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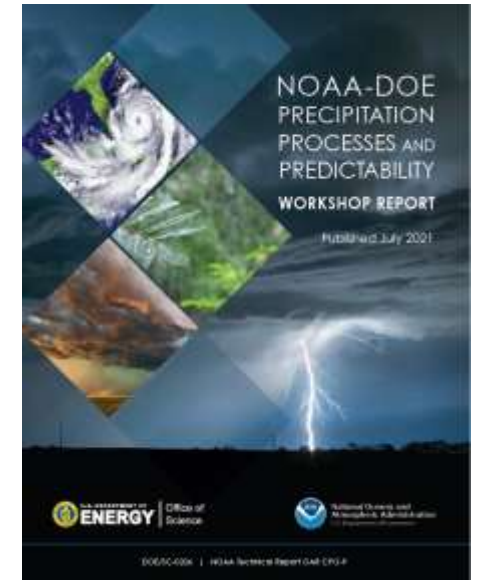
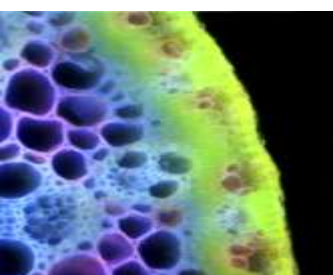
# NOAA-DOE PRECIPITATION PROCESSES AND PREDICTABILITY WORKSHOP

November 30 - December 2, 2020



## Renu Joseph

Earth and Environmental Systems Modeling  
Earth and Environmental Systems Sciences Division



**Workshop Co-Chairs:** Jin Huang (NOAA/CPO), Renu Joseph (DOE/EESD), Sandy Lucas (NOAA/CPO), Sally McFarlane (DOE/EESD), Mike Patterson (US CLIVAR), Yan Xue (NOAA/NWS)



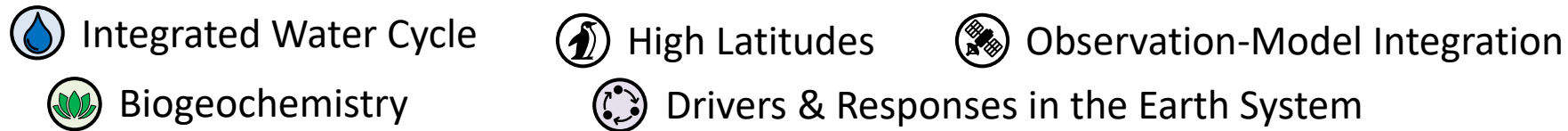
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# DOE and Precipitation Predictability

- Relevant to all 5 goals of the EESSD Strategic Plan:

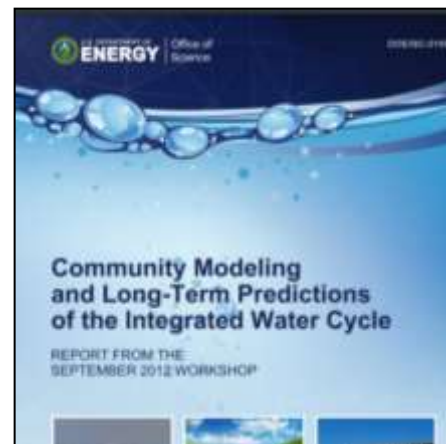
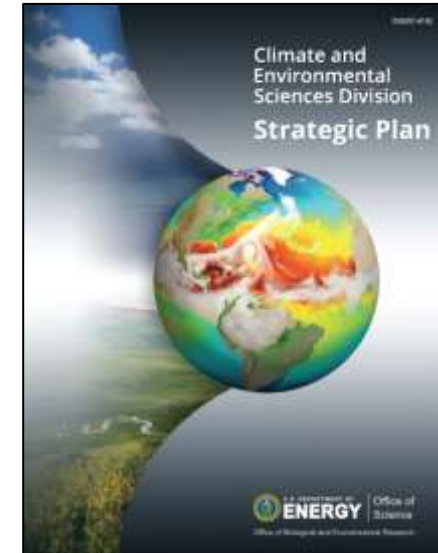


- Relevant to the EESSD

- Modeling (EESM), Atmospheric (ASR), and Terrestrial (ESS)
- User Facilities and Infrastructure (ARM)

- Water Cycle + Precip Workshops:

- Community Modeling and Long-Term Predictions of the Integrated Water Cycle
- Atmospheric River Tracking Method Intercomparison Project (ARTMIP)
- Benchmarking Simulated Precipitation in ESMS



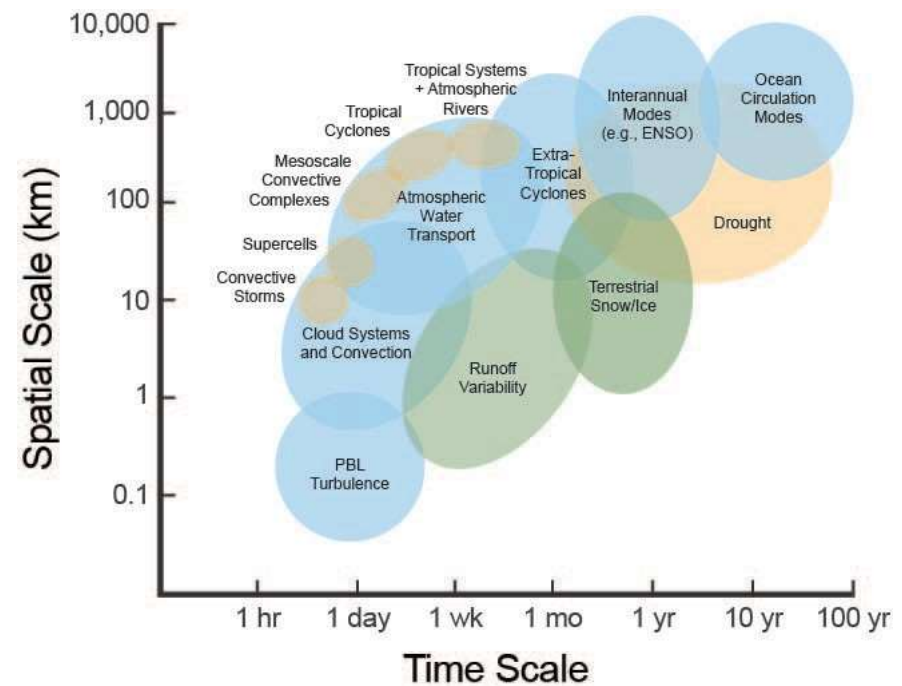


# NOAA-DOE Joint Workshop

## NOAA's Precipitation Predictability Grand Challenge



## DOE Interest in Precipitation



# NOAA-DOE Joint Workshop

- Emphasized a **comprehensive** look at precipitation (process understanding, predictability, prediction skill, model biases, observations).
- Focus on **integrating different ways of studying precipitation** (process interactions, interdisciplinary processes, end-to-end integration of model development, process studies, prediction).
- Discussion benefited from **modern / cutting-edge technologies and accomplishments** (global storm-resolving models, regional refined meshes, machine learning + artificial intelligence)
- Spanned a **range of timescales** from weather to multidecadal.

# NOAA-DOE

## Precipitation Processes and Predictability Workshop

### Active participants (400) and Slack channel

A **community workshop** is jointly organized by NOAA and DOE in partnership with USGCRP and US-CLIVAR

**Workshop Scope:** Contiguous U.S. in the context of global models; Subseasonal to multi-decadal timescales

### Major Themes:

- Sources and limits of predictability
- Key processes critical to precipitation biases
- Interdisciplinary processes
- Regional precipitation

### Scientific Committee

- Magdalena Balmaseda
- Ana Barros
- **Samson Hagos**
- **Ben Kirtman**
- **Hsi Yen Ma**
- Yi Ming
- **Angeline Pendergrass**
- Vijay Tallapragada

### Program Organizing Committee

- Jin Huang
- **Renu Joseph**
- Sandy Lucas
- **Sally McFarlane**
- Mike Patterson
- Yan Xue

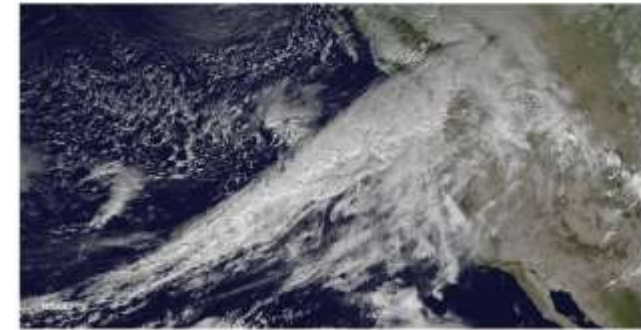
### Facilitators and Rapporteurs

- Victoria Breeze
- LuAnn Dahlman
- John Coggins
- **Zhe Feng**
- **Bryce Harrop**
- **Huaping Huang**
- Ali Stevens
- **Die Wang**



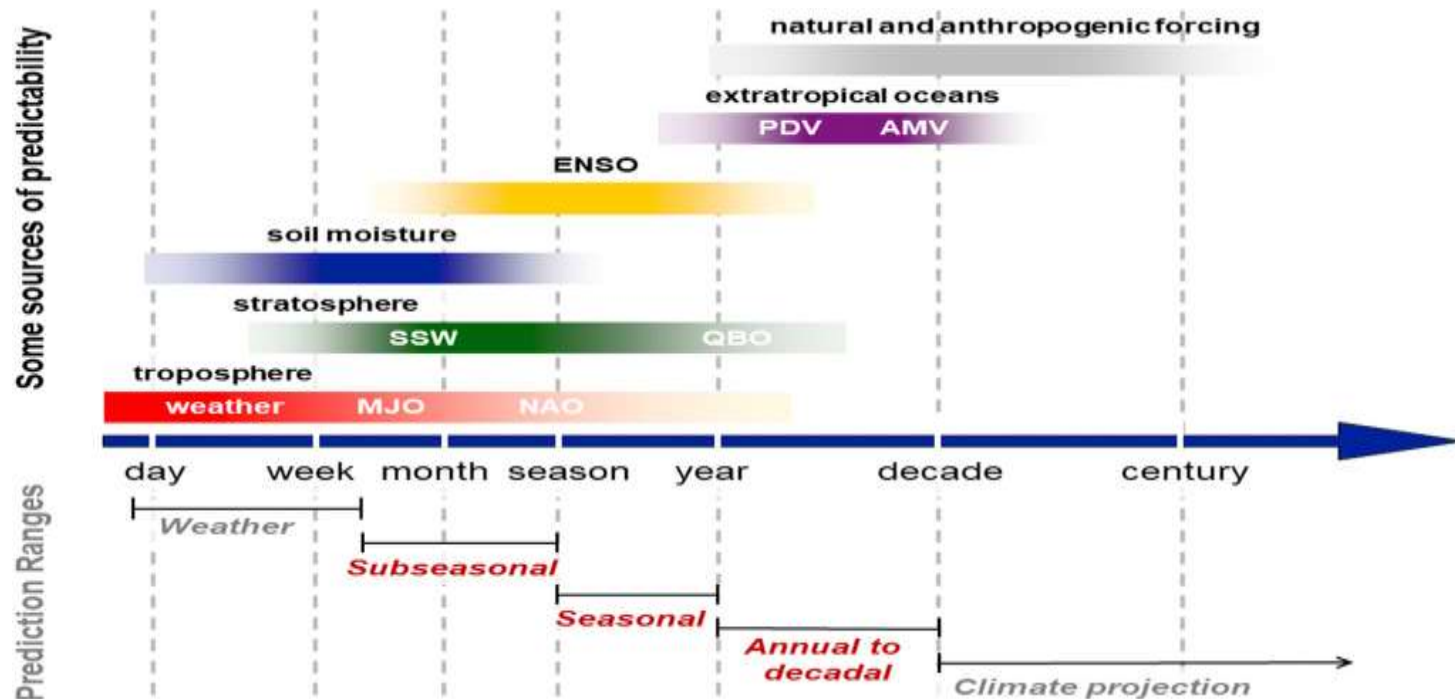
# Each Theme was organized around and addressed the following questions:

1. What are the **sources of predictability** that have the biggest influences on precipitation at weather, sub- seasonal-to-seasonal (S2S), and multi-decadal timescales, including extremes?
2. What are the key physical processes that have the strongest imprint on the **model biases** and precipitation predictions and projections?
3. How can we most effectively take advantage of **existing observations and data** (satellite and in situ) to advance process-level understanding?
4. What are the gaps and needs for **targeted observations and process studies** to improve understanding and model representations of those key processes?
5. How do we benefit from **national and international collaboration** to make significant progress?



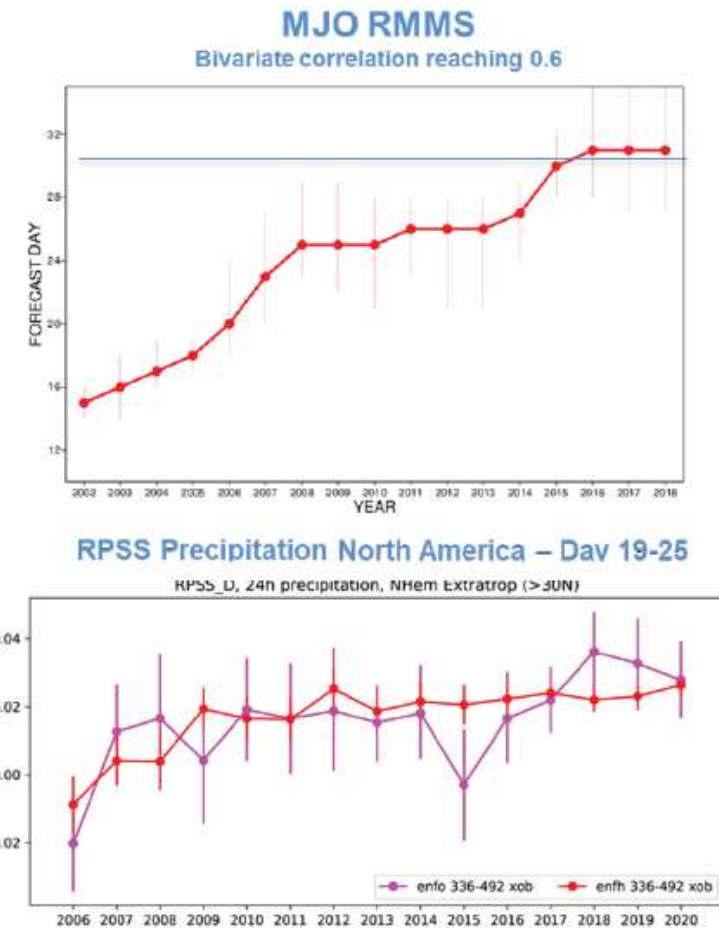
# Theme 1: Limits And Sources of Predictability

Temporal ranges and (top) sources of predictability for weather and climate prediction



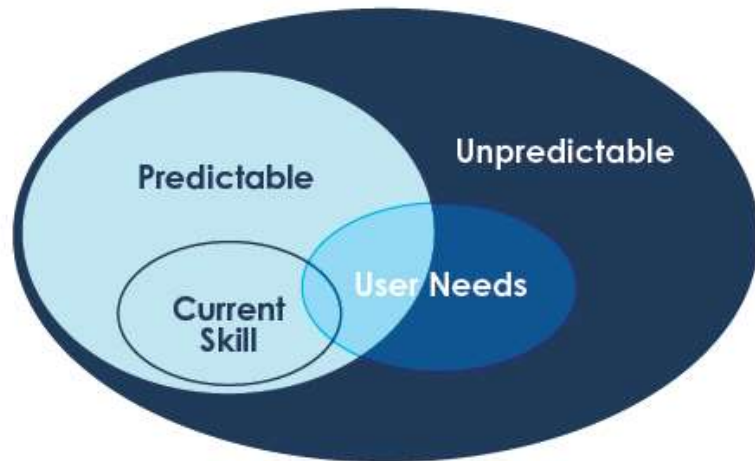
While there has been significant progress in the prediction of MJO and associated largen-scale environment, skill for prediction of precipitation remains limited

North American precipitation forecast skill trend in ECMWF forecast system





# Theme 1: Strategies for Advancing Understanding of Predictability



**Figure:** A schematic representing the general concept of predictability, including understanding predictability limits and strategies for realizing them as prediction skills that meet user needs.

## Understand sources and limits of predictability

- Research in air-sea and air-land coupling and precipitation processes, modes of variability, and their impacts on prediction and predictability
- Diabatic heating as a source of predictability

Connection to regional precipitation

Modeling underlying mechanisms

Exploiting forecasts of opportunity

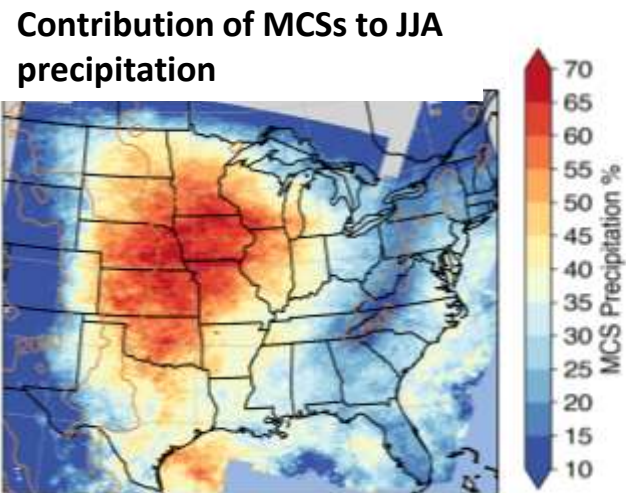
- Resolving multi-scale processes including unified or seamless modeling
- Systematic investigations of impacts of model bias on predictability estimates
- Machine Learning assisted development of reduced dimension models
- End-to-End integration of model development, process level studies and prediction as well as engagement of prediction users



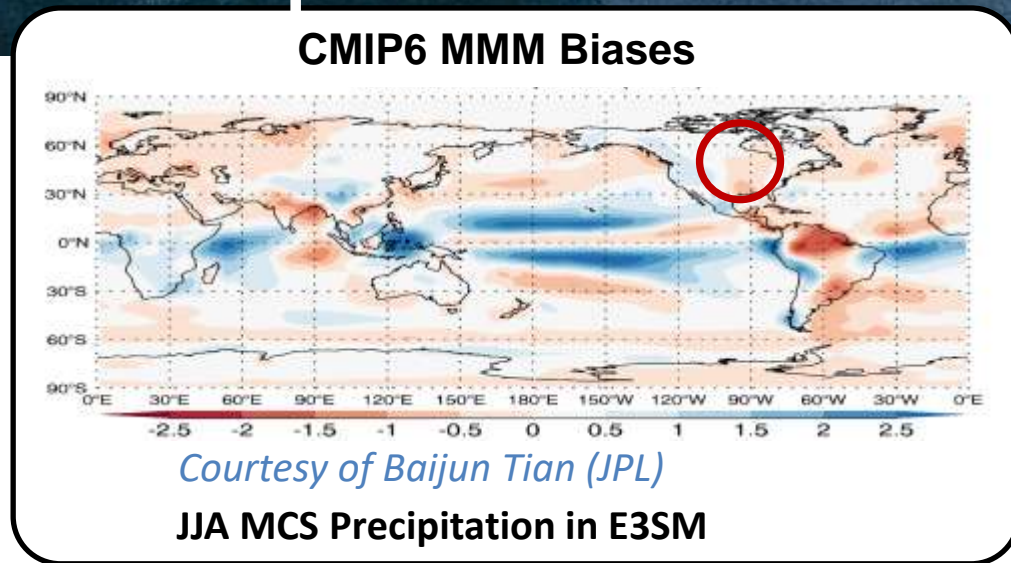
# Theme 2: Key Processes Critical to Precipitation Biases

## Some common Model Errors in Precipitation over US

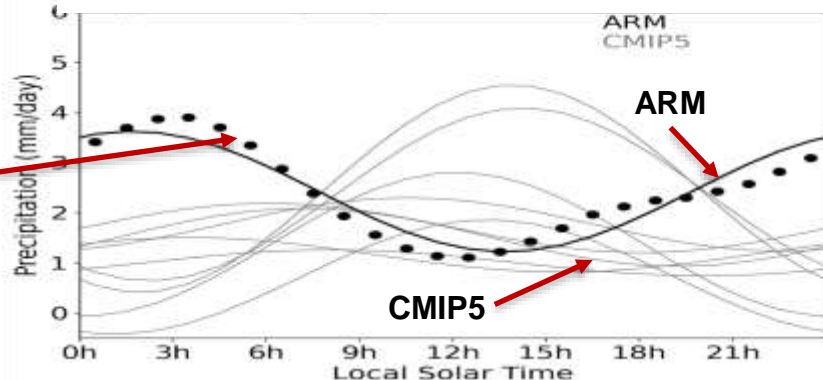
- More than 50% of rainfall over the central US in summer originates from Mesoscale Convective systems
- Processes controlling mesoscale organization are not well understood or modeled



Feng et al. (2019) JCLI

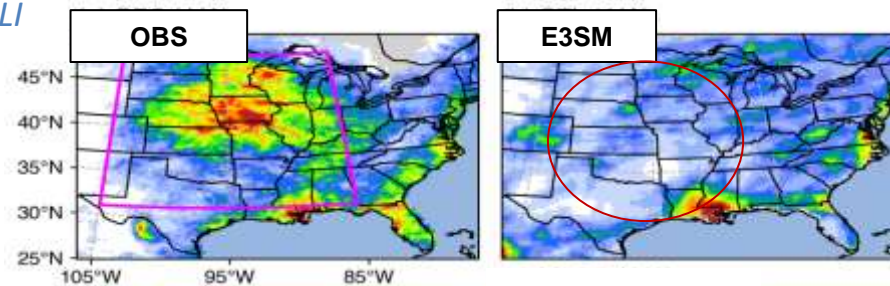


**JJA Diurnal Cycle of Precipitation in CMIP5 at ARM SGP Site**



Miss the nocturnal peak

**Black:** ARM observations      Zhang, Xie et al. (2020) BAMS  
**Grey lines:** CMIP5 model results,



Xie, Leung et al. (2020) DOE Q4 Metric Report

- Dry bias over central US
- Weaker MCS precipitation
- Wrong diurnal cycle

# Theme 2: Strategies for Addressing Precipitation Biases

## Models

Sub-grid processes  
(CRM, LES, DNS, etc.)

Global Storm-Resolving  
Models (GSRMs)

Numerical Weather  
Prediction Models

HighResMIP  
Models (2019)

Operational IPCC Class  
Models for CMIP6

100 m

1 km

10 km

100 km

4

**1. Processes / models:** Conventional Parameterizations – more focus on convective parameterizations.

**2. Processes / models:** ML-based convective parameterizations – more tuning in weather forecast mode.

1

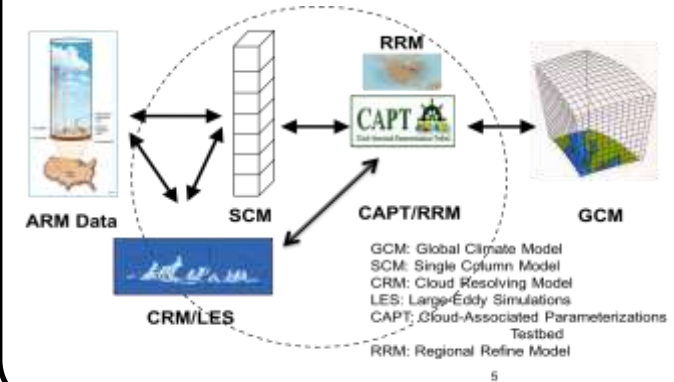
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3

**3. Phenomena / observations:** Organized convection (MCS, convective-large scale interactions) – more observations (lacks theory)

**4. Unresolved convection:** What about shallow convection, planetary boundary layer and microphysics (aerosols)?

## A hierarchy modeling framework supported by DOE



- Detailed field observations are critical for improving our understanding of organization of mesoscale convective systems
- A hierarchy modeling framework acts to bridge the gap between field data and model developments
- Critical analysis tools need to be developed to support such as a model framework, process-oriented model diagnostics / evaluation / improvement (such as being developed in NOAA and DOE)
- Parameterization applications of machine learning



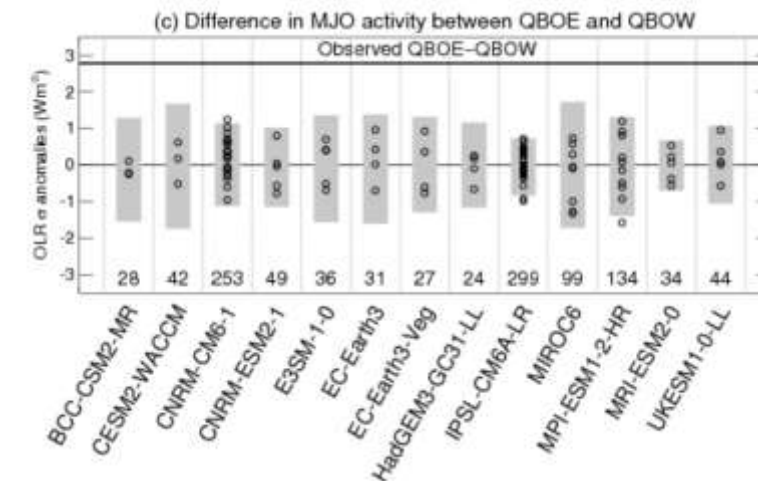




# Theme 3: Strategies for advancing understanding of interactions related to precipitation

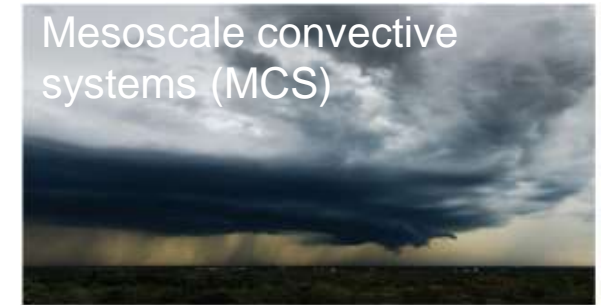
- Unified Modeling systems that span weather to climate that includes capturing these interdisciplinary processes
- More observations and data needed to constrain these models and more collaboration across both with easy access to centralized data archives (e.g., surface-atmosphere & aerosol-cloud interactions)
- Better characterization of land-surface properties
- The sinks and sources of energy and moisture (i.e., dissipation across scales) need to be accounted for and identified in observations and models.
- Improvements in the vertical resolution of models in the stratosphere and their representation of gravity waves
- Observations key climate regions known to impact CONUS precipitation predictions and predictability, such as the Maritime Continent, far western Pacific Ocean, coastal zones of the U.S., and the Arctic

**No CMIP6 model reproduces the observed QBO-MJO relationship**

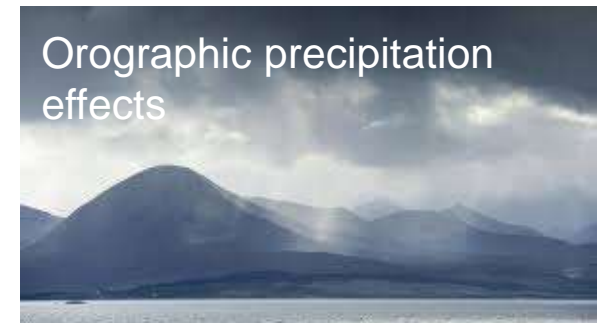


# Theme 4: Regional Precipitation

- Precipitation forecast skill over the CONUS, although slightly improved in the past decade, lags other forecast improvement metrics like hurricane track and intensity and
- Factors influencing the poor precipitation forecast skill for weather prediction include underestimation of heavy rain, overestimation of light rain, inaccurate representation of the diurnal cycle of precipitation (especially with precipitation maxima too early in the day);
- Weather ensemble systems also suffer from overconfident ensembles

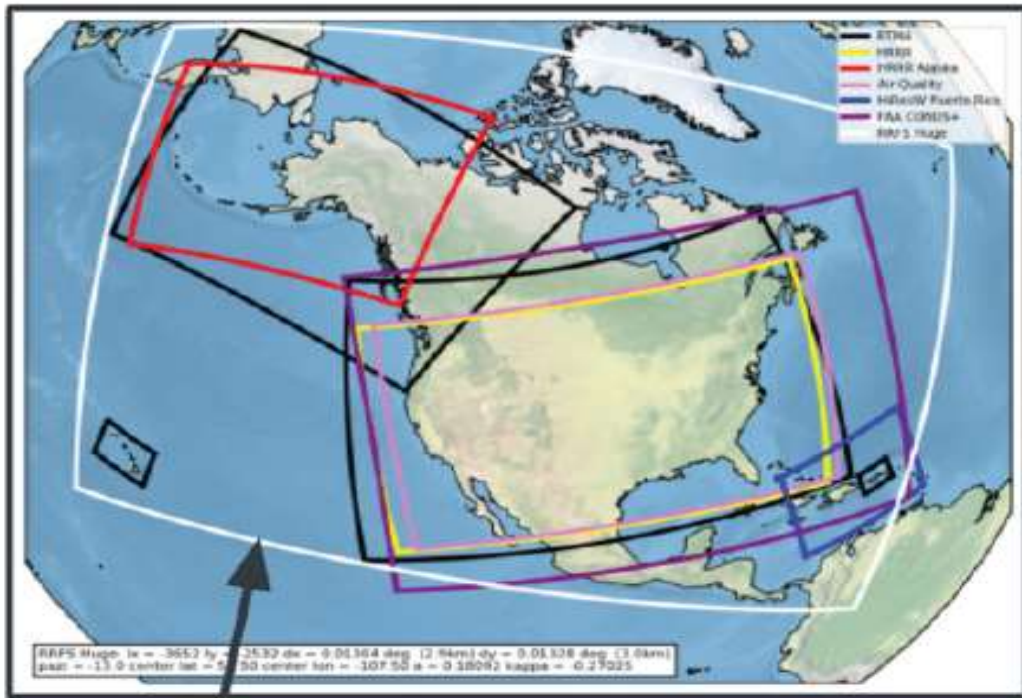


## A partial list of precipitation phenomena over CONUS





# Theme 4: Strategies for advancing prediction of regional precipitation



**3 km RRFs domain (white outline)**

UFS-based Regional Rapid Refresh Forecast System (RRFS) to replace several mesoscale modeling systems currently in use at National Centers for Environmental Prediction (NCEP) operations

- Using higher-resolution global and regional models, as well as improved physics and data assimilation, well-calibrated ensembles, and sophisticated post processing techniques (including use of ML/AI).
- Development of the unified forecasting system as a community-based, coupled, comprehensive ESM.
- Variable-resolution grids, which allow high resolution regionally along with the full physics and global water and energy budget representation.
- Enhanced Observations (both from field campaigns and Satellites) to address the uncertainties for the various precipitation features.
- Modeling and observational communities to work hand in hand to address critical gaps in understanding of the physical processes and provide better data sets for initialization and evaluation.
- Development of standard benchmarking capabilities for evaluating the quality of different precipitation products.
- Invest in standardizing and streamlining precipitation product data.



What are the sources of predictability that have the biggest influences on precipitation at weather, subseasonal-to-seasonal to multi-decadal timescales, including extremes?

What are the key physical processes that have the strongest imprint on the model biases and precipitation predictions and projections?

How can we most effectively take advantage of existing observations and data (satellite and in-situ) to advance process-level understanding of the key processes and predictability?

What are the gaps and needs for targeted observations and process studies to improve understanding and model representations of those key processes?

How do we benefit from national and international collaboration to make significant progress?

## Sources of Predictability Influencing Precipitation

### SESSION 1

Sources and limits of predictability

- ▶ Large-scale variability (e.g., MJO, NAO, ENSO, AMV, PDO)
- ▶ Slowly varying processes (e.g. SST, soil moisture, vegetation, sea ice)
- ▶ Phenomena (e.g., cyclones, atmospheric rivers, mesoscale convective systems)

## Physical Processes Representation and Biases

### SESSION 2

Key processes critical to precipitation biases

- ▶ Improving representation of local (e.g. aerosol-cloud interactions) and remote (e.g. tropical diabatic heating) processes
- ▶ Systematic characterization of model biases

## Modeling and Observational Strategies

### SESSION 4

Regional precipitation

- ▶ Global storm resolving models
- ▶ Hierarchical modeling
- ▶ Phenomena-based model evaluation
- ▶ Community modeling infrastructure
- ▶ Enhance model observation integration
- ▶ More observations to constrain models
- ▶ Collaboration between modeling and observation teams
- ▶ ML/AI

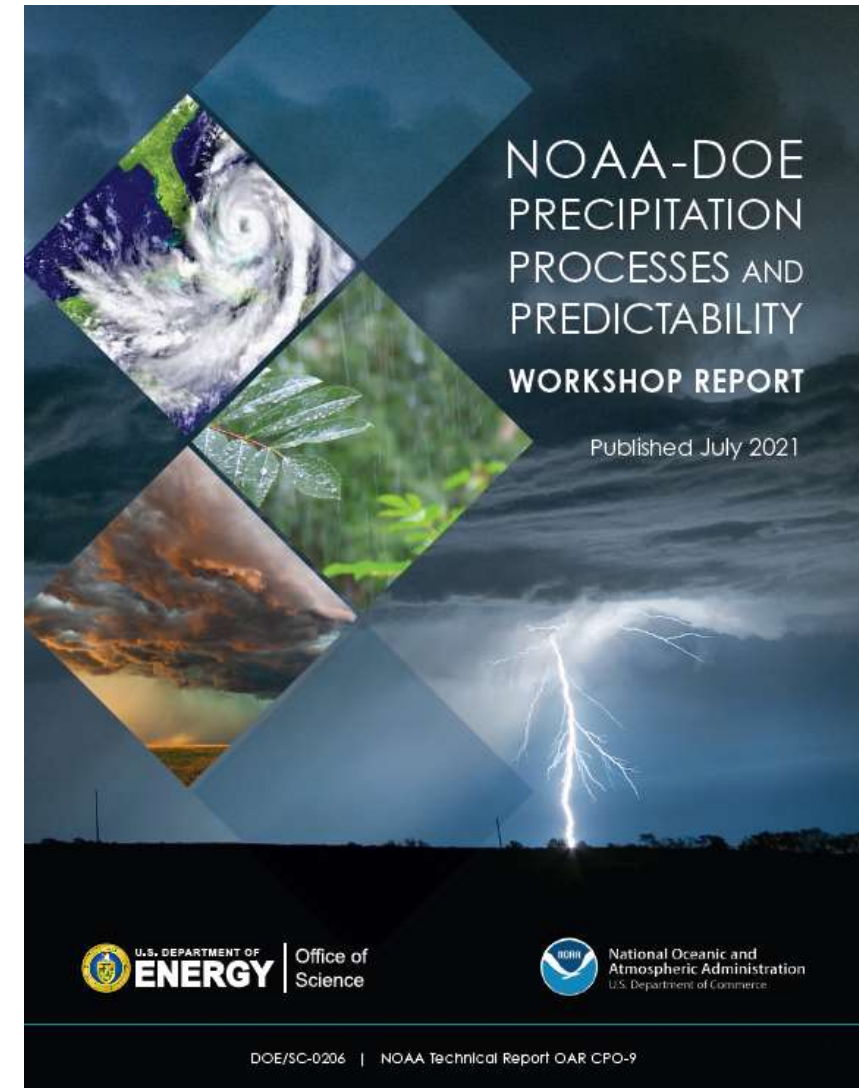
**Stakeholder Engagement and Interagency Collaboration**

# Successes and Next Steps

- **Interagency Front**
  - At **USGCRP** exploring ways to enhance interactions on Precipitation Predictability & Water Cycle across agencies
  - NOAA is seeking national and international partnership for **Global Precipitation Experiment**.
  - Explore activities like the **Climate Process Teams** that can work on (e.g., US Climate Modeling Summit working together)
- **Within DOE**
  - **EESM & ASR FOA's** are informed by and refer to the Precipitation Predictability report (as well as other reports)
  - Provides ideas for potential applications of AI in earth system predictability (**AI4ESP**)
  - Coordination on **process metrics, diagnostics, and benchmarks**
  - ARM instrumentation, data product, and campaign priorities informed by workshop; current campaigns TRACER and SAIL highly relevant to workshop goals
- **Attendees**
  - Several scientists indicated that **cross-interagency interactions** at the meeting were productive
  - Enables **better collaboration**

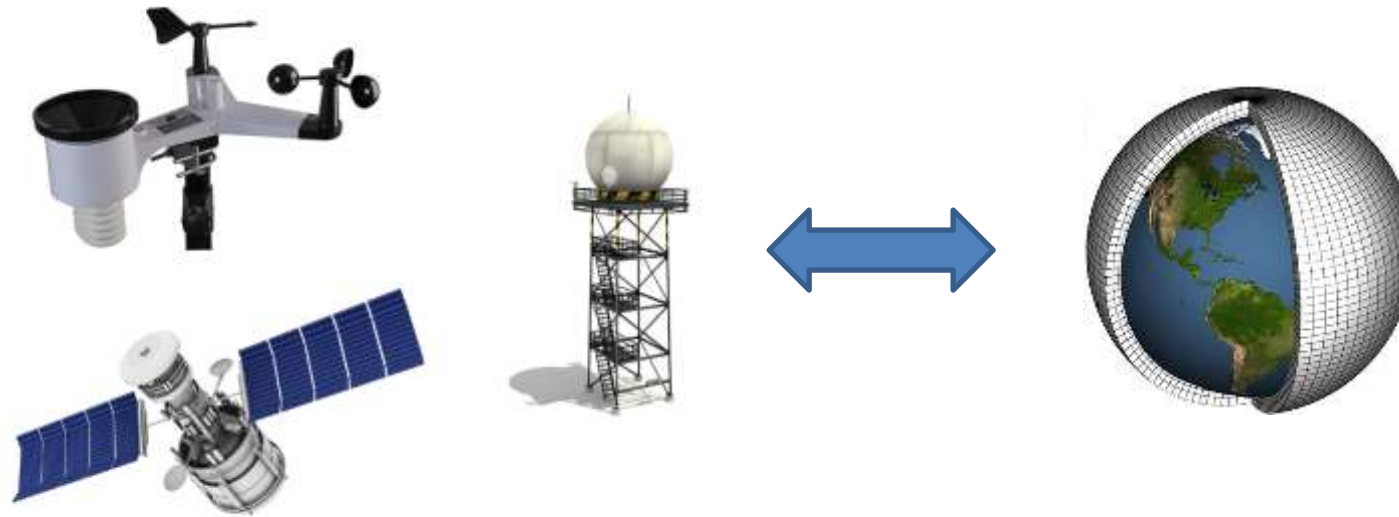
# Thank You!!!!

Balmaseda M, A Barros, S Hagos, B Kirtman, H-Y Ma, Y Ming, A Pendergrass, V Tallapragada, E Thompson. 2020. "NOAA-DOE Precipitation Processes and Predictability Workshop." U.S. Department of Energy and U.S. Department of Commerce NOAA; DOE/SC-0203; NOAA Technical Report OAR CPO-9.





# Strategies for advancing observation-model integration



- A variety of observational and reanalysis-based precipitation products exist that provide precipitation at different spatial and temporal scales, cover different regions and time periods, and available in different formats.
- No standard benchmarking capability exists for evaluating the quality of different precipitation products.
- Format differences can lead to roadblocks in the employ of observational datasets for evaluating model performance.
- Investments are necessary in streamlining and standardizing precipitation products to support observation-model integration.