

Part I: Impact of ENSO on seasonal climate  
predictability and prediction

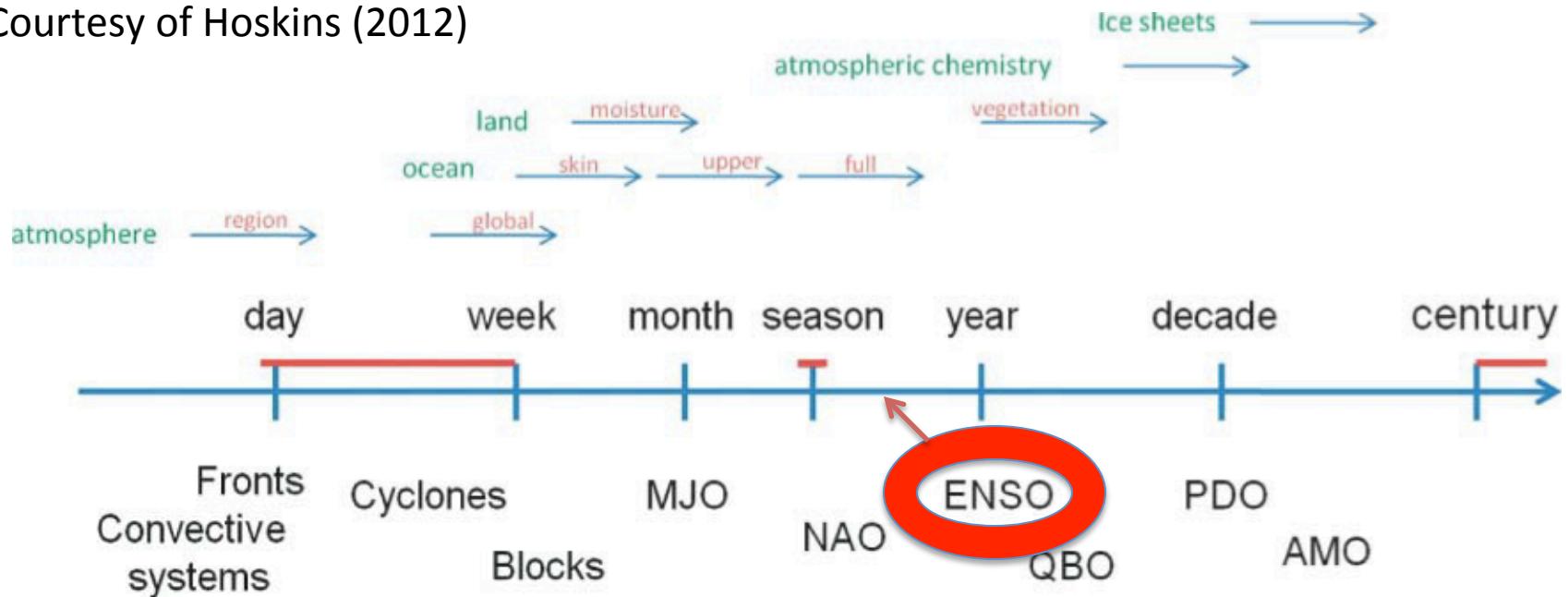
Part II: Attribution study of extreme North  
America winter storm season of 2013/14

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NOAA/GFDL, Princeton, NJ, USA  
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Tucson, AZ

Acknowledgements: G. Vecchi, L. Jia,, T. Delworth, A. Rosati, R. Gudgel, A. Wittenberg, S. Zhang and W. Zhang

# The seamless weather-climate prediction problem

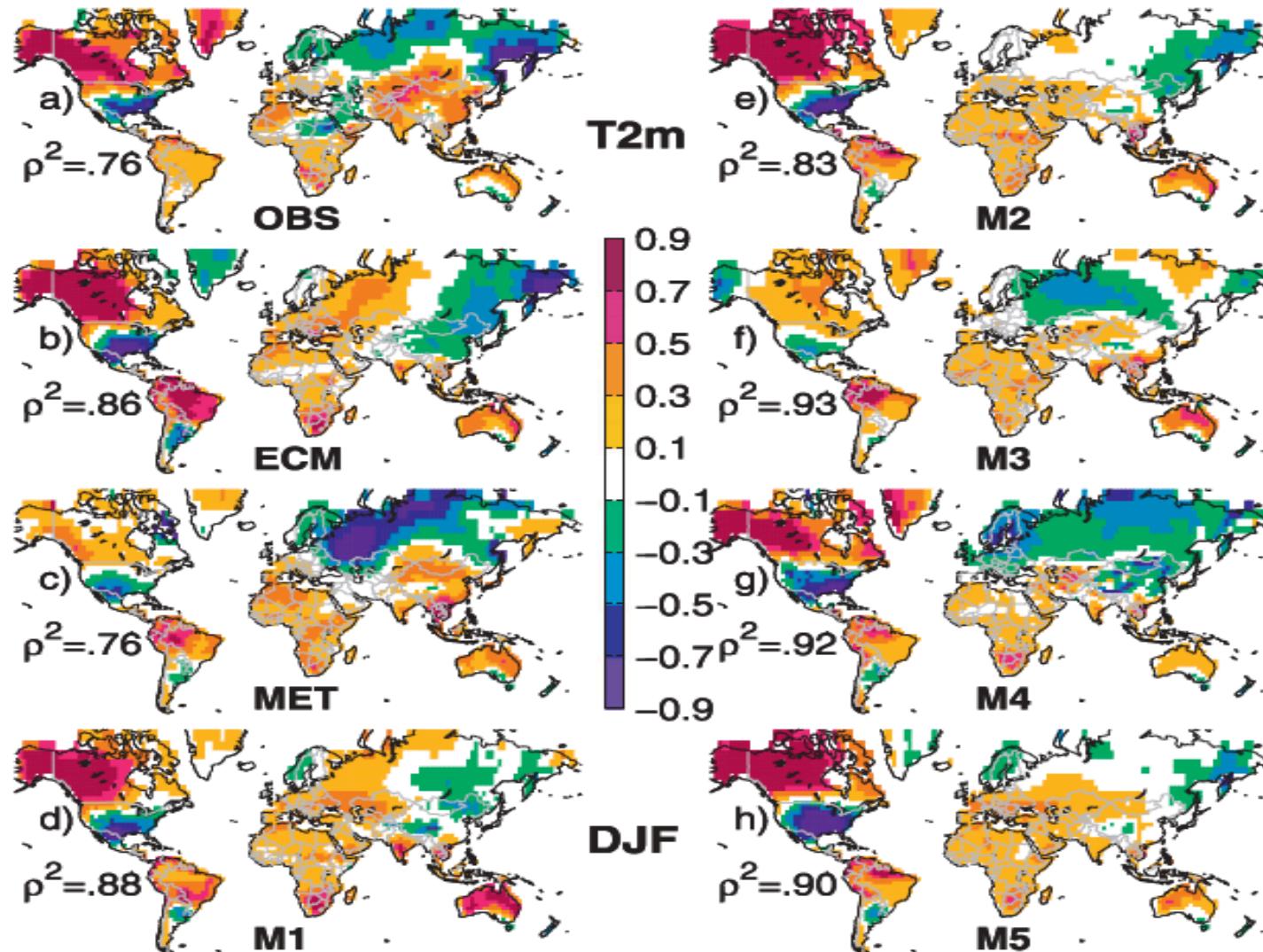
Courtesy of Hoskins (2012)



A seamless weather-climate seasonal prediction system:

- ENSO provides dominant source for **skillful** seasonal climate prediction over global land (Jia et al., J. Clim., 2015)
- Need a model representing ENSO and ENSO-induced variability to predict ENSO itself and its global impacts (regional, extremes)

# Agreement between observed and modeled ENSO-teleconnection patterns differs among different models and regions



# Model development for seasonal climate prediction (GFDL)

- Built on GFDL-CM2.1 (~200x250km atmosphere/land, 1° ocean/sea ice, LM2 land model)
- Initialized using GFDL's ensemble coupled data assimilation
- Contributed to North American Multi-Model Ensemble (NMME)

However:

- Relatively low resolution atmosphere: can't directly get to extremes/ regional
- Large biases (processes poorly represented )
- **ENSO and ENSO-teleconnection** need improvement



# GFDL FLOR (Forecast-oriented low ocean resolution):

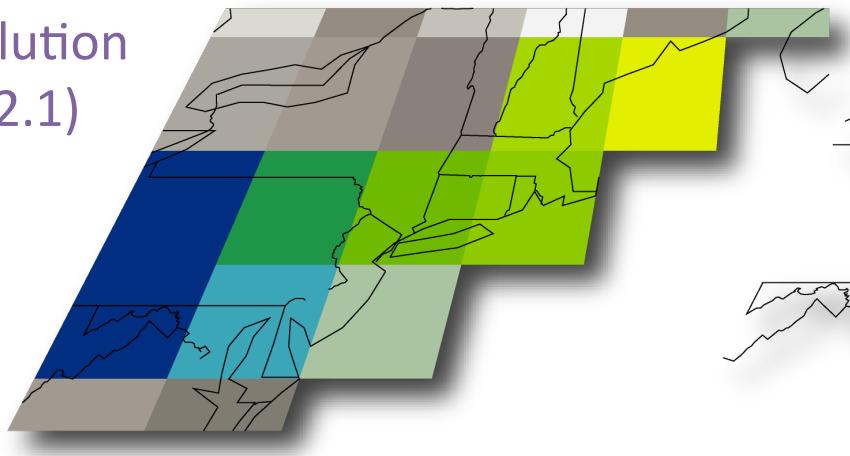
Experimental high-resolution coupled prediction system

**Goal:** Build a seasonal to decadal forecasting system to:

Yield improved forecasts of large-scale climate

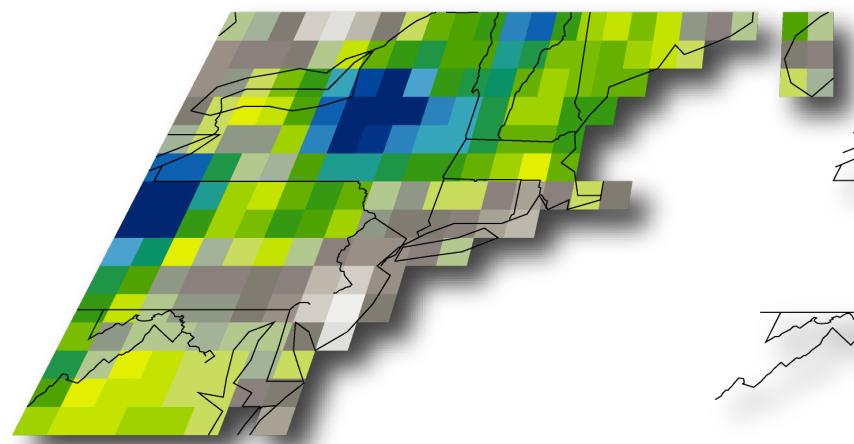
Enable forecasts of regional climate and extremes

Medium  
resolution  
(CM2.1)



Precipitation in Northeast USA

High resolution  
(GFDL-FLOR)



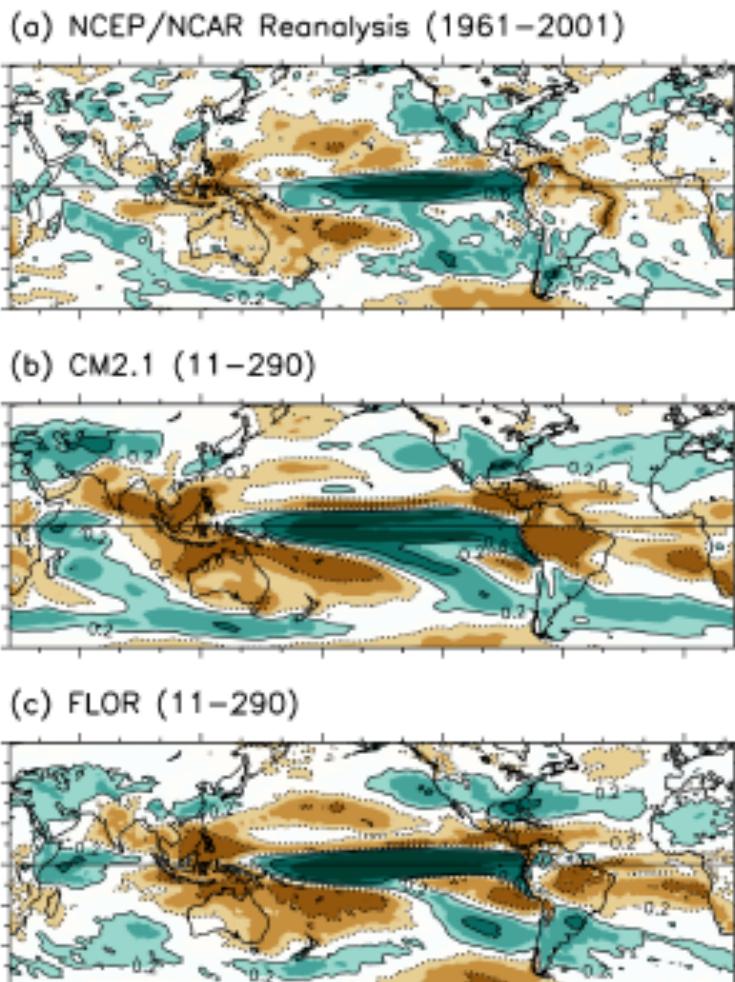
*Delworth et al. (2012), Vecchi et al. (2014)*

Modified version of CM2.5 (Delworth et al. 2012):

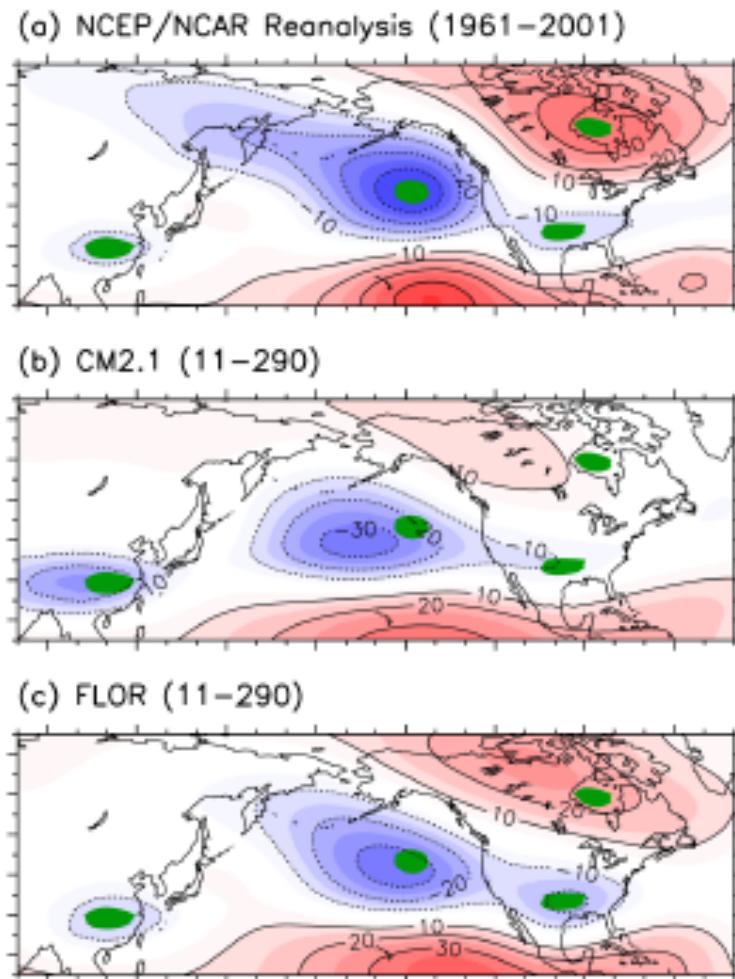
- 50km cubed-sphere atmosphere
- 1° ocean/sea ice (low res enables prediction work)

# Increased atmospheric model resolution improves ENSO-teleconnection pattern

CORR(Precip, NINO3 SSTA)

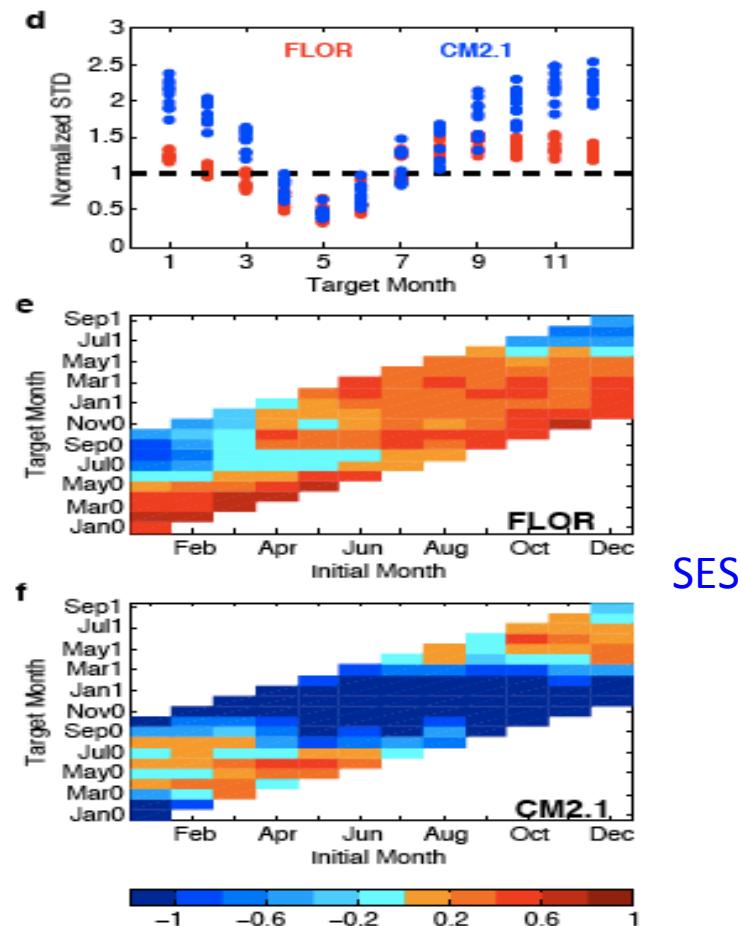
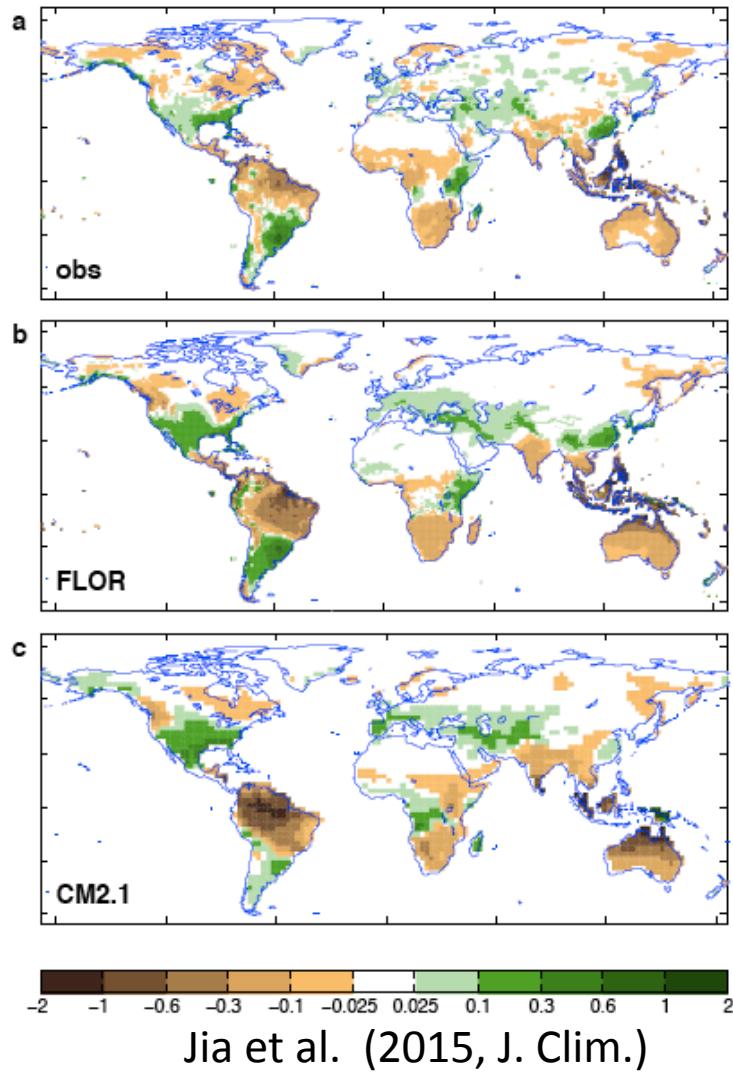


Z200 regressed on NINO3 SSTA



Courtesy of A. Wittenberg

# GFDL's Seasonal prediction: ENSO-related predictable patterns of global land precipitation for FLOR and CM2.1



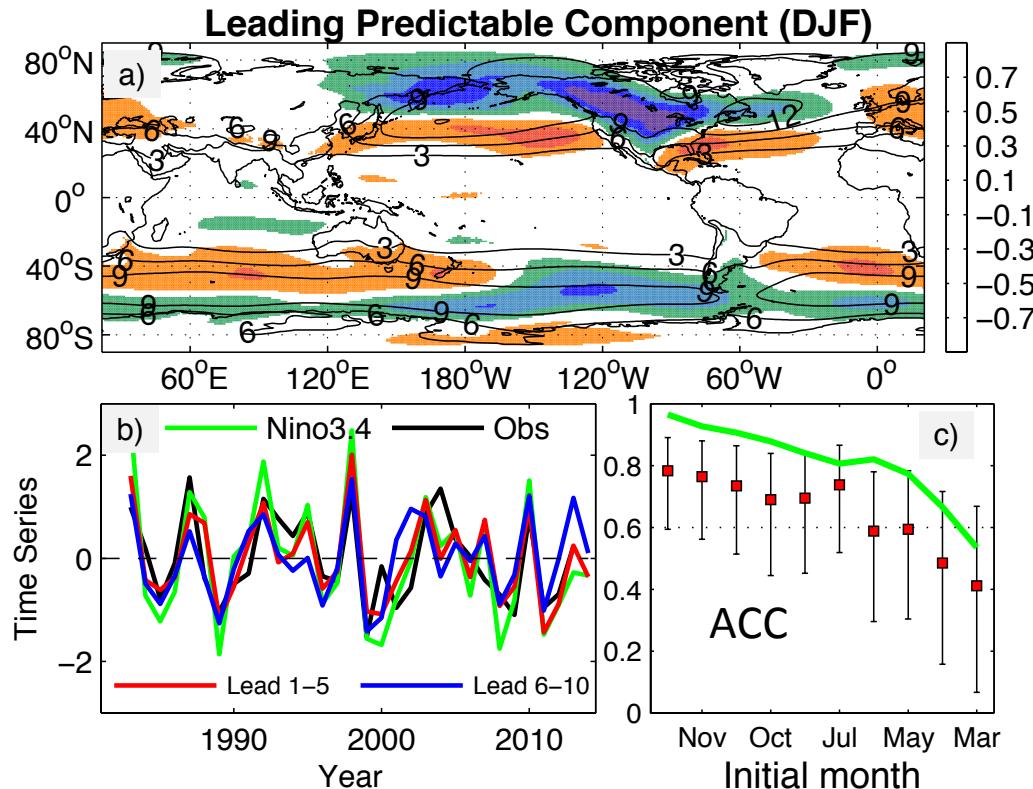
Regional patterns and predictive skill  
(FLOR > CM2.1)

# Seasonal prediction of higher order statistical information

- **Traditional seasonal prediction products**
  - Seasonal mean precipitation, surface temperature (first moment)
  - Predictability analysis of land temperature and precipitation (Jia et al. 2015)
- **Higher order products (second moment)**
  - Extratropical storms (ETS) (Variance statistics)
  - Cause extreme weather and climate events
  - Useful information for the seasonal prediction
  - Are they predictable?

ETS predictability: Leading Predictable pattern of storm tracks is ENSO-related, and is predictable up to 9 month lead time.

Storm track:  $\text{std}(\text{24-hour difference filtered SLP})$

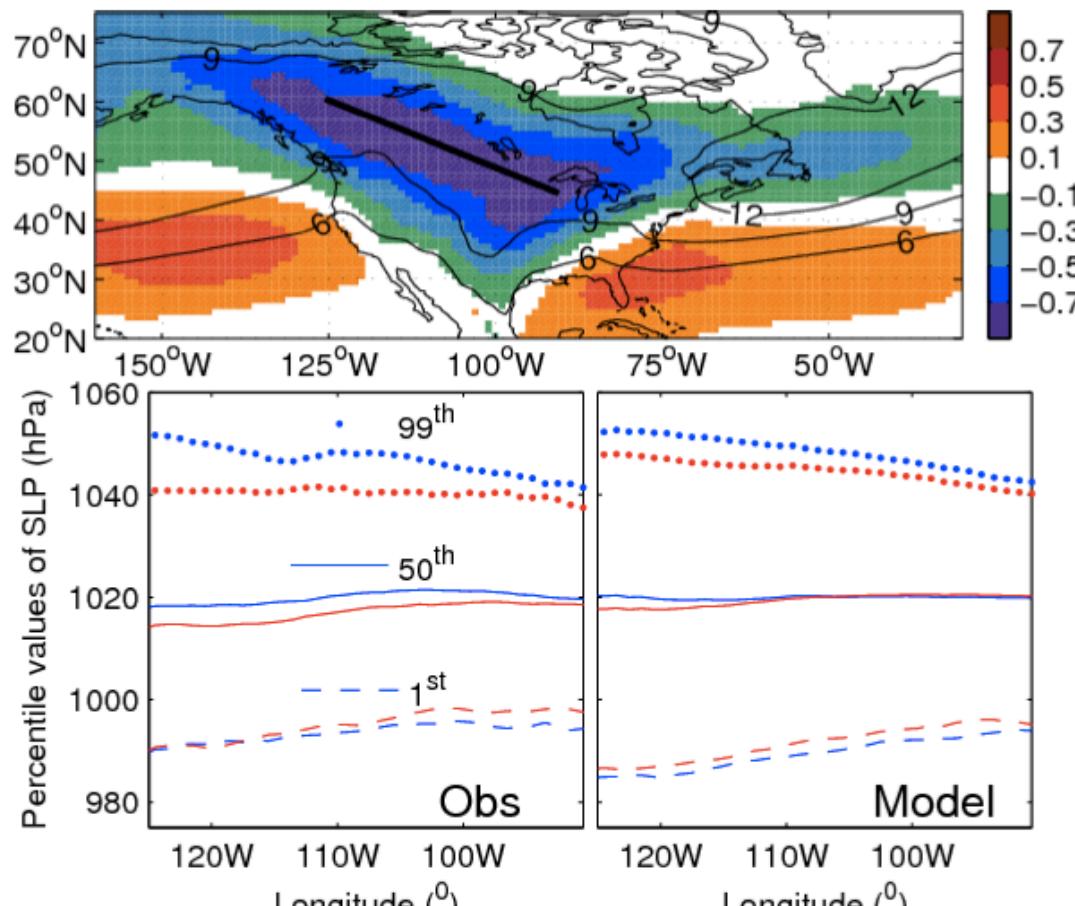


- Storm reduction over most North America
- Time series highly correlated with NINO3.4
- Skill is comparable with predicting ENSO

FLOR

Yang et al. (2015, J. Clim.)

# ETS predictability: The model could predict the storm extreme changes associated with ENSO



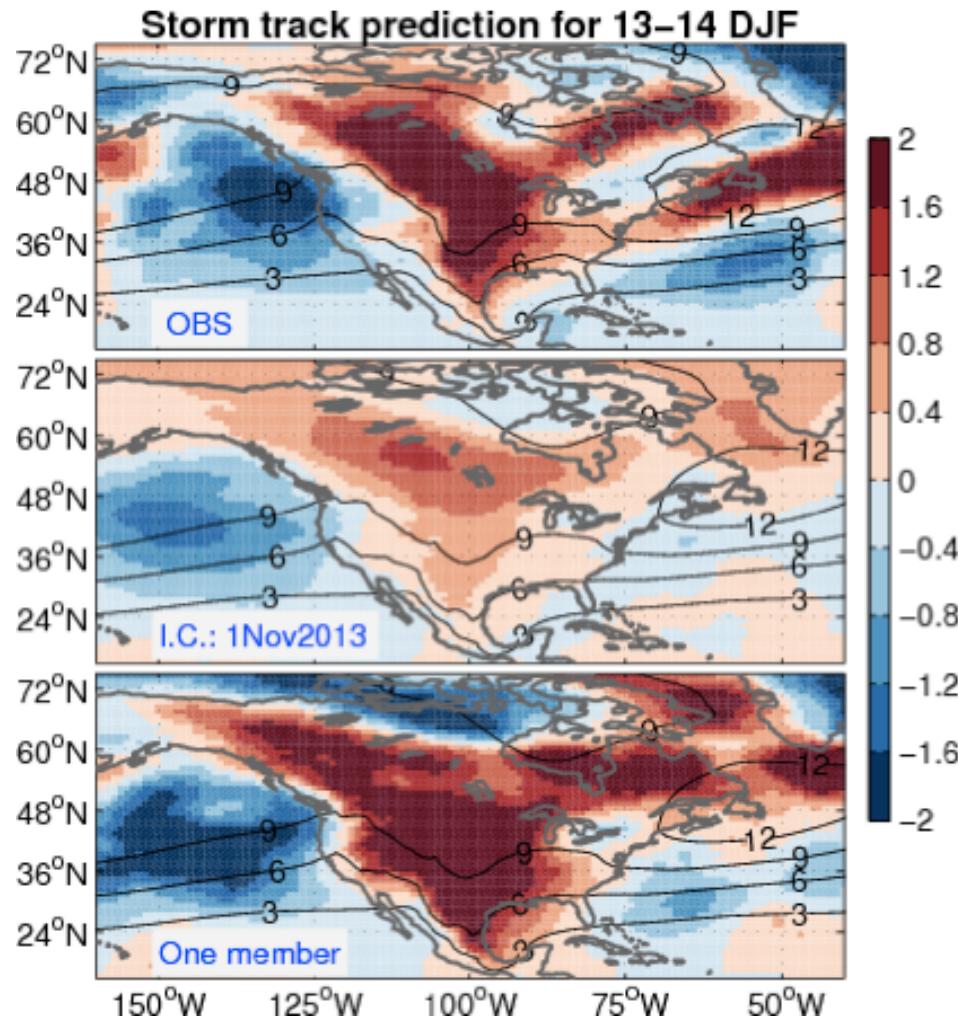
During El Niño years:

Reduced storm tracks →  
Reduced both anticyclones and cyclones → Smaller 99<sup>th</sup> percentile value and larger 1<sup>st</sup> percentile value (Narrower distribution width)

Vice versa for La Niña years

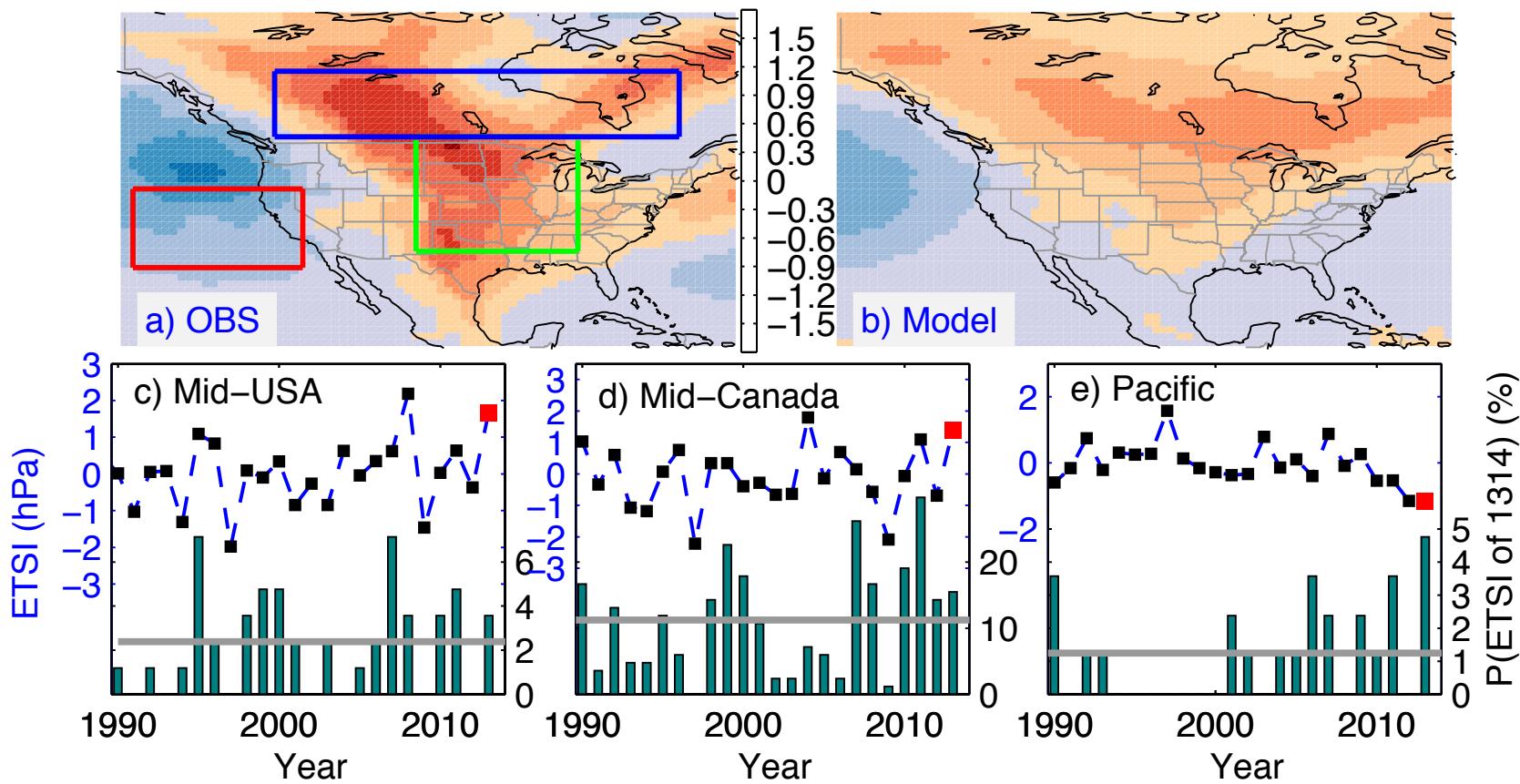
Model agrees well with Obs

# ETS predictability: Storm track prediction for 2013-14 winter (non-ENSO year, an extreme year)



- Skill is limited to 1-2 months lead time
- Amplitudes are much weaker in prediction than in observation

# Attribution study for 2013/14 winter ETS extreme event over North America: Probabilistic approach

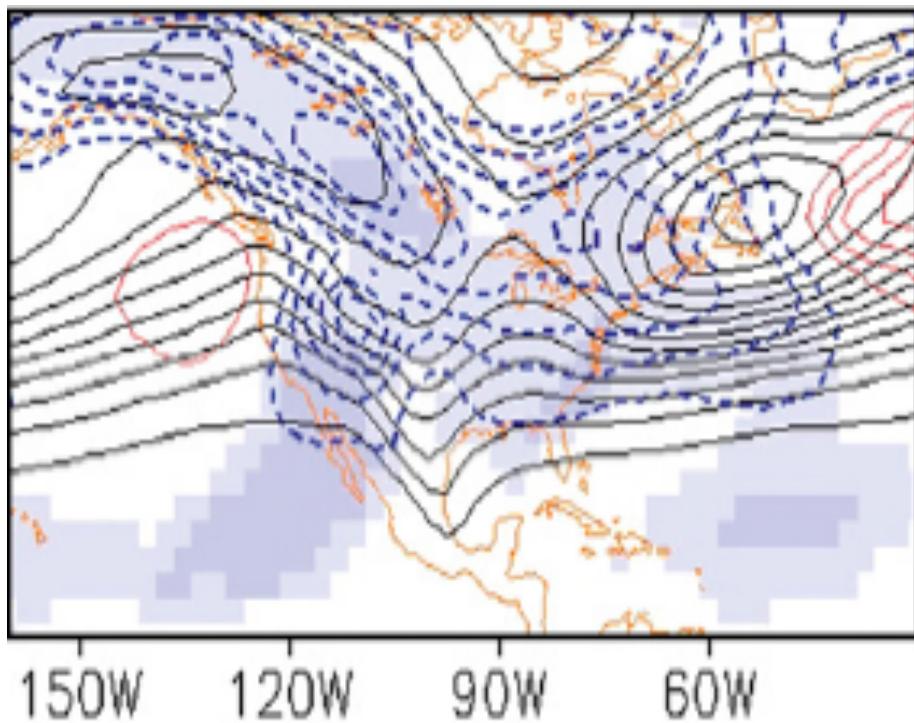


Extreme probability:  $P = (\text{number of members} > 2013\text{-}14 \text{ value}) / \text{total sample size}$

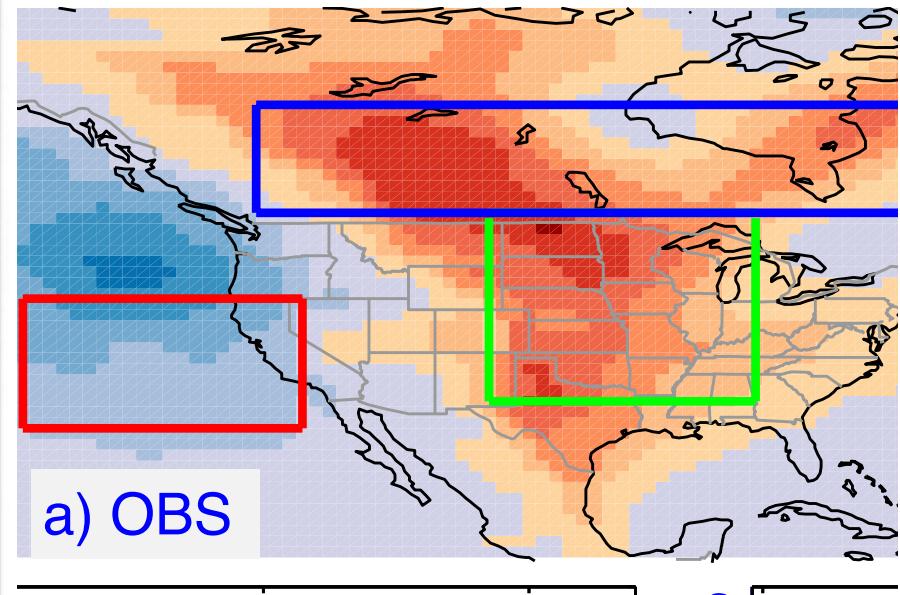
Climate drivers for this ETS extreme event : Global warming vs Global warming hiatus

# Global warming: reduction of surface ETS over North America

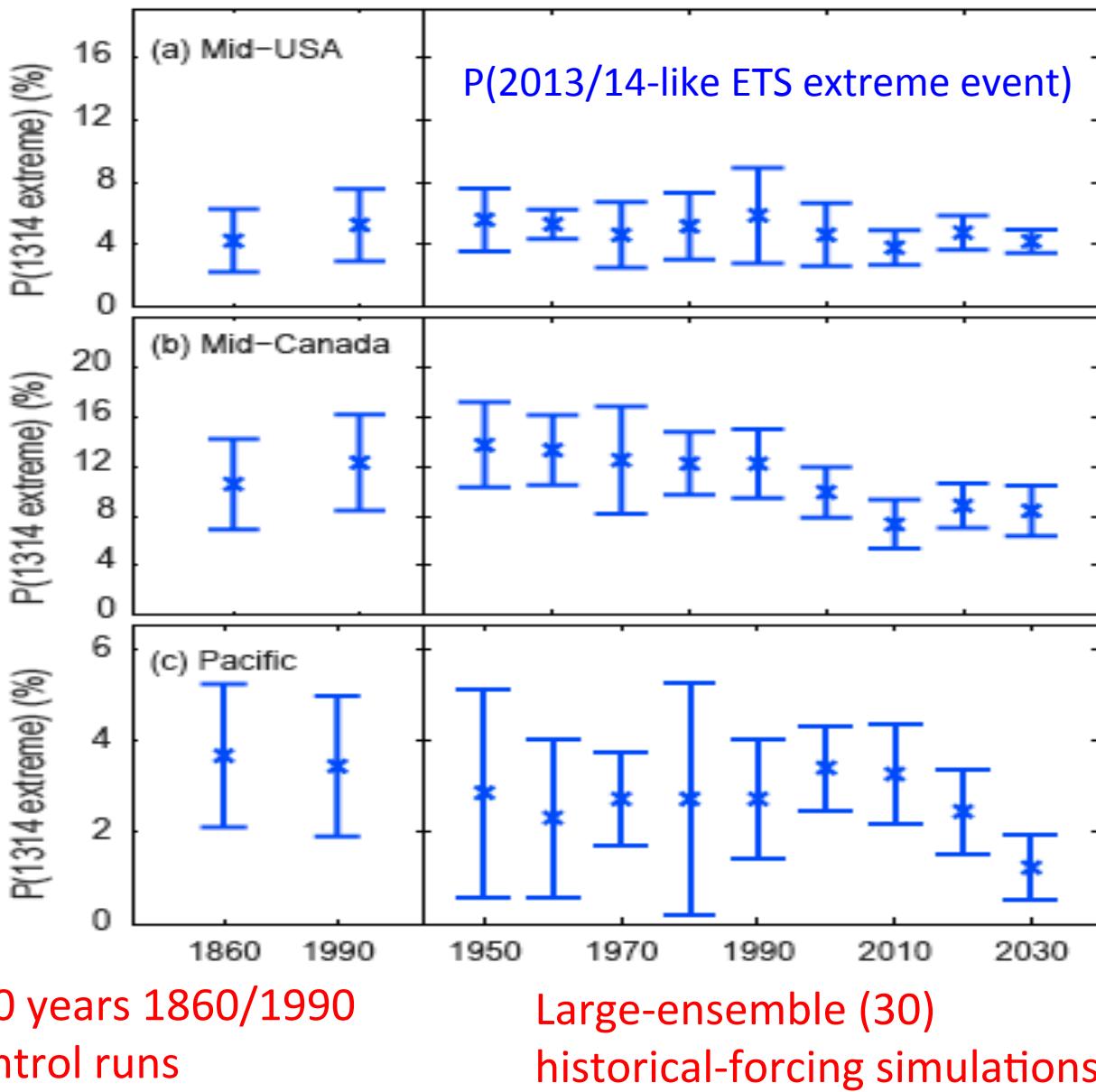
CMIP5 multi-model projection  
(2081-2100 – 1980-99)



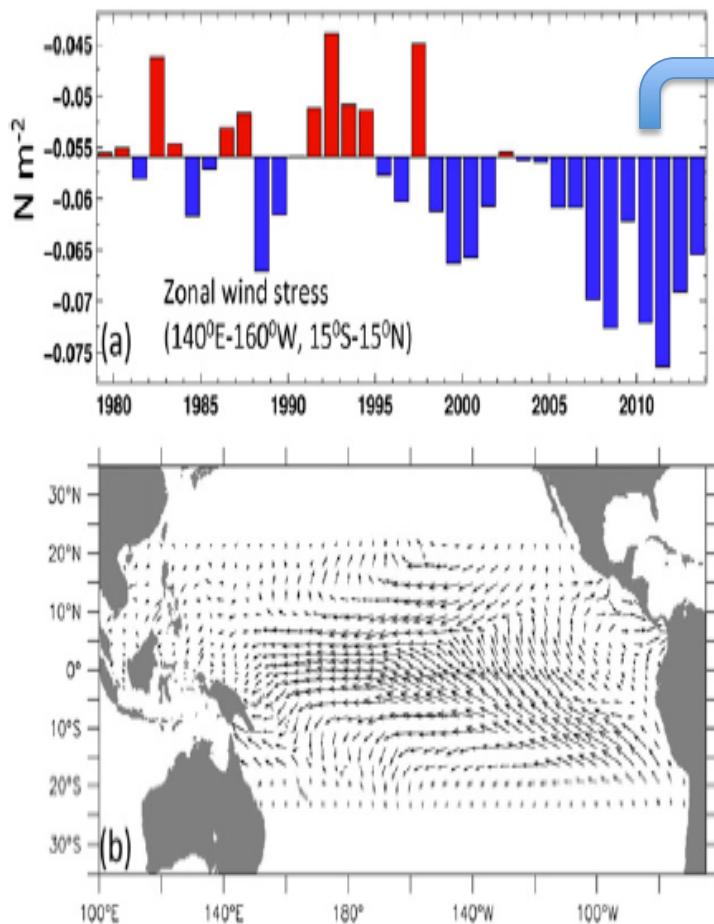
Chang (2013, J. Clim.)



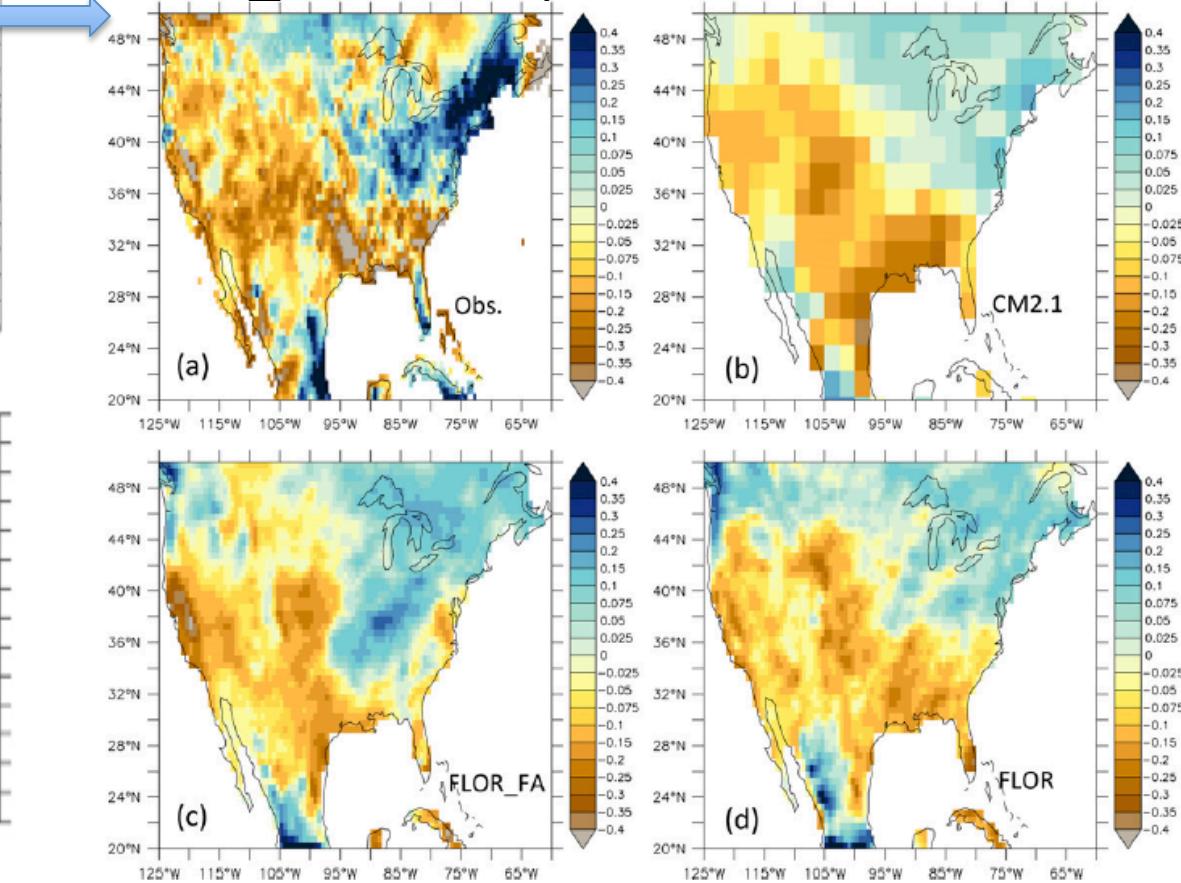
# No evidence: global warming contributed to the 2013/14 extreme ETS event



# A link between the hiatus in global warming and North America drought



ALLFORC\_STRESS Exp.



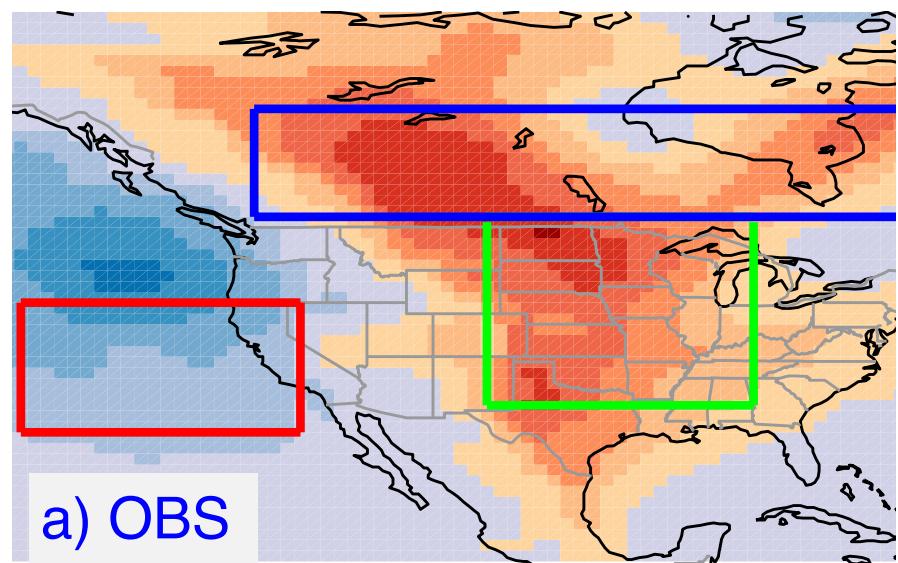
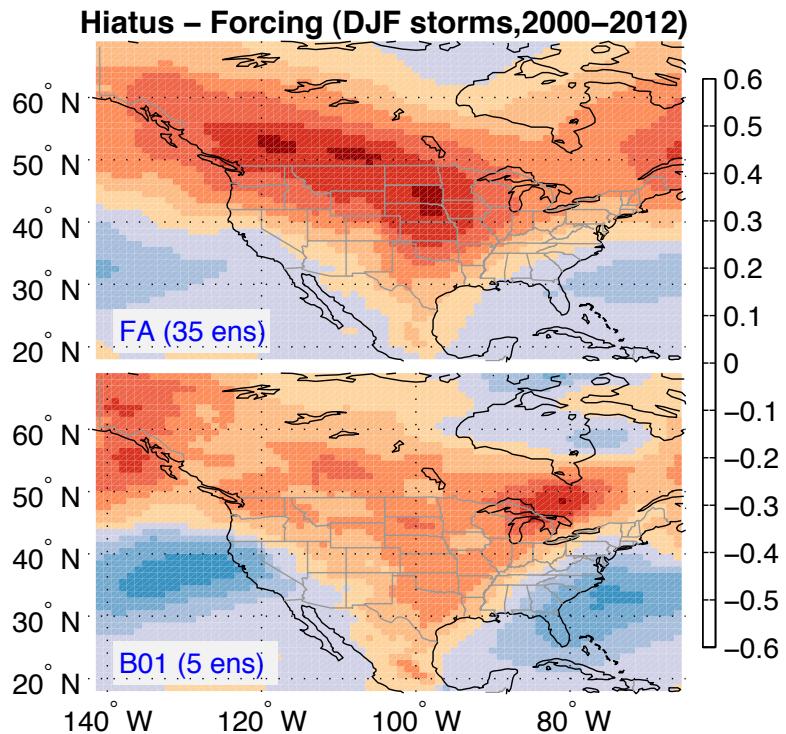
Connection between tropical Pacific SSTA and wind stress anomalies (Kosaka and Xie, 2013; England et al., 2014)

500 years 1860/1990 control runs

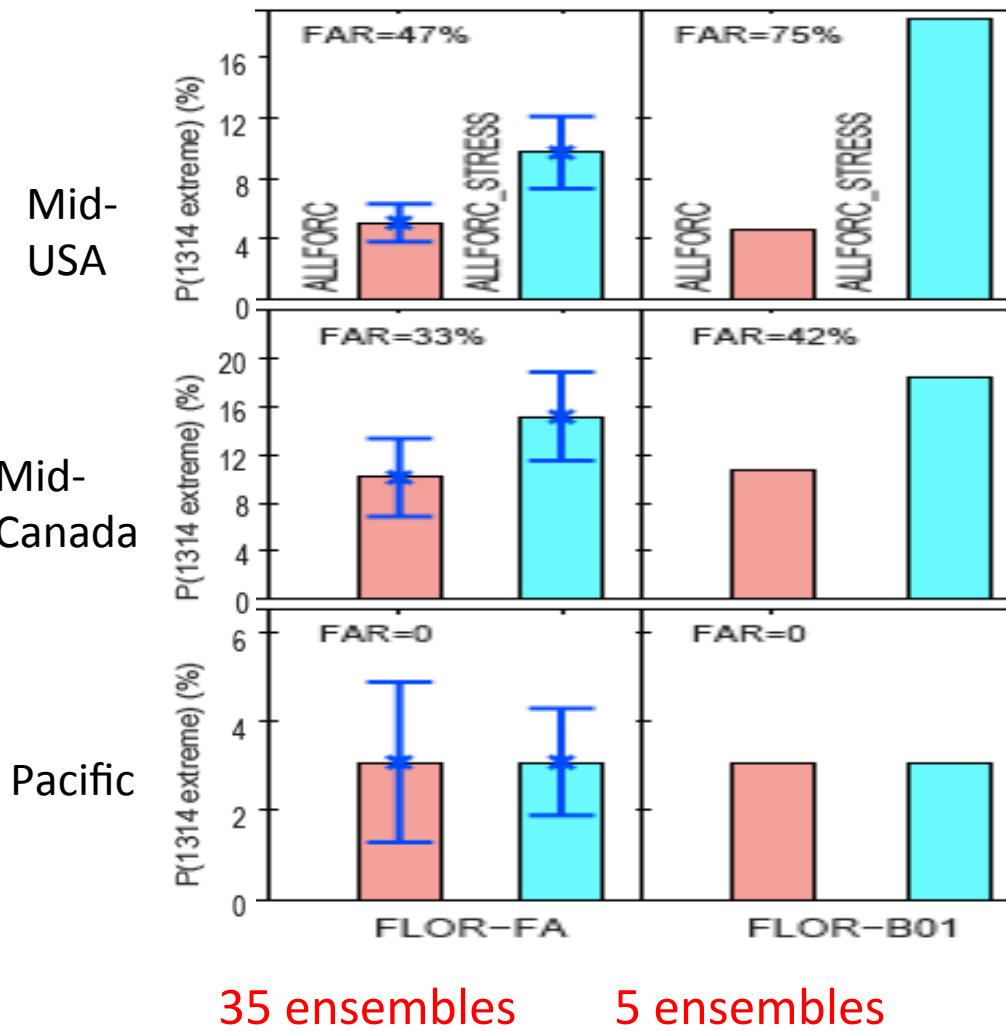
Delworth et al. (2015, J. Clim.)

# Global warming hiatus: increase of surface ETS over North America

Hiatus - Forcing (2000-2012)



# Connection between global warming hiatus and the 2013/14 extreme ETS event over North America

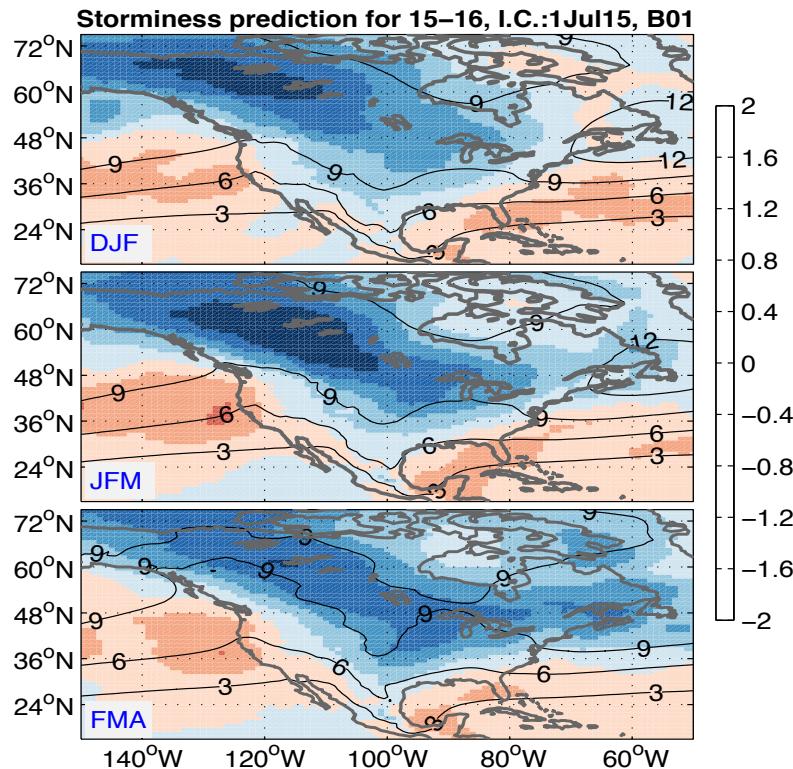


Pink shading: ALLFORC (global warming)  
Cyan shading: ALLFORC\_STRESS (hiatus)

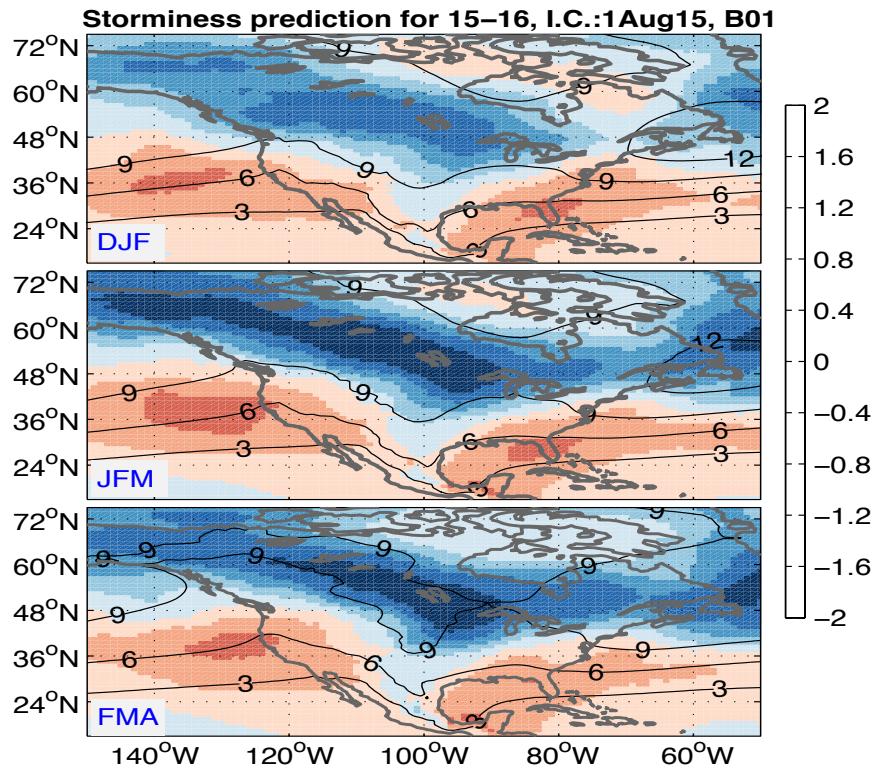
The recent multiyear increase in the strength of trade winds in the tropical Pacific Ocean that has been linked to global warming hiatus(Kosaka and Xie, 2013; England et al., 2014; Delworth et al., 2015) substantially increased the probability of the 2013/14 positive extreme ETS winter over much of North America.

# Experimental prediction of 2015-16 winter ETS over North America using GFDL-FLOR

**Forecast: 1Jul2015**



**Forecast: 1Aug2015**



Reduced storms: Mid-USA, Northeast of USA and Canada

Increased storms: Southeast, Southwest of USA

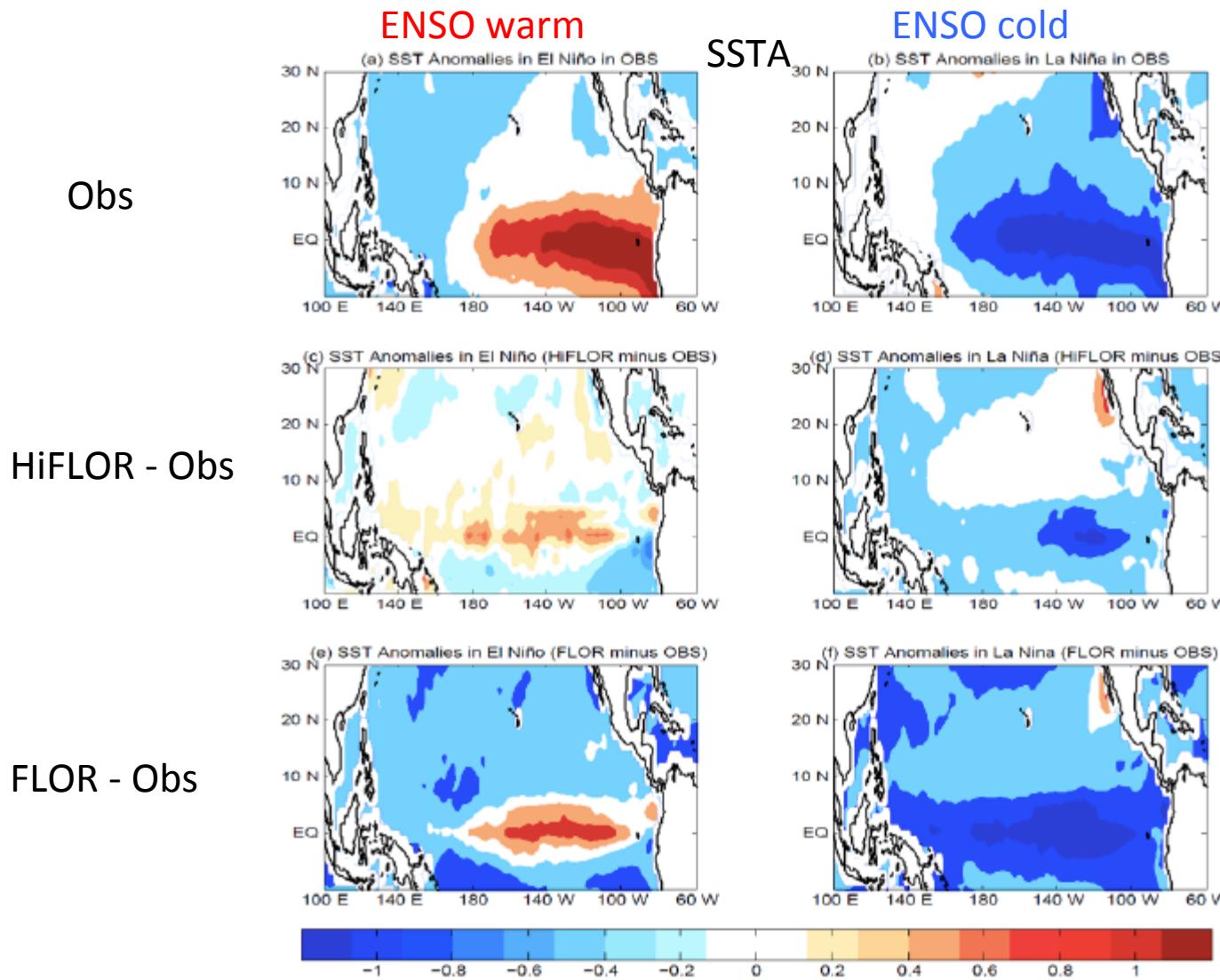
High-resolution coupled models provide opportunity for improvement of ENSO-related regional climate variation and its predictive skill

- Increased atmosphere resolution substantially enhance seasonal predictive skill of ENSO-related precipitation anomalies
- ENSO-related extratropical storm pattern is predictable up to 9 month lead.
- The FLOR model could reproduce the observed extratropical storm extreme changes associated with ENSO

Attribution study of 2013/14 winter extratropical storm extreme event:

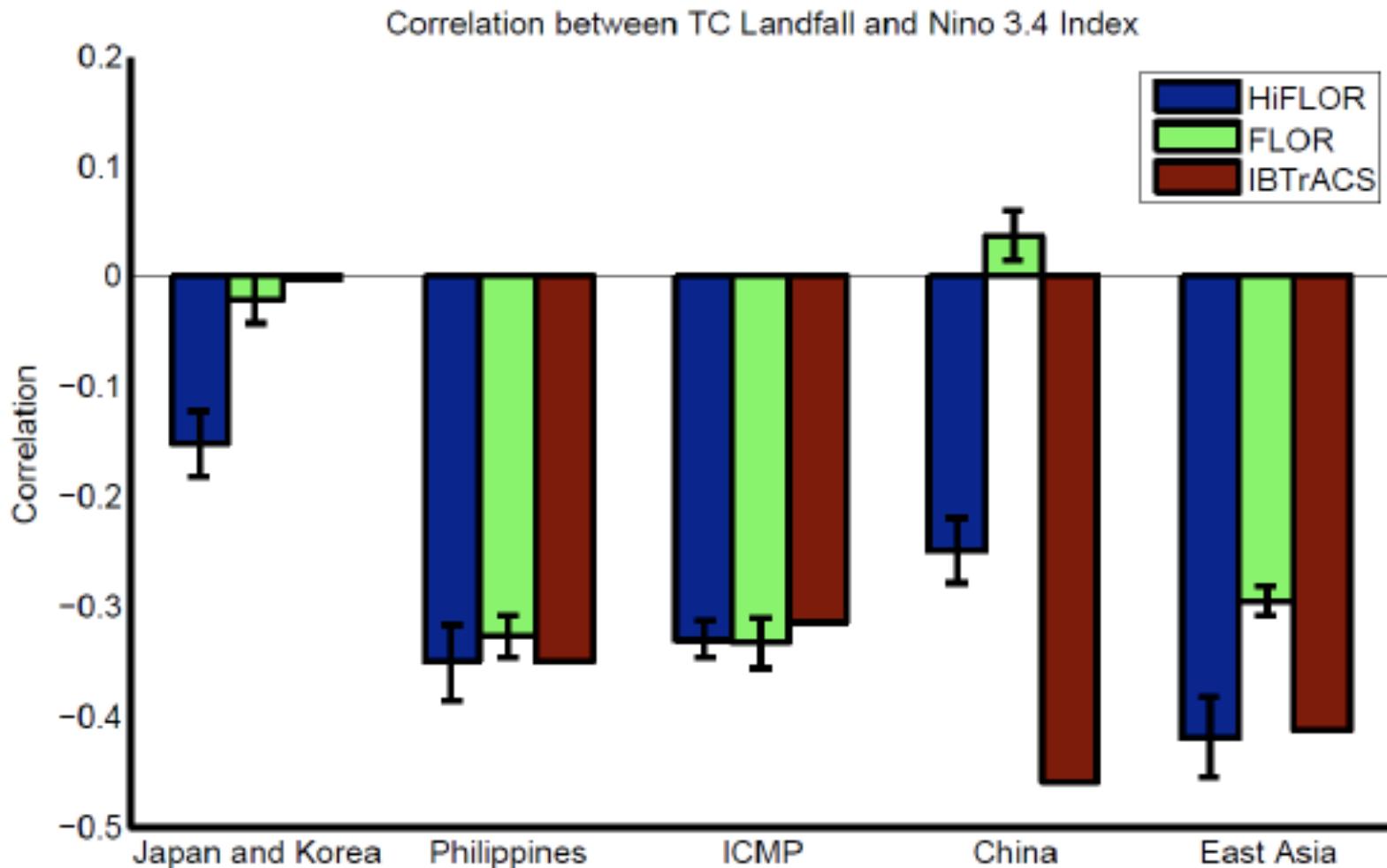
- Global warming does not contribute to the occurrence of 2013/14-like extreme event over North America
- The recent multiyear easterly wind anomalies in the tropical Pacific Ocean (linked to global warming hiatus) significantly increase the occurrence of 2013/14-like extreme ETS event over North America

# HiFLOR(25km): Further improves ENSO variability



Murakami et al. (2015, J. Clim., in press; W. Zhang et al. (2015, J. Clim., submitted)

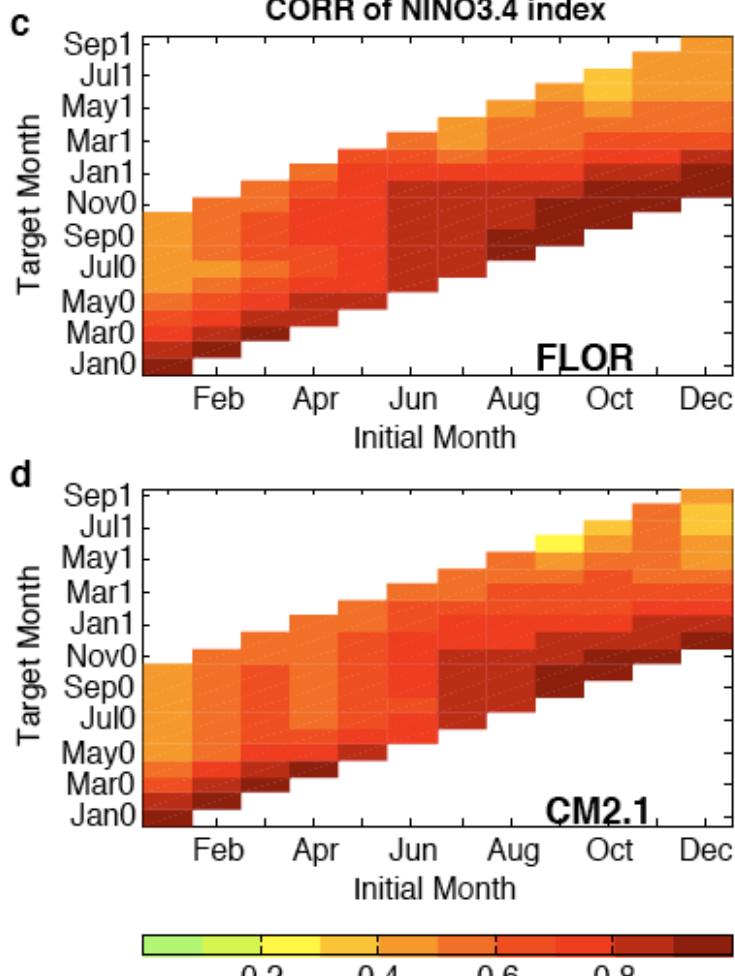
# HiFLOR(25km): Improves relationship between ENSO and regional TC landfall in the Western North Pacific



# Seasonal predictability and predictions using GFDL-FLOR

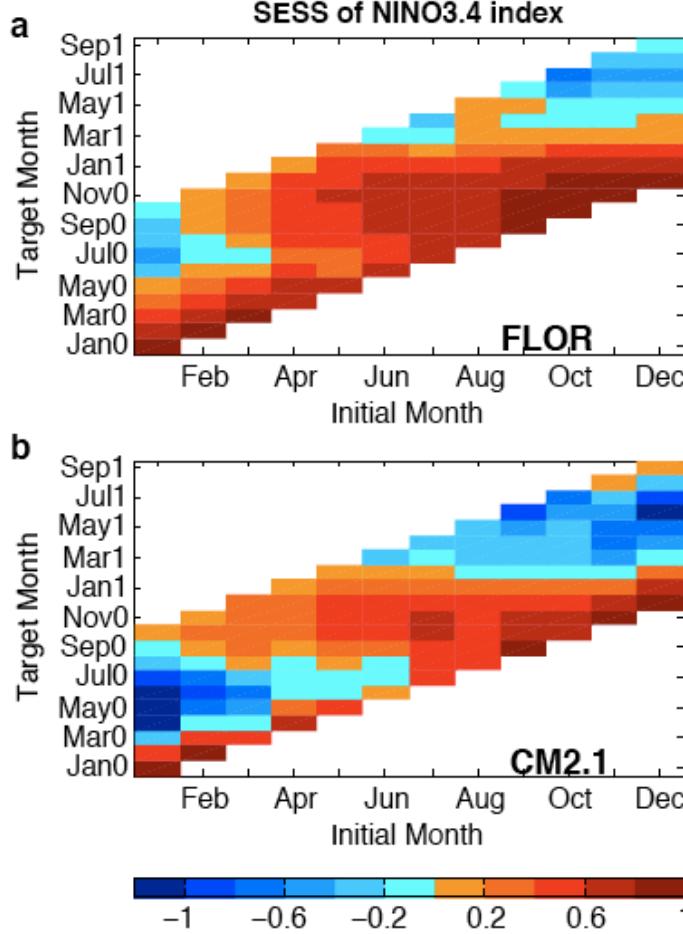
- Seasonal predictability and predictions of extratropical storm tracks (Yang et al., 2015)
- Seasonal predictability and predictions of land temperature and precipitation (Jia et al., 2015).
- Seasonal predictions of Arctic sea ice extent ( Msadek et al., 2014)
- Seasonal Forecasting of Regional Tropical Cyclone Activity (Vecchi et al., 2014)
- The Role of Sea Surface Temperature, Atmospheric and Land Initial Conditions in US Heat Waves (Jia et al., 2015)

# GFDL's Seasonal prediction: Predictive Skill of ENSO (Nino3.4 SST)



$$\text{SESS} = 1 - \frac{\sum_i (f_i - o_i)^2}{\sum_i (o_i)^2}$$

**Squared Error Skill Score**



Jia et al. (2015, J. Clim.)