## Weather regime diagnostic tools for wintertime sub-seasonal ensemble forecasts

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- 1. Weather Regimes over North America from Reanalysis; ENSO/MJO relationships; surface impacts
- 2. ECMWF model regimes
- 3. CFSv2 subseasonal forecast regime diagnostics

### Outline



### Weather Regimes aka Large Scale Meteorological Patterns

- Long history in dynamical meteorology of the midlatitudes of so-called low frequency variability (LFV: 10–50 days) that organizes synoptic-scale weather: index cycles, blocking, quasi-equilibria, Grosswetterlagen, . . .
- WRs are typically defined through classification of weather maps, using geopotential height data
- Can the concept of discrete circulation regimes lead to improved sub-seasonal to seasonal forecasts, by providing a low-order coarse-graining of S2S forecast evolution?



FIG. 4. Left: 500-hPa maps for the points in phase space that correspond to the centroids of the clusters labeled A, G, and R (indicated by boldfaced type in Fig. 3); contour interval 60 m. Right: The corresponding composite anomaly maps: contour interval 50 m, negative contours are dashed. Printed at the top of each panel is the number of maps in the cluster and the reproducibility parameter.

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#### Greenland High (NAO-)

#### Pacific Trough (PNA)

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### Weather Regimes over North America from Reanalysis

 K-means analysis of Z500 daily Oct-Mar fields from MERRA reanalysis data [150E-40W, 10N-70N], 1982-2014

 Anomalies from the mean seasonal cycle, filtered to retain larger scales using 10 leading EOFs



(the dashed line indicates 10% significance level according to a first-order Markov process)

Vigaud et al. (2018, MWR)





### Weather Regimes over North America from Reanalysis

#### Similar to

Strauss and Molteni (2004) Strauss et al (2007) Stan and Strauss (2007)



Based on NCEP Z200





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Vigaud et al. (2018, MWR)



### Weather Regime Surface Impacts

#### **Precipitation**



Similar overall patterns between observed-data impacts and model's own surface impacts, Vigaud et al. (2018, MWR) But substantial regional differences



MERRA

40°N

30<sup>o</sup>l

Temperature

40<sup>°</sup>N

30<sup>0</sup>N



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**ECMWF** 









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# Forecast Evolution in WR Space

- Use the 4 MERRA regimes to define a low-order subspace for large-scale Z500 flow
- Circulation evolution is portrayed by regime persistence and transitions
  - We track the forecast evolution by projecting 5-day running means of the CFSv2 forecast ensemble means onto the MERRA-regime subspace
  - On each day, the forecast Z500 pattern is assigned to the most-similar MERRA regime pattern
- Similarity is defined by pattern correlation of anomalies from a seasonallyvarying (and lead dependent) model climatology

### CFSv2 Hindcasts of 2008/9 Winter Projected on MERRA Regimes



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Jan–Feb Regime 4–>1 Episode and transition Well forecast up to 4 weeks ahead







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(RMM1,RMM2) phase space for 1-Jan-2009 to 31-Mar-2009



Blue line is for Mar, green line is for Feb, red line is for Jan

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MJO







## S2S Drivers of Regime Frequency

#### **SST Year-to-Year Correlations with Frequency**



• Regime 3 (Pacific trough/PNA) is related to El Niño and 10–15 days after MJO phase 6 • Regime 4 (Pacific ridge/RNA) is related to La Niña and after MJO phase 3

#### **Frequency vs MJO Phase**



### CFSv2 Forecasts of 2015/16 Winter





### CFSv2 Forecasts of 2015/16 Winter



forecasted beyond 2 weeks



# How close are model forecasts to the observed regime centroids?

- Color saturation denotes strength of similarity between forecast ensemble mean and MERRA regime centroid
- Longer lead forecast ensemble mean Z500 anomalies tend to be less well categorized by regime pattern











### **Regime Frequency: CFSv2 vs MERRA**

#### Mean Regime Occurrence vs Reanalysis



Minimal bias in longer lead forecasts



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#### Interannual Correlations of **Regime Counts vs Reanalysis**



Regime 3 has best week 3-6 skill



### **CFSv2 Regime Counts Anomaly Correlation Skill**

#### 1999–2014 Hindcasts



• skill limited to 2 weeks in general

2015/16 Forecasts



• week 3-4 skill in 2015/16 in PNA/RNA regimes



#### Weekly counts

(7-day sliding window targets i.e., [d-3,d+3] for a lead of d days)



All ECMWF reforecasts projected onto MERRA weather regimes

Vigaud et al. (2018, MWR)

### ECMWF **Forecast Skill**







### Weather Regime Forecasts in Real Time





### Weather Regime Forecasts in Real Time



#### **Observed Geopotential Height Anomaly**







### Weather Regime Forecasts in Real Time



#### **Observed Geopotential Height Anomaly**











## Summary

- Set of four K-means daily Geopotential height map regimes, whose occurrence is related to ENSO and MJO phases and precip/temperature patterns over North America.
- ECMWF model at day 1–7 leads reproduces these regime structures well from independent analyses; CFSv2 less so.
- Both ECMWF & CFSv2 models skillful in MERRA-regime space to 10–15 days.
- Cases of good skill in CFSv2 up to 4 weeks ahead such as Dec-Feb 2008/9, associated with ENSO and possibly MJO. Pacific Trough Regime greatly over-forecasted in 2015/16.
- "Chiclet diagrams" provide a "tracker" of large-scale forecast evolution and assessment, highlighting past skillful intraseasonal episodes and real-time development.