

# The fidelity of land-atmosphere interactions in CESM

Paul Dirmeyer, Sungyoon Kim & Nazanin Tavakoli

*George Mason University, Fairfax, Virginia, USA*

Megan Fowler

*NSF-NCAR*

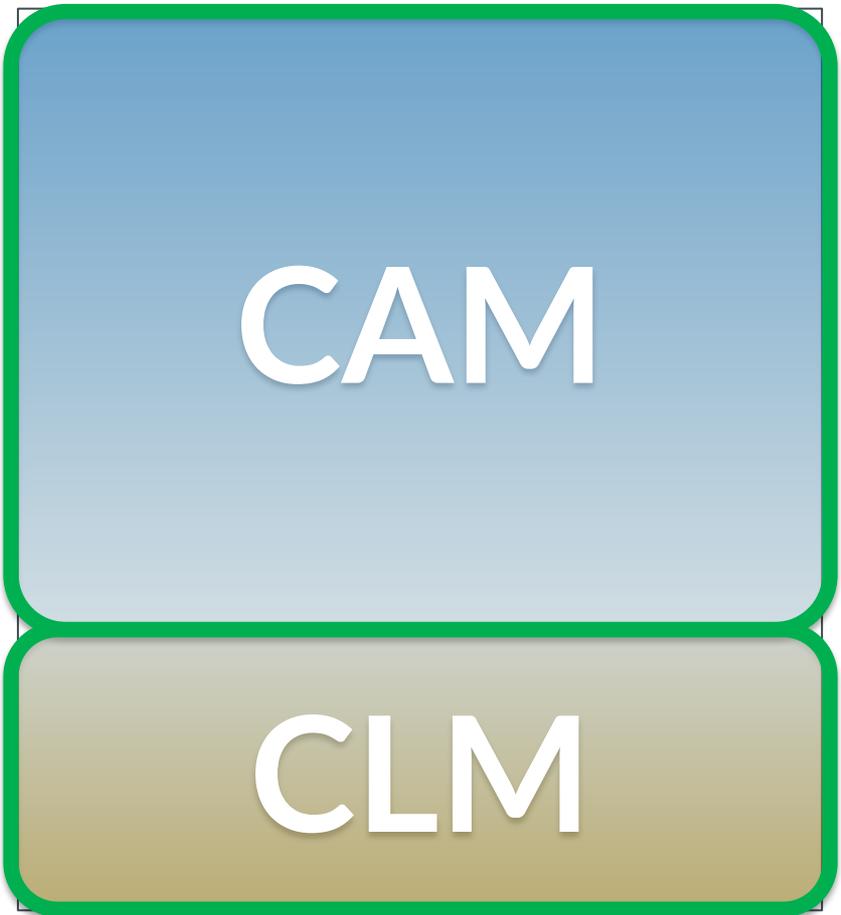
# Theoretical Basis

- The notion of local coupling (LoCo) between land and atmosphere → through water and energy cycles.
- Any **broken links** in the chain **interrupt** land surface impacts on weather, climate, predictability.
- **Where and when** are these feedbacks in place in *the real world*, and how strong are they?
- **Do our models get this right?**

Adapted from Santanello et al.  
(2018)

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CAM

CLM

# How Land Can Affect Atmosphere

$\frac{LE}{SH + LE}$

- Evaporation (latent heat flux) requires **energy and water** – while sensible heat flux, ground heat flux & surface warming need **energy only**.

*Adapted from Seneviratne et al. (2010)*

- Because of this, soil moisture can regulate energy (net radiation) partitioning, but **only over part of its range**.
  - wp = wilting point
  - csm = critical soil moisture

# Models & Reanalyses

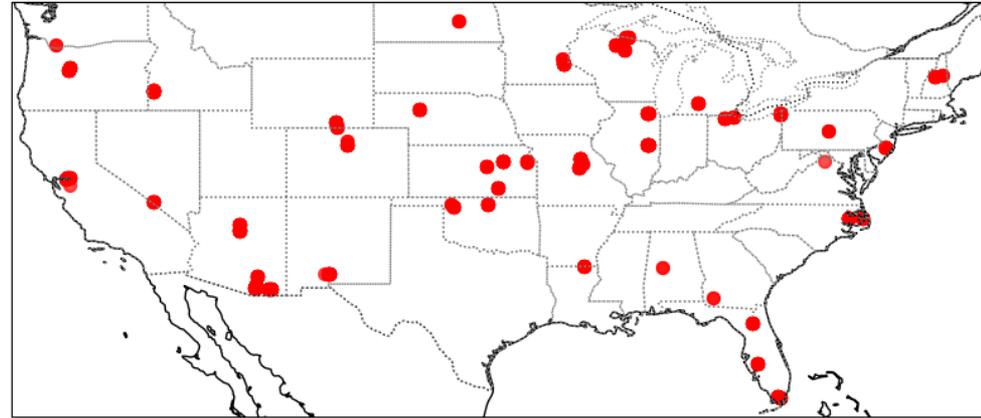
- CESM2.1.5 (CLM5 & CAM6)  $0.9^\circ \times 1.25^\circ$ , F2000climo compset, 26y simulations
  - CLM only runs with GSWP3v1 met forcing
  - CLM+CAM runs have climo SSTs, sea ice

*to assess CESM's behavior  
w.r.t. LoCo, which is  
foundational to S2S prediction  
skill*

- 
- ERA5 (global and flux-tower site comparisons)
    - On original reduced Gaussian grid (nominally 31km)
    - HTESSEL land model (no carbon cycle or predicted phenology)
    - ASCAT soil moisture assimilated
  - MERRA2 (flux-tower site comparisons)
    - $0.625^\circ \times 0.5^\circ$
    - Catchment land model, no soil moisture assimilation

# Flux Tower Data

- Daily AmeriFlux data over CONUS
- Stations with excessive missing, incomplete or short time span data were omitted
- Exact number of sites varies by season, each site has different years and days available / missing: typically have ~60-70 stations
- For consistent comparisons, model and reanalysis data at the grid cell for each tower site only include the exact days present in the observational data.



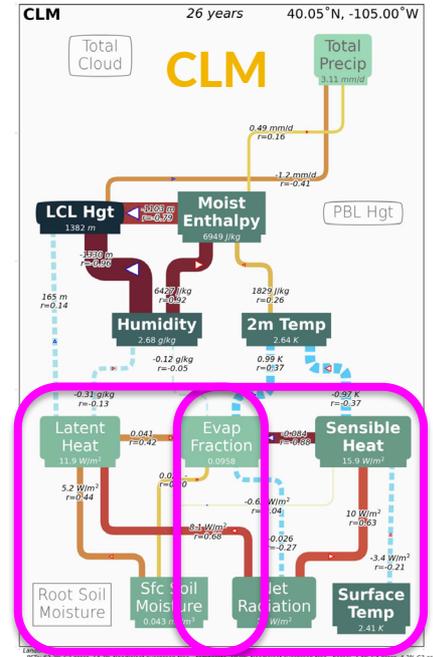
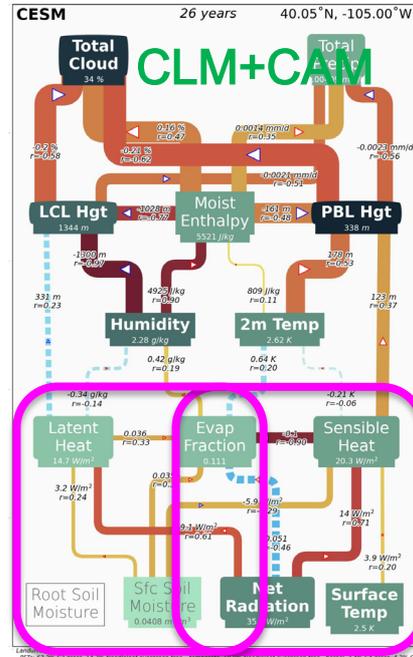
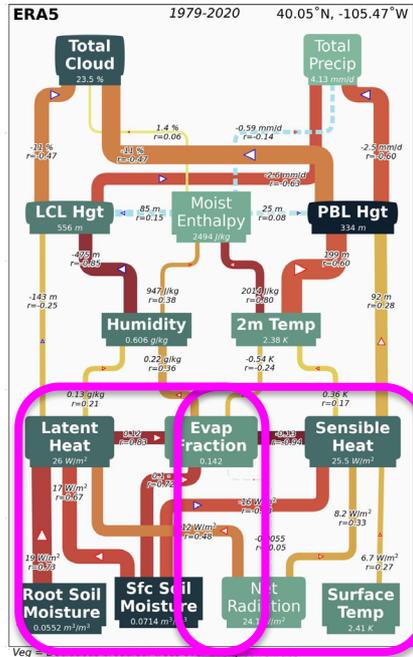
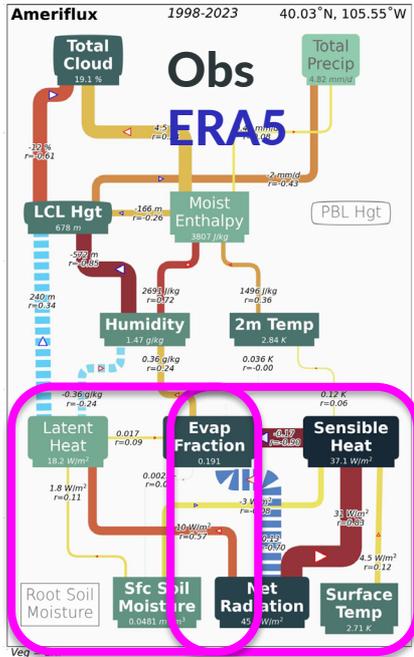
# Coupling Metrics

- Pearson's temporal correlation:  $r(SM:LE)$ ,  $r(SM:SH)$ ,  $r(SM:EF)$ 
  - Reveals covariability between soil moisture and surface fluxes, an **important clue for causality**, process identification (identifies water-limited versus energy-limited evaporation regimes)
- Variability:  $\sigma(SM)$ ,  $\sigma(LE)$ ,  $\sigma(SH)$ ,  $\sigma(EF)$ 
  - Correlation doesn't mean much if these quantities rarely change.
  - There must be **fluctuations the atmosphere can feel**.
- Coupling Index:  $I = \sigma(LE) \cdot r(SM:LE)$ , etc...
  - Puts a magnitude of response onto the correlation information
  - These **can be chained to find links** between land states, surface fluxes, near surface atmospheric states, boundary layer characteristics, cloud formation and precipitation.

# Evaluations at Specific Sites

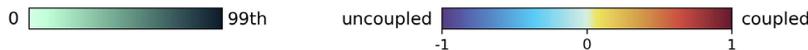
US-NR1: Niwot Ridge Forest (LTER NWT1), USA

Season: JJA



Source (S) > Target (T)  
 L-A feedback  $\begin{cases} \triangleright r(S, T) > 0 \\ \triangleleft r(S, T) < 0 \end{cases}$

Temporal standard deviations:



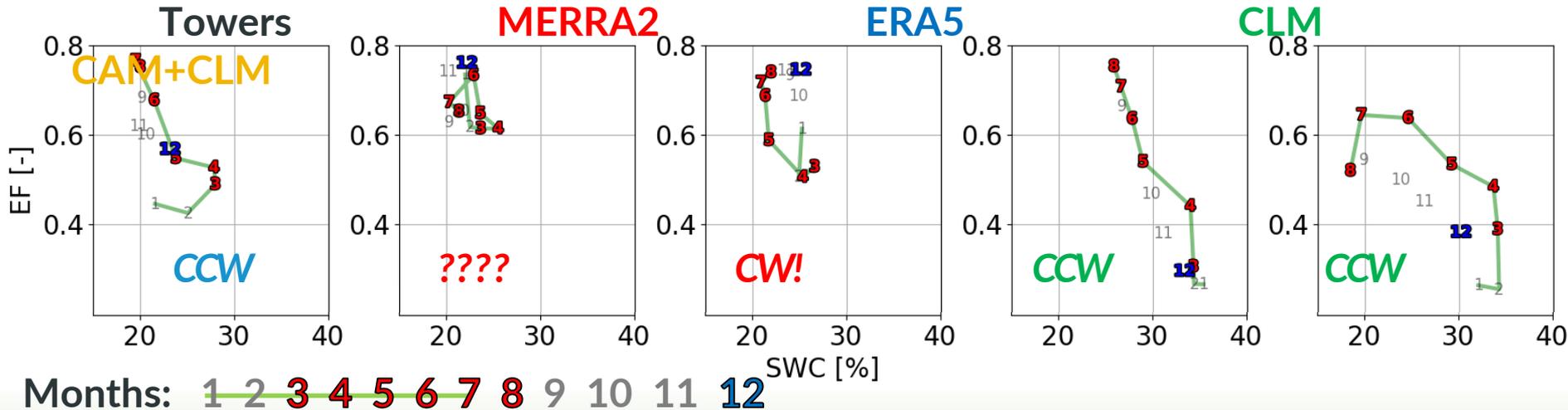
Link width is proportional to coupling index magnitude:  $|\alpha(T)r(S, T)|$

Dashed blue links indicate severed feedbacks

Coupling indices list units; correlations are shown as: 'r='

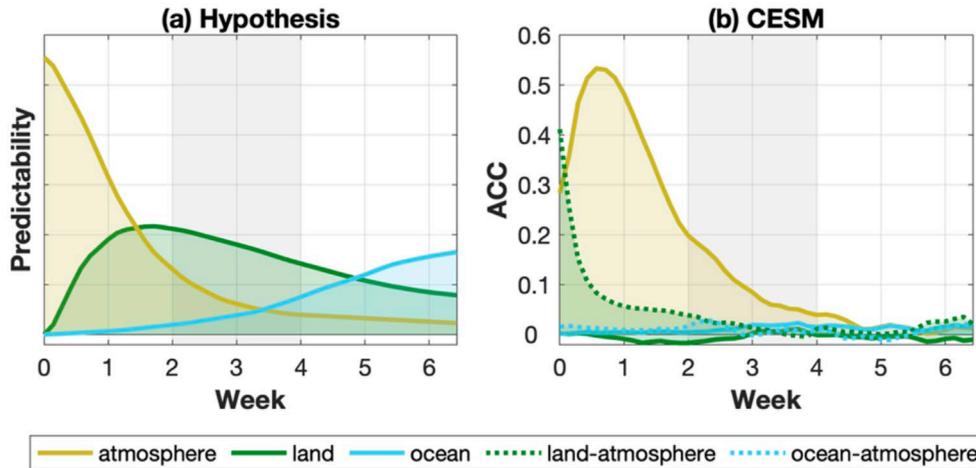
# Seasonal Cycle of EF versus SWC

- At flux tower sites, the average seasonal cycle has minimum EF in Jan-Feb, maximum during July.
- Reanalyses have minimum EF in spring, maximum in winter
- CLM is better than CAM+CLM, but both fail to maintain dry soil through autumn.

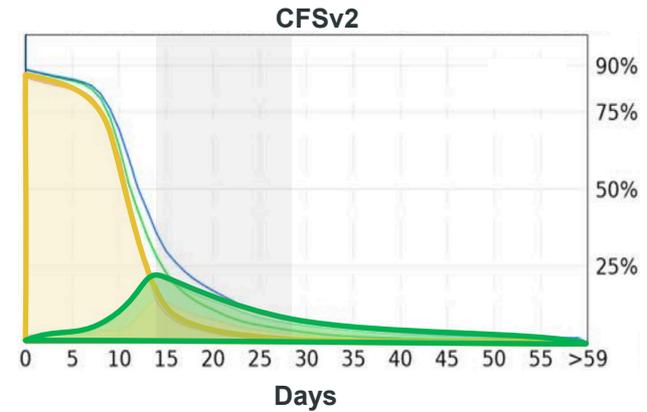


# ESP: Yaga's Paper

- In an S2S prediction framework, CESM appears not to exhibit the predictability from land that other forecast models do....



From Richter et al. (2024)



From Dirmeyer et al. (2018)

# Global Analysis

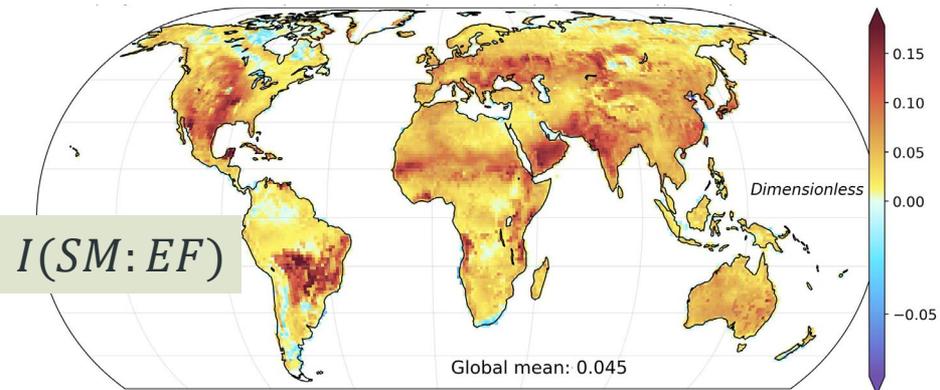
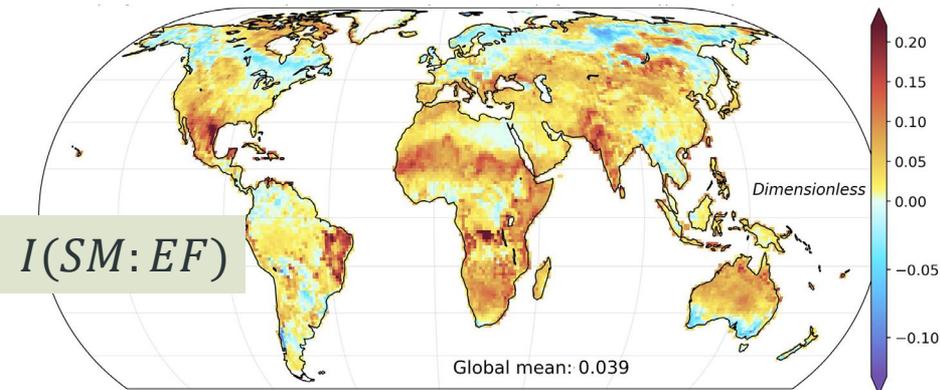
- Historically, our notions of L-A coupling and feedbacks have come from climate model simulations (e.g., GLACE).
- Locally, using flux tower or field campaign data, we can measure aspects of L-A coupling in nature.
- To best understand L-A coupling in the Earth system, and to validate our models, **a global picture of the structure, intensity and variability of coupling metrics is needed.**



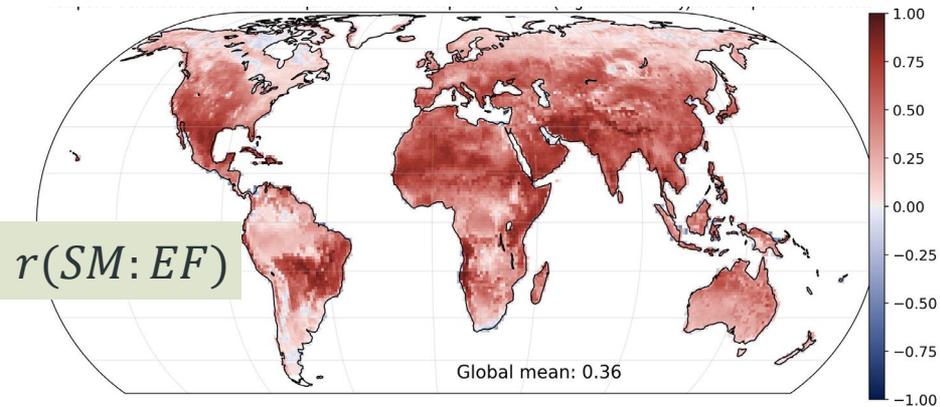
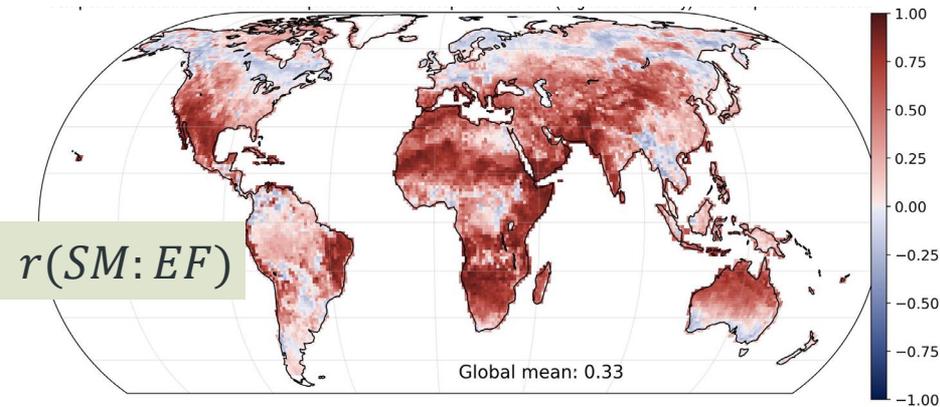
*SM:EF*

CLM

CLM+CAM



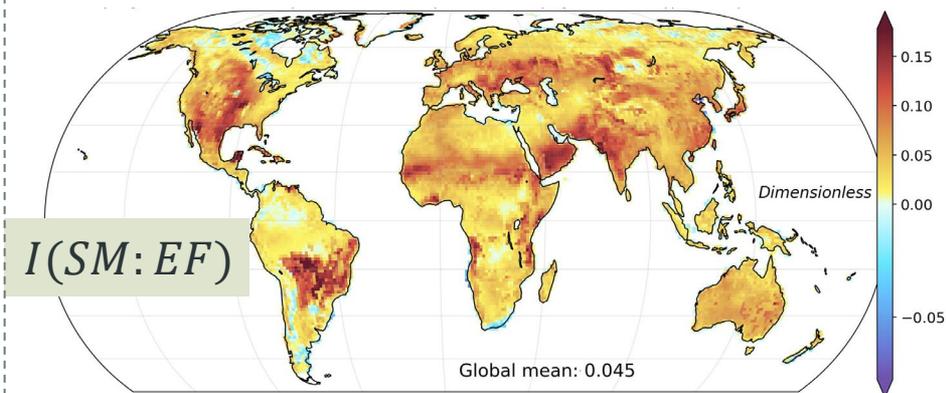
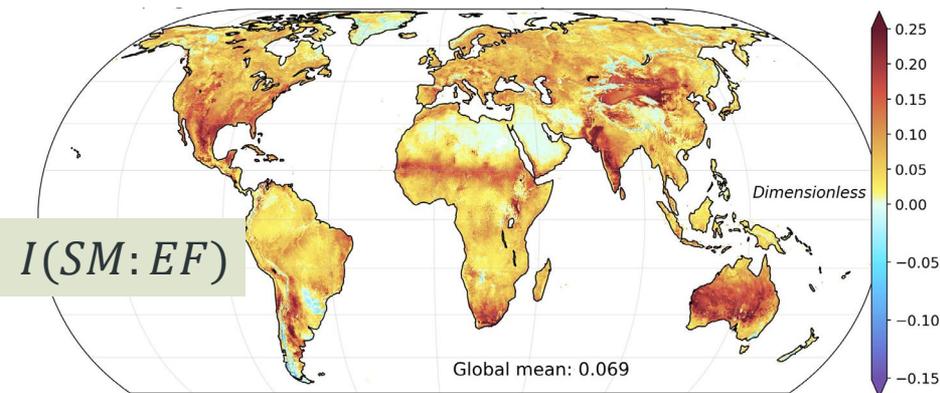
- The stronger and more widespread coupling in CLM+CAM (above) is largely driven by its stronger correlations (below)



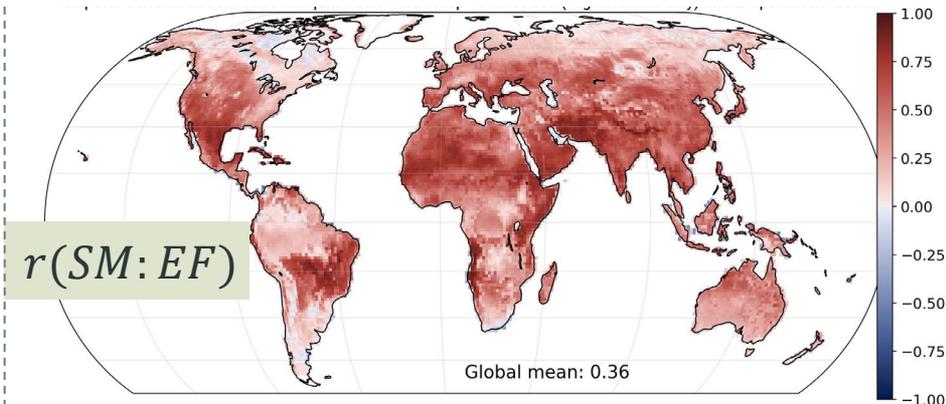
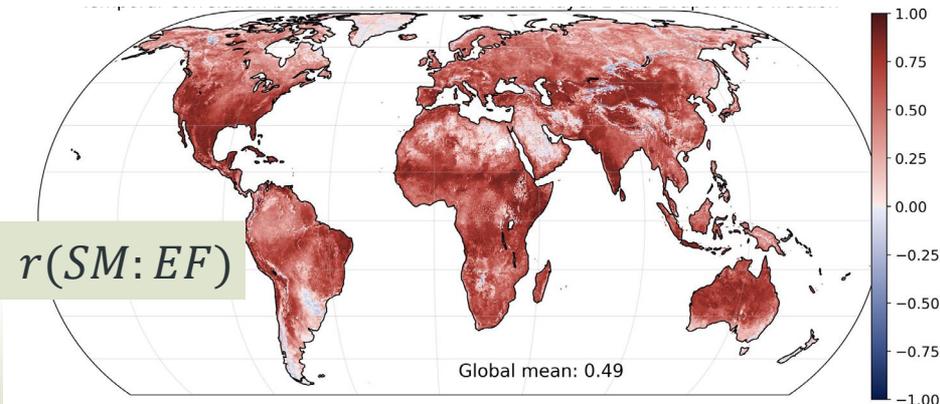
# SM:EF

# ERA5

# CLM+CAM



- ERA5... OK, fine, but reanalysis isn't *really* observations for things like surface fluxes.
- We saw ERA5 is iffy at individual sites. **What can we do to validate models globally?**



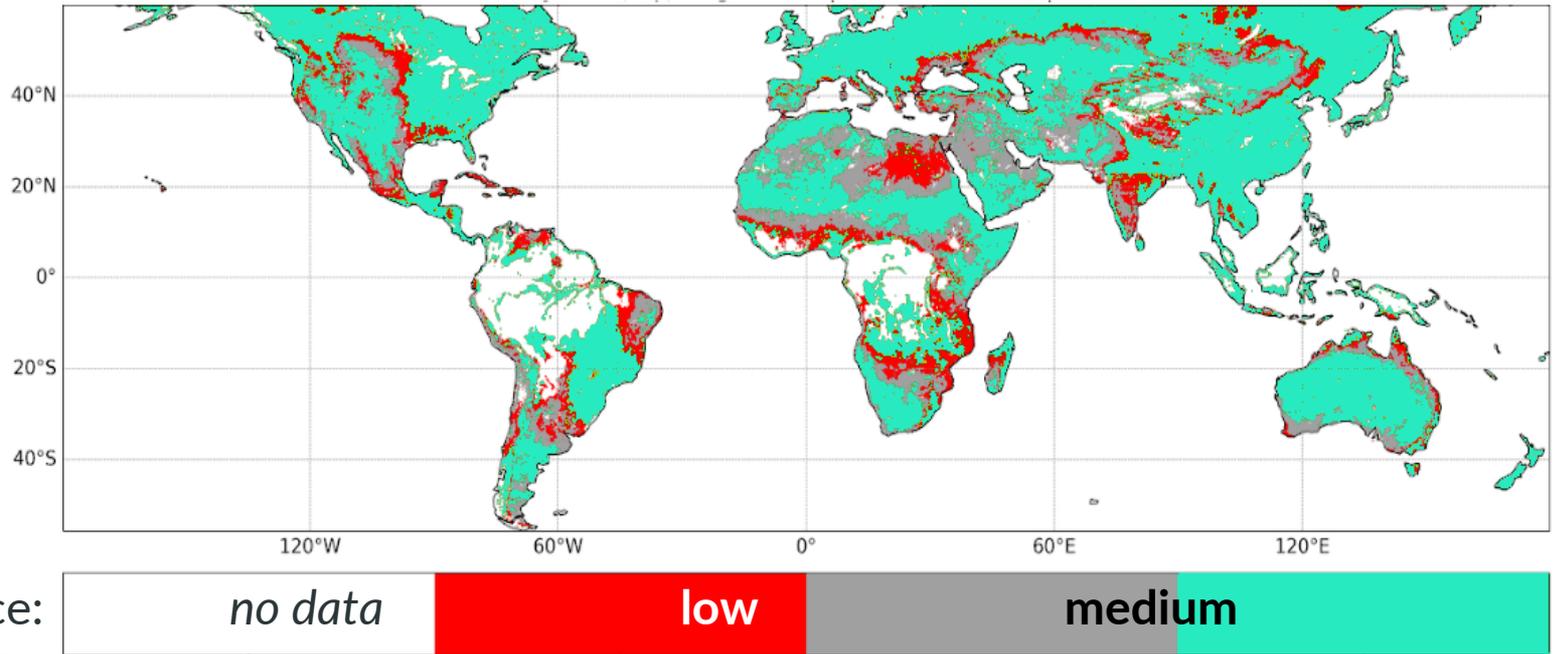
# Data for Global Coupling Metrics

- Three **soil moisture** datasets (all **corrected**\*):
  - **SMAP** (NASA, 2015-) *high information content, limited duration*
  - **CCI** (ESA, 1982-) *multi-platform composite, great coverage*
  - **SoMo.ml** (MPI-Jena 2001-2019) *uses ML to interpolate subsurface soil moisture*
- Three **surface flux** datasets:
  - **FLUXCOM XBASE** (Fluxnet + Satellite data + ML) *LE only*
  - **GLEAM4.1a** (Fluxnet + Satellite data + reanalysis + ML) *also has SH*
  - **CAMELE** (a multi-product composite) *LE only*
- Everything interpolated to  $\frac{1}{4}^\circ$  common grid, daily intervals
- $3 \times 3 = 9$  ways to combine these: *spread treated as uncertainty*

\*removes impact of random noise (Vinnikov et al. 1996, Dirmeyer et al. 2016)

# Regimes & Uncertainty

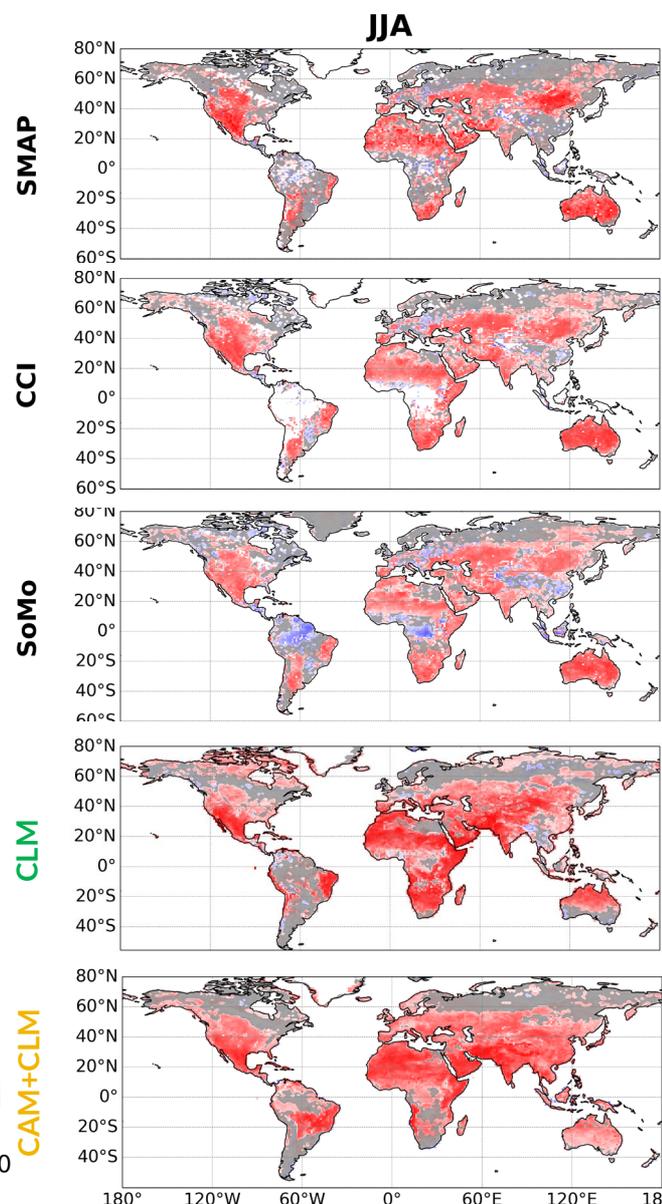
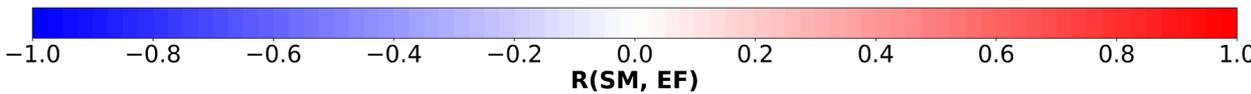
- Red areas – where we are uncertain about boundary between energy & moisture limited regimes (based on  $SM:LE$ , not  $SM:EF$ ). Remarkably tight agreement!



# $r(SM:EF)$

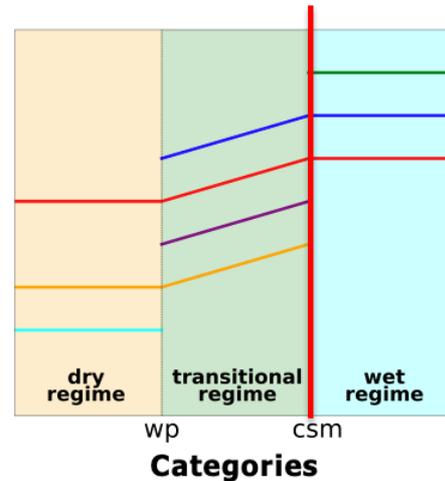
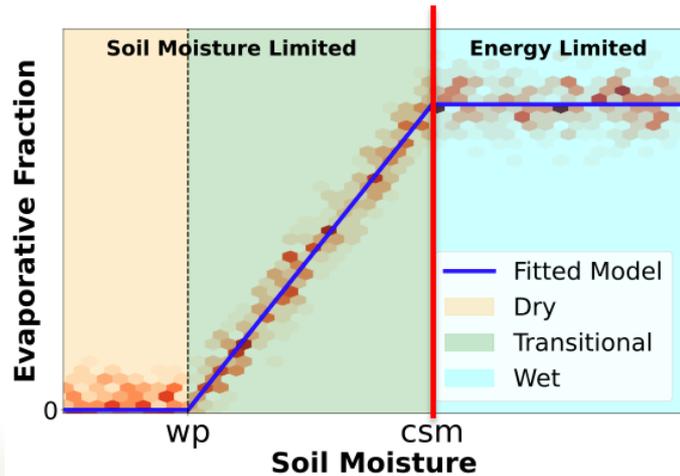
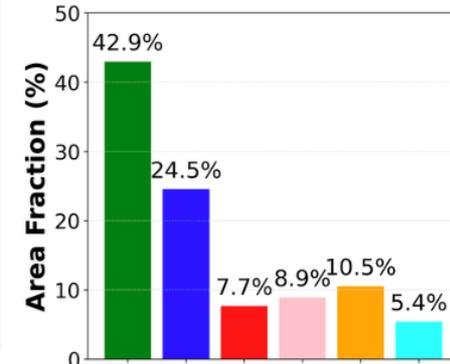
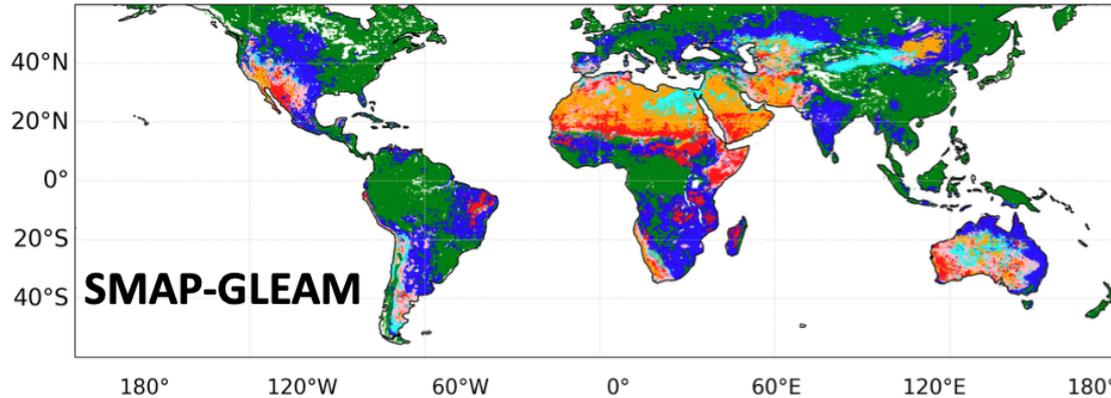
- Here, all using GLEAM for fluxes (it matches the best with tower data)...
- Very **strong agreement on pattern** among SM datasets – mainly the scale shifts.
- CLM and CAM+CLM have:
  - Consistently **stronger coupling** ( $r > 0$  means moisture limited, SM controls fluxes)
  - Consistently **more area** with significant positive correlations
  - **CAM+CLM is more egregious** than CLM in these regards

grey = correlations not significant,  $p > 0.05$ , white: no data



# Coming Back to Regimes

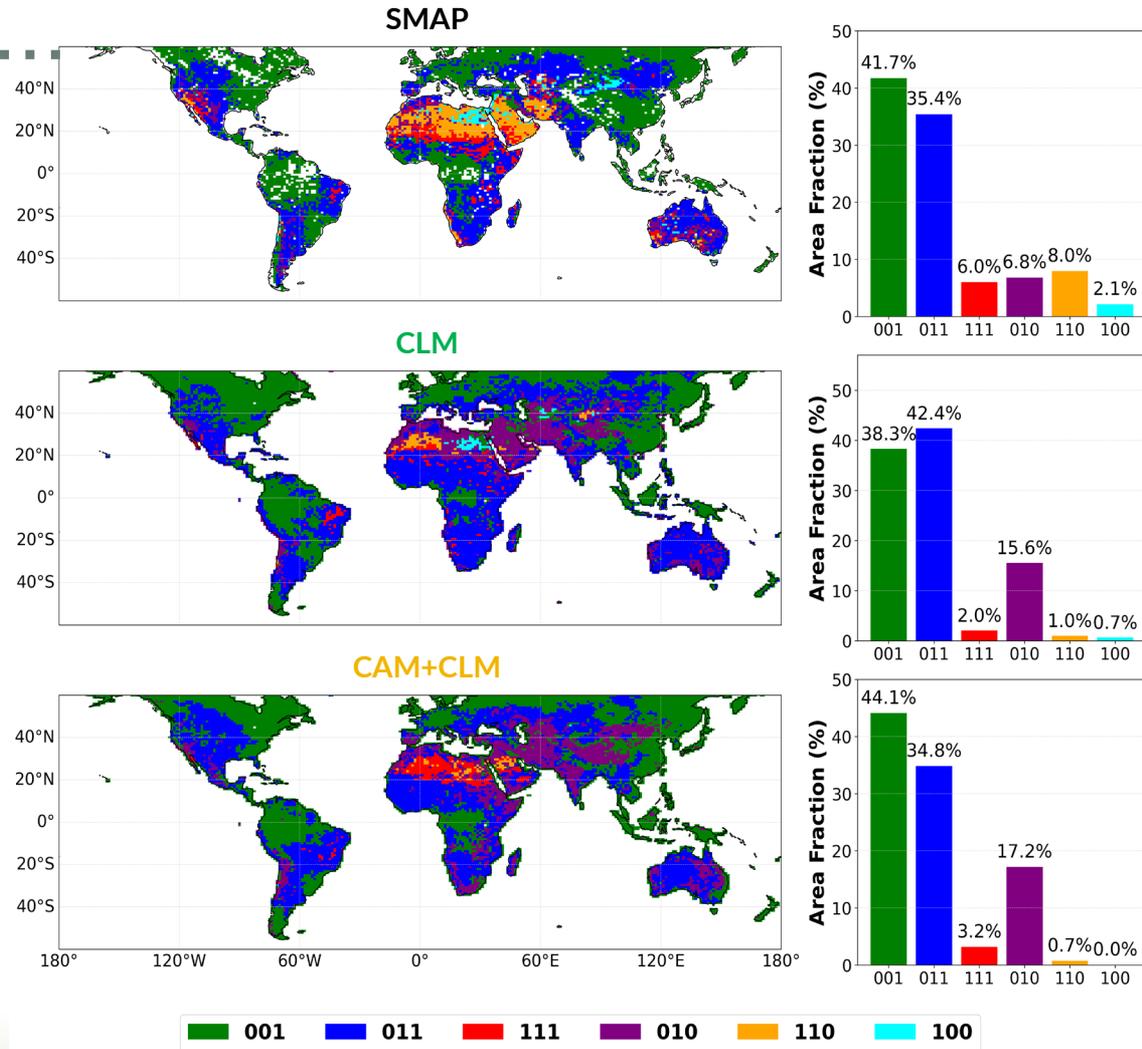
April 2015-  
March 2023



- Wet regime only
- Transitional + Wet
- All three regimes
- Transitional only
- Dry + transitional
- Dry regime only

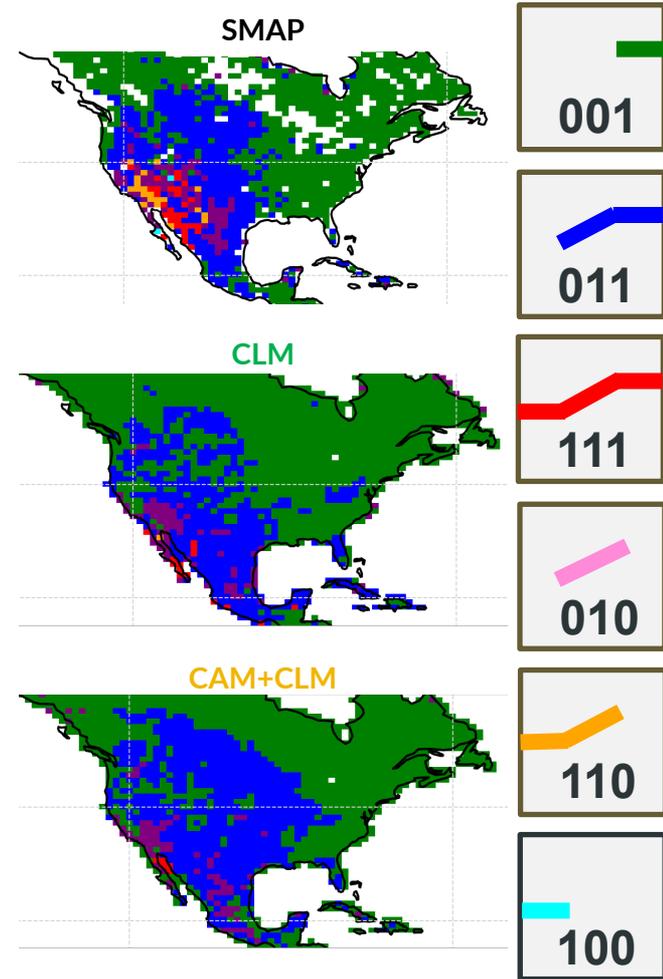
# Very Preliminary...

- Both CESM configs seriously underestimate coverage of **dry** regime.
  - Especially **crucial for extreme heat forecasts**
- A key validation metric: the **location of boundaries** between regimes...



# If We Zoom in...

- These may appear to be subtle differences, but they can have major consequences for:
  - Fidelity of climate simulations
  - Response of climate to anthropogenic forcings
  - Simulation of extremes (drought, extreme heat)
  - Overall S2S forecast skill



# Summary

- **Beginning to look** at the coupled L-A behavior of CESM *from the bottom up*.
- A key resource to properly validate models is **observational estimates of coupling metrics** that illuminates the coupled process chains linking land to atmosphere.
- We are producing global gridded observational analyses for this purpose.
- Not explicitly discussed here: **Vegetation (namely stomatal conductance) is a linchpin that integrates water, energy and carbon cycle drivers of L-A coupling.**

