# L-band observations from space: new observations linking the Water and Carbon cycles

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ESA 4<sup>th</sup> Carbon from Space 2022

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# SMOS soil moisture and vegetation optical depth

- Passive microwaves sensors measure the frequencies depends mainly of soil moisture and temperature
- content and structure creating a vegetation optical depth (VOD)









### The long post-fire recovery of the equatorial forest







# LAI, SMOS L-VOD, AMSR2 Ku-VOD, ASCAT slope

### LM 103 px > 90% croplands







Land Carbon **Constellation** project @esa



See Segarra et al., 2020 for wheat phenological stages in the region









# LAI, SMOS L-VOD, AMSR2 K-VOD, ASCAT slope







### Land Carbon **Constellation**

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Cover

Snow









# High sensitivity of L-VOD to AGB





SMOS + Veg

tse

esa

$$AGB = \frac{a}{\left(1 + exp\left(-b\left(vod - c\right)\right)\right)} + d,$$



### **Microwave data versus ESA CCI Biomass**



Spain Las Majadas 2010-2017-2018 R=0.79: RMSE=27.49 100 MAE=17.23; STD=21.43 0.3 0.4 0.5 0.2 VOD SMOS 2010-2017-2018



**Community Session-Synergistic use of** observations for constraining the carbon cycle across scales

> Scholze et al. Steele-Dunne et al. Lemmetyinen et al. Kaminski et al.

AGB depending on VOD-C1-AMSR2 in Las Majadas AGB depending on VOD-C1-AMSR2 in Sodankyla R = 0.62AGB = 181 VOD-C1-AMSR2 - 56

VOD C1 AMSR2





#### **Finland Netherlands** Sodankyla 2010-2017-2018 Reusel 2010-2017-2018 <sup>100</sup> R=0.66; RMSE=50.07 <sup>220</sup> R=0.66; RMSE=83.15 <sup>200</sup> MAE=74.56; STD=36.82 <sup>90</sup> MAE=47.05; STD=17.11

141.5522 VOD -

0.6

0.5

/OD SMOS 2010-2017-2018

### **AGB vs SMOS L-VOD**





0.25 0.3 0.35 0.4 0.45 0.5 0.55 0.55 0.55 0.55

0.3 0.35 0.4 0.45 0.5 0.55

0.25

R = 0.53

2017

AGB = 391 VOD-C1-AMSR2 - 10

-70.46

AGB vs **ASCAT slope** 









### Using a spatial correlation to infer the temporal behavior...



Brandt et al. 2018, Satellite-Observed Major Greening and Biomass Increase in South China Karst During Recent Decade, Earth's future. Brandt et al. 2018, Satellite passive microwaves reveal recent climate-induced carbon losses in African drylands, Nature Ecology and Evolution Bastos et al. 2018, Impact of the 2015/2016 El Niño on the terrestrial carbon cycle constrained by bottom-up and top-down approaches, Phil. Trans. of the Royal Society B Fan et al. 2019, **Satellite-observed pantropical carbon dynamics**, Nature Plants . . .

Wigneron et al., 2020, Tropical forests did not recover from the strong 2015–2016 El Niño event, Science Advances Qin et al. 2021, Carbon loss from forest degradation exceeds that from deforestation in the Brazilian Amazon, Nature Climate Change



...





### **VOD and AGB: Effect of inundated areas**

Time series over seasonally inundated areas: anomalous decrease of L-VOD during floods.

Modelling experiment in order to understand the impact of dynamic surface water on L-VOD retrieval.

#### Results :

- L-VOD is underestimated during floods, by ~10 % over flooded forests, up to 100 % over flooded grasslands.
- L-VOD/AGB relationship : AGB is also underestimated, by 15/20 Mg ha<sup>-1</sup> and up to 50 Mg ha<sup>-1</sup> temporarily.

Bousquet et al. (2021, RSE)





Time series of LAI, L-VOD, Soil Moisture, and water fraction over the Pantanal wetland (South A



Computation of the yearly mean L-VOD error at the global scale due to floo



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### Rodriguez-Fernandez et al. (2018, Biogeosciences)



- AGB maps used as reference have many uncertainties, including those using currently available SAR data, which saturates in dense forest
- Which one to chose ?
- How to take into account the large dispersion ?
- What period should be used to compute the relationship ?





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### **Interannual Variations of Vegetation Optical Depth are Due to Both Water Stress and Biomass Changes**

Alexandra G. Konings<sup>1</sup>, Nataniel M. Holtzman<sup>1</sup>, Krishna Rao<sup>1</sup>, Liang Xu<sup>2</sup>, and Sassan S. Saatchi<sup>3</sup> 🕩

**Geophysical Research Letters** 

**RESEARCH LETTER** 10.1029/2021GL095267







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- Which one to chose ?
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- What period should be used to compute the relationship ?
- Yearly AGB maps from VOD maps with respect different recent AGB data sets will be freely distributed by





# **SMOS AGB without VOD**









#### Using several years of AGB for the training simultaneously **ESA CCI Biomass**

Rodriguez-Fernandez et al. (2019, IGARSS) Salazar-Neira et al. (2022, IGARSS) Salazar-Neira et al. (submitted)



#### **Other goal: Consistent X, C, and L-band VOD using 2-stream**



Because VOD tends to estimate a similar AGB value over large regions the difference with AGB(ANN) is red (thus ANN < VOD func) in regions where the ANN produce an AGB more detailed than the AGB(VOD), and sometimes more details means lower values (closer to the reference than those produced by the VOD func) and thus the red spots











### Summary

- cycles
- observations and VOD measured at other wavelengths
- L-VOD provides complementary information to radar, lidar and optical • Useful for a wide range of applications but ... should be used with care !
- Future ?
- Biomass P-band SAR (Le Toan et al. (2011, RSE) - Multi-incidenc angles L-band measurements with increased resolution: **SMOS-HR** (Rodriguez-Fernandez et al. 2022, IGARSS)







### L-band observations allow to link components of both the water and carbon

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🥑 @NemesioRF **@SMOS** satellite







# LAI, SMOS L-VOD, AMSR2 K-VOD, ASCAT slope







### Land Carbon **Constellation**

90

80

70

60

50

40

30

20

10

[%]

Cover

Snow









### **SMOS L-VOD and vegetation water content**



### Tian et al. (2018, *Nature Eco&Evo*)



- Different dynamics of L-VOD and LAI : up to 180 days shift in dry **Tropical forests such as those in Miombo**
- L-VOD is linked to vegetation water content
- In regions with woody vegetation the information in L-VOD is highly complementary to vegetation indices linked to leaves and more appropriate for herbaceous plants
- Trees may access deep soil water and have sophisticated hydraulic strategies
- **Interannual Variations of Vegetation Optical Depth are Due to Both Water Stress and Biomass Changes**
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