

# Precision crop phenotyping using drones: experiences at ILVO



Peter Lootens



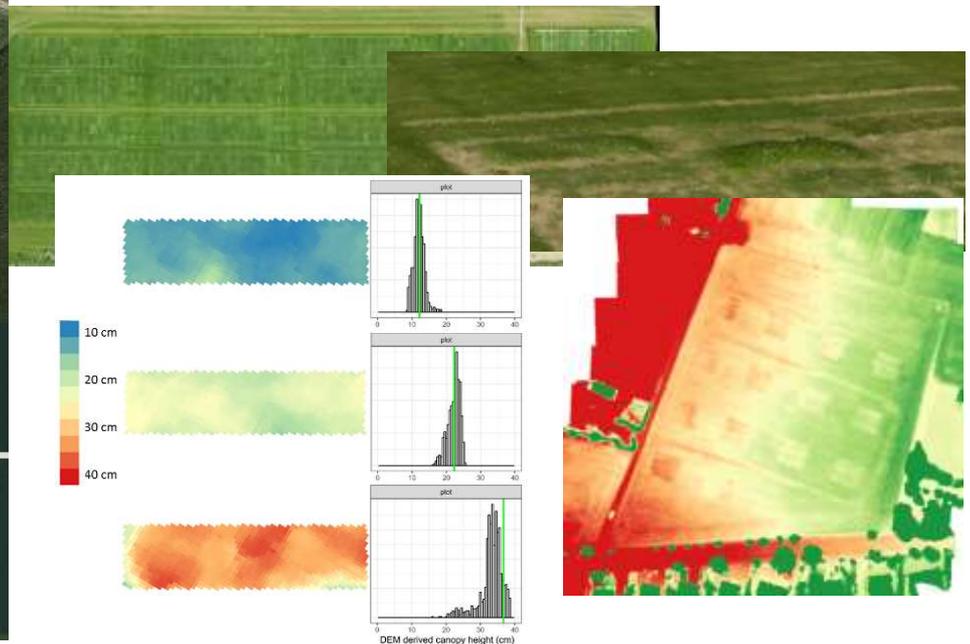
**Vlaanderen**  
is landbouw & visserij

**ILVO**  
Instituut voor Landbouw-  
en Visserijonderzoek

**Why?**

# Precision Crop Farming/Precision Crop Phenotyping

- **Aim: monitor crops/plants with high spatial and temporal resolution in an objective and quantitative manner for:**
  - Farmer (crop management) → Precision Crop Farming
    - management tasks can be performed at the right place, with the right intensity and at the right time (e.g. task maps for fertilization, crop protection, weed control, ...)
  - Breeder (plant/crop monitoring) → Precision Crop Phenotyping
    - assessments of plants, plots, trials for genotype selection or variety testing



**How – sensors and carriers?**

# Spectra en sensoren

1280 x 960 pixels  
b.v. 550, 660, 735, 790 nm

409 x 218 pixels  
25-40 bands between 400-1000 nm



640 x 512 pixels  
8-13µm  
temperature

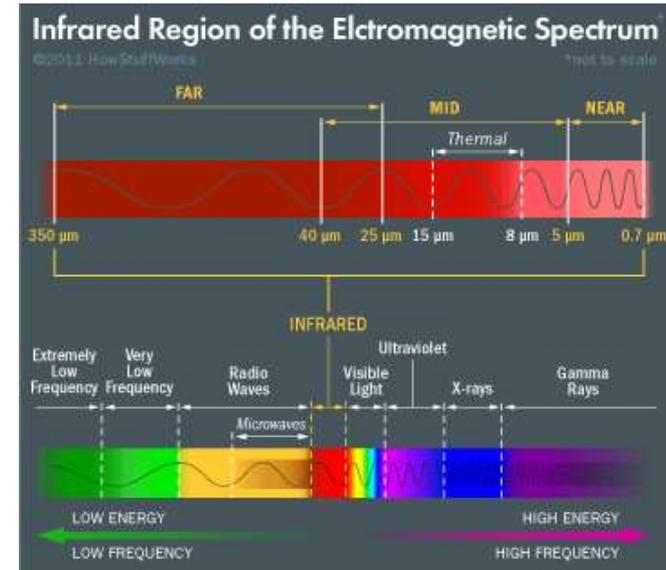
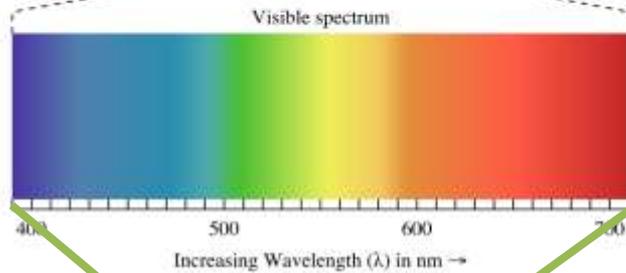
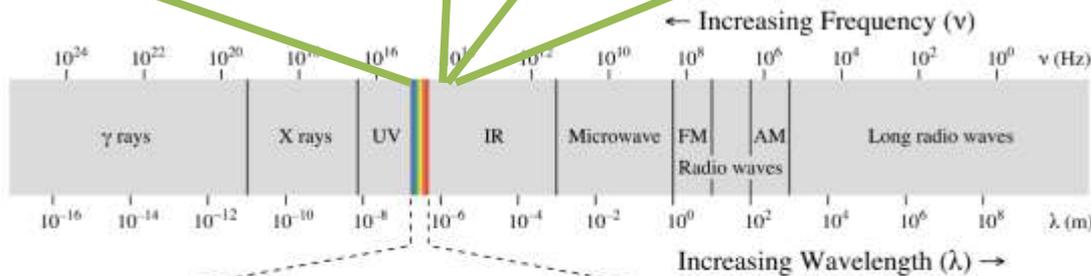
Hyperspectral camera  
Multispectral camera

Thermal camera

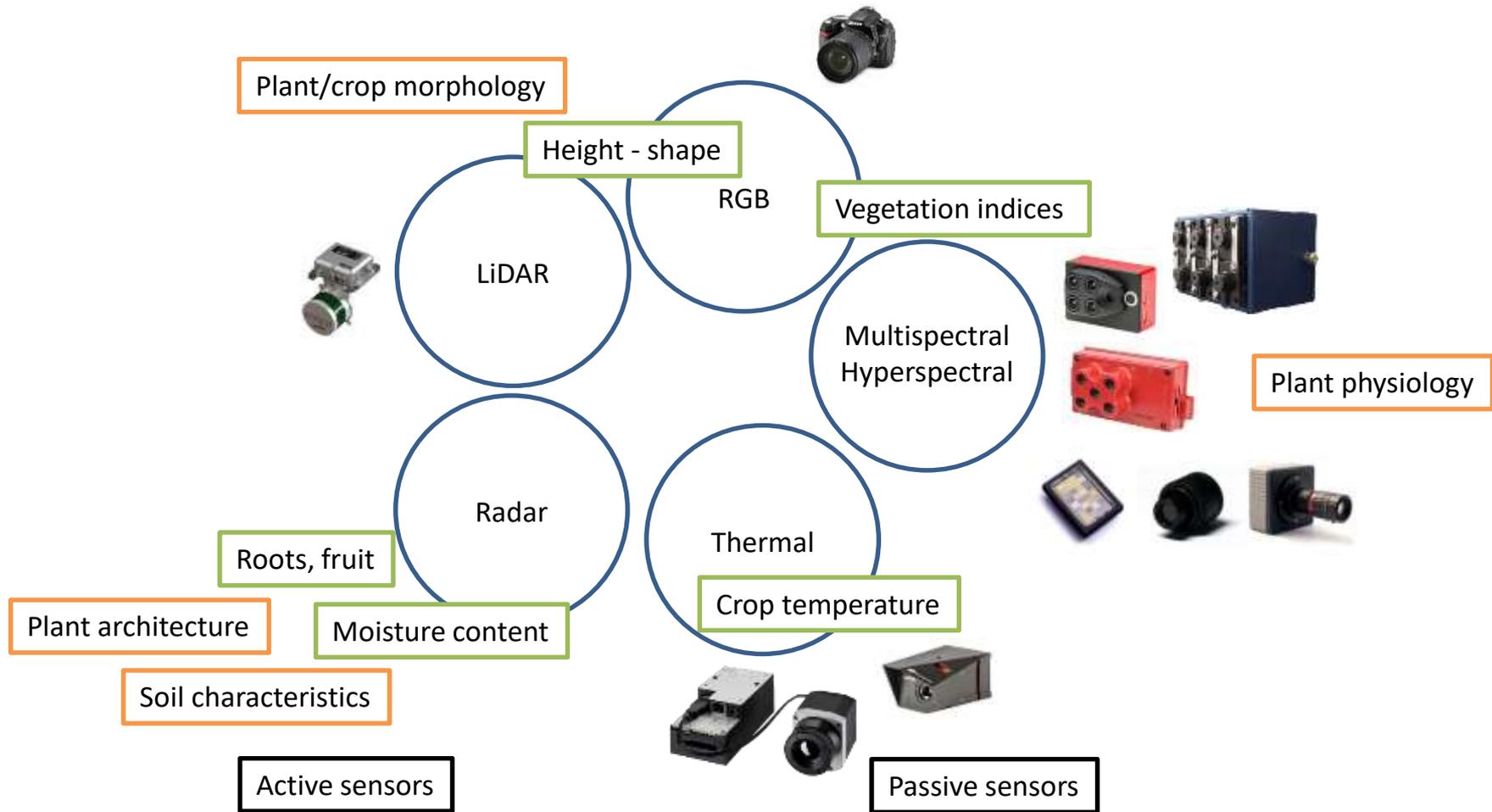
RGB camera



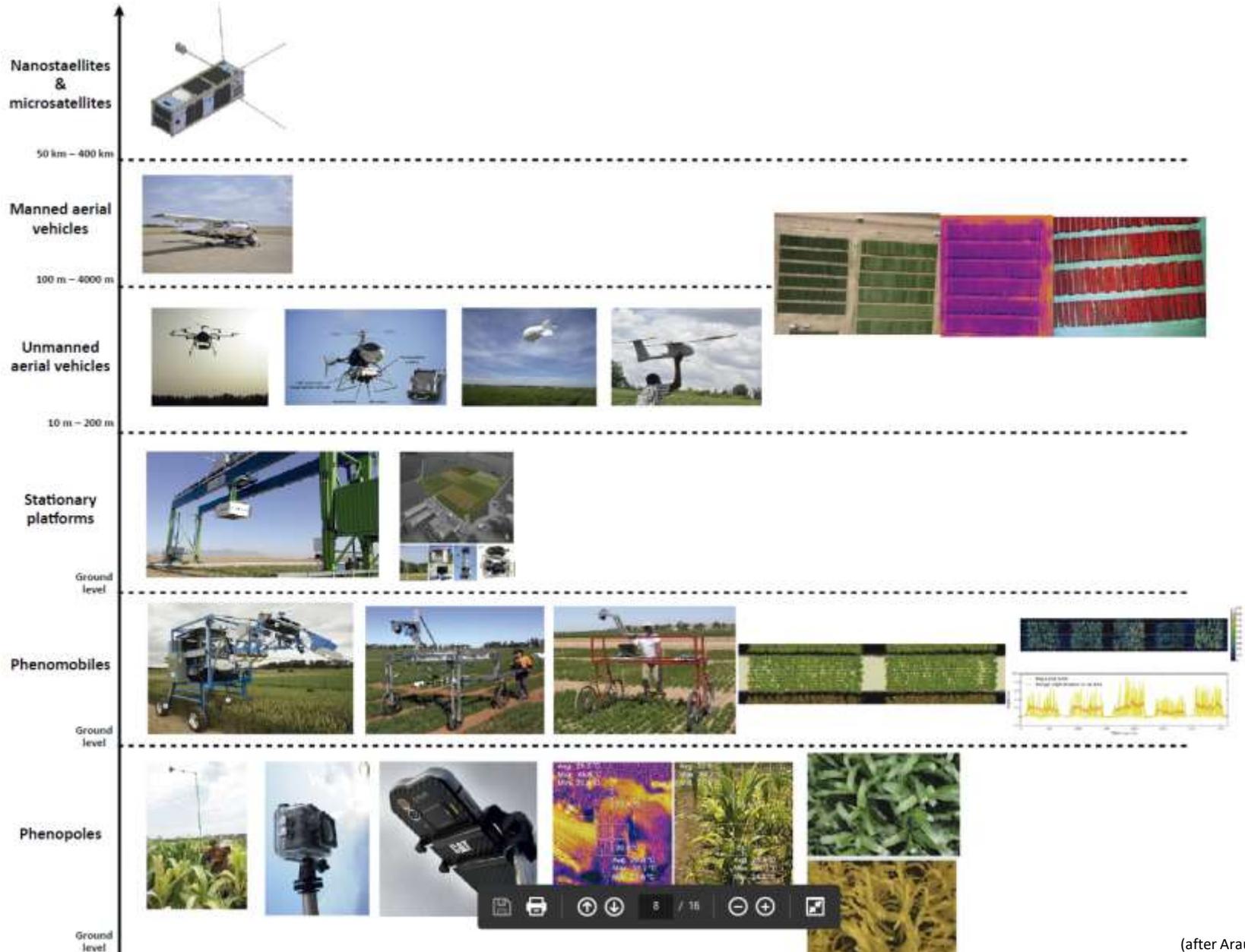
6000 x 4000 pixels  
RGB bands



# Sensors and what can they measure?

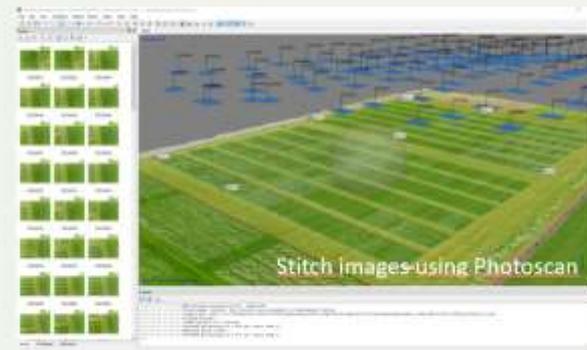


# Carrier/platforms for sensors



**How – from drone flight to data?**

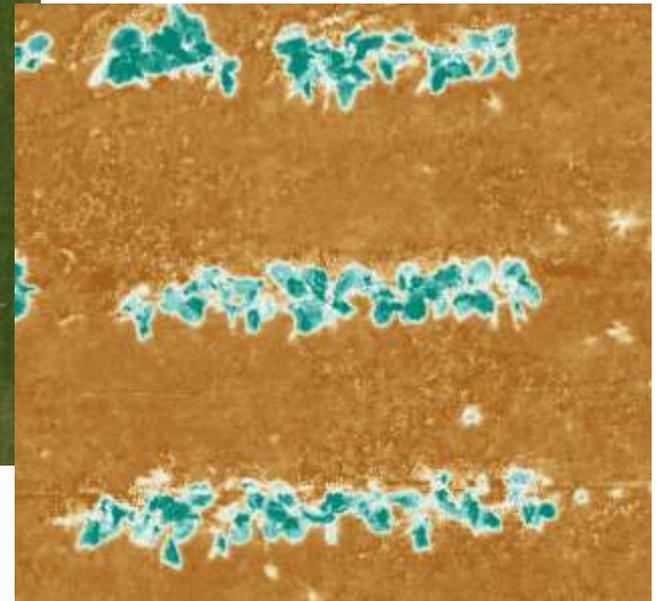
# From flight plan to orthomosaic or height model



# From orthomosaic to vegetation index: soybean – ground cover/early vigor

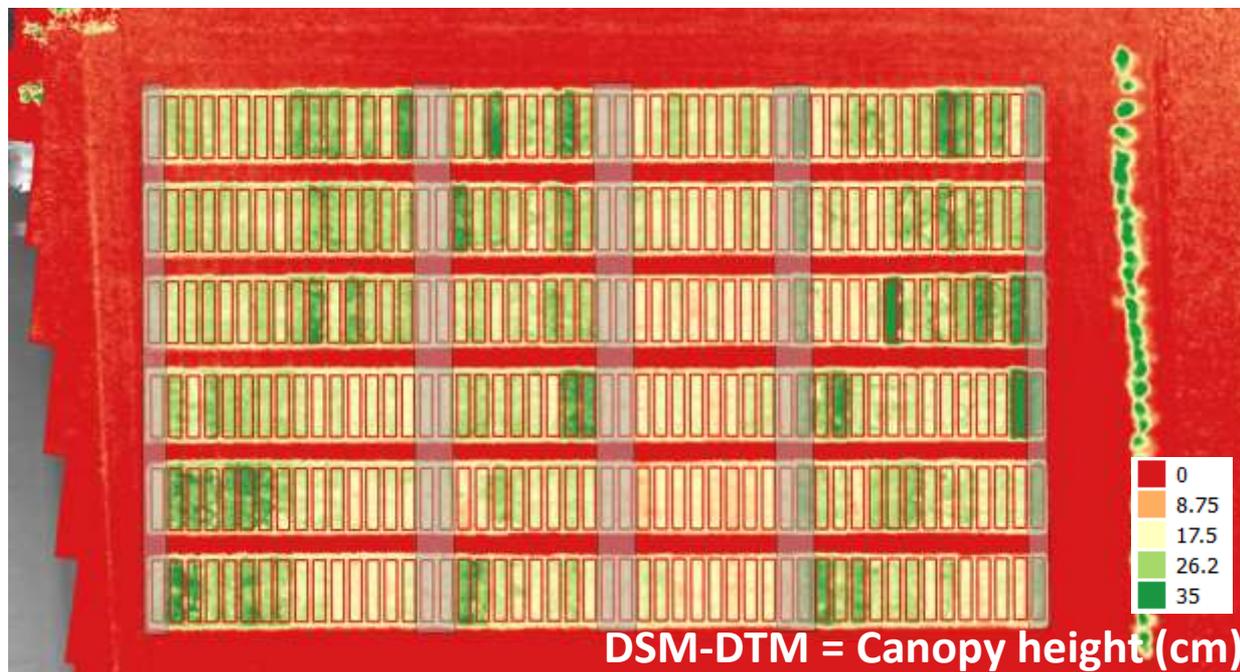
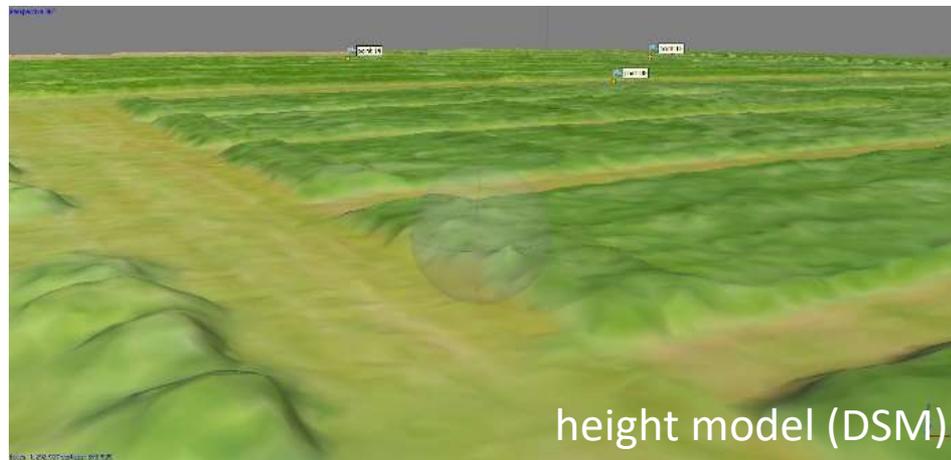
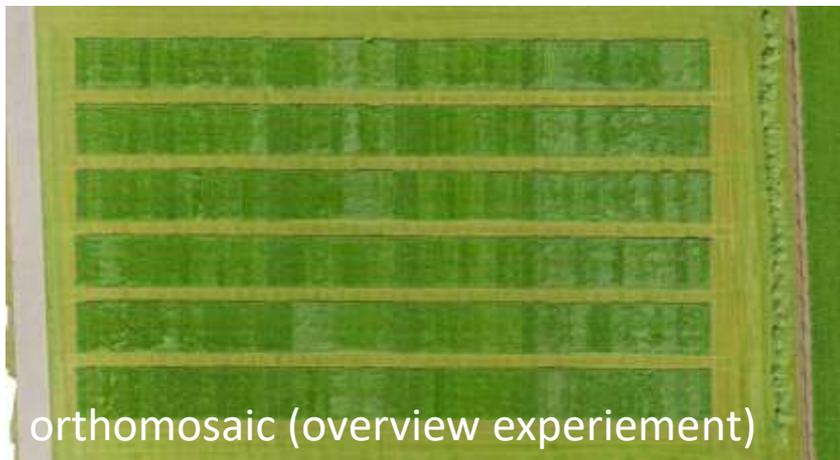
Normalised vegetation indices (ExG)

$$ExG(2) = \frac{(2 * G - R - B)}{(R + G + B)}$$



RGB sensor

# From heightmodel(DEM) to crop/plant height: plots forage grasses



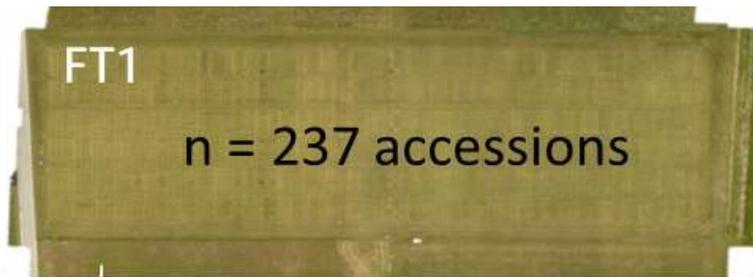
# Forage grass precision crop phenotyping

# Evaluation of persistency of forage grasses (RGB)

Spatial resolution possible up to = 2 mm

Each breeder scores consistent but different

|           | Breeder 1 | Breeder 2 |
|-----------|-----------|-----------|
| Breeder 1 | 0.754     | 0.243     |
| Breeder 2 | 0.243     | 0.760     |

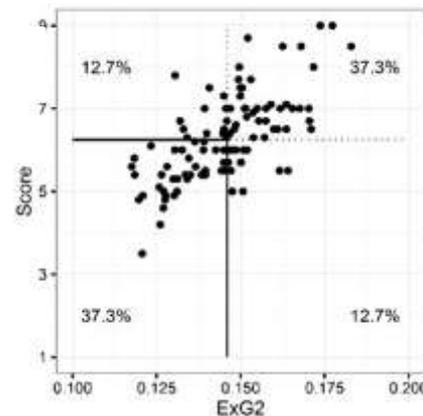


High correlations between flights  
(flights done on different days with different weather/light conditions)

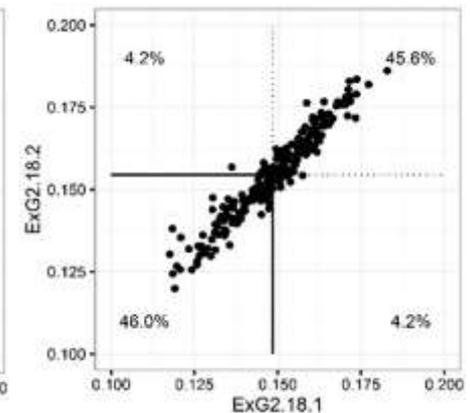
| Index     | ExG2 18-1 | ExG2 18-2 | ExG2 22-1 |
|-----------|-----------|-----------|-----------|
| ExG2 18-2 | 0.957     |           |           |
| ExG2 22-1 | 0.948     | 0.930     |           |
| ExG2 22-2 | 0.871     | 0.876     | 0.919     |

Agreement of the selection with the breeder

VI-UAV vs Score-Breeder



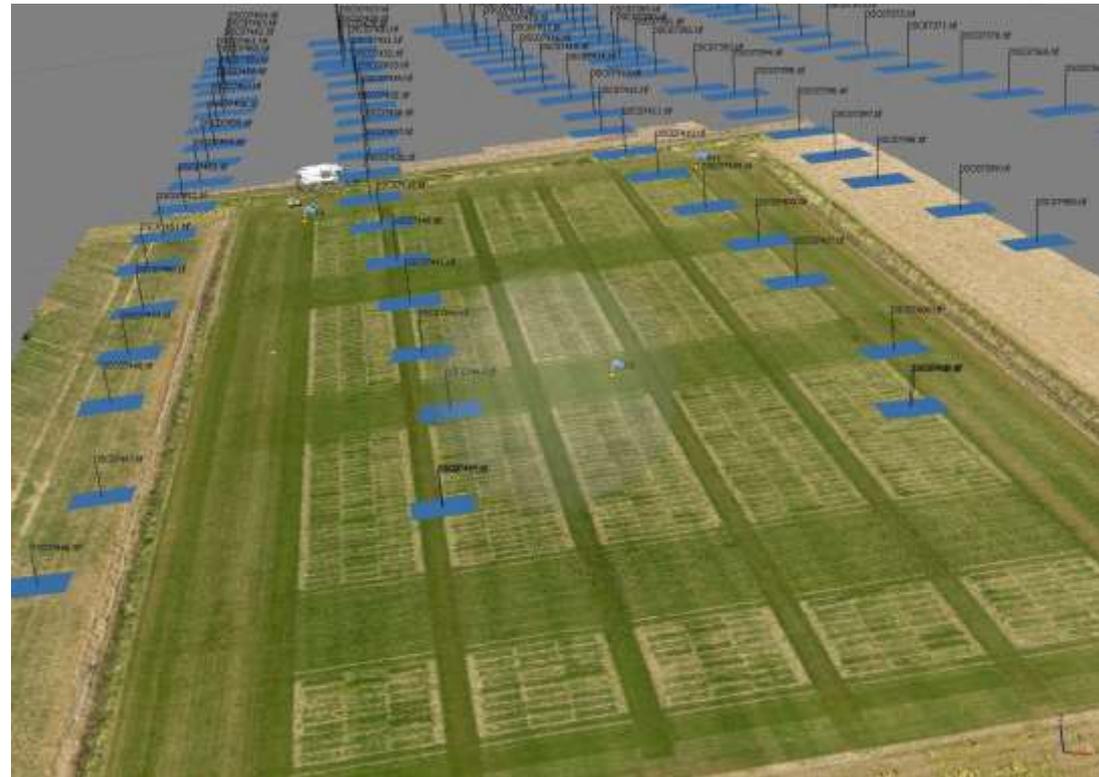
VI-UAV vs VI-UAV



# Estimation of canopy height and biomass of forage grasses (RGB)

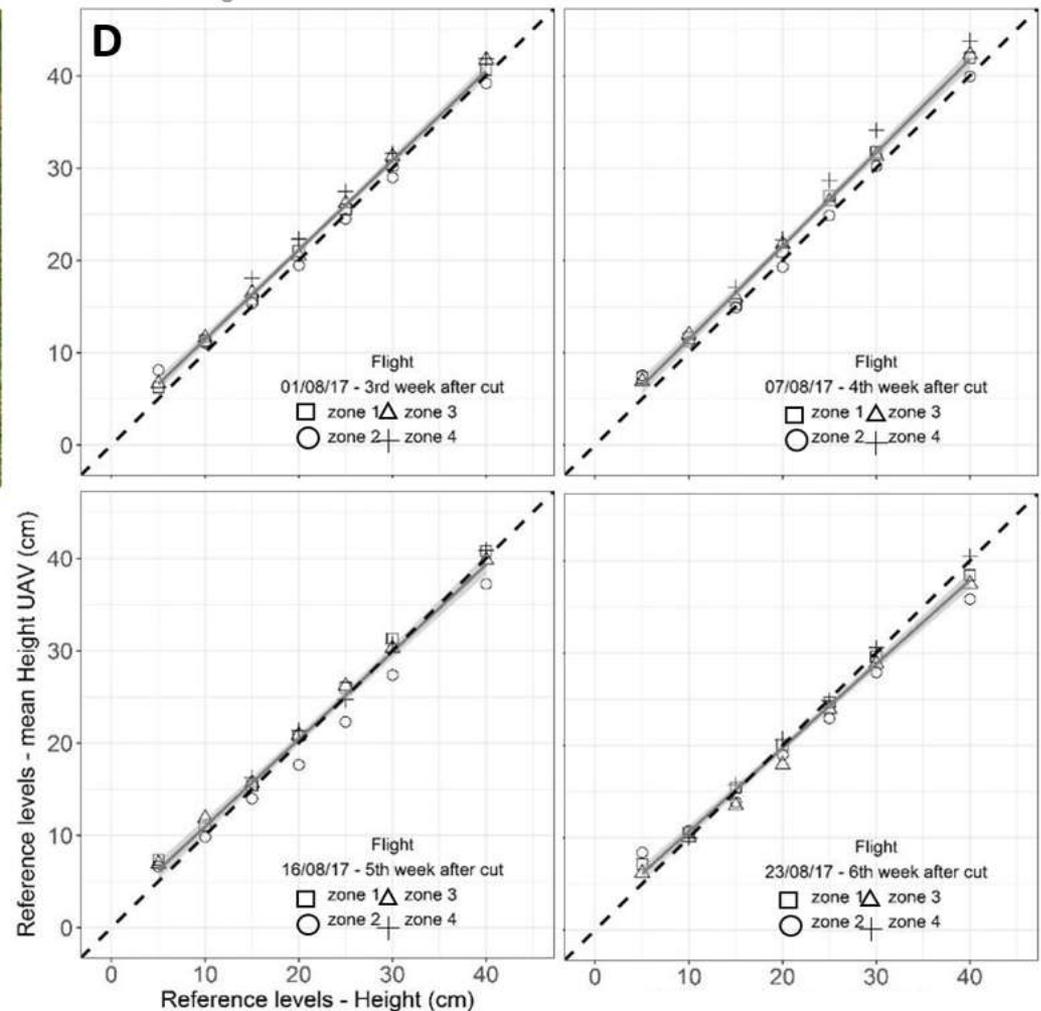


Traditional height measurement with a 'rising-plate meter'



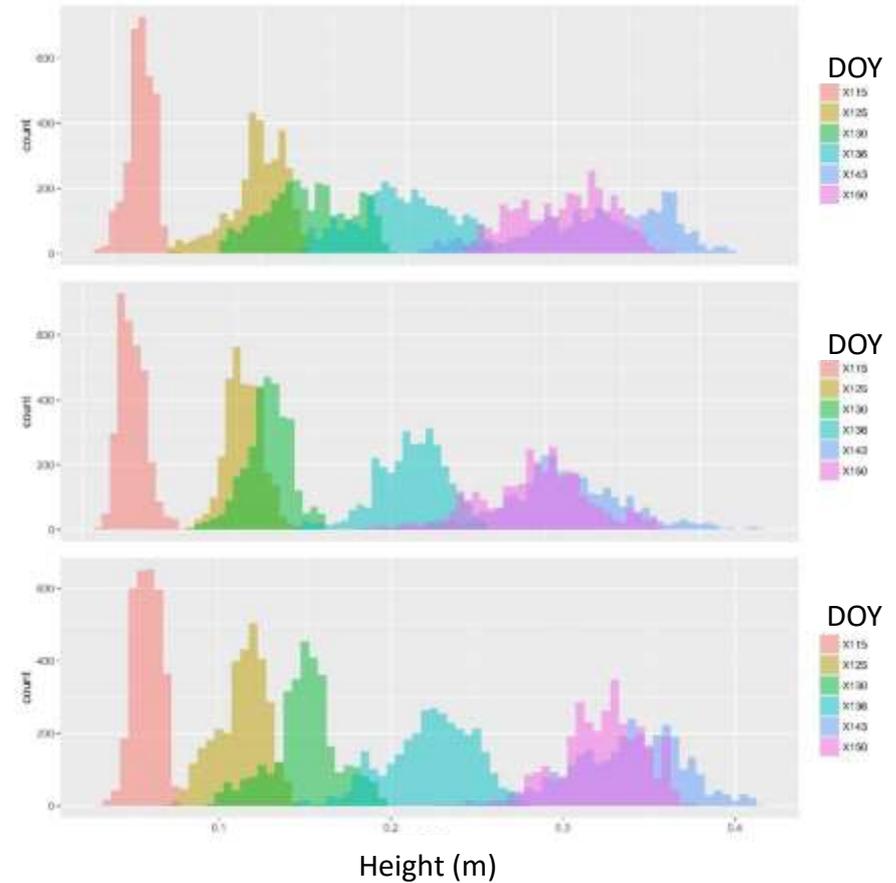
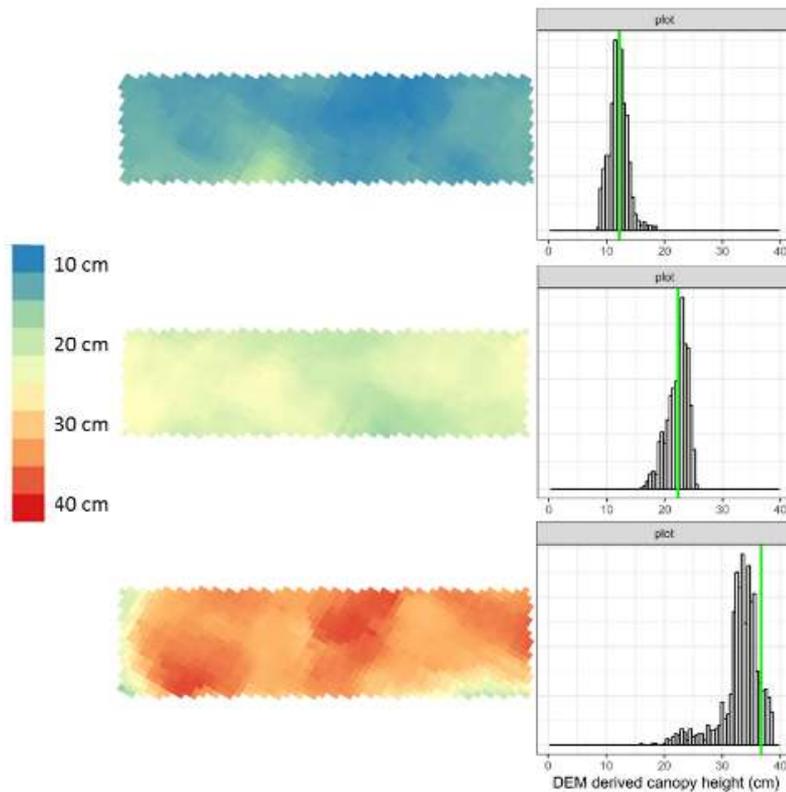
# Estimation of canopy height and biomass of forage grasses (RGB)

Correct estimation height references  
Spatial resolution = 0.5 - 0.7 cm  
Altimetric resolution = 1.0 - 1.2 cm



# Estimation of canopy height and biomass of forage grasses (RGB)

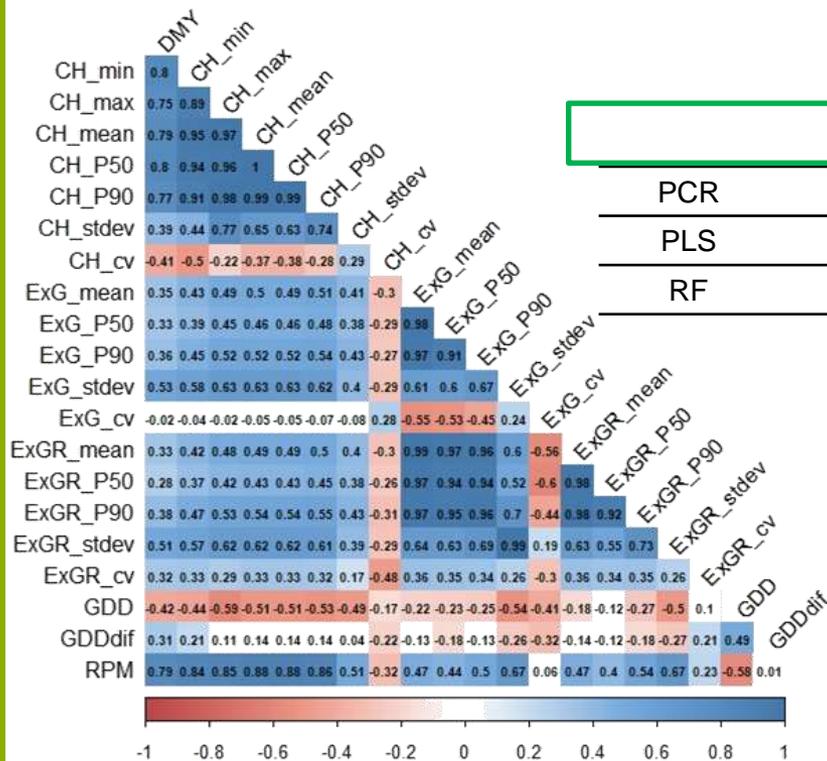
Spatial variation of growth over time



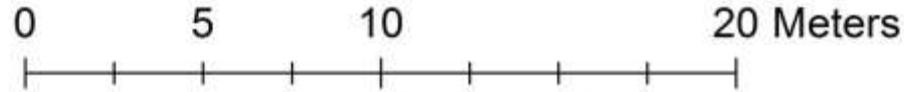
# Estimation of canopy height and biomass of forage grasses (RGB)

Several methods statistical models evaluated to estimate biomass

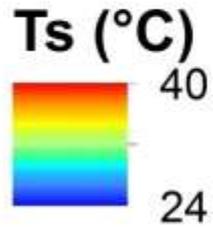
| Model type | Variables         | RMSE (kg ha <sup>-1</sup> ) | NRMSE (%) | R <sup>2</sup> |
|------------|-------------------|-----------------------------|-----------|----------------|
| LR         | RPM               | 986                         | 31.0      | 0.60           |
|            | CHMv – CH_P50     | 876                         | 27.6      | 0.67           |
| MLR        | CHMv              | 825                         | 26.0      | 0.71           |
|            | CHMv + Vlv        | 822                         | 25.9      | 0.71           |
|            | CHMv + Vlv + RPM  | 857                         | 27.0      | 0.69           |
|            | CHMv + Vlv + GDDv | 679                         | 21.3      | 0.81           |
| PCR        | CHMv + Vlv + GDDv | 714                         | 22.5      | -              |
| PLS        | CHMv + Vlv + GDDv | 739                         | 23.3      | (0.58)         |
| RF         | CHMv + Vlv + GDDv | 769                         | 24.2      | (0.70)         |



# Drought tolerance of individual plants (thermal)



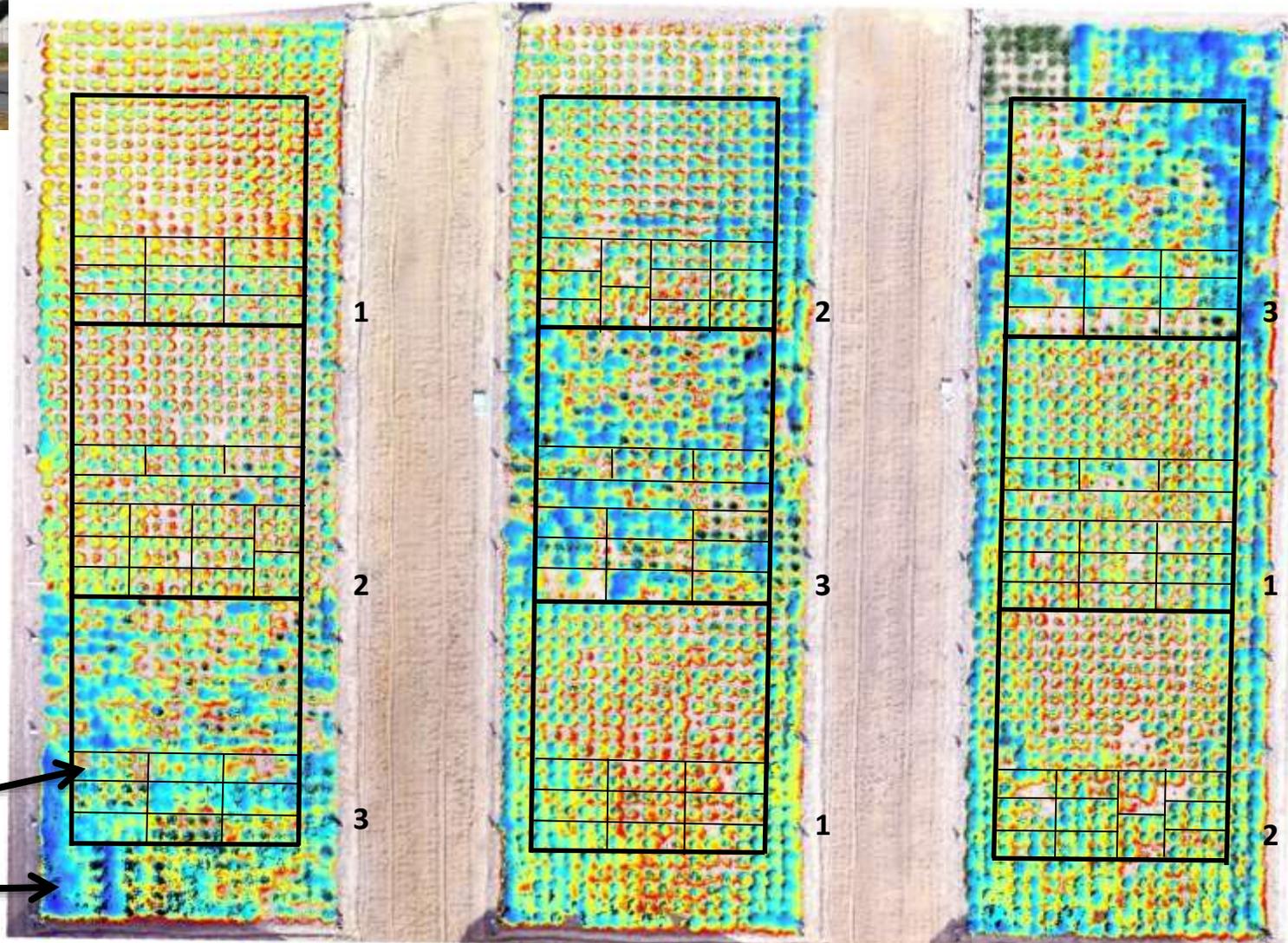
(Lootens et al. 2016 - EUCARPIA)



- 1 = *Lolium perenne*, 2n
- 2 = *Lolium perenne*, 4n
- 3 = *Festuca arundinacea*

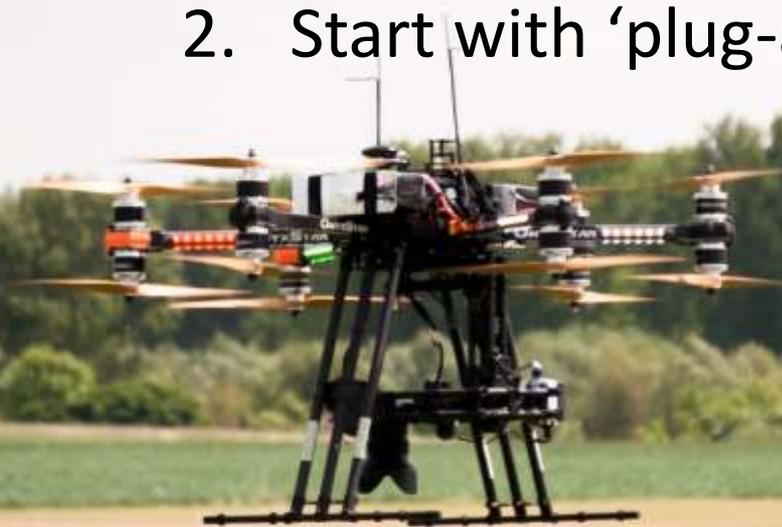
seedlings one family

edge plants



# Take home messages

1. Discuss with the crop expert which crop trait need to be monitored
2. Start with 'plug-and-play' sensors





**INVITE**  
INnovations in  
plant Variety  
Testing

WIKILEEKS

# Thank you! Question?

Institute for Agricultural, Fisheries and Food Research  
Caritasstraat 39  
9090 Melle – Belgium

[peter.lootens@ilvo.vlaanderen.be](mailto:peter.lootens@ilvo.vlaanderen.be)

[www.ilvo.vlaanderen.be](http://www.ilvo.vlaanderen.be)

