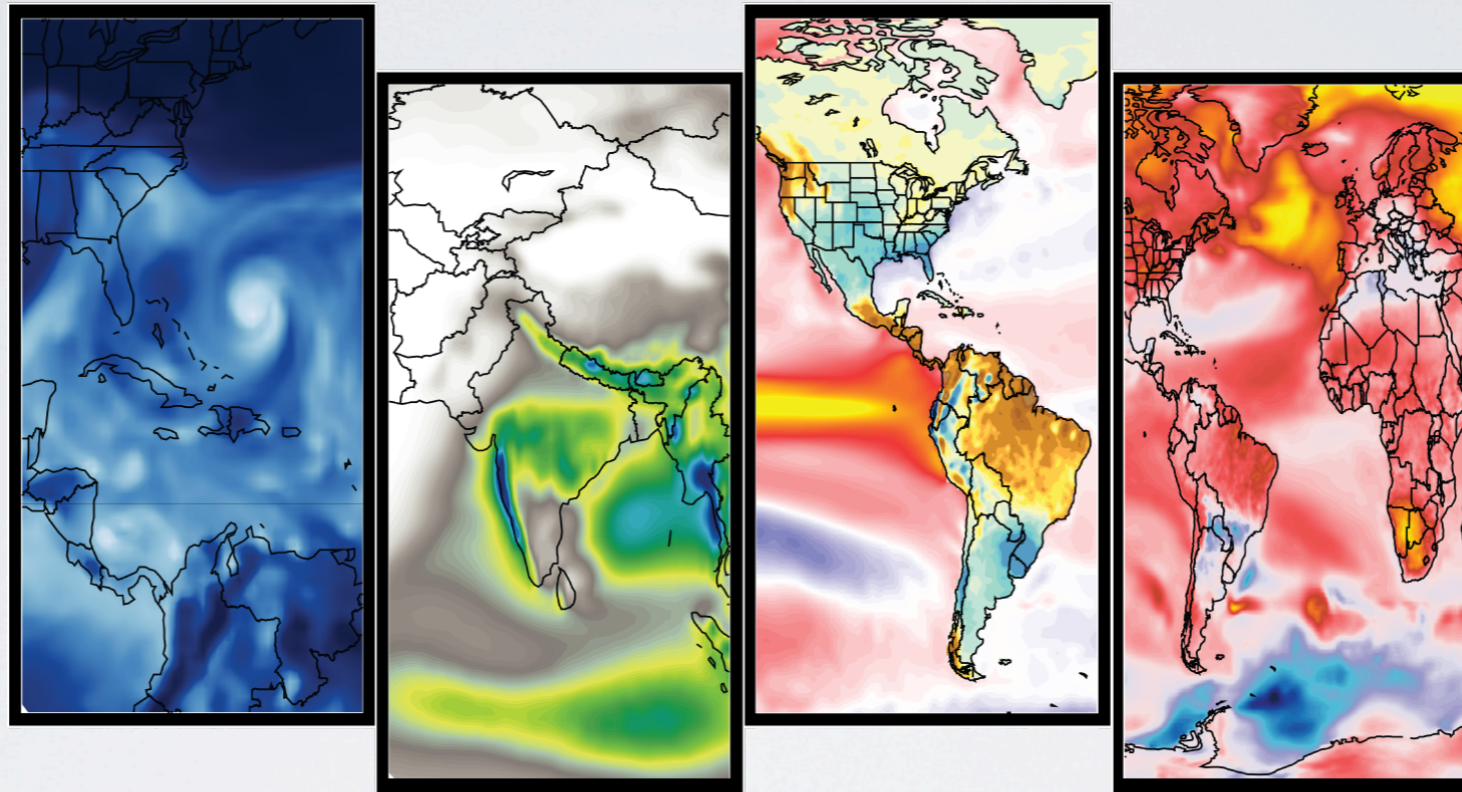


Towards Seasonal Predictions of Regional Hurricane Activity

NOAA/GFDL Climate Variations and Predictability Group



Hypothesis: Enhanced resolution & corrected large-scale climate improve simulation and prediction of regional climate & extremes.

Practical Goal: Build a seasonal to multi-decadal forecasting system to:

- Yield improved forecasts of large-scale climate
- Enable forecasts of regional climate and extremes

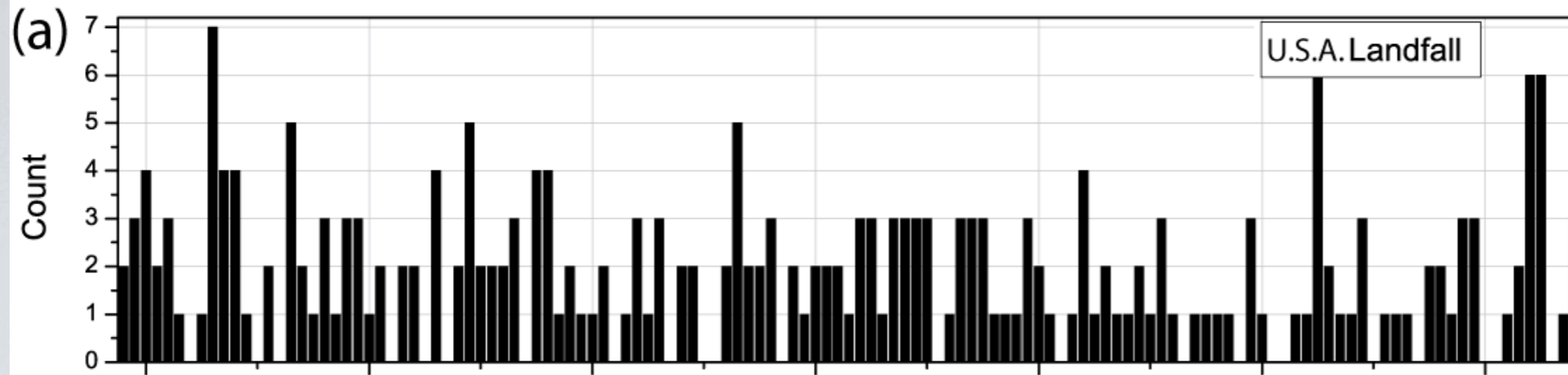
Outline

- Motivation
- Development of prediction model:
focus on high atmospheric resolution
- Phase I of retrospective forecasts:
ocean/sea ice initialize
- Next stages

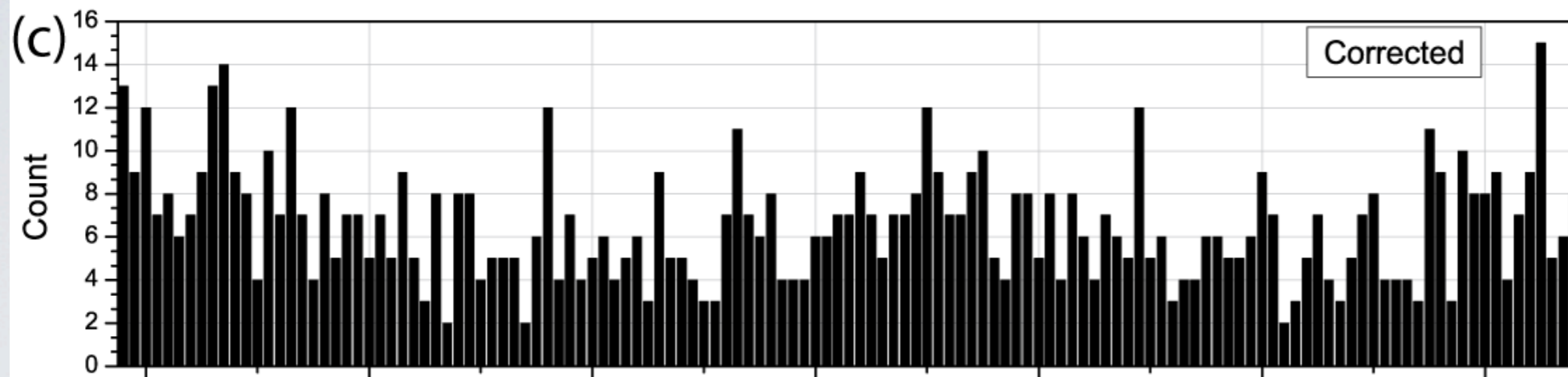
Why make predictions?

- **Pragmatic reasons:** skillful predictions help support decisions by providing glimpses of the future.
- **Scientific reasons:** prediction is a fundamental element of scientific method, providing tests to hypotheses underlying them.

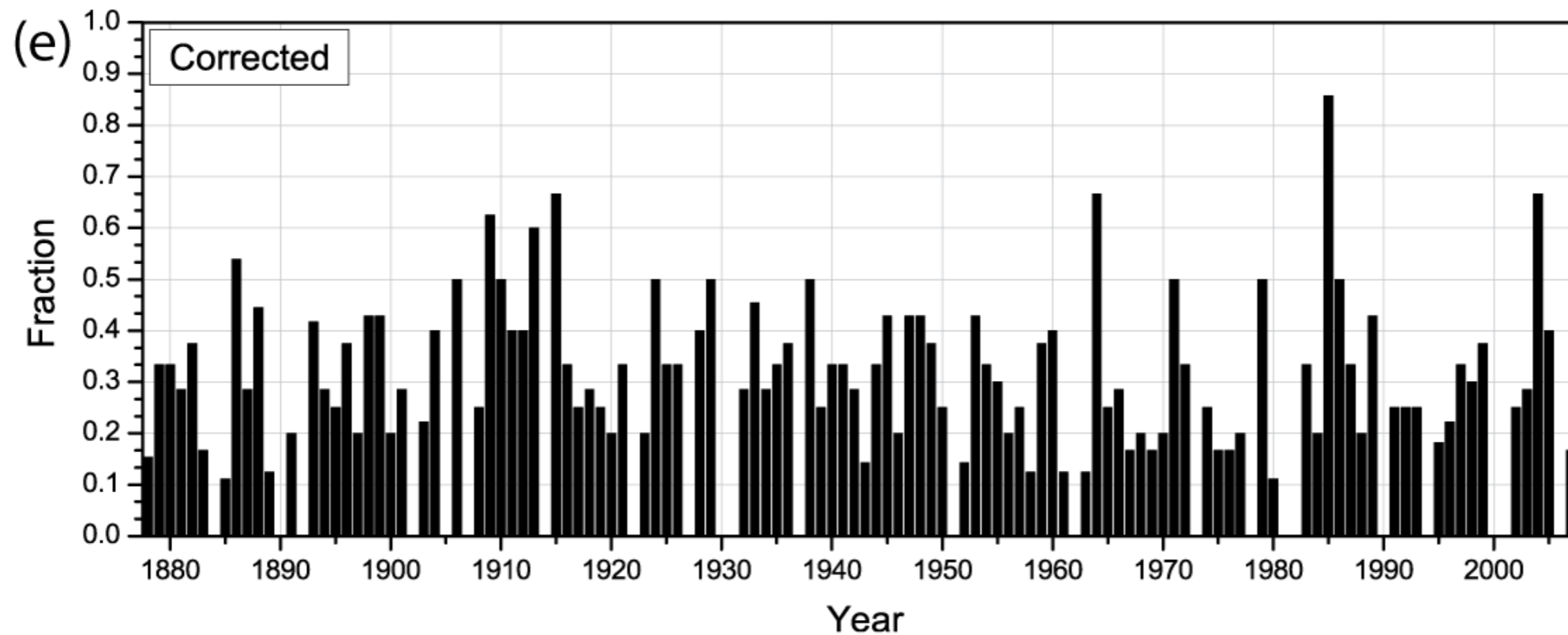
Seasonal hurricane counts



U.S. Landfalling
Hurricanes



Basinwide
Hurricanes



Fraction of
Basinwide
Hurricanes
Making U.S.
Landfall

Sources of & Limitations on Climate Predictability

Months to decades

hours to
a month

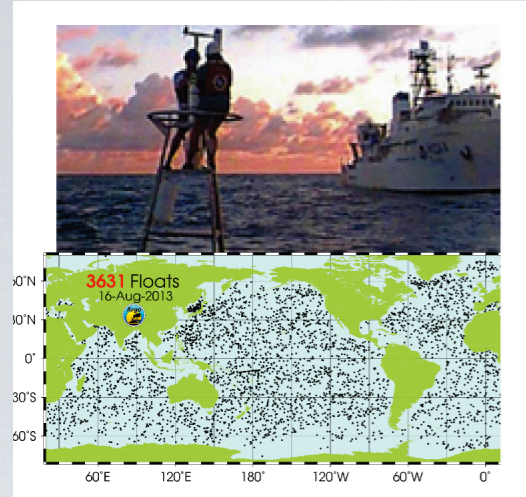
Evolution of initial state of ocean/atmosphere.
Need good models and observations of present and past

Many decades
to centuries

Climate response to forcing
(*e.g.*, CO₂, soot/dust, sun, volcanoes, land use)
need good models and estimates of forcing

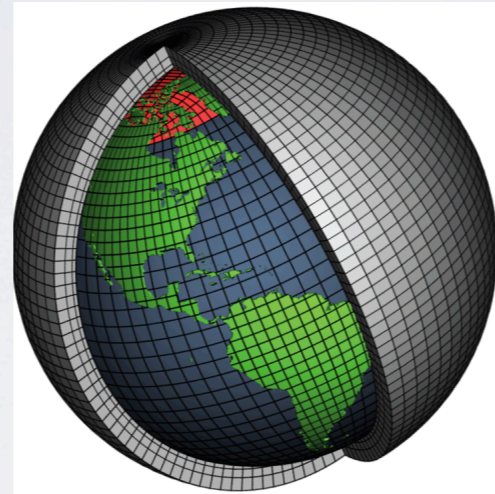
Predictability has inherent limits: need to be probabilistic.

Elements of Climate Prediction System of Systems

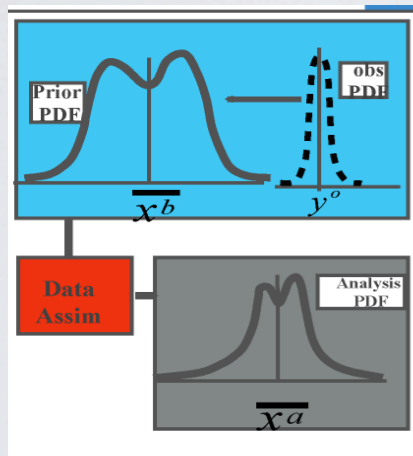


Global climate observing system:
Sparse observations of many quantities across globe.

Image sources: NOAA/PMEL and Argo.ucsd.edu



Dynamical modeling system:
Allows forward integration from present state, including expected changes in radiative forcing.



Data assimilation system:
Combines sparse observations with model, to estimate present state.
Usually based on dynamical model.

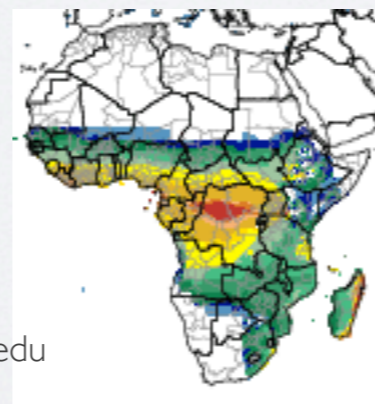
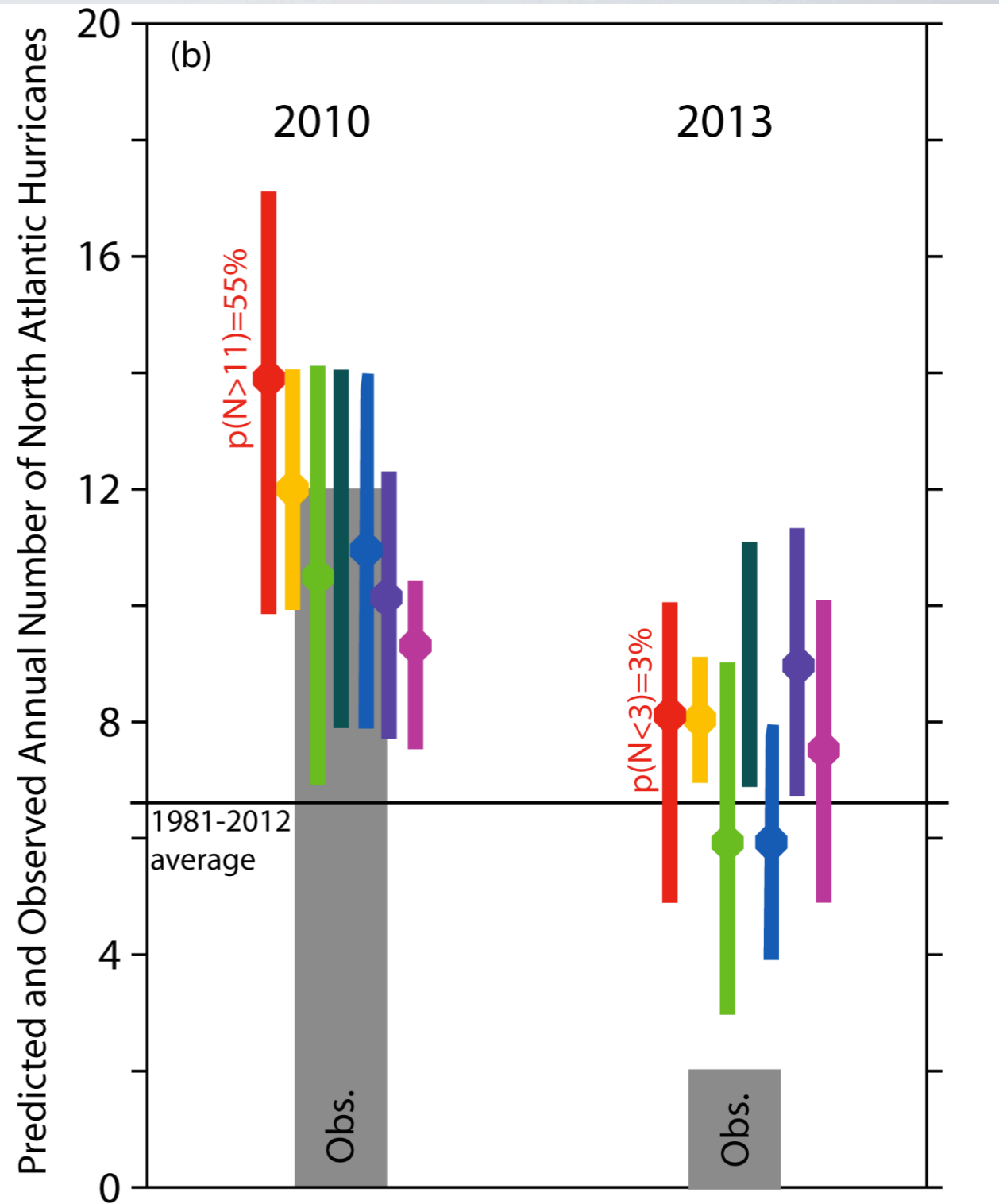
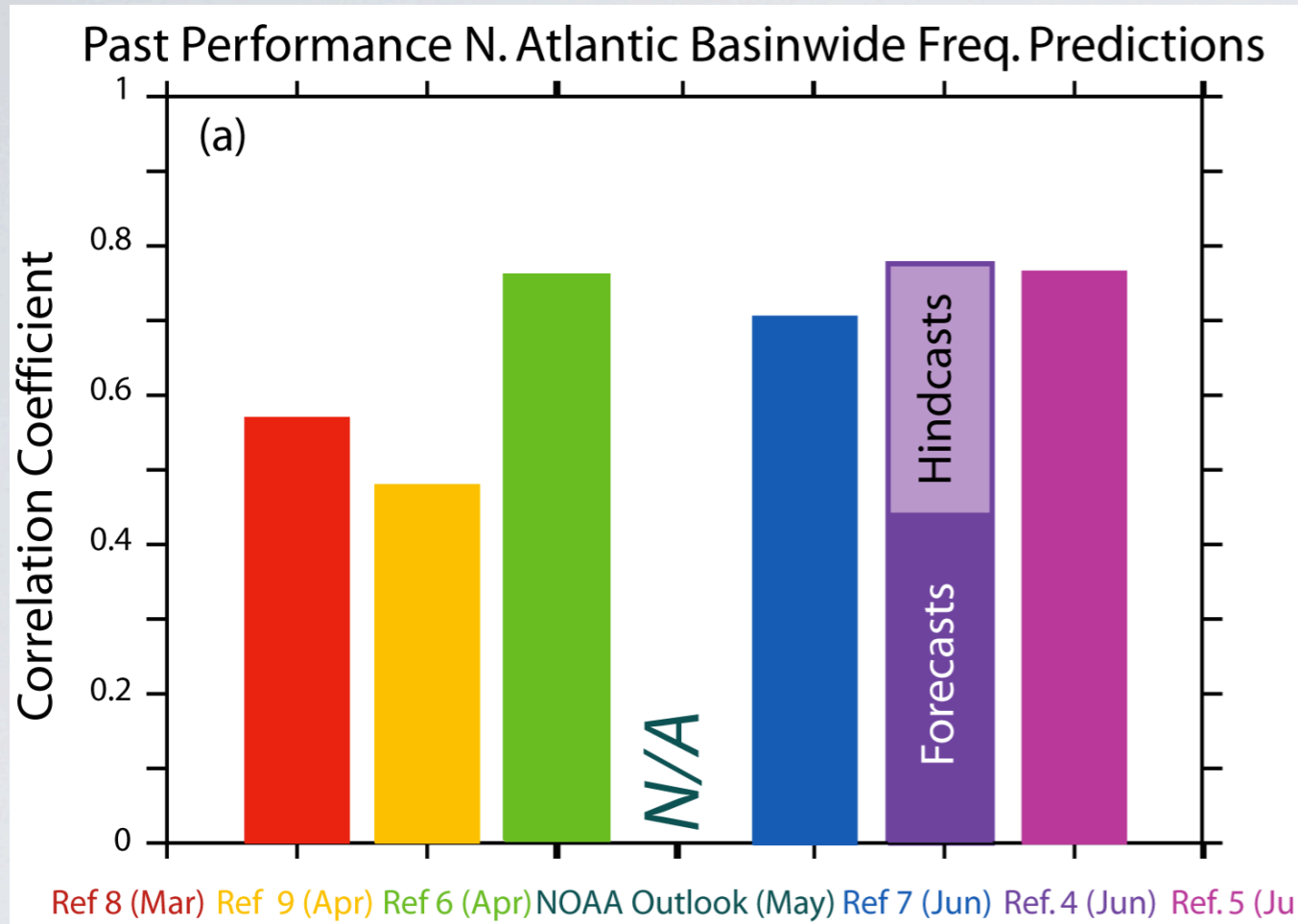


Image source: <http://iridl.ldeo.columbia.edu>

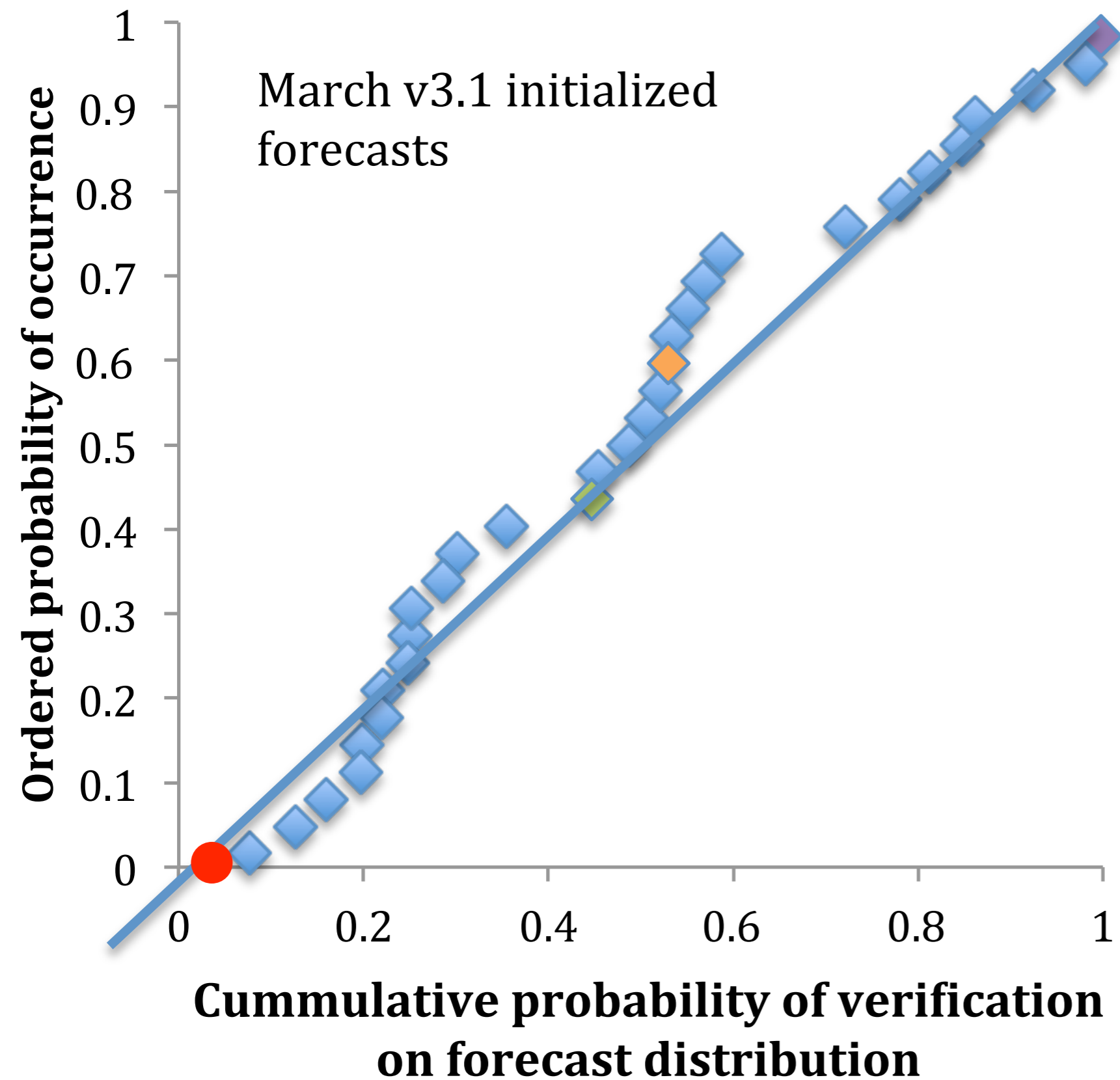
Analysis and dissemination system:
Take output from predictions and produce “useful” information, communicate predictions.

Predictions of Basinwide Hurricane Activity



Statistical, dynamical and hybrid statistical-dynamical schemes regularly (and skillfully) predict seasonal hurricane activity.

Even though 2013 has poor deterministic skill:
Prediction PDF appears relatively well calibrated

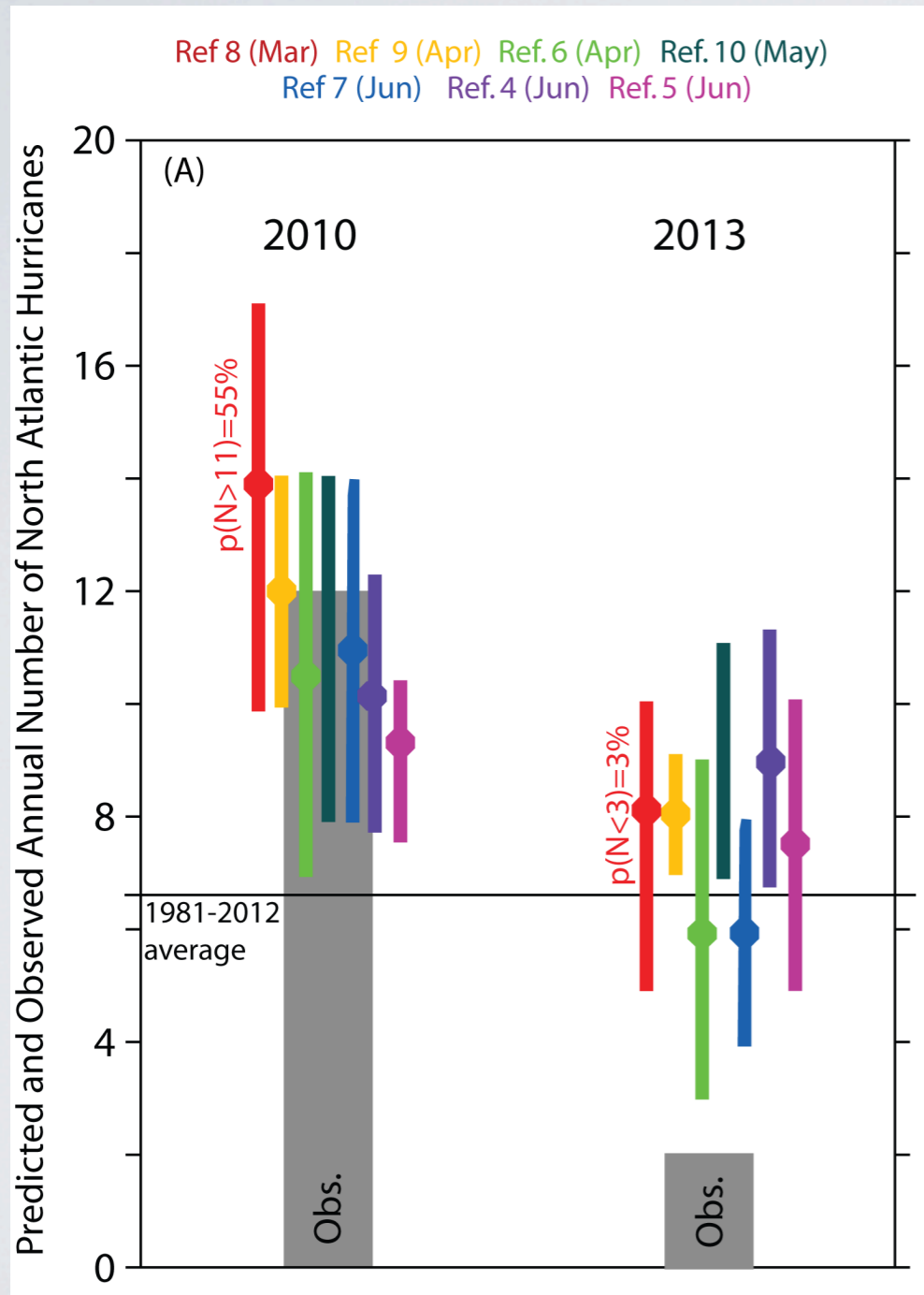


Blue: prior to publication of method
Colors: post-publication (2010-2012)
● 2013

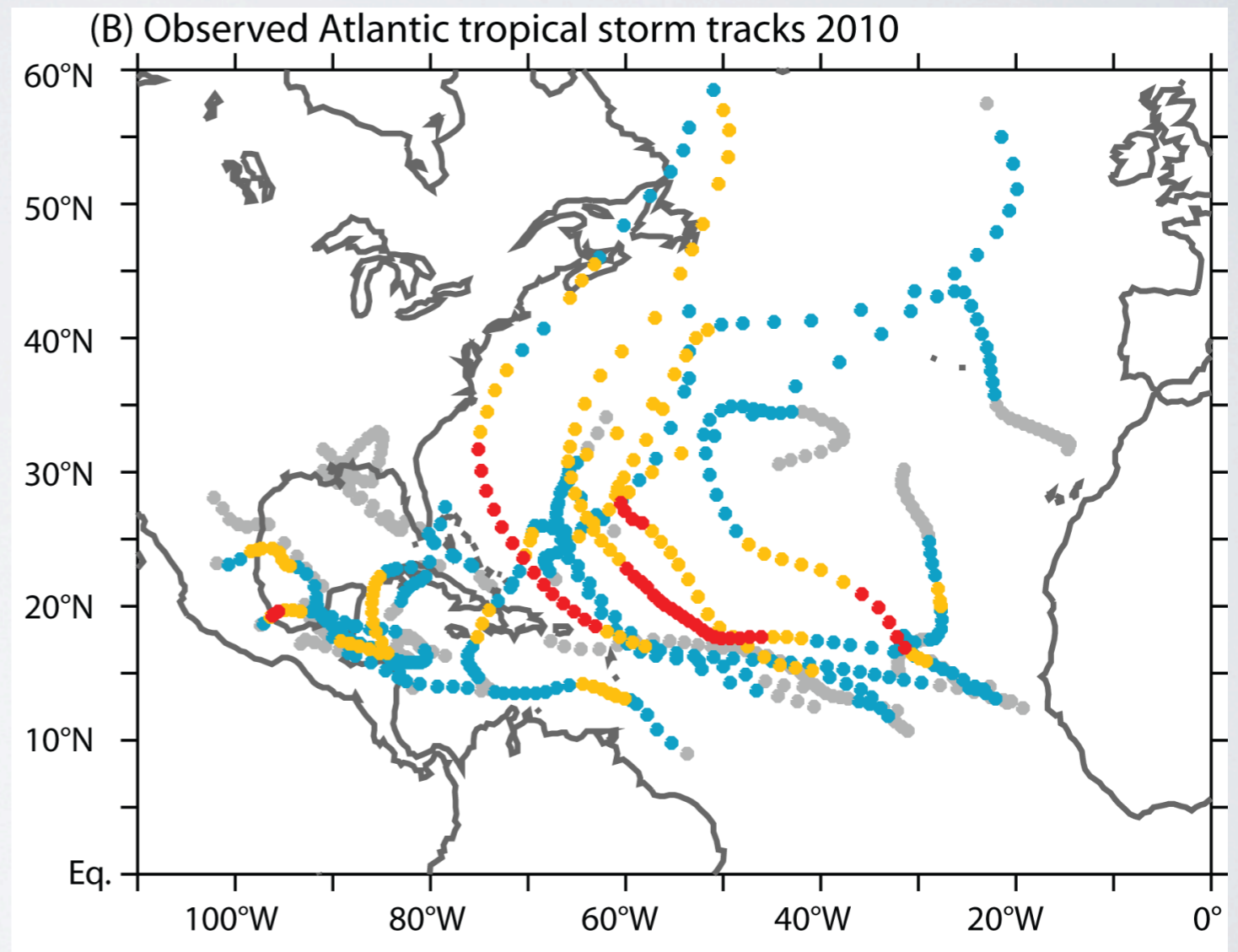
Make PDF, not mode, of TC activity the target

Update of Vecchi et al. (2011)

Correct predictions of basin-wide active 2010 but not of U.S. landfall absence

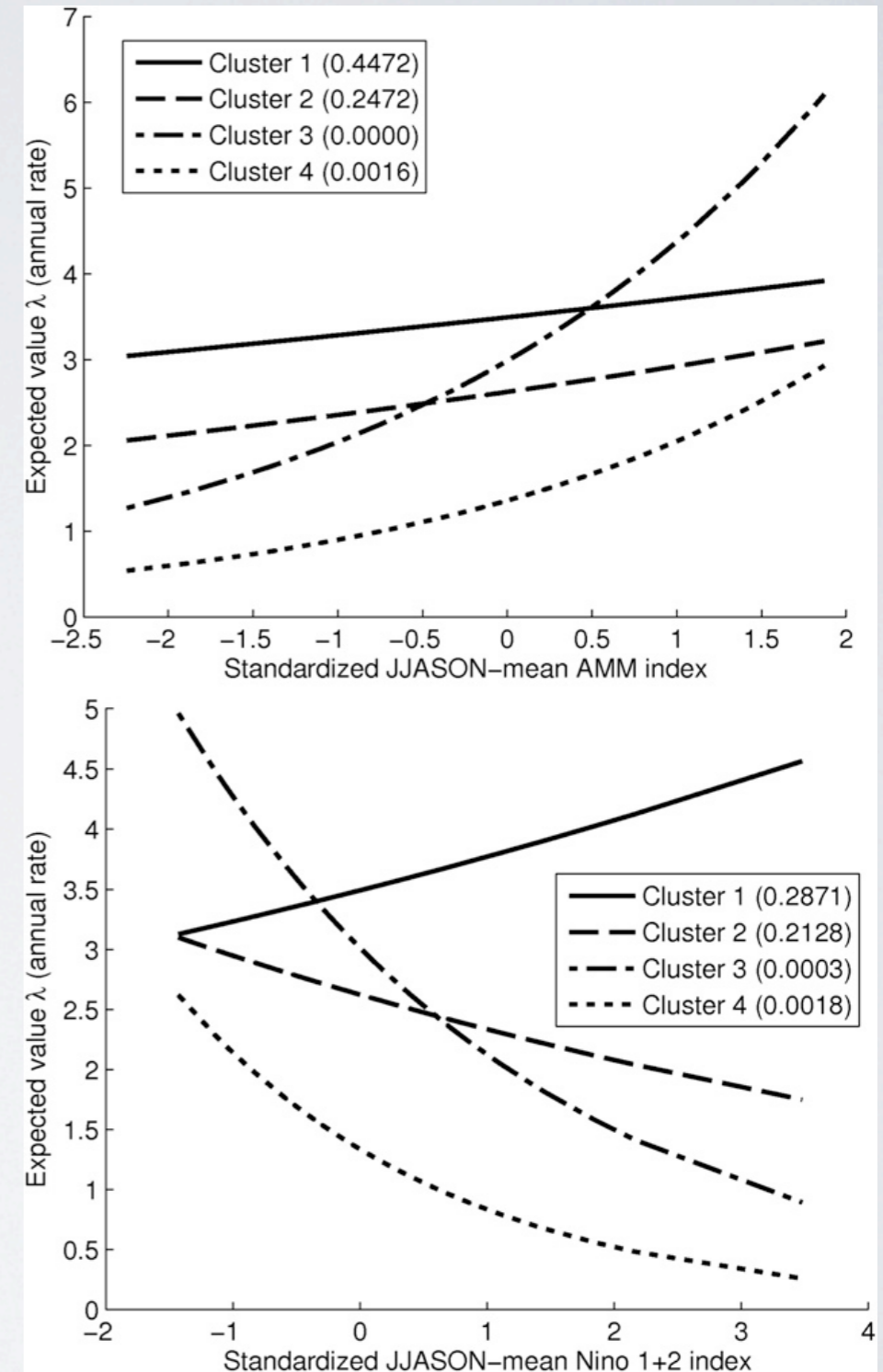
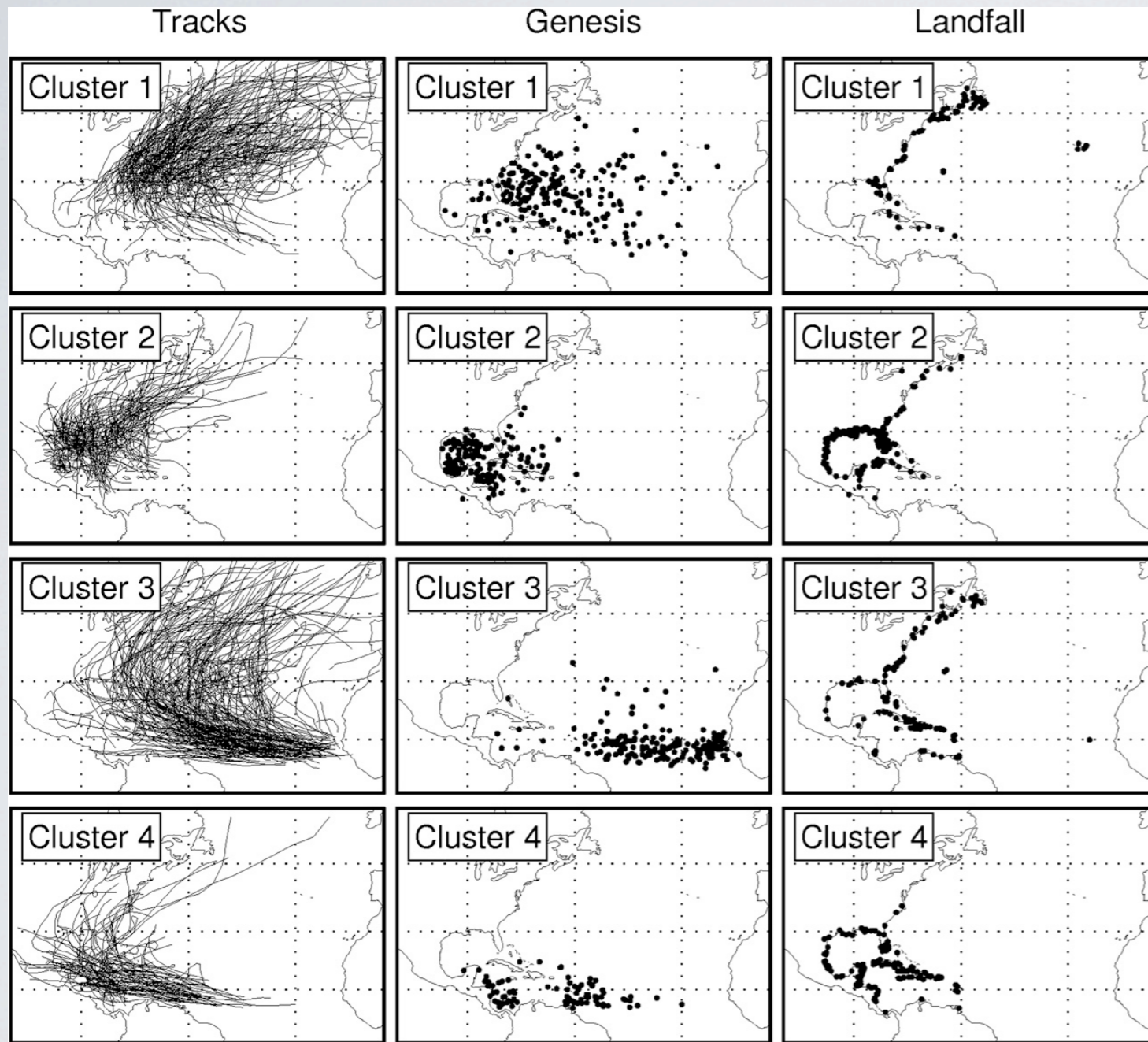


Can we reliably predict statistics of storms
more regionally than “basin-wide”?



Vecchi and Villarini (2014)

Different “types” of Atlantic storms exhibit different relation to large-scale variations





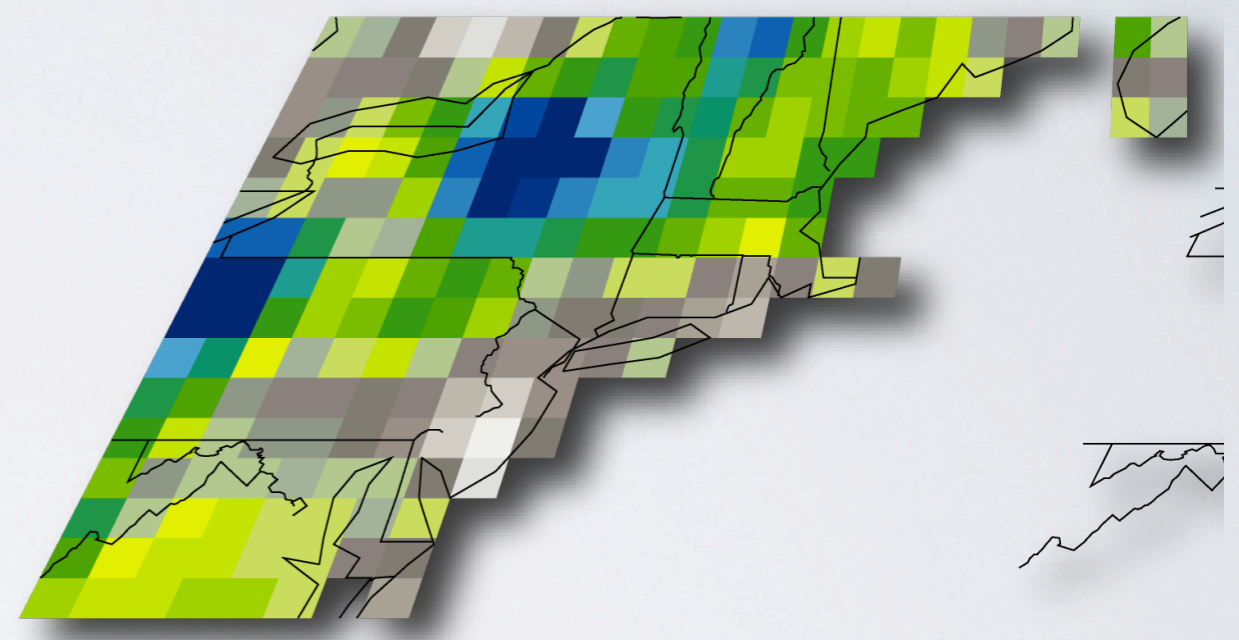
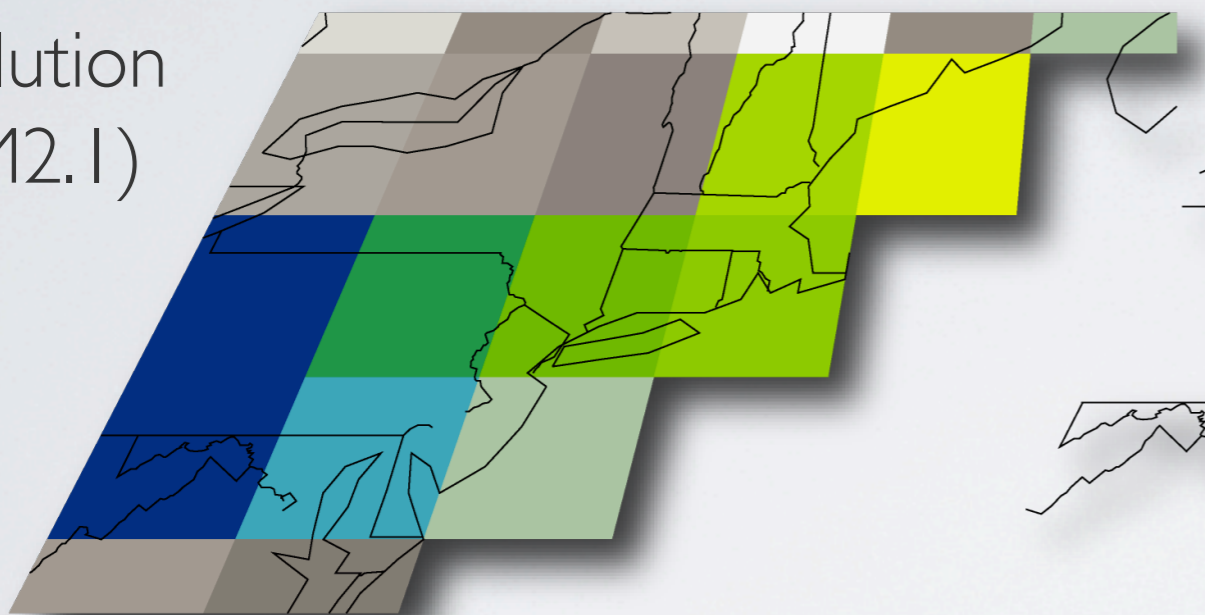
GFDL FLOR: Experimental high-resolution coupled seasonal to decadal prediction system

Goal: Build a seasonal to decadal forecasting system to:
Yield improved forecasts of large-scale climate
Enable forecasts of regional climate and extremes

Precipitation in Northeast USA

High resolution
(CM2.5-FLOR)

Medium
resolution
(CM2.1)



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

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

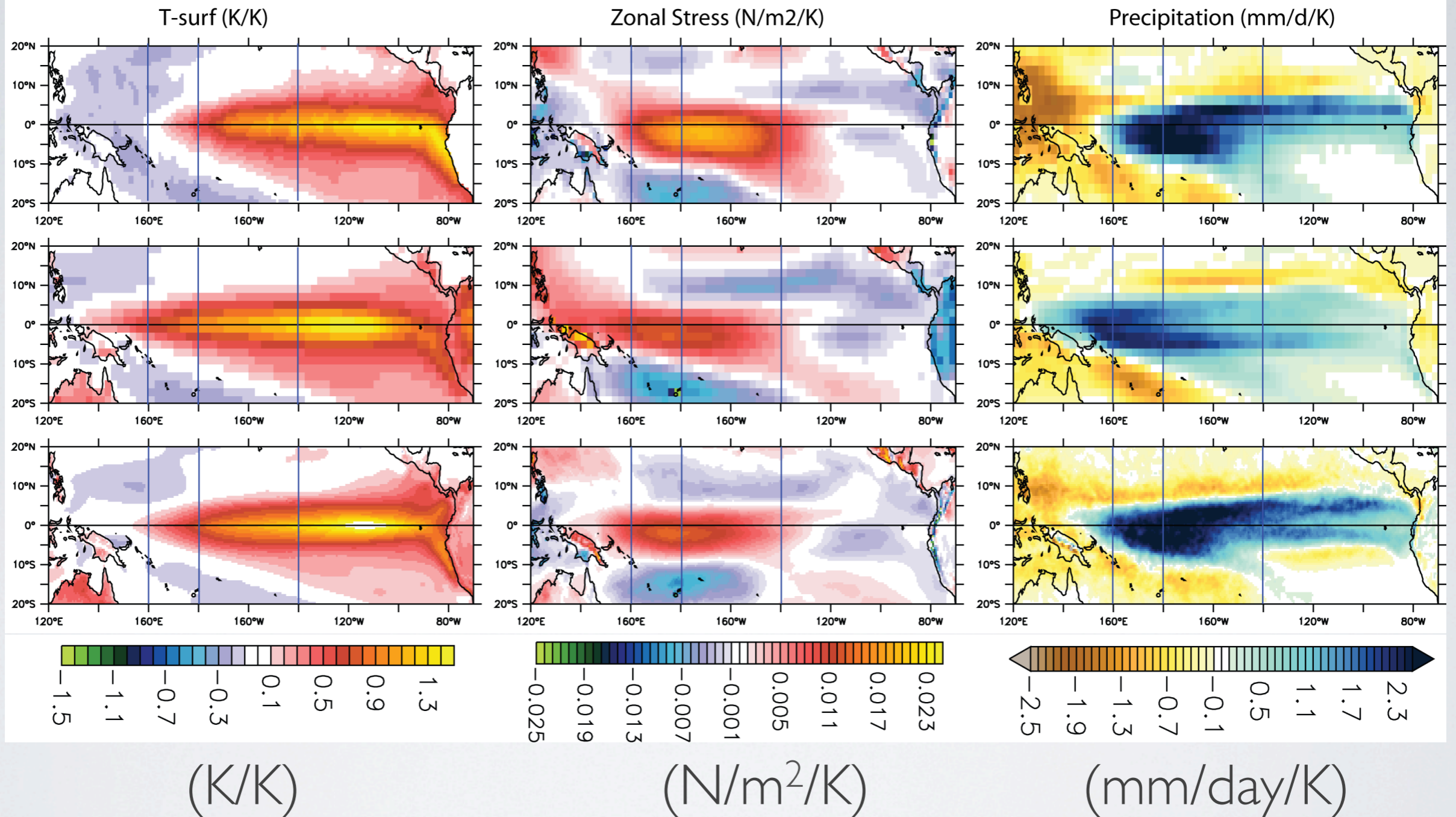
- 50km cubed-sphere atmosphere
 - 1° ocean/sea ice (low res enables prediction work)
- ~15-18 years per day. Multi-century integrations. 15,000+ model-years of experimental seasonal predictions completed and being analyzed.

Structure of ENSO anomalies improved by atmospheric resolution

Regressions onto NIÑO3 SSTA

Obs: HadISST1, ERA-Interim, CMAP

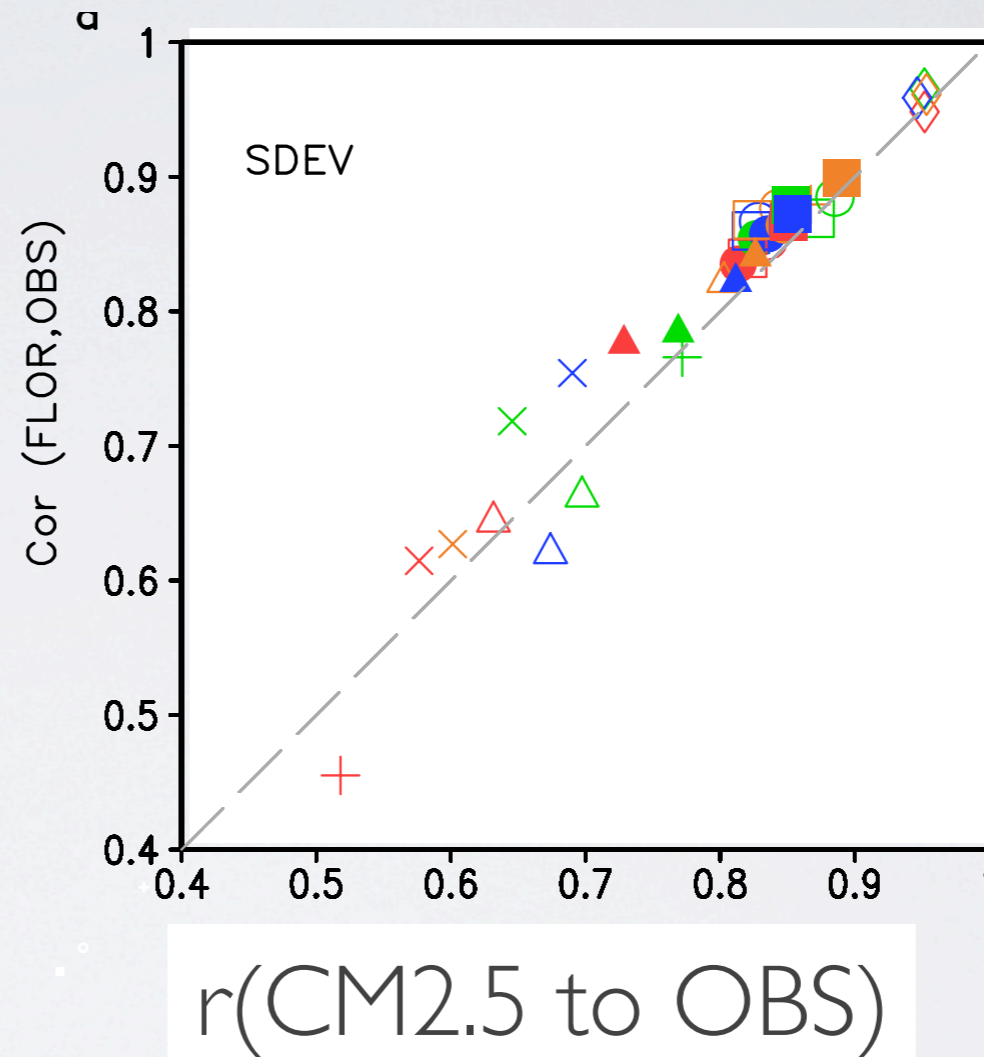
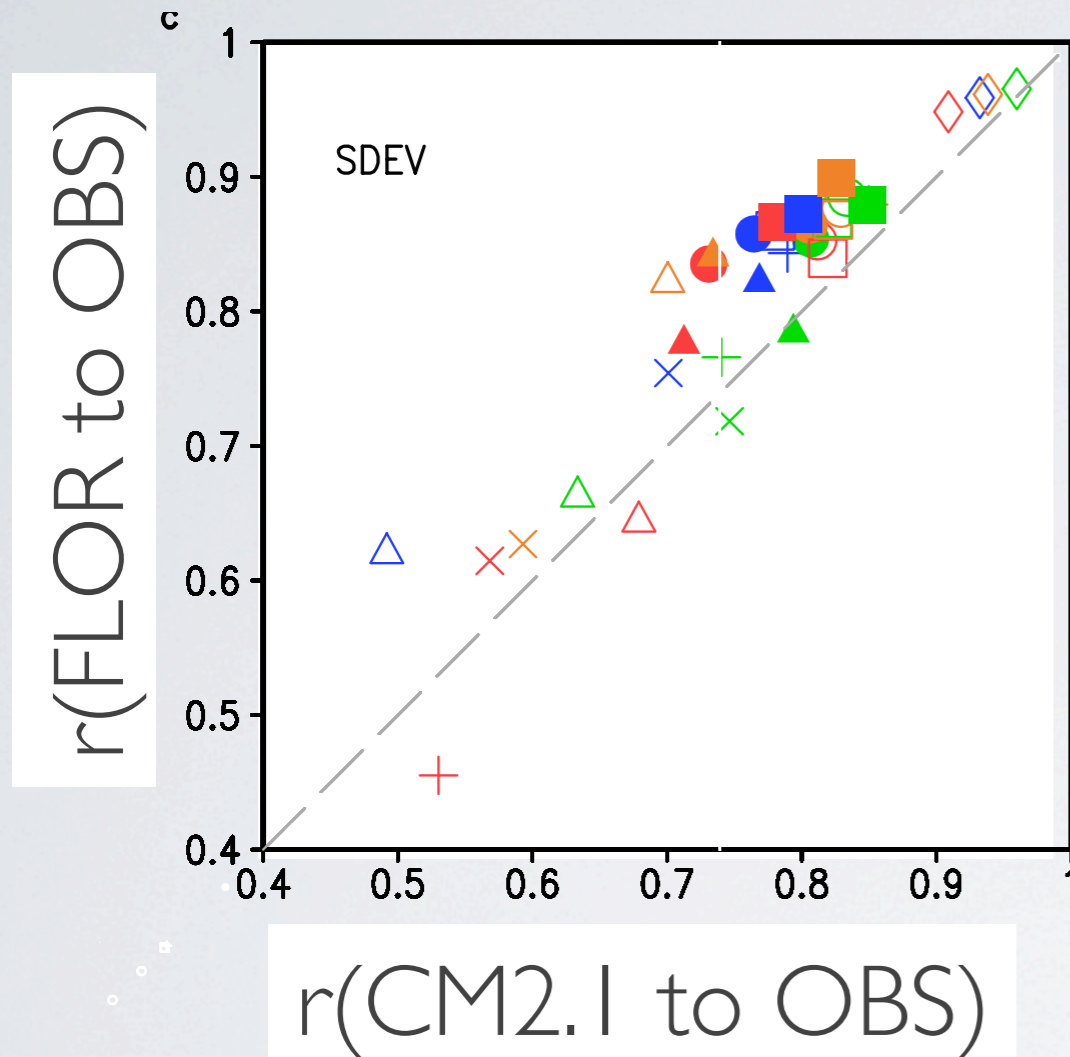
OBS
CM2.1
FLOR



Hypothesis: Enhanced atmos./land resolution improves climate

~5xAtmos Res.

4xOcean Res.



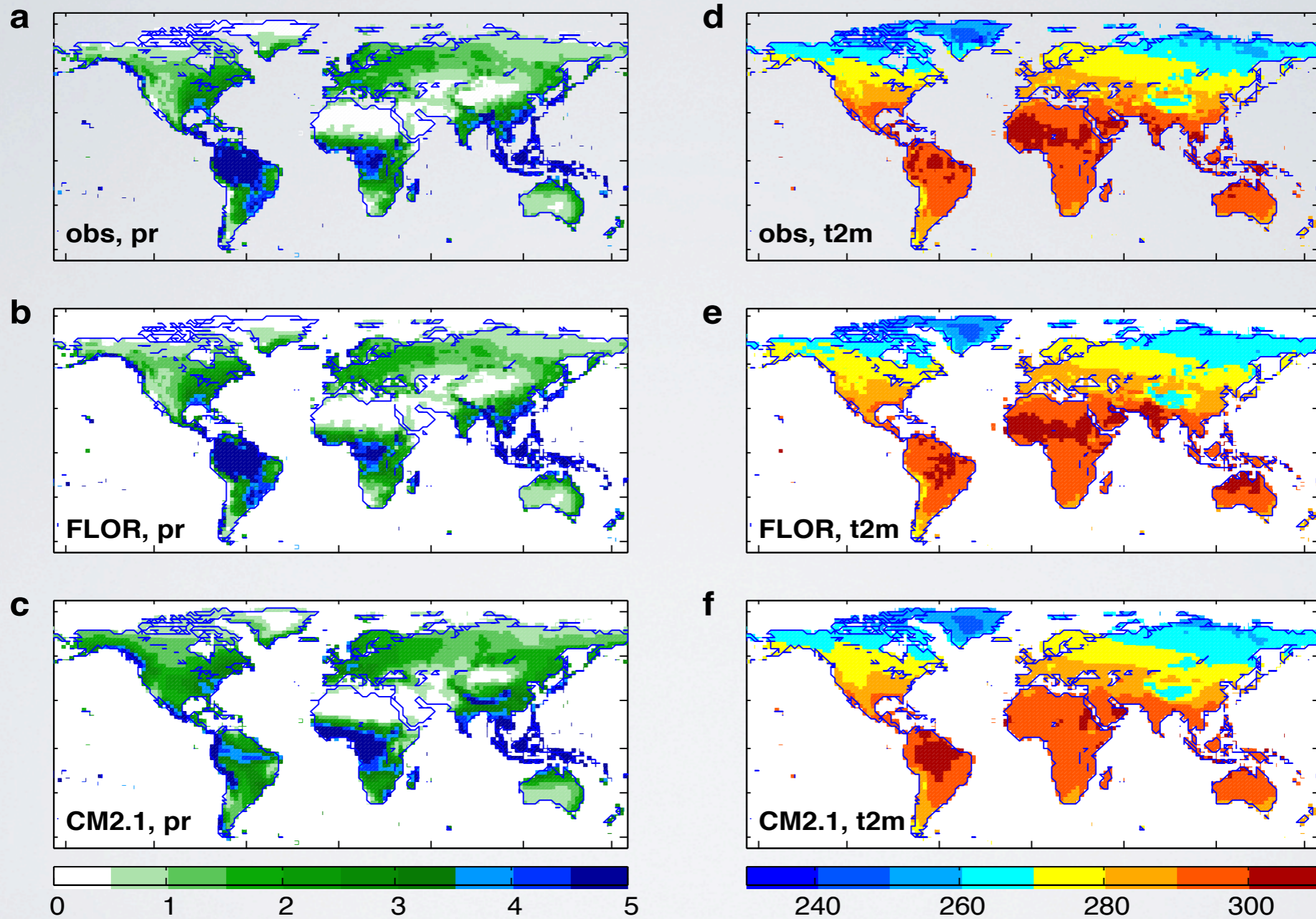
Spatial
Correlation
Of Standard
Deviation

Mark: + p × sst ◇ slp ○ u925 ● v925 □ u850 ■ v850 △ u200 ▲ v200
Color: MAM JJA SON DJF

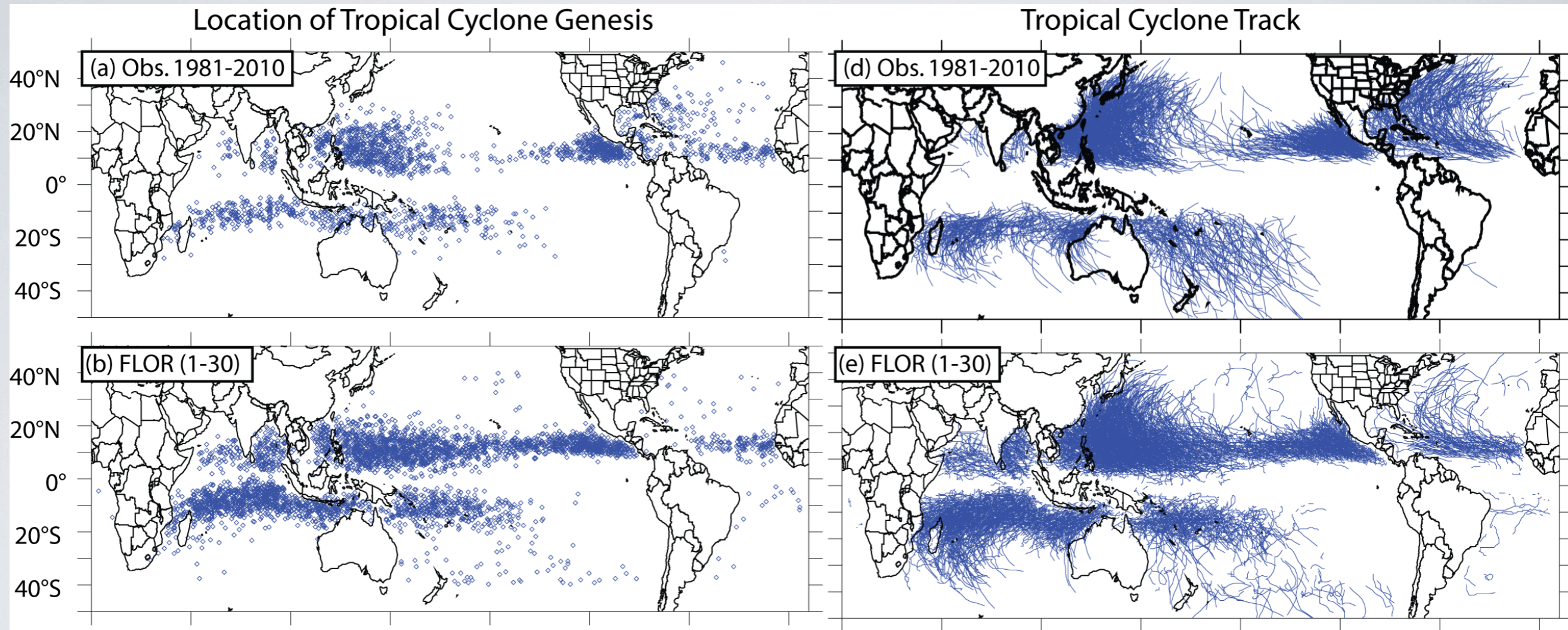
Figure: Lakshmi Krishnamurthy

Jia et al. (2014, J. Clim.)

FLOR improves simulation of land Ts and Pr over CM2.1



TC tracks in FLOR decent for a coupled model (better than CM2.5)



Flux adjustment for predictions of regional TC activity

- **Hypothesis:** Biases in large-scale climate degrade simulation and prediction statistics of regional and extreme climate, flux adjustment will lead to improvements – particularly at longer leads.
- **Methodology:** FA version of FLOR with climatological (once computed, independent of model state) adjustment to **momentum**, **freshwater** and **enthalpy** fluxes to ocean.

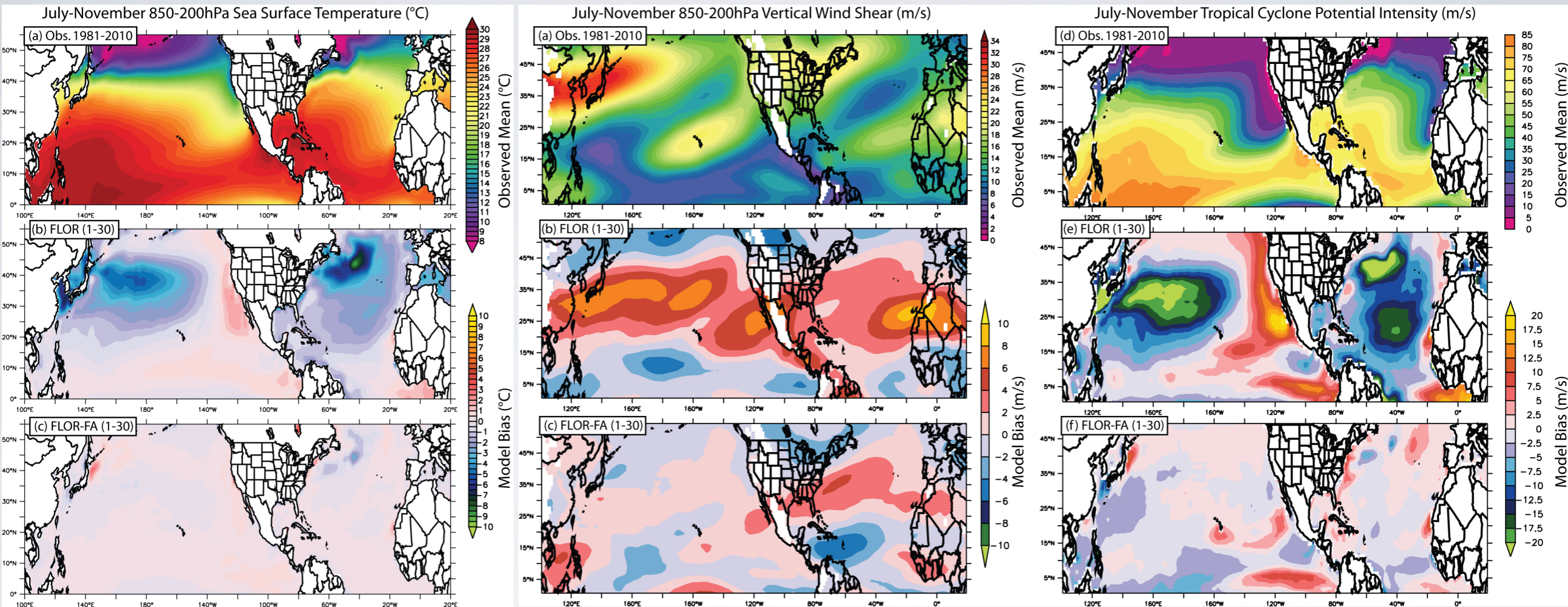
Repeat simulations and predictions with FLOR-FA, compare to FLOR.

Large-scale biases in summer climate map onto some of TC biases

SST

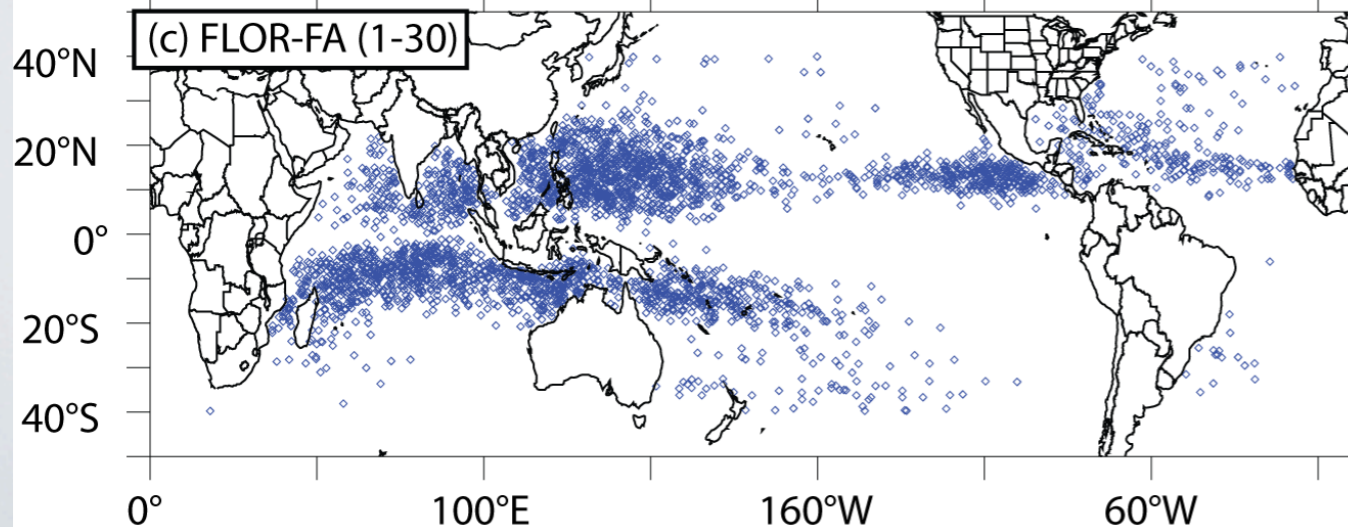
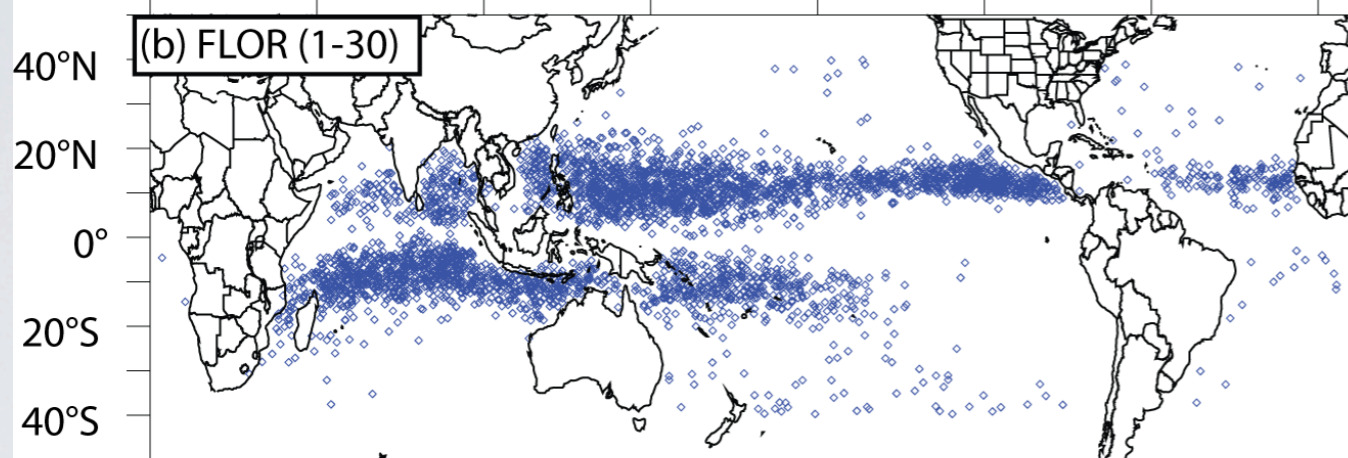
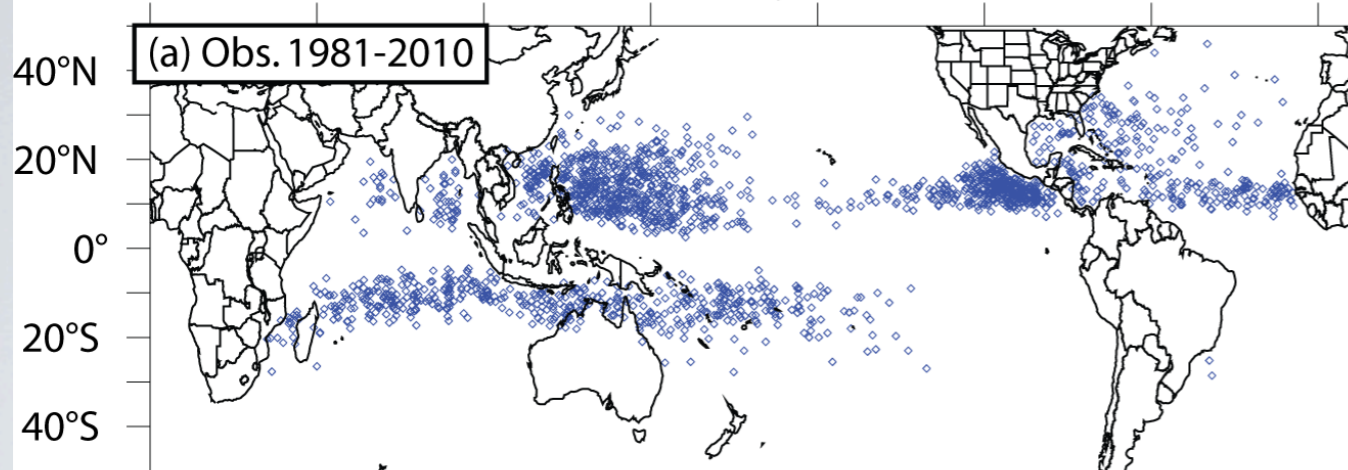
Shear

Potential Intensity

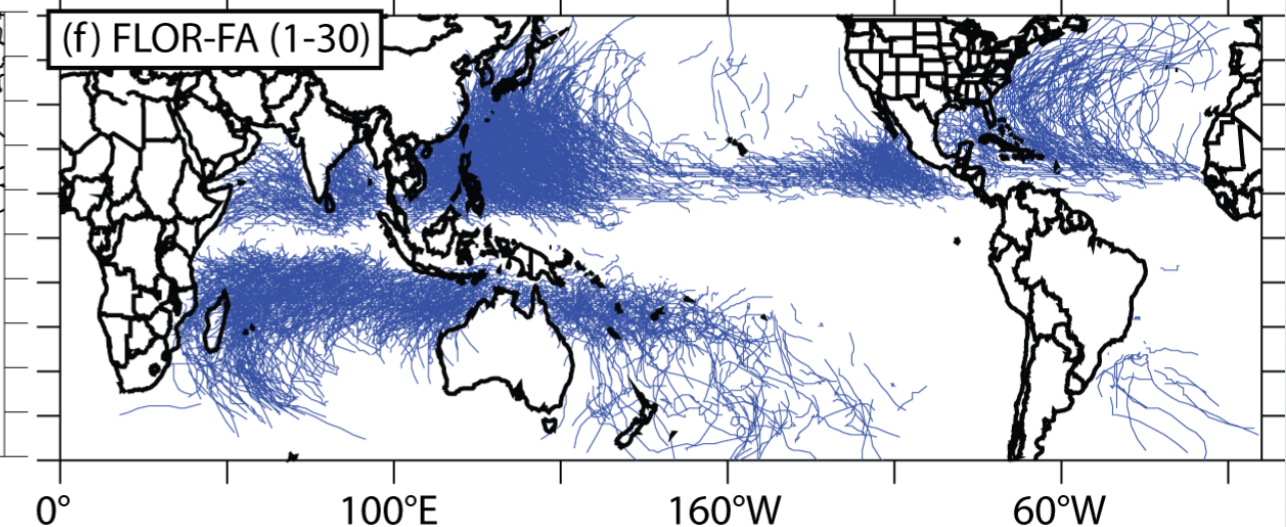
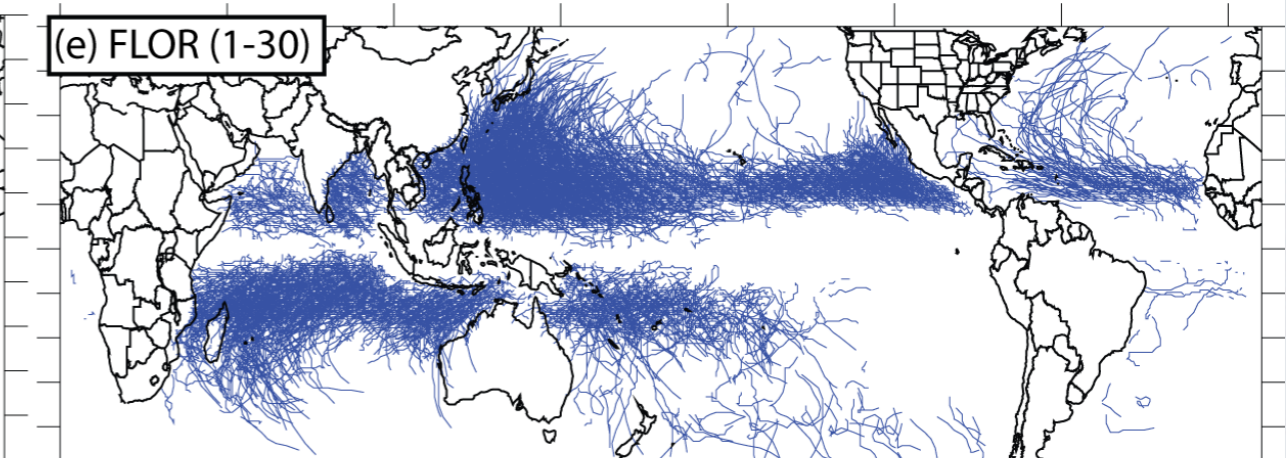
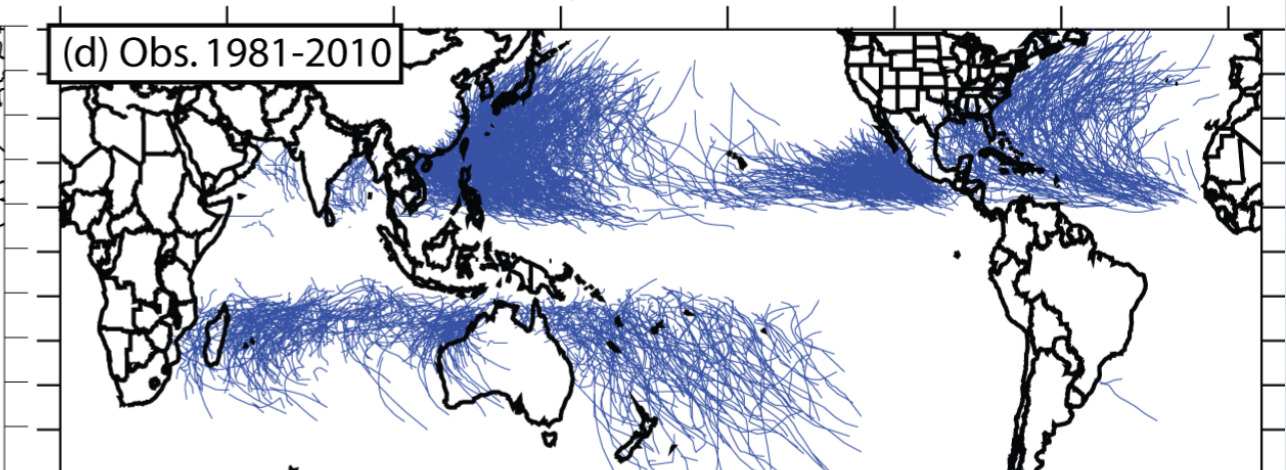


TC tracks in free-running FLOR-FA improved over FLOR particularly in North Pacific and North Atlantic

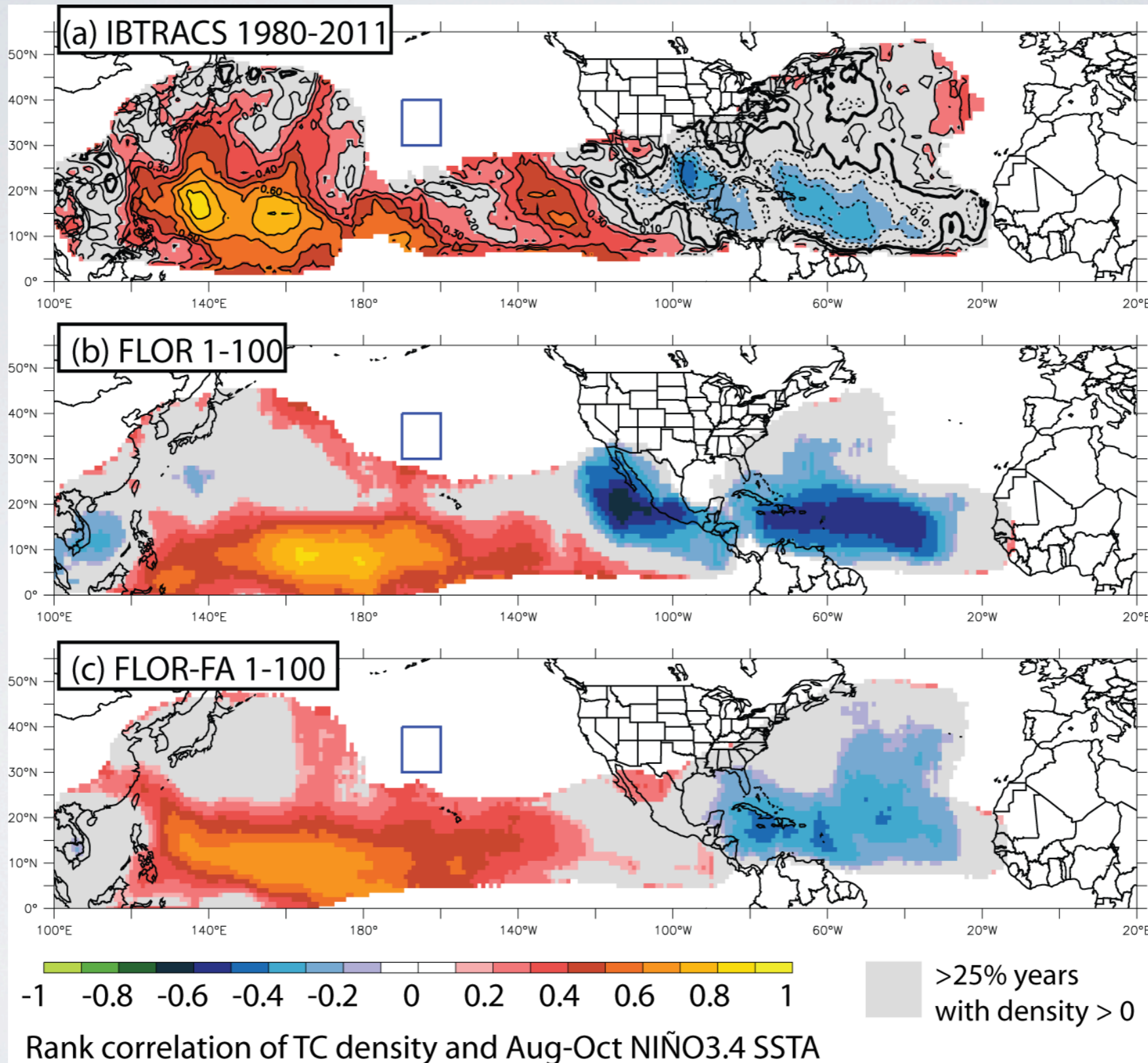
Location of Tropical Cyclone Genesis



Tropical Cyclone Track



TC density relation to NIÑO3.4 improved in FLOR-FA: due to improvements in simulation of El Niño



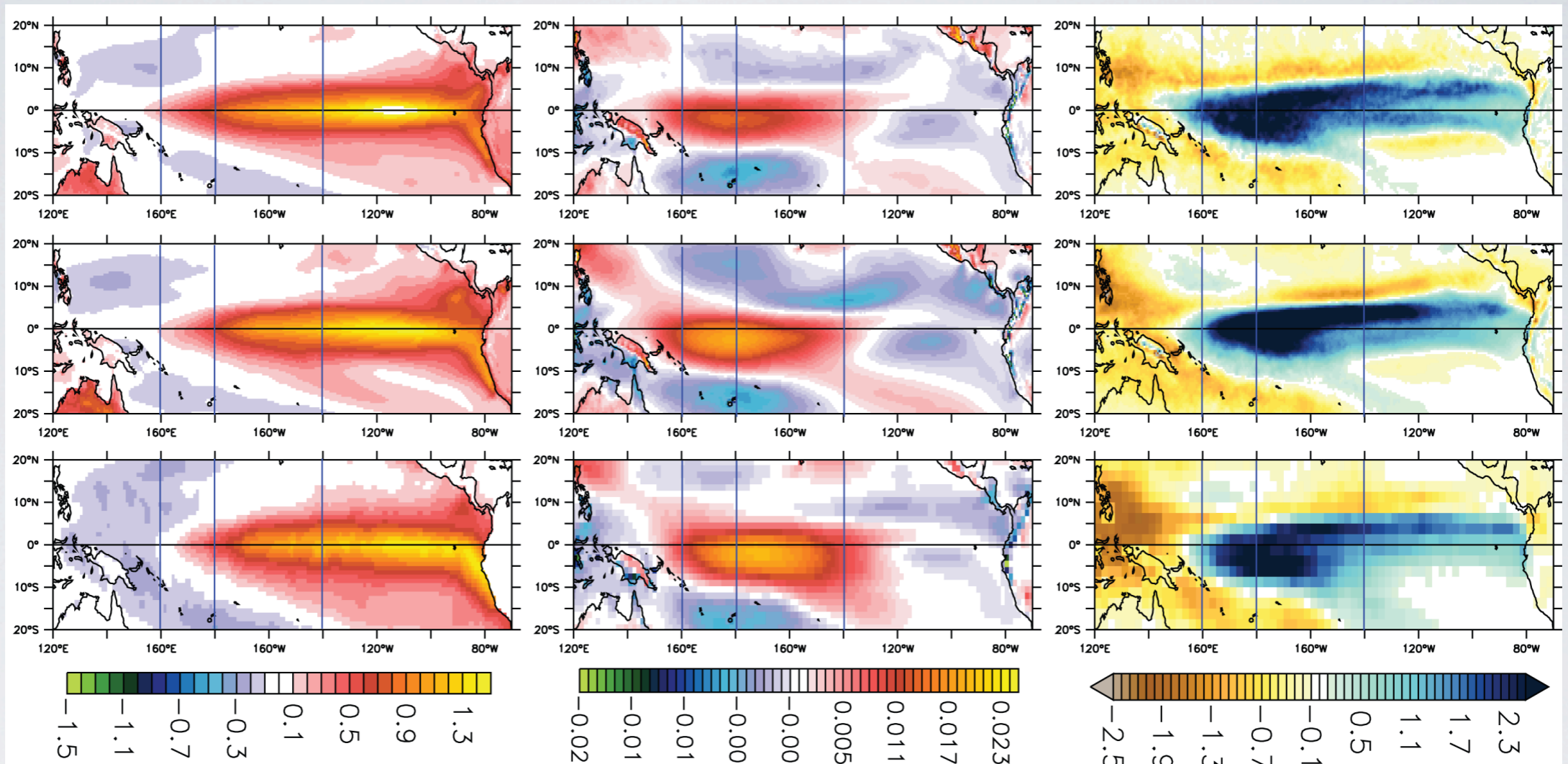
Structure of ENSO improves in FA, as does its phase-locking

Regression on NIÑO3 SSTA

FLOR
-B01

FA-
SST+ τ

OBS

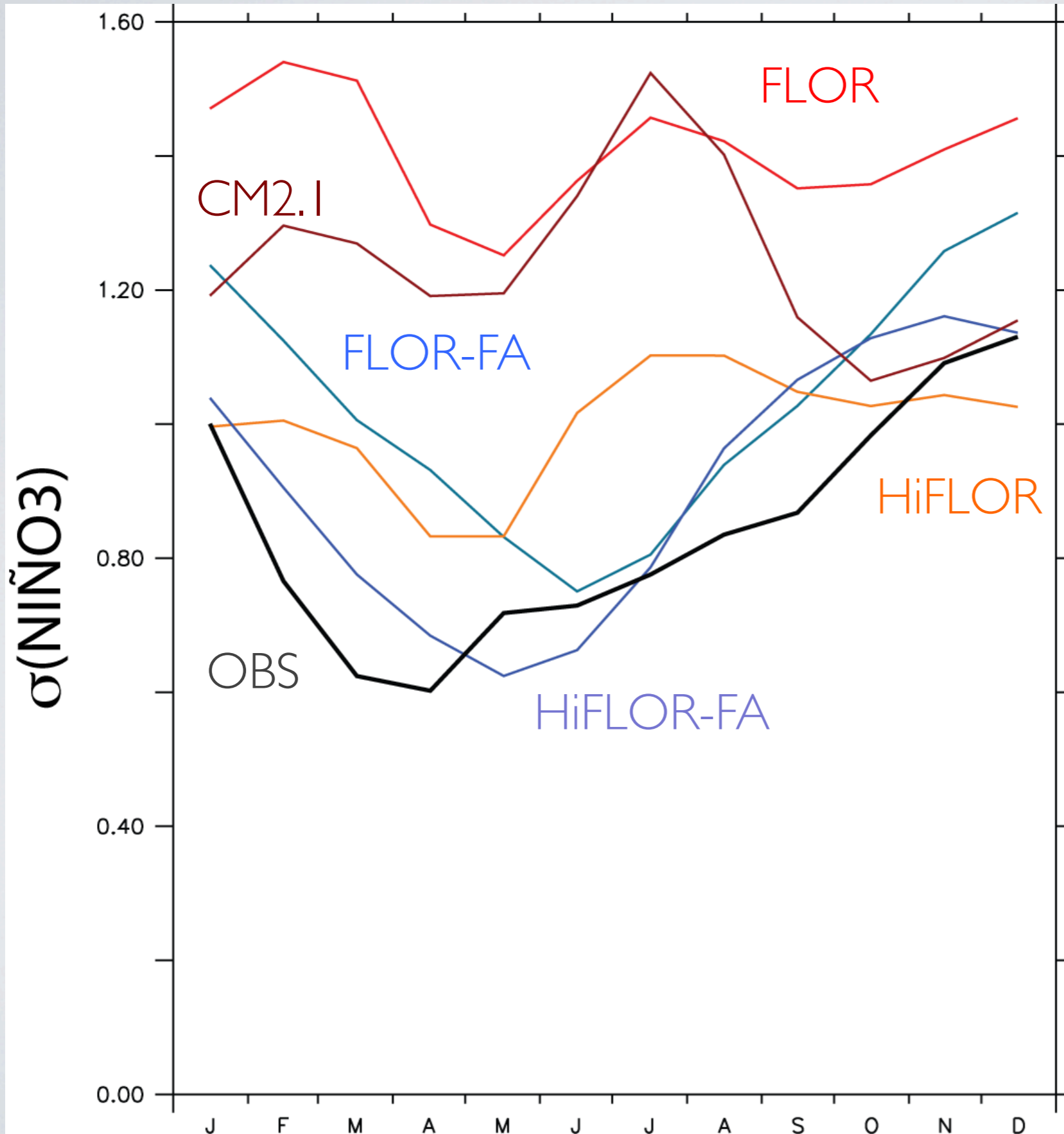


SST

Zonal Stress

Precip.

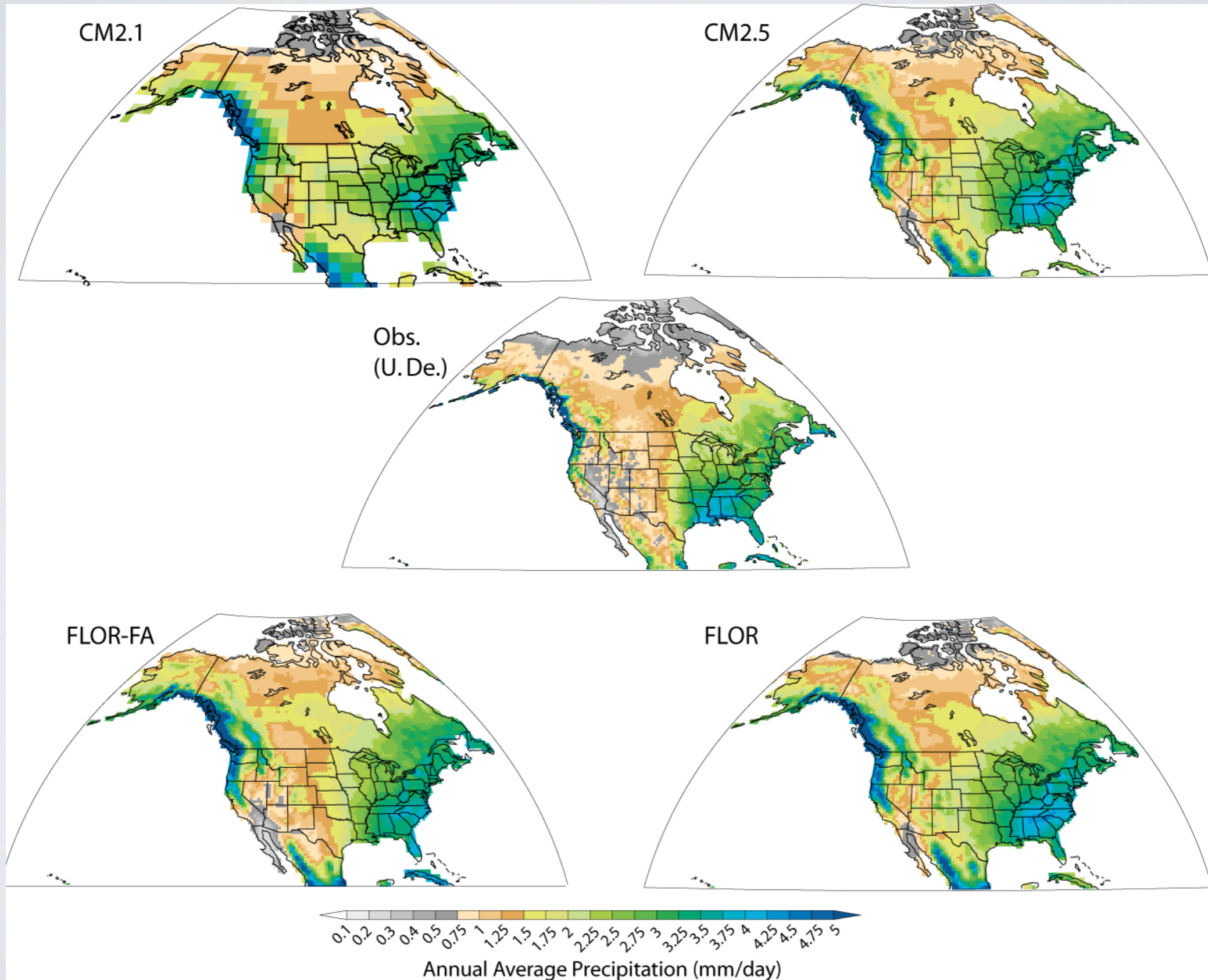
Atmospheric resolution/FA and ENSO phase locking



Artificially adjusting mean state biases improves phase locking of anomalies.

Appears in part related to onset: seasonality of WWEs improved...

N. American precip improves from FA (look at E. and W. Texas)



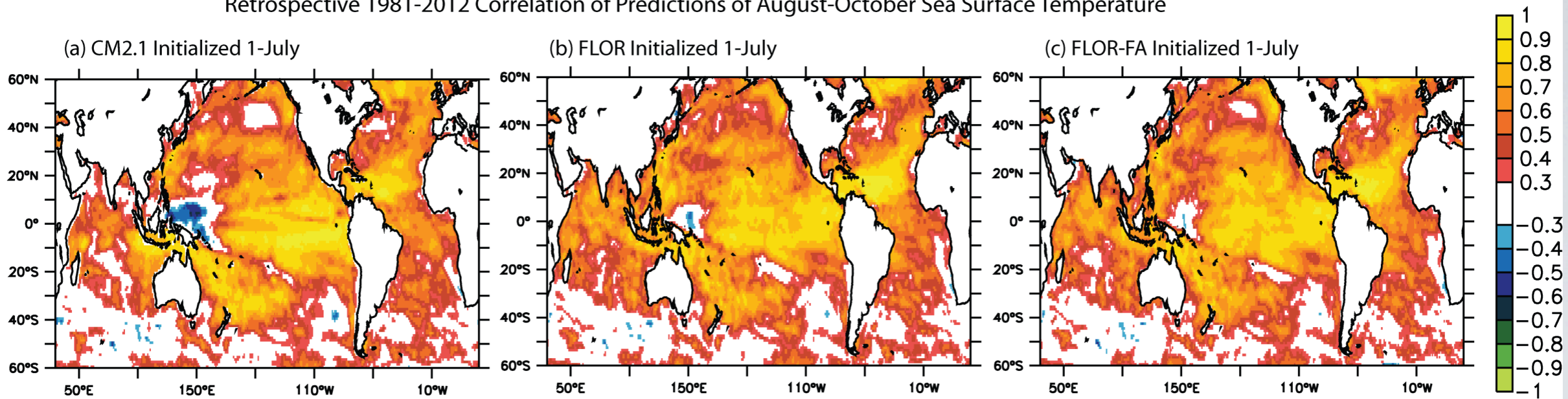


FLOR Seasonal Predictions (phase I)

- 1980-2013 retrospective forecasts (12-member ensemble)
- Ocean & sea ice initialized from CM2.1 EnKF3.1 Assimilation
- Atmosphere and land initialized from ensemble of AGCM (*i.e.*, only information contained in SST and radiative forcing in atmos/land lcs)
- Done with two versions of FLOR (A06 & B01, differ in ocean physics)
 - will discuss B01
- These retrospective forecasts and future real forecasts to be submitted to NMME starting March 2014

Retrospective predictions of ASO SST no worse in FLOR-FA than FLOR – both somewhat better than CM2.1

Retrospective 1981-2012 Correlation of Predictions of August-October Sea Surface Temperature



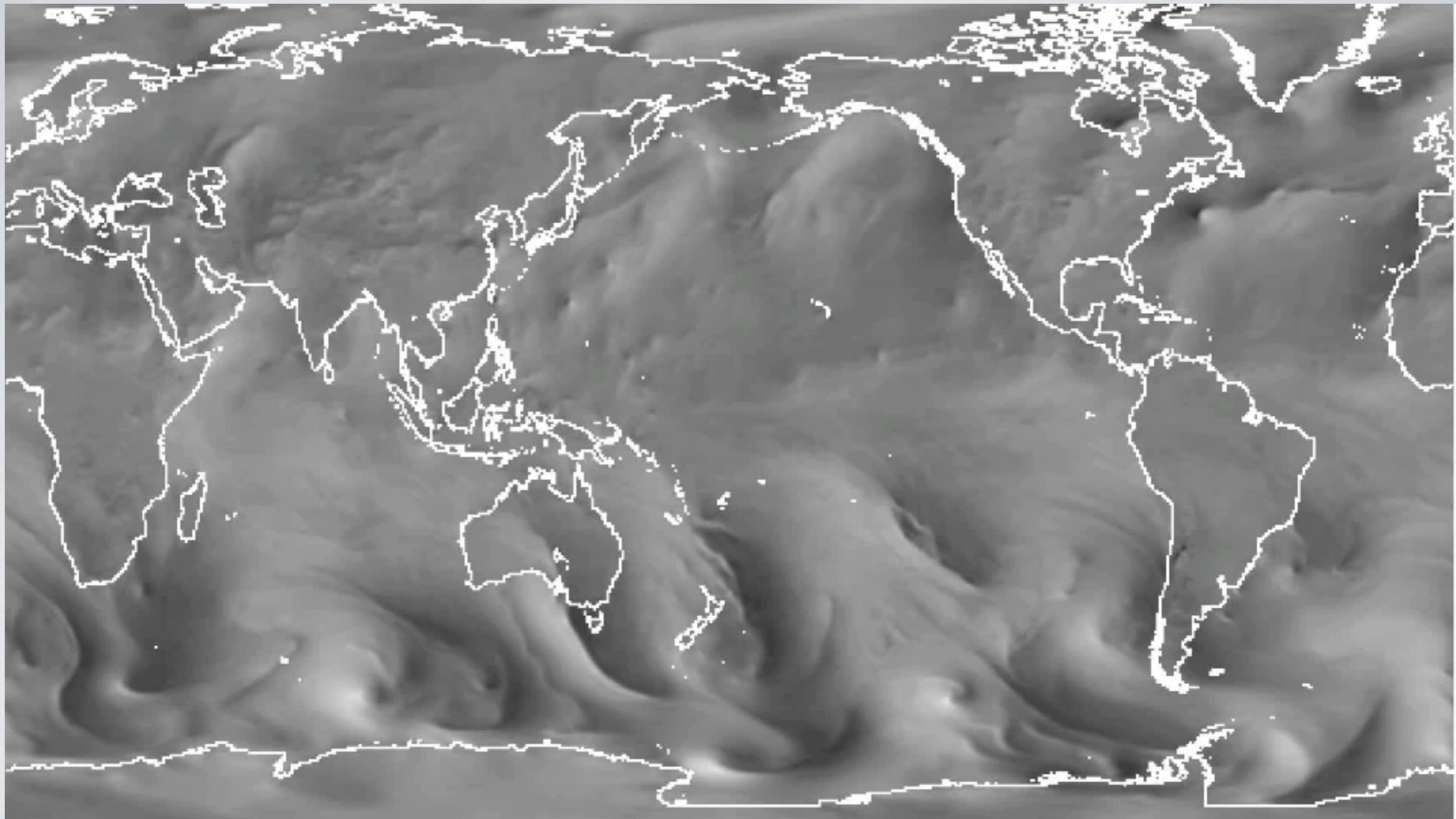
CM2.1

FLOR

FLOR-FA

1981-2012 correl. of Aug-Oct SSTA predictions

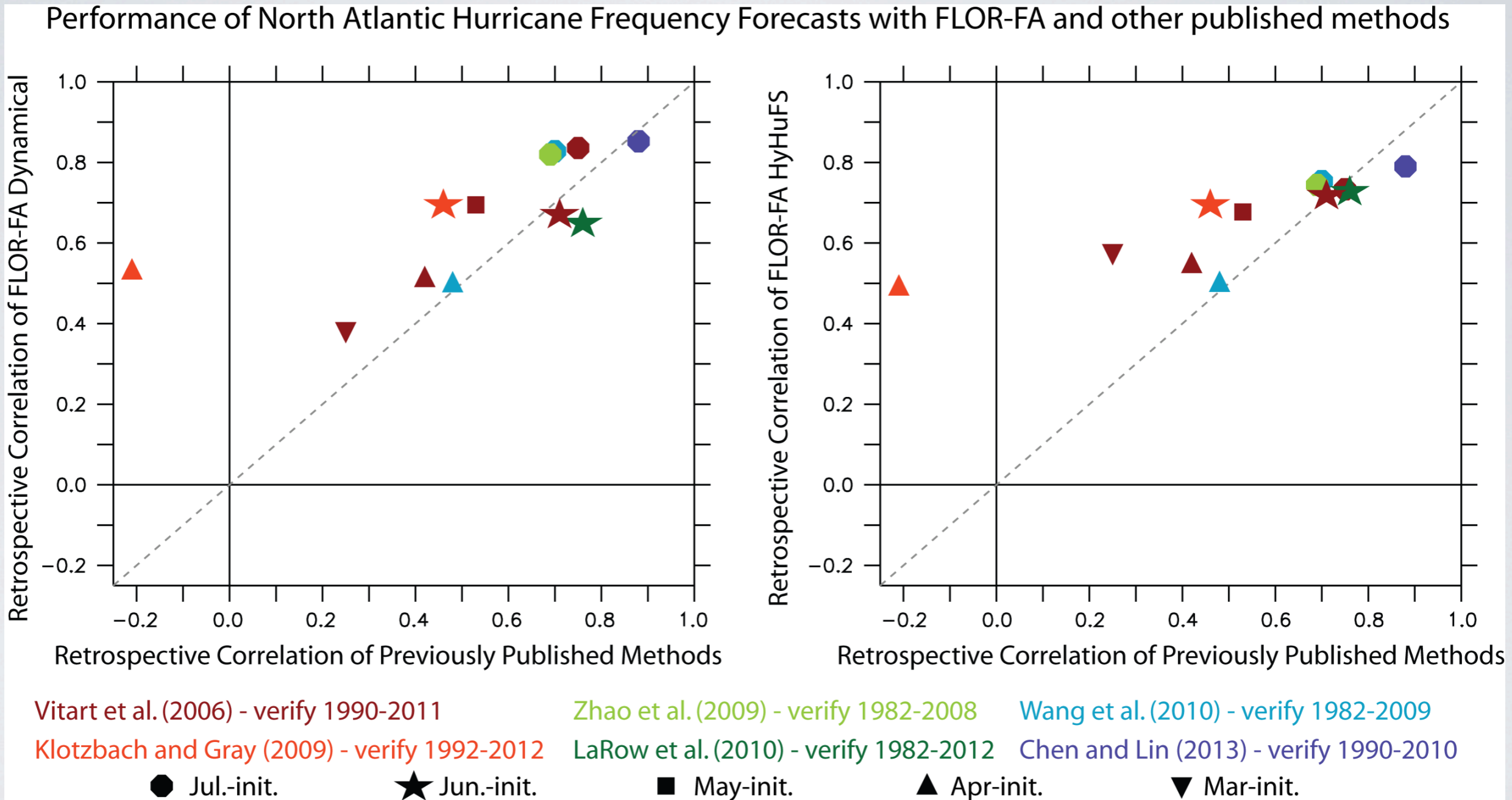
100 days of single ensemble of 10-m v from CM2.5-FLOR initialized 1-Aug-2005



4xdaily 1-Aug through 8-Nov 2005

FLOR-FA is among best NA hurricane seasonal prediction systems (symbol above diagonal: FLOR-FA nominally 'better')

FLOR-FA ↑

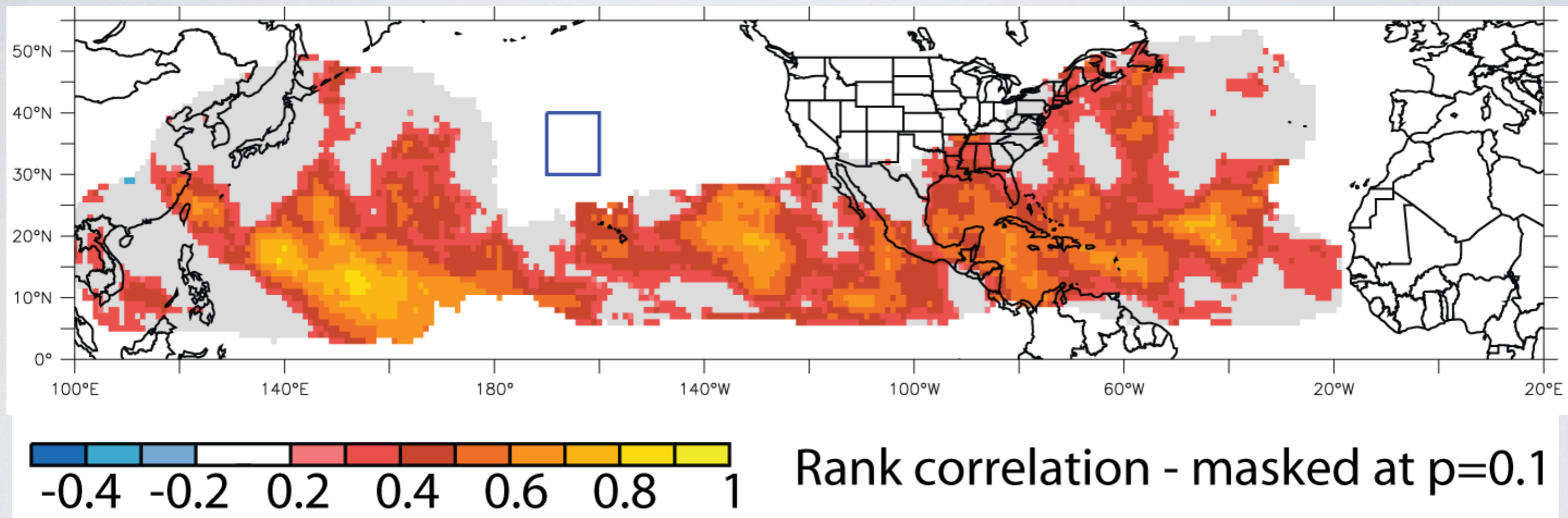


Other systems →

Vecchi et al. (2014)

Can we reliably predict statistics of storms more regionally than “basin-wide” number?

GFDL-FLOR 1981-2012 1-July Initialized Forecasts for July-December

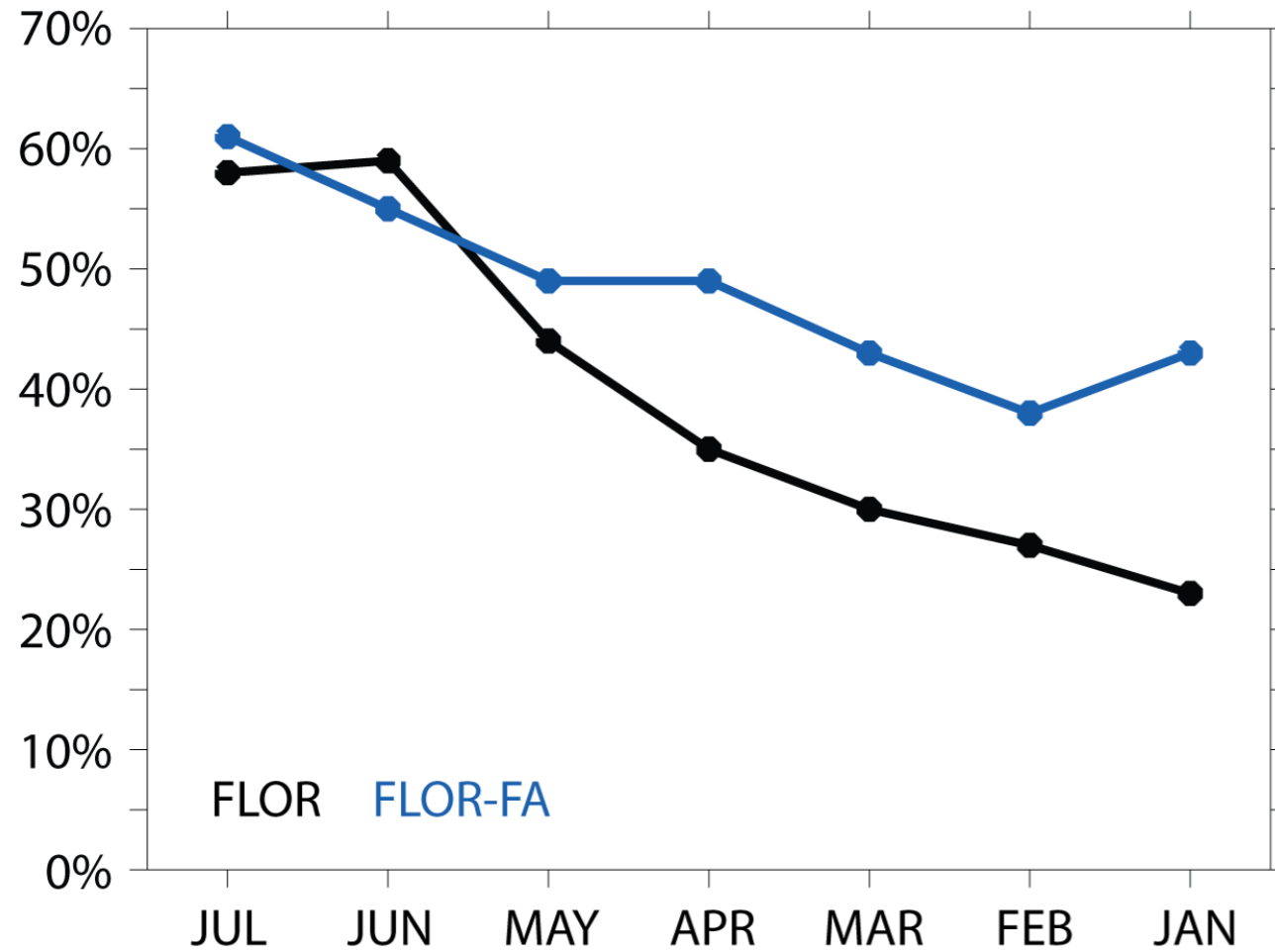


Rank correlation: Can experimental FLOR forecasts distinguish years with many and few storms passing within $10^\circ \times 10^\circ$ of a point.

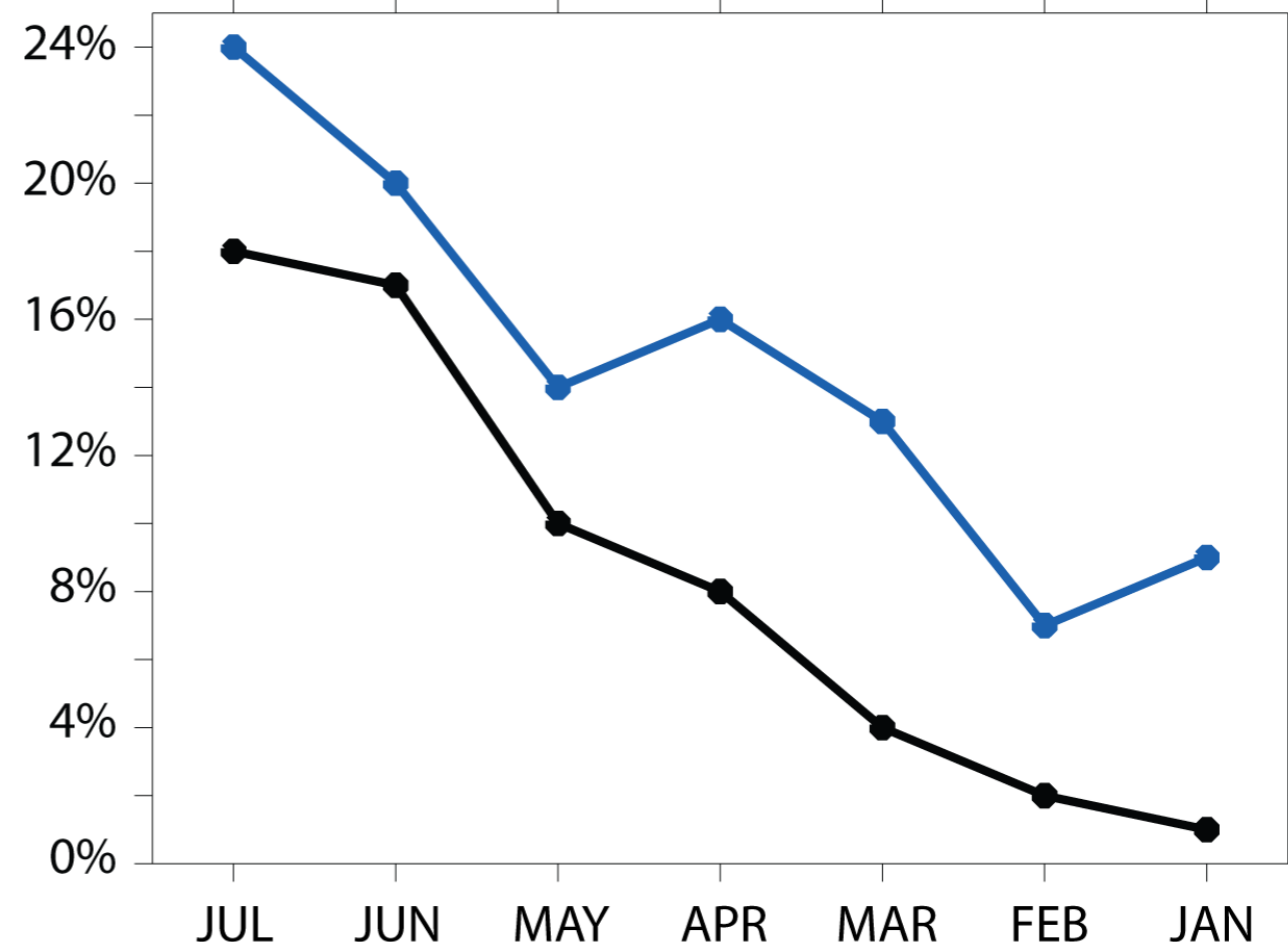
Vecchi et al. (2014, submitted)

FLOR-FA outperforms FLOR at predictions of regional (and basinwide) TC activity – particularly at long leads

(a) Percentage of TC areas with significant rank correlation



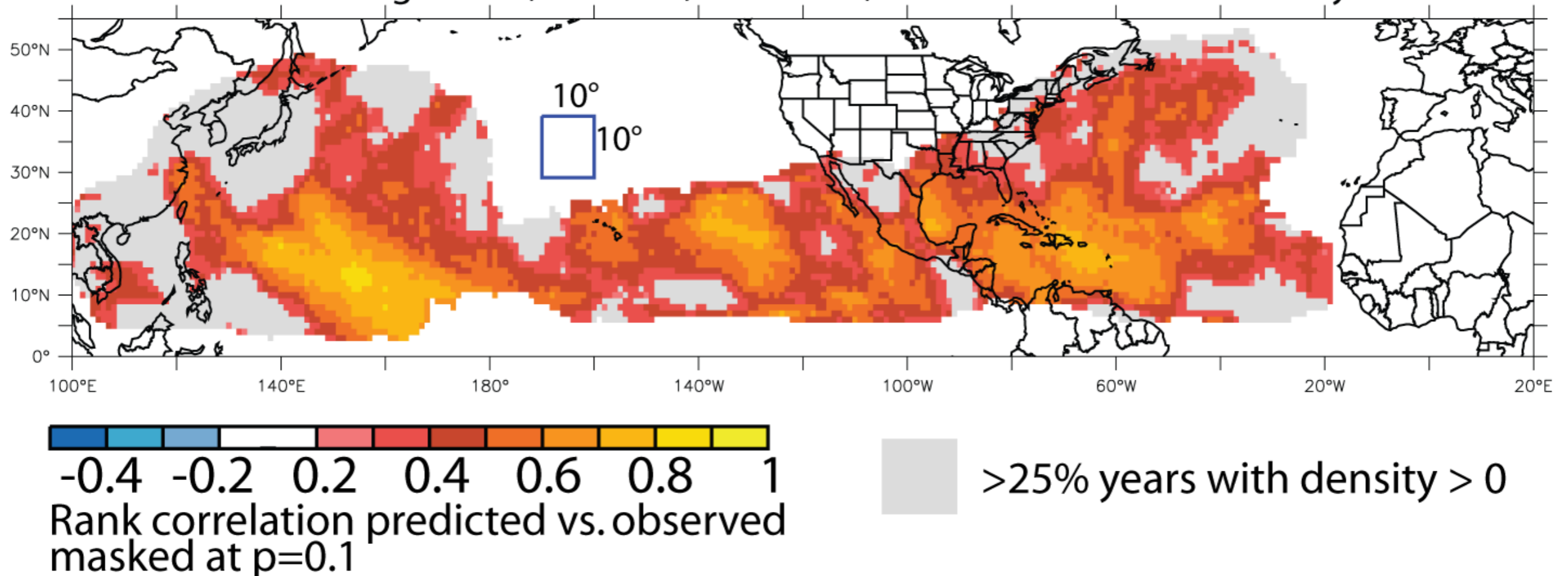
(b) Percentage of TC areas with rank correlation > 0.5



Increasing ensemble size from 12 to 48 improves regional TC predictions

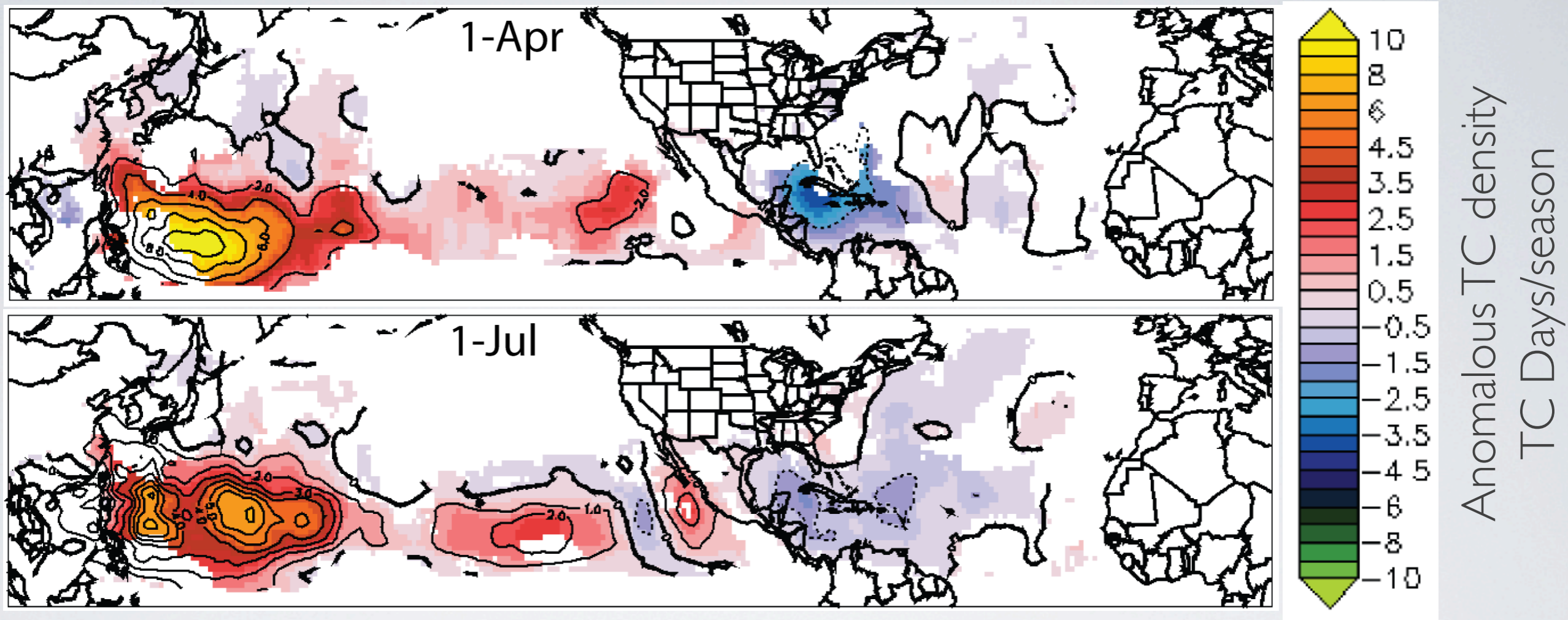
Ensemble Size Impact on 1981-2011 Predictions of Regional TC Activity

48-Member Average FLOR, FLOR-FA, FLOR-A06, FLOR-FA.05 Initialized 1-July



***EXPERIMENTAL RESEARCH PRODUCT – NOT AN OFFICIAL OUTLOOK ***

Experimental seasonal TC density forecasts with GFDL-FLOR-FA
(Vecchi et al. 2014, J. Clim. in press)

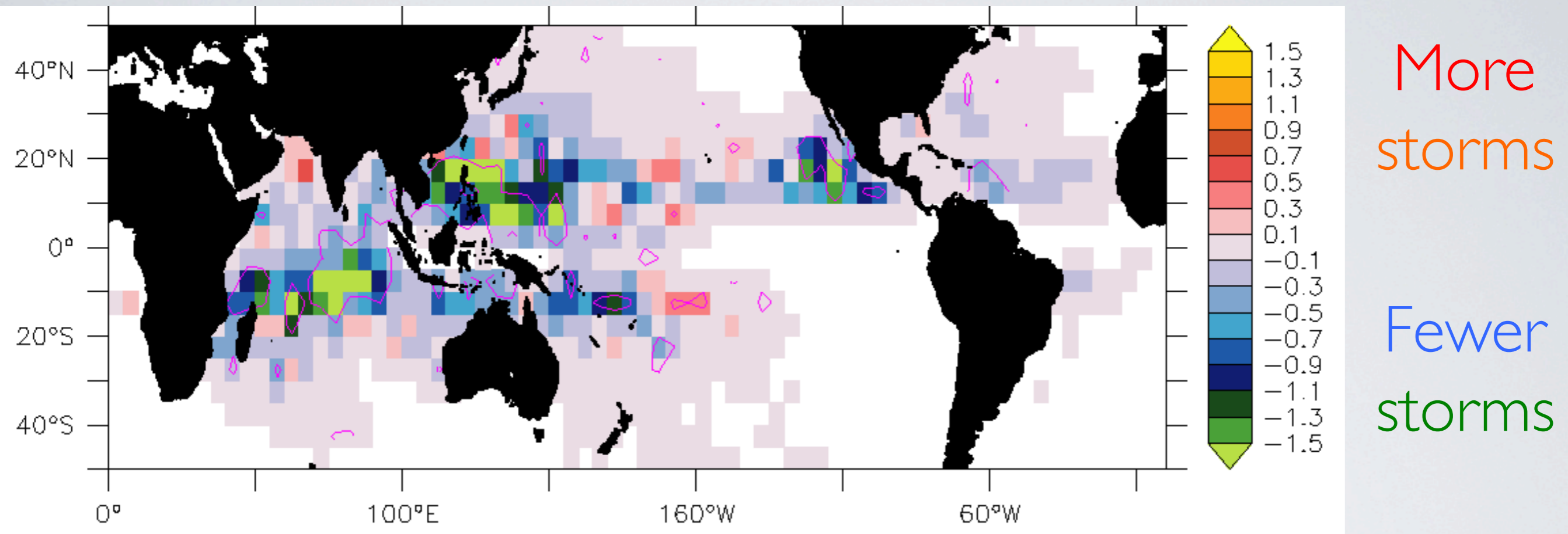


Forecasts of 2014 TC density anomaly with GFDL-FLOR-HAD13 initialized 1-April-2014 and 1-July 2014.

Contour: all values

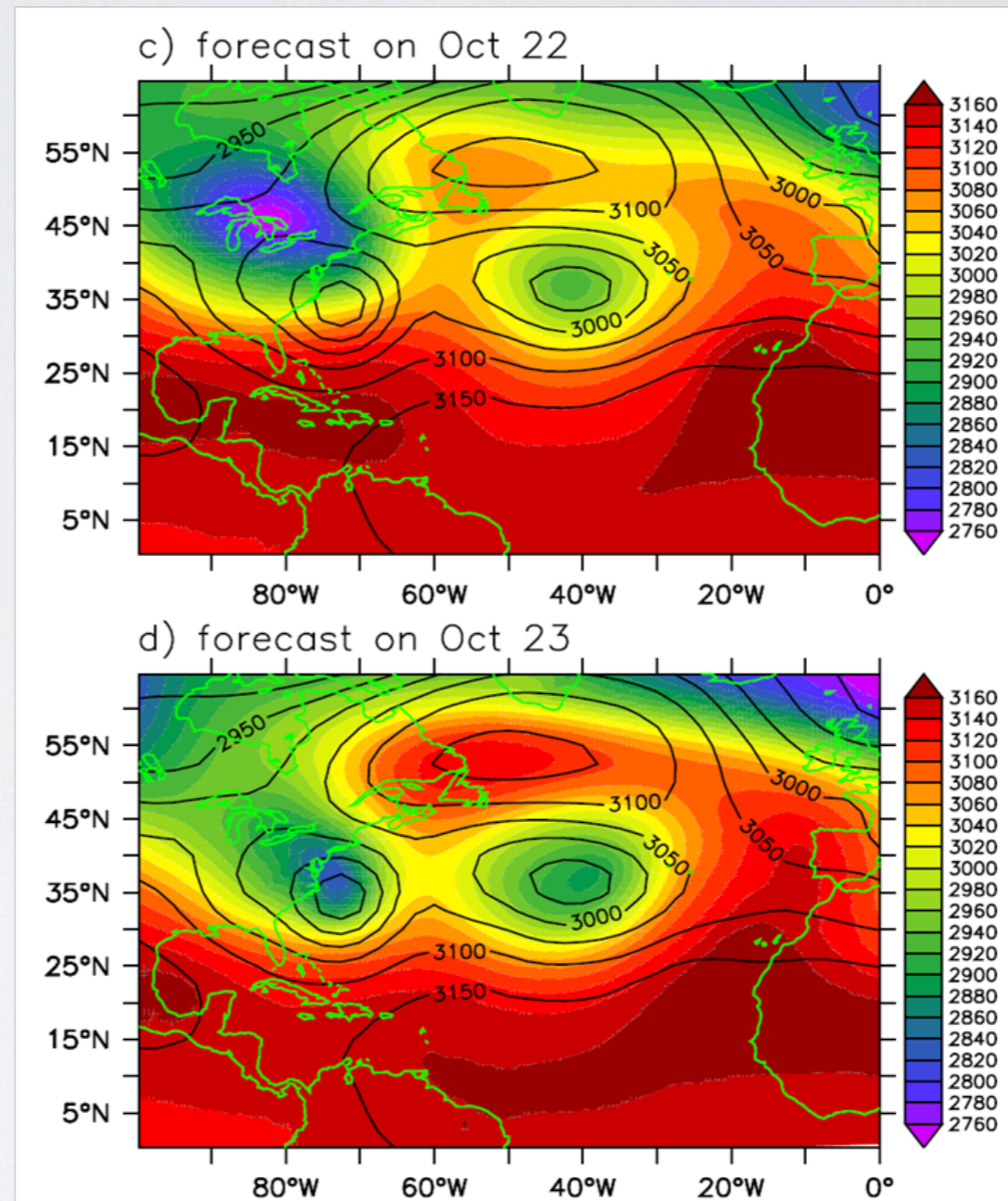
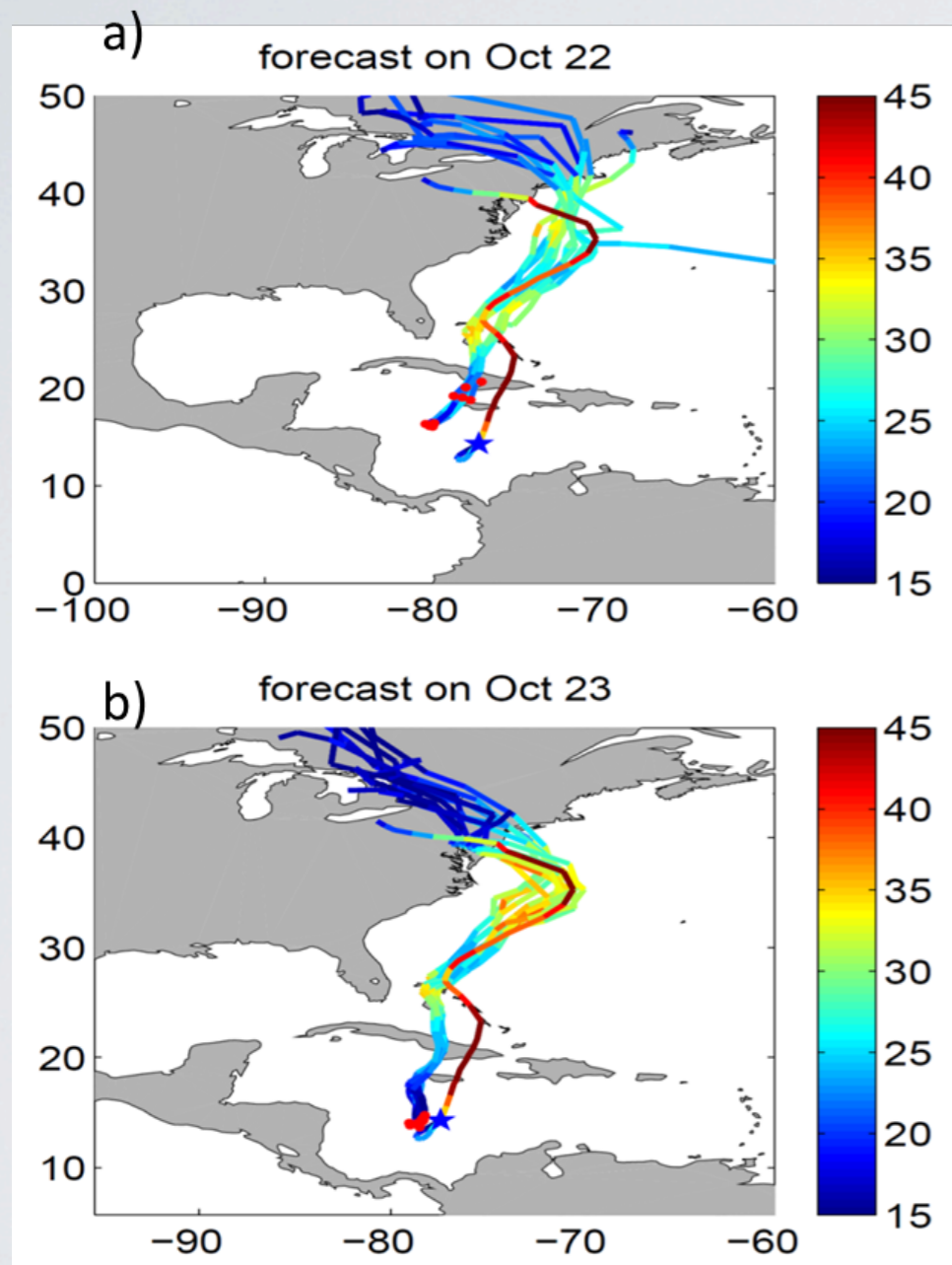
Shade: locations with significant retrospective correlation

Towards seamless (or “lightly stitched”) weather-to-centennial TC changes in high-resolution global coupled models



(Kim et al. 2014)

Seamless predictions: 5-7 days forecasts of Sandy with GFDL coupled model similar to FLOR



Xiang et al. (2014, MWR, in press)

Forecasts initialized 7 & 8 days before landfall capture track

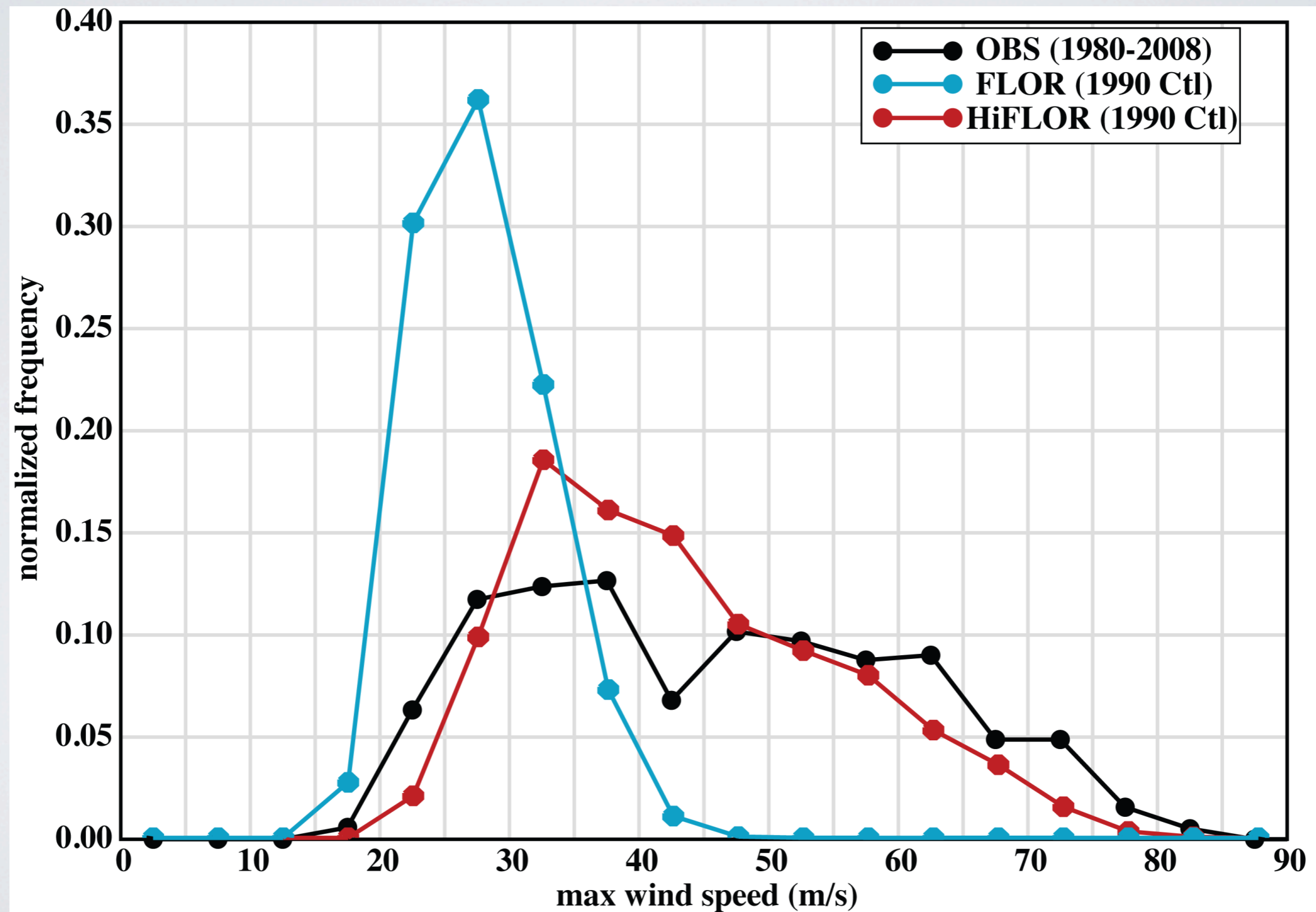
Summary

- Increased atmospheric and land resolution, and better land model:
Yields improved forecasts of large-scale climate
Enables simulation and forecasts of regional climate and extremes
- Skillful seasonal predictions of TC activity at regional scales appear feasible
Large (many 10s) ensembles appear desirable
- Flux adjustment improves simulation and seasonal prediction of regional and climate extremes.
FA adds one season to skill in regional TC prediction
For what problems is FA a net negative?

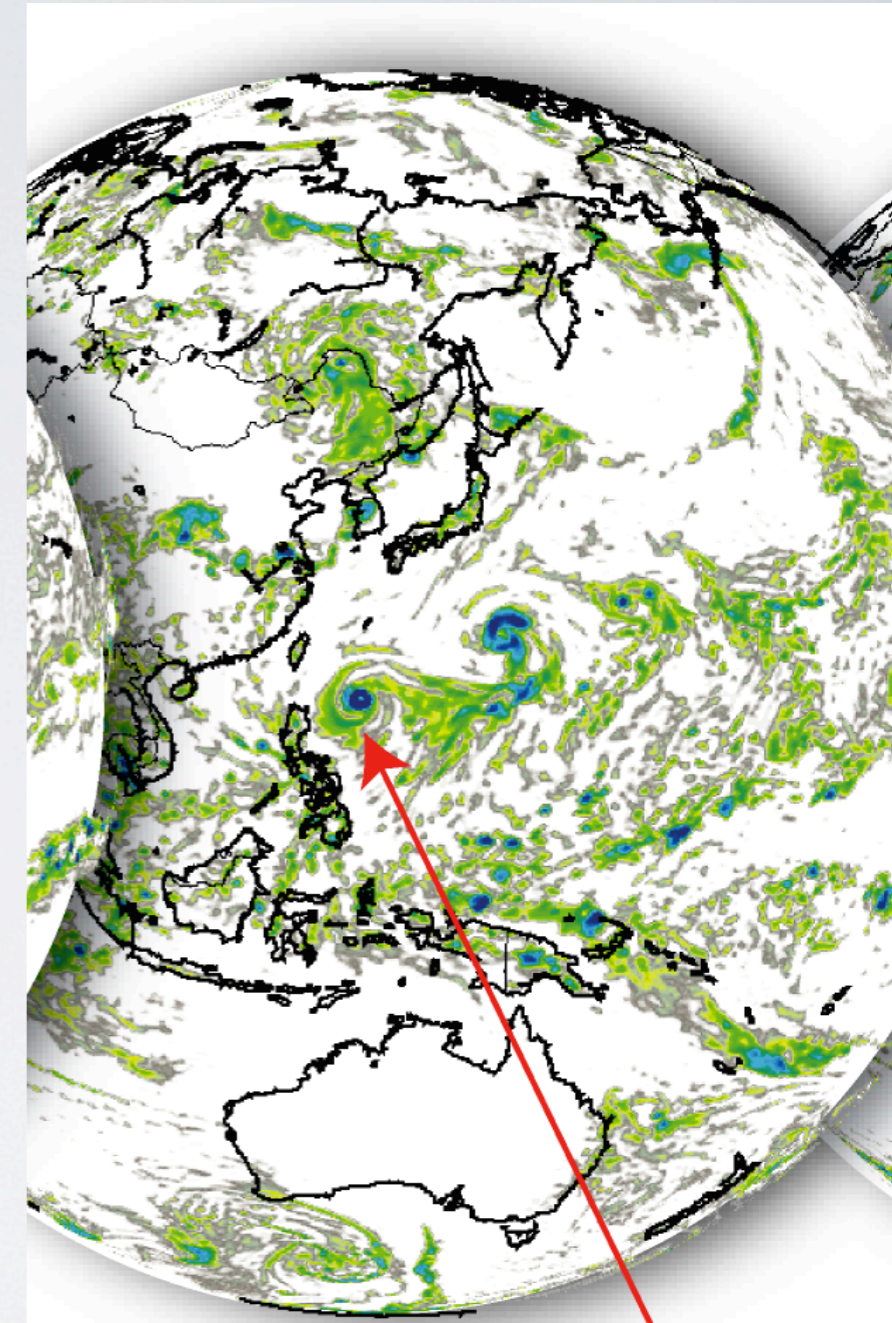
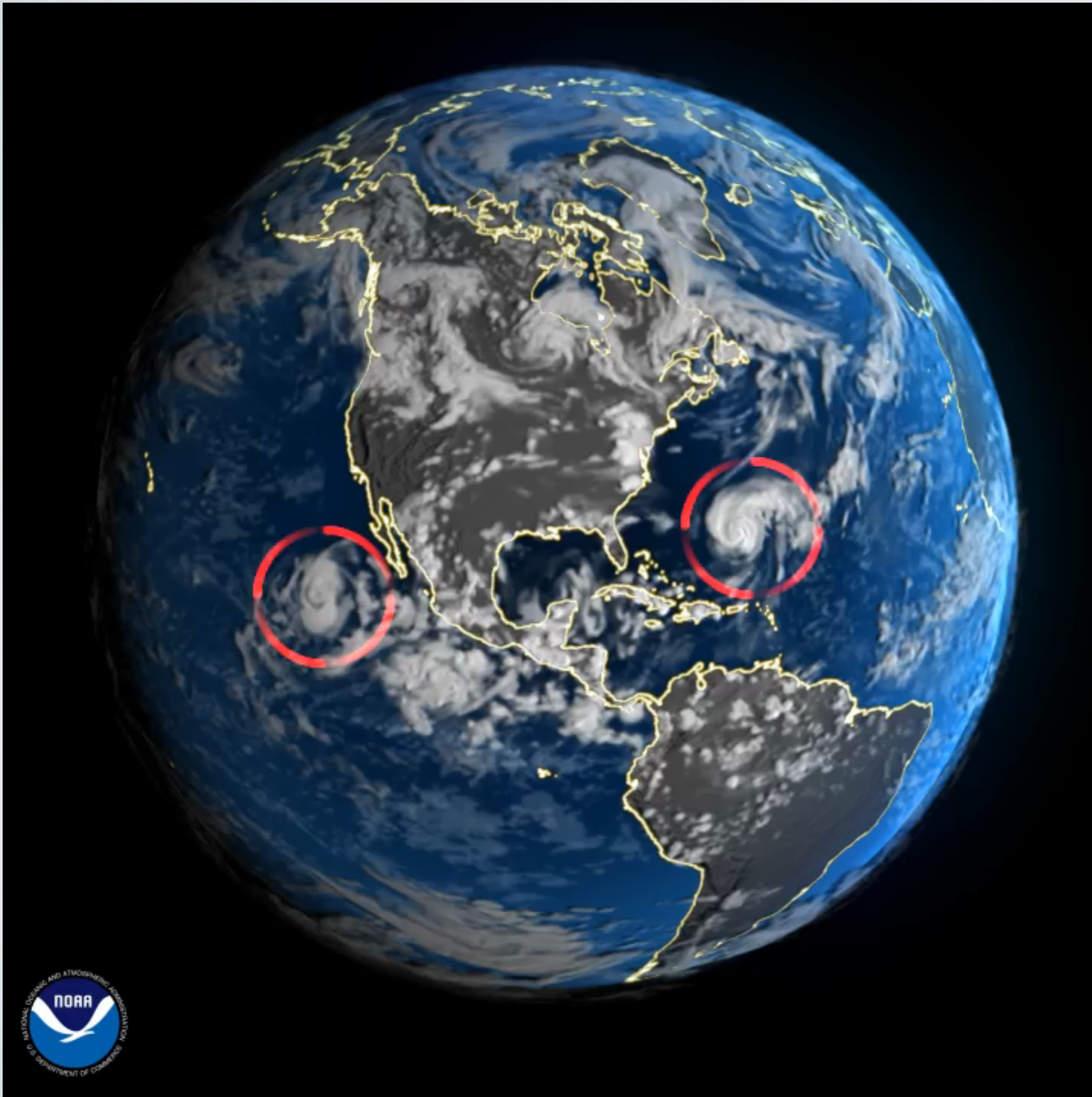
Next Steps

- Higher resolution to get to intensity

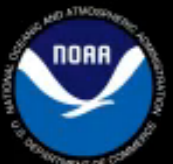
HiFLOr (25km version of FLOr)



HiFLOR: doubling atmospheric resolution of FLOR (cost 6x) allows us model to simulate Cat. 4-5 TCs (most destructive storms)

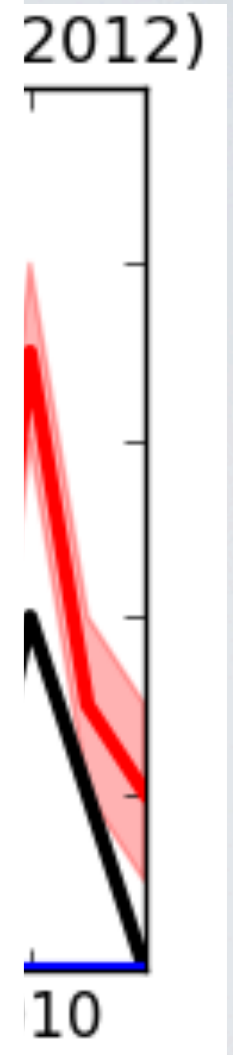
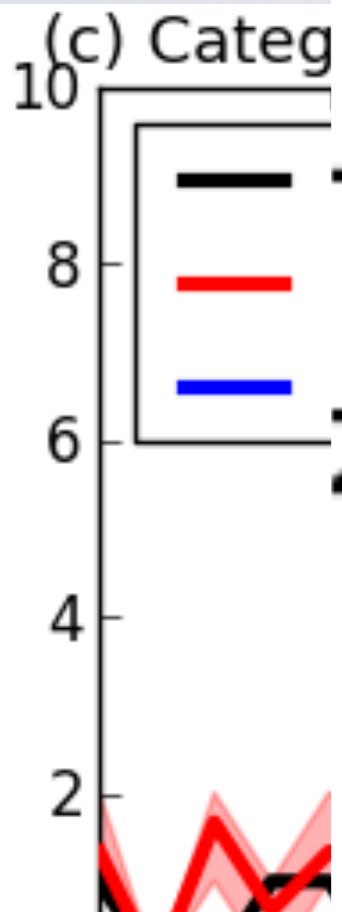
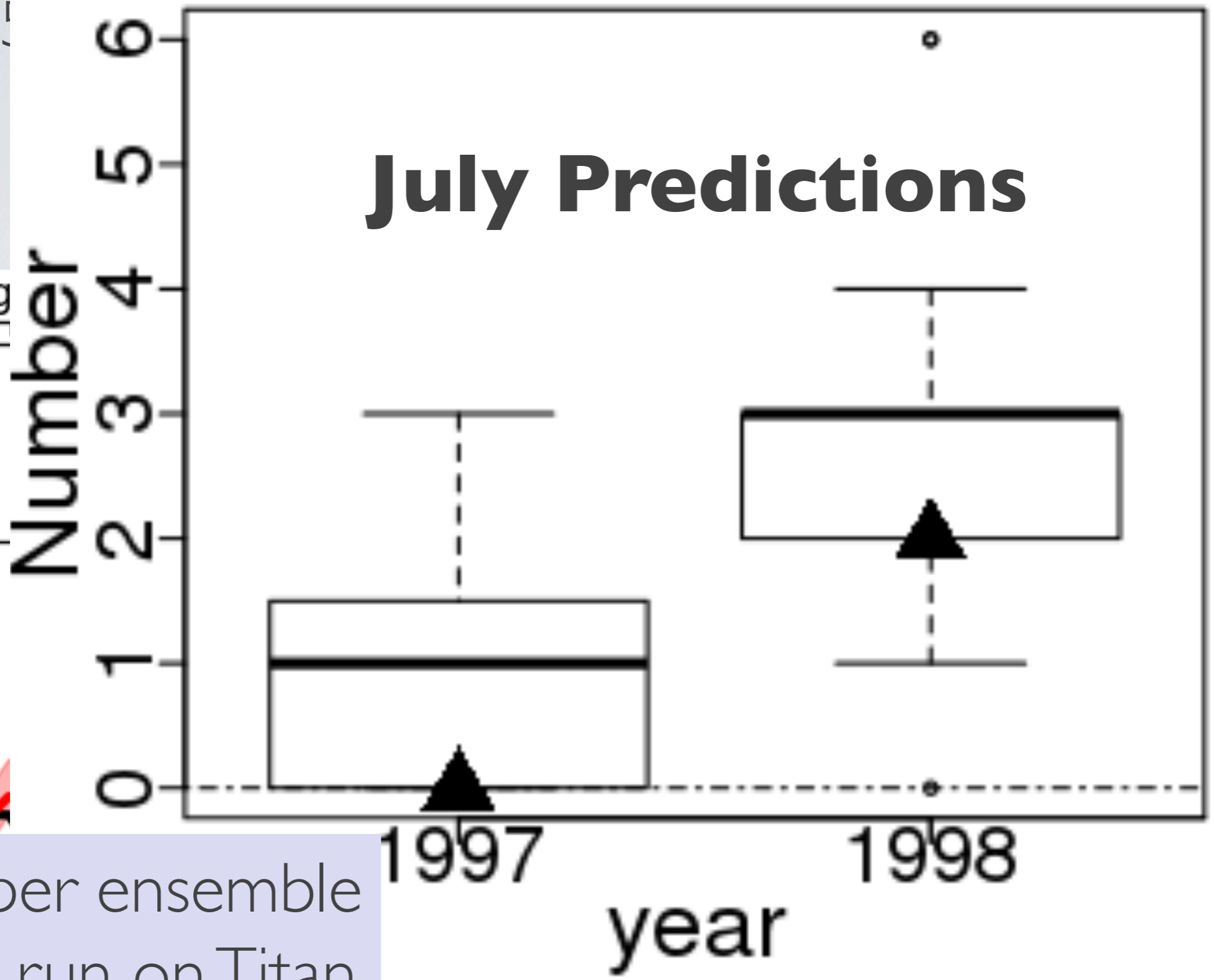


10-Aug.: Cat. 5 Typhoon
(158 knot winds)



HiFLOR
Cat. 4-5

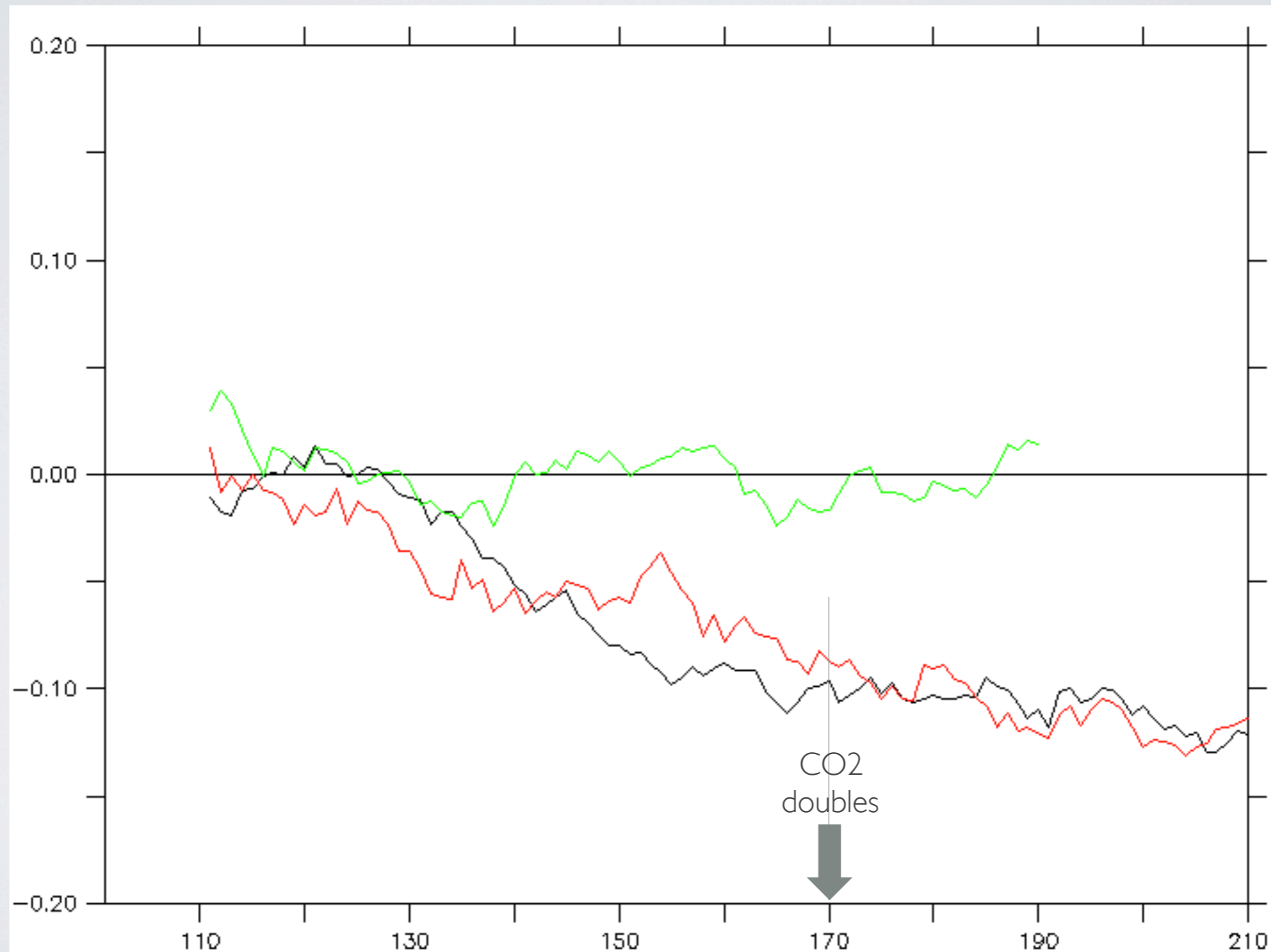
(i) C45 Hurricane (NAT)



36-member ensemble forecasts run on Titan (175,968 processors)

Global TC frequency decrease in response to 2xCO₂ in 0.5° FLOR and FLOR-FA
no change in 0.25° HiFLOR – why?

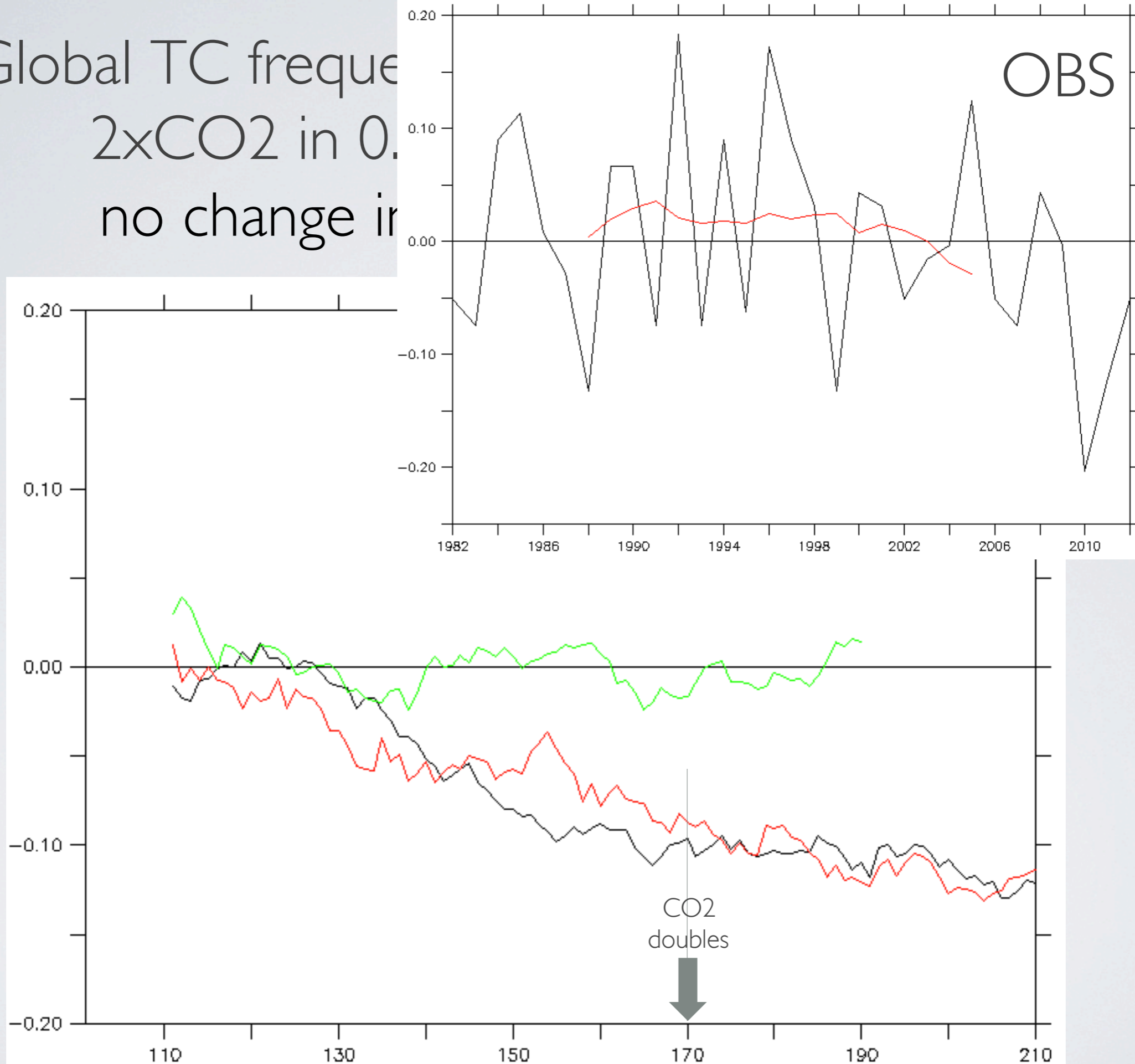
Fractional change in global TC #



Global TC frequency
2xCO₂ in 0.
no change in

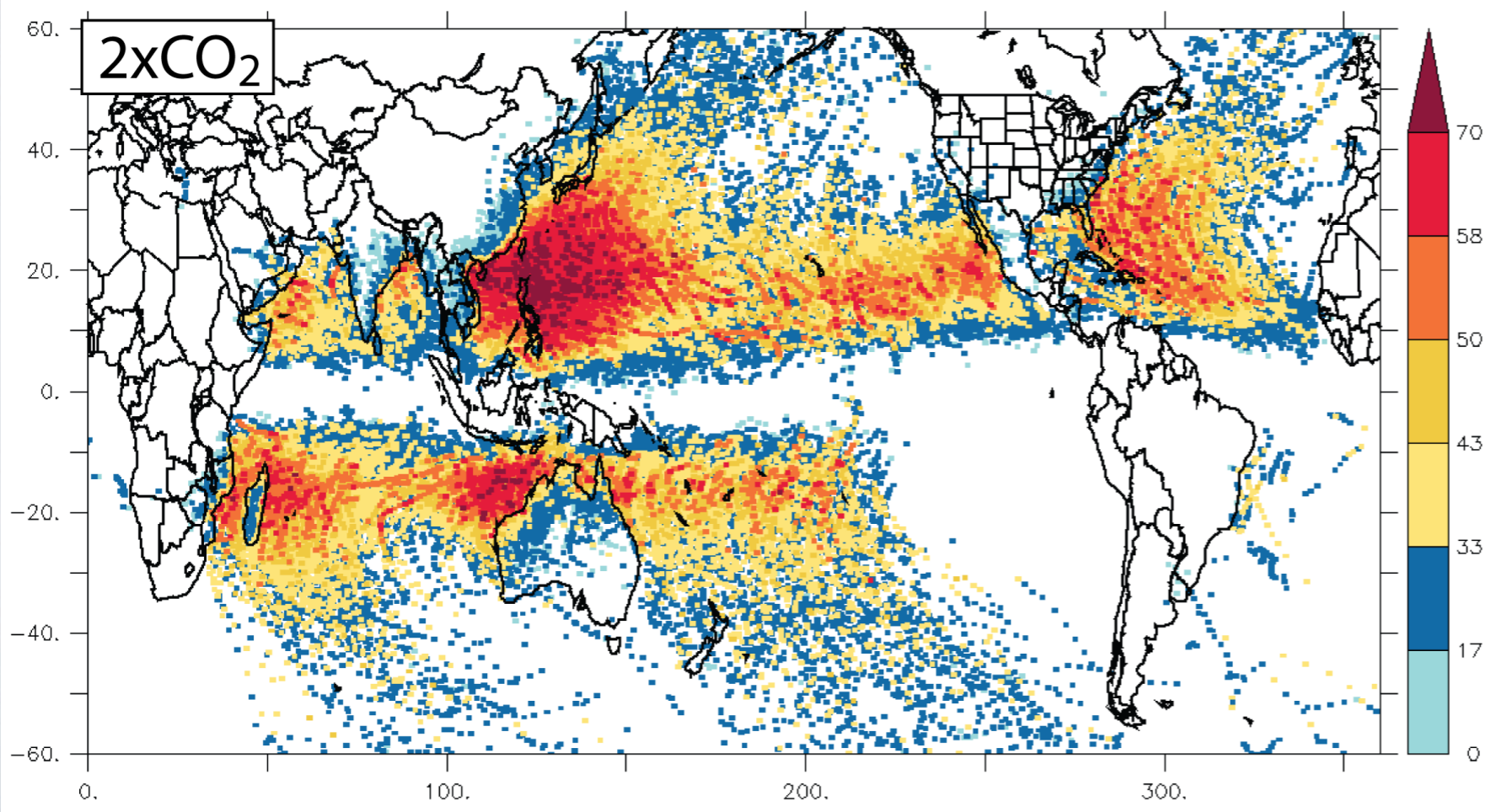
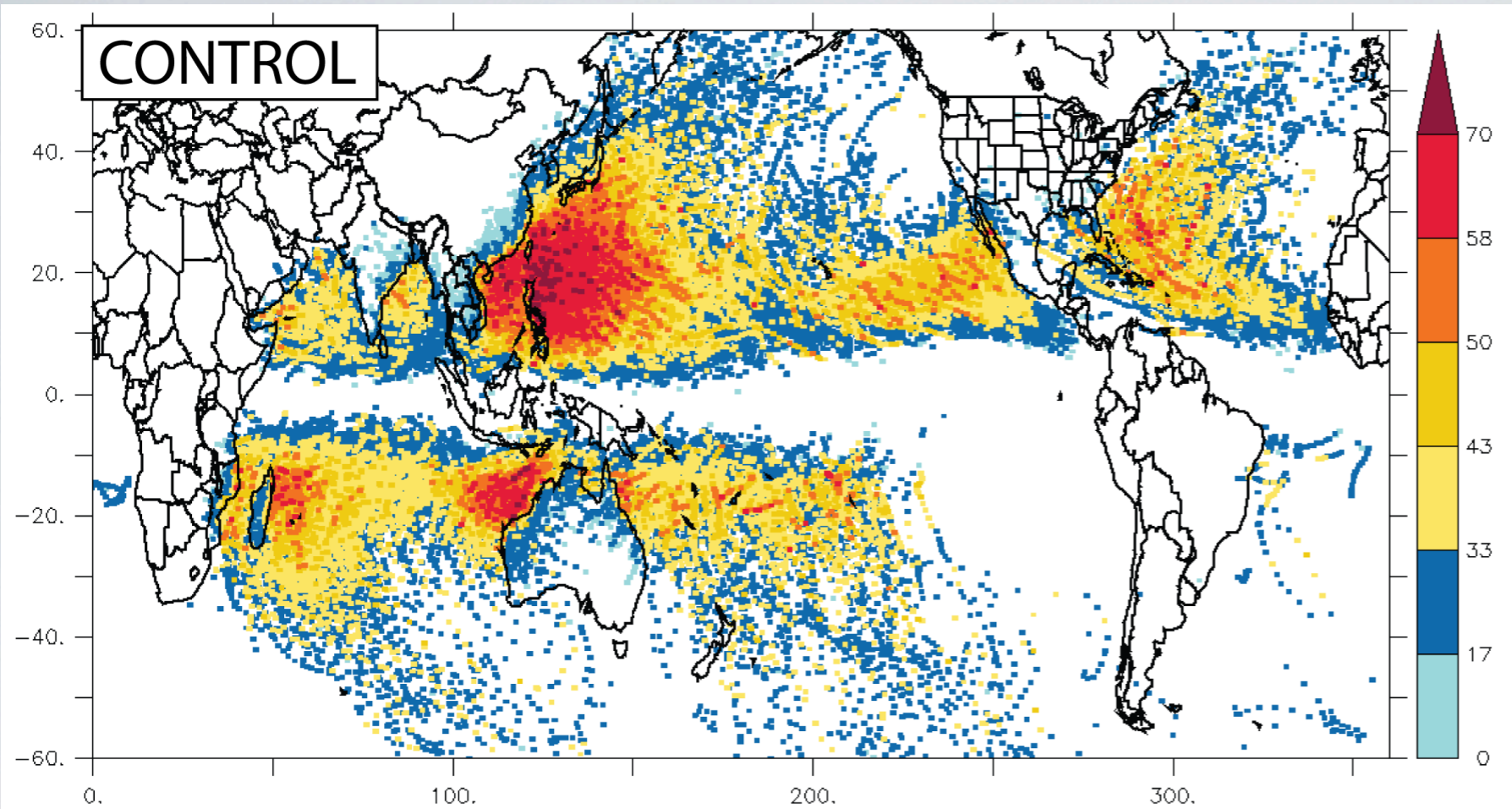
OBS

Fractional change in global TC #



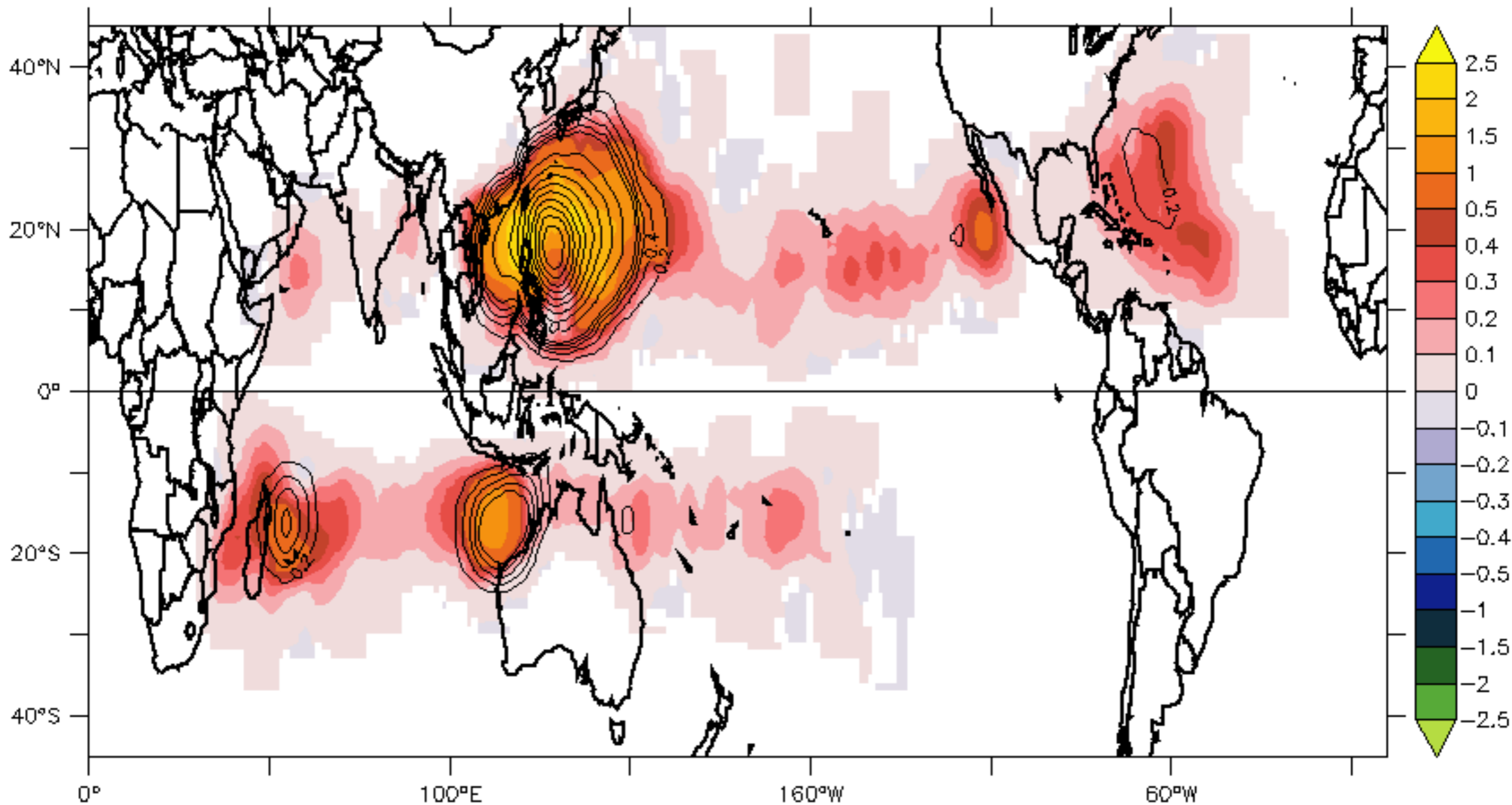
Year

Vecchi et al. (2015, in prep.)



Increase in
intensity from
CO₂ doubling
in hiFLOR

Density increase of Cat 3-4-5s in all basins



Next Steps

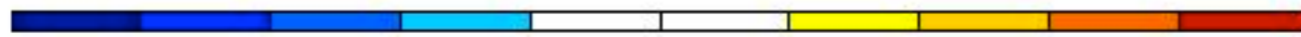
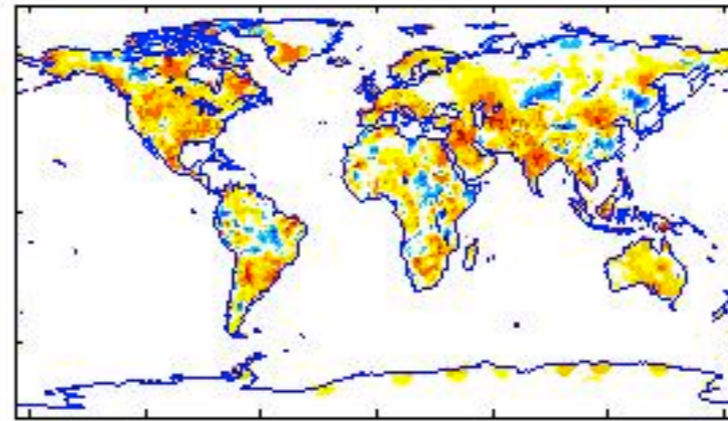
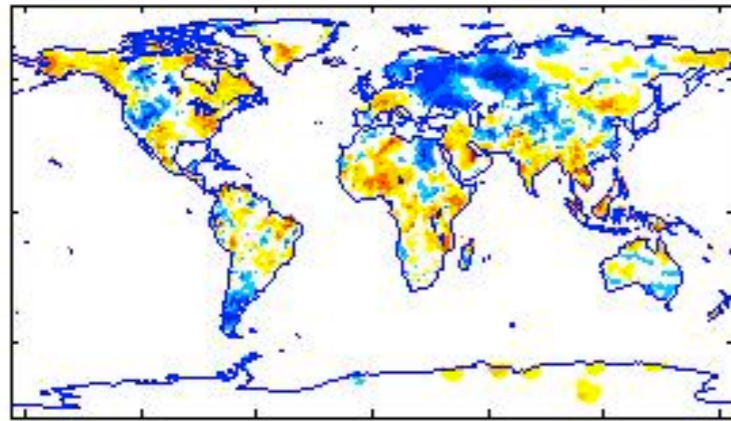
- Higher resolution to get to intensity
- Atmospheric initialization

Ocean Init

Atmosphere & Ocean Init

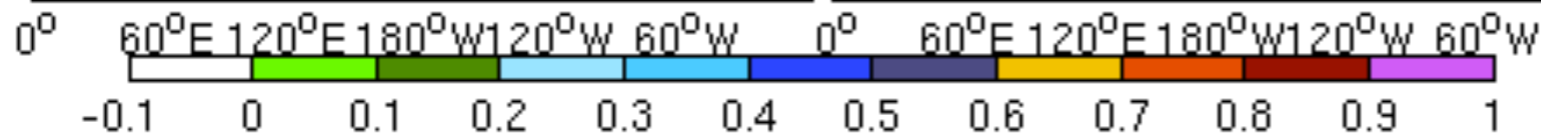
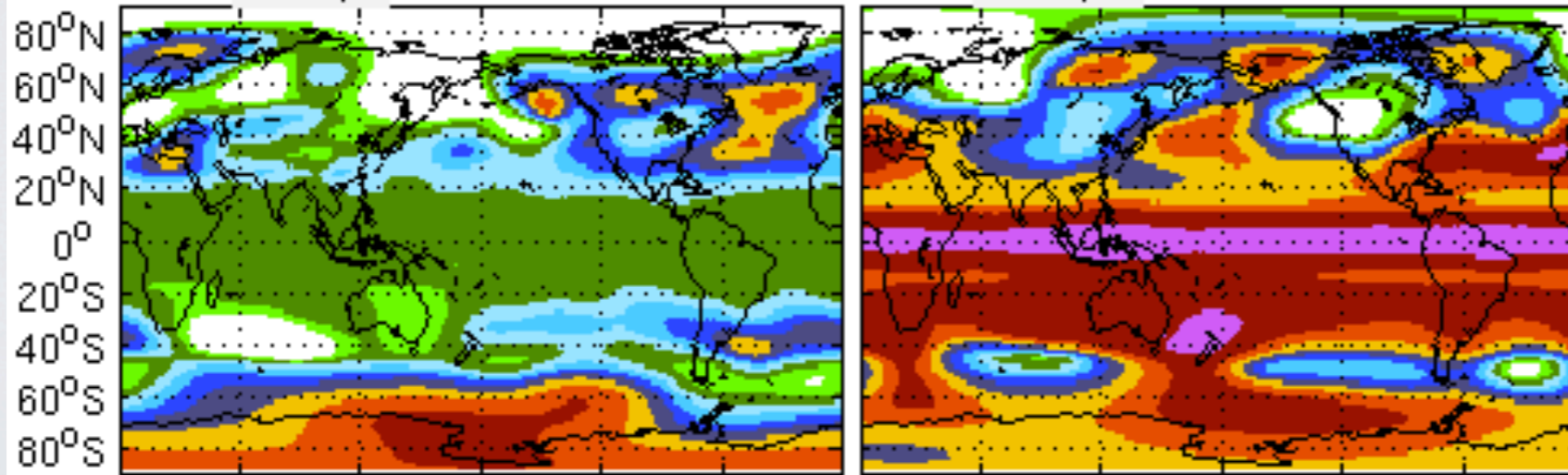
τ_{ef} corr of JJA, phase 1 (I.C. Jun.)

τ_{ef} corr of JJA, phase 2 (I.C. Jun.)



SON p1

SON p2



June-August
Surface temperature

Analysis: Liwei Jia

September-November
50hPa heights

Analysis: Xiaosong Yang

Next Steps

- Higher resolution to get to intensity
- Atmospheric initialization
- Assimilation built on FLOR:
Goal: initial state in better balance (reduce drift)
Computationally expensive

Next Steps

- Atmospheric initialization
- Higher resolution to get to intensity
- Assimilation built on FLOR
- Make predictions explicitly probabilistic :
How do we build an error model?

Next Steps

- Atmospheric initialization
- Higher resolution to get to intensity
- Assimilation built on FLOR
- Make predictions explicitly probabilistic
- Higher “top”: what is the role of stratospheric processes in the variation/change and prediction of extremes?

References

- Delworth, T. & coauthors (2012): Simulated climate and climate change in the GFDL CM2.5 high-resolution coupled climate model. *J. Climate* doi:10.1175/JCLI-D-11-00316.1
- Jia, L. & coauthors (2014): Improved Seasonal Prediction of Temperature and Precipitation over Land in a High-resolution GFDL Climate Model. *J. Climate* (submitted)
- Kim, H.-S., G.A. Vecchi, T.R. Knutson, W.G. Anderson, T.L. Delworth, A. Rosati, F. Zeng, M. Zhao (2014): Tropical Cyclone Simulation and Response to CO2 Doubling in the GFDL CM2.5 High-Resolution Coupled Climate Model. *J. Climate* (submitted).
- Knutti, R., D. Masson, & A. Gettelman (2013): Climate model genealogy: Generation CMIP5 and how we got there. *Geophys. Res. Lett.*, doi:10.1002/grl.50256
- Vecchi, G.A. & coauthors (2014): On the Seasonal Prediction of Regional Tropical Cyclone Activity. *J. Climate* (in press)
- Vecchi, G.A., & G. Villarini (2014): Next Season's Hurricanes. *Science*, doi:10.1126/science.1247759