



# Optimizing Observations to Explore Predictive Skill: An Ocean Perspective

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with input from Carol Anne Clayson, Bruce Cornuelle, Meghan Cronin, Chelle Gentemann,  
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UC San Diego



# Guiding structure

- Not enough time now to address observations for entire Earth system
- Use ocean as microcosm for the full system, to illuminate broader themes that extend across system. Draw on community consensus for OceanObs'19.
- Challenges in Earth system are at interfaces: Focus on upper ocean and air-sea exchange
- Take aways: To advance predictive skill, expand observing system and support process studies



Bioluminescent waves at Scripps pier: Philipp Arndt, April 2020



The energy to warm the atmosphere by  $1^{\circ}\text{C}$  is equivalent to energy to warm the top 2.5 m of the ocean by  $1^{\circ}\text{C}$

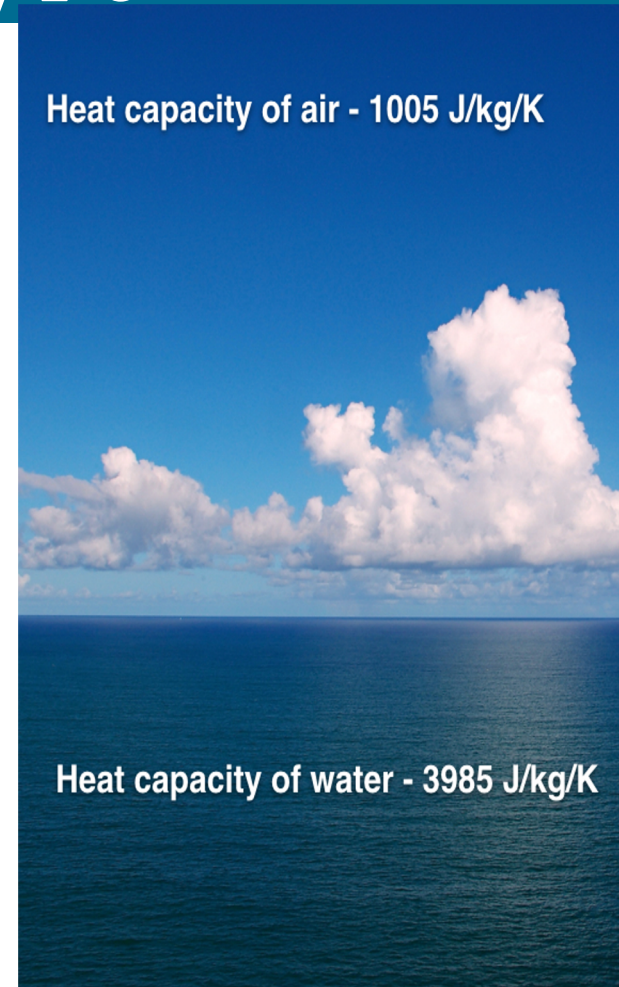
The average ocean depth is 4 km  $\rightarrow$  400 times more mass than the atmosphere and 1600 times more heat storage per unit area

The ocean covers about 70% of the Earth  $\rightarrow$   $1^{\circ}\text{C}$  change in atmospheric temperature is equivalent to  $<0.01^{\circ}\text{C}$  change in mean ocean temperature.

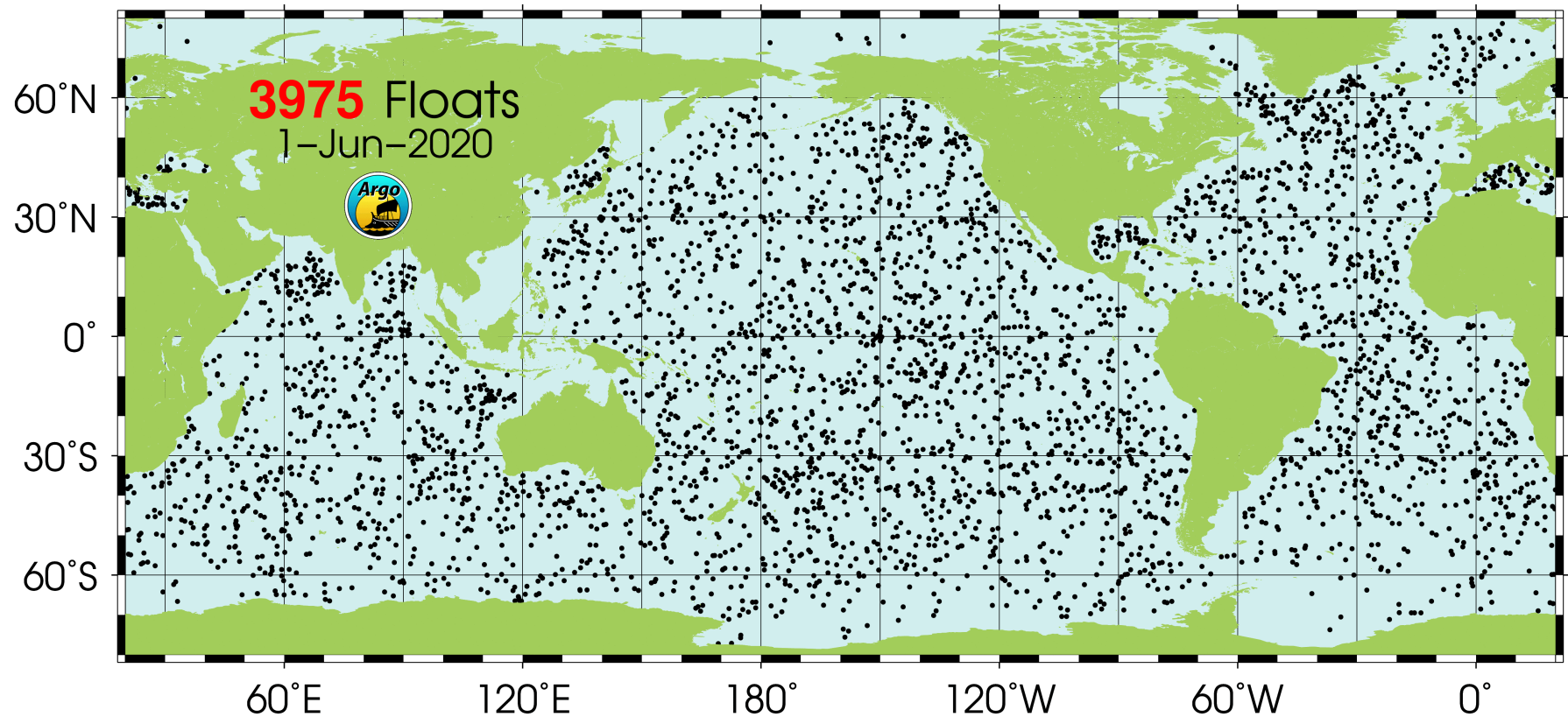
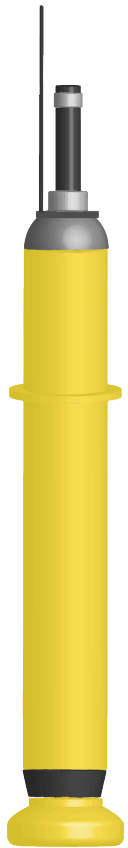
How much of the ocean communicates with the atmosphere? How big are the fluxes?

Heat capacity of air -  $1005 \text{ J/kg/K}$

Heat capacity of water -  $3985 \text{ J/kg/K}$



# ARGO FLOATS: TEMPERATURE & SALINITY TO 2000 M, EVERY 10 DAYS



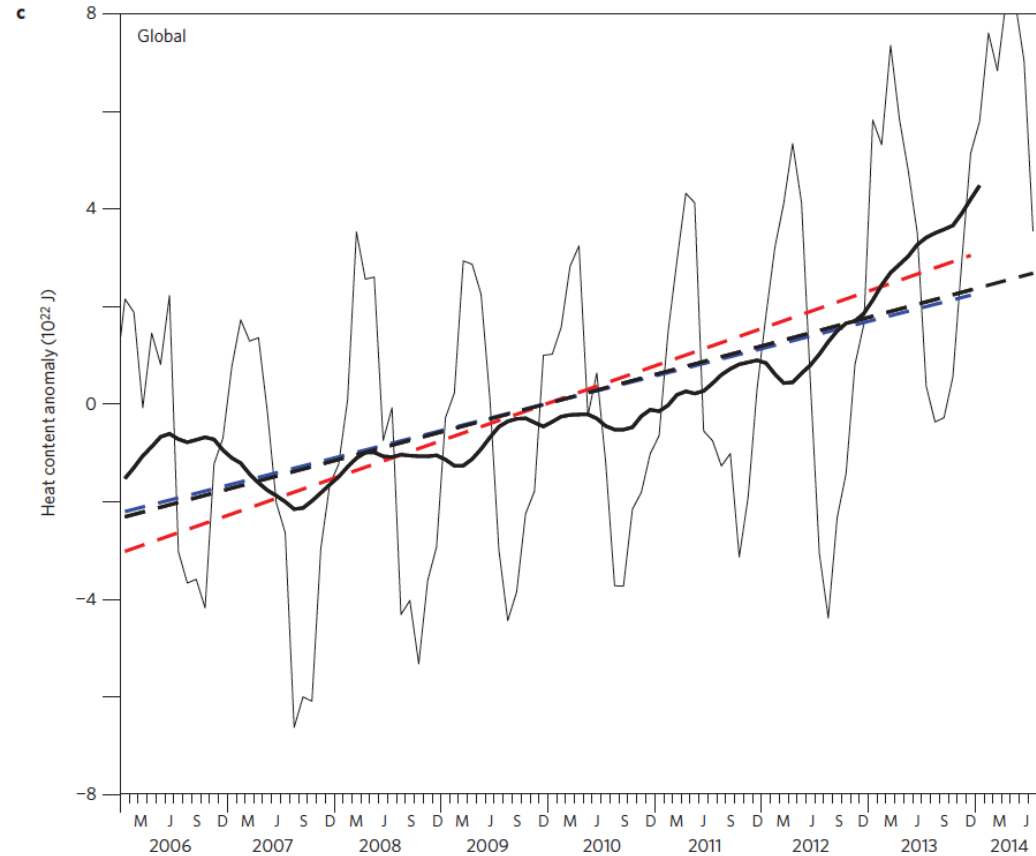


## OCEAN HEAT CONTENT CHANGES MEASURED BY ARGO FLOATS

Argo resolves **annual cycle** in warming and cooling of the ocean

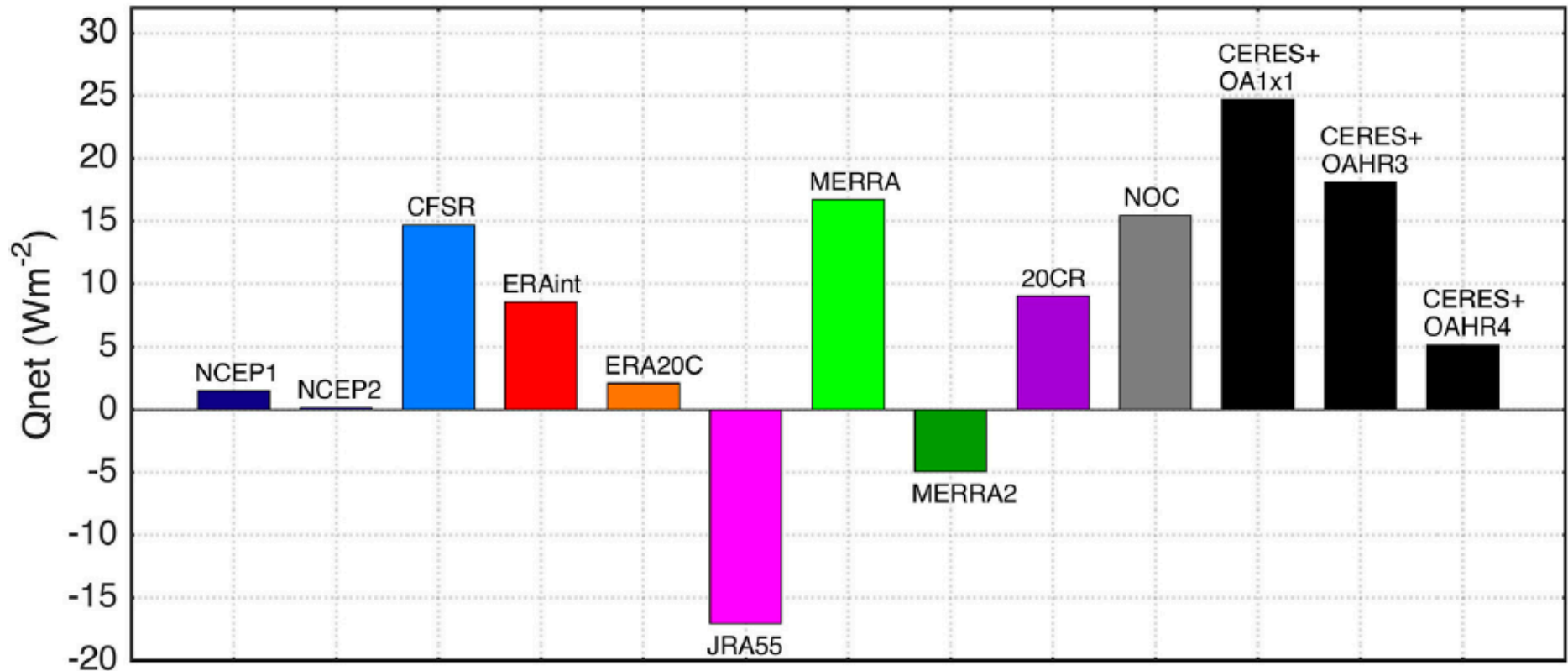
Long-term ocean heat gain equivalent to **0.5-0.7 W/m<sup>2</sup>** net heat flux to ocean.

(Biogeochemical and Deep Argo now extending capabilities.)



# GLOBAL MEAN AIR-SEA HEAT FLUX: NO AGREEMENT AMONG PRODUCTS

Flux products not accurate enough to see  $0.5 \text{ W m}^{-2}$  net uptake



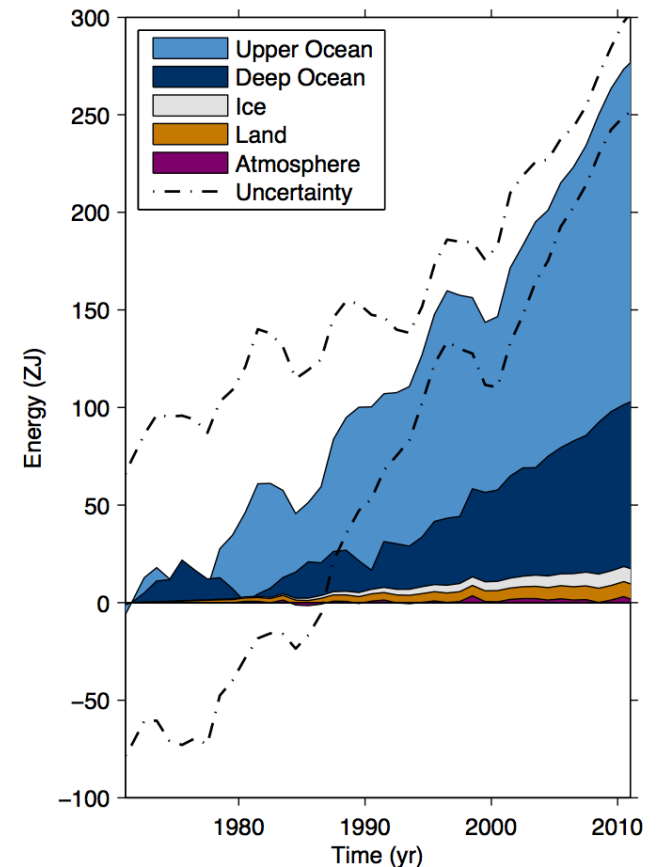


## DECADAL SCALE HEAT STORAGE IN THE EARTH SYSTEM

*On decadal scale, Argo + historic data show that most of the Earth's heat storage in the upper ocean + deep ocean.*

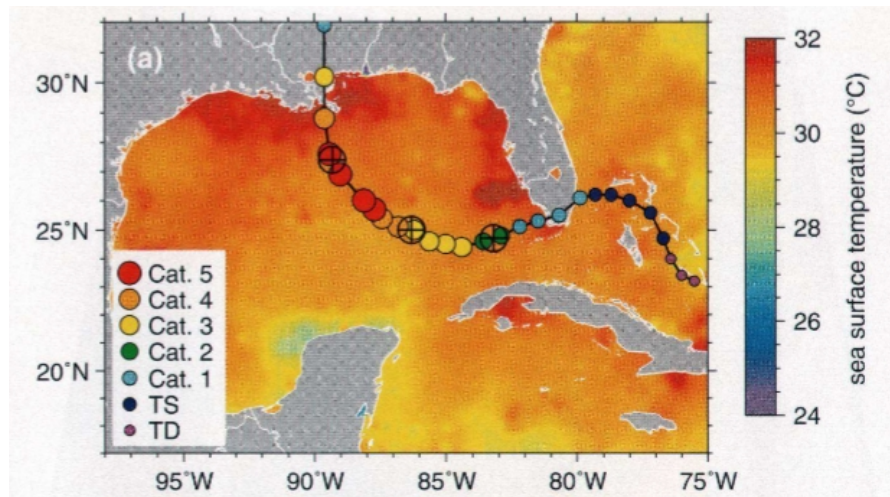
Observations to support decadal predictability:  
Keep doing Argo + Deep Argo over full water column.

Observations for 10-day to 3-year time-scales:  
Require a more nuanced and local understanding of ocean exchanges with the atmosphere (in context of analysis/reanalysis/assimilation requirements)

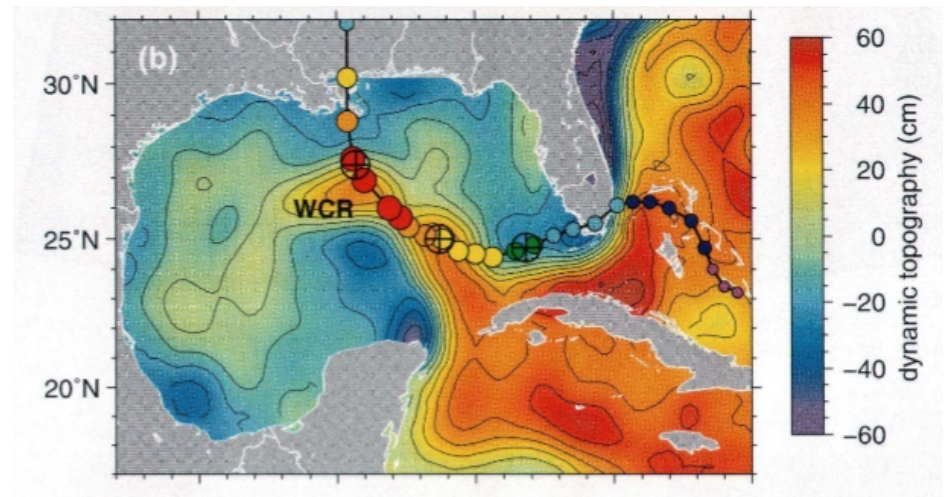


# Upper ocean heat influences hurricanes (not just SST)

## Hurricane Katrina - Intensification correlated with ocean heat content



Sea Surface Temperature

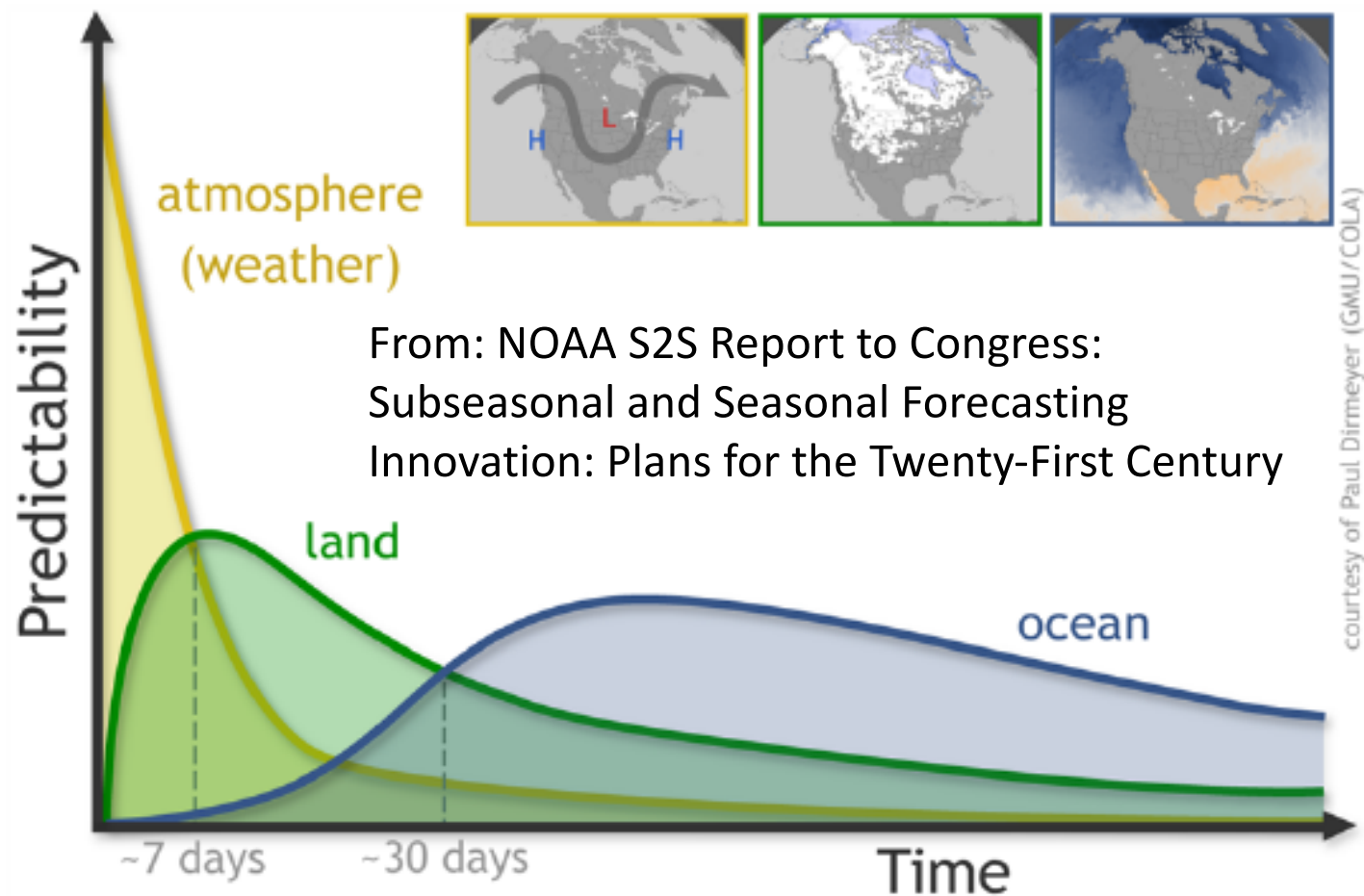


Ocean Heat Content

The upper ocean matters for El Niño/La Niña, monsoons, as well as hurricanes.

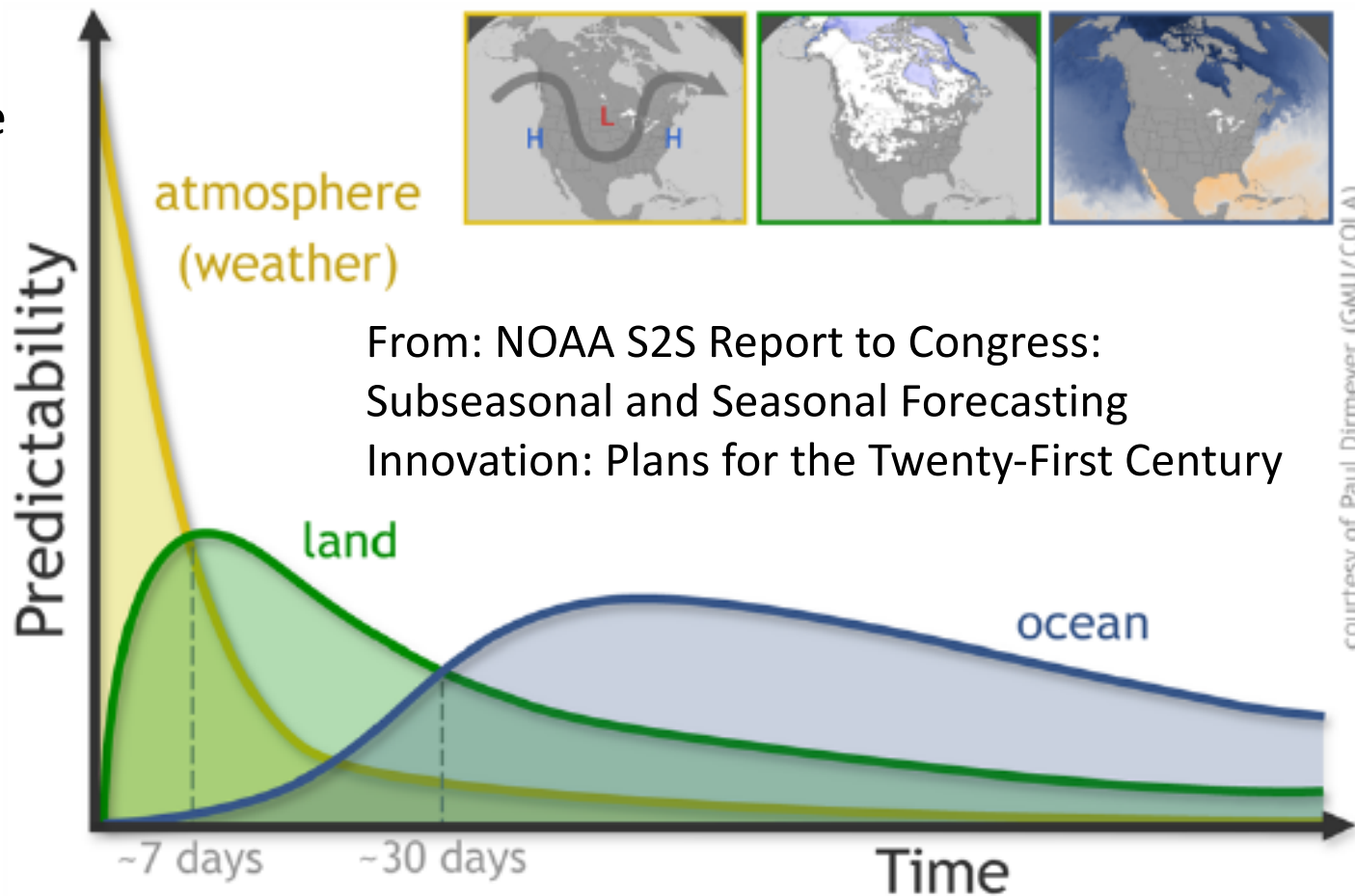


# NASA and NOAA sketch of sources of S2I predictability



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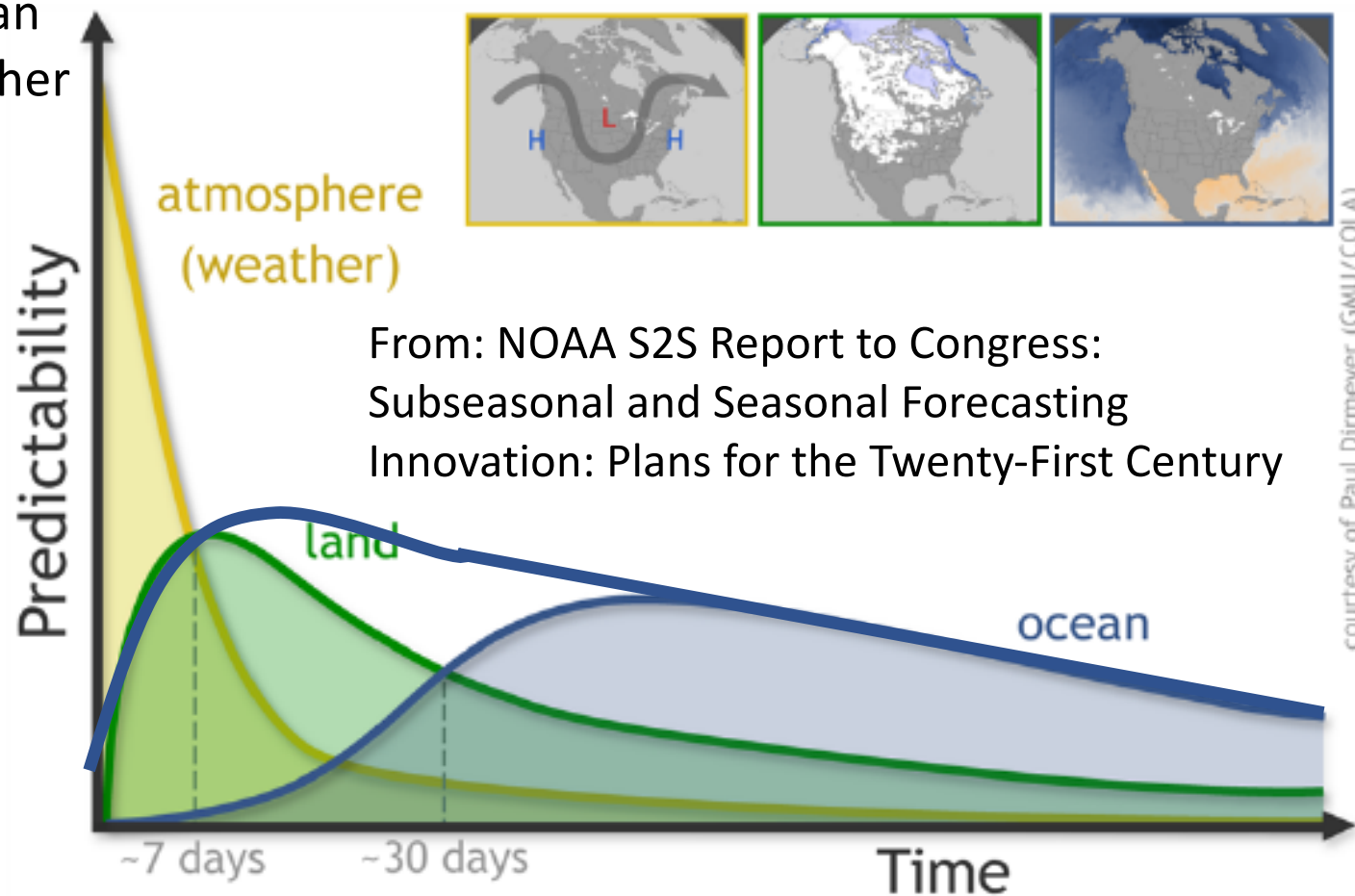
Drawn by a  
Soil moisture  
Person!!





# Revised sketch for S2I predictability for the West

Defaced by an  
Oceanographer



# ROLE OF THE UPPER OCEAN: MIXED LAYER AS VESTIBULE

Gateway between atmosphere and ocean interior. Need:

- Surface fluxes (heat, freshwater, momentum, gas)
- Fluxes through base of mixed layer
- Physical processes responsible for turbulent mixing in mixed layer, flux out of base of mixed layer, and surface fluxes.
  - When can we use statistical approximations?
  - When do we need to be exact?

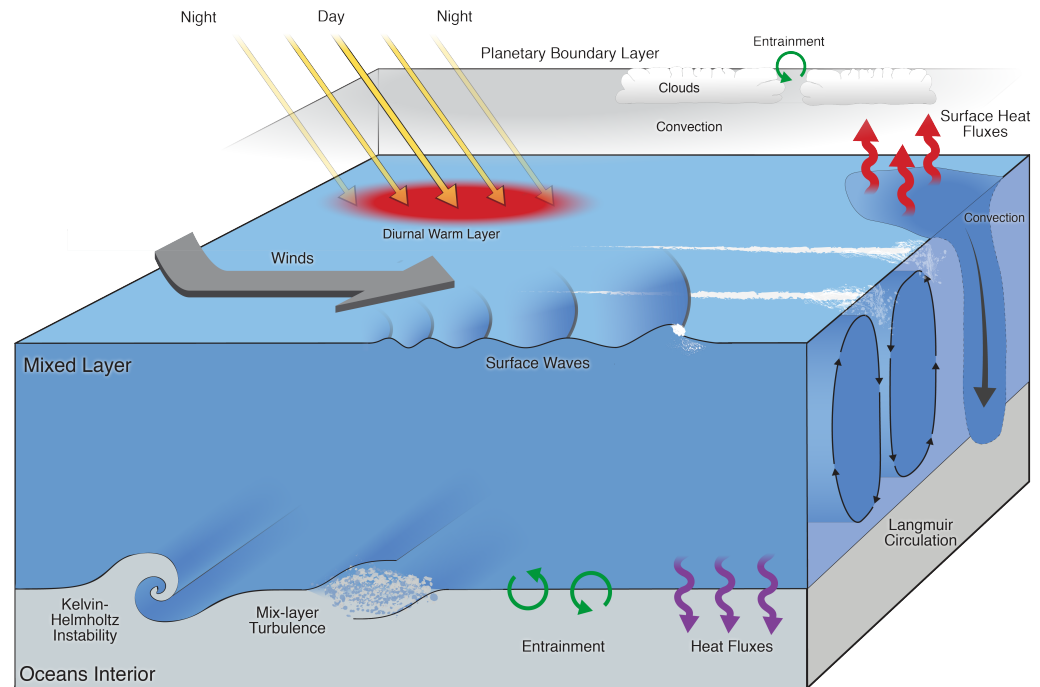


Figure by Momme Hell

# ROLE OF THE UPPER OCEAN: MIXED LAYER AS VESTIBULE

Gateway between atmosphere and ocean interior. Need:

- Surface fluxes (heat, freshwater, momentum, gas) [1]
- Fluxes through base of mixed layer [2]
- Physical processes responsible for turbulent mixing in mixed layer, flux out of base of mixed layer, and surface fluxes.
  - When can we use statistical approximations?
  - When do we need to be exact?

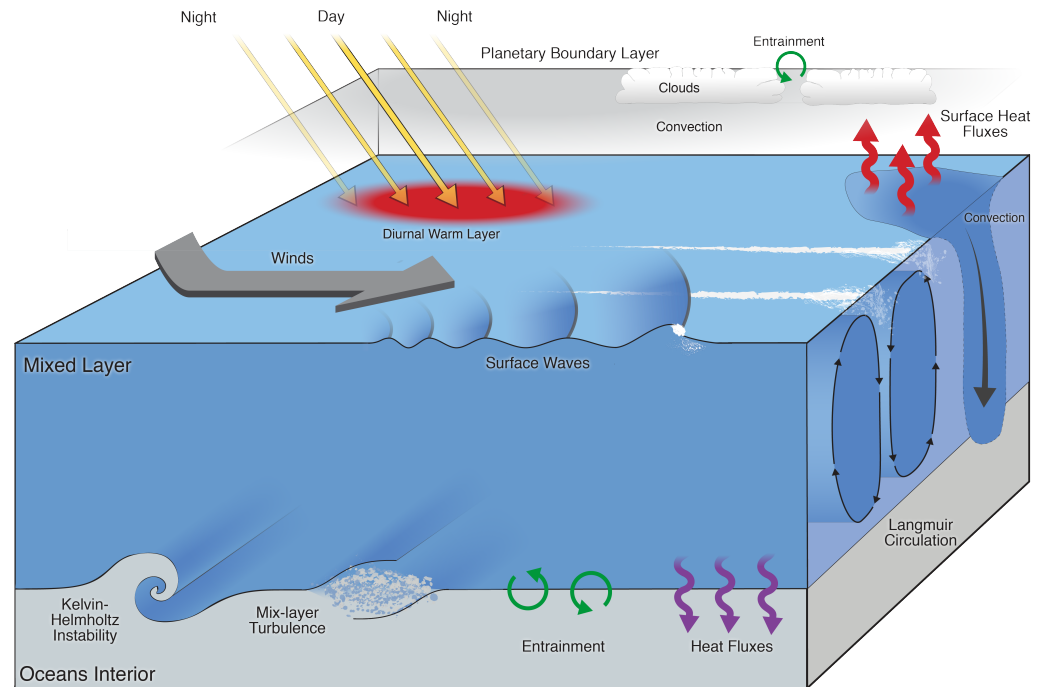
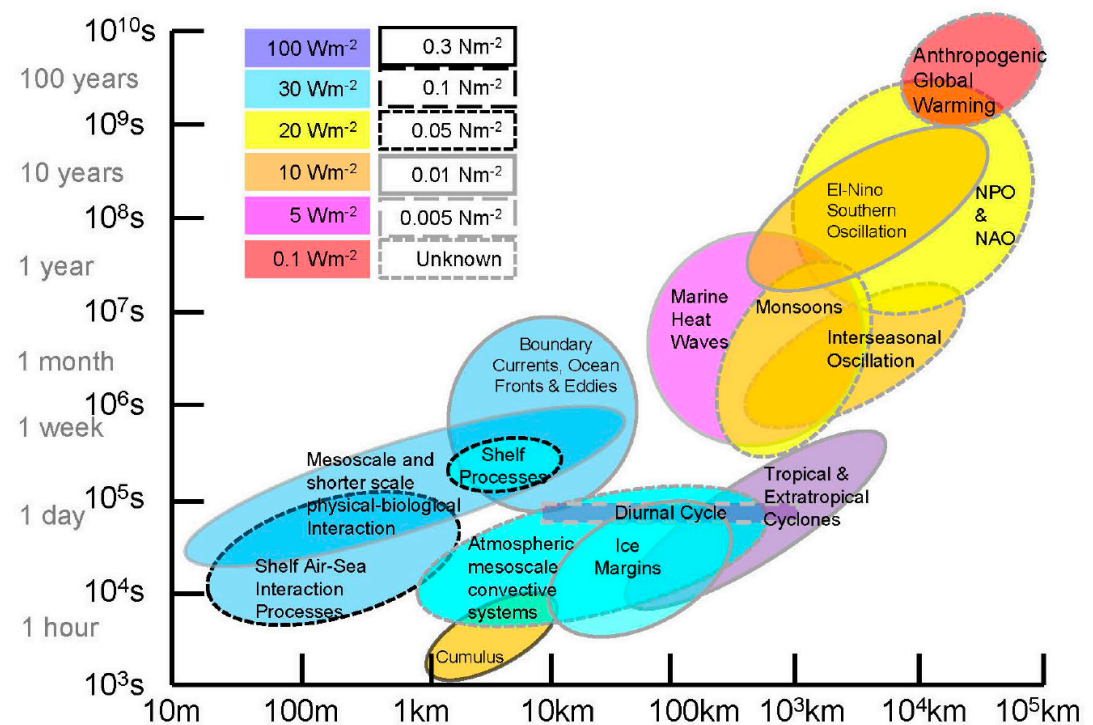


Figure by Momme Hell

# SURFACE FLUX REQUIREMENTS DEPEND ON APPLICATIONS

OceanObs'19 Community  
Consensus on air-sea flux  
requirements for heat and  
momentum fluxes

## Flux Accuracies and Processes

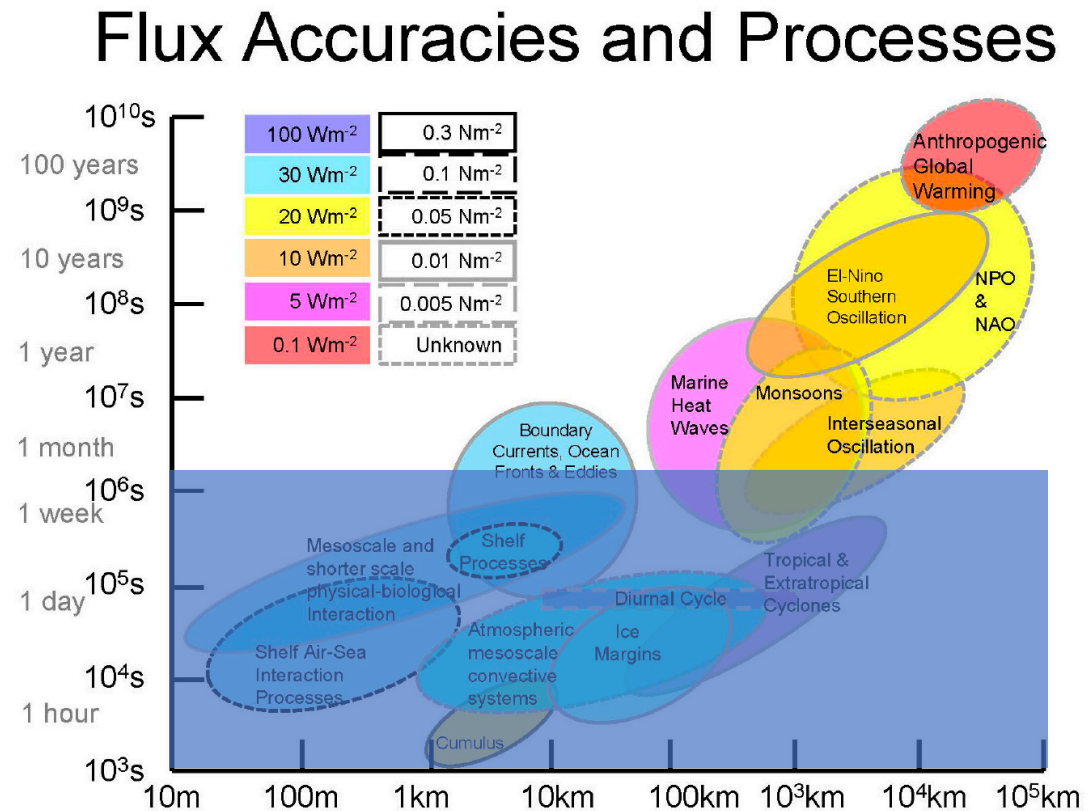




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OceanObs'19 Community Consensus on air-sea flux requirements for heat and momentum fluxes

For 10-day to 3-year time scales, maybe we can exclude high-frequency and small-scale processes.



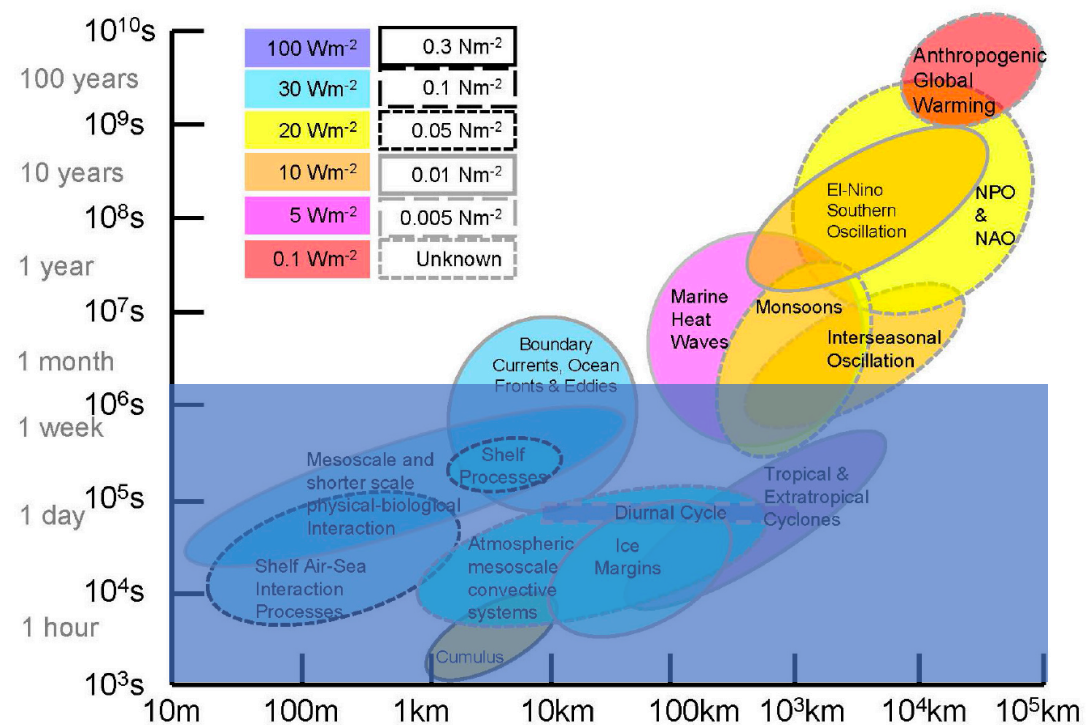
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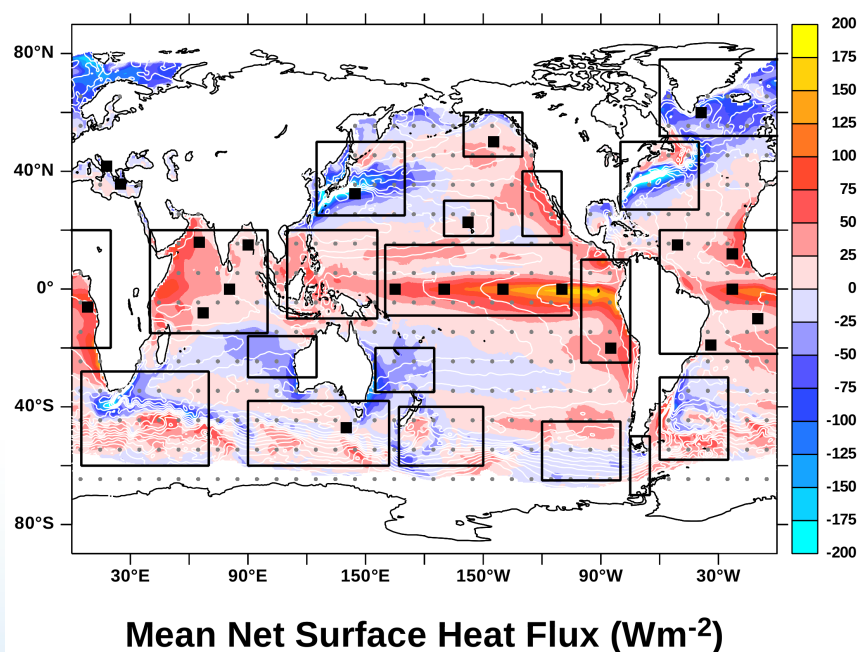
For 10-day to 3-year time scales, maybe we can exclude high-frequency and small-scale processes.

No, high-frequency, small-scale processes matter

## Flux Accuracies and Processes

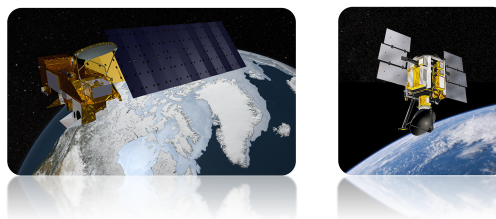


# OceanObs'19 Recommendation: Create an Integrated Surface Ocean Observing System



Cronin et al. (2019) "Air-sea fluxes with a focus on heat and momentum"

## Satellite Platforms



- OceanSITES surface platforms that measure Net Surface Heat Flux

- Key regions needing new OceanSITES flux platforms

- 10°x10° gridpoints. With 1000 platforms, each gridbox could have 2-3 platforms. (Mazloff et al 2018 suggest 4°x4° sampling)

## Fixed Platforms (Examples)



## Mobile and Drifting Platforms (Examples)

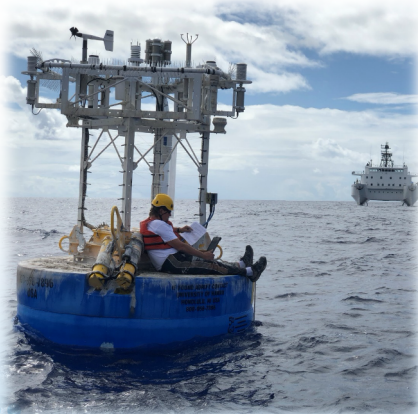




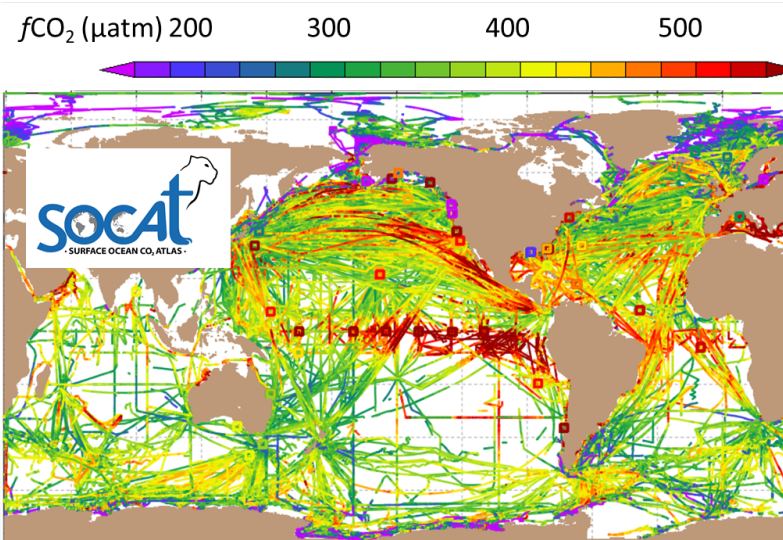
# OceanObs'19 Recommendation: Create an Integrated Surface Ocean Observing System



## Established Platforms:



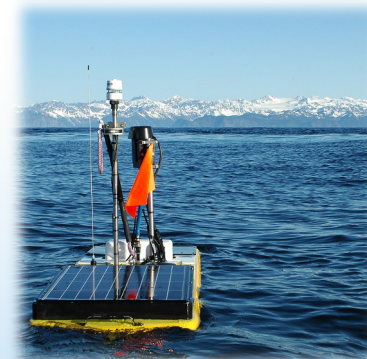
Surface ocean CO<sub>2</sub> flux: all seawater pCO<sub>2</sub> measurements collected since 1957



Wanninkhof et al. (2019) "A Surface Ocean CO<sub>2</sub> Reference Network, SOCONET and Associated Marine Boundary Layer CO<sub>2</sub> Measurements"



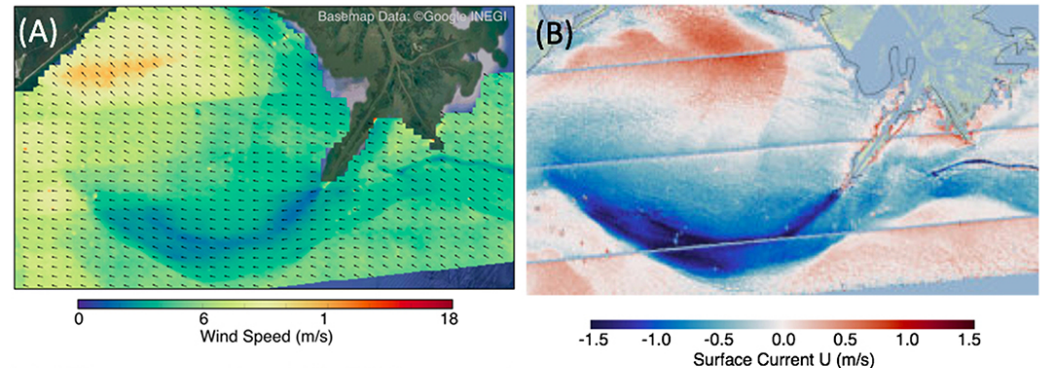
## New Technologies:





# SATELLITE-BASED OBSERVATIONS TO COMPLEMENT IN SITU OBSERVATIONS

**Momentum exchange:** WACM (Winds and Currents Mission); SKIM (ESA proposal: waves and currents), CFOSAT (Chinese-French Ocean satellite: winds and waves)



**Heat flux:** FluxSat (coincident SST,  $T_{air}$ ,  $q_{air}$ , wind speed)

**Sensible heat flux**

$$Q_{sen} = \rho_a C_p C_H U (T_{sea} - T_{air})$$

Diagram showing the components of the sensible heat flux equation:

- Air density ( $\rho_a$ )
- Air specific heat capacity ( $C_p$ )
- Turbulent exchange coefficient ( $C_H$ )
- Wind speed ( $U$ )
- Sea-air temperature difference ( $T_{sea} - T_{air}$ )

**Latent heat flux**

$$Q_{lat} = \rho_a L_v C_E U (q_{sea} - q_{air})$$

Diagram showing the components of the latent heat flux equation:

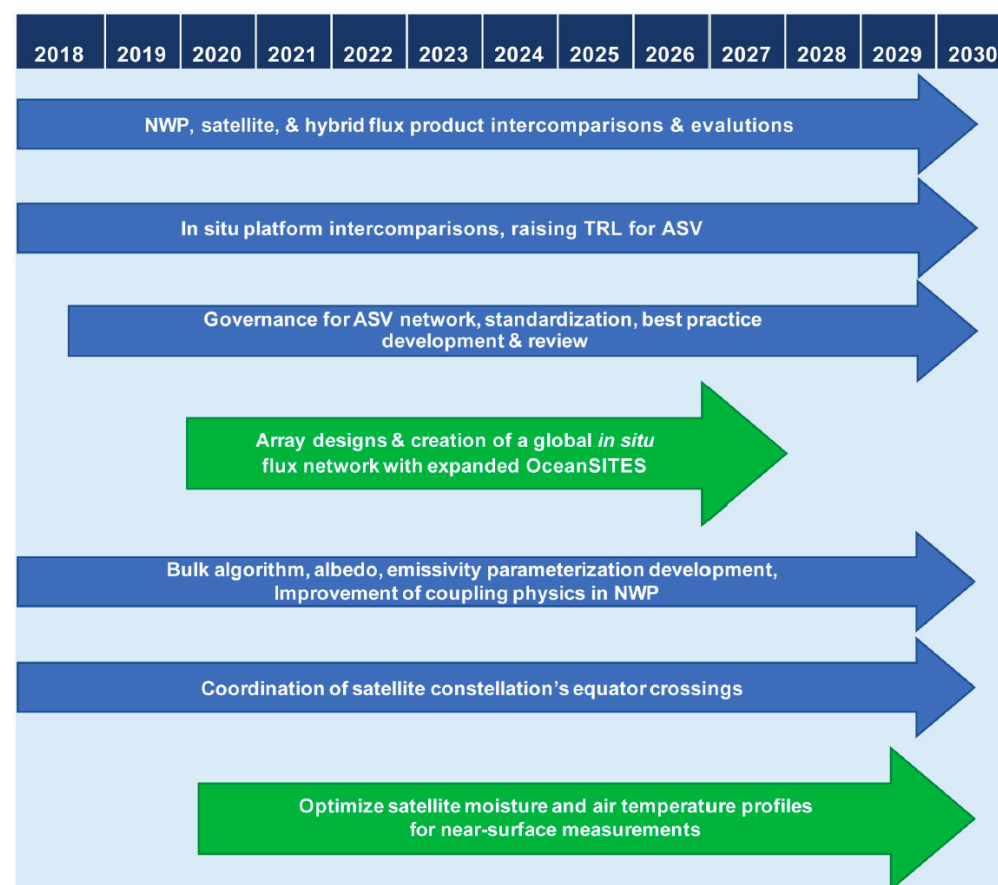
- Air density ( $\rho_a$ )
- Latent heat of vaporization ( $L_v$ )
- Turbulent exchange coefficient ( $C_E$ )
- Wind speed ( $U$ )
- Sea-air humidity difference ( $q_{sea} - q_{air}$ )

**Freshwater flux:** Precipitation missions

# A VISION FOR THE FUTURE: IN SITU AND SATELLITE FLUX MEASUREMENTS

**Goal for 2030:**  
**Gridded (3-hourly at 25 km)**  
**Air-Sea Fluxes with breakthrough**  
**1-day random uncertainties of:**  
 $15 \text{ W m}^{-2}$  (5%) &  $0.01 \text{ N m}^{-2}$  (5%)

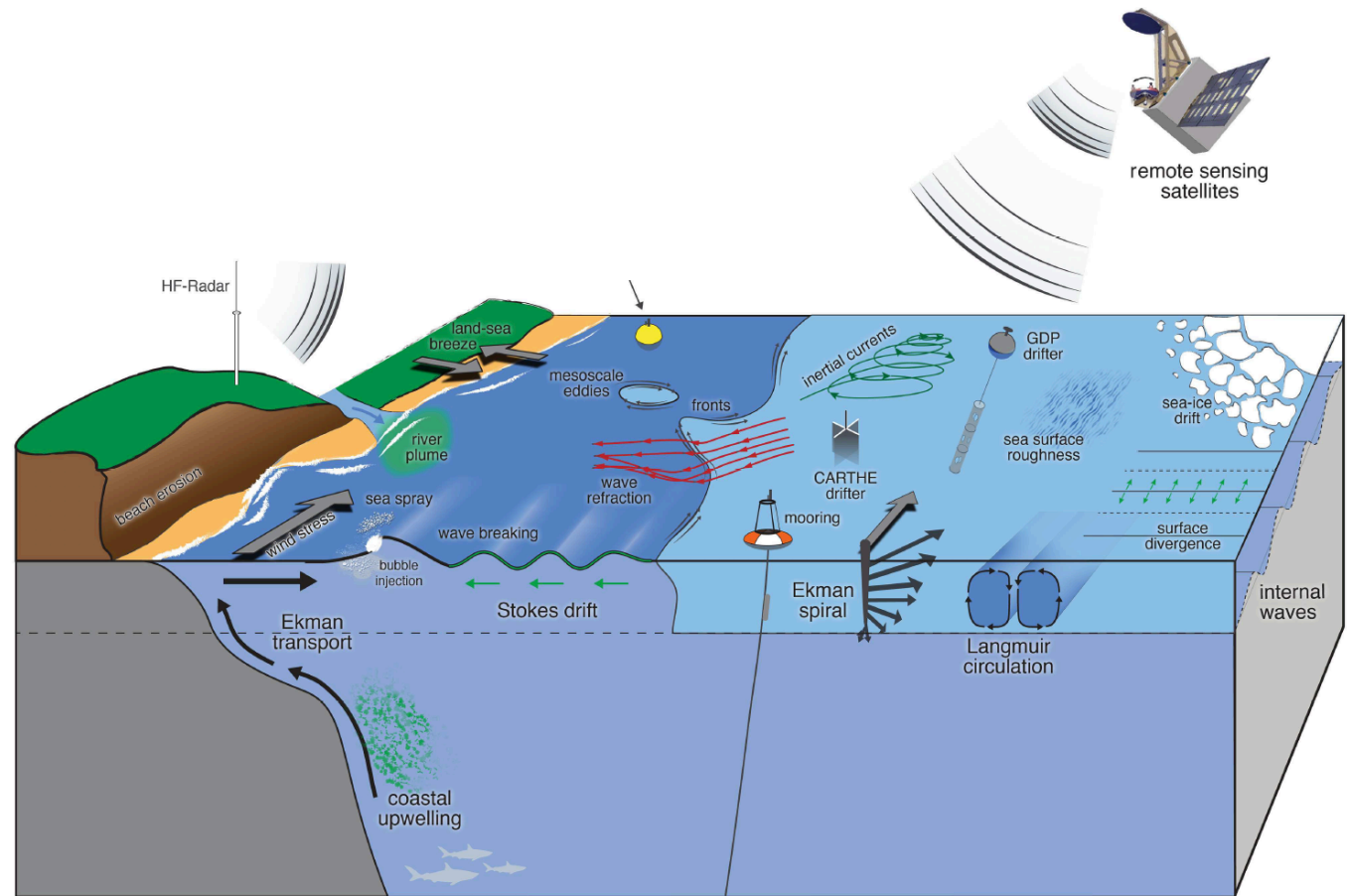
**And Biases less than:**  
 $5 \text{ W m}^{-2}$  &  $0.005 \text{ N m}^{-2}$



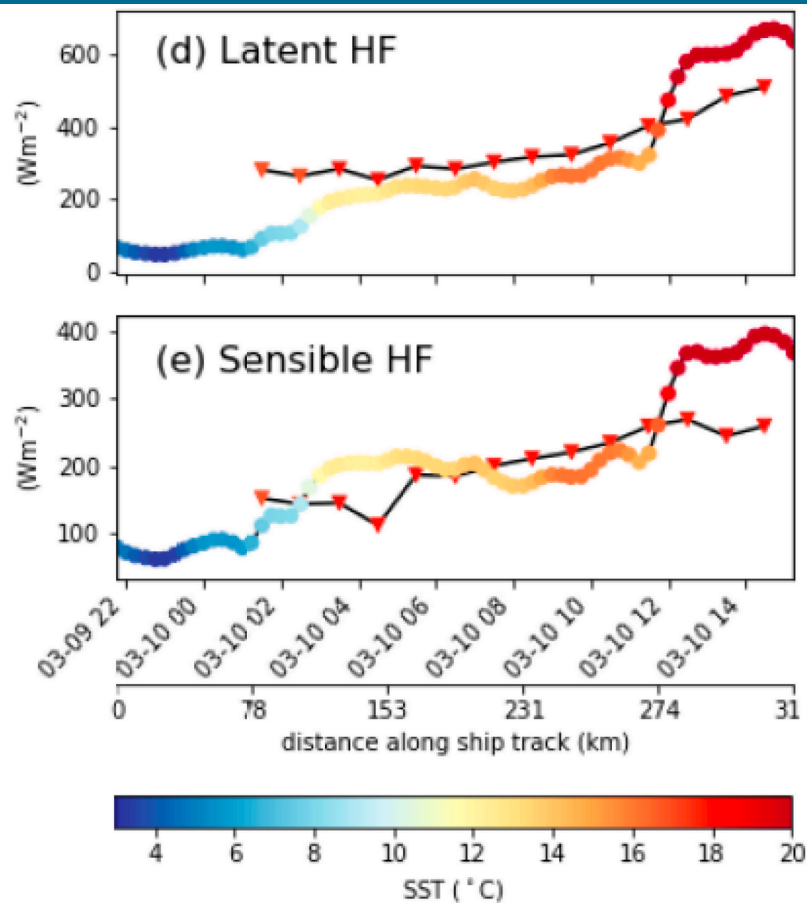
# HOW DO WE REPRESENT THE IMPACT OF UPPER-OCEAN PROCESSES?

Upper ocean supports a multitude of processes:

- Surface waves---wave breaking, aerosol formation, bubbles
- Turbulent mixing and mixed-layer deepening
- Internal waves
- Wind-current and wind-SST interactions



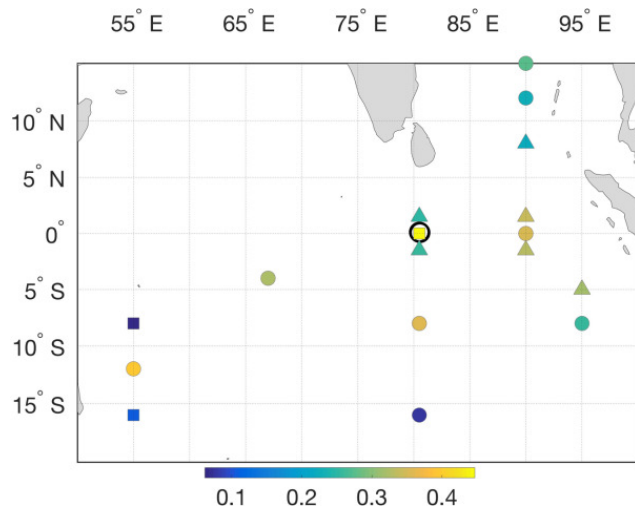
## FLUXES ACROSS THE GULF STREAM: SHARP GRADIENTS



Air-sea exchanges vary at the scale of ocean eddies and fronts.

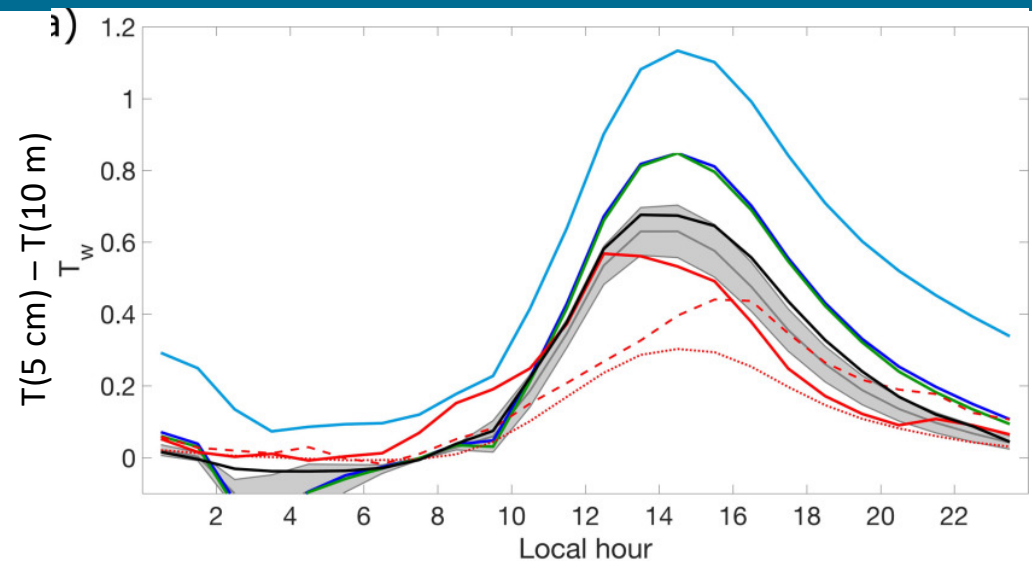
Sharp gradients in latent and sensible heat flux measured from ship are not detected in satellite-derived SeaFlux product (black line)

# GUSTY WINDS NEEDED TO EXPLAIN UPPER OCEAN TEMPERATURE



RAMA array in Indian Ocean. Focus on October 2011 MJO event at yellow circle.

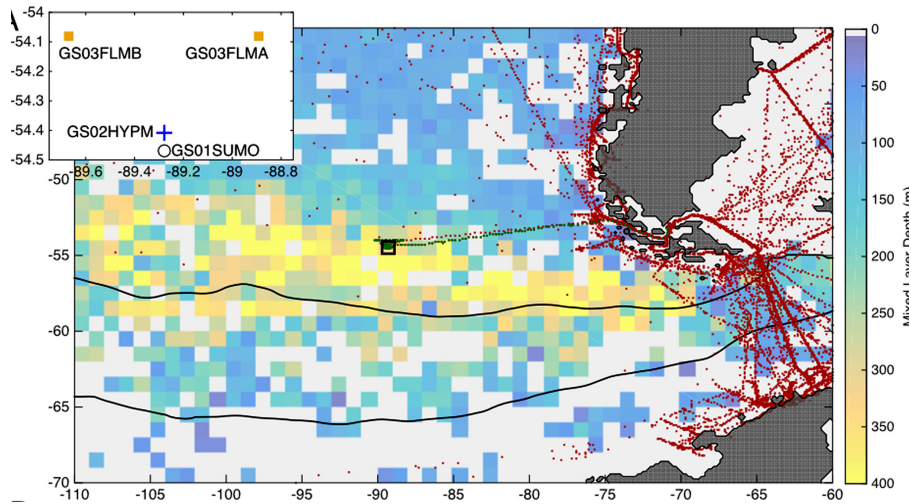
Generalized Ocean Turbulence Model.



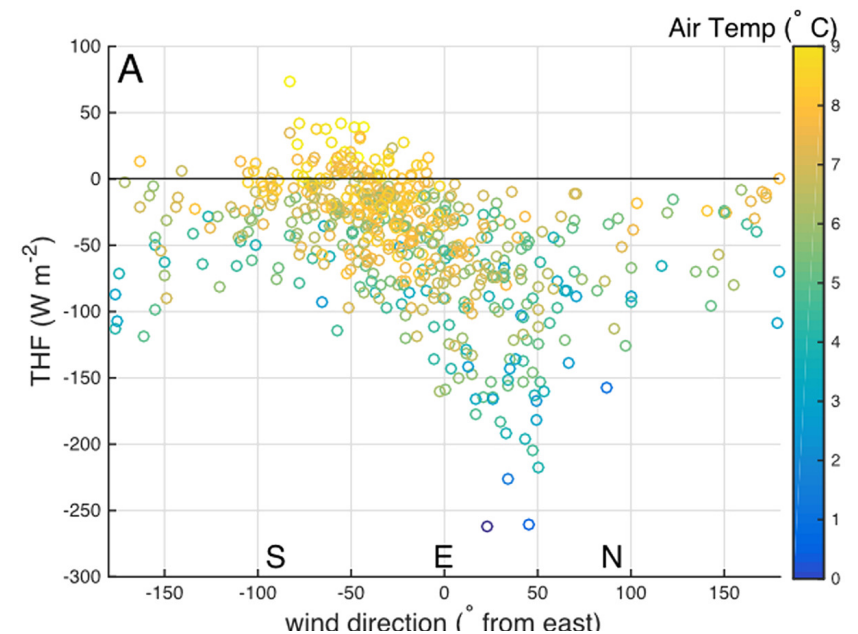
**Observations** best matched with model forced with **true winds** or **stochastic gusty winds** while **constant winds** or **diurnal cycle** imply too little mixing.



# MIXED LAYERS DEEPEN IN RESPONSE TO EPISODIC EVENTS



Southern Ocean (OOI) Mooring at a location of deep winter mixed layers.

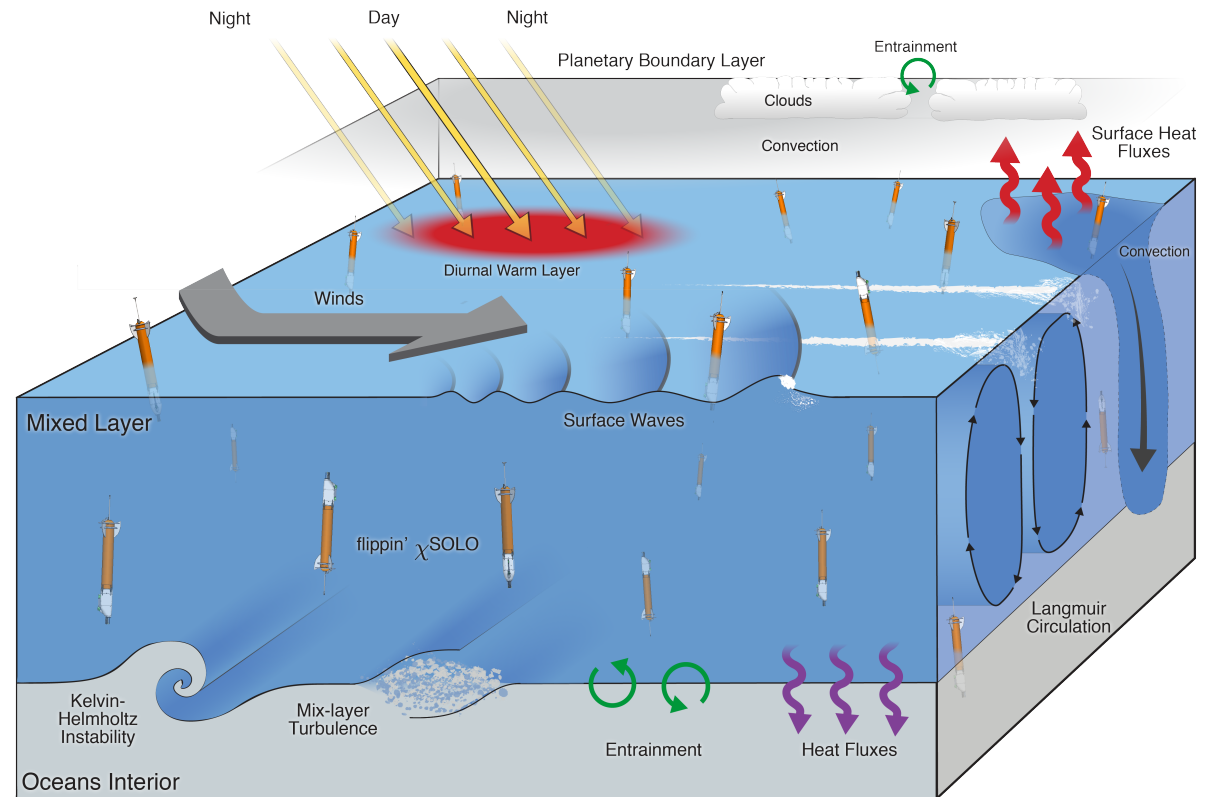


Strong cooling heat fluxes coincide with winds from the south; single events deepen the mixed layer.

# ENVISIONING PROCESSES STUDIES FOR MIXED-LAYER TURBULENCE

**Hypothesis:** small-scale, high-frequency, episodic processes govern turbulent mixing and mixed-layer depth.

- Measure vs parameterize?
- What instruments?
- What statistical and modeling tools? (Machine learning? Super parameterization? Surrogate models?)



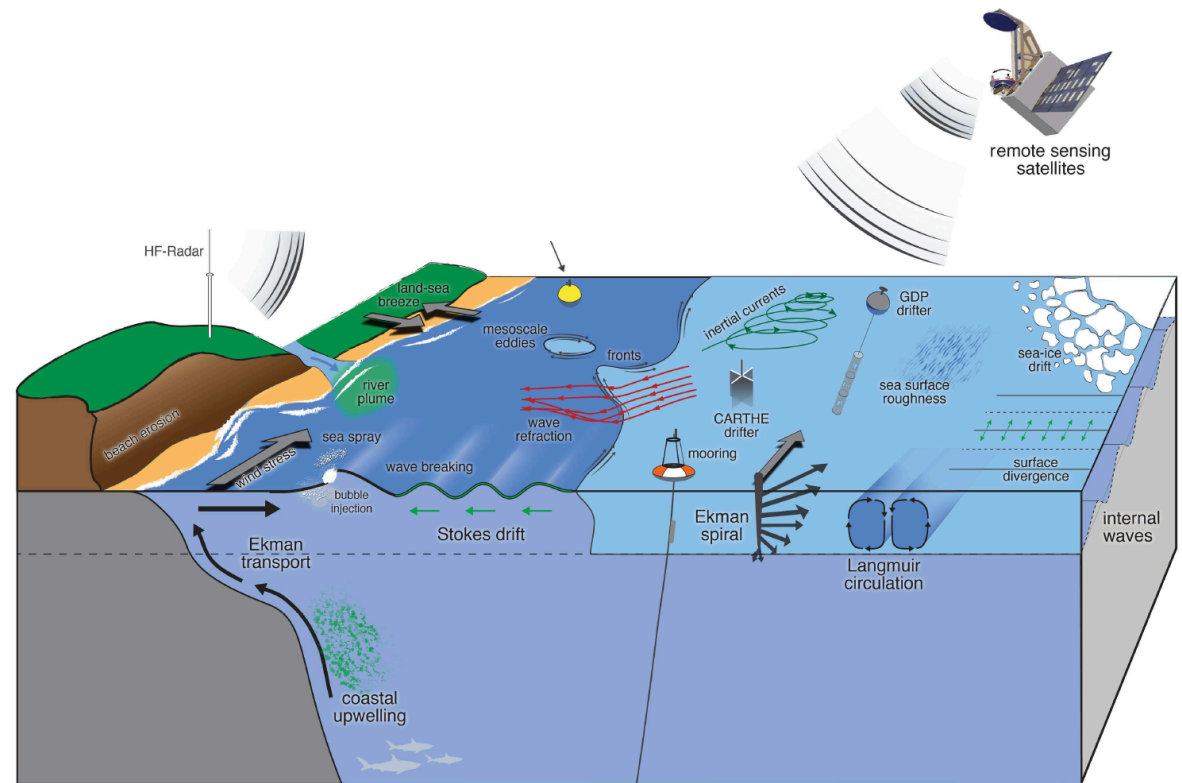
Flippin'  $\chi$ SOLO: Turbulence-measuring Argo-float variant

## SUMMARY: A VISION FOR OPTIMIZING OBSERVATIONS

**Observing system:** in situ plus satellite observations provide boundary conditions and model verification. Configure to resolve key variability.

**Process studies:** probing episodic turbulent processes (things we don't yet know how to parameterize)

**FAIR:** findable, accessible, interoperable, reusable



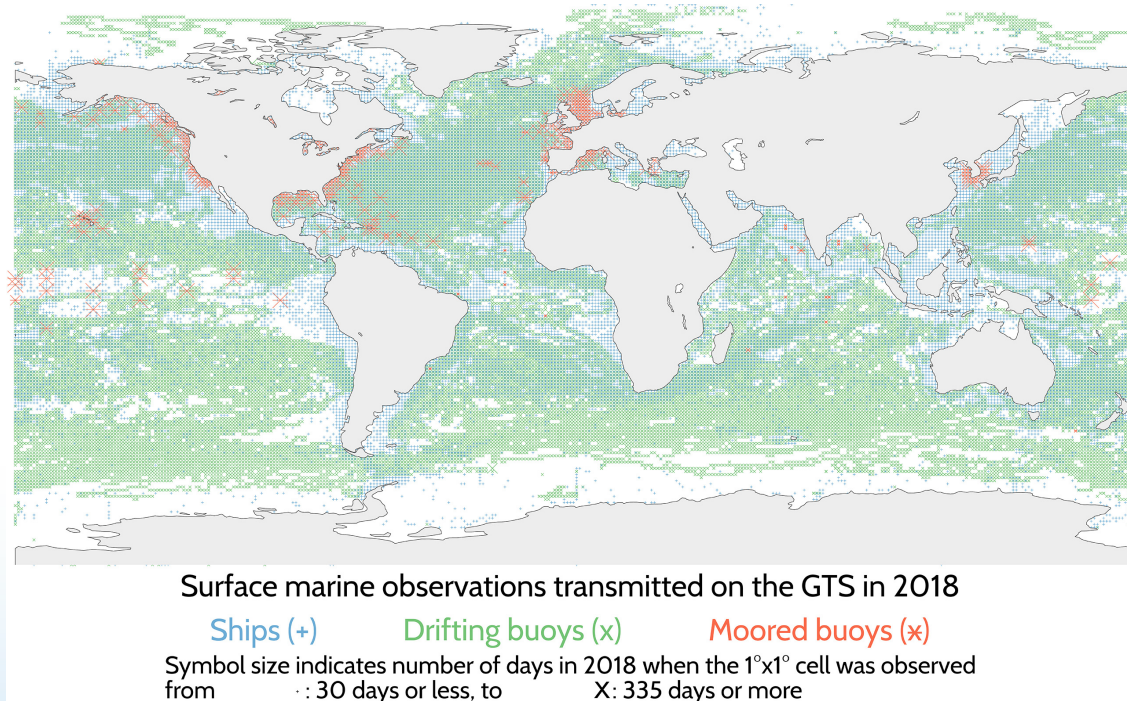
EXTRAS

# More than two dozen OceanObs19 Community Strategy Papers address surface ocean:

- Cronin et al. (2019) "Air-Sea Fluxes with focus on Heat and Momentum" <https://www.frontiersin.org/articles/10.3389/fmars.2019.00430/full>
- Centurioni, et al. (2019) "Multidisciplinary Global In-Situ Observations of Essential Climate and Ocean Variables at the Air-Sea Interface in Support of Climate Variability and Change Studies and to Improve Weather Forecasting, Pollution, Hazard and Maritime Safety Assessments" <https://www.frontiersin.org/articles/10.3389/fmars.2019.00419/full>
- Wanninkhof et al. (2019) "A surface ocean CO<sub>2</sub> reference network, SOCONET and associated marine boundary layer CO<sub>2</sub> measurements" <https://www.frontiersin.org/articles/10.3389/fmars.2019.00400/full>
- Arduin, et al. (2019) "Observing sea states" <https://doi.org/10.3389/fmars.2019.00124>
- Arduin, et al. (2019) "SKIM, a candidate satellite mission exploring global ocean currents and waves" <https://doi.org/10.3389/fmars.2019.00209>
- Bourassa, et al. (2019) "Remotely Sensed Winds and Wind Stresses for Marine Forecasting and Ocean Modeling" <https://doi.org/10.3389/fmars.2019.00443>
- Domingues, et al. (2019) "Ocean Observations in Support of Studies and Forecasts of Tropical and Extratropical Cyclones". Front. Mar. Sci. 6:446. doi: 10.3389/fmars.2019.00446
- Foltz et al. (2019) "The Tropical Atlantic Observing System" doi: 10.3389/fmars.2019.00206
- Gommenginger, et al. (2019) "SEASTAR: a mission to study ocean submesoscale dynamics and small-scale atmosphere-ocean processes in coastal, shelf and polar seas" <https://doi.org/10.3389/fmars.2019.00457>
- Groom, et al. (2019) "Satellite Ocean Colour: Current Status and Future Perspective". Front. Mar. Sci. 6:485. doi: 10.3389/fmars.2019.00485
- Kent et al. (2019) "Observing requirements for long-term climate records at the ocean surface" <https://doi.org/10.3389/fmars.2019.00441>
- Lombard, F., E. Boss, A. M. Waite, and others. (2019). Globally Consistent Quantitative Observations of Planktonic Ecosystems. Frontiers in Marine Science 6: 196. doi:10/gfzvfd
- Maximenko, et al. (2019) Toward the Integrated Marine Debris Observing System. Front. Mar. Sci. 6:447. <https://doi.org/10.3389/fmars.2019.00447>
- Meinig, et al. (2019) Public-Private Partnerships to Advance Regional Ocean-Observing Capabilities: A Saildrone and NOAA-PMEL Case Study and Future Considerations to Expand to Global Scale Observing. Front. Mar. Sci. 6:448. doi: 10.3389/fmars.2019.00448
- Muelbert, et al. (2019) ILTER – The International Long-Term Ecological Research Network as a Platform for Global Coastal and Ocean Observation. Front. Mar. Sci. 6:527. doi: 10.3389/fmars.2019.00527
- Newman, L. and co-authors. (2019). Delivering sustained, coordinated and integrated observations of the Southern Ocean for global impact. *Frontiers Mar. Sci.*, doi: [10.3389/fmars.2019.00433](https://doi.org/10.3389/fmars.2019.00433).
- O'Carroll, et al. (2019) "Observational Needs of Sea Surface Temperature" <https://doi.org/10.3389/fmars.2019.00420>
- Pinardi, et al. (2019) The Joint IOC (of UNESCO) and WMO Collaborative Effort for Met-Ocean Services. Front. Mar. Sci. 6:410. doi: 10.3389/fmars.2019.00410
- Powers M, Begg Z, Smith G and Miles E (2019) Lessons From the Pacific Ocean Portal: Building Pacific Island Capacity to Interpret, Apply, and Communicate Ocean Information. Front. Mar. Sci. 6:476. doi: 10.3389/fmars.2019.00476
- Smith, et al. (2019) "Ship-Based Contributions to Global Ocean, Weather, and Climate Observing Systems" <https://doi.org/10.3389/fmars.2019.00434>
- Smith et al. (2019) Tropical Pacific Observing System
- Steinhoff, et al. (2019) "Constraining the oceanic uptake and fluxes of greenhouse gases by building an ocean network of certified stations: the ICOS Oceans Network" <https://doi.org/10.3389/fmars.2019.00544>
- Subramanian, et al. (2019) Ocean Observations to Improve Our Understanding, Modeling, and Forecasting of Subseasonal-to-Seasonal Variability. Front. Mar. Sci. 6:427. doi: 10.3389/fmars.2019.00427
- Swart et al. (2019) "Constraining Southern Ocean air-sea-ice fluxes through enhanced observations" <https://doi.org/10.3389/fmars.2019.00421>
- Villas Boas, A. B. et al. (2019) "Integrated observations and modeling of winds, currents, and waves: requirements and challenges for the next decade" <https://doi.org/10.3389/fmars.2019.00425>

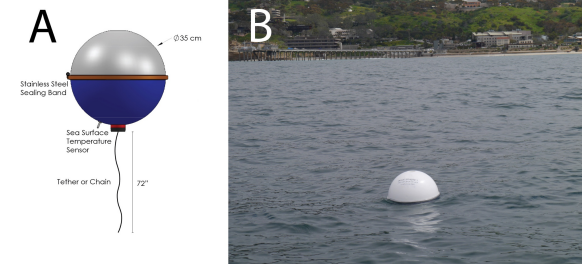


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Centurioni et al. (2019) “Global in situ Observations of Essential Climate and Ocean Variables at the Air-Sea Interface”

New technology for measuring directional waves



... and meteorological variables

