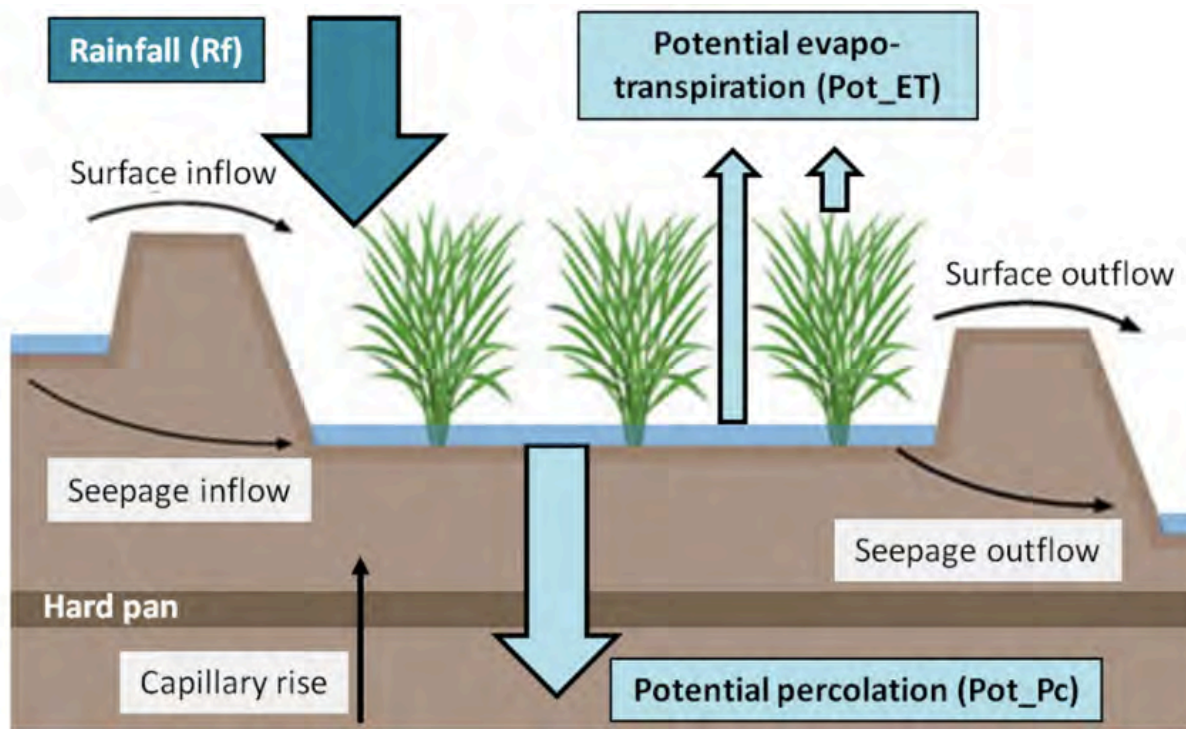


# *Remote Sensing and Geospatial Innovations for Rice Based Agri-Food Systems*

Thomas Gumbricht  
May 2019

# *Components that will be covered*



Nelson, A., Wassmann, R, Sander, B.O., Palao, L.K., 2015.

Climate-Determined Suitability of the Water Saving Technology "Alternate Wetting and Drying" in Rice Systems: A Scalable Methodology demonstrated for a Province in the Philippines. <https://doi.org/10.1371/journal.pone.0145268>

# *Remote Sensing and Geospatial Innovations for Rice Based Agri-Food Systems*

## *Data and models*

Global

Continental

Basin

Landscape

Phenotype

## *Impacts and drivers*

Transforming lives

Climate change

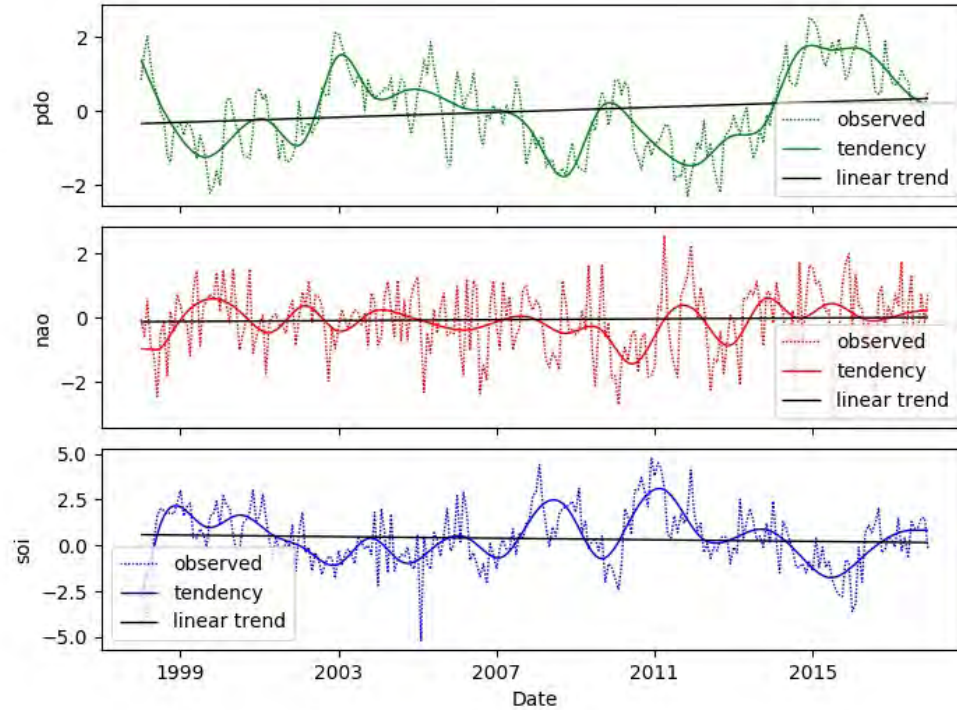
Water Use Efficiency

Precision farming

Livelihood

# Climate indexes

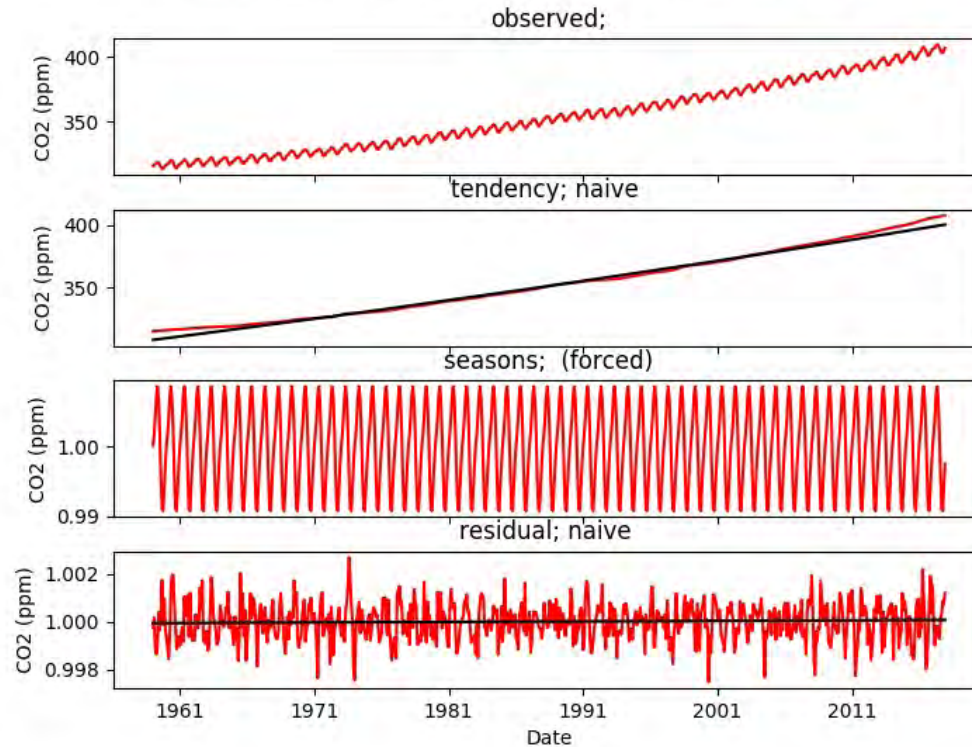
Climate index: (spline, period: 12 filter: 11 [1 yr])



## Climate index smoothing and trends

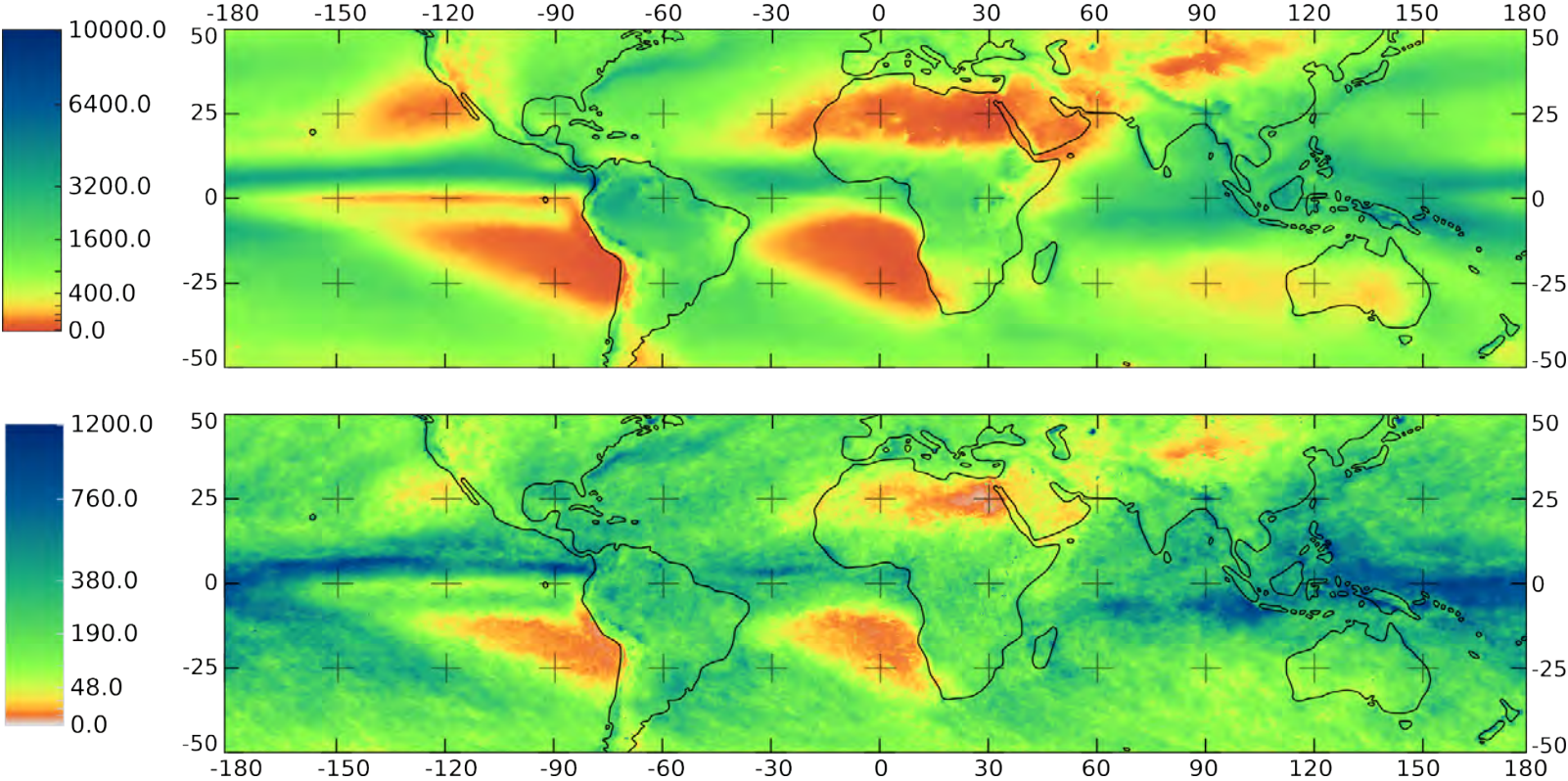
# Climate indexes

Mauna Loa CO<sub>2</sub>: (naive kernel, period: 12 filter: 13 [1 yr])



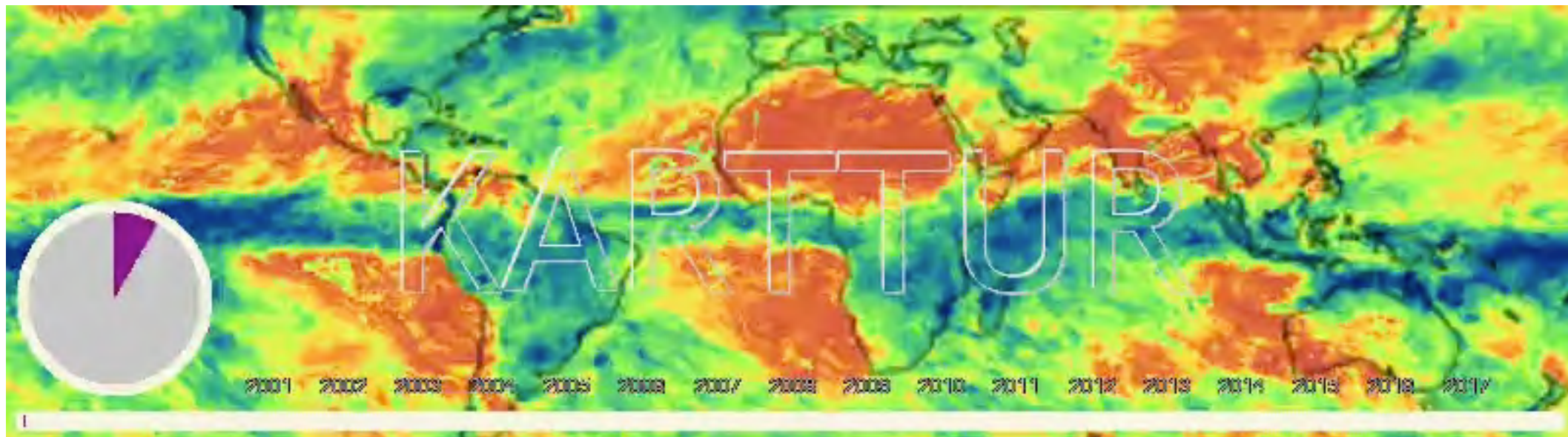
Multiplicative decomposition of the Mauna Loa CO<sub>2</sub> observation

# Tropical precipitation (TRMM)



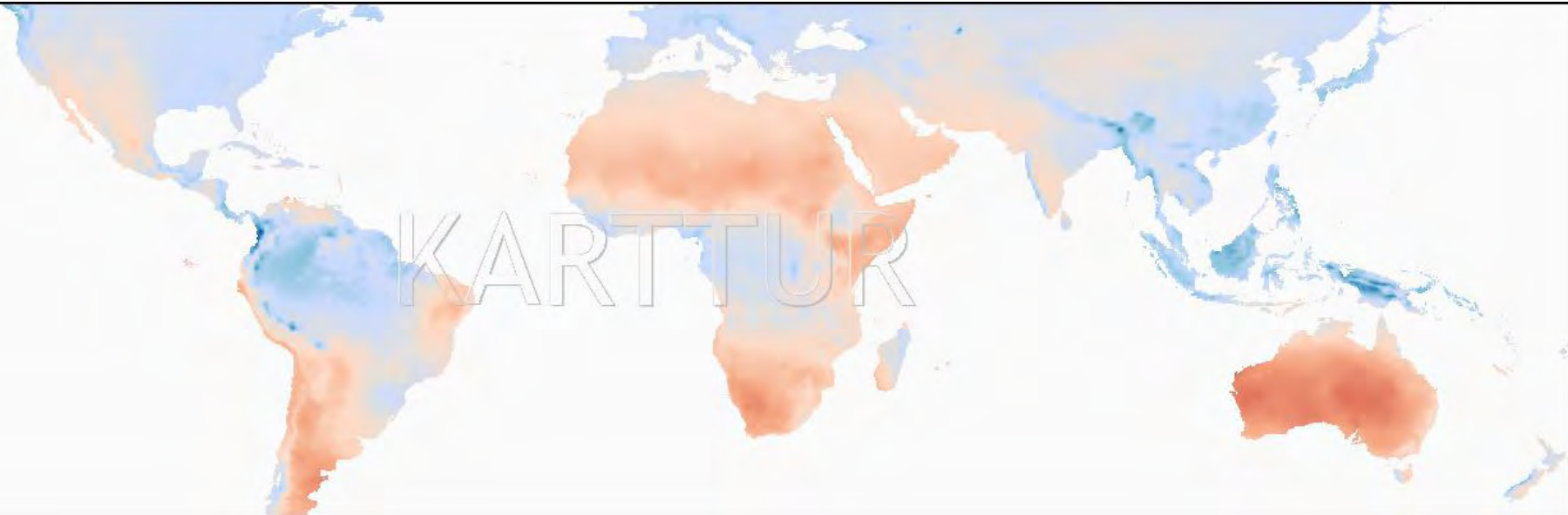
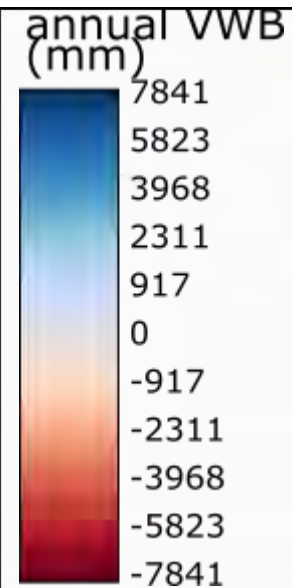
Tropical Rainfall Measurement Mission (TRMM) rainfall  
1998-2016 (mean and standard deviation)

# *Tropical precipitation (TRMM)*



[https://karttur.github.io/common/movies/rainfall\\_3b43\\_trmm\\_199801-201807\\_v7-f.mp4](https://karttur.github.io/common/movies/rainfall_3b43_trmm_199801-201807_v7-f.mp4)

# *Tropical Vertical Water Balance (VWB)*



VWB is calculated as the annual accumulated monthly difference between rainfall and evapotranspiration.



# *Tropical Vertical Water Balance (VWB)*



[https://karttur.github.io/common/movies/trmm-fao-vwb\\_3b43\\_trmm\\_199801-201807\\_v7-f-m.mp4](https://karttur.github.io/common/movies/trmm-fao-vwb_3b43_trmm_199801-201807_v7-f-m.mp4)

# *Significant trends in tropical VWB*



Regions with significant trends in VWB 1998-2016.

# Significant trends in tropical VWB

Humid region.



Regions with significant trends in surplus VWB 1998-2016.

# *Significant trends in tropical VWB*

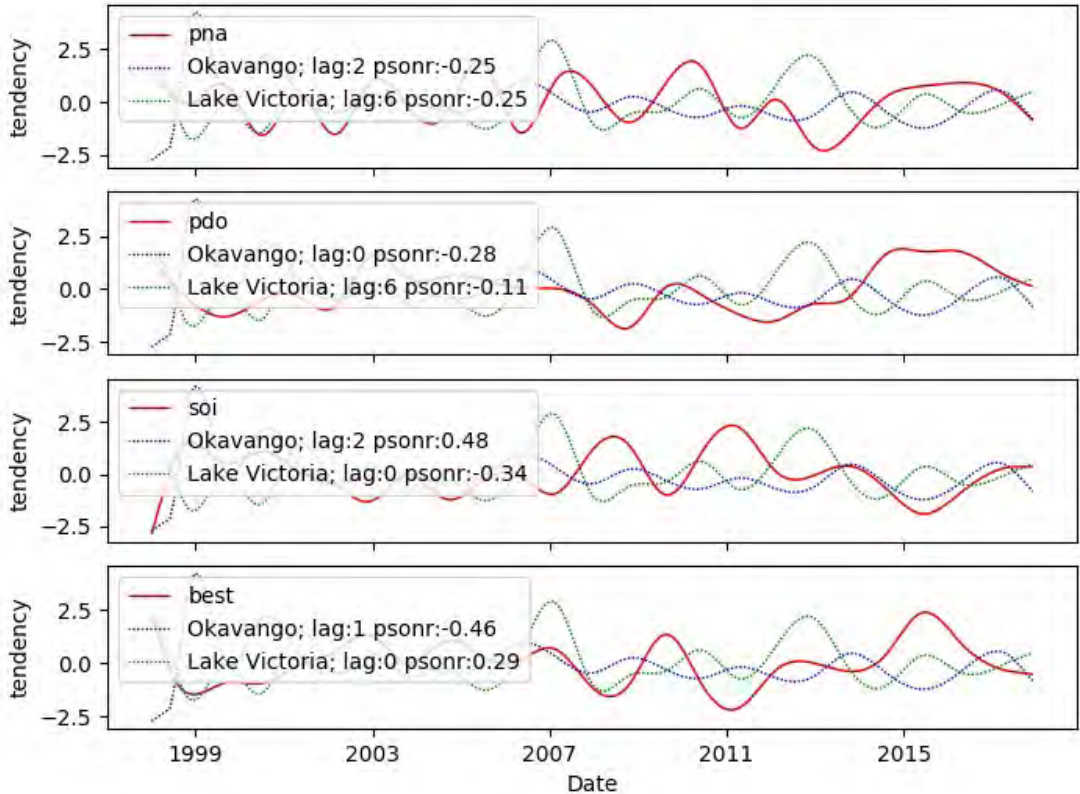
Arid region.



Regions with significant trends deficit VWB 1998-2016.

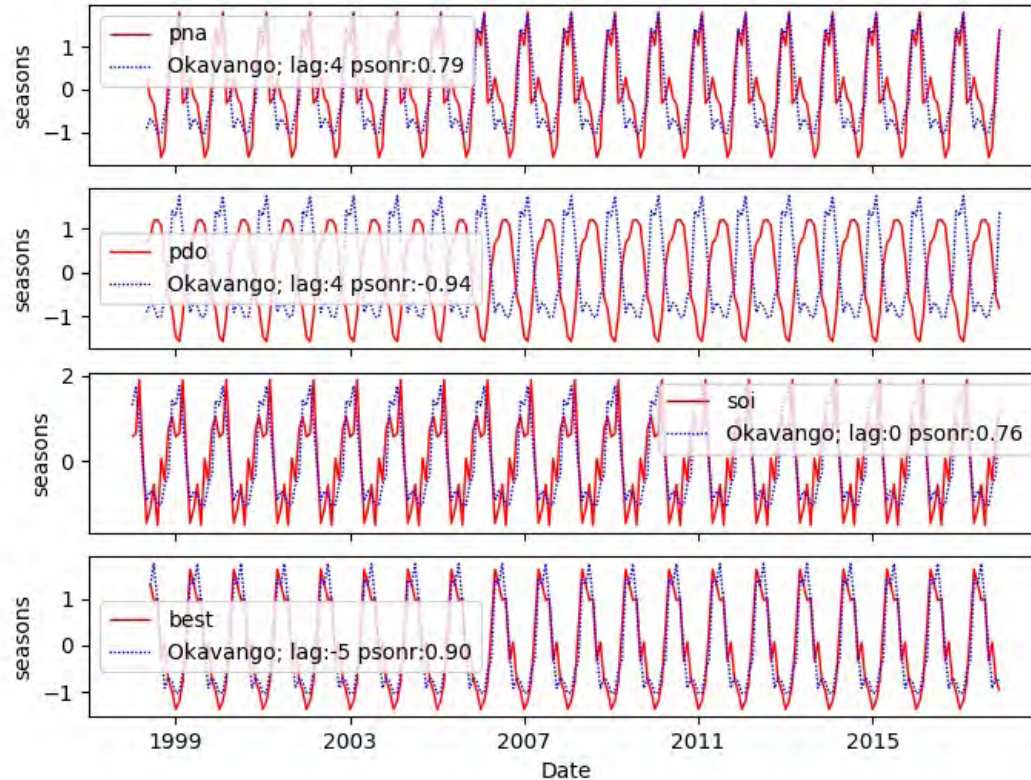
# Cross correlation: climate vs rainfall

Cross correlation; tendency; absolute corr



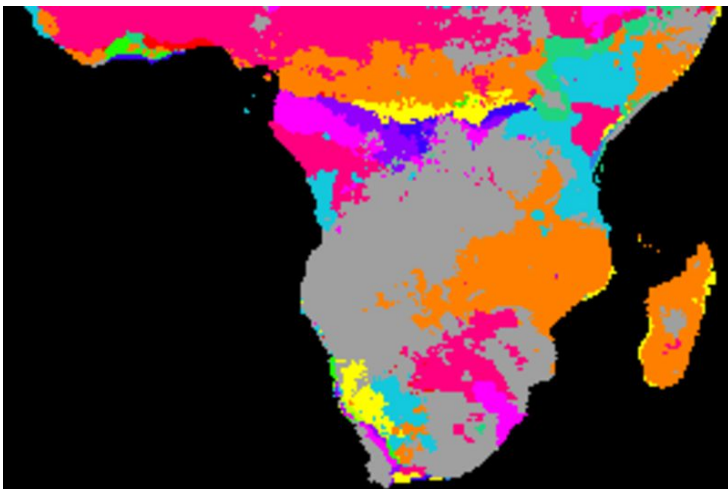
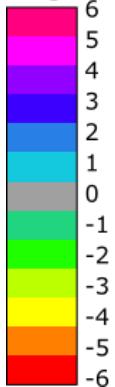
# Cross correlation: climate vs rainfall

Cross correlation; seasons; lag adjusted; absolute corr

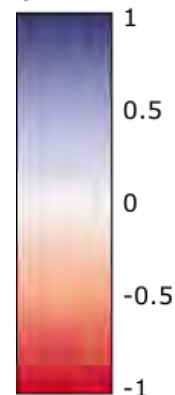


# Cross correlation: climate vs rainfall

Lagtime (months)

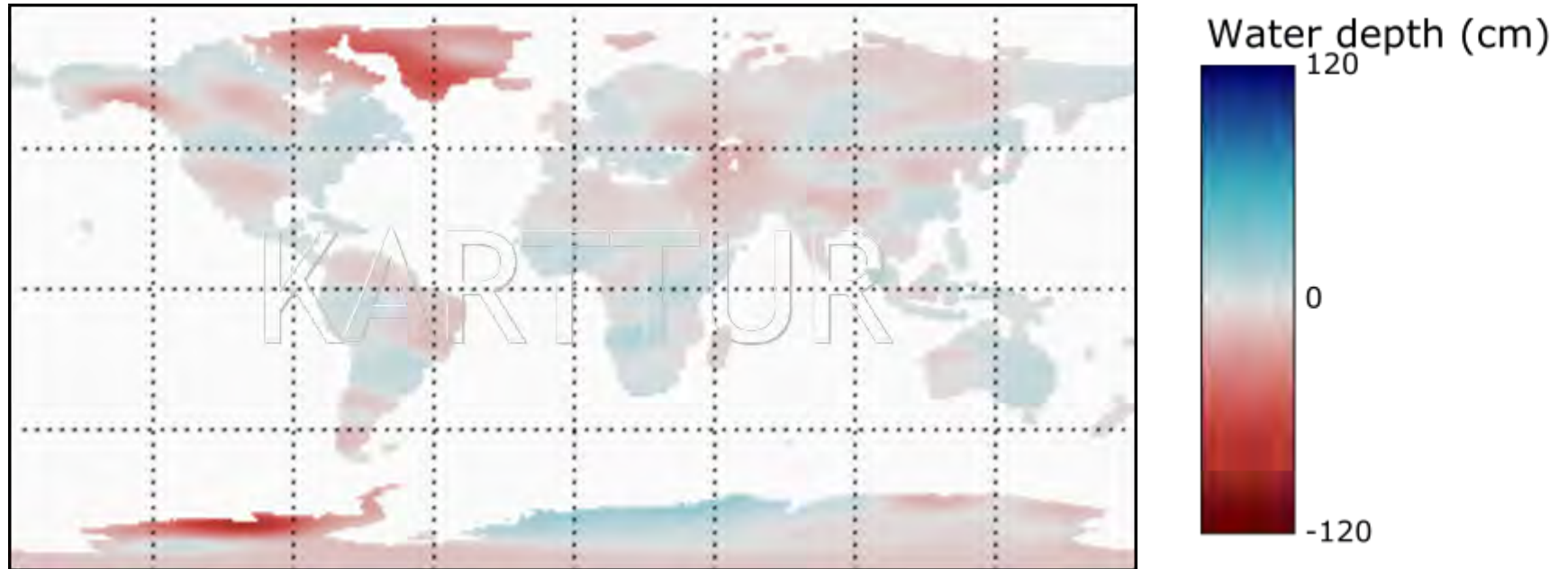


pearsonnr



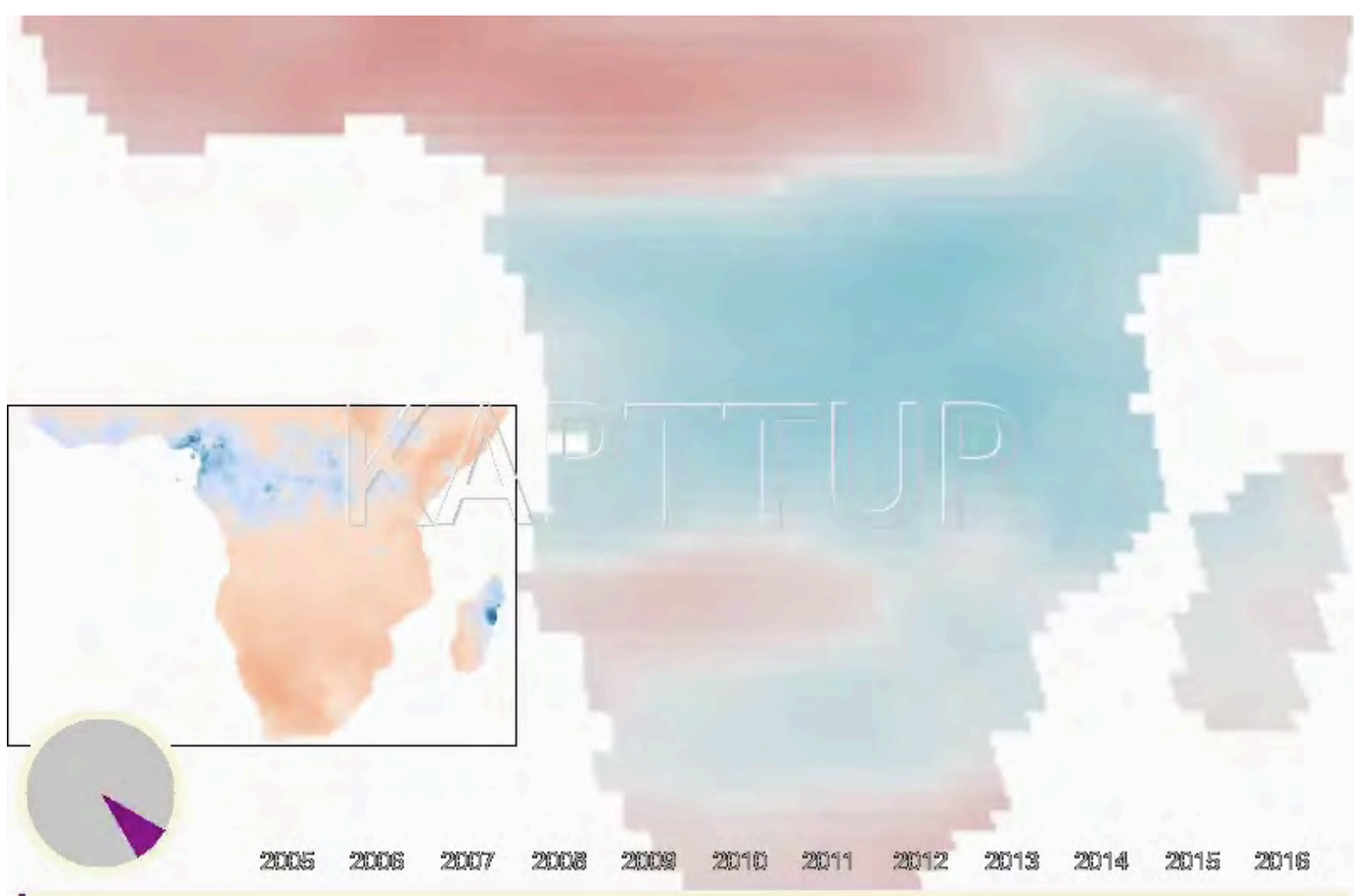
Southern Oscillation index vs TRMM rainfall (1998 to 2017)  
Seasonal cross correlation

# *GRACE global variation in water content*



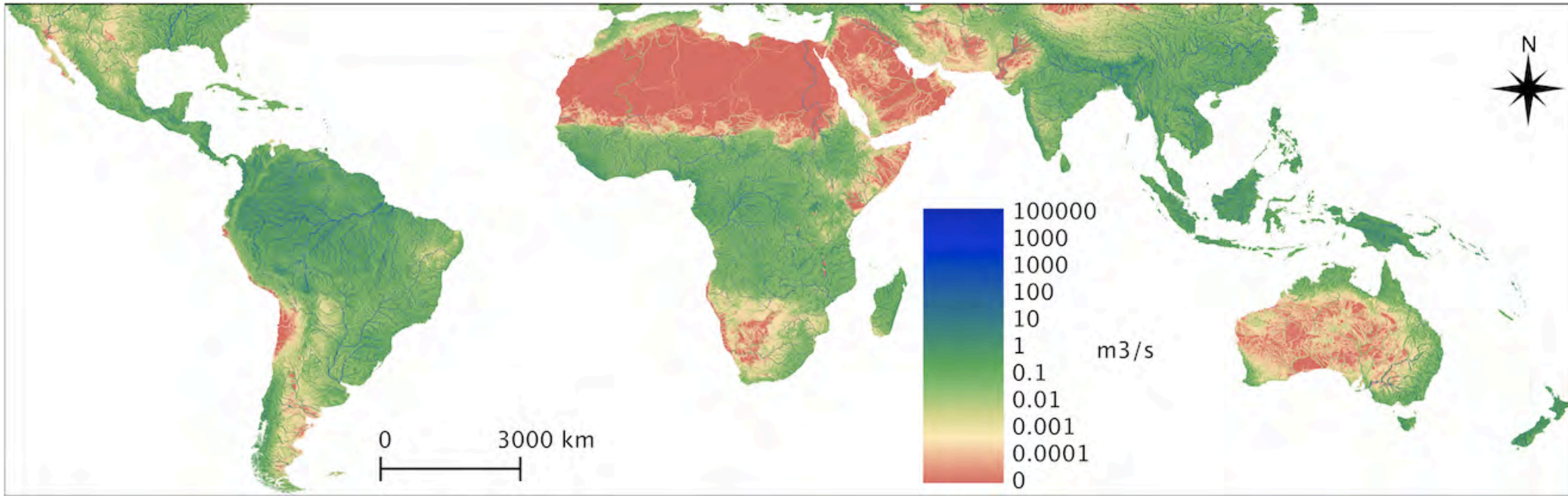
Gravity Recovery And Climate Experiment (GRACE)  
average water depth 2003-2016





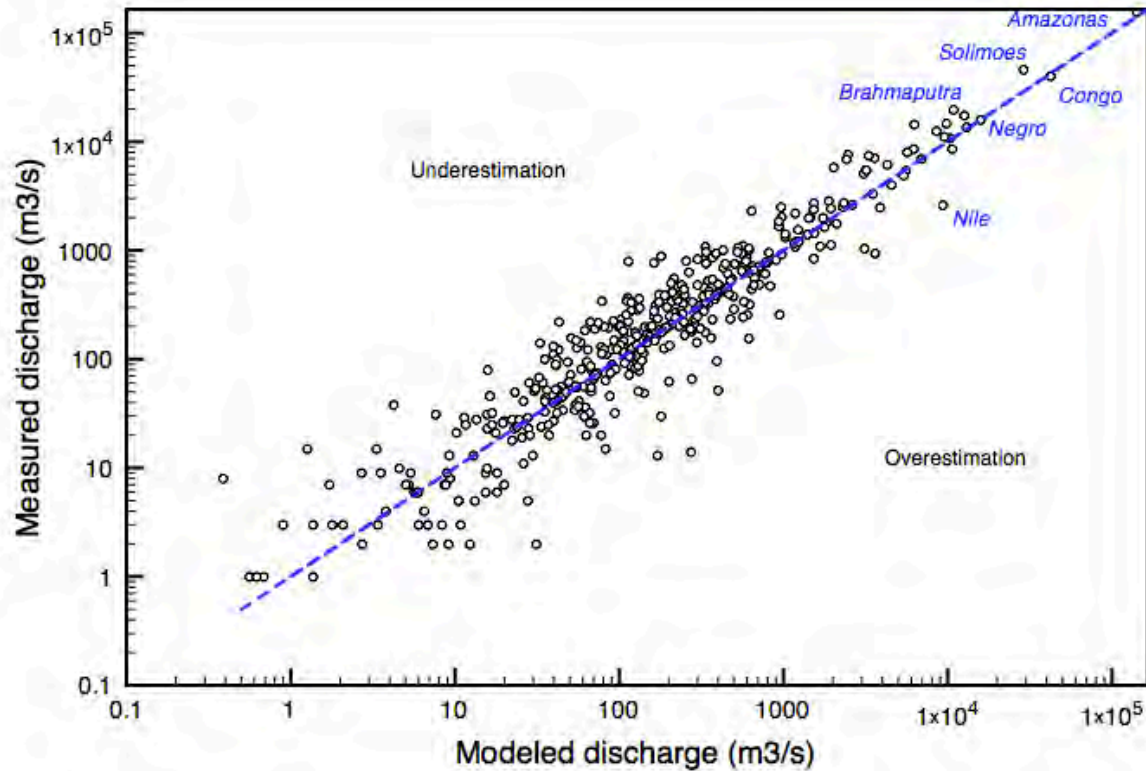
[https://karttur.github.io/common/movies/grace-vwb\\_xcorr\\_africasubsahara\\_200205-201612\\_RL05-f-1deg.mp4](https://karttur.github.io/common/movies/grace-vwb_xcorr_africasubsahara_200205-201612_RL05-f-1deg.mp4)

# Topographic water flow



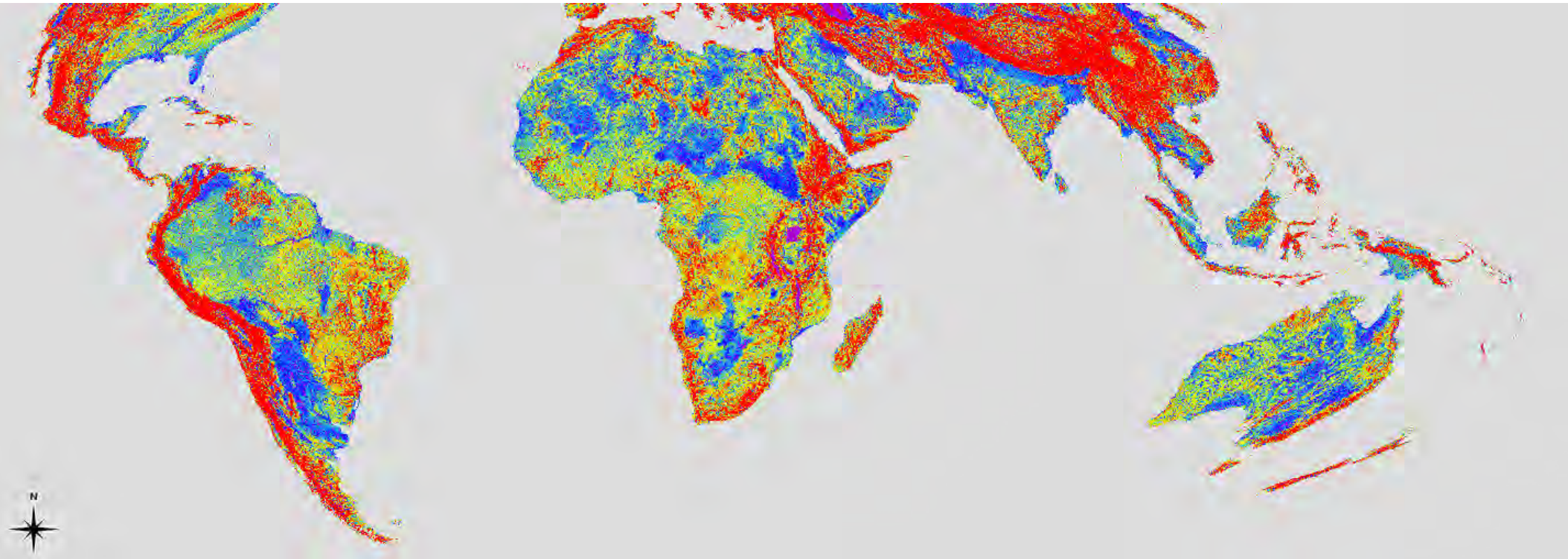
Modeled annual average water flow

# Topographic water flow



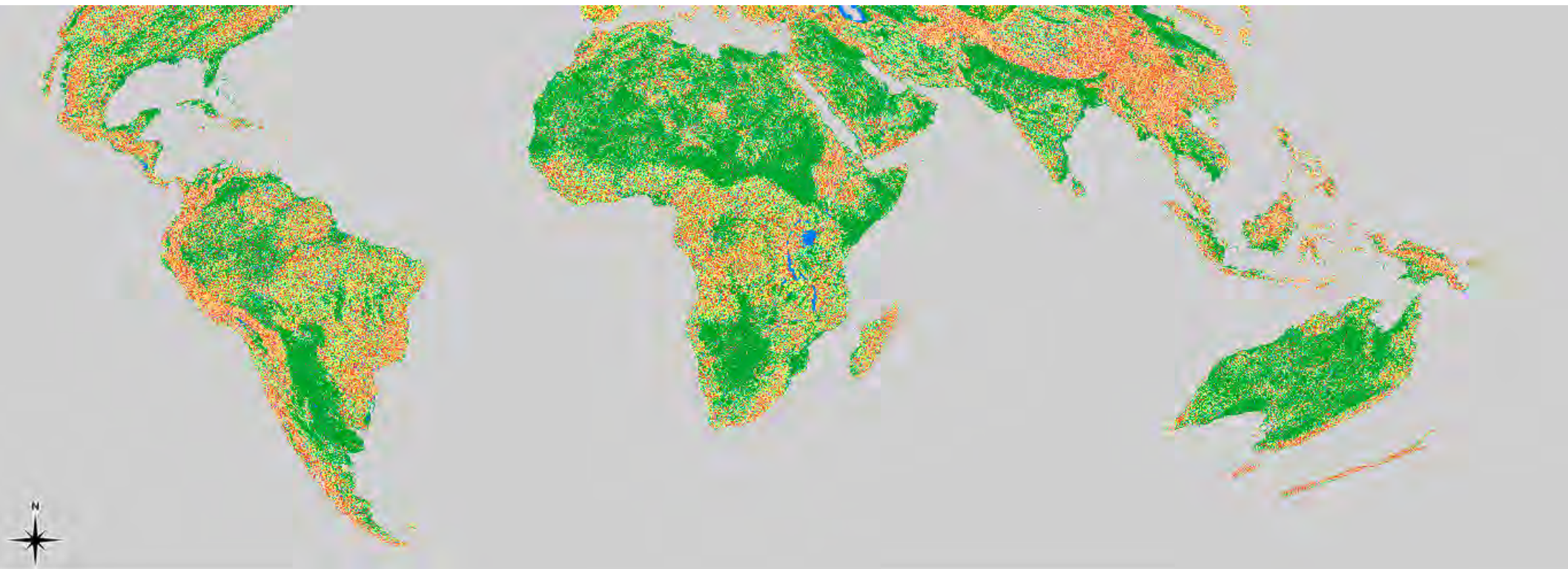
Accuracy assessment of global hydrological model

# *Hydraulic head*



The hydraulic head is the vertical elevation difference between the land surface and its permanent drainage point.

# *Landform*



The landform map is created from multiscale topography combined with hydrological data.

# Optical Sensor Data



Office Du Niger, irrigated rice paddies along the Niger River

# Microwave Sensor Data

Soil moisture (%)



SMAP (Soil Moisture Active Passive) Mission

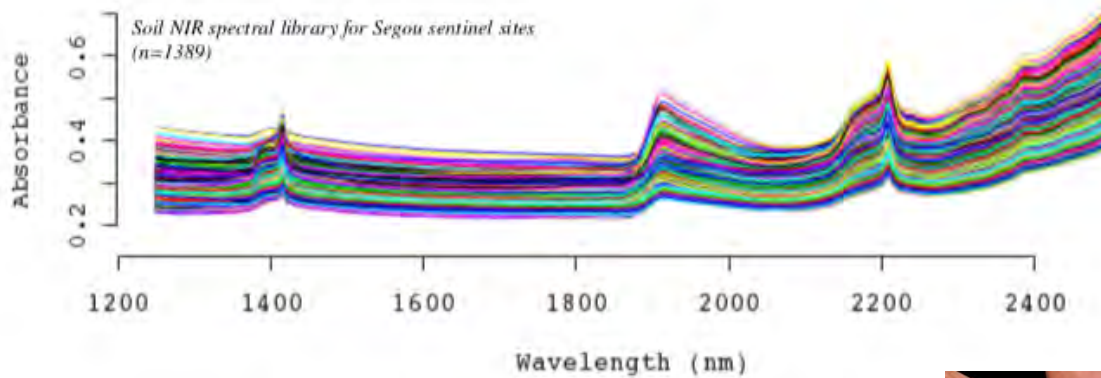
# Landscape



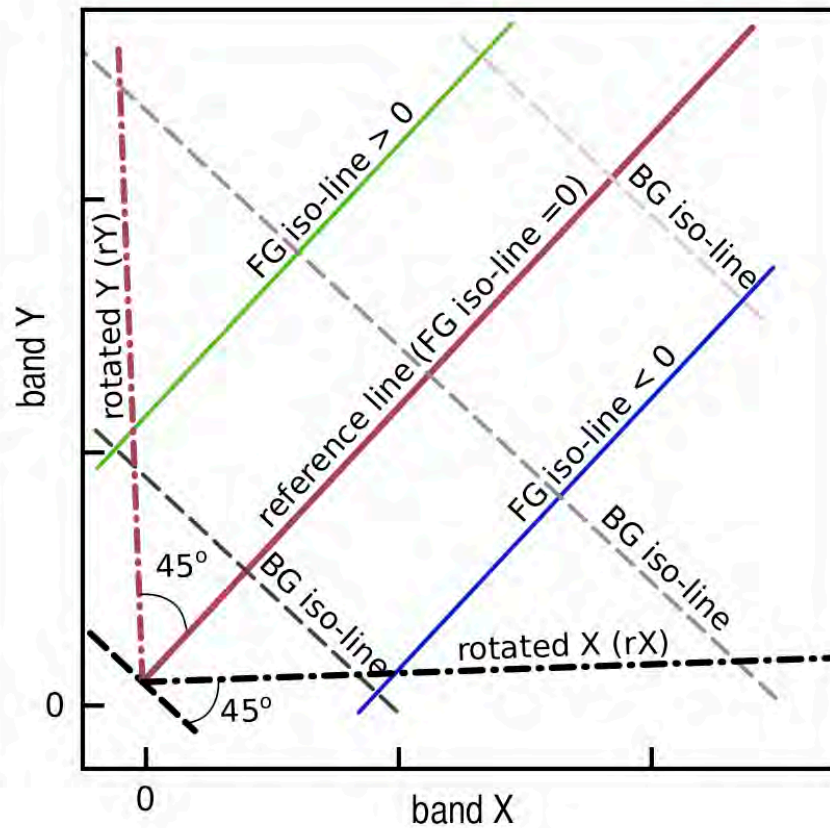
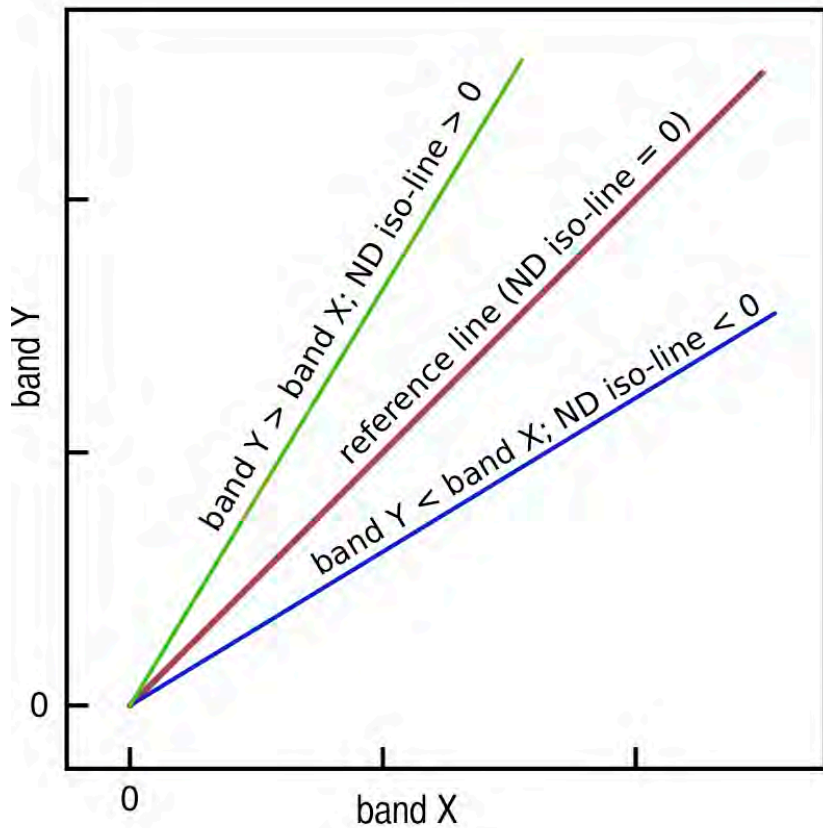
[https://karttur.github.io/common/movies/soil-moisture-avg\\_SPL3SMP\\_global\\_2015121-2018345\\_005.mp4](https://karttur.github.io/common/movies/soil-moisture-avg_SPL3SMP_global_2015121-2018345_005.mp4)



# *Field and laboratory spectroscopy (soon in the smart phone)*

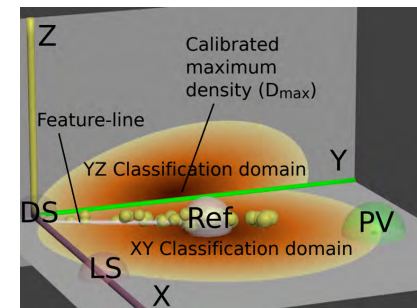
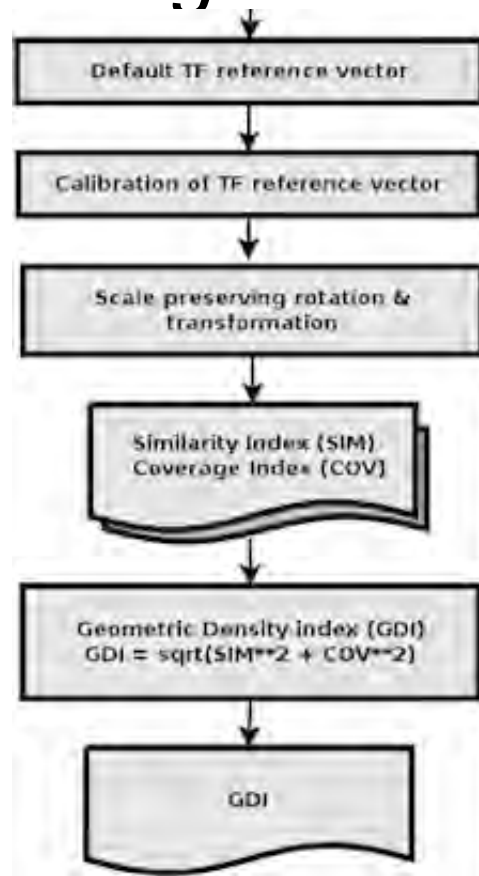
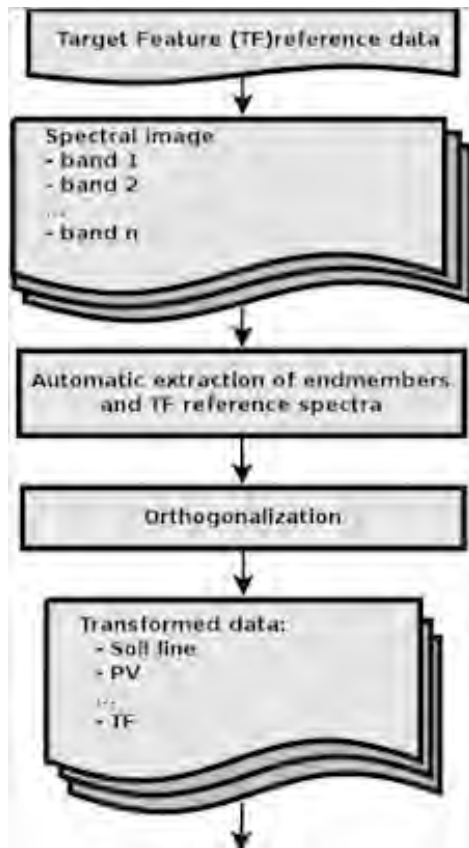
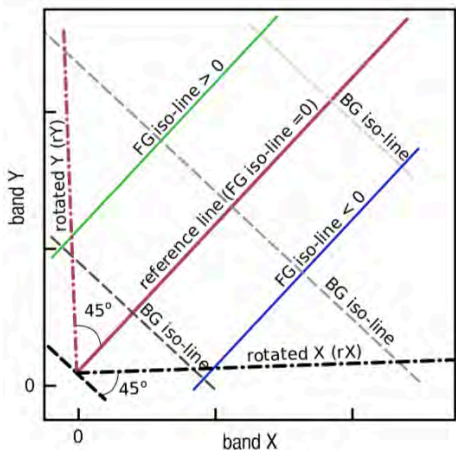
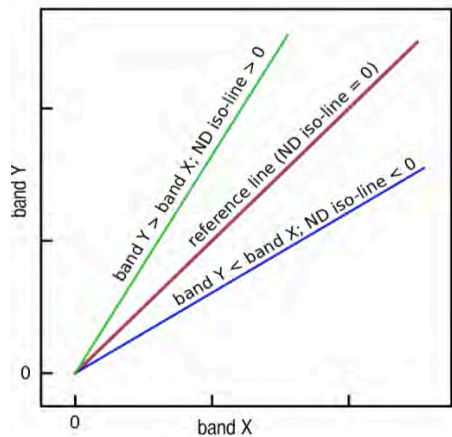


# Traditional and customized models for biomass

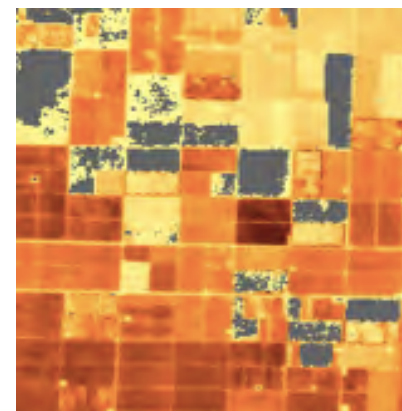
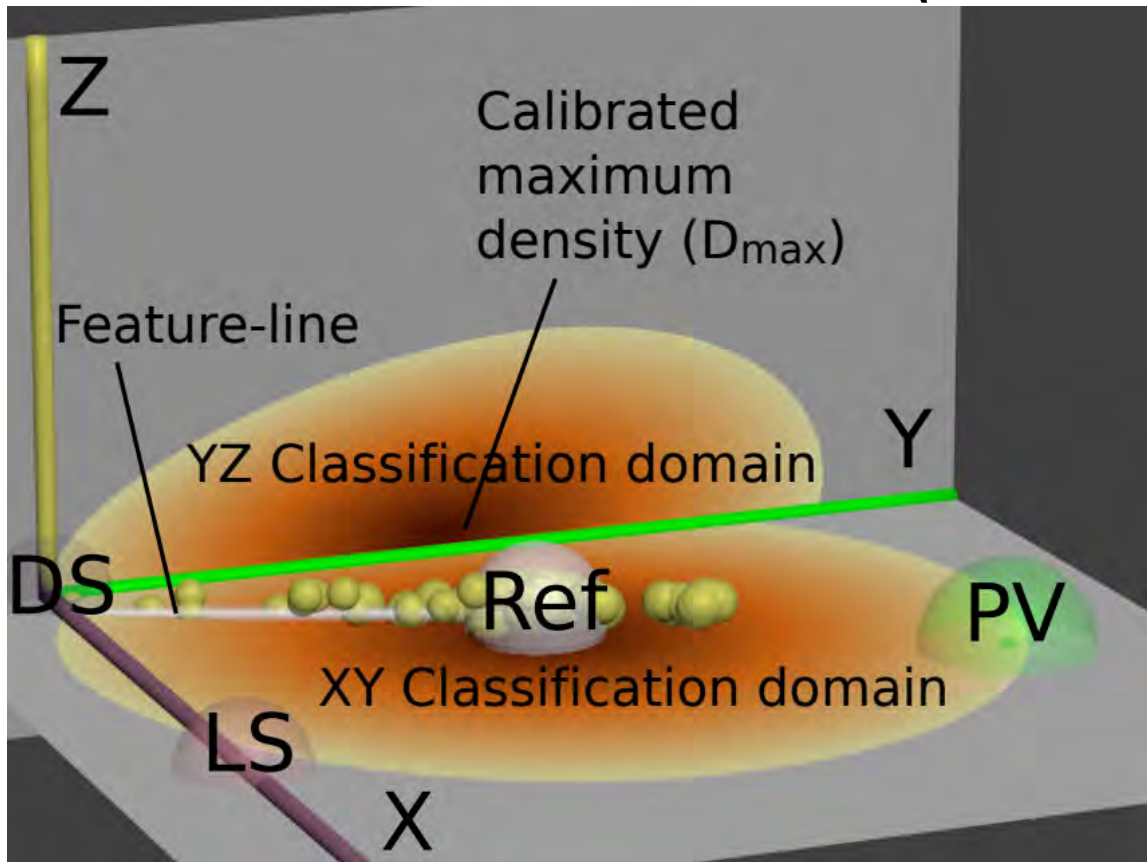


Transformed and Rotated Indexing of Density

# Deterministic biomass modeling from optical data

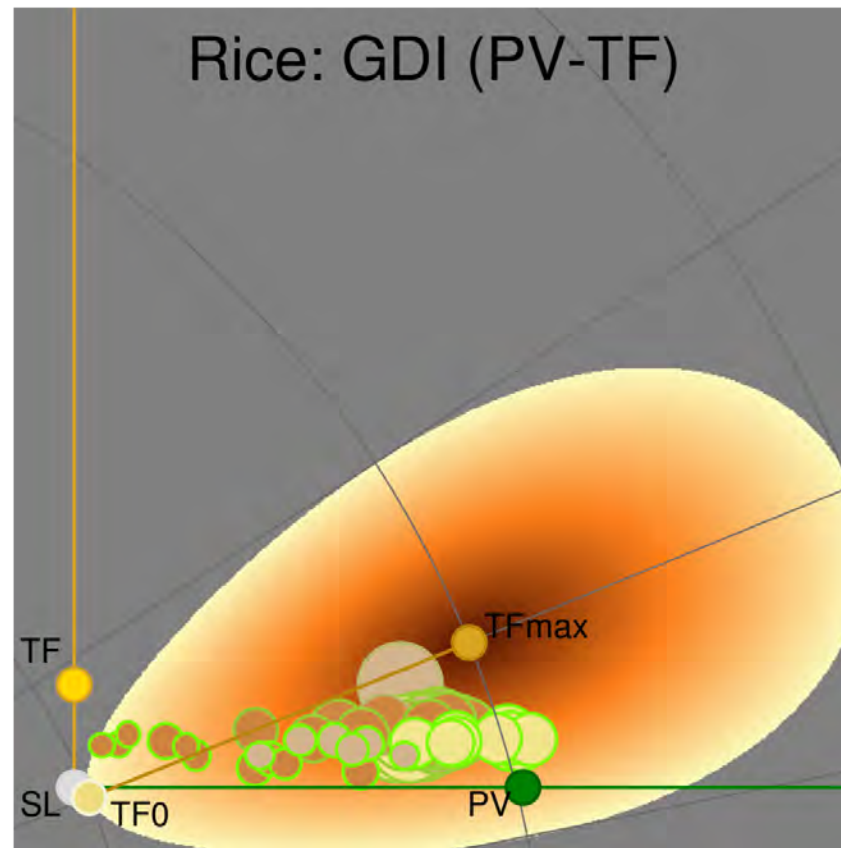
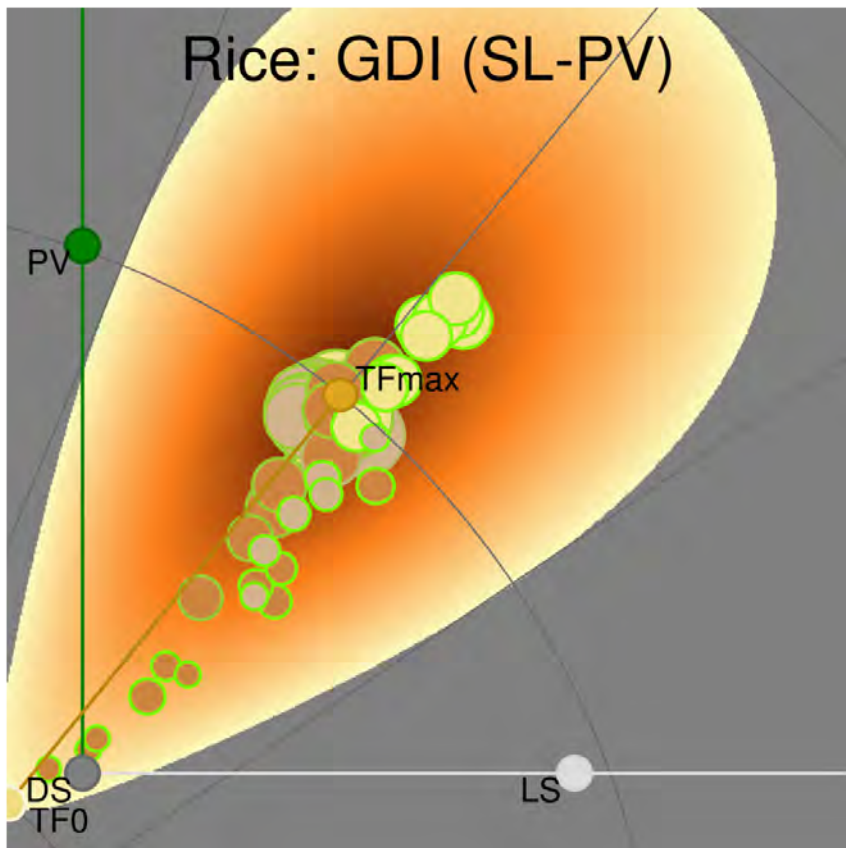


# Model for rice biomass (flooded conditions)



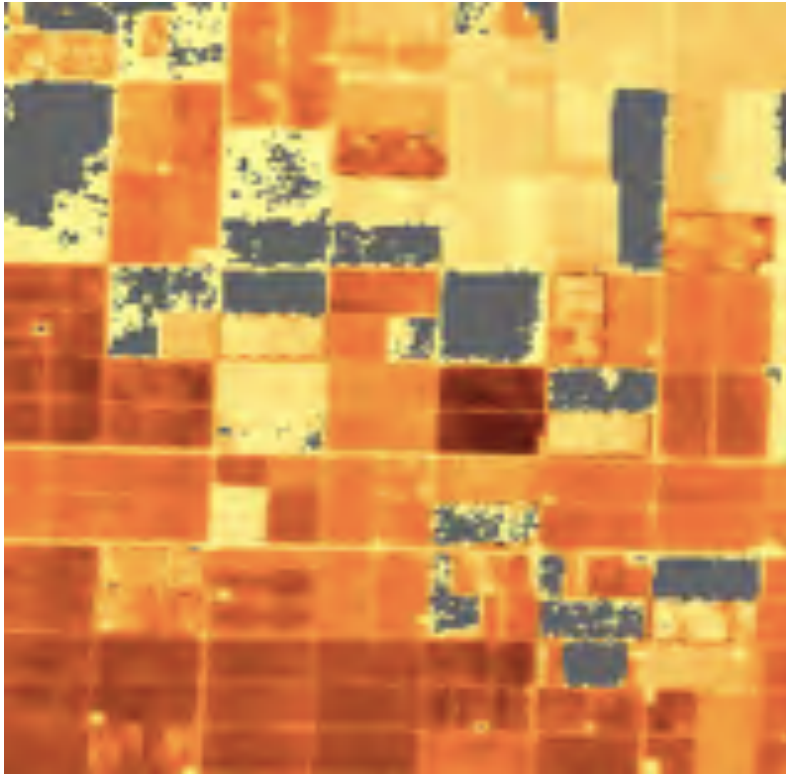
Transformed and Rotated Indexing of Density

# Model for rice biomass (flooded conditions)



Modeling of rice biomass for 3 fields in California

# *Biomass map for rice fields in California (single date)*

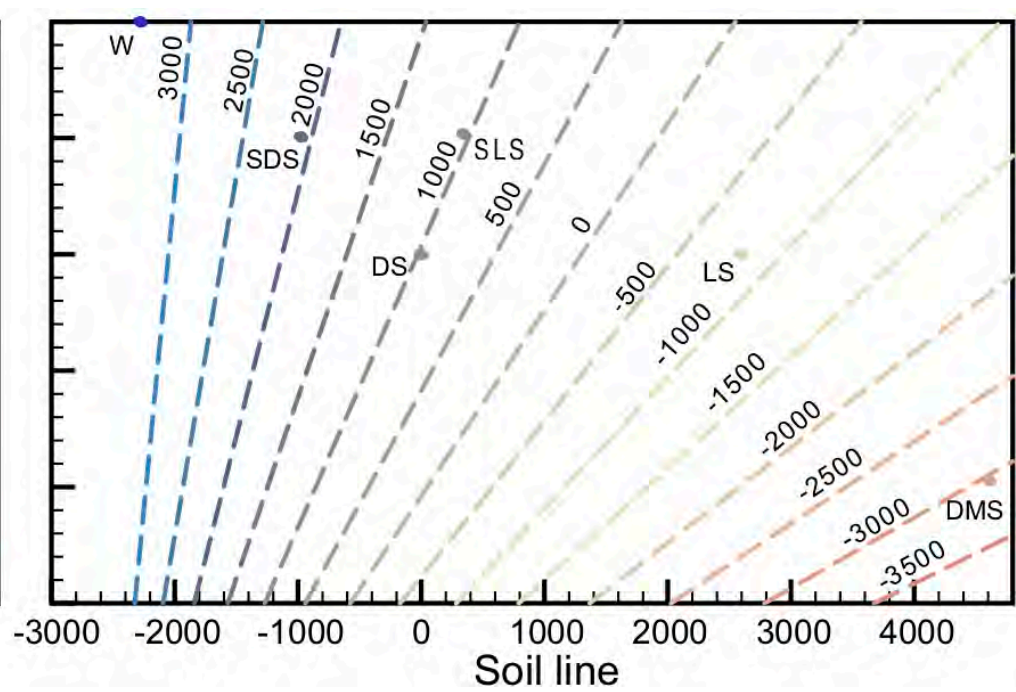
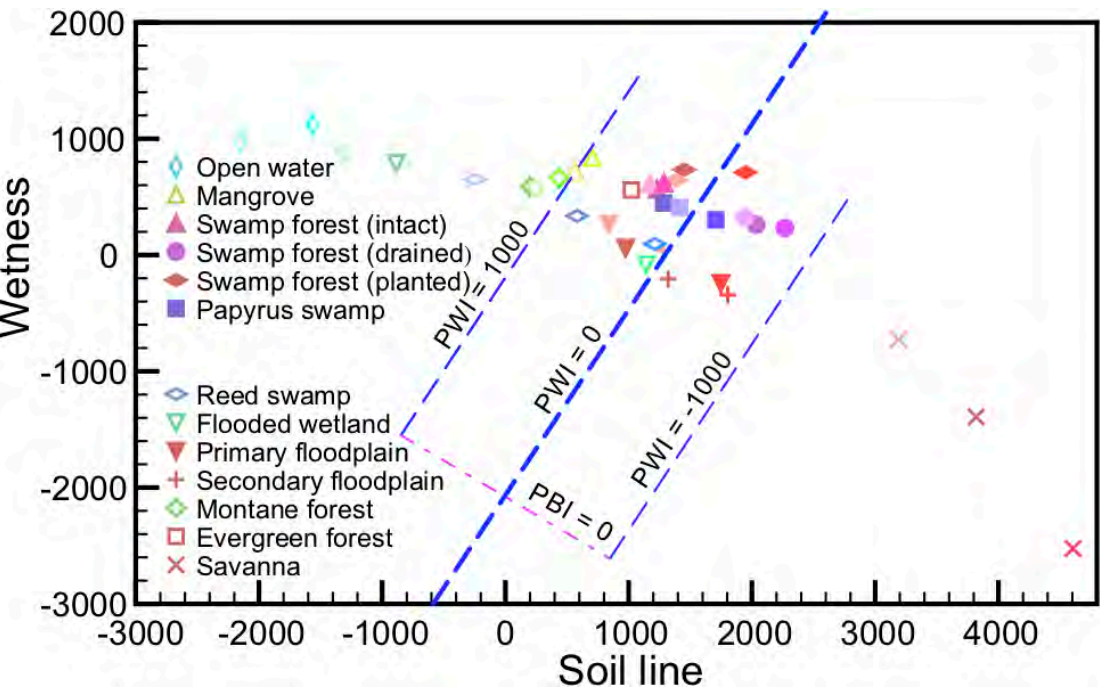


California Rice fields:

- Areas
- boundaries
- biomass

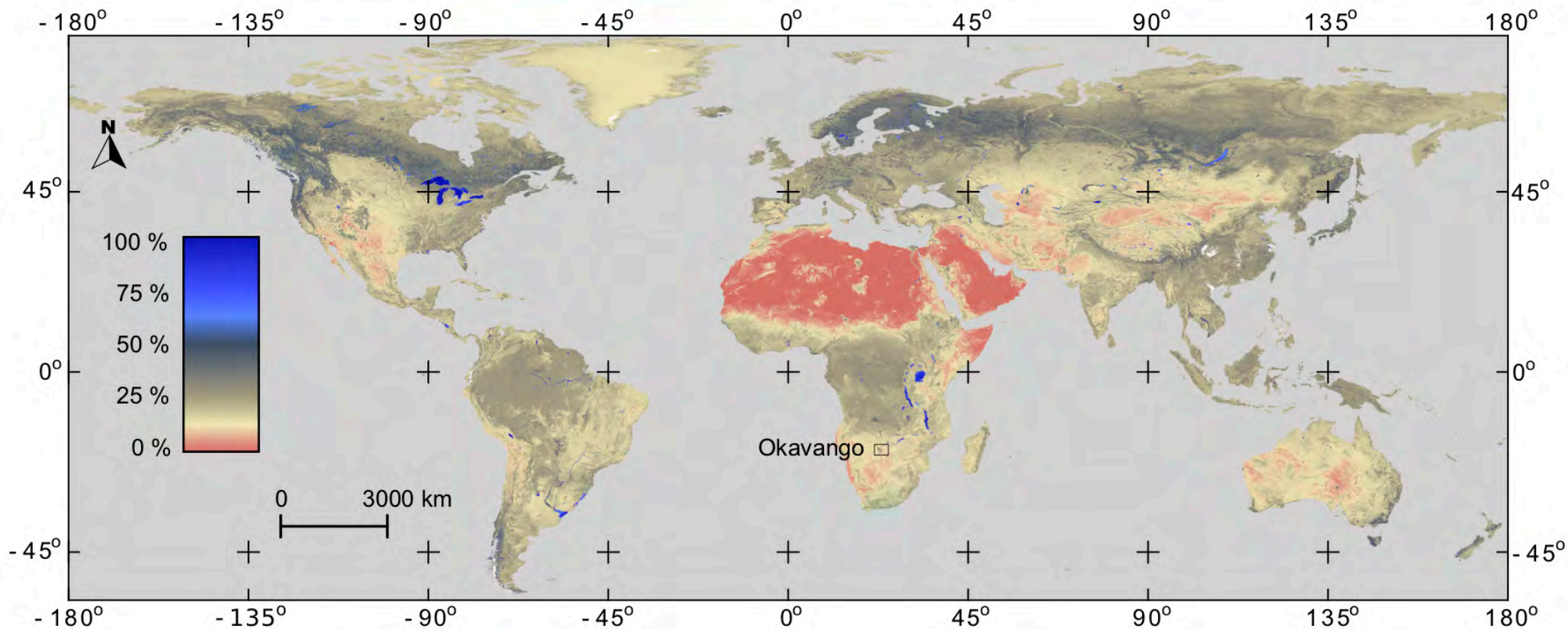
Transformed and Rotated Indexing of Density

# Model for soil moisture conditions for MODIS



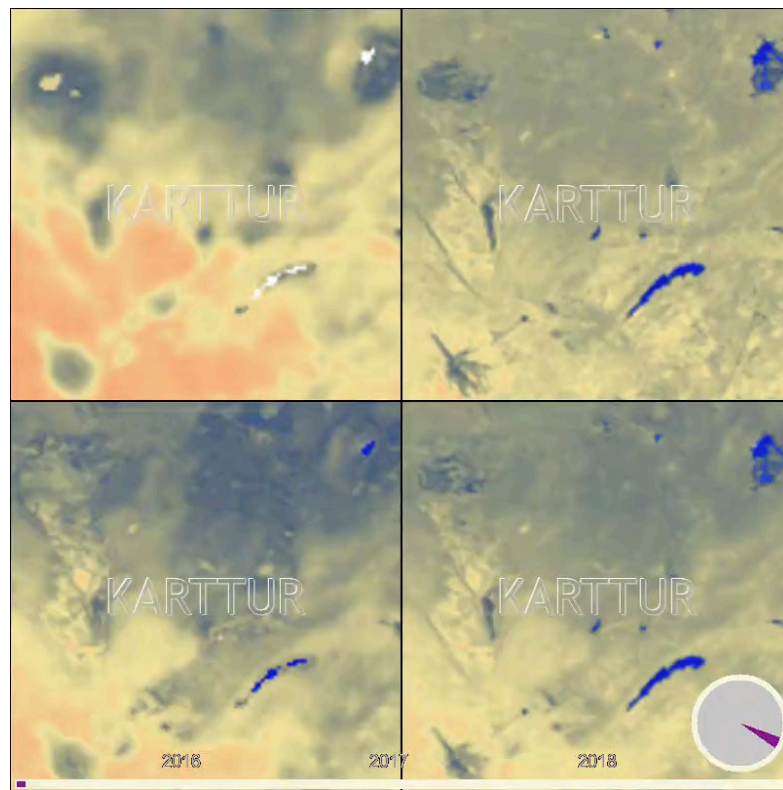
Transformed Wetness Index (TWI)

# *Transformed Wetness Index (TWI)*



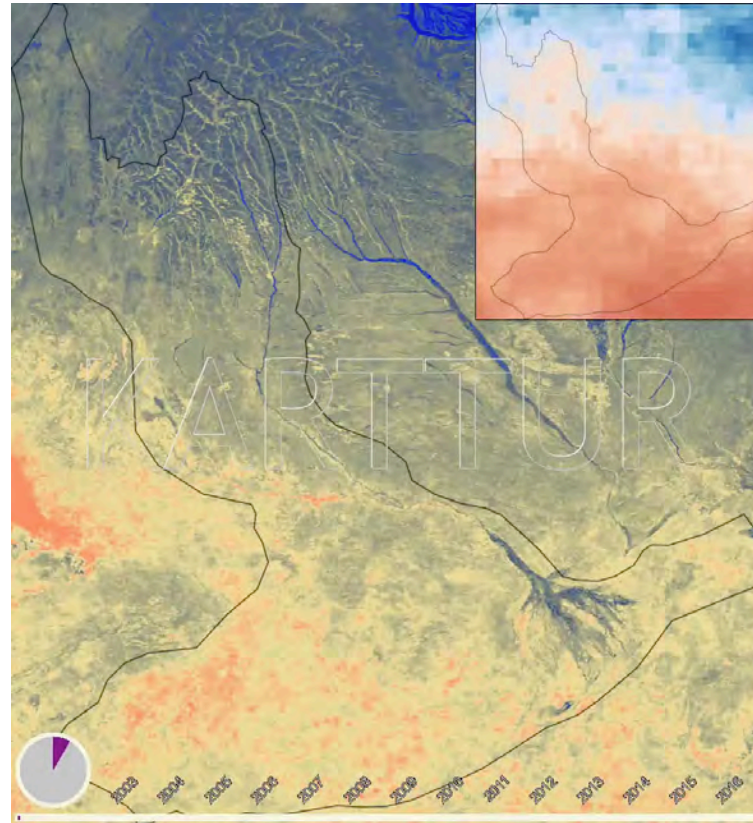


# Adjusting TWI bias using SMAP



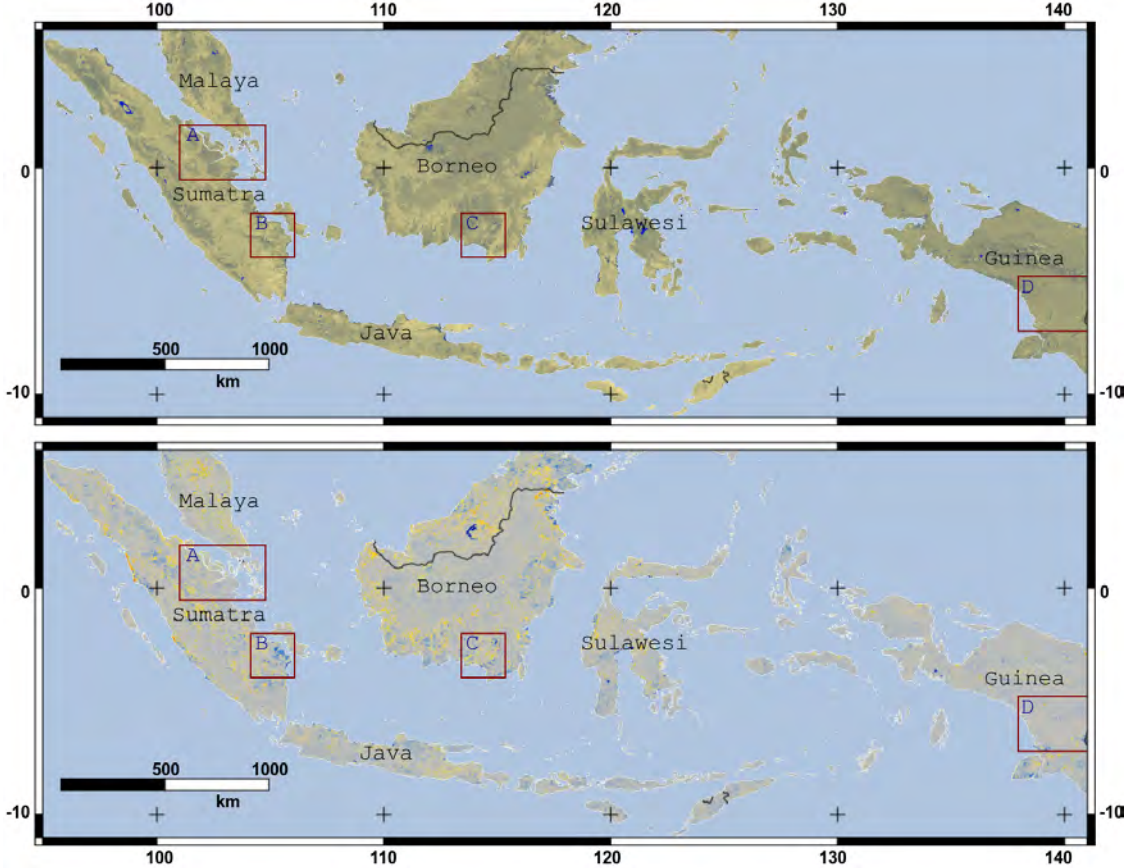
[https://karttur.github.io/common/movies/SMAPvsTWIx4\\_h20v10\\_2015121-2018361\\_002-modfit-9km.mp4](https://karttur.github.io/common/movies/SMAPvsTWIx4_h20v10_2015121-2018361_002-modfit-9km.mp4)

# Soil moisture dynamics at 500 m spatial scale



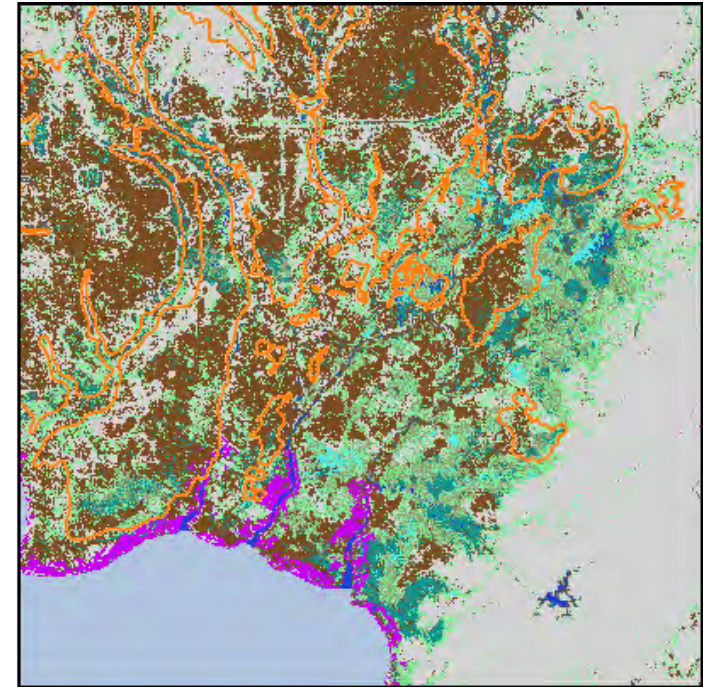
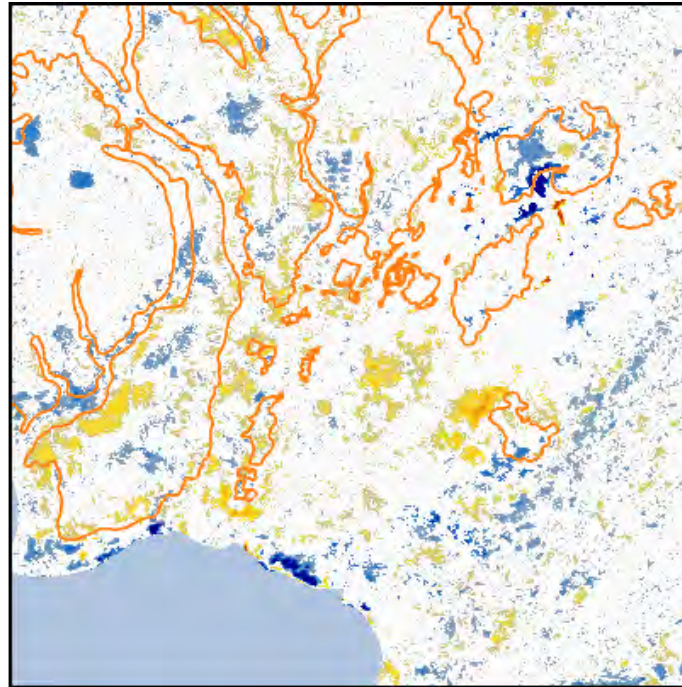
[https://karttur.github.io/common/movies/twi-vwb-clock-basin\\_mp4\\_oka-basin\\_2001-2016\\_MS.mp4](https://karttur.github.io/common/movies/twi-vwb-clock-basin_mp4_oka-basin_2001-2016_MS.mp4)

# Soil moisture map over Indonesia



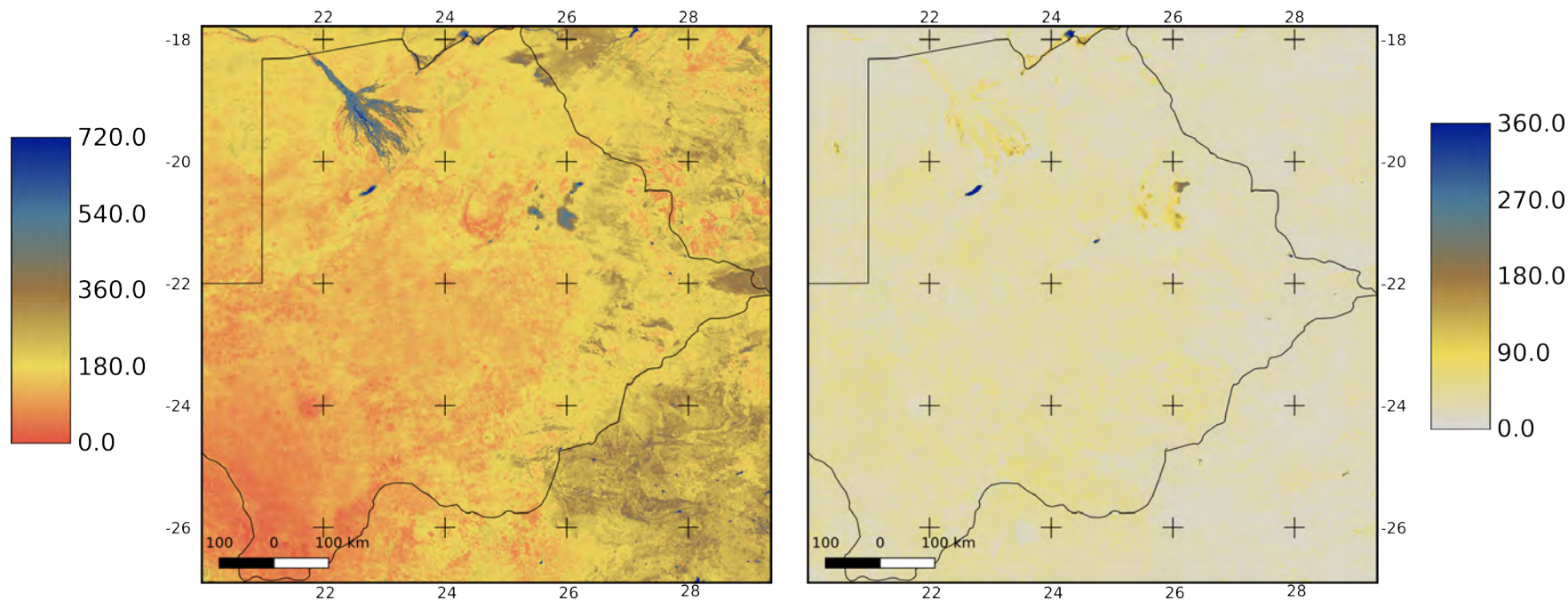
TWI and TWI change for Indonesia 2001 - 2016

# *Soil moisture and wetland maps: Mega Rice Project*



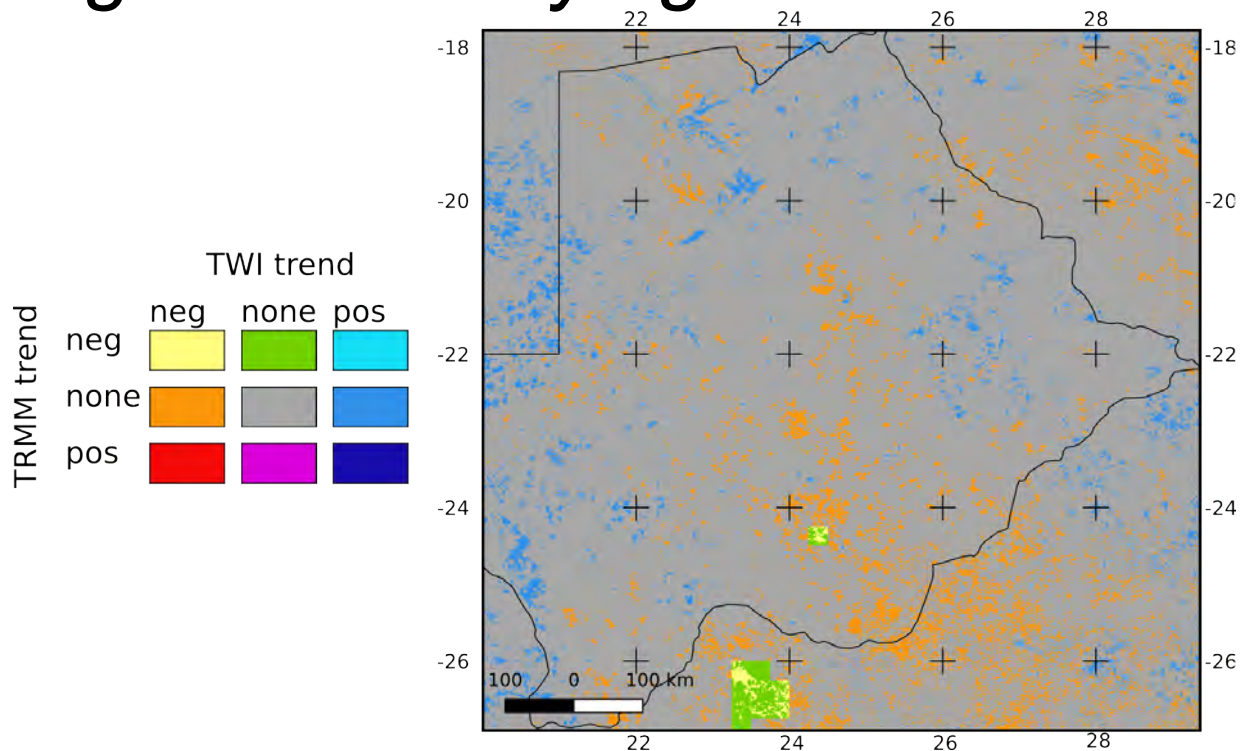
The Mega Rice Project in Indonesia (Borneo)

# *Rain Normalized Transformed Wetness Index*



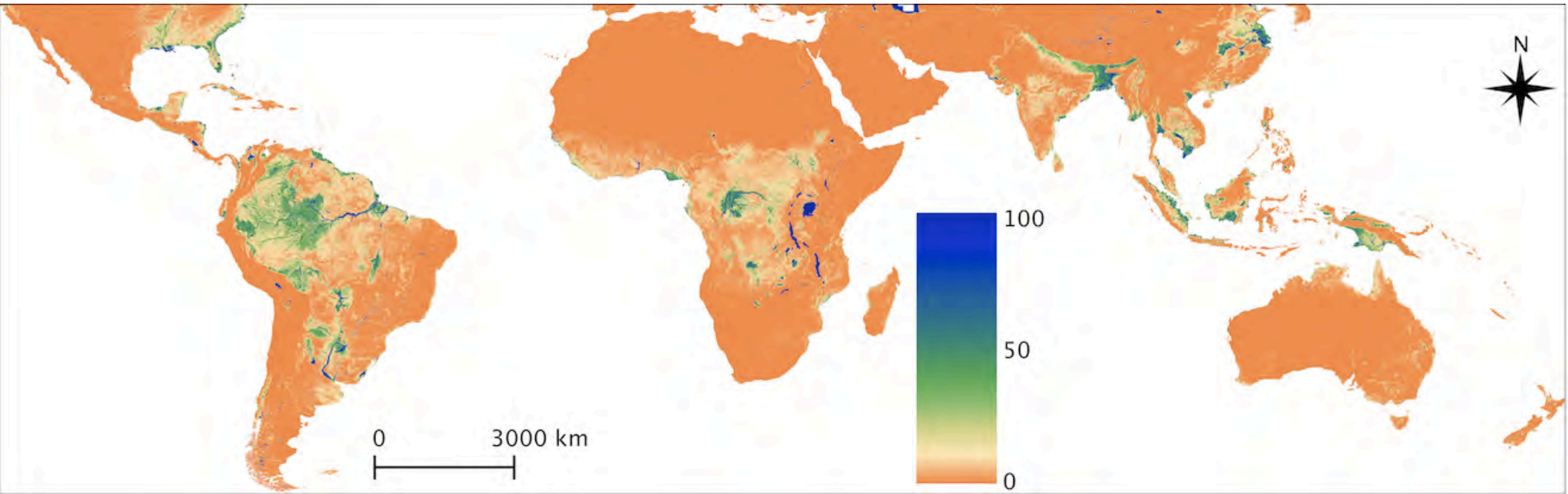
RNTWI for Botswana 2001 to 2016 (mean and standard deviation)

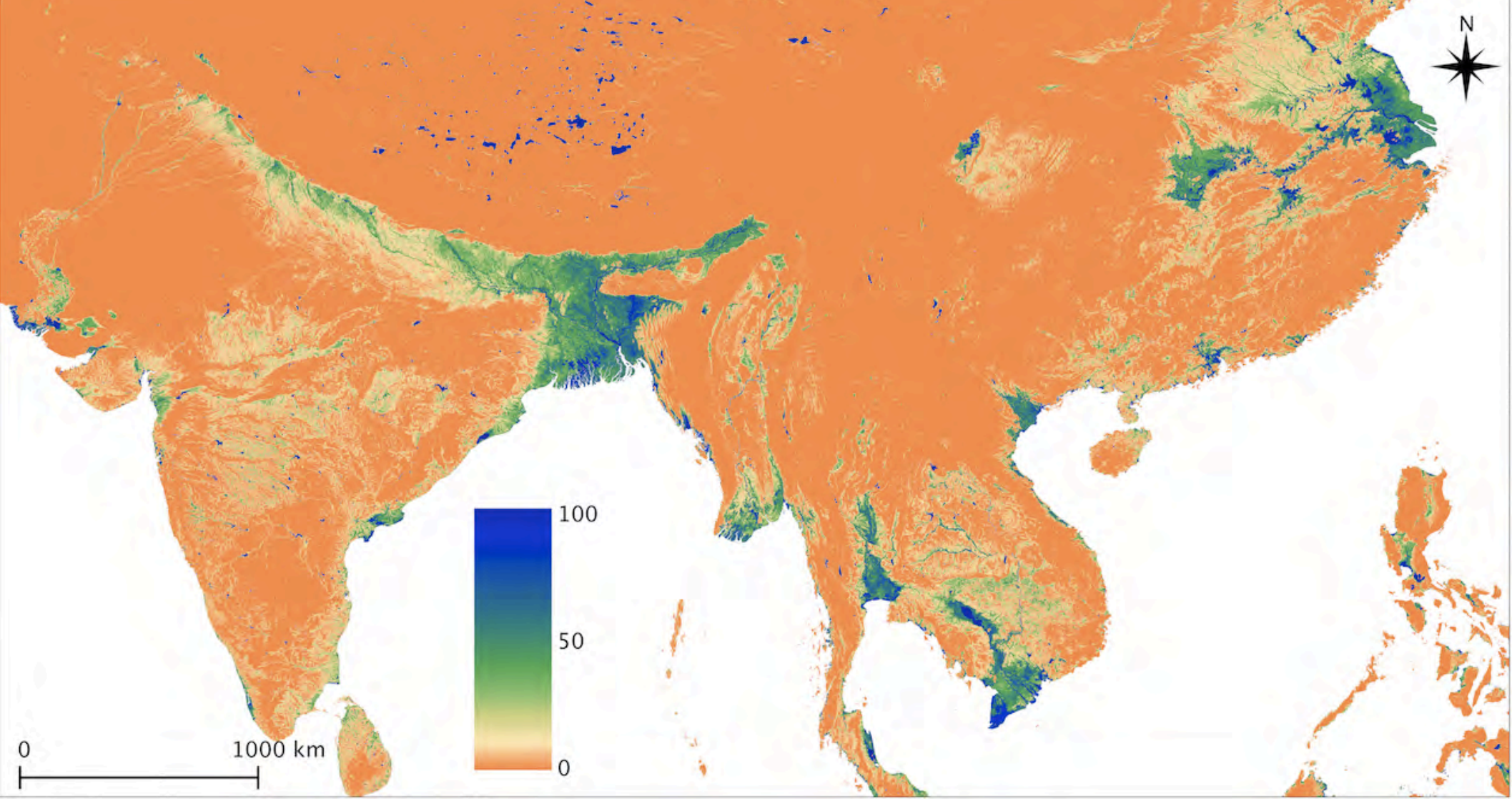
# Comparing and identifying drivers of moisture change



*Comparison of trends in soil moisture (TWI) and rainfall (TRMM) 2001 to 2016 for Botswana.*

# *Expert model of global tropical wetlands*



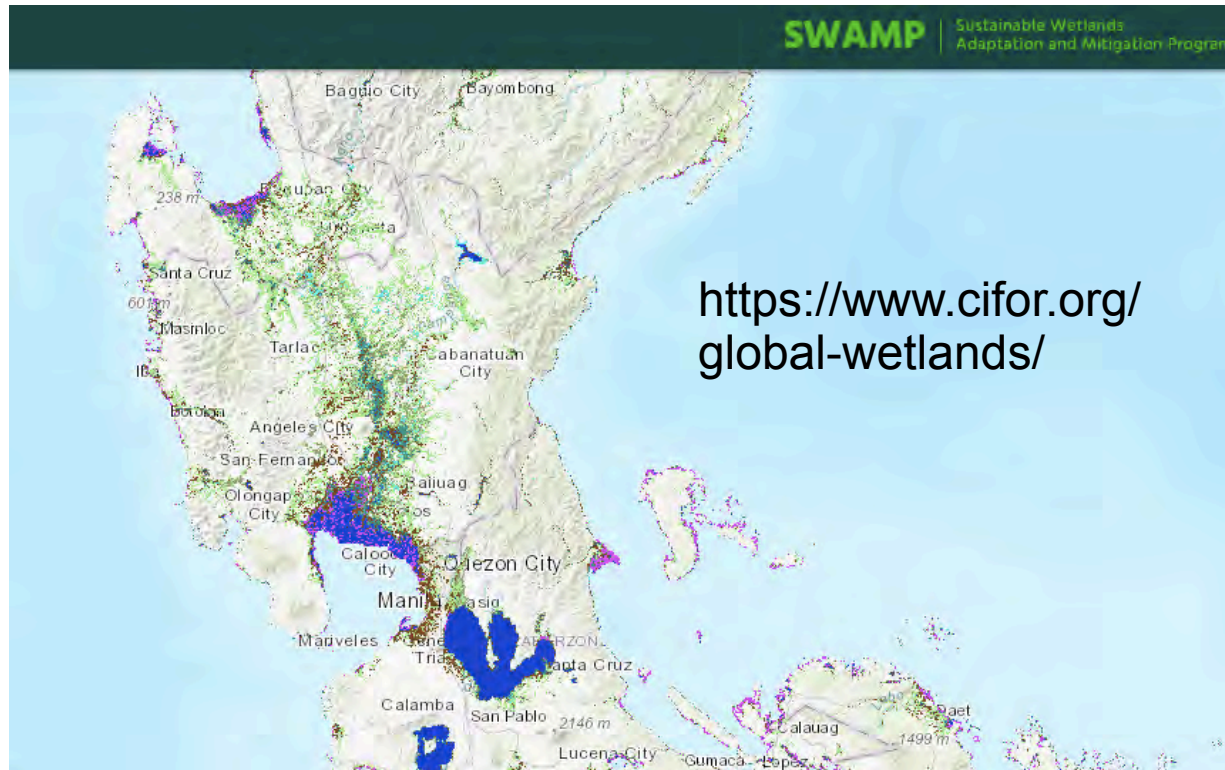


Thomas Gumbricht, May 2019

*Remote Sensing and Geospatial Innovations for Rice Based Agri-Food Systems*



# *The online version of the Global wetlands map*



# *Remote Sensing and Geospatial Innovations for Transforming Lives in Rice Based Agri-Food Systems*

*Genotype selection for local conditions (physical, medical and cultural)  
Real time monitoring for precision farming (mobile phones!, even as spectrometers?)*

*Soil health and nutrient mapping and assessment (mitigating As content in rice?)*

*Management for water conservation (considering CH<sub>4</sub>?)*

*Identify landscape suitability and cultural/economic markets*

*Adapting to climate change effects, including sea level rise and salinization, and changes in water regimes.*

# *Remote Sensing and Geospatial Innovations for Rice Based Agri-Food Systems*

Almost all maps and models, and how to make them, are available on my blog:

Anchor aweigh