

Statistical Predictions of Seasonal Tornado Activity

30 November 2015

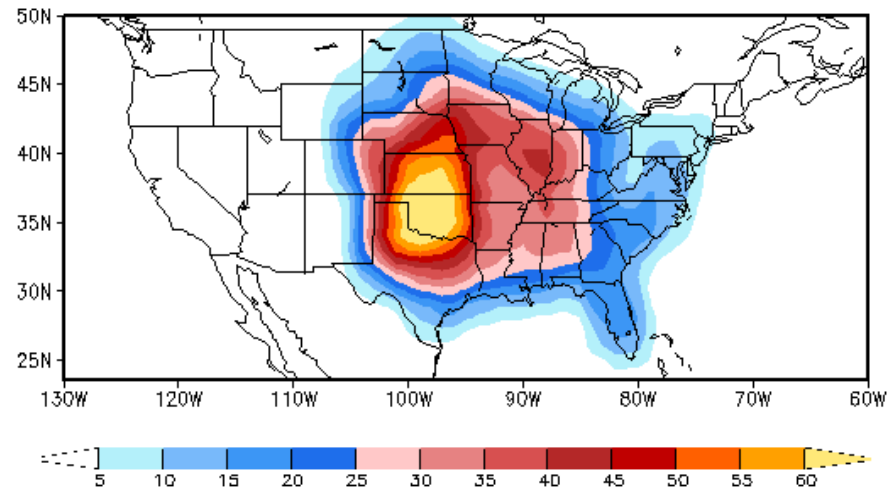
Data

NOAA/NWS/Storm Prediction Center

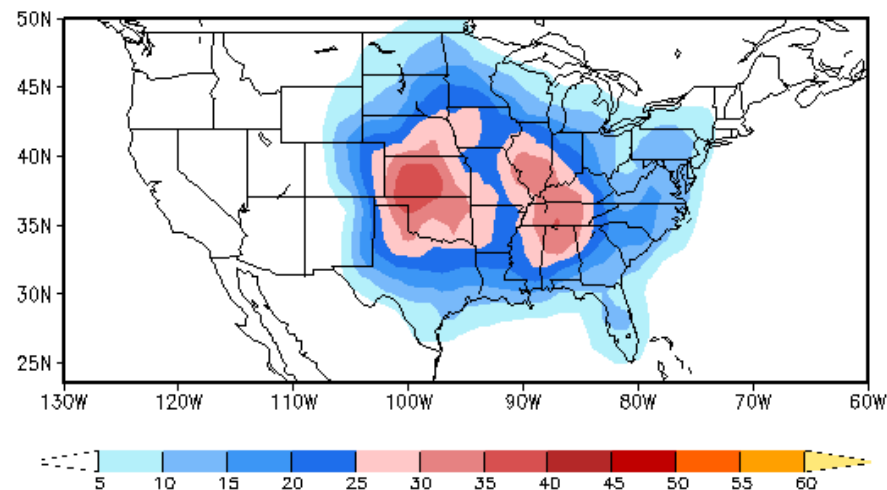
TORNADO	HAIL	DAMAGING WIND
2014_torn.csv (0.1 mb)	2014_hail.csv (0.9 mb)	2014_wind.csv (2.8 mb)
2013_torn.csv (0.10 mb)	2013_hail.csv (1.0 mb)	2013_wind.csv (1.5 mb)
2012_torn.csv (0.10 mb)	2012_hail.csv (1.4 mb)	2012_wind.csv (1.7 mb)
2011_torn.csv (0.20 mb)	2011_hail.csv (2.0 mb)	2011_wind.csv (2.5 mb)
2010_torn.csv (0.14 mb)	2010_hail.csv (1.1 mb)	2010_wind.csv (1.6 mb)
2009_torn.csv (0.14 mb)	2009_hail.csv (1.4 mb)	2009_wind.csv (1.5 mb)
2008_torn.csv (0.18 mb)	2008_hail.csv (1.7 mb)	2008_wind.csv (1.7 mb)
2005-2007_torn.csv (0.25 mb)	2005-2007_hail.csv (4 mb)	2005-2007_wind.csv (4 mb)
2000-2004_torn.csv (0.7 mb)	2000-2004_hail.csv (6 mb)	2000-2004_wind.csv (6 mb)
90-99_torn.csv (1 mb)	90-99_hail.csv (6 mb)	90-99_wind.csv (8 mb)
80-89_torn.csv (0.75 mb)	80-89_hail.csv (2.5 mb)	80-89_wind.csv (3.5 mb)
70-79_torn.csv (0.82 mb)	70-79_hail.csv (1 mb)	70-79_wind.csv (1.6 mb)
60-69_torn.csv (0.65 mb)	60-69_hail.csv (0.67 mb)	60-69_wind.csv (0.90 mb)
50-59_torn.csv (0.46 mb)	55-59_hail.csv (0.20 mb)	55-59_wind.csv (0.28 mb)

Climatology

Tornado Climatology MAMJ 1955–2014



Tornado Standard Deviation MAMJ



Unit: number of tornadoes in $5^\circ \times 5^\circ$ box from March to June per year

The forecast model is based on lagged relationships between **January SST and **MAMJ** tornado activity.**

- The lagged relationships are objectively identified by the singular value decomposition (SVD) method.
- The first three SVD modes account for 56% of seasonal tornado variance.
- Data: 1955–2014 (60 years)
- February SST is not available when issuing forecasts.
- January SST should be similar to DJF SST due to strong persistence of winter SST anomaly.

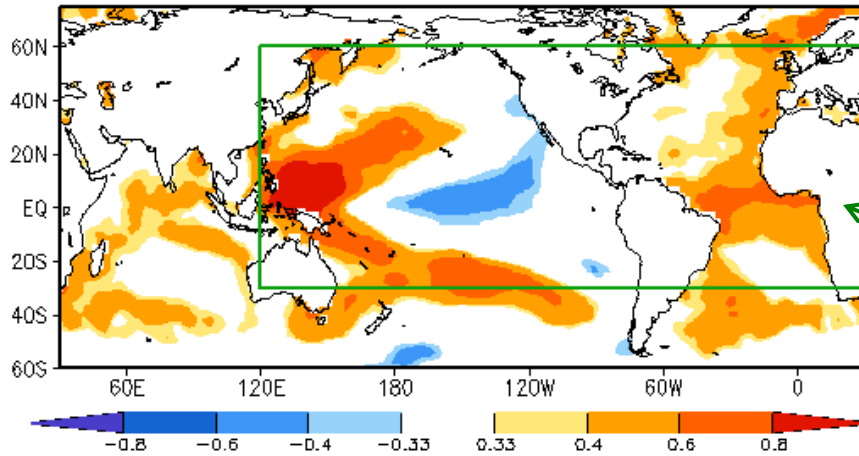
SVD1

SVD Mode 1

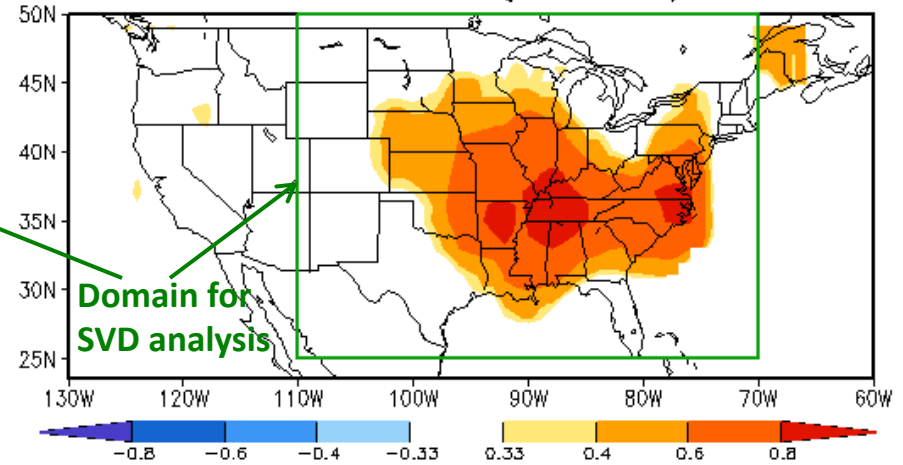
Homogeneous correlation map

99% significance level: $R=0.33$

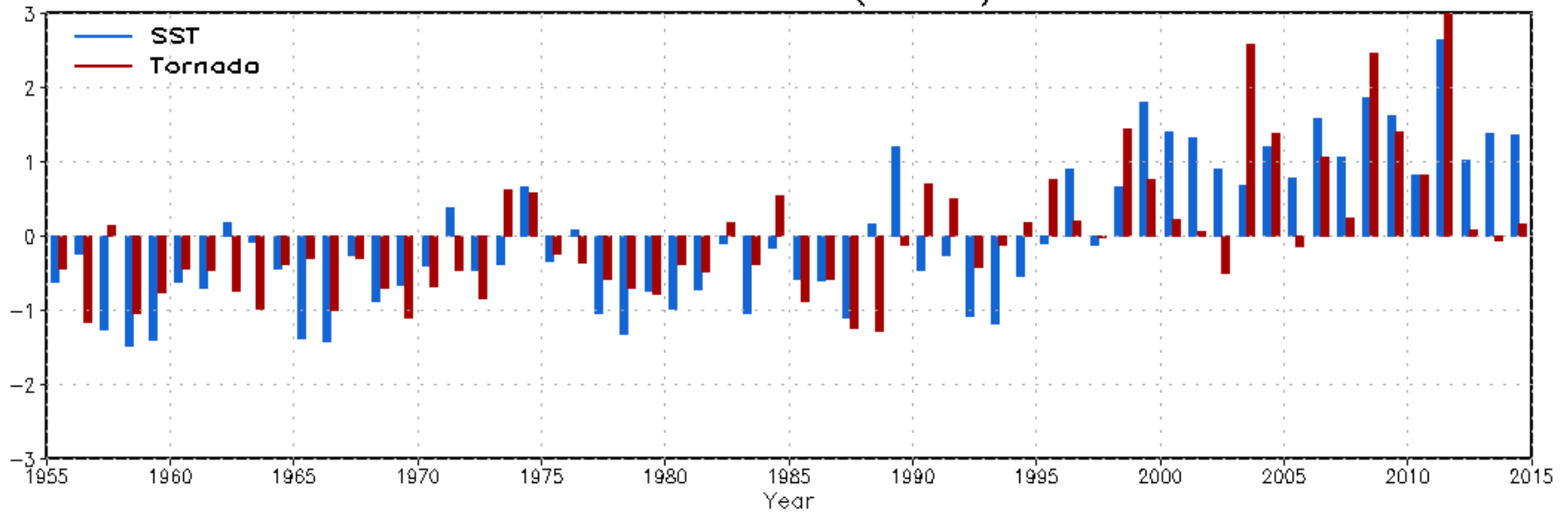
January SST (Var=12%)



MAMJ Tornado (Var=34%)



SVD Time Series ($R=0.66$)

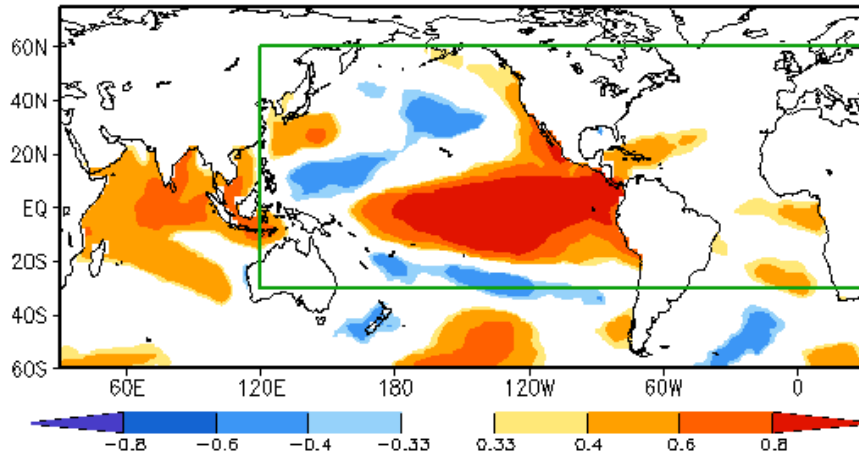


Mode 1: Tornadoes in the eastern and central U.S. associated with an SST warming trend 5

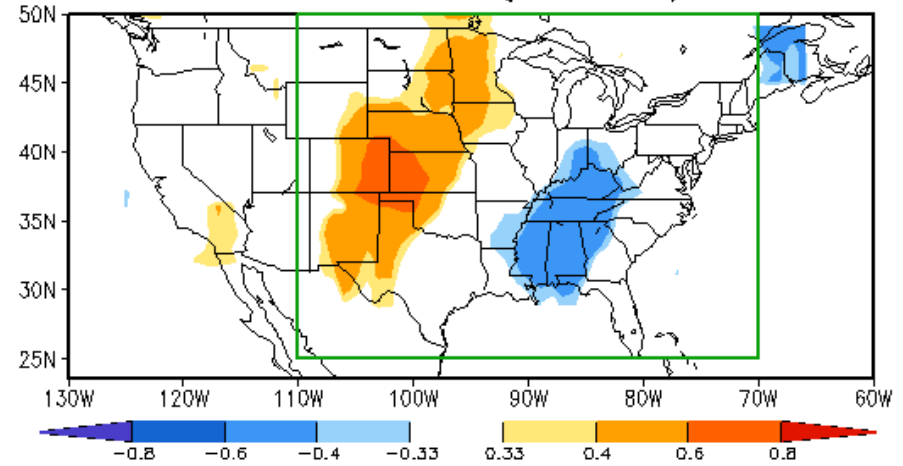
SVD2

SVD Mode 2

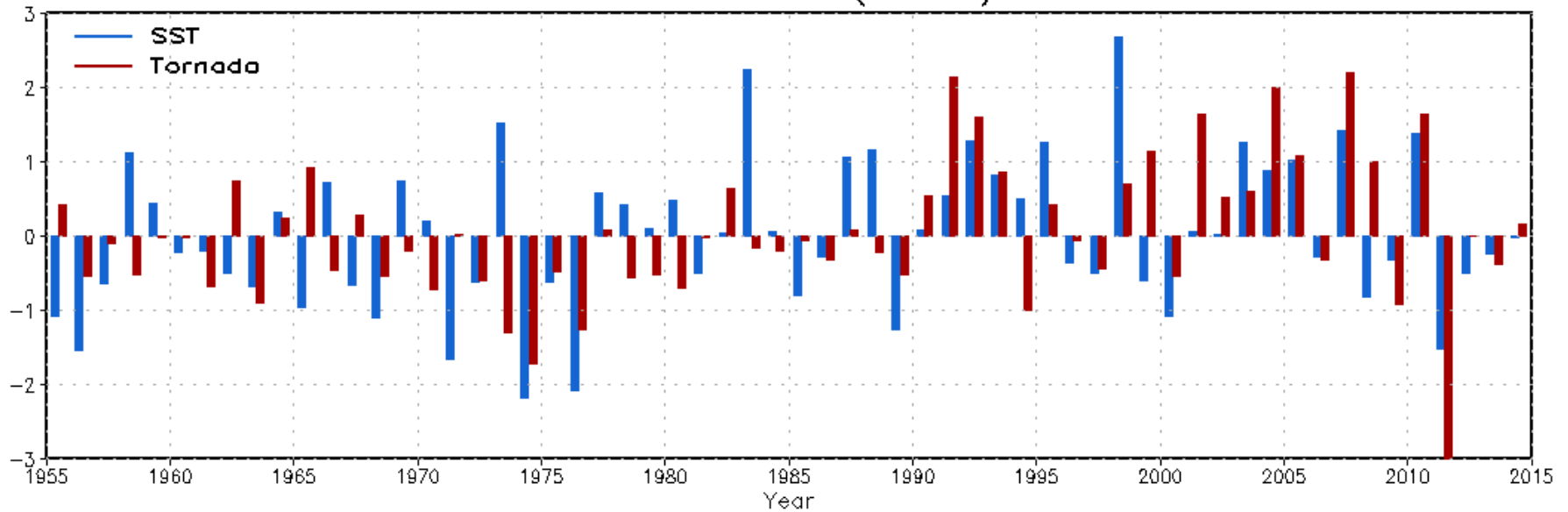
January SST (Var=28%)



MAMJ Tornado (Var=12%)



SVD Time Series (R=0.42)

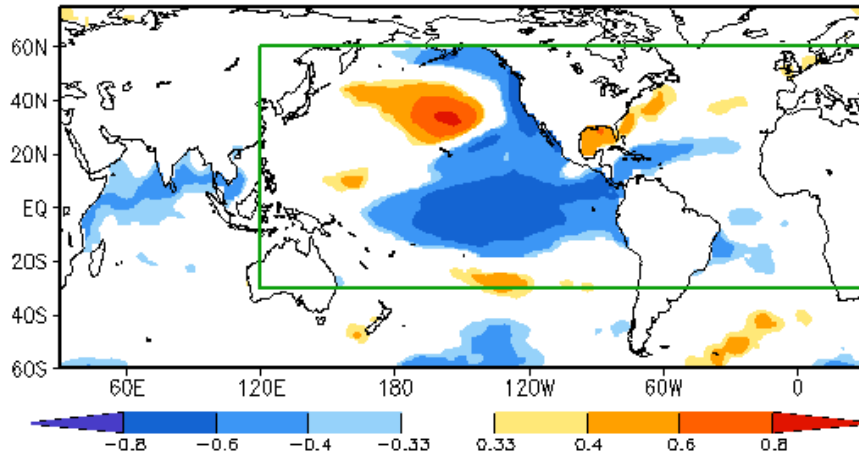


Mode 2: Out-of-phase tornado activity in the southeast and Great Plains associated with ENSO

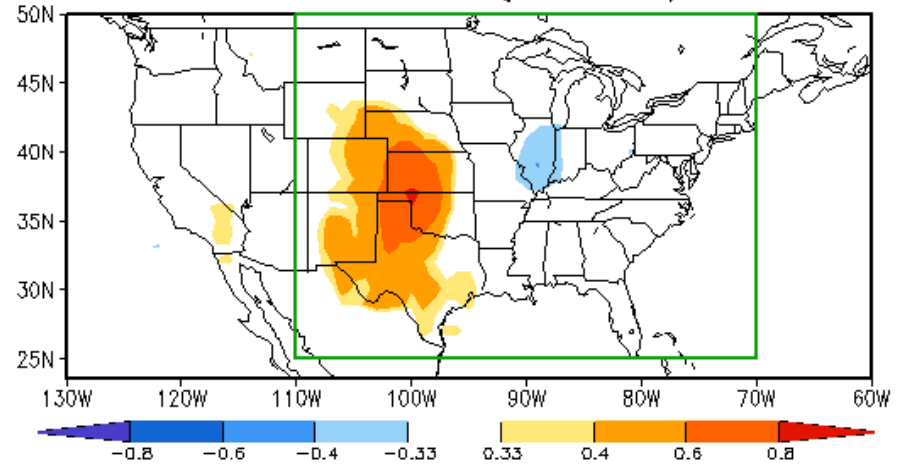
SVD3

SVD Mode 3

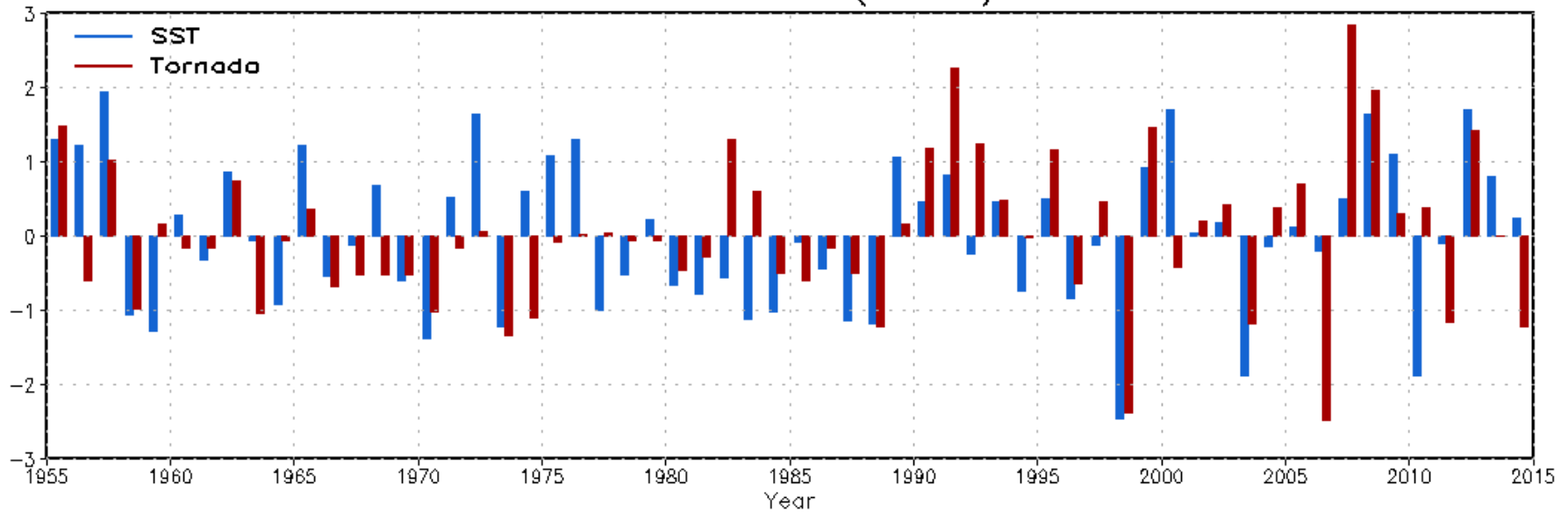
January SST (Var=7%)



MAMJ Tornado (Var=10%)



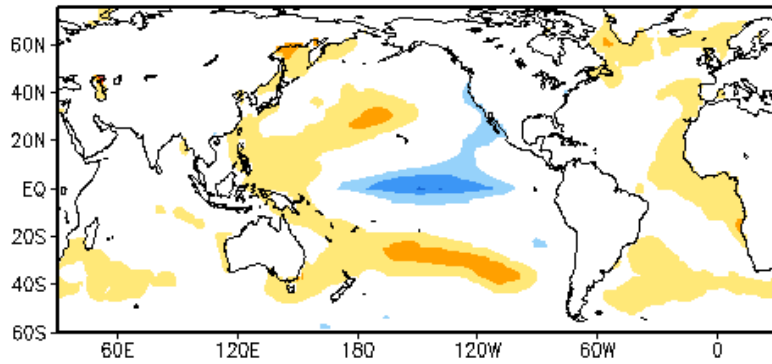
SVD Time Series (R=0.48)



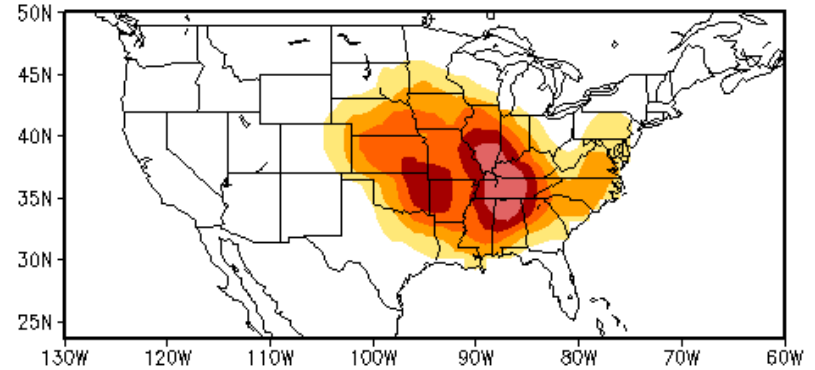
Mode 3: Tornadoes in the Central and Southern Plains associated with the PDO-like SST

Regression Coefficient (Anomaly Amplitude)

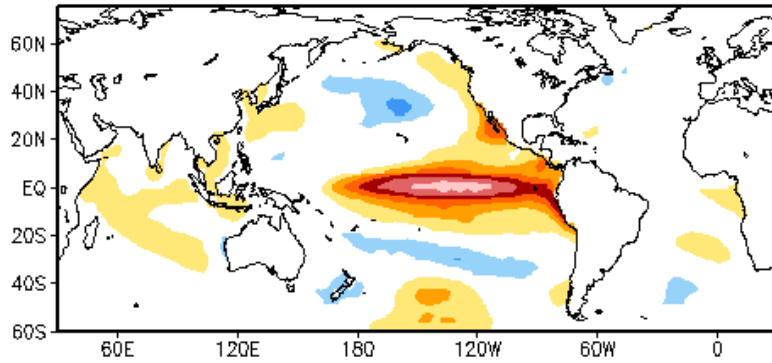
SVD1 SST Jan



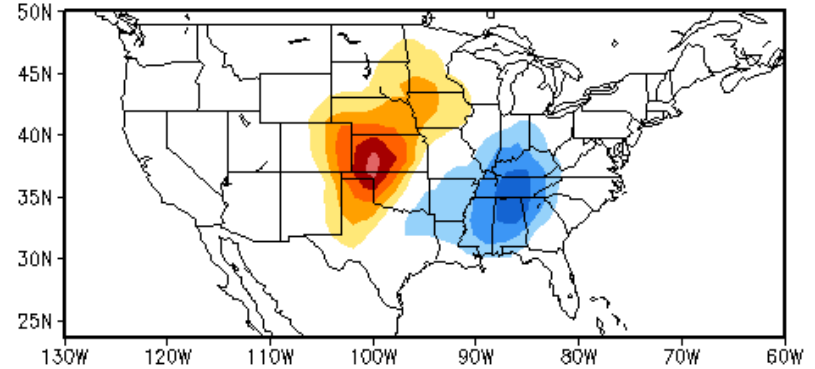
SVD1 Tornado MAMJ



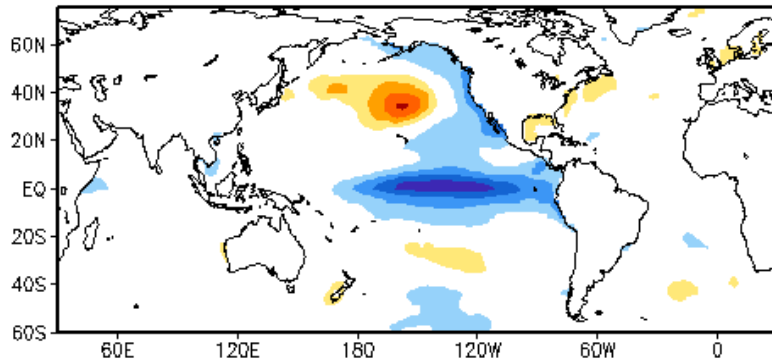
SVD2 SST Jan



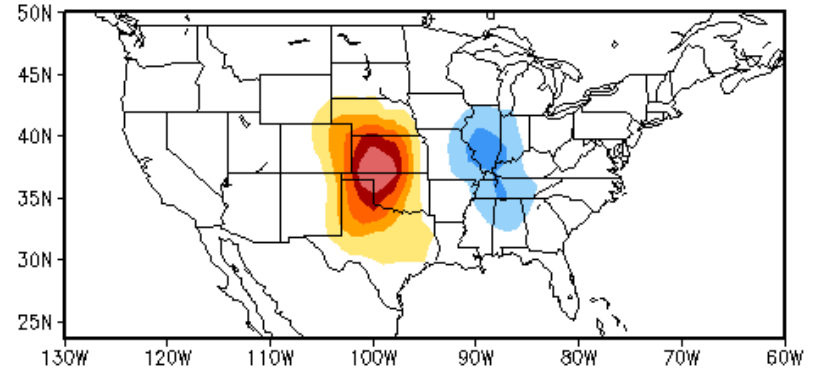
SVD2 Tornado MAMJ



SVD3 SST Jan



SVD3 Tornado MAMJ



Magnitudes of anomalous SST and tornado activity in the SVD modes

Statistical Forecast model

The methodology is same as Wang et al. (1999). The forecast model is cross-validated by the following steps.

1. To perform an SVD analysis between January SST and MAMJ tornado activity to establish the lagged relationships, with a target year removed from the SVD analysis.
2. January SST of the target year is projected onto the SVD SST pattern. The SST projection coefficient is multiplied by the correlation coefficient between the two SVD time series to obtain a tornado projection coefficient for each mode.
3. The anomalous tornado activity of the target year is predicted by the regression pattern of tornado activity associated with each SVD mode multiplied by the tornado projection coefficient for the target year.
4. The forecast skill is measured by anomaly correlation and hit rate over the 60 years.

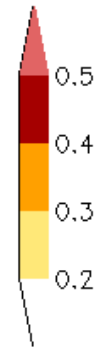
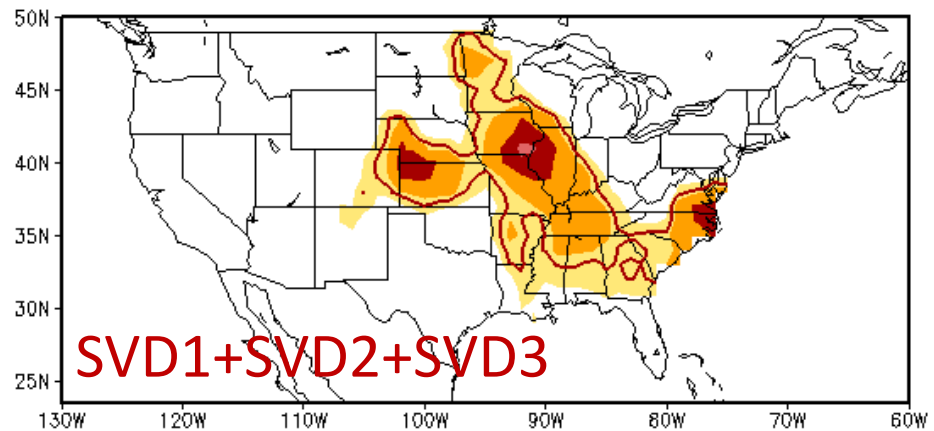
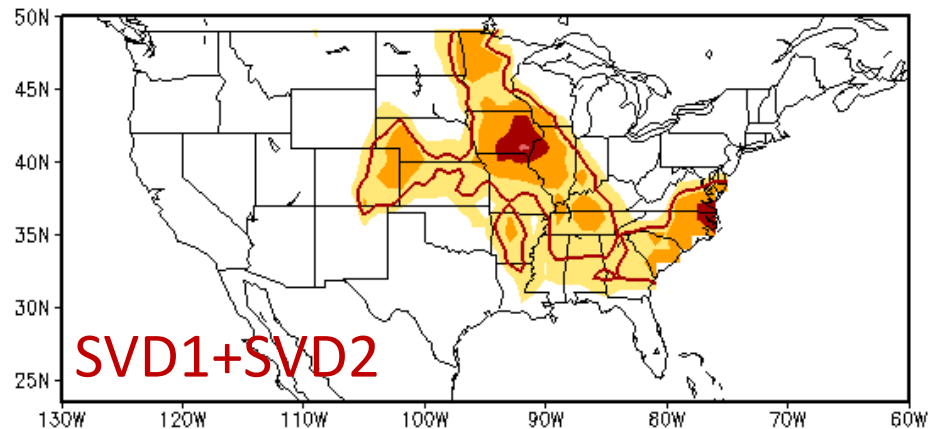
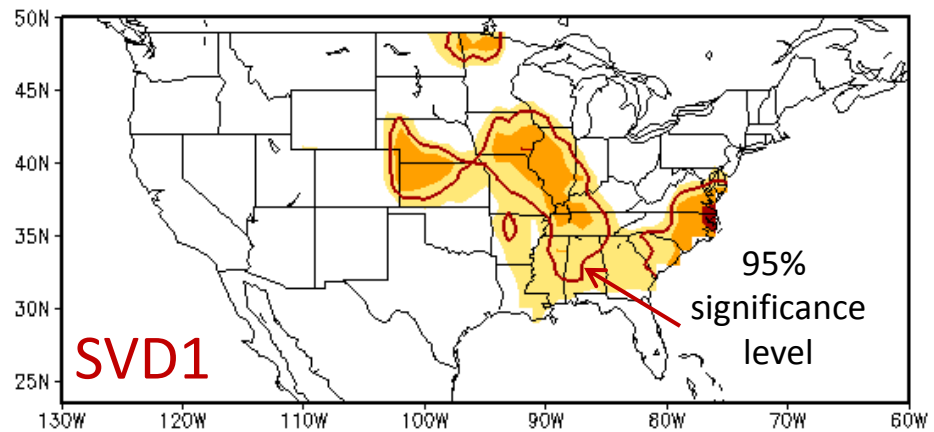
Reference:

Wang, H., M. Ting, and M. Ji, 1999: Prediction of seasonal mean United States precipitation based on El Niño sea surface temperatures. *Geophys. Res. Lett.*, **26**, 1341–1344.

Forecast Skill

Anomaly Correlation between observed and predicted MAMJ tornado activity during 1955 and 2014.

The forecast skill is increased by including the second and third SVD modes.

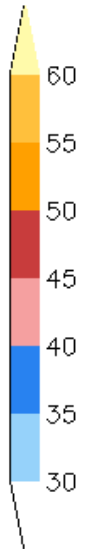
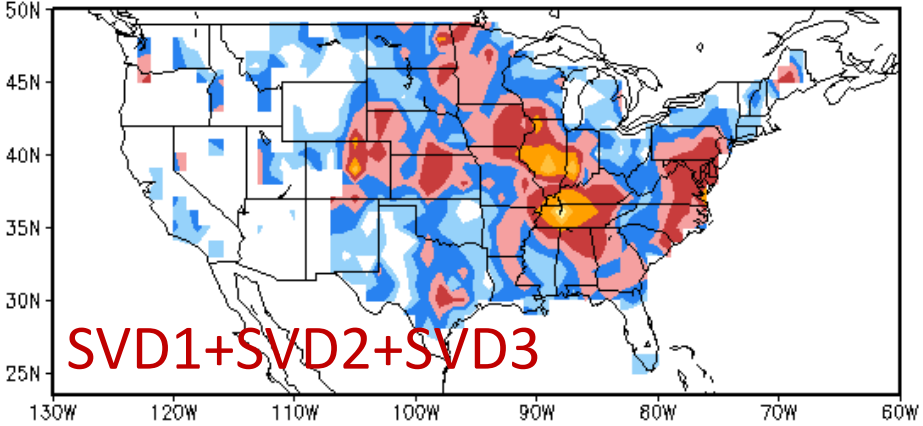
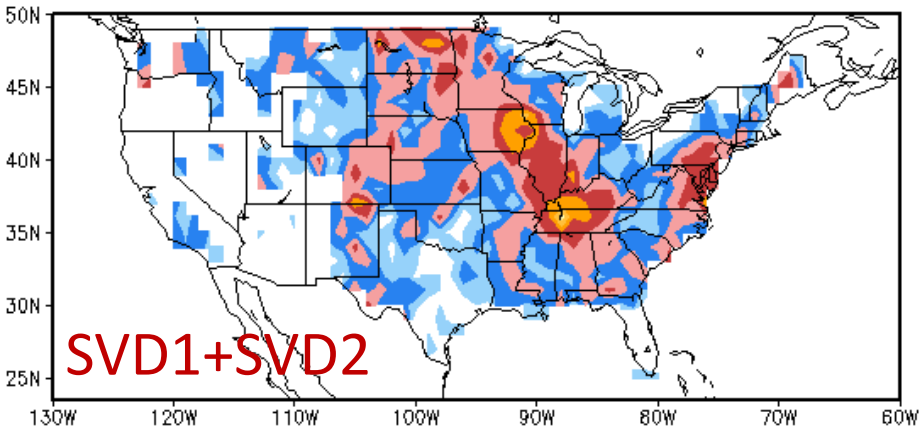
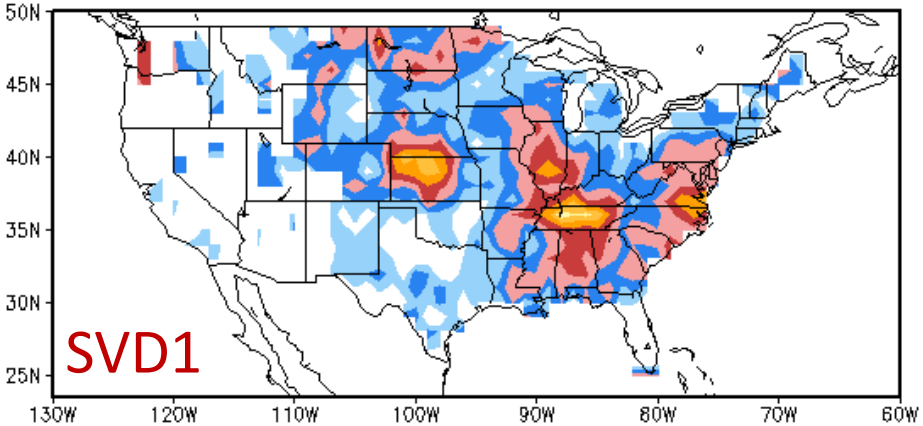


Hit Rate (%)

Three categories:

- Above normal: 33%
- Near normal: 33%
- Below normal: 33%

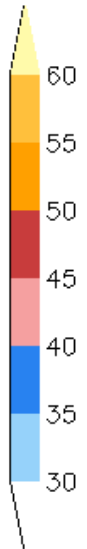
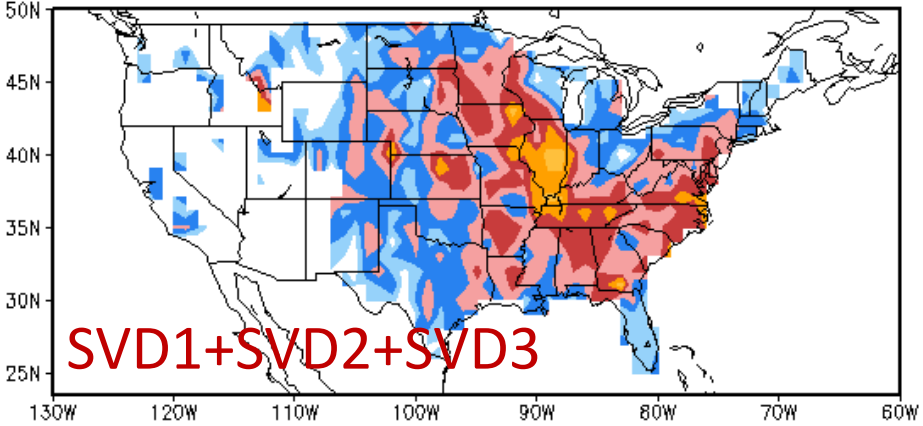
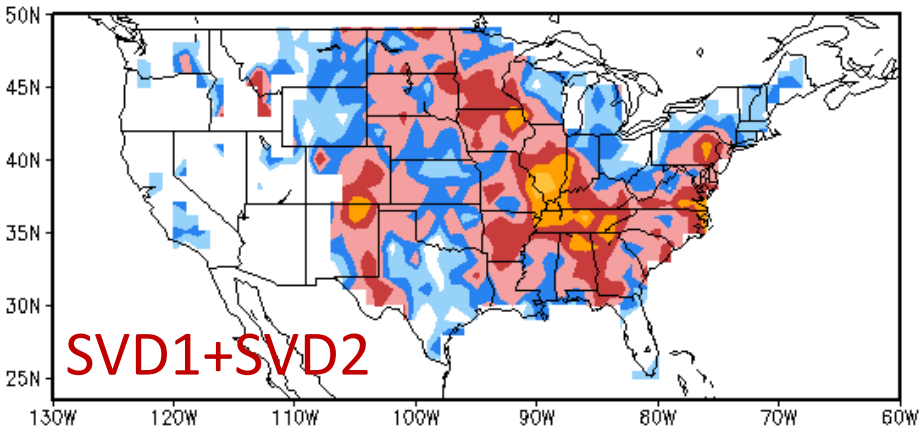
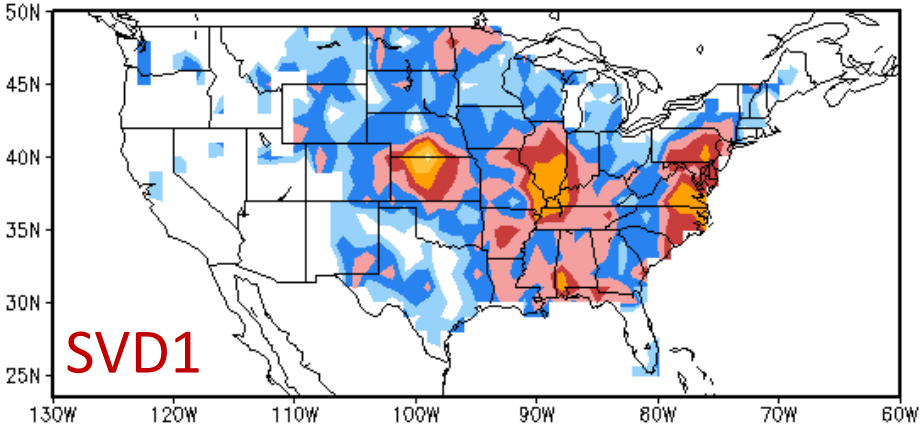
Hit rate: ratio of number of hits (both seasonal forecast and observation fall into the same category) to the total number of years (60 years).



Hit Rate (%)

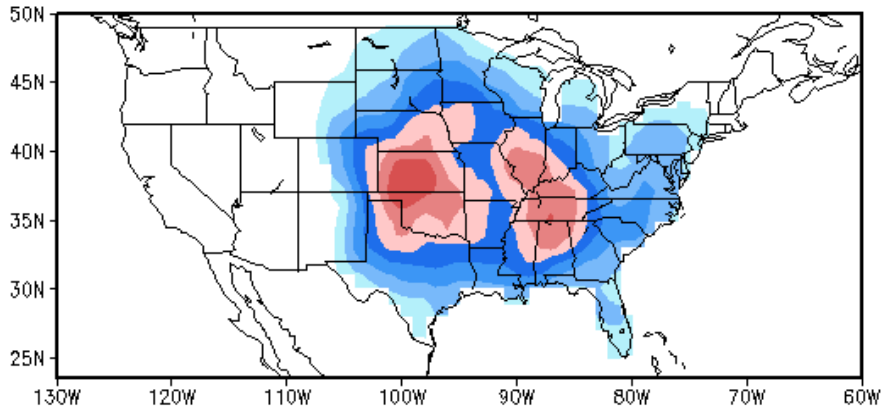
Three categories:

- Above normal: 25%
- Near normal: 50%
- Below normal: 25%

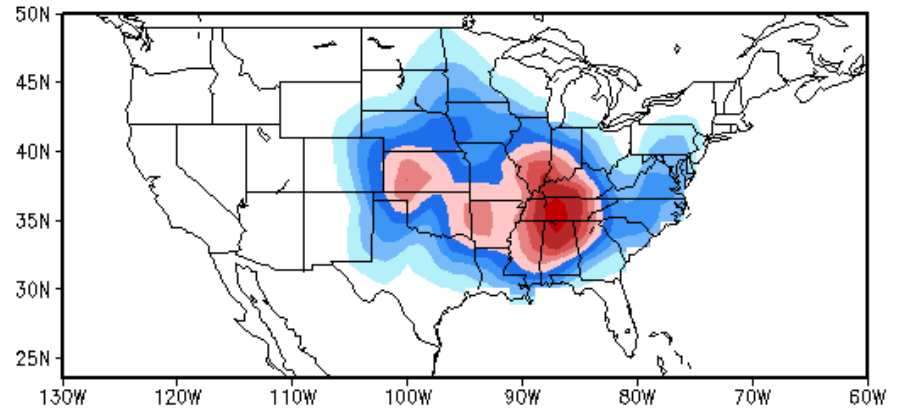


Tornado MAMJ 1955–2014

OBS **One Standard Deviation (SD)**

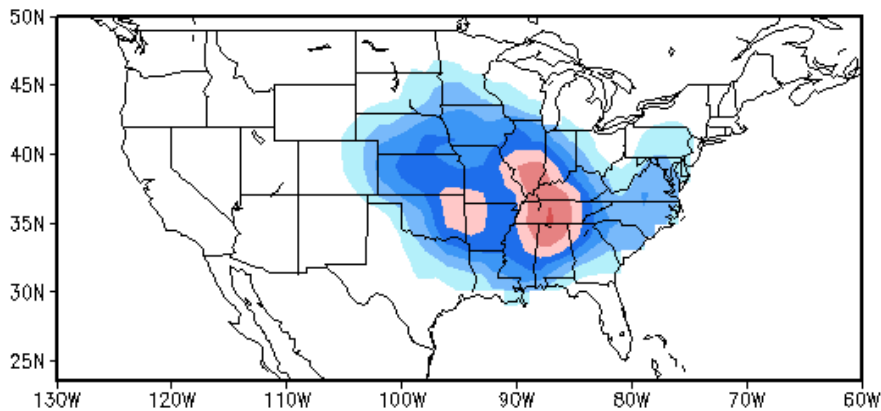


Forecast: SVD1+SVD2 **2 SD**

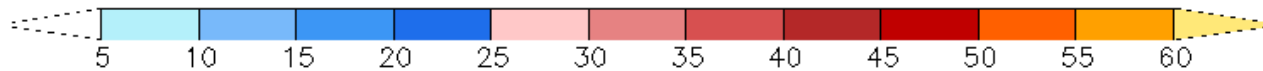
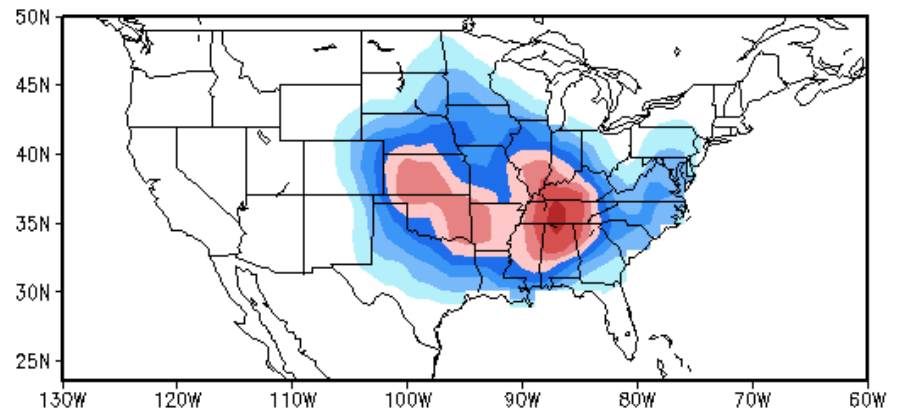


The standard deviation of forecasted tornado activity is about a half of the observed. Therefore, the predicted tornado activity is weaker than the observed.

Forecast: SVD1 **Two Standard Deviation**



Forecast: SVD1+SVD2+SVD3 **2 SD**

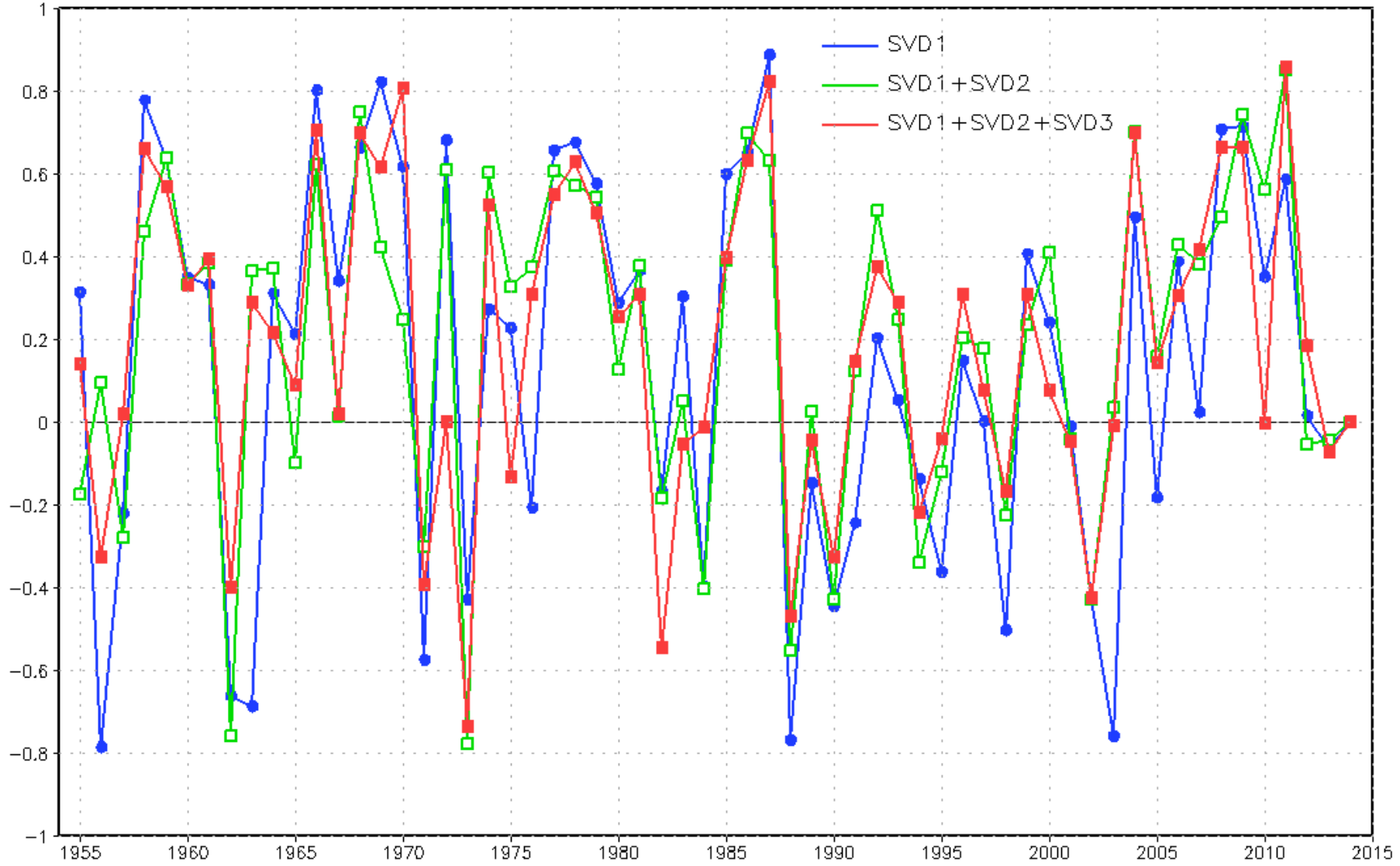


Pattern Correlation

for each year

Tornado MAMJ 1955-2014

Pattern Correlation: Forecast vs. Observation

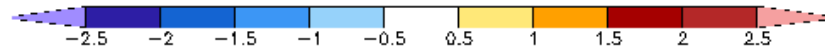
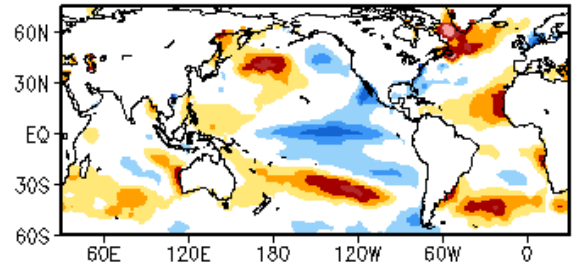
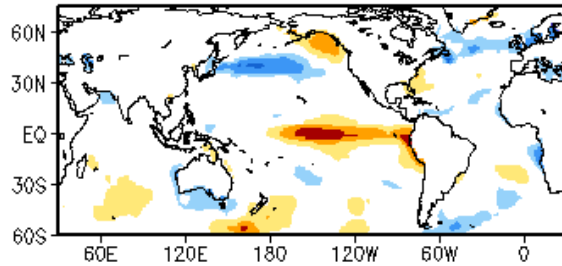
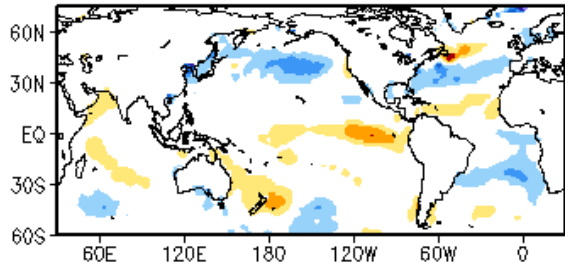


Three Years with High Pattern Correlation

OBS SST Jan 1970

OBS SST Jan 1987

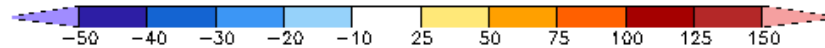
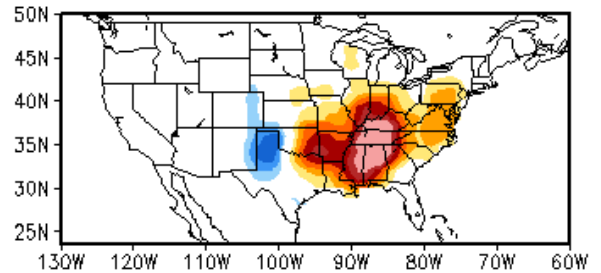
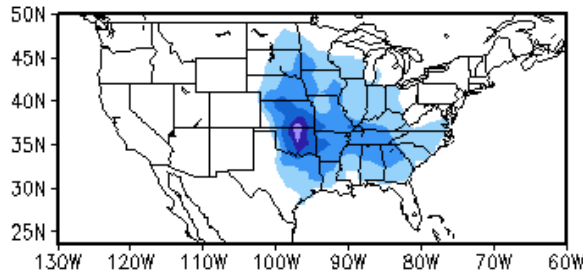
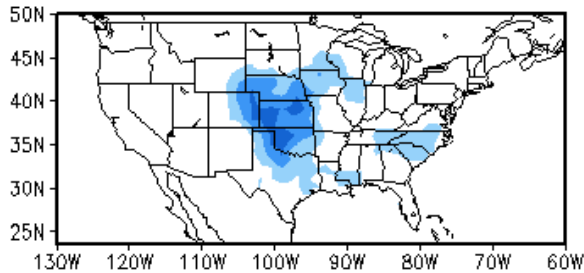
OBS SST Jan 2011



OBS Tornado MAMJ 1970

OBS Tornado MAMJ 1987

OBS Tornado MAMJ 2011

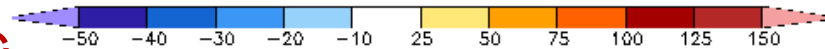
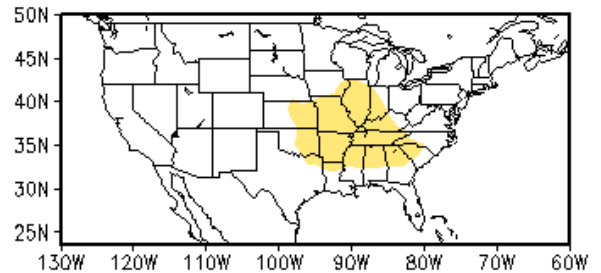
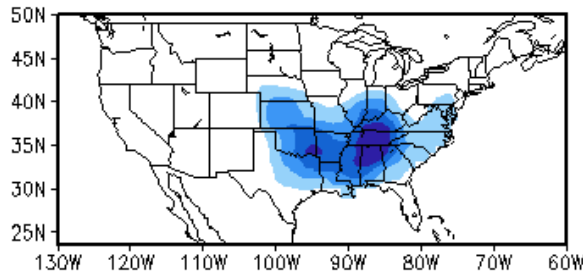
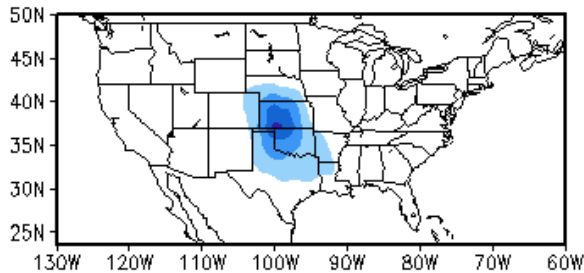


The predicted is much weaker than the observed in 2011.

FCST Tornado MAMJ 1970

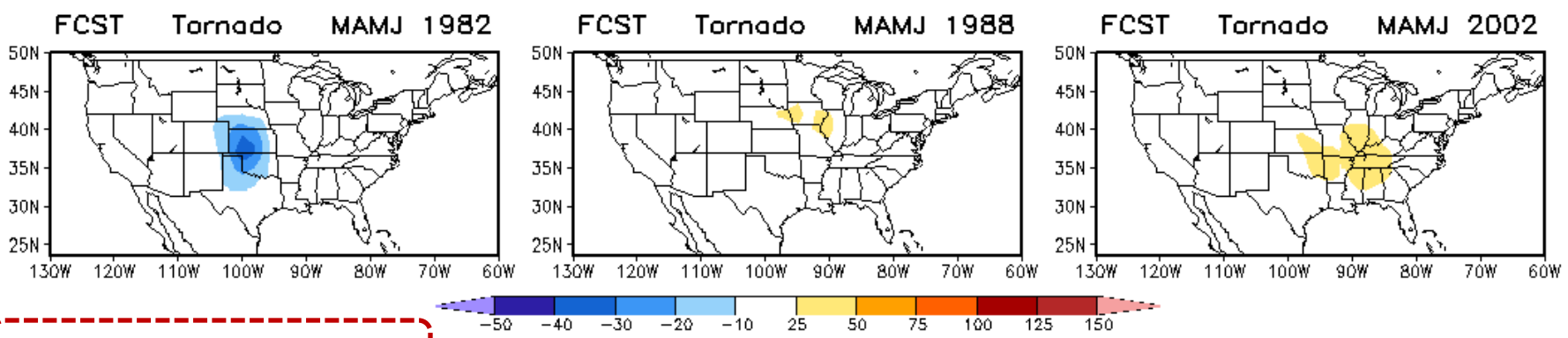
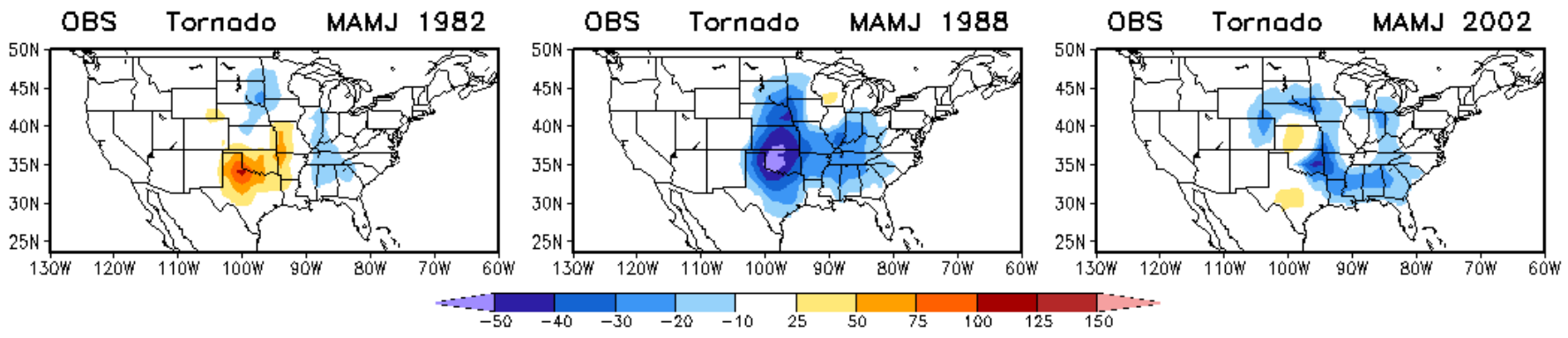
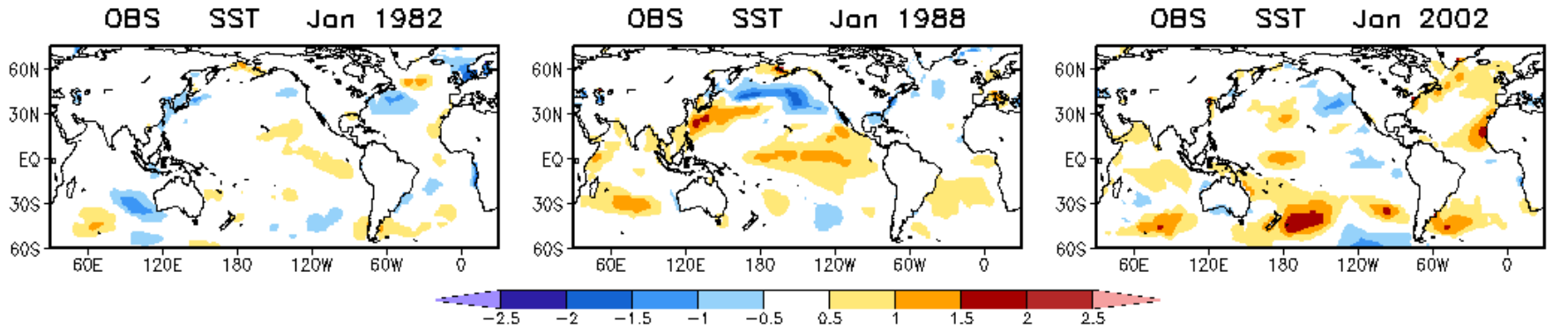
FCST Tornado MAMJ 1987

FCST Tornado MAMJ 2011



Forecast x 2 (3 modes)

Three Years with Low Pattern Correlation



Forecast x 2 (3 modes)

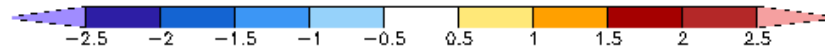
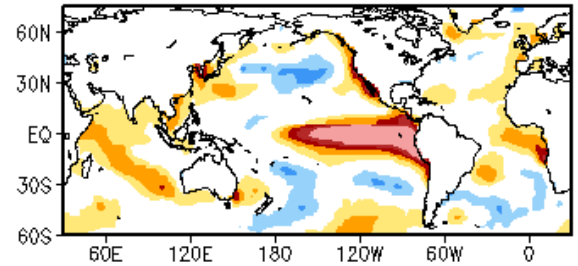
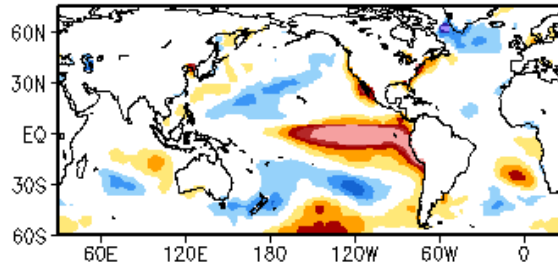
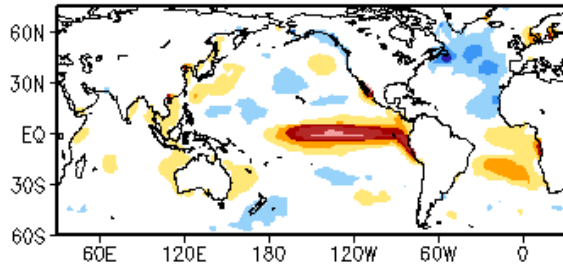
SSTs are weak in 1982 and 2002.

Three El Niño Years

OBS SST Jan 1973

OBS SST Jan 1983

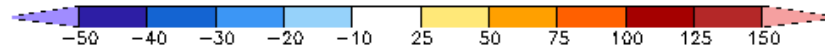
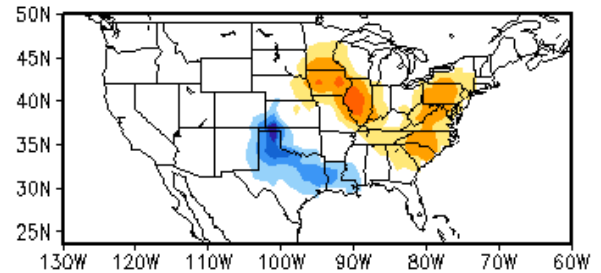
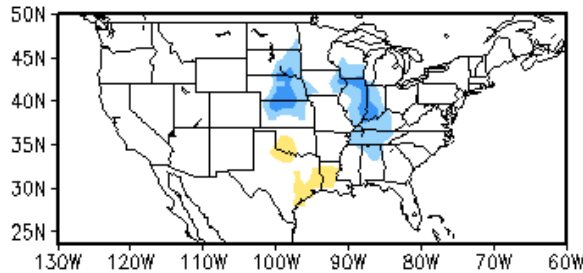
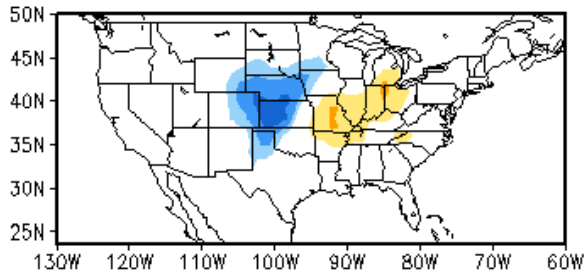
OBS SST Jan 1998



OBS Tornado MAMJ 1973

OBS Tornado MAMJ 1983

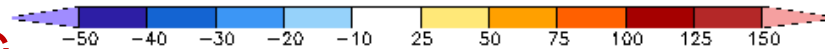
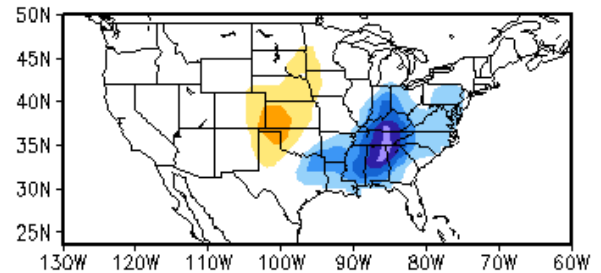
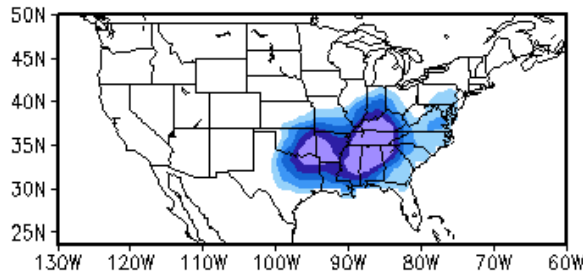
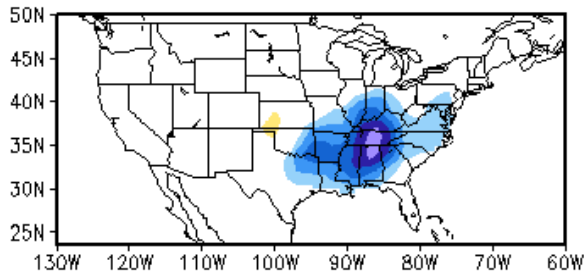
OBS Tornado MAMJ 1998



FCST Tornado MAMJ 1973

FCST Tornado MAMJ 1983

FCST Tornado MAMJ 1998



Forecast x 2 (3 modes)

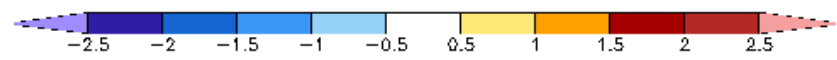
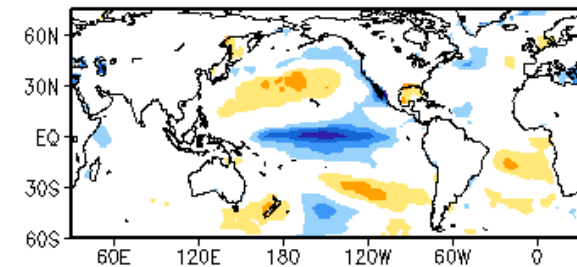
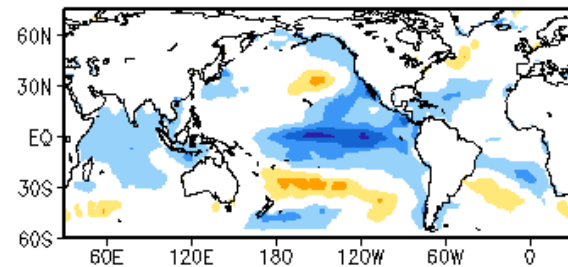
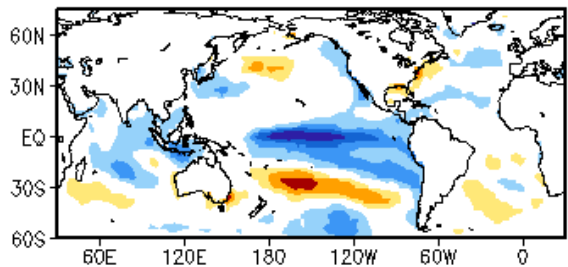
Observations are not coherent among different El Niño years.⁷

Three La Nina Years

OBS SST Jan 1974

OBS SST Jan 1976

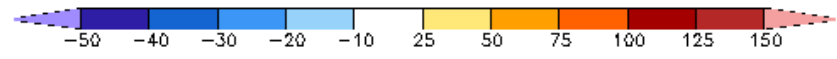
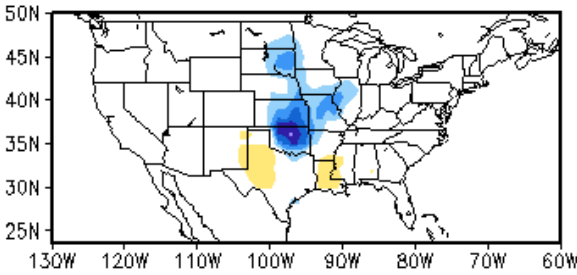
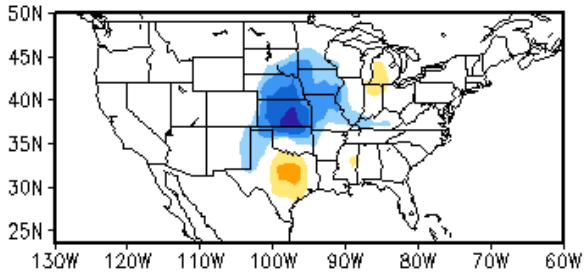
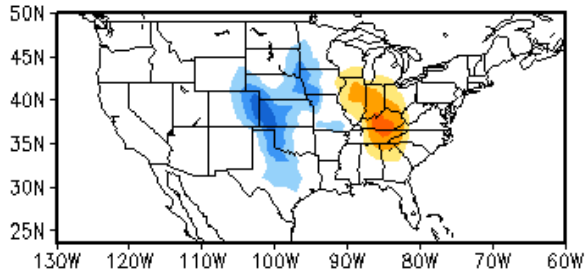
OBS SST Jan 1989



OBS Tornado MAMJ 1974

OBS Tornado MAMJ 1976

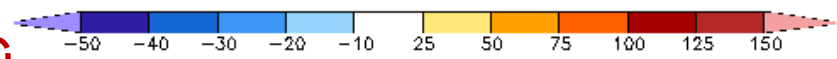
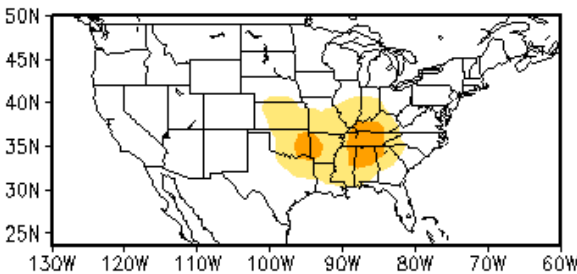
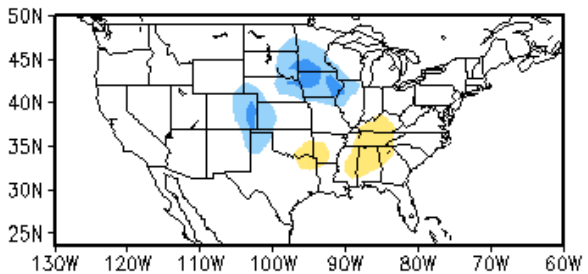
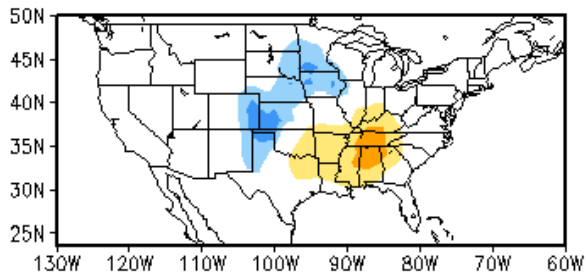
OBS Tornado MAMJ 1989



FCST Tornado MAMJ 1974

FCST Tornado MAMJ 1976

FCST Tornado MAMJ 1989



Forecast x 2 (3 modes)

Skills are better in La Niña years than in El Niño years.

Summary

1. A statistical model was developed for forecasting seasonal tornado activity based on lagged relationships between January SST and MAMJ tornado activity depicted by three SVD modes.
2. The predictors are January SSTs associated with three specific SST patterns, namely, a warming trend, ENSO, and the PDO-like pattern.
3. Cross-validations indicate some skills in the central and eastern U.S.
4. The predicted tornado activity is weaker than observations.
5. The forecast skill seems higher in La Niña years than in El Niño years.

Potential Future Work

- ❑ The model may also be used for seasonal prediction of hails.
- ❑ The method can be used for develop a hybrid dynamical–statistical forecast model, as well as the NMME-based forecasting system, using model predicted SST and atmospheric circulation for the MAMJ season as predictors.
- ❑ Statistical forecasts for sub-seasonal time scales.