



# Quantifying sources of subseasonal prediction skill in CESM2

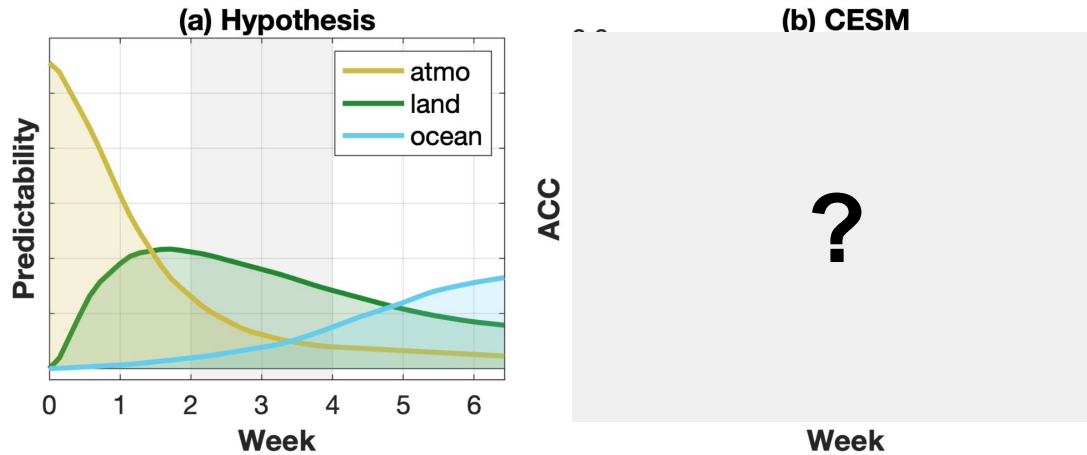
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***ESPWG Meeting***

**March 5, 2024**

# Goal

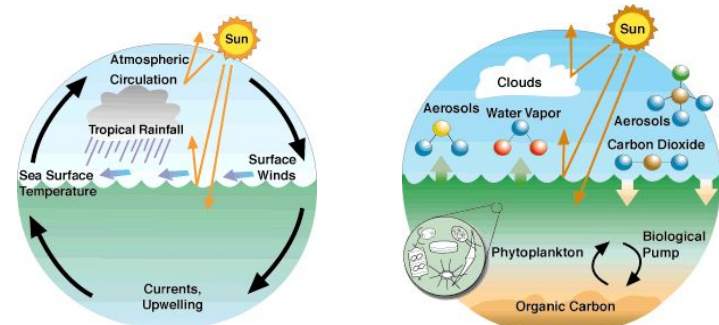
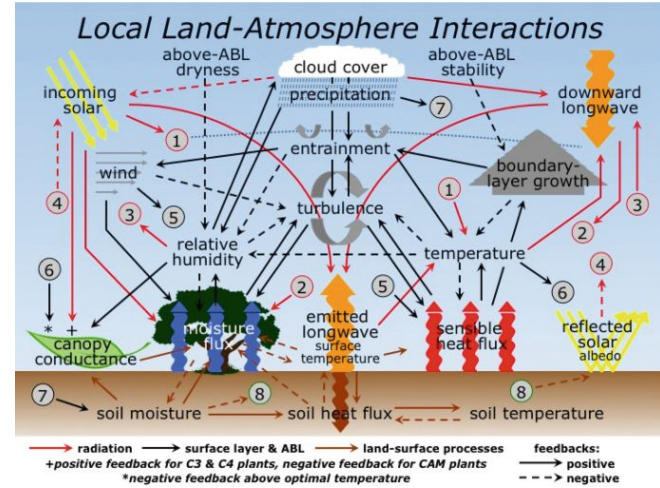
To quantify how much subseasonal predictability comes from the initial state of atmosphere, land, and ocean/sea-ice.



*Recreated figure by Paul Dirmeyer:  
representative of predictability of mid-latitude  
surface temperature over land*

# Additional Sources?

- Diagram assumes ATM, LND, OCN are independent, but they are not ....
- Land and atmosphere are tightly coupled near the surface: Land-atmosphere interact with each other very quickly
- Atmosphere & ocean interact as well (slower timescale)

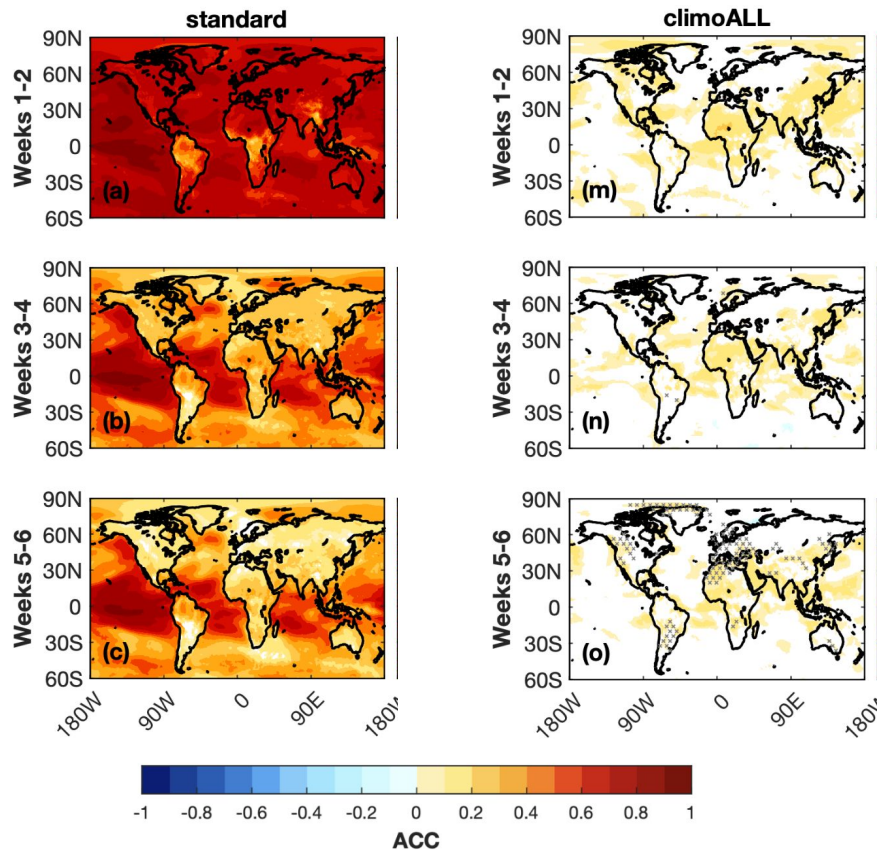


# Methods

- **Calculate skill for 2m Temperature and Precipitation: Weeks 1- 2, Weeks 3-4, Weeks 5 -6**
  - Anomaly Correlation Coefficient (ACC)
  - “Observations” come from ERA5 (2m Temperature) and GPCP (Precipitation) although CPC is comparable
- **Standard reforecast set** (realistic ATM, LND, OCN initialization)
  - 1999 - 2020; weekly initializations; 11 member ensemble
- **Seven additional reforecast sets with various initial states set to climatology**
  - climoATM
  - climoLND
  - climoOCN
  - climoOCNclimoLND
  - climoOCNclimoATM
  - climoATMclimoLND
  - climoALL (all components climo)

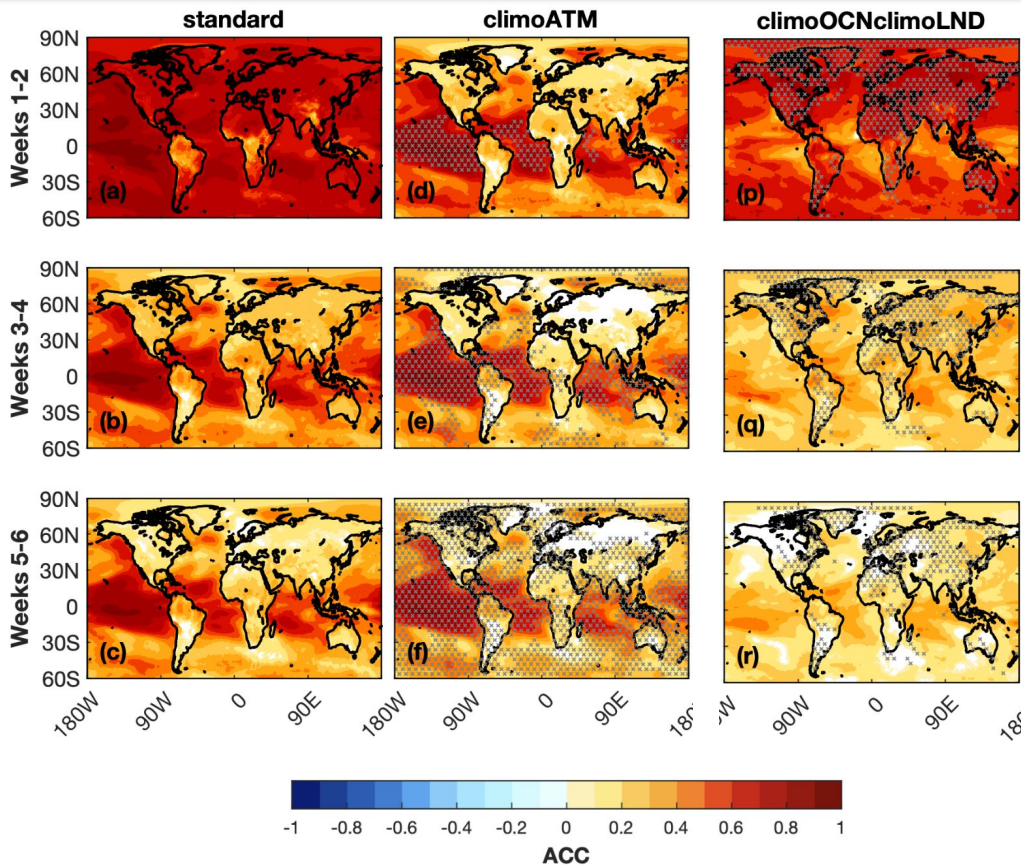
# Annual Mean 2m Temperature ACC

- 2m T skill over land decreases very quickly with time
- Most skill: S. America, parts of Africa
- ACC over tropical oceans ~ 1



- No skill in climoALL runs through week 4

# Annual Mean 2m Temperature ACC: Role of Atmosphere



Weeks 1-2: Almost all skill in NH land regained just with ATM initialization; Not true over S. America

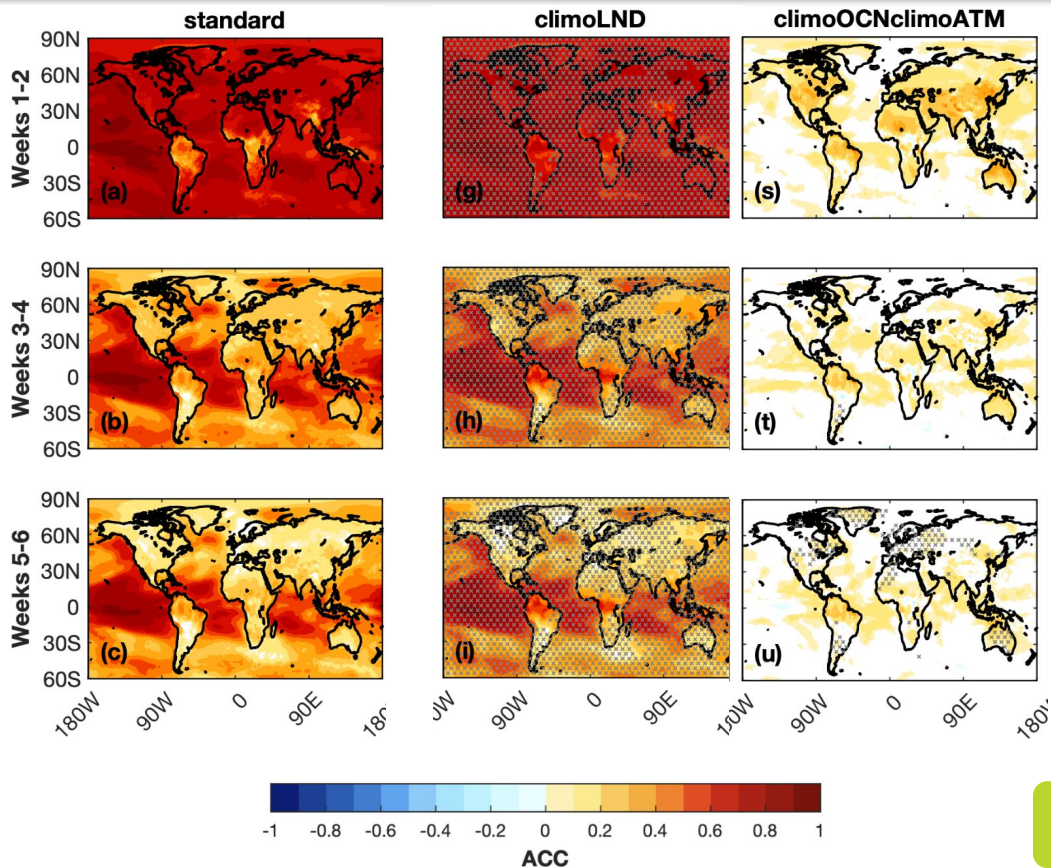
Weeks 3-4: Majority of skill gained from ATM initialization (not all) over NH land

Weeks 5-6:  
Mostly not statistically different from standard forecast

# Annual Mean 2m Temperature ACC: Role of Land

Weeks 1-2: No loss of skill with climatological initialization  
Gain of skill in S. America  
Parts of Africa

Weeks 3-6: Gain of skill over S. America & central Africa from climatological conditions



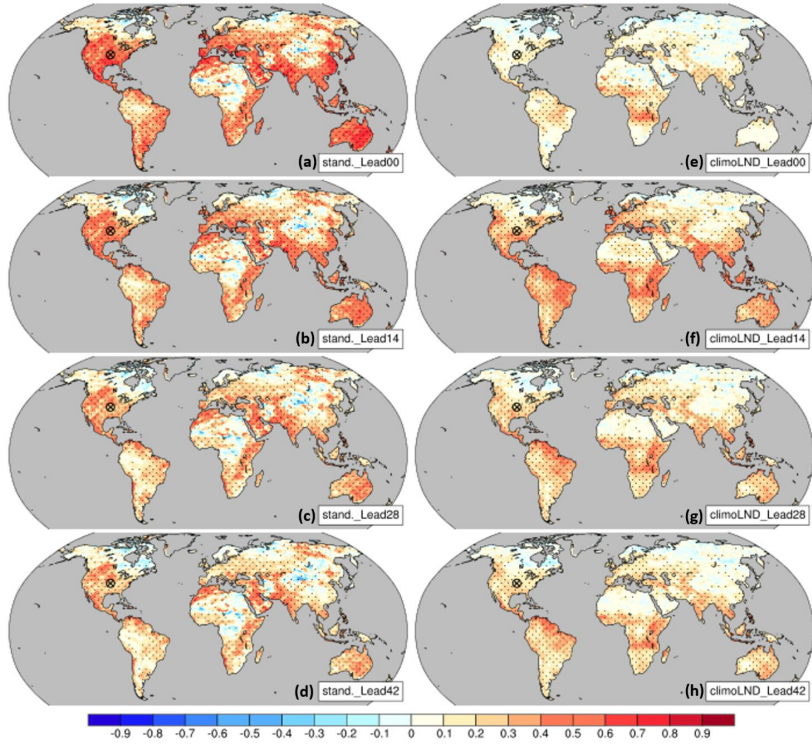
Initializing land only brings in some skill (much more than lost due not initializing)

Not expected!

# Soil Moisture Forecast

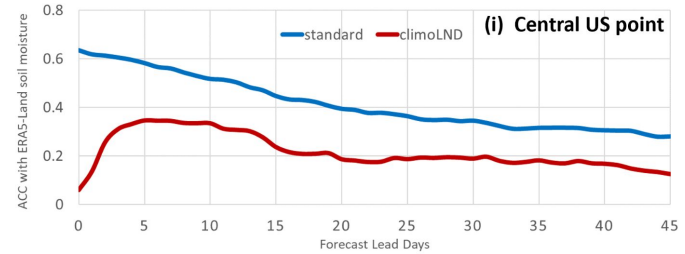
Standard

climoLND



Soil Moisture forecast as expected:

Better forecast when initialized realistically  
(Not translating to better 2m T forecast - why?)

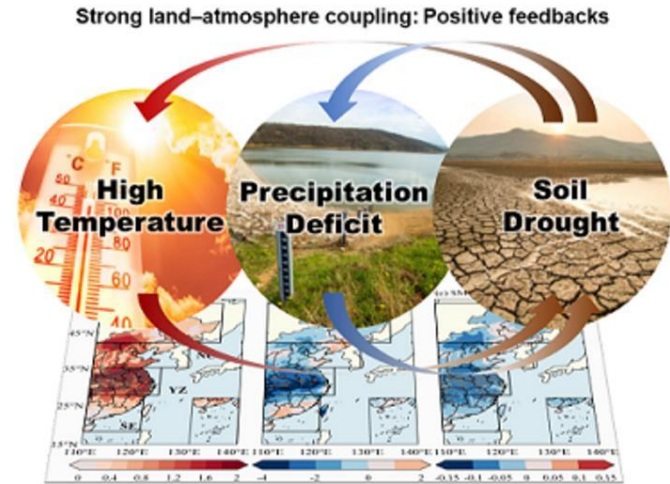


By week 2 (beyond), over S. America and central Africa, better soil moisture skill with climoLND initialization



# Land-atmosphere Coupling

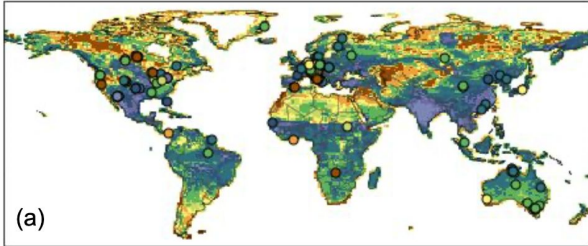
- **High-soil moisture** -> increased evaporative cooling  
-> Negative T anomalies
- **Soil drought** - > positive T anomalies
- **Highest interaction:** both strong soil moisture-evaporation coupling and long soil moisture memory (Guo et al 2011)
- High soil moisture predictability in N. America throughout Spring and Summer, however Low atmospheric predictability due to low atmos-land coupling strength (Guo et al 2011)



# Land-atmosphere coupling

CESM2: JJA

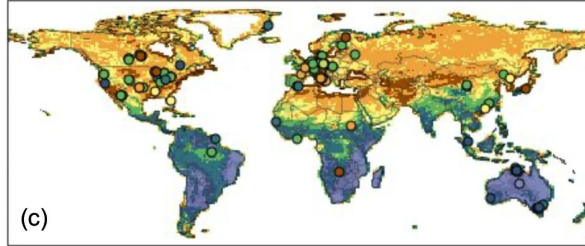
CESM2 Terrestrial Coupling Index (SM, SHF): JJA  
FLUXNET-based estimates in circles



(a)

CESM2: DJF

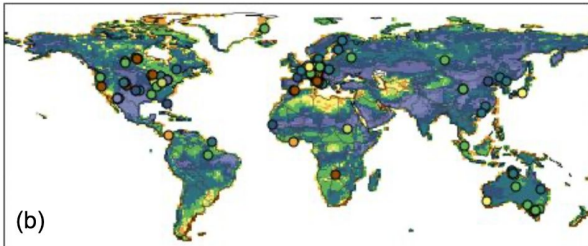
CESM2 Terrestrial Coupling Index (SM, SHF): DJF  
FLUXNET-based estimates in circles



(c)

CESM1: JJA

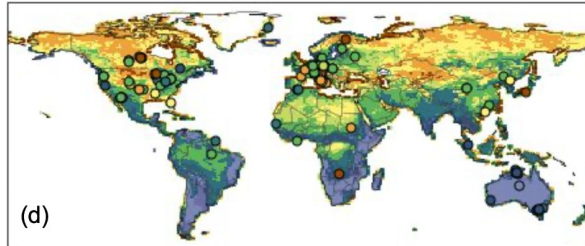
CESM1 Terrestrial Coupling Index (SM, SHF): JJA  
FLUXNET-based estimates in circles



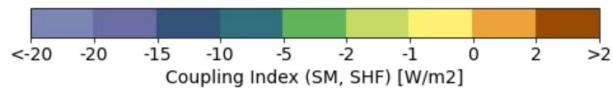
(b)

CESM1: DJF

CESM1 Terrestrial Coupling Index (SM, SHF): DJF  
FLUXNET-based estimates in circles



(d)



CESM2: Strong and negative coupling in summer hemisphere

SH: similar to CESM1 (and to OBS)

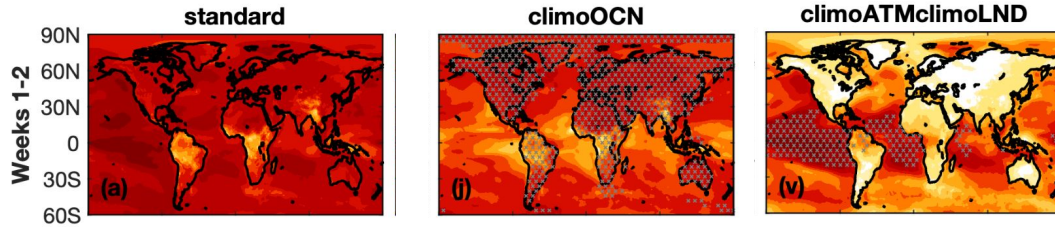
NH: weaker in CESM2 than in CESM1

**Weaker impact of soil moisture on surface fluxes in NH winter in CESM2**

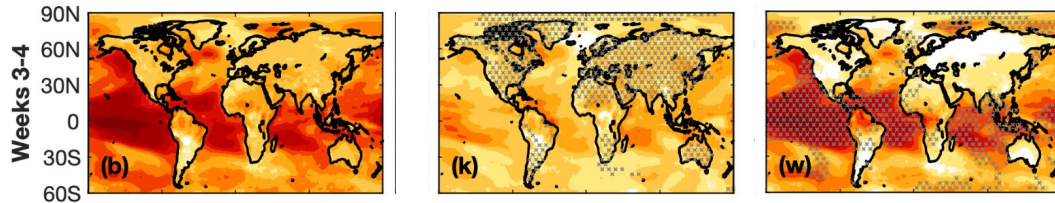
Fig from Meg Fowler

# Annual Mean 2m Temperature ACC: Role of Ocean

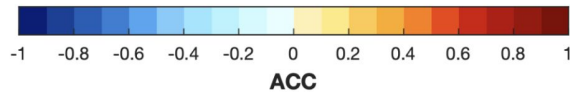
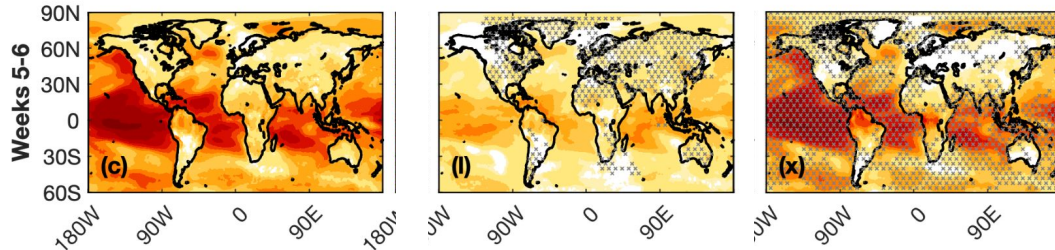
Weeks 1-2: No loss of skill with **over land** climatological initialization



Weeks 3-4: Little loss of skill **over land** with climatological initialization

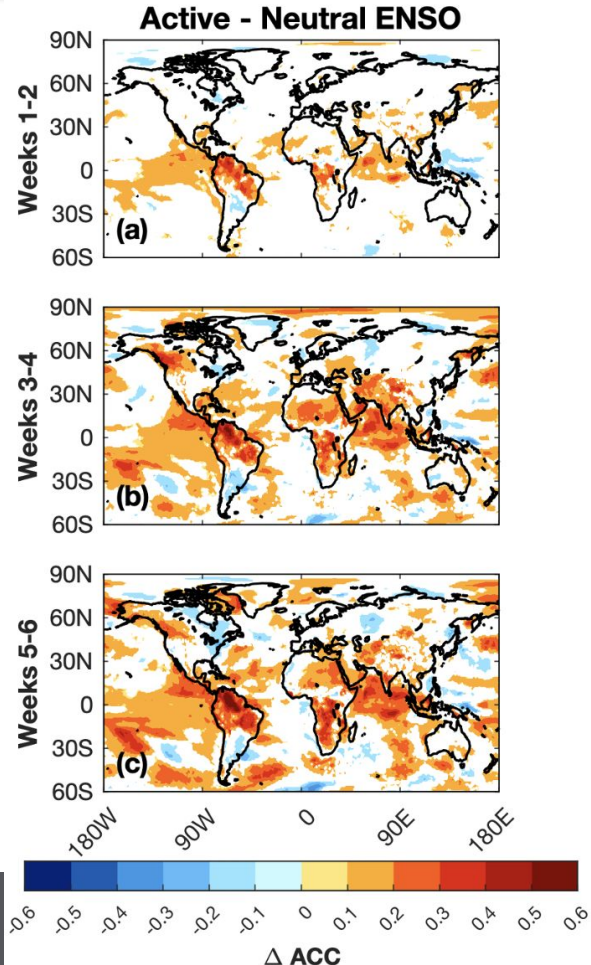


Weeks 5-6: Little loss of skill **over land** with climatological initialization in extratropics  
Reduced skill over Tropical Land



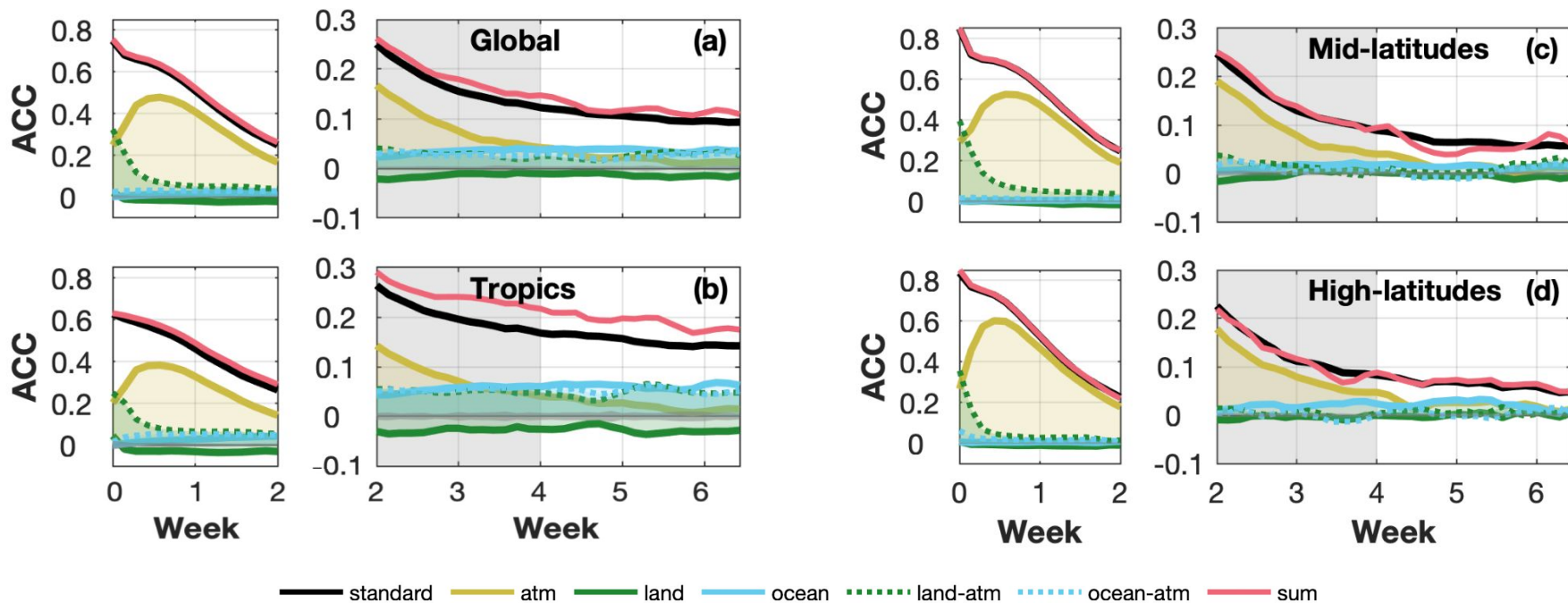
# Role of ENSO

- Increased T skill in ENSO years;
- Benefit in weeks 3-4 and week 5-6
- Mostly in the Tropics: S. America and Africa
- Also in North-West N. America



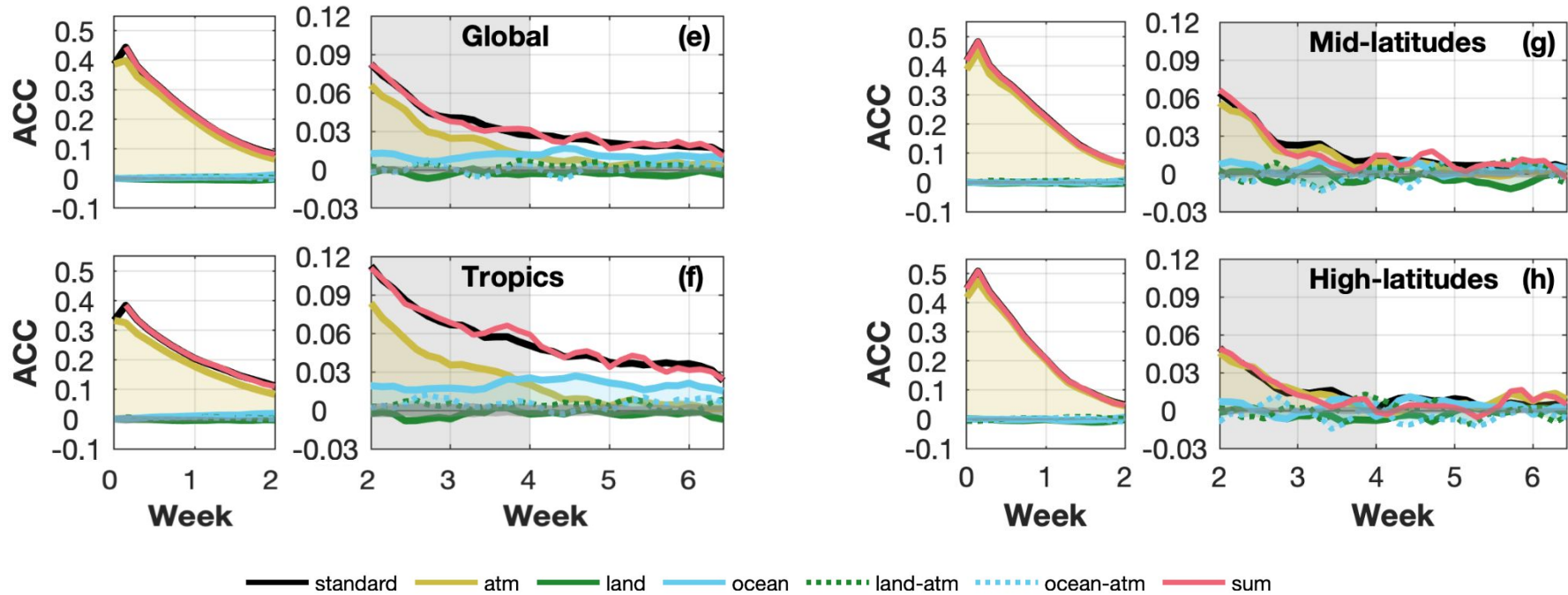
Role of ocean beginning to grow  
in subseasonal window

# Annual Mean 2m Temperature ACC



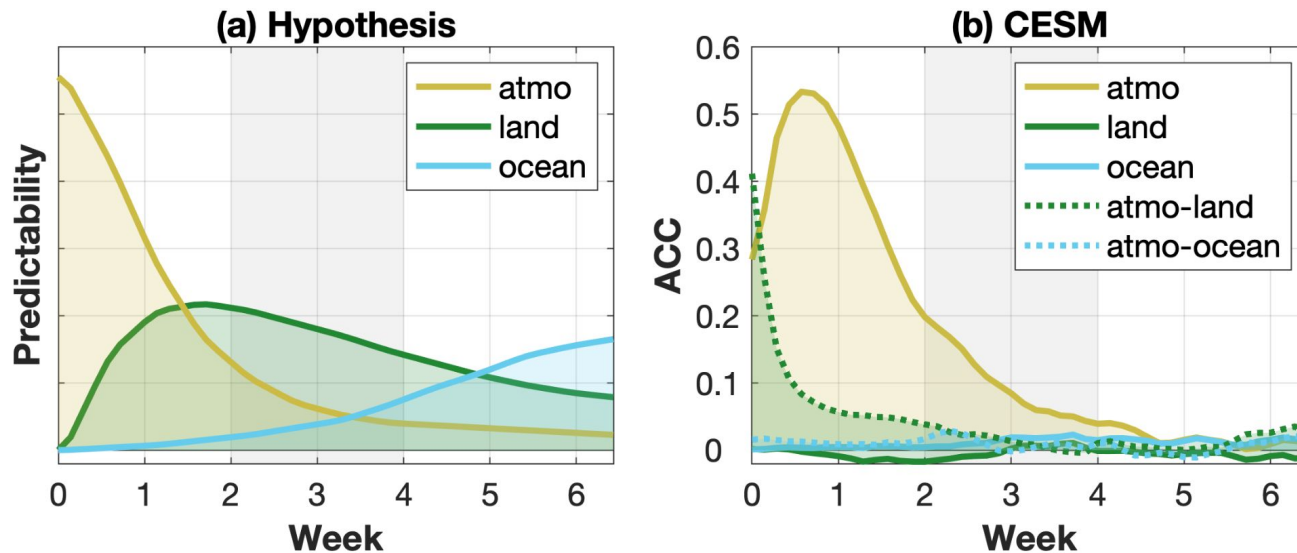
Response is pretty linear

# Annual Mean Precipitation ACC



Response is pretty linear

# Mid-Latitude (30N-60N) Annual Mean 2m Temperature ACC



Predictability sources very different from hypothesis in CESM

# Discussion

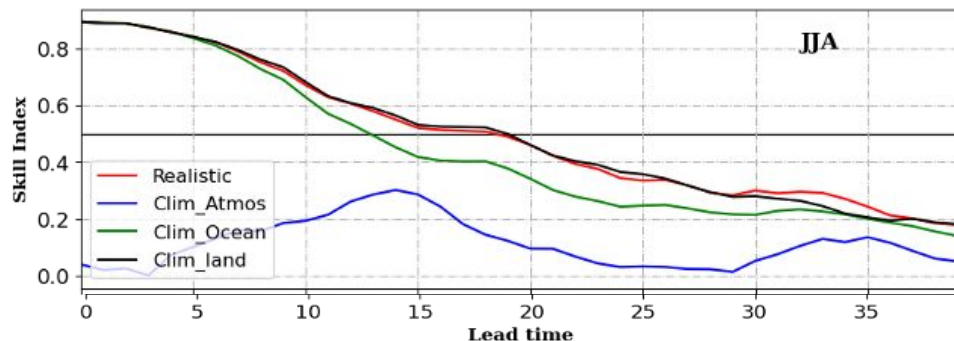
- Results suggest that **atmospheric initial state is the dominant source of 2m air temperature predictability through weeks 3-4** for the majority of land areas, especially in the extratropics
- **Land IC plays a small role in the CESM2(CAM6) subseasonal system** and higher subseasonal skill for surface temperature can be obtained with climatological land initialization
  - Land-coupling not strong enough in CESM2
- Predictability from the **ocean initial state** comparable to that in the atmosphere **in the tropics only**
  - slightly increased skill during active ENSO
- Atmospheric initial state is the main driver of subseasonal **precipitation** skill over extratropical land
  - except for South America and SE Asia/Australia
- Prediction skill seems to be fairly linear

Work published on March 4 in NPJ Climate & Atmospheric Science:  
<https://www.nature.com/articles/s41612-024-00595-4>



# Data & Next Steps

- Raina Roy (Monash U) looking at MJO



- Yanan Duan & Sanjiv Kumar (Auburn U) looking at soil moisture in detail

- Available online: [https://www.earthsystemgrid.org/dataset/ucar.cgd.cesm2.s2s\\_hindcasts.cesm2.climo.html](https://www.earthsystemgrid.org/dataset/ucar.cgd.cesm2.s2s_hindcasts.cesm2.climo.html)
- NCAR casper: [/glade/campaign/cesm/development/cross-wg/S2S/CESM2/](https://glade.campaign.cesm/development/cross-wg/S2S/CESM2/)
- DOI: <https://doi.org/10.5065/0s63-m767>

# Sources of Predictability

## Reforecast Set

climatology of all  
3 components

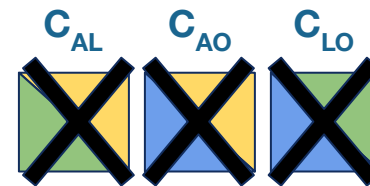
variability due to  
anomalies

coupling between  
components

### climoALL

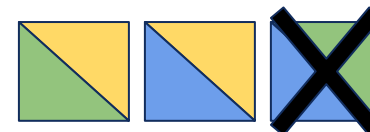
ATM: climatology  
LND: climatology  
OCN: climatology

**Clim**<sub>ALL</sub>



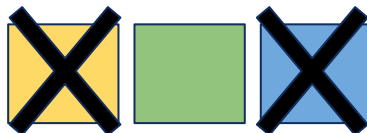
### climoOCNclimoLND

ATM: realistic  
LND: climatology  
OCN: climatology



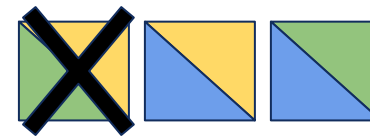
### climoOCNclimoATM

ATM: climatology  
LND: realistic  
OCN: climatology



### climoATMclimoLND

ATM: climatology  
LND: climatology  
OCN: realistic



# How do we quantify the sources of predictability?

$$(1) \text{ standard } = \text{Clim}_{\text{ALL}} + V_{\text{A}} + V_{\text{L}} + V_{\text{O}} + C_{\text{AL}} + C_{\text{AO}} + C_{\text{LO}}$$

$$(2) \text{ climoATM } = \text{Clim}_{\text{ALL}} + V_{\text{L}} + V_{\text{O}} + C_{\text{AL}} + C_{\text{AO}} + C_{\text{LO}}$$

$$(3) \text{ climoLND } = \text{Clim}_{\text{ALL}} + V_{\text{A}} + V_{\text{O}} + C_{\text{AL}} + C_{\text{AO}} + C_{\text{LO}}$$

$$(4) \text{ climoOCN } = \text{Clim}_{\text{ALL}} + V_{\text{A}} + V_{\text{L}} + C_{\text{AL}} + C_{\text{AO}} + C_{\text{LO}}$$

$$(5) \text{ climoOCNclimoLND } = \text{Clim}_{\text{ALL}} + V_{\text{A}} + C_{\text{AL}} + C_{\text{AO}}$$

$$(6) \text{ climoOCNclimoATM } = \text{Clim}_{\text{ALL}} + V_{\text{L}} + C_{\text{AL}} + C_{\text{AO}}$$

$$(7) \text{ climoATMclimoLND } = \text{Clim}_{\text{ALL}} + V_{\text{O}} + C_{\text{AL}} + C_{\text{AO}}$$

$$(8) \text{ climoALL } = \text{Clim}_{\text{ALL}}$$

$$(9) \text{ sum } = \text{Clim}_{\text{ALL}} + V_{\text{A}} + V_{\text{L}} + V_{\text{O}} + C_{\text{AL}} + C_{\text{AO}}$$

$$(10) \text{ sum } \approx \text{ standard }$$

When **climatological** initial conditions are **used for a single component**, we can remove that component's variability term. We assume that the average coupling between the components do not change much between the reforecast sets.

When **climatological** initial conditions are **used for two components**, we assume their two variability terms are negligible, along with their shared coupling term

Assuming that the **land-ocean coupling  $C_{\text{LO}}$  is nearly zero** over land, we can then use the earlier variability results ( $V_{\text{L}}$  and  $V_{\text{O}}$ ) to solve for  $C_{\text{AL}}$  and  $C_{\text{AO}}$ . If the linearity assumption holds, we should be able to retrieve the standard ACC by adding the individual components.