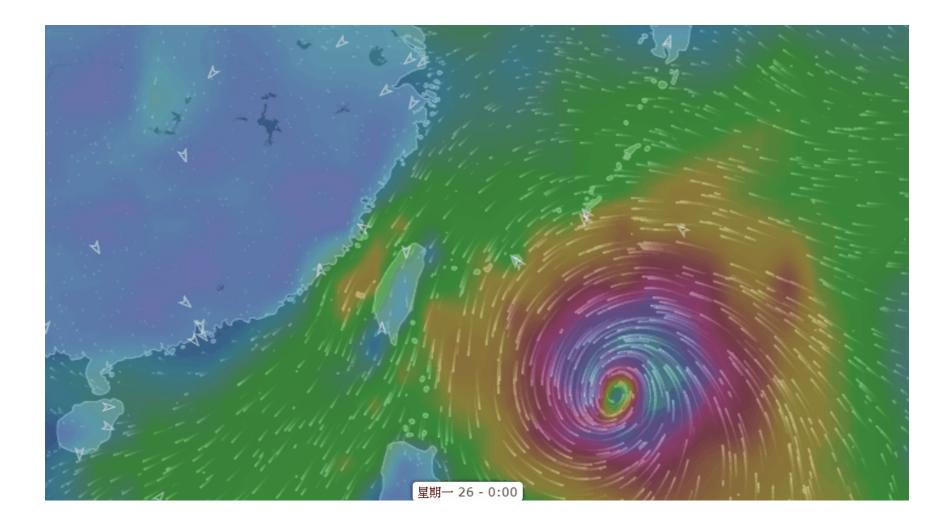
Using satellite-based estimates of evapotranspiration and groundwater changes to determine anthropogenic water fluxes in land surface model

#### Min-Hui Lo, R. G. Anderson, J. S. Famiglietti, S. Swenson, Q. Tang

Department of Atmospheric Sciences, National Taiwan University, Taiwan

2016/09/29 @ the GEWEX workshop of Including Water Management in Large Scale Models





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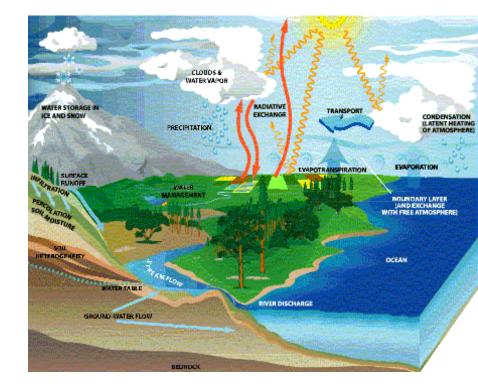
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## Land Surface Processes

## Land surface processes function as

- lower boundary condition in Atmospheric Models
- upper boundary condition in Hydrological Models
- interface for coupled
  Atmospheric / Hydrological / Ecological Models

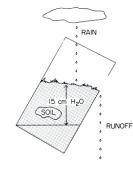


## Evolutions of Land Surface Model (LSM)

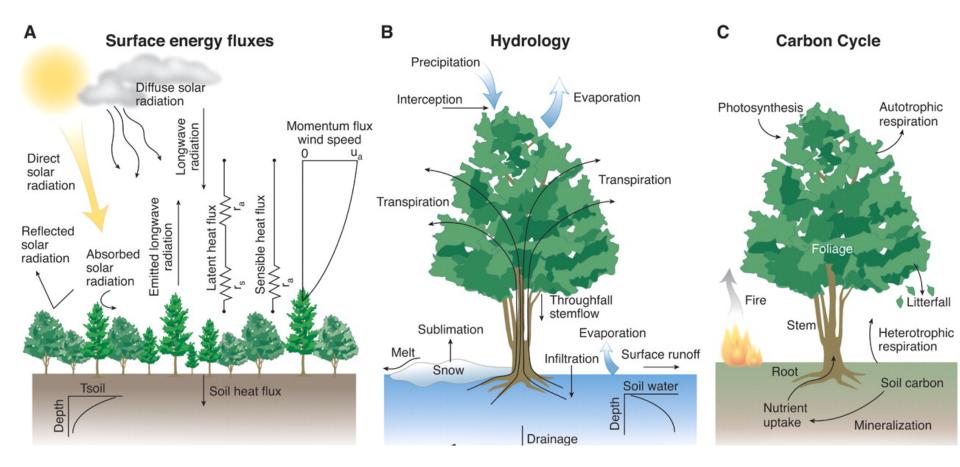
Earliest LSMs: prescribed soil moisture condition

- 1965 1970
- A bucket model was developed as a lower boundary condition for a GCM by Manabe et al., [1965]
- 1980 →
- Soil-vegetation-atmosphere transfer (SVAT) model[Dickinson et al, 1986 and Sellers et al., 1986.]
- 2000 → Detailed ecological processes. [Bonan, 1998]
- 2010 → Subsurface process [Yeh and Eltahir, 2005; Niu et al., 2007; Lo et al., 2008; Pokhrel et al., Campoy et al., ...]

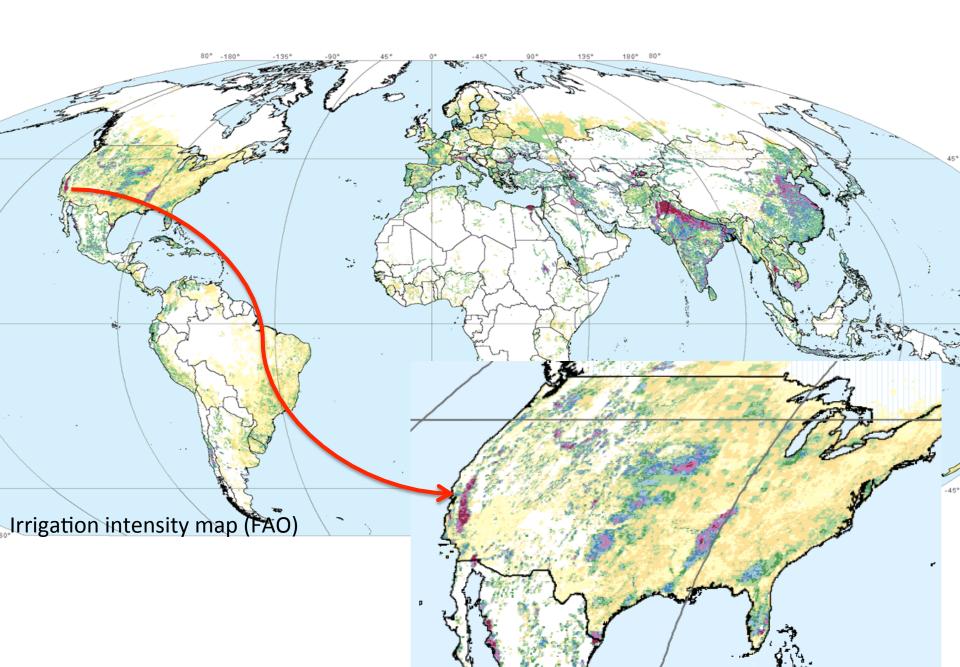
I-GEM (Impact of Groundwater in Earth system Models) 2015-2018 between France ANR (Agnès Ducharne) and Taiwan NSF (Min-Hui LO)



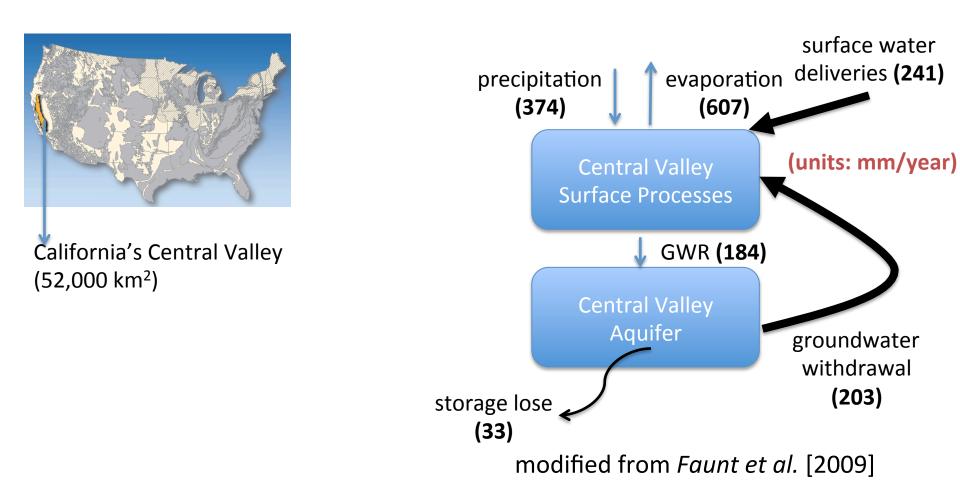
#### Physical processes in land surface model



Bonan(2008)



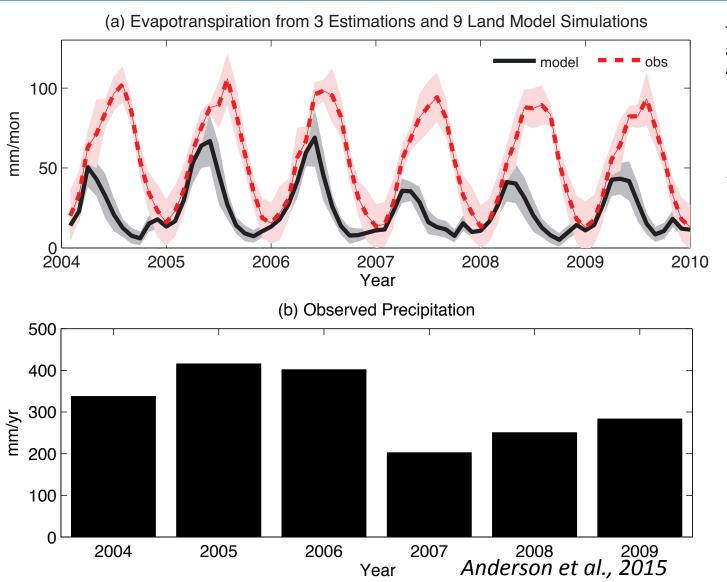
water budget in heavily irrigated system using California as an example



(Famiglietti et al., 2011; Anderson et al., 2012; Lo and Famiglietti, 2013; Lo et al., 2013; Anderson et al., 2015)

# Can current models simulate reasonable evaporation?

#### can models simulate reasonable evaporation?

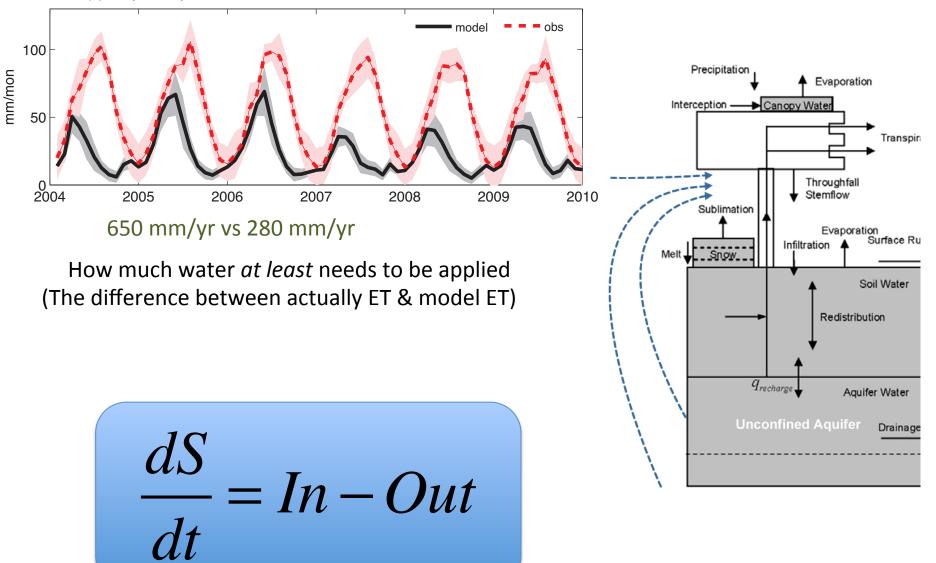


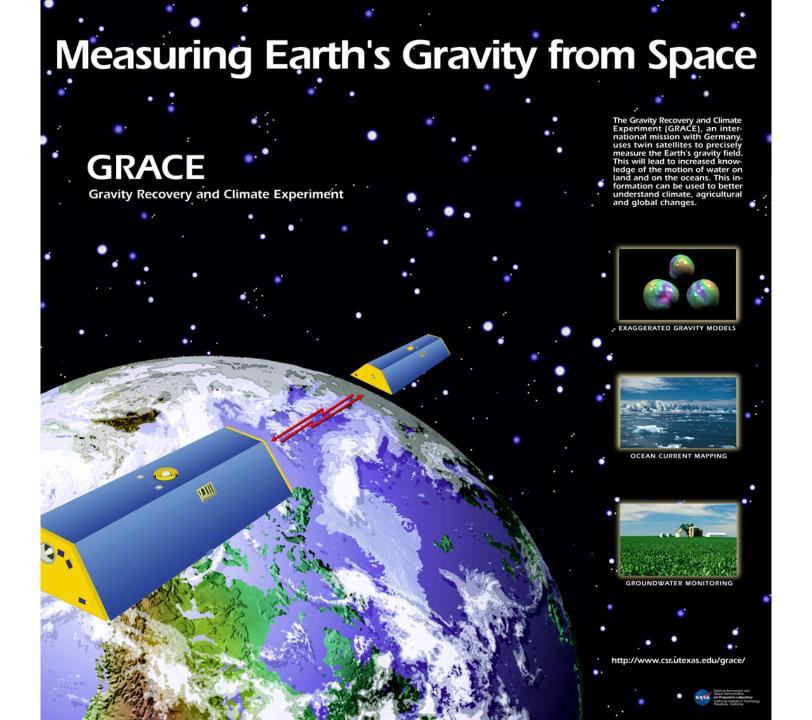
The surface energy balance algorithm for land (SEBAL), Anderson et al., 2012

United States Agricultural Monitoring (USAM), Tang et al, 2009

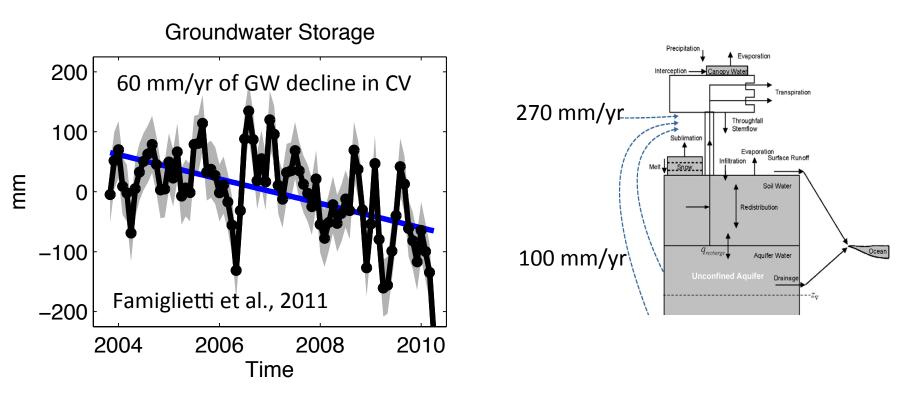
#### lower envelope estimate of irrigated water demand

(a) Evapotranspiration from 3 Estimations and 9 Land Model Simulations





#### GRACE estimated groundwater pumping rate



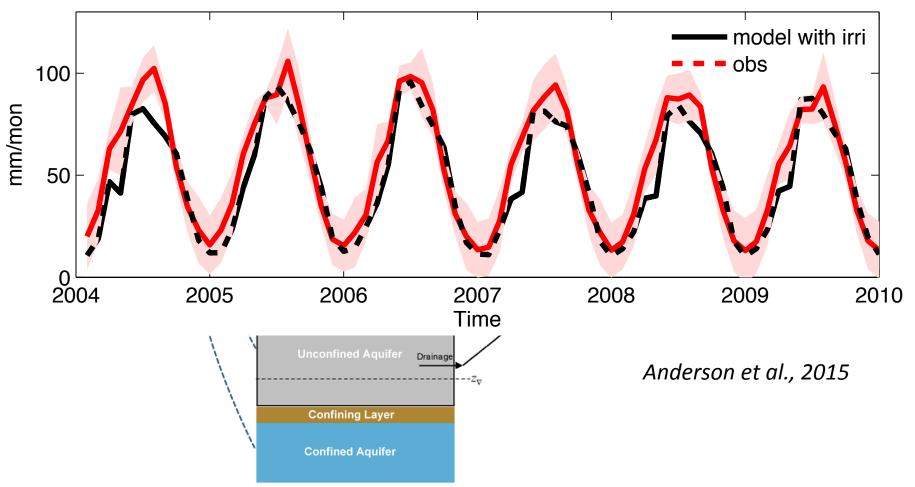
 $\frac{dGW}{dt} = GWR - pumping$ 

Surface water use statistics (240 mm/yr) from State Water Project, US Bureau of Reclamation, and canal streamflow data from California Data Exchange.

Total irrigated water demand (~400 mm/yr) in CV, (Wisser et al., 2008)

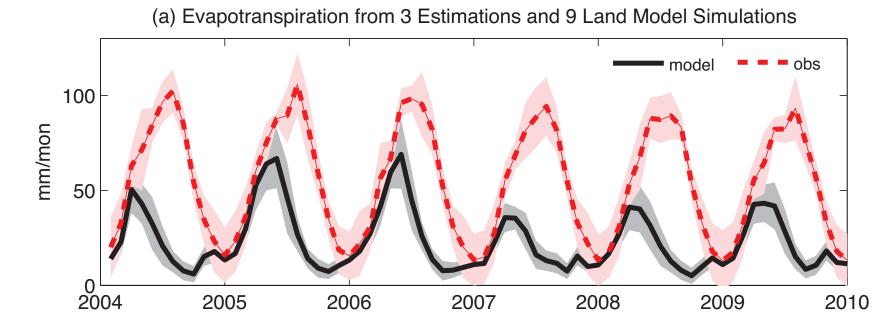
#### representation of irrigation fluxes

Evapotranspiration from 3 Estimations and Land Model Simulation with Irrigation





- Current models have sophisticated physical parameterizations.
- HOWEVER, lack of anthropogenic processes leads to underestimated evaporation.



#### Caveat:

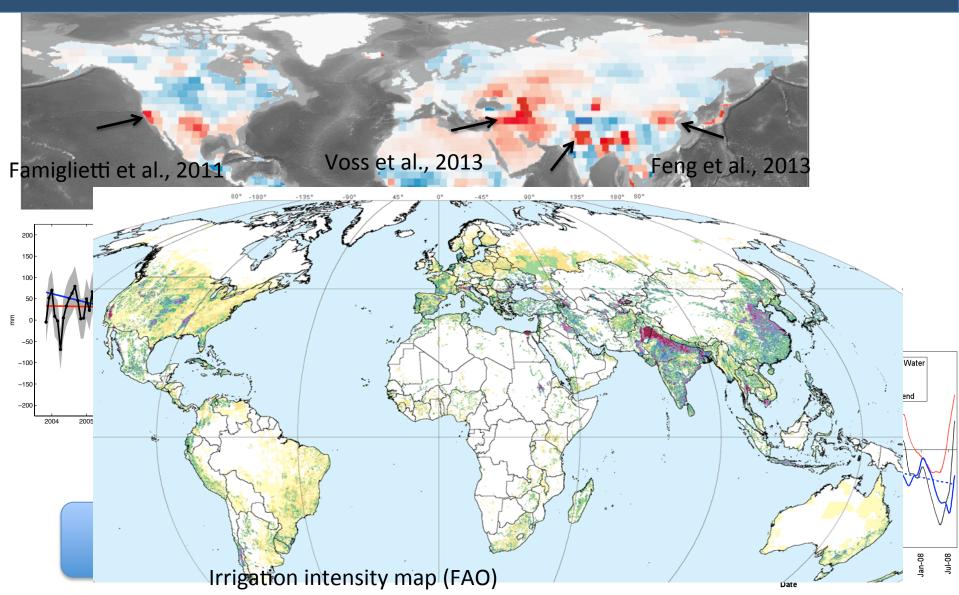
- Constant irrigated water?
- GW withdrawal from confined and unconfined aquifers globally?

Next Step:

- Apply this approach globally
- Couple to GCM to see human fingerprint on the climate

#### GRACE trend map:

#### spatial distribution of land water storage change (2003-2014)



#### Caveat:

- Constant irrigated water?
- GW withdrawal from confined and unconfined aquifers globally?

Next Step:

- Apply this approach globally
- Couple to GCM to see human fingerprint on the climate

## climate model simulations

- Model:
  - NCAR AGCM (Community Atmosphere Model, 1.4 lat x 1.4 lon)

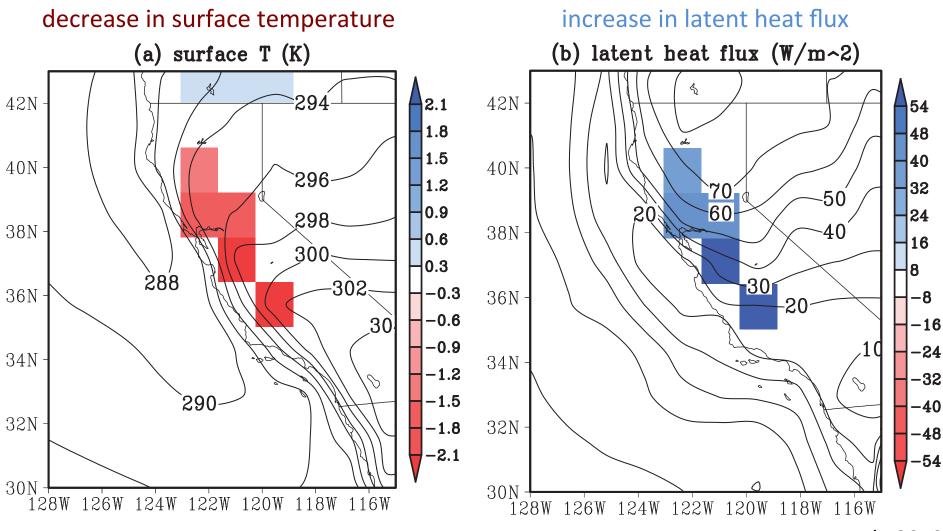
### • Experiments:

- Exp01 (CTR): CAM coupled land surface model
- Exp02 (IRRI): CAM coupled land surface model + Irrigation

## • Methodology:

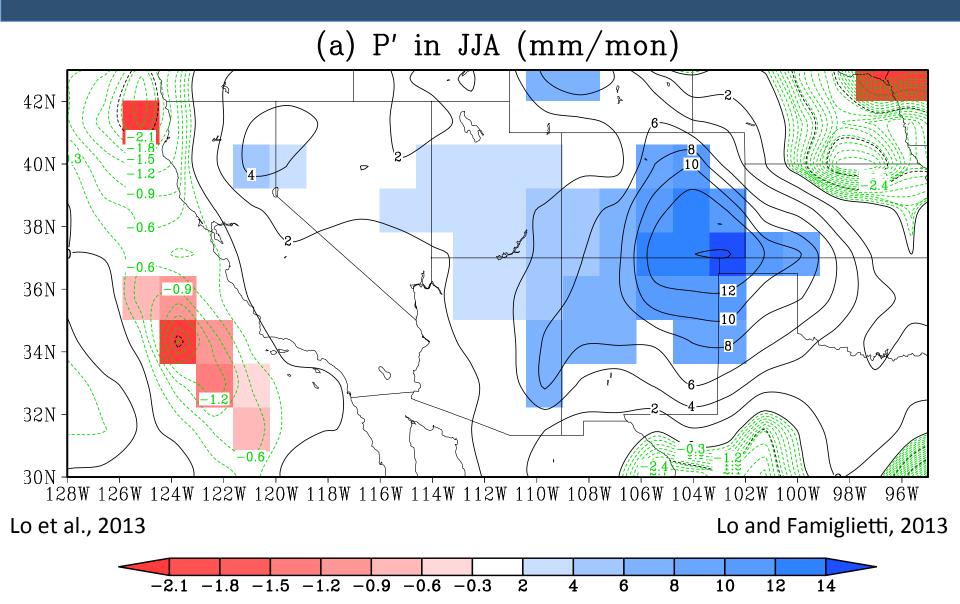
- Both simulations are conducted for 90 years
- Analysis of the differences between Exp01 and Exp02 for the west of US and for summer only.

#### changes in local surface energy budget

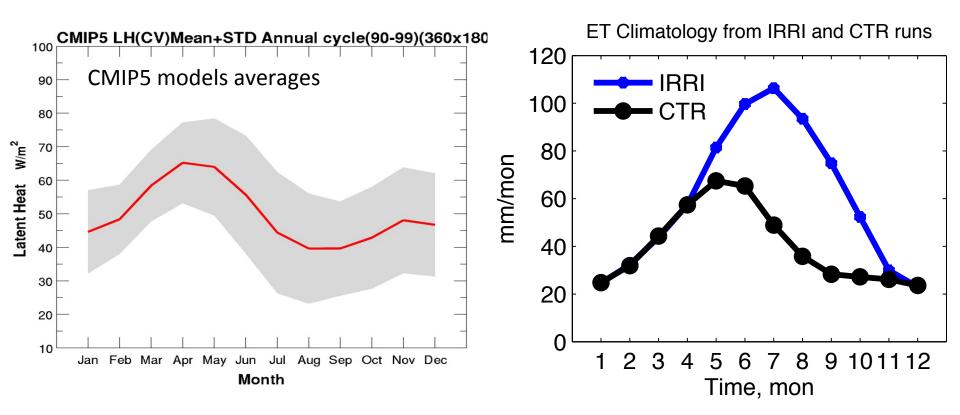


Lo et al., 2013

## asymmetric responses in rainfall



#### applications on current climate moels



simulated costal stratocumulus might be overestimated? simulated US southwest rainfall might be underestimated?

#### summary

- GRACE trend map provides an invaluable information
  - Some of those negative regions indicate the anthropogenic activities
  - How to best utilize the GRACE data in climate models?

- When coupling to the climate model,
  - the results show the importance of subsurface hydrological and anthropogenic processes in the climate and water cycle.

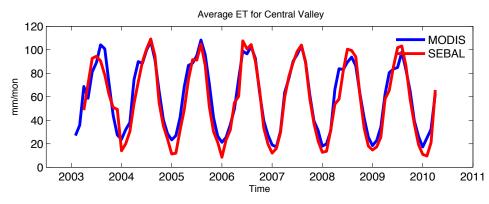
## Thanks for listening! Min-Hui Lo minhuilo@ntu.edu.tw

#### **ET Estimate**

#### United States Agricultural Monitoring (USAM) Monthly ET (200107) -105 -75 45 40 40 35 35 30 30. 25 0 15 30 45 60 75 90 105 120 135 150 ET (mm)

## The surface energy balance algorithm for land (SEBAL)

From Ray Anderson



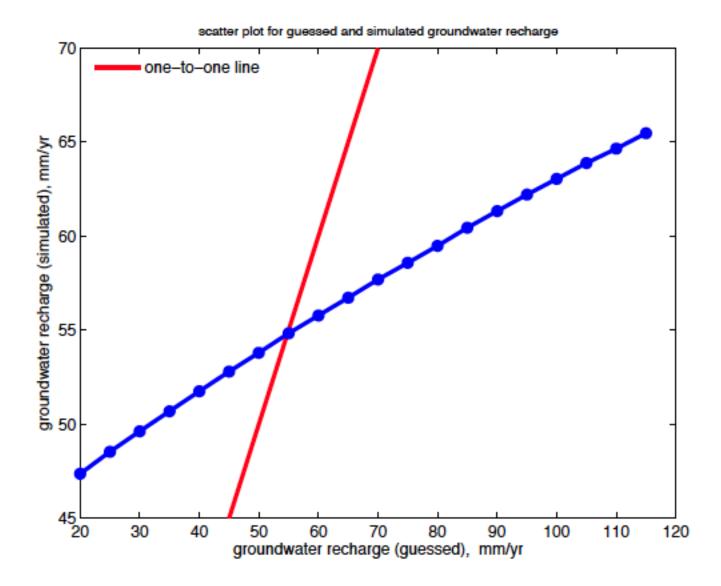
The MODIS data include Land Cover Type, Surface Reflectance, *Land Surface Temperature*/Emissivity, Vegetation Indices, and Albedo.

Surface radiation components are obtained from Surface Radiation Budget Data.

Input data:

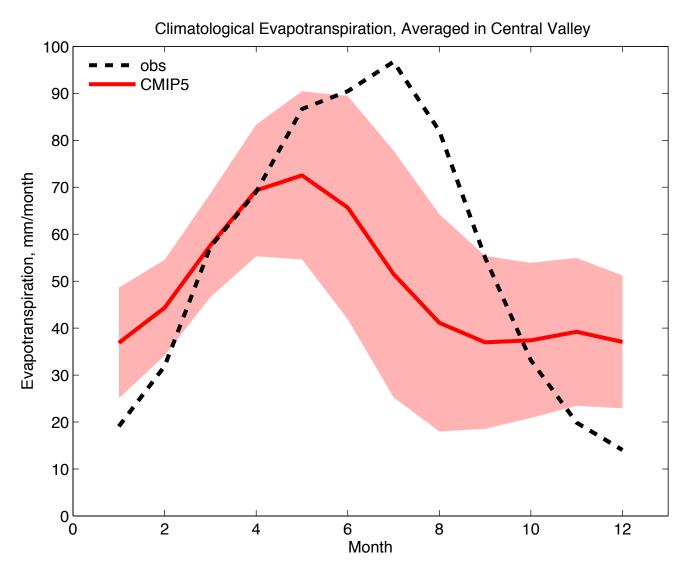
Surface T, surface emissivity, veg indices, and albedo from MODIS.

Incoming solar, air humidity, net longwave radiation, and air temperature data from CIMIS (The California Irrigation Management Information System)



Anderson et al., 2015

## Simulations of Evapotranspiration in CMIP5



from Anderson et al., 2015