

Understanding future ENSO risks

presented by

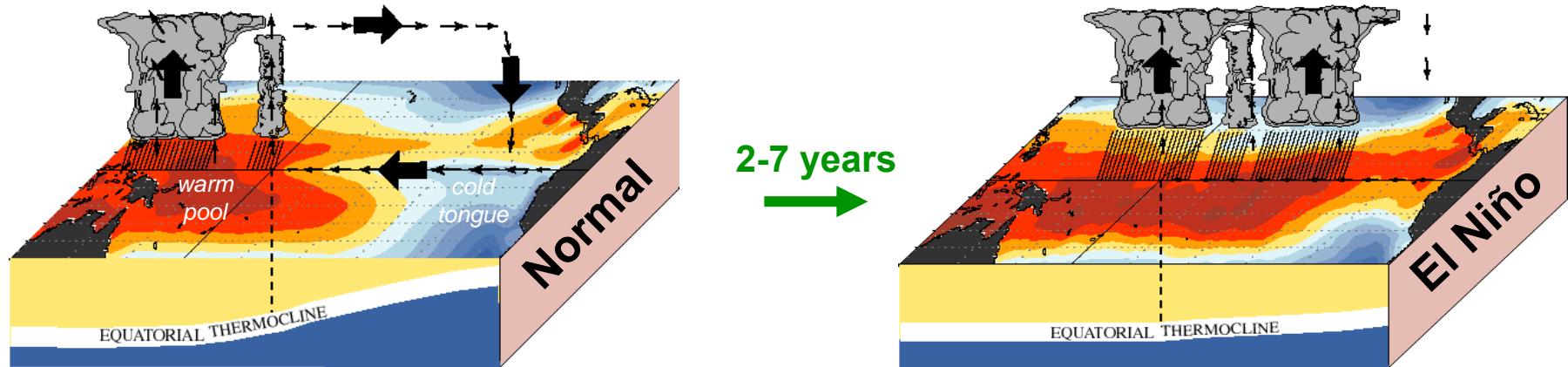
Andrew Wittenberg

Geophysical Fluid Dynamics Laboratory Review

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ENSO: Earth's dominant year-to-year climate signal



Global impacts:

- **weather & climate**, extremes, natural disasters
- **ecosystems**, fisheries, agriculture, forests
- **economies**: commerce, transportation, energy, water, food, health

How vulnerable are we to ENSO?

- sources & limits of seasonal-to-decadal **predictability**
- **natural vs. anthropogenic risks**
- changes in **dynamics** vs. **impacts**
- short, gappy, nonstationary observing system → **models crucial**
- coupling & scale interactions → **key test** for models

GFDL: Strongly positioned in the ENSO community

ENSO simulations among the best in the world

- **realistic** ENSO behavior: patterns, spectra, mechanisms, teleconnections
- **stable** multi-millennial control runs, large ensembles
- **diverse** model tools, complementary **assimilation & forecast** systems

Wittenberg et al. (JC 2014; JAMES 2018); Vecchi et al. (JC 2014); Wittenberg (CV 2015); Choi et al. (JC 2015); Delworth et al. (JC 2015); Krishnamurthy et al. (JC 2015, 2016; CD 2019); Griffies et al. (JC 2015); Jia et al. (JC 2015); Yang et al. (JC 2015; CD 2018); Ward et al. (ERL 2016); Zhang et al. (JC 2016); Ray et al. (JC 2018ab); Zhao et al. (JAMES 2018a); He et al. (JC 2018); Park et al. (GRL 2018); Held et al. (JAMES 2020); Johnson et al. (JC 2020); Delworth et al. (JAMES subm); Dunne et al. (in prep)

Groundbreaking ENSO research & collaborations

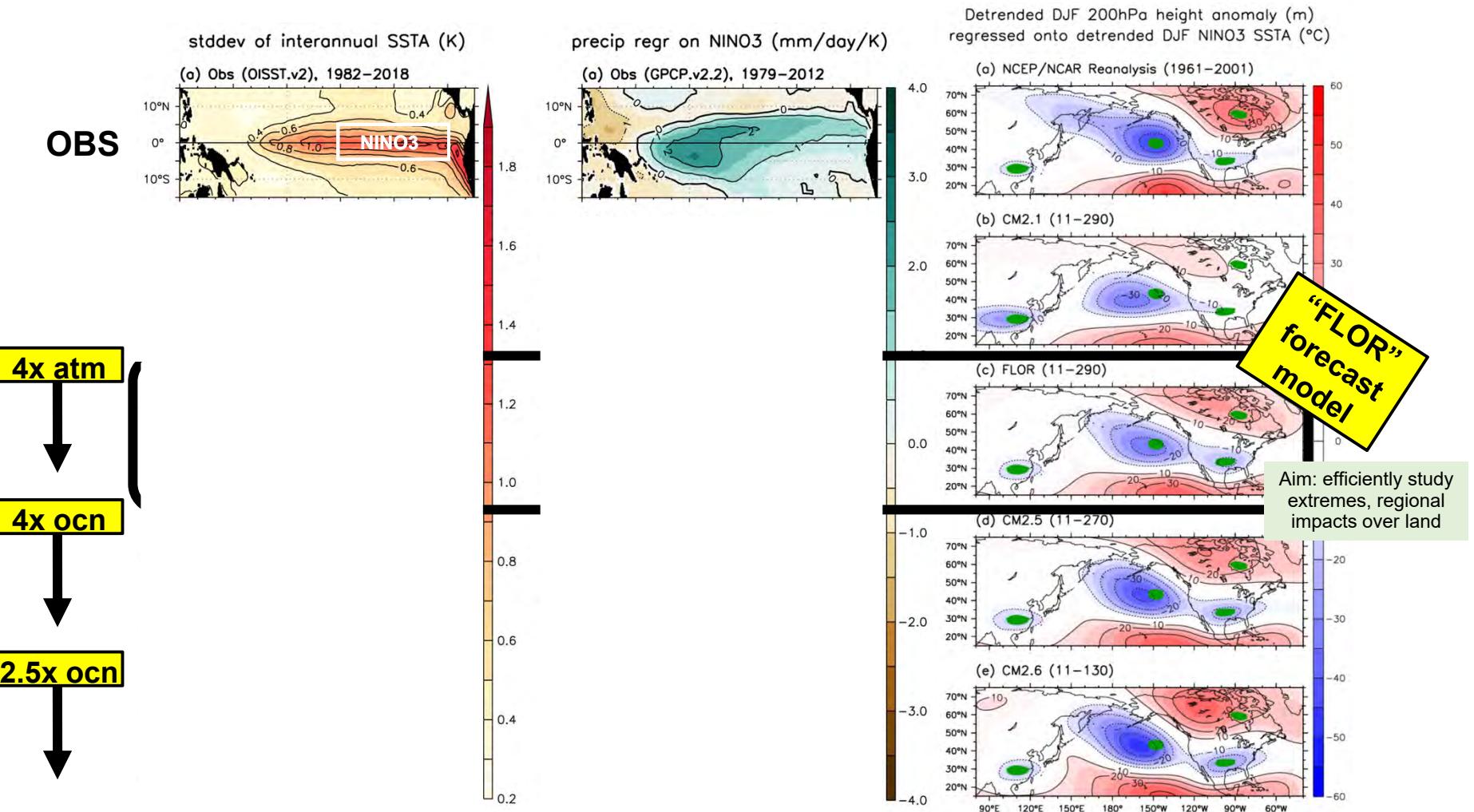
- **Diversity, sensitivities & trends**, mechanisms
- **Predictability**, forecasts, observing system design
- **Impacts** on hydroclimate, storms, extremes, ecosystems
- **Community metrics, emergent constraints**, model hierarchy

60+ peer-reviewed papers related to ENSO during 2014-19, with 2300+ citations (Google Scholar, Sept. 2019)

NOAA & U.S. collaborations: ESRL, AOML, PMEL, NCEP, NDBC, CPO; U.S. CLIVAR Working Group on ENSO Diversity.
International: CLIVAR (Research Focus on ENSO; Working Group on ENSO Metrics; Pacific Region Panel); CMIP; IPCC; NMME; TPOS2020.

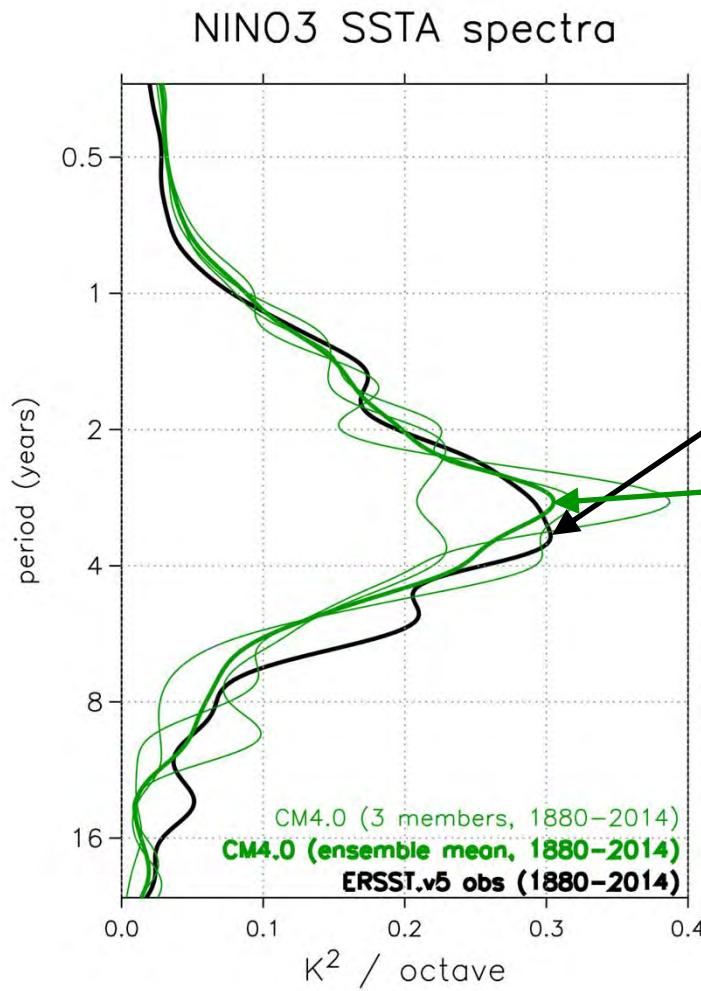
Collaborative studies: Lee et al. (GRL 2014, 2018; ERL 2016); Capotondi et al. (BAMS 2015; CV 2015); Erb et al. (JC 2015); Cravatte et al. (TPOS 2016); Guilyardi et al. (BAMS 2016); Zhang et al. (GRL 2016) Atwood et al. (CD 2017); Chen et al. (JC 2017); Graham et al. (CD 2014, 2017; JC 2015); L'Heureux et al. (BAMS 2017; WF 2019); Naiman et al. (JC 2017); Stuecker et al. (GRL 2017); Predybaylo et al. (JGRA 2017); Newman et al. (BAMS 2018); Ding et al. (JC 2018; GRL 2019); Timmermann et al. (Nature 2018); Chiodi et al. (GBC 2019); Kessler et al. (TPOS 2019); Vecchi et al. (CD 2019); Capotondi et al. (AGU 2020); Fedorov et al. (AGU 2020); Guilyardi et al. (AGU 2020); Predybaylo et al. (SA subm); Santidrian et al. (CC subm); Lee et al. (in prep); McGregor et al. (in prep); Power et al. (in prep); Stevenson et al. (in prep)

ENSO improvements with increasing resolution



Vecchi et al. (JC 2014; CD 2019); Jia et al. (JC 2015); Yang et al. (JC 2015); Wittenberg et al. (JAMES 2018); Ray et al. (JC 2018ab)

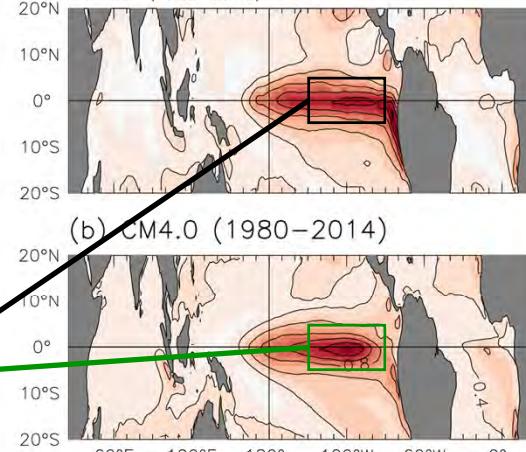
Improved ENSO patterns & spectra in CM4



surface temperature ($^{\circ}\text{C}$)
stddev of interannual variations

(a) OBS

OISST.v2 (1982–2016)

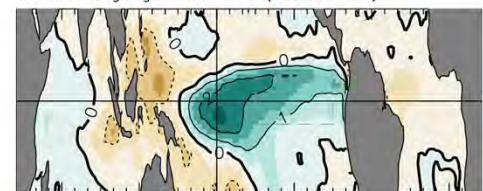


(b) CM4.0 (1980–2014)

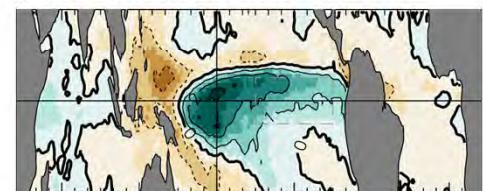
total precip (mm/day)
regressed on NINO3 SSTA ($^{\circ}\text{C}$)

(a) OBS

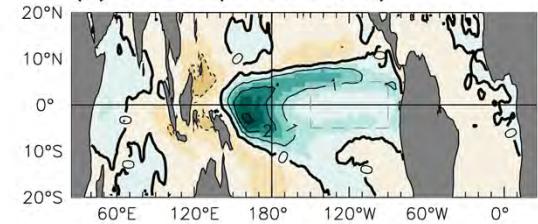
GPCP.v2.3 gauge + satellite (1980–2014)



(b) AM4.0 (1980–2014)



(c) CM4.0 (1980–2014)



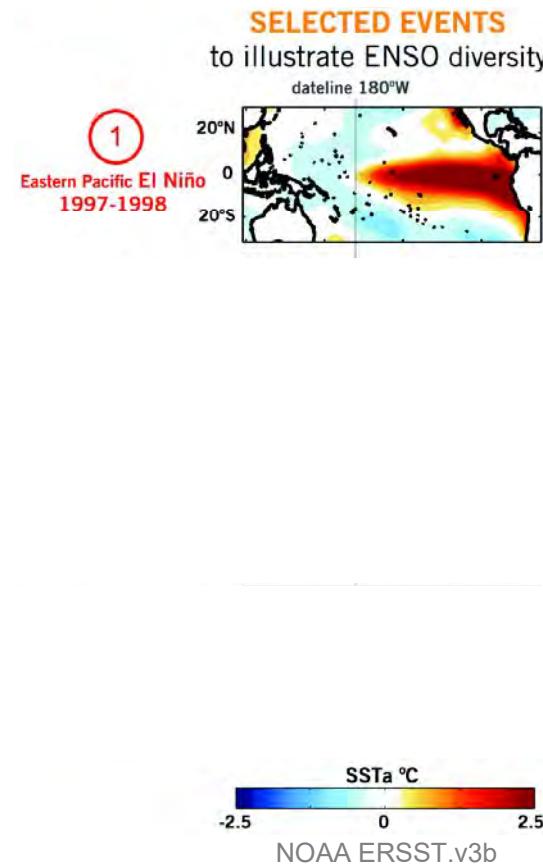
Better resolution
& comprehensiveness

→ New avenues for
research & applications

Zhao et al. (JAMES 2018a)
Held et al. (JAMES, in press)

ENSO diversity in observations

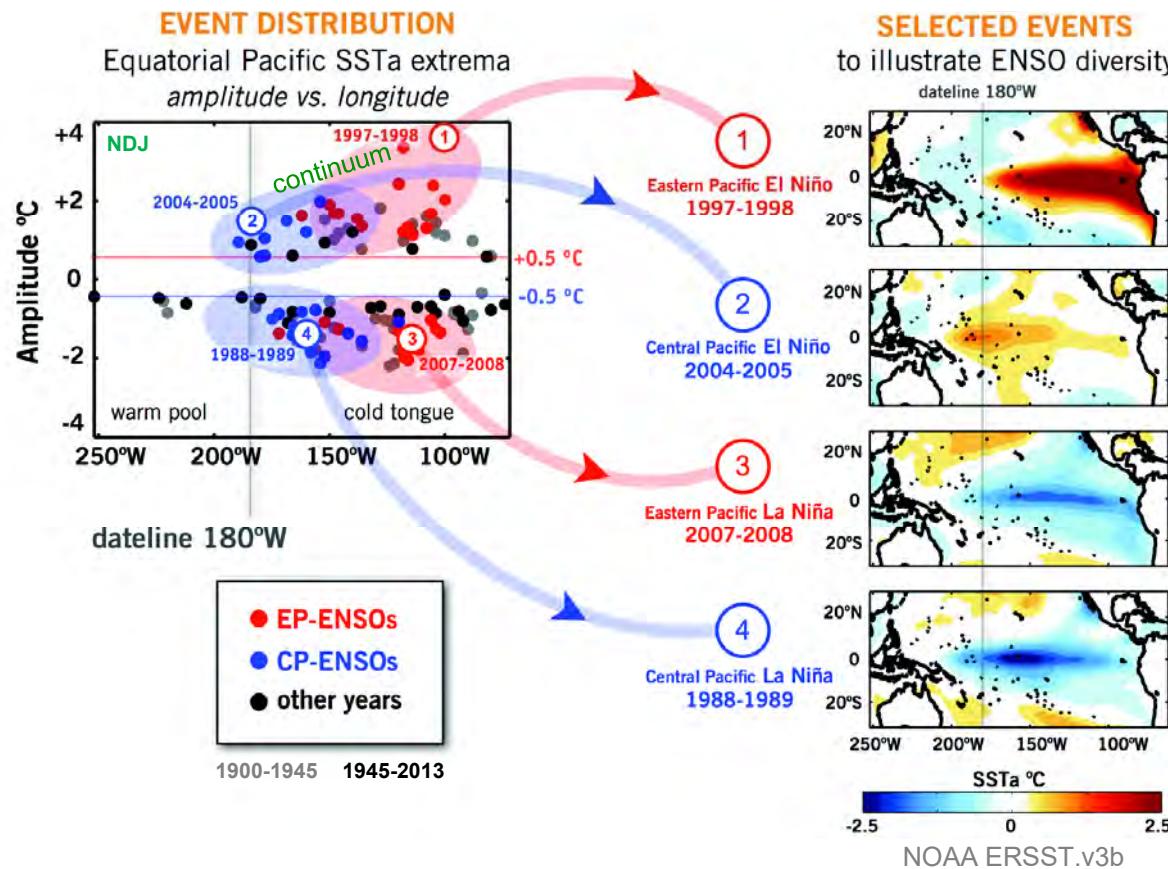
ENSO flavors have different dynamics & impacts



U.S. CLIVAR Working Group on ENSO Diversity: Capotondi, Wittenberg, et al. (BAMS 2015; AGU 2020)

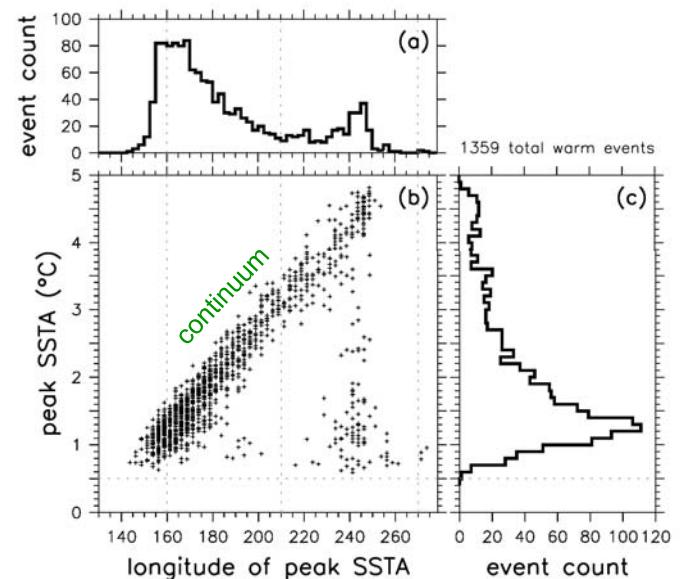
ENSO diversity in observations & models

ENSO flavors have different dynamics & impacts



GFDL CM2.1 simulation

Bivariate distribution of DJF El Niño SSTa peaks,
(4000yr CM2.1 Pctrl, averaged 5°S–5°N)

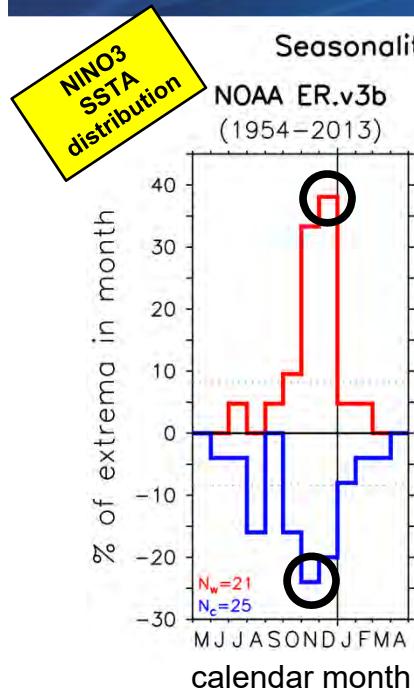


CM2.1 captured this diversity well

U.S. CLIVAR Working Group on ENSO Diversity: Capotondi, Wittenberg, et al. (BAMS 2015; AGU 2020)

Sources, impacts, predictability: Wittenberg et al. (JC 2014); Graham et al. (CD 2017); Chen et al. (JC 2017); Atwood et al. (CD 2017); L'Heureux et al. (BAMS 2017); Yang et al. (CD 2018); Timmermann et al. (Nature 2018); Johnson et al. (GRL 2019); Santidrian et al. (CC subm)

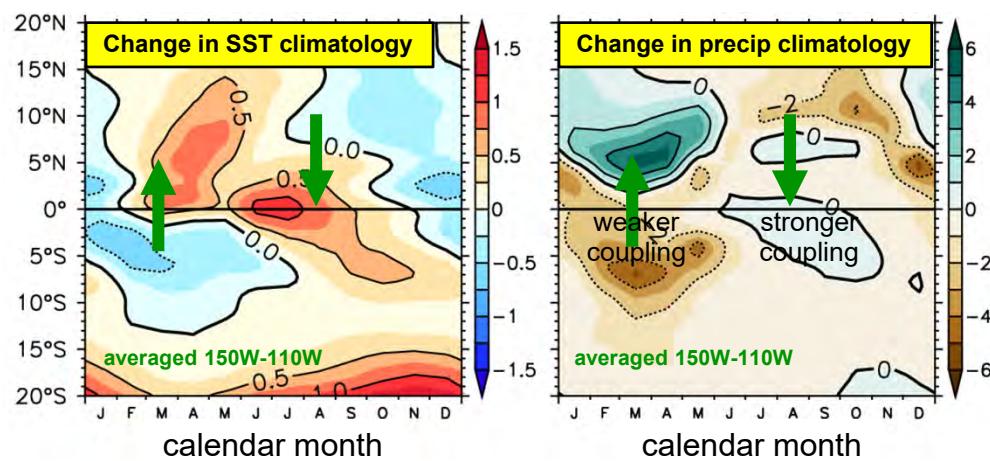
Improved seasonal synchronization of ENSO



Observed events (especially strong ones) tend to peak during Oct-Dec.

GFDL-FLOR (like many models) didn't capture this.

Correct climatological SST & wind stress using **flux adjustments (FA)**
→ ENSO **synchronizes** to end of calendar year.



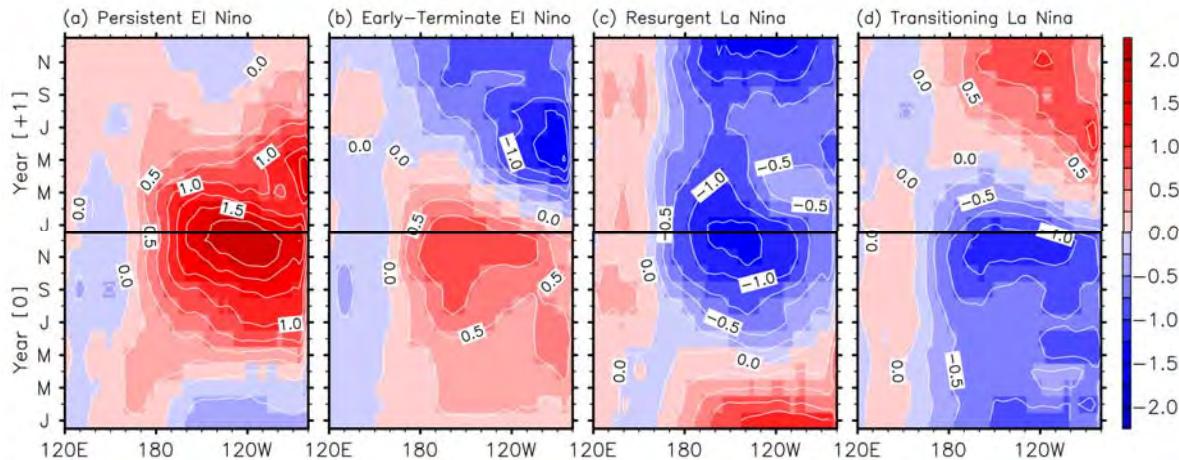
FA corrects east Pacific seasonality of dT/dy and **ITCZ latitude**.

Boosts **SST→wind** coupling during the key Jun-Nov season of ENSO growth.

Wittenberg et al. (in prep)

ENSO diversity & seasonality affect remote impacts

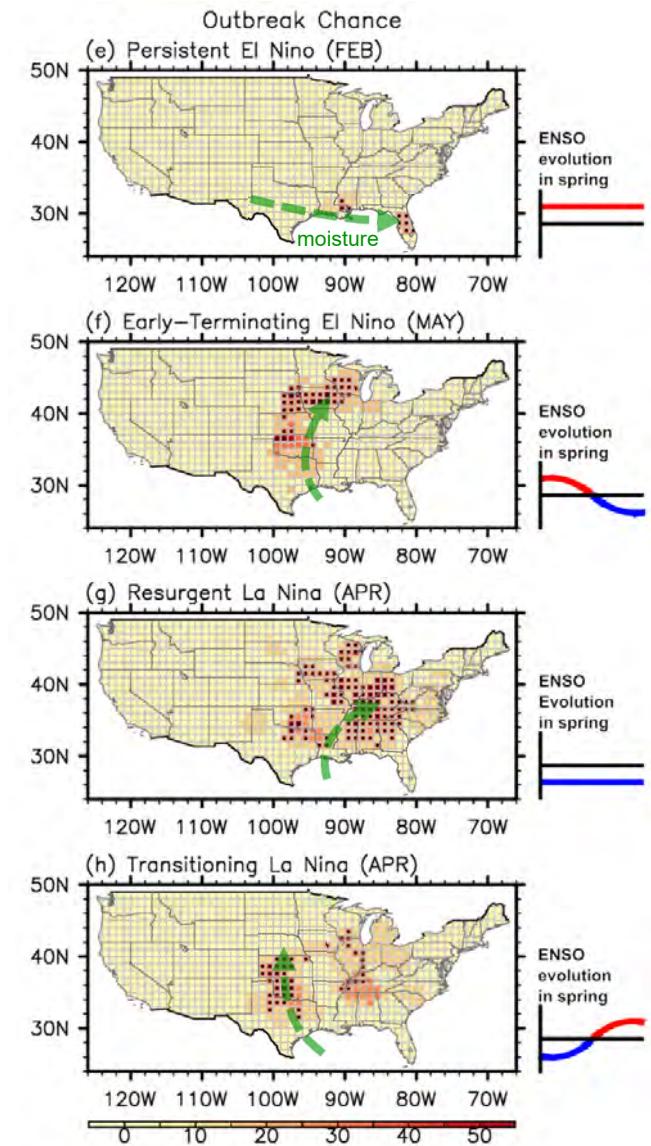
Key flavors of observed ENSO evolution



ENSO events show diverse temporal behavior in boreal spring:
persisting, terminating early, resurging, or transitioning.

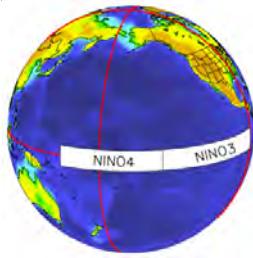
This significantly affects ENSO impacts,
e.g. on U.S. **tornado outbreak frequency**
& California rainfall.

large-scale seasonal
wind shear,
moisture advection
(GPLLJ)



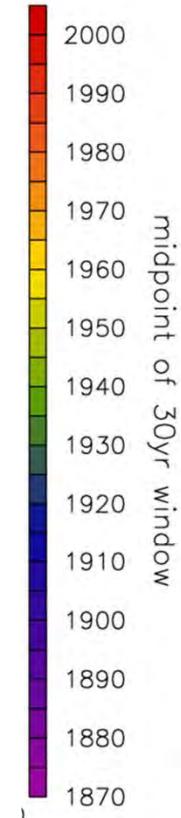
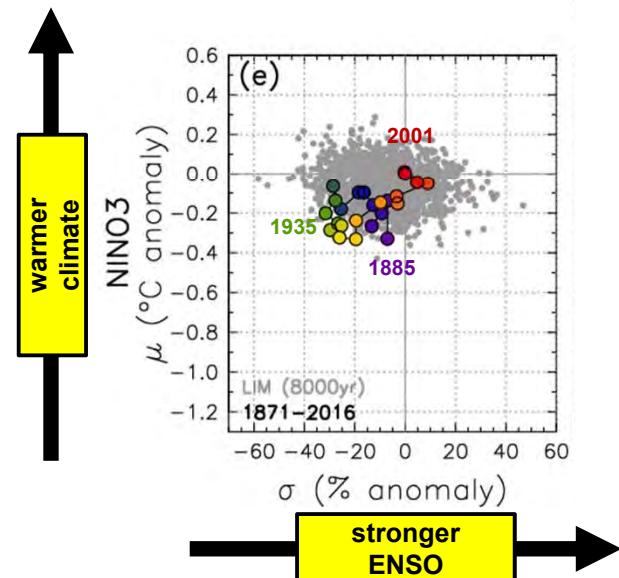
Lee et al. (GRL 2014, 2018; ERL 2016)
Krishnamurthy et al. (JC 2015)

Historical changes in ENSO & mean eq. Pacific SST



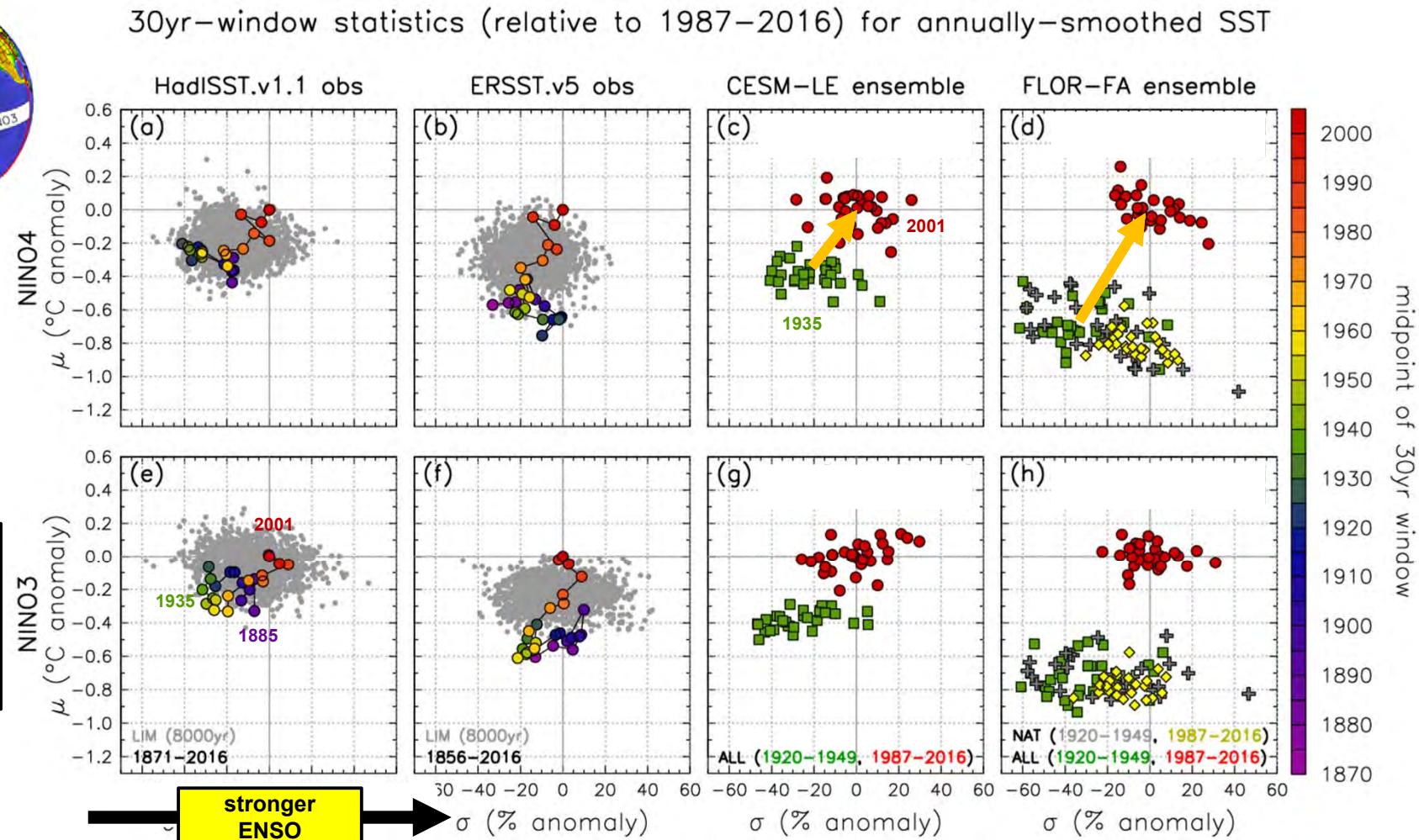
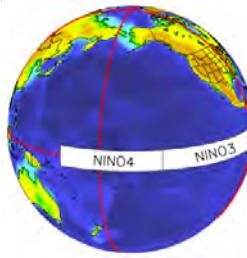
30yr–window statistics (relative to 1987–2016) for annually–smoothed SST

HadISST.v1.1 obs



Newman, Wittenberg, et al. (BAMS 2017)

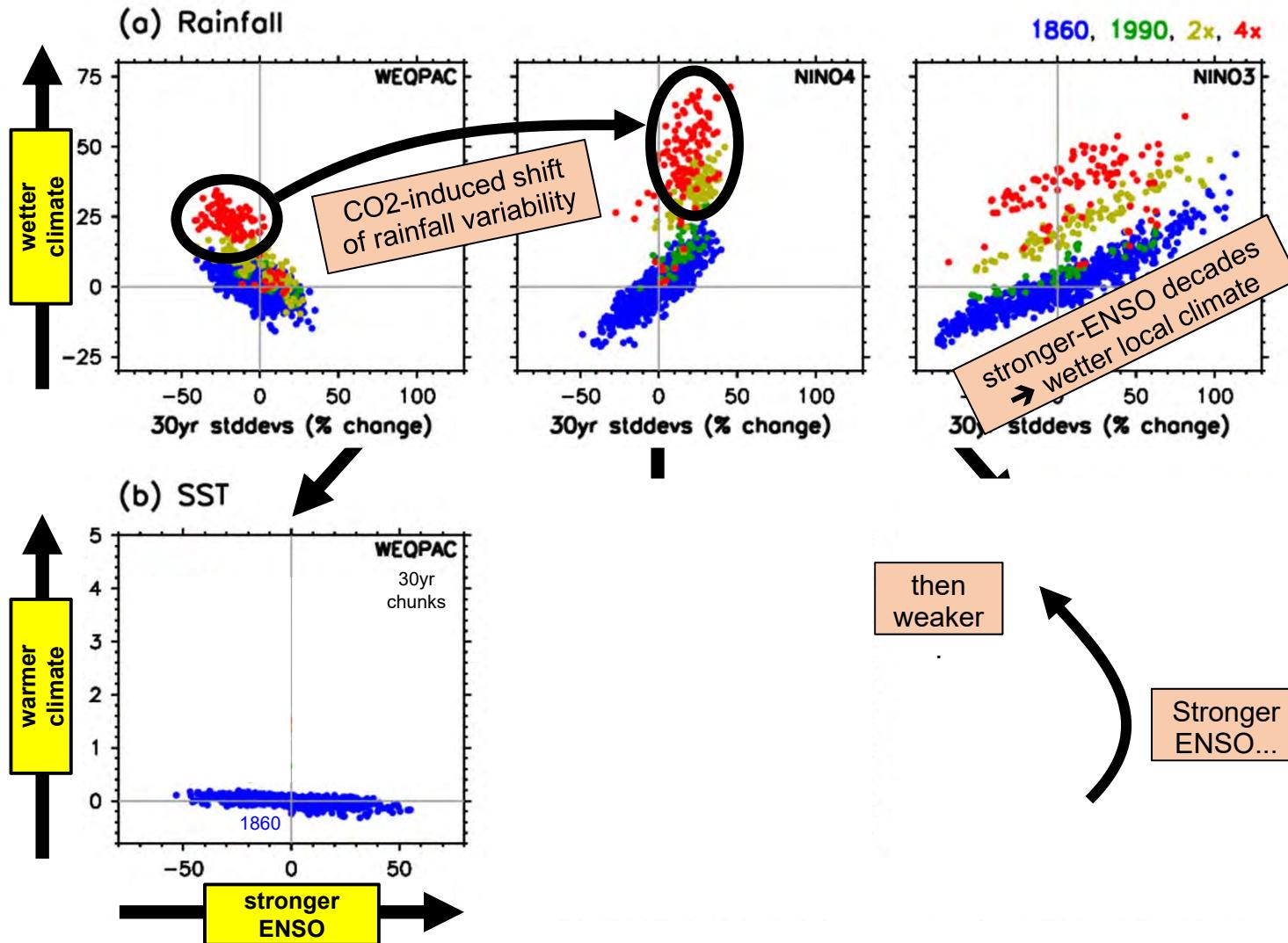
Historical changes in ENSO & mean eq. Pacific SST



Mean SST change marginally detectable. ENSO change, less so.

Newman, Wittenberg, et al. (BAMS 2017)

ENSO responses to increasing CO₂



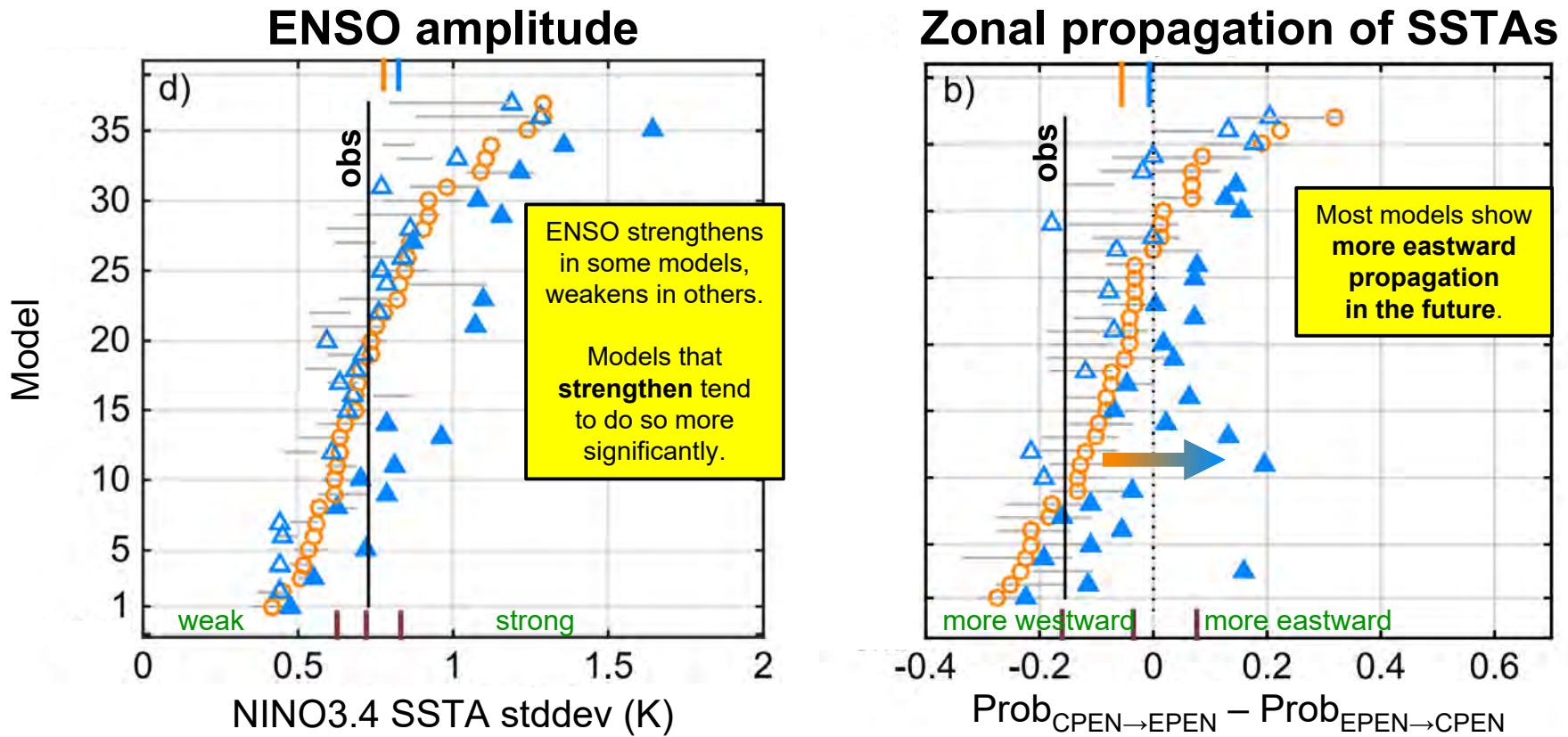
Wittenberg
(U.S. CLIVAR Variations, 2015)

CM2.1 simulations show interplay of intrinsic ENSO modulation, multidecadal climate, nonlinear sensitivity, and regional responses to increasing CO₂.

Further work:

- Knutson et al. (BAMS 2014)
- Cai et al. (NCC 2014)
- Delworth et al. (JC 2015)
- Choi et al. (JC 2015)
- Kam et al. (BAMS 2016)
- Chen et al. (JC 2017)
- Graham et al. (CD 2017)
- Atwood et al. (CD 2017)
- Timmermann et al. (Nature 2018)
- Fedorov et al. (AGU 2020)
- Stevenson et al. (in prep)

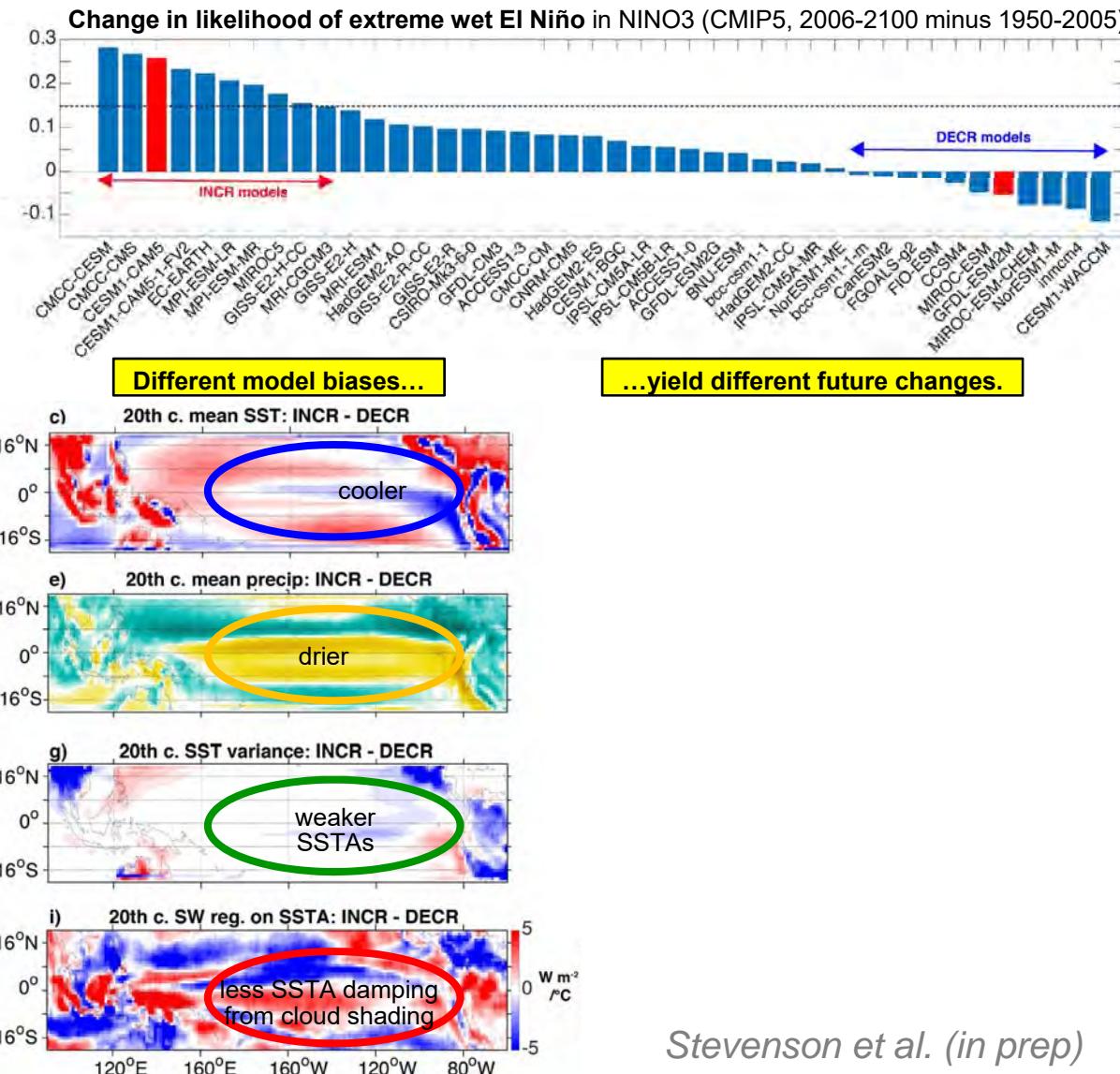
CMIP5 projections (PI, 1900-99, 2000-99)



No CMIP5-model consensus on future ENSO SSTA amplitude.
But they do suggest **changes in ENSO's dynamics & evolution**.

Chen et al. (JC 2017)

Emergent constraints for future ENSO extremes



Models project a wide range of changes in **El Niño rainfall extremes**: some **strongly increase**, others **decrease**.

“Increasers” start with common biases: **cooler** & **drier** cold tongue, **weaker ENSO**, and **weaker heat flux damping** of SST changes.
→ More room to amplify ENSO extremes.

Increasers also project **more future warming, wetting, and ENSO SSTA amplification** in the cold tongue.

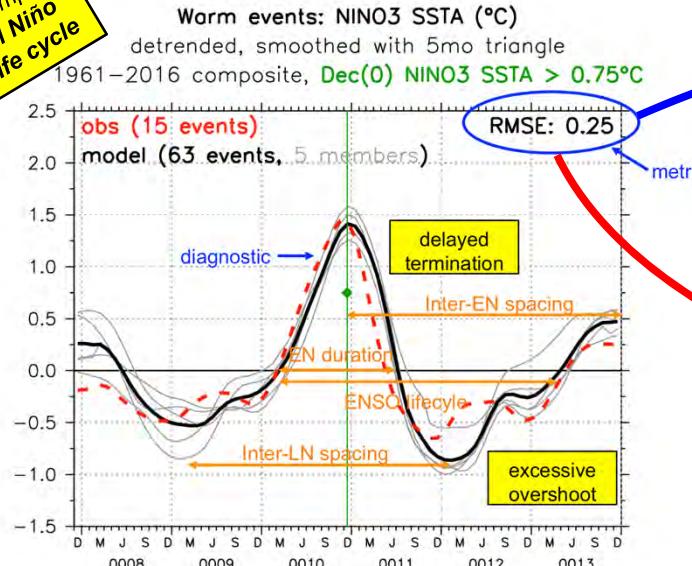
Can use these **emergent constraints** to leverage model diversity and inform future projections.

Stevenson et al. (in prep)

Community metrics for ENSO simulations

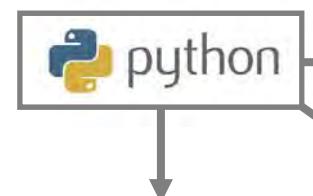
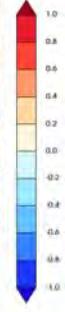
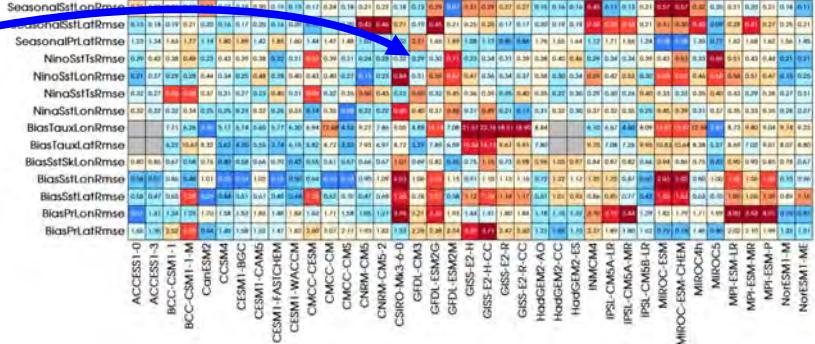
CLIVAR Research Focus on ENSO – Guiyadi et al. (AGU 2020); Planton et al. (in prep)

Example:
El Niño
life cycle

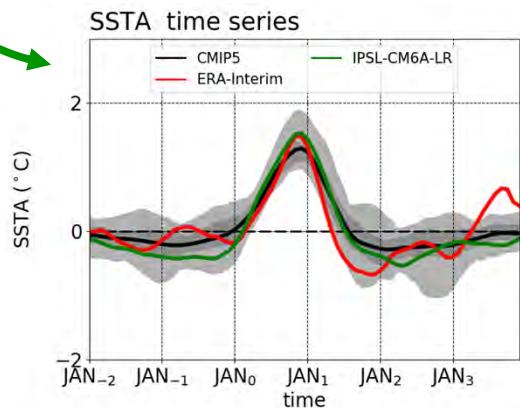


Compare to
other models
& metrics

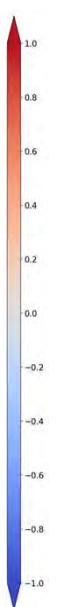
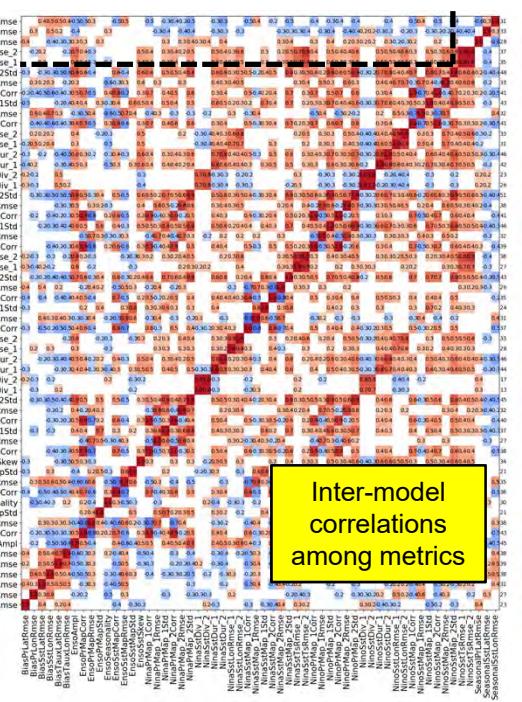
Discover connections
among metrics, find
emergent constraints



Provide
multi-model
context

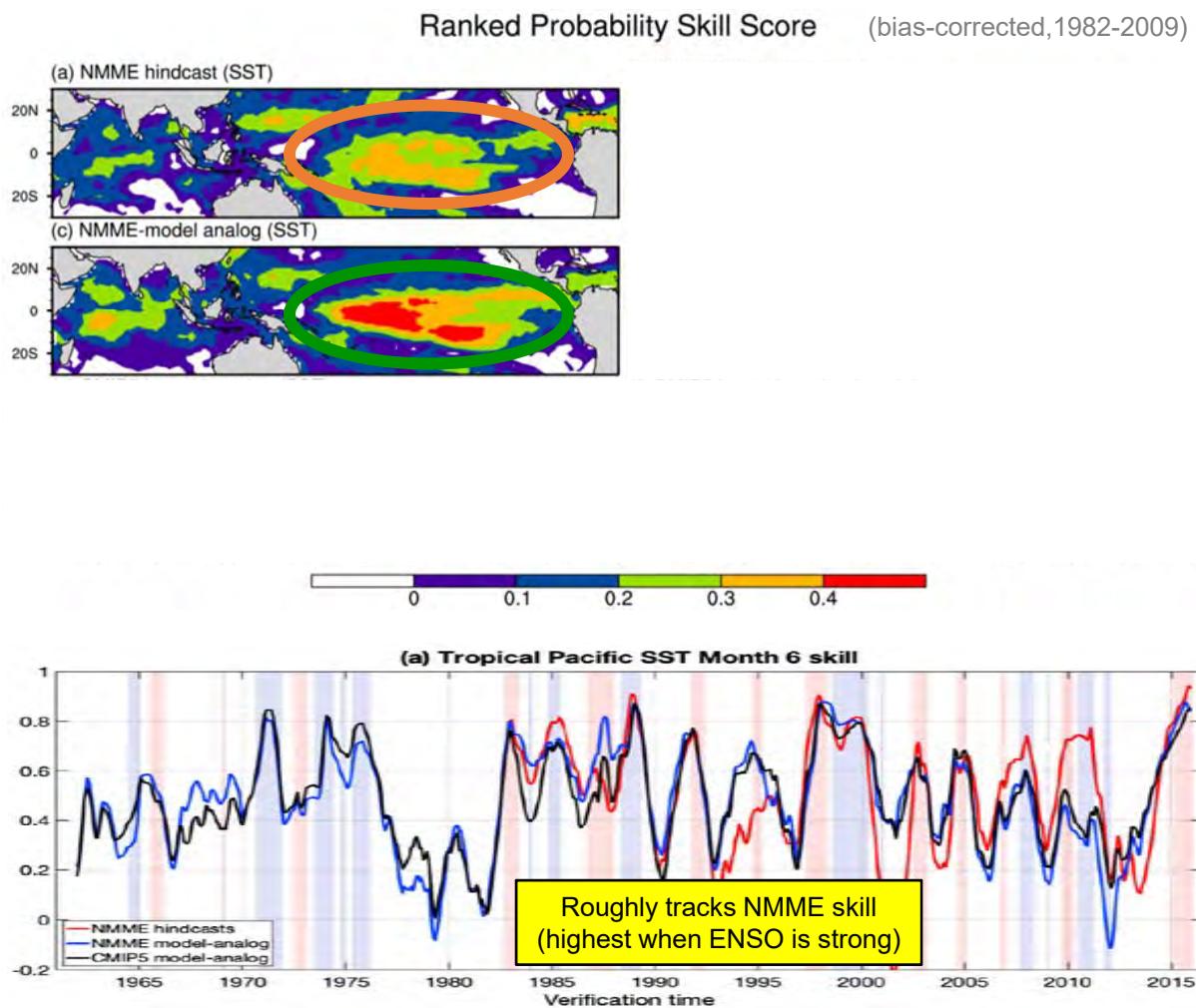


Inter-model
correlations
among metrics



ENSO forecasts using model-analogs

*Existing long model control runs are like “libraries” of ENSO behavior.
Find analogs of obs SST & SSH → trace how those states evolved in control runs.*



→ Like a forecast with no initialization shock.

At 6-month leads in the tropics, **analogs** from the NMME control runs beat the same models' **initialized forecasts!**

Suggests that even models **without assimilation** (e.g. CMIP5) could offer useful forecast guidance.

Also permits rapid assessment of secular variations in **predictability**.

Ding et al. (JC 2018; GRL 2019)

Future plans and challenges

1. Better understand ENSO & improve models

- a. **Background climate** is key (flux adjustments, heat/momentum budgets)
- b. Community metrics & obs **constraints** (TPOS2020, LES, reanalyses, paleo)
- c. Enhance model **resolution & physics**
 - clouds & convection, surface winds & fluxes, ocean mixing (TIWs), diurnal cycle

2. Improve predictions & projections

- a. Clarify ENSO connections to **extremes & regional impacts**
- b. Understand sources & limits of **predictability** (model analogs)
- c. **Emergent constraints** to improve future projections



Summary

1. ENSO understanding & predictions are **critical to NOAA's mission.**
2. GFDL's ENSO simulations, forecasts, and projections are **among the world's best.** They are widely used, and improving.
3. GFDL is rapidly **advancing community understanding** of ENSO's diversity, dynamics, sensitivities, impacts, and predictability.

2014-2019 ENSO Publications (1 of 2)

- Atwood, A. R., et al., 2017: Characterizing unforced multi-decadal variability of ENSO: A case study with the GFDL CM2.1 coupled GCM. *Climate Dyn.*, **49**, 2845-2862. doi: 10.1007/s00382-016-3477-9
- Capotondi, A., et al., 2015a: Climate model biases and El Niño Southern Oscillation (ENSO) simulation. *U.S. CLIVAR Variations*, **13**, 21-25.
- Capotondi, A., A. T. Wittenberg, et al., 2015b: Understanding ENSO diversity. *Bull. Amer. Meteor. Soc.*, **96**, 921-938. doi: 10.1175/BAMS-D-13-00117.1
- Capotondi, A., A. T. Wittenberg, et al., 2020: ENSO diversity. Ch. 5 of: *ENSO in a Changing Climate*, an AGU monograph.
- Chen, C., et al., 2017: ENSO in the CMIP5 simulations: Life cycles, diversity, and responses to climate change. *J. Climate*, **30**, 775-801. doi: 10.1175/JCLI-D-15-0901.1
- Chiodi, A. M., J. P. Dunne, et al., 2019: Estimating Air-Sea Carbon Flux Uncertainty over the Tropical Pacific: Importance of Winds and Wind Analysis Uncertainty. *Global Biogeochemical Cycles*, **33**, doi:10.1029/2018GB006047
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- Cravatte, S., et al., 2016: *First Report of TPOS 2020*. GOOS-**215**, 200 pp. <http://tpos2020.org/first-report>
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- Ding, H., et al., 2018: Skillful climate forecasts of the tropical Indo-Pacific Ocean using model-analogs. *J. Climate*, **31**, 5437-5459. doi:10.1175/JCLI-D-17-0661.1
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- Dunne, J. P., et al.: The GFDL Earth System Model version 4.1 (GFDL-ESM4.1): Model description and simulation characteristics. In prep for *J. Adv. Model. Earth Syst.*
- Erb, M. P., et al., 2015: Response of the equatorial Pacific seasonal cycle to orbital forcing. *J. Climate*, **28**, 9258-9276. doi: 10.1175/JCLI-D-15-0242.1
- Fedorov, A., et al., 2020: ENSO low-frequency modulations and mean state interactions. Ch. 8 of: *ENSO in a Changing Climate*, an AGU monograph.
- Graham, F. S., et al., 2014: Effectiveness of the Bjerknes stability index in representing ocean dynamics. *Climate Dyn.*, **43**, 2399-2414. doi: 10.1007/s00382-014-2062-3
- Graham, F. S., et al., 2015: Reassessing conceptual models of ENSO. *J. Climate*, **28**, 9121-9142. doi: 10.1175/JCLI-D-14-00812.1
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- Griffies, S. M., et al., 2015: Impacts on ocean heat from transient mesoscale eddies in a hierarchy of climate models. *J. Climate*, **28**, 952-977. doi: 10.1175/JCLI-D-14-00353.1
- Guilyardi, E., A. Wittenberg, et al., 2016: Fourth CLIVAR Workshop on the Evaluation of ENSO Processes in Climate Models: ENSO in a Changing Climate. *Bull. Amer. Meteor. Soc.*, **97**, 817-820. doi: 10.1175/BAMS-D-15-00287.1
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- He, J., et al., 2018: Precipitation sensitivity to local variations in tropical sea surface temperature. *J. Climate*, **31**, 9225-9238. doi:10.1175/JCLI-D-18-0262.1
- Held, I., et al., 2020: Structure and performance of GFDL's CM4.0 climate model. *J. Adv. Model. Earth Syst.*, in press.
- Jia, L., et al., et al., 2015: Improved seasonal prediction of temperature and precipitation over land in a high-resolution GFDL climate model. *J. Climate*, **28**, 2044-2062. doi: 10.1175/JCLI-D-14-00112.1
- Johnson, N. C., et al., 2019: On the delayed coupling between ocean and atmosphere in recent weak El Niño episodes. *Geophys. Res. Lett.*, in press.
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- Karamperidou, C., M. A. Cane, U. Lall, and A. T. Wittenberg, 2014: Intrinsic modulation of ENSO predictability viewed through a local Lyapunov lens. *Climate Dyn.*, **42**, 253-270. doi: 10.1007/s00382-013-1759-z.
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- Knutson, T. R., et al., 2018: CMIP5 model-based assessment of anthropogenic influence on record global warmth during 2016. Section 3 of: "Explaining extreme events of 2016 from a climate perspective." *Bull. Amer. Meteor. Soc.*, **99**, S11-S15. doi: 10.1175/BAMS-D-17-0104.1
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- Krishnamurthy, L., et al., 2016: Impact of strong ENSO on regional tropical cyclone activity in a high-resolution climate model in the North Pacific and North Atlantic. *J. Climate*, **29**, 2375-2394. doi: 10.1175/JCLI-D-0468.1



2014-2019 ENSO Publications (2 of 2)

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- McGregor, H., et al.: Orbital forcing of increasing ENSO variability over the past 6,000 years. In prep.
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