

# The impact of the systematic mean bias on MJO prediction in the ECMWF ensemble prediction system

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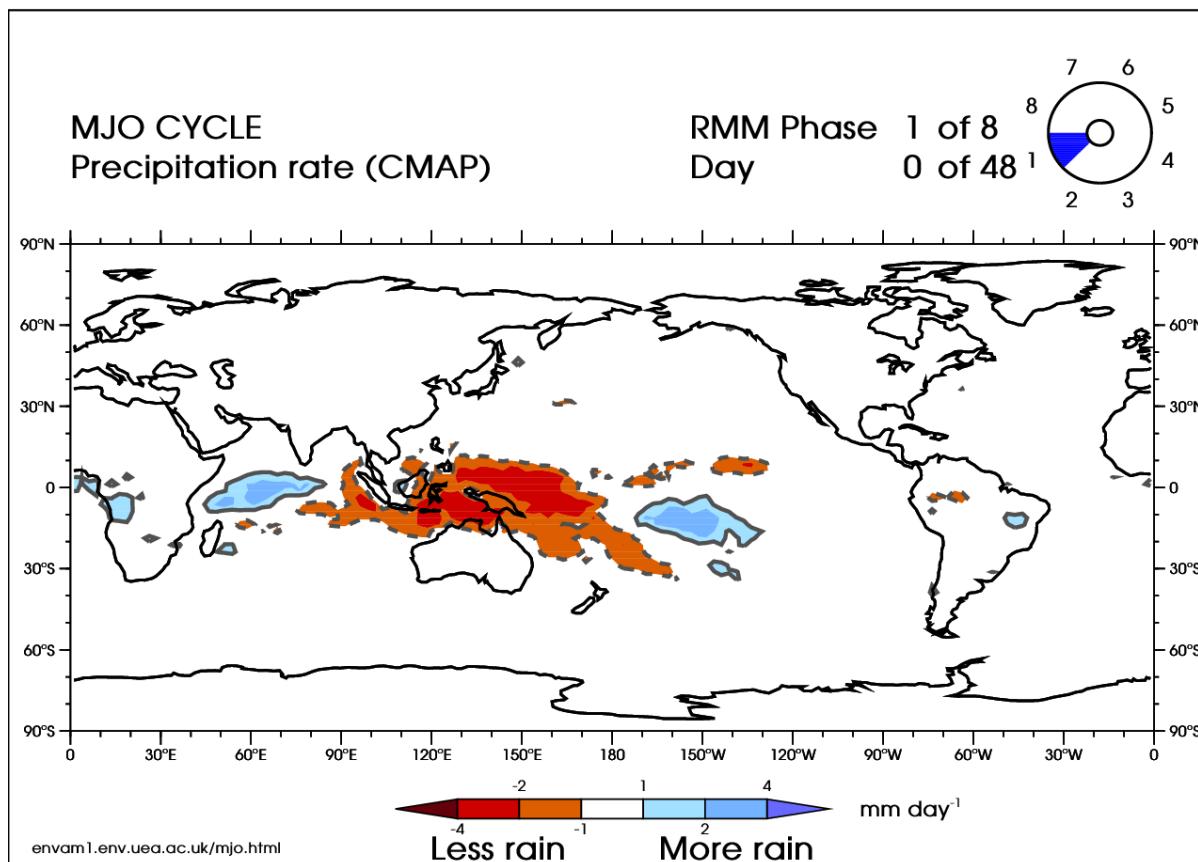
Stony Brook University | The State University of New York



**MAPP**  
Modeling, Analysis,  
Predictions, and Projections

# Madden Julian Oscillation (MJO)

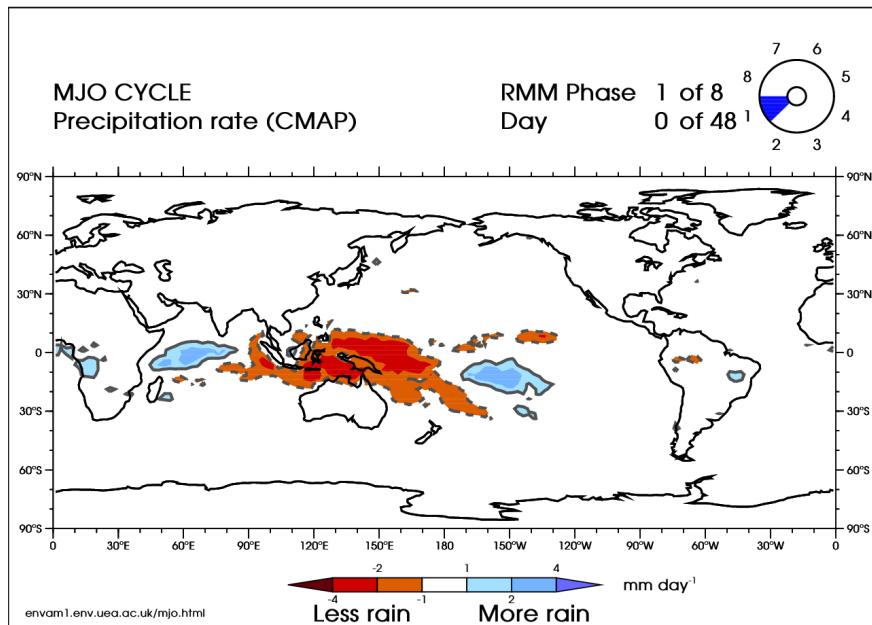
- The dominant mode of intraseasonal variability in the tropics
- MJO tends to develop in the Indian Ocean and propagate eastward
- Major source of global subseasonal predictability



Source: <http://envam1.env.uea.ac.uk/mjo.html>

# Outline

- MJO prediction skill in current models
- Prediction of the MJO propagation
- MJO propagation and the mean state bias

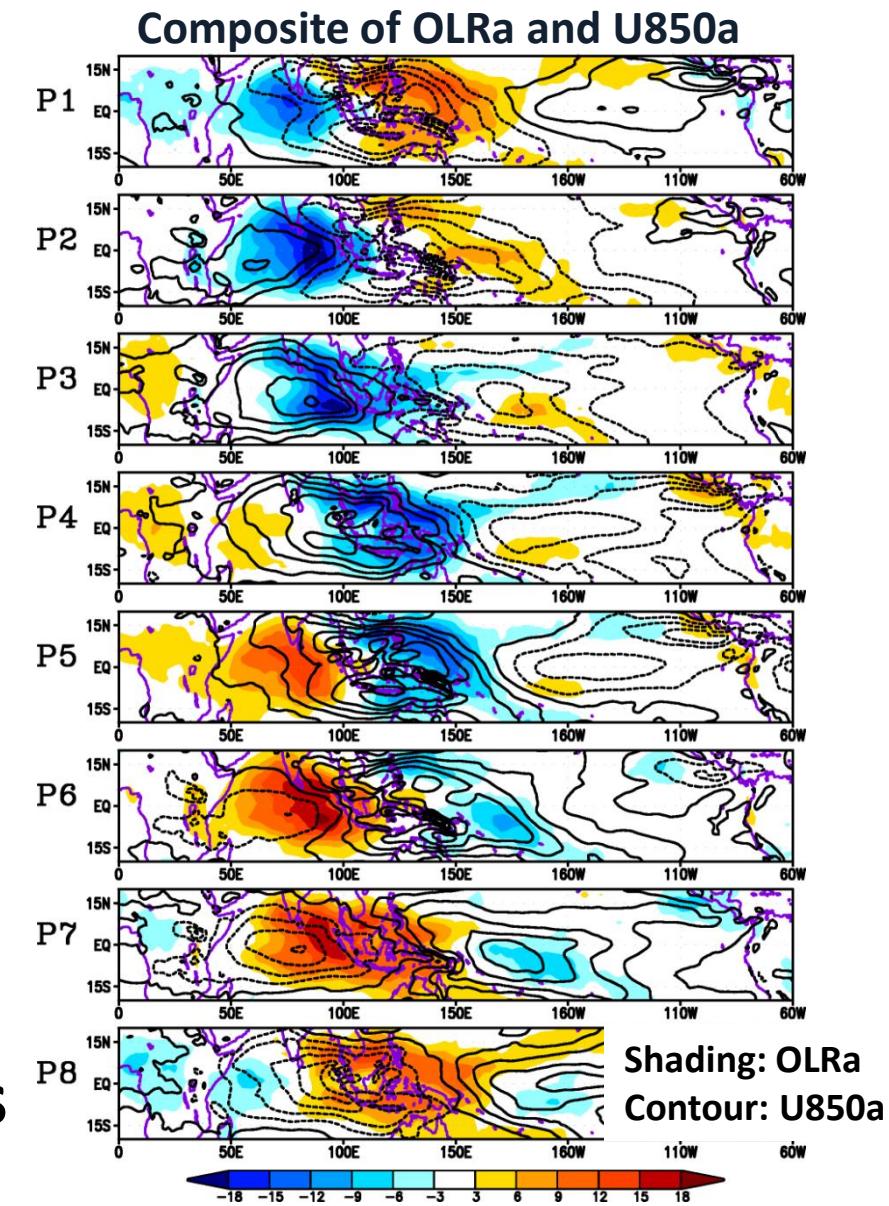
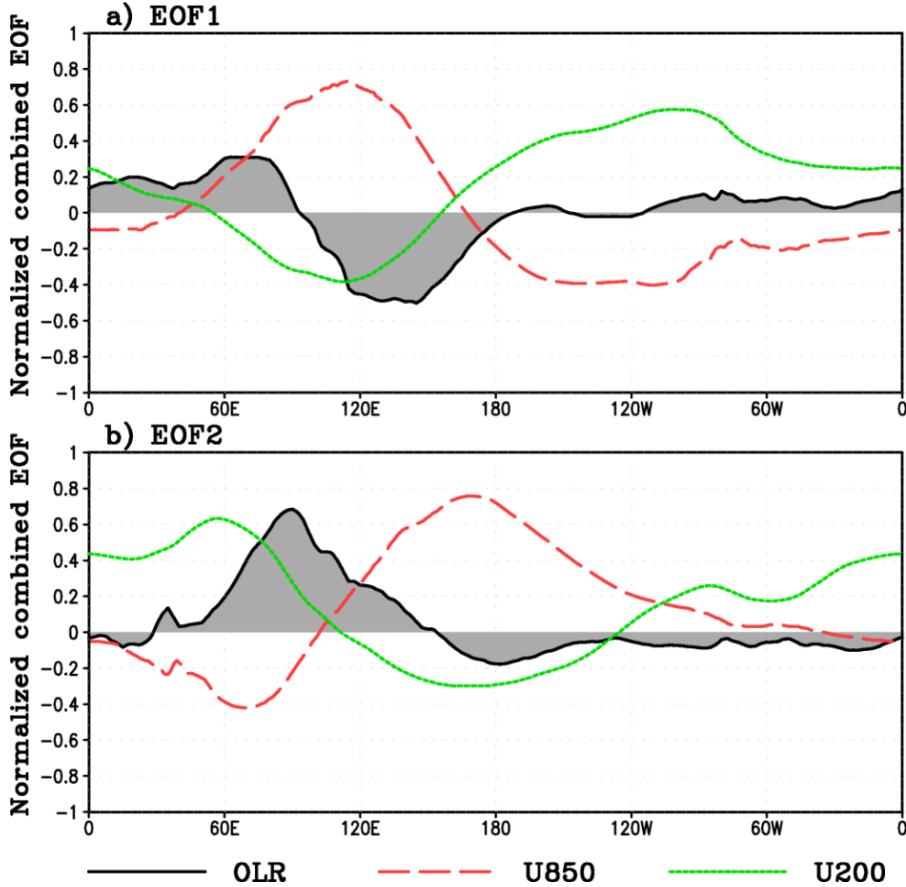


Source: <http://envam1.env.uea.ac.uk/mjo.html>

# Real-time Multivariate MJO (RMM) index

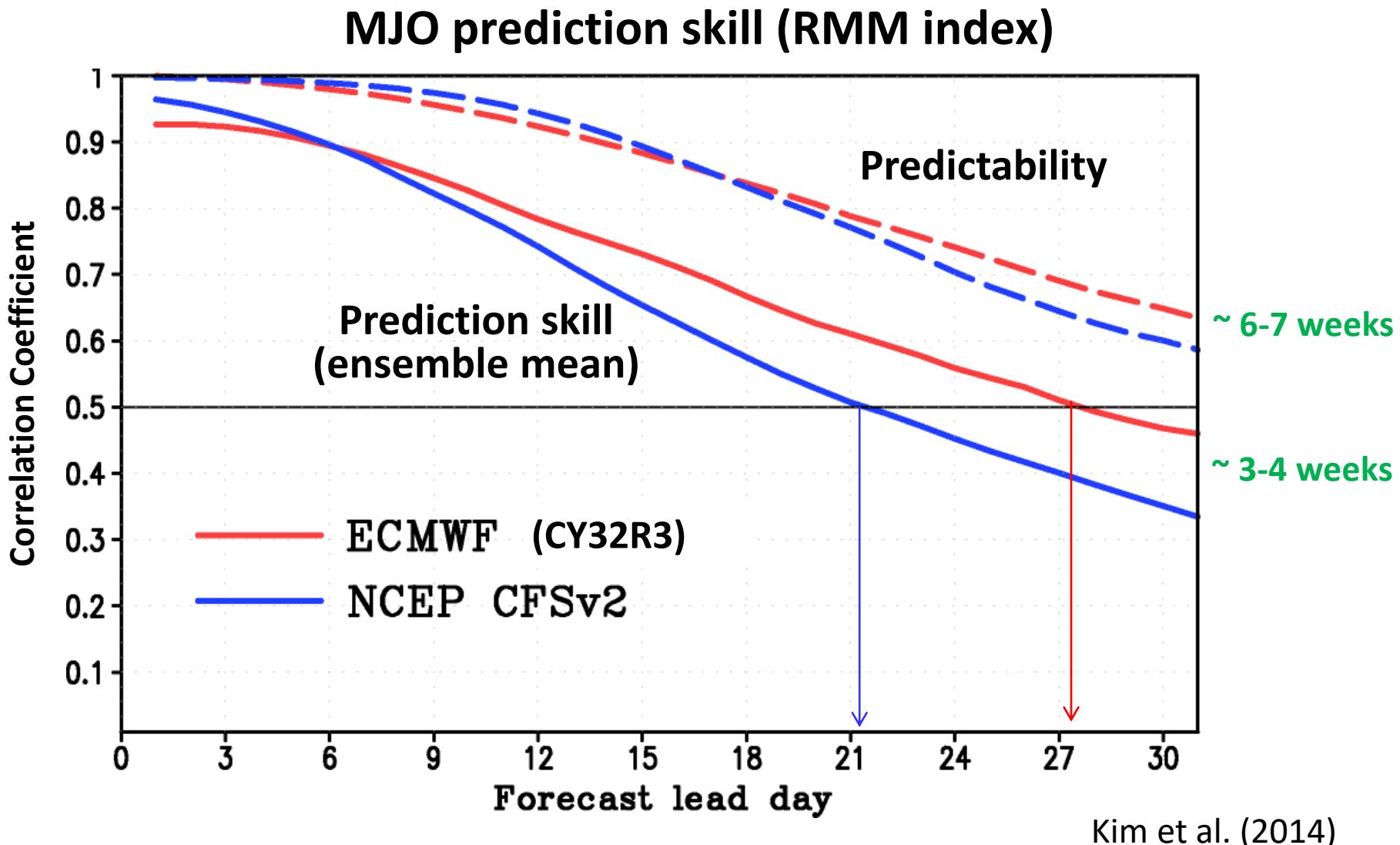
Wheeler and Hendon (2004)

## Eigenvector of 1<sup>st</sup> and 2<sup>nd</sup> EOF



RMM indices = PC time series

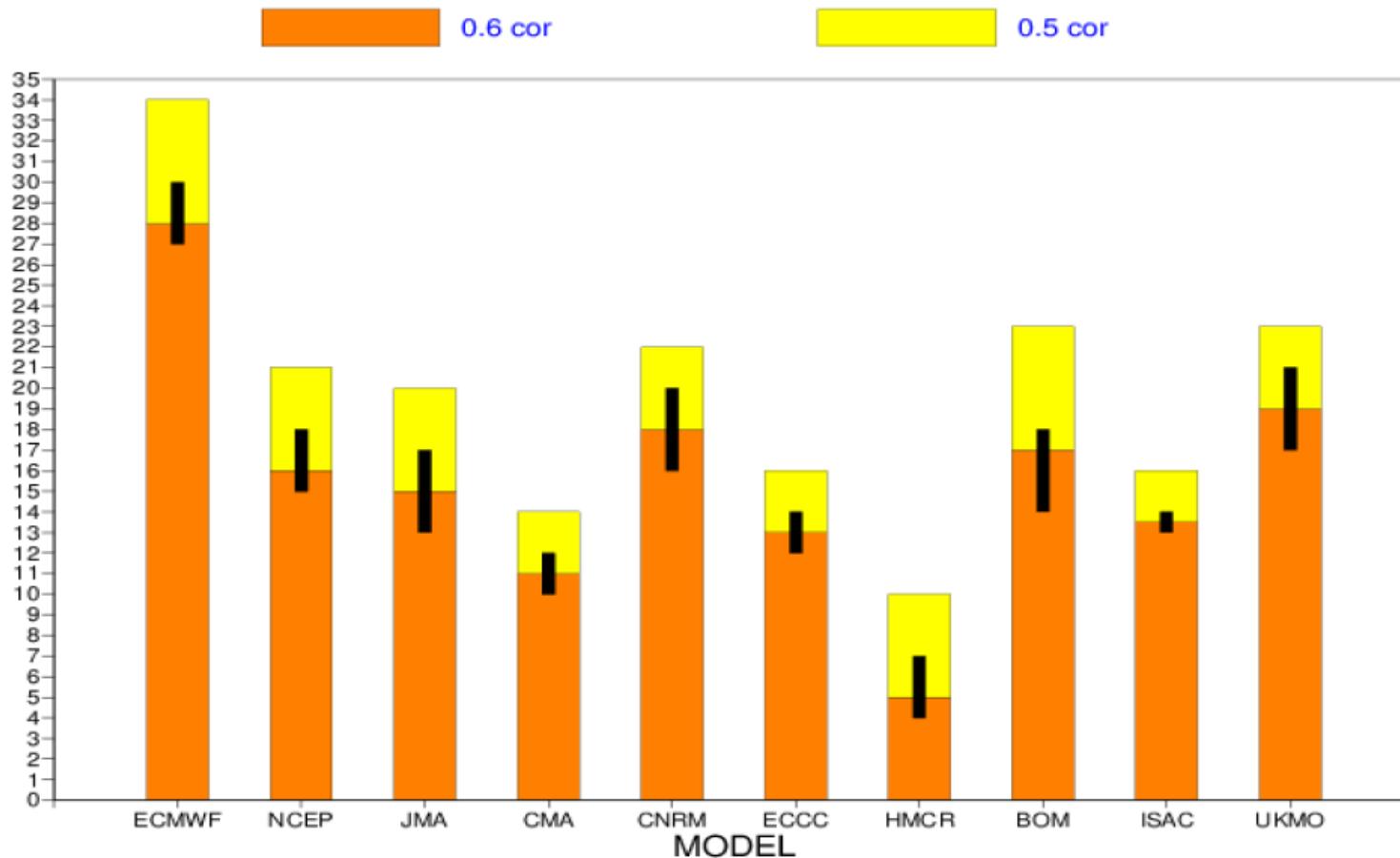
# Capability of MJO forecast



# Capability of MJO forecast

## MJO prediction skill (reforecasts: 1999-2010)

\* WWRP/WCRP S2S Database



\* F. Vitart (NOAA Webinar, May 2017)

Source: [http://cpo.noaa.gov/sites/cpo/MAPP/Webinars/2017/05-24-17/Webinar\\_FV.pdf](http://cpo.noaa.gov/sites/cpo/MAPP/Webinars/2017/05-24-17/Webinar_FV.pdf)

# Data

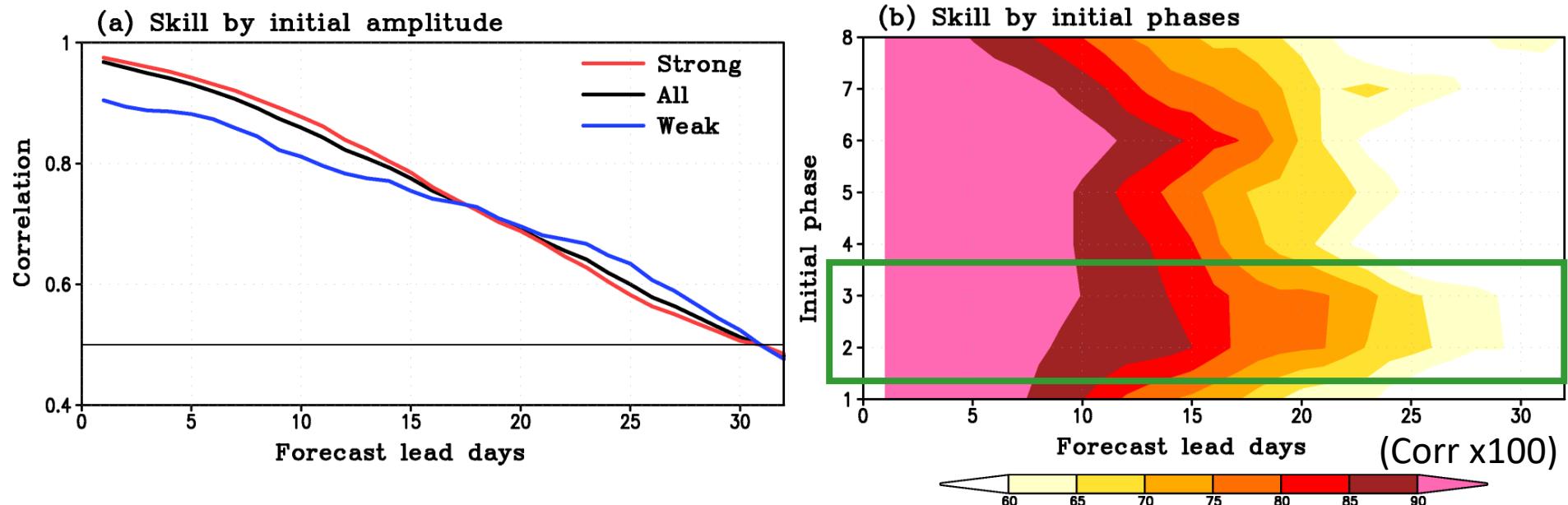
Reforecast (CY40R1)	
<b>Period, lead time, ensembles</b>	<ul style="list-style-type: none"><li>• 1994~2013 (20yr)</li><li>• 32-day forecast lead</li><li>• Five ensemble members</li></ul>
<b>Initialization</b>	<ul style="list-style-type: none"><li>• Once/week (Jan-Dec)</li></ul>
<b>Resolution</b>	<ul style="list-style-type: none"><li>• 32 km up to day 10 (64 km after day 10)</li><li>• 91 levels (0.01 hPa)</li></ul>

- ERA Interim

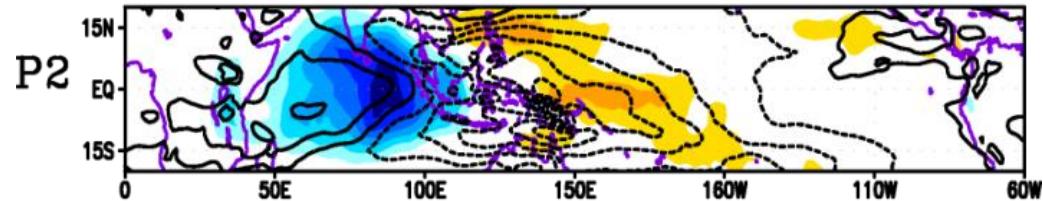
# ECMWF Reforecast

## MJO Skill Dependency

- Initial amplitude: Higher with initially strong MJO signal
- MJO Phase: Higher in Phase 2-3



\* Strong event: RMM amplitude > 1.0



# MJO eastward propagation

## MJO events

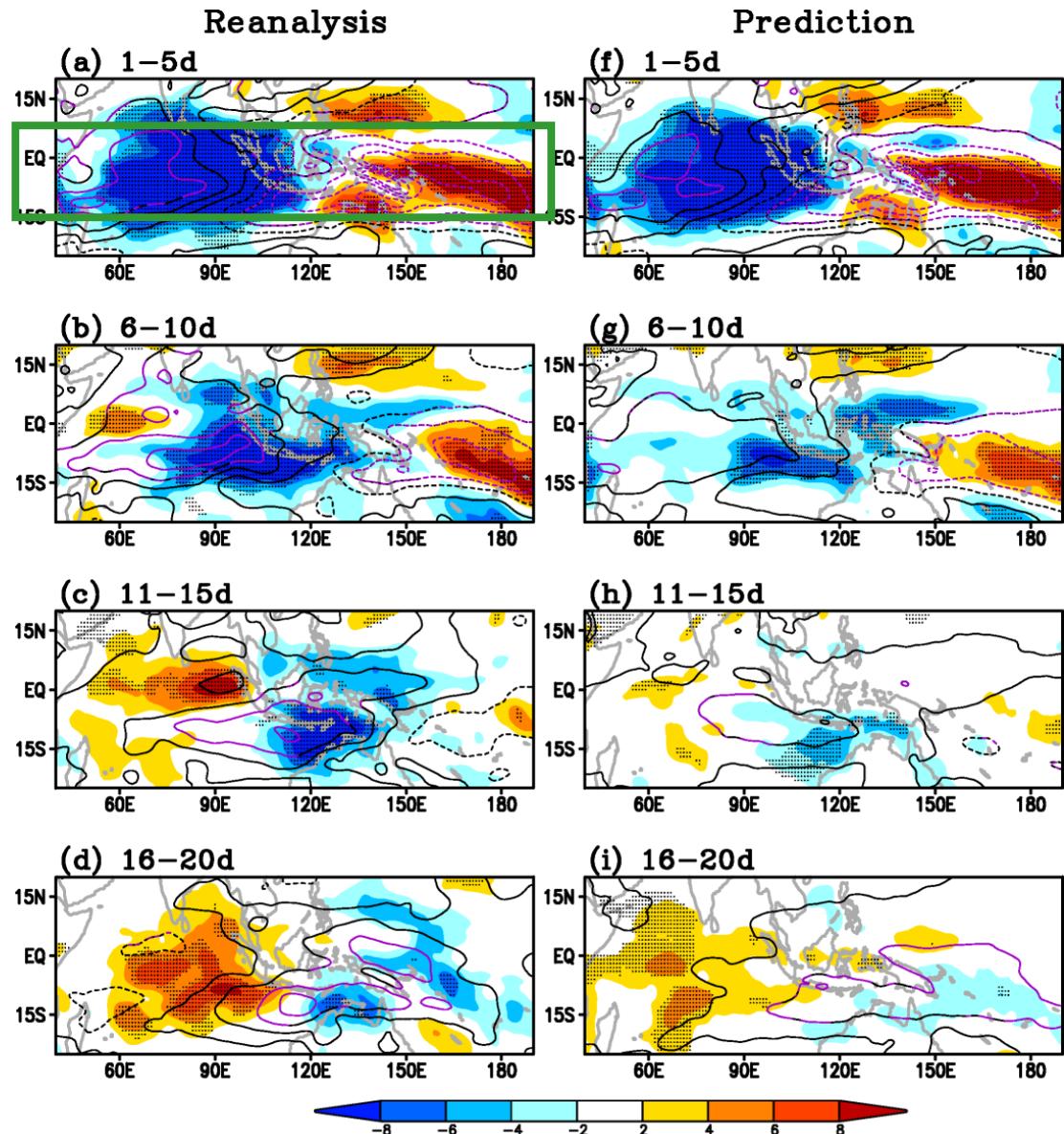
- NH winter (Oct-Mar, 1994-2013)
- IC: Phase2&3, strong (>1.0)  
→ 89 events for ERA-I  
→ 445 events for ECMWF (5 ens)

Shading: OLRa

Contour: U850a

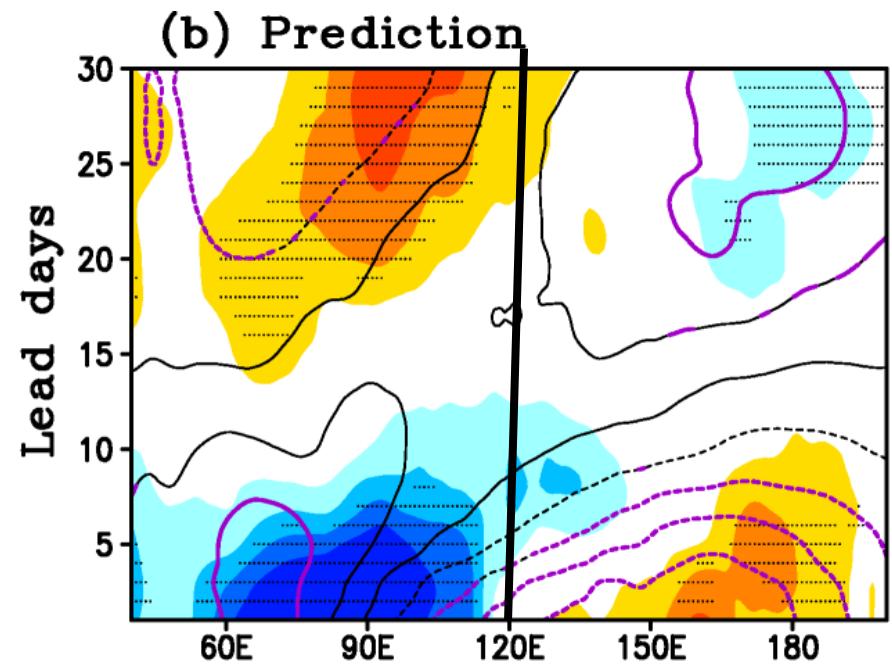
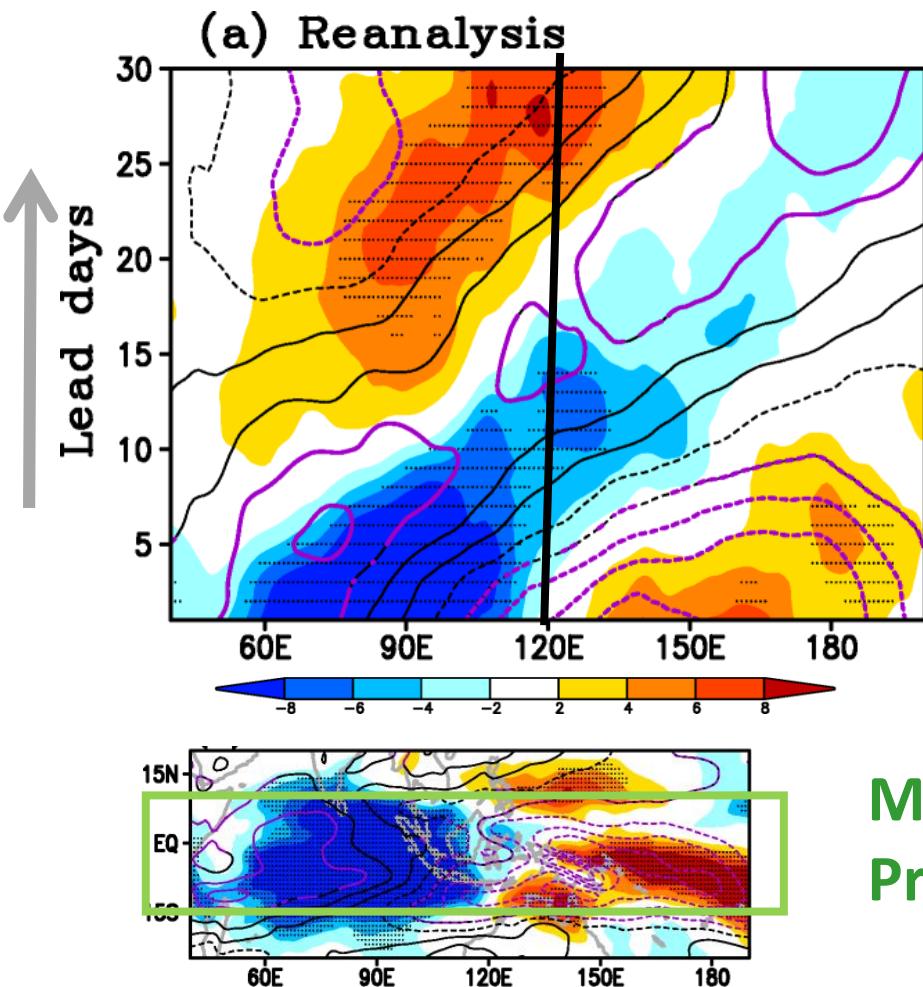
Stippling, purple contours > 95% sig.

- Quicker decay of MJO signal



# MJO eastward propagation

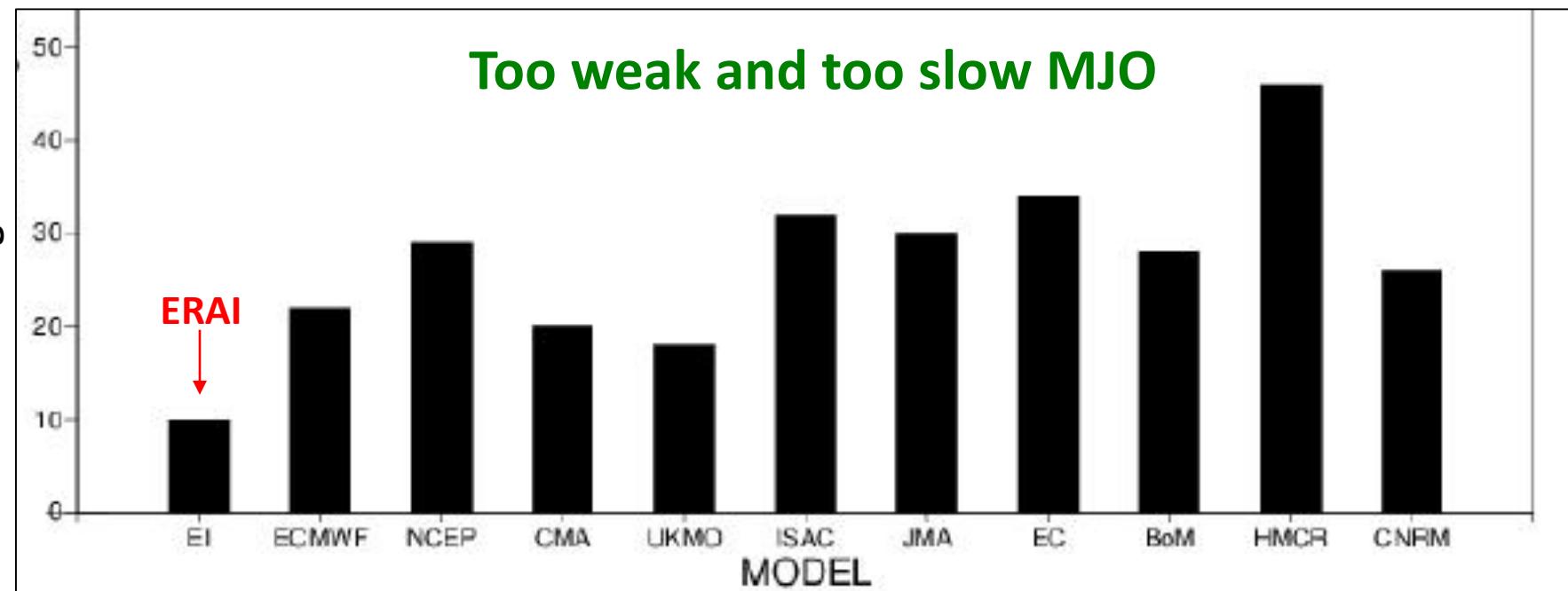
OLRa and U850a (15°S-10°N)



Maritime Continent (MC) MJO  
Propagation and Prediction Barrier

# MC Prediction Barrier

Percentage of MJO events not crossing the MC  
(S2S reforecasts, 1999-2010)



Q: How do mean state biases impact on MJO propagation?

\* F. Vitart (NOAA Webinar, May 2017)

Source: [http://cpo.noaa.gov/sites/cpo/MAPP/Webinars/2017/05-24-17/Webinar\\_FV.pdf](http://cpo.noaa.gov/sites/cpo/MAPP/Webinars/2017/05-24-17/Webinar_FV.pdf)

# “Moisture mode” theory

- MJO physics is governed by feedbacks that regulate moisture anomalies
- MSE as a proxy for MJO convection

Moist static energy (MSE):  $m = c_p T + gz + Lq$

Column-integrated MSE budget

$$\frac{\partial \langle m \rangle}{\partial t} = -\langle V \cdot \nabla m \rangle - \left\langle \omega \frac{\partial m}{\partial p} \right\rangle + F_{sf}c + \langle Qr \rangle$$

Tendency	Horizontal advection	Vertical advection	Surface Fluxes	Radiative Fluxes
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\* Yu and Neelin (1994), Raymond and Fuchs (2008), Raymond et al. (2009), Maloney (2009), Sobel and Maloney (2012, 2013), Jiang et al. (2015), Kim and Adames (2016), Jiang (2017), many others

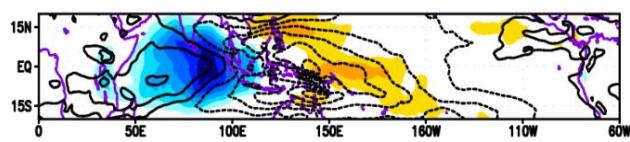
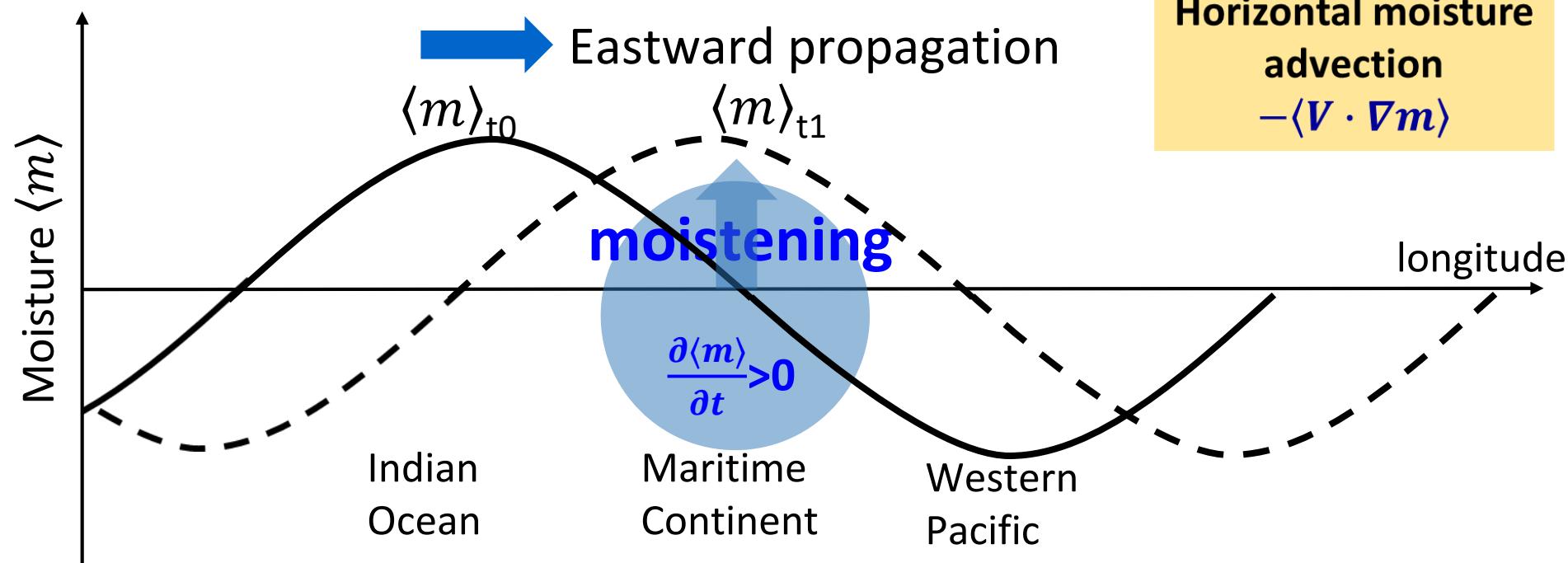
# MJO Propagation

$$\frac{\partial \langle m \rangle}{\partial t} = -\langle V \cdot \nabla m \rangle - \left\langle \omega \frac{\partial m}{\partial p} \right\rangle + F_{sfc} + \langle Qr \rangle$$

Tendency      Horizontal advection

MJO eastward propagation

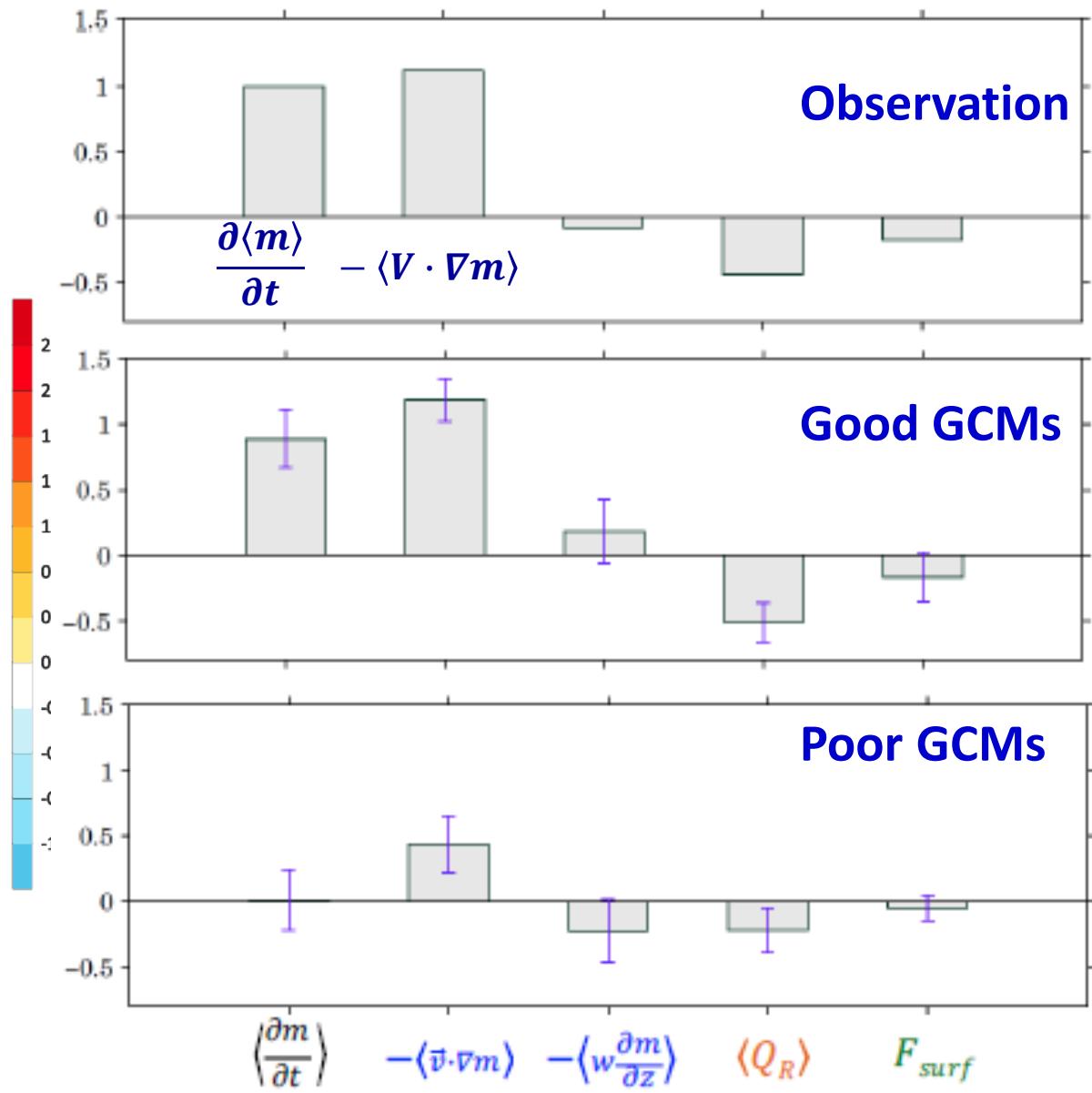
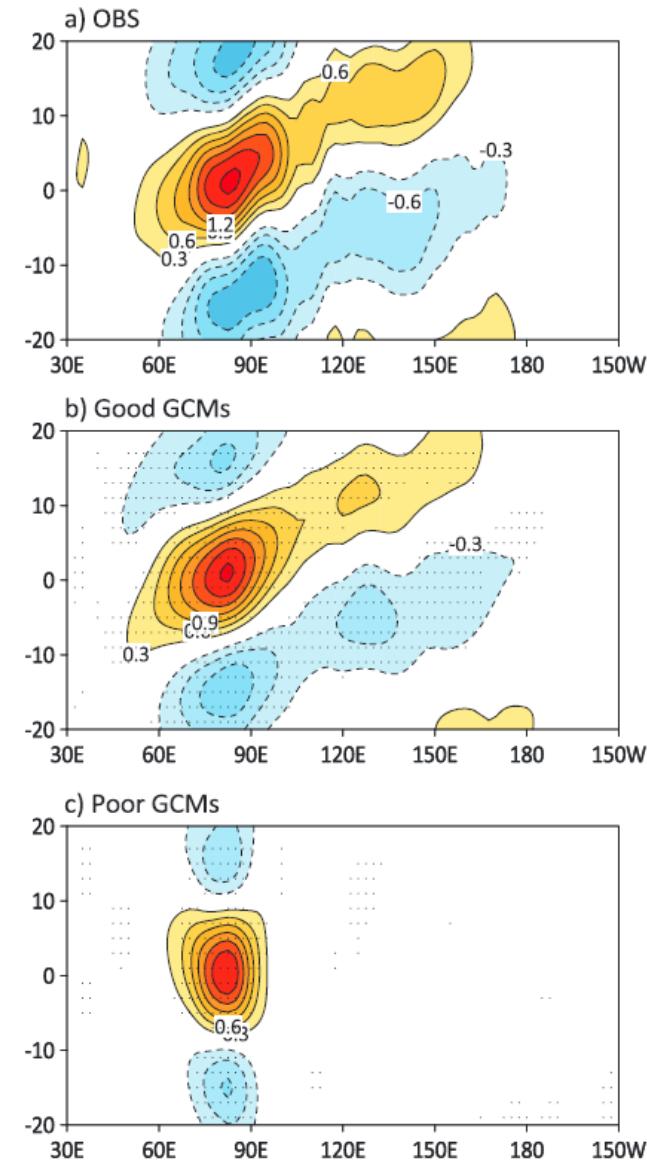
↑  
Horizontal moisture advection  
 $-\langle V \cdot \nabla m \rangle$



Maloney (2009), Kiranmayi and Maloney(2011),  
Andersen and Kuang(2012), Kim et al. (2014), Kim  
and Adames (2016), Jiang (2017)

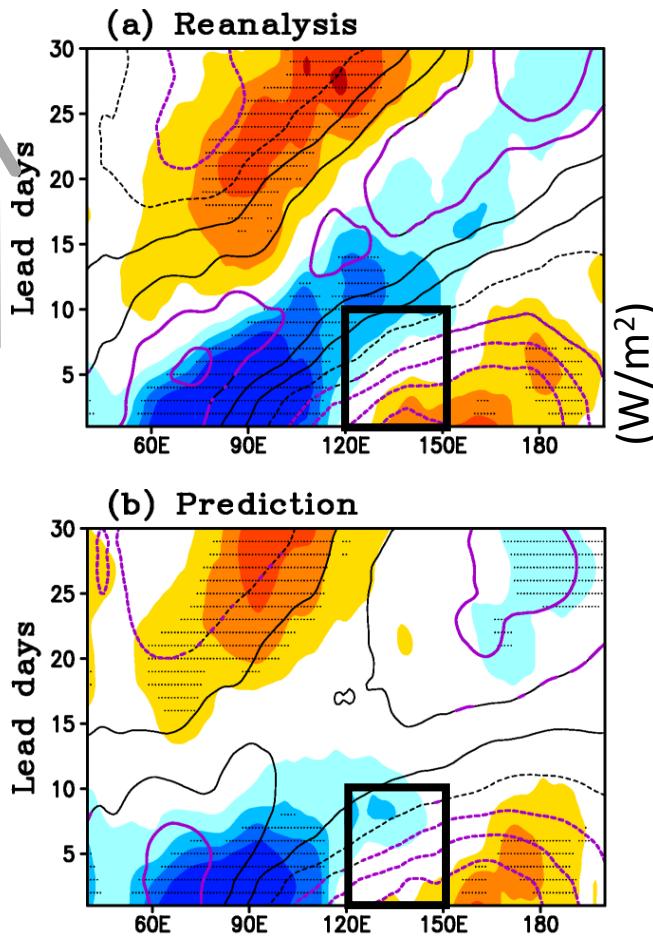
# MSE analysis in multi-models

Jiang (2017): MJOTF/GASS MJO project

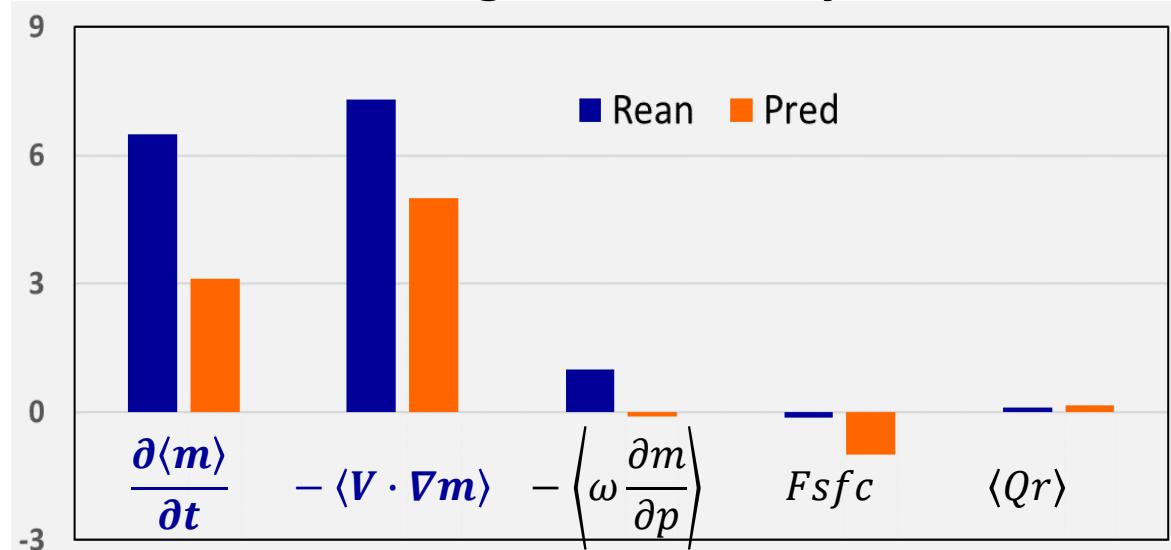


# MSE analysis in ECMWF reforecast

## OLR and U850



## MSE budget terms: Day 1~10

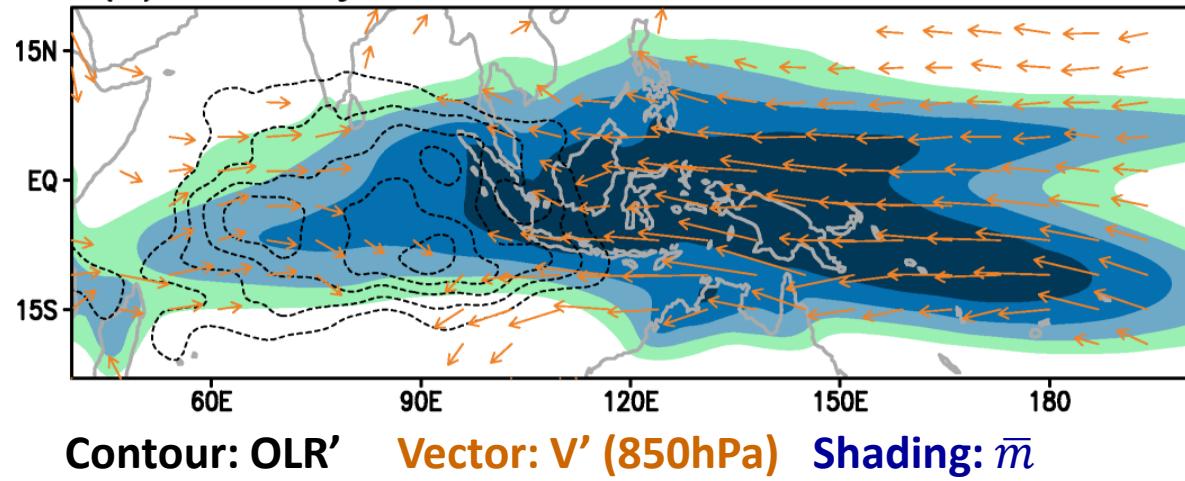


\* Averaged area: 20°S-5°S, 120°-150°E

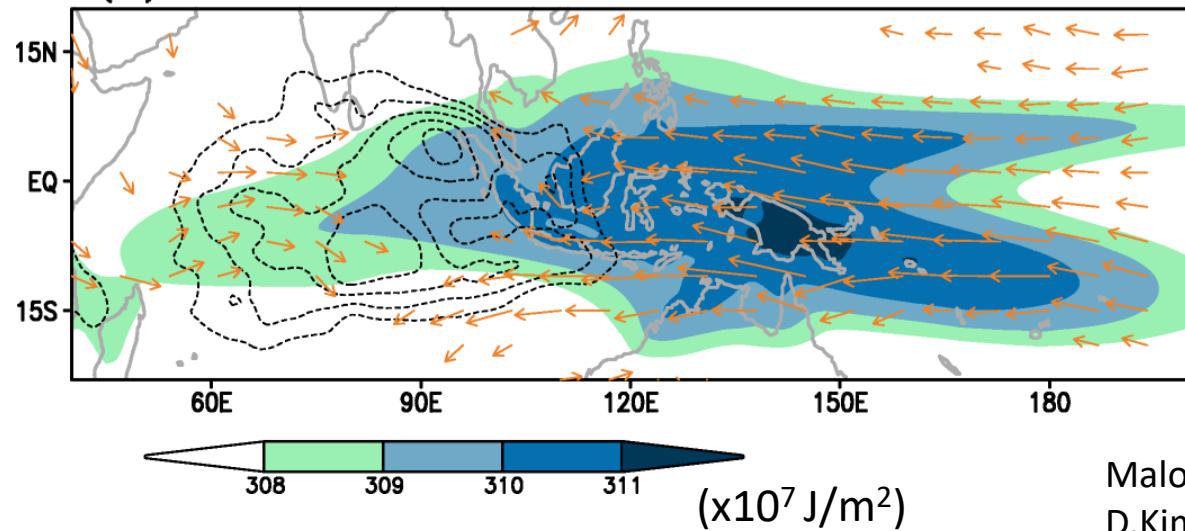
**Prediction:**  
**Weaker horizontal moisture advection**

# Mean Moisture Bias

(a) Reanalysis



(b) Prediction Day 1~5



MJO eastward propagation  
Faster decay

Horizontal moisture advection  
 $-\langle V \cdot \nabla \bar{m} \rangle$  Weaker

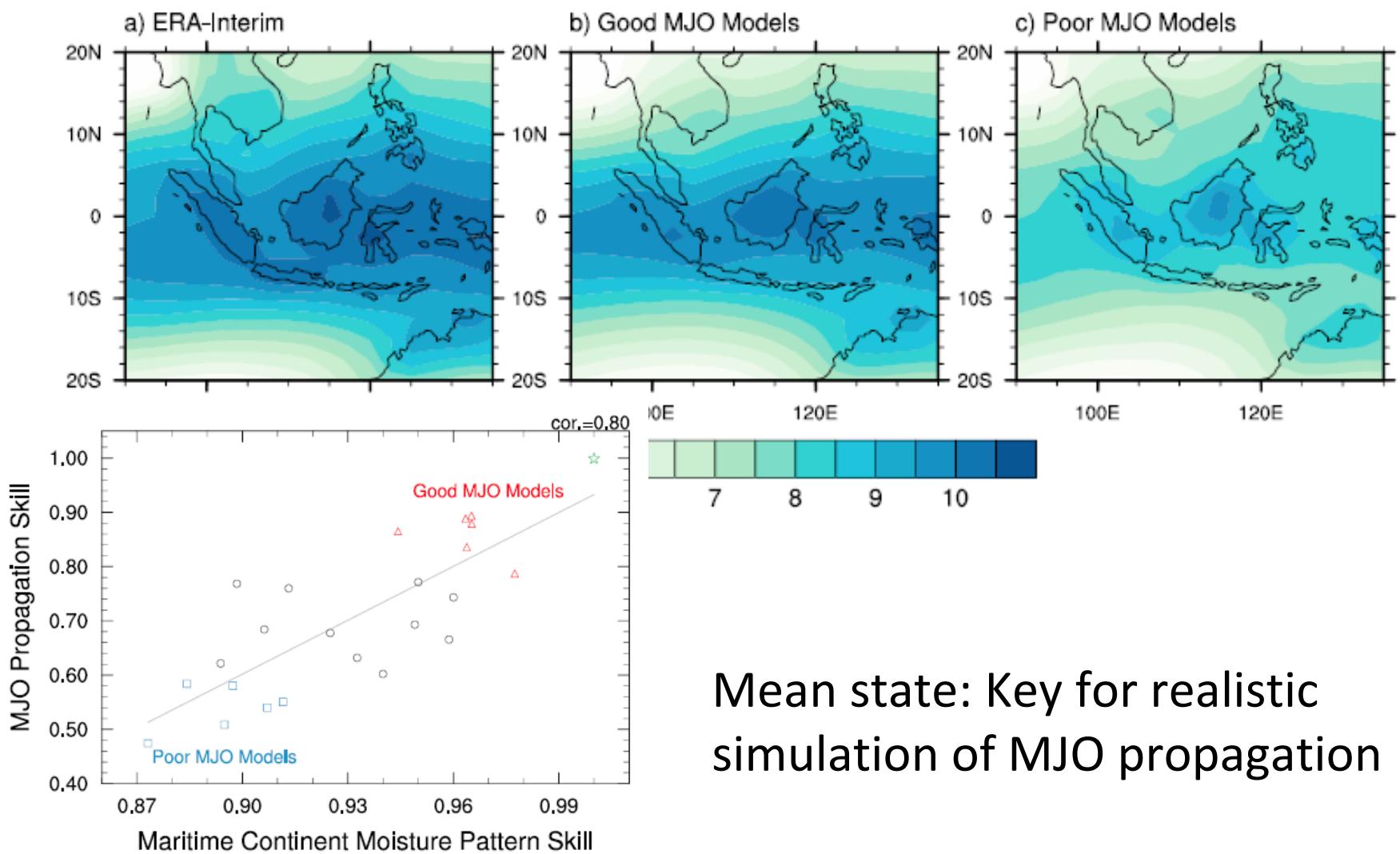
$-\langle V' \cdot \nabla \bar{m} \rangle$  Weaker  
MJO wind Mean MSE

Maloney (2009), Andersen and Kuang(2012),  
D.Kim et al. (2014), Jiang (2017)

# Mean Moisture Bias

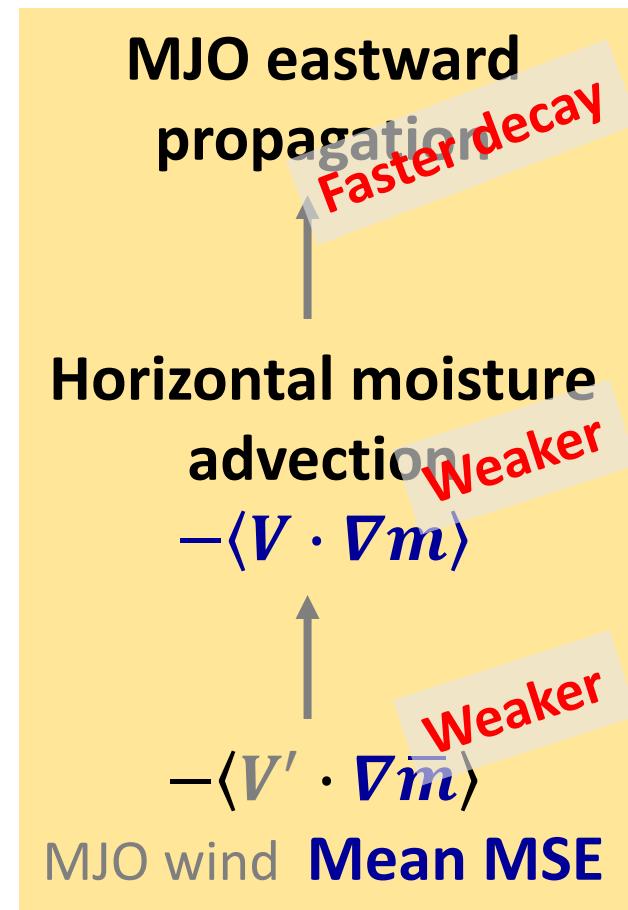
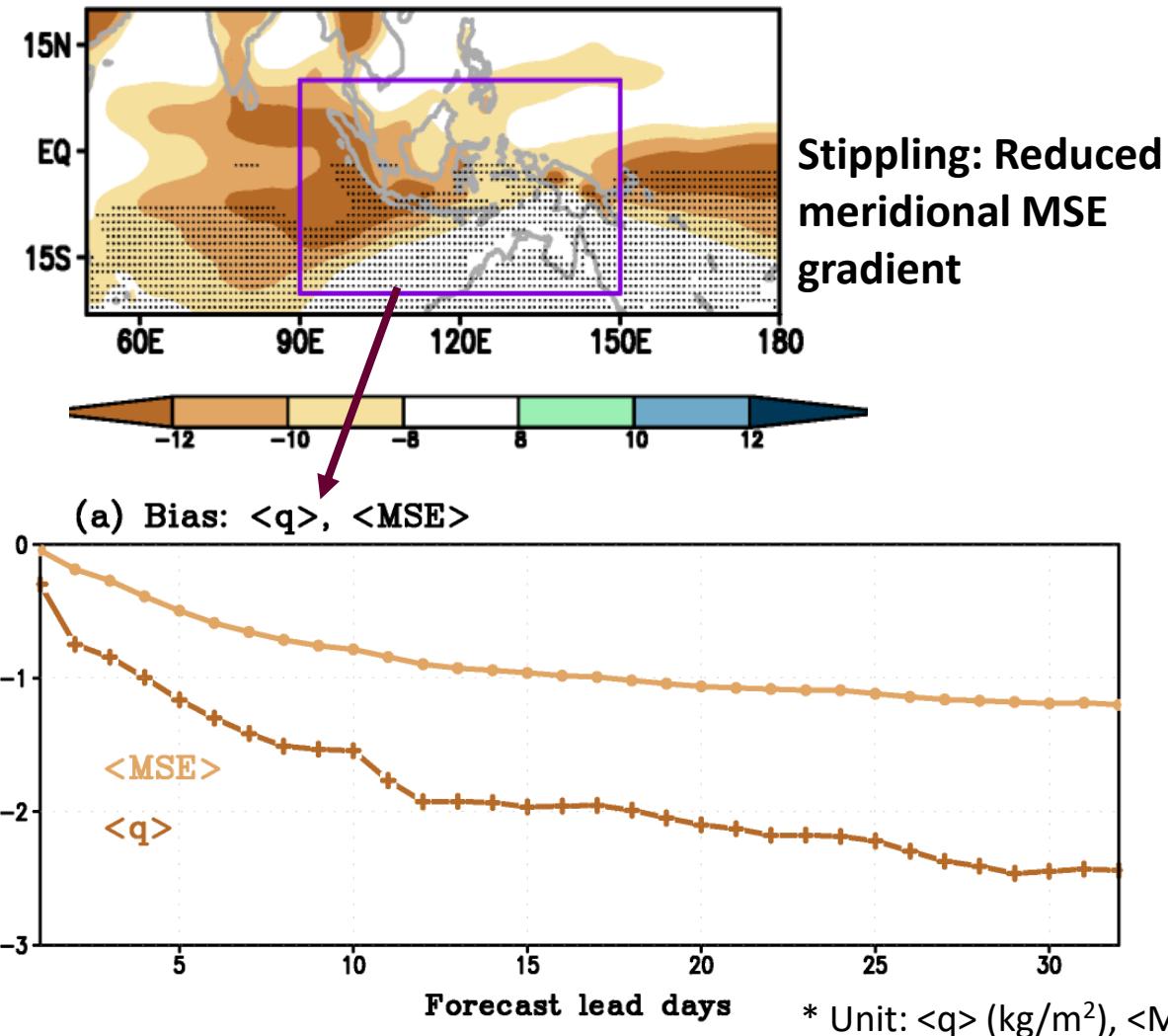
Gonzalez and Jiang (2017)

Nov-April mean specific humidity (650-900 hPa)



# Mean Moisture Bias

## Mean $\langle \text{MSE} \rangle$ Bias (Prediction-Rean)

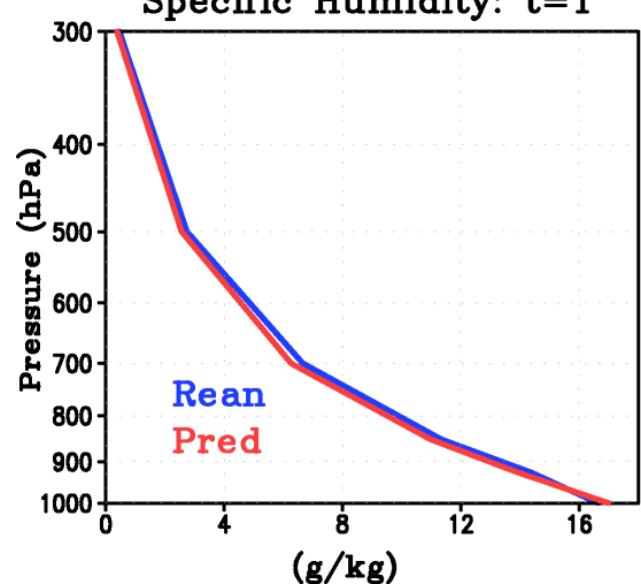


# Mean Moisture Bias

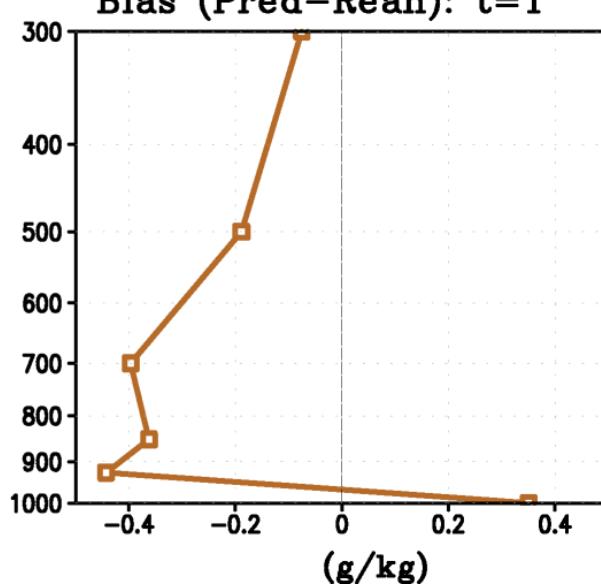
## Specific Humidity ( $q$ )

Day 01

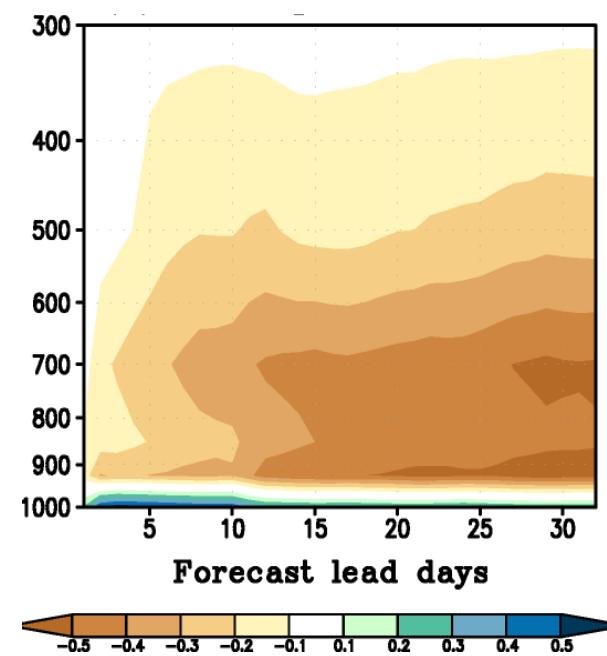
Specific Humidity:  $t=1$



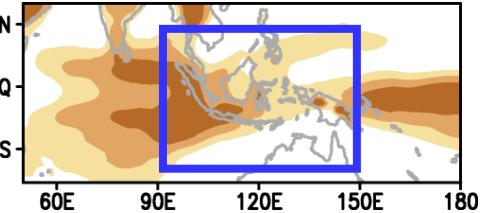
Bias (Pred-Rean):  $t=1$



Bias: Day 1 to 32



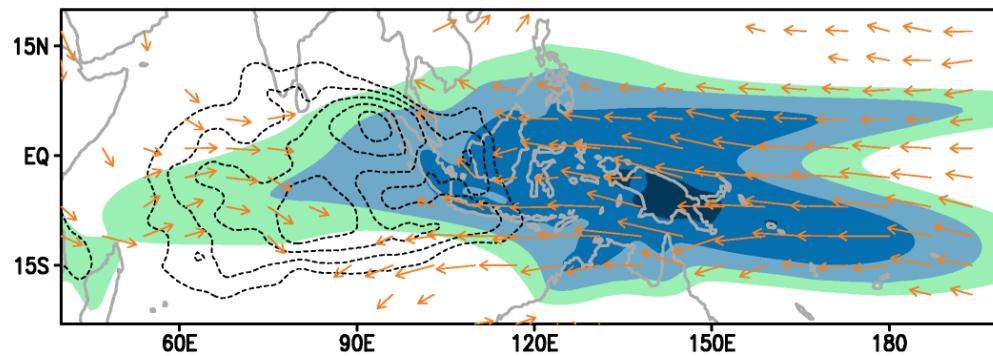
\* Averaged area: 20°S-10°N, 90°E-150°E



Kim (JGR, in review)

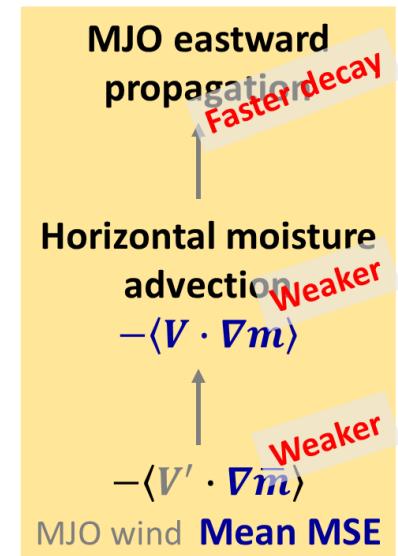
# Summary

- The MJO is the main source of subseasonal predictability.
- Current operational models successfully predict the MJO up to 3-4 weeks but have **Maritime Continent MJO propagation/prediction barrier**.
- The weak predicted MSE tendency to the east of the MJO convection is due to the **weak horizontal MSE advection**.
- The **biases in seasonal mean tropospheric moisture field** is a key factor that weakens the horizontal MSE advection.



Questions, comments?

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# References

- Kim, H. M.: The impact of the **mean moisture bias** on the key physics of MJO propagation in the ECMWF reforecast, *JGR-Atmospheres (in revision)*
- Kim, H. M., D. Kim, F. Vitart, V. Toma, J. Kug, and P. Webster, 2016: **MJO Propagation across the Maritime Continent** in the ECMWF Ensemble Prediction System. *J. Climate*, 29, 3973–3988
- Kim, H. M., P. J. Webster, V. E. Toma, and D. Kim, 2014: **Predictability and prediction skill of the MJO** in two operational forecasting systems, *J. Climate*, 27, 5364-5378