

# Developing a Long-term Global Reservoir Product Series by Fusing Multi-Satellite Observations

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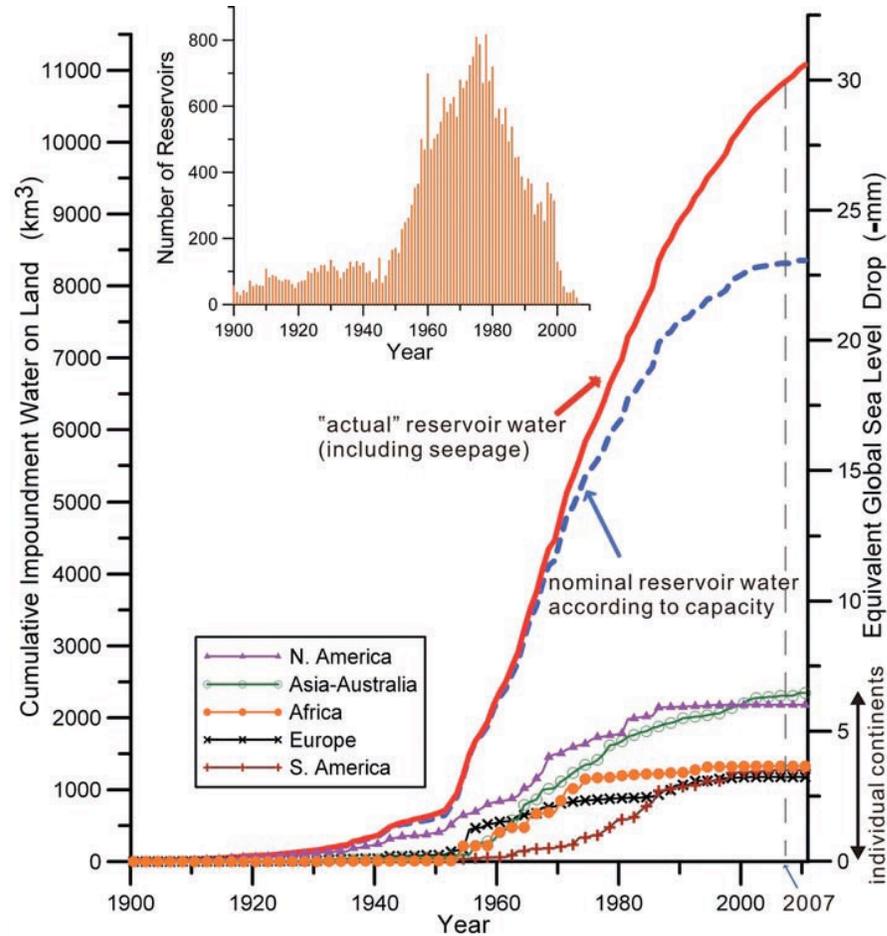


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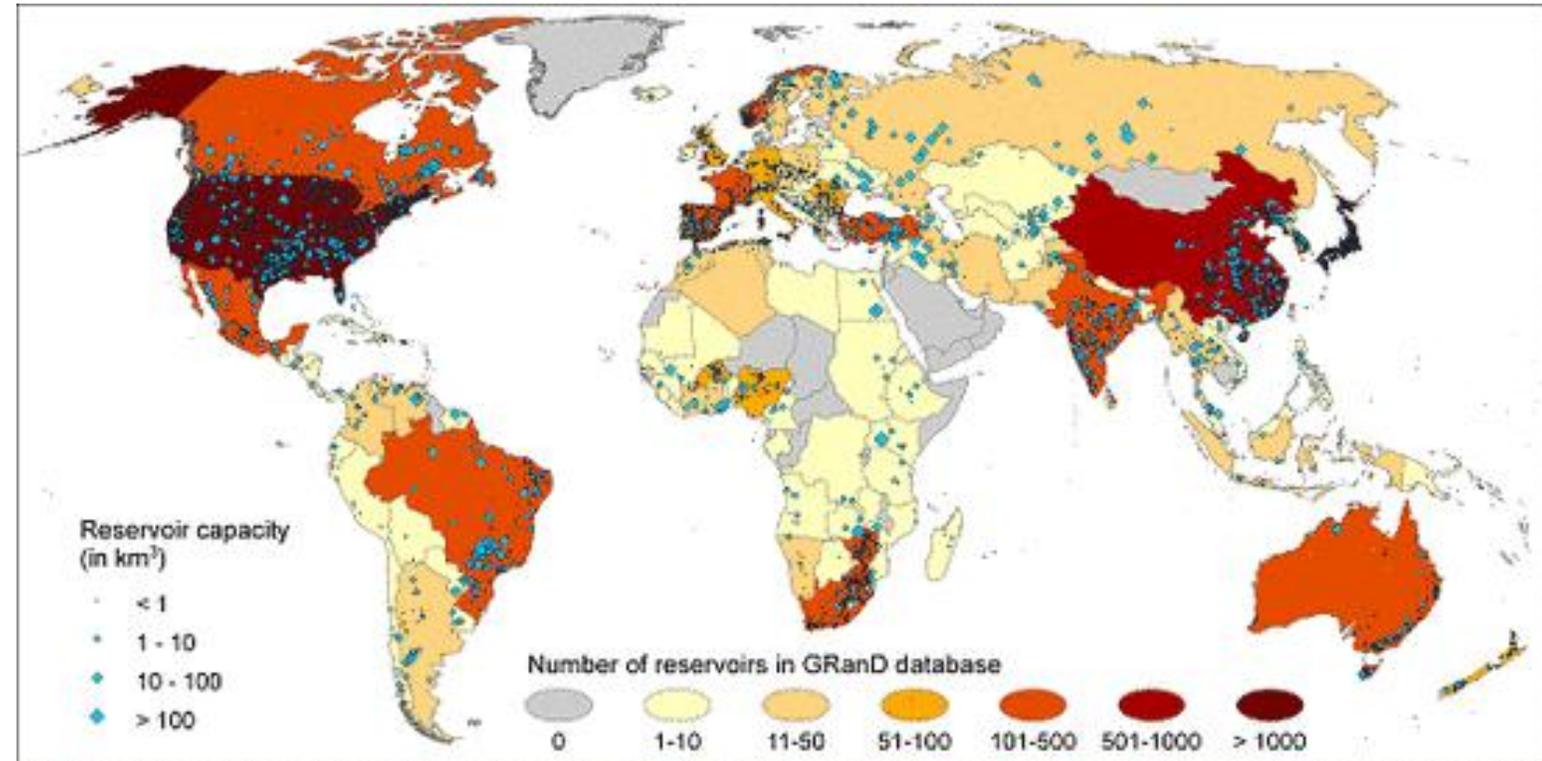
# Global Reservoirs

## Global Reservoir and Dam (GRanD) Database

Global capacity > 6200 km<sup>3</sup>



Chao et al., 2008



Lehner et al., 2011

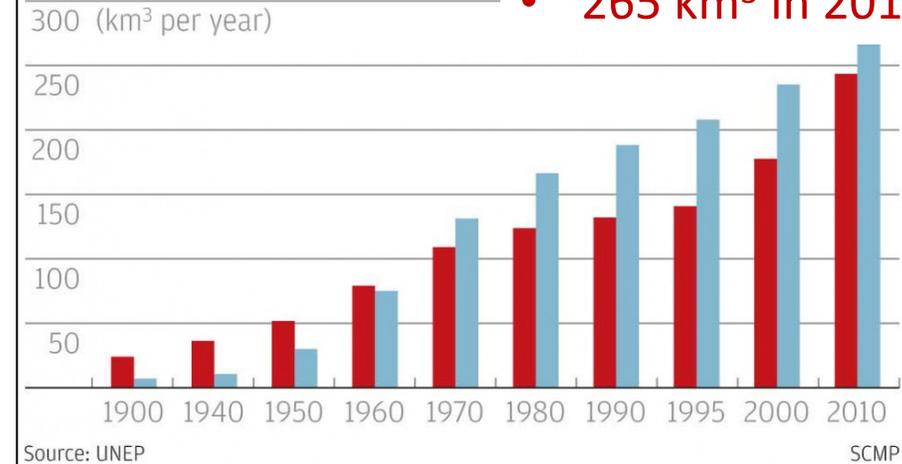
# Reservoir Storage vs. Reservoir Evaporation



## A global phenomenon

- Industrial and domestic consumption
- Evaporation from reservoirs

- Evaporation > Industrial + Domestic
- ~265 km<sup>3</sup> in 2010



- Lake Mead annual evaporation = 791,000 acre-feet

# Motivation

## Limited data availability

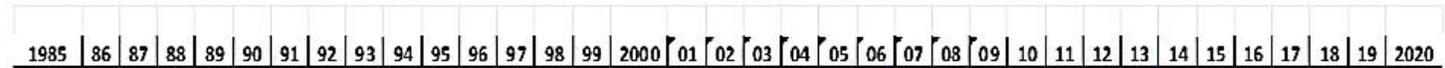
- We hardly know anything about the reservoir storage in some regions (e.g. developing regions with conflicts of interest)
- Different reservoirs are operated using different rules, but information about operating rules are usually not shared
- In situ reservoir evaporation data is extremely limited

## Targeted Science Applications

- Drought and flood monitoring
- Water resources management
- Hydrological modeling
- Coupled atmospheric-hydrologic modeling
- Hydrodynamic modeling
- Ecosystem service

# Water Surface Elevation from Radar Altimetry

## General Timeline for Satellite Radar Altimeters with Short Repeat Periods



TOPEX/Poseidon (NASA/CNES)

Jason-1 (NASA/CNES)

OSTM/Jason-2 (NASA/CNES)

Jason-3 (NASA/CNES)

Poseidon (different orbit)

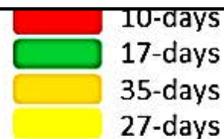
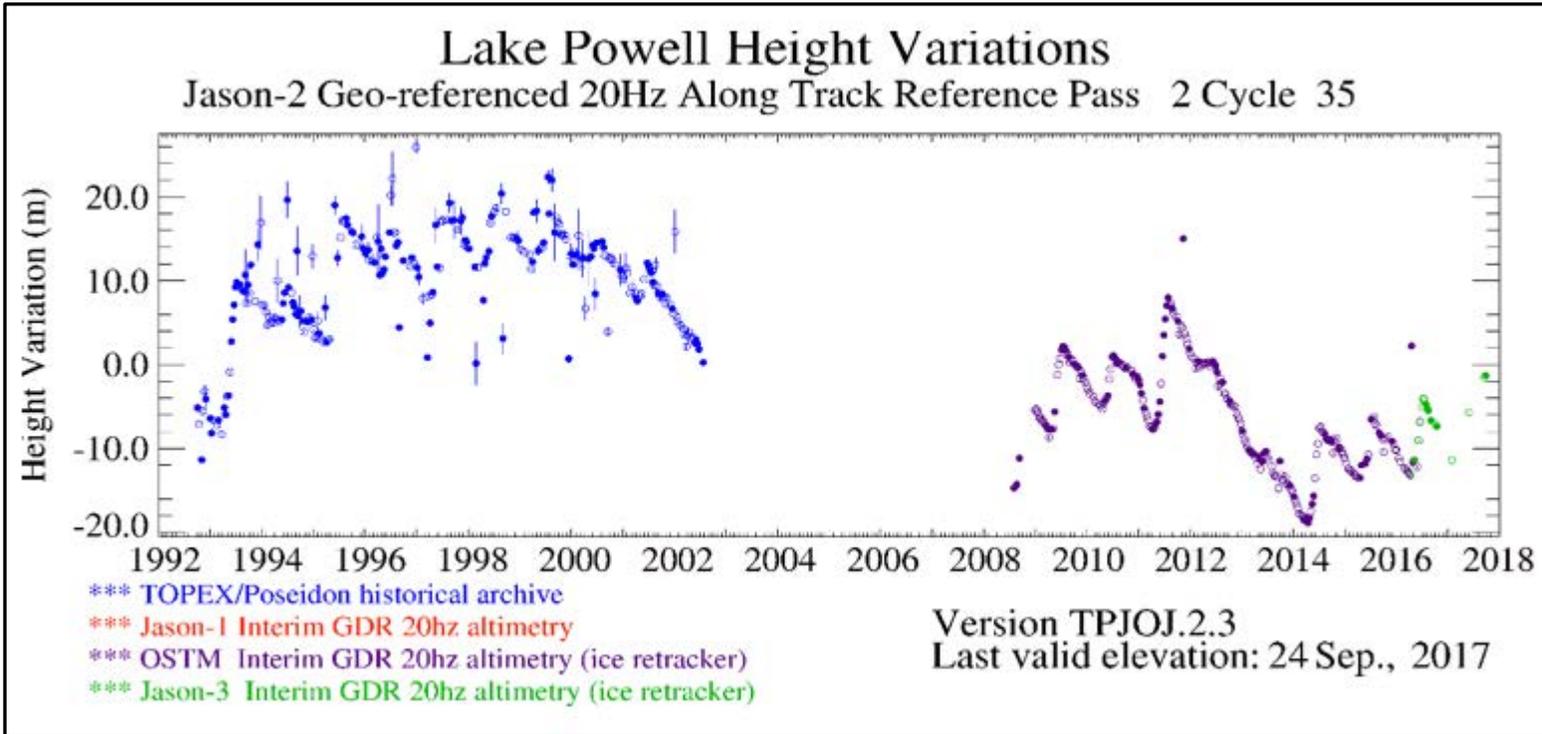
Jason-1 (different orbit)

Sw-On (GFO/US Navy)

ENVISAT (ESA)

SARAL (ISRO/CNES)

Sentinel-3 (ESA)

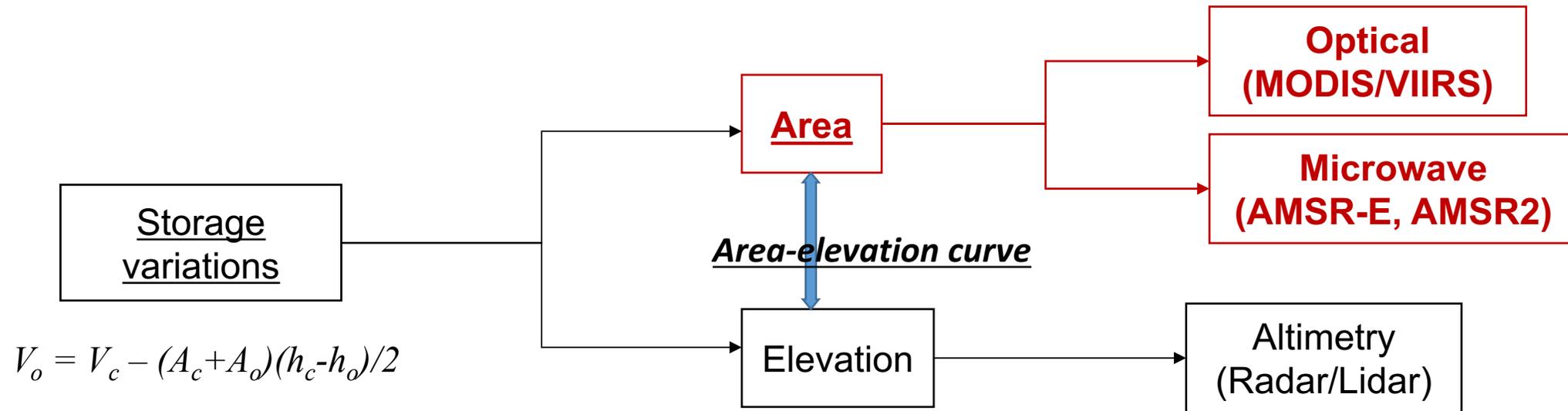


# Objectives

To generate *a comprehensive, coherent, and long term global reservoir product series* at improved spatial coverage (and at improved temporal resolution) by combining **MODIS/VIIRS** observations with data from other satellite sensors.

- Develop a long term reservoir storage variation dataset under all-weather conditions.
- Generate a **first** long term record of the reservoir evaporation rate and the evaporation loss.
- Validate the reservoir product series and quantify the uncertainties associated with the datasets.

# Reservoir Storage Variations

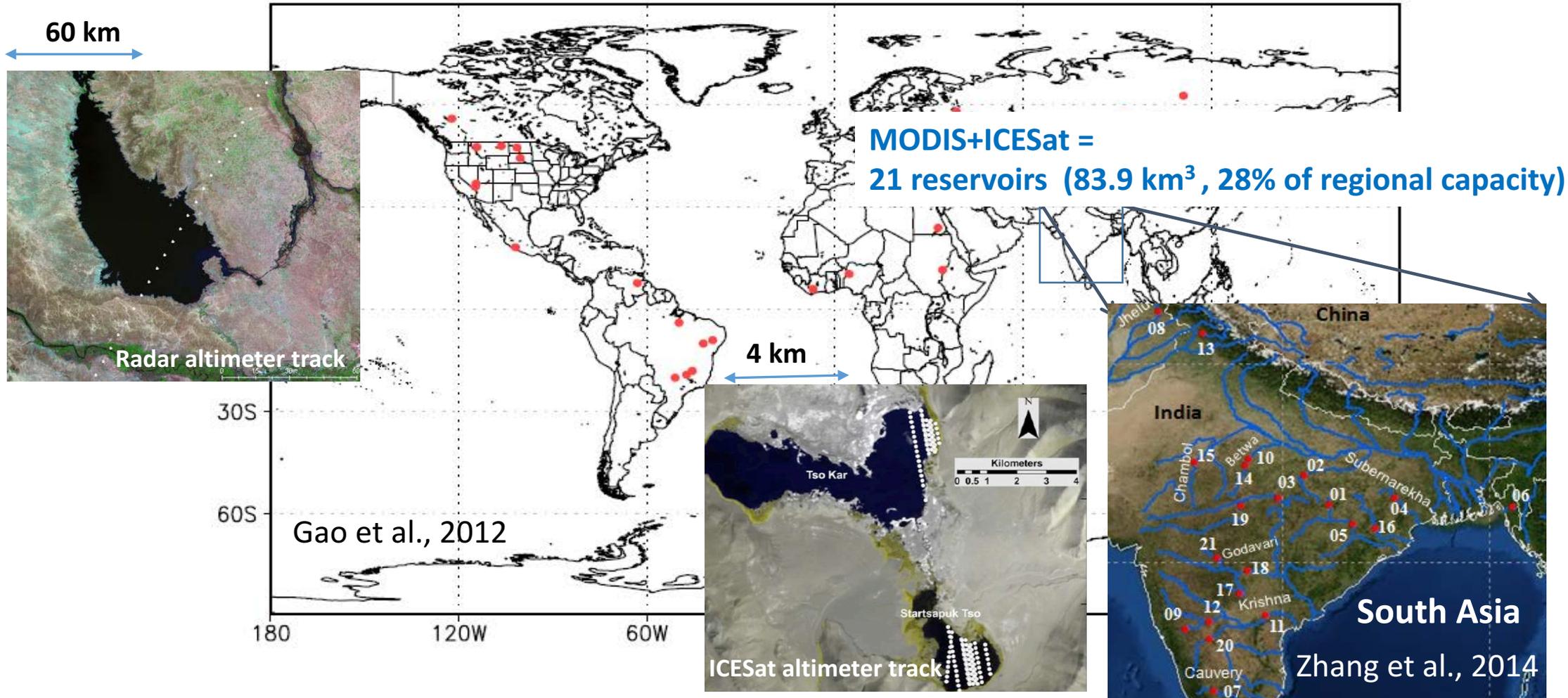


Available global reservoir storage variation datasets

Dataset	Number	Sensors	Period
Cretaux et al 2011 (Adv. Space Res)	15	Various imagers + radar altimeters	1992- 2011(present)
Gao et al. 2012 (WRR)	34	<b>MODIS</b> + radar altimeters	1992-2010
Busker et al. 2018, (HESS)	135 (including lakes)	Landsat + radar altimeters	1984-2011

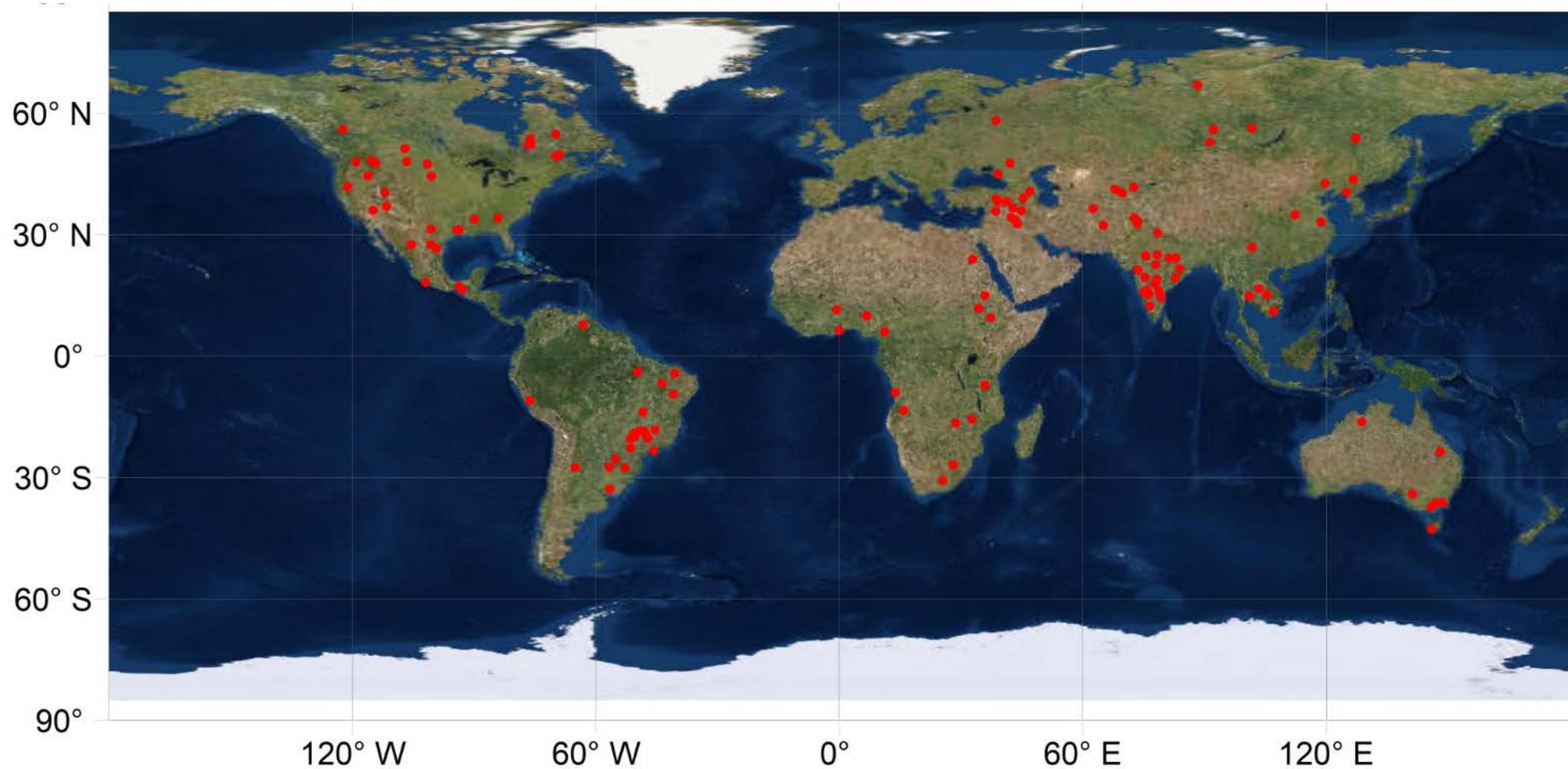
# Improving the Spatial Coverage of the Product

MODIS + Radar altimeter = 34 reservoirs (1164 km<sup>3</sup>, 19% of global capacity)



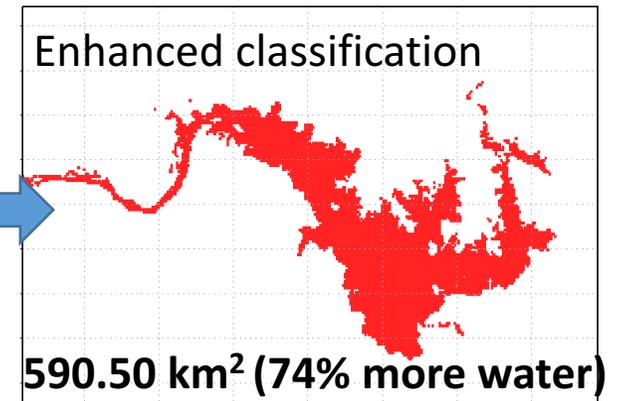
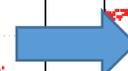
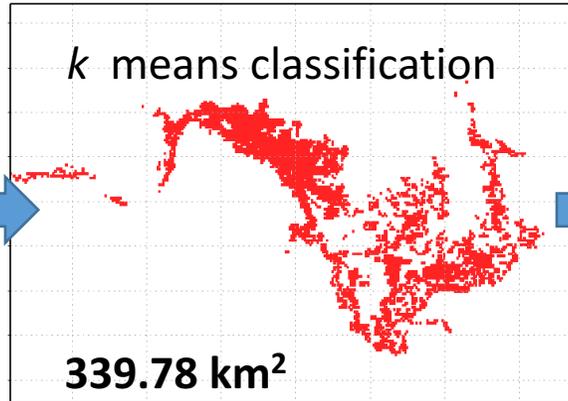
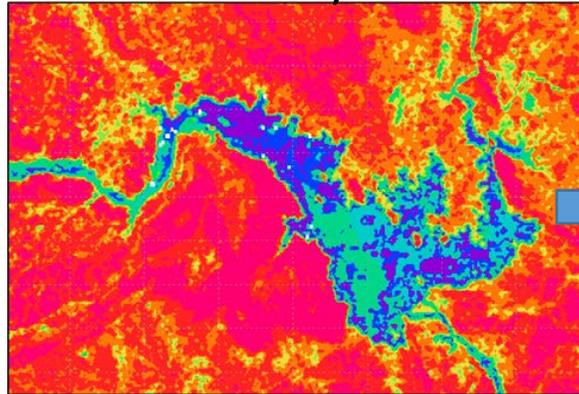
# Improving the Spatial Coverage of the Product

MODIS + Radar altimeter & ICESat = 180 reservoirs (2880 km<sup>3</sup>, 46.5% of global capacity)

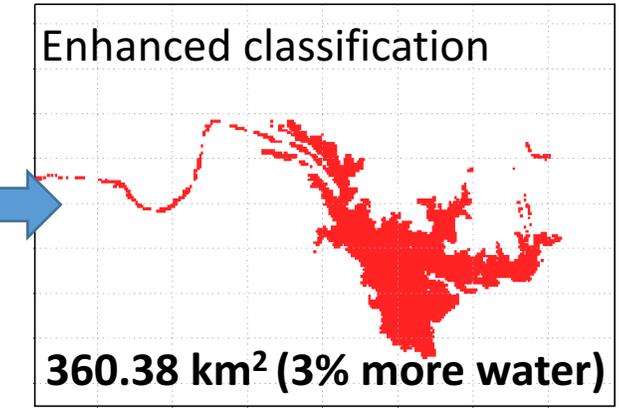
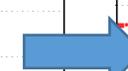
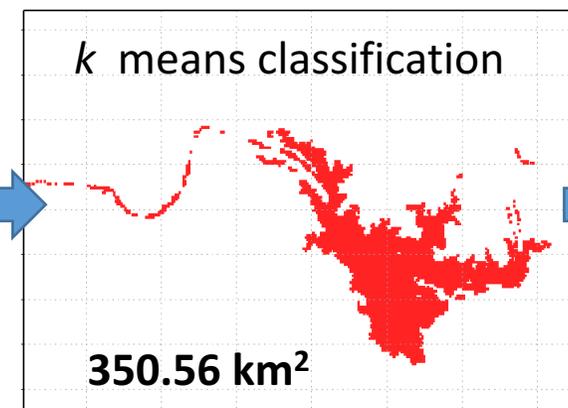
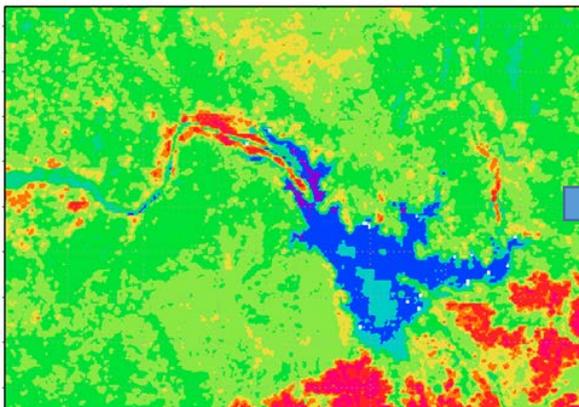


# Reservoir Area from MODIS

MODIS NDVI on day 273 in 2005



MODIS NDVI on day 097 in 2005



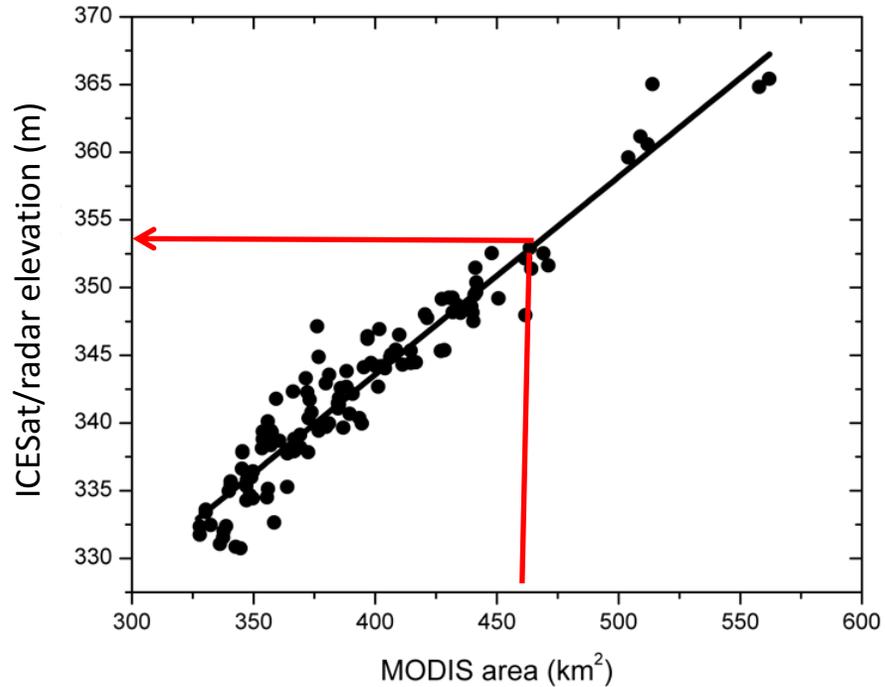
# Towards a Continuous Storage Data Record

## Area-elevation relationship

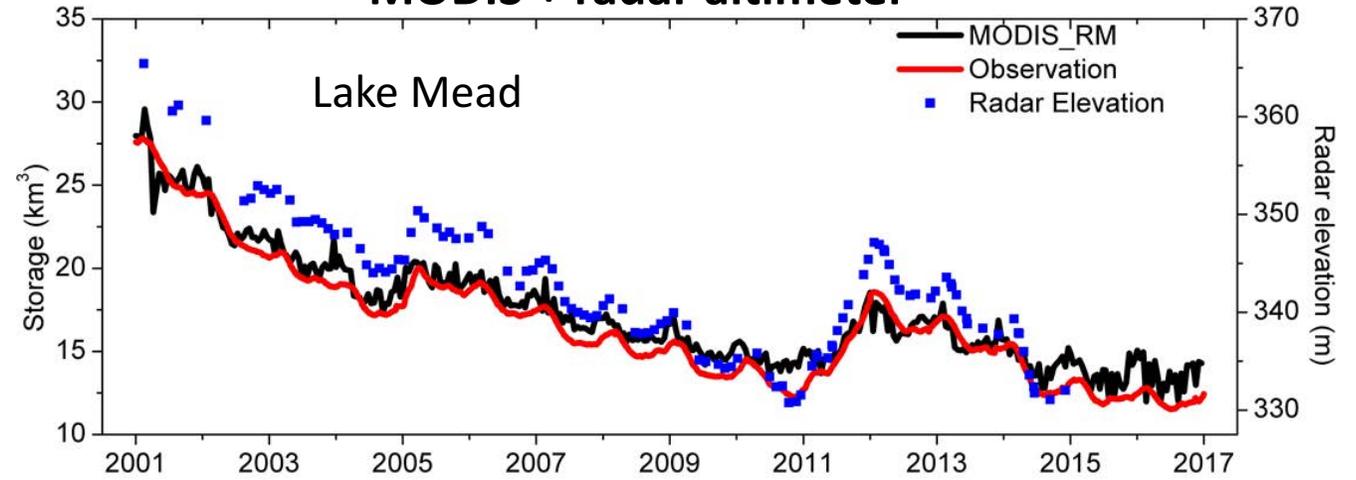
$$h = f(A)$$

## Storage Estimation

$$V = g(A)$$

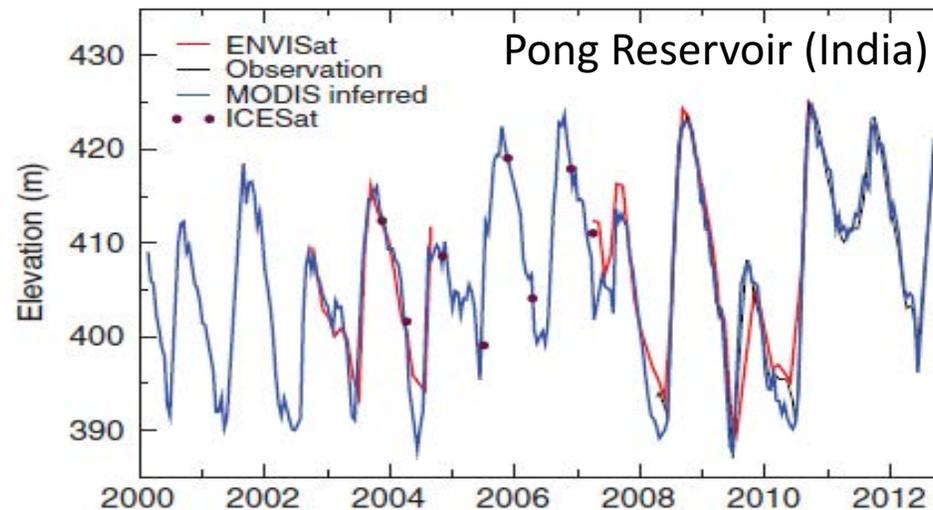


## MODIS + radar altimeter



Li et al, 2017

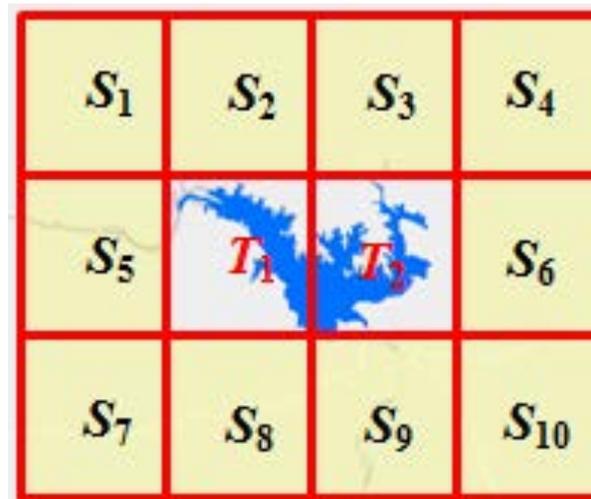
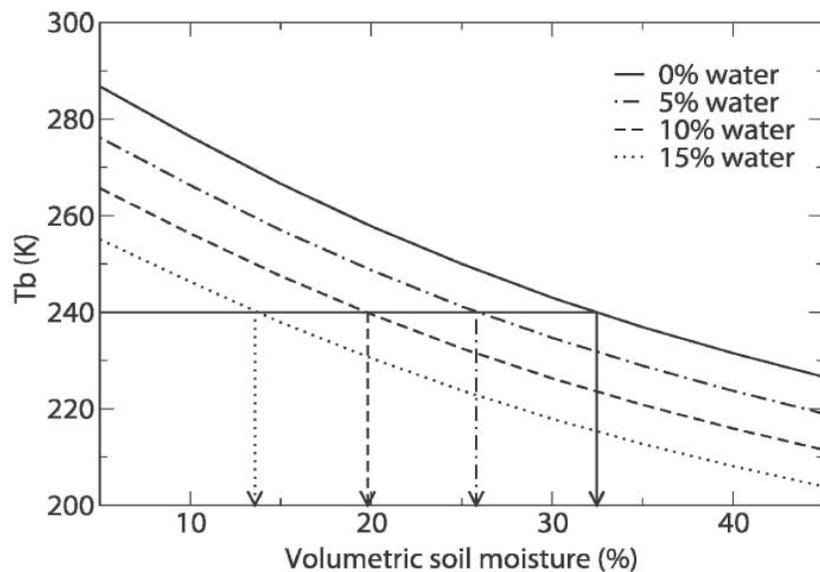
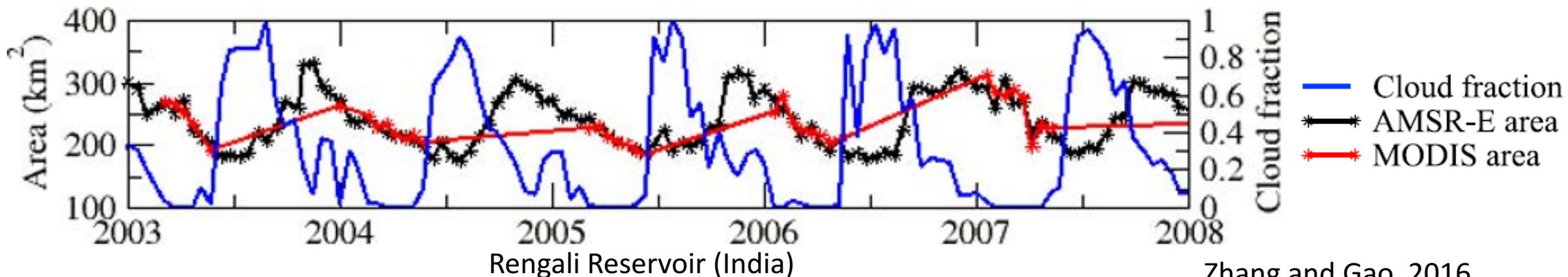
## MODIS + ICESat



Gao, 2015

# Monitoring Reservoir Storage under All-Weather Conditions

MODIS and AMSR-E at 16-day

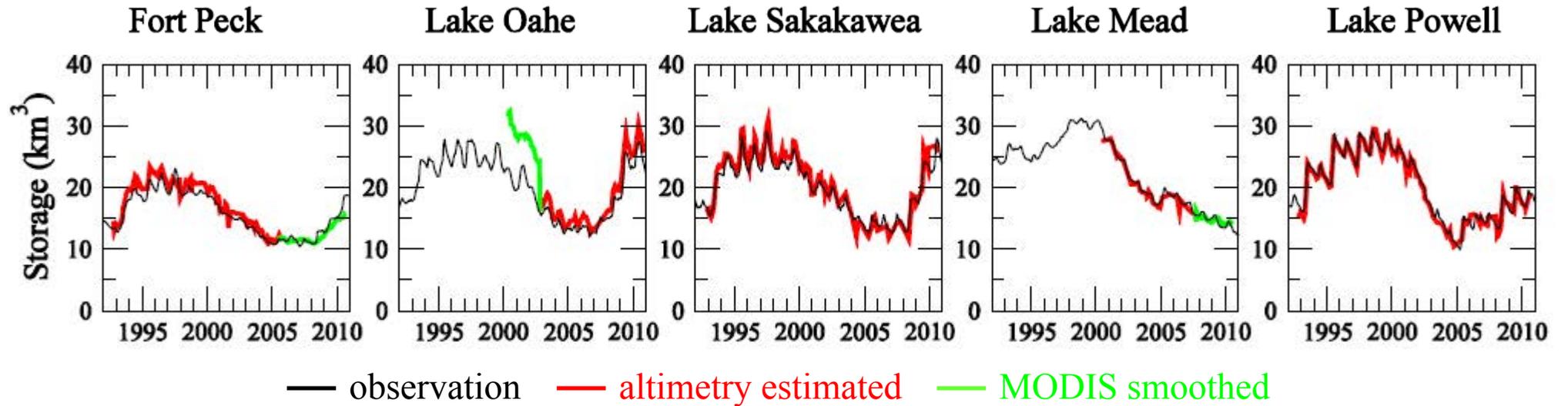


$$WHR = \frac{\sum_{i=1}^{N_T} W_i \times TbH(T_i)}{\sum_{j=1}^{N_S} W_j \times TbH(S_j)}$$

# Validation Results

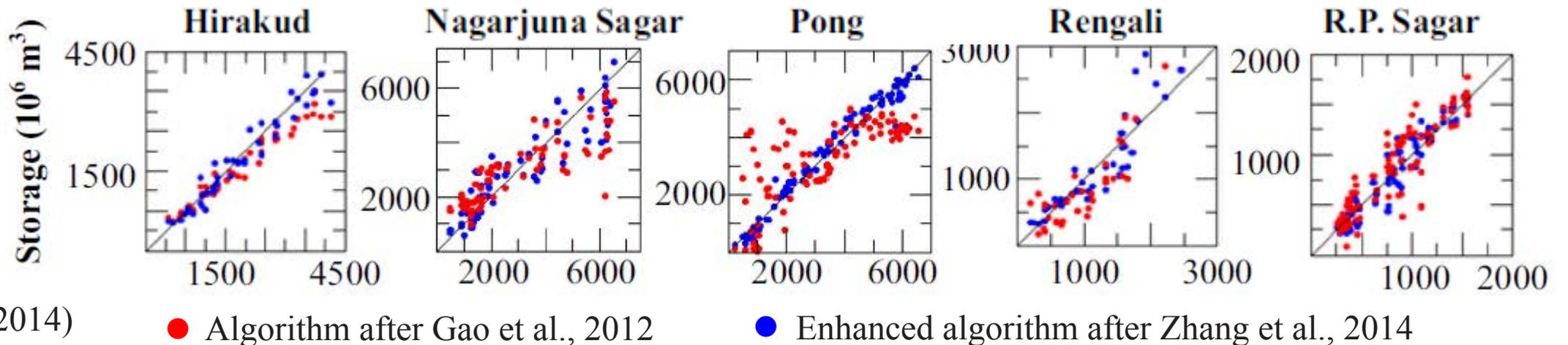
MODIS  
+  
radar

(Gao et al., 2012)

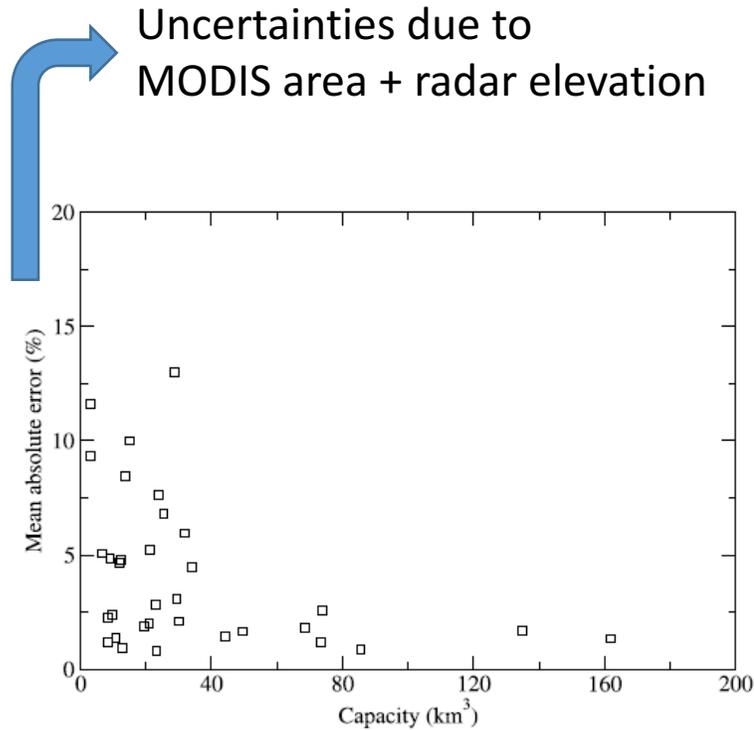


ICESat  
+  
radar

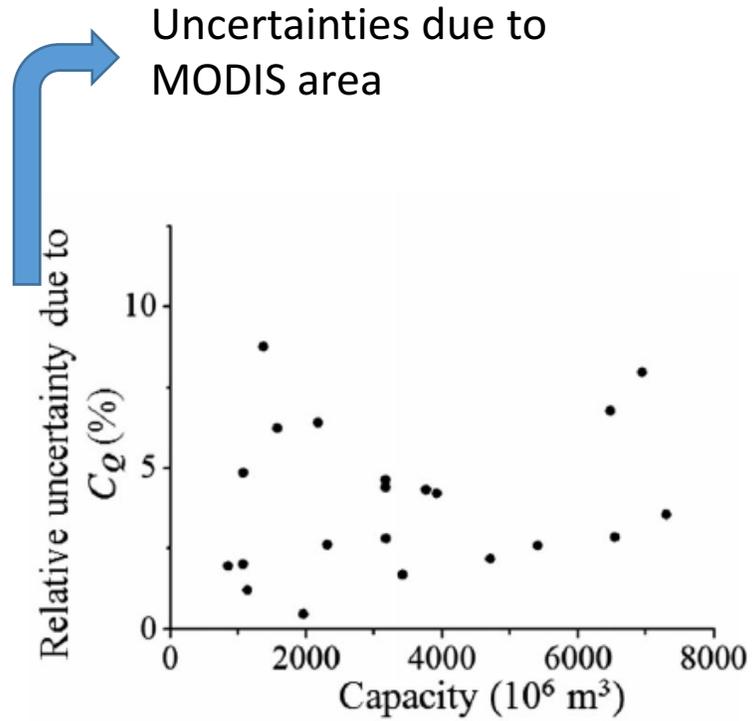
(Zhang et al., 2014)



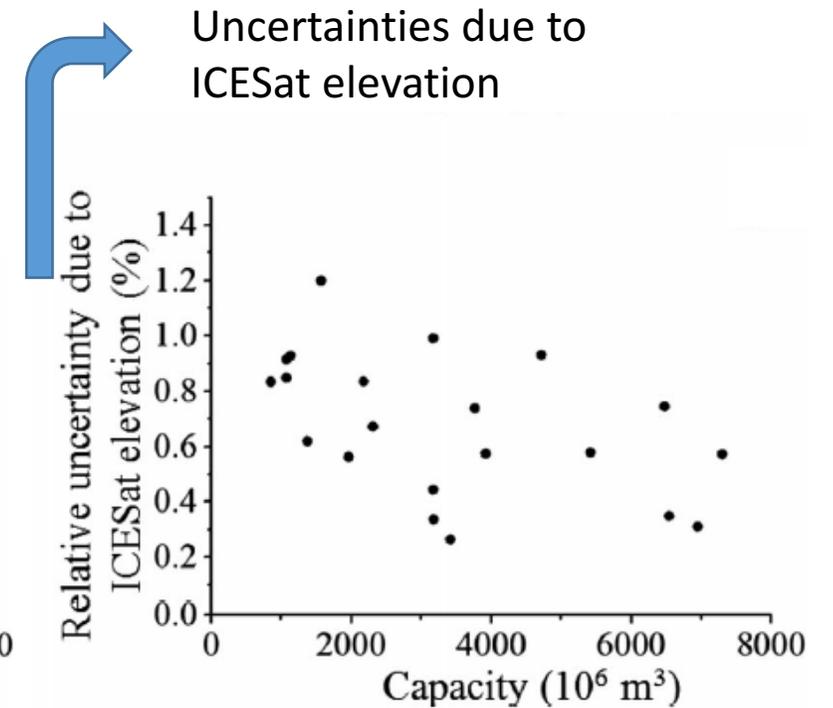
# Uncertainty Analysis



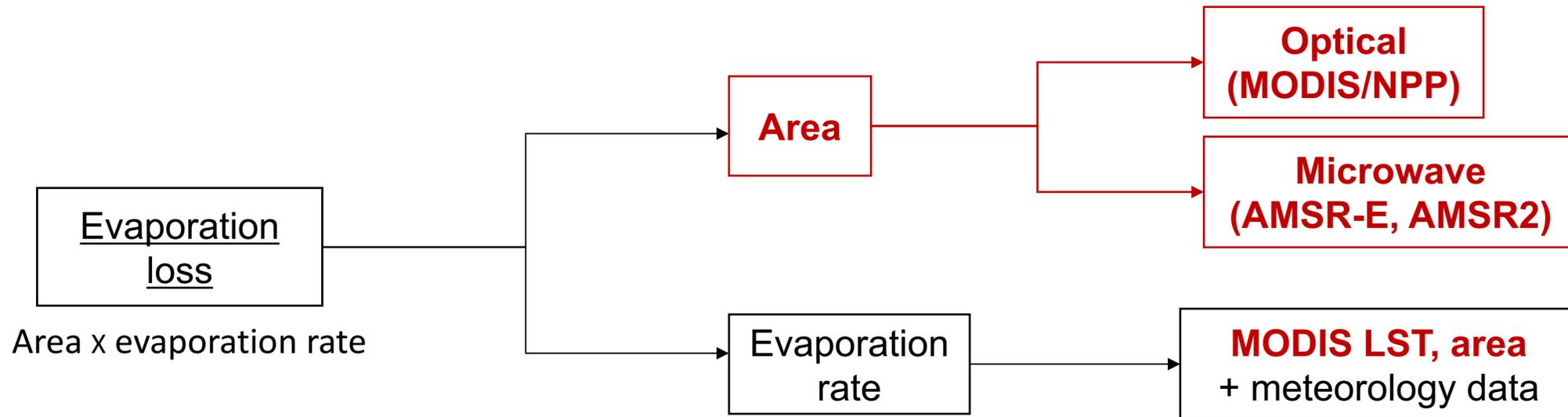
Gao et al., 2012



Zhang et al., 2014)



# Reservoir Evaporation Estimation



## RESERVOIR EVAPORATION IN THE WESTERN UNITED STATES

Current Science, Challenges, and Future Needs

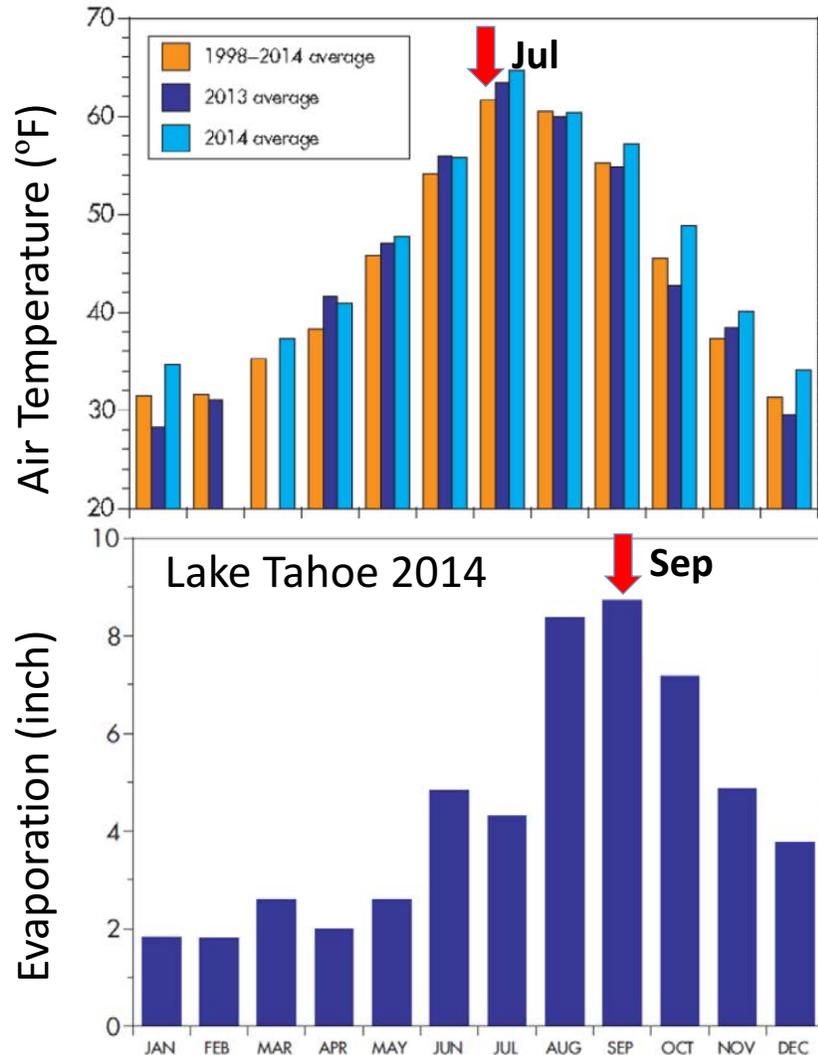
Friedrich et al., 2017 **BAMS**

### FUTURE NEEDS.

Uniform, coherent, and long-term measurements.

Reservoir evaporation represents a substantial loss of available water. Improved understanding, estimation, and forecasting of evaporation rates will help to manage this water loss more efficiently, particularly when water is scarce.

# Heat Storage Effect on the Evaporation Rate



## Heat storage effect:

Spring and Summer – absorb heat  
 Fall and Winter – release heat

Penman Equation

$$E = \frac{s(R_n - \Delta U) + \gamma f(u_2) \delta_e}{\lambda_v (s + \gamma)}$$

$s$ : slope of the saturation vapor pressure curve ( $\text{kPa} \cdot ^\circ\text{C}^{-1}$ )

$R_n$ : net radiation ( $\text{MJ} \cdot \text{m}^{-2} \cdot \text{d}^{-1}$ )

$\gamma$ : psychrometric constant ( $\text{kPa} \cdot ^\circ\text{C}^{-1}$ )

$f(u_2)$ : wind function ( $\text{s} \cdot \text{m}^{-1}$ )

$\delta_e$ : vapor pressure deficit ( $\text{kPa}$ )

$\lambda_v$ : latent heat of vaporization ( $\text{MJ} \cdot \text{kg}^{-1}$ )

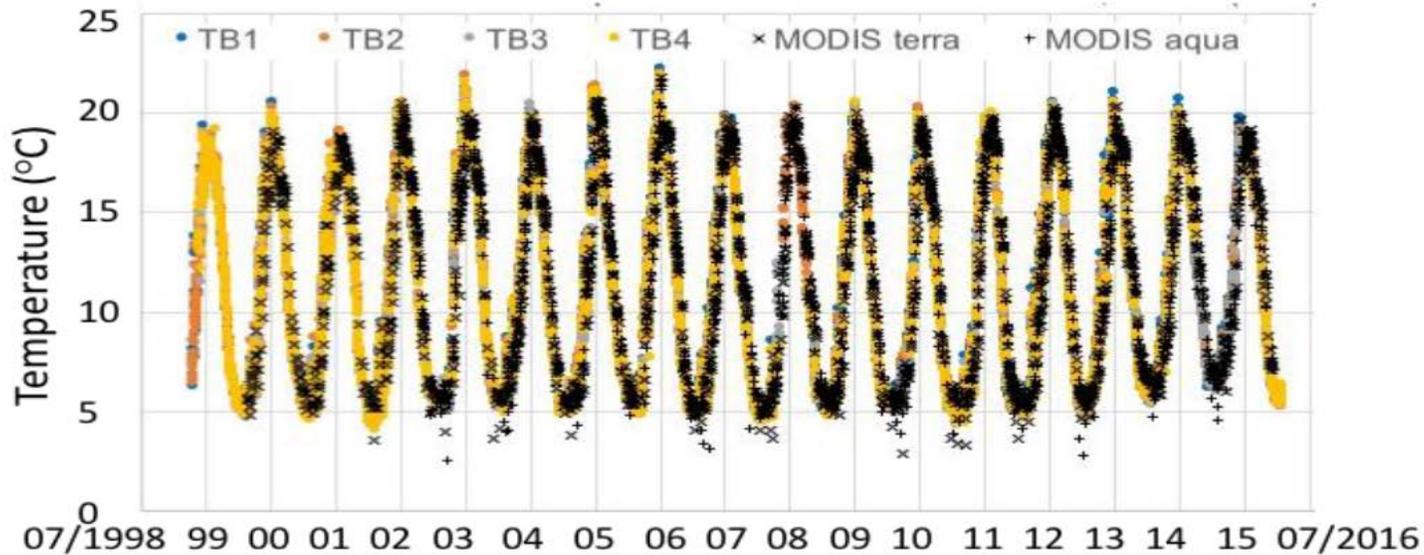
# Improving the Estimation of Reservoir Evaporation Rate

$$E = \frac{s(R_n - \Delta U) + \gamma f(u_2)(e_s - e_a)}{\lambda_v(s + \gamma)}$$

$$\Delta U = h\rho c [T_w(t) - T_w(t - \Delta t)]$$

**Tw from MODIS LST**

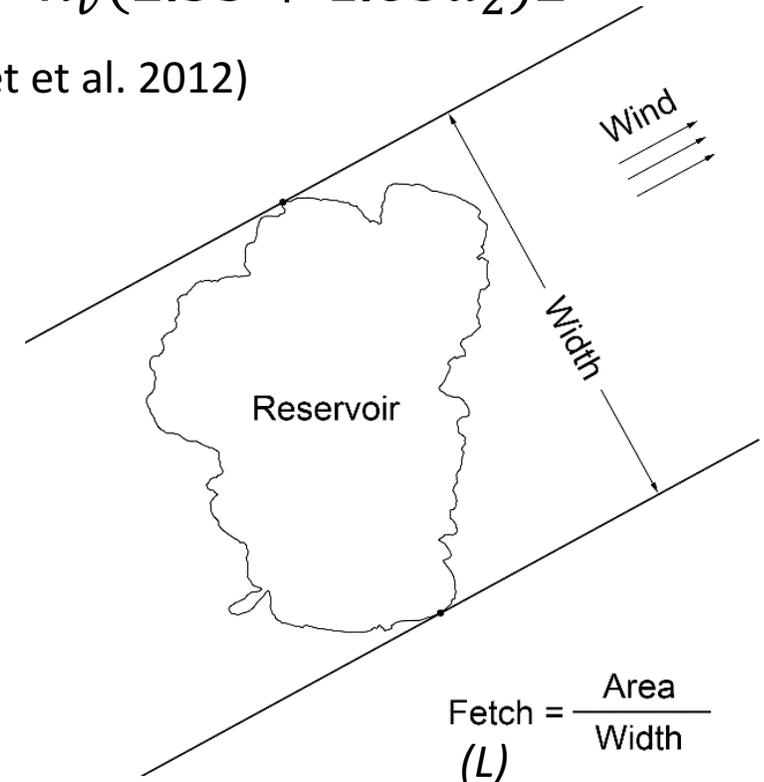
Lake Tahoe



(Friedrich et al., 2017)

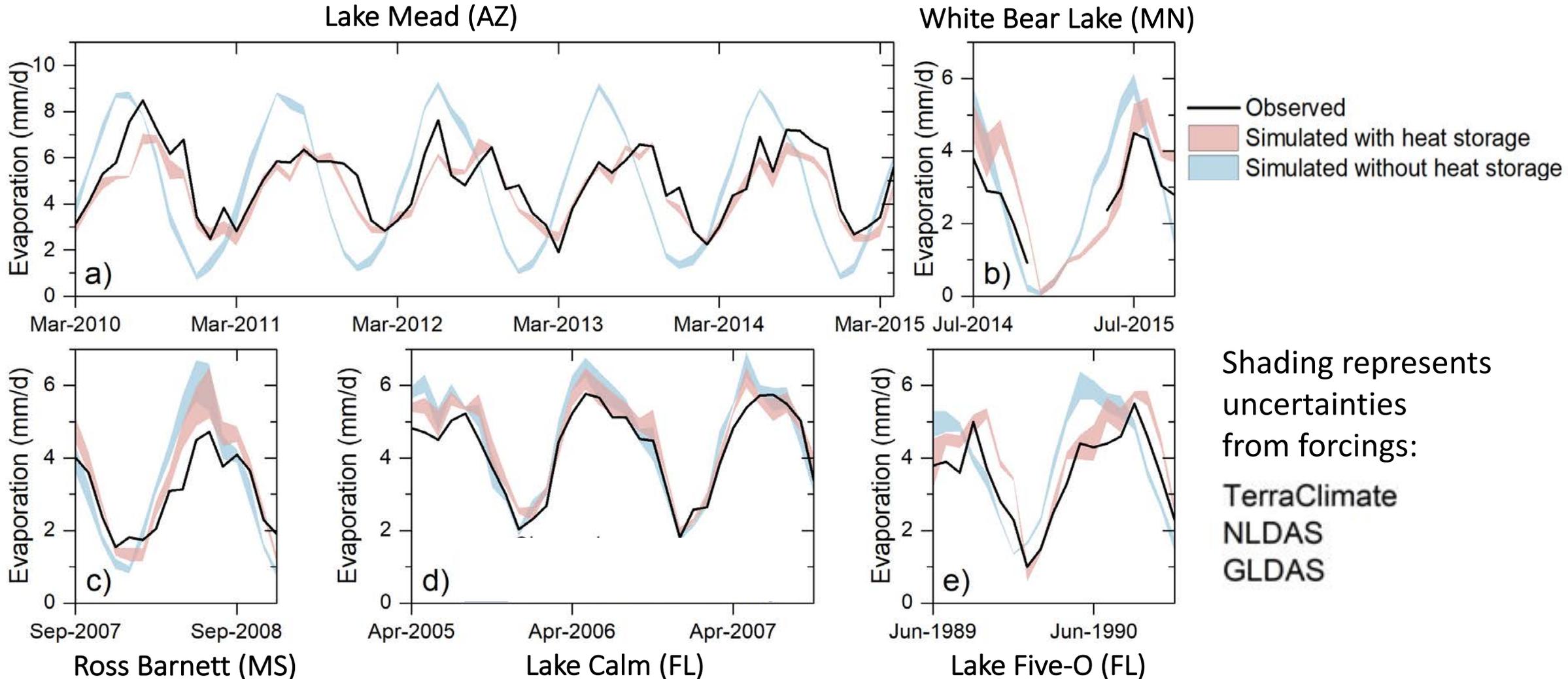
$$f(u_2) = \lambda_v(2.33 + 1.65u_2)L^{-0.1}$$

(McJannet et al. 2012)



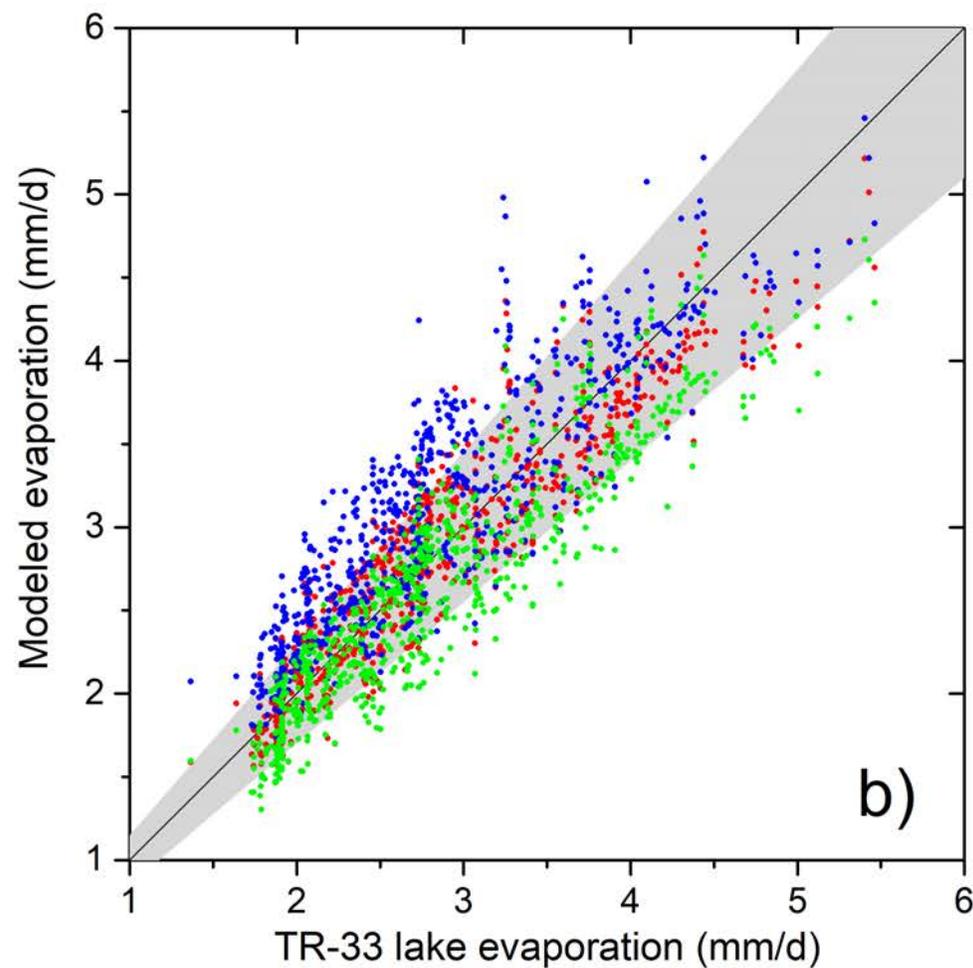
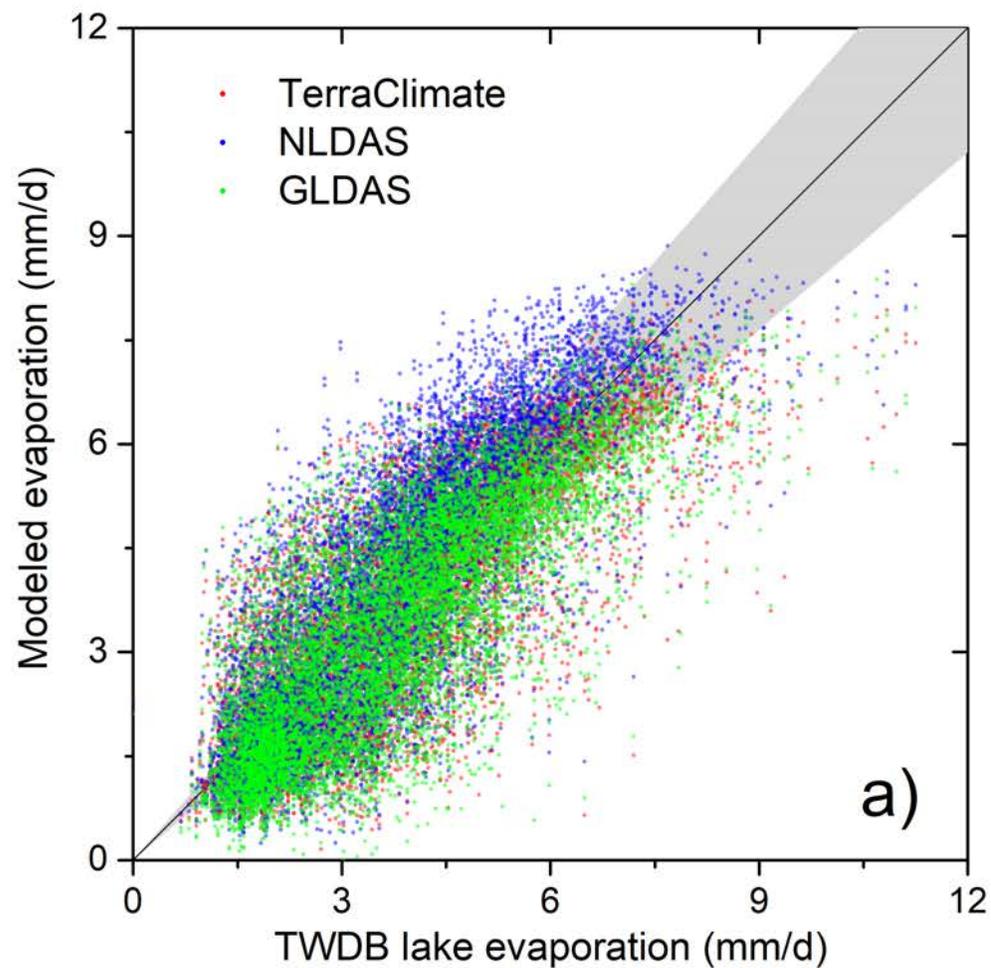
**Dynamic  
MODIS Area**

# Validation Results & Uncertainties



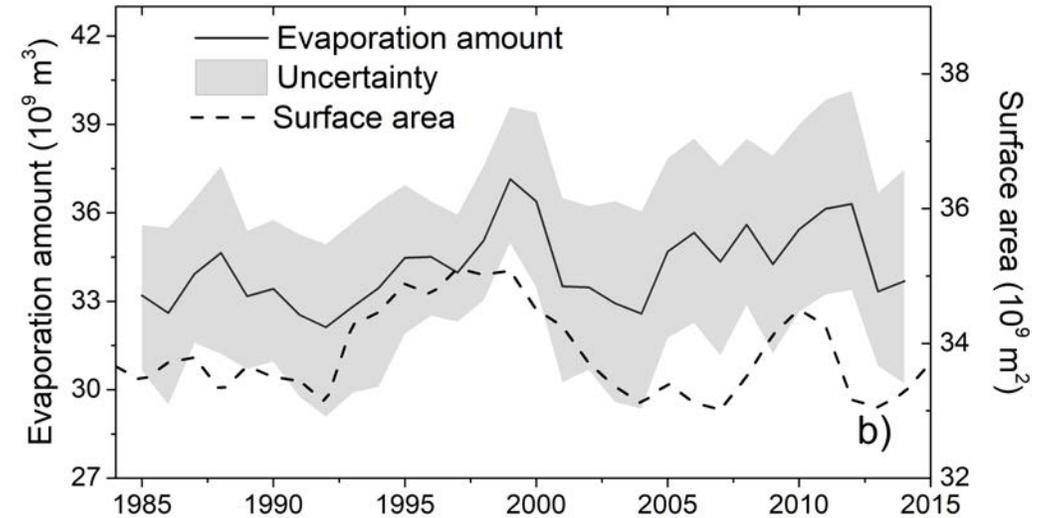
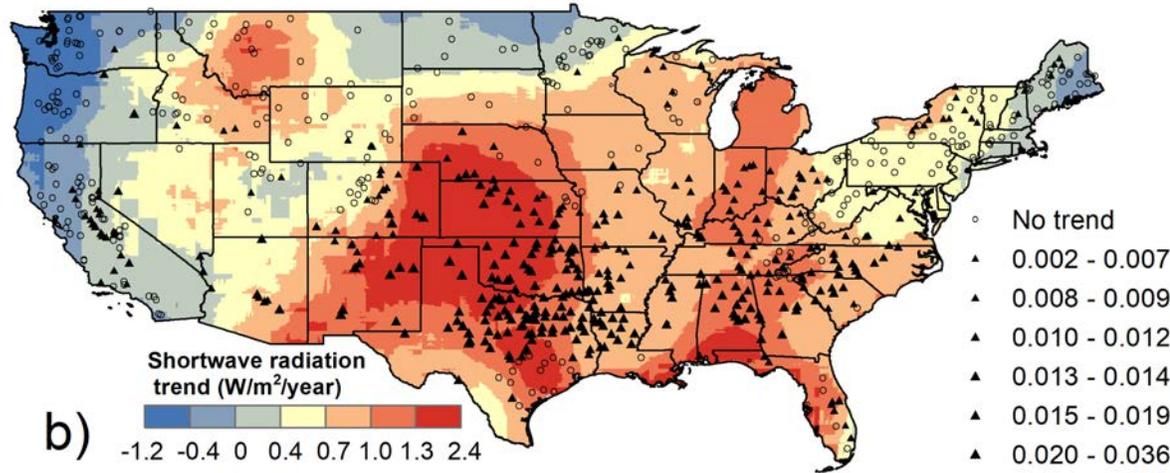
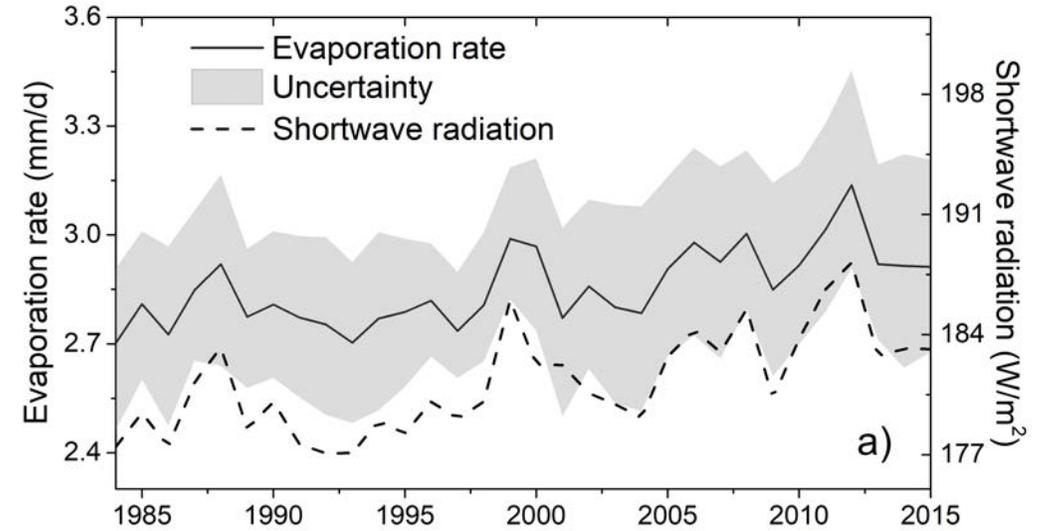
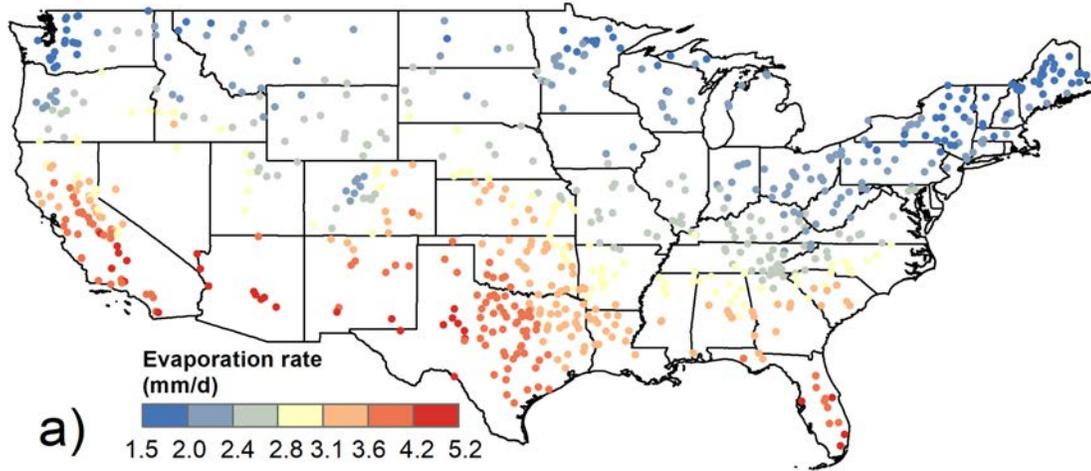
a-c: Eddy covariance; d-e: Bowen ratio

# Validation Results & Uncertainties



# Trends of Reservoir Evaporation

1984-2015



# Planned Schedule of Activities

Tasks	Yr1				Yr2				Yr3			
<b>Task 1: Identifying reservoirs and extracting elevation</b>	■	■										
<b>Task 2: Developing the reservoir product series</b>												
Task 2.1 Reservoir area, storage, and elevation products	■	■	■	■	■	■	■	■	■	■		
Task 2.2 Reservoir evaporation rate and loss products	■	■	■	■	■	■	■	■	■	■		
<b>Task 3: Validating the algorithms and product series</b>												
Task 3.1 Validating the reservoir storage algorithm and product					■	■	■					
Task 3.2 Validating the reservoir evaporation algorithm and product					■	■	■					
<b>Task 4: Characterizing errors and uncertainties</b>									■	■	■	■
<b>Task 5: Developing the ATBD and delivering the products</b>									■	■	■	■

# Summary

- ✓ Long term, consistent, remotely sensed reservoir storage and evaporation products can be used to support many applications.
- ✓ By leveraging MODIS/VIIRS observations along with satellite altimetry data, the spatial and temporal coverage of remotely sensed global reservoirs can be significantly improved.
- ✓ The estimation of reservoir evaporation rate can be improved using the Penman Equation, with the heat storage and fetch considered. The lake heat storage can be estimated using MODIS/VIIRS LST, while the fetch is a function of the dynamic lake area.
- ✓ Both the storage and evaporation algorithms have been validated using in situ data.
- ✓ More comprehensive uncertainty analyses are needed for the final product.