

Skillful Long-lead Prediction of US Midwest Summertime Heavy Rain from Ocean Salinity

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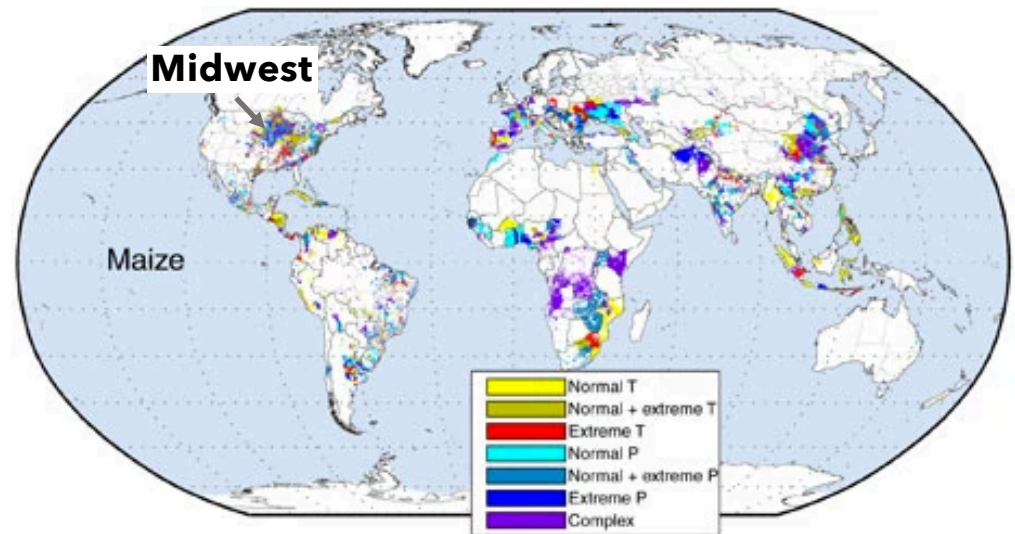
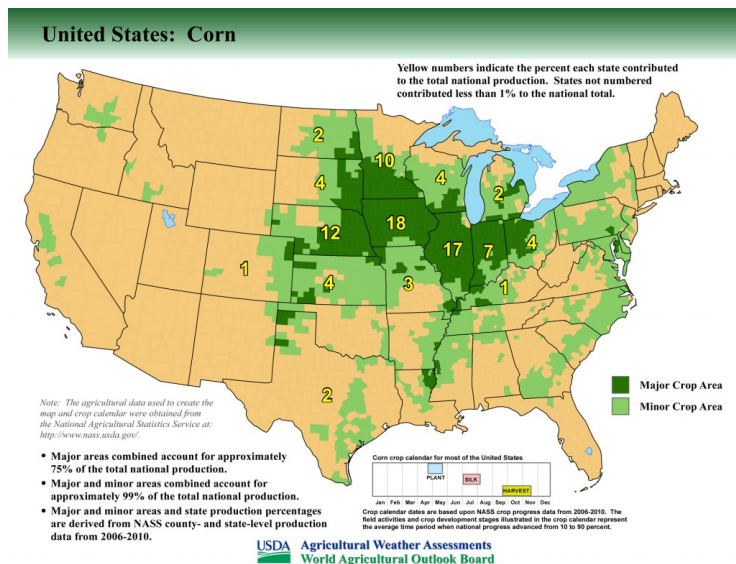
³Institute of Computational and Data Science, PSU

⁴Earth and Environmental Science Institution, PSU

NOAA's 46th CDPW | 10/26/2021

Introduction: US Midwest precipitation

Climate factors impacting corn production



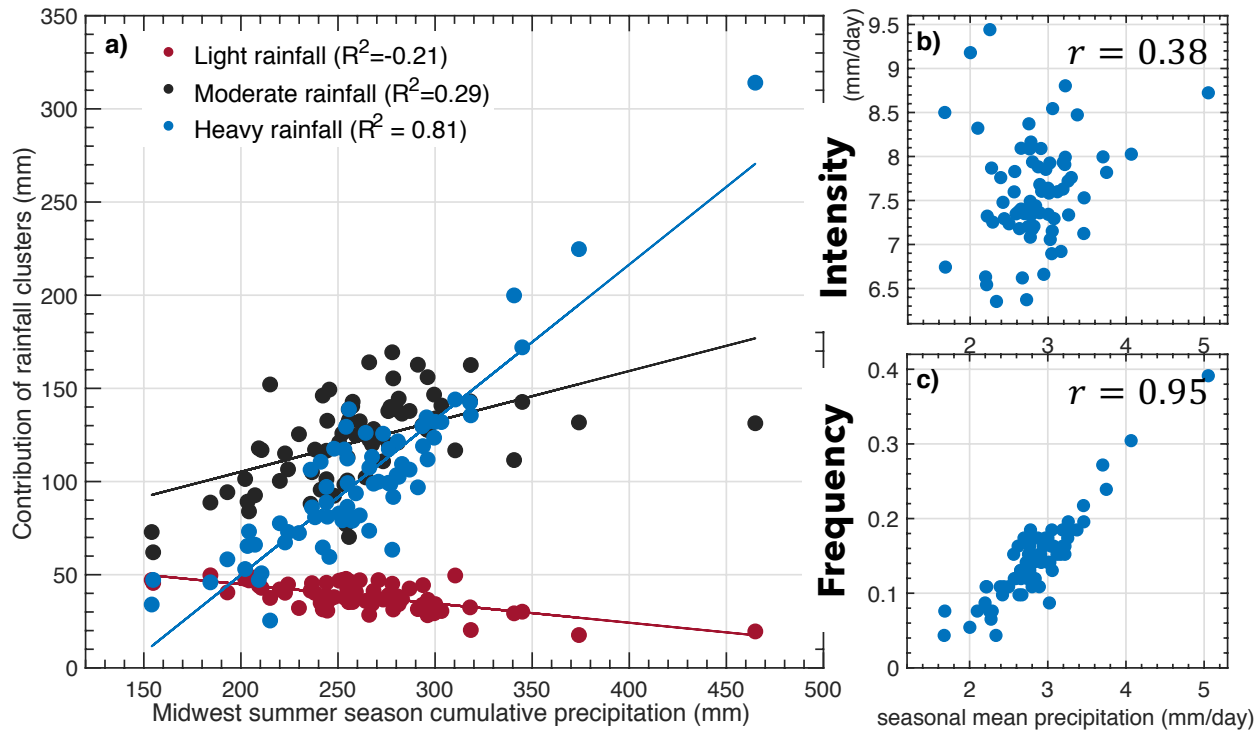
Ray et al. (2015) Nature Communications

- Midwest is a primary corn production area in the US

- Corn production in the US Midwest is significantly impacted by the amount of rainfall.

Heavy rainfall: important to Midwest summer rain

Statistical inference based on a 3-cluster Bayesian Gaussian mixture model (Li et al. 2013; 2016)



Statistical Model:

- Objectively categorize daily rainfall to **light**, **moderate**, and **heavy** clusters based on probability density function
- Code available at: <https://zenodo.org/record/5389218#.YTEWgtNKjVo>

Results:

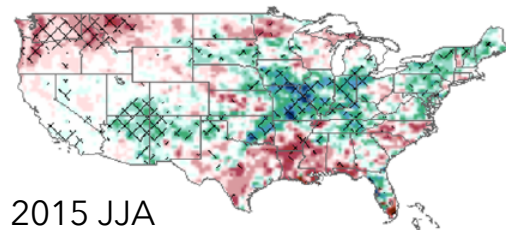
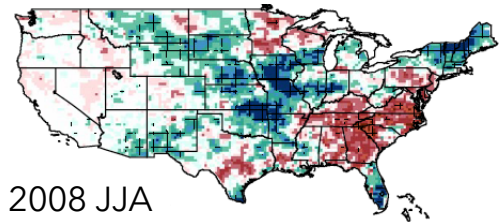
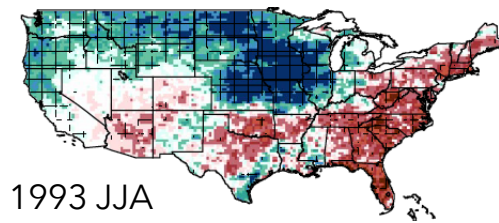
- Heavy rainfall cluster contributes the most to Midwest summer rainfall variability
- Frequency > Intensity

Li et al. (2021) GRL, Under Revision

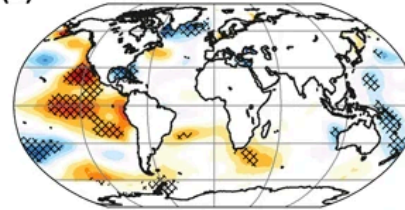
*Midwest:

106°W-90°W; 36°N-49°N

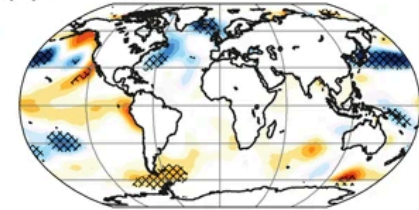
Uncertain SSTA-heavy rainfall relationship



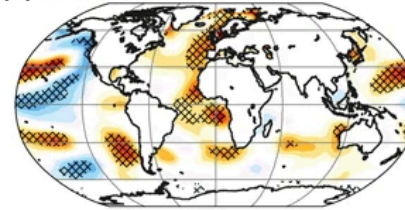
(a) 1993 MAM



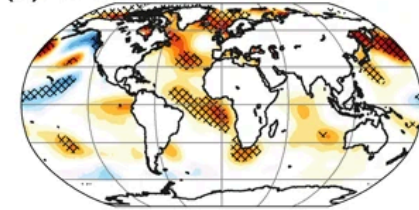
(b) 1993 JJA



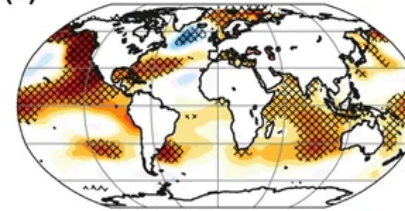
(c) 2008 MAM



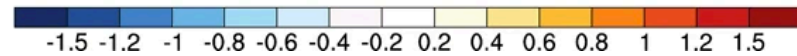
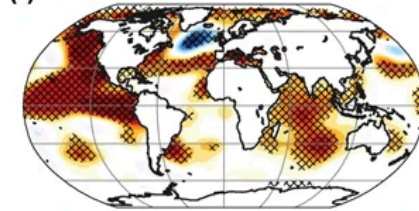
(d) 2008 JJA



(e) 2015 MAM

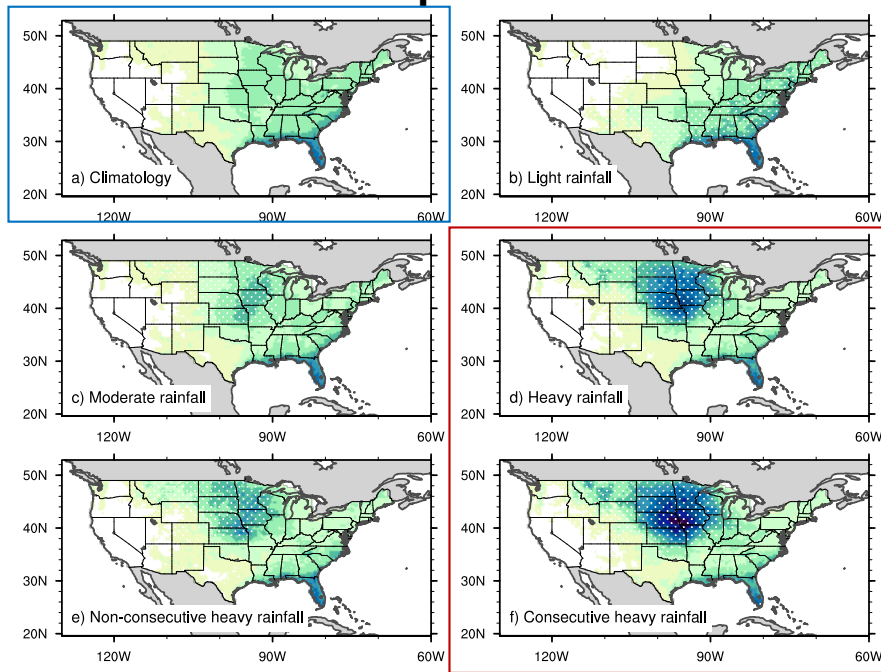


(f) 2015 JJA



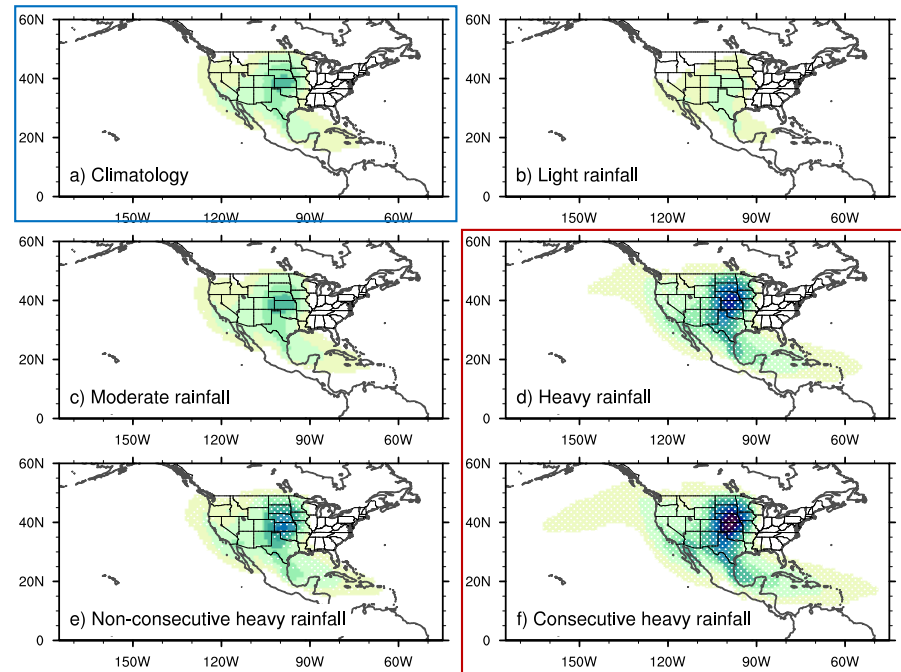
Moisture sources for US Midwest heavy rain

Precipitation



Precipitation rate (mm/day)

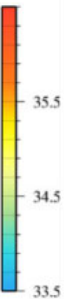
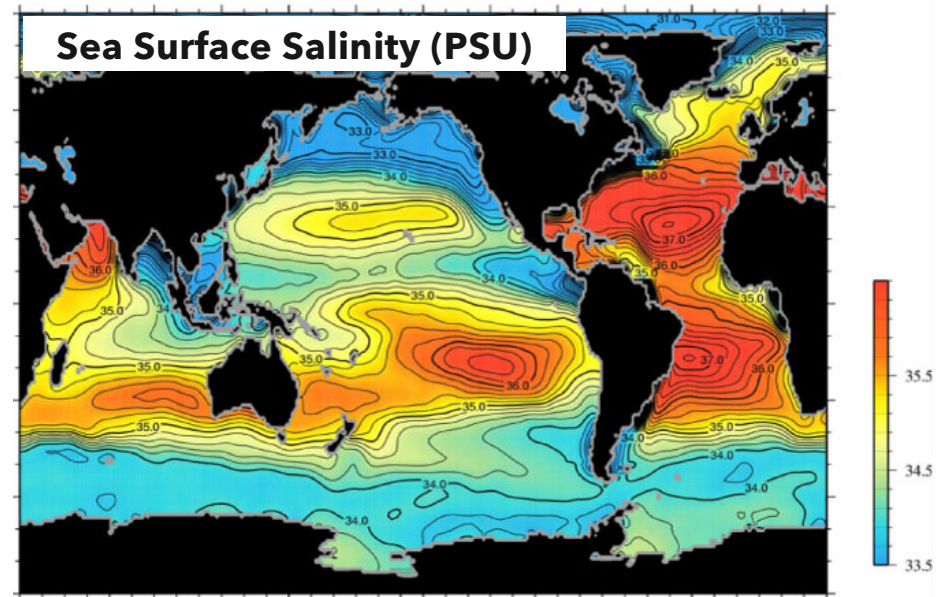
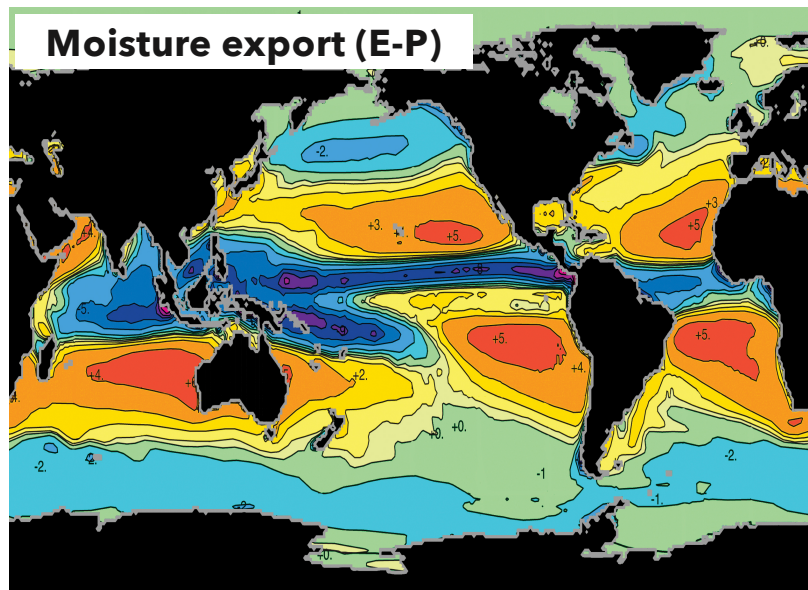
Moisture sources



Moisture contribution (mm/day)

Oceanic moisture export leaves an imprint on salinity

Sea surface salinity as "Nature's rain gauge"



New opportunities for rainfall prediction from ocean **salinity**

RESEARCH ARTICLE Li et al. Sci. Adv. 2016; 2: e1501588

OCEANOGRAPHY

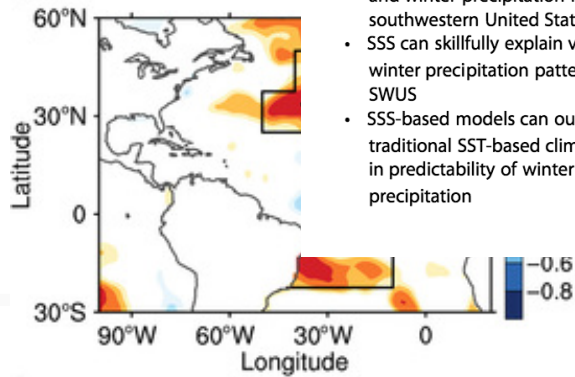
Geophysical Research Letters

North Atlantic imprint on Sahel rainfall

Laifang Li,^{1*} Raymond W.

Water evaporating from the ocean leaves a clear imprint on sea surface salinity (SSS) in the tropical Atlantic.

MAM Salinity



RESEARCH LETTER
10.1029/2018GL079293

Key Points:

- We search globally for teleconnections between autumn-lead sea surface salinity and winter precipitation in southwestern United States
- SSS can skillfully explain variations in winter precipitation patterns in the southwestern United States
- SSS-based models can outperform traditional SST-based climate models in predictability of winter precipitation

Climate Dynamics (2019) 53:5495–5509
<https://doi.org/10.1007/s00382-019-04878-y>

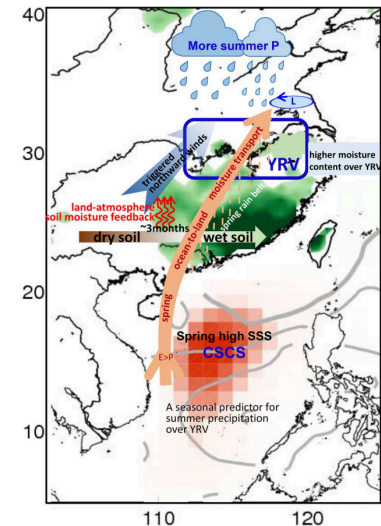
Forecast of summer precipitation in the Yangtze River Valley based on South China Sea springtime sea surface salinity

Lili Zeng¹ · Raymond W. Schmitt² · Laifang Li³ · Qiang Wang¹ · Dongxiao Wang¹

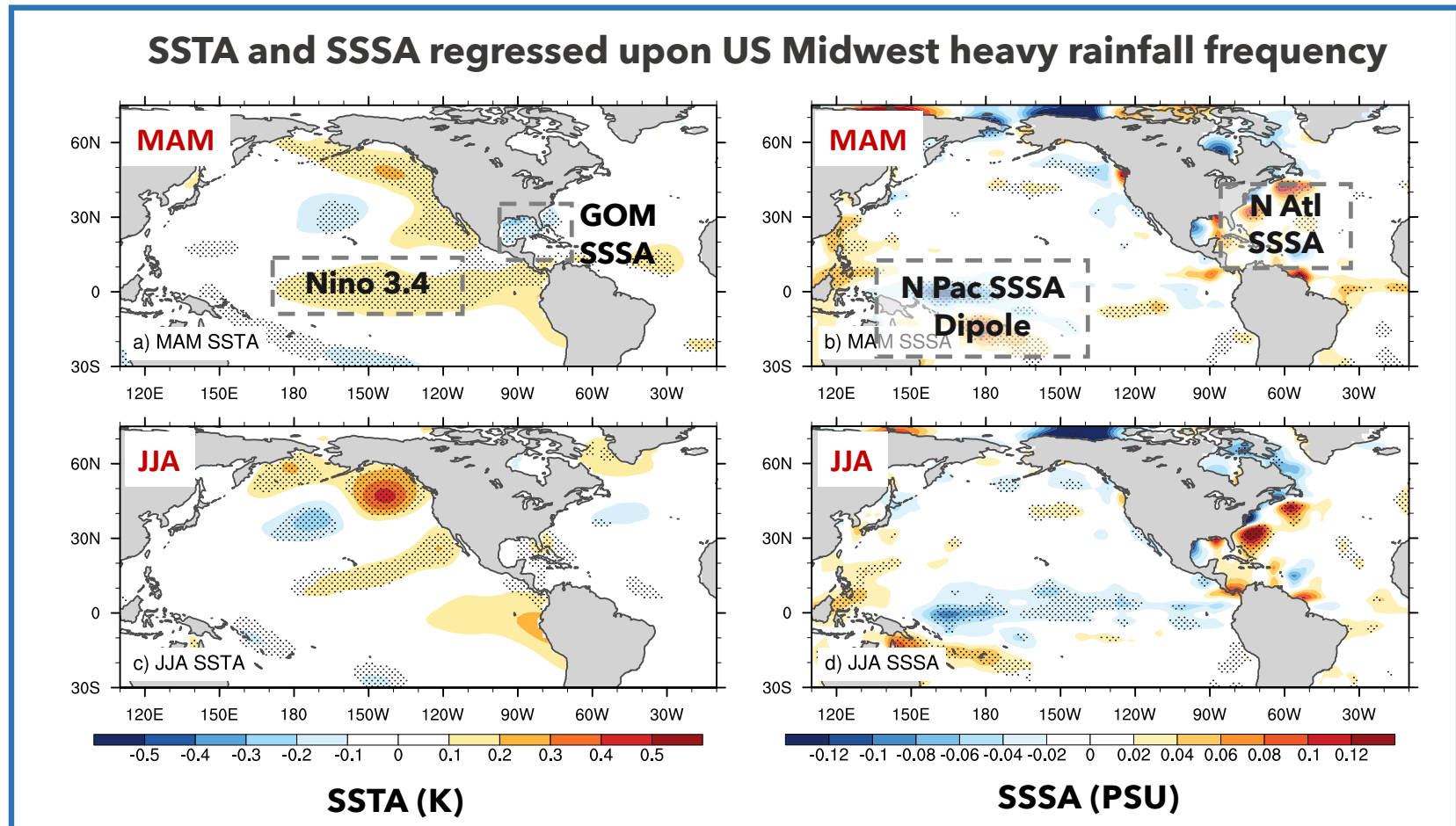
Received: 19 December 2018 / Accepted: 24 June 2019 / Published online: 4 July 2019
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Abstract

As a major moisture source, the South China Sea (SCS) has a significant impact on the ocean-to-land moisture transport that generates sea surface salinity (SSS) anomalies that can act as a predictor on land. This study illustrates a high correlation between springtime SSS in the SCS and summer precipitation over the middle and lower Yangtze River Valley (the YRV region). The linkage between springtime SSS and summer YRV precipitation is established by ocean-to-land moisture transport by atmospheric moisture transport. In spring, oceanic moisture evaporated from the sea surface generates higher moisture content over the YRV region and directly feeds the precipitation over southern China and the YRV region. The results show about 3 months triggering land-atmosphere soil moisture feedback and modulating the atmospheric circulation in the subsequent summer. Evaluation of the atmospheric moisture balance shows a stronger northward meridional wind and a local thermodynamic contribution (higher moisture content over the YRV region).

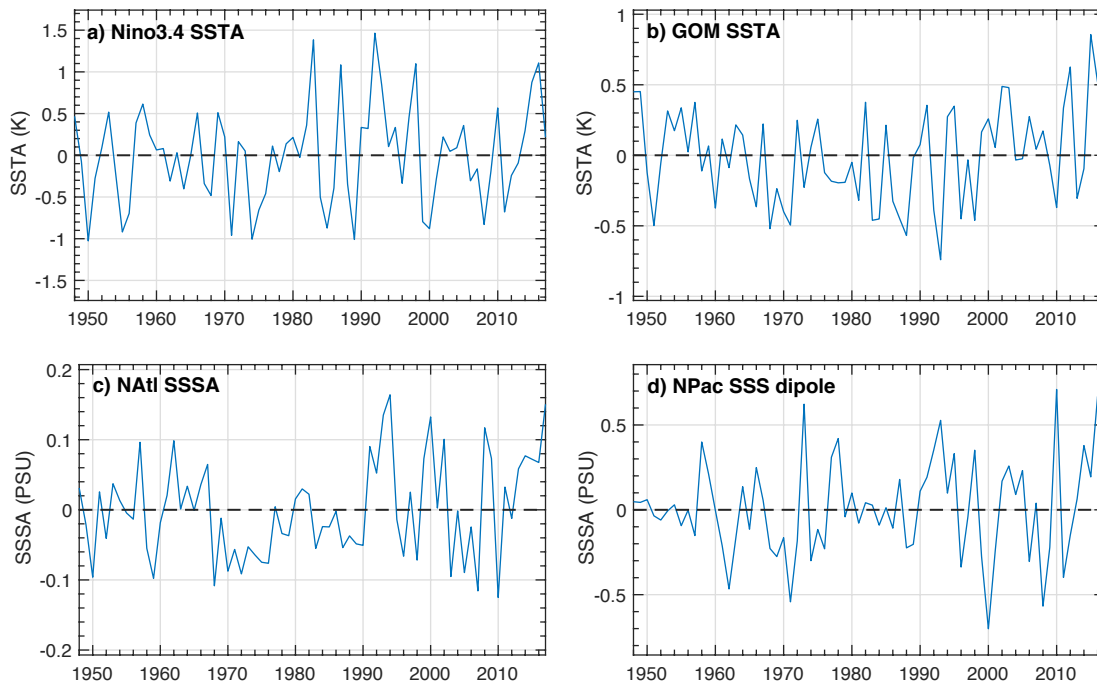


Global search for Midwest rainfall predictors



SSTA- & SSSA-based predictors

SSTA and SSSA time series



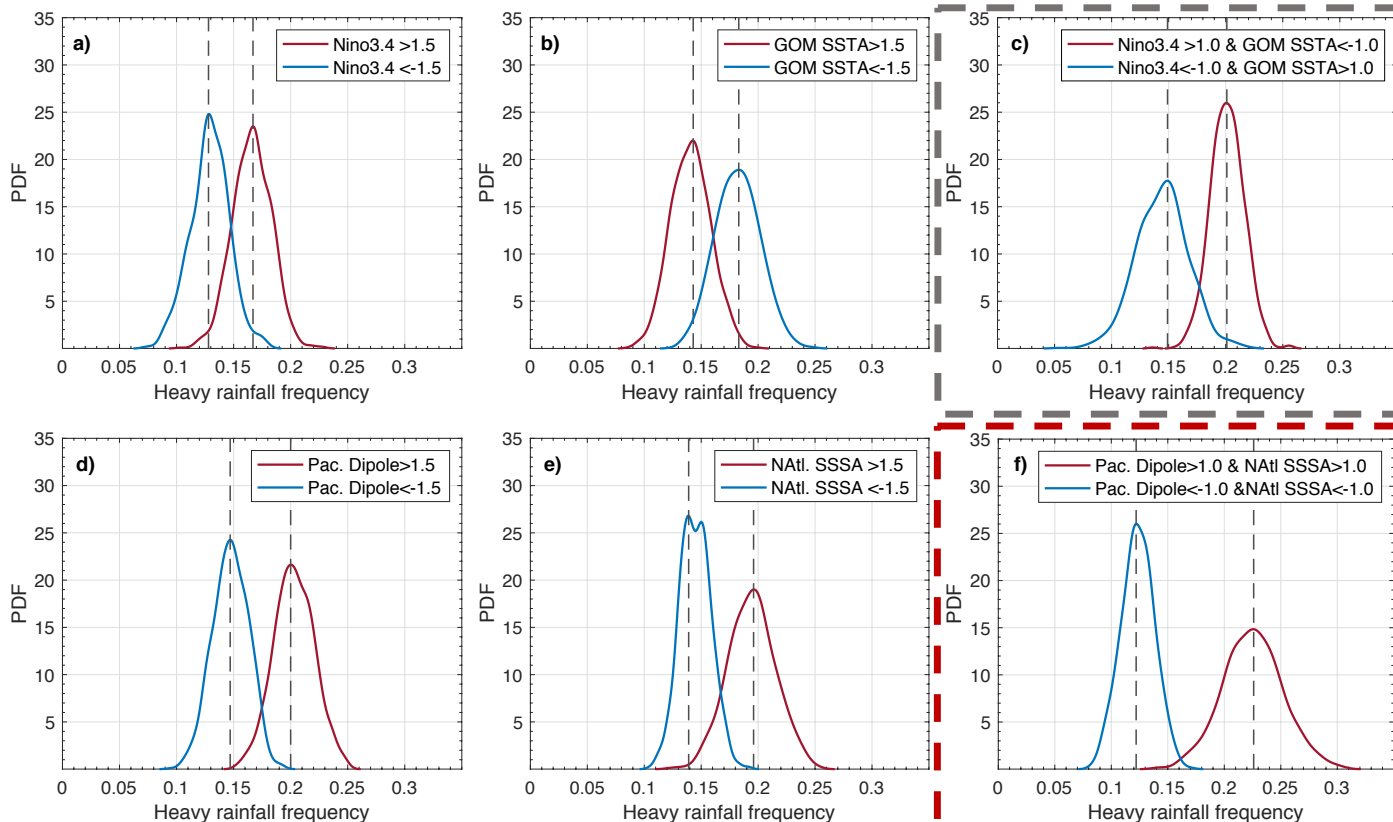
Cross correlation between SSTA and SSSA indices

	Nino 3.4	GOM SSTA	NATl SSSA	NPac SSSA
Nino 3.4		-0.08	0.09	0.60
GOM SSTA	-0.08		<i>0.32</i>	-0.08
NATl SSSA	0.09	<i>0.32</i>		-0.13
NPac SSSA	0.60	-0.08	-0.13	

Li et al. (2021) GRL, Under Revision

Heavy rainfall frequency vs. predictors

Probability density function of Midwest heavy rainfall frequency



Resampled based on predictor indices using the Bayesian Gaussian mixture model (Li *et al.* 2013; 2016):

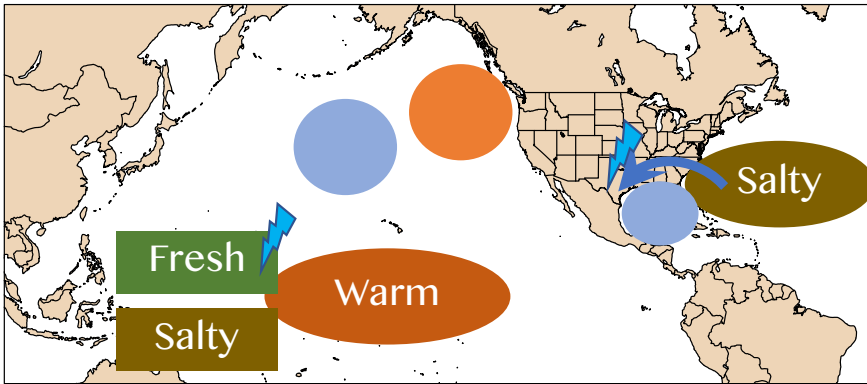
- Pre-season SSTA → moderate skill
- Pre-season SSSA → doubles the skill from SSTA-based predictors

* N. Pac SSSA dipole highly correlated with ENSO, but is more skillful than ENSO in rainfall prediction

Li *et al.* (2021) GRL, Under Revision

Salinity-Midwest heavy rainfall relationship

MAM



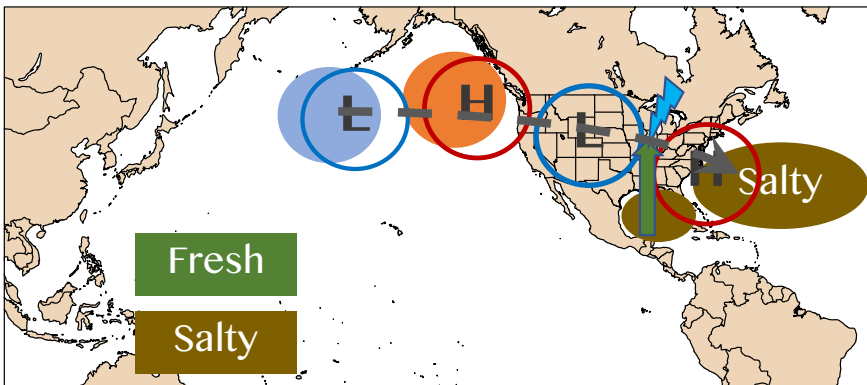
North Atlantic salinity (Li et al. 2018):

- long memory of soil moisture
- Dynamic and thermodynamic impacts on moisture flux

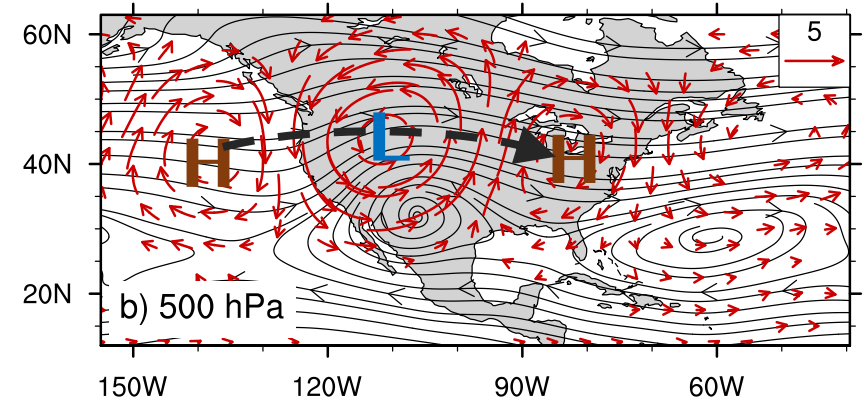
North Pacific salinity dipole (Li et al. 2021):

- Tropical-extratropical teleconnection
- Long-persistence of extratropical SSTA
- Wave-train pattern

JJA



Atmo. circulation during Midwest heavy rain



Li et al. (2021) GRL, Under Revision

Predict US Midwest heavy rain using salinity

- Construct *logistic regression* model

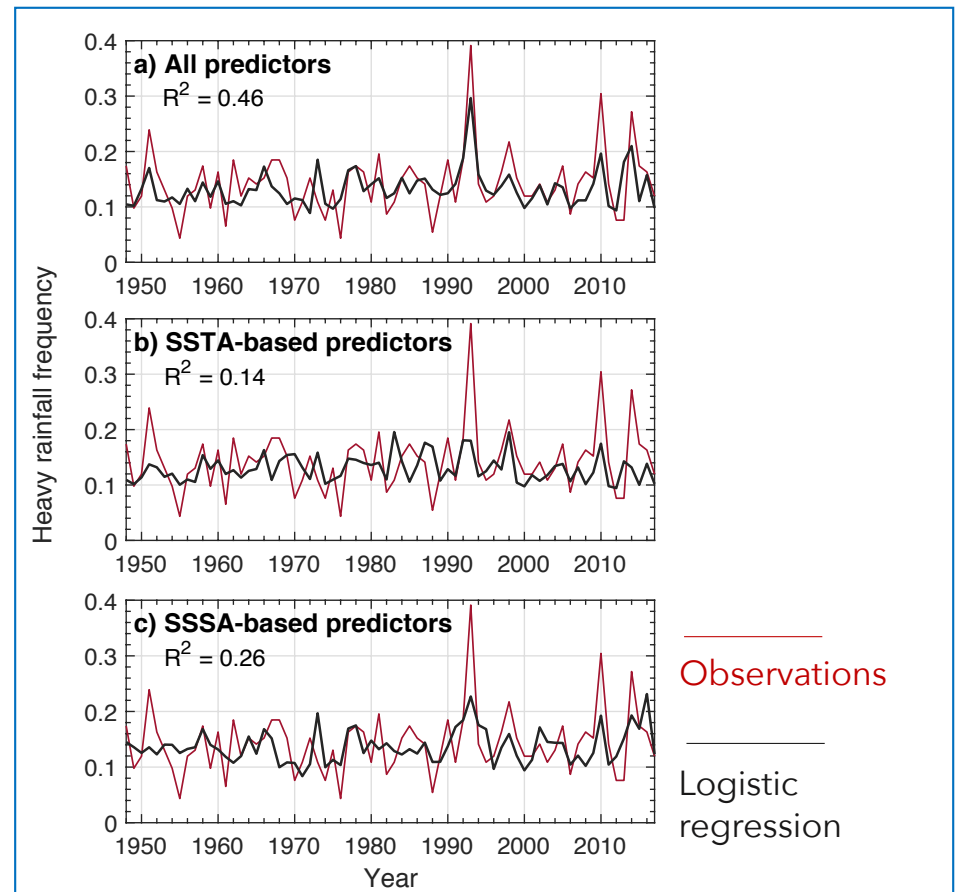
$$y = \frac{1}{1 + \exp(-\theta^T x)}$$

y: heavy rainfall frequency

x: predictors: Nino3.4; GOM SSTA, NAtl. SSSA, NPac. SSSA dipole

θ : regression parameters

- Logistic regression with pre-season SSTA and SSSA generates skillful prediction of US Midwest heavy rainfall
- SSSA-based predictors are almost twice more skillful than SSTA-based predictors



Conclusions & discussion

Pre-season salinity anomaly improves the skill (92% increase) to predict US Midwest heavy rainfall

