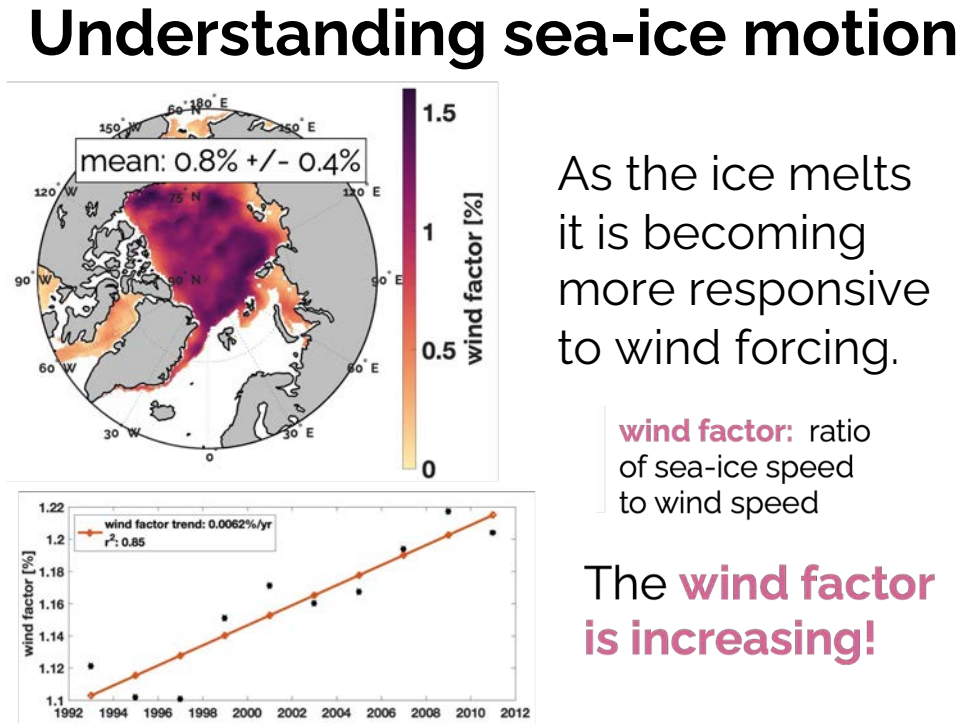
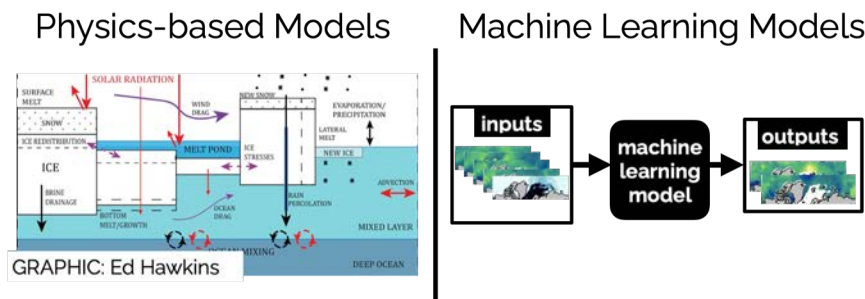


# Machine learning is a useful tool to predict and understand sea-ice motion.

Lauren Hoffman<sup>1</sup>, Matthew Mazloff<sup>1</sup>, Sarah Gille<sup>1</sup>, Donata Giglio<sup>2</sup>, Cecilia Bitz<sup>3</sup>, Patrick Heimbach<sup>4</sup>  
[1] Scripps Institution of Oceanography, [2] University of Colorado Boulder, [3] University of Washington, [4] University of Texas at Austin

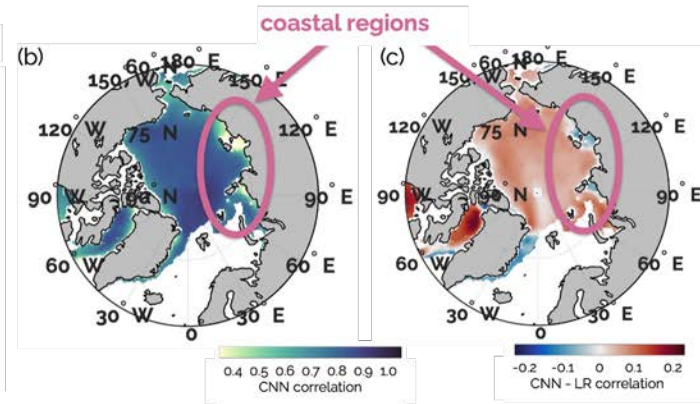
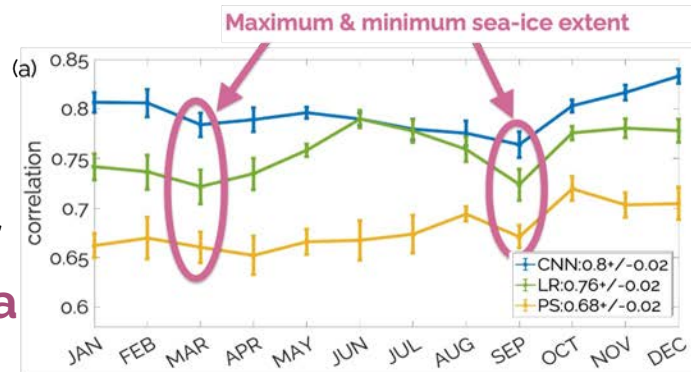
## Predictability

Machine learning models can be used to predict sea-ice dynamics and are more computationally efficient than traditional physics-based models.



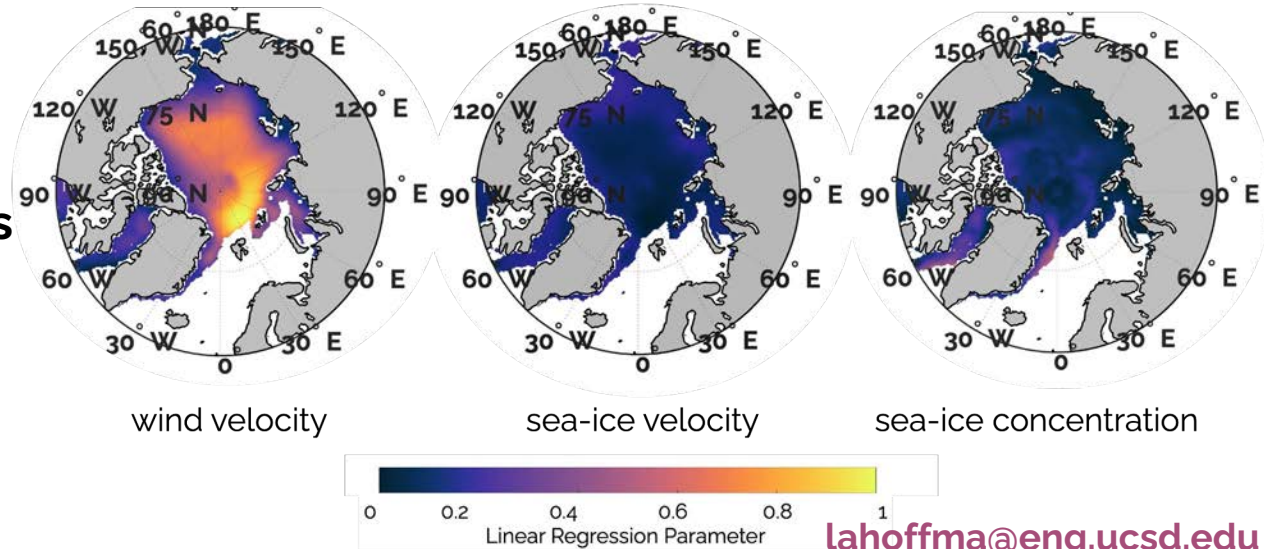
# Predictability

Machine learning models can make skillful predictions of sea-ice motion, **with a few caveats.**



# Understanding sea-ice motion

Machine learning methods confirm historical results that **wind velocity has the largest relevance in determining sea-ice velocity.**

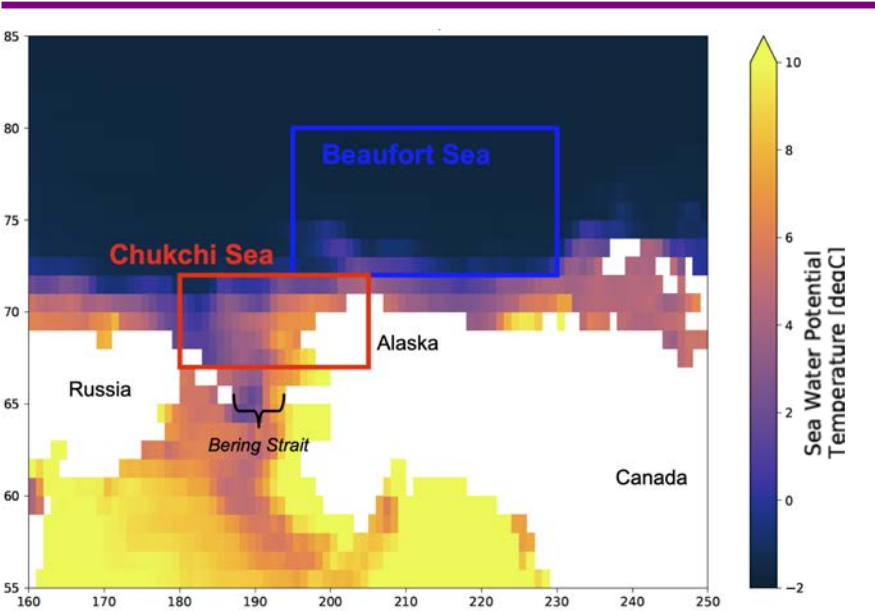


# Evaluation of GFDL coupled climate models for western Arctic seasonal heat budgets

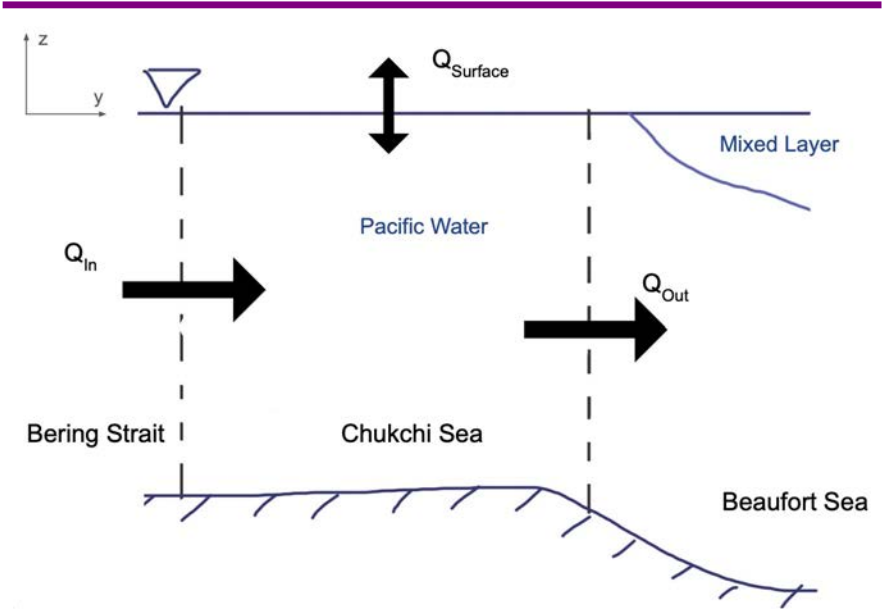
Marion Albery<sup>\*1</sup>, Mary-Louise Timmermans<sup>2</sup>, Sonya Legg<sup>1</sup>, Robert Hallberg<sup>3</sup>

<sup>1</sup>Princeton University, <sup>2</sup>Yale University, <sup>3</sup>NOAA Geophysical Fluid Dynamics Laboratory

## Region of Interest



## Chukchi Sea Heat Budget



While the Chukchi Sea plays a critical role in modulating the heat content of Pacific Water subducted into the Beaufort Gyre halocline on seasonal timescales, inconclusive observational evidence leaves the Chukchi Sea's role in this heat transport unclear.

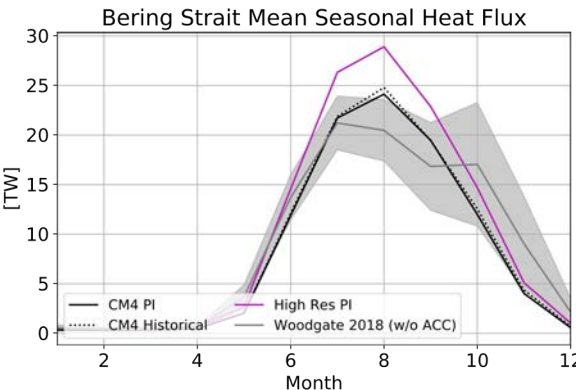
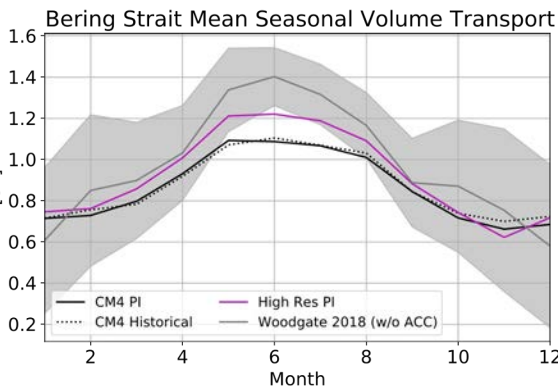
# Evaluation of GFDL coupled climate models for western Arctic seasonal heat budgets

Marion Albery<sup>\*1</sup>, Mary-Louise Timmermans<sup>2</sup>, Sonya Legg<sup>1</sup>, Robert Hallberg<sup>3</sup>

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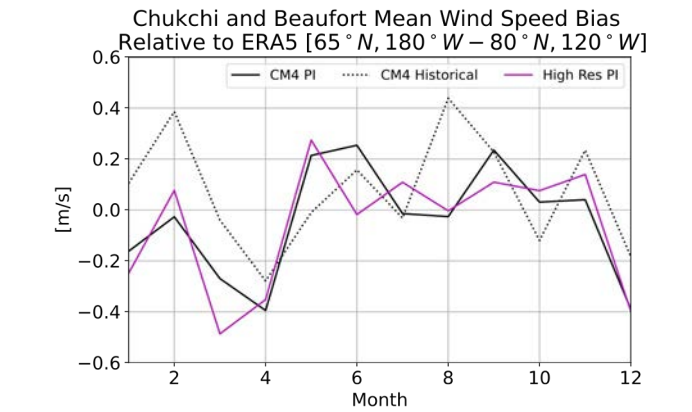
## Q<sub>in</sub>: Bering Strait Inflow

	Woodgate 2018	CMIP6 CM4 PI	CMIP6 CM4 Hist	High Res PI
$T_{vol}$ [Sv]	$1.07 \pm 0.12$	$0.86 \pm 0.06$	$0.87 \pm 0.07$	$0.92 \pm 0.08$
$\sum T_{heat}$ [ $10^{20}$ J]	$4.38 \pm 1.20$	$2.57 \pm 0.40$	$2.63 \pm 0.45$	$3.13 \pm 0.48$

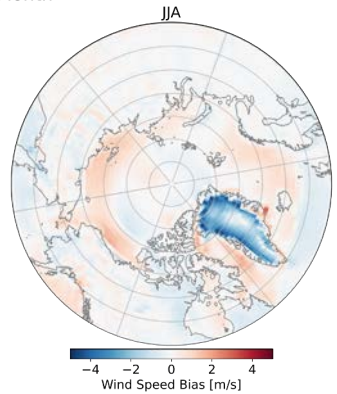


Simulated transports and fluxes are low relative to the observational estimate, however there is improved agreement between the observational estimates and the High Resolution simulation.

## Q<sub>Surface</sub>: Surface Winds



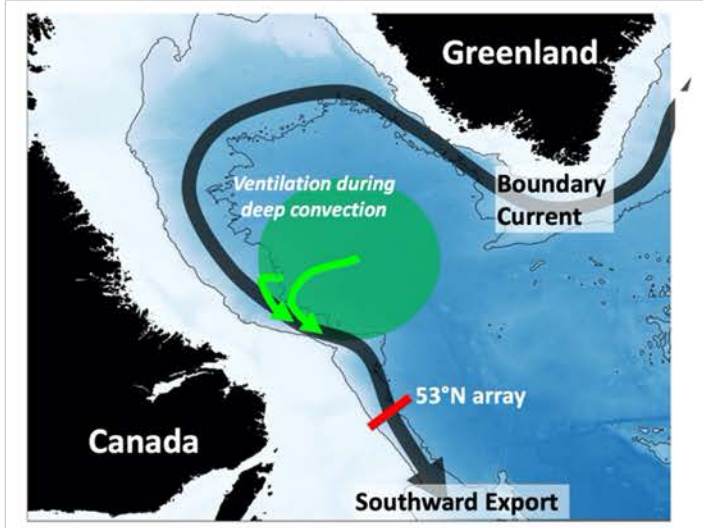
For all three simulations, surface wind speed biases are weaker in summer when air-sea heat fluxes are strongest.



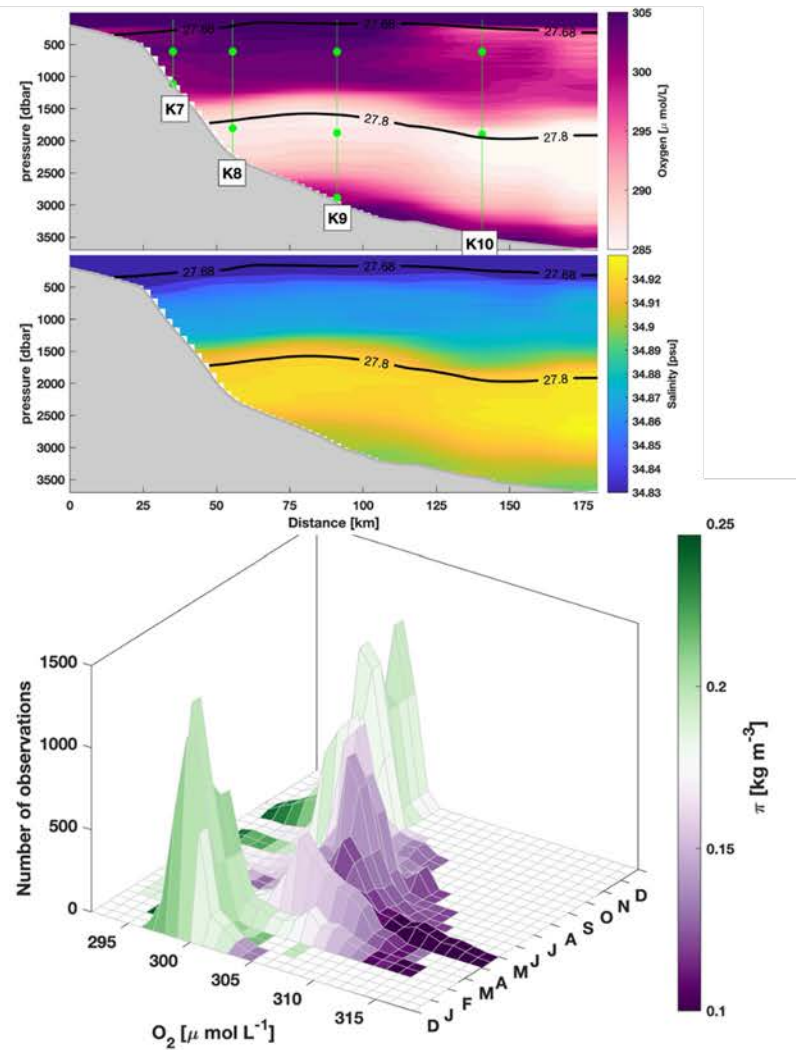


# Gateway to the gateway to the Arctic: Oxygen export from the Labrador Sea

Jannes Koelling ([j.koelling@dal.ca](mailto:j.koelling@dal.ca))



- Oxygen measurements at 53N
- Increased oxygen levels due to direct export of recently convected Labrador Sea Water
- 1.6 Tmol/year of southward oxygen export from newly ventilated LSW (50% of interior uptake)



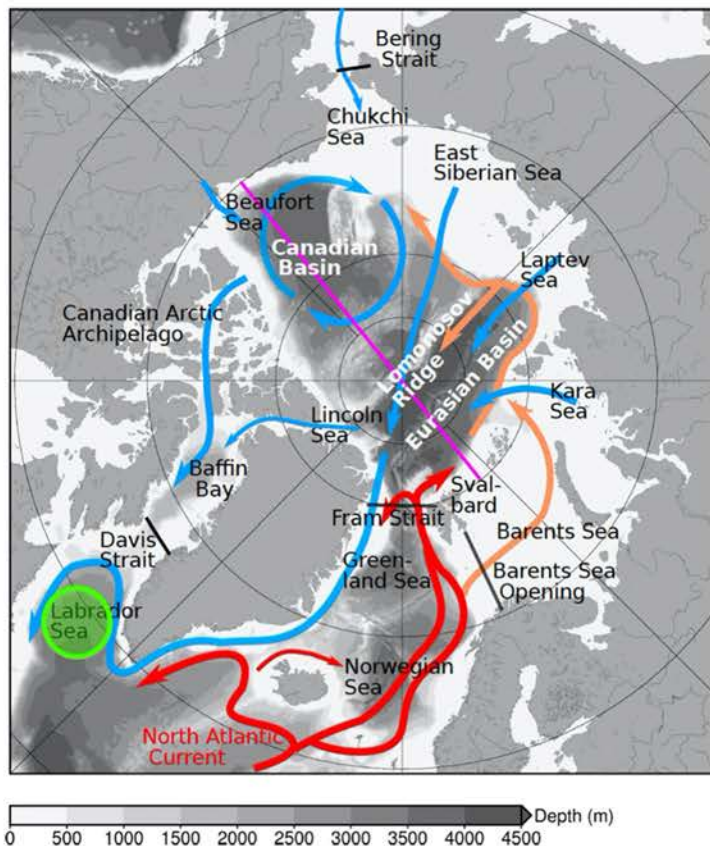
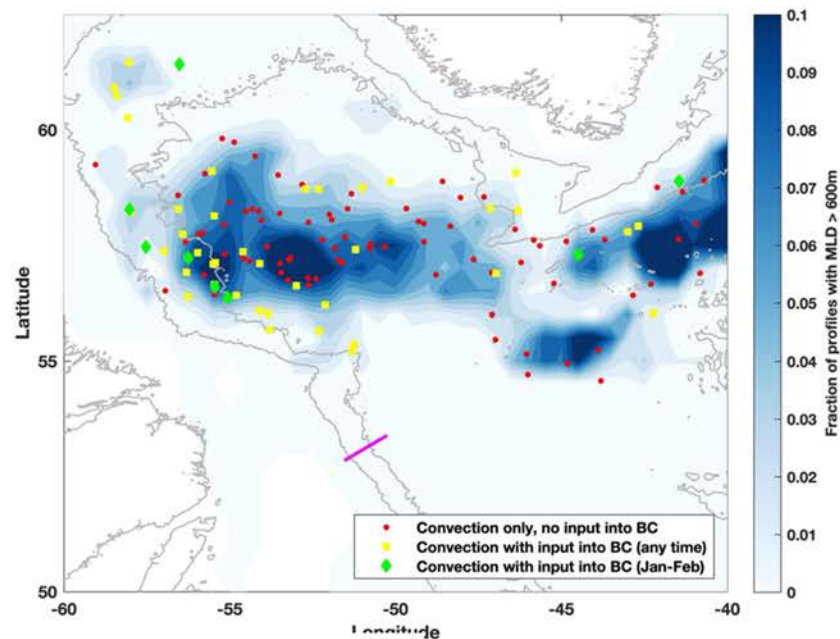


Figure from Wang et al. (2018)

- Convection in boundary current as well as interior
- Impacted by input of cold, fresh, high-oxygen water from the Arctic near the surface



## Oxygen export to the deep ocean following Labrador Sea Water formation

Jannes Koelling<sup>1</sup>, Darlia Atamanchuk<sup>1</sup>, Johannes Karstensen<sup>2</sup>, Patricia Handmann<sup>2</sup>, and Douglas W. R. Wallace<sup>1</sup>

<sup>1</sup>Department of Oceanography, Dalhousie University, Halifax, Nova Scotia, Canada

<sup>2</sup>GEOMAR Helmholtz Centre for Ocean Research Kiel, Kiel, Germany

Contact: [j.koelling@dal.ca](mailto:j.koelling@dal.ca)

# 3D reconstruction of upper ocean dynamics in the Nordic and Beaufort Seas.

## Assessment of the Surface Quasi-Geostrophic Approach

Marta Umbert <sup>(1)</sup>, Jordi Isern-Fontanet <sup>(1)</sup>, Marina Gutierrez <sup>(1)</sup>, Carolina Gabarró <sup>(1)</sup>, Laurent Bertino <sup>(2)</sup>, Roshin Raj <sup>(2)</sup>

(1) Institute of Marine Sciences (CSIC) and Barcelona Expert Center (BEC), Barcelona

(2) Nansen Environmental and Remote Sensing Center (NERSC) Bergen, Norway



➤ **OBJECTIVE** → See if surface information may be used to reconstruct 3D ocean dynamics in two key areas of the Arctic Ocean

➤ **METHOD** → **Surface Quasi-Geostrophy (eSQG)**

• **Reconstruction from SSH :**

$$\hat{\psi}_\eta(\vec{k}, z) = \exp(n_0 k z) \hat{\psi}_s(\vec{k}) \quad \psi_s(\vec{x}) = \frac{g}{f_0} \overset{\text{SSH}}{\eta}(\vec{x})$$

Stream function

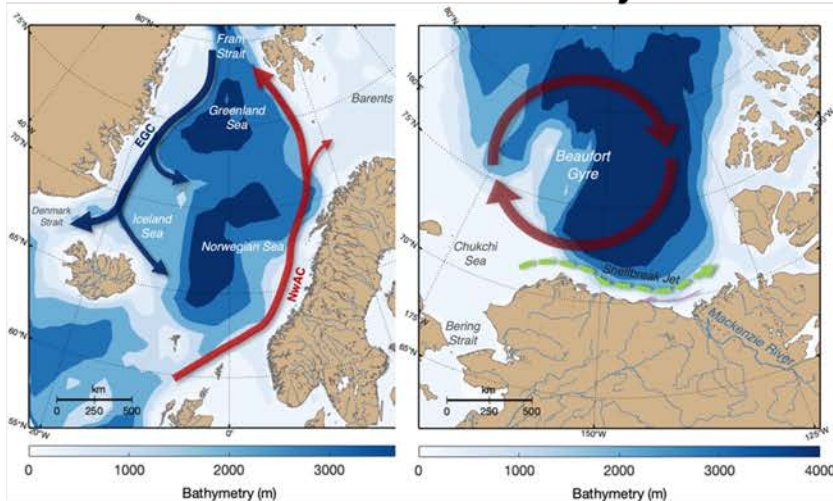
• **Reconstruction from SSB:**

$$\hat{\psi}_b(\vec{k}, z) = \frac{1}{n_0 f_0 k} \exp(n_0 k z) \hat{b}_s(\vec{k}) \quad b_s(\vec{x}) = -g \overset{\text{Surface Density (SSS \& SST)}}{\frac{\rho'(\vec{x})}{\rho_0}}$$

• **Reconstruction from SSV:**

$$\hat{v}_{vel}(\vec{k}, z) = \exp(n_0 k z) \overset{\text{Prandtl ratio}}{\hat{v}_s(\vec{k})}$$

### Beaufort Sea



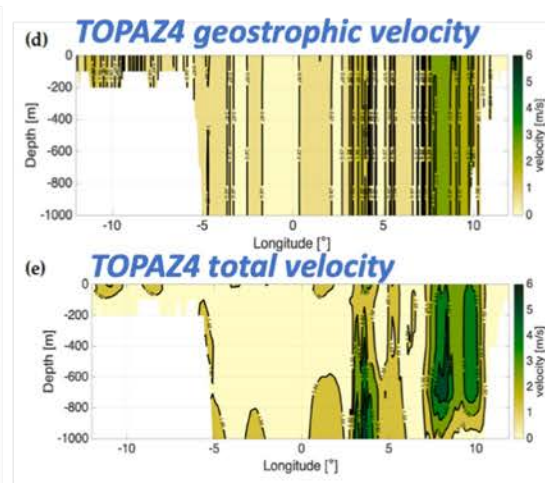
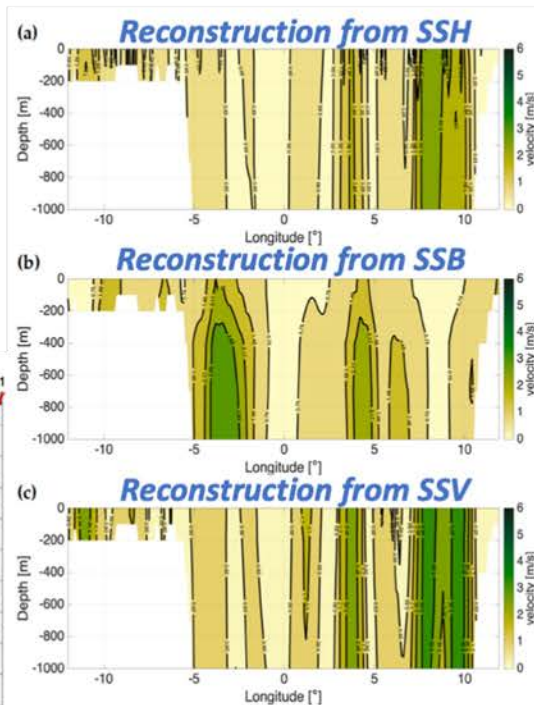
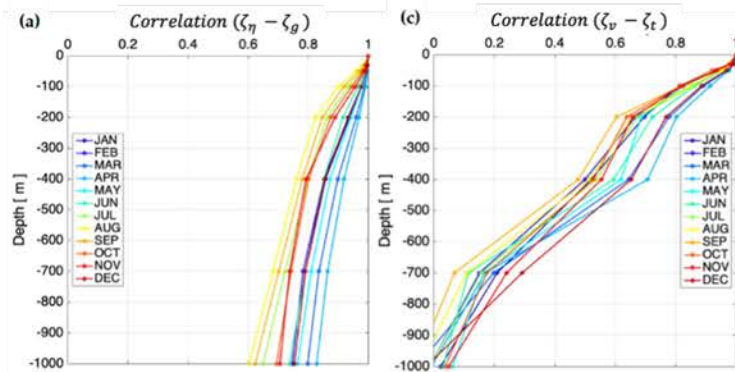
Contact Marta Umbert at → [mumbert@icm.csic.es](mailto:mumbert@icm.csic.es)



# 3D reconstruction of upper ocean dynamics in the Nordic and Beaufort Seas.

## Assessment of the Surface Quasi-Geostrophic Approach

- Reconstruction from SSH and model geostrophic current, **show good agreement (corr.>0.8) up to 400 meters.**
- Reconstruction from SSV and model total currents, **exhibit fairly good agreement (corr.>0.6) up to 200 meters.**
- Reconstructions are better in the winter and spring when the water column is less stratified



Contact Marta Umbert at → [mumbert@icm.csic.es](mailto:mumbert@icm.csic.es)

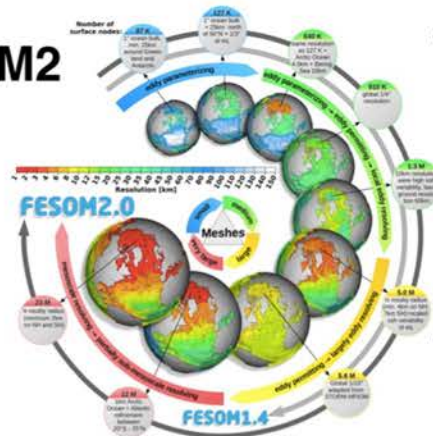
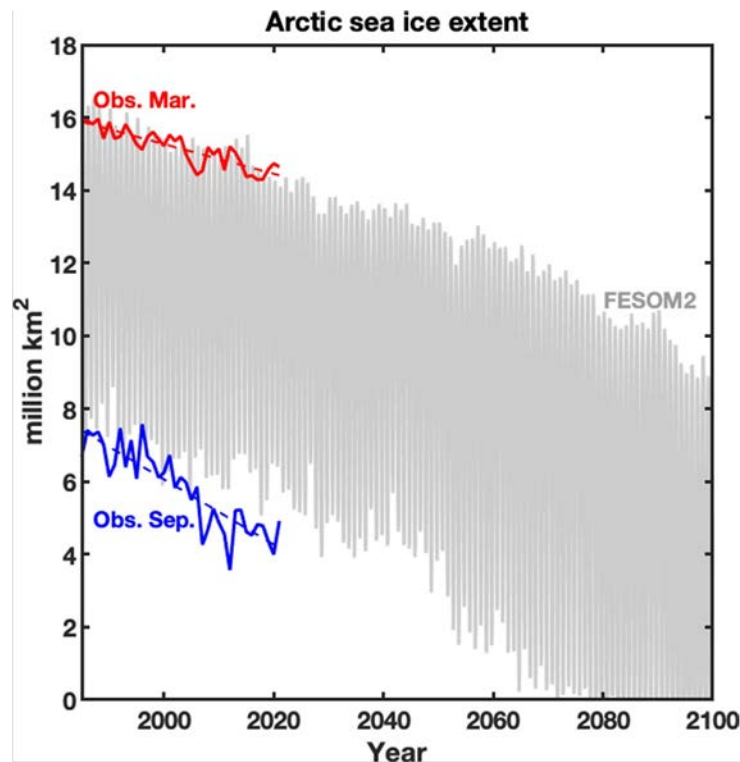




# Toward understanding future development of Arctic using FESOM2

Xinyue Li\*, Qiang Wang, Nikolay Koldunov, Dmitry Sidorenko, Thomas Jung, Sergey Danilov, Vasco Müller

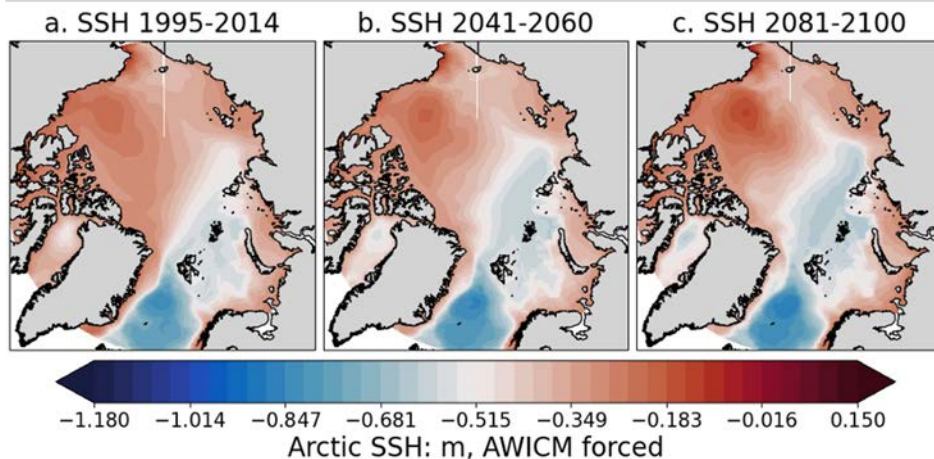
\*Alfred Wegener Institute, Helmholtz Centre for Polar and Marine Research

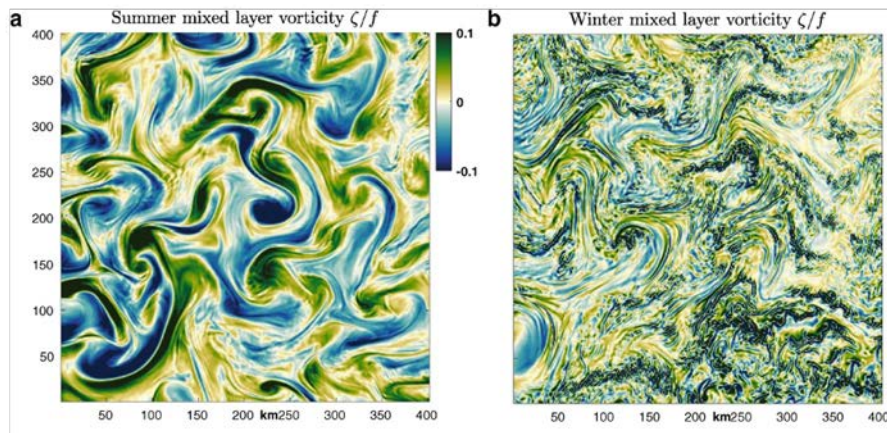


- Existing CMIP models tend to underestimate the strength of mesoscale eddies.

*We planned to apply the 4.5-1km grid of FESOM2.*

- Arctic sea ice is expected to decline in the future, somehow affecting strength of future Beaufort flows.

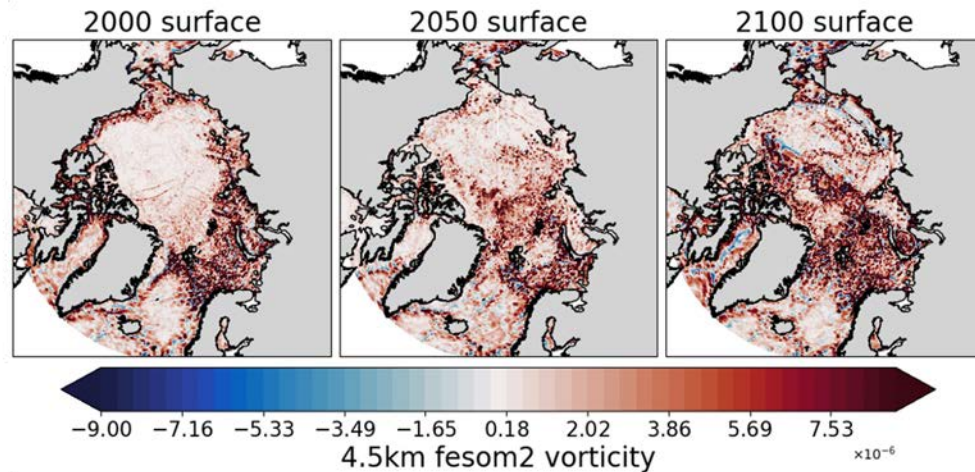




- In this recent study, high resolution model (1km) clearly captures more eddy activities than low resolution model.
- Stronger eddy activity in summer compared to winter reflects role of Arctic sea ice change.

Figure from (Manucharyan and Thompson, 2022)

- Using 4.5km resolution model, changes of Arctic eddy activities can still be observed.
- In 2100, sea ice may be largely receding, Arctic eddy activities would be greatly enhanced. These results contribute to simulations applying future 1km grids.





# Oceanic Fluxes Across Arctic Gateways in the Regional Arctic System Model (RASM)

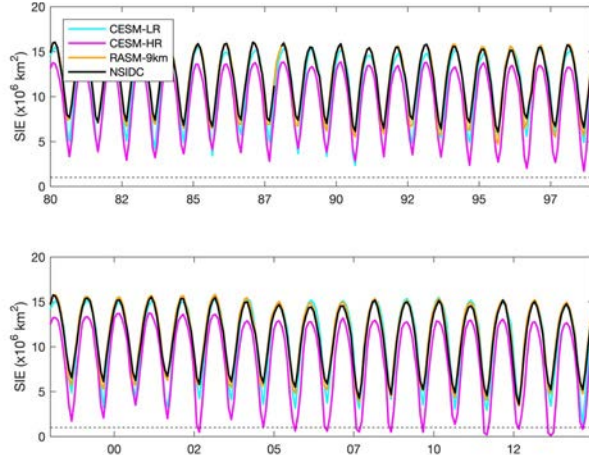


Younjoo J. Lee<sup>1</sup>(ylee1@nps.edu), Wieslaw Maslowski<sup>1</sup>, Robert Osinski<sup>2</sup>, and Jaclyn Clement Kinney<sup>1</sup>

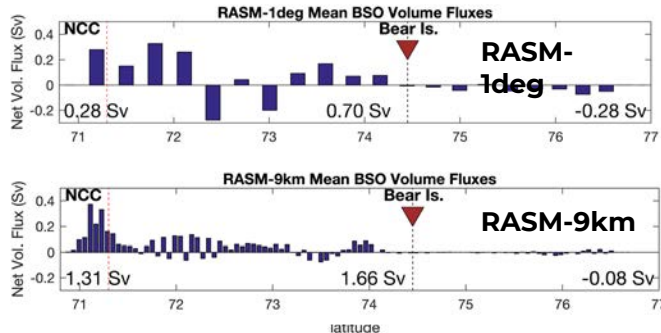
<sup>1</sup>Naval Postgraduate School, Monterey, CA, USA; <sup>2</sup>Institute of Oceanology, Polish Academy of Sciences, Sopot, Poland

Case		CESM-LR	CESM-HR	RASM-1deg	RASM-9km	RASM-2km
<b>Name (Experiment)</b>		CESM1-CAM5-SE-LR (hist-1950)	CESM1-CAM5-SE-HR (hist-1950)	R2200tGcdaa01f (hindcast)	R2200rGcsph02f (hindcast)	R2300uGcspn01f (hindcast)
<b>Arctic Ocean (&gt;65 N) Horizontal Resolution Range: Min.- Max. (Mean)</b>		7.8 ~ 72 km (45 km)	2.7~7.0 km (5.0 km)	7.8 ~ 72 km (45 km)	8.5 ~ 9.3 km (9.2 km)	2.1 ~ 2.3 km (2.3 km)
<b>Vertical # of Ocean</b>		60	62	60	45	45
<b>Atm.-Ocean-Ice-Land Models (forcing)</b>		CAM5.2-POP2-CICE4-CLM4		POP2-CICE6 (JRA55-do)		
<b>Net Volume Flux (Sv=10<sup>6</sup> m<sup>3</sup>/s)</b>	<b>BS</b>	0.77	1.41	0.65	0.70	0.65
	<b>BSO</b>	1.91	4.04	0.70	2.89	2.59
	<b>DS</b>	-1.49	-2.79	-1.21	-1.72	-2.34
	<b>FS</b>	-1.18	-2.61	-0.14	-1.86	-0.86
<b>Arctic Ocean Heat Convergence (TW)</b>		64	196	54	116	104

## Arctic Sea Ice Extent



## Barent Sea Opening Flux



## Summary & Future Research

- Net volume fluxes across the Arctic main gateways varies between the simulations; the higher resolution, the larger fluxes across the gateways.
- CESM high resolution simulation may overestimate heat fluxes into the Arctic since sea ice almost disappears during summer of 2002.
- The low resolution models exhibit lack of skills representing coastal currents such as Norwegian Coastal Current, which is critical to understand the connection between the Arctic and the sub-Arctic regions.
- Hence, improved observational flux estimates are necessary to constrain ocean and other climate models.
- Also, Arctic-wide balanced volume exchanges are needed across the gateways.





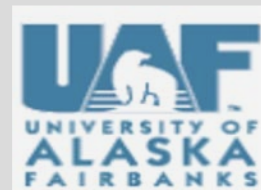
# Understanding circulation in the eastern Arctic Ocean from NABOS observations

Igor Polyakov and NABOS team

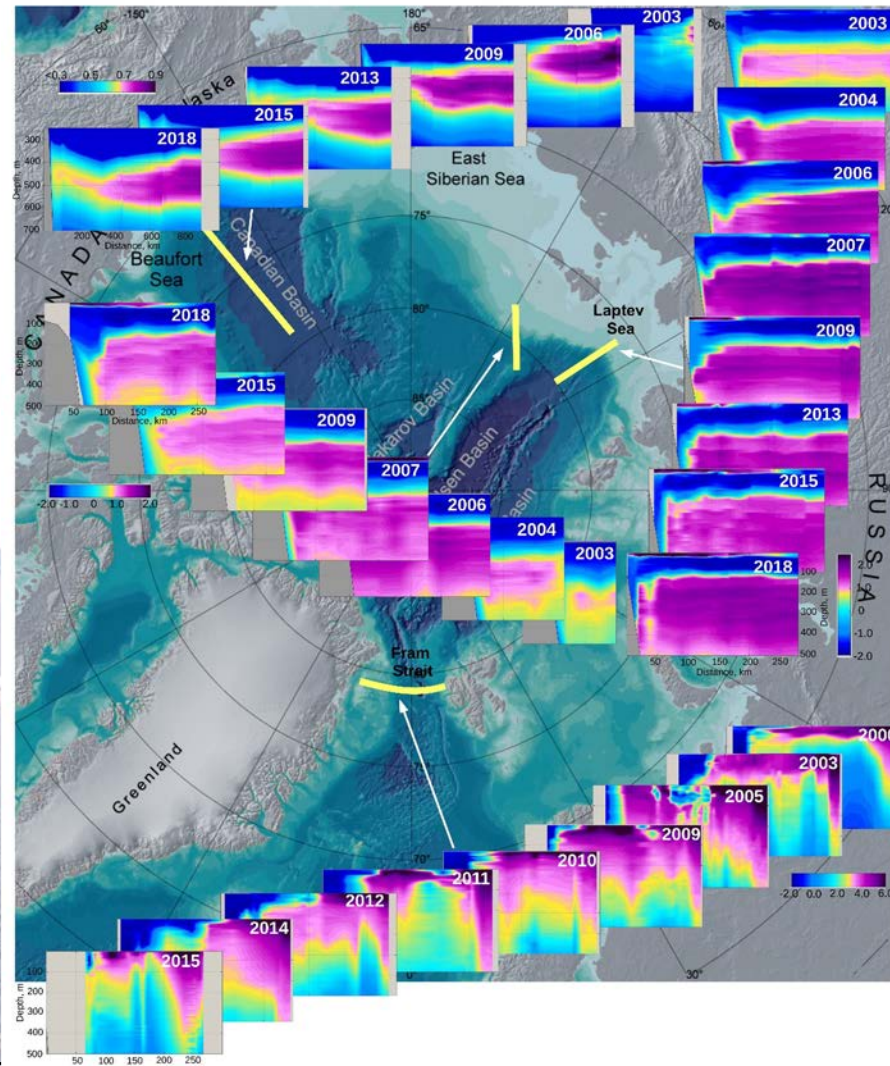
June 24, 2022



Fairbanks, Alaska

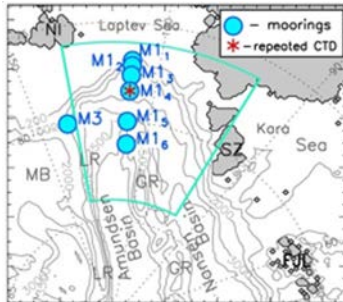


Atlantification:  
Atlantic water was  
 $\sim 1^{\circ}\text{C}$  warmer in the  
1990s compared  
with the 1970 and  
 $0.24^{\circ}\text{C}$  warmer in  
2007 compared with  
the 1990s

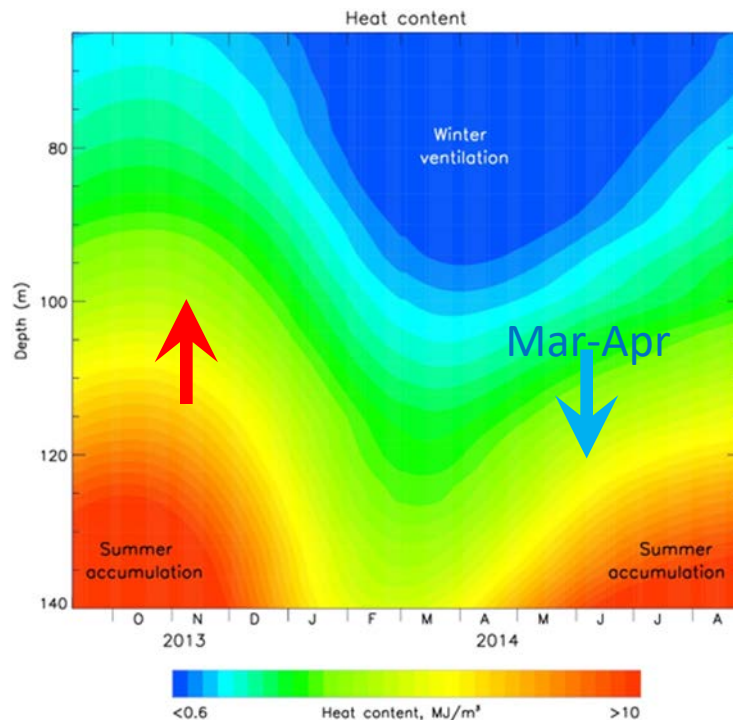


## *New Arctic Ocean:*

Sea ice loss due to stronger oceanic heat flux caused by weaker stratification and deep ocean winter ventilation



Blue arrow shows penetrative winter ventilation to the depths exceeding 140m. *Polyakov et al. (2020).*

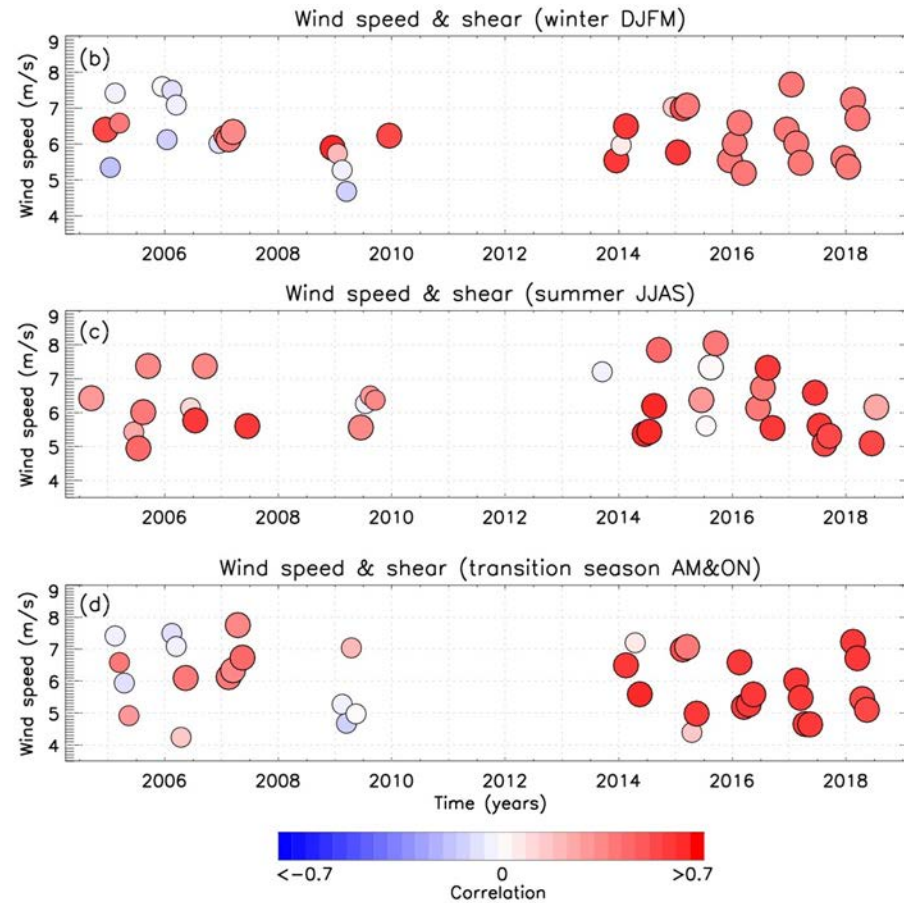


← 2000s

← 2010s

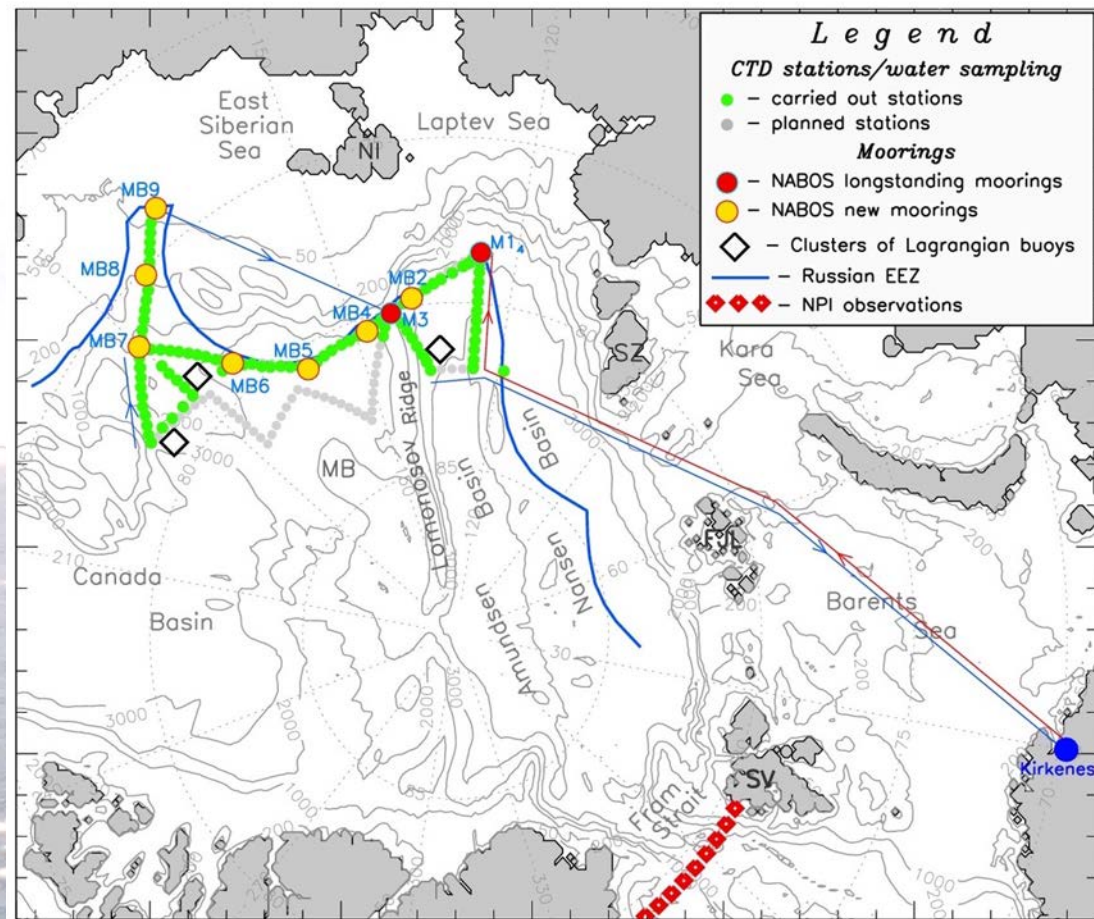


# Increasing in time correlation between wind and upper ocean currents/shear suggests stronger air-ice-ocean coupling





# 2021 NABOS cruise



## Conclusions

- Recent loss of cold halocline layer in the eastern Eurasian Basin makes this region similar to the western Eurasian Basin -> “atlantification” - a fundamental step toward a new Arctic climate state.
- Consequences include change of intensity of the upper ocean circulation and shear.
- The role of remote and local freshwater anomalies in establishing the observed changes in the eastern Arctic Ocean is not well constrained.