



Sandia  
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# Probabilistic Predictions of Offshore Gas Hydrate and Submarine Permafrost Distribution Along the Alaskan North Slope



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# PURPOSE, GOALS AND APPROACH



## PURPOSE

Geospatial  
Machine Learning  
Prediction



Sediment  
Thermodynamic  
Physical Modeling



**Creation of *Probabilistic Maps* of Free  
Gas, Gas Hydrate, and Submarine  
Permafrost Distribution, and resulting  
Geo-acoustic/Geo-mechanical Properties**

## APPLICATIONS

Allows more accurate  
natural resource  
quantification for energy  
security.

Can inform climate models  
on **greenhouse gas releases**  
and carbon cycling.

Maps can support **Naval**  
operations that rely on  
SONAR performance and  
sound propagation models.

## APPROACH

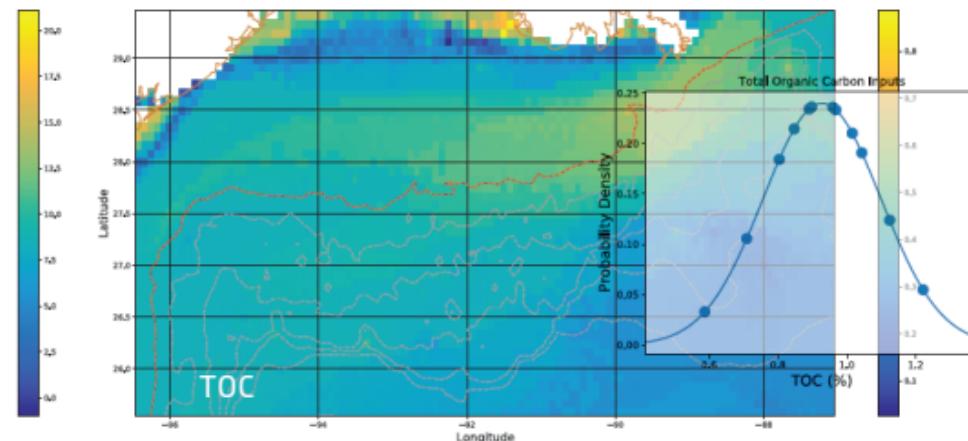
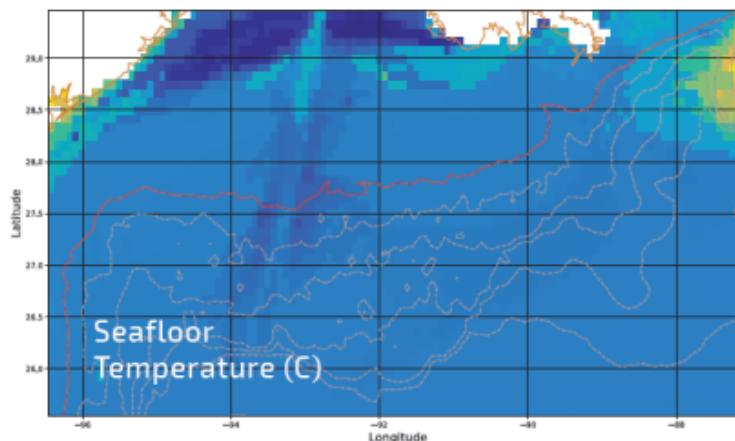
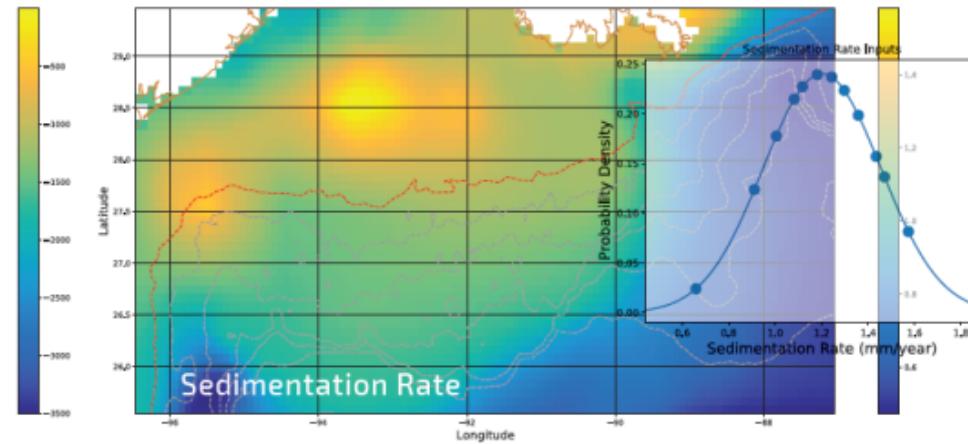
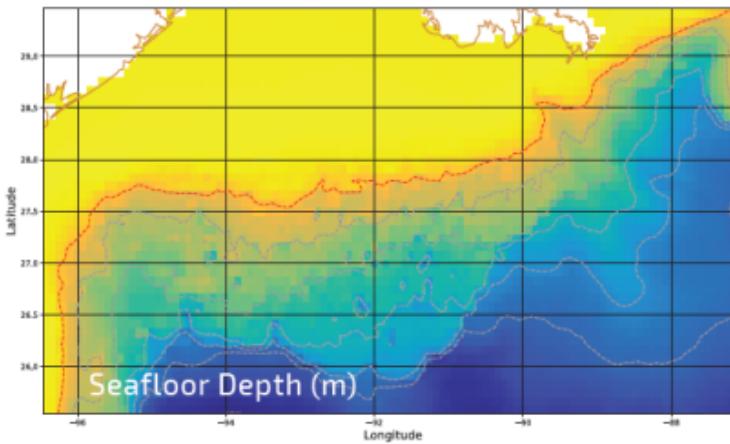
Ensemble modeling can produce  
probabilistic maps give the **most likely**  
**value** of any characteristic of interest,  
but also its **variation and range**.

**Analogous to a weather forecast:** although  
it is uncertain, it is more useful than a  
single deterministic forecast.

# Ensemble Modeling Approach, An Example



Naval Research Lab's geospatial machine learning maps of input parameters at the Gulf of Mexico:



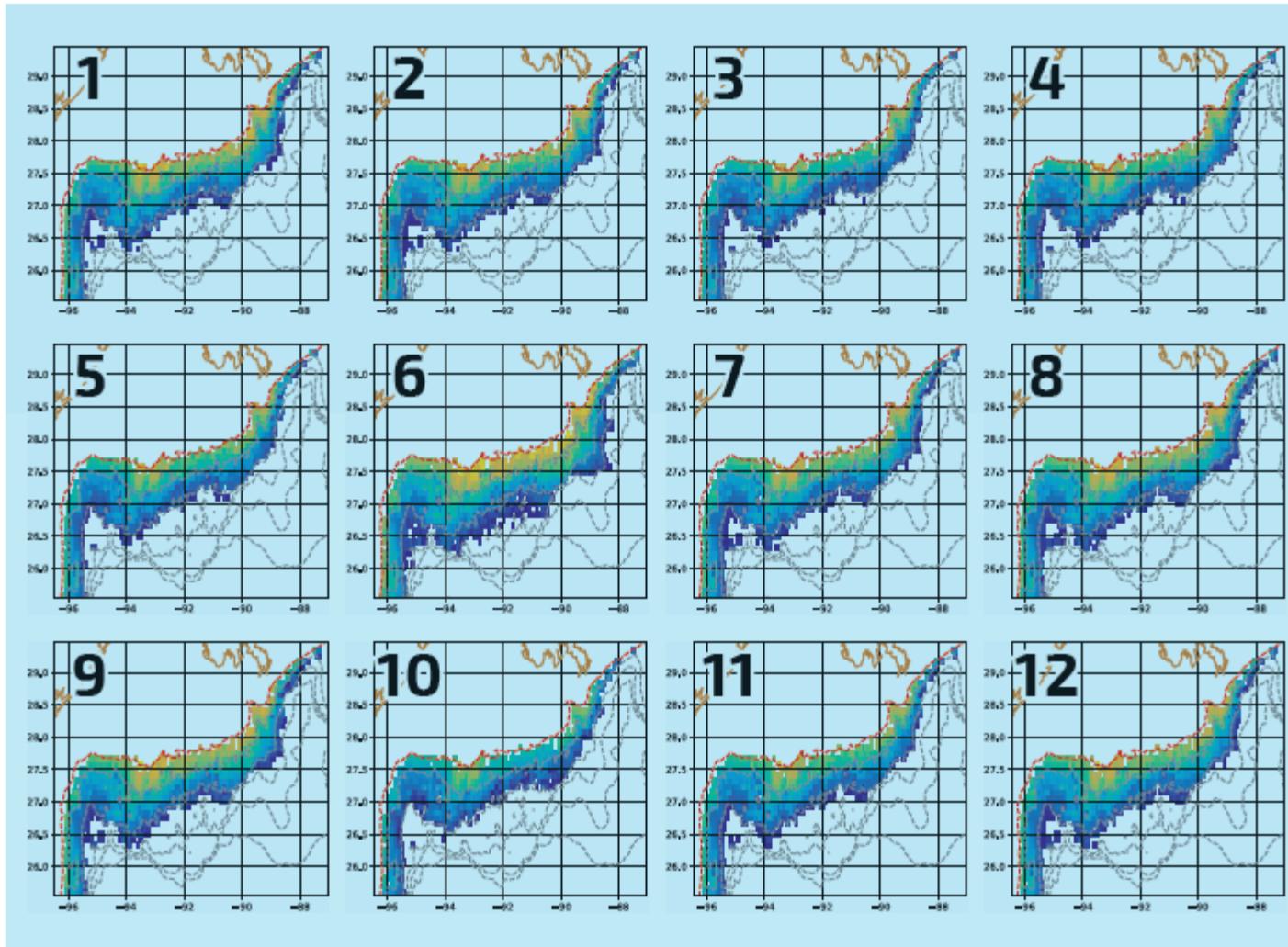
We use DAKOTA to sample on the pdf of each uncertain parameter (here, sedimentation rate and total organic carbon).

# Ensemble Modeling Approach, An Example



## Samples

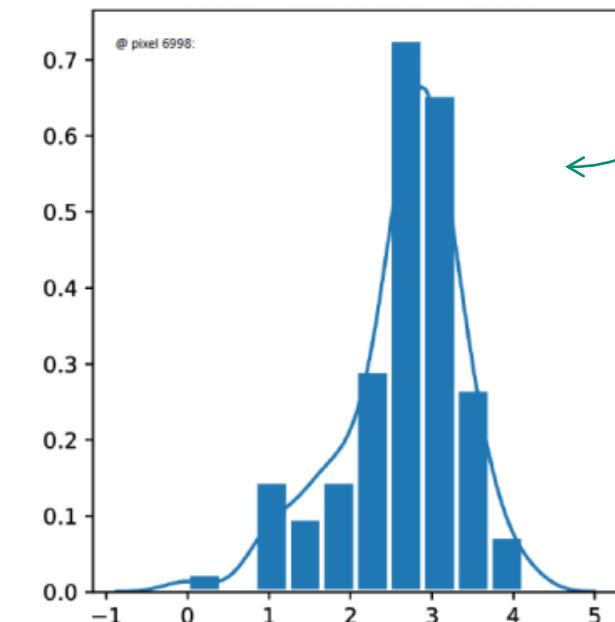
**PFLOTRAN** 



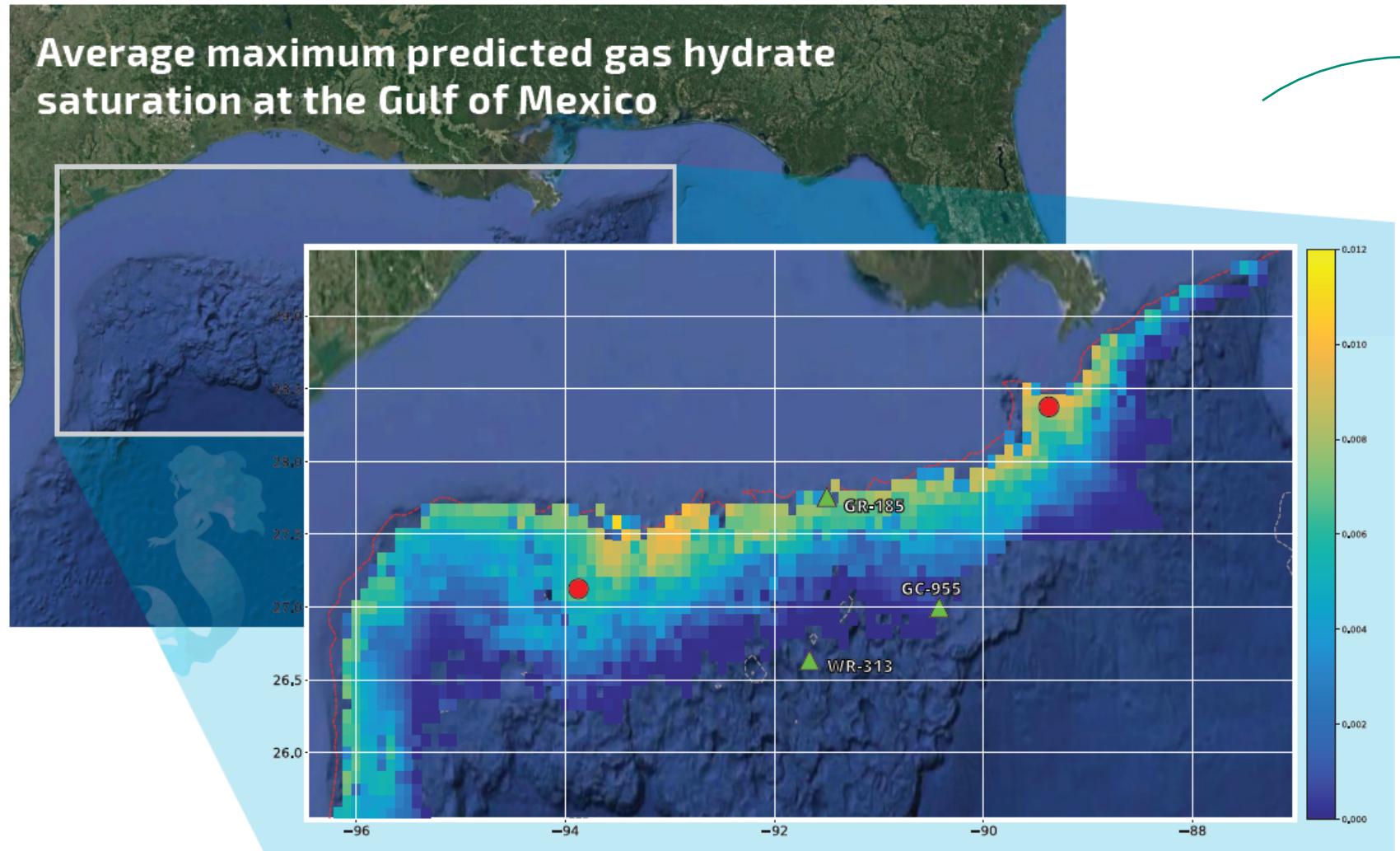
The sampled input parameters define an ensemble of PFLOTRAN (Hydrate Mode) simulations for free gas and gas hydrate distribution (here we show maximum gas hydrate saturation).

Results are compiled into a histogram, and a pdf function is fit:

Maximum Hydrate Saturation (%)  
Mean = 2.645 Var = 0.530

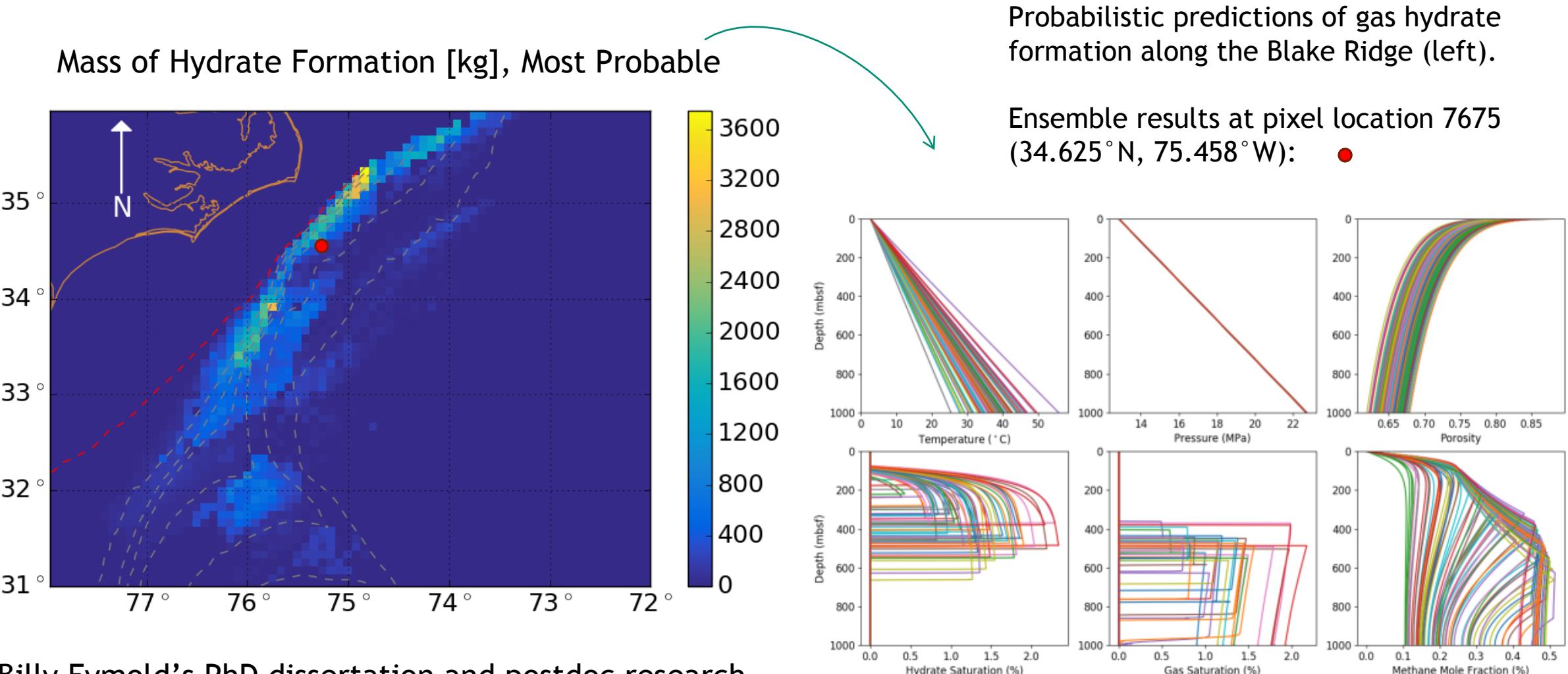


# Ensemble Modeling Approach, An Example



A probabilistic map can be created showing the most likely value of your parameter of interest, including uncertainty.

# Ensemble Modeling Approach, Another Example

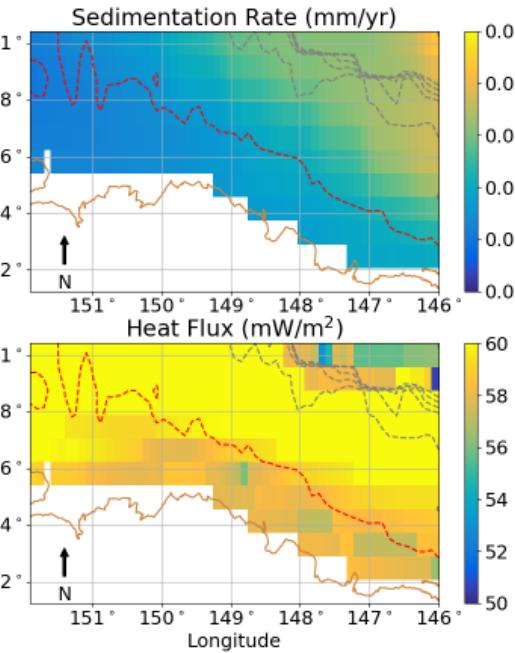
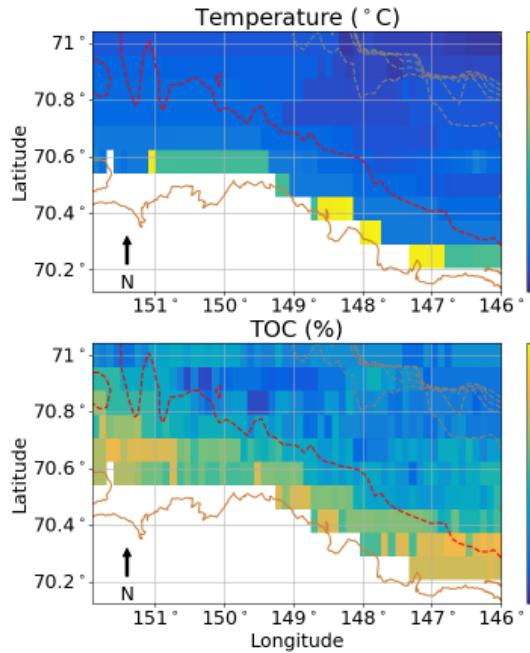


# Applying Ensemble Modeling to Predict Arctic Gas Hydrate and Submarine Permafrost Distribution



*Can we use our ensemble modeling frame work to predict submarine permafrost distribution?*

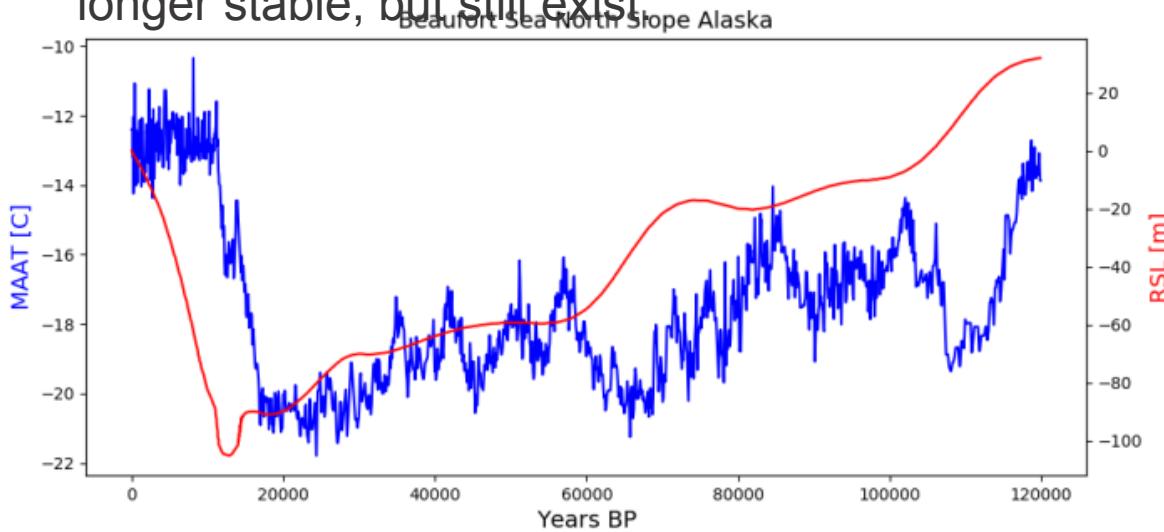
Naval Research Lab's geospatial machine learning maps of input parameters at the North Slope:



# Relict Submarine Permafrost and Gas Hydrate Formation



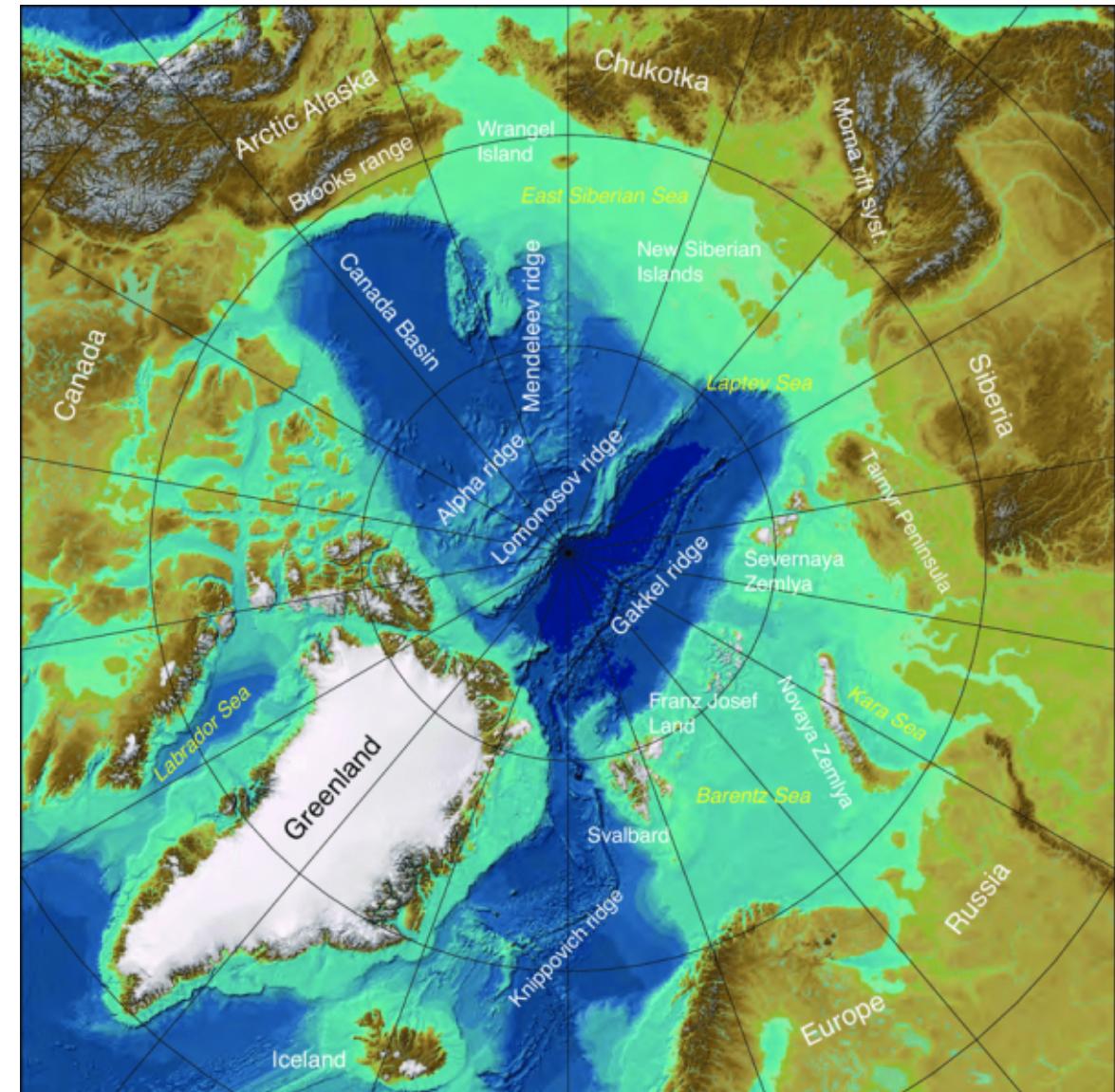
- During glacial periods, sea level was  $\sim 120$  m lower than present day, exposing the shallow continental shelves.
- Permafrost and associated gas hydrate formed within the exposed sediments.
- During interglacial periods, ocean transgression submerges the continental shelves, and the submarine permafrost and gas hydrates are no longer stable, but still exist.



Data comes from:

- Petit, J. R., et al. (1999), Climate and atmospheric history of the past 420,000 years from the Vostok Ice Core, Antarctica, *Nature*, 399, 429-436.
- Zhang, T., T. E. Osterkamp, and K. Sturmnes (1996), Some characteristics of the climate in Northern Alaska, U.S.A., *Arctic Alpine Res.*, 28(4), 509-518.
- Peltier, W. R. (2004), Global glacial isostasy and the surface of the ice-age Earth: The ICE-5G (VM2) Model and GRACE, *Annu. Rev. Earth Planet. Sci.*, 32, 111-149.
- Kendall, R. A., J. X. Mitrovica, and G. A. Milne (2005), On post-glacial sea level—II. Numerical formulation and comparative results on spherically symmetric models, *Geophys. J. Int.*, 161, 679-706.

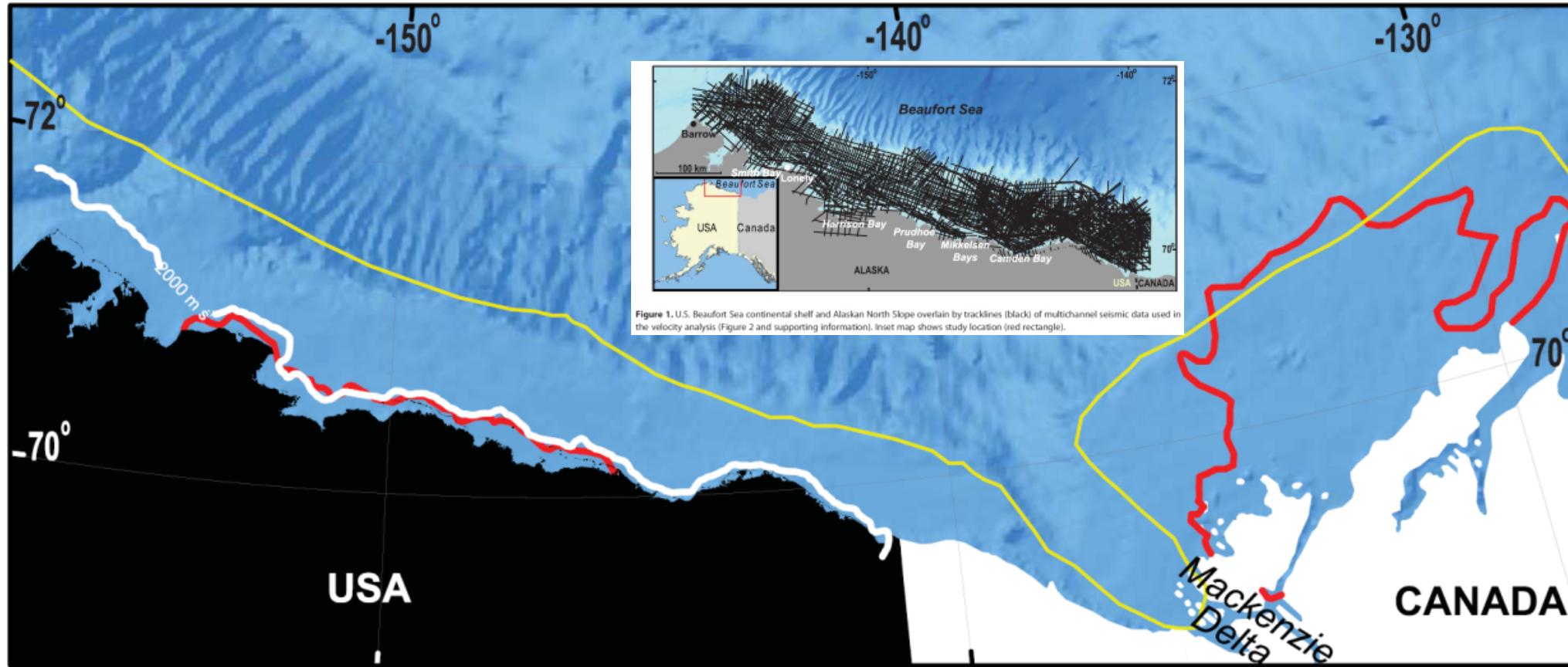
International Bathymetric Chart of the Arctic Ocean (IBCAO) of Jakobsson et al. (2008)



# Previous Studies On Submarine Permafrost Distribution



Brothers, L. L., B. M. Herman, P. E. Hart, and C. D. Ruppel (2016), Subsea ice-bearing permafrost on the U.S. Beaufort Margin: 1. Minimum seaward extent defined from multichannel seismic reflection data, *Geochem. Geophys. Geosyst.*, 17, doi:10.1002/2016GC006584.

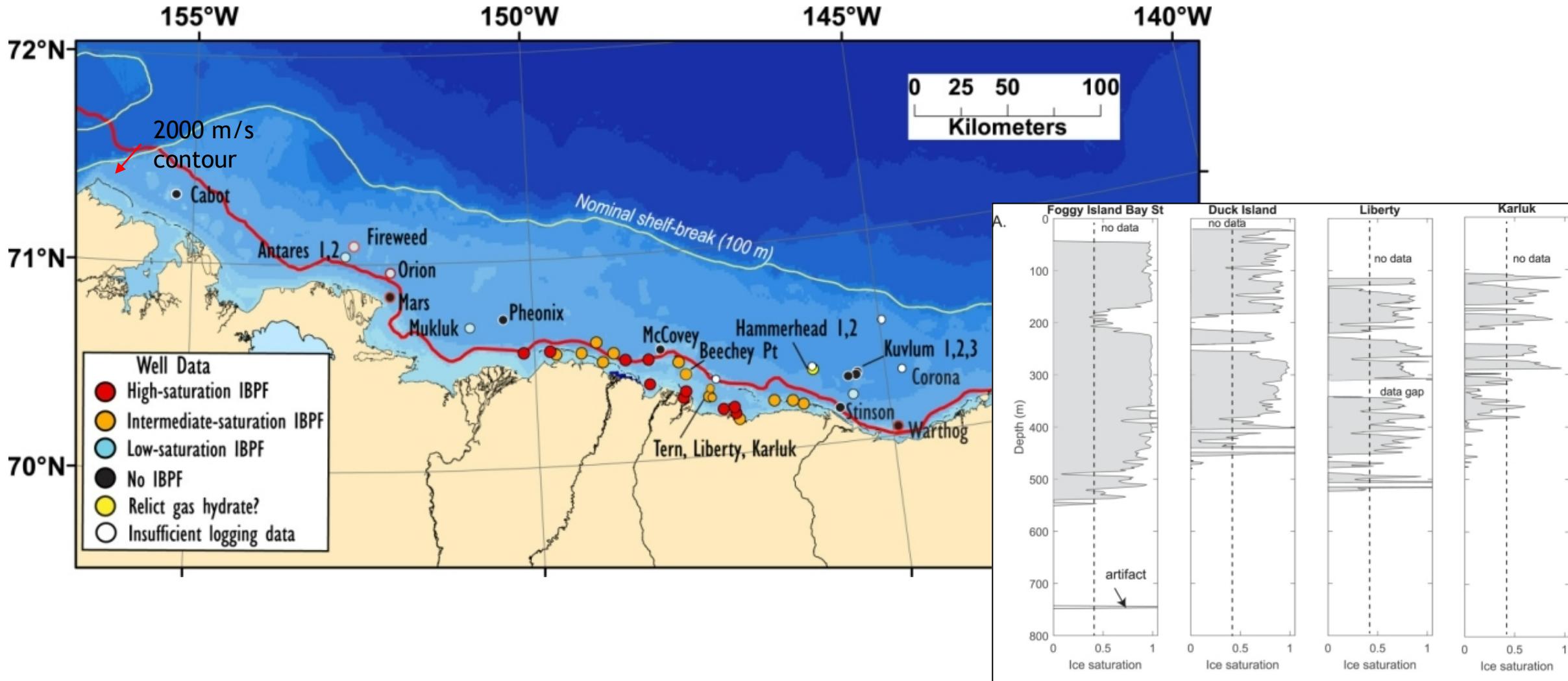


**Figure 6.** Map of subsea IBPF indicators on the U.S. & Canadian Beaufort. The yellow line is the proposed near-shelf edge boundary [Brown *et al.*, 1997]. Red lines indicate the seaward extent of subsea permafrost determined by seismic refraction analysis [Brothers *et al.*, 2012; Hunter *et al.*, 1978; Pullan *et al.*, 1987]. White line is the  $2000 \text{ m s}^{-1}$  contour.

# Previous Studies On Submarine Permafrost Distribution



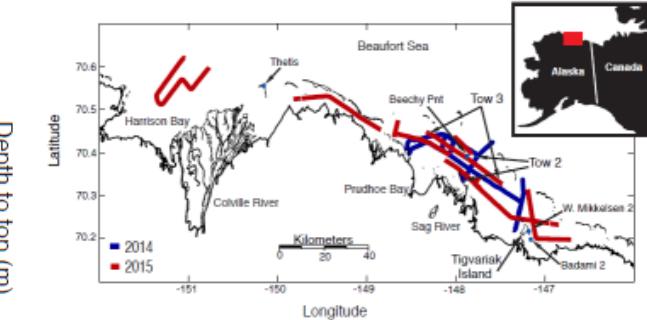
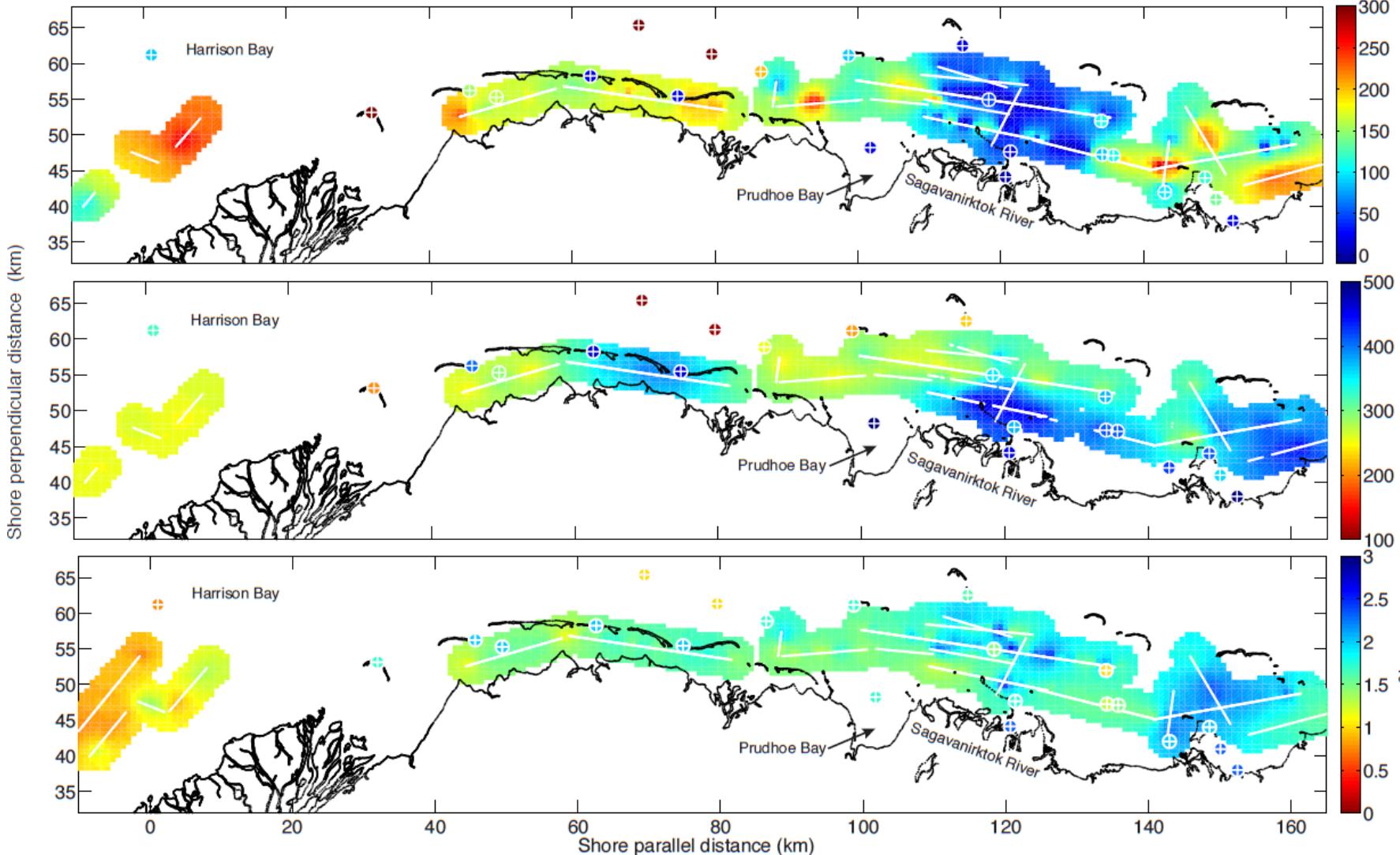
Ruppel, C. D., B. M. Herman, L. L. Brothers, and P. E. Hart (2016), Subsea ice-bearing permafrost on the U.S. Beaufort Margin: 2. Borehole constraints, *Geochem. Geophys. Geosyst.*, 17, 4333-4353, doi:10.1002/2016GC006582.



# Previous Studies On Submarine Permafrost Distribution



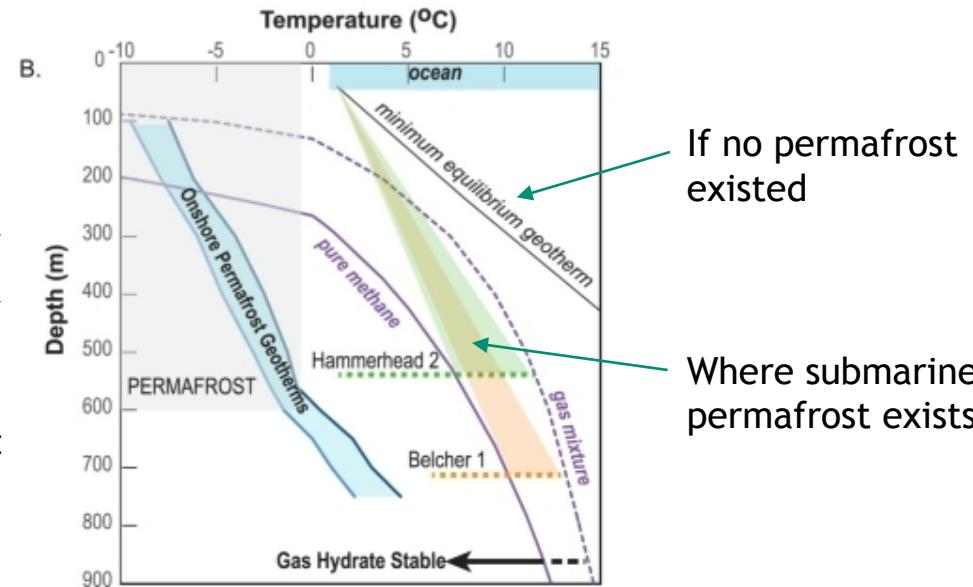
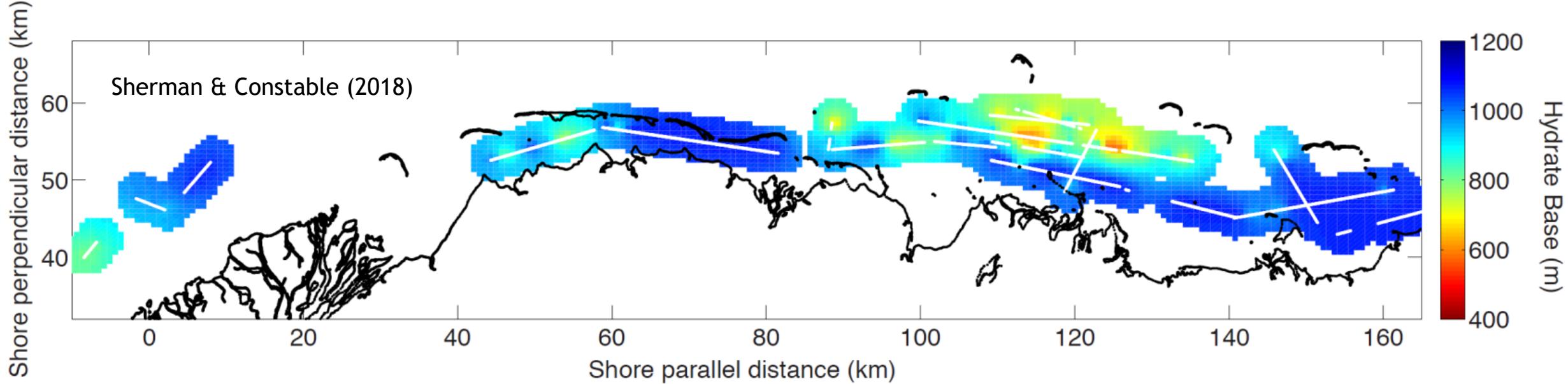
Sherman, D., & Constable, S. (2018). Permafrost extent on the Alaskan Beaufort shelf from surface-towed controlled-source electromagnetic surveys. *Journal of Geophysical Research: Solid Earth*, 123, 7253-7265.  
<https://doi.org/10.1029/2018JB015859>



Submarine permafrost thickness

This survey was limited by presence of sea ice, and does not indicate submarine permafrost extent.

# Submarine Permafrost Implies Gas Hydrate Stability



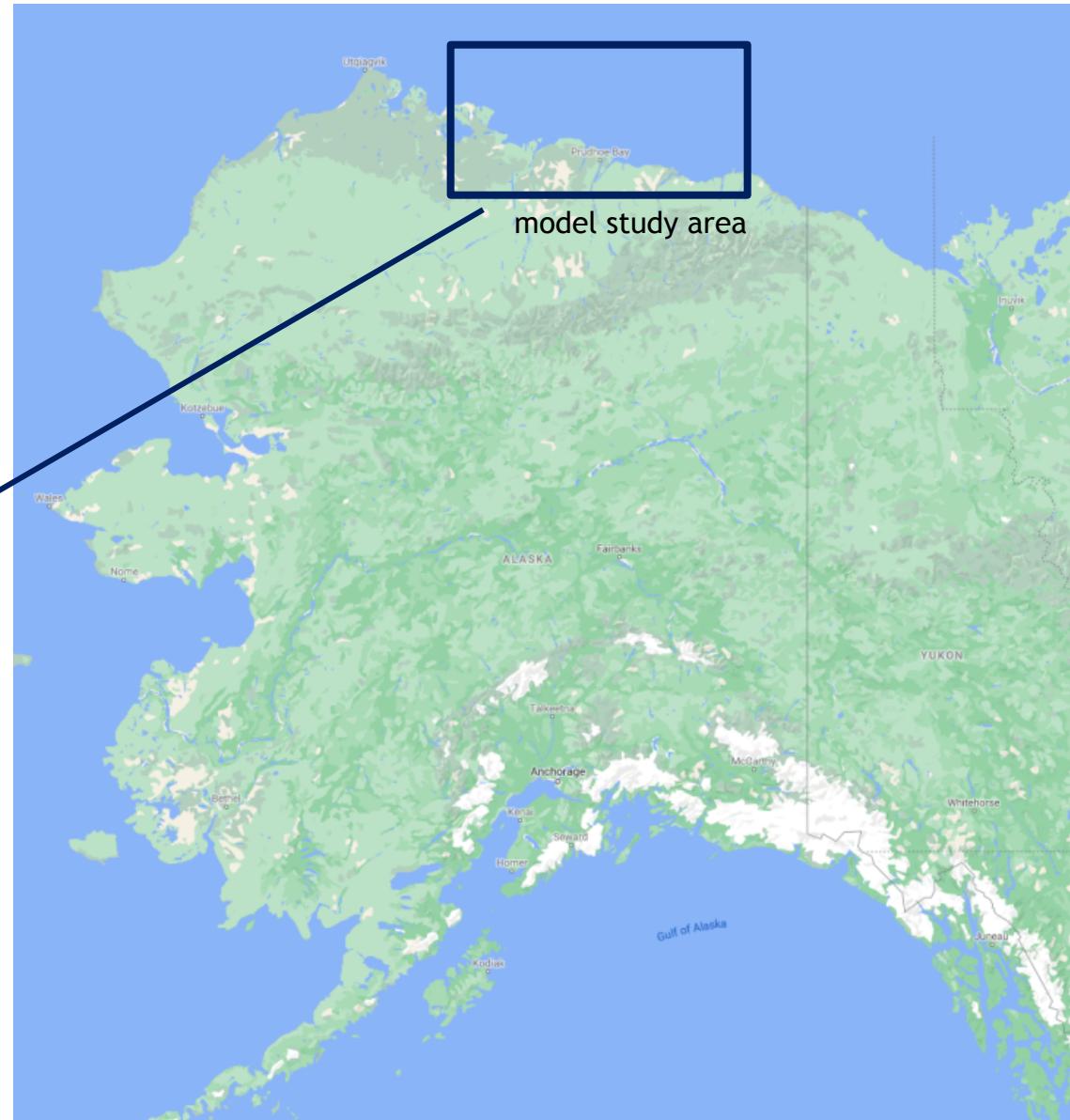
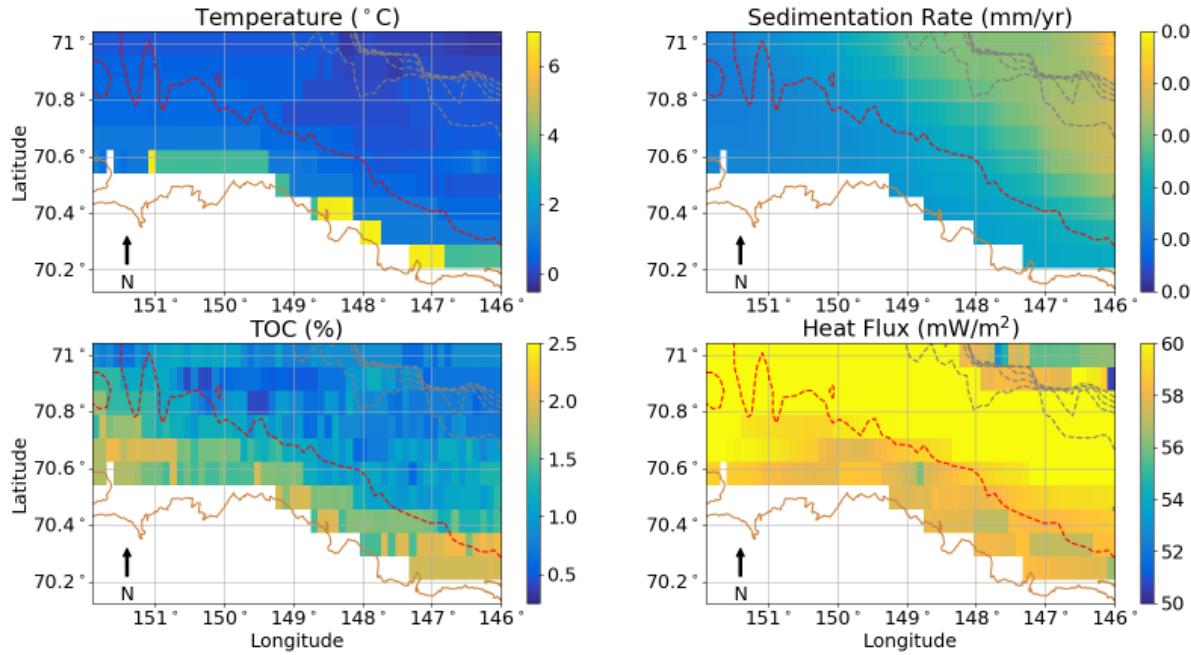
- Permafrost and associated gas hydrate likely formed simultaneously within the exposed sediments during glacial epochs.
- At present day, the thermal input required to thaw submarine permafrost has kept sediment temperatures low enough to maintain gas hydrate stability where submarine permafrost still exists.

# Applying Ensemble Modeling to Predict Arctic Gas Hydrate and Submarine Permafrost Distribution



*Can we use our ensemble modeling frame work to predict submarine permafrost distribution?*

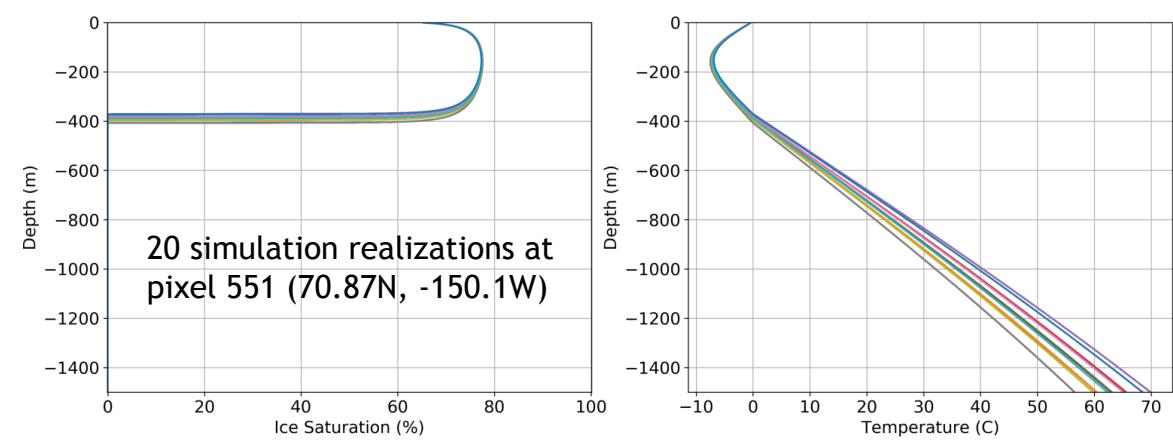
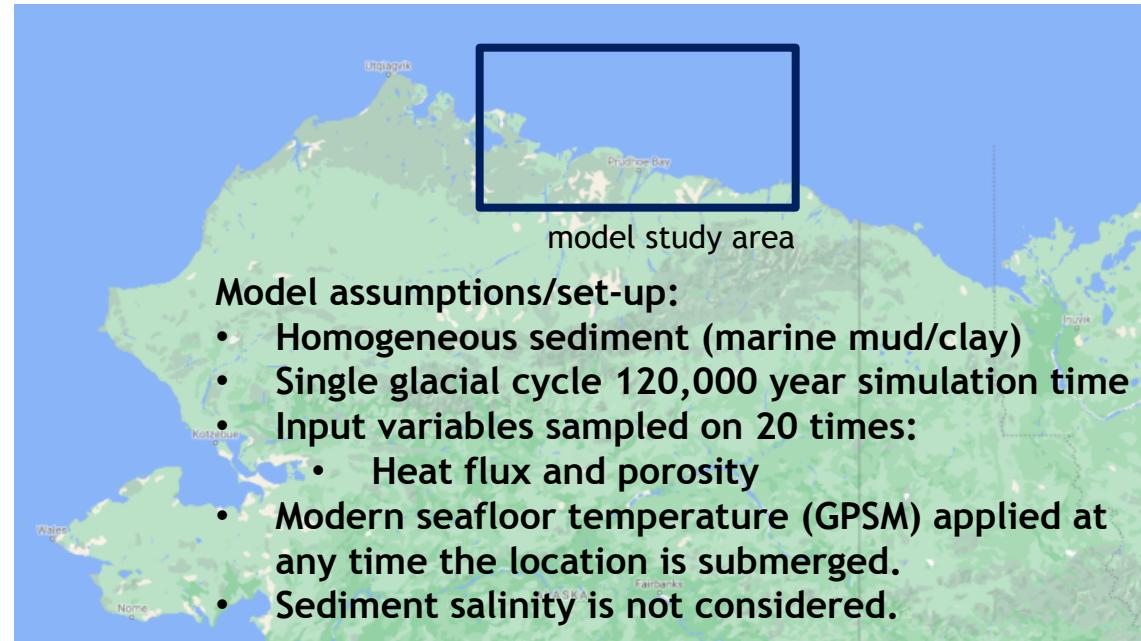
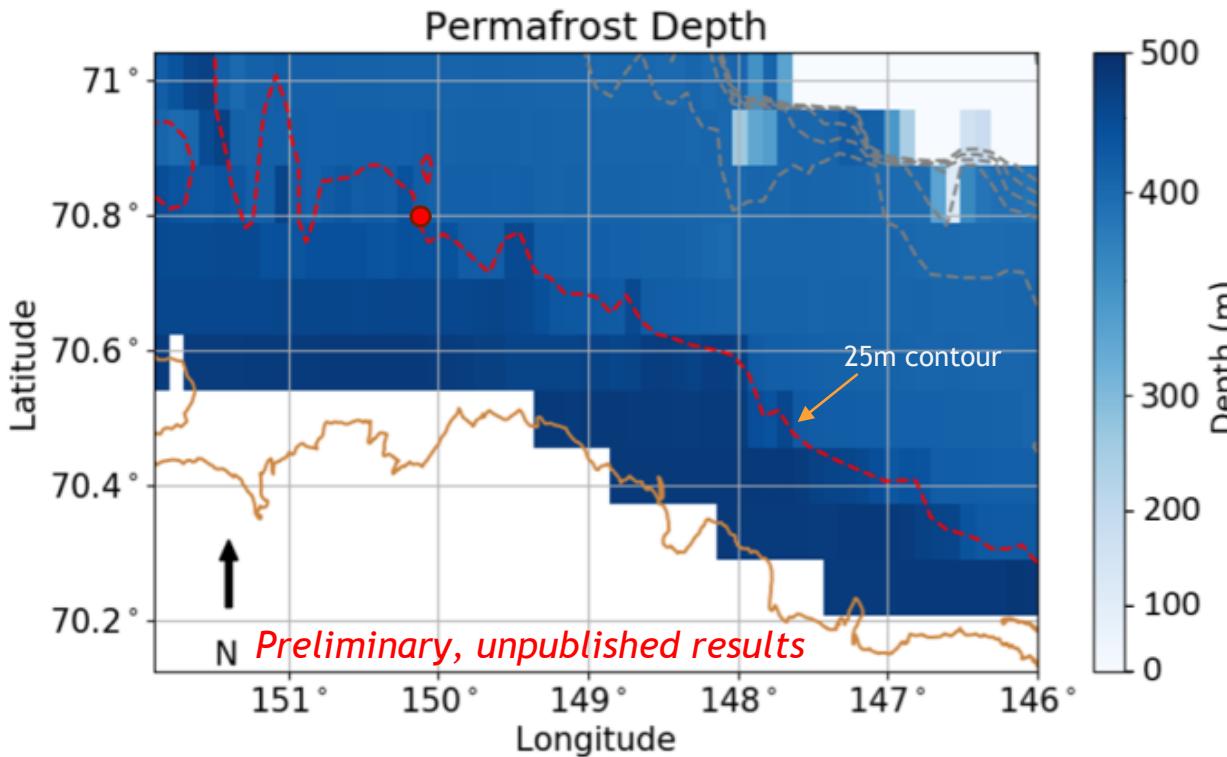
## Naval Research Lab's geospatial machine learning maps of input parameters at the North Slope:



# Applying Ensemble Modeling to Predict Arctic Gas Hydrate and Submarine Permafrost Distribution



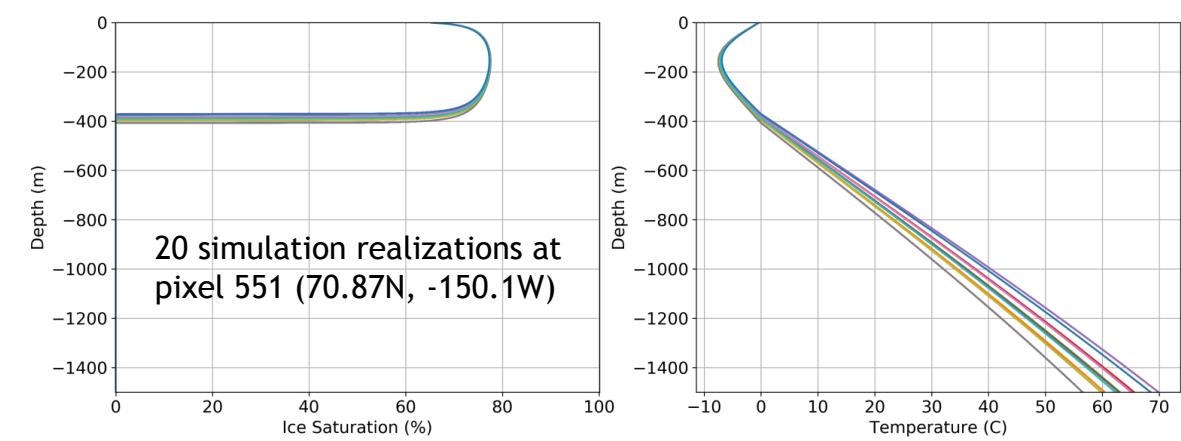
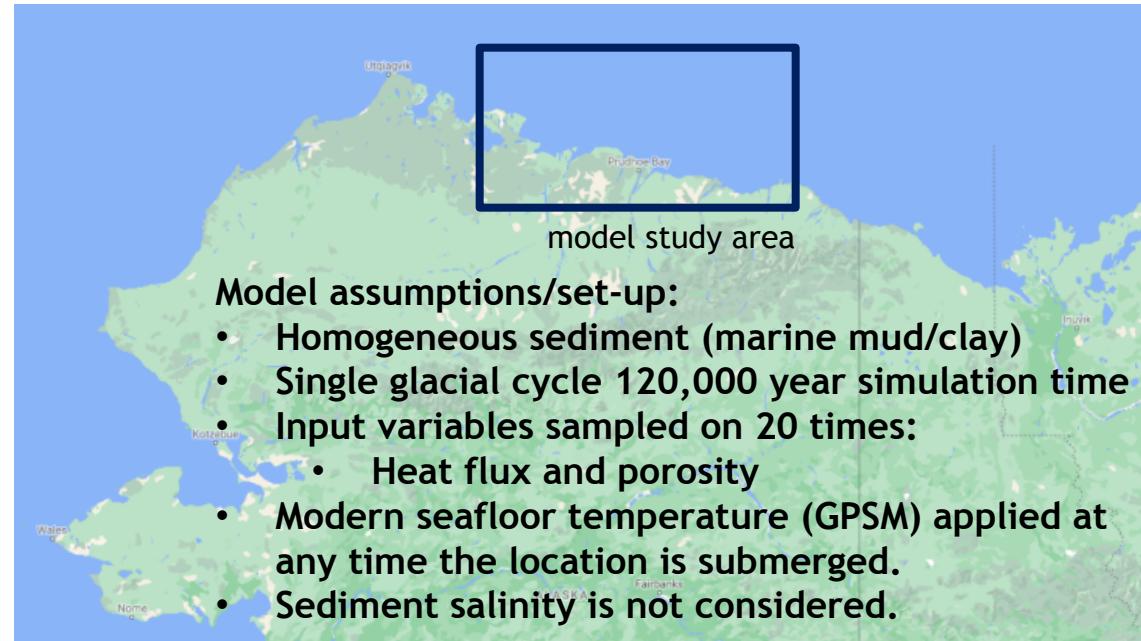
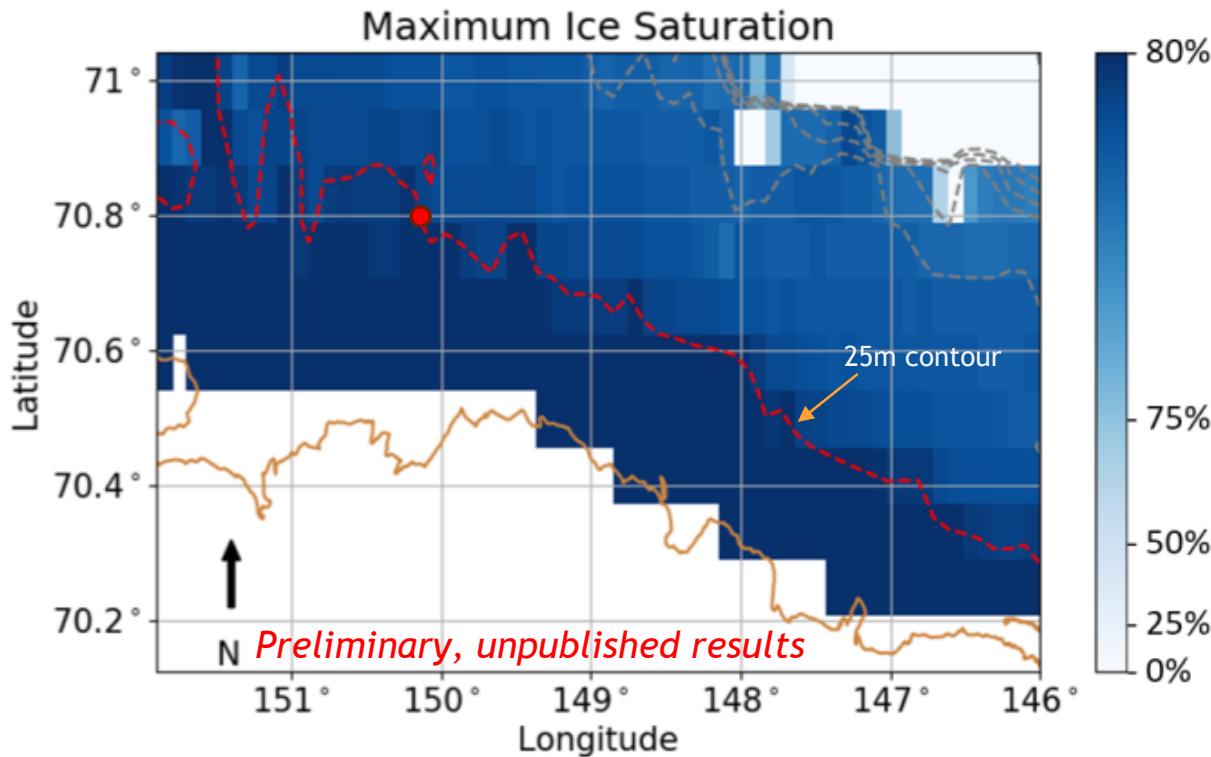
- Extensive submarine permafrost is predicted with a thickness 300 – 500 m.
  - Model results predict permafrost out to shelf edge, which is inconsistent with previous observations, which limit permafrost to ~ 30km offshore.
  - Implies sea level curve or sediment characteristics need improvement.



# Applying Ensemble Modeling to Predict Arctic Gas Hydrate and Submarine Permafrost Distribution



- Submarine permafrost has high ice saturation.
  - Model results are consistent with borehole observations near-shore, but over predict ice content towards shelf edge.
  - Implies sea level curve or sediment characteristics need improvement.



# Applying Ensemble Modeling to Predict Arctic Gas Hydrate and Submarine Permafrost Distribution



- Future Work:

- Incorporate effects of salinity in submarine permafrost ice model.
- Include spatial variation in sediment properties.
- Add gas hydrate model to PFLOTRAN ensemble simulations.
  - Produce probabilistic maps of free gas and gas hydrate distribution on North Slope.

Thank you for your interest. Please don't hesitate to contact me with questions via e-mail: [jmfrede@sandia.gov](mailto:jmfrede@sandia.gov)

Jenn

