





## → 7th ADVANCED TRAINING COURSE ON LAND REMOTE SENSING

4–9 September 2017 | Szent István University | Gödöllő, Hungary







## LONG-TERM HYDROLOGICAL MONITORING WITH ACTIVE AND PASSIVE MICROWAVE MISSIONS

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http://climers.geo.tuwien.ac.at/



### **Recent hydrological extremes**



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## Storm Harvey: Houston battles



Main roads in Houston have been turned into rivers

state of Texas, officials sav.

turning roads into rivers.

## 'unprecedented' flood Droughts in East Africa becoming more frequent, more devastating

Wildfires trap 2,000 people in town in are banned from making fake snow central Portugal

Can the cycle be broker

RY STEPHEN WAINAINA / @ MARCH 17 2017 / O

Flames and smoke surround Mação, making it impossible to enter or leave - the latest in country's deadliest year for fires



#### A record 30in of rain (75cm) has fallen on the city in the wake of Hurric People watch a firefighting plane drop water to stop a raging forest blaze reaching their houses near Maçã central Portugal, Photograph: Armando Franca/AP

#### Dry ice: Thousands of holidays in the Alps ruined after the region is declared a 'drought zone' and resorts

· Fifty resorts in Haute-Savoie will have to turn off snow cannons on their pistes

 If there is no downfall by the weekend, the machines will be banned in the region

• It has stretched water supplies after some places haven't seen snow in 50 days

Across Europe, the warm weather and lack of snow is threatening ski seasons

#### By GARETH DAVIES FOR MAILONLINE

11:13 BST, 9 January 2017 | UPDATED: 11:57 BST, 12 January 2017





214



## **Predicted global changes**



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39

(°C)

**RCP 8.5** 

7

5

9 11

In average conditions...

**RCP 2.6** Change in average surface temperature (1986-2005 to 2081-2100)

1.5

1

... and the extremes



(a)

[Seneviratne et al. (2012), *IPCC/SREX*]

[IPCC, AR5 (2014)]

-2 -1.5 -1 -0.50 0.5



#### Why do we need Earth observation if we have models? European Space Agency



5

"There is *medium confidence* that since the 1950s some regions of the world have experienced trends toward more intense and longer droughts, ..., but in some regions droughts have become less frequent." [IPCC-SREX WG2, 2012; IPCC AR5, 2014]





## Motivation and goal of this course



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- There are still large uncertainties in observations and projections of the water cycle
  - > Models are still far from perfect, especially in representing complex interactions
  - > Large uncertainties in drivers of these models (e.g. precipitation)
- Focus on long-term ESA CCI soil moisture product
  - > What information sources can we use?
  - How do we combine information from different sensors?
  - > What are the characteristics of the product?
  - > What are the limitations of the product?
- Applications of the ESA CCI soil moisture
- What will be next?
- Practical using online tools





#### **Microwaves and water**



- Microwaves (1 mm 1 m wavelength)
  - Very sensitive to soil water content below relaxation frequency of water (< 10 GHz)</li>
  - > All-weather, day-round measurement capability
  - > Penetrate vegetation and soil to some extent
  - > Penetration depth increases with wavelength





The **dipole moment** of water molecules causes "orientational polarisation", i.e. a high dielectric constant

Dielectric constant of water



# Backscatter and emissity from vegetated surfaces



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8

Observed signal over vegetated surfaces contains contributions from surface and vegetation and depends on their geometrical and chemical properties.



 $\rightarrow$  retrieval is underdetermined



#### A short summary of ESA CCI SM v03.2





#### Input data products

- 11 active and passive microwave L2 products
- L-, C-, X-, Ku-band
- Resolution: ~25-100 km
- Revisit time: 1-7 days

#### $\rightarrow$ Merged ESA CCI soil moisture

- 0.25° resolution
- Daily product
- Period 1978-2015

# How dow we combine so many different sensors?



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Year

-AMSR-E

ASCAT

SMMR

SSM/I



# Statistical merging methodology in a nut shell



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Not one but 3 products are being produced



[Dorigo et al., RSE, 2017]



## **Rescaling by CDF-matching**



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- Overcoming systematic differences, e.g.
  - Retrieval model )
  - Penetration depth
  - Active vs. Passive
- Since no Level 2 product has global coverage, we use GLDAS-Noah LSM for scaling ACTIVE and PASSIVE!

**Cumulative Frequency Distribution** 

0.8

0.6

0.4

0.2

0

0

AMSR-E

Rescaled

0.1

0.2





## Error assessment using triple collocation



• Error variance in satellite soil moisture computed with triple collocation technique



[Dorigo et al. (2010), HESS]

 Areas where, according to triple collocation, ASCAT (blue) or AMSR-E (red) has lowest error



 Annual average vegetation optical depth from AMSR-E C-band using VUA-NASA algorithm



## Weighted merging based on Signal-to-Noise Ratio



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- Allows for merging >2 datasets
- > Optimal reduction of random errors
- > Resilient to sensor failure



Blending weights for merging AMSR-E, Windsat, and SMOS into a merged passive dataset (July 2010-October 2011) [Gruber et al., in prep.]



Blending weights for merging ACTIVE and PASSIVE into COMBINED (period January-December 2014) [Dorigo et al., RSE, 2017]



#### **Reduction of error variances**





 Triple collocation + error propagation for estimating random errors at daily basis

Average error variances of ACTIVE, PASSIVE, and COMBINED for the period July 2012-December 2015 [Dorigo et al., RSE, 2017]; SNR improvement in decibel units w.r.t. best performing single sensor product [Gruber et al., TGRS, 2017]



#### Microwave sensors used per period

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[Dorigo et al., RSE, 2017]



#### **Dataset characteristics**



1.0 90 80 0.9 70 0.8 60 50 rage [] 40 0.6 Latitude [°] 30 20 0.5 Fractional 10 0.4 0 -10 0.3 -20 \*\*\*\*\*\*\*\*\*\*\*\*\* -30 0.2 -40 0.1 -50 -60 0.0 983 2003 2006 2008 2009 2010 2011 2012 2013 2014 2015 1979 1980 1982 984 985 1986 988 989 990 1992 993 1995 1996 1998 1999 2000 2002 2004 2005 2007 981 987 1991 1994 1997 2001

Fraction of days covered by ESA CCI SM COMBINED v03.2 [Dorigo et al., RSE, 2017]

covel



Passive and active microwave sensors used per period [Dorigo et al., RSE, 2017]



#### Heterogeneous coverage in space and time

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Fraction of days with valid observations []



[Dorigo et al. (2015), *RSE*]



#### Assessing product skill



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v03.2 [Dorigo et al., RSE, 2017]



Inhomogeneity detection of ESA CCI SM COMBINED v02.2 [Su et al., GRL, 2016; Preimesberger et al., EGU, 2017] 20



#### Assessing product evolution



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Correlation with **in situ** surface soil moisture for period 1991-2010 [Dorigo et al., 2017, RSE]

Data coverage 2007-2010 [Dorigo et al., 2017, RSE]



## **ESA CCI Soil Moisture Climatology**



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- Average seasonal behaviour
- Dense vegetation (tropics) is permanently masked
- Snow and ice are masked both permanently (ice shields) as seasonally





#### **Climate variability and change**

> 0.01

0.008

0.006

0.004

0.002

-0.002

-0.006

-0.008

0.0



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- Interannual variability
- Evaluating Earth System Models



Trends (1988-2005) in CMIP5\_CNRM\_CM5 and ESA CCI SM [Lauer et al., RSE, in press]



Anomalies in 2016 from 1991-2014 baseline [Dorigo et al., BAMS, 2017]



Average global anomalies from 1991-2014 baseline [Dorigo et al., BAMS, 2017]



#### **Trend assessment**



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#### ESA CCI soil moisture



#### ERA Interim soil moisture



#### GPCP precipitation



GLDAS-Noah soil moisture



[Dorigo et al., 2012, GRL]



#### Land-atmosphere interactions

esa **European Space Agency** 

- Soil moisture as control of ET
  - Assimilation into > GLEAM evapotranspiration model ET model



Global trends (1980-2012) in satellite-based evaporation from GLEAM [Miralles et al., 2014, NCLIMATE] 25



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#### Land-atmosphere interactions



- Impact on temperature and heatwaves
- Feedbacks on precipitation
- Impact on (trends in) dust aerosol dynamics



Correlation of TRMM 3B42 precipitation (top row) and ESA CCI SM COMBINED v02.2 soil moisture (bottom row) with MODIS Aerosol Optical Depth [Klingmüller et al., 2016]



## **Global biogeochemical cycles and ecosystems**



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- Evaluation of global ecosystem models (DGVMs)
- Ecosystem Water Use Efficiency
- Impact on vegetation productivity



Correlation between ESA CCI soil moisture and leading Empirical Orthogonal Function (EOF) of Araucaria tree ring archives as indicator of NPP [Muñoz et al., 2017, AE]



## **Global biogeochemical cycles and ecosystems**



European Space Agency

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Trends (1988-2010) in CCI soil moisture and multi-satelliteNDVI 3G [Dorigo et al., 2012, GRL]28



Correlation (1991-2013) between ESA CCI SM v03.2 COMBINED and GIMMS NDVI 3G [Dorigo et al., 2017, RSE]



## Hydrology and land surface modelling



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- Evaluating hydrological and Land Surface Models
- Improving flood risk modelling
- Soil moisture as trigger for land slides
- Improving precipitation estimates
- Estimating precipitation through "bottom-up approach"





Correlation of SM2RAIN 5-day cumulative precipitation from ESA CCI SM COMBINED v03.2 and GPCC FDD [Ciabatta et al., subm.]





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## **Drought applications**



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- Validation of drought indices
- Soil moisture based drought indices
- Part of "convergence of evidence" with other drought-related indicators









## **Meteorological applications**



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- Numerical Weather Model evaluation
- Assimilation into NWP
- Improving NWP land surface scheme



Improvement in correlation against ESA CCI SM COMBINED v02.2 of using a 1 cm instead of 7 cm surface layer in [Dorigo et al., 2107, RSE]





#### What did users like?

Long time series!

#### What should be improved?

- →More recent data
- → Changing characteristics over time
- $\rightarrow$ Spatial and temporal data gaps

- Well error-characterised
- Direct observation of soil water
- Largely independent from models and forcing

- →Reducing errors
- →No observation of root zone
  →Layer depth not exactly defined
- →Dependency of absolute values on LSM

#### What can be done?

- →Copernicus Climate Change Service (C3S) soil moisture
- →Inhomogeneity testing and correction
- →Use of additional sensors, use of L-band data
- →Denoising, improved merging
- →Assimilation into LSM, Soil Water index
- →Using L-band observations as scaling reference



#### Data access



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Download from:

http://www.esa-soilmoisture-cci.org/ https://wci.earth2observe.eu/ http://cci.esa.int/

https://climate.copernicus.eu/ (2018)

View, compare, and plot at: <u>http://rs.geo.tuwien.ac.at/data\_viewer/</u> <u>https://wci.earth2observe.eu/</u>







Where: Research group Climate and Environmental Remote Sensing, TU WienWhat topic: Data assimilation of soil moisture and vegetation (VOD) remote sensing dataWho are we looking for:

- *MSc* in geodesy, geoinformation sciences, environmental sciences, information sciences, physics, physical geography, or similar
- Good programming skills (e.g. Python, R, C++)
- Modelling experience

When: starting in October 2017 for 4 years

For more info visit:

http://climers.geo.tuwien.ac.at/

... or just ask me.