

**Math 5490**  
**Topics in Applied Mathematics**  
**Introduction to the Mathematics of Climate**

**Fall 2023**  
**1:25 - 3:20 Tuesdays and Thursdays**  
**Amundson Hall 162**

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course website  
[www-users.cse.umn.edu/~mcgehee/teaching/Math5490/](http://www-users.cse.umn.edu/~mcgehee/teaching/Math5490/)

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**Math 5490**  
**Permafrost Melt**

**What is permafrost?**



<https://www.nps.gov/gaar/learn/nature/permafrost.htm>

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**What is permafrost?**



<https://climatetvulture.com/2016/08/28/satellite-remote-sensing-of-permafrost/>

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**What is permafrost?**



[http://alaska.usgs.gov/science/interdisciplinary\\_science/cas/arctic\\_coastal\\_plain.php](http://alaska.usgs.gov/science/interdisciplinary_science/cas/arctic_coastal_plain.php)

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**What is permafrost?**



*Washington Post*, Oct 4, 2019: "In fast-thawing Siberia, radical warming is warping the earth"

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**Where is the permafrost?**

Average latitude of permafrost boundary:  
61°  
(yellow circle)

(Aileen Zebrowski)




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### Potential Carbon Emissions

The National Snow and Ice Data Center estimates that there are **1400** Gigatonnes of carbon (GtC) stored in the permafrost.

By comparison, the atmosphere currently holds about **890** GtC.

<https://nsidc.org/cryosphere/frozenground/methane.html>

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### Conversions

tonne = metric ton = 1000 kilograms  
 $Gt = \text{gigatonne} = 10^9 \text{ tonnes} = 10^{12} \text{ kilograms}$   
 $Pg = \text{petagram} = 10^{15} \text{ grams} = 10^{12} \text{ kilograms} = Gt$

atomic weight carbon: 12  
 atomic weight oxygen: 16  
 molecular weight carbon dioxide: 44

carbon dioxide =  $\text{CO}_2$

$$\begin{array}{ccc} & \swarrow & \searrow \\ & 12 + 2 \times 16 = 44 & \end{array}$$

44 gigatonnes of carbon dioxide contains 12 gigatonnes of carbon  
 $44 \text{ GtCO}_2 \leftrightarrow 12 \text{ GtC}$

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### Atmospheric Carbon

**ppm** = parts per million (by molecule)

Atmospheric carbon dioxide at **420 ppm** means that every million molecules of air contains 420 molecules of  $\text{CO}_2$ .

**Conversion to GtC**

$1 \text{ ppm CO}_2 = 2.13 \text{ GtC} \quad \text{(carbon, not carbon dioxide)}$

**Example**

$420 \text{ ppm CO}_2 = 895 \text{ GtC}$

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### Atmospheric Methane

$\text{methane} = \text{CH}_4$

atomic weight carbon: 12  
 atomic weight hydrogen: 1  
 molecular weight methane: 16

$\text{CH}_4$

$$\begin{array}{ccc} & \swarrow & \searrow \\ & 12 + 2 \times 1 = 16 & \end{array}$$

16 gigatonnes of methane contains 12 gigatonnes of carbon  
 $16 \text{ GtCH}_4 \leftrightarrow 12 \text{ GtC}$

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### Atmospheric Methane

Methane is unstable in the atmosphere.  
 $\text{CH}_4 + 2\text{O}_2 \rightarrow \text{CO}_2 + 2\text{H}_2\text{O}$

It takes about a decade for new methane entering the atmosphere to be converted to carbon dioxide and water. The water falls as rain, about half of the carbon dioxide goes into the ocean, and the other half stays in the atmosphere for millennia.

If we think in terms of decades, it doesn't matter much whether the carbon from the melting permafrost enters the atmosphere as methane or carbon dioxide.

Methane entering the atmosphere has a bigger greenhouse effect for a few years, then it turns into carbon dioxide.

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### Discussion

Assume that methane has a half-life of 10 years. Assume that 12 GtC enters the atmosphere as methane ( $16 \text{ GtCH}_4$ ). After a decade, the half of the methane remains, but half has oxidized into carbon dioxide and water.

**How much carbon dioxide, measured in GtC?**

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**How much carbon dioxide, measured in GtC?**  
6 GtC

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**How much carbon dioxide, measured in GtC?**  
6 GtC

**How much carbon dioxide, measured in  $\text{GtCO}_2$ ?**

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**How much carbon dioxide, measured in  $\text{GtCO}_2$ ?**  
22 Gt $\text{CO}_2$

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**How much carbon dioxide, measured in ppm?**

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**Discussion**

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**How much carbon dioxide, measured in GtC?**  
6 GtC

**How much carbon dioxide, measured in  $\text{GtCO}_2$ ?**  
22 Gt $\text{CO}_2$

**How much carbon dioxide, measured in ppm?**  
6/2.13 = 2.8 ppm

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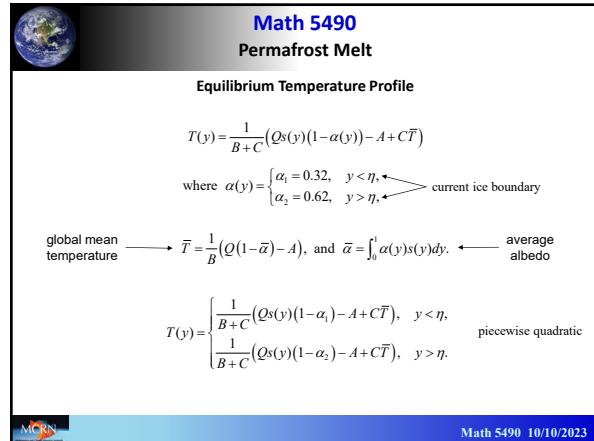
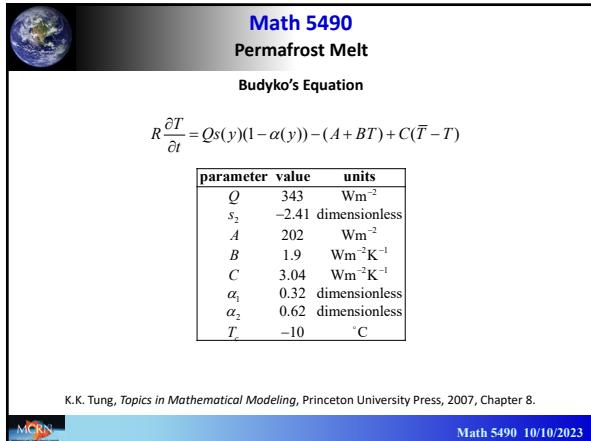
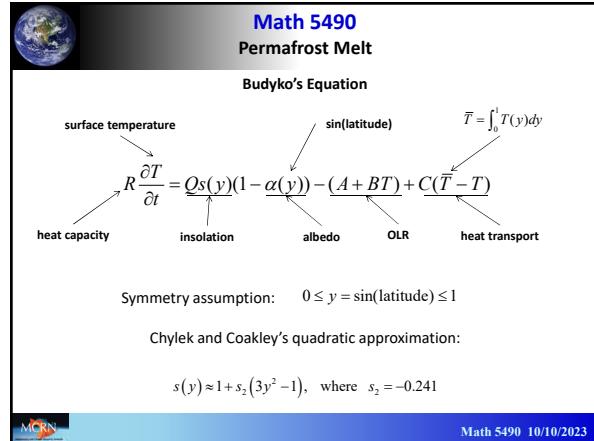
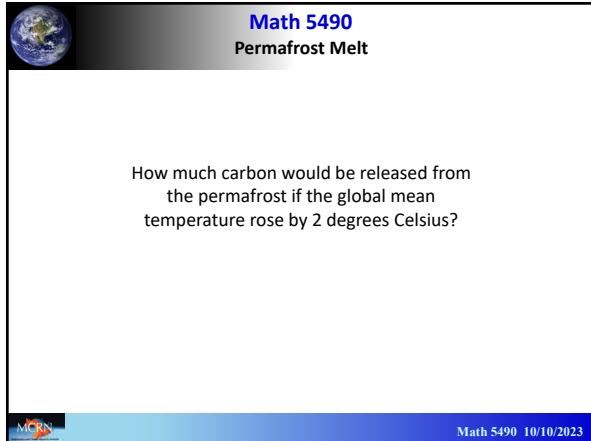
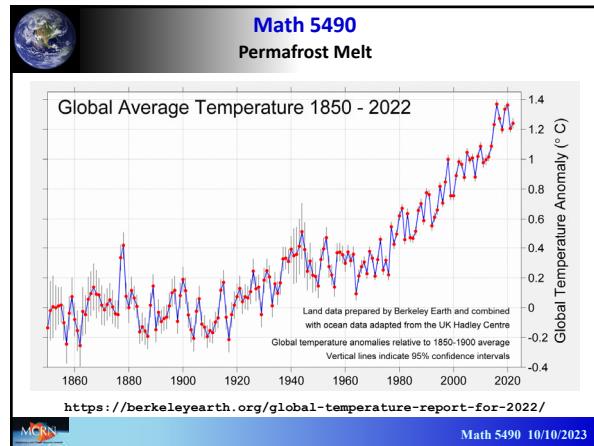
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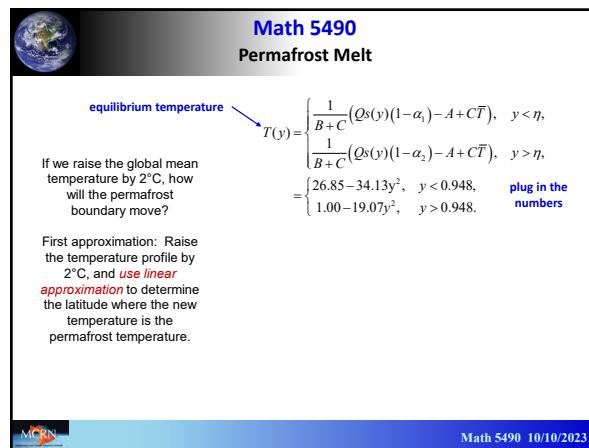
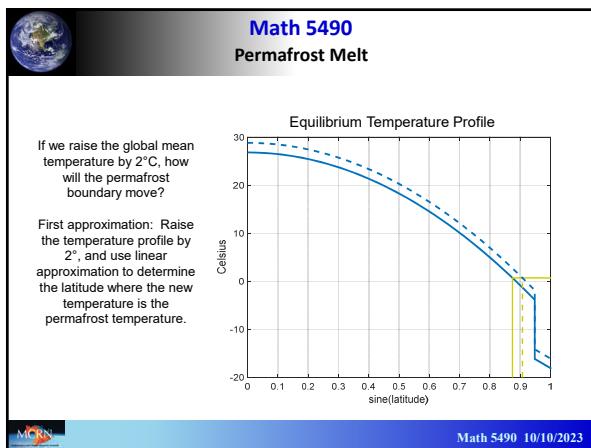
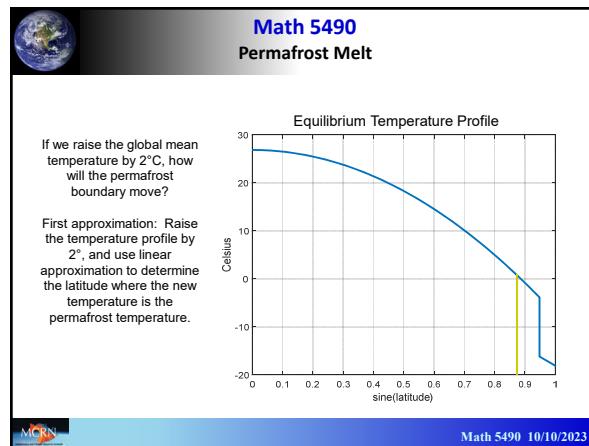
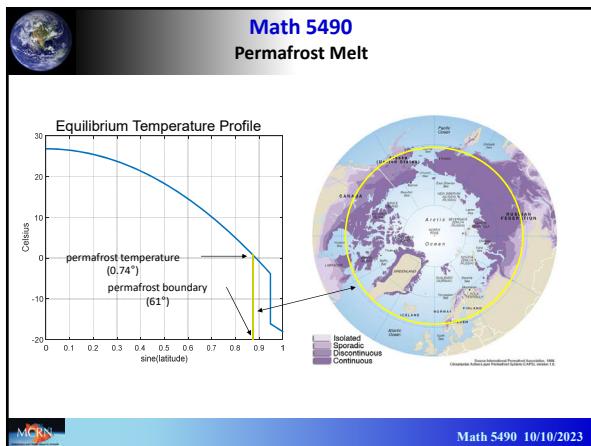
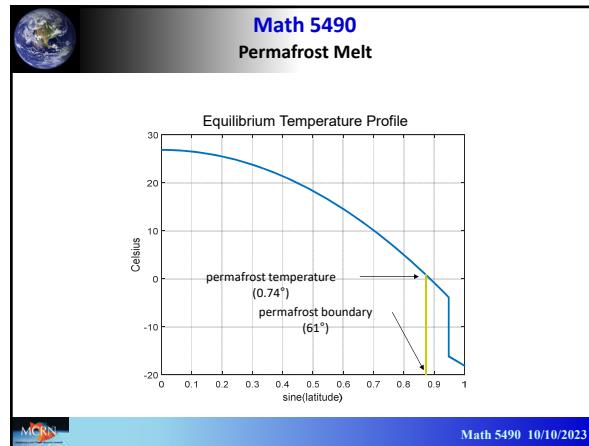
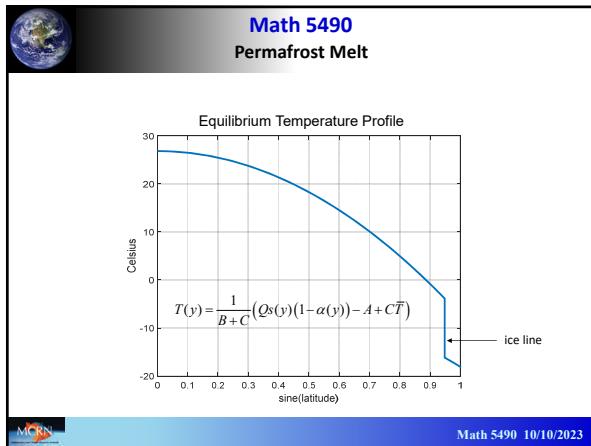
**Paris climate conference (COP21)**



<http://www.npr.org/sections/thetwo-way/2015/12/12/459502597/2-degrees-100-billion-the-world-climate-agreement-by-the-numbers>

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Permafrost Melt

If we raise the global mean temperature by 2°C, how will the permafrost boundary move?

First approximation: Raise the temperature profile by 2°C, and **use linear approximation** to determine the latitude where the new temperature is the permafrost temperature.

**derivative**

$$T(y) = \begin{cases} \frac{1}{B+C}(Qs(y)(1-\alpha_1) - A + C\bar{T}), & y < \eta, \\ \frac{1}{B+C}(Qs(y)(1-\alpha_2) - A + C\bar{T}), & y > \eta, \end{cases}$$

$$= \begin{cases} 26.85 - 34.13y^2, & y < 0.948, \\ 1.00 - 19.07y^2, & y > 0.948. \end{cases}$$

permafrost boundary:  $y_p = \sin(61^\circ) \approx 0.875$

$$T'(y_p) = -68.26y_p = -59.70$$

**derivative**

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**new temperature profile**

$$\hat{T}(y) = T(y) + 2$$

**increased by 2**

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permafrost boundary:  $y_p = \sin(61^\circ) \approx 0.875$

$$T'(y_p) = -68.26y_p = -59.70$$

$$\hat{T}(y) = T(y) + 2$$

$$T(y_p) = \hat{T}(y_p + \Delta y) \approx \hat{T}(y_p) + \hat{T}'(y_p)\Delta y = T(y_p) + 2 + T'(y_p)\Delta y$$

solve for increase in  $y$

$$\Delta y \approx \frac{-2}{-59.70} = \frac{-2}{-59.70} = 0.0335$$

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**Aileen Zebrowski**

new permafrost boundary:

$$\hat{y}_p \approx 0.875 + 0.0335 \approx 0.908$$

new permafrost boundary in degrees latitude:

$$\sin^{-1}(\hat{y}_p) \approx 65.2^\circ \text{ latitude}$$

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Permafrost Melt

If we raise the global mean temperature by 2°C, how will the permafrost boundary move?

First approximation: Raise the temperature profile by 2°C, and **use linear approximation** to determine the latitude where the new temperature is the permafrost temperature.

**Equilibrium Temperature Profile**

The graph shows a blue curve representing the equilibrium temperature profile. The x-axis is labeled "sine(latitude)" and ranges from 0 to 1. The y-axis is labeled "Celsius" and ranges from -20 to 30. A horizontal dashed line at approximately 26.85°C represents the original temperature profile. A second horizontal dashed line at approximately 28.85°C represents the new temperature profile after a 2°C increase. A vertical dashed line at approximately 0.875 on the sine(latitude) axis represents the permafrost boundary for the new temperature profile. The curve starts at (0, 26.85), decreases to (0.948, 0), and then increases sharply to meet the new temperature profile at the permafrost boundary.

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Permafrost Melt

If we raise the global mean temperature by 2°C, how will the permafrost boundary move?

First approximation: Raise the temperature profile by 2°C, and **use linear approximation** to determine the latitude where the new temperature is the permafrost temperature.

**Equilibrium Temperature Profile**

The graph shows the same equilibrium temperature profile as the previous slide, but with additional annotations. A vertical yellow arrow at x ≈ 0.88 indicates a 2°C increase in temperature. A horizontal yellow arrow at x ≈ 0.9 indicates a 4.2° increase in latitude. Dashed lines connect these annotations to the corresponding points on the graph, showing the shift in the permafrost boundary due to the temperature increase.

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If we raise the global mean temperature by 2°C, how will the permafrost boundary move?  
We have not taken into account that the ice line might move.

Equilibrium Temperature Profile

Celsius

sine(latitude)

same ice line

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Global Mean Temperature

$$\bar{T}(\eta) = \frac{1}{B} (Q(1 - \bar{\alpha}(\eta)) - A), \text{ where } \bar{\alpha}(\eta) = \int_0^\eta \alpha(y, \eta) s(y) dy,$$

where  $\alpha(y) = \begin{cases} \alpha_1 = 0.32, & y < \eta, \\ \alpha_2 = 0.62, & y > \eta, \end{cases}$

The ice line is determined by the assumption that the average temperature across the ice line is  $T_c$ , usually take to be  $-10^\circ\text{C}$ . This condition reduces to

$$\frac{1}{B+C} (Qs(\eta)(1 - \alpha_0) - A + C\bar{T}(\eta)) = T_c, \text{ where } \alpha_0 = \frac{1}{2}(\alpha_1 + \alpha_2)$$

outgoing long wave radiation varies with greenhouse gases.

$$h(\eta, A) = \frac{1}{B+C} (Qs(\eta)(1 - \alpha_0) - A + \frac{C}{B}(Q(1 - \bar{\alpha}(\eta)) - A)) - T_c = 0$$

$$h(\eta, A) \equiv \frac{Q}{B+C} (s(\eta)(1 - \alpha_0) + \frac{C}{B}(1 - \alpha_2 + (\alpha_2 - \alpha_1)S(\eta))) - \frac{A}{B} - T_c = 0$$

\*e.g., McGehee & Widiasih 2014, SIAM J. Applied Dynamical Systems 13, pp 518-536.

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How to Proceed?

- Determine how the ice line varies with the parameter  $A$ . (*increase in CO<sub>2</sub> reduces A*)
- Determine the change in  $A$  giving an increase of 2 degrees Celsius in the global mean temperature.
- Determine the change in the location of the permafrost boundary given the change in  $A$ .

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**Math 5490**  
Budyko's Model

**Step 1**

$$h(\eta, A) \equiv \frac{Q}{B+C} (s(\eta)(1 - \alpha_0) + \frac{C}{B}(1 - \alpha_2 + (\alpha_2 - \alpha_1)S(\eta))) - \frac{A}{B} - T_c = 0$$

decrease  $A$

old ice line

new ice line

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**Step 1**

Solve for  $\eta$  as a function of  $A$ :

$$h(\eta, A) = \frac{1}{B+C} (Qs(\eta)(1 - \alpha_0) - A + \frac{C}{B}(Q(1 - \bar{\alpha}(\eta)) - A)) - T_c = 0,$$

where

$$\bar{\alpha}(\eta) = \int_0^\eta \alpha_1 s(y) dy + \int_\eta^1 \alpha_2 s(y) dy$$

$$= \alpha_1 \int_0^\eta s(y) dy + \alpha_2 \left(1 - \int_0^\eta s(y) dy\right) = \alpha_2 - (\alpha_2 - \alpha_1) \int_0^\eta s(y) dy$$

Numerically,

$$h(\eta, A) = h_0(\eta) - 0.5236A, \text{ where } h_0(\eta) = -8.0309\eta^3 - 26.6024\eta^2 + 41.3542\eta + 97.8714$$

$$h'_0(\eta) \frac{d\eta}{dA} = -0.5236 = 0$$

Evaluate at  $\eta = 0.9483$ :  $\frac{d\eta}{dA} = \frac{0.5236}{-30.7672} = -0.0171$

$\boxed{\frac{d\eta}{dA} = -0.0171}$

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**Step 2**

Compute  $\frac{d\bar{T}}{dA}$ :

$$\bar{T}(\eta, A) = \frac{1}{B} (Q(1 - \bar{\alpha}(\eta)) - A), \text{ where } \bar{\alpha}(\eta) = \alpha_2 - (\alpha_2 - \alpha_1) \int_0^\eta s(y) dy$$

$$\frac{d\bar{T}}{dA} = \frac{\partial \bar{T}}{\partial \eta} \frac{d\eta}{dA} = \frac{\partial \bar{T}}{\partial A} = -\frac{Q}{B} \bar{\alpha}'(\eta) \frac{d\eta}{dA} - \frac{1}{B} = \frac{Q}{B} (\alpha_2 - \alpha_1) s(\eta) \frac{d\eta}{dA} - \frac{1}{B}$$

Evaluate at  $\eta = 0.9483$ :  $\frac{d\bar{T}}{dA} = -1.09172$

Change in  $A$  to increase  $T$  by 2 degrees:

$$\Delta A \approx \frac{\Delta T}{-1.09172} = \frac{2}{-1.09172} = -1.832$$

$\boxed{\Delta A \approx -1.832}$

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**Step 3**

Compute the change in  $y_p$ :

current temperature profile  $T(y) = \frac{1}{B+C}(Qs(y)(1-\alpha_i) - A + C\bar{T})$ ,  $y < \eta$   
 $= 26.85 - 34.13y^2$   $\Delta\bar{T} = 2$   
 $\Delta A \approx -1.832$

new temperature profile  $\hat{T}(y) = \frac{1}{B+C}(Qs(y)(1-\alpha_i) - (A + \Delta A) + C(\bar{T} + \Delta\bar{T})$   
 $= \frac{1}{B+C}(Qs(y)(1-\alpha_i) - A + C\bar{T}) + \frac{C\Delta\bar{T} - A}{B+C}$   
 $= T(y) + 1.60$

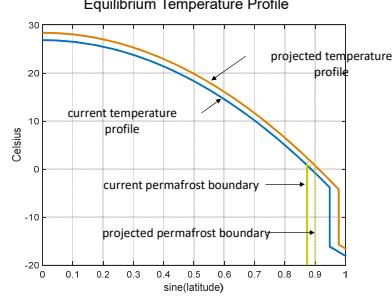
$y_p = \sin(61^\circ) \approx 0.875$  permafrost boundary  
 $\Delta y \approx -1.60$   $\frac{-1.60}{T'(y_p)} = \frac{-1.60}{-59.70} = 0.027$  as before, but with 1.6 instead of 2

new permafrost boundary  $\hat{y}_p = y_p + \Delta y = 0.902$ , corresponding to  $[64.4^\circ \text{ latitude}]$

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**Equilibrium Temperature Profile**

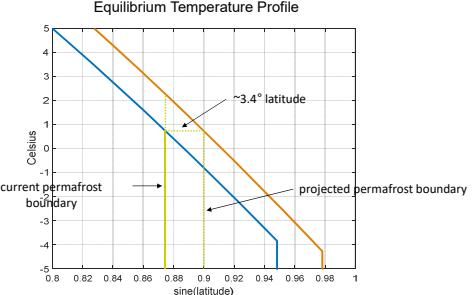


The graph plots Celsius temperature against sine(latitude). It shows two downward-sloping curves: a blue curve for the 'current temperature profile' and an orange curve for the 'projected temperature profile'. Arrows point from the labels to their respective curves. A vertical yellow line marks the 'current permafrost boundary' at approximately 0.875 on the sine(latitude) axis. A vertical blue line marks the 'projected permafrost boundary' at approximately 0.902. A horizontal dashed line is drawn at approximately 0.875 on the Celsius axis, labeled 'permafrost boundary'.

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**Equilibrium Temperature Profile**



This graph provides a detailed view of the equilibrium temperature profile. The y-axis is Celsius (from -5 to 5) and the x-axis is sine(latitude) (from 0.8 to 1.0). The blue 'current permafrost boundary' is at approximately 0.875. The orange 'projected permafrost boundary' is at approximately 0.902. A vertical yellow line at approximately 0.875 is labeled '3.4° latitude'. A horizontal dashed line at approximately 0.875 is labeled 'permafrost boundary'.

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**Where is the permafrost?**



A map of the Arctic region showing the distribution of permafrost. Two concentric circles are drawn around the North Pole: a yellow circle representing the 'Average latitude of permafrost boundary: 61° (yellow circle)' and an orange circle representing the 'Projected permafrost boundary (orange circle)'. The map also shows landmasses like Canada, Greenland, and Russia, and various bodies of water. A legend at the bottom left indicates four types of permafrost coverage: Isolated, Sporadic, Discontinuous, and Continuous, each represented by a different shade of purple.

Source: International Permafrost Association, 1998  
Unisatellite Active-Layer Permafrost System (SAP), Version 1.0

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 **Math 5490**  
Permafrost Melt

**How much carbon could be released from the permafrost if the global mean temperature rose by 2 degrees Celsius?**

Recall that the surface area is proportional to  $y$ , the sine of the latitude.

Current permafrost boundary:  $y_p = \sin(61^\circ) \approx 0.875$

Proportion of globe covered by permafrost:  $1 - y_p = 0.125$

$\Delta y \approx 0.027$

Proportion of permafrost melted:  $\frac{0.027}{0.125} = 0.216$

Amount of carbon released:  $0.216 \times 1400 = 302 \text{ GtC}$

Total fossil fuel emissions since 1751: 580 GtC

**To hold the GMT at 2°C, we will have to withdraw 300 GtC from the atmosphere as the permafrost melts.**

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**How much carbon could be released from the permafrost if the global mean temperature rose by 2 degrees Celsius?**

We have computed the potential carbon released to the atmosphere when the permafrost line moves north.

**How fast will the permafrost melt?**

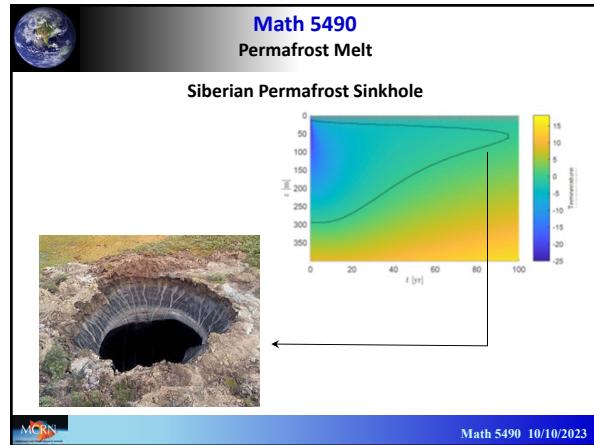
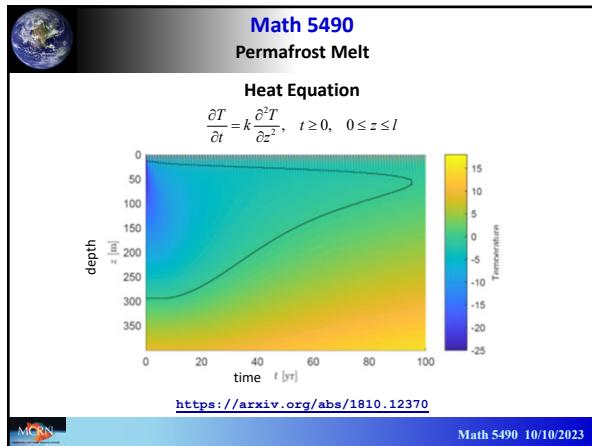


Kaitlin Hill



Maria Sanchez Muniz

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**Other Interesting Questions**

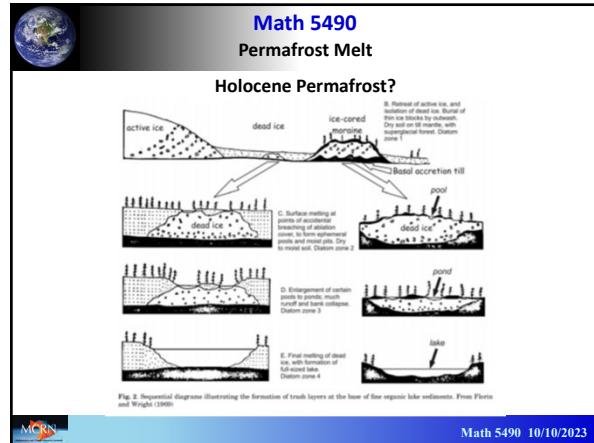
Budyko's model includes ice-albedo feedback, but not carbon feedback.

- Can we modify the model to include the effects of permafrost melt on atmospheric carbon?
- Could we use the data we have about current permafrost to model the glacial retreats during the Pleistocene?\*
- To what extent was the "dead ice" in the Holocene similar to today's permafrost?\*\*

\*e.g., J.A. Walsh, E. Widiasih, J. Hahn & R. McGehee, *Nonlinearity* **29**, 1843–1864 (2016).

\*\*H. Wright & I. Stefanova, *Acta Palaeobotanica* **44**, 141–146 (2004).

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**Glacial Lake Agassiz**



The map illustrates the massive extent of Glacial Lake Agassiz, which covered parts of Manitoba, Ontario, Saskatchewan, North Dakota, and South Dakota. It shows the lake's connection to Lake Winnipeg, Lake Manitoba, Lake of the Woods, and Lake of the Souris. The map also indicates the locations of the Red River, Assiniboine River, and Nelson River. A legend at the bottom left identifies the 'Glacial Lake Agassiz' (light blue) and 'Residual Lakes' (dark blue).

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[http://www.rootsweb.ancestry.com/~ndpembin/html/lake\\_agassiz.htm](http://www.rootsweb.ancestry.com/~ndpembin/html/lake_agassiz.htm)

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Could this be a picture of the North shore of Lake Agassiz 10,000 years ago?



A photograph showing a coastal erosion site, likely the North shore of Lake Agassiz. The image depicts a steep, eroded cliff face made of light-colored rock, with a large, dark rock partially submerged in the water at the base. The land above the cliff is covered in dry, brown grass. In the background, the ocean extends to the horizon under a clear sky.

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