

# **Soil moisture retrieval from SMAPVEX12 and SMAPVEX16-MB data**

**Ramata Magagi, Kalifa Goïta**

**Honqguan Wang (PDF)**

**Vincent Beauregard (M. Sc. student)**

**With the collaboration of Andreas Colliander, Alexandre Roy and Tom Jackson**



**UNIVERSITÉ DE  
SHERBROOKE**



# Outline

- Context
- Results from recent investigations with SMAPVEX12 data
  - Empirical soil moisture retrievals over wheat fields;
  - Polarimetric soil moisture retrievals;
- Current works on SMAPVEX12 and SMAPVEX16-MB data

# Context

Project designed in the context of the Canadian science plan for SMAP mission

## **Financial partners:**

*Canadian Space Agency (CSA)*

Natural Sciences and Engineering Research Council of Canada (NSERC)

## **Collaborators:**

Environment Canada (EC)

Agriculture and Agri-Food Canada (AAFC)

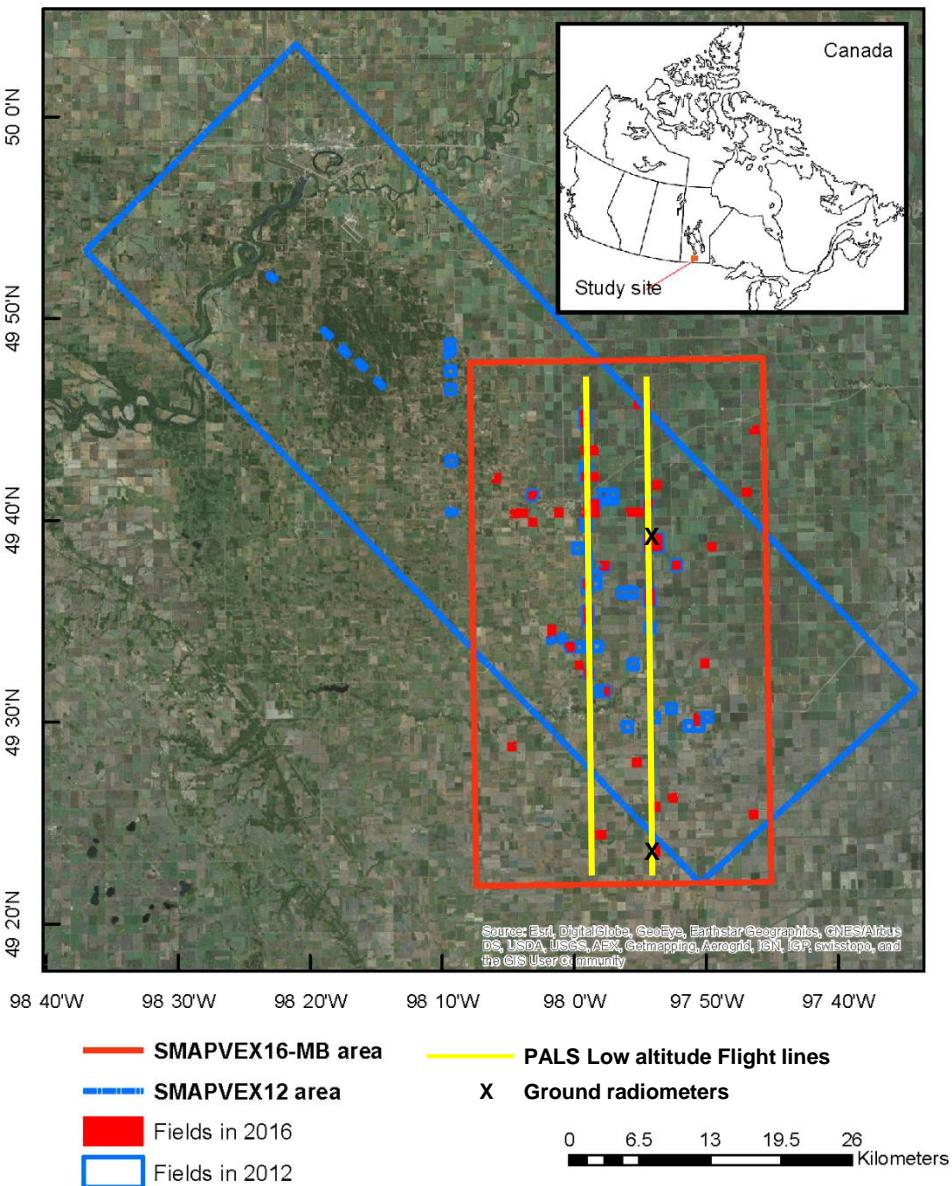
University (Sherbrooke, Manitoba, Guelph)

National Aeronautics and Space Administration (NASA), USDA, JPL

CESBIO, France

DLR Microwaves and Radar Institute, Germany

# Study area and data



SMAPVEX12 and SMAPVEX16-MB fields

Collection of ground (soil and vegetation) data  
network data (SM and temp.)  
L-band radiometers

airborne PALS data  
airborne UAVSAR data (2012 only)  
satellite data

# **Empirical soil moisture retrievals over wheat fields from RADARSAT-2 data**

# Empirical Soil moisture estimation over wheat fields from RADARSAT-2

- Multiple linear regressions

$$m_v = \beta_1 X_1 + \cdots + \beta_i X_i + \cdots + \beta_p X_p + \beta_0 + \epsilon$$

- 1) Consider all the variables  $X_i$  (incoherent + coherent)
- 2) Reduce the dimension by using only selected **non-correlated** variables
- 3) Use stepwise regression

# Empirical Soil moisture estimation over wheat fields (cont.)

- Results from SMAPVEX12

| Model | Nb of fields | Nb of Observations | R <sup>2</sup> | RMSE (m <sup>3</sup> /m <sup>3</sup> ) | Variables  | β   | p-value  |
|-------|--------------|--------------------|----------------|--|--|---|--|
| 4     | 8            | 60                 | 0.598          | 0.078                                  | $\sigma_{HH}^0$<br>$\sigma_{HV}^0$<br>$\sigma_{VV}^0$<br>$\phi_{HH-VV}$<br>$Hs$<br>$A$ | 0.107<br>-0.117<br>0.057<br>-0.003<br>2.072<br>-1.637 | 0.000<br>0.000<br>0.005<br>0.000<br>0.000<br>0.008 |
| 5     | 8            | 60                 | 0.510          | 0.084                                  | (Intercepte)<br>$\sigma_{HH}^0$<br>$\phi_{HH-VV}$                                      | 0.662<br>0.036<br>-0.004                              | 0.000<br>0.000<br>0.000                            |

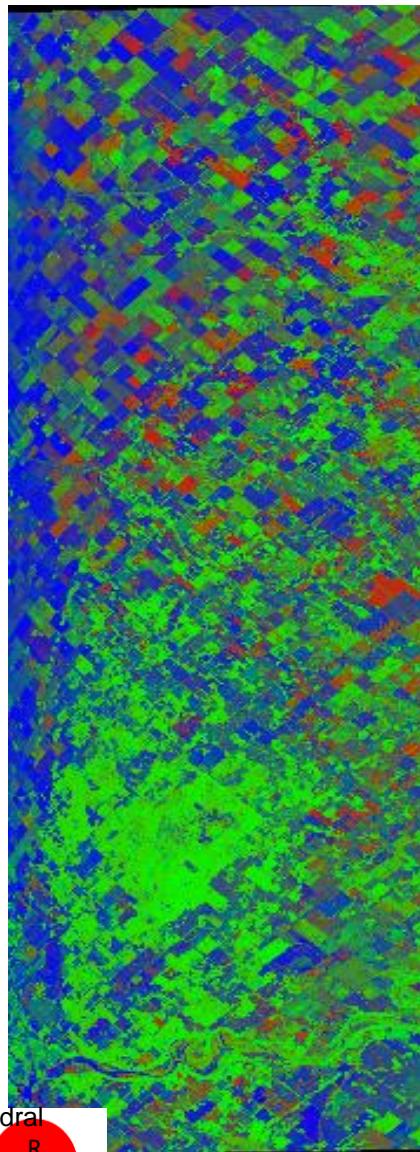
# Polarimetric soil moisture retrievals

# Polarimetric soil moisture retrievals

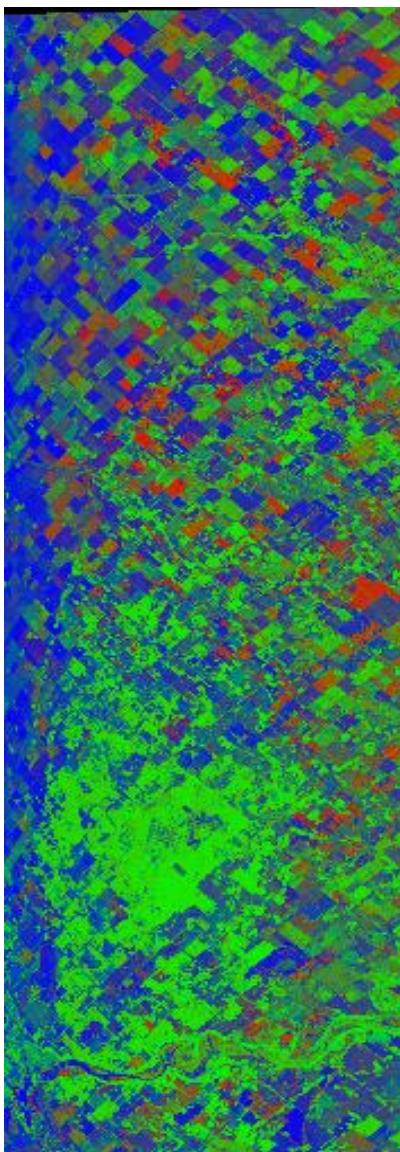
- **Compare** 3 model-based polarimetric decompositions (Freeman-Durden, Hajnsek and An) for soil moisture retrievals from L-band UAVSAR data;
- Apply the best approach to **Multi-angular UAVSAR**

# Comparison of 3 polarimetric methods : RGB composite of scattering powers

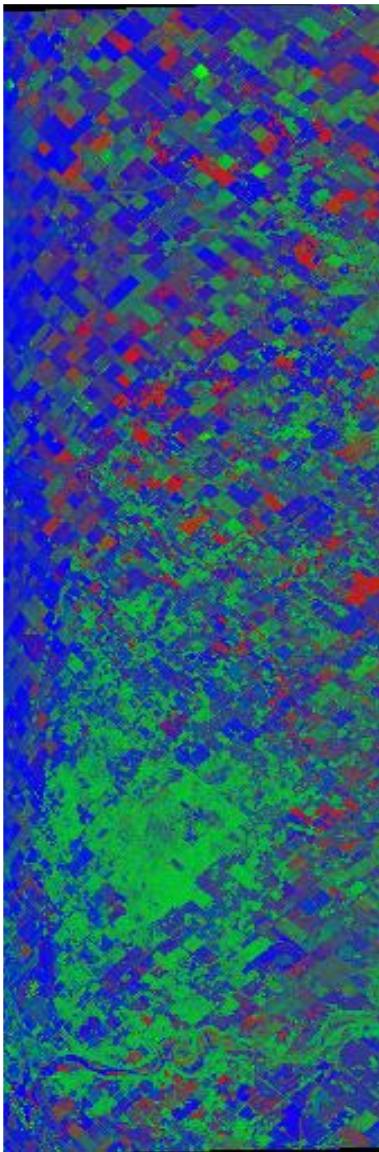
Freeman-Durden



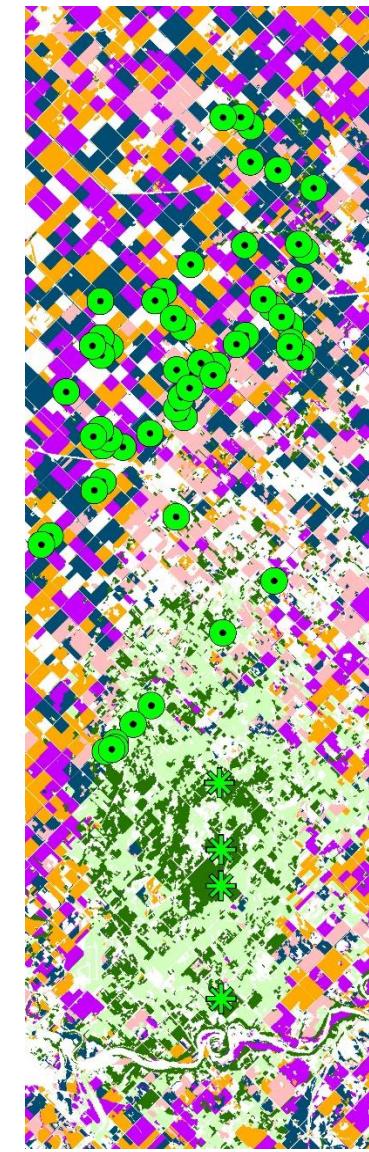
Hajnsek



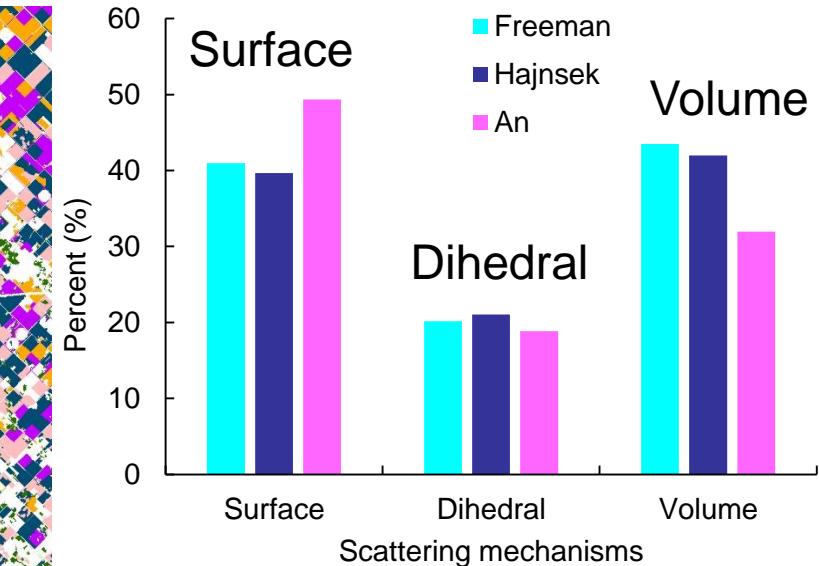
An



Classified Image



2012-06-17



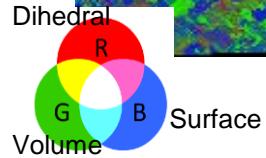
## Legend

- Agricultural sampling points
- ★ Forest sampling points
- Canola
- Corn
- Soybean
- Wheat
- Pasture
- Forest
- Other crops

Wang et al. 2016 IEEE GRSL

Wang et al. 2016 Remote sensing

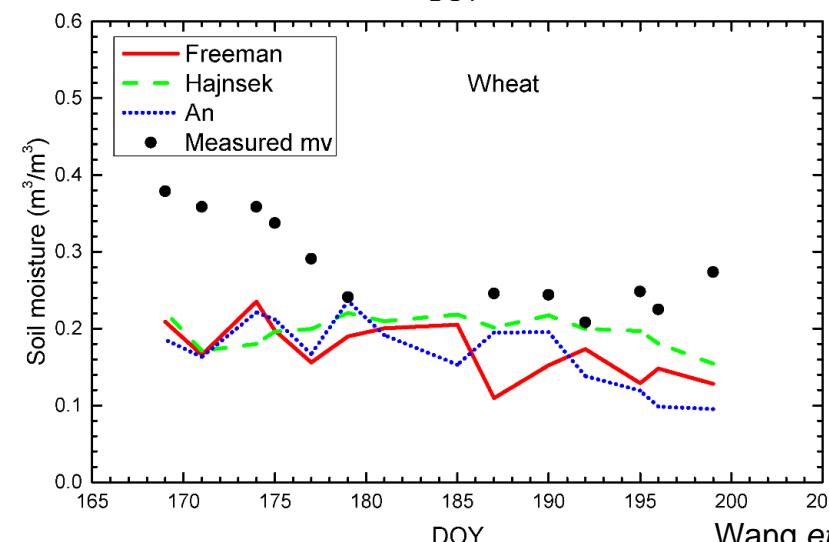
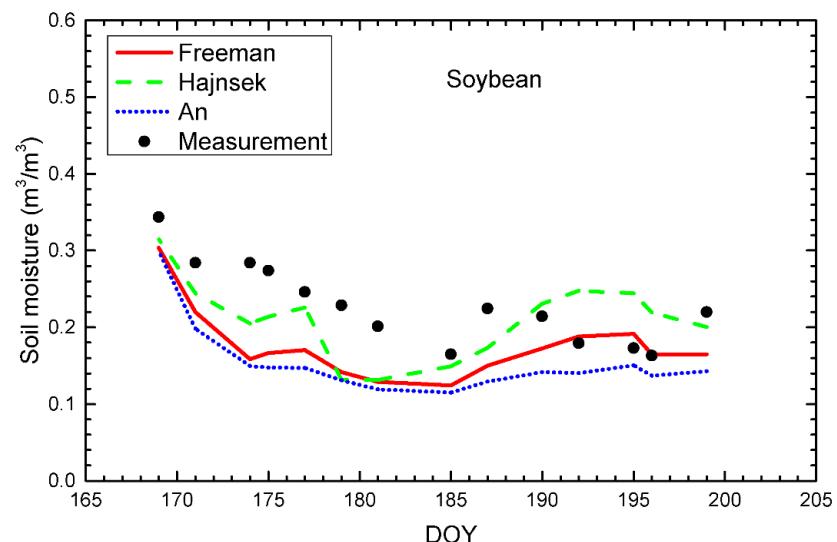
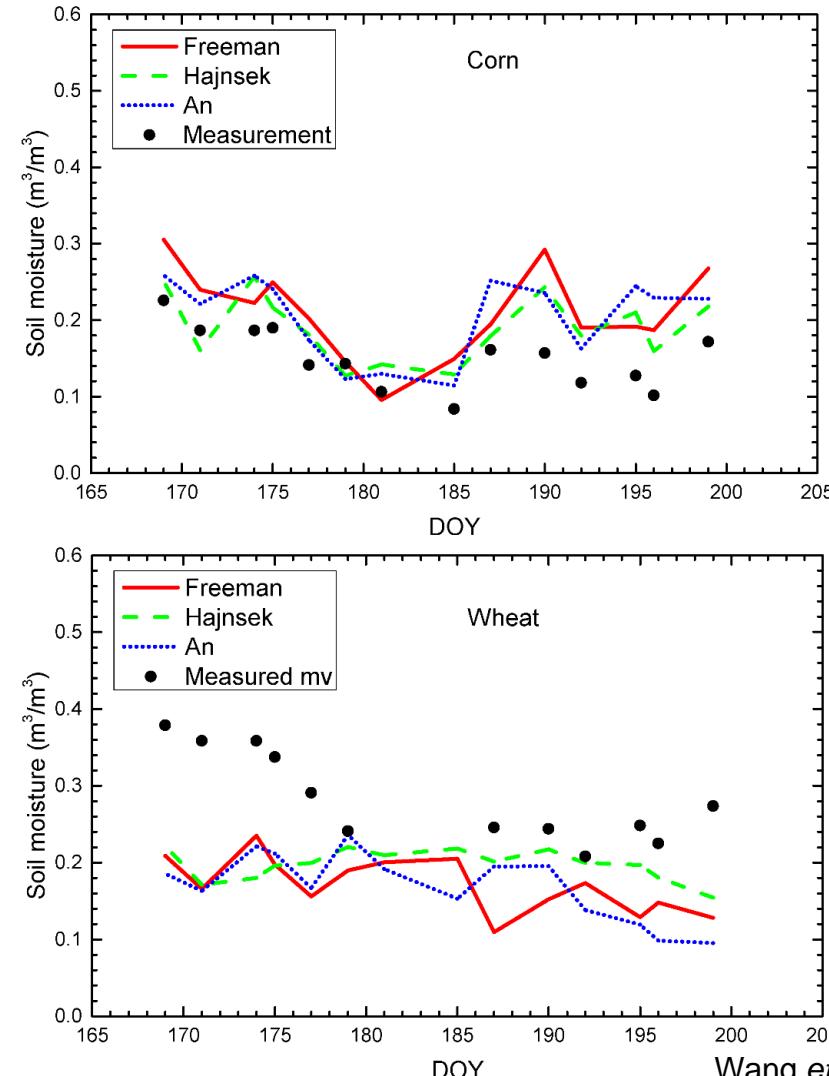
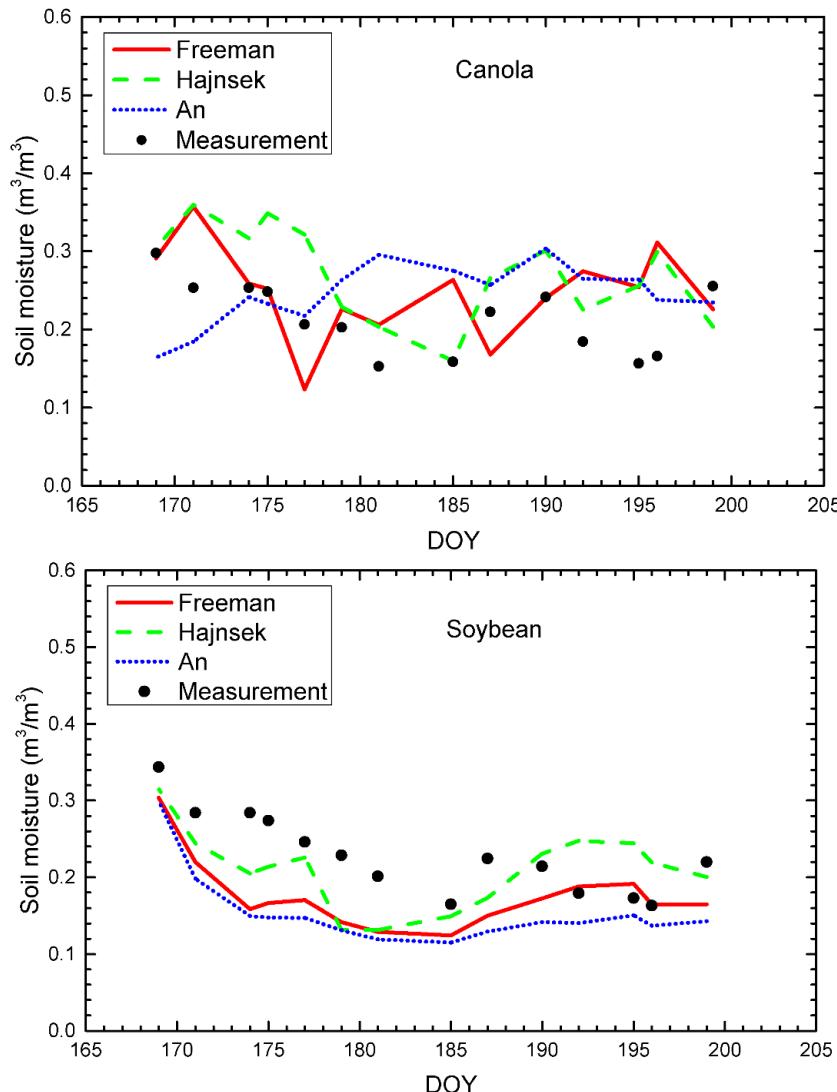
Wang et al. 2017 RSE (under review)



More surface scattering power in An decomposition

## Comparison of 3 polarimetric methods (cont.)

### Results of soil moisture retrieval from the dominant surface or dihedral scattering component



Wang et al. 2016 IEEE GRSL

Wang et al. 2016 Remote sensing

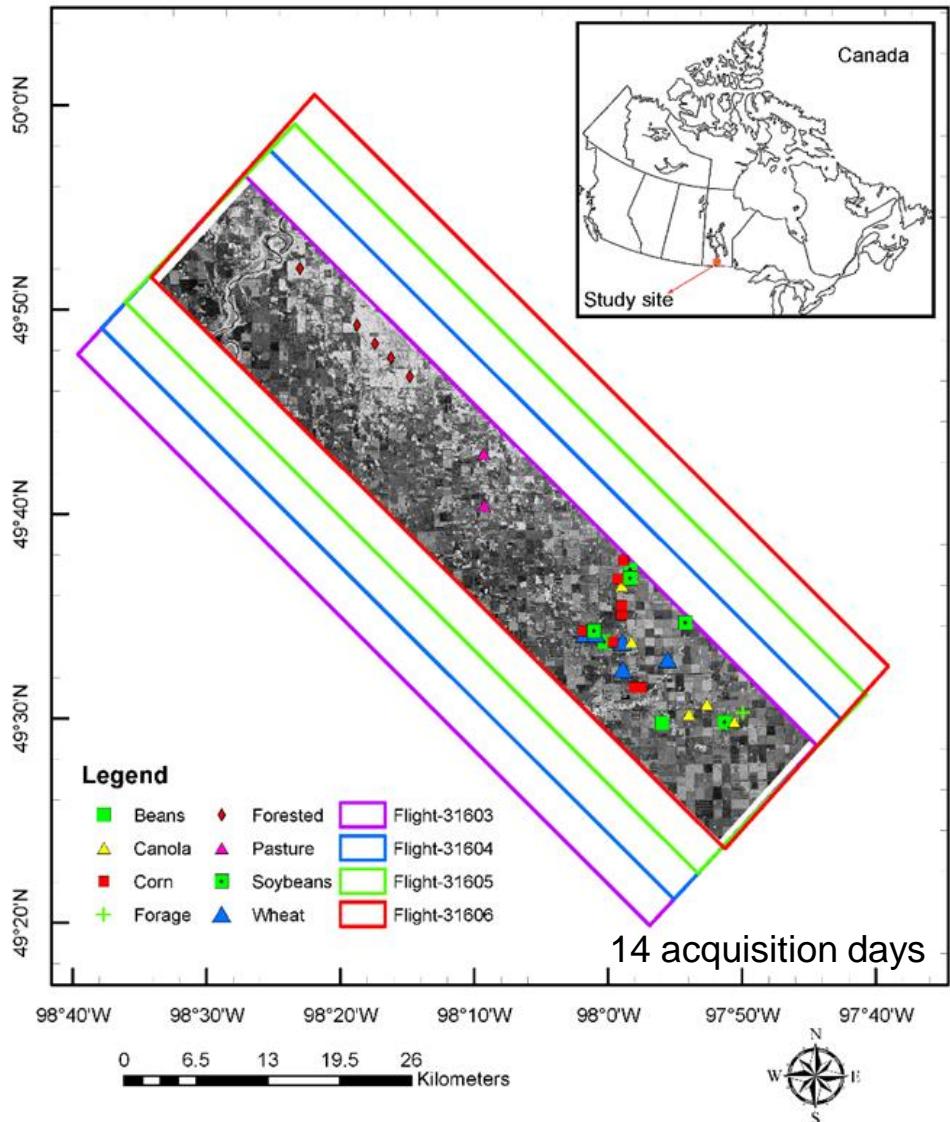
11



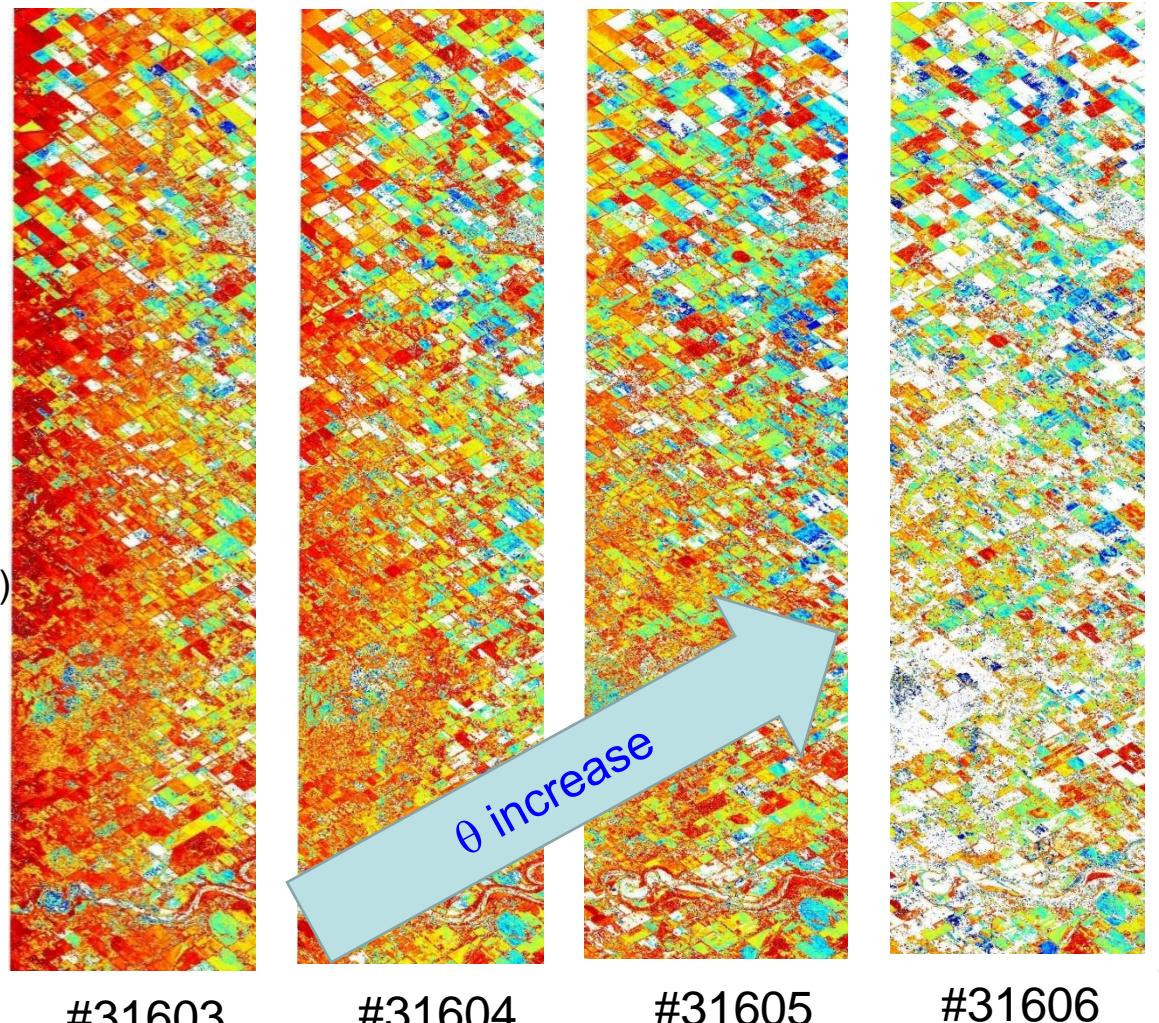
Best retrieval with Hajnsek method

Wang et al. 2017 RSE (under review)

# Polarimetric decomposition of Multi-angular UAVSAR data

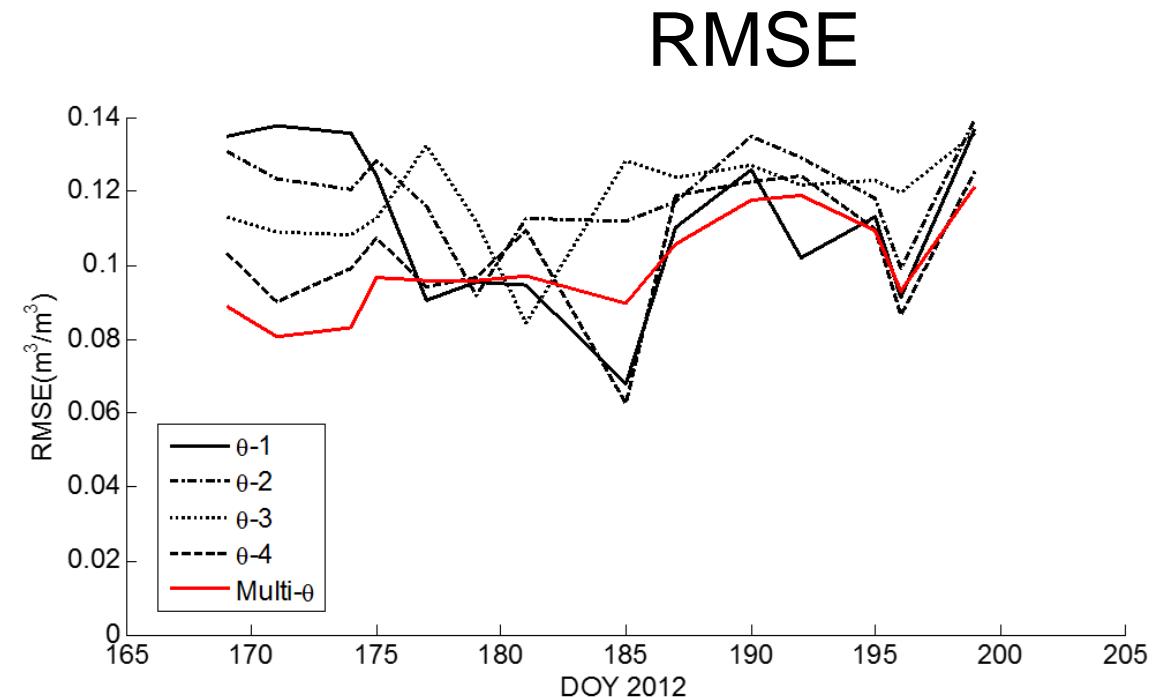
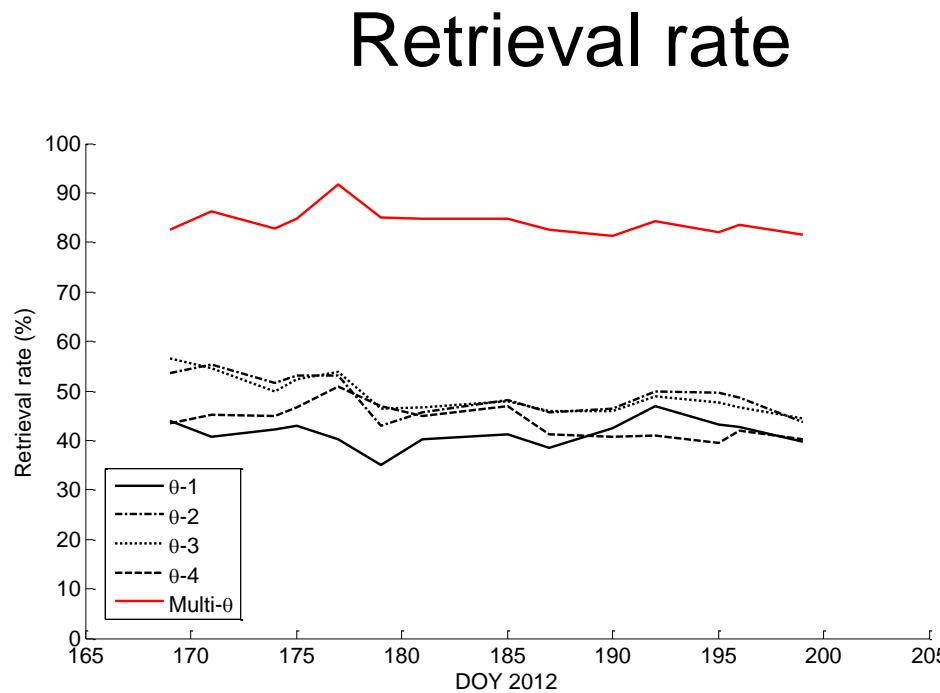


Surface scattering component



# Polarimetric decomposition of Multi-angular UAVSAR data (cont.)

- Results



Multi-incidence angle → increases the retrieval rate and decreases the RMSE

# **Current works with SMAPVEX12 and SMAPVEX16-MB data**

# Preliminary analyses

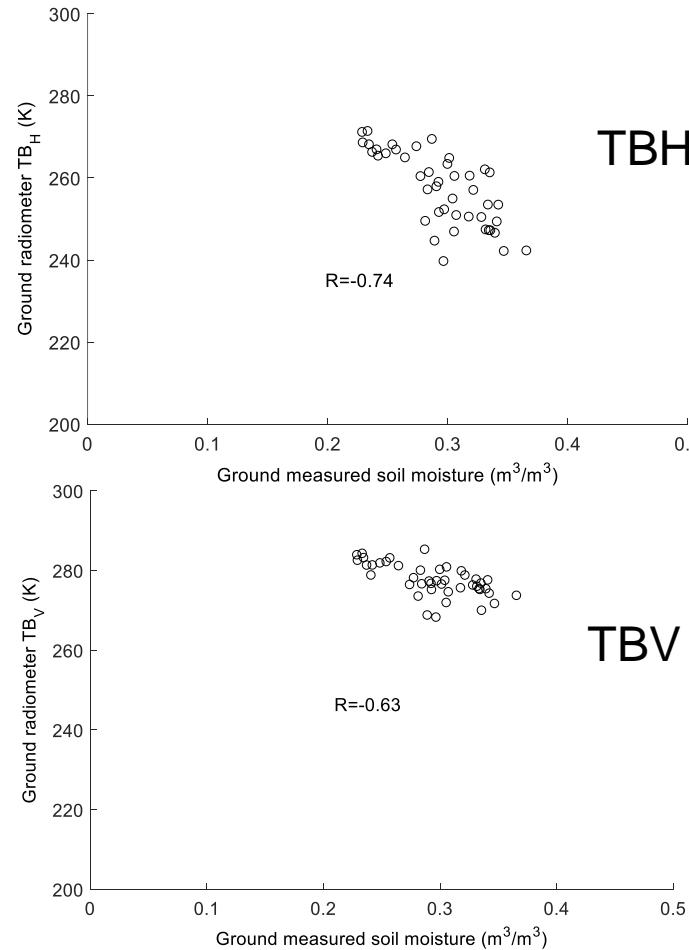
**SMAPVEX 12 & 16-MB PALS TB (**Low altitude**) to soil moisture**

→ **Objective : Understand the effects of soil and vegetation conditions on TB for soil moisture retrieval**

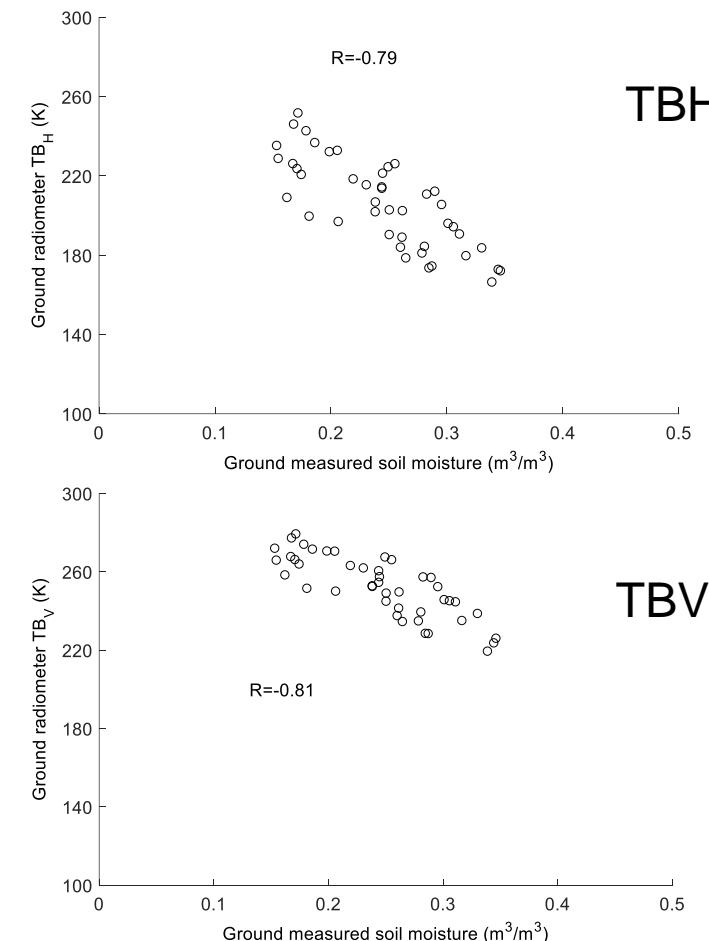
| Field campaigns                   | Data analyses  |
|-----------------------------------|--|
| <b>SMAPVEX16-MB</b>               | <b>L-band Radiometers :</b><br><b>Ground vs soil moisture</b><br><b>Ground vs low altitude PALS</b><br><b>Low altitude PALS vs soil moisture</b> |
| <b>SMAPVEX12 and SMAPVEX16-MB</b> | <b>Comparison of low altitude PALS</b><br><b>Modelling results</b>   |

# Ground radiometer TB versus soil moisture

- Field #105: Wheat



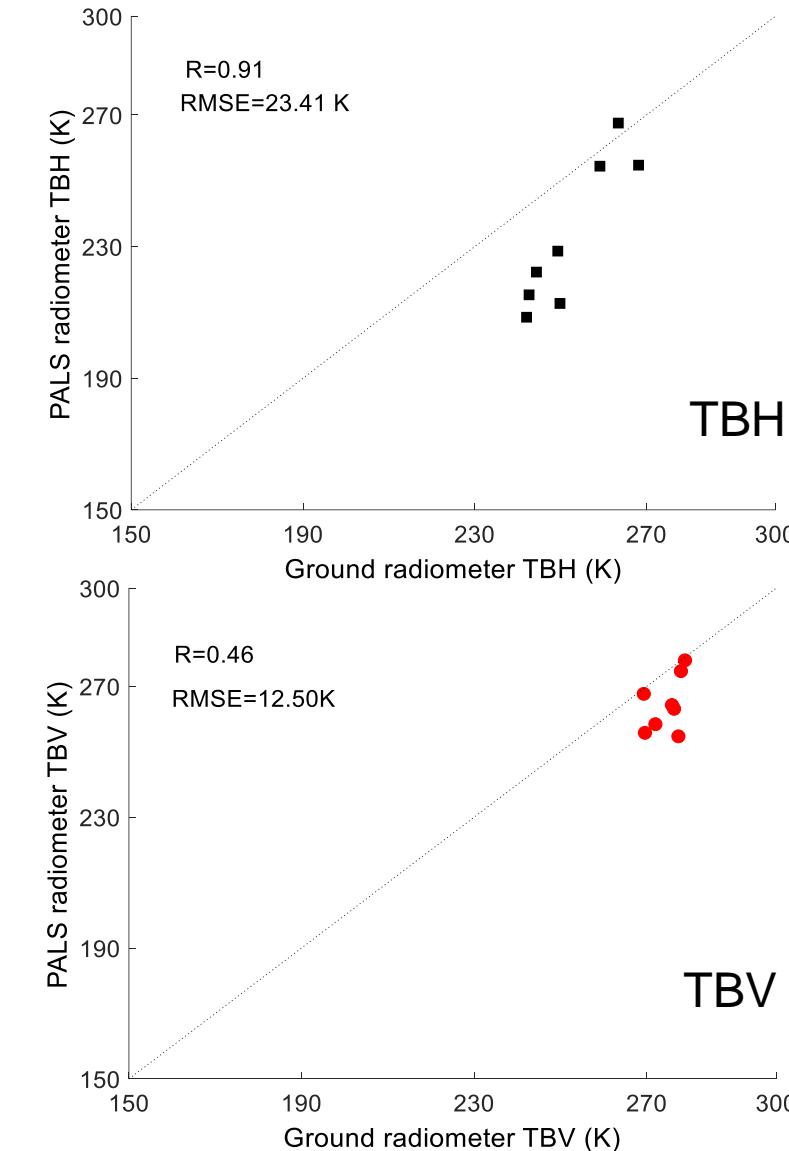
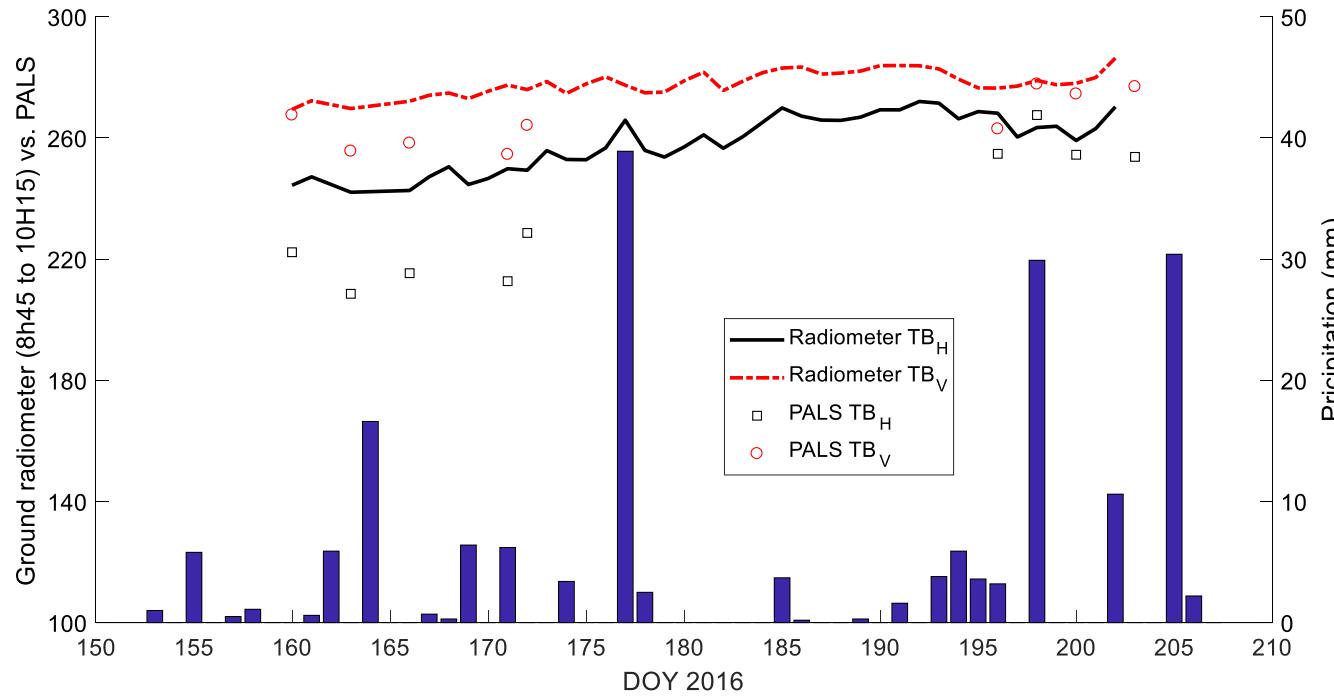
Field #202: Canola (Low vegetation)



Less vegetation over Field #202 → Higher sensitivity to soil moisture

# Ground radiometer versus PALS

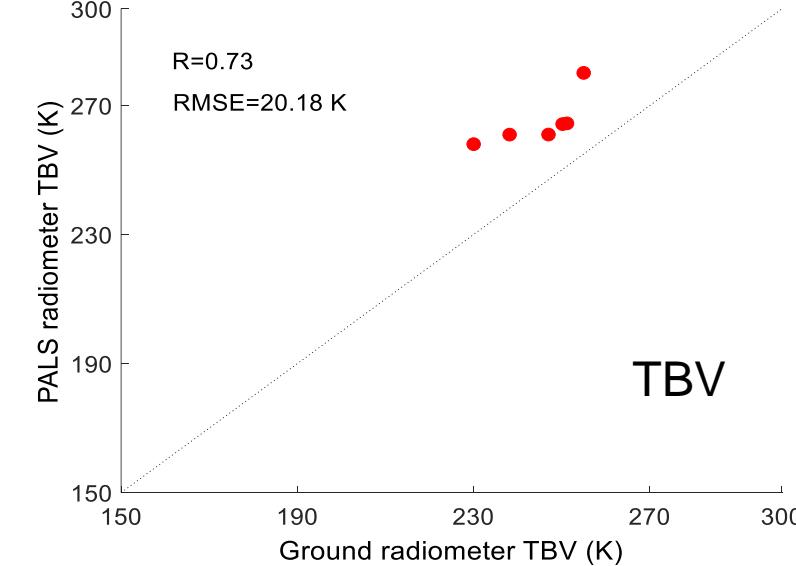
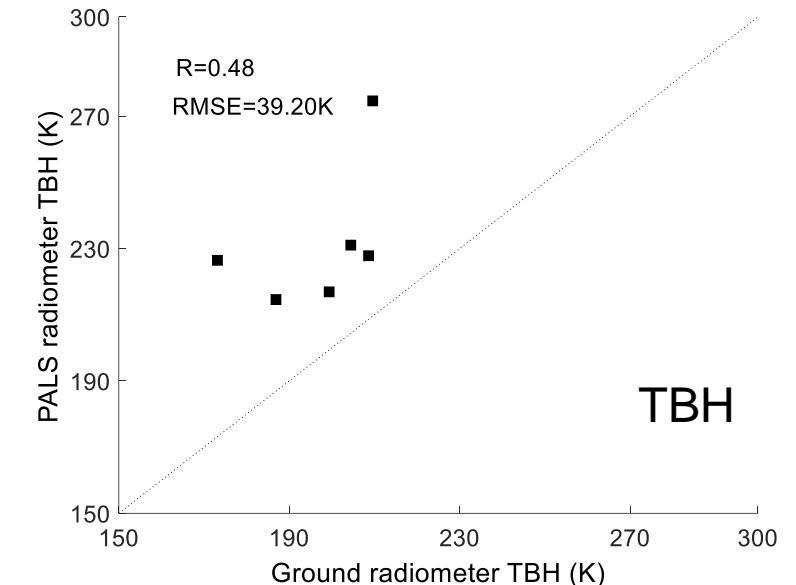
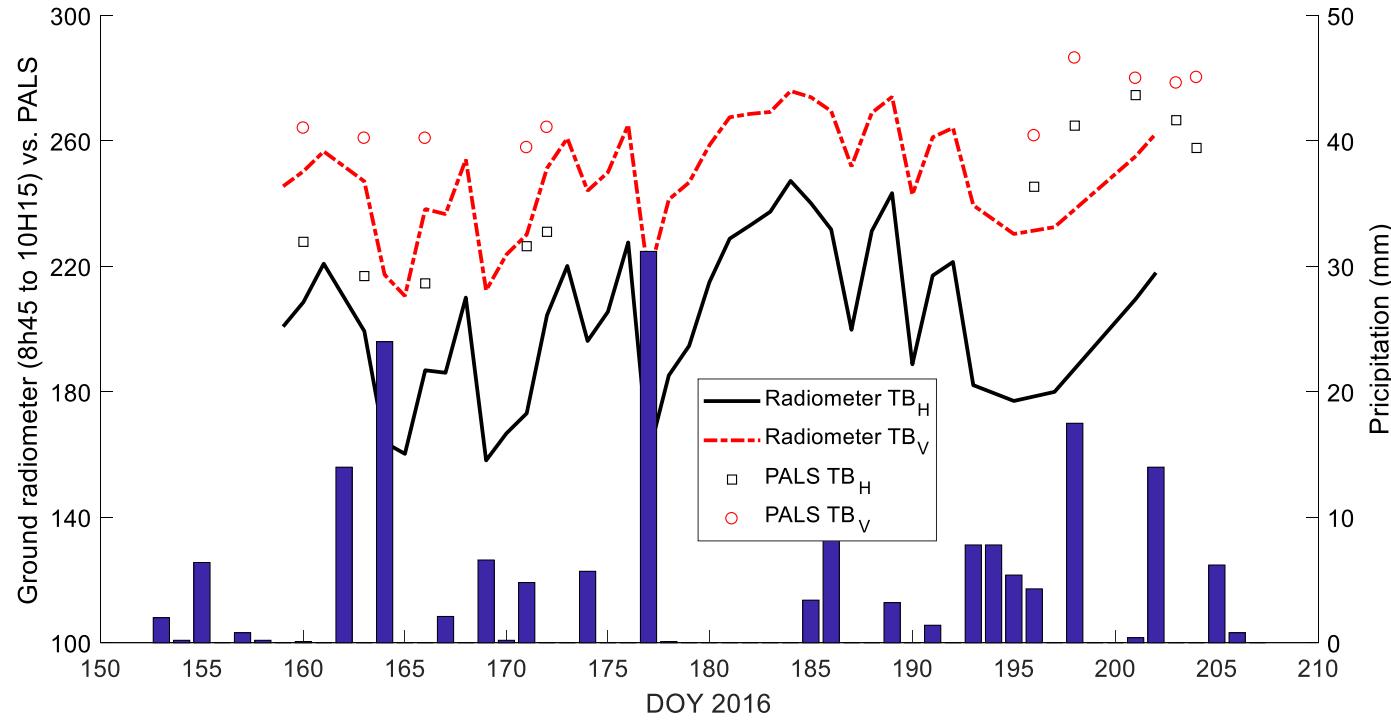
- Field #105: Wheat



TB of radiometer over wheat field → Higher than PALS

# Ground radiometer versus PALS (cont.)

- Field #202: Canola

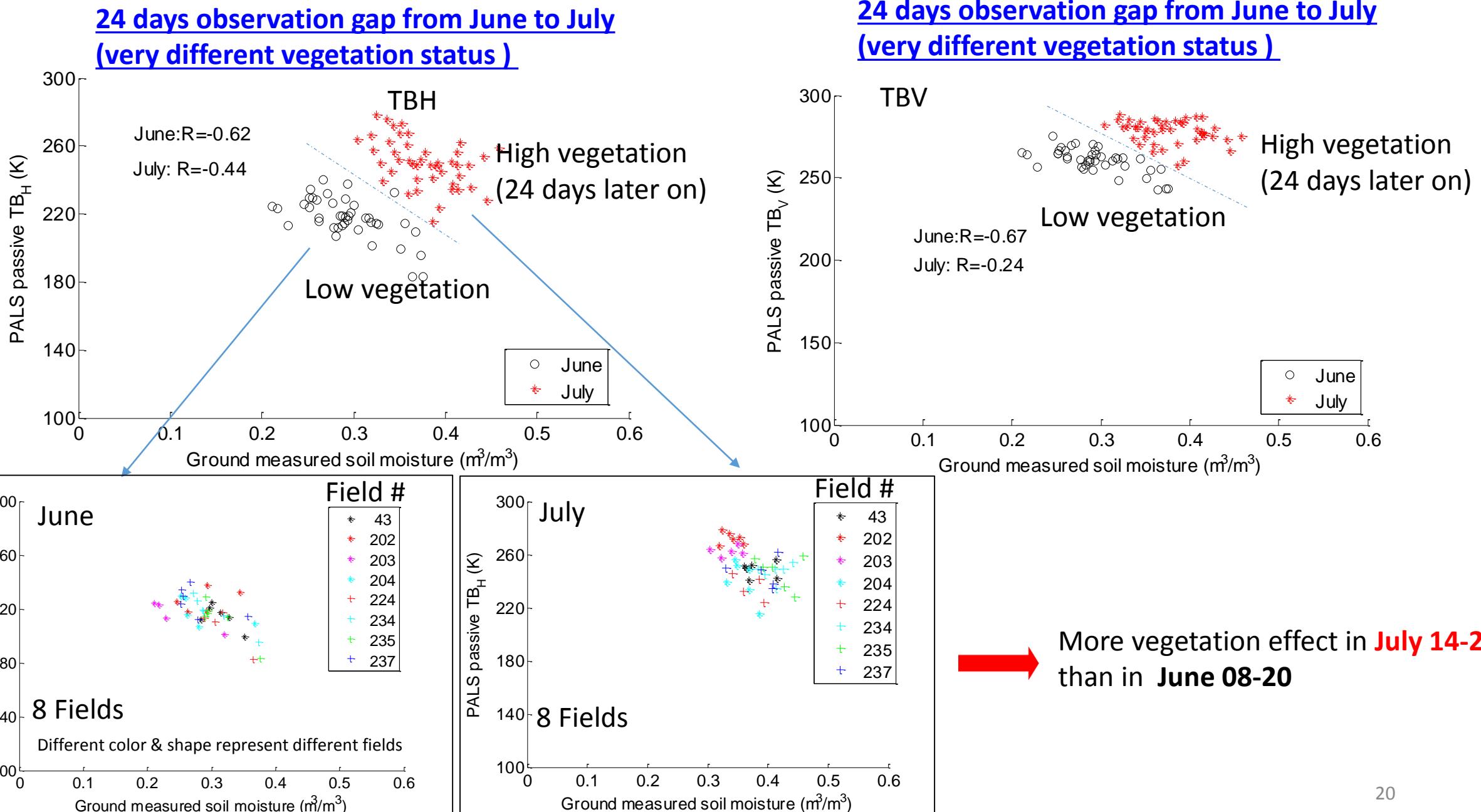


TB of radiometer over canola field → Lower than PALS

# Preliminary analyses

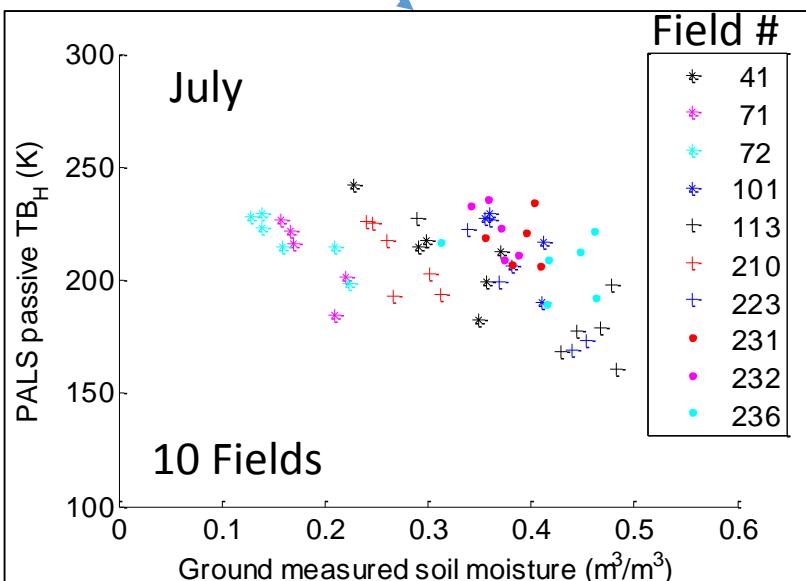
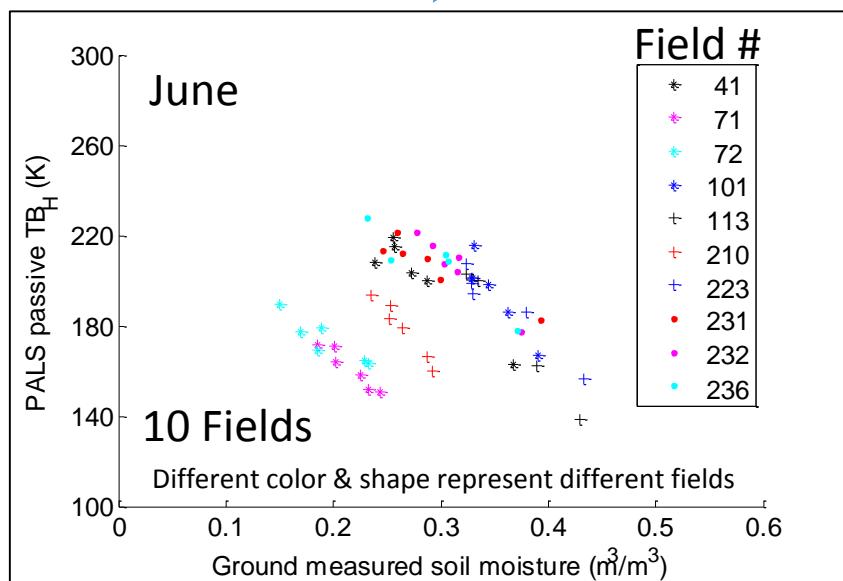
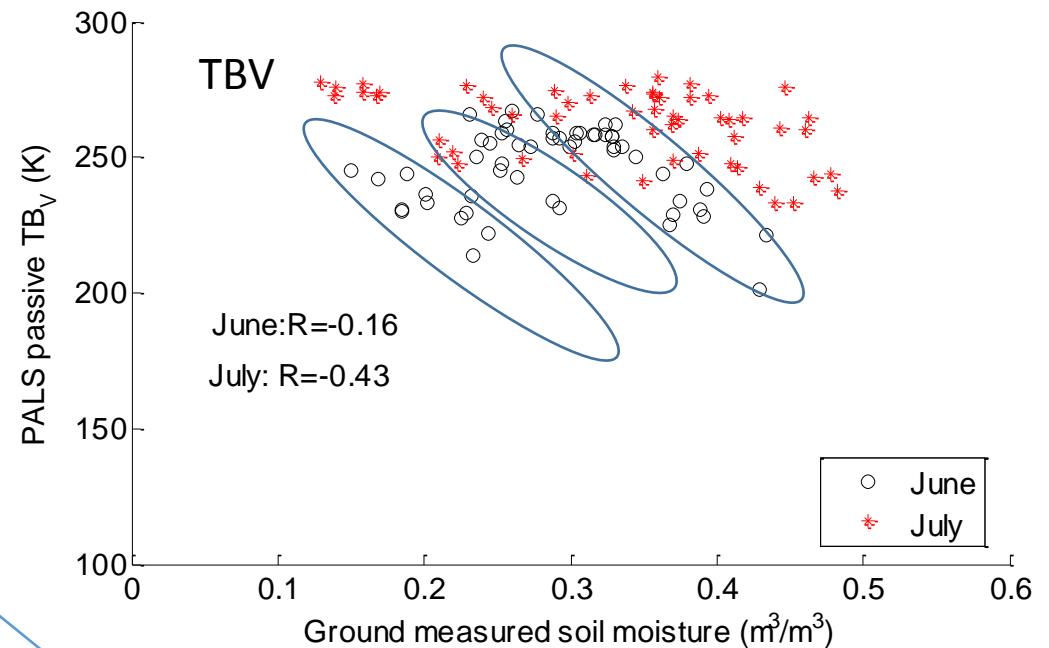
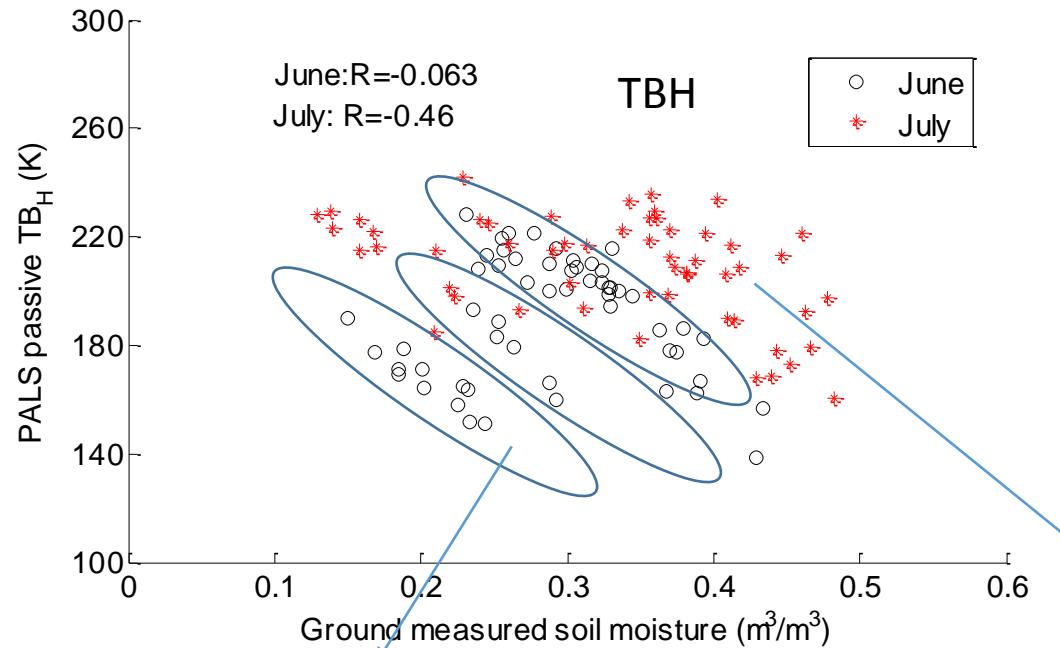
SMAPVEX 12 & 16-MB PALS TB (**Low altitude**) to soil moisture

## Sensitivity of SMAPVEX16 PALS passive signal to soil moisture



# Soybean

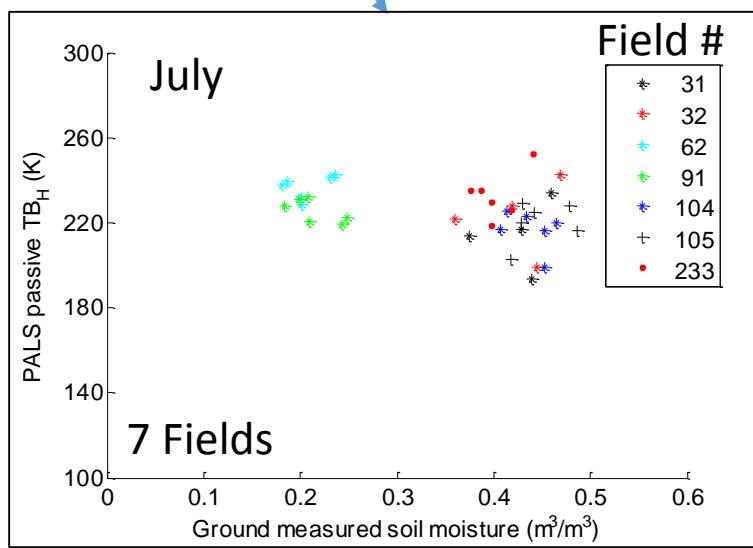
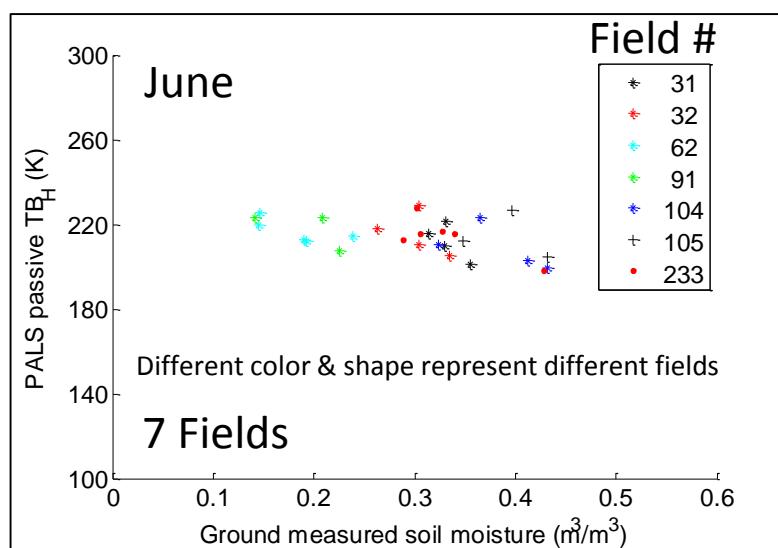
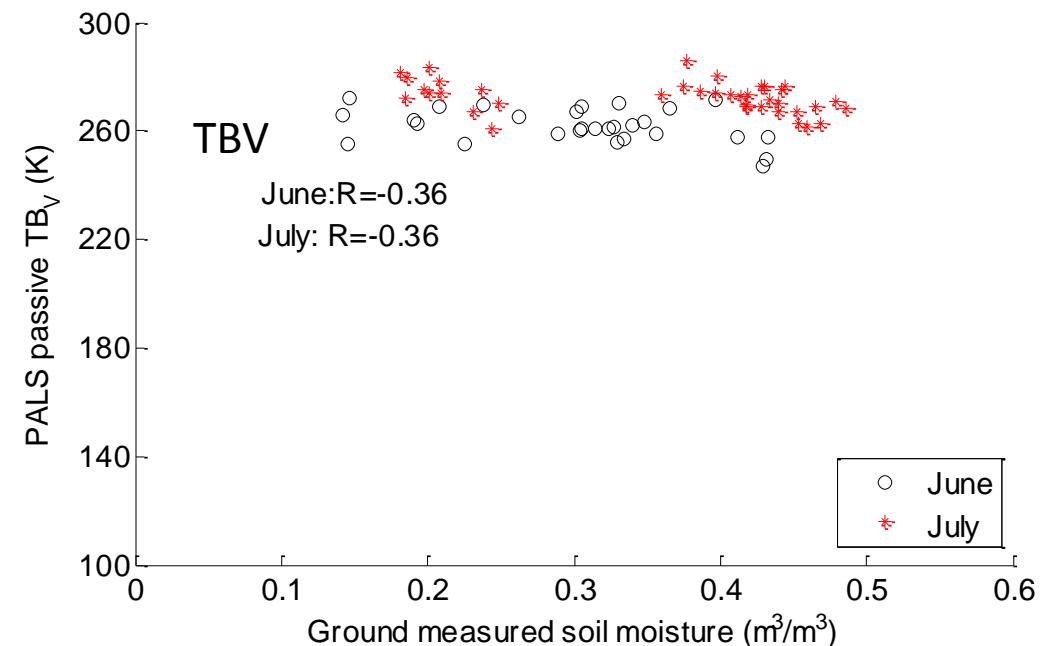
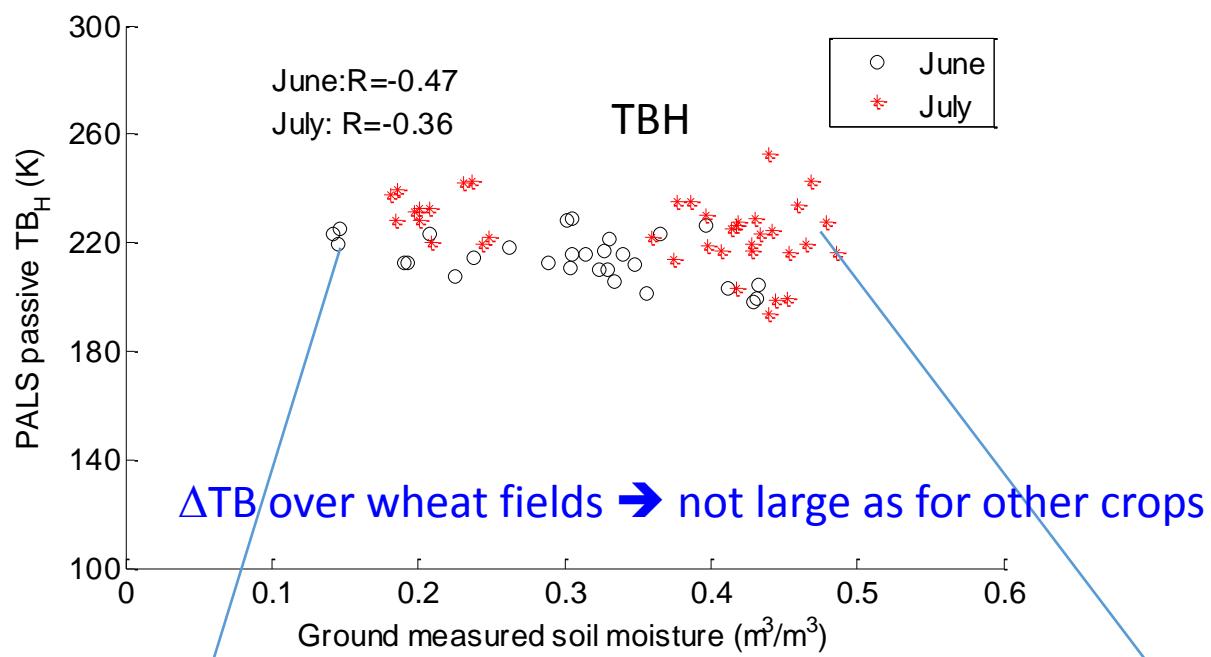
## Sensitivity of SMAPVEX16 PALS passive signal to soil moisture



Diversity in soil conditions  
particularly for soybean;  
For June and July, clusters  
of points.

# Wheat

## Sensitivity of SMAPVEX16 PALS passive signal to soil moisture



Less sensitivity to soil conditions

# Preliminary analyses

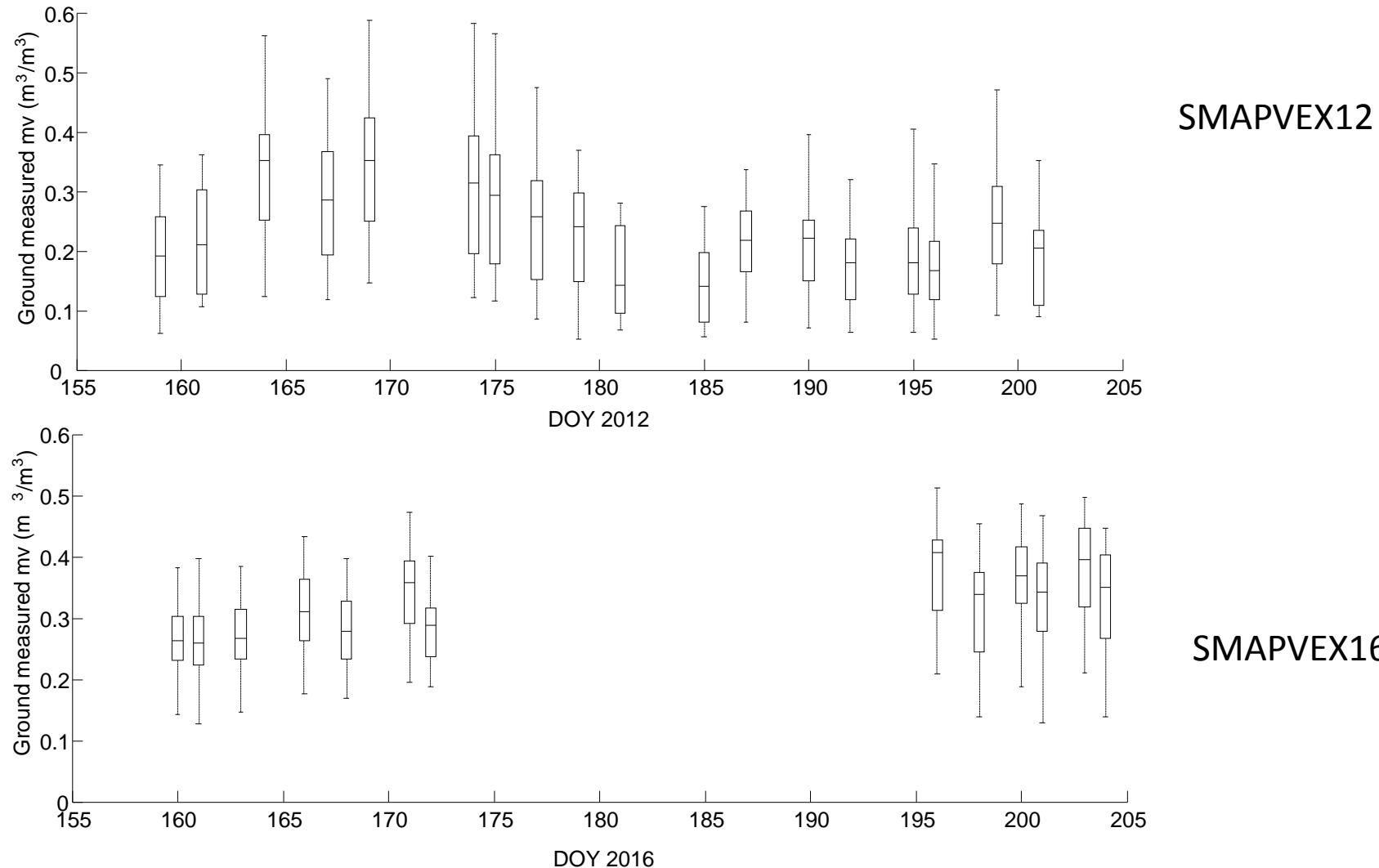
**SMAPVEX 12 & 16-MB PALS TB (**Low altitude**) to soil moisture**

→ **Objective : Understand the effects of soil and vegetation conditions  
on TB for soil moisture retrieval**

| Field campaigns                   | Data analyses  |
|-----------------------------------|--|
| <b>SMAPVEX16-MB</b>               | <b>L-band Radiometers :</b><br><b>Ground vs soil moisture</b><br><b>Ground vs low altitude PALS</b><br><b>Low altitude PALS vs soil moisture</b> |
| <b>SMAPVEX12 and SMAPVEX16-MB</b> | <b>Comparison of low altitude PALS</b><br><b>Modelling results</b>   |

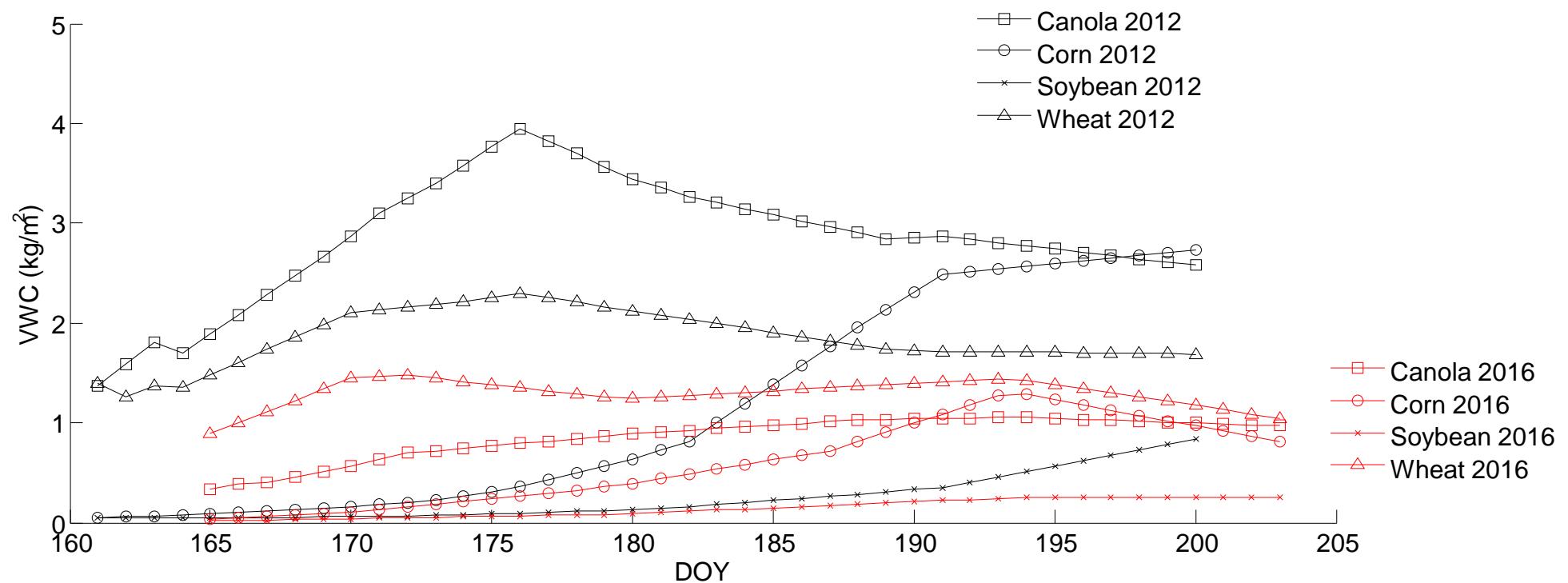
# Soil moisture conditions in 2012 and 2016

- Ground measurements *mv*



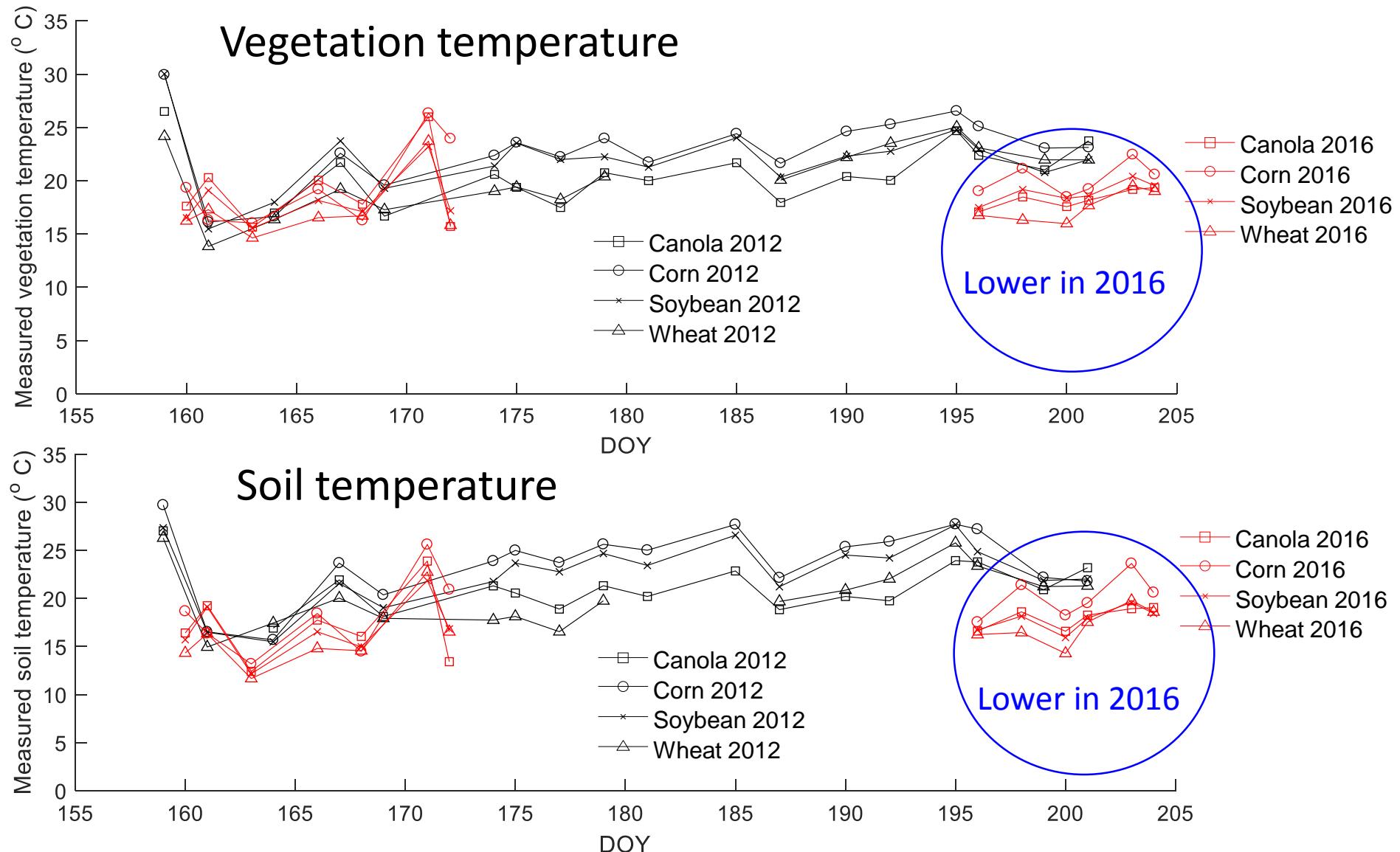
# Vegetation conditions in 2012 and 2016

- Ground measurements VWC



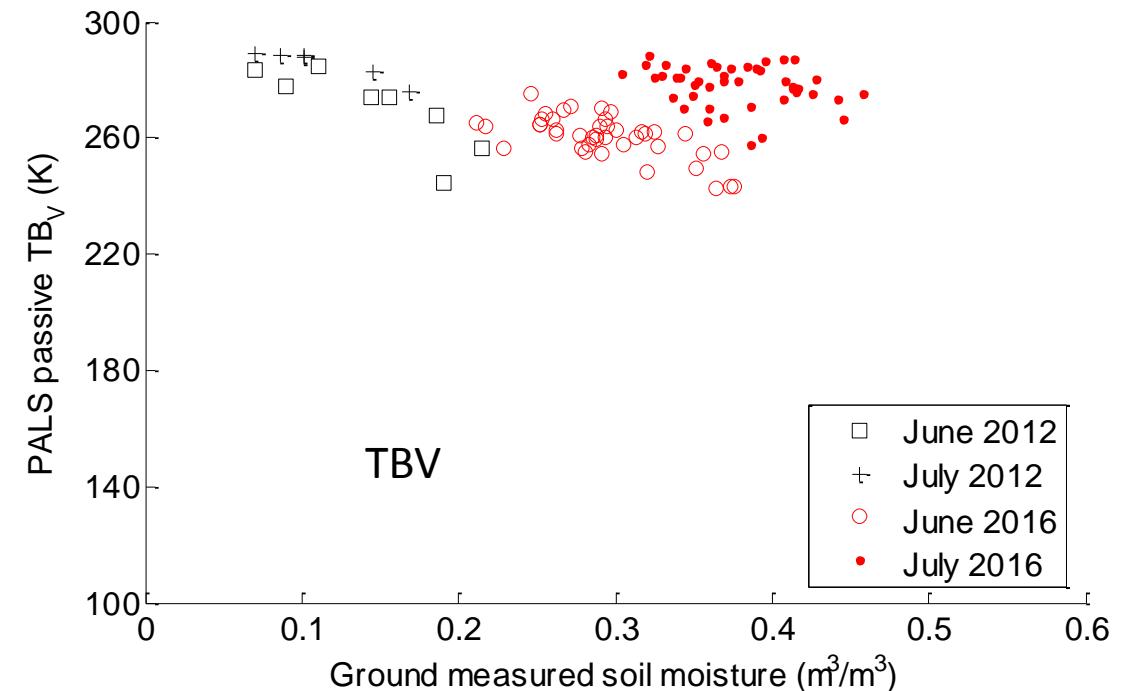
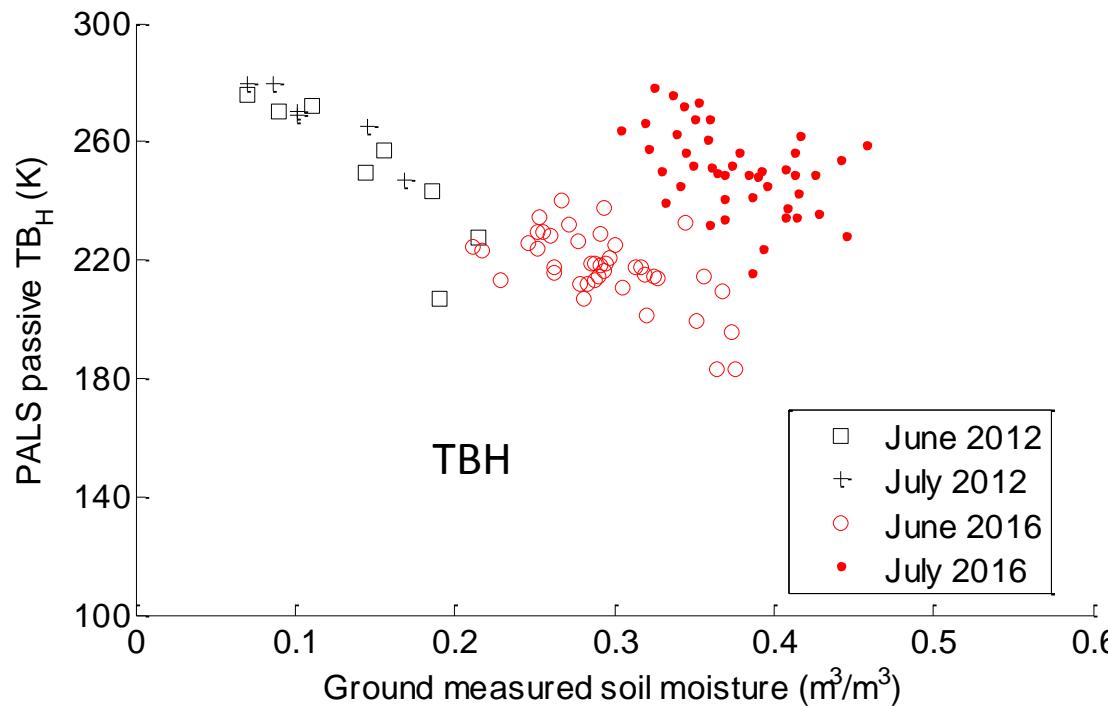
Lower VWC in SMAPVEX16-MB than SMAPVEX12

# Temperature conditions in 2012 and 2016



# Comparison between 2012 and 2016 PALS data

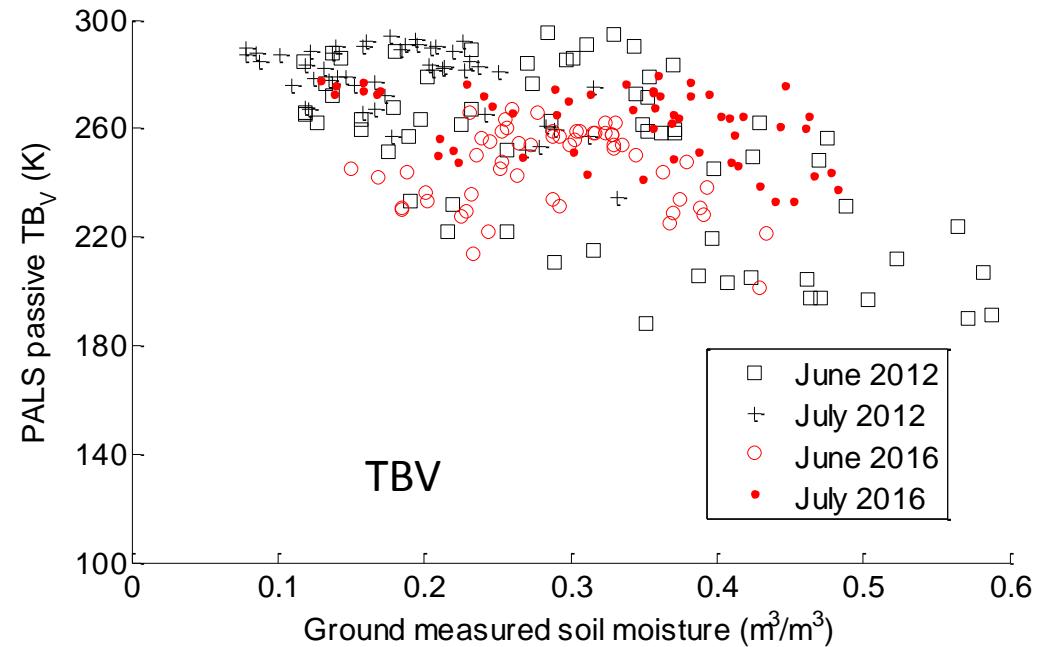
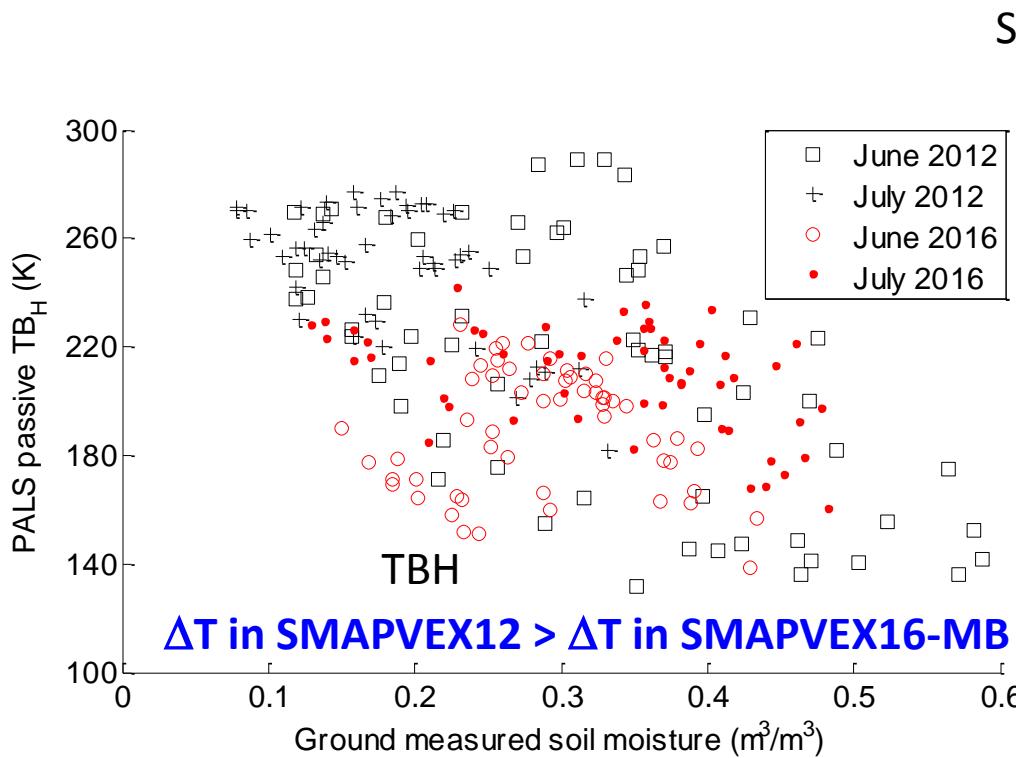
Canola



Low soil moisture during SMAPVEX12 → Low contrast between June and July 2012

High soil moisture during SMAPVEX16 → High contrast between June and July 2016

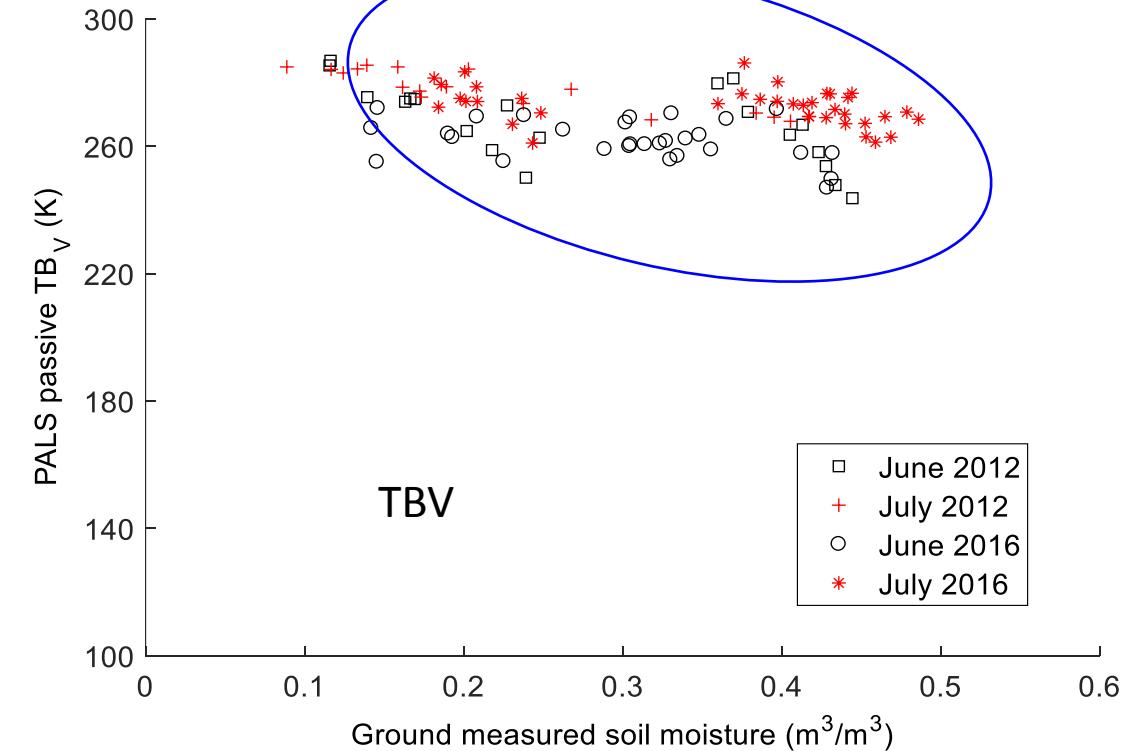
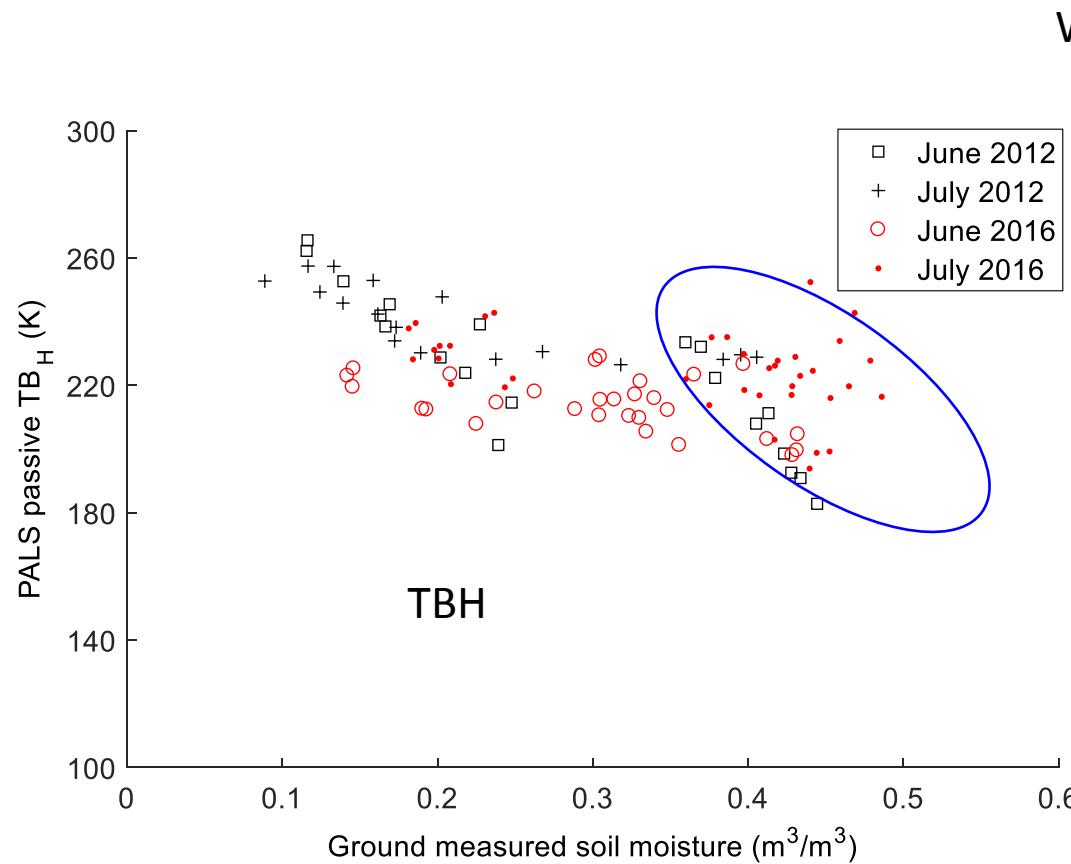
# Comparison between 2012 and 2016 PALS data



Lower VWC & Surface and vegetation temperature for all crops during SMAPVEX16-MB

→ TB in 2016 should be lower than TB 2012: not always observed

# Comparison between 2012 and 2016 PALS data



Lower VWC & Surface and vegetation temperature for all crops during SMAPVEX16-MB

→ TB in 2016 should be lower than TB 2012: not always observed

# Preliminary analyses of modelling results obtained with SMAPVEX12 and SMAPVEX16-MB data

$$TB_p = (1 - R_p) \gamma_p T_{soil} + (1 - \omega)(1 - \gamma_p) T_{vege} + (1 - \omega)(1 - \gamma_p) T_{vege} R_p \gamma_p$$

$$\gamma_p = e^{-\tau_p / \cos(\theta)} = e^{-b_p * VWC / \cos(\theta)}$$

Objective : Soil moisture mapping

- Use of SMAPVEX12 PALS data into L-MEB model to **estimate  $b_p$**  parameters (p is the polarization);
- Analyze the performance of  $b_p$  parameters with SMAPVEX16-MB PALS data;
- Develop the retrieval approaches (**not yet done**)

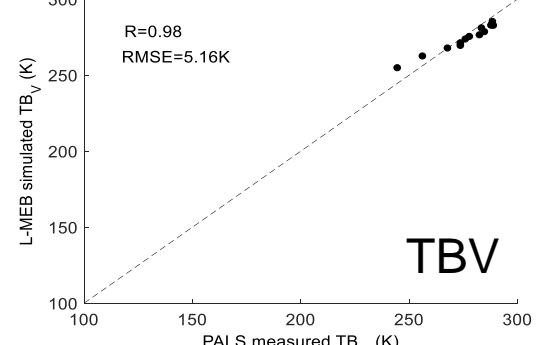
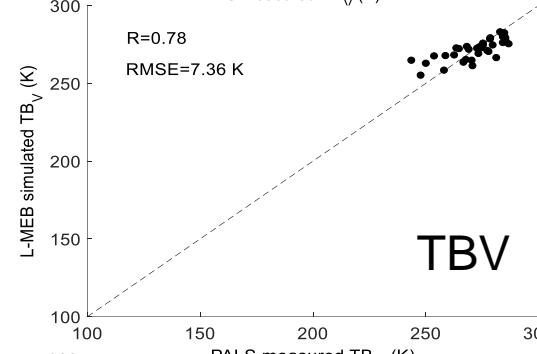
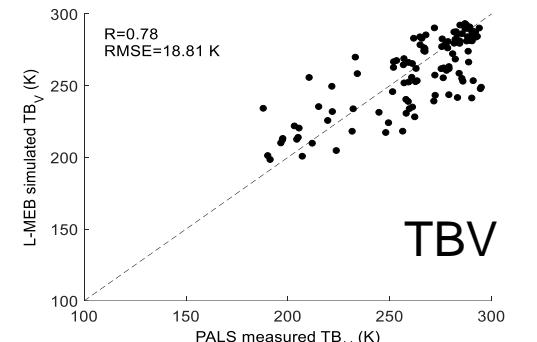
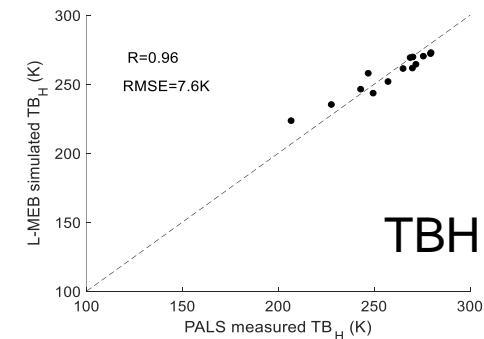
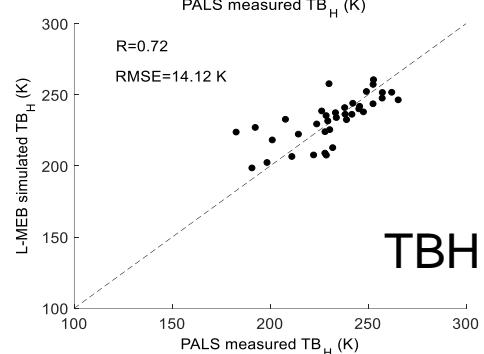
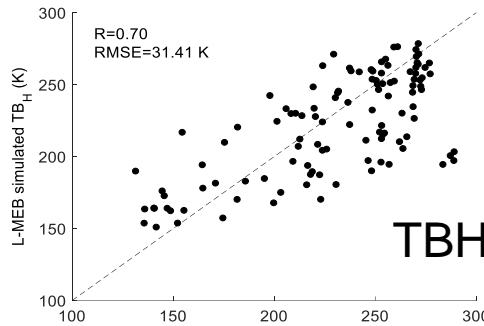
# Preliminary analyses of modelling results with SMAPVEX12 data (cont.)

- Optimal  $b$  parameters obtained from **low altitude** PALS TB in 2012

|       | Canola | Corn   | Wheat  | Soybean |
|-------|--------|--------|--------|---------|
| $b_h$ | 0.1548 | 0.1729 | 0.0953 | 0.2504  |
| $b_v$ | 0.1935 | 0.1574 | 0.2556 | 0.3280  |

# Preliminary analyses of modelling results with SMAPVEX12 data (cont.)

- Performance of optimization



Soybean (9 fields, 17 days)

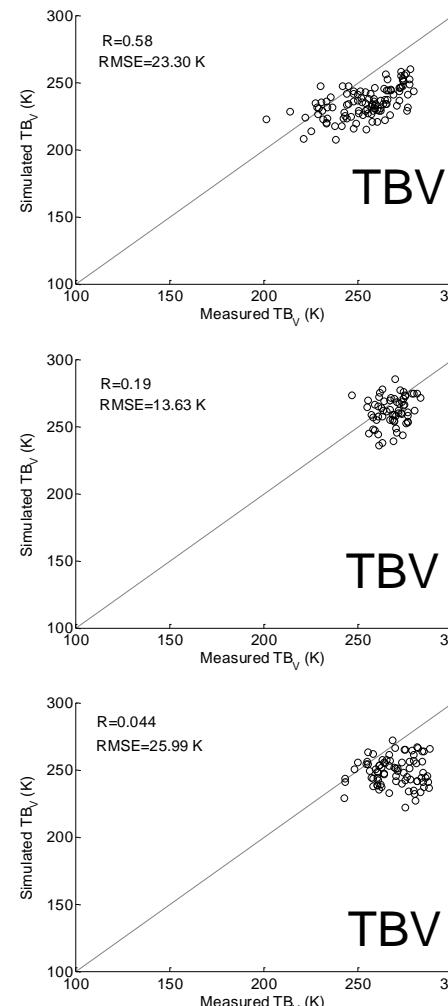
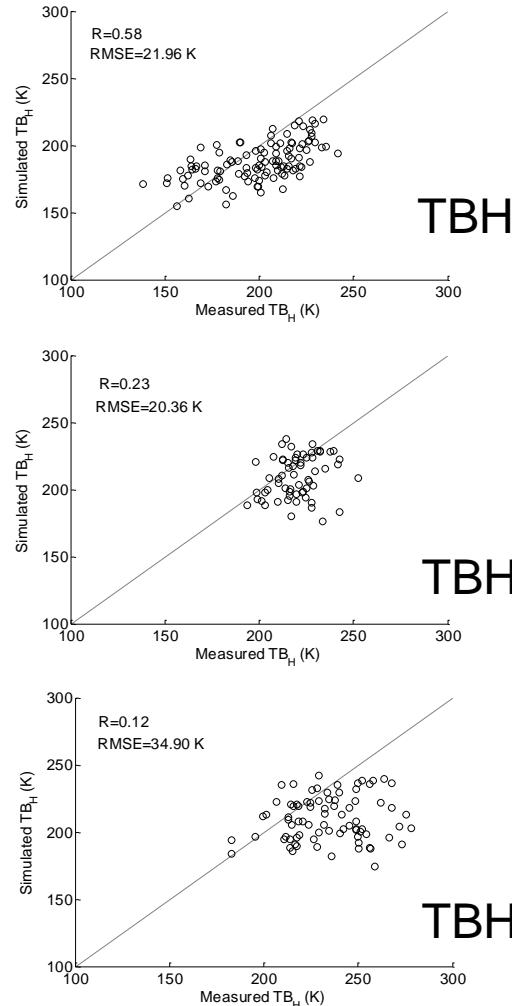
Wheat (4 fields , 17 days)

Canola (1 field , 17 days)

The *b* parameter of canola → based only one field

# Preliminary analyses of modelling results with SMAPVEX16-MB data (cont.)

- Performance of  $b$  parameter



Calibrated L-MEB underestimates PALS TB in 2016  
Roughness or vegetation water content or both??

# Perspectives

- Refine the data analysis and model calibration;
- Develop the retrieval algorithms of soil moisture;
- Soil moisture disaggregation with RADARSAT-2.

# Acknowledgments

Canadian Space Agency (CSA)

Natural Sciences and Engineering Research Council of Canada  
(NSERC)

Environment Canada (EC)

Agriculture and Agri-Food Canada (AAFC)

University (Sherbrooke, Manitoba, Guelph)

National Aeronautics and Space Administration (NASA)

United States Department of Agriculture (USDA)

Jet Propulsion Laboratory (JPL)

CSA-SOAR program

CESBIO, France

DLR Microwaves and Radar Institute, Germany