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# The Challenge Of Ground Truth Data for Water Resource Management (West Africa)

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International Space Science Institute Workshop: "Global Change in Africa: Role of Space Observations", Bern, Switzerland January 12, 2021. Session 2: Water Resources in Africa

## 1. Journey to a place









ent 3. Large scale model improved with remote sensed data





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4. Solution: Think about scale and participation









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#### **Eddy Covariance**

- Goal: Observe Turbulent Fluxes, understand variations
- 2 Stations, May 2009 October 2010
  - Gallery Forest
  - Agricultural Field
- 1 Station, July 2011 November 2013
  - Agricultural Field



### Limited direct measured of Evapotranspiration



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Available Stations in the Region

- Little or no availability of EC data
- National Weather Station data is scarce, or unreliable

## **Energy Balance**





- Eddy Correlation, planar fit
- Sensible and Latent Heat Fluxes

 $H = \hat{\rho}c_{p}\overline{w'T'}$  $L_{e}E = L_{e}\hat{\rho}\overline{w'q'}$ 

- Measure Net Radiation
- Ground Heat = Remainder Energy Balance
- Scale depends on wind, up to 50 m distance upwind



 $G = R_n - L_e E - H$ 

## Eddy- Covariance Measurements World Wide



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## Two stations over two land-covers: forest and field $u^{\scriptscriptstyle b}$



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### The Diurnal Cycle of Energy Balance over Forest vs. Agriculture







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- Sensible heat (H, blue, [W/m2])
- Latent heat (LeE, green, [W/m2])
- Net radiation (Rn, red, [W/m2])
- Residual = Rn H LeE (Res, turquoise, [W/m2])
- Half hour calculation of evaporative fraction, averaged between 10 and 14h

## **Comparison of wind directions**

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# Comparison with calculations from ground based measurements





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Suppressed convective rainfall by agricultural expansion in southeastern Burkina Faso Mande, T. et al. Water Resources Research, Volume: 51, Issue: 7, Pages: 5521-5530, First published: 19 June 2015, DOI: (10.1002/2015WR0171 44)

## **Seasonal Change in NDVI**



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## Indirect measures of evaporation: Weather station data

### TAHMO weather station data



TAHMO, with goal to install 20000 weather stations in Africa.

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Algorithms to determine PET, AET, ET0 depend on various combinations of meteorological variables, for example:

- Penman, Menman Monteith, Shuttleworth, Brutsaert-Strickler and others: Tmin – Tmax, Rs, Uz, Rhmin, Rhmax
- Priestley-Taylor: Tmin Tmax, Rs, Rhmin, Rhmax
- Others require sunchine hours, Dew Point temperature, and pan-evaporation
- => Limited by quality of data and appropriateness for algorithm



Advances in Water Resources Volume 143, September 2020, 103667



Potential of satellite and reanalysis evaporation datasets for hydrological modelling under various model calibration strategies

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## Total annual actual evaporation $(E_a)$





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- gridded evaporation datasets
- Volta River basin
- Averaged 2003-2012
- min-max normalization

## Hydrological Model Performance with Evaporation



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MOD16A2 JRA-55 SSEBop ALEXI • CMRSET 6 106 SEBS GLEAM v3.3b

GLEAM v3.3a

GLEAM v3.2a

MERRA-2

ERA5

GLEAM v3.2b

- Values give the relative difference in model performance as compared to the Q-only calibration
- MERRA-2, GLEAM v3.3a and SSEBop improve model performance most
- Spatial patterns of gridded evaporation data for calibration, vs. absolute values, => higher performance than basin average evaporation signal or based only on streamflow



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### Comparison of satellite data sets

Spatial Temporal Temporal Datasets Name/ Data portal **Spatial coverage** resolution coverage resolution Moderate Resolution Imaging Spectroradiometer (MODIS) Global 0,0085° MOD16A2 2001-2014 Monthly Global **Terrestrial Evapotranspiration** (~1 km) Algorithm version 5 **Operational Simplified Surface** 0.0083° 2003-2014 SSEBop (FEWS) Global Monthly **Energy Balance** (~1 km) 0.05° Atmosphere-Land Exchange ALEXI 70° N-60° S 2003-2015 Monthly Inverse (~5.6 km) **CSIRO MODIS Reflectance Scaling** 0.05° CMRSET 2001-2013 Global Monthly EvapoTranspiration (~5.6 km) 0.05° Surface Energy Balance System 2001-2012 SEBS 40° N-40° S Monthly (~5.6 km) **Global Land Evaporation Amsterdam** 0.25° 1980-present GLEAM v3.2a - 3.3b Global (dep. Version) Daily (~28 km) (dep. Version) Model

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# Comparison Evaporation from Eddy-Correlation and FEWS, Gleam, and MOD-16A2 data





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## Pairwise Corelation Coefficients by Product and Site





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# Could an algorithm based on the object identification (tree) paired with a model based on processes work better?



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- 50,000 DigitalGlobe multispectral images from the QuickBird-2, GeoEye-1, WorldView-2 and WorldView-3 satellites, collected from 2005–2018 (in November to March) from 12° to 24° N latitude within Universal Transverse Mercator zones 28 and 29
- Classified with deep learning

## An unexpectedly large count of trees in the Brandt et al., <u>Nature</u> volume 587, pages78–82 (2020) West African Sahara and Sahel

## Solution:

# Combine large scale, remotely sensed data and corresponding models with:



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2. Citizen-based field observations

i.e. Water Accounting Plus Water Accounting

Independent estimates of water flows, fluxes, stocks, consumption, and services

3. Innovative frameworks between data, research, policy

## Summary

- 1. Field measurements (eddy covariance) show high variability
- 2. At large scale, ET improves model performance
- 3. Difficult to validate with field measurments at this point
- 4. Solution: Adjust scale, citizen-based validation



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#### **Key Publications:**

- Ceperley, N., T. Mande, N. Van de Giesen, S.W. Tyler, H. Yacouba, and M.B. Parlange. "Evaporation from Cultivated and Semi-Wild Savanna in West Africa." *Hydrology and Earth System Sciences* 21 (2017). <u>https://doi.org/10/gbtpk7</u>.
- Dembélé, Moctar, Natalie Ceperley, Sander J. Zwart, Elga Salvadore, Gregoire Mariethoz, and Bettina Schaefli. "Potential of Satellite and Reanalysis Evaporation Datasets for Hydrological Modelling under Various Model Calibration Strategies." *Advances in Water Resources* 143 (September 1, 2020): 103667. <u>https://doi.org/10/gg3jtk</u>.

