

Ocean Variability from the Surface to the Abyss

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Arin Nelson & Jeff Weiss (CU-ATOC), Scott Reckinger (Montana State)
Royce Zia (Va. Tech.)

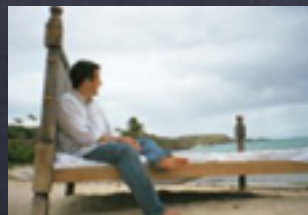
DEEP Sciences Colloquium
Brown University 10/1/15

Sponsors: NSF 1245944, 1258907, 1350795, GoMRI, and Institute
at Brown for Environment and Society (IBES)

Key:



= Work Active Since at Brown



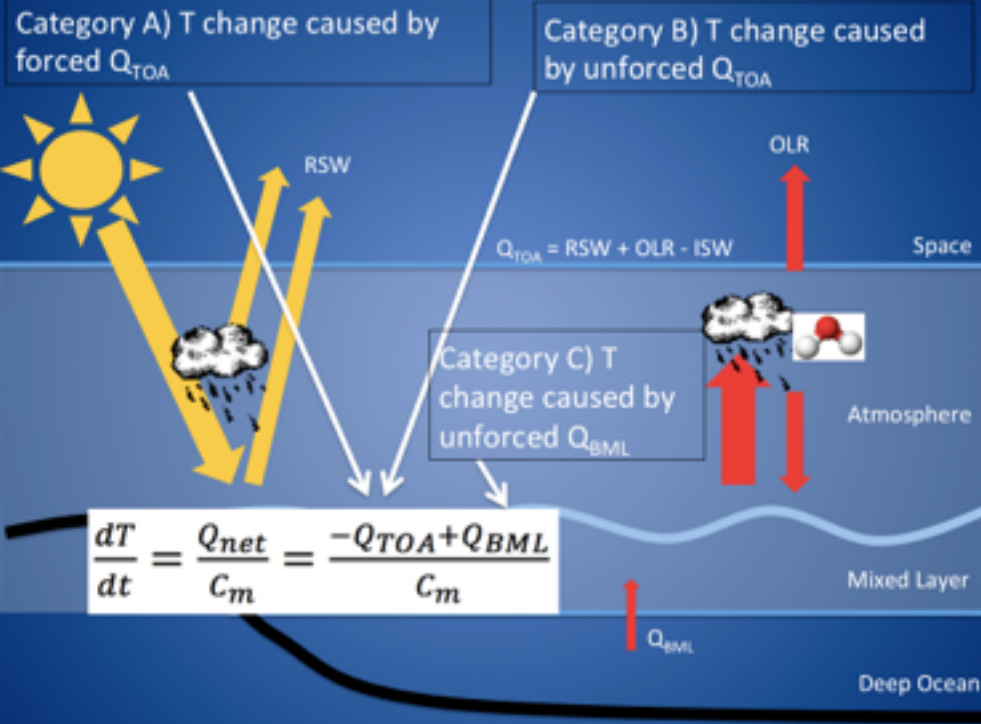
= Notable Contribution of F-K Group Member



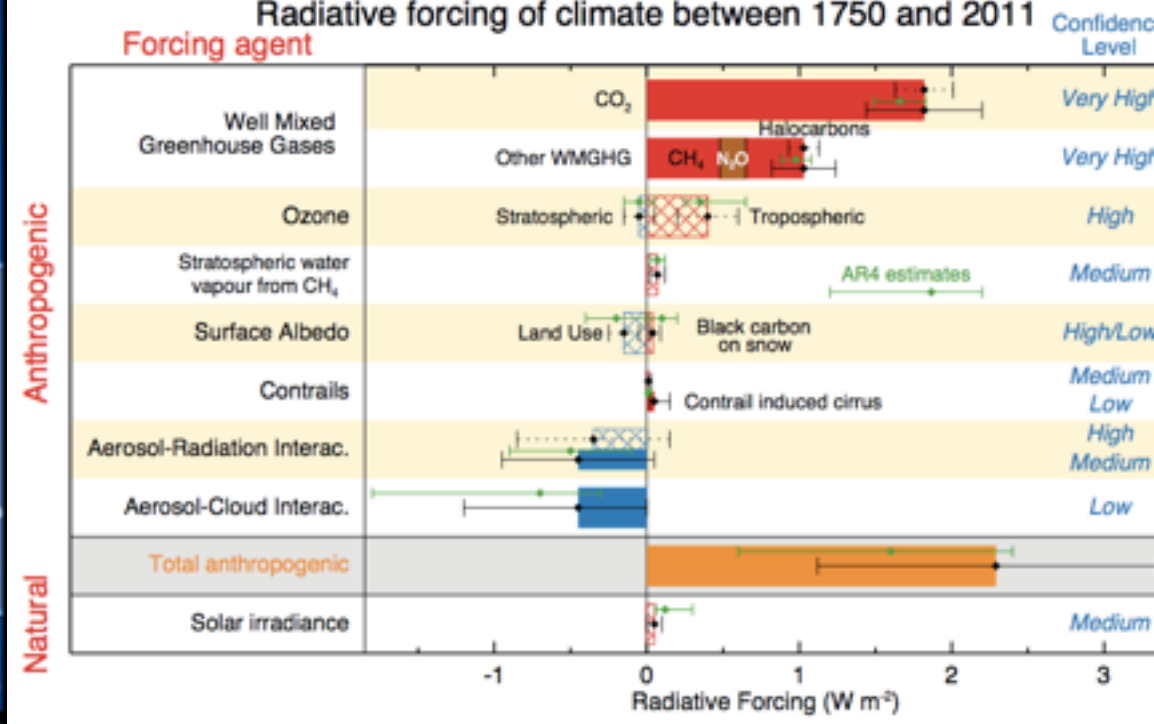
To understand ocean & climate variability,
it is important to distinguish:

- Presence of observable variability
- Understanding of past variability
- Modeling of variability
- Prediction of variability

Focus Today: diurnal to centennial variability



Brown et al., 2014



IPCC AR5, 2013

Presence of observable variability

It is easier to observe the ocean consequences of air-sea exchange (ocean heat content (OHC), salinity) rather than exchanges (fluxes) themselves.

However, insufficient for prediction and attribution



Prediction & Attribution Goal: Effects of Anthropogenic Forcing



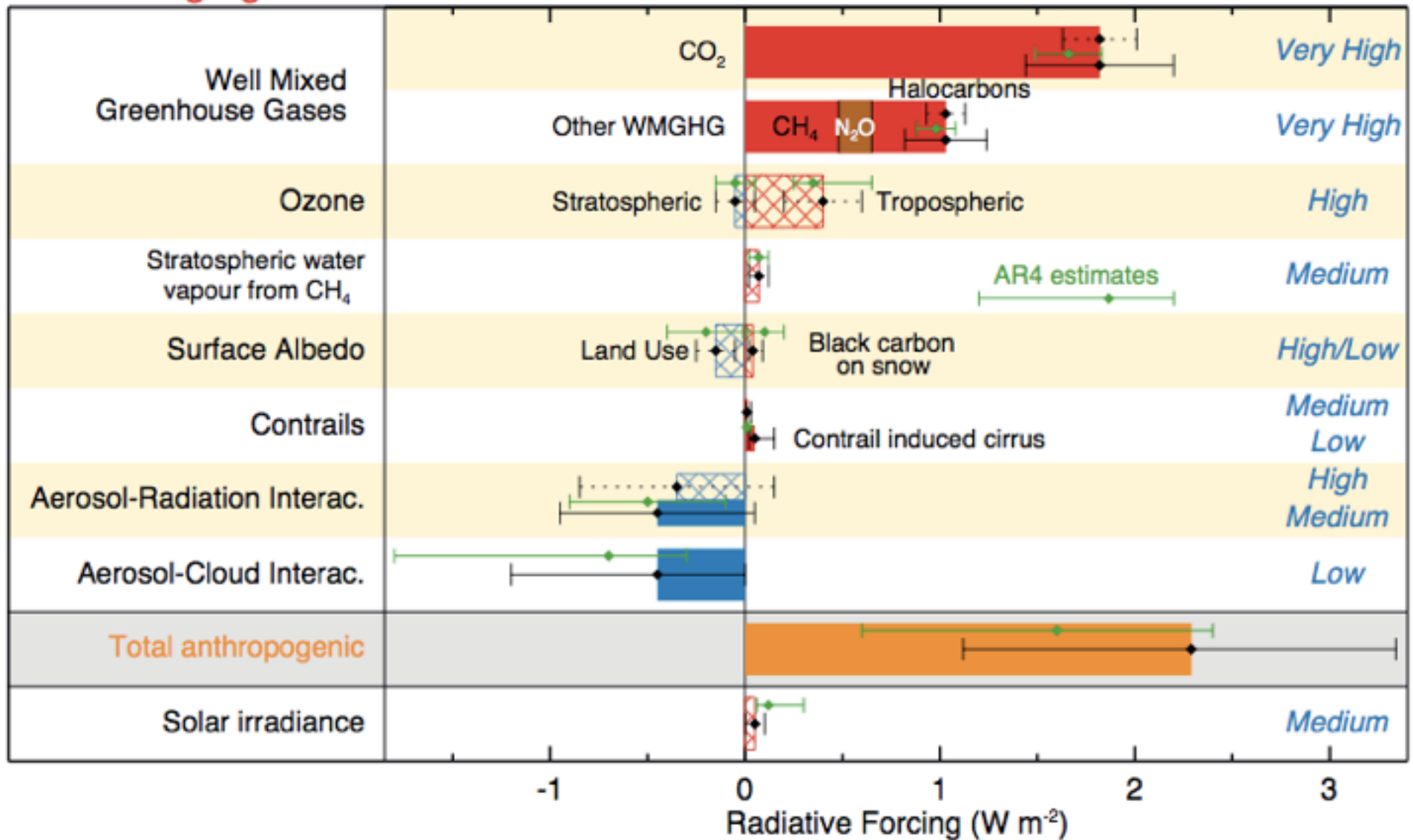
Radiative forcing of climate between 1750 and 2011

Forcing agent

Confidence Level

Anthropogenic

Natural



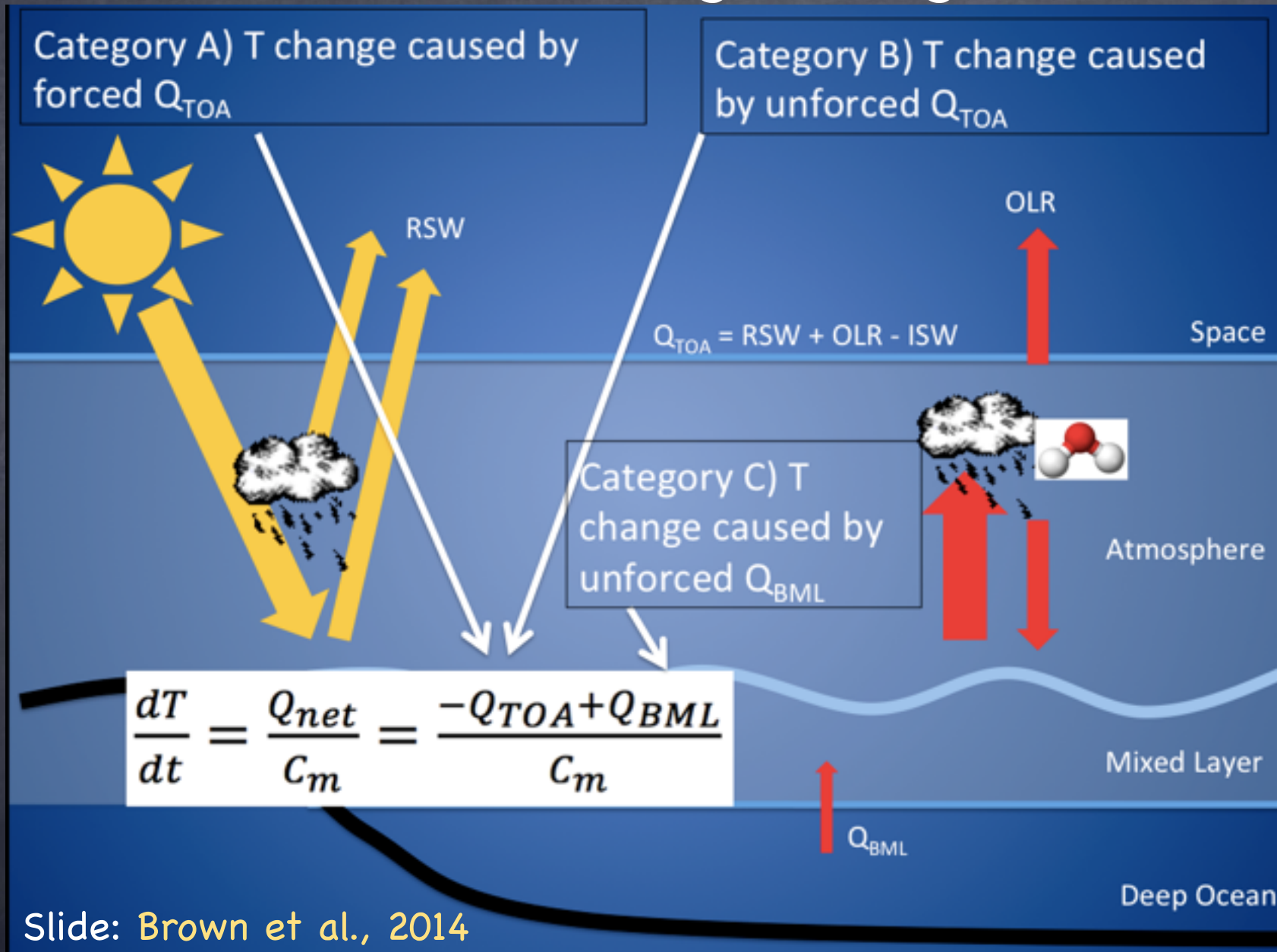
Question: By Show of Hands Indicate Whether You Have Heard that the IPCC is

- ❑ A) Wrong
- ❑ B) Independent Police Complaints Commission of England & Wales
- ❑ C) Together with Al Gore, they invented the internet
- ❑ D) The Intergovernmental Panel on Climate Change, a nonpolitical group that reviews peer-reviewed climate science and summarizes it for policymakers, who won a Nobel Peace Prize shared with Al Gore.

Image: Al Gore's Google+



Surface Energy Budget



- $O(2W/m^2)$ change to Q_{BML} as important as GHG
- Slight oversimplification—sensitivity + budget



What do hydrographic observations show?

Ocean Heat Content not fixed: Q_{BML} not zero (it even varies)!

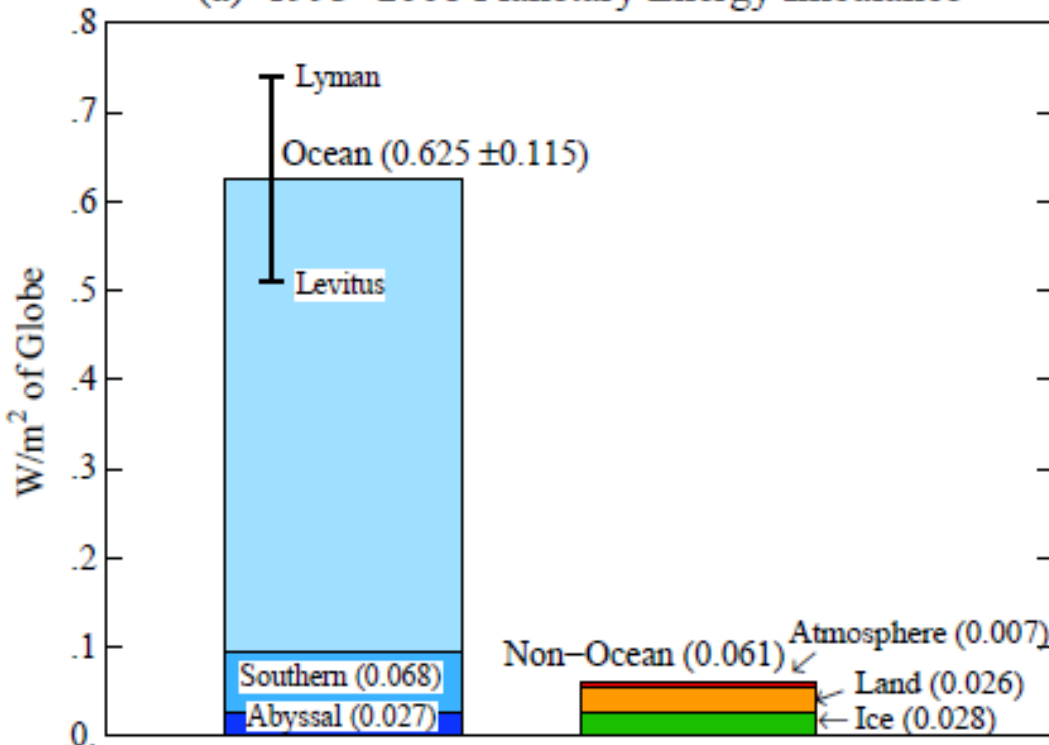
28% of anthropogenic forcing equals the warming in the oceans and about 70% goes back to space.

90% of anomalous warming is in the oceans.

0.7 W/m^2 to atmosphere only is about 1.5K/yr

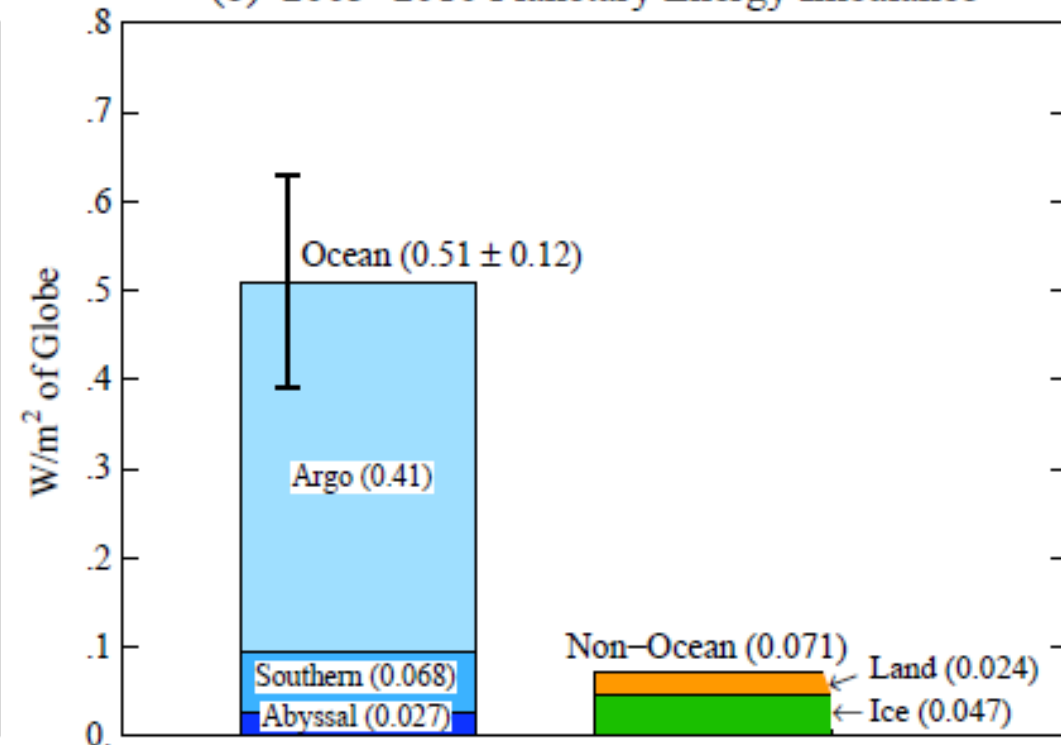
Trad. Hydrography

(a) 1993–2008 Planetary Energy Imbalance



From the Argo Era

(b) 2005–2010 Planetary Energy Imbalance

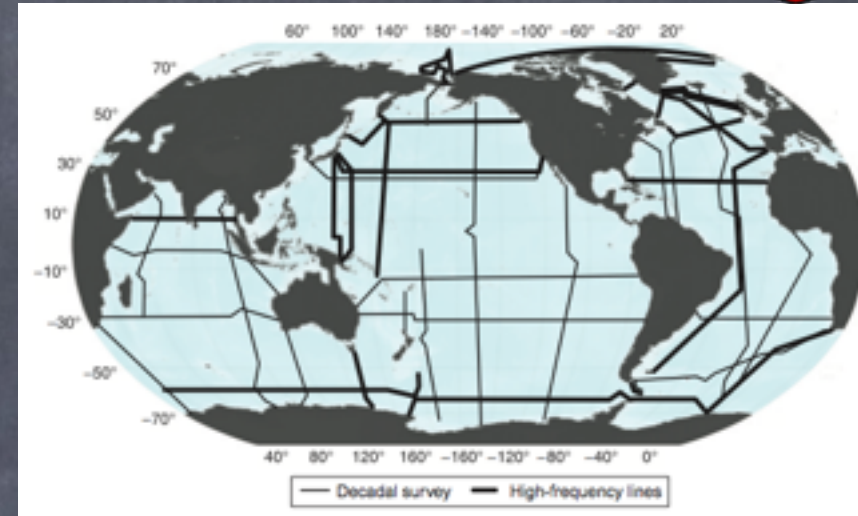


Hansen et al. (2011)

How do we know OHC?

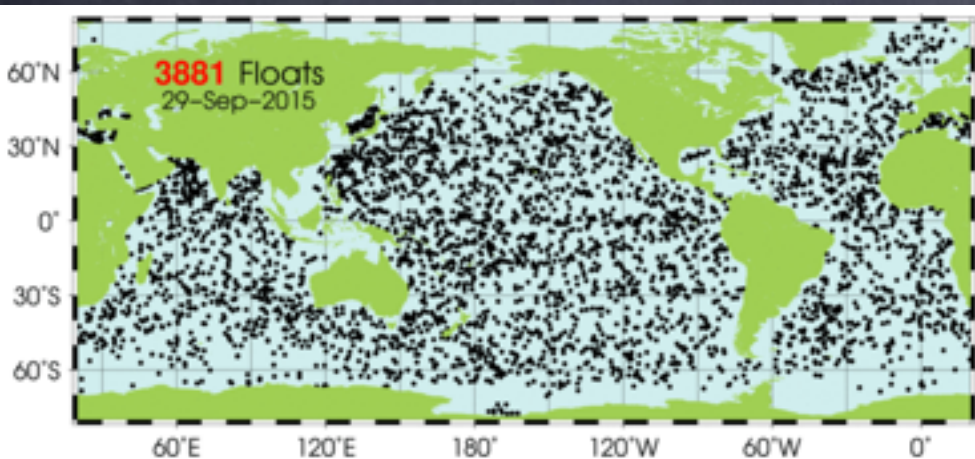


Traditional Hydrography (<http://www.ukosnap.org/>)



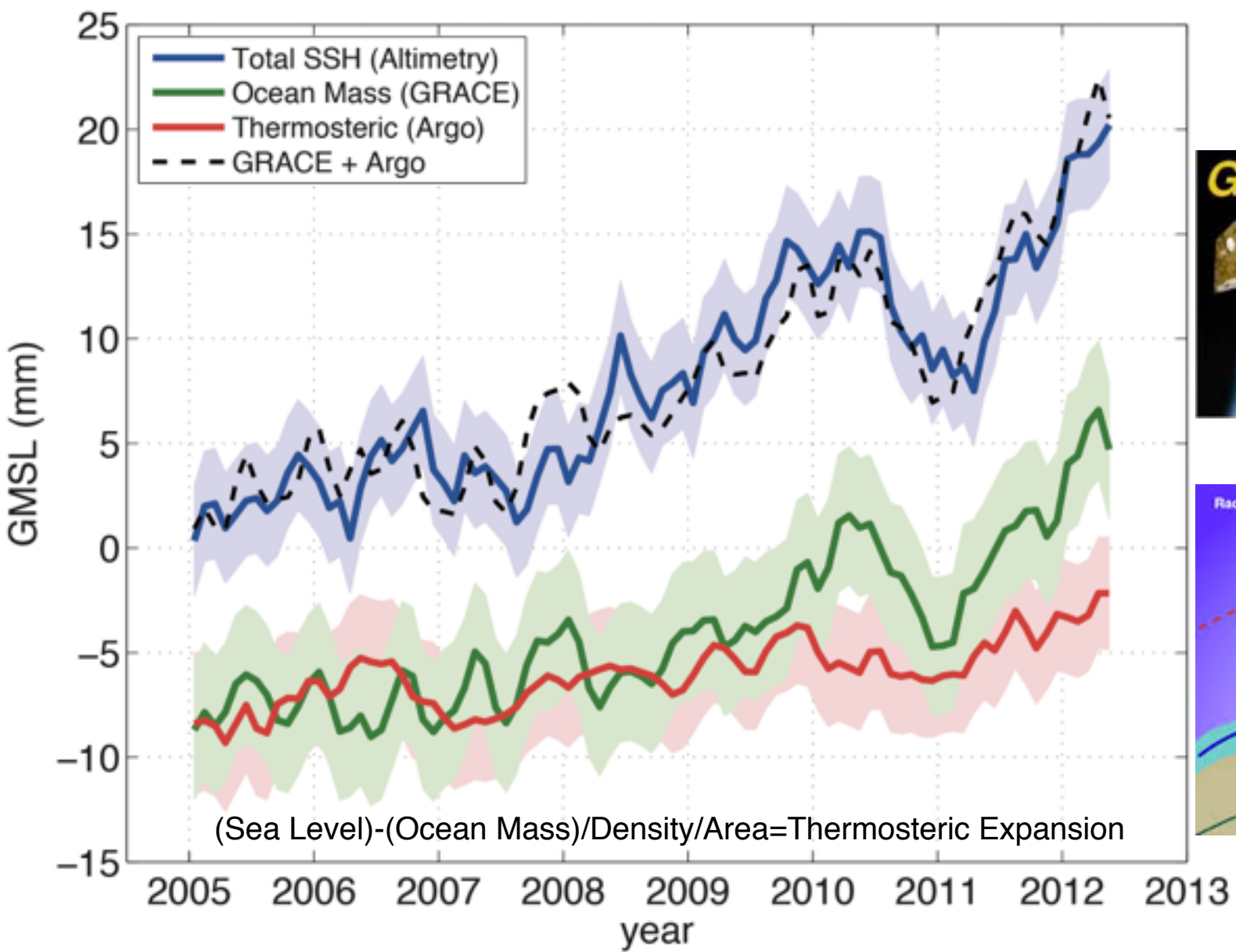
GO-SHIP repeat sections: Siedler et al. 2013

Autonomous: e.g., Argo and Satellites.
<http://www.argo.ucsd.edu/>

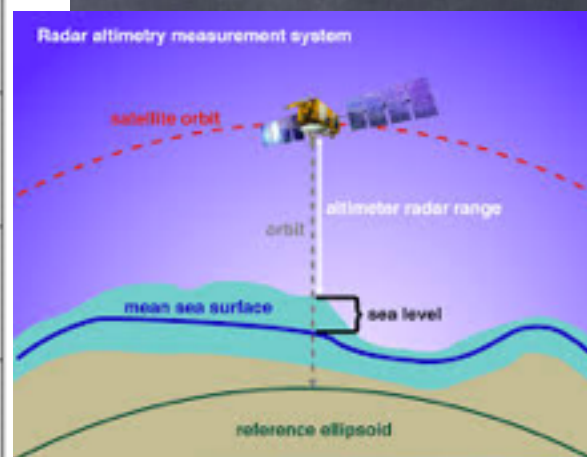


Argo floats presently active

Another reason to care about ocean warming—and to observe it (by subtraction): Sea Level Rise



podaac.jpl.nasa.gov



nesdis.noaa.gov



Surface, Mixed Layer, Seasons?

0.7 W/m²

=

Atmosphere:

1.5K/yr

=

3.4m Ocean:

1.5K/yr

=

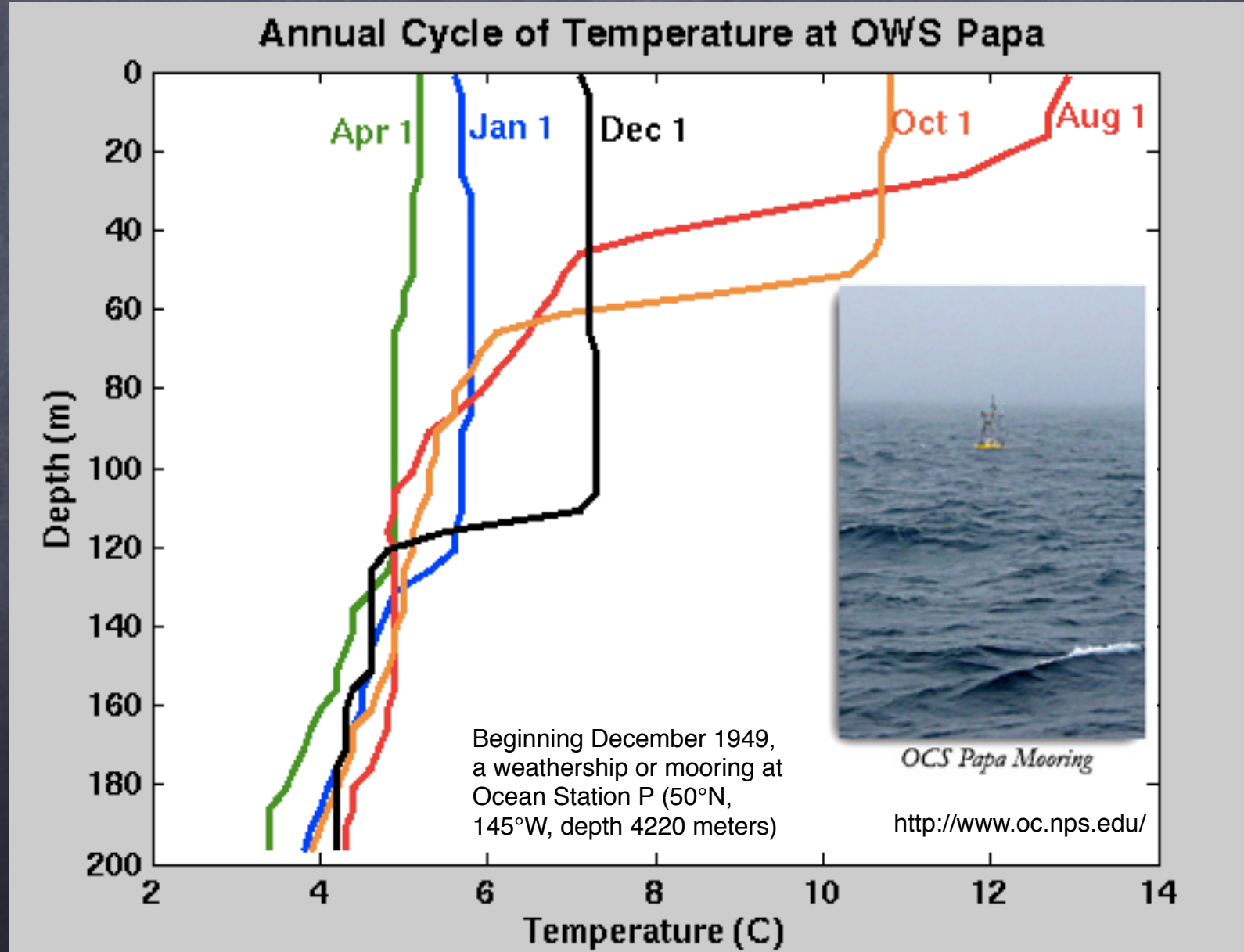
34m Ocean:

0.15K/yr

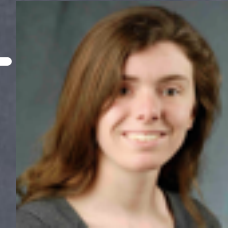
=1% of

mixed layer

seasonality



The net Q_{BML} is also about 1% of different flux components and about 1% of net spatial extremes

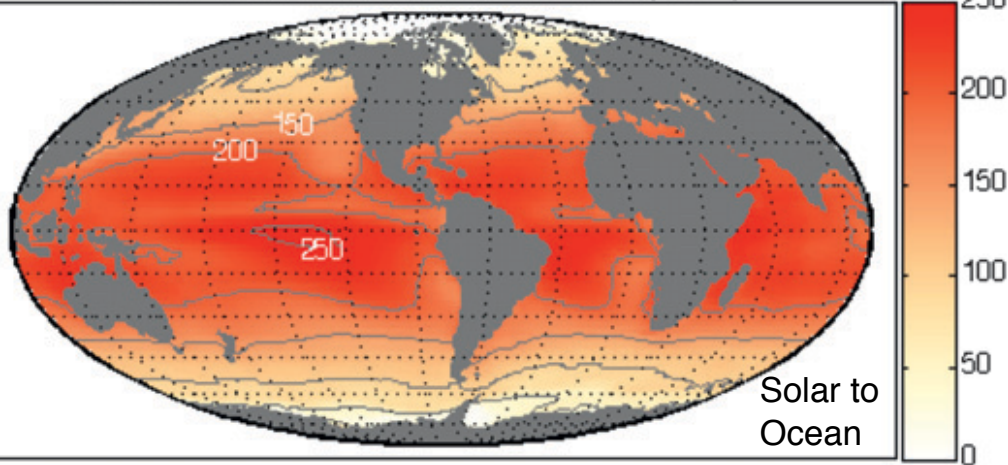


CU, now NCAR

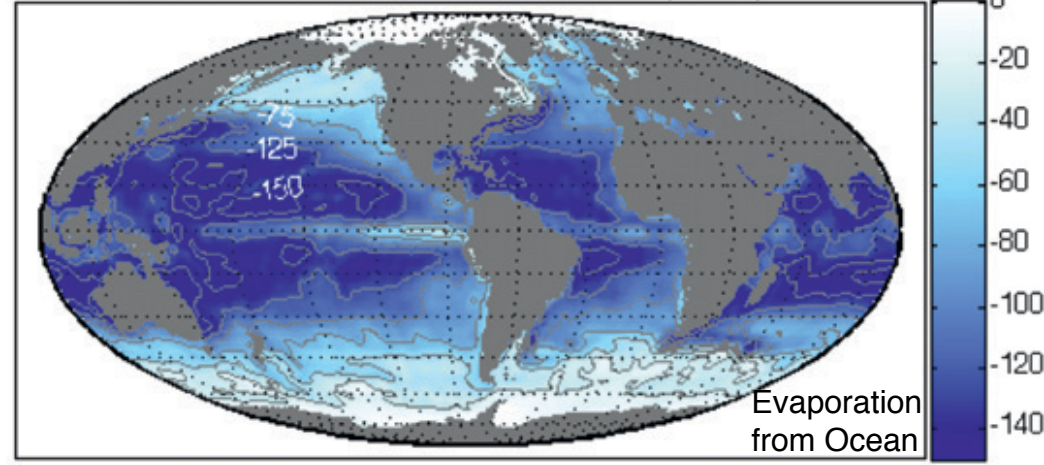


CU, now NCAR

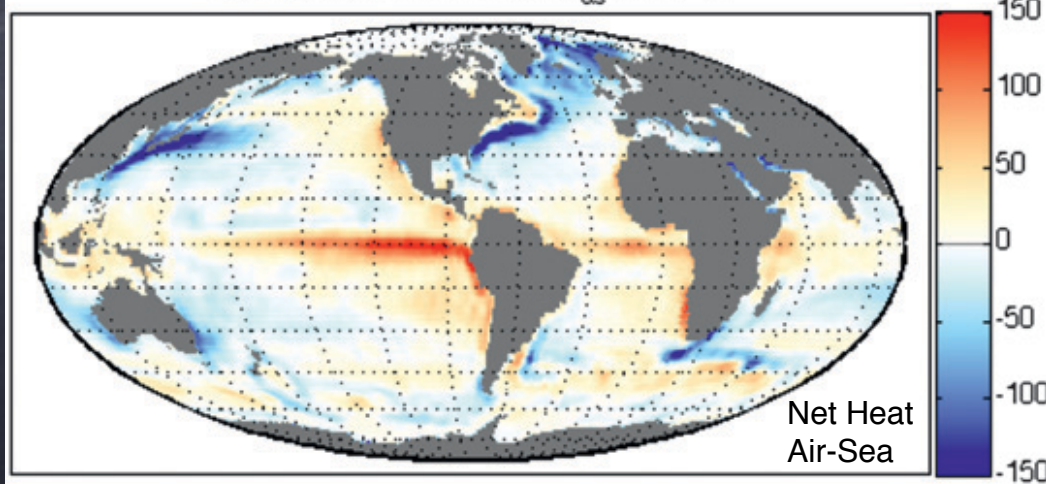
Mean of 1986-2005 CORE net sw heat flux (W/m^2)

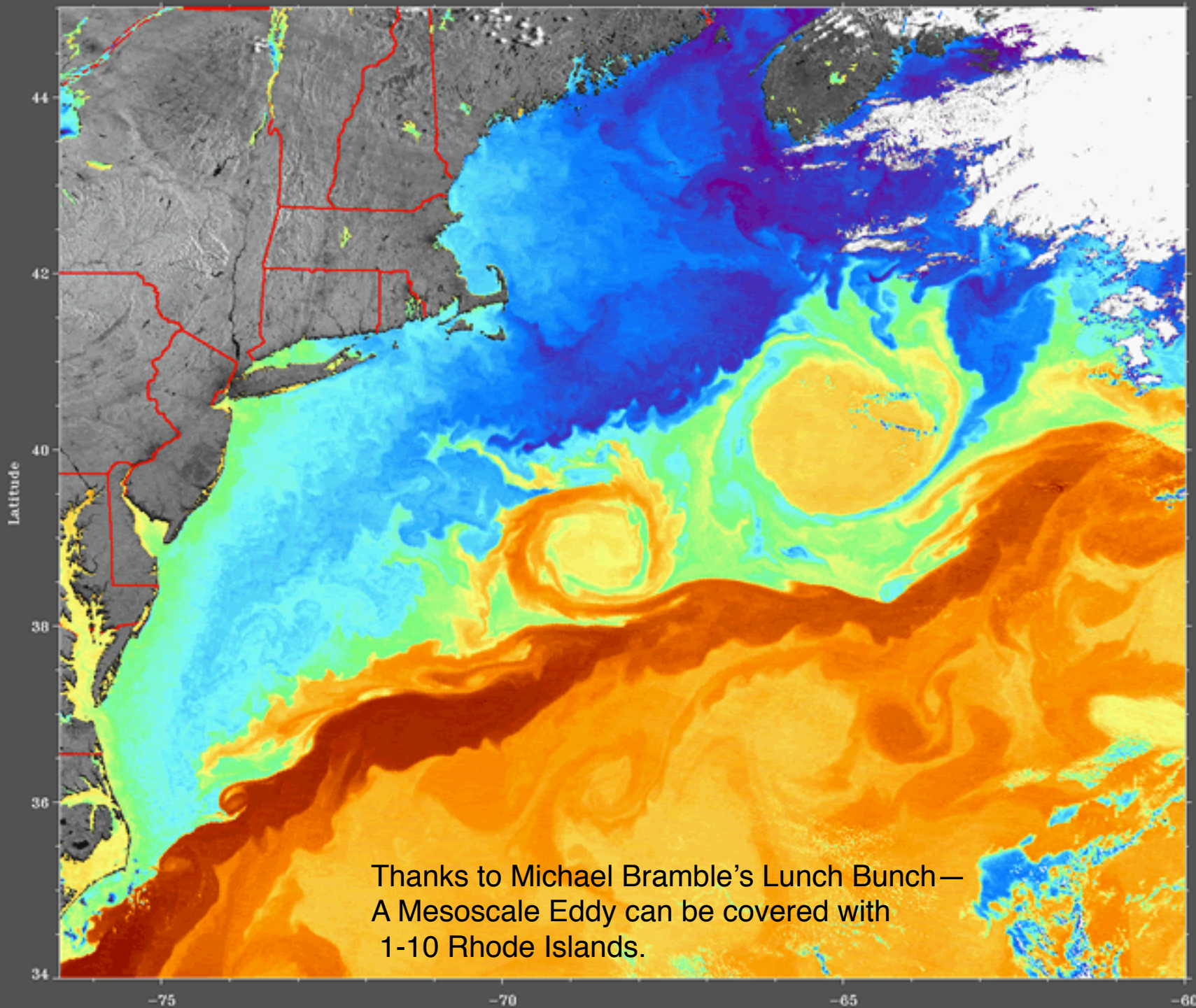


Mean of 1986-2005 CORE latent heat flux (W/m^2)



Mean of 1986-2005 CORE Q_{as} (W/m^2)

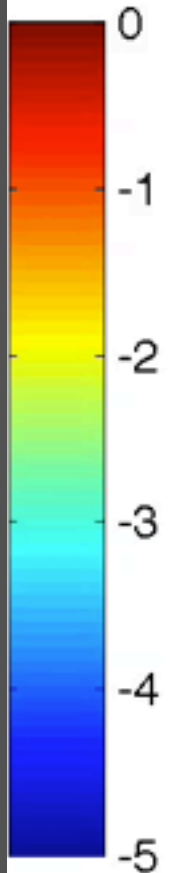
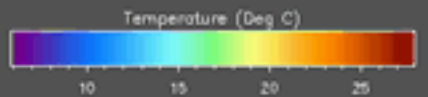


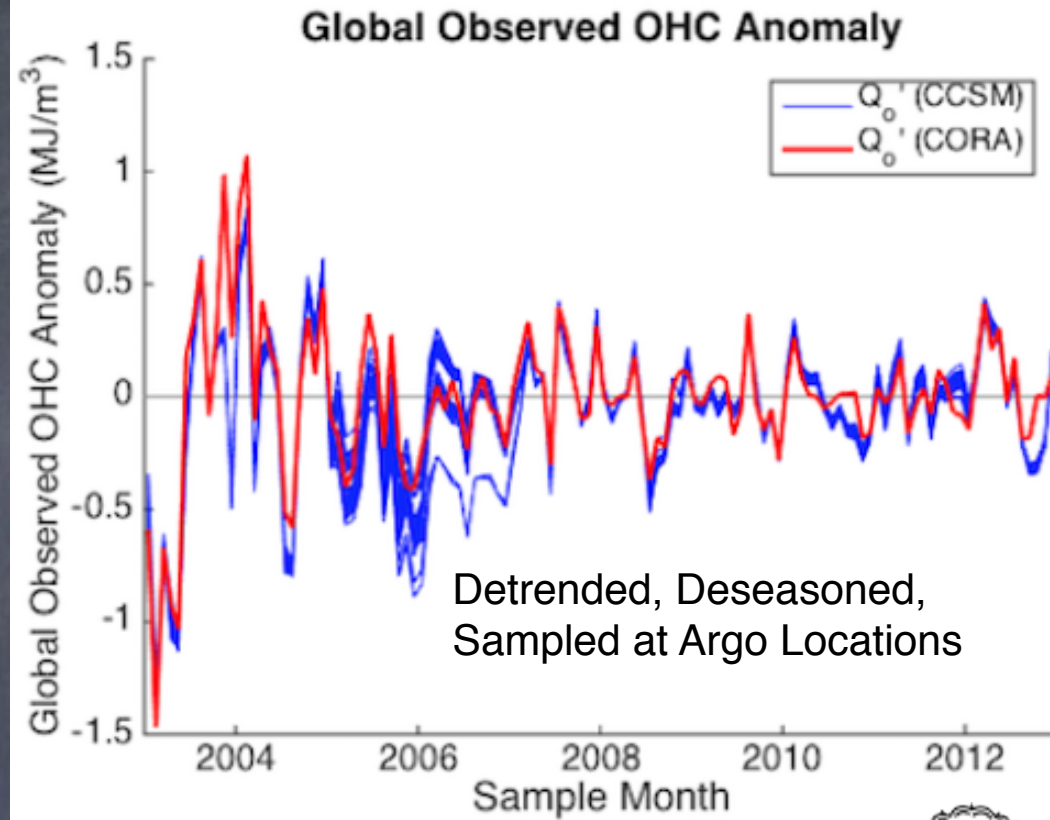
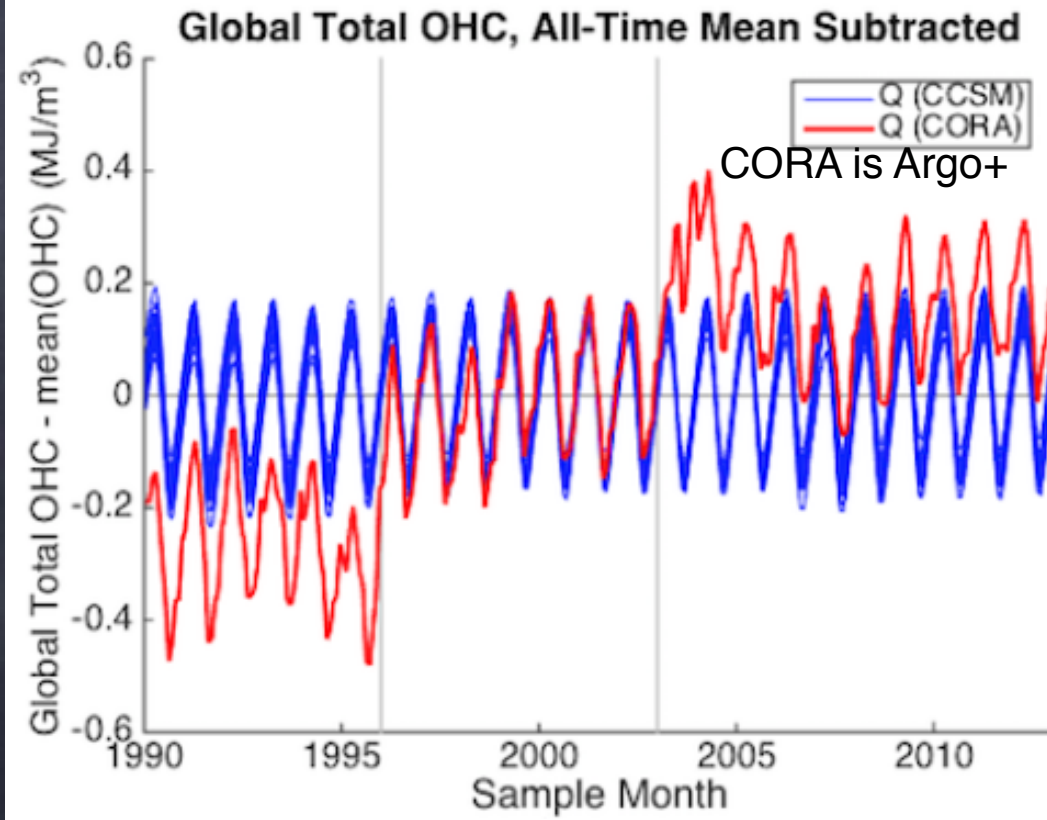


Satellite
view of
flows

Thanks to Michael Bramble's Lunch Bunch—
A Mesoscale Eddy can be covered with
1-10 Rhode Islands.

WATER SURFACE TEMPERATURE
Land and Clouds from Channel 2
NOAA-12 AVHRR 1997 Jun 11 11:27 UT





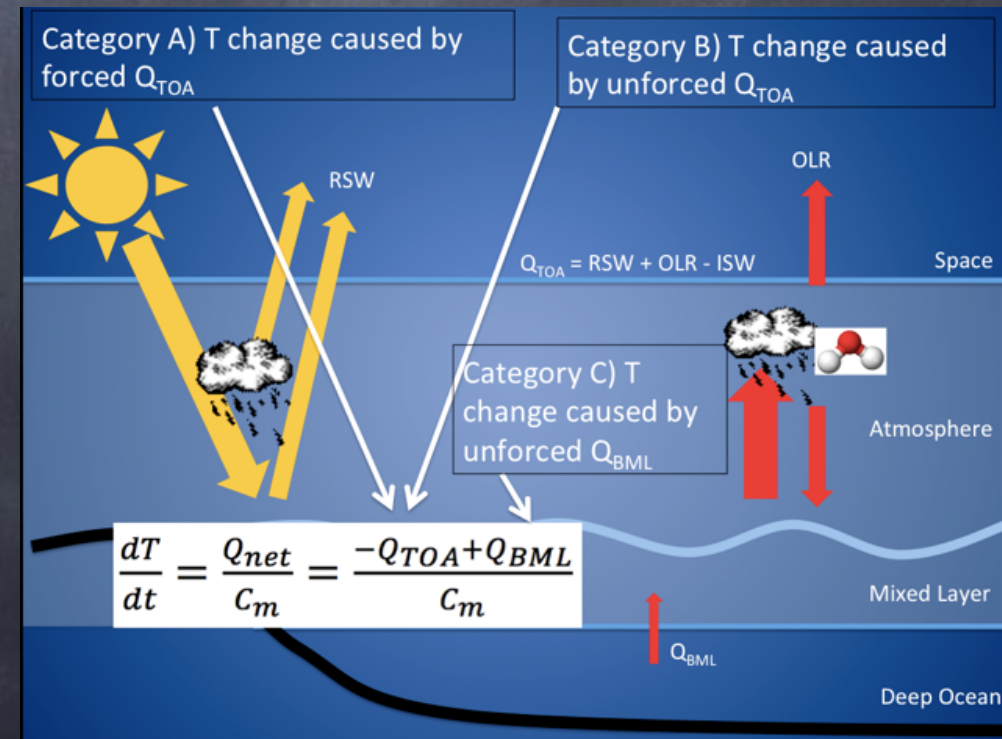
Sophisticated analysis to overcome Ship & Argo sampling problems—inherent uncertainty, $O(0.2W/m^2)$, on interannual to decadal timescales in global average. $O(10W/m^2)$ without analysis.



CU, soon Brown

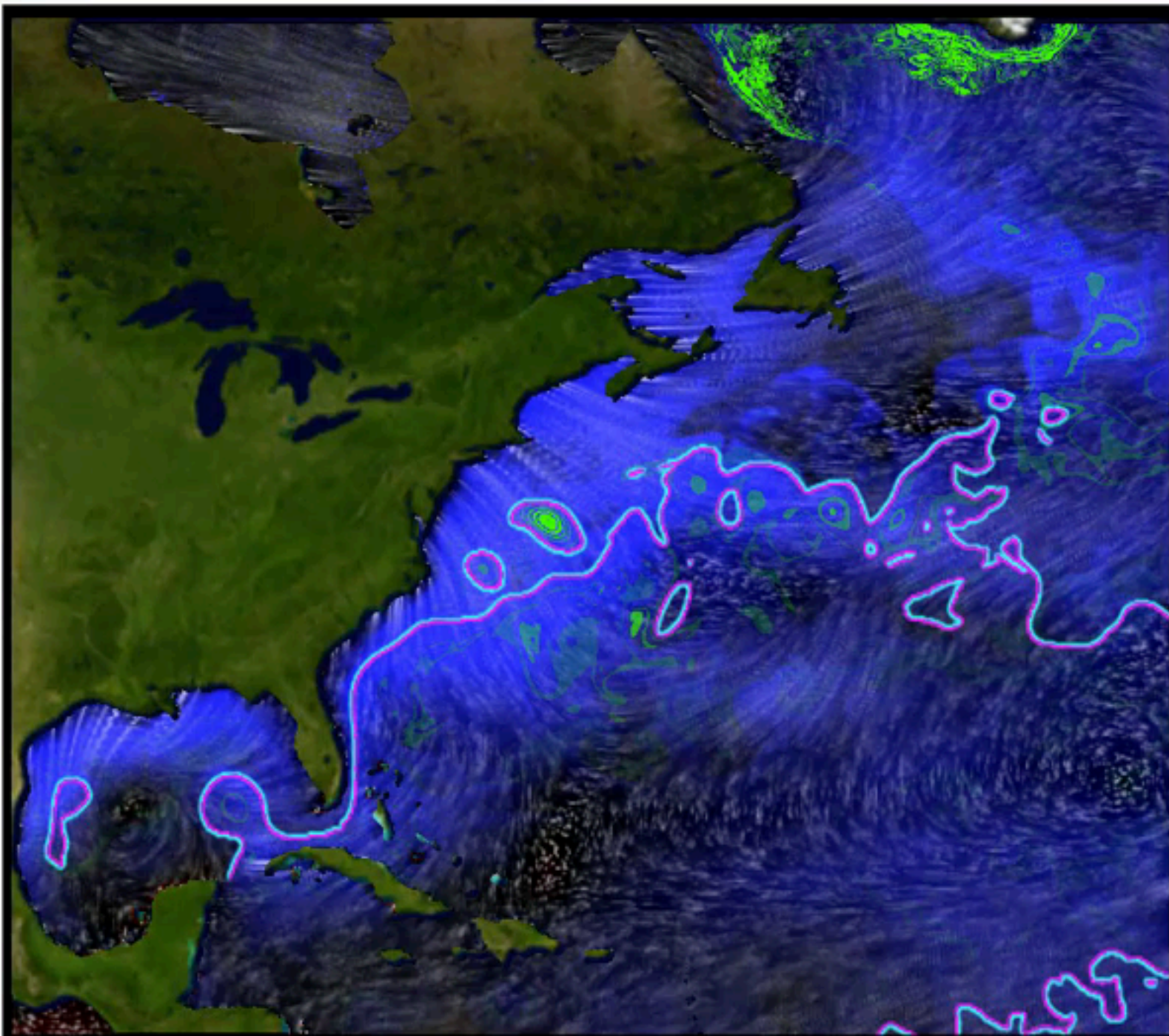
Presence of observable variability

- There is observable (autonomous, satellite & ship) ocean heat content variability.
- The near surface seasonal cycle, regional variations, and individual flux components are $O(100 \text{ W/m}^2)$
- Imbalance of Q_{TOA} and net mixed layer entrainment Q_{BML} are $O(1 \text{ W/m}^2)$
- In Situ & Satellite agree.





- Understanding of past variability
 - Monday Morning Quarterbacking abounds in variability analyses, e.g.:
 - You can't use 1998 as a start year for climate change—it was the biggest ENSO event of the past 100yr...
 - Phase of the PDO explains the recent warming hiatus, but we don't know what PDO is...
 - May explain and test our understanding, but it has little predictive power.



Weather,
Atmosphere
Fast

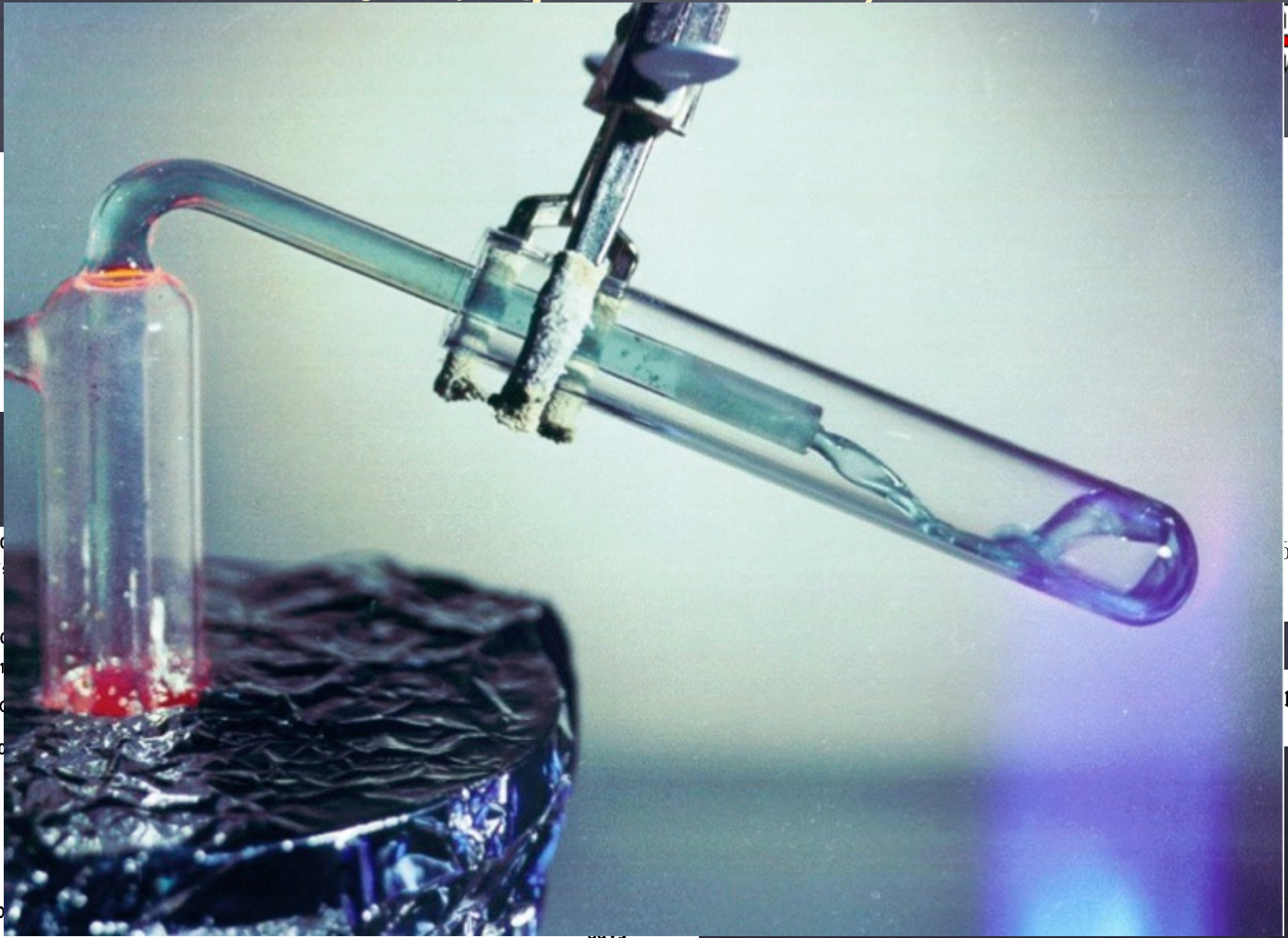
Ocean,
Climate
Slow

3.4m of ocean
water has
same heat
capacity as
the WHOLE
atmosphere

tau / qflux / theta200m / kppMLD

Jan 1 00:30 2001

Modeling of variability



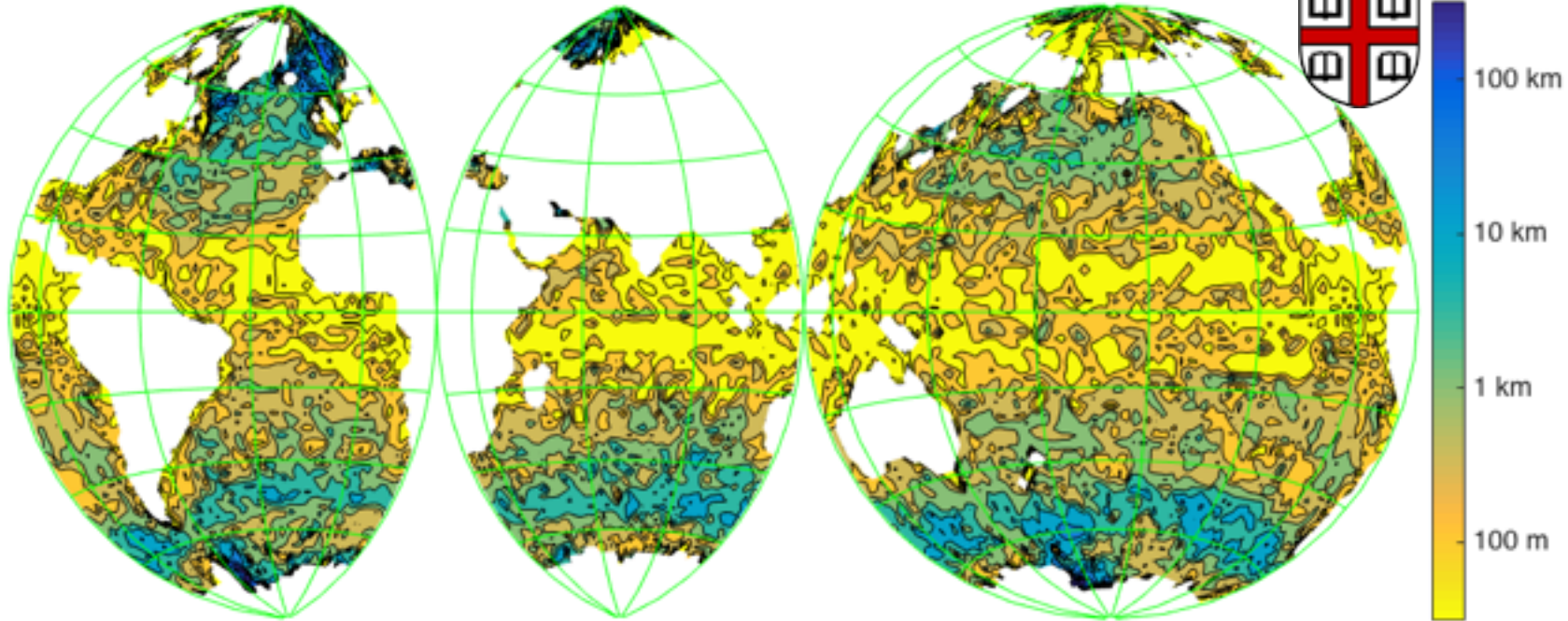
0.0
ly/
0.0
°C
0
-0

5
1

days



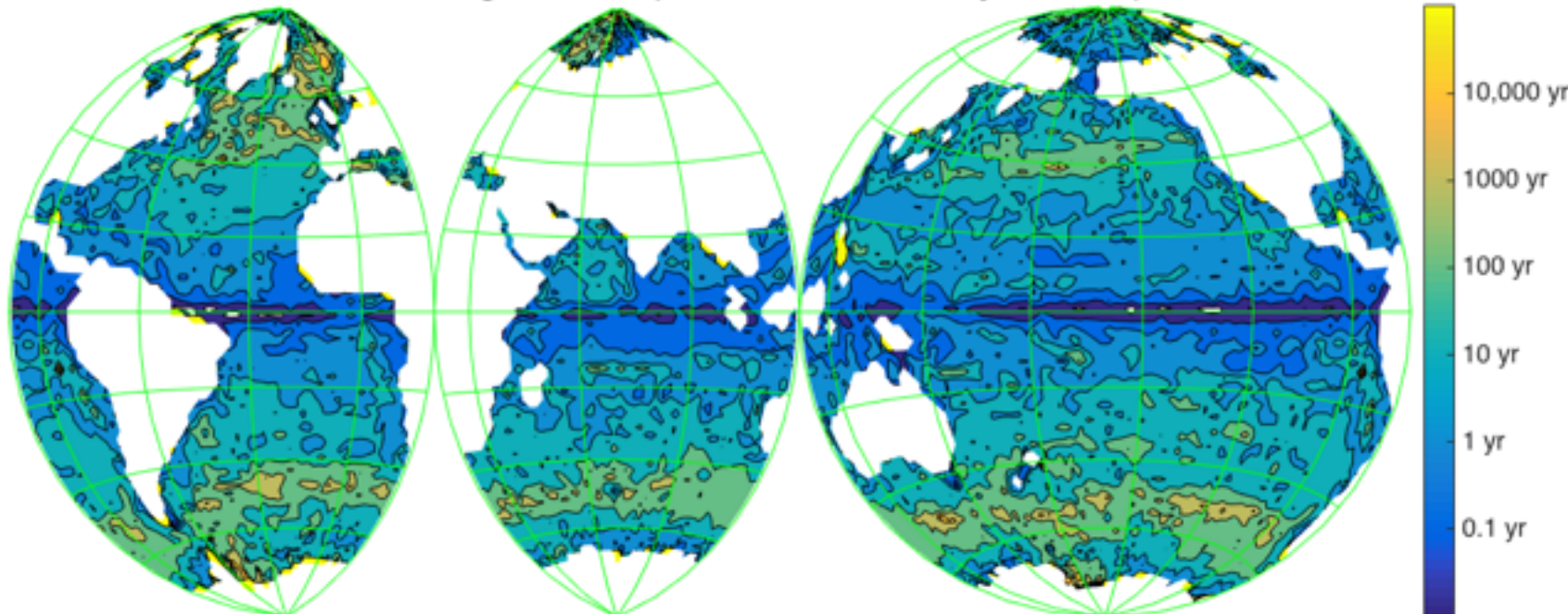
Equivalent Depths of Watermasses by Source (Gebbie & Huybers, 2011)



Consider
lots of
1D Oceans:
one per
watermass

Wind
(Ekman)
flushing
gives
upper limit
to λ^{-1}
timescale

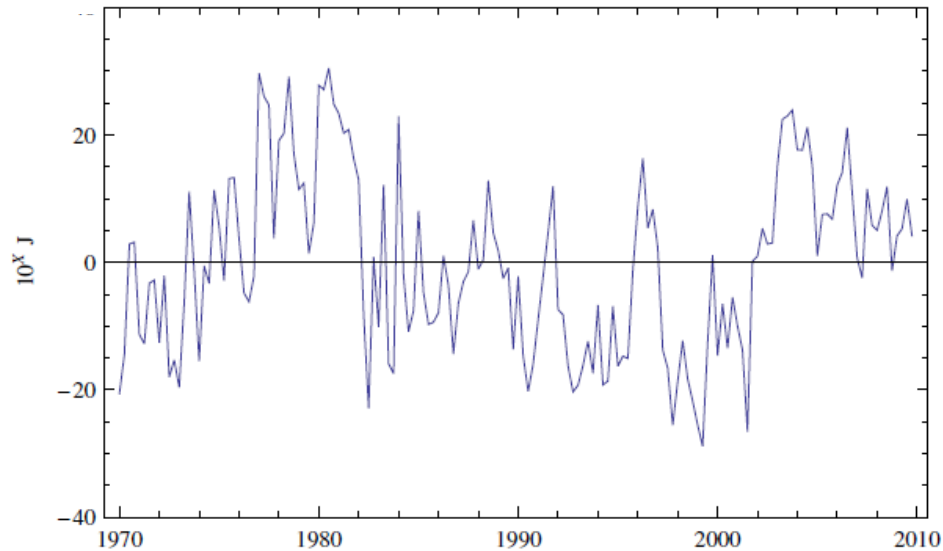
Ekman Flushing Timescale (ECCOv4 + Gebbie & Huybers, 2011)



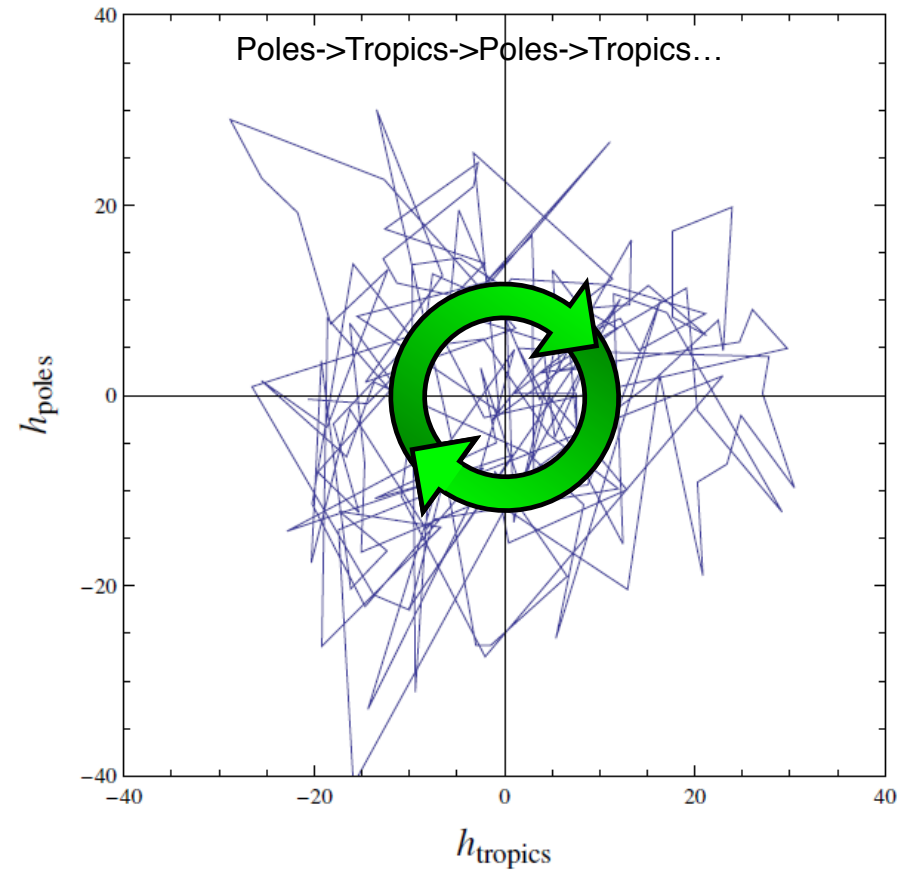
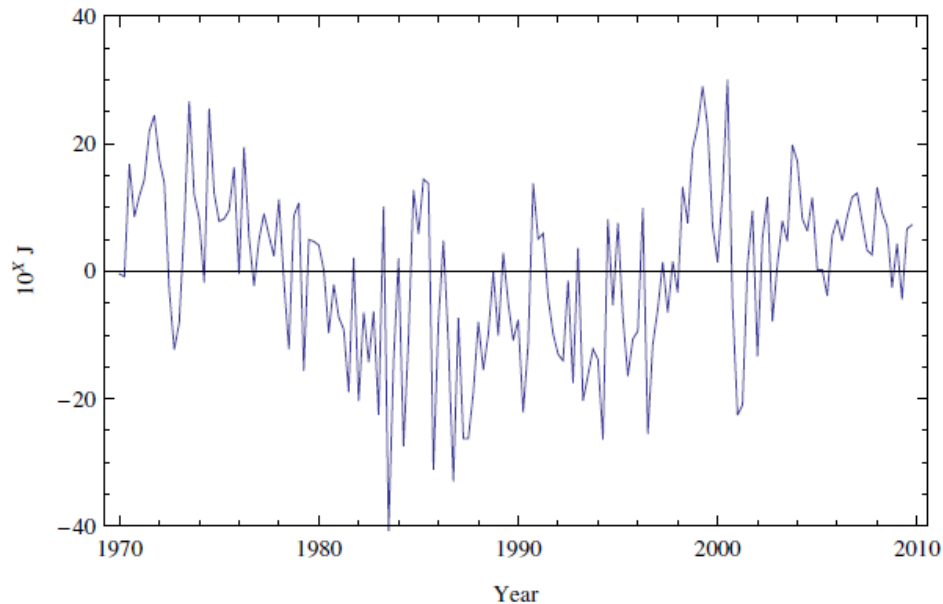
If Connections Occur Between Regions— Predictability Can Arise, Even in Stochastic Systems.



Tropical Ocean Heat Content h_{tropics}



Polar Ocean Heat Content h_{poles}



This is the root cause of
most stochastic model
predictability beyond persistence

Global climate models do pretty well at matching heat fluxes and watermasses.

Statistically significant differences in a few timescales & regions from obs.
(Ticks=10 W/m²)

Models get better every generation due to improved resolution and parameterizations

What does it take to make these improvements?



CU, now NCAR



CU, now NCAR

S. C. Bates, BFK, S. R. Jayne, W. G. Large, S. Stevenson, and S. G. Yeager. Mean biases, variability, and trends in air-sea fluxes and SST in the CCSM4. *Journal of Climate*, 25(22):7781-7801, November 2012.

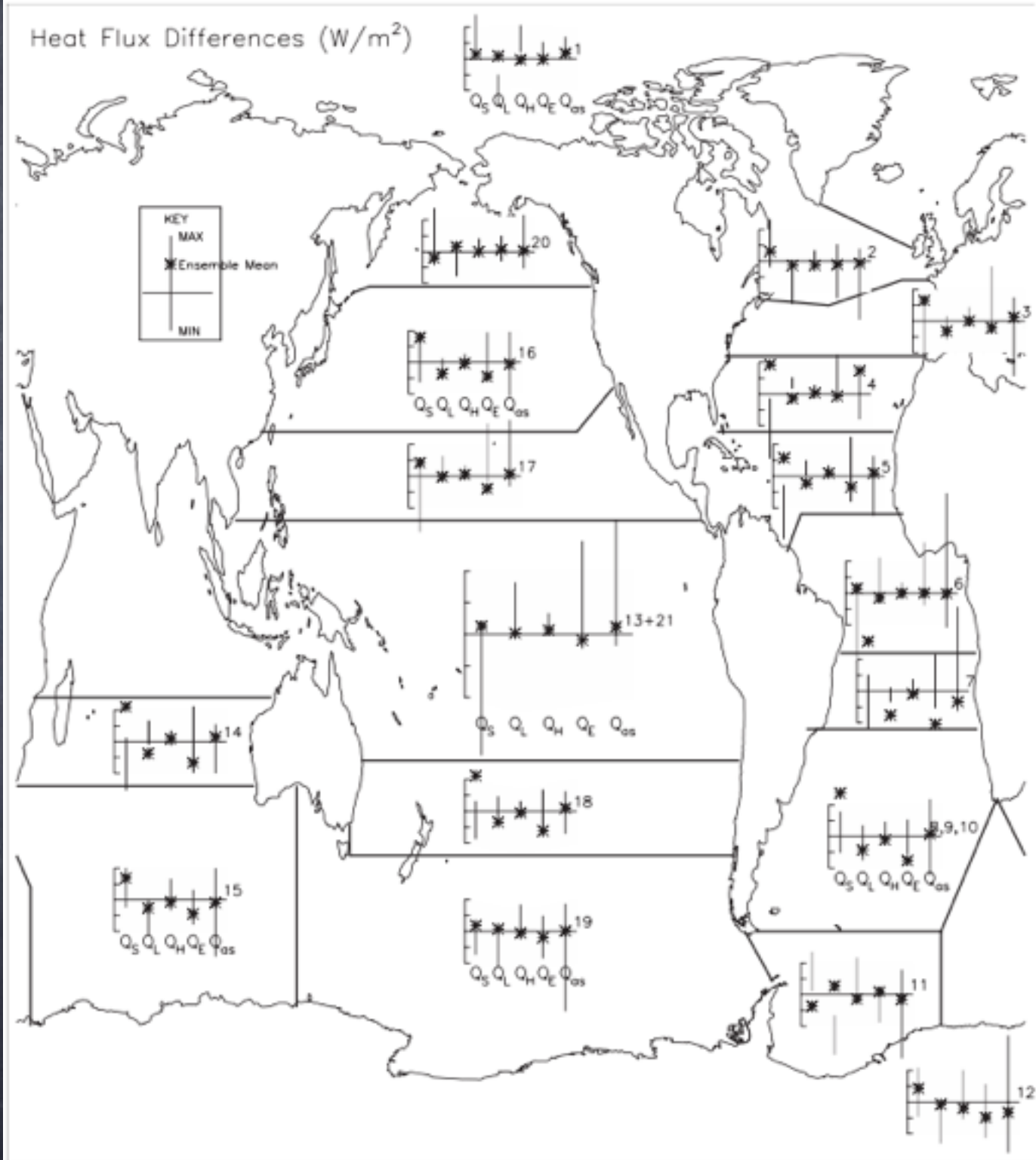


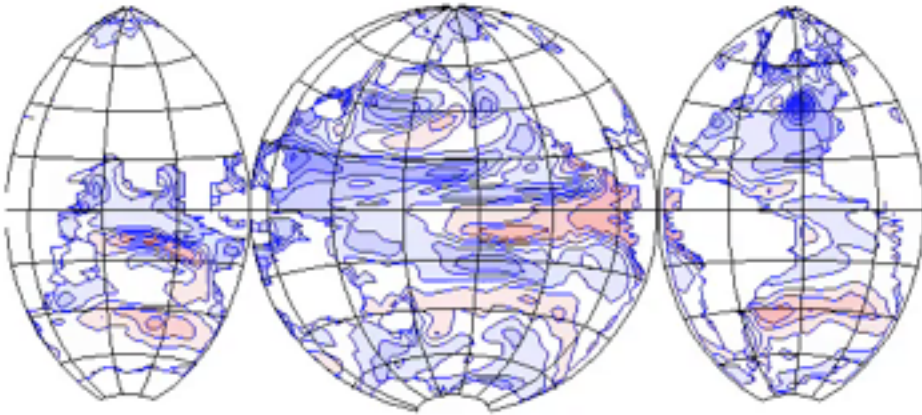
FIG. 4. Regional averages of the CCSM4 20C ensemble mean heat flux components differenced with the CORE

What does a climate model—WITHOUT WARMING—look like in Ocean Heat Content Variability?

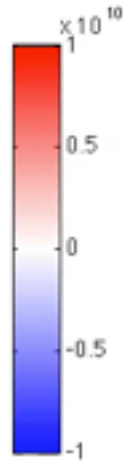


Doesn't even include mesoscale eddies

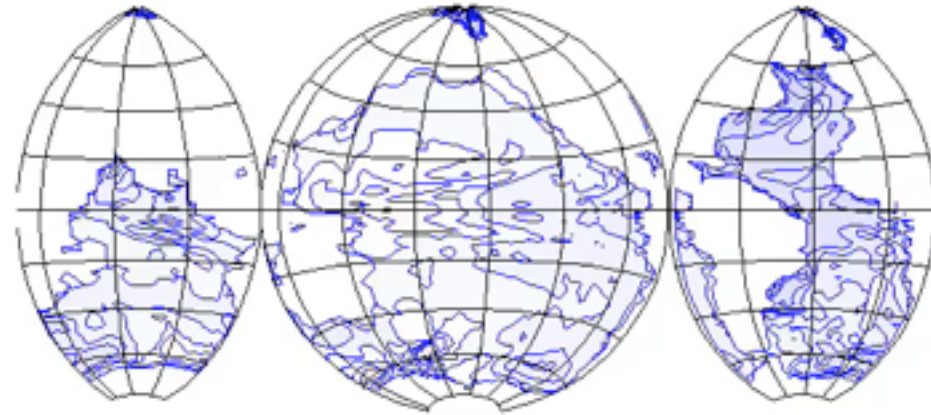
0-2km Depth Heat Content Anomaly (J) in year 200



Contours = 4 units



Below 2km Depth Heat Content Anomaly (J) in year 200



Contours = 1 unit

From the >1000yr steady forcing CCSM3.5 runs of Stevenson et al. 2012

S. Stevenson, BFK, and M. Jochum, 2012: Understanding the ENSO-CO2 link using stabilized climate simulations. *Journal of Climate*, 25(22):7917–7936.

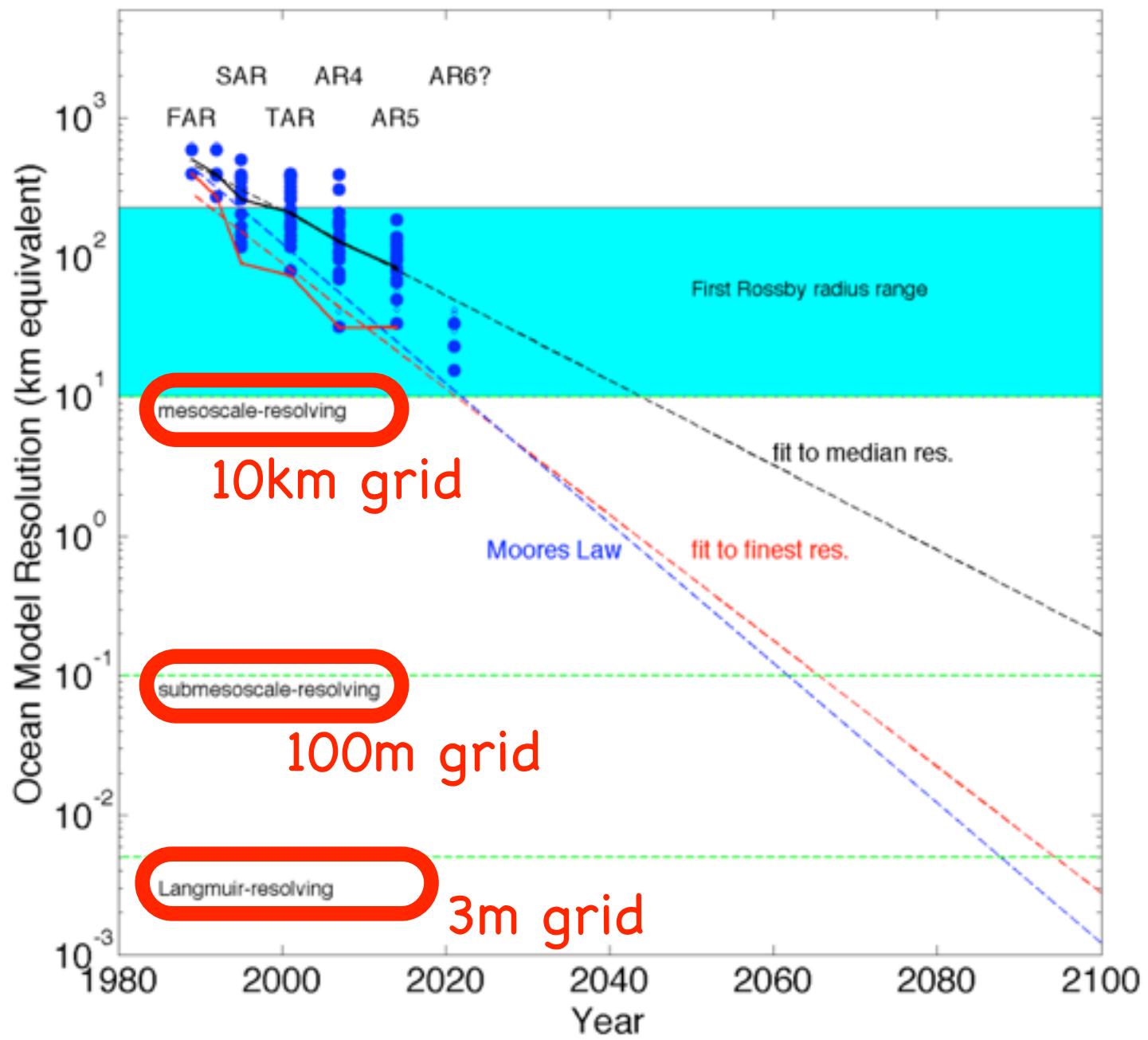


CU, now NCAR

Too Simple: What about directly modeling processes in climate models?
Don't we have big enough computers? or won't we soon?



Resolution of Ocean Component of Coupled IPCC models



Here are the collection of IPCC models...

If we can't resolve a process, we need to develop a parameterization or subgrid model of its effect



Anisotropic Mesoscale Eddy Advective & Diffusive Transport

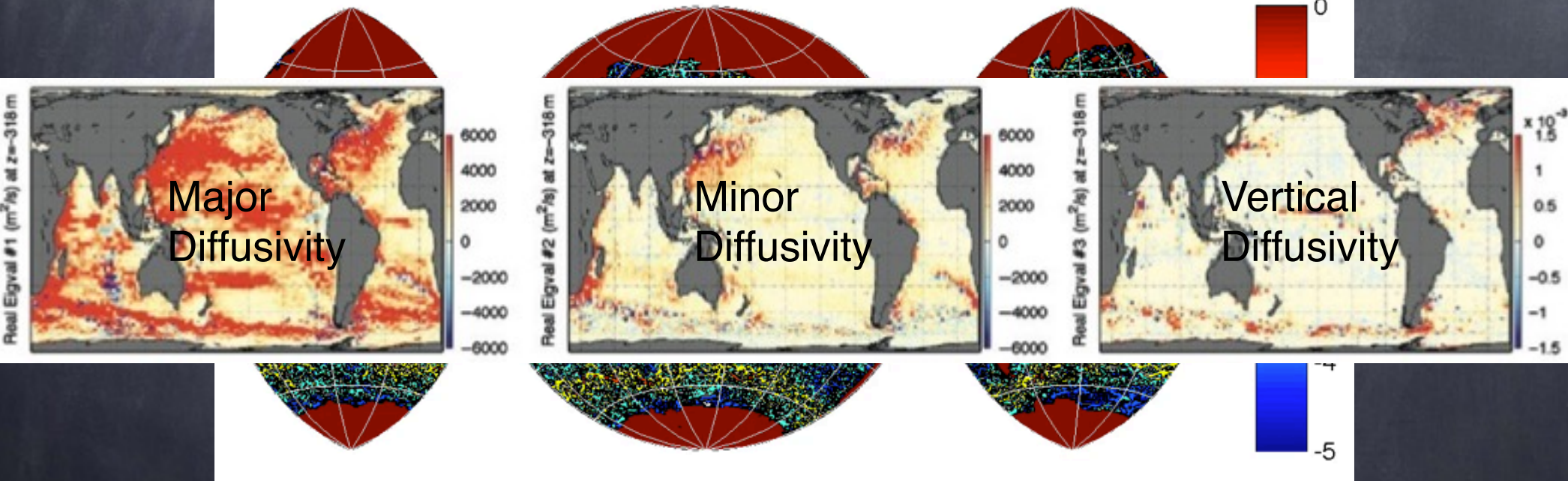
$$\overline{u'_j \tau'_\pi} = -R_{ji} \nabla_i \bar{\tau}_\pi$$

Flux-Gradient
(Anisotropic)

Symmetric=Diff.

Antisymmetric=Adv.

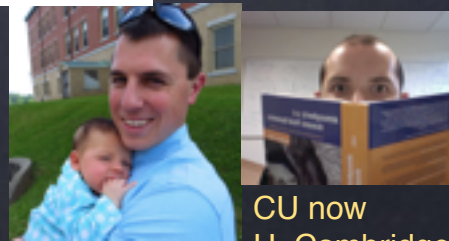
AVISO: $\log_{10}(0.5(u^2+v^2))$ on 19940101



BFK, R. Lumpkin, and F. O. Bryan. Lateral transport in the ocean interior. In G. Siedler, S. M. Griffies, J. Gould, and J. A. Church, editors, *Ocean Circulation and Climate: A 21st century perspective*, volume 103 of International Geophysics Series, chapter 8, pages 185-209. Academic Press (Elsevier Online), 2013.

S. Bachman and BFK. Eddy parameterization challenge suite. I: Eady spindown. *Ocean Modelling*, 64:12-28, 2013

S. Bachman, BFK, and F. O. Bryan. A tracer-based inversion method for diagnosing eddy-induced diffusivity and advection. *Ocean Modelling*, 86:1-14, February 2015.



Brown now
Montana State
CU now
U. Cambridge

Control: Isotropic

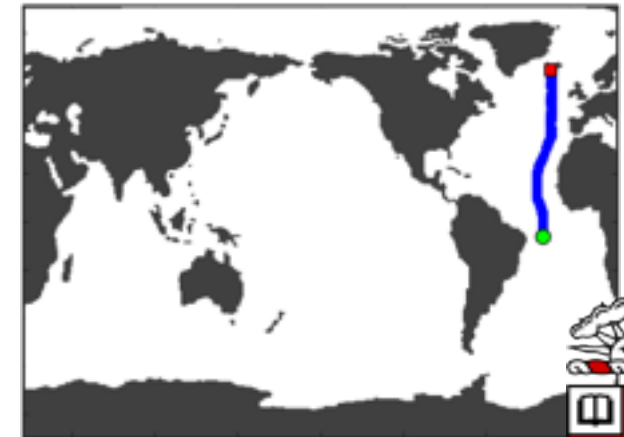
Anisotropic

Along transects

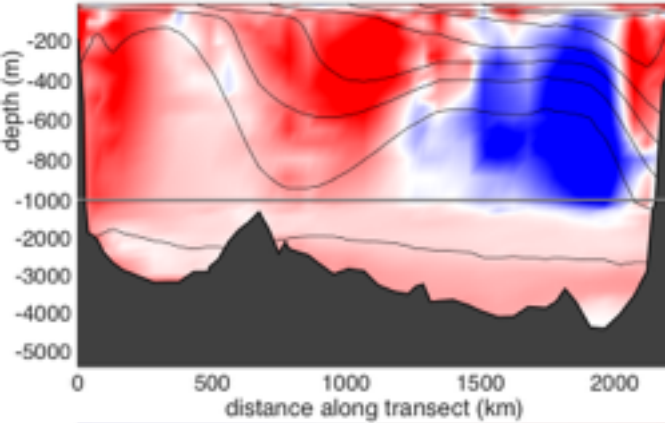
Map for a01e



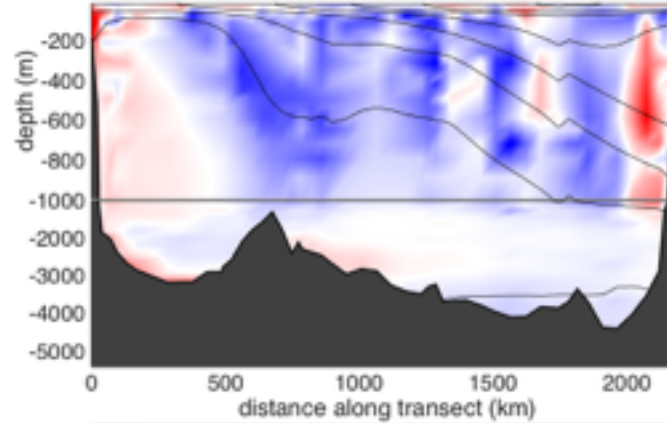
Map for a16n₂003a



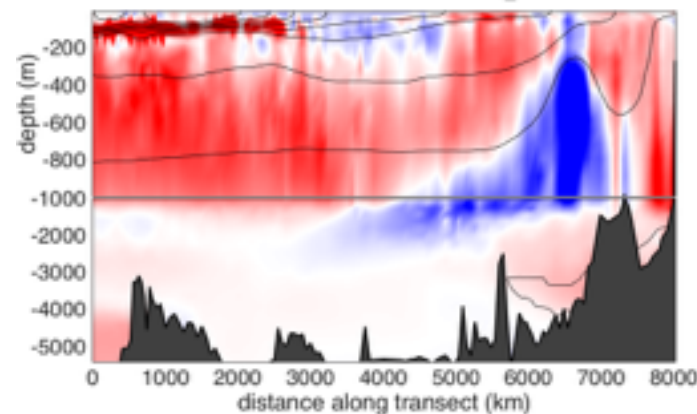
temp bias - bass - a01e



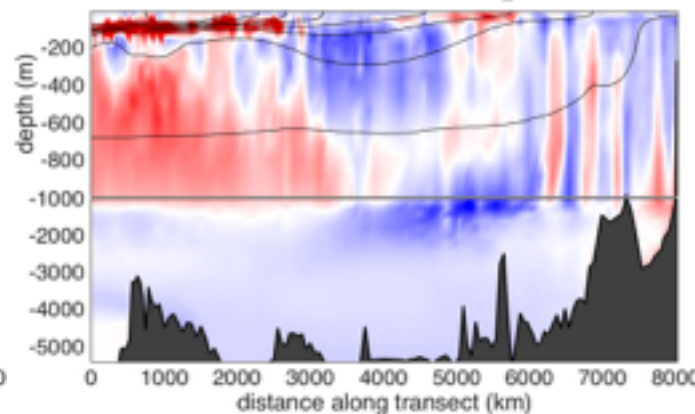
temp bias - flow - a01e



temp bias - bass - a16n₂003a



temp bias - flow - a16n₂003a



Anisotropy often reduces biases:

pCFC by up to 24%

Temp by up to 48%

Salinity by up to 63%

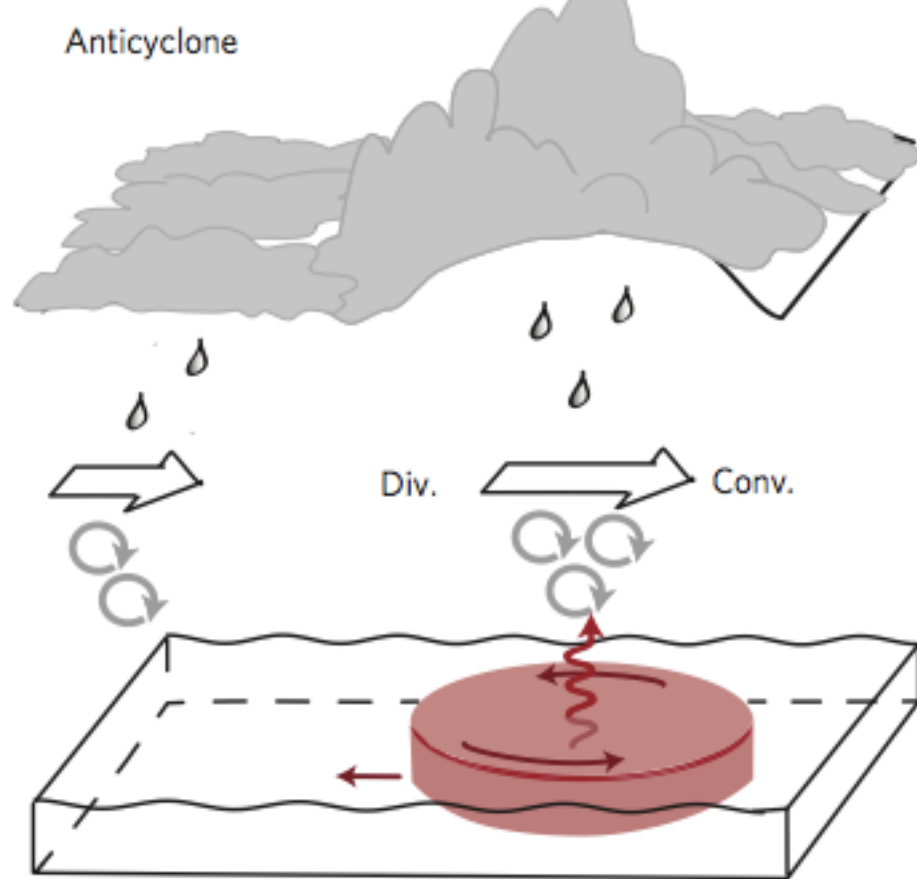
Mesoscale Eddies have a profound effect on Q_{BML}
Even small changes affect surface warming budget



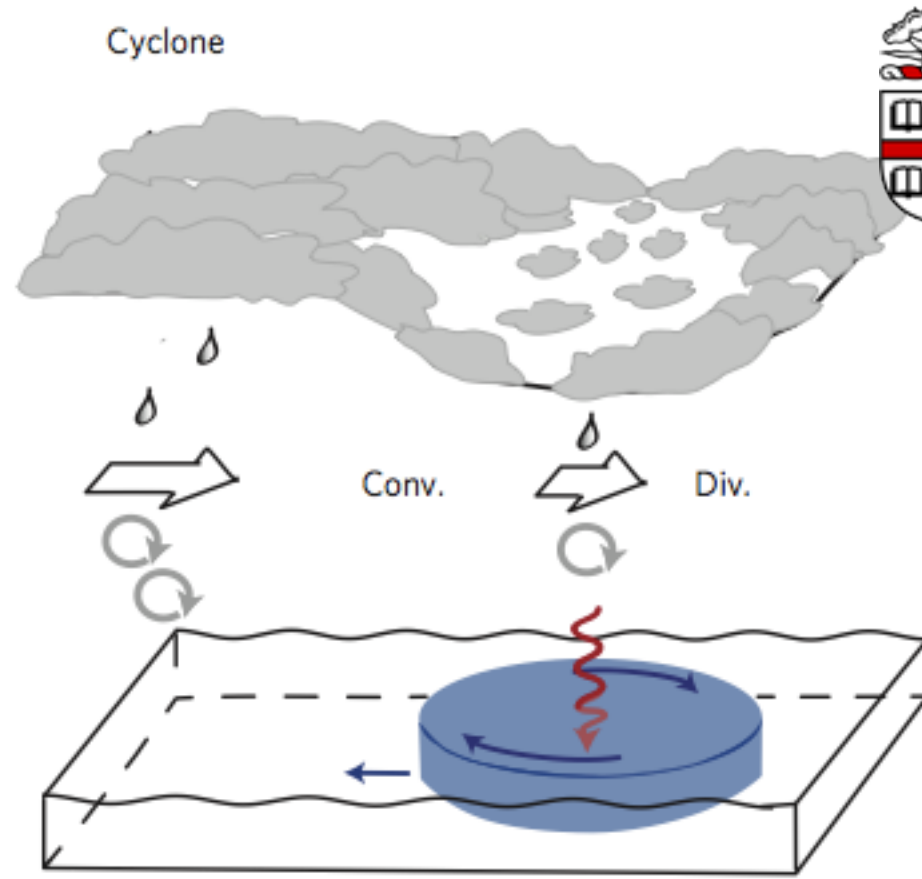
Brown now
Montana State

b

Anticyclone



Cyclone



Near-surface wind



Turbulence

Marine atmospheric boundary
layer clouds

Eddy swirl velocity



Eddy propagation



Rain

Air-sea heat and moisture flux
anomalies

Complicated Mesoscale Eddy Air-Sea Feedbacks? Resolve!
Effect on net air-sea fluxes observed, parameterization unknown.

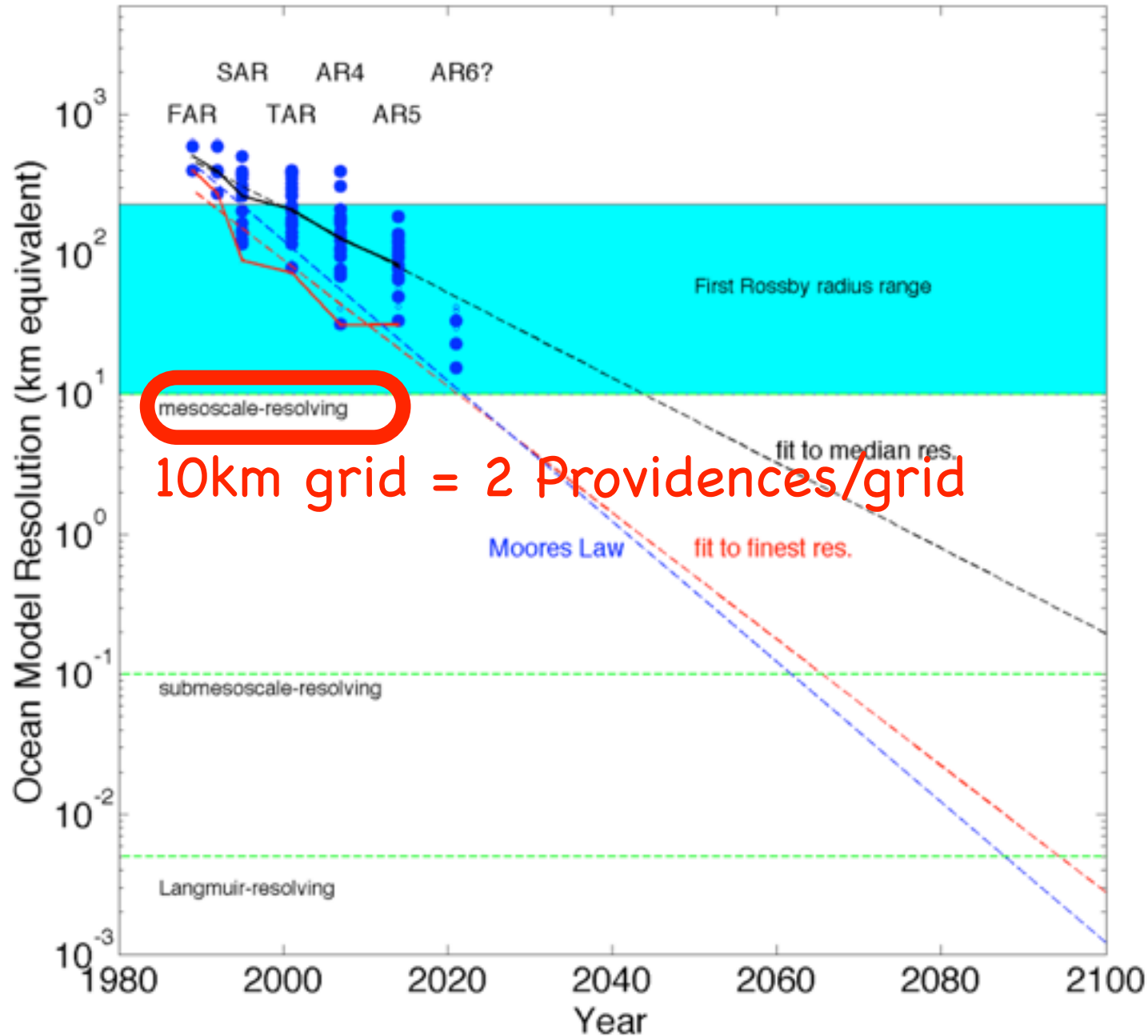
Bryan et al. 2010, Frenger et al. 2013

What about modeling important processes in climate models?

Don't we have big enough computers? or won't we soon?



Resolution of Ocean Component of Coupled IPCC models

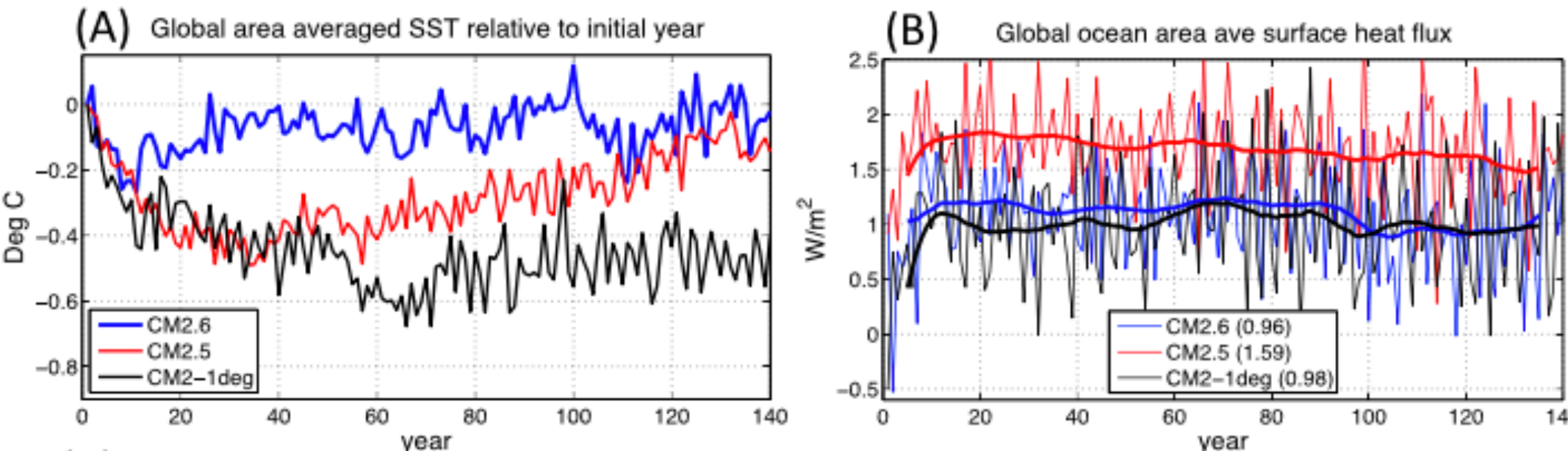


Here are the collection of IPCC models...

If we can't resolve a process, we need to develop a parameterization or subgrid model of its effect

By comparing resolved mesoscale eddies to parameterized ones (with same 50km atmosphere), we get another entry in the pile!

$O(0.7 \text{ W/m}^2)$ persistent and $O(0.4 \text{ K/century})$, i.e., significant warming to upper 1500m of ocean.



Stephen M. Griffies, Michael Winton, Whit G. Anderson, Rusty Benson, Thomas L. Delworth, Carolina O. Dufour, John P. Dunne, Paul Goddard, Adele K. Morrison, Anthony Rosati, Andrew T. Wittenberg, Jianjun Yin, and Rong Zhang, 2015: Impacts on Ocean Heat from Transient Mesoscale Eddies in a Hierarchy of Climate Models. *J. Climate*, 28, 952–977.



Viscosity Scheme: BFK and D. Menemenlis. Can large eddy simulation techniques improve mesoscale-rich ocean models? In M. Hecht and H. Hasumi, editors, *Ocean Modeling in an Eddying Regime*, volume 177, pages 319-338. AGU Geophysical Monograph Series, 2008.

MILLIONS OF CPUHRS!



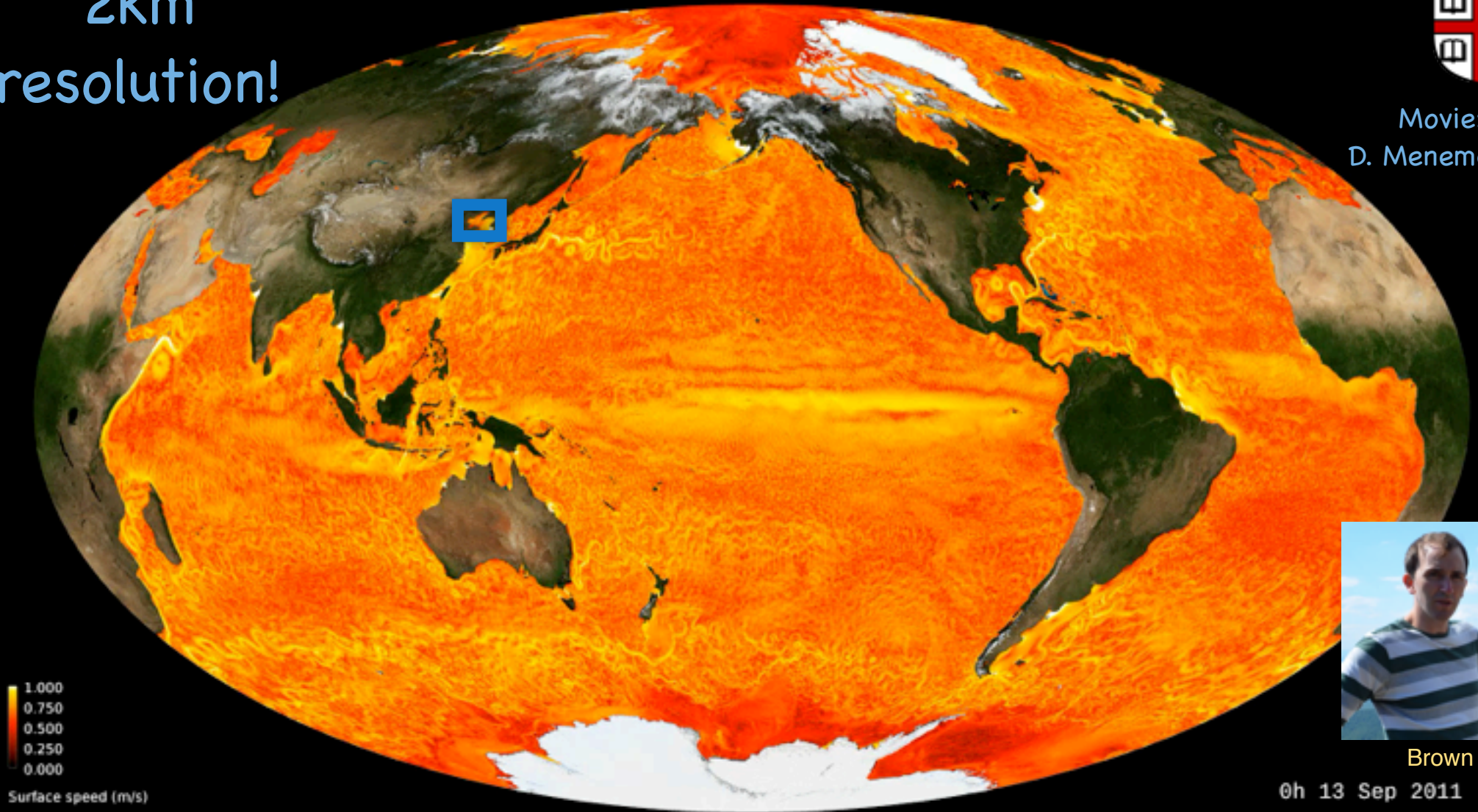
Brown

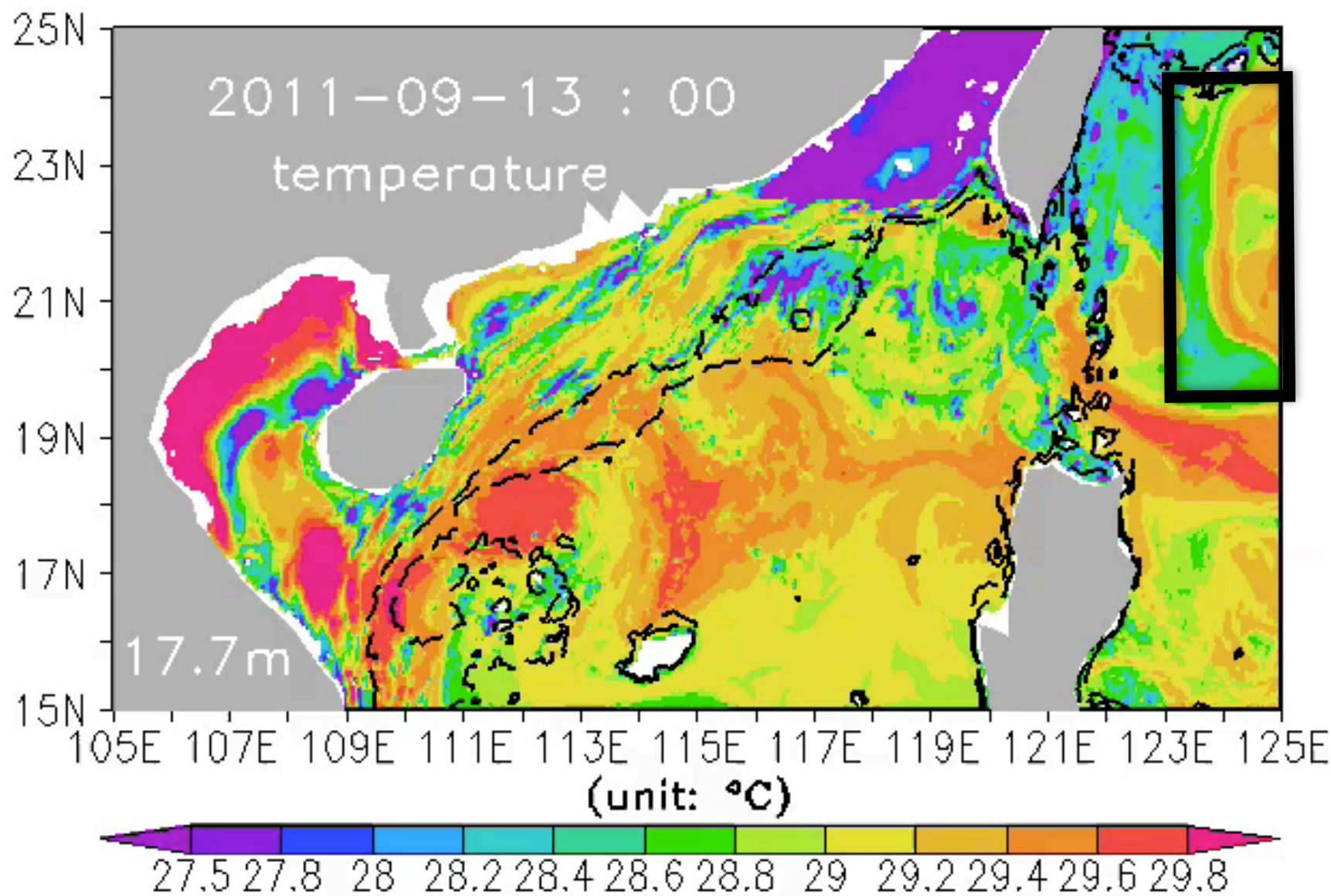
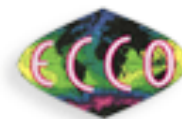


2km
resolution!



Movie:
D. Menemenlis





Movie:
Z. Jing

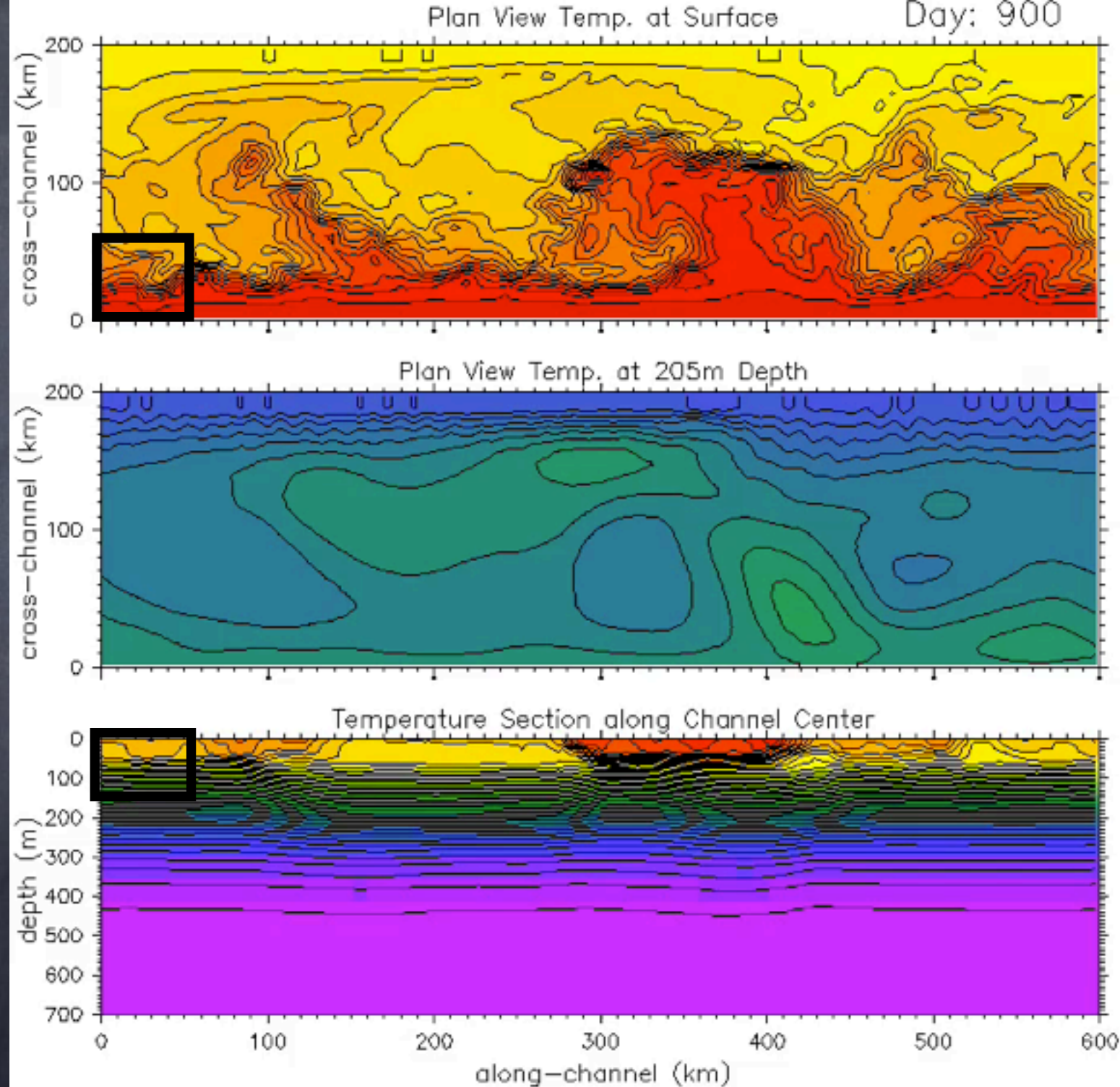


Brown Visitor
from
S. China Sea
Institute of Ocean.

Local Analysis: Z. Jing, Y. Qi, BFK, Y. Du, and S. Lian. Seasonal thermal fronts and their associations with monsoon forcing on the continental shelf of northern South China Sea: Satellite measurements and three repeated field surveys in winter, spring and summer. *Journal of Geophysical Research-Oceans*, August 2015. Submitted.

200km x 600km
x 700m
domain

1000 Day
Simulation



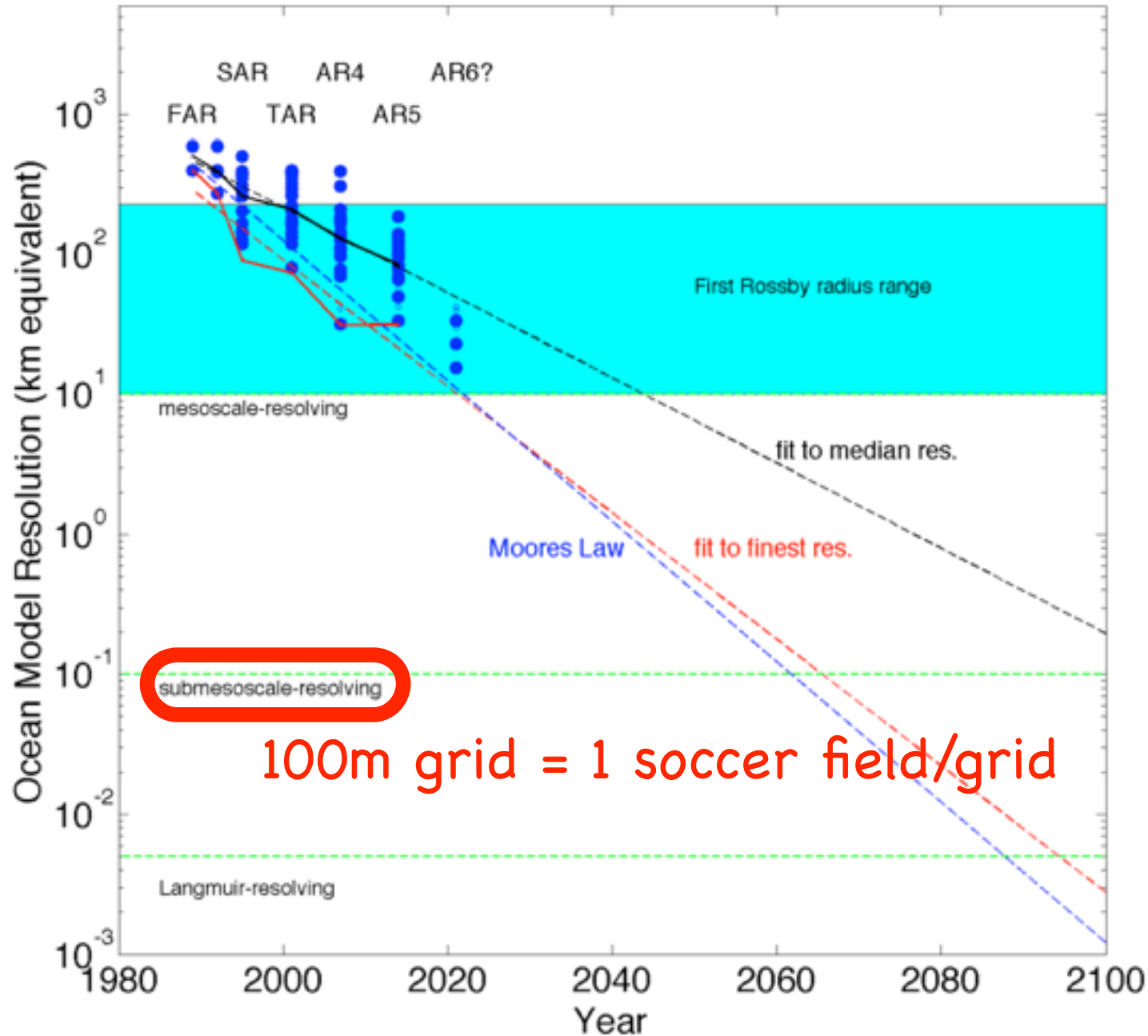
G. Boccaletti, R. Ferrari, and BFK. Mixed layer instabilities and restratification. *Journal of Physical Oceanography*, 37(9): 2228-2250, 2007.

What about modeling important processes in climate models?

Don't we have big enough computers? or won't we soon?



Resolution of Ocean Component of Coupled IPCC models



Here are the collection of IPCC models...

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The Character of the Submesoscale

(Capet et al., 2008)

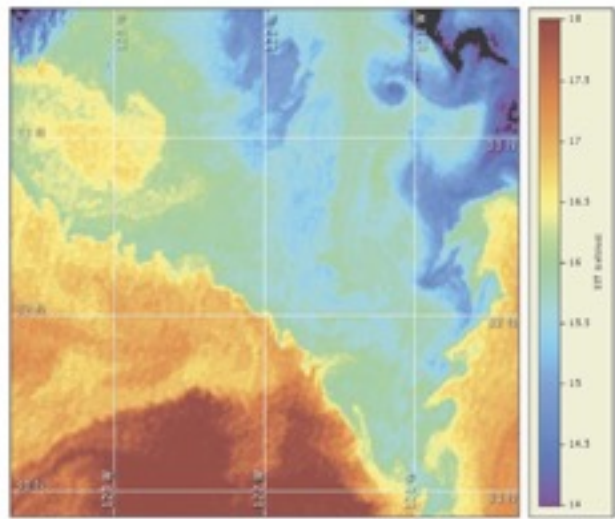
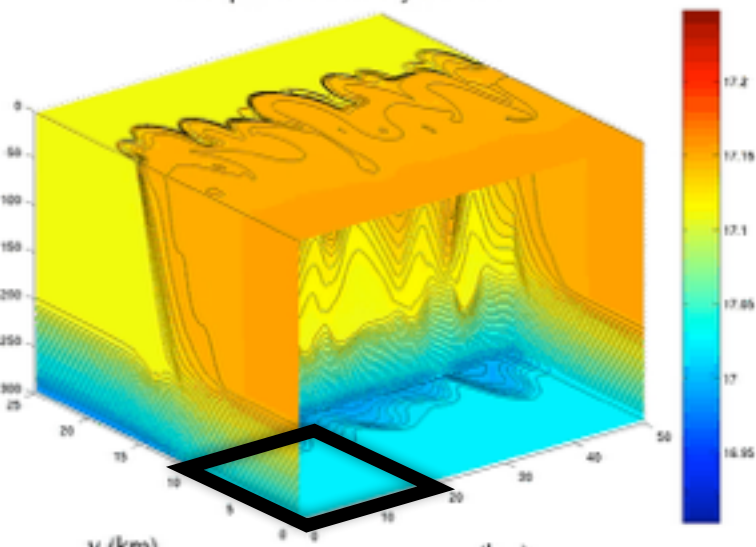


FIG. 16. Sea surface temperature measured at 1832 UTC 3 Jan 2006 off Point Conception in the California Current from CoastWatch (<http://coastwatch.pfeg.nasa.gov>). The fronts between recently

Temperature on day:17.375

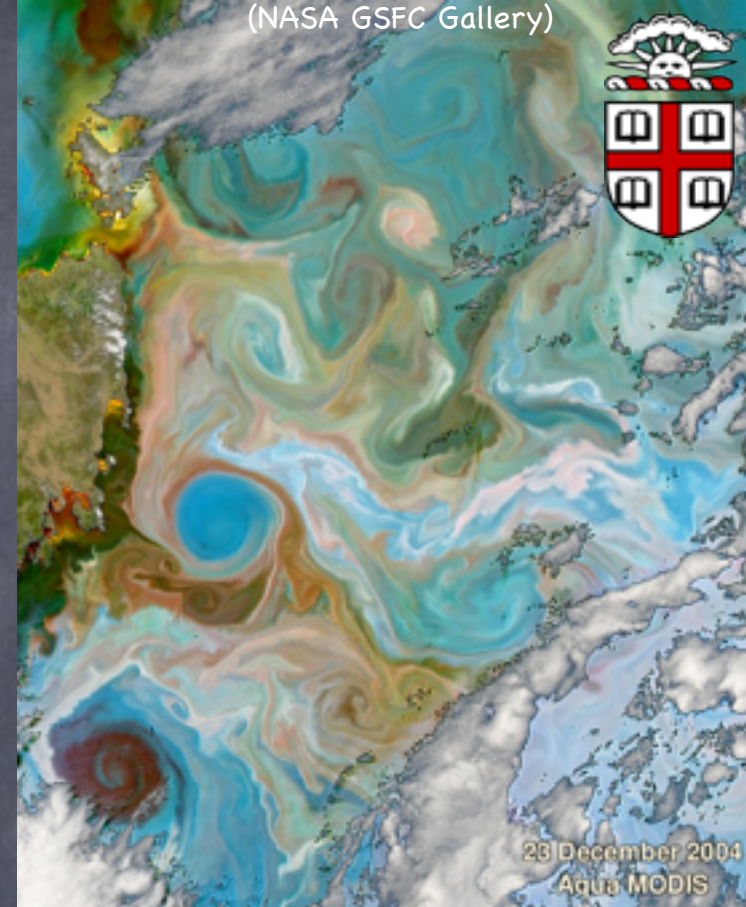


- Fronts
- Eddies
- $Ro=O(1)$
- $Ri=O(1)$
- near-surface ($H=100m$)
- 1-10km, days

Eddy processes often
baroclinic instability

Parameterizations =
BFK et al (08-11).

←
10
km



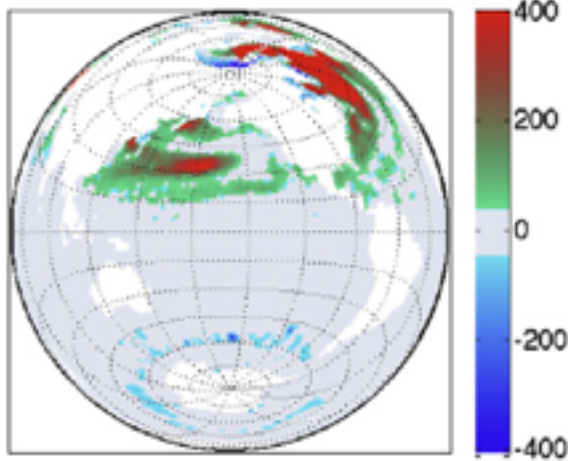
BFK, R. Ferrari, and R. W. Hallberg. Parameterization of mixed layer eddies. Part I: Theory and diagnosis. *Journal of Physical Oceanography*, 38(6):1145-1165, 2008

BFK, G. Danabasoglu, R. Ferrari, S. M. Griffies, R. W. Hallberg, M. M. Holland, M. E. Maltrud, S. Peacock, and B. L. Samuels. Parameterization of mixed layer eddies. III: Implementation and impact in global ocean climate simulations. *Ocean Modelling*, 39:61-78, 2011.

S. Bachman and BFK. Eddy parameterization challenge suite. I: Eady spindown. *Ocean Modelling*, 64:12-28, 2013

Global **Ocean Climate** is **SENSITIVE** to these **Submesoscale Eddies!** At least in parameterized form
 Implemented in IPCC AR5 & 6: NCAR, GFDL, Hadley, NEMO,...

CM2M H_{ml} Control-deBM (m) FEB



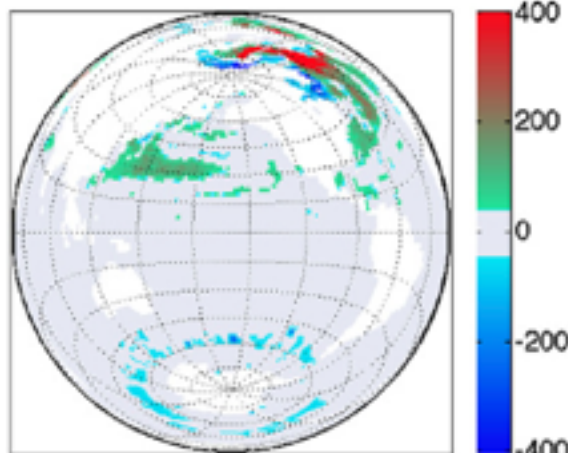
max=2528m, min=-1560m

February
 Mixed layer
 depth Bias w/o
 MLE

$O(0.1 \text{ W/m}^2)$ change to
 global mean net fluxes,
 Regional: 5 to 50 W/m^2

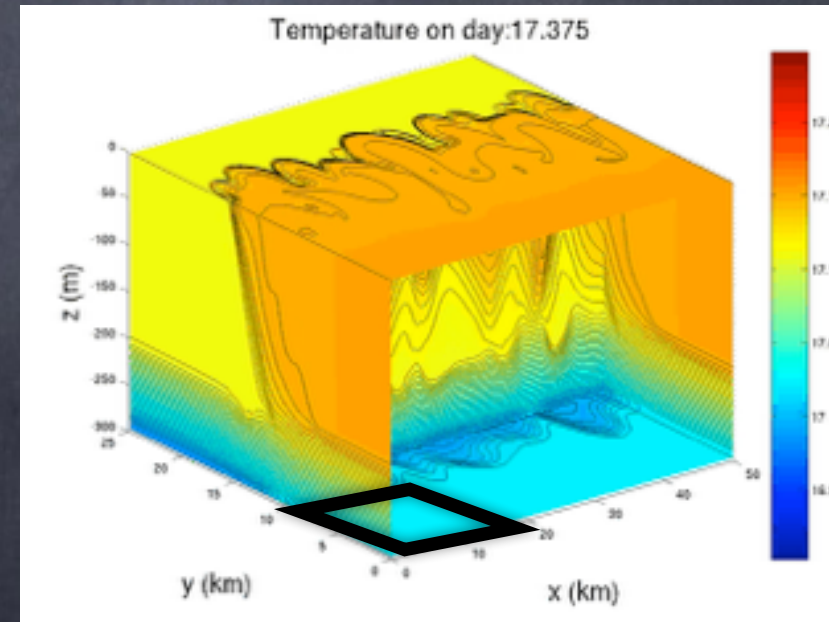
Deep Mixed Layer
 Bias reduced

CM2M H_{ml} Submeso-deBM (m) FEB



max=1422m, min=-1600m

February
 MLD Bias
 With MLE
 Parameterization



20km x 20km x 150m
domain

10 Day Simulation

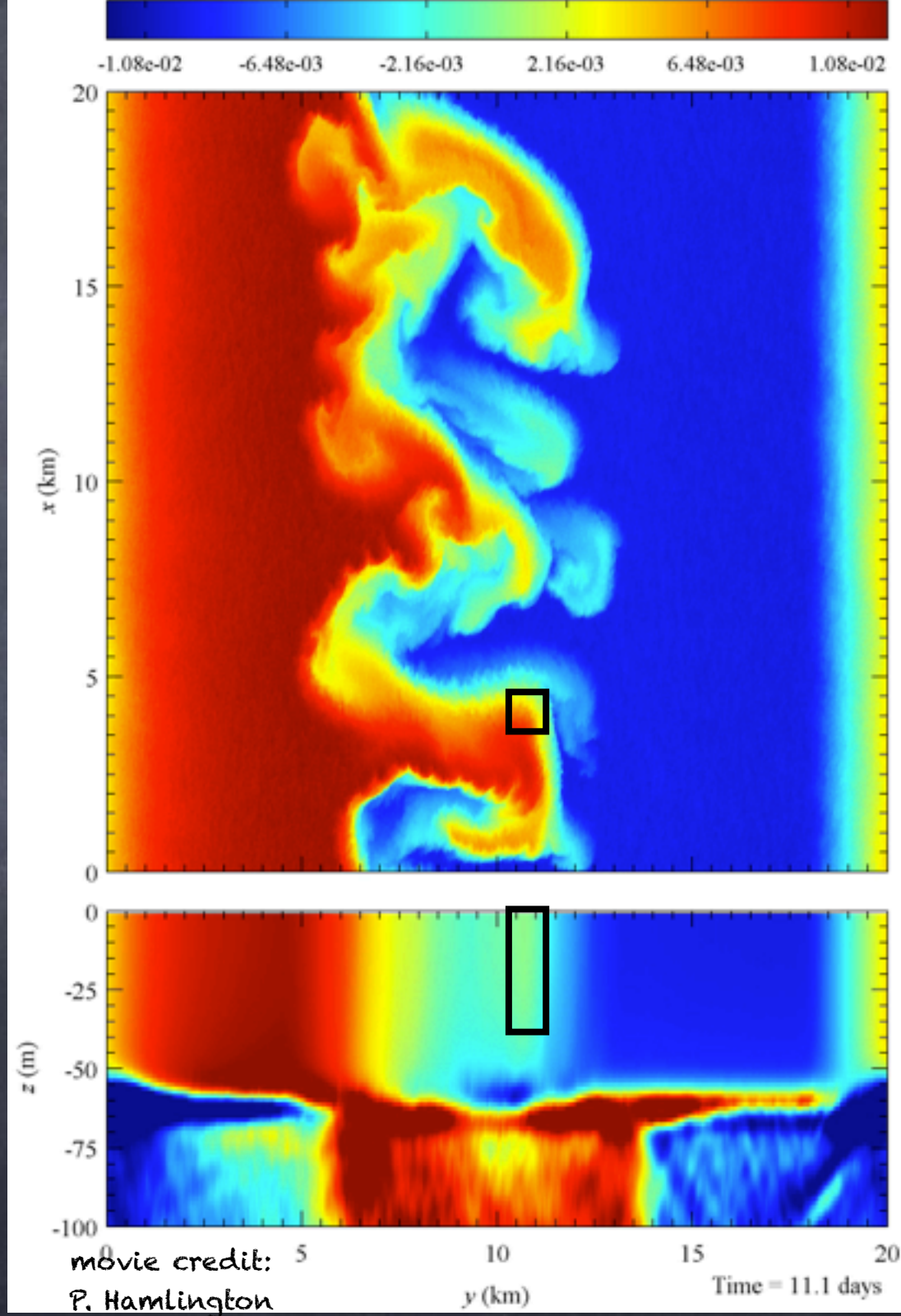


CU, now CU



CU, now LANL

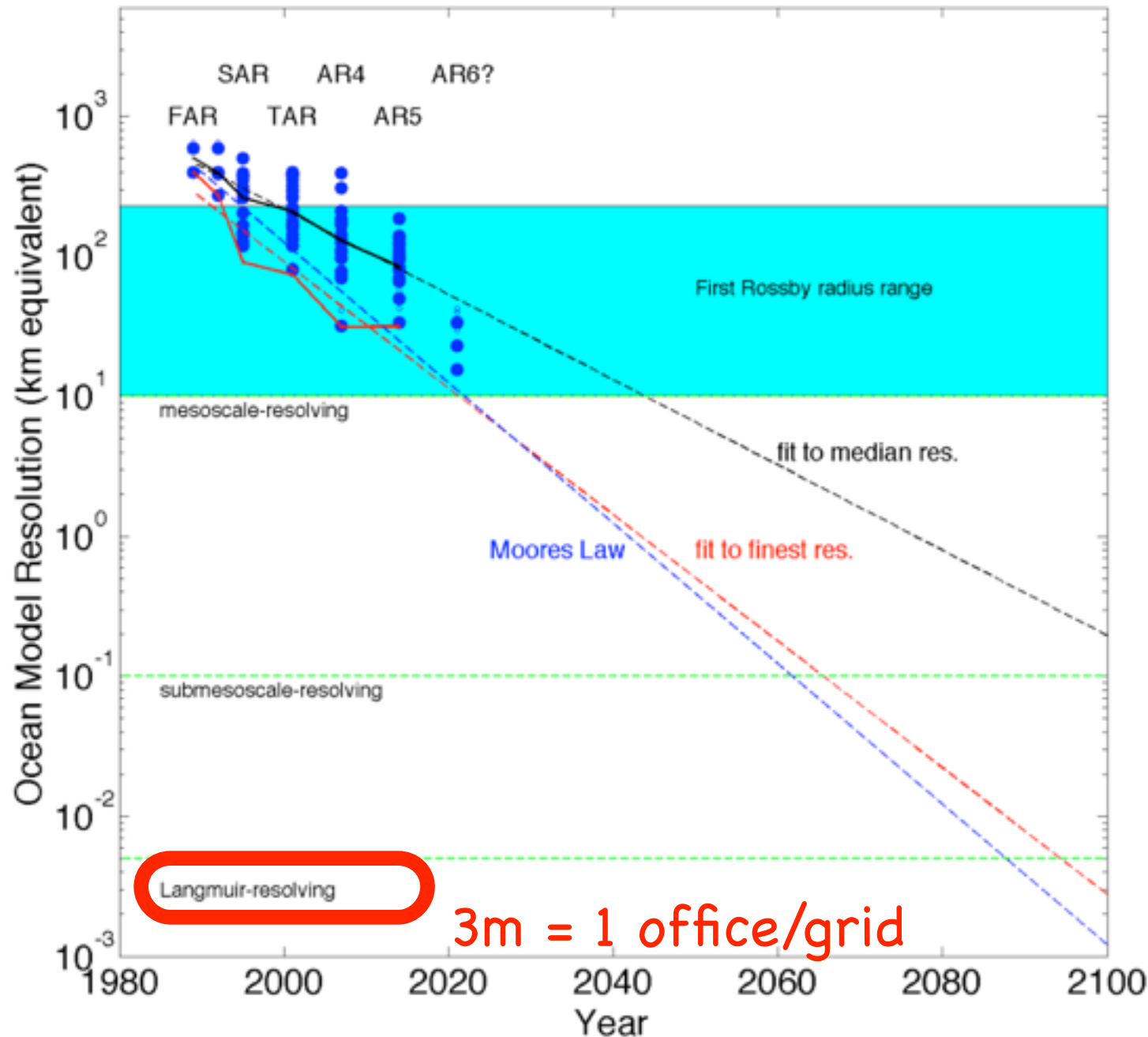
P. E. Hamlington, L. P. Van Roekel, BFK, K. Julien, and G. P. Chini. Langmuir-submesoscale interactions: Descriptive analysis of multiscale frontal spin-down simulations. *Journal of Physical Oceanography*, 44(9): 2249-2272, September 2014.



Climate Model Resolution: an issue for centuries to come!



Resolution of Ocean Component of Coupled IPCC models

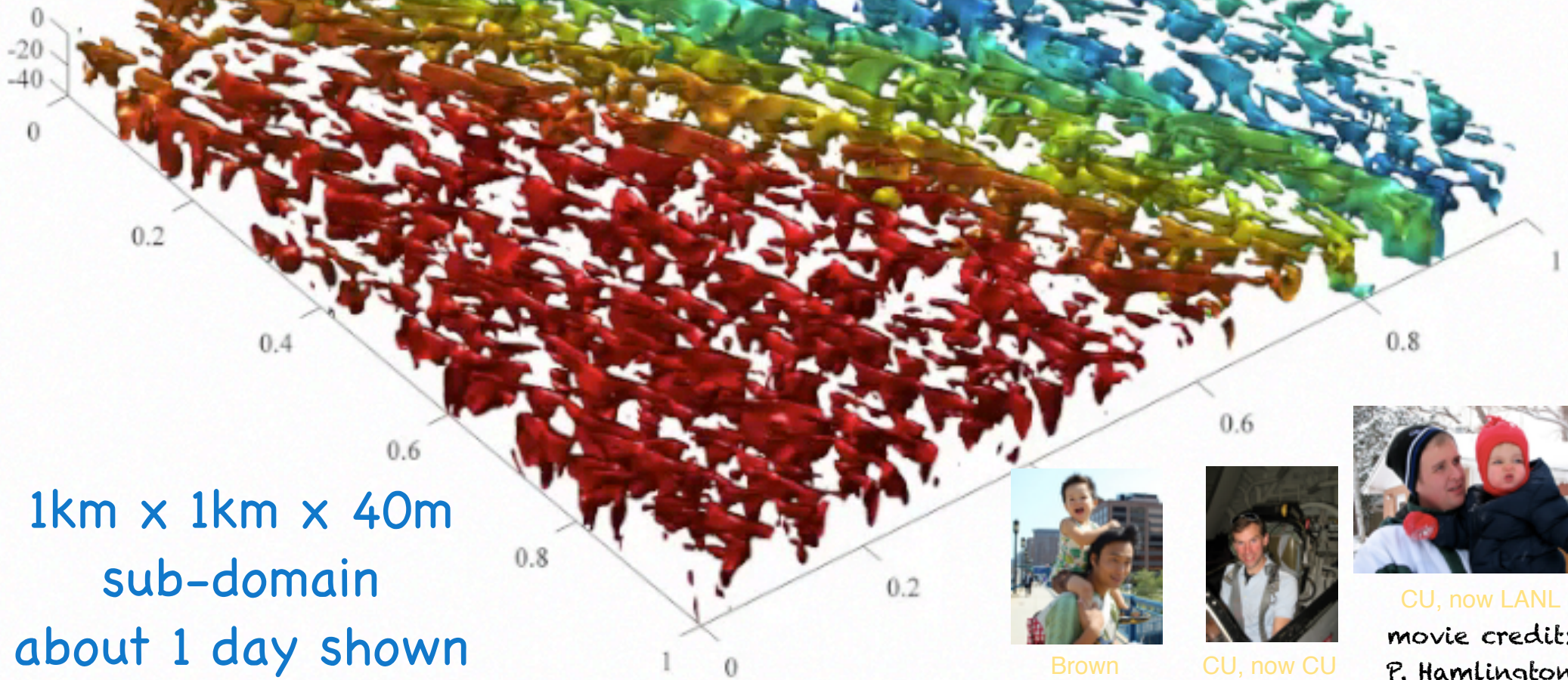


Here are the collection of IPCC models...

If we can't resolve a process, we need to develop a parameterization or subgrid model of its effect

20km x 20km x 150m
domain
10 Day Simulation

Colors=Temp.
Surfaces on
Large w



1km x 1km x 40m
sub-domain
about 1 day shown



Brown



CU, now CU



CU, now LANL
movie credit:
P. Hamlington

The Character of the Langmuir Scale

image:
Thorpe, 04

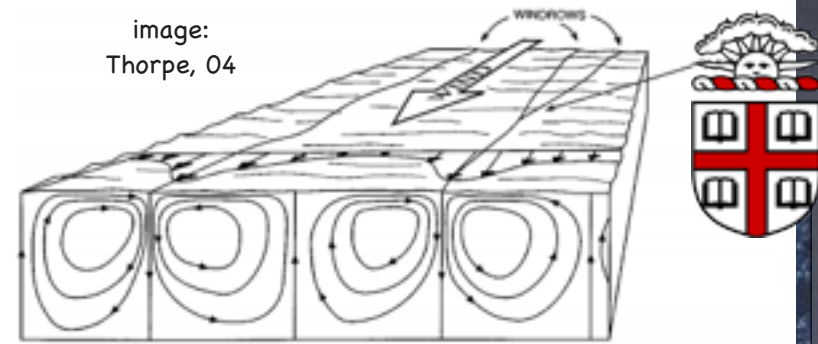


Figure 1 Sketch showing the pattern of mean flow in idealized Langmuir circulation. The windrows may be 2 m to 300 m apart, and the cell form is roughly square (as shown). In practice the flow is turbulent, especially near the water surface, and the windrows (Figure 2) amalgamate and meander in space and time. Bands of bubbles or buoyant algae may form within the downward-going (or downwelling) flow (see Figure 3).

- Near-surface

- Langmuir Cells & Langmuir Turb.

- $Ro \gg 1$

- $Ri < 1$: Nonhydro

- 1-100m ($H=L$)

- 10s to 1hr

- $w, u = O(10\text{cm/s})$

- Stokes drift

- Eqtns: Craik-Leibovich

- Params: McWilliams & Sullivan, 2000, Van Roekel et al. 2012

- Resolved routinely in 2170

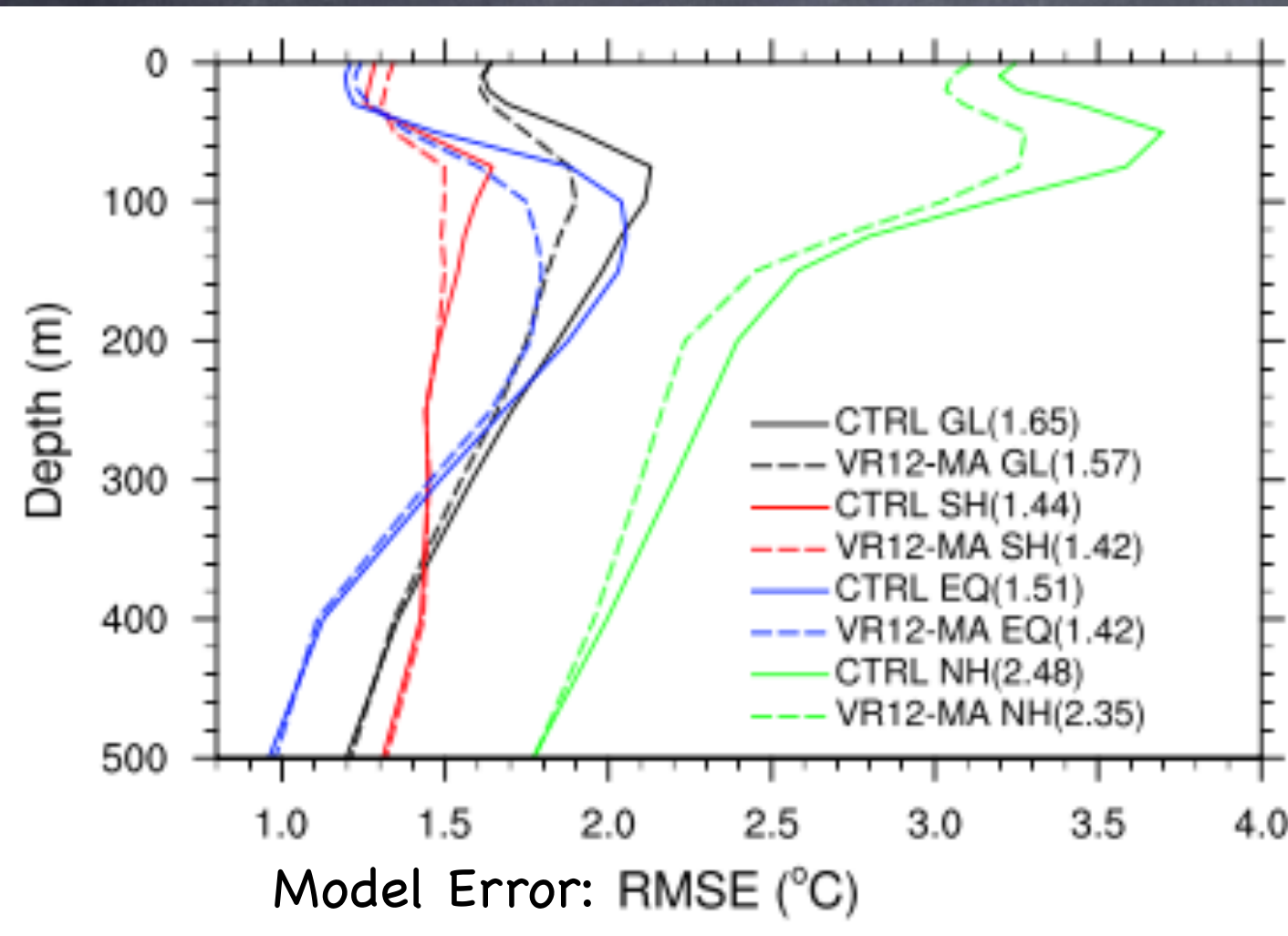
Image: NPR.org,
Deep Water
Horizon Spill

Modeling of variability



First-Principle Process & GCM Modeling: Predictions and Biases

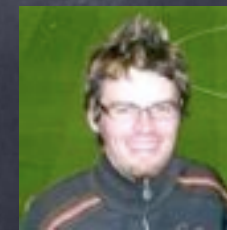
How much does Langmuir mixing affect Globe?



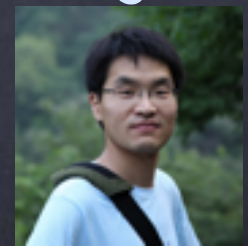
Global Air-sea flux changes by 0.26 W/m^2 when Langmuir mixing is introduced

Regions, e.g. Lab Sea: $10\text{--}15 \text{ W/m}^2$

Dashed lines include wave mixing

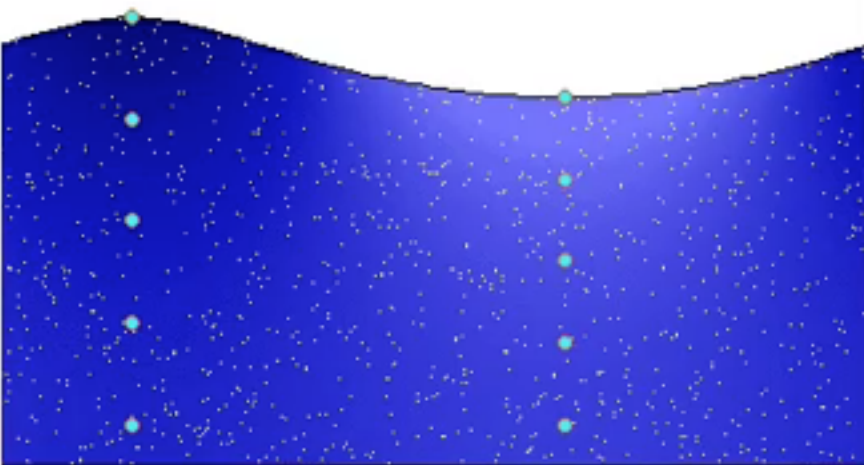


CU, now Tokyo



Brown

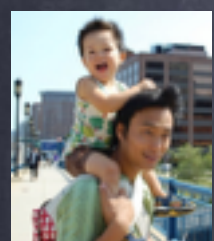
wave phase : $t/T = 0.000$



Stokes drift does more than boundary layer mixing!
 Making our way to new parameterizations—
 Coastal models, oil spills, etc.



Movie: Creative Commons



Brown



CU, now Scripps



CU, now Tokyo

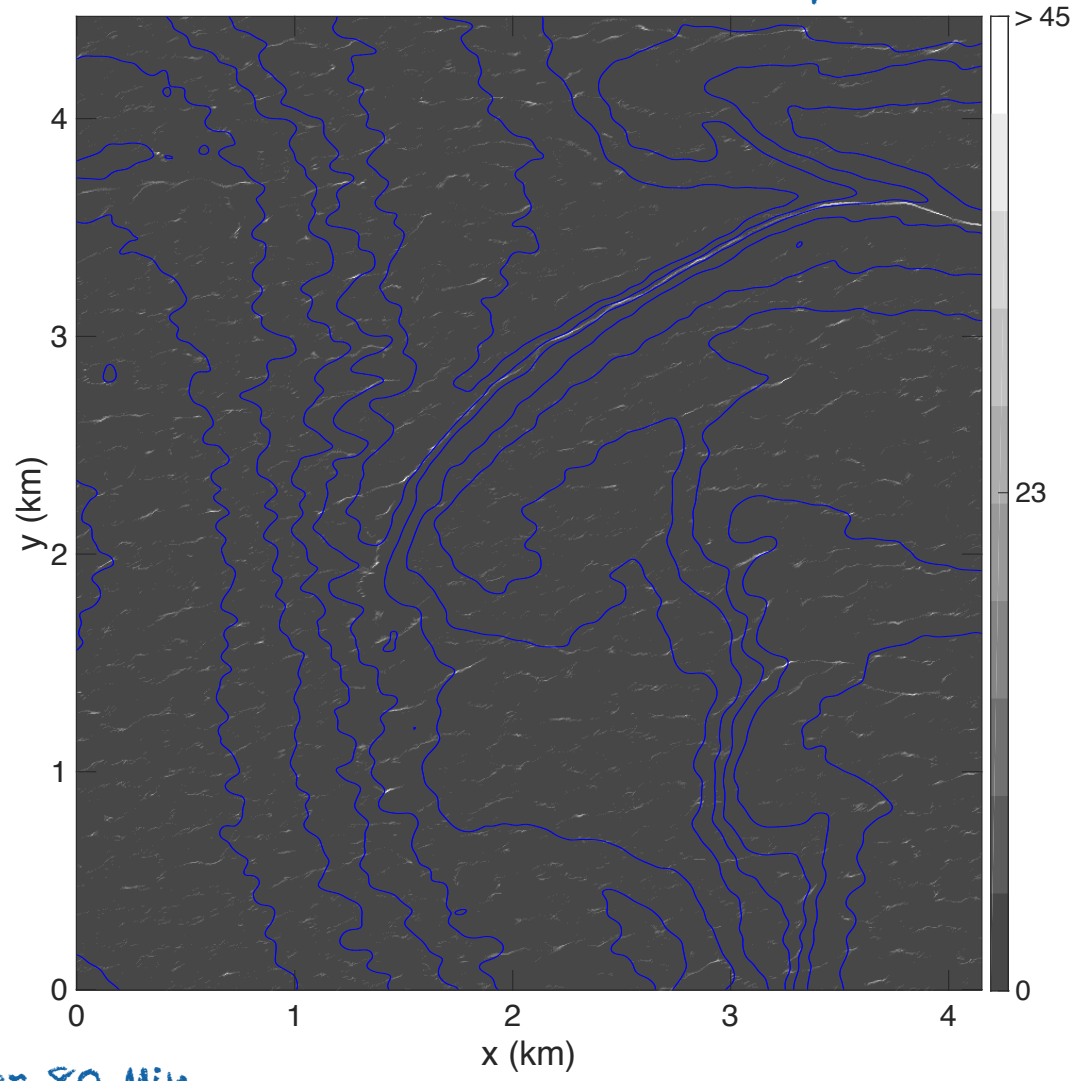
N. Suzuki and BFK. Understanding Stokes Forces in the Wave-Averaged Equations, JGR, in prep, 2015.

S. Haney, B. Fox-Kemper, K. Julien, and A. Webb. Symmetric and geostrophic instabilities in the wave-forced ocean mixed layer. Journal of Physical Oceanography, September 2015. In press.

A. Webb and B. Fox-Kemper. Impacts of wave spreading and multidirectional waves on estimating Stokes drift. Ocean Modelling, January 2015. In press

A. Webb and B. Fox-Kemper. Wave spectral moments and Stokes drift estimation. Ocean Modelling, 40(3-4): 273-288, 2011.

There are 851796 drifters in the picture



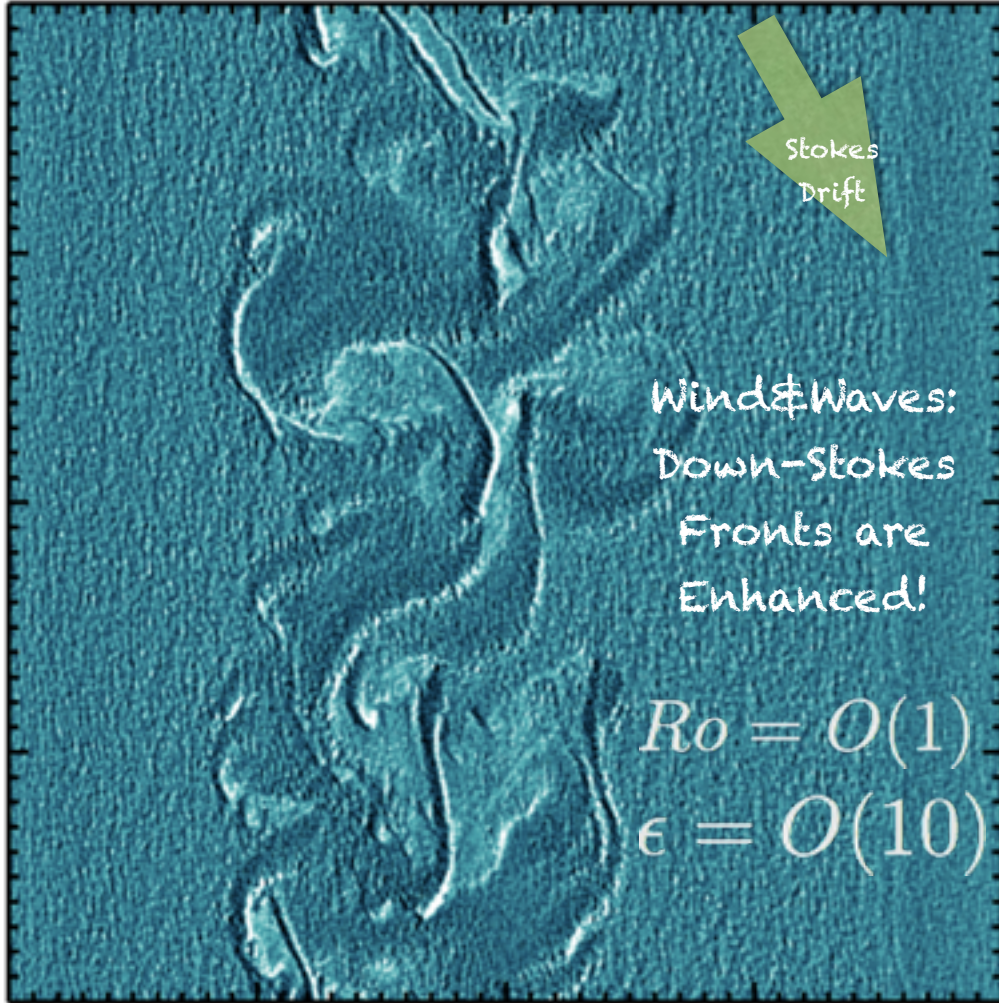
After 80 Min

Are Fronts and Filaments different with Stokes shear force?

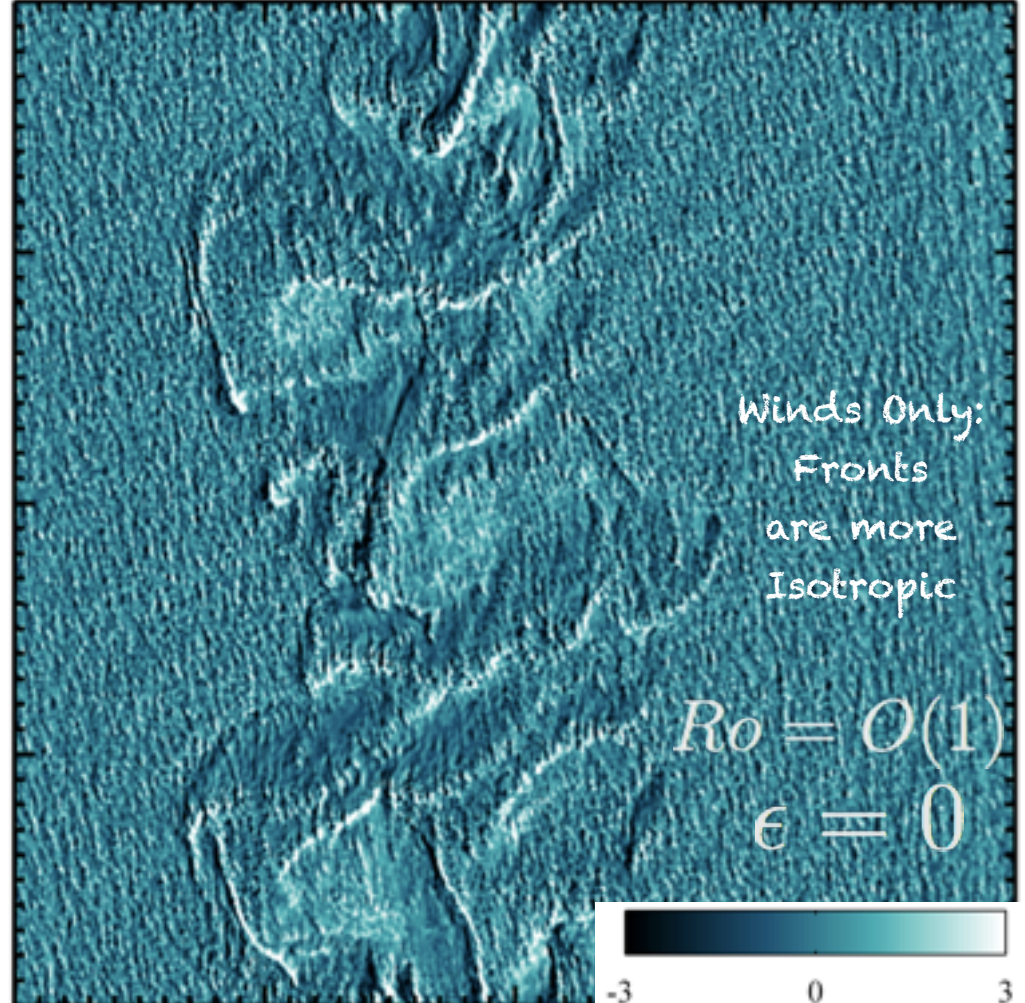


$$\frac{\alpha^2}{Ri} \left[w_{,t} + v_j^L w_{,j} + \frac{M_{Ro}}{Ro Ri} w w_{,z} \right] = -\pi_{,z} + b - \epsilon v_j^L v_{j,z}^s + \frac{\alpha^2}{Re Ri} w_{,jj}$$

(b) LT, ω_z/f



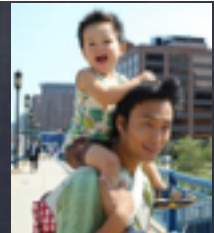
(d) ST, ω_z/f



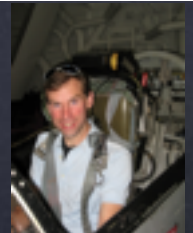
N. Suzuki, BFK, Hamlington, Van Roekel, Sullivan. Stokes Forces Affect Frontogenesis, JGR, in prep, 2015.

J. C. McWilliams and BFK. Oceanic wave-balanced surface fronts and filaments. Journal of Fluid Mechanics, 730:464-490, 2013.

P. E. Hamlington, L. P. Van Roekel, B. Fox-Kemper, K. Julien, and G. P. Chini. Langmuir-submesoscale interactions: Descriptive analysis of multiscale frontal spin-down simulations. Journal of Physical Oceanography, 44(9):2249-2272, September 2014.



Brown



CU, now CU



CU, now LANL

Turbulence Obs & Stats!



We try to check all of the high-resolution models and turbulence parameterizations against data. There is a lot of statistical work that goes along with doing so.

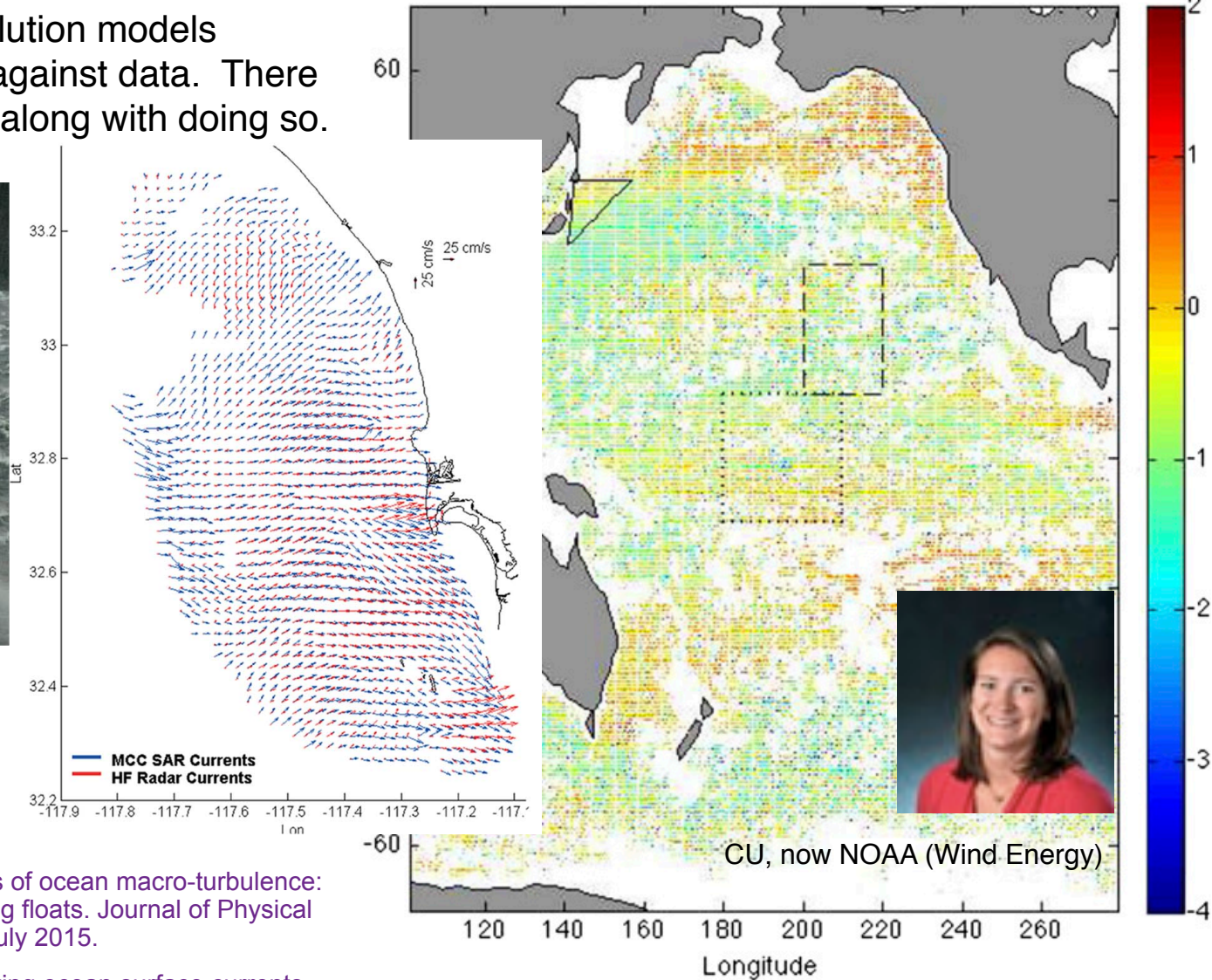


FIG. 5. The log of salinity variance at 5 m with a solid box around the chosen near-homogeneous region in the Kuroshio. The dashed line

K. McCaffrey, B. Fox-Kemper, P. Hamlington, and J. Thomson. Characterization of turbulence anisotropy, coherence, and intermittency at a prospective tidal energy site: Observational data analysis. *Renewable Energy*, 76:441-453, April 2015.

K. McCaffrey, B. Fox-Kemper, and G. Forget. Estimates of ocean macro-turbulence: Structure function and spectral slope from Argo profiling floats. *Journal of Physical Oceanography*, 45(7):1773-1793, July 2015.

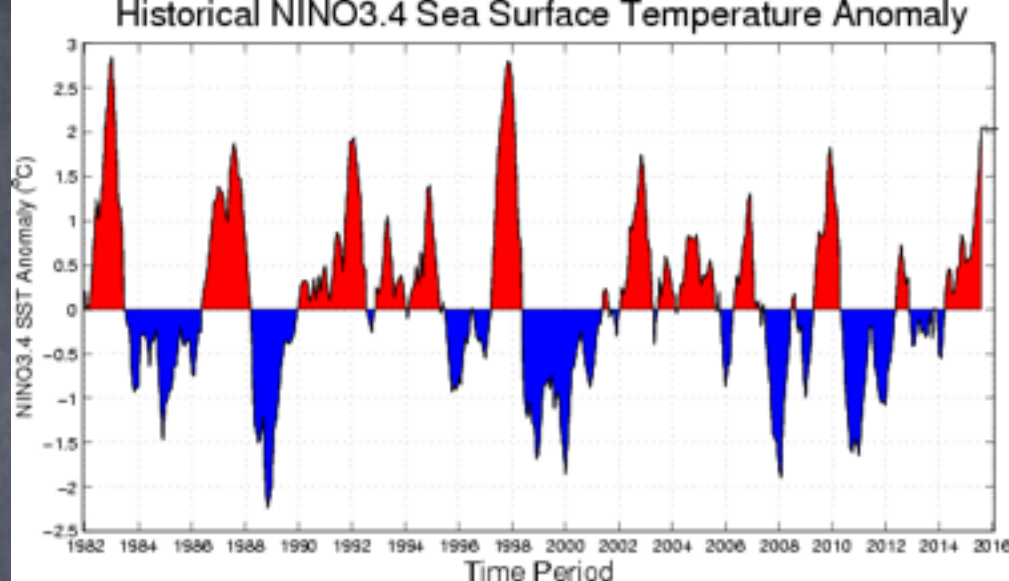
W. A. Qazi, W. J. Emery, and B. Fox-Kemper. Computing ocean surface currents over the coastal California Current System using 30-minute lag sequential SAR images. *IEEE Transactions on Geoscience and Remote Sensing*, 52(12): 7559-7580, June 2014.

E. A. D'Asaro, J. Thomson, A. Y. Shcherbina, R. R. Harcourt, M. F. Cronin, M. A. Hemer, and B. Fox-Kemper. Quantifying upper ocean turbulence driven by surface waves. *Geophysical Research Letters*, 41(1):102-107, January 2014.

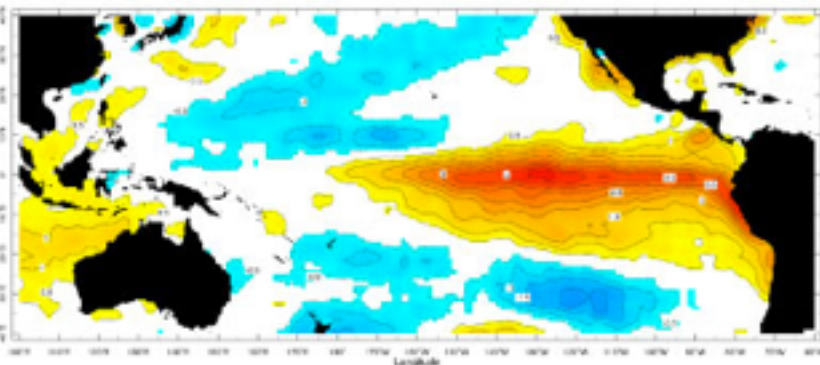
Prediction of variability

Predictability of ENSO events limited to < 1yr

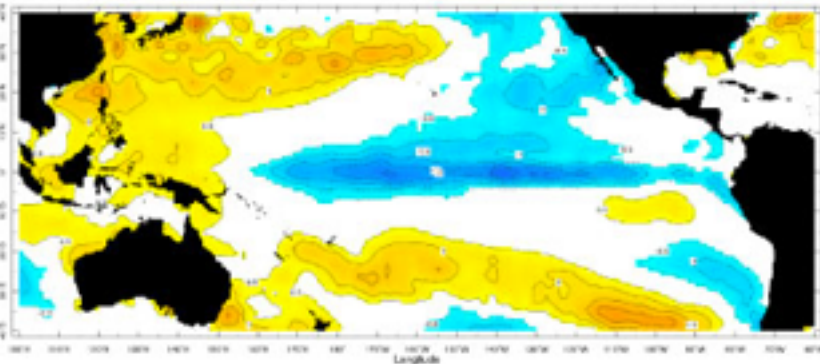
ENSO statistics more predictable?



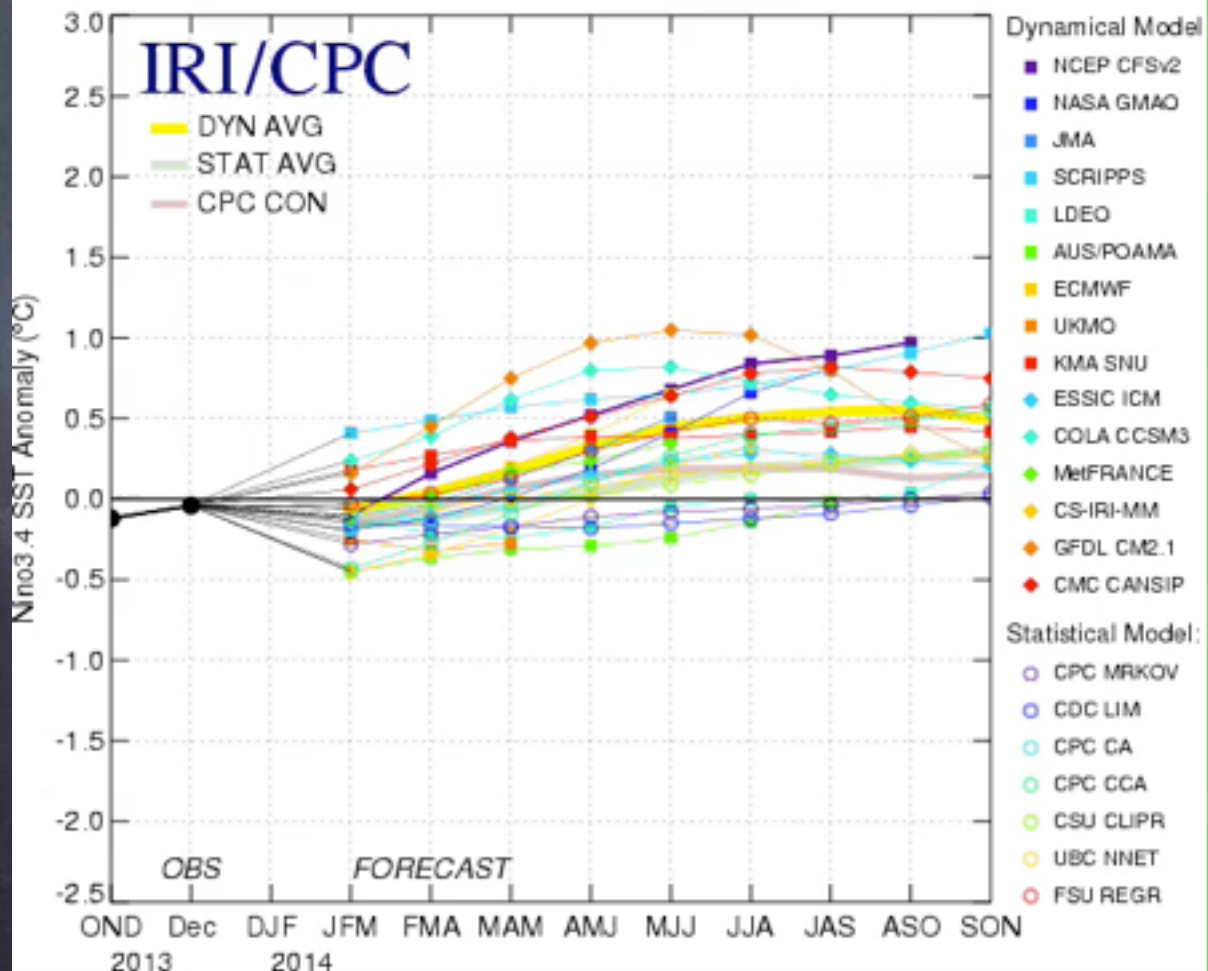
El Niño Episode Sea Surface Temperatures
Departure from average in degrees Celsius
Dec 1982 - Feb 1983

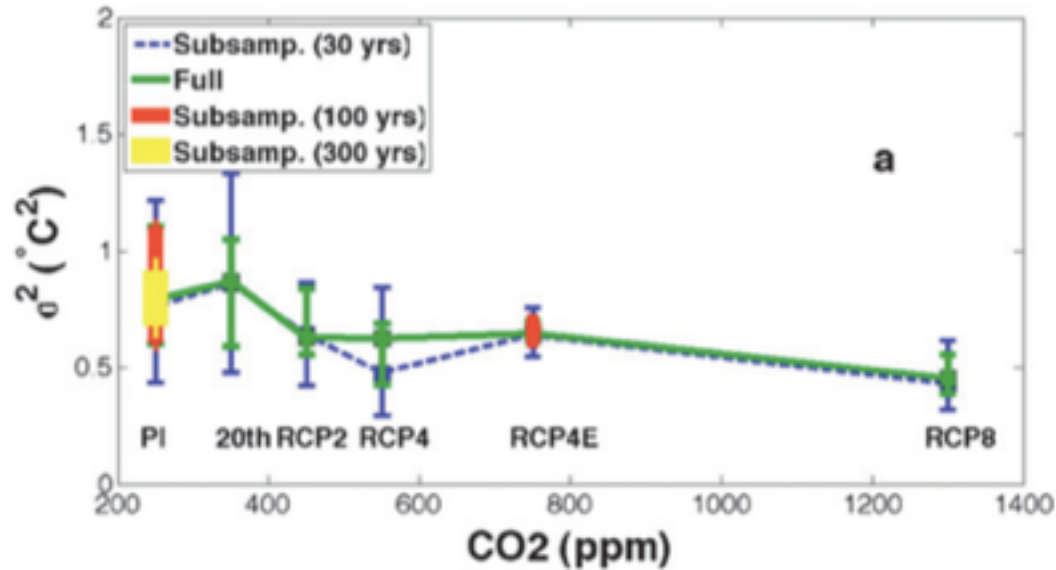


La Niña Episode Sea Surface Temperatures
Departure from average in degrees Celsius
Dec 1998 - Feb 1999

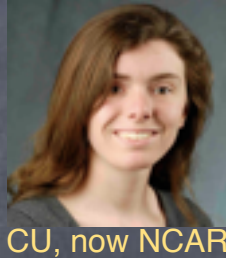


Mid-Jan 2014 Plume of Model ENSO Predictions





Almost no change to Direct ENSO variability with GHG... (>200 yr to detect)



Big GHG Change to ENSO impacts!

INDIRECT Proxy Reconstructions won't work!!!

S. Stevenson, BFK, M. Jochum, R. Neale, C. Deser, and G. Meehl. Will there be a significant change to El Niño in the 21st century? *Journal of Climate*, 25(6): 2129-2145, March 2012.

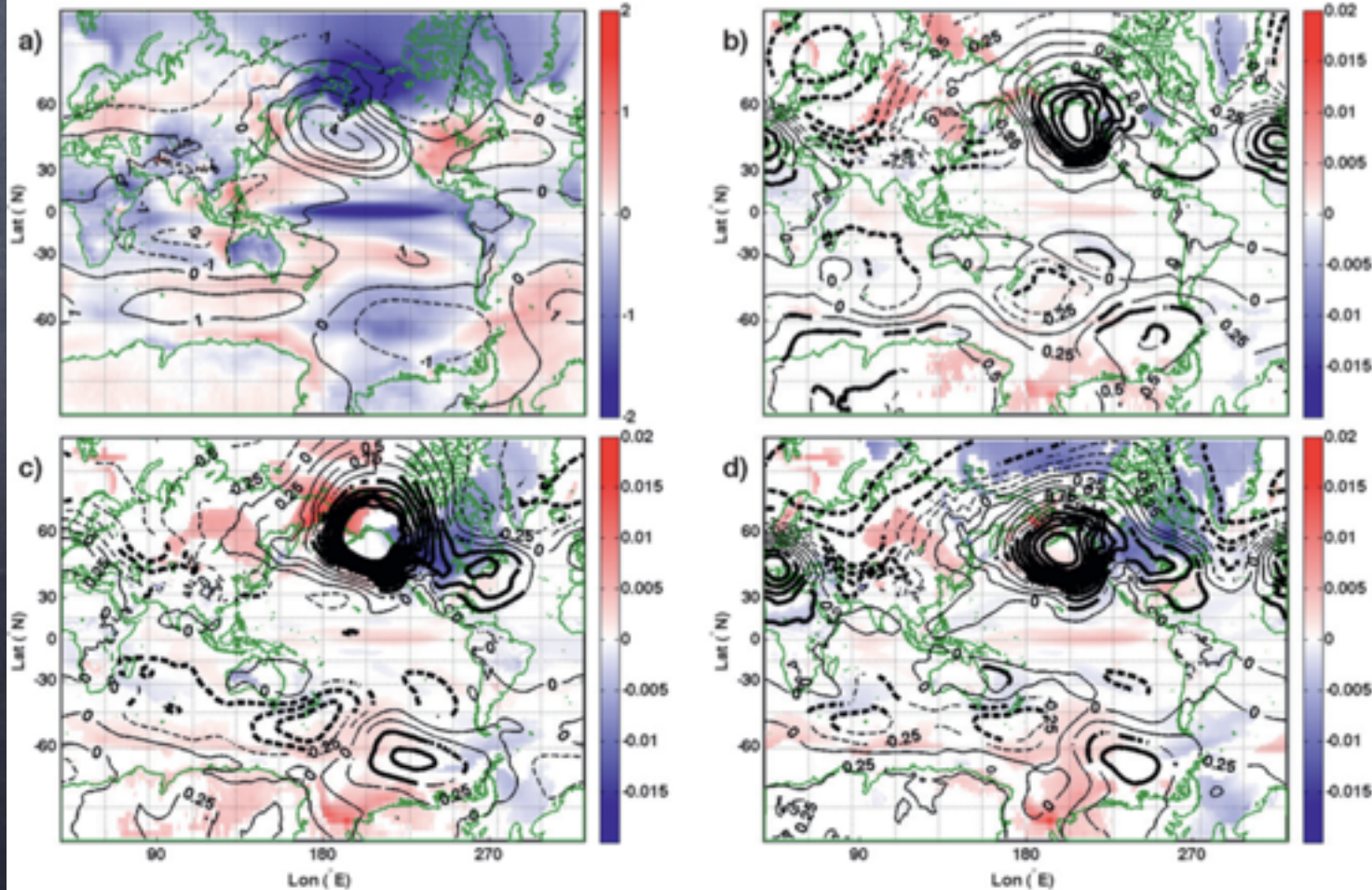
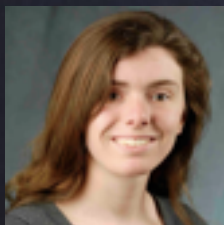
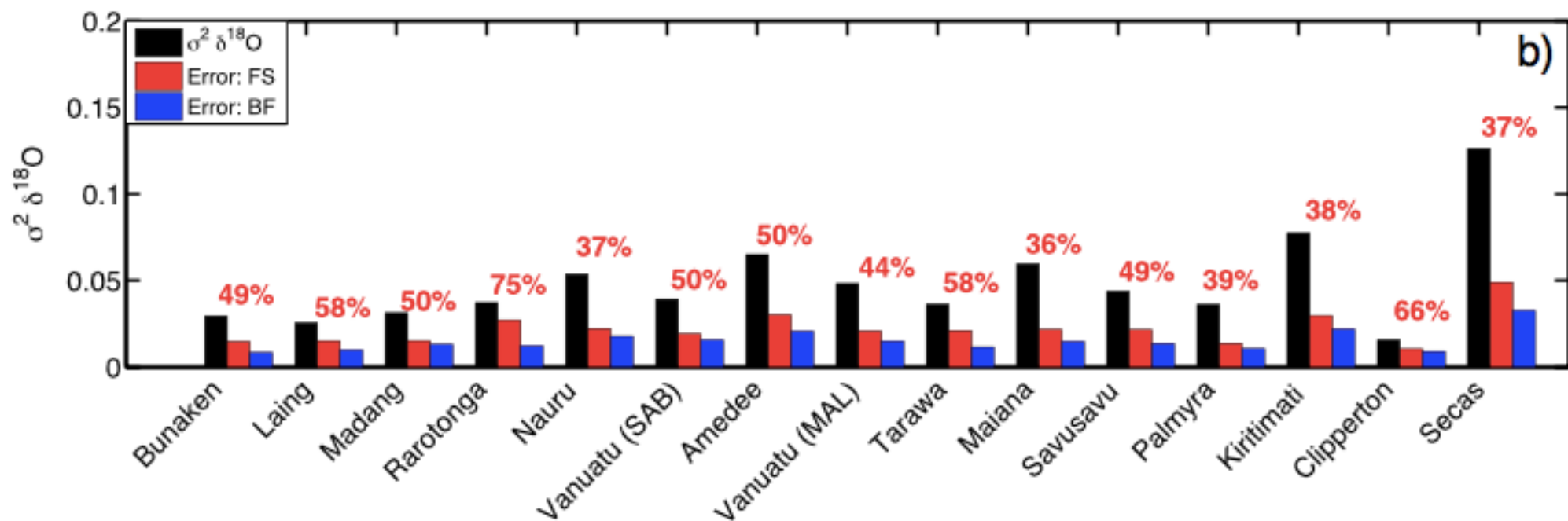
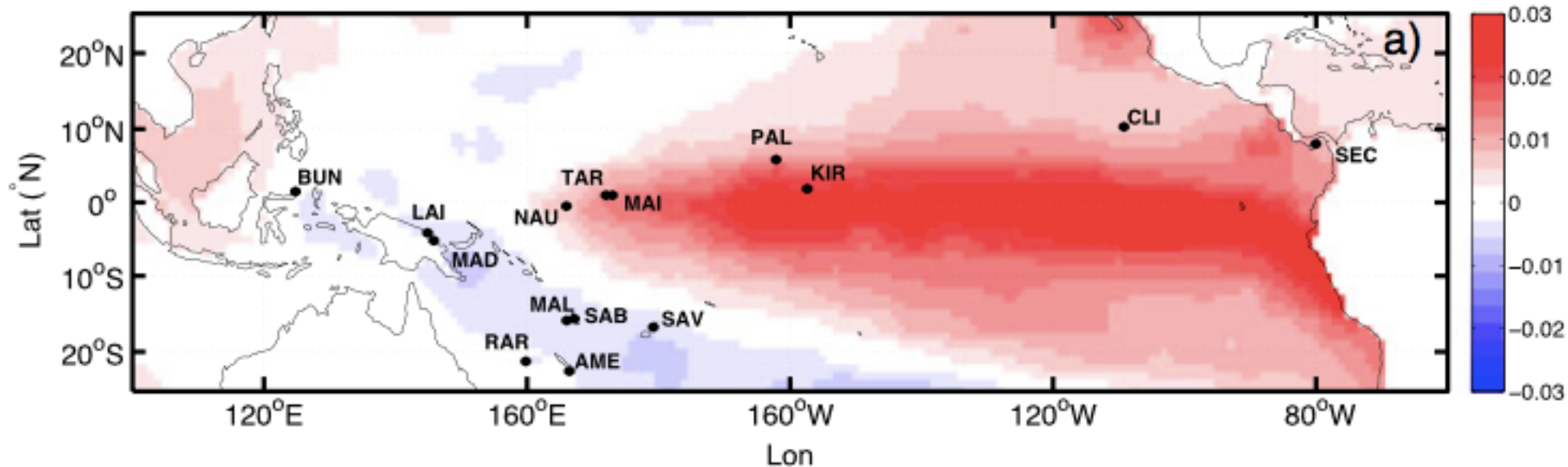


FIG. 6. As in Fig. 5, but for La Niña DIF.



S. Stevenson, H. V. McGregor, S. J. Phipps, and B. Fox-Kemper. Quantifying errors in coral-based ENSO estimates: Towards improved forward modeling of $\delta^{18}\text{O}$. *Paleoceanography*, 28(4):633-649, December 2013.

Understanding of past variability



New: Abyssal Variability is the HARDEST!

- Stochastic damping very slow!
 - huge heat capacity (biggest watermasses on Earth)!
- Timescales may be very long!
 - Watermasses $O(1500\text{yr})$ old by radiocarbon
- Lengthscales may be very short!
 - (weak stratification implies a Rossby radius of $O(2\text{km})$ for modes trapped in AABW only)
- Water "formed" in very small areas!
 - Small-scale atmospheric & oceanic phenomena will be disproportionately important on air-sea effects
- Difficult to observe, IMPOSSIBLE TO MODEL = FUN!

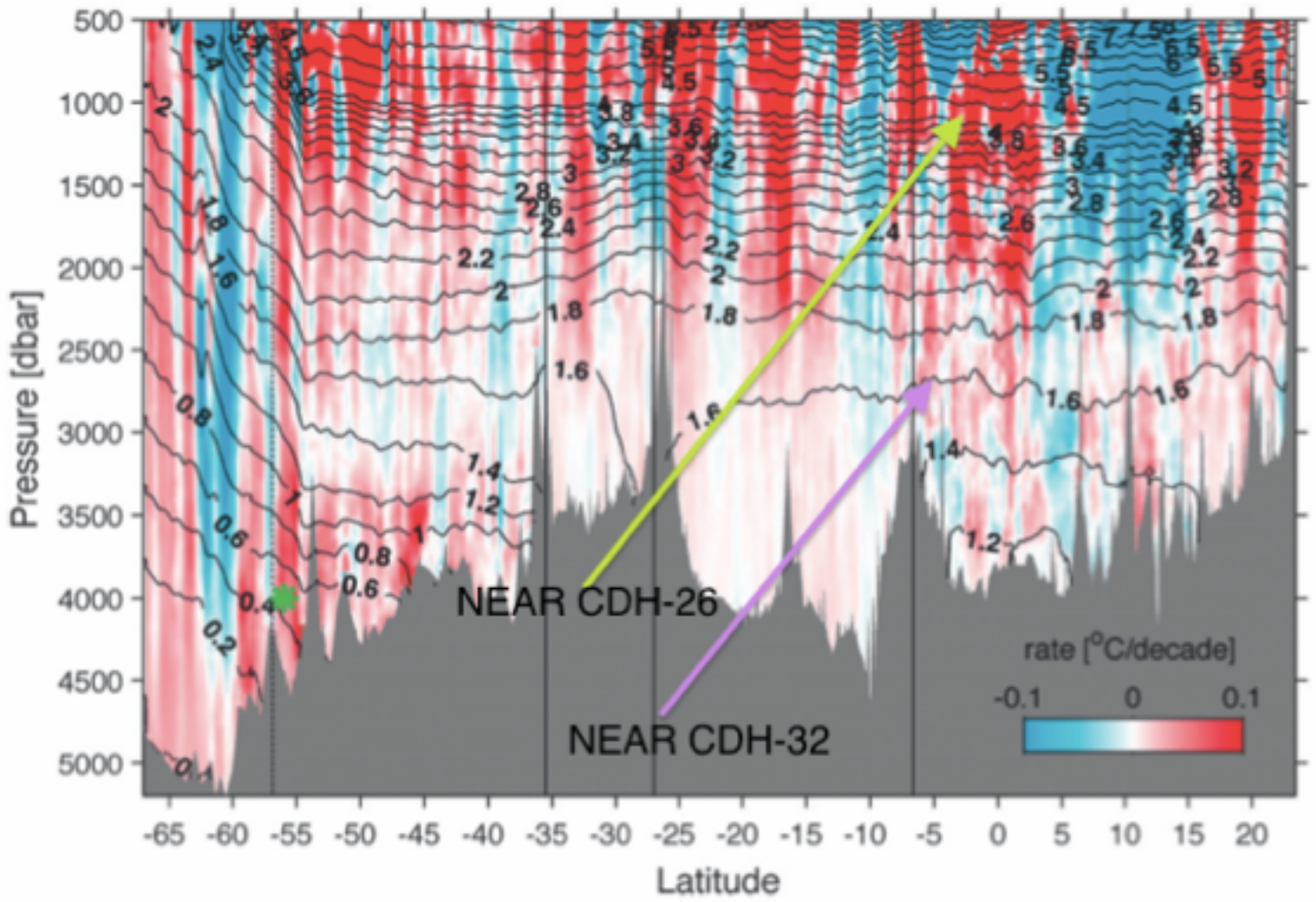
Understanding of past variability



Even with Argo, it will be a while until we have long timescale variability. What to do?

Pattern of Warming from Hydrography

Examine CDH-26 sediment core from the Holocene indicated



Purkey & Johnson, 2010



Brown

Understanding of past variability



Assessing variability using individual benthic foraminifera

$$\delta^{18}O = \left(\frac{\left(\frac{^{18}O}{^{16}O} \right)_{sample}}{\left(\frac{^{18}O}{^{16}O} \right)_{standard}} - 1 \right) * 1000 \text{ ‰}$$

- Benthic foraminiferal $\delta^{18}O$ values record temperature and salinity properties of ambient seawater

$$T (\text{°C}) = 21.6 - 5.50 \times (\delta^{18}O_c - \delta^{18}O_{sw})$$

Bemis et al. 2002

$$\delta^{18}O_{sw} = -14.38 + 0.42 * \text{salinity}$$

Conroy et al. 2014

- Individual foraminifera provide 2-3 week snapshots of seawater properties
- We analyze 30-40 individuals within 200 year windows to assess the mean and variance of foraminiferal $\delta^{18}O$ values On roughly decadal timescales



Uvigerina spp.



Brown

Understanding of past variability

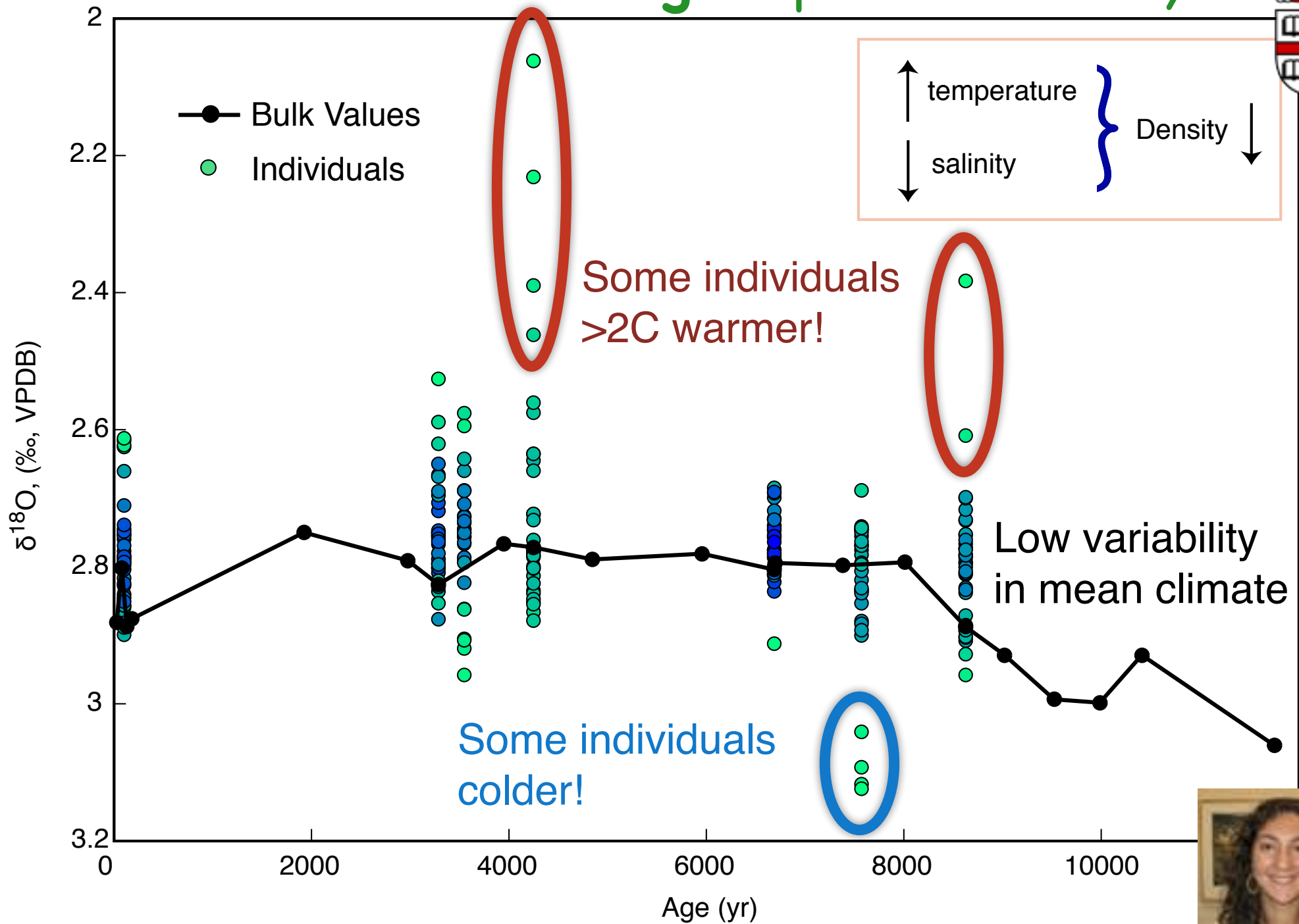
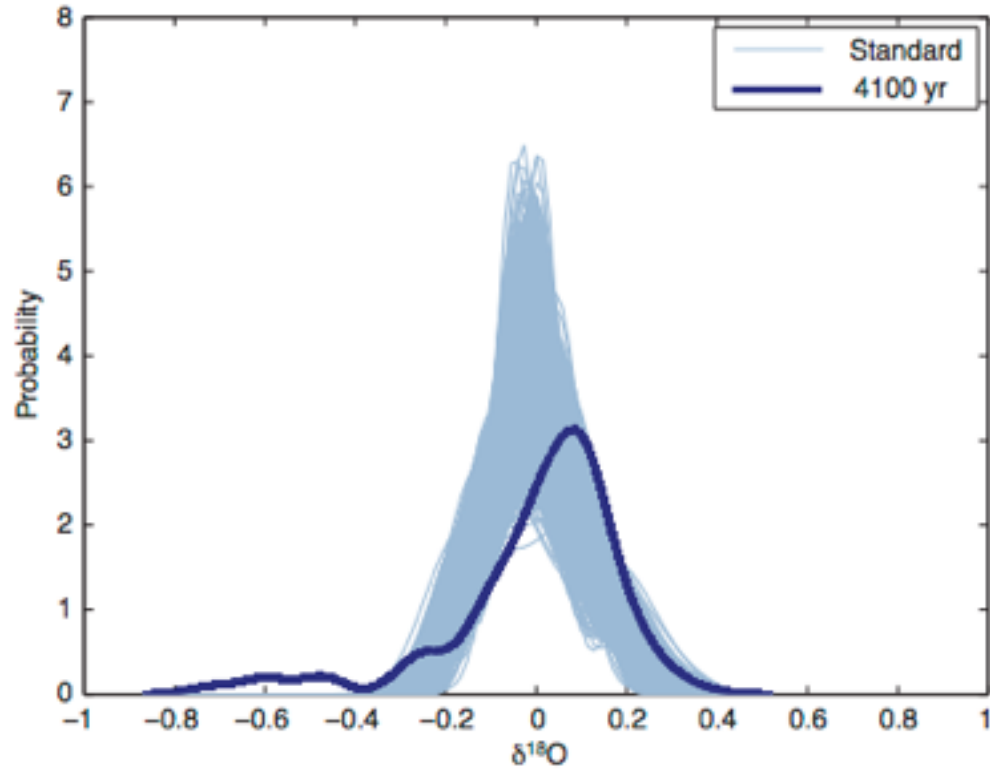


Figure Credit: Sam Bova



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$p < 0.01$

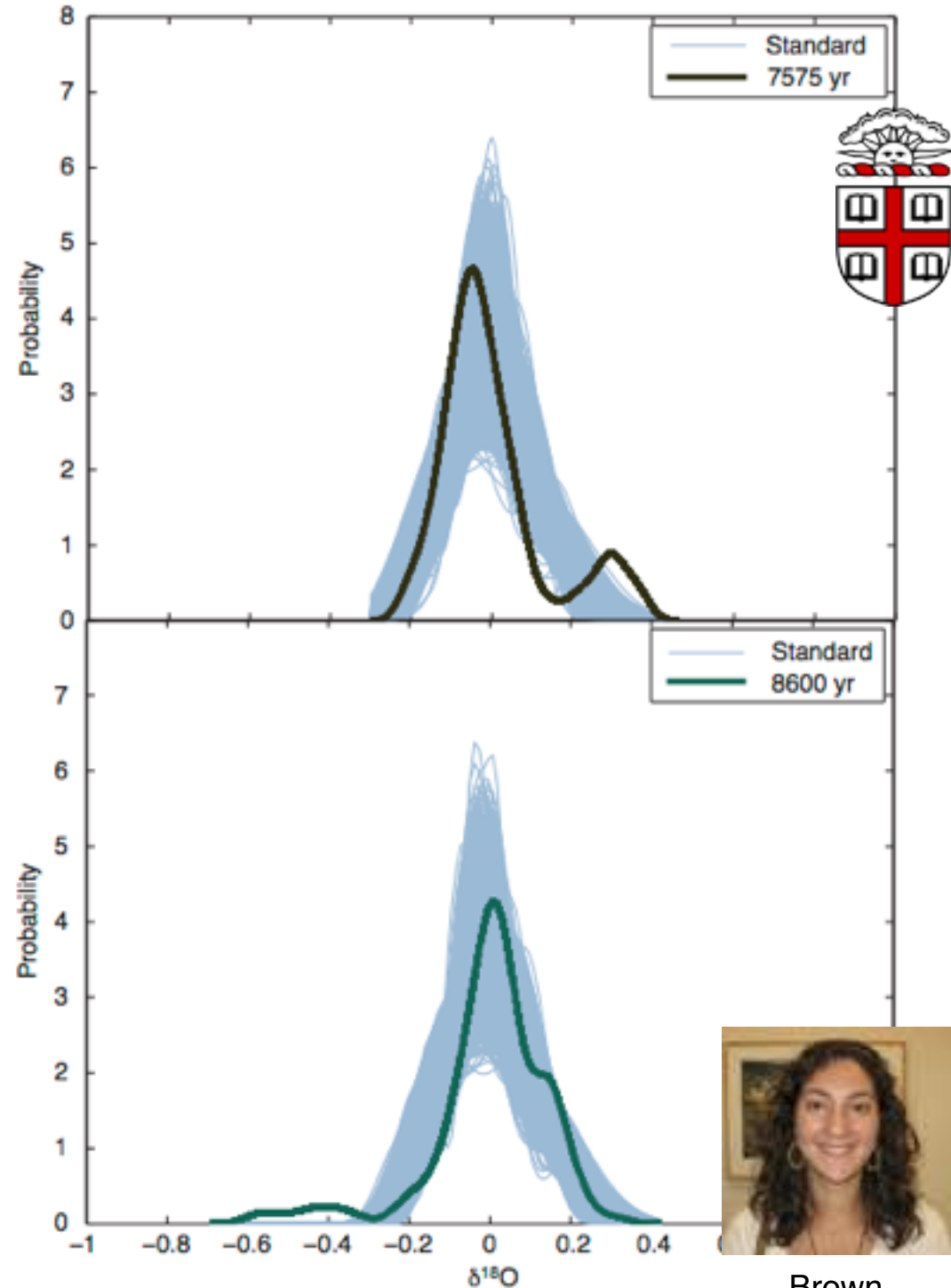


At these three time intervals, the spread of individual values exceeds a size-matched spread of instrumental standards.

The statistical significance of this deviation is given by the p-values of a Kolmogorov-Smirnov test comparing the distributions.

If this is right—abyssal variability may have an **unexpectedly important role, intermittently** through the past!

$p < 0.10$

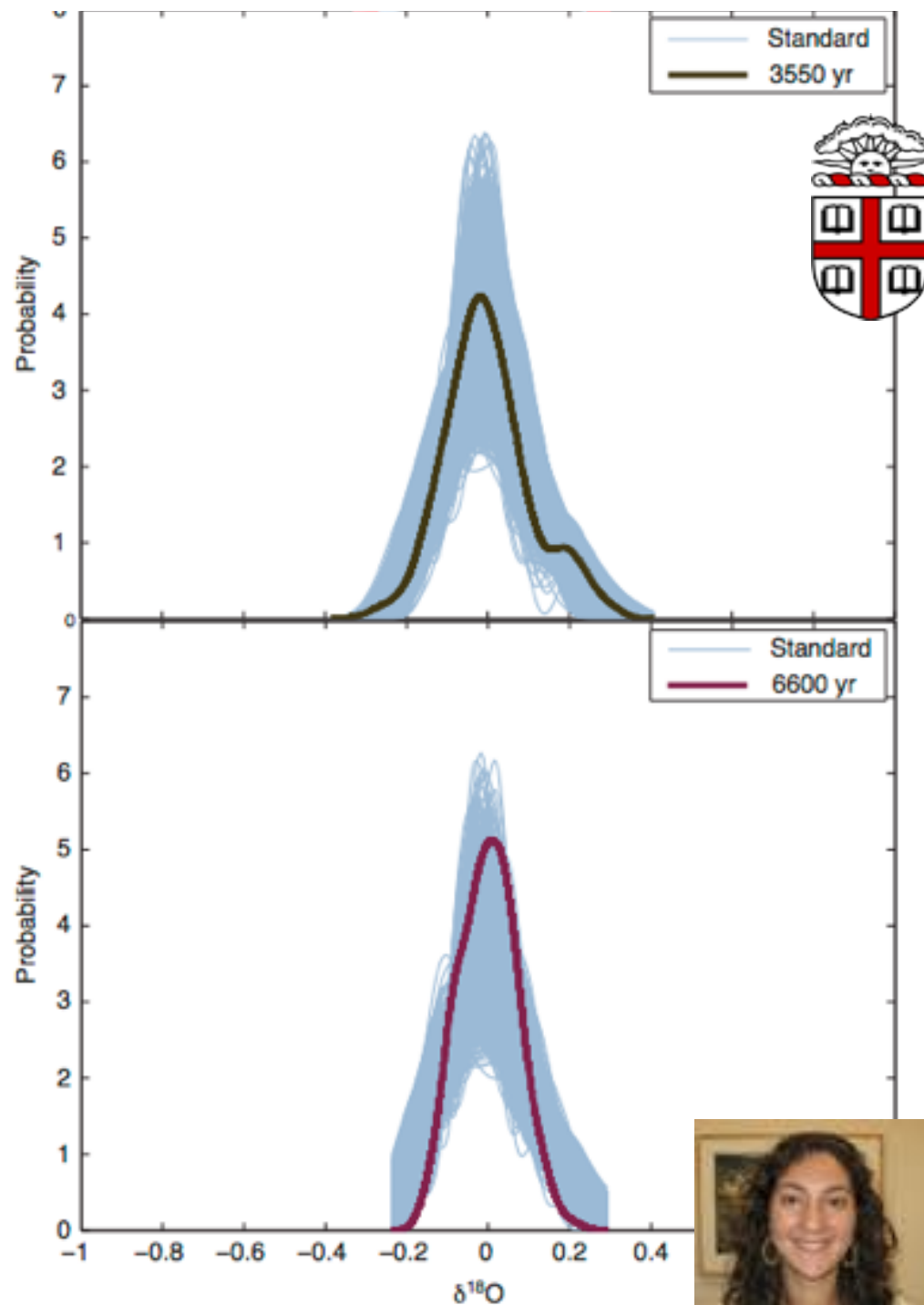
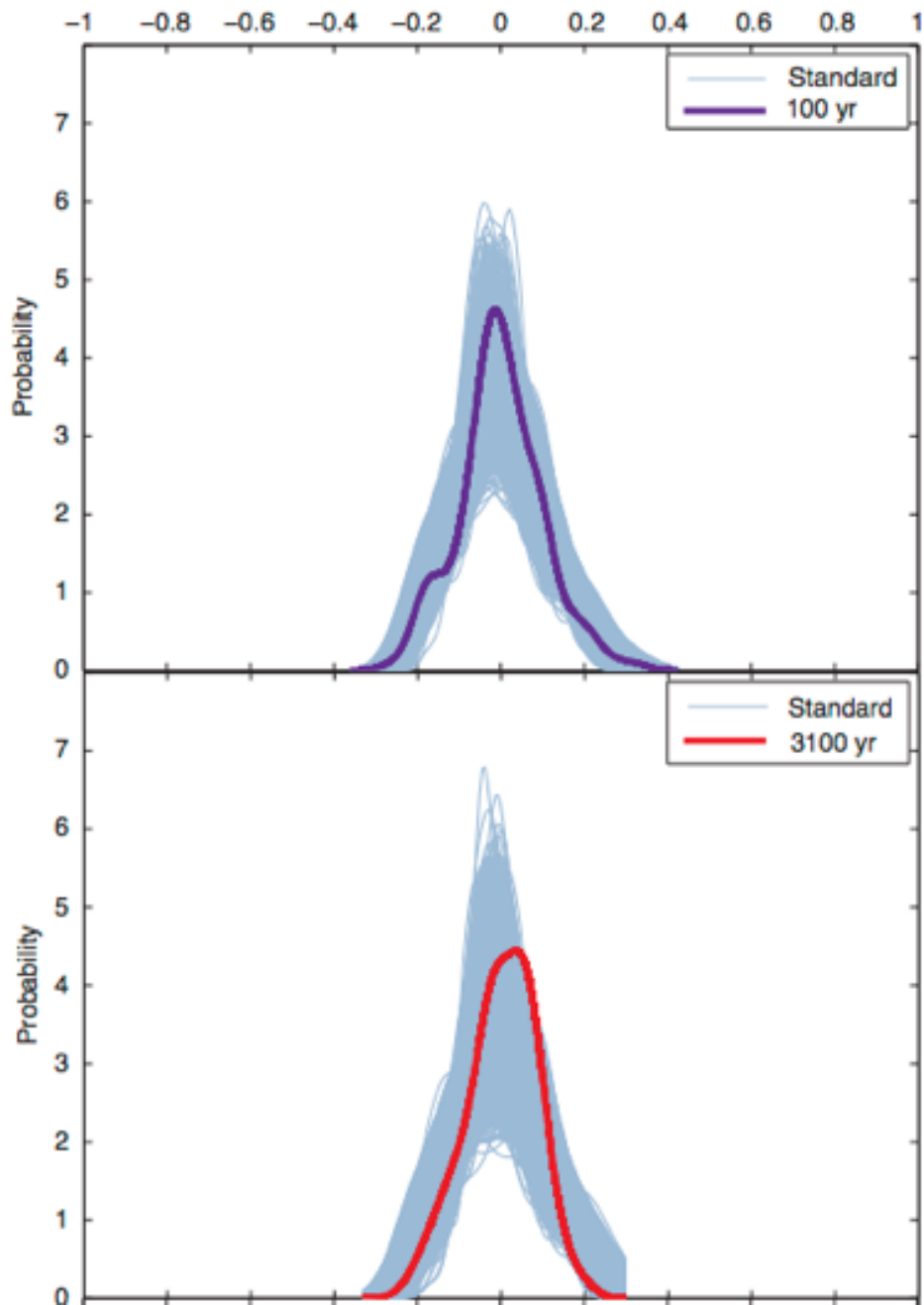


Conclusions



- **Presence of observable variability**
 - Regional $O(100 \text{ W/m}^2)$, Global Net $O(1 \text{ W/m}^2)$
 - Difficult due to sampling, obs. density & duration
 - Many problems require paleothermometry!
- **Understanding of past variability**
 - Not always a path to progress w/o models & predictions
 - But, discovery of new processes & unexpected variability is a way forward to better predictions!
- **Modeling of variability**
 - Stochastic models work—but not very predictive.
 - Deterministic models: discrepancies in tuning, params, resolution.
 - Fun to work on parameterizations & process understanding, though!
- **Prediction of variability**
 - Possible in some regions, chaos limits the forecast window.
 - Accurate global budgets need process-level understanding and modeling.

Null Results



At these four time intervals, the spread of individual values fits within a size-matched spread of instrumental standards.

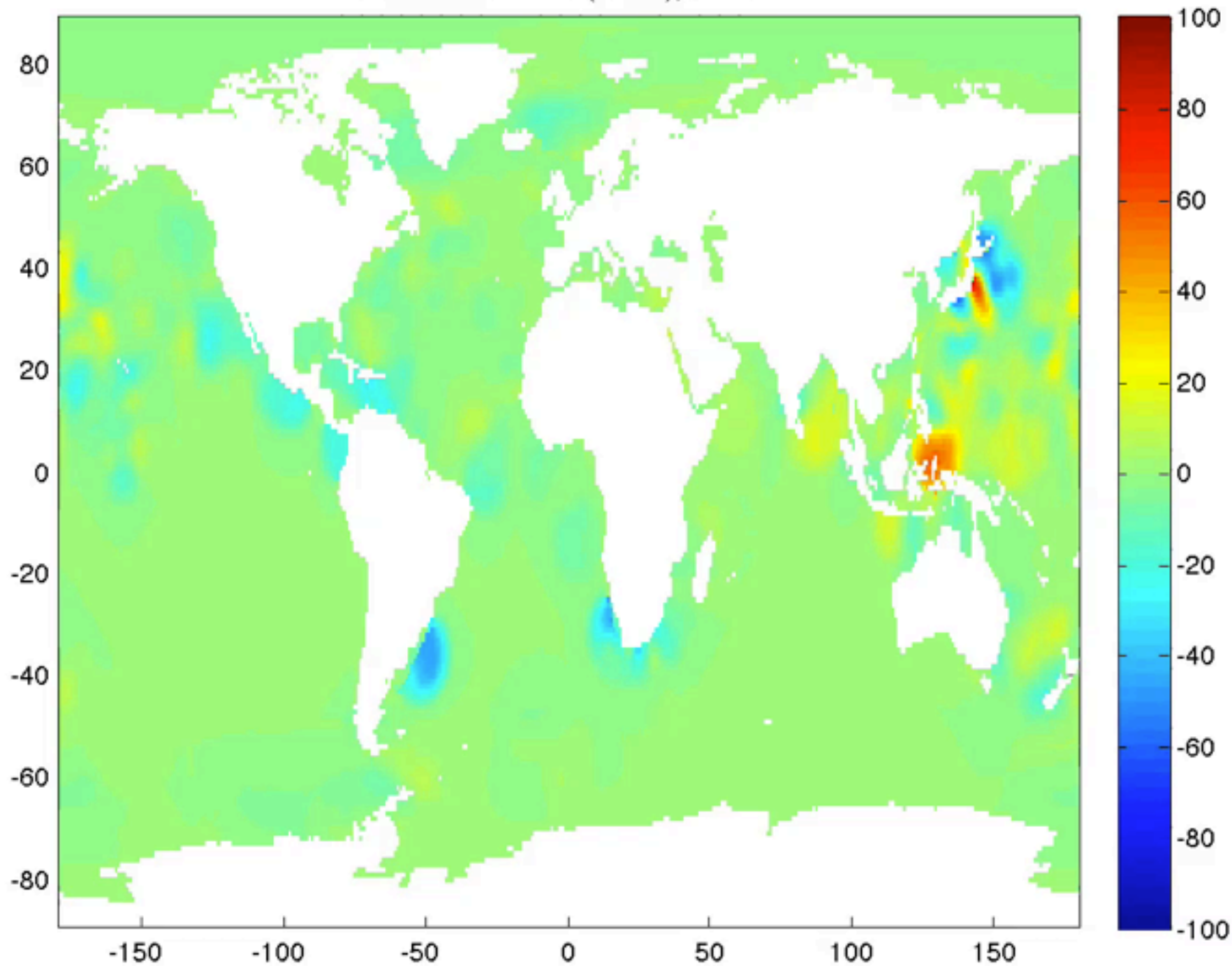
Figure Credit: Sam Bova

Brown



Compare to Observational Product

Heat Content 0-700m (10^{18} J), Feb55



Levitus, S., J. I. Antonov, T. P. Boyer, O. K. Baranova, H. E. Garcia, R. A. Locarnini, A.V. Mishonov, J. R. Reagan, D. Seidov, E. S. Yarosh, M. M. Zweng, 2012: World Ocean heat content and thermosteric sea level change (0-2000 m) 1955-2010. *Geophys. Res. Lett.* , 39, L10603, doi: 10.1029/2012GL051106"