

A satellite night view of Europe, showing the continent illuminated by city lights against the dark background of the night sky. The lights are concentrated in major urban centers and along coastlines.

# Crop yield monitoring based on NDVI and environmental variables

Case study for winter wheat, sugar beet and potato in Flanders, Belgium



# crop yield monitoring



- Evaluate management choices
- Identify potential threats
- Enhance potential opportunities
- ...



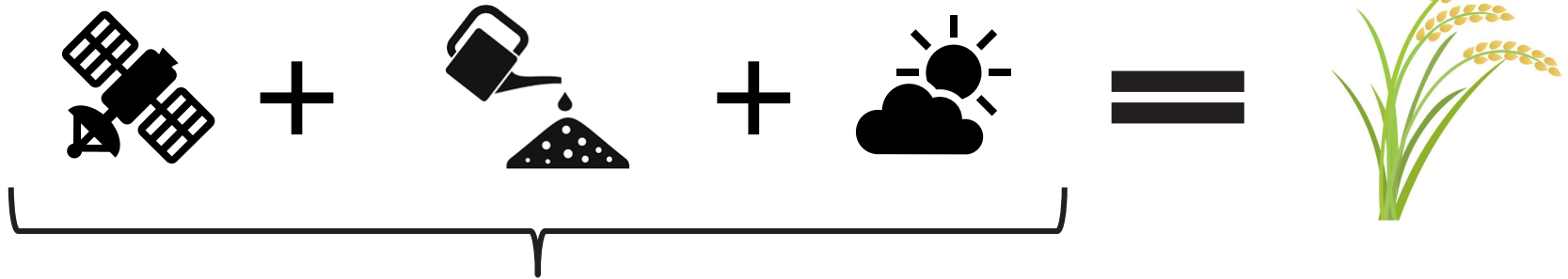
- Decision making
- Strategic planning
- ...



- Insurance companies
- Agricultural service businesses
- Breeding companies
- ...

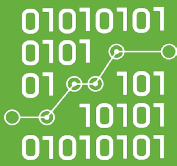


# crop yield monitoring with NDVI and environmental variables



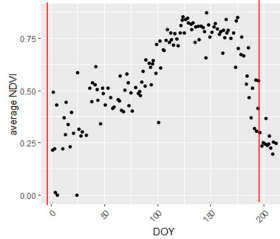
Use case: modeling winter wheat, sugar beet and late potato yield in Flanders, Belgium (data from 2016/2017/2018)

- Remotely sensed vegetation indices: NDVI → Sentinel-2 accessed via OpenEO
- Soil water depletion → AquaCrop
- Weather data → RMI

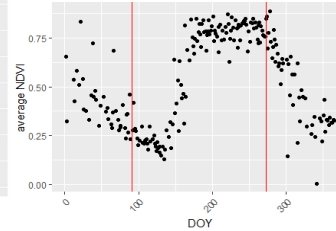


# Empirical crop yield model (random forest)

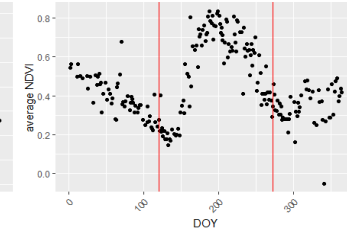
Winter wheat



Sugar beet

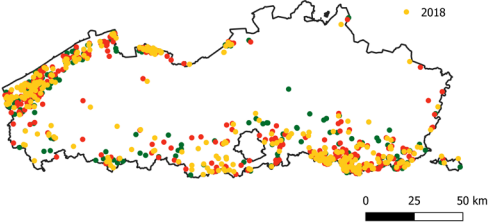


Late potato



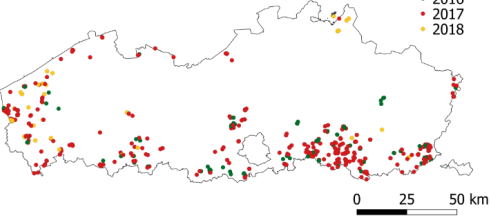
winter wheat

- 2016
- 2017
- 2018



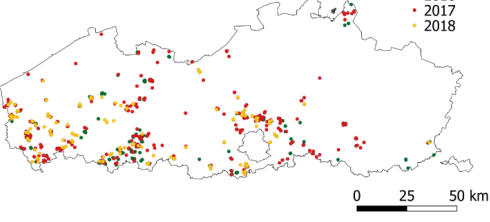
Sugar beet

- 2016
- 2017
- 2018

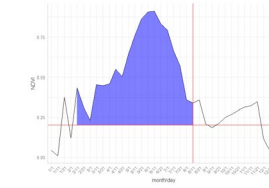


Late potato

- 2016
- 2017
- 2018

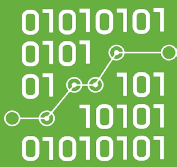


NDVI integral



Monthly soil water depletion (for sugar beet and late potato)

Monthly P and Tmax



# Satellite information from openEO

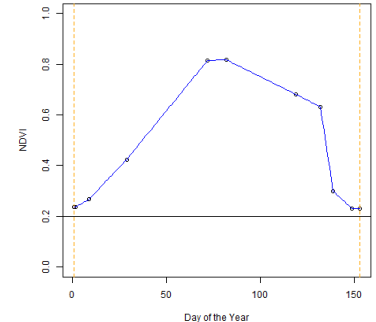
- <https://openeo.org/>
- Platform to **access, process and download** satellite information
  - No need to download huge tiles
  - Big collection of satellite data (see: <https://hub.openeo.org/> )
  - Different programming languages (R/python/JavaScript)

Example: calculate average NDVI of an agricultural field



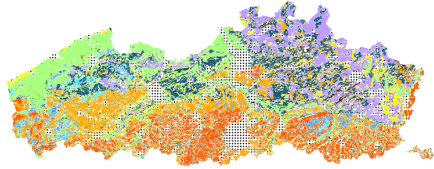
openEO

- Remove pixels affected by clouds
- Extract data from particular time range
- Calculate average value at field level for each time point



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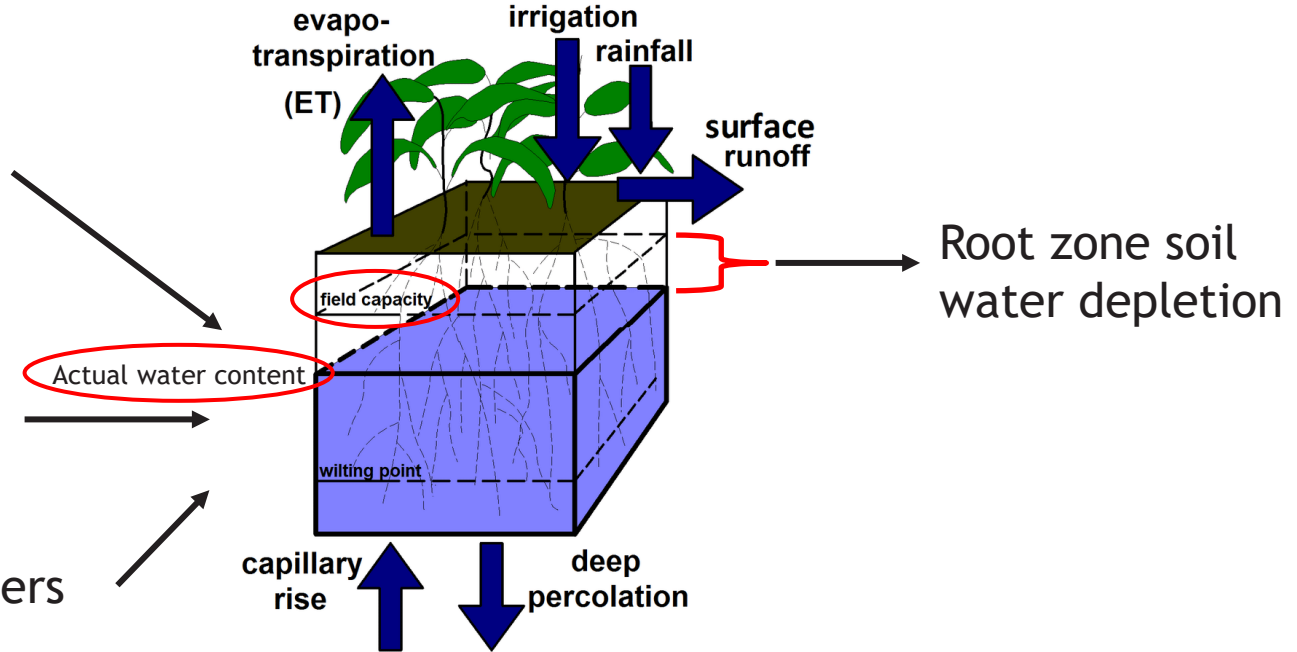
# Soil water depletion: AquaCrop



WRB: soil texture

Daily weather data

Crop specific parameters

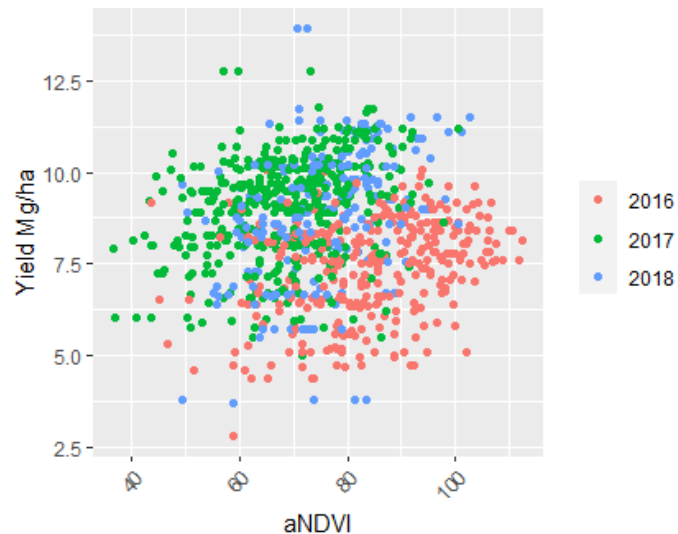
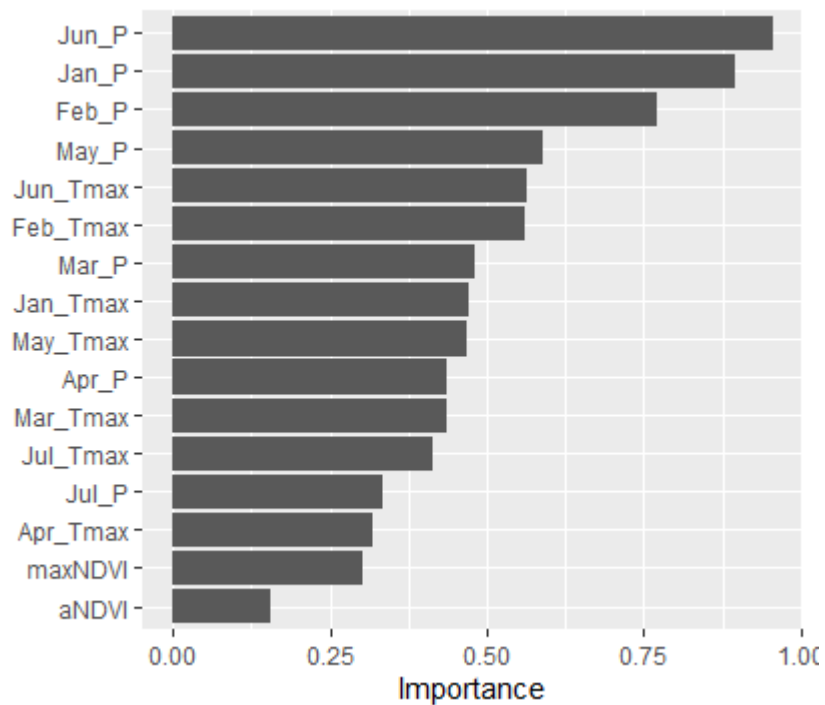


<https://pypi.org/project/aquacrop/>



# Model results: winter wheat

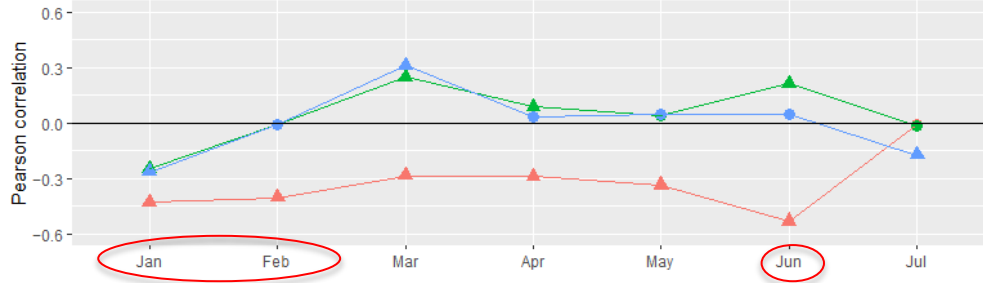
## Feature importance of random forest



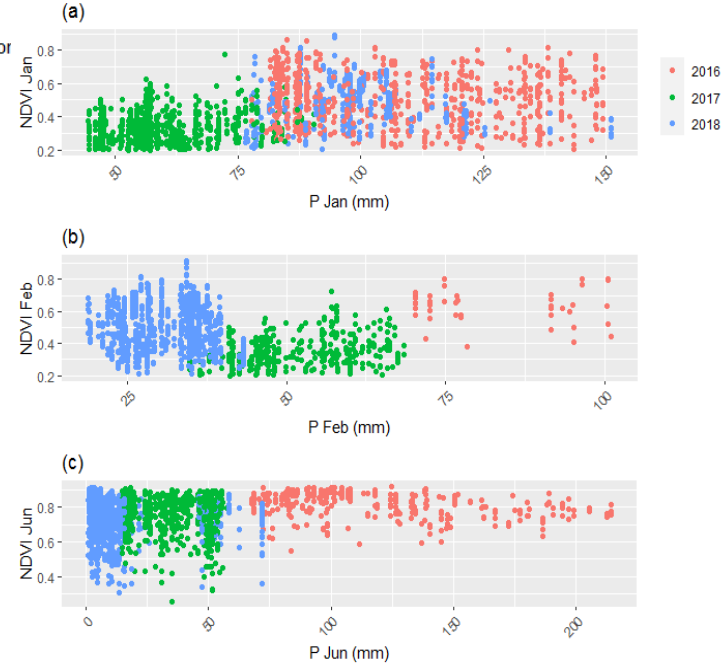
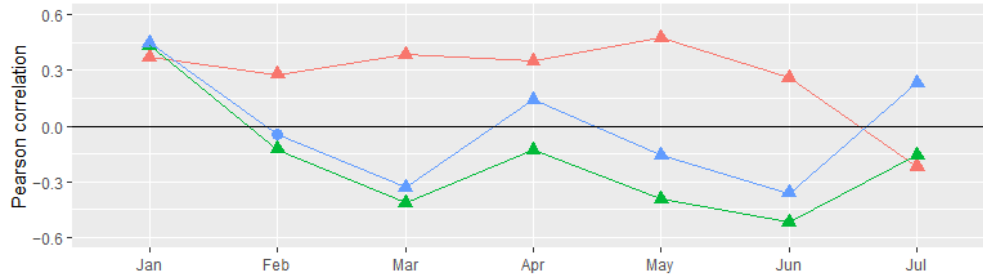


# Winter wheat: why was NDVI not a good predictor?

(a) Correlation between wheat yield and climate variables



(b) Correlation between aNDVI and climate variables

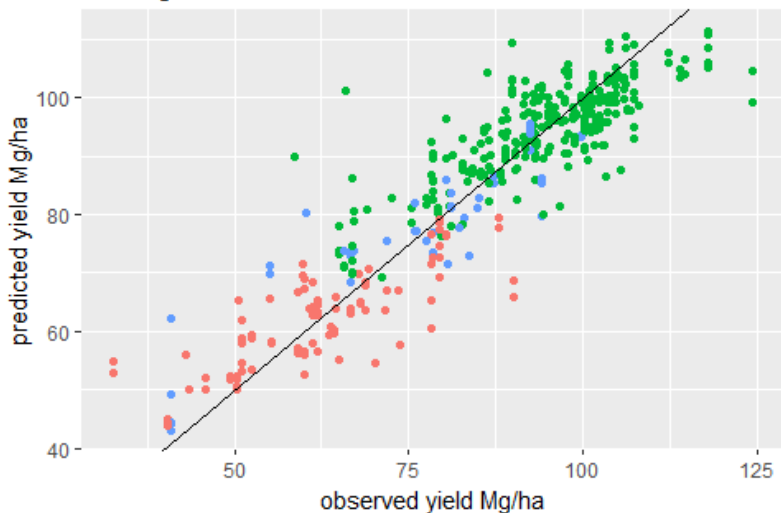




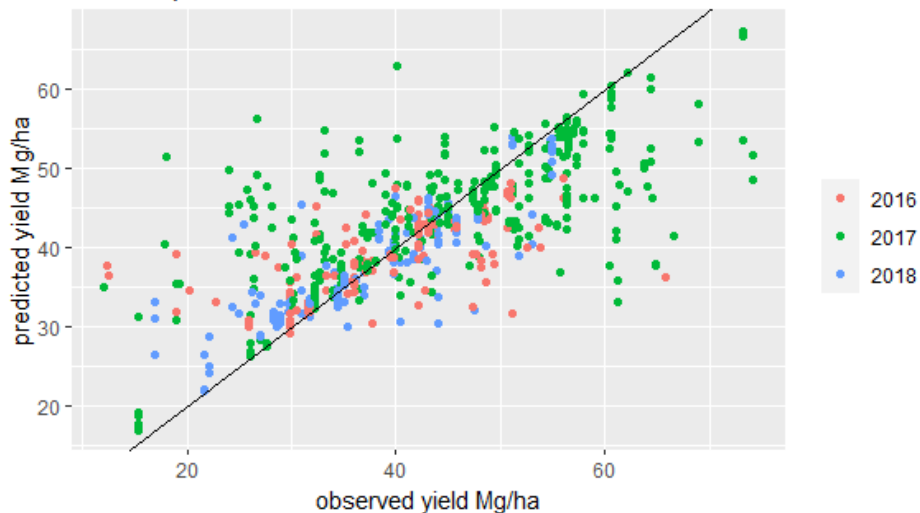


# Model results: sugar beet and late potato

sugar beet



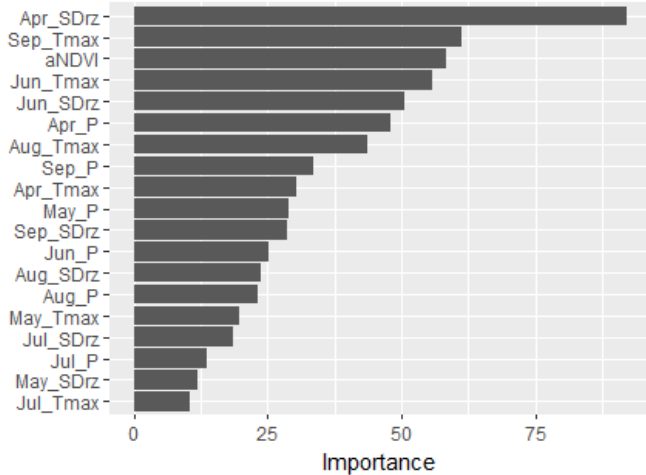
late potato



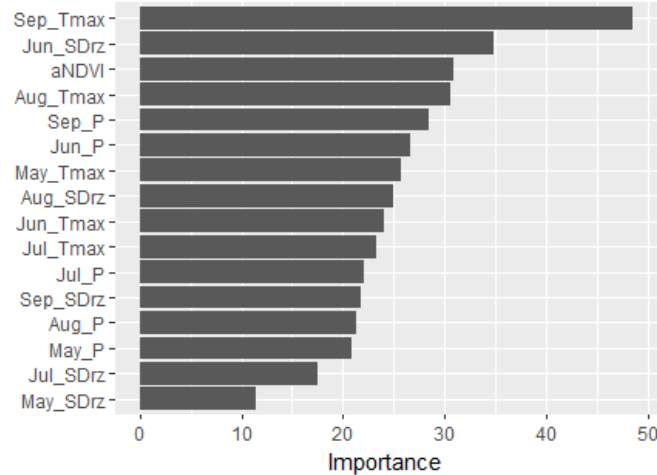


# Evaluation of variable importance

(a) sugar beet



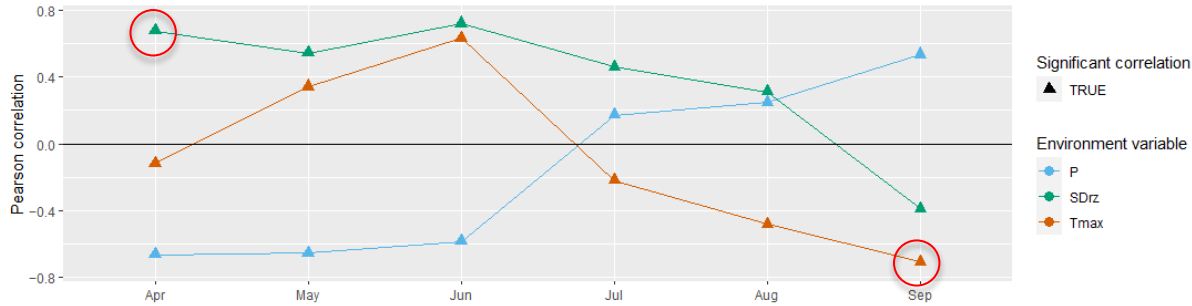
(b) late potato



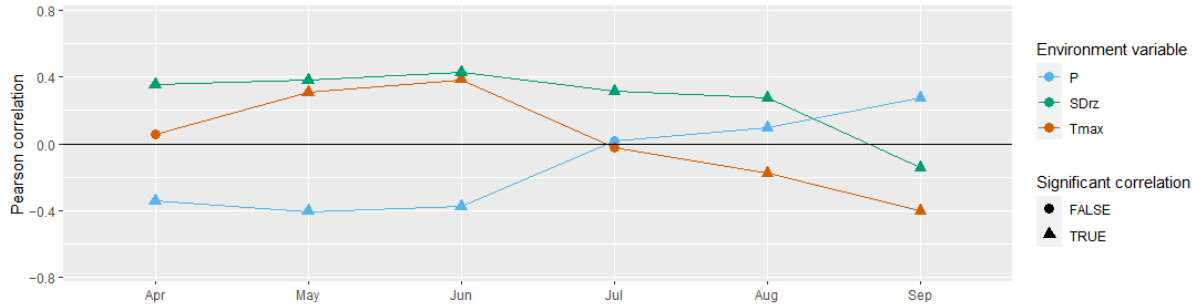


# Correlation plots: sugar beet

(a) Correlation between sugar beet yield and environment variables



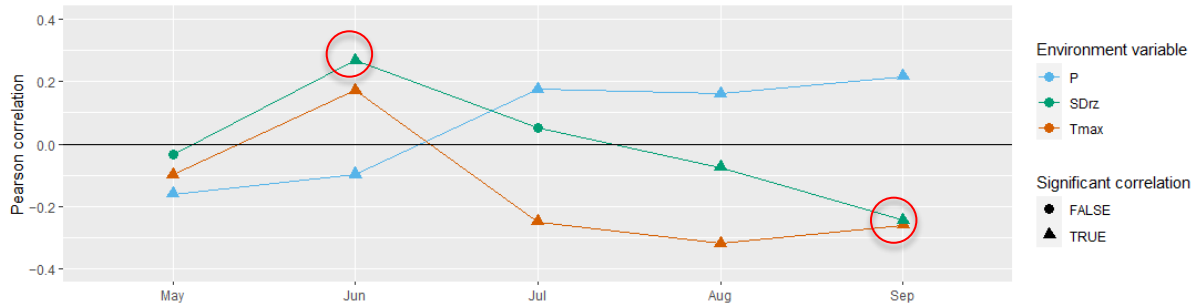
(b) Correlation between sugar beet aNDVI and environment variables



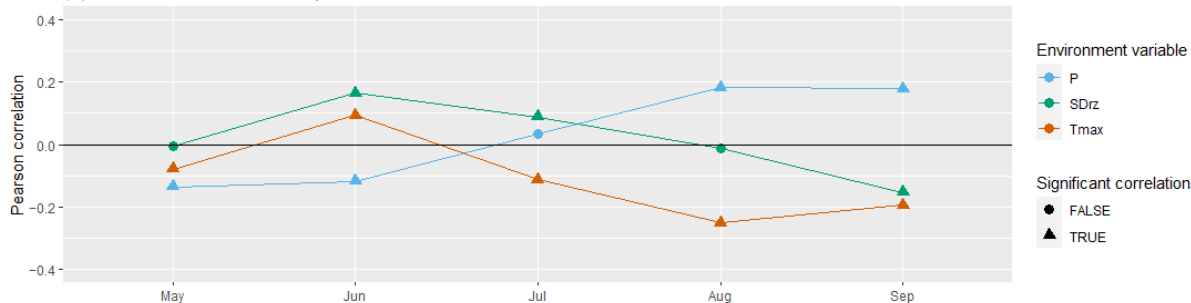


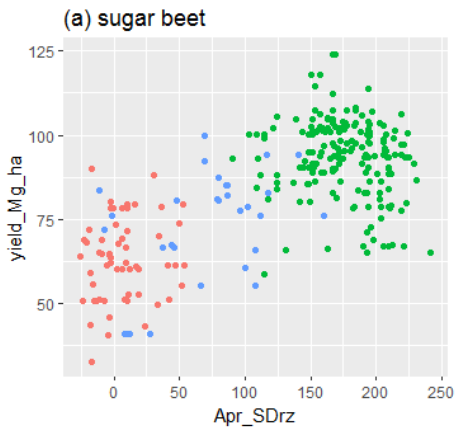
# Correlation plots: late potato

(a) Correlation between late potato yield and environment variables

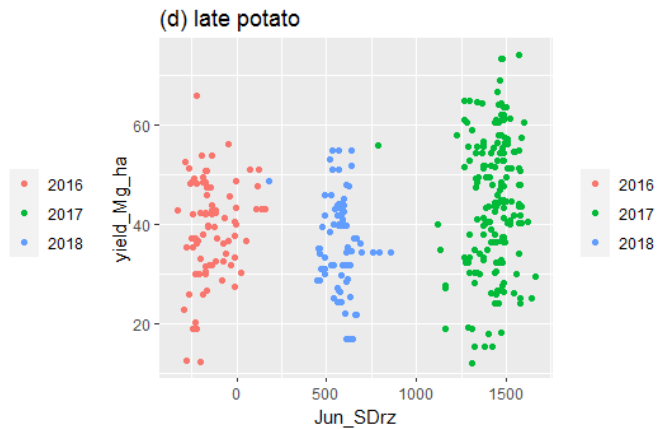
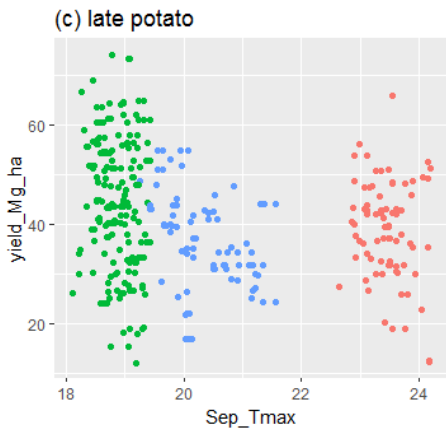
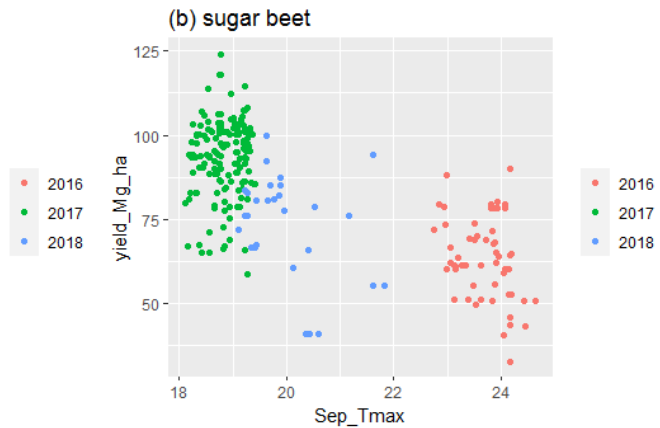


(b) Correlation between late potato aNDVI and environment variables





Soil gets more and more saturated



Soil gets more and more saturated



# Conclusions

- NDVI needs to be sensitive enough to yield affecting environmental variables to be able to use it in crop models
- Weather information explains large part of crop yield variability
- Modelled soil water depletion explains part of the crop variability of sugar beet and late potato yield in Flanders
- Transferability of data driven EO based crop yield models
  - Crop yield models should be based on data from multiple years to be robust to year-to-year weather variability
  - Wide range of environmental conditions should be included in data driven models

Vannoppen, A.; Gobin, A. *Estimating Farm Wheat Yields from NDVI and Meteorological Data*. *Agronomy* **2021**, *11*, 946. <https://doi.org/10.3390/agronomy11050946>.

Vannoppen, A.; Gobin, A. *Estimating Yield from NDVI, Weather Data, and Soil Water Depletion for Sugar Beet and Potato in Northern Belgium*. *Water* **2022**, *14*, 1188. <https://doi.org/10.3390/w14081188>



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R&D

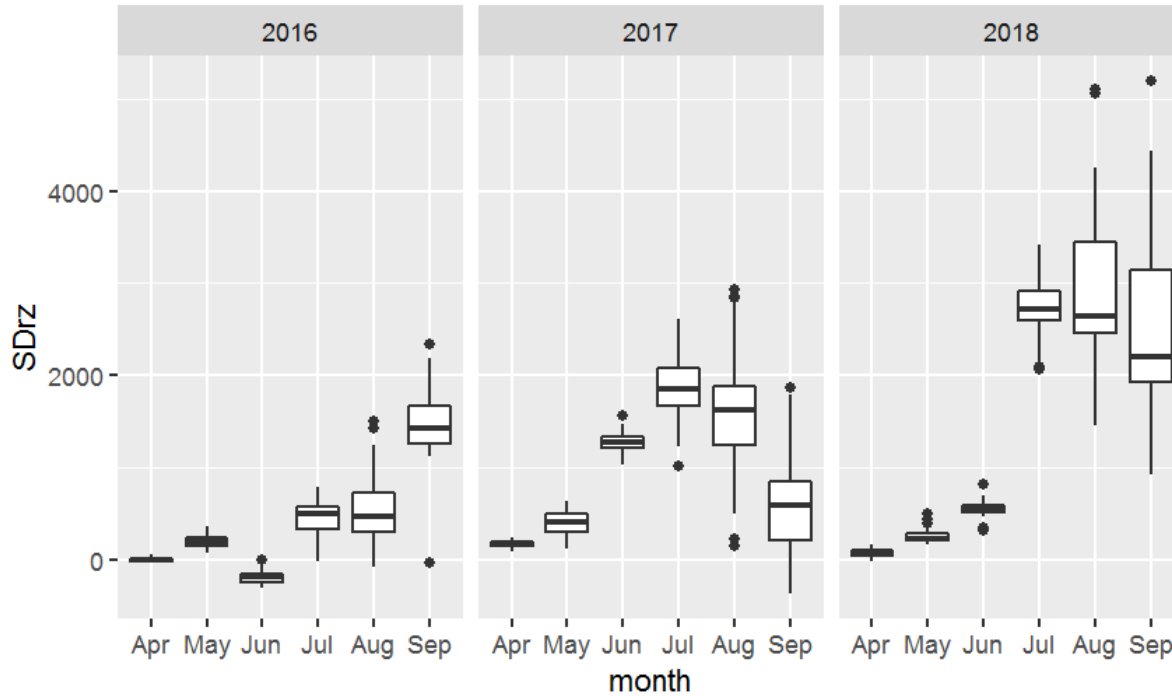
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[blog.vito.be/remotesensing](https://blog.vito.be/remotesensing)



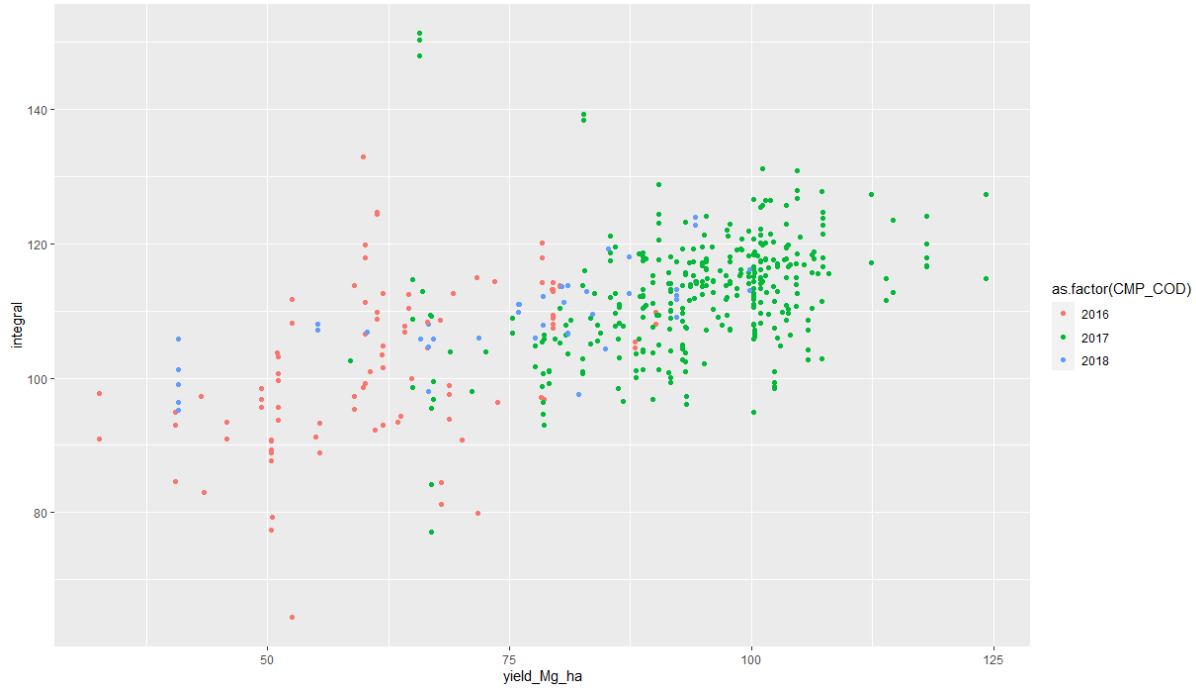
## Sugar beet soil water depletion





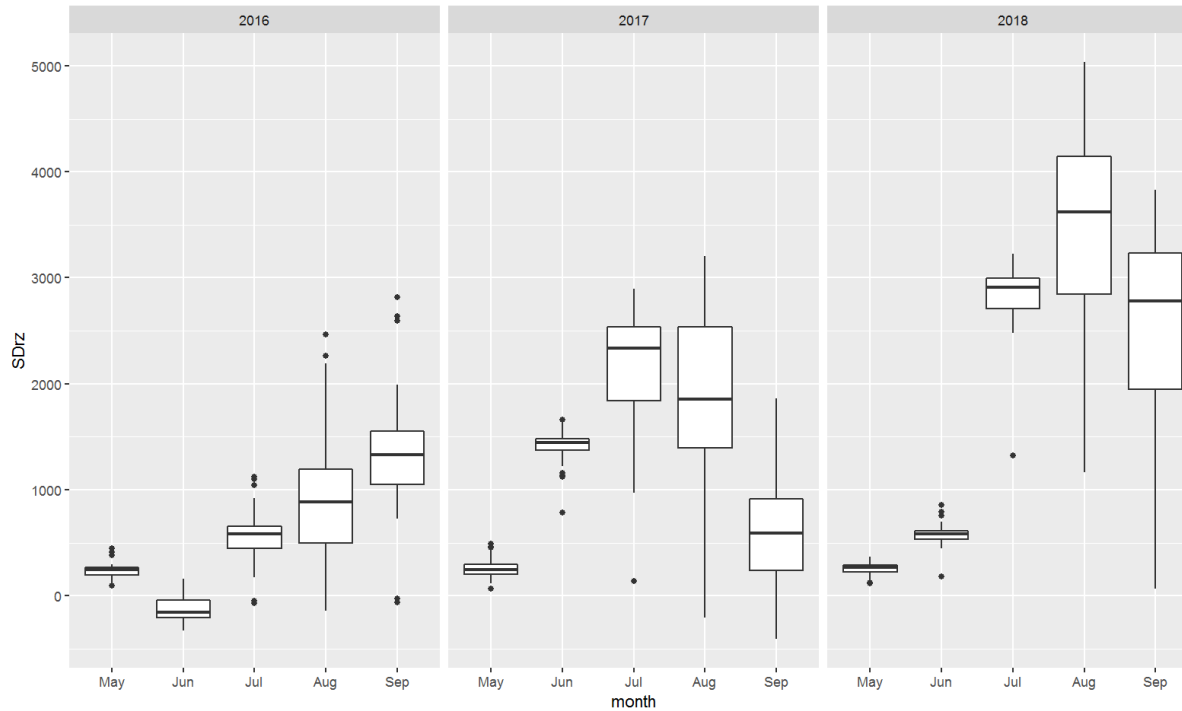


## Sugarbeet aNDVI versus yield





## Late potato soil water depletion





## Late potato aNDVI versus yield

