



# Using UAV & S2 reflectance and vegetation index for calibrating realistic 3D models of maize fields with DART and simulating their radiative budget

P. Boitard<sup>(1,2)</sup>, B. Coudert<sup>(1)</sup>, N. Lauret<sup>(1)</sup>, JP. Gastellu-Etchegorry<sup>(1)</sup>

(1) CESBIO UMR 5126, 18 av. E Belin, 31401 Toulouse, France  
(2) Université Paul Sabatier - Toulouse 3, Site d'Auch, France



paul.boitard@cesbio.cnes.fr

## Site description

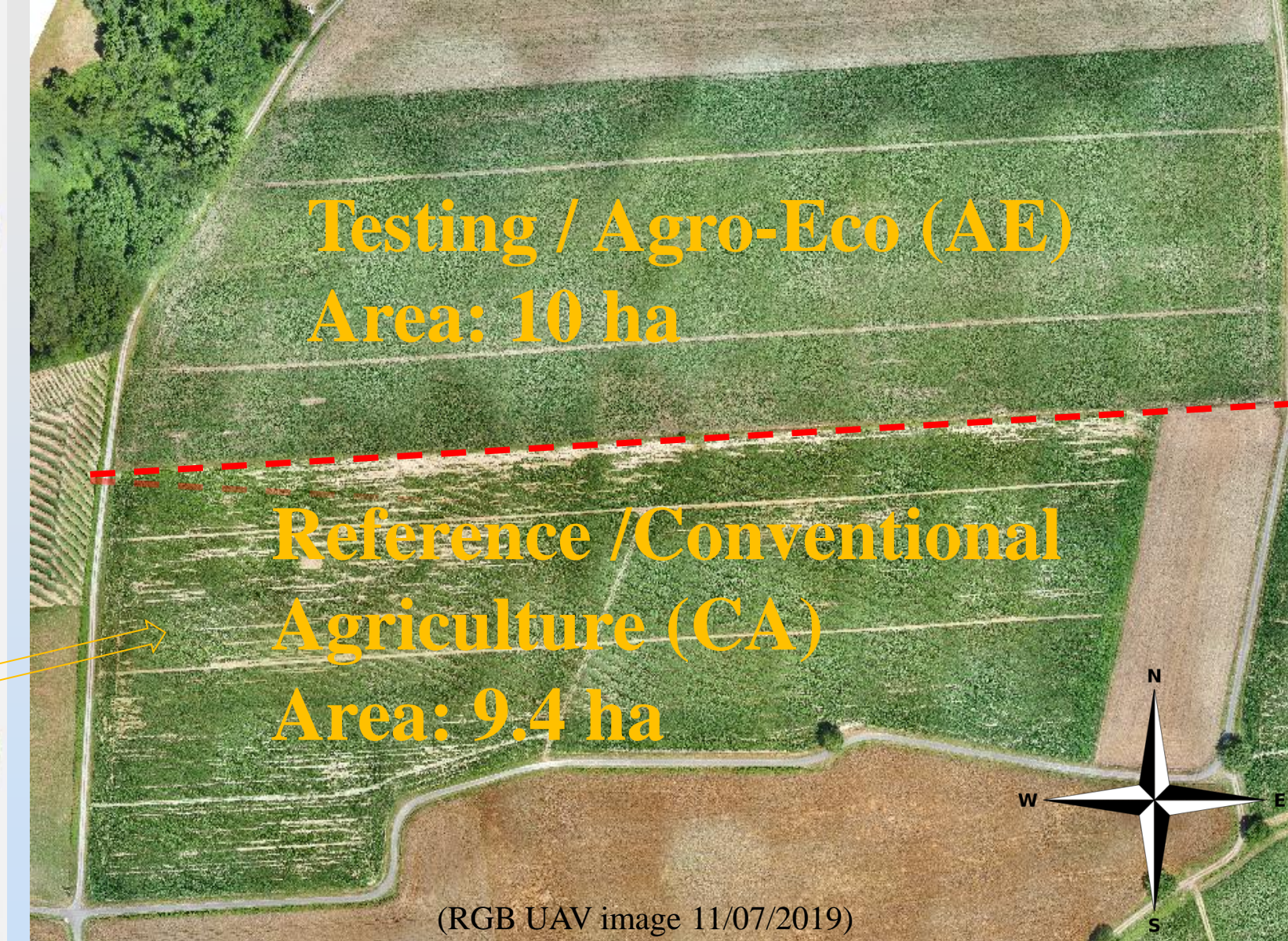
## Abstract

How does the type of maize cultivation (agro-ecological and conventional) influence the Radiative Budget of plants ( $RB_{\text{plant}}$ ) and ground ( $RB_{\text{ground}}$ ), especially in the APAR (Absorbed Photosynthetically Active Radiation) domain?

We assess this influence with the 3D radiative budget of the DART model for 2 maize fields each with specific type of cultivation, 3D architecture and optical properties. The LAI of the fields was not accurately defined by the SNAP code applied to Sentinel 2 (S2). Therefore, we derived from a new method that uses DART, and UAV ( $\Delta r=11\text{cm}$ ) or S2 ( $\Delta r=10\text{m}$ ) images.

Our study highlights:

- The conventional field has a larger  $APAR_{\text{ground}}$  than the agro-eco field with its crop residues
- The agro-eco field has a larger albedo than the conventional field
- The plant architectures of the two fields (interplant and inter-rows) greatly influence  $RB_{\text{plant}}$
- The soil optical property, LAI and plant architecture greatly influence the APAR of the fields



Southwest, France (43°41'N; 0°28'E)  
**Climate:** temperate climate, 1110 mm of cumulative precipitation in 2019, average July temperature > 22 °C.

**Two types of cultivation** with same plant density per hectare (90 000 pl/ha):

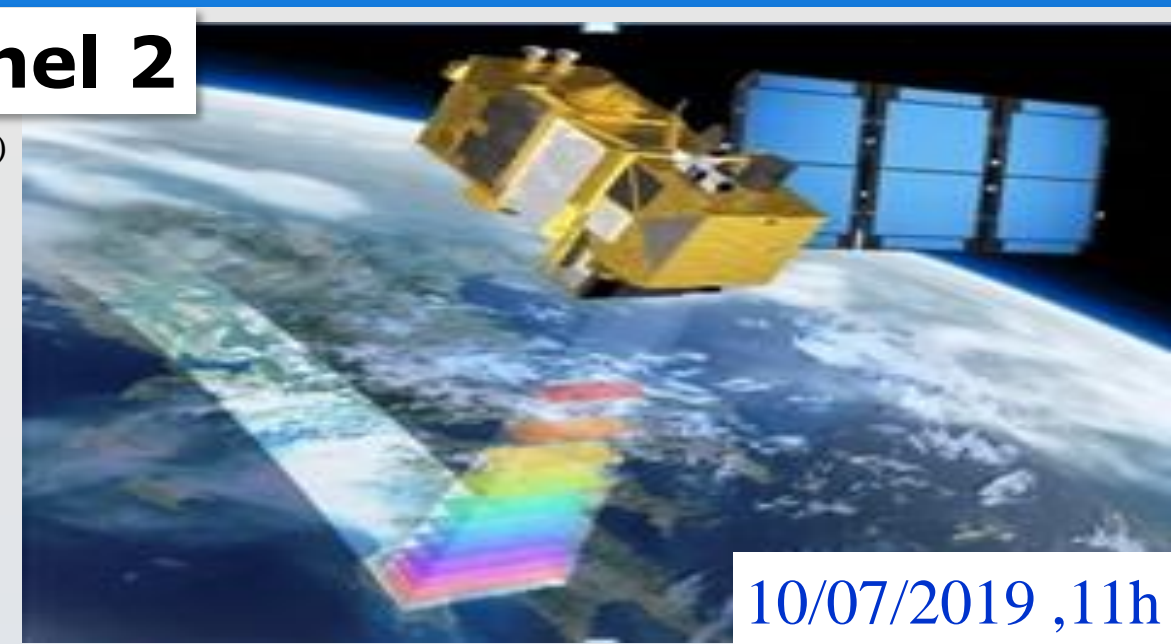
- Agro-ecology (no-till, intermediate crops, crop residue,...)
- Conventional

This site (Estampes, Gers) participates to the TRISHNA CAL/VAL, and is part of the CESBIO's Regional Space Observatory

## Data and method used

### Sentinel 2

(courtesy ESA)



10/07/2019, 11h

Spatial resolution	Satellite Sentinel-2B	Sensor
	Wavelength Bandwidth	
10 m	492.1 nm 98 nm	MSI
	559 nm 46 nm	
	665 nm 39 nm	
	833 nm 133 nm	

The Sentinel Application Platform (SNAP) is a common architecture for all Sentinel Toolboxes. It is developed by Brockmann Consult, Skywatch, Sensar and C-S.

### UAV



(sensefly.com)

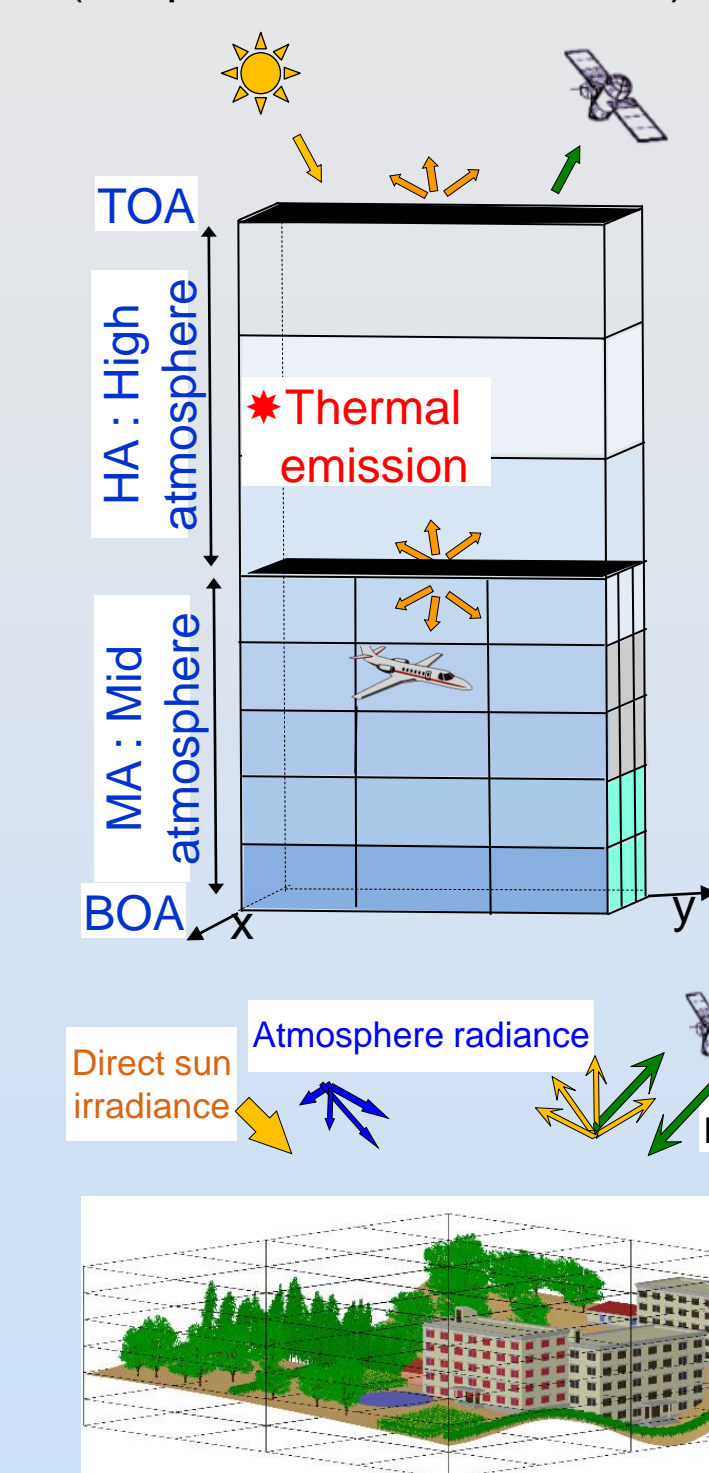
11/07/2019, 14h

Spatial resolution	UAV Ebee	Sensor
	Wavelength Bandwidth	
≈11 cm	550 nm 40 nm	Multi Spec 4 C
	660 nm 40 nm	
	735 nm 10 nm	
	790 nm 40 nm	

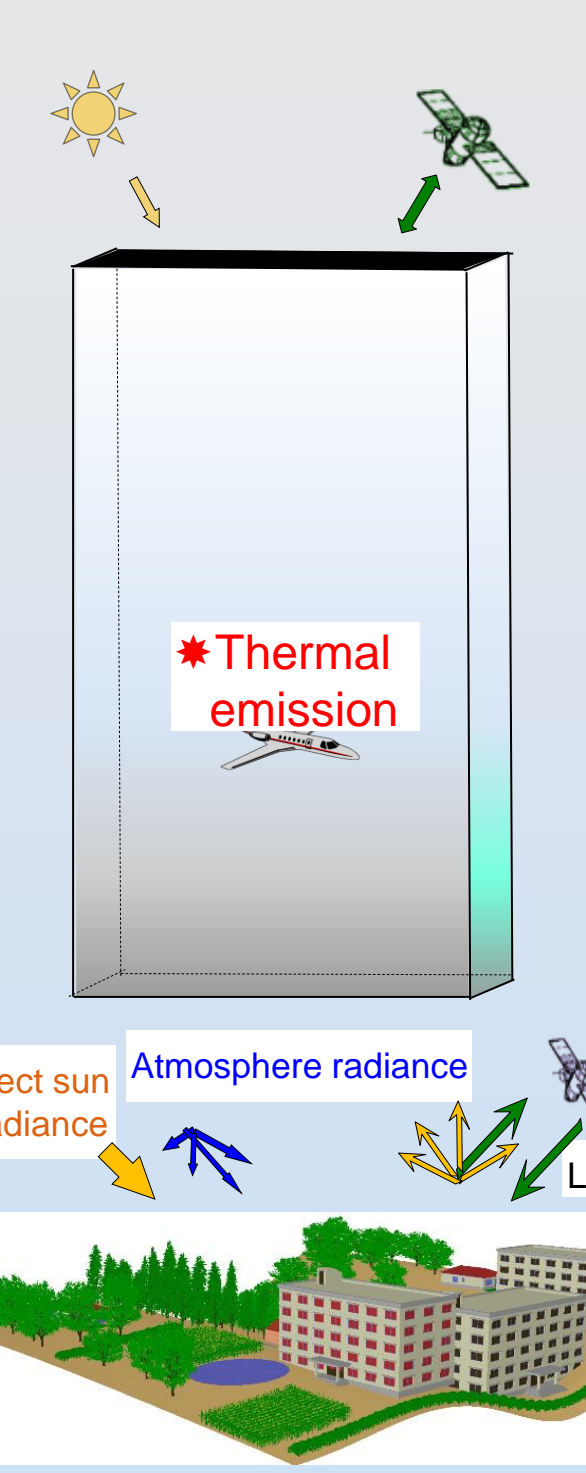
### DART (Discrete Anisotropic Radiative Transfer Model)

- Developed at CESBIO since 1992 (patented in 2003).
- One of the most complete 3D radiative transfer models to simulate the radiative budget and remote sensing observations (VIS / TIR spectroradiometer, LiDAR, SIF) of natural and urban surfaces.
- It contains the PROSPECT/FLUSPECT plant models and MARMIT soil model.
- Landscapes and atmosphere are voxelized (DART-FT) or not (DART-Lux).
- 3D scenes (maize field,...) are made of DART-created and imported scene elements (maize plant,...).

DART-FT : Radiative budget (adapted discrete ordinates)



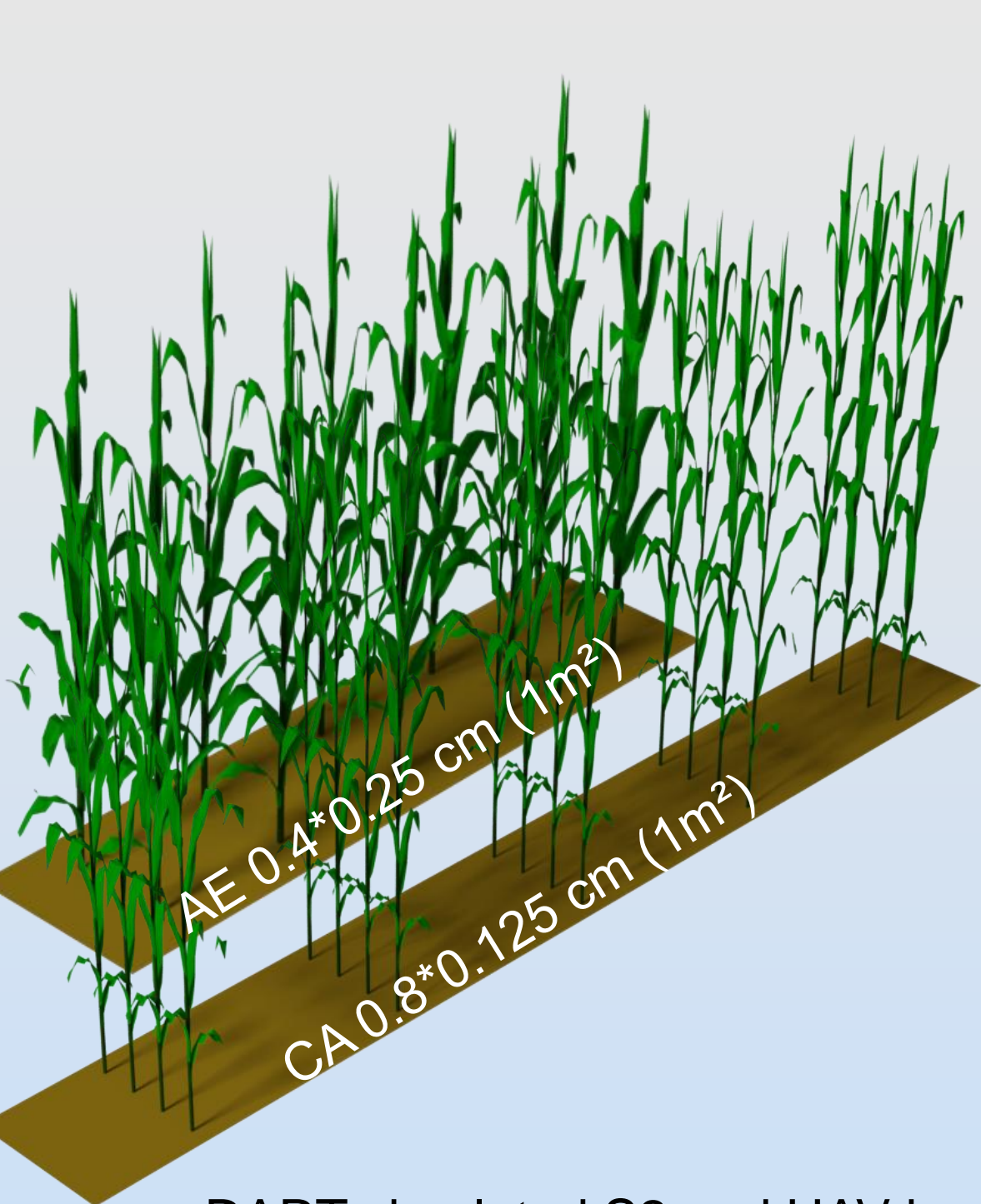
DART-Lux : Image (bi-directional Monte Carlo)



Our work is a continuation of the BAG'AGES project (2016-2021, Adour-Garonne Water Agency) to study agro-ecology (no-till, residues,...), water balance and local determinants (morphology, hydrology, soil properties ...), and also to evaluate the effects of its determinants. We used:

- Remote sensing images at 1 day interval: 2019/07/10 at 11am for Sentinel 2 (S2) and 2019/07/11 at 2pm for UAV (VIS NIR, TIR). UAV was used to create soil and vegetation classification masks (RGB, resolution: 3 cm)
- In situ data: 4 radiative fluxes (short and long waves, upward and downward), images of a TIR camera at 7m height, soil / plant optical properties ( $OP_{\text{soil}}$ ,  $OP_{\text{plant}}$ ) from ASD spectroradiometer, T° & RH micro-sensors (ibuttons inside canopy and soil surface)
- The DART model: simulation of in-situ radiative fluxes, and 3D radiative budget and images of the fields

## Mock-up DART



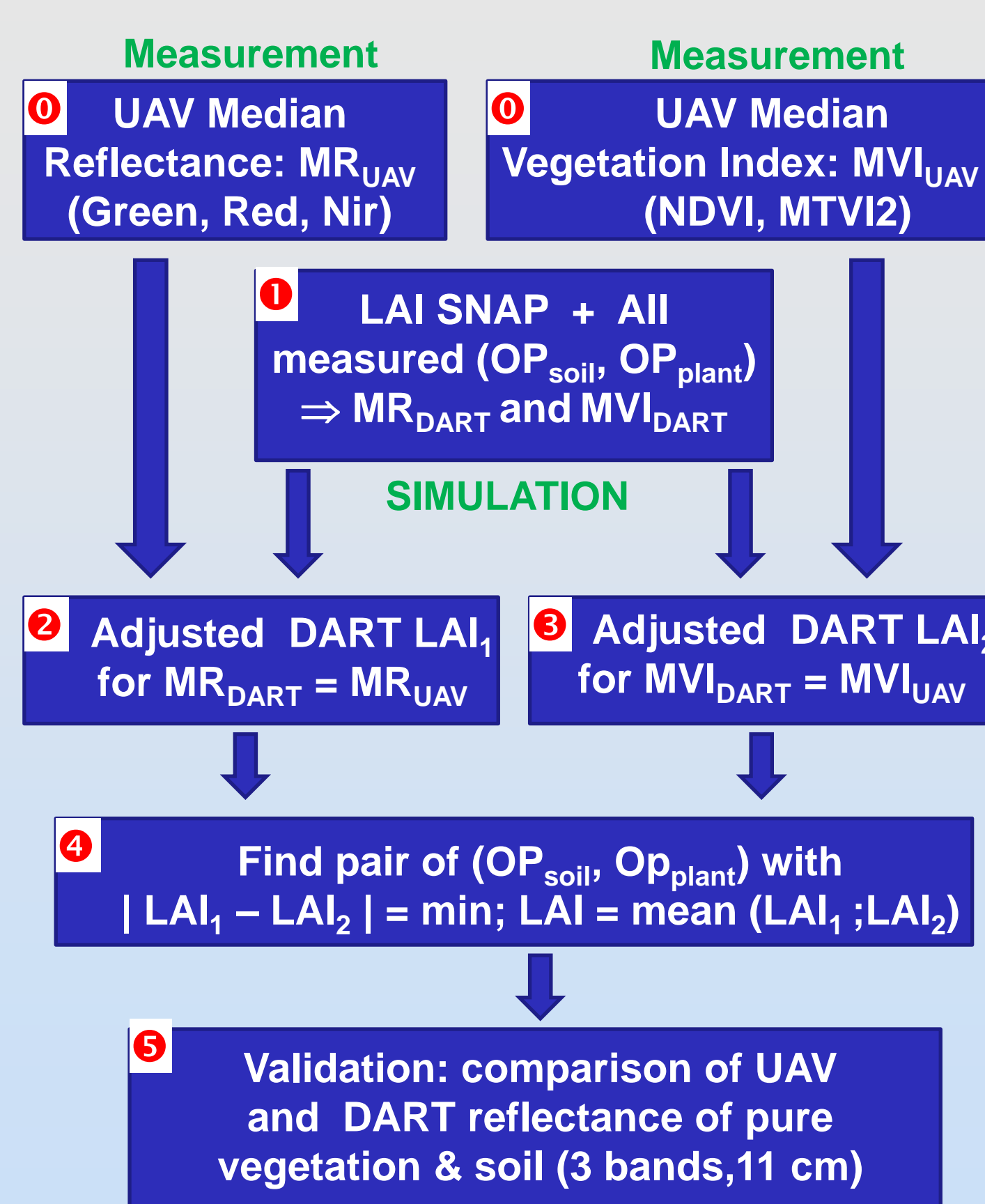
DART simulated S2 and UAV images according to their observation configurations: spectral bands, and atmospheric conditions using the MidLatSum gas model and the Rural23 aerosol model

The AE and CA maize fields are simulated as an infinite repetition of a pattern of 10 plants with specific 3D architecture (plant geometry, LAI, inter-row, inter-plant, row orientation).

The optical properties (soil, stem, plant) are derived from in-situ, UAV and satellite data.

The time variation of spectral direct  $E_{BOA,dir}(t,\lambda)$  / diffuse  $E_{BOA,dif}(t,\lambda)$  irradiance were derived from a DART-based inversion method applied to local BOA shortwave direct  $E_{BOA,dir}(t)$  + diffuse  $E_{BOA,dif}(t)$  irradiance.

## LAI adjustment strategy

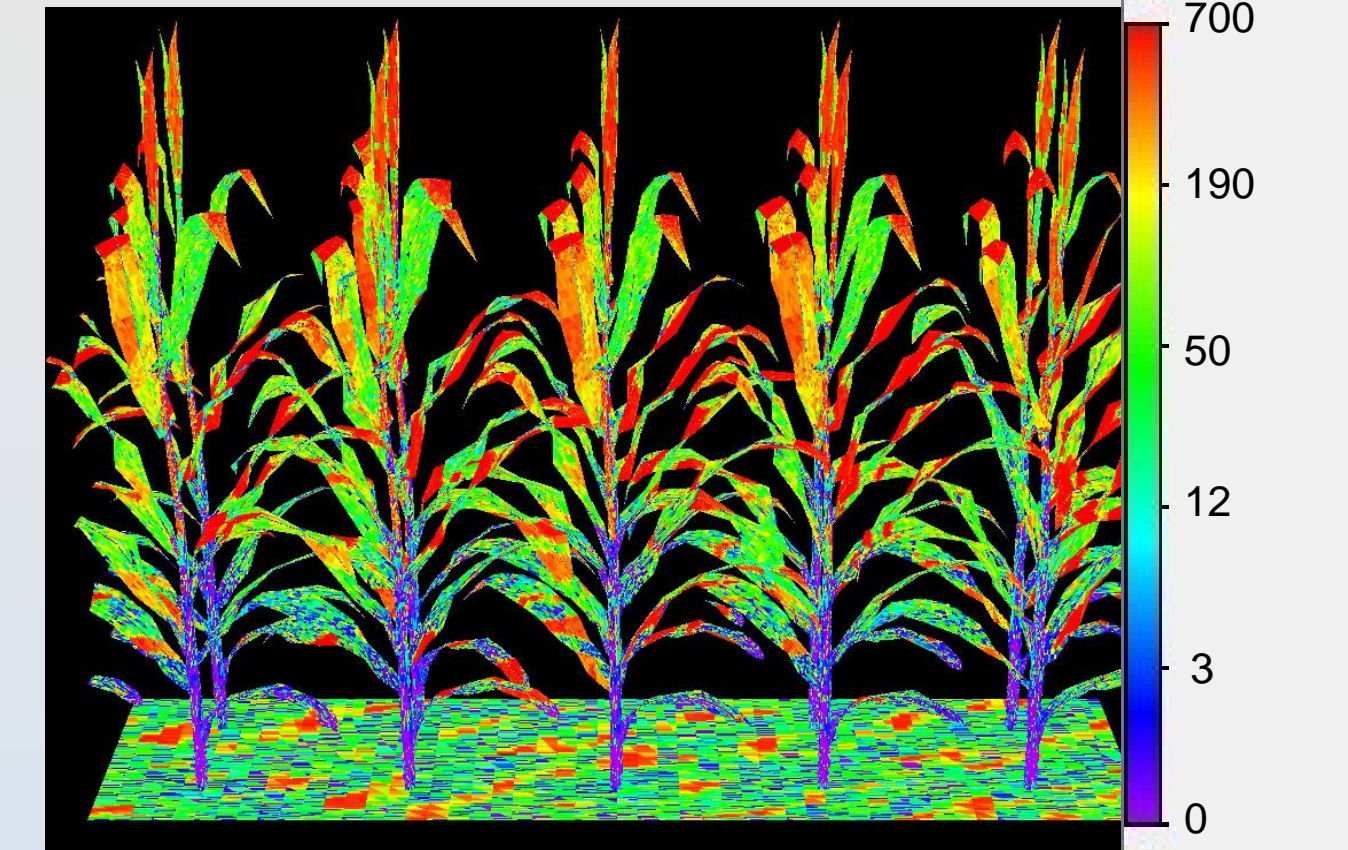


- 1 Compute Median Reflectance  $MR_{UAV}$  and Median Vegetation Index  $MVI_{UAV}$  of UAV image
- 2 Choice of  $OP_{\text{soil}}$  and  $OP_{\text{plant}}$  spectra (in-situ data)
- 3 Find  $LAI_1$  such that  $MR_{DART} = MR_{UAV}$  (11cm)
- 4 Find  $LAI_2$  such that  $MVI_{DART} = MVI_{UAV}$  (10 m).
- 5 Select  $(OP_{\text{soil}}, OP_{\text{plant}})$  from 1, 2 and 3 that gives the minimal value of  $|LAI_1 - LAI_2|$ .
- 6 Validation: compare UAV & DART reflectance of pure soil and vegetation (from RGB classification masks)

The method can also be used with S2 (without step 6, Mock-up considerate at 10 m)

- Better LAI from UAV & S2 than from S2 SNAP:
- S2 SNAP:  $LAI_{AE} = 1.90$  and  $LAI_{CA} = 1.70$
- S2 data:  $LAI_{AE} = 3.17$  and  $LAI_{CA} = 2.84$
- UAV data:  $LAI_{AE} = 3.52$  and  $LAI_{CA} = 3.24$
- LAI S2 and LAI UAV  $\neq$  LAI SNAP and agreed with Jiang et al., 2022

## Sensitivity study of RB



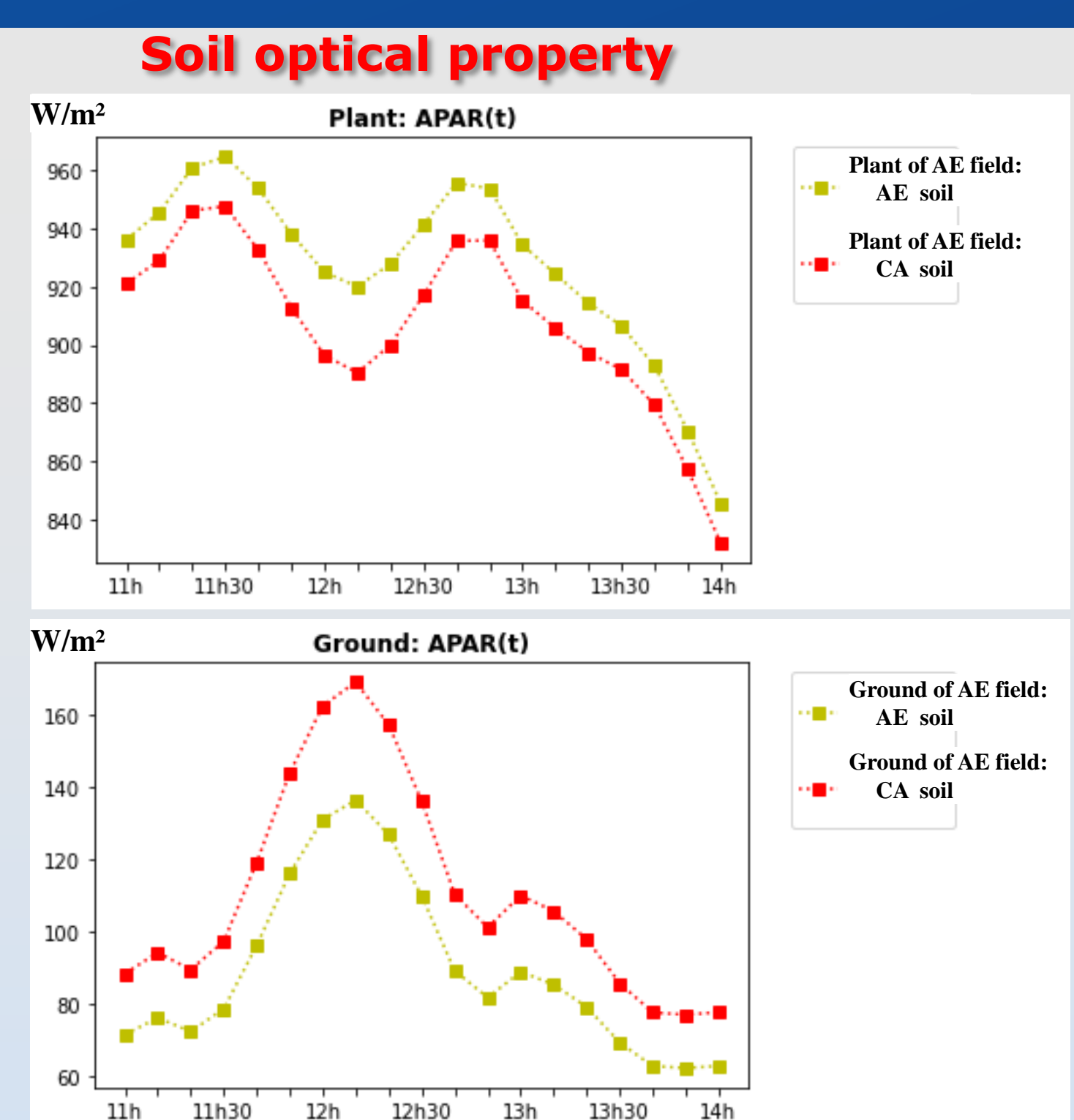
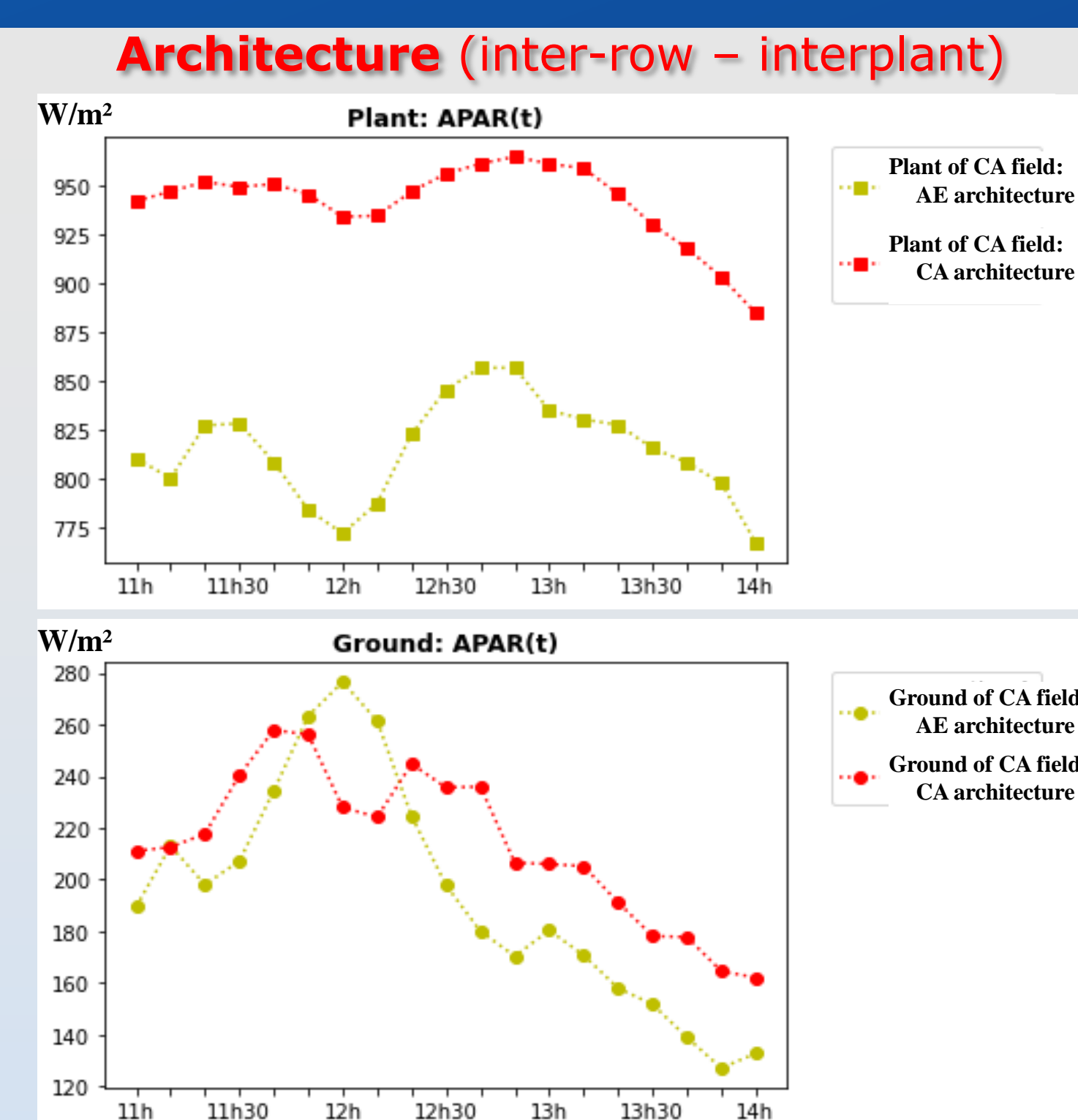
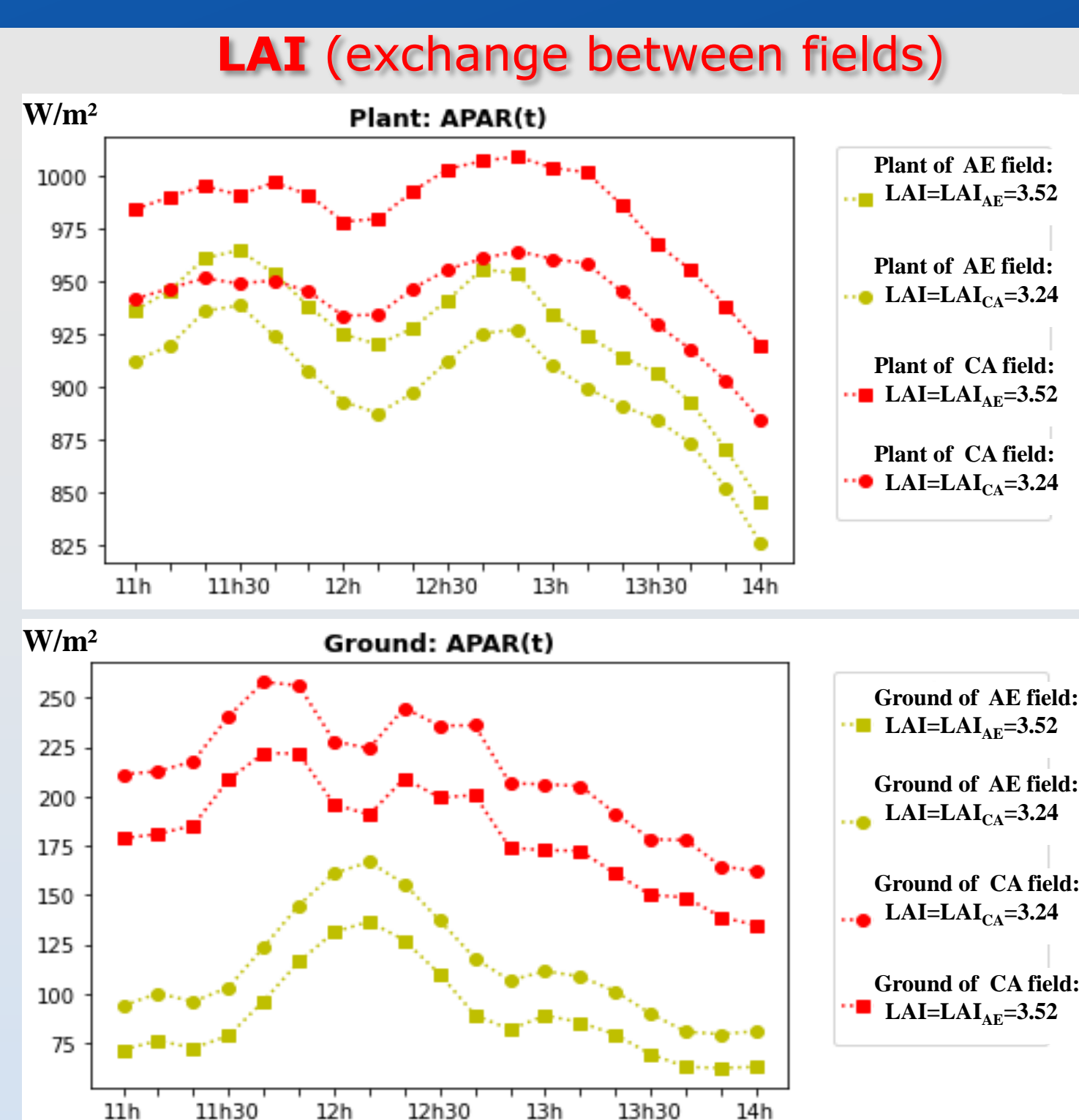
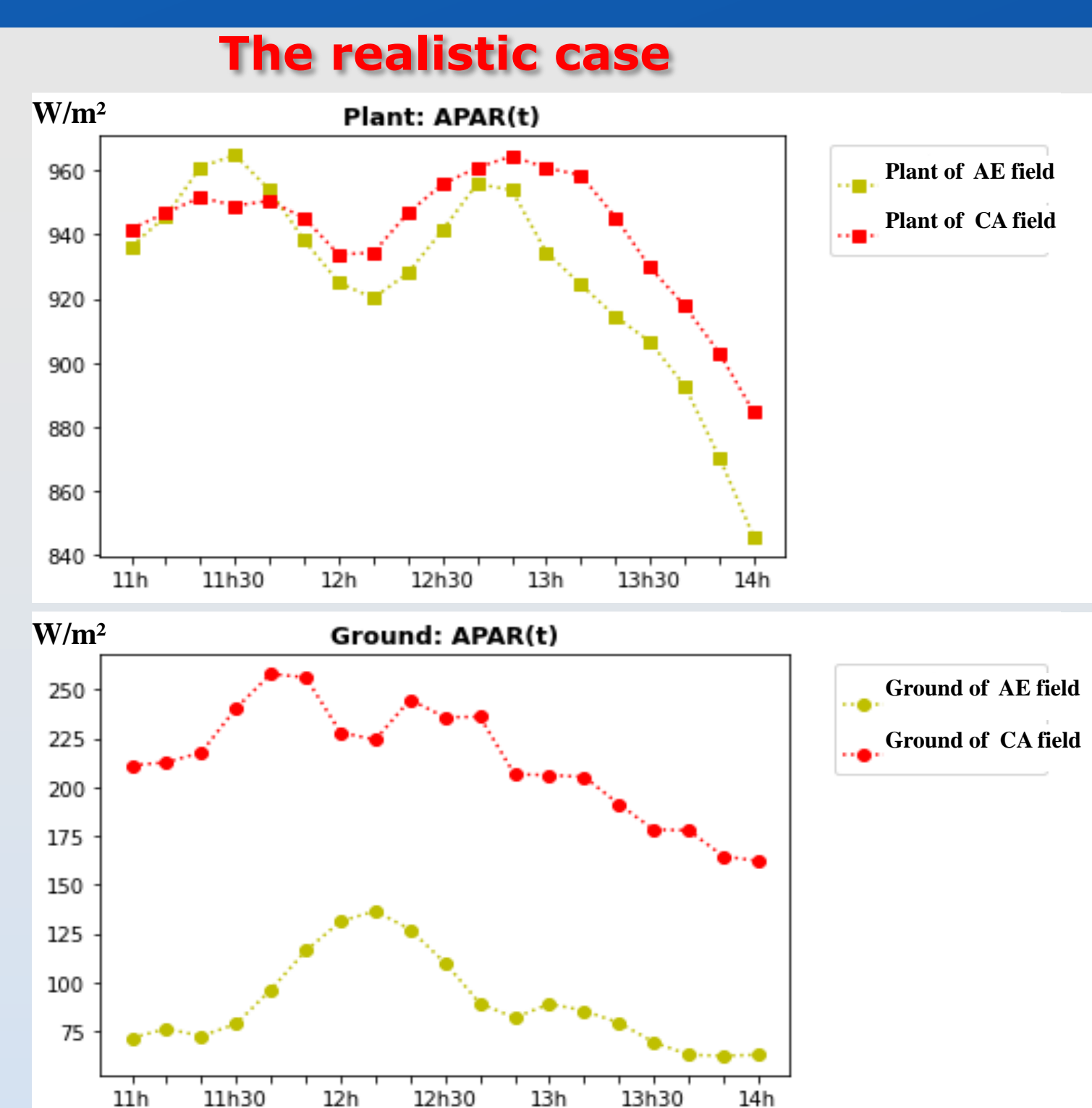
3D radiative budget PAR agro-eco field band 1 ( $W/m^2/\mu m$ )

Time series  $\{RB_{\text{plant}}(t), RB_{\text{ground}}(t)\}$  from 11am to 2pm ( $\Delta t=10'$ ) in PAR (8 bands) function of:

- 3D geometry: LAI, plant mock-up, plant spacing and orientation
- Optical properties (soil, plant).

This work was carried out with 3D mock-ups to take into account clumping effects (Duthoit et al., 2008) shading and geometry of plants.

## Sensitivity analysis on $APAR_{\text{plant}}$ and $APAR_{\text{ground}}$ : realistic case, variable LAI, field architecture and $OP_{\text{soil}}$



$AE\ APAR_{\text{plant}} \approx CA\ APAR_{\text{plant}}$  and Mean Difference on the three Hours (MDH)  $\approx 14\ W/m^2$ .  
 $CA\ APAR_{\text{ground}} \gg AE\ APAR_{\text{ground}}$  with a MDH of  $124\ W/m^2$ . AE scattered more to the atmosphere. This study explains the "CA-AE" difference and quantifies the influence of each parameter.

$APAR_{\text{plant}} \nearrow$  and  $APAR_{\text{ground}} \searrow$  if  $LAI \nearrow$ .  
Here:  $LAI_{AE} > LAI_{CA} \Rightarrow$  difference "AE - CA" smaller for  $APAR_{\text{plant}}$  and larger for  $APAR_{\text{ground}}$ .  
If  $LAI_{AE} = LAI_{CA}$ : MDH of  $APAR_{\text{ground}} = 92\ W/m^2$  instead of  $124\ W/m^2$ . The difference of LAI contributes but cannot explain alone the differences on  $APAR_{\text{ground}}$  for the real case.

The architecture of the field with CA :  
- Greatly increases  $APAR_{\text{plant}}$  (MDH=126-147  $W/m^2$ )  
- Slightly increases  $APAR_{\text{ground}}$  (MDH=20  $W/m^2$ ).

Tilled soil (CA)  $\Rightarrow$  higher  $APAR_{\text{ground}}$  (MDH  $\in [20-35\ W/m^2]$ )  
Crop residue on soil (AE)  $\Rightarrow$  higher  $APAR_{\text{plant}}$  (MDH  $\in [20-40\ W/m^2]$ ).  
 $OP_{\text{soil}}$  contributes to the difference on  $APAR_{\text{ground}}$ .

**Conclusion:** Field architecture, LAI and  $OP_{\text{soil}}$  greatly affect  $APAR_{\text{ground}}$  and  $APAR_{\text{plant}}$ . For the CA and AE fields,  $\Delta APAR_{\text{ground}} = 124\ W/m^2$ . The only architectural difference implies  $\Delta APAR_{\text{plant}} = 120-147\ W/m^2$ . It could explain microclimatic differences in the CA and AE fields and the observed differences in local temperatures ([https://backoffice.inviteo.com/upload/compte84/Base/inscriptions\\_projets/supplement20/2522-trishna\\_days\\_paul\\_boitard.pdf](https://backoffice.inviteo.com/upload/compte84/Base/inscriptions_projets/supplement20/2522-trishna_days_paul_boitard.pdf)).