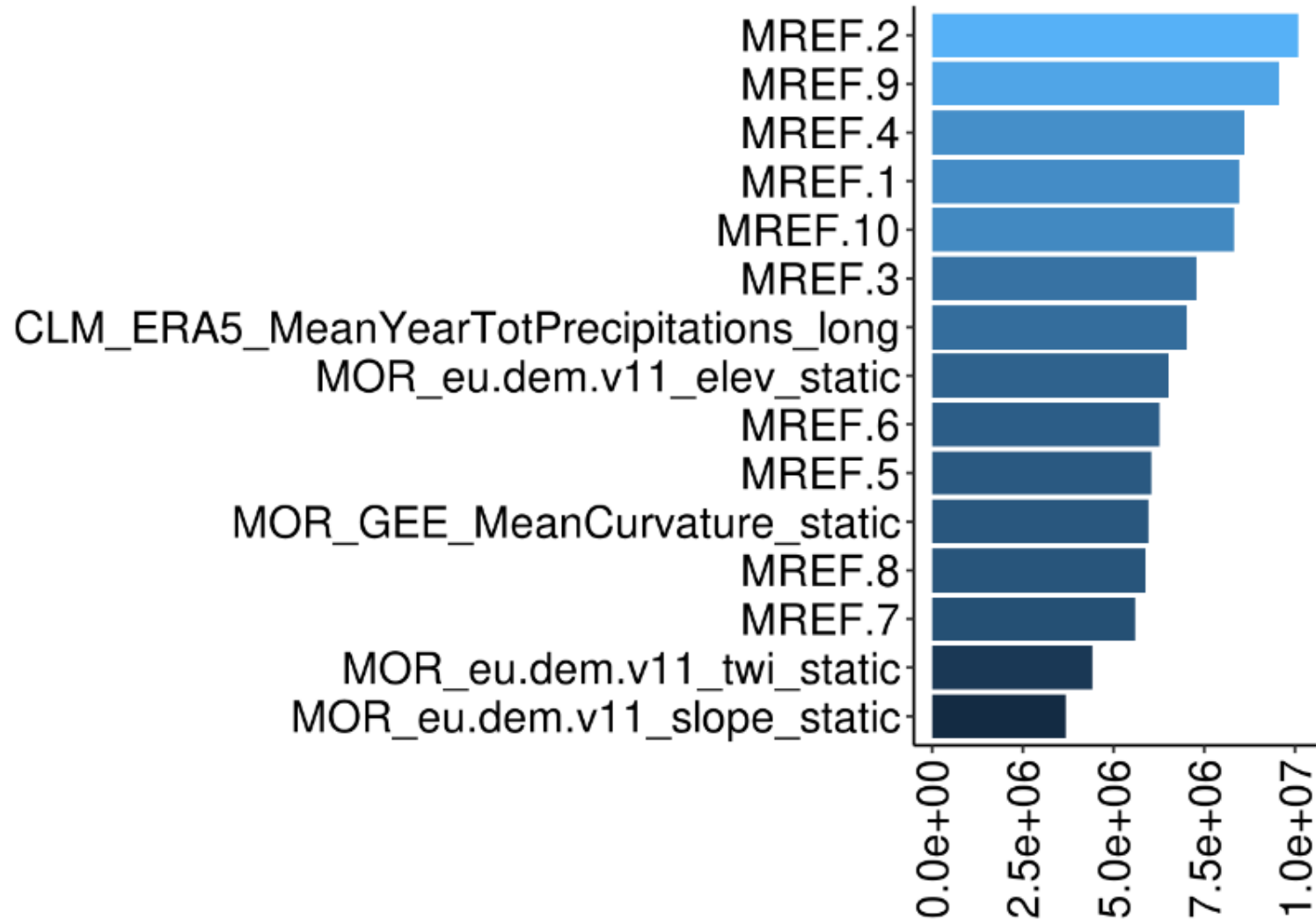
Results vegetated soil model



MEC	RMSE (g / kg)	NRMSE	MAE (g/kg)	PICP
0.28	67.35	0.88	31.67	0.94

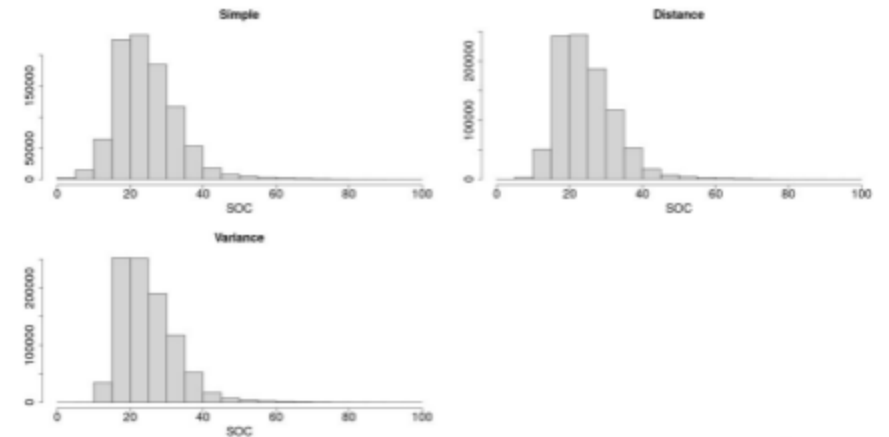
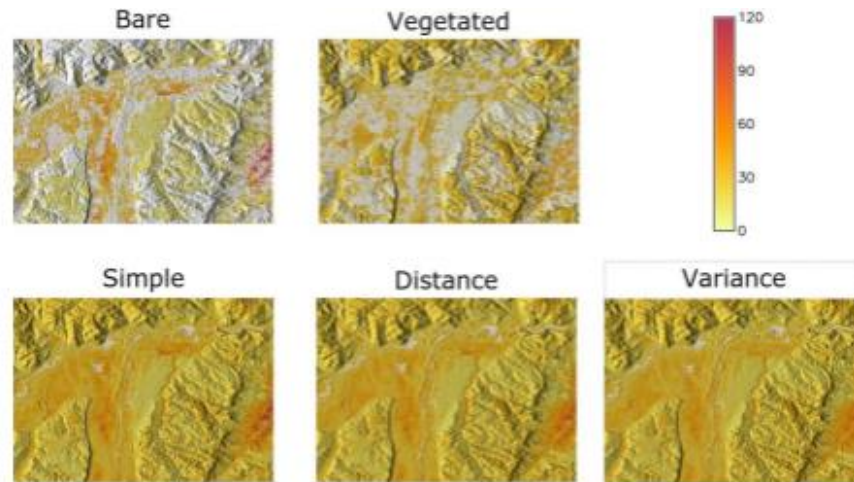


Results vegetated soil model



Integration bare and vegetated soil results

- Mosaic between the bare and vegetated predictions:
 - If bare soil predictions are present they take precedence
 - Around the edges of the bare soil a small distance weighted smoothing is applied to reduce the edge effect



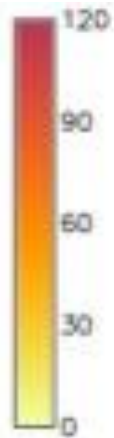
Integration bare and vegetated soil results



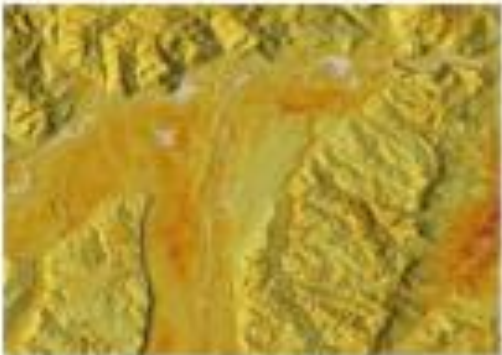
Bare



Vegetated



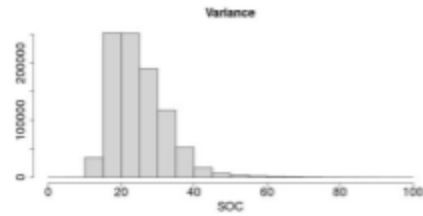
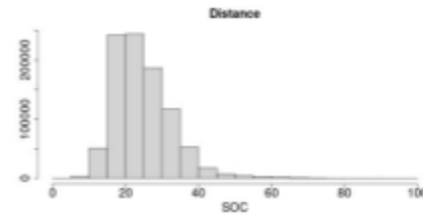
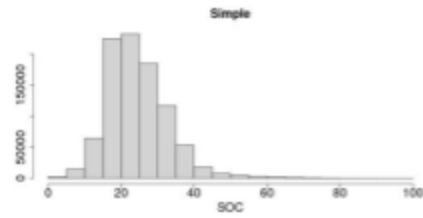
Simple



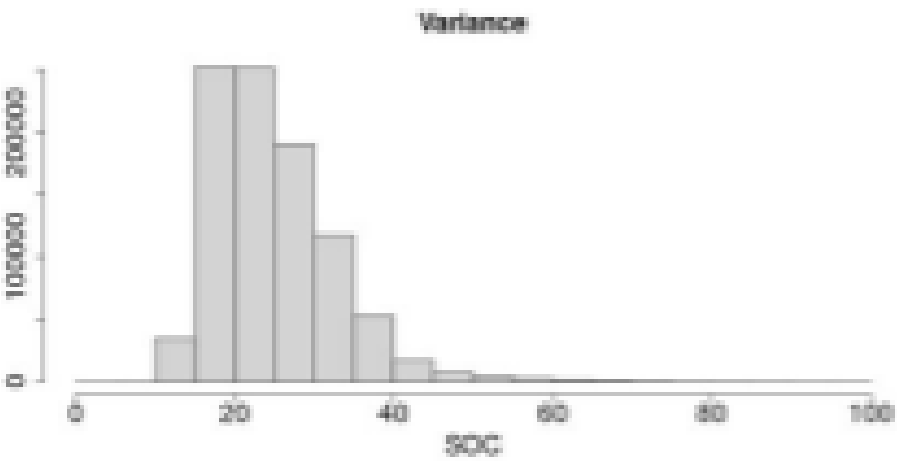
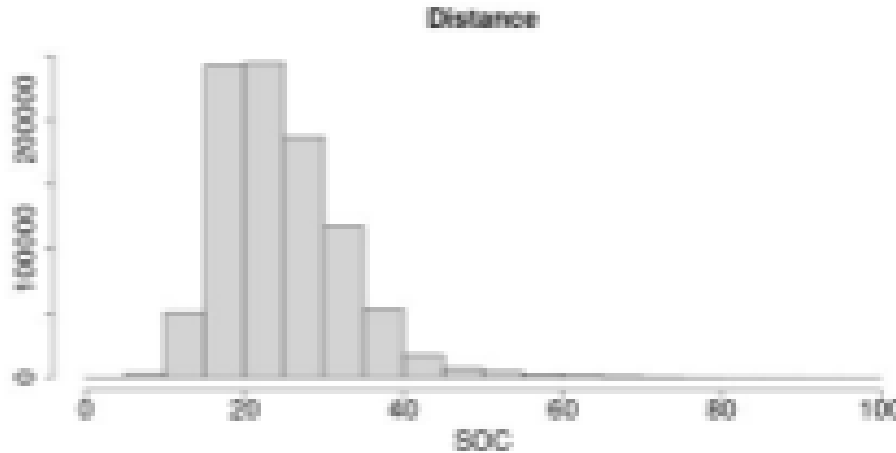
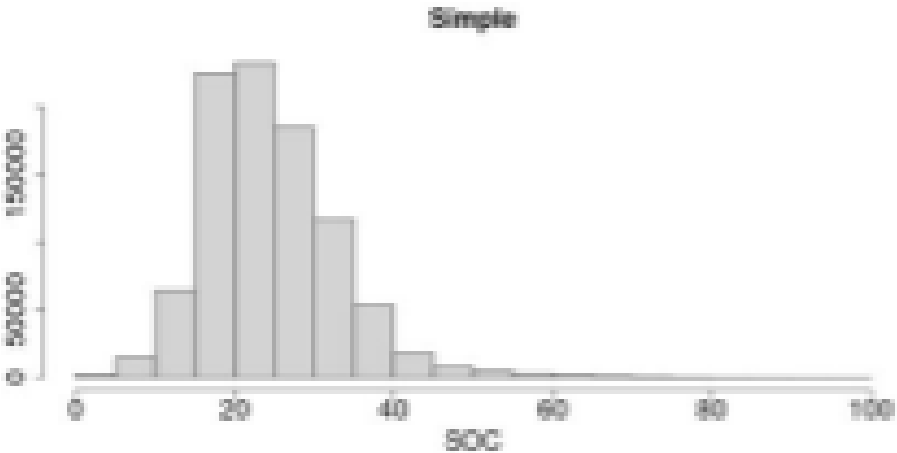
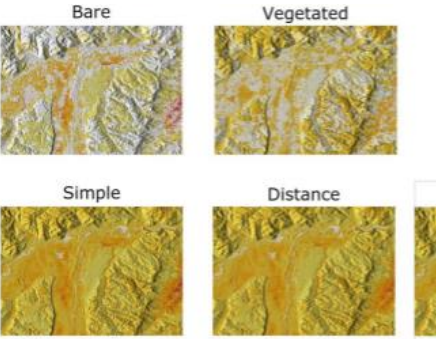
Distance



Variance



Integration bare and vegetated soil results



Technical implementation details

- All the computations are based on self-contained "containers". They can run in the same way on different infrastructures
- Process is fully reproducible
- All softwares used are open source



Summary remarks

- Model for vegetated soil fitted with state of the art covariates and latest available soil observations
- Acceptable cross-validation
- Acceptable landscape patterns recognition
- Full working reproducible system





Thank you!

Presenter e-mail



ESA Symposium on Earth Observation for Soil Protection and Restoration



Contract 400131273/20/I-NB