



# SMOS Long term Validation and Forest retrievals

Yann Kerr Paolo Ferrazzoli, Cristina Vittucci Mike Schwank And The SMOS team

SMAP Cal-Val Workshop #9 GMU-Fairfax 2018 10 23 YHK







qCalibration **q**Validation of SM **q**Validation of VOD **q**Validation for Forest **q**SNOW and forest **q**Concluding remarks

### First step: Calibration

**q**Comparison at TB level are conducted over various

surfaces of known temperatures

✓Galactic background✓Ice sheet (Antarctica)

- ✓Ocean bodies
- **q**Or other similar sensors
  - SMOS' view of the Galaxy ■ Based on near simultaneous, iso geometry
    - **Ø**Land
    - ØOcean

▼Ice core around Dome Concordia

✓Compared TBs are ToA, without reflexion foreign source corrections (gal, sun, moon)

**q**NB SMOS BT available in NRT since the beginning







# Level 1 validation



SMOS different from SMAP rely on colad (Deep sky) and hot target (noise source) Interferometer using 3 NIR no spill over, reflector characteristics, radome to account for

Close agreement between SMOS, SMAP and Aquarius Latest DomeX calibration also improves match (reprocessing is on-going)

See also Bindlish & Chan



# SMOS SM products to be validated

### **q** Standard products

▼Level 2

New version includes better L1 (GIBBS2, Sun corrections, galactic, ...)
 Implemented in V7 a organic soils, new forest parameterisation

▼Level 3

Bug identified and being corrected

▼L2 SM near real time

**Ø**New version implemented at ECMWF

**Ø** Used in assimilation Scheme

**q** Science products

✔ Root zone soil moisture

▼SMOS-IC

Same as L2 but without antenna pattern correction and main land use retrievals

**Ø** Trained on ISMN

SMAP Cal-Val Workshop #9 GMU-Fairfax 2018 10 23 YHK



## **Near Real Time SM**



- Training on SMOS Level 2 v620 SM
- Similar performances (slightly better indeed)
- Much faster ! Less than 3.5 hours after sensing Rodriguez-Fernandez et al. (2017, HESS)







# Validation scheme (1/3)



- **q** « Matchups » concept
  - ✓ Issues with continuity (9 years is long!)
  - ✓ approach (model based ) deficientà knowledge of the area)
  - ▼Limited results (UDB, VAS, ...)
- **q**Core sites
  - ✓Based on available reliable areas
    - **Ø**USDA watersheds
    - ØAustralian sites (AACES, J Walker)
    - Specifically designed sites (HOBE)
    - Science based sites (Berambadi (India) also used for 1 km products, Igarka (Russia), Davos (Switzeland), Sodankylä (Finland), St hilaire and SMOSRex (France), Poland, Tibet, ...)
  - ▼Not enough of them!







Watershed - LittleWashita - Ascending orbits

#### △ Stats: Series minus Insitu - Intersected Valid Retrievals

Series	ρ	μ	σ	RMSE	#kept	#total
620	0.86	-0.000	0.031	0.031	182	205
721	0.86	-0.004	0.034	0.034	182	187

Series	<sup>µ</sup> Series	<sup>µ</sup> Insitu	$\sigma_{\rm Series}$	σ <sub>Insitu</sub>
620	0.142	0.143	0.061	0.053
721	0.138	0.143	0.066	0.053





Soil moisture & temperature network, 30 stations: since Jan 2010 Decagon 5TE sensors at 0-5, 20-25 and 50-55cm depth + organic layer



Funder Kirkeby

Vrad:

Ch

800 mm

Them'

Gra

Klovboł

Terring

Vindelev

10 km

olidved

153

Bording

Kirkeby

Gludsted

411

Lindah

.137 Mallebiero Hampen

loamy

IKAS

Isenvad



SMAP Cal-Val Workshop #9 GMU-Fairfax 2018 10 23 YHK

S. Bircher

### Sub-kilometric soil moisture (SMOS+S1 -500m)



SMAP Cal-Val Workshop #9 GMU-Fairfax 2018 10 23 YHK



### Validation of MAPSM: SMOS+S1

















Legend

対 Station



Al Bitar, Tome



### Active/Passive Remote Sensing of Snow SNF-Proposal "APRESS"

#### Applicant:

Mike Schwank, WSL-Birmensdorf

#### **Partners:**

Martin Schneebeli, SLF-Davos Andreas Wiesmann, GAMMA Juha Lemmetyinen, FMI

#### **Emploee:**

Reza Naderpour

#### **APRESS Goals:**

Methodical research to advance synergistic use of Multi-Frequency Active & Passive (M-F A&P) microwave data. Improve / develop retrieval approaches for estimation of state parameters over the Earth's cryosphere.



#### **Requested Funding:**

300 kCHF » 273 k€

#### **Decision Date:**

1st October 2018

#### Duration:

» 2 years: 1<sup>st</sup> April 2019 – 31 March 2021

#### **Two Winter-Campaigns:**

2019/20: Davos & 2020/21: Sodankylä

#### Microwave Sensors:

Passive: L- and X-band (ELBARA, MORA)

Active: L- to Ka-band (WBScat)



WBScat (SAR, L – Ka-band Scatterometer) developed by GAMMA under ESA-contract with WSL-contribution for L-band part. Test in Davos during winter 2018/19











Soil properties (temperature; permittivity; moisture; frost depth)

Snow properties (depth; Snow Water Equivalent; temperature)



### **ICOS tower**

- 24 m high platform overlooking scots pine forest
- Setup following ICOS (Integrated Carbon Observation System) standards
  - CO2 flux; CO2, CH4 background concentration
  - meteorological measurements, surface measurements
- RS equipment:
  - Elbara II (1.4 GHz)
  - High frequency dual pol radiometers (10.65, 18.7, 21, 37 GHz)
  - Fully polarimetric radar (1-10 GHz)
  - Hyperspectral camera (500-900 nm)
  - Webcams
  - Additional Elbara II at ground level (upward-looking canopy transmissivity)
- Supporting in situ instrumentation:
  - Soil moisture and temperature profile
  - Sap flow (dendrometers)
  - Vegetation temperature
  - Vegetation permittivity
  - Snow depth, SWE, temperature
  - Frost tubes
- Situation September 2018
  - RS equipment installed in tower; start of measurements October 2018
  - second ground-level Elbara-II: installation October 2018
  - ICOS installation completed
  - Supporting in situ instrumentation: completion in October 2018









### **q**Sparse networks

- **v**Pros
  - ØEasily accessible
  - Somewhat normalised , QC etc... (ISMN)
- ✓Main caveats
  - not representative of all biomes (Tropical, Boreal,...)
    Often used for tuning / parameter fitting
    Not necessarily representative of the pixel

### qModels

- ▼Global but not necessarily valid everywhere
- ✓Can be severly biased
- ▼But scale similar to taht of satellite data

# Models and "proxy" sensors give erroneous estimates 🏈

A. Mialon



Very important region:

- Hotspot (land feedback to atmosphere, Koster et al., Seneviratne et al.)
- Very little in situ data to constrain weather models -> Remote sensing



# Validation scheme (3/3)



- **q** Satellite data
  - ▼See next talk
  - ▼To be noted

ØApproach more important than Sensor when all are good

### **q**Field campaigns

- ✓Not very conclusive in Europe
- ▼For validation or for science?
- ▼SMAP VEX

### Little washita = temperate - flat

CESBIO







5-year time period (1 June 2010 ->31 May 2015)







J. Quets, G. De Lannoy et al., 2017

(2) Intercomparison over the core SMAP cal / val sites



-SMOS IC V1









- **q**With multi angular views SMOS delivers SM + VOD **q**Varies with time
  - ₩AGB
  - VWC
- **q**Has not yet unravelled all its potential
  - ▼First analysis very early (Ferrazzoli, Rahmoune, Vittucci)
  - ✓Comparison with AGB
- **q** Main issue is with Validation!
  - vHow
  - ✓What with
  - **V**...







### **q**Short summary of CalVal 2017 presentation

**q**New results

By Ferrazzoli and Vittucci Tor vergata University

SMAP Cal-Val Workshop #9 GMU-Fairfax 2018 10 23 YHK



### Requirements for spaceborne missions, including SMOS

- Spaceborne missions are finalized to retrieve physical parameters, particularly soil moisture at L band.
- Retrieval algorithms are based on forward models and retrieval techniques
- 1st order Radiative Transfer (RT) model is used for soil covered by vegetation
- There is need to relate RT parameters to variables available at large scale.
- We selected Leaf Area Index (LAI).





### Preliminary fitting of RT parameters for forests

A discrete model was run. Model outputs were used to fit the albedo and the optical depth of an "equivalent" 1st order RT model.

Steps

- A soil roughness hstd (1.5 cm) was selected
- The roughness factor h of the simple model was set by imposing the surface emissivity of the simple model to be equal to the surface emissivity of the physical model
- The physical model was run at both polarizations, an angular range 5°-55° and a SMC range 5%-30%
- The simple model was run for the same conditions
- $\omega$  and  $\tau$  were selected in order to have the minimum rms difference between outputs of the two models.

### in full leaf development Emissivity as a function of SMC at L band

- With litter

---- Without litter







RT-0 inputs for soil: SM (first guess), h RT-0 inputs for vegetation:  $\tau$  (first guess),  $\omega$ 

h = 0.3 (fixed) SM by ECMWF

 $\tau$  (first guess) and  $\omega$  are obtained using the already indicated procedure.





Important outcomes from preliminary modeling work (confirmed by real spaceborne signatures):

- The most important effects depend on branches;
- Seasonal variations are small;
- Maximum LAI is an important parameters, at least at continental scale;
- Reasonable estimate of optical depth, at least for broadleaf forests.





However, problems were found:

- The procedure suffers several approximations, since the complexity of the forest cannot be represented by the single LAI max parameter (particularly for needleleaf forests);
- LAI is also contributed by understorey;
- At large scale inhomogeneity effects must be considered;
- Litter effects are difficult to be predicted, and strongly depend on climate;
- Most of experiments and model tests were limited to Boreal regions of Europe and US.

Overall, after some years of spaceborne data availability:

- Coefficients relating VOD to LAImax were reduced (by a 0.6-0.8 factor)
- The most appropriate albedo was 0.06.

### <u>ecein</u>

**Results obtained by SMOS L2 algorithm, 650 version** SMOS LVOD map (2015 average, LVOD>0.3 threshold)



SMOS



Previous works monitored forest evolution using long term AMSR C-band VOD (CVOD), but CVOD saturates earlier than LVOD.



SMOS LVOD (2015 average) vs forest height

AMSR2 CVOD (2015 average) vs forest height

# Comparisons with Climatological Research Unit (CRU)

The Climate Research Unit data set is gridded to 0.5x0.5 degree resolution, based on analysis of over 4000 individual weather station records.







For areas with average vegetation height > 5m (from ICESAT lidar estimates) we have generated:

- Maps of correlation coefficients of retrieved SM vs rainfall R (monthly averages);
- Multitemporal trends of rainfall, temperature, retrieved SM, retrieved VOD for selected pixels.

Time interval: 2013-2016.





#### SM vs R correlation coeff.





SM vs R correlation is kept up to LVOD ~ 0.7 Negative correlation along Ituri river (Congo)



1.2

0.96

0.72

0.24

12

SMAP Cal-Val Workshop #9 GMU-Fairfax 2018 10 23 YHK









SM vs R correlation is kept up to LVOD ~ 0.7; Complex behaviors for higher LVOD.

SMAP Cal-Val Workshop #9 GMU-Fairfax 2018 10 23 YHK

SM vs R correlation coeff.



SMAP Cal-Val Workshop #9 GMU-Fairfax 2018 10 23 YHK



SM vs R correlation is kept up to LVOD ~ 0.7; High correlations in several northern areas.







SM is mostly driven by melting/drying processes. Retrieval fails in cold months.







**SMAP** Meeting

### RESEARCH ON L-BAND RADIOMETRY APPLIED TO A) SNOW B) FOREST

M. Schwank, R. Naderpour, Ch. Mätzler, J. Lemmetyinen, K. Rautiainen



GAMMA REMOTE SENSING



### A) SNOW: Background

### Dry Snow is largely transparent at L-band, but impacts brightness temperature via refraction and impedance matching!

X

Theoretically and experimentally proved.





L-band  $T_{\rm B}$  contains information on snow properties (e.g. density and liquid water). Development of retrieval approaches to estimate snow properties from L-band  $T_{\rm B}$ .

L-band Specific Emission Model	Snow density & Ground permittivity ( $\rho_{S}, \varepsilon_{G}$ ) retrieval algorithm	$( ho_{ m S},  ho_{ m G})$ based on close-range measurements.	<ul> <li>(ρ<sub>S</sub>, ε<sub>G</sub>)-sensitivities to "Geophysical Noise".</li> <li>Winter campaign at Davos, Switzerland.</li> </ul>	<ul> <li>(ρ<sub>S</sub>, ε<sub>G</sub>)-sensitivities to "Melting Effects".</li> <li>Snow Liquid Water Retrieval</li> </ul>
2014	2015	2016	2017	2018

#### A) SNOW: L-Band Specific Microwave Emission Model of Layered Snowpacks (LS-MEMLS)

- **§** Layers in MEMLS characterized with: transmissivity  $t_i$ reflectivity  $r_i$ temperature  $T_i$ interface reflectivity  $s_i^p$
- **§** Vertical fluxes (incoherent) linked via boundary conditions at layer interfaces, and via Kirchhoff's law.
- § Multiple reflections
- **§ Volume scattering** (considered in *r<sub>i</sub>*)
- **§** LS-MEMLS developed as part of MEMLS & L-MEB
- § No volume scattering at Lband  $(r_{s} = 0)$
- **§** 1-layer LS-MEMLS is simple enough for use in a retrieval algorithm (via minimizing **Cost Function**).

$$CF(\boldsymbol{r}_{\mathrm{S}},\boldsymbol{e}_{\mathrm{G}}) \circ \overset{\circ}{\mathbf{a}}_{q,p} \frac{\left(T_{\mathrm{B}}^{p}(\boldsymbol{q}) - T_{\mathrm{B,sim.}}^{p}(\boldsymbol{q},\boldsymbol{r}_{\mathrm{S}},\boldsymbol{e}_{\mathrm{G}})\right)^{2}}{\left(\mathsf{D}T_{\mathrm{B,RMA}} + \mathsf{D}T_{\mathrm{B,RFI}}^{p}(\boldsymbol{q})\right)^{2}}$$



Ç.

#### A) SNOW: Snow Density & Ground Permittivity ( $r_s, e_G$ ) retrieved from tower-based $T_B^p(q)$ :

- Tower-based  $T_B^p(q)$  for  $q = 35^\circ$ ,  $40^\circ$ ,..., $60^\circ$  and p = H, V used to retrieve ( $e_G$ ,  $r_S$ )
- UNFILTERED retrievals ( $e_G$ ,  $r_S$ ) are shown.
- Retrieved  $r_{\rm S}$  is expected to be representative of the lowest 10cm of the snowpack
- Ground was frozen during "snow-free" period.
- Snow was dry during "cold winter" period.

Increased  $r_{\rm S}$ -retrievals « detection of onset of dry snow cover with the beginning of the "cold winter" period.



#### A) SNOW: Snow Density & Ground Permittivity ( $r_s, e_G$ ) retrieved from tower-based $T_B^p(q)$ :

Reliable retrievals ( $e_{G}$ ,  $r_{S}$ ) are expected to be UNCORRELATED.

- ▷ Retrieval pairs ( $e_G$ ,  $r_S$ ) with low correlation  $R^2 < 0.1$  between  $e_G$  and  $r_S$  are expected to be more "reliable" than highly correlated ( $e_G$ ,  $r_S$ ).
- ▷ Condition  $R^2 < 0.1$  (computed from 12 hour sliding windows) is used as quality-flag for identification of "reliable" retrieval pairs ( $e_G$ ,  $r_S$ ).
- With the beginning of the "early spring" period, the number of "reliable" retrievals ( $R^2 < 0.1$ ) is reduced significantly.
- Quality-flag  $R^2 > 0.1$  detects unrealistic daily variations.
- Large deviations between retrievals  $\varepsilon_G^{RM}$  and in-situ  $\varepsilon_G$  during "early spring" period are detected.



A) SNOW: Snow Density & Ground Permittivity ( $r_{s}, e_{G}$ ) retrieved from tower-based  $T_{B}^{p}(q)$ :

Histograms of correlations  $R^2$  between retrievals  $e_G$  and  $r_S$  derived from morning (left) and afternoon measurements  $T_B{}^p(q)$ .

- more low-correlated retrievals during mornings than during afternoons.
- more reliable retrievals during morning than during afternoons resulting from moist snow during afternoons & re-freezing over night.
- Theoretical study (not shown) confirms that liquid water in snow leads to increased  $R^2$  between retrievals.



A) SNOW: Snow Density & Ground Permittivity ( $r_s, e_G$ ) retrieved from SMOS L3  $T_B^p(q)$ :

- Demonstration retrievals ( $r_s$ ,  $e_G$ ) based on weekly averaged SMOS L3  $T_B^p(q)$  at  $q = 30^\circ 60^\circ$ , p = H & V
- Reasonable patterns but validation is still outstanding.



A) SNOW: Snow liquid-water column  $WC_S$  retrieved from tower-based  $T_B^p(q)$ :

**Snowpack liquid-water column**  $WC_{\rm S}$  (mm):  $WC_{\rm S} = \int_0^{h_{\rm S}} W_{\rm S}(z) \cdot dz$ 

- Synchronicity between *T*<sub>air</sub> raising above 0°C and *WC*<sub>S</sub> & *WC*<sub>S</sub>.
- Synchronicity between reference  $WC_S$  retrieved from  $T_{B,R}{}^p$  over areas with reflector placed beneath snow and  $WC_S$  retrieved from  $T_{B,N}{}^p$  over natural snow-covered areas.
- Diurnal afternoon-peaks in WC<sub>S</sub> are slightly shifted in time compared with T<sub>air</sub>.
   Û latent-heat of snow
- "rain on snow event" clearly detected (18 Feb. 2017)
- Evidence that  $WC_{\rm S}$  can be estimated from L-band  $T_{\rm B}$  over natural snow-covered grounds.



### A) SNOW: Snow liquid-water retrieved from SMOS $T_B^p(q)$ over Greenland:

XPGR derived from SSMIS  $T_{\rm B}$ 's



 $XPGR = \frac{T_{B}(19H) - T_{B}(37V)}{T_{B}(19H) + T_{B}(37V)}$ 

- Only sensitive to upper few cm of snowpack
- Very much empirical (unphysical) retrieval approach

### **Snow-Melt detection based on SMOS** $T_B^p(q)$ :

- Greater sensitive depth
   volume information rather than just surface information
- EM (LS-MEMLS) implemented for ablation zone only (Clear snow/ice interface)





- L-band Specific Microwave Emission of Layered Snowpack (LS-MEMLS).
   a) dry snow impacts L-band T<sub>B</sub><sup>p</sup> although it is transparent at L-band.
   b) (e<sub>G</sub>, r<sub>S</sub>) retrieval scheme uses single-layer LS-MEMLS and assumes snow as dry.
- 2. Demonstration of (e<sub>G</sub>, r<sub>S</sub>) retrievals based on tower-based measurements T<sub>B</sub><sup>p</sup>(q).
  a) reasonable agreement with in-situ data
  b) demonstrated R<sup>2</sup>(r<sub>S</sub><sup>"V"</sup>, e<sub>G</sub><sup>"V"</sup>) based quality-flags
- 3. Retrievals ( $e_G$ ,  $r_S$ ) become correlated for moist snow conditions. a) Respective coefficient of determination  $R^2 < 0.1$  is used as flag to identify "reliable" retrieval pairs ( $e_G$ ,  $r_S$ ).
- 4. Demonstration maps of retrievals (*e*<sub>G</sub>, *r*<sub>S</sub>) based on SMOS data have been produced.
  a) Validation of retrievals (*e*<sub>G</sub>, *r*<sub>S</sub>) based on satellite data is still outstanding.
  b) Use of density retrievals to improve SWE estimates?
- 5. L-band  $T_B{}^p$  contain volume information on liquid-water of seasonal snowpacks. a) demonstrated based on tower-based measurements of  $T_B{}^p$ .
  - b) demonstrated based on SMOS measurements (over Greenland).

### SMOS 2S study goals (2013 + 1 year):

Potential of updating current SMOS L2 SM processor with Two-Stream (2S) Emission Model (EM) as a replacement of the Tau-Omega (TO) EM.

### 2S EM has certain advantages over TO EM:

- a) Consideration of multiple reflections & multiple scattering (relevant for dense vegetation, e.g. forests).
- b) Wider applicability range (e.g. "soft-layer" assumption not necessary. Suited for vegetated ground (incl. forest) and snow (unification of retrieval algorithms using a consistent EM is a conceptual advantage of implementing 2S EM as a replacement for TO EM).
- c) 2S EM includes TO EM for sparse vegetation.
- d) Formulation of the single layer 2S EM is as simple as TO EM (2S EM is as suitable as TO EM for implementation in a retrieval algorithm)

### Resumed in 2017 –

 Paper submitted to MDPI Remote Sensing: "Tau-Omega"- and Two-Stream Emission Models used for Passive L-band Retrievals: Application to Close-Range Measurements over a Forest. The next slides provide a summary.



#### **B)** FOREST: 2S EM ® TO EM : Formulation of TO EM and 2S EM

$$T_{B,EM}^{p,\theta} = T_{s} \cdot e_{s,EM}^{p,\theta} + T_{v} \cdot e_{v,EM}^{p,\theta} + T_{sky} \cdot e_{sky}^{p,\theta}$$

$$T_{B,TO}^{p,\theta} = f(\tau_{TO}, \omega_{TO}, WC_{TO})$$

$$e_{s,TO}^{p,\theta} = t_{TO}^{\theta} (1 - s_{s}^{p,\theta})$$

$$e_{v,TO}^{p,\theta} = (1 - \omega_{TO})(1 - t_{TO}^{\theta})(1 + s_{s}^{p,\theta} t_{TO}^{\theta})$$

$$e_{sky,TO}^{p,\theta} = 0$$

$$t_{TO}^{\theta} = \exp(-\tau_{TO}/\cos\theta)$$

vegetation

soil

- Scattering considered as a loss mechanism only.
- **b** underestimation of emitted radiation.
- Neglect of multiple reflections between vegetation and soil.
- Inconsistent with Kirchhoff's law.

$$\begin{aligned} & \mathcal{P}_{\text{sky,EM}}^{p,\theta} \quad \text{Kirchhoff formulation for EM} = \{\text{TO}, 2S\} \\ & \mathcal{P}_{\text{B,2S}}^{p,\theta} = f(\tau_{2\text{S}}, \omega_{2\text{S}}, WC_{2\text{S}}) \\ & e_{\text{s,2S}}^{p,\theta} = t_{\text{V}}^{\theta} \left(1 - s_{\text{s}}^{p,\theta}\right) / \left(1 - s_{\text{s}}^{p,\theta} r_{\text{V}}^{\theta}\right) \\ & e_{\text{v,2S}}^{p,\theta} \\ & e_{\text{v,2S}}^{p,\theta} \left(1 - r_{\theta}^{\theta}\right) \left(\theta - e_{\text{s,2S}}^{p,\theta}\right) r_{\theta}^{\theta} + s_{\text{s}}^{p,\theta} t_{\text{V}}^{\theta}\right) / \left(1 - s_{\text{s}}^{p,\theta} r_{\text{V}}^{\theta}\right) \\ & e_{\text{sky,2S}}^{p,\theta} \left(1 - r_{\theta}^{\theta}\right) \left(\theta - e_{\text{s,2S}}^{p,\theta}\right) r_{\theta}^{\theta} + s_{\text{s}}^{p,\theta} t_{\text{V}}^{\theta}\right) / \left(1 - s_{\text{s}}^{p,\theta} r_{\text{V}}^{\theta}\right) \\ & = \frac{2 \cdot \exp\left(\tau_{2\text{s}}\sqrt{1 - \omega_{2\text{s}}^{2}}/\cos\theta\right) \cdot \left[1 - \omega_{2\text{s}}^{2} + \sqrt{1 - \omega_{2\text{s}}^{2}}\right]}{\exp\left(2\tau_{2\text{s}}\sqrt{1 - \omega_{2\text{s}}^{2}}/\cos\theta\right) \cdot \left[2 - \omega_{2\text{s}}^{2} + 2\sqrt{1 - \omega_{2\text{s}}^{2}}\right] - \omega_{2\text{s}}^{2}} \\ & = \frac{\omega_{2\text{s}} \cdot \left[\exp\left(2\tau_{2\text{s}}\sqrt{1 - \omega_{2\text{s}}^{2}}/\cos\theta\right) - 1\right] \cdot \left[1 + \sqrt{1 - \omega_{2\text{s}}^{2}}\right]}{\exp\left(2\tau_{2\text{s}}\sqrt{1 - \omega_{2\text{s}}^{2}}/\cos\theta\right) \cdot \left[2 - \omega_{2\text{s}}^{2} + 2\sqrt{1 - \omega_{2\text{s}}^{2}}\right] - \omega_{2\text{s}}^{2}} \end{aligned}$$

- Considers multiple scattering in vegetation, multiple reflections between vegetation and the soil surface, and consistent with Kirchhoff's law.
- Formulation is as simple as TO EM.

**B)** FOREST: 2S EM **®** TO EM: Comparison between  $T_{BTO}^{p,\theta}(\tau,\omega) \ll T_{B2S}^{p,\theta}(\tau,\omega)$ 

- TO EM and 2S EM converge for sparse vegetation.
- Differences of several kelvins (> instrument noise of SMOS and SMAP) for *t* and *w* typical of forests.
  - ▷ TO-retrievals<sup>1</sup> 2S-retrievals.



Contour plot of differences  $\Delta T_{B,2S-TO}^{p,\theta}(\tau,\omega) \equiv T_{B,2S}^{p,\theta}(\tau,\omega) - T_{B,TO}^{p,\theta}(\tau,\omega)$  simulated for  $\theta = 40^{\circ}$ . Blue dashed contours are for p = H, red solid contours are for p = V.

#### **B)** FOREST: 2S EM ® TO EM: Reasoning and computation of 2S-equivalent W<sub>2S.eq</sub>

Transformation  $\omega_{TO} \mapsto \omega_{2S,eq}$  of  $\omega_{TO}$  to 2S-equivalences  $\omega_{2S}$  is mandatory for retrievals ( $WC_{2S}, \tau_{2S}$ ) which are comparable with ( $WC_{TO}, \tau_{TO}$ ). Because ( $WC_{RC}, \tau_{RC}$ ) achieved with Retrieval Configuration  $RC = \{TO, 2S\}$  assume respective scattering albedo  $\omega_{TO} \simeq 0.08$  and  $\omega_{2S,eq} = 0.1246 > \omega_{TO}$  as constant.



2S-equivalences  $\omega_{2S,eq}(\omega_{TO})$  computed from  $\omega_{TO}$  used with TO EM. Dots are  $\omega_{2S,eq}(\omega_{TO})$  computed from  $\omega_{2S,eq}(\tau_{TO,j}, \omega_{TO}, WC_{TO,k})$  averaged over  $\tau_{TO,j}$  and  $WC_{TO,k}$ ; gray-shaded area represents the ± uncertainty  $\sigma\omega_{2S,eq}(\omega_{TO})$  due to second order dependencies on  $\tau_{TO}$  and  $WC_{TO}$ ; the Fast Model (FM)  $\omega_{2S,eq}^{FM}(\omega_{TO})$  is shown with the solid line.

### **B)** FOREST: 2S EM **®** TO EM: Retrievals ( $WC_{RC}, \tau_{RC}$ ) from tower-based $T_B^{p}(q)$



### **B)** FOREST: 2S EM **®** TO EM: Retrievals ( $WC_{RC}, \tau_{RC}$ ) from tower-based $T_B^{p}(q)$

**In-situ observations:** Air temperature  $T_{soil}$  and precipitation *P* 

Soil water-content  $WC_{in-situ}$  and Relative Foliation RF

L-band  $T_{B}^{p}(q) @ p = \{H,V\} 4AM-8AM$  $q = \{46^{\circ}, 50^{\circ}, 54^{\circ}, 58^{\circ}\}$ 

- $T_{\rm B}{}^{p}$  follow Seasonal patterns of *RF* and  $T_{\rm soil}$
- $T_{\rm B}^{p}$  respond (decrease) to strongest rain periods



### **Retrievals** ( $WC_{RC}, \tau_{RC}$ ) for RC={TO,2S}

- Very similar  $WC_{RC}$  for  $RC = \{TO, 2S\}$  $\triangleright \omega_{TO} = 0.08 \mapsto \omega_{2S,eq} = 0.1246$  is adequate
- Responses of  $WC_{RC}$  to strongest rain periods

	$\langle  au_{RC}  angle \pm \Delta  au_{RC}$		
RC	TO	2S	
foliage-free	$0.6756 \pm 0.1116$	$0.5754 \pm 0.0726$	
fully foliated	$0.7113 \pm 0.0875$	$0.6229 \pm 0.0694$	

• Larger optical depth during foliated period than during foliage free period.

### **B)** FOREST: 2S EM **®** TO EM: Retrievals ( $WC_{RC}, \tau_{RC}$ ) from tower-based $T_B^{p}(q)$



### **B)** FOREST: 2S EM **®** TO EM: Retrievals $(WC_{RC}, \tau_{RC}, \omega_{RC})$ from SMOS $T_B^{p}(q)$

**Global retrieval differences** ((RC = 2S) - (RC = TO))

*w* retrieved simultaneously with *WC* and *t* because transformation  $\omega_{TO} \mapsto \omega_{2S,eq}$  was not developed at that time!



### **B) FOREST:** *Conclusions / Summary:*

- 1. 2S EM has certain advantages over TO EM:
  - a) Consideration of multiple reflections between vegetation and soil
  - b) More correct representation of multiple scattering within vegetation
  - c) Above points a) & b) become increasingly relevant for dense vegetationd) 2S EM has a wider applicability range, and converges to TO EM for sparse vegetation.
- 2. Retrieval Configuration RC = 2S (using 2S EM) and RC = TO (using TO EM): a) RC = 2S is as simple to implement as RC = TO currently used by SMOS & SMAP. b) Translation  $\omega_{TO} \mapsto \omega_{2S,eq}$  is developed to achieve 2-parameter retrievals  $(WC_{RC}, \tau_{RC})$  that are comparable for RC = TO and RC = 2S.
- 3.  $(WC_{RC}, \tau_{RC})$  retrievals for  $RC = \{TO, 2S\}$ :
  - a) Derived from tower-based  $T_B^{p}(q)$ :
    - i) Very small "direct" impact of TO EM ® 2S EM on retrieved *WC*. Expected indirect impact on SMOS *WC* retrievals via  $T_B{}^p(q)$  of non-nominal pixel fraction (forest).
    - ii) Retrievals  $t_{TO}$  are too high due to wrong representation of multiple scattering and neglect of multiple reflection in TO EM.
    - iii) *RC* = 2S should be used for retrievals over forests!
  - b) Demonstration maps derived from SMOS data:
    - i) Technically speaking RC = 2S works at least as good as RC = TO.
    - ii) Validation and implementation in operational algorithm still outstanding.



# Summary



- **q**Need for reliable BT first
- **q**Validation is complexe
  - ▼Need for more well designed dense networks
  - ✓Over more biomes
- **q**Issue of representativity of ground measurements (Molero et al 2018)
- Issue with data sets used for « calibration »/ Training and validation
- **q**Need for specific exercises and standard approaches **q** « torture numbers ... they'll confess anything » **q**Need for objective approaches **v**Exemple of « blind tests »