## The wintertime impact of the MJO and ENSO on intraseasonal climate patterns over North America

#### Emily Riddle, Marshall Stoner, Dan Collins, Steven Feldstein, Nat Johnson, Michelle L'Heureux

NOAA/NCEP Climate Prediction Center University of Hawaii Wyle Information Systems Pennsylvania State University



Funding: NOAA Climate Test Bed Project NA10OAR4310250

### **Outline:**

- I. Cluster Analysis to identify common 500 mb geopotential height patterns over North America in the wintertime.
- II. How do the MJO and ENSO impact the frequency of occurrence of these patterns?
- III. How well do CFSv2 hindcasts capture the observed enhanced/suppressed probabilities of these patterns?

### Finding common geopotential height patterns: K-means cluster analysis

**Dataset:** 500 hPa heights from NCEP/NCAR Reanalysis

**Domain:** Centered on North America but including the whole PNA region. We have repeated the analysis for the whole northern hemisphere as well, with similar results

Averaging: 7-Day running mean

Time Range: December – March (Winter months) 1979-2011, total of 3962 overlapping 7-day periods go into the analysis Example of 500 hPa geopotential height anomalies for one 7-day period: January 1<sup>st</sup> – January 7<sup>th</sup> 1979



#### **K-means Cluster Analysis**



# New method for choosing an optimal number of clusters:

How well do hyperspheres centered on the cluster centers cover the phase space, minimizing gaps and overlap?

2-Dimensional Example



#### **Results: Composites of the 7 Clusters**







Mean 500 hPa Geopotential height anomalies (m)

#### Focus on three of the seven clusters









### Impact of the Madden-Julian Oscillation: The Wheeler-Hendon Index

EOF analysis of OLR, 850 hPa zonal winds and 200 hPa zonal winds

First two EOFs are in quadrature and together describe an eastward propagating wave of precipitation and circulation anomalies (30-60 day period)

We use phase of the index (1-8) to describe the location of MJO related precipitation.

We also use the magnitude of the index to determine whether MJO is active or inactive. This determination is also based on the persistence and direction of propagation. An MJO event is represented by a counterclockwise propagation in the EOF-1 vs. EOF-2 phase space



#### Impact of the Madden-Julian Oscillation: The Wheeler-Hendon Index



#### **Impact of the Madden-Julian Oscillation: Example: Anomalous cluster frequencies**

 $\Delta F = 100 \cdot [(P(clust|MJO - P(clust))/P(clust)]$ 



#### Impact of the MJO on Clusters 4,6, and 7

![](_page_10_Figure_1.jpeg)

![](_page_11_Picture_0.jpeg)

**Dependence on ENSO** 

**Cluster 4** 

![](_page_11_Figure_3.jpeg)

Ocean East Indian Ocean West Maritime Continent Constructive **East Maritime** interference Continent between El Nino and MJO phase West Pacific 7 convection Ocean patterns **Central Pacific** Ocean

Western Hemisphere

West Indian

![](_page_12_Picture_0.jpeg)

**Dependence on ENSO** 

![](_page_12_Figure_2.jpeg)

West Indian Ocean

#### East Indian Ocean

West Maritime Continent

East Maritime Continent

**West Pacific** 

Generally constructive interference between El Nino and MJO phase 6 convection patterns

![](_page_12_Picture_8.jpeg)

East Pacific Ocean

Western Hemisphere

![](_page_13_Figure_0.jpeg)

#### **CFSv2 Hindcasts**

**Dataset**: 45-day Climate Forecast System version 2 hindcast runs. 4 runs initiated every day.

**Domain**: Same as before

**Time Range:** December – March (Winter months) 1999-2009, shorter record than for full cluster analysis

Averaging: Average over 4 runs started each day, 7-day running mean

Assigning cluster numbers: Use nearest cluster centroid based on Euclidean distance

#### **CFSv2 Hindcasts (1999-2009)**

### Slanted lines show the position of peaks and troughs from the full reanalysis record (1979-2011)

![](_page_15_Figure_2.jpeg)

#### **Summary and Conclusions**

- 1) A new method is introduced for optimizing the number of clusters in a k-means cluster analysis
- 2) The resulting 7 clusters provide an efficient description of variability in 500 mb heights over PNA region. One advantage of the cluster analysis is that it allows for asymmetries between positive and negative phases of the leading modes of NH variability. Clusters tend to be mixtures of leading modes, such as the AO and PNA.
- 3) Cluster 4, 6 and 7 occurrences are strongly modulated by MJO. While Clusters 6 and 7 resemble the positive and negative phases of the PNA, respectively, they show stronger modulations than similarly sized clusters based on the PNA alone.
- 4) The enhanced probabilities of clusters 6 and 7 occur almost entirely during El Nino and La Nina, respectively, when ENSO convection anomalies constructively interfere with the MJO.
- 5) 45-day CFSv2 hindcasts generally capture the approximate timing of enhanced/ suppressed cluster probabilities associated with MJO, though the magnitude of the anomalies is slightly weaker in the model and the anomalies may persist for slightly longer. This may suggest that the model is capturing at least some of the dynamics between the tropics and extratropics.

#### Questions

#### **Results are consistent with previous studies**

**Relationship between MJO and PNA:** 

(e.g., Higgins and Mo, 1997; Mori and Wanatabe, 2008; Johnson and Feldstein, 2010)

Cluster 6 subtropical jet extension and a positive PNA is associated with enhanced MJO convection over the Central Pacific (phase 6/7)

Cluster 7 weakening of the subtropical jet and a negative PNA is associated with suppressed MJO convection over the Central Pacific (phase 2/3)

**Relationship between MJO and AO/NAO:** (e.g., Cassou et al, 2008; L'Heureux and Higgins, 2008; Lin et al 2009)

Cluster 4 negative AO is common several weeks after enhanced MJO convection over the Central Pacific (phase 6/7)

A positive AO is common several weeks after suppressed MJO convection over the Central Pacific (phase 2/3)

## Is the MJO impact on pure AO and PNA modes stronger or weaker than on Clusters 4,6 and 7?

#### Number of "significant" results (p<0.05)

Clusters 4,6, and 7		Clusters of the same size consisting of the most positive / negative AO/PNA values	
Cluster 4	49	Negative AO	64
Cluster 6	55	Positive PNA	42
Cluster 7	75	Negative PNA	7

![](_page_19_Figure_3.jpeg)