

# Modeling Martian Climate with Low-Dimensional Energy Balance Models

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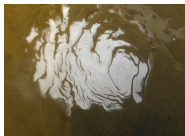
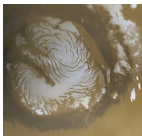
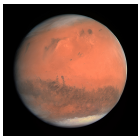
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Alice Nadeau (University of Minnesota)

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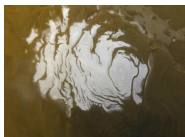
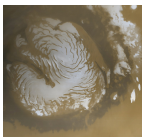
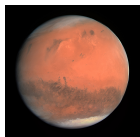


Figure: Spring 2018 **Math and Climate** seminar. Field trip to Harvard Forest.

## Background on Mars

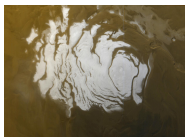
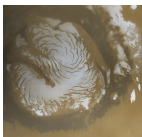
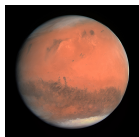


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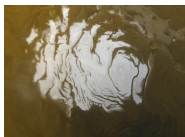
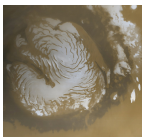
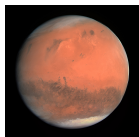
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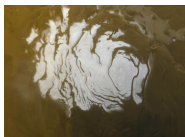
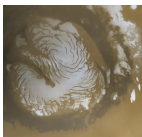
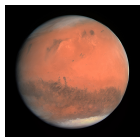
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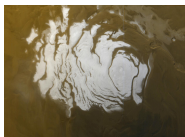
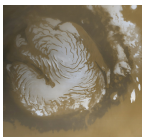
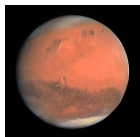
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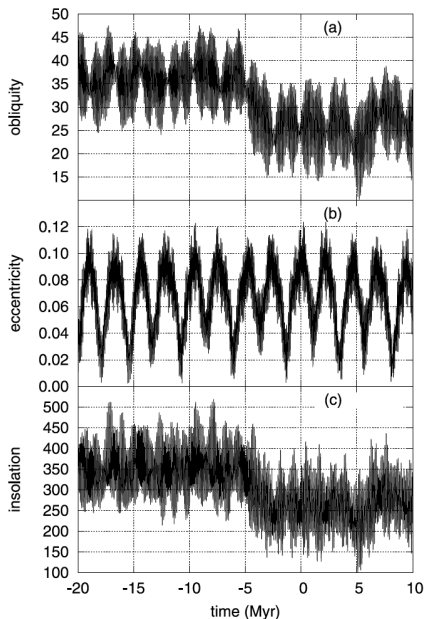
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- Current Martian ice line is approximately at a latitude of  $60^{\circ}$ .



# Martian Obliquity



- Figure from [Laskar et al., 2004](#). Extensive calculations show obliquity to be chaotic.
- Current obliquity of Mars is  $25.19^\circ$  (Earth =  $23.44^\circ$ )
- Average value (computed over 5 billion years) is  $37.62^\circ$
- Maximum value =  $82.035^\circ$ ; probability for obliquity  $> 80^\circ$  is 0.015%
- Change in obliquity due to influence of **secular terms** in solar system

## Budyko's Energy Balance Model (1969)

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$$R \frac{\partial T}{\partial t} = Q s(y)(1 - \alpha) - (A + BT) - C(T - \bar{T})$$

$Q$  = solar constant

$s(y)$  = insolation (incoming solar radiation)

$\alpha$  = albedo (reflectivity of planet)

$A + BT$  = outgoing longwave radiation

$C(T - \bar{T})$  = meridional heat transport

$$\bar{T} = \int_0^1 T(t, y) dy = \text{mean global annual temp.}$$

## Comparison of Parameter Values

$$R \frac{\partial T}{\partial t} = Q_s(y)(1 - \alpha) - (A + BT) - C(T - \bar{T})$$

Symbol	Definition	Earth	Mars
$Q$	solar constant	342 W/m <sup>2</sup>	146 W/m <sup>2</sup>
$\alpha_r$	albedo for land i.e., Martian regolith	0.32	0.25
$\alpha_s$	albedo for snow/ice	0.62	0.67
$A + BT$	outgoing longwave radiation	$A = 202 \text{ W/m}^2$ $B = 1.9 \text{ W}/(\text{m}^2\text{C})$	$A$ unknown $B = 1.33$
$C(T - \bar{T})$	heat transport	$C = 3.04$	unknown

## Nadeau-McGehee Insolation Approximation

Annual average insolation as a function of latitude  $y = \sin \theta$  and obliquity angle  $\beta$  ( $\gamma = \text{longitude}$ ):

$$s(y, \beta) = \frac{2}{\pi^2} \int_0^{2\pi} \sqrt{1 - (\sqrt{1 - y^2} \sin \beta \sin \gamma - \gamma \cos \beta)^2} d\gamma$$

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6th-degree polynomial approximation (Nadeau, McGehee 2017):

$$s(y, \beta) \approx 1 - \frac{5}{8} p_2(\tilde{\beta}) p_2(y) - \frac{9}{64} p_4(\tilde{\beta}) p_4(y) - \frac{65}{1024} p_6(\tilde{\beta}) p_6(y)$$

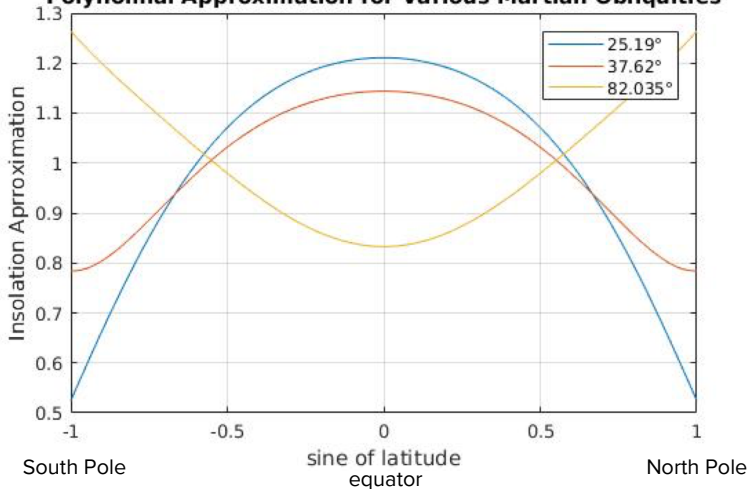
where  $\tilde{\beta} = \cos \beta$  and  $p_i$  is the  $i$ -th Legendre polynomial

$$p_2(y) = \frac{1}{2}(3y^2 - 1)$$

$$p_4(y) = \frac{1}{8}(35y^4 - 30y^2 + 3)$$

$$p_6(y) = \frac{1}{16}(231y^6 - 315y^4 + 105y^2 - 5).$$

## Insolation Functions Using Sixth-Degree Polynomial Approximation for Various Martian Obliquities



Note: For  $\beta \approx 53.937^\circ$ ,  $s(0) = s(1)$  and  $0.974 \leq s(y) \leq 1.031$  (nearly constant at 1).



## Albedo and the Ice Line

**Albedo** varies with latitude, depending on whether the surface is ice covered in CO<sub>2</sub> “snow” or land.

Define the parameter  $\eta \in [0, 1]$  to be the **ice line**, the latitudinal boundary between snow-covered ice and land.

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Two-step albedo function depending on the magnitude of obliquity:

$$\alpha_1(y, \eta) = \begin{cases} \alpha_r & \text{if } y < \eta \\ \alpha_s & \text{if } y > \eta, \end{cases} \quad \text{or} \quad \alpha_2(y, \eta) = \begin{cases} \alpha_s & \text{if } y < \eta \\ \alpha_r & \text{if } y > \eta. \end{cases}$$

Left model (smaller obliquity) for polar **ice caps**.

Right model (large obliquity) for equatorial **ice belts**.

$\alpha_r \approx 0.25$  (land) and  $\alpha_s \approx 0.67$  (snow-covered ice).

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We will assume that  $T_c = -125.5^\circ\text{C}$  is the **critical temperature** at which CO<sub>2</sub> ice can form on Mars.

## Equilibrium solutions

Let  $T^* = T^*(y, \eta, \beta)$  represent the equilibrium solution of the Budyko model. Integrating the right-hand side of the PDE with respect to  $y$  from 0 to 1 yields the global mean temperature at equilibrium

$$\overline{T^*} = \frac{1}{B}(Q(1 - \overline{\alpha}(\eta, \beta)) - A),$$

where  $\overline{\alpha}(\eta, \beta) = \int_0^1 s(y, \beta)\alpha(y, \eta) dy$  is the weighted average albedo, a 7th degree polynomial in  $\eta$  (coefficients in  $\beta$ ).

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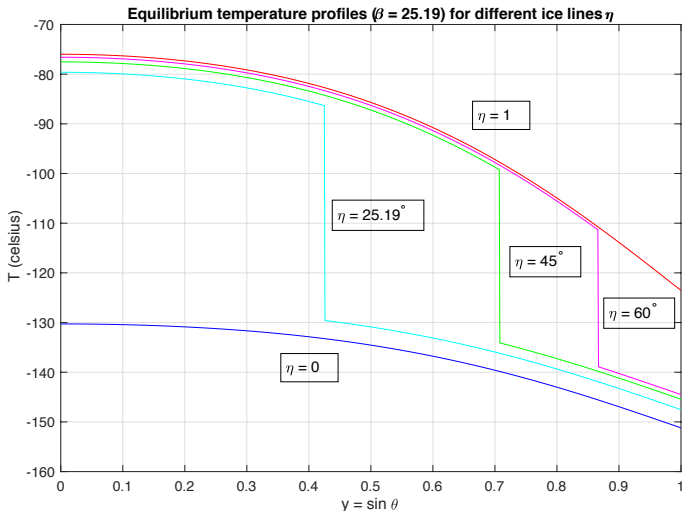
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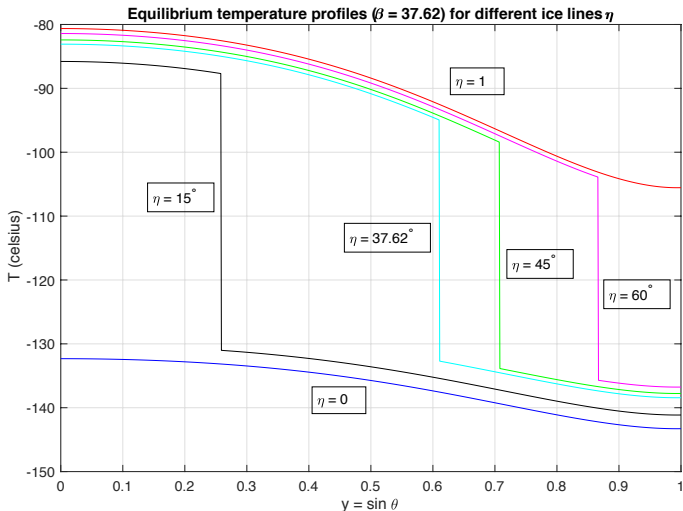
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This in turn gives a formula for the [equilibrium temperature profile](#)

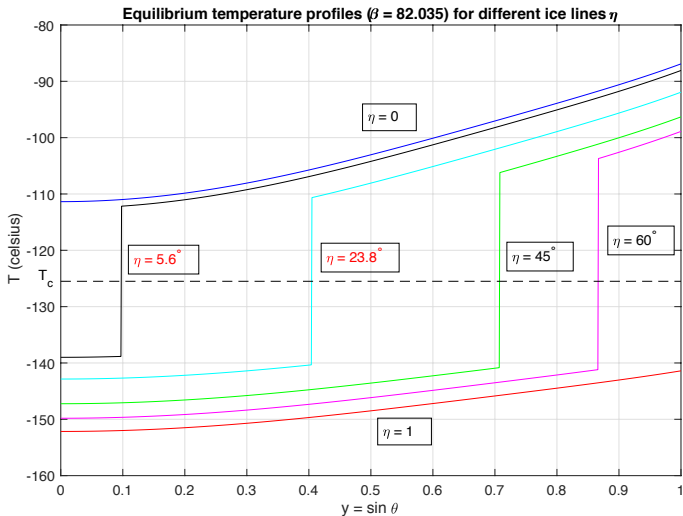
$$T^*(y, \eta, \beta) = \frac{Q}{B+C} \left( s(y, \beta)(1 - \alpha(y, \eta)) + \frac{C}{B}(1 - \overline{\alpha}(\eta, \beta)) \right) - \frac{A}{B}.$$



**Figure:** Graphs of equilibrium temperature profiles with two-step albedo function  $\alpha_1$  for obliquity  $\beta = 25.19^\circ$  and various ice lines ( $A = 230$ ,  $C = 0.25$ ).  $\eta = 1$  corresponds to an ice-free planet while  $\eta = 0$  is ice-covered.



**Figure:** Graphs of equilibrium temperature profiles with two-step albedo function  $\alpha_1$  for obliquity  $\beta = 37.62^\circ$  and various ice lines ( $A = 230$ ,  $C = 0.25$ ).  $\eta = 1$  corresponds to an ice-free planet while  $\eta = 0$  is ice-covered.



**Figure:** Graphs of equilibrium temperature profiles with two-step albedo function  $\alpha_2$  for obliquity  $\beta = 82.035$  and various ice lines ( $A = 245$ ,  $C = 0.6$ ). Here,  $\eta = 1$  corresponds to an ice-covered planet while  $\eta = 0$  is ice-free.



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Treat the ice line  $\eta$  as a variable and append the ODE

$$\frac{d\eta}{dt} = \pm\epsilon(h(\eta, \beta) - T_c)$$

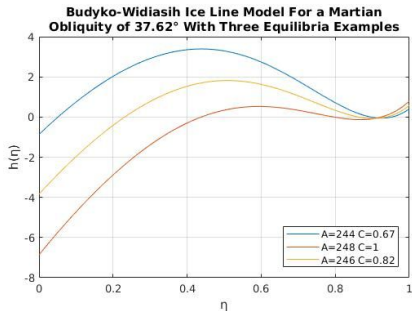
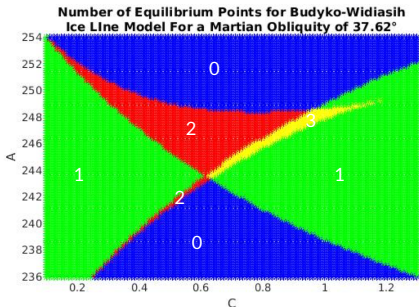
to the Budyko model, where  $\epsilon$  is a small parameter and

$$\begin{aligned} h(\eta, \beta) &= T^*(\eta, \eta, \beta) = \frac{1}{2} \left( \lim_{y \rightarrow \eta^-} T^*(y, \eta, \beta) + \lim_{y \rightarrow \eta^+} T^*(y, \eta, \beta) \right) \\ &= \frac{Q}{B+C} \left[ s(\eta, \beta) \left( 1 - \frac{\alpha_r + \alpha_s}{2} \right) + \frac{C}{B} (1 - \bar{\alpha}(\eta, \beta)) \right] - \frac{A}{B} \end{aligned}$$

is the equilibrium temperature at the ice line (7th-degree poly. in  $\eta$ ).  
Choose  $+$  for smaller obliquities and  $-$  for larger ( $\beta > \beta_c = 53.937^\circ$ ).







**Figure:** Bifurcation diagram (left) indicating the number of ice line equilibria as  $A$  and  $C$  are varied for  $\beta = 37.62^\circ$ . Yellow region yields 1 stable and 2 unstable equilibrium ice lines. Graphs of  $h(\eta) - T_c$  (right) demonstrating a saddle node bifurcation.

Number of Equilibrium Points For 100x100  
Budyko-Widiasih Ice Line Models For a Martian  
Obliquity of  $82.035^\circ$

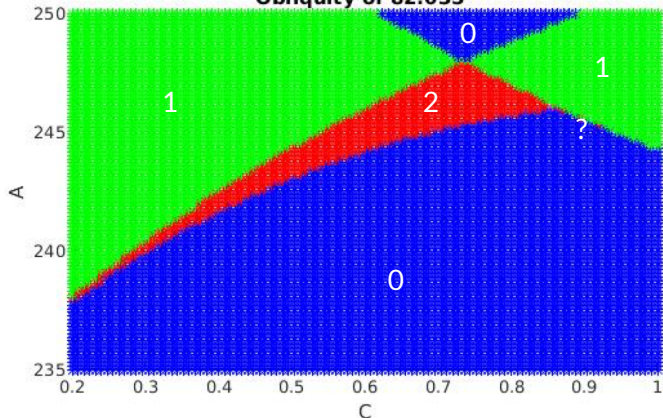


Figure: Bifurcation diagram indicating the number of ice line equilibria as  $A$  and  $C$  are varied for  $\beta = 82.035^\circ$ , with adjusted albedo function  $\alpha_2$ . Red region yields stable and unstable ice belts.

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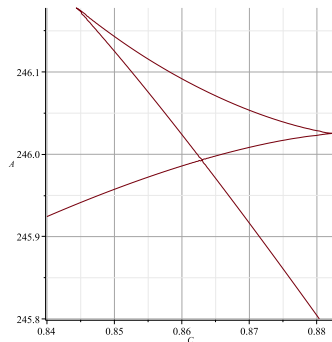
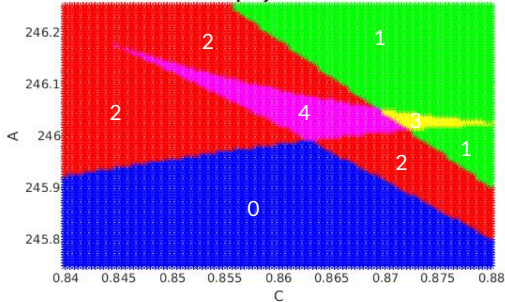
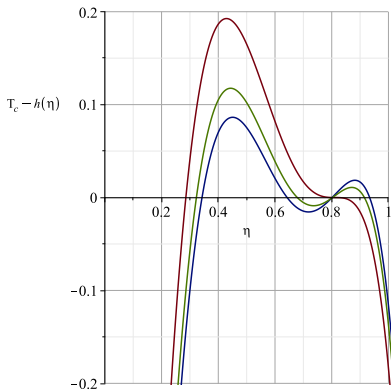
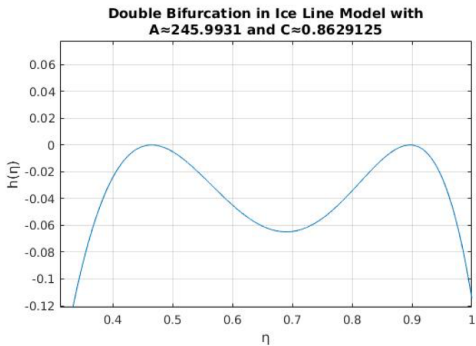


Figure: (Left) Zoom of previous diagram indicating parameter values with **four** equilibrium ice lines! A **double saddle node** bifurcation occurs at  $A \approx 245.9931$  and  $C \approx 0.8629$ . (Right) Maple plot of the level curve  $g(A, C) = 0$  where  $g$  is the **discriminant** of  $h(\eta, \beta = 82.035) - T_c$  with respect to  $\eta$ . Any point on this level curve corresponds to parameter values with multiple roots (saddle node bifurcation).  $g$  is an 18th degree polynomial in  $A$  and  $C$  with 85 terms.



**Figure:** (Left) Graph of  $T_c - h(\eta)$  at the double saddle node bifurcation. (Right) Graphs of  $T_c - h(\eta)$  near  $A \approx 246.1905$ ,  $C \approx 0.84286$  illustrating a **pitchfork bifurcation** (cubic tangency).



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- **Thank you for your attention!**

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