# Interpreting the Past: Modeling the 100,000 year Problem

Samantha Oestreicher

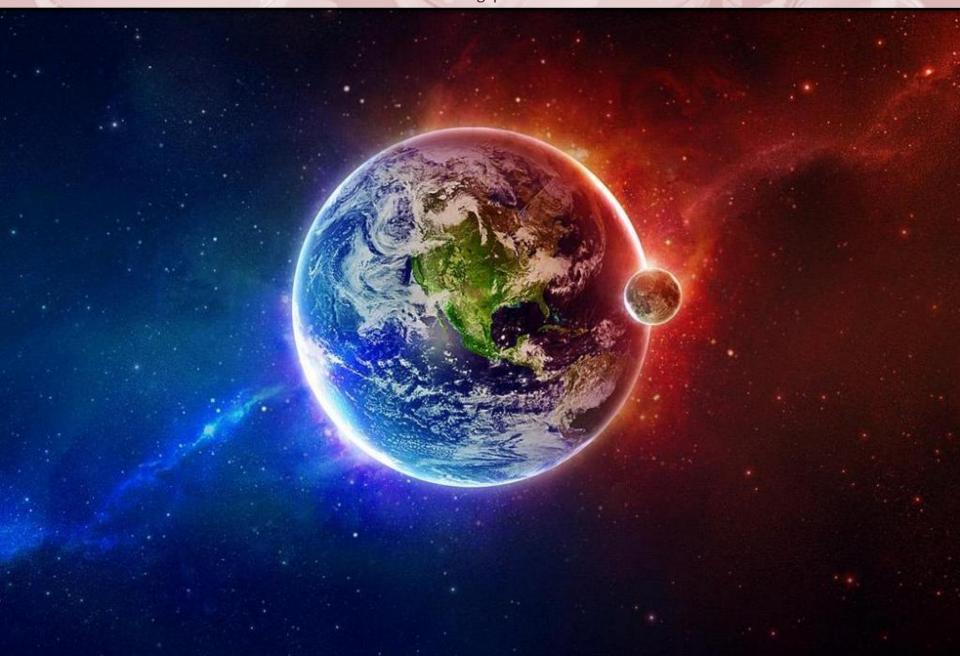
February 4, 2014



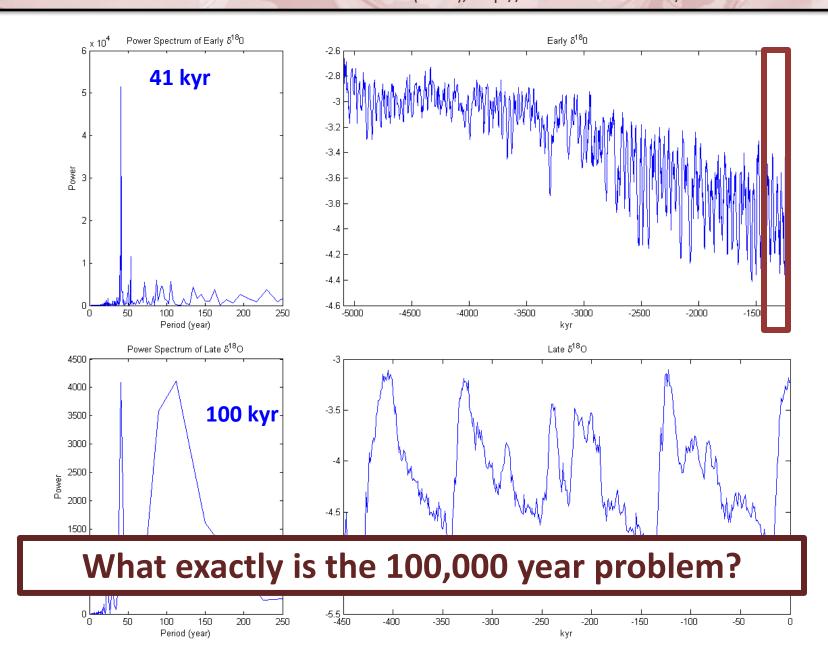


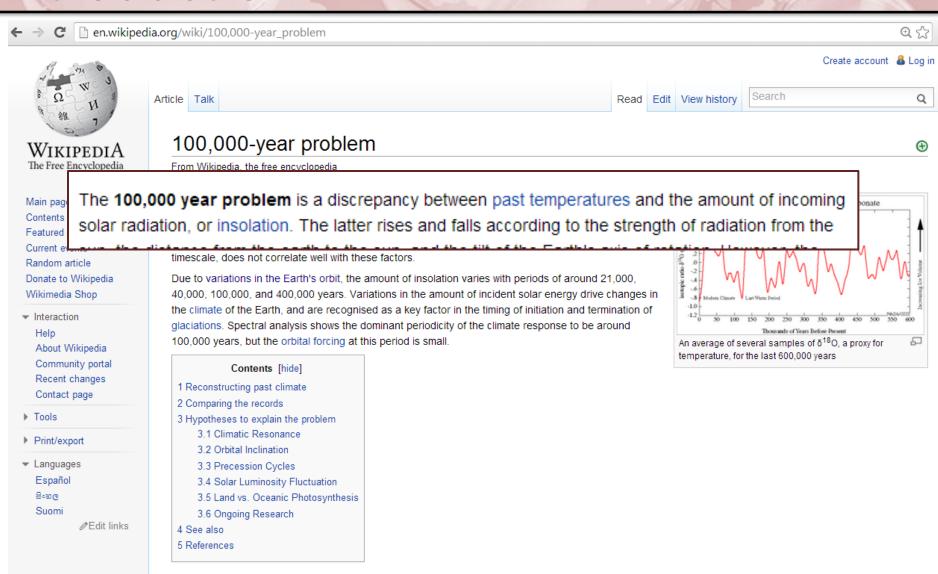


We are living in our only Petri Dish.



Data from Lisiecki and Raymo, "A Pliocene-Pleistocene stack of 57 globally distributed benthic  $\delta^{18}$ O records" *Paleoceanography* (2005), http://lorraine-lisiecki.com/LR04stack.txt.



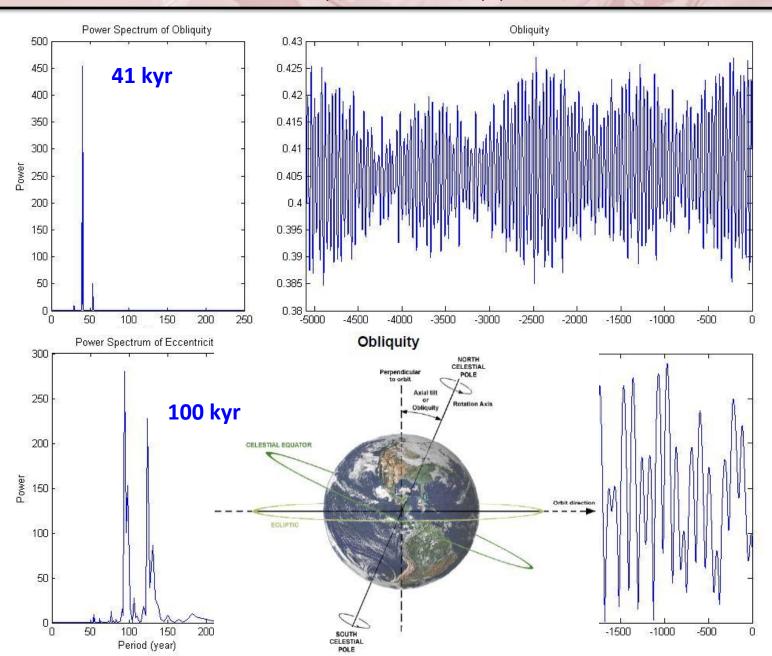


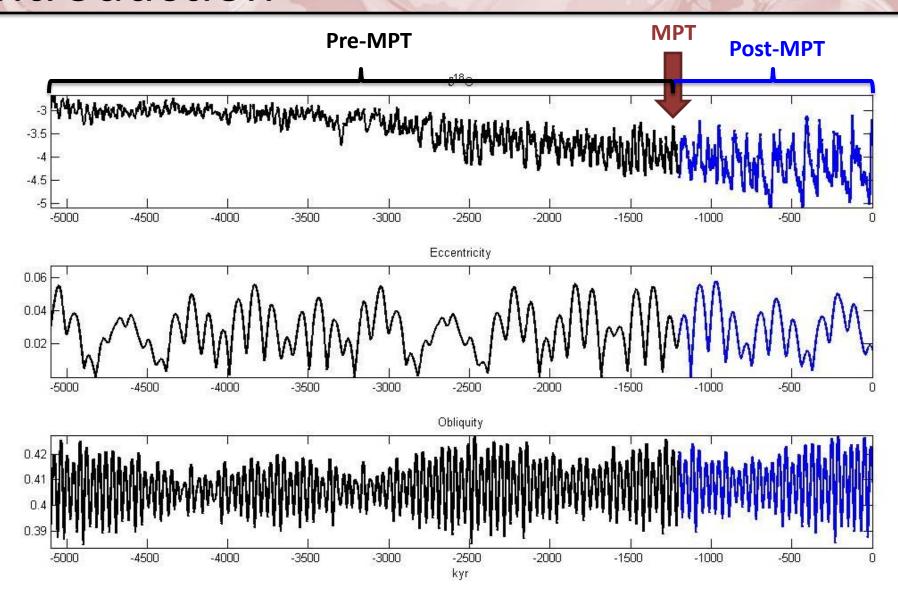
#### Reconstructing past climate [edit]

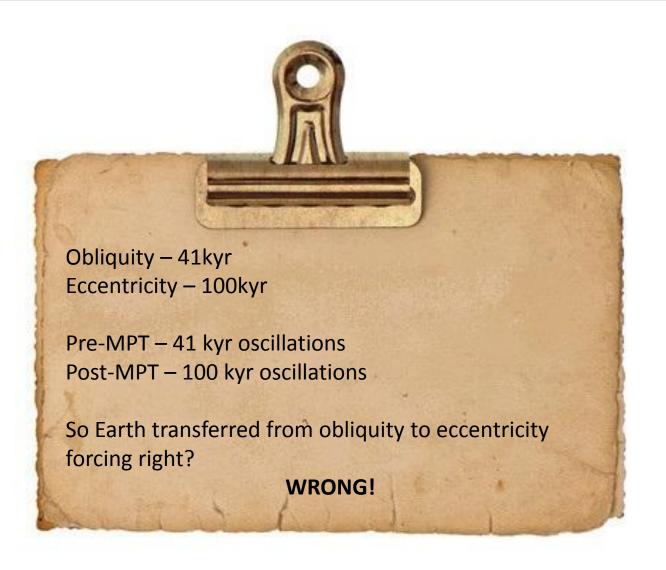
Past climate data—especially temperature—can be readily inferred from sedimentary evidence, although not with the accuracy that instruments can measure current temperatures. Perhaps the most useful indicator of past climate is the fractionation of oxygen isotopes, denoted  $\delta^{18}$ O. This fractionation is controlled mainly by the amount of water locked up in ice and the absolute temperature of the planet.

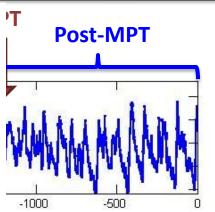


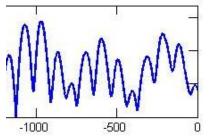
Data from Laskar et al, "A long-term numerical solution for the insolation quantities of the Earth" *Astronomy & Astrophysics* (2004), 261–285. http://www.imcce.fr/Equipes/ASD/insola/earth/La2004/index.html

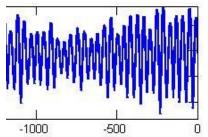


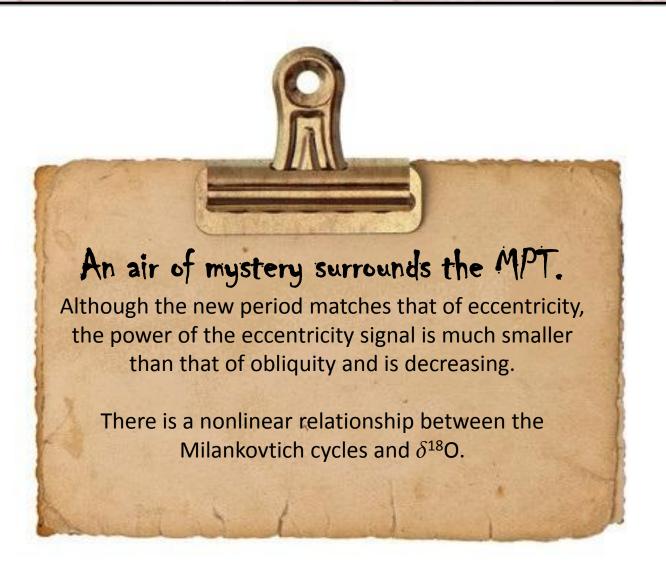


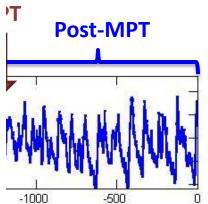


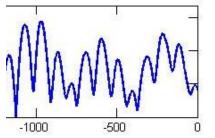


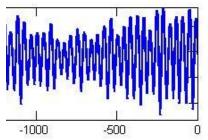


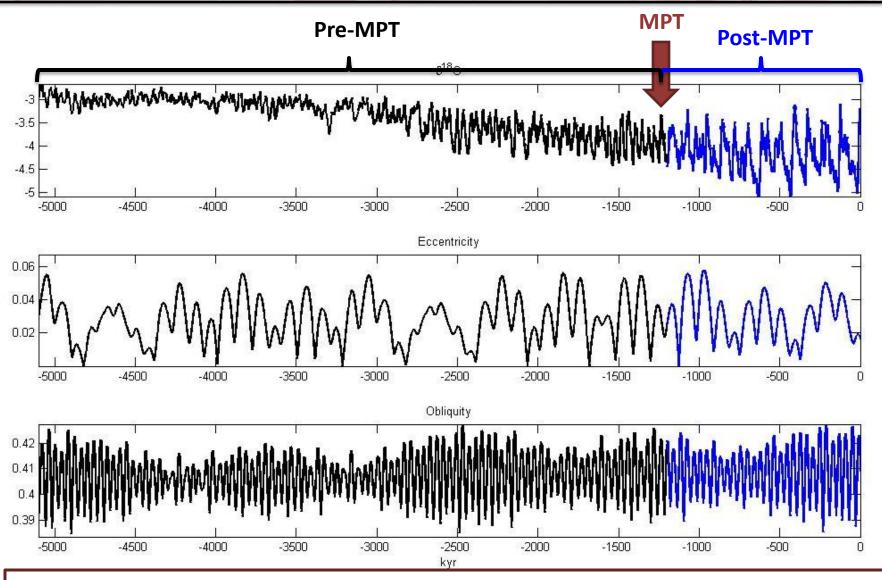






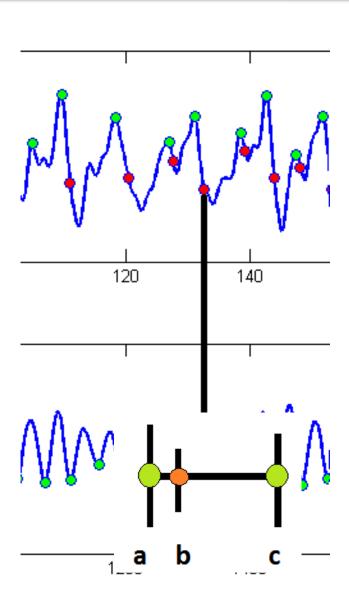




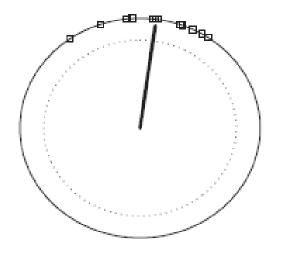


What do we know about the relationship between  $\delta^{\text{18}}\text{O}$  and external forcing?

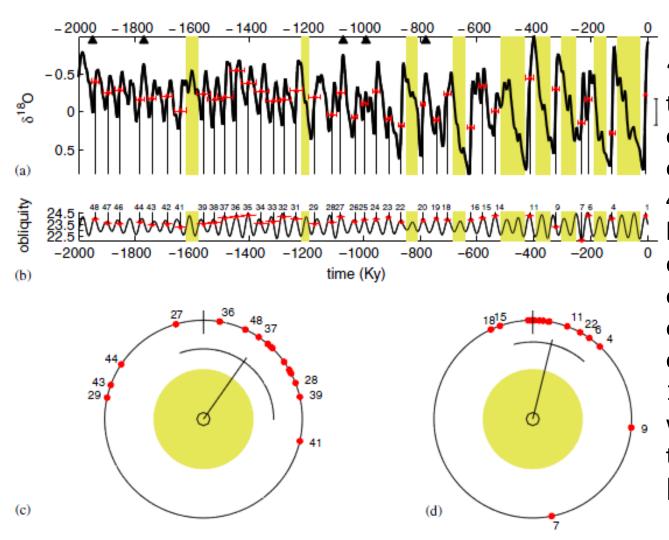
## Computing Phase Angles



$$\Delta \text{Phase} = \left(\frac{b-a}{c-a}\right) 2\pi$$

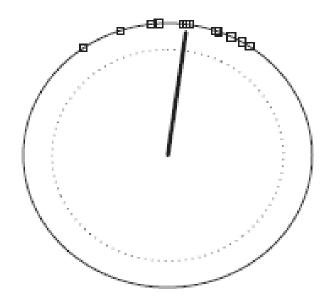


# Phase Angles in $\delta^{18}$ O



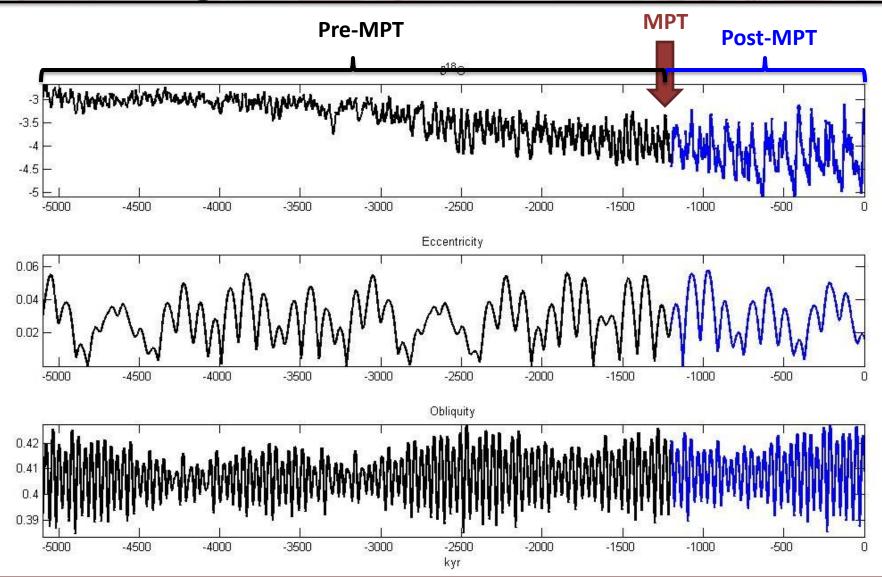
"During the early Pleisdeglaciations tocene occur nearly every obliquity cycle giving a 40 Ka timescale, while Pleistocene late deglaciations more often skip one or two obliquity beats, corresponding to 80 or 120 Ka glacial cycles which, on average, give the 100 Ka variability." [Huybers 2007, 2011]

# Phase Angles in $\delta^{18}$ O



"The relative phase of eccentricity and glacial cycles has been stable since 1.2 Myr ago, supporting the hypothesis that 100,000 glacial cycles are paced by eccentricity." [Lisiecki 2010]

# Phase Angles in $\delta^{18}$ O



 $\delta^{18}$ O is in phase with obliquity and eccentricity for the last 2 mya and 1.2 mya. resp.

#### Table of Models

Identifying which type of model is the best choice for modeling the MPT is just as important as the actual fit of the model. The underlying mathematical structure might teach us something about the underlying drivers of the system.

#### MPT modeling options:

- 1. Dynamic Hopf Bifurcations
- 2. Relaxation Oscillators
- 3. Threshold/bursting models
- 4. Excitable System with Slow Manifold

We will focus on the Dynamic Hopf Bifurcation as possible tool to uncover the secrets of the 100,000 year Problem. We will not consider methods 2-4.1

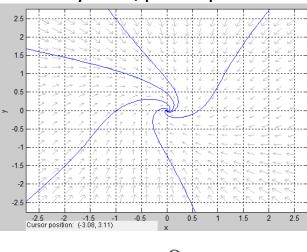
<sup>1</sup>To learn more about these systems I recommend Michel Crucifix's "Oscillators and relaxation phenomena in Pleistocene climate theory" 2012.

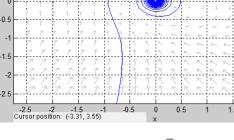
#### **Hopf Bifurcation**

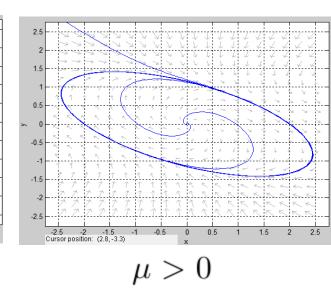
$$\dot{x} = y + \mu x - xy^2$$

$$\dot{y} = \mu y - x - y^3$$

#### Velocity field/phase portrait:







$$\mu < 0$$

$$\mu = 0$$

origin is a center.

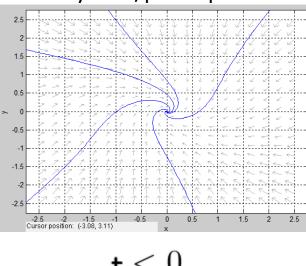
origin is globally stable or a global attractor

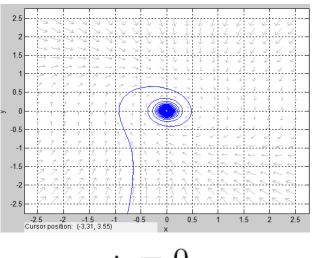
origin is locally unstable with a globally stable limit cycle

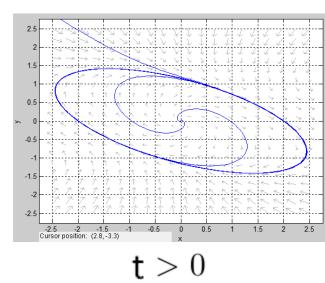
$$\dot{x} = y + \mu x - xy^2$$

$$\dot{y} = \mathbf{t} y - x - y^3$$

#### Velocity field/phase portrait:







t < 0

t = 0

origin is a center.

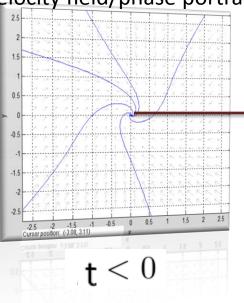
origin is globally stable or a global attractor

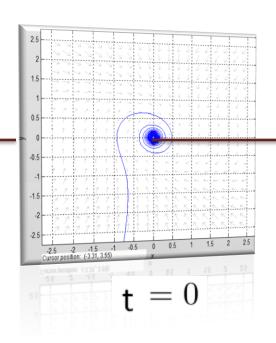
origin is locally unstable with a globally stable limit cycle

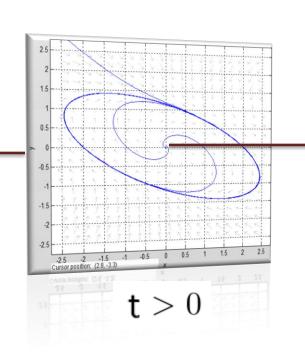
$$\dot{x} = y + \mu x - xy^2$$

$$\dot{y} = \mathbf{t} y - x - y^3$$

Velocity field/phase portrait:







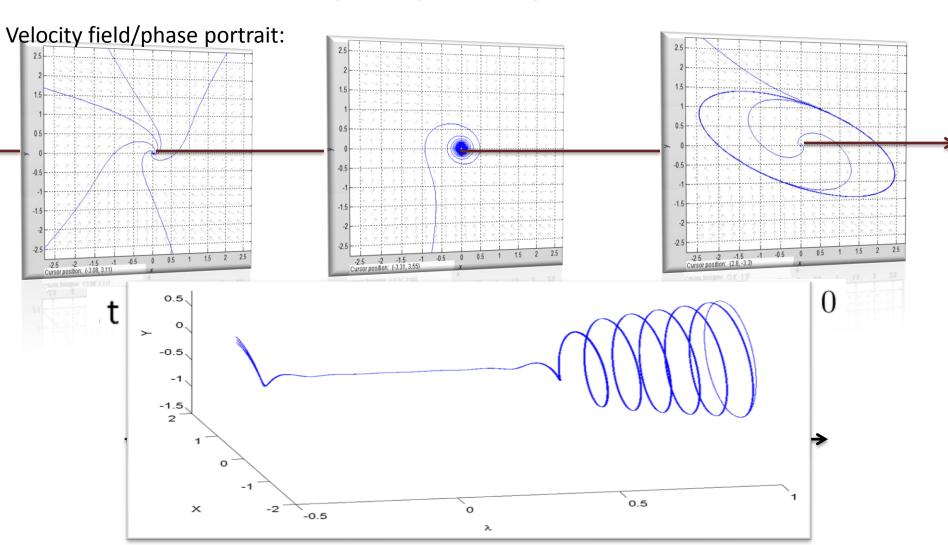
origin is a center.

origin is globally stable or a global attractor

origin is locally unstable with a globally stable limit cycle

$$\dot{x} = y + \mu x - xy^2$$

$$\dot{y} = t y - x - y^3$$



Because the  $\delta^{18}$ O data has small oscillations followed by larger ones, it is reasonable to model the MPT with a forced dynamic Hopf Bifurcation.

Two famous examples are all the Saltzman Models (1987, 1988, 1990, 2001) and Korobeinikov (2010).

We explore one of most famous Dynamic Hopf Bifurcation MPT models from Barry Saltzman and Kurt Maasch.

#### Maasch & Saltzman [1990]

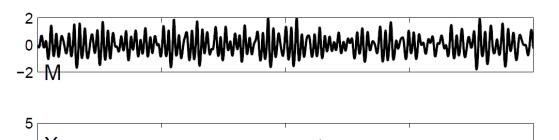
Ice Line 
$$\dot{X}=-X-Y-uM(t)$$
 Atmospheric  $\mathrm{CO}_2$   $\dot{Y}=-pZ+rY+sZ^2-Z^2Y$  North Atlantic Deep Water Formation  $\dot{Z}=-q(X+Z)$ .

#### Maasch & Saltzman [1990]

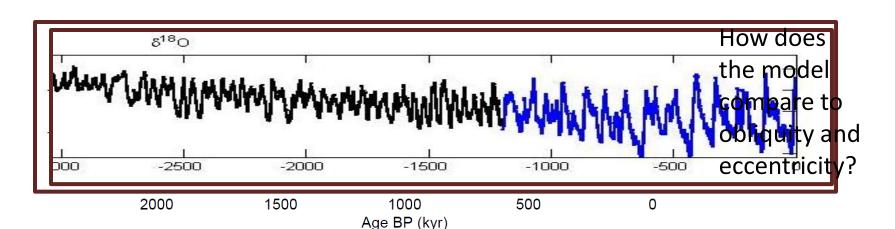
Ice Line 
$$\dot{X} = -X - Y - uM(t)$$

$$\text{Atmospheric CO}_2 \quad \dot{Y} \quad = \quad -pZ + rY + sZ^2 - Z^2Y$$

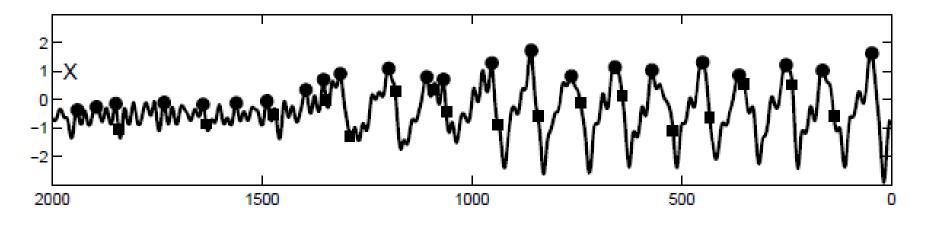
North Atlantic Deep Water Formation  $\dot{Z} = -q(X+Z)$ .

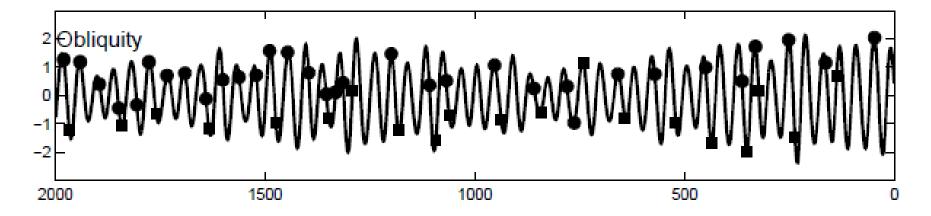


Does the model look like  $\delta^{18}$ O?



How does the model compare to obliquity?





#### Maasch & Saltzman [1990]

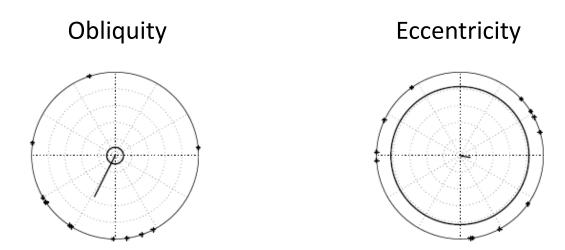
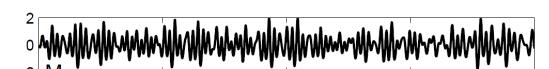
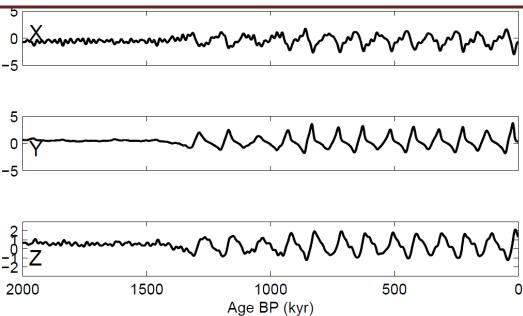


Figure 3.2: Circular statistics of the last 1.2 million years. Obliquity phase angle is on the left, eccentricity is on the right. Radial line shows mean angle with magnitude R showing relative cohesion of angles. The inner solid circle is the magnitude R must be exceed to reject  $H_0$ . Stars along the outer circle are individual phase angle differences. A radial line pointing straight up would show the model is in phase with the local maxima of the forcing term. A radial line pointing straight down would show the model is in phase with the local minima of the forcing term.

Ice Line 
$$\dot{X}=-X-Y-uM(t)$$
 Atmospheric  ${\rm CO_2}$   $\dot{Y}=-pZ+rY+sZ^2-Z^2Y$  North Atlantic Deep Water Formation  $\dot{Z}=-q(X+Z).$ 



Maybe the external forcing is not sophisticated enough to phase correlate?



Budyko-Sellers-Widiasih Model:

$$\frac{\partial T}{\partial t} = \frac{k}{R}((1 - \alpha(y, \eta))Qs(y) - (A + BT(y)) + C(\overline{T} - T(y))$$

$$\frac{d\eta}{dt} = k\epsilon(T(\eta) - T_c)$$

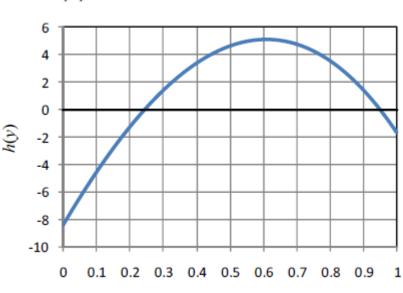
With attracting invariant curve found by Widiasih-McGehee:

$$\begin{split} \dot{\eta} &= \epsilon h(\eta) \\ h(\eta) &= \left( \Phi_0(\eta) + \frac{Qs_2(1 - \alpha_0)}{B + C} p_2(\eta) - T_c \right) \\ \Phi_0(\eta) &= \frac{1}{B} \left( Q(1 - \alpha_0) - A + C \frac{Q(\alpha_2 - \alpha_1)}{B + C} \left( \eta - \frac{1}{2} + s_2 P_2(\eta) \right) \right) \end{split}$$

$$s_2(\beta) = \frac{5}{16} \left( -2 + 3\sin^2 \beta \right)$$

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

$$P_2 = \int_0^{\eta} p_2(y) dy = \frac{1}{2} (\eta^3 - \eta)$$



We incorporate the Budyko-Sellers-Widiasih Model into the Maasch & Saltzman model:

$$\dot{\eta} = \epsilon \left( \left( \frac{C(\omega)Q(\varepsilon)(\alpha_2 - \alpha_1)}{B(B + C(\omega))} \right) \left( \eta - \frac{s_2(\beta)\eta}{2} \right) + \frac{Q(\varepsilon)}{B} (1 - \alpha_0) \right) -$$

$$\left( \frac{A(\mu)}{B} + \left( \frac{1 - s_2(\beta)\eta^3}{2} \right) \frac{C(\omega)Q(\varepsilon)(\alpha_2 - \alpha_1)}{B(B + C(\omega))} \right) + \left( \frac{Q(\varepsilon)s_2(\beta)(1 - \alpha_0)}{2(B + C(\omega))} (3\eta^2 - 1) \right) - T_c$$

$$\dot{\mu} = -p\omega + r\mu + s\omega^2 - m\omega^2\mu$$

$$\dot{\omega} = -q(f(\eta) + \omega)$$

$$\alpha_1 = 0.32 \qquad p = 0.8 \quad A(\mu) = -3\mu + 205.5$$

$$\alpha_2 = 0.62 \qquad q = 1.8 \quad C(\omega) = 0.05\omega + 3$$

$$\alpha_0 = (\alpha_1 + \alpha_2)/2 \quad m = 1 \qquad f(\eta) = -16\eta + 13.2$$

$$B = 1.9 \qquad T_c = -10 \qquad s_2 = (5/16)(-2 + 3\sin\beta^2)$$

We incorporate the Budyko-Sellers-Widiasih Model into the Maasch & Saltzman model:

$$\dot{\eta} = \epsilon \left( \left( \frac{C(\omega)Q(\varepsilon)(\alpha_2 - \alpha_1)}{B(B + C(\omega))} \right) \left( \eta - \frac{s_2(\beta)\eta}{2} \right) + \frac{Q(\varepsilon)}{B} (1 - \alpha_0) \right) - \left( \frac{A(\mu)}{B} + \left( \frac{1 - s_2(\beta)\eta^3}{2} \right) \frac{C(\omega)Q(\varepsilon)(\alpha_2 - \alpha_1)}{B(B + C(\omega))} \right) + \left( \frac{Q(\varepsilon)s_2(\beta)(1 - \alpha_0)}{2(B + C(\omega))} (3\eta^2 - 1) \right) - T_c$$

$$\dot{\mu} = -p\omega + r\mu + s\omega^2 - m\omega^2\mu \tag{4.1}$$

$$\dot{\omega} = -q(f(\eta) + \omega)$$

$$\alpha_1 = 0.32 \qquad p = 0.8$$

$$\alpha_2 = 0.62 \qquad q = 1.8$$

$$\alpha_0 = (\alpha_1 + \alpha_2)/2 \qquad m = 1$$

$$B = 1.9 \qquad T_c = -10$$

262.5

225

187.5

112.5

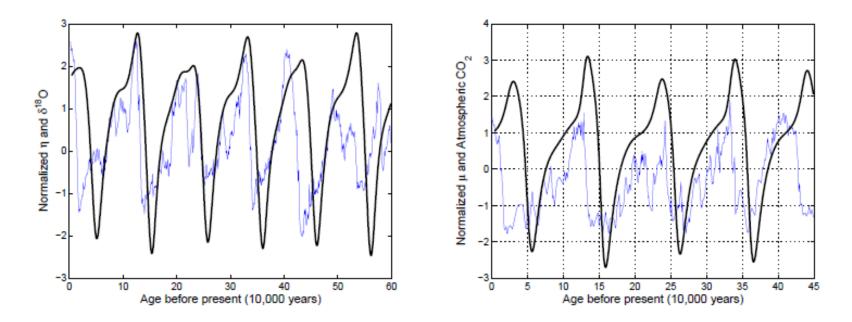


Figure 4.1: Left: Ice mass data for the last 3My. Blue data is  $\delta^{18}$ O data from the supplement to Lisiecki (2005), Black curve is output from the model in Equation 4.1 [34]. Right: Atmospheric CO<sub>2</sub> comparison for the last 450 kyrs. Normalized atmospheric CO<sub>2</sub> data from Luthi (2008) is shown in black, and normalized model output of atmospheric CO<sub>2</sub> is shown in blue [35].

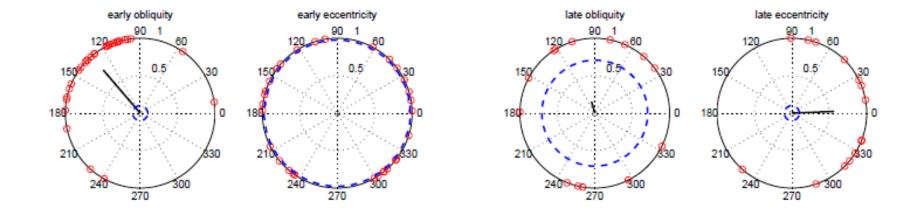
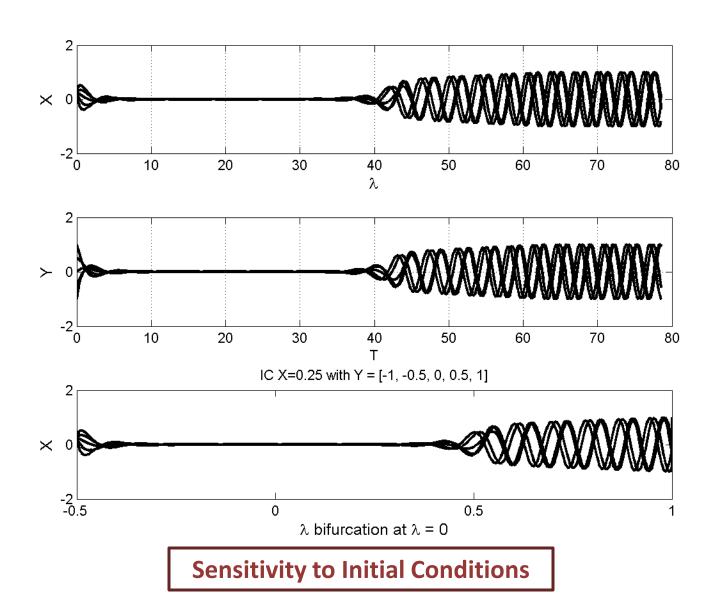


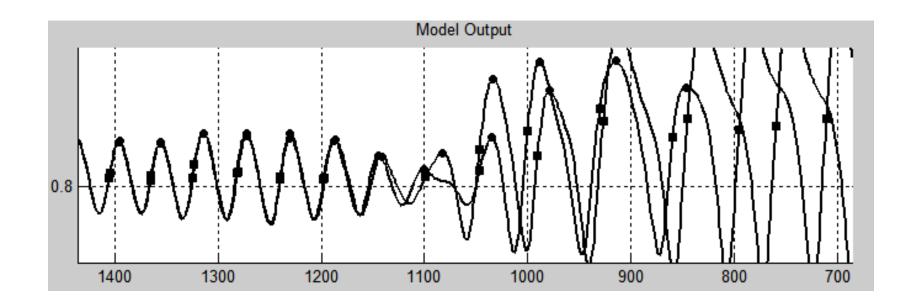
Figure 4.3: Phase angle analysis between model ice line output and orbital forcing for early (3 My - 1.2 My) and late (1.2 My to present) Pleistocene. The reader is referenced to Zar (1999) and Upton and Fingleton (1989) for details on the circular statistics used to produce these diagrams [31, 32]. Lisiecki (2010) also presents a concise review of the process [8].

And it gets worse...

# Initial Conditions of Dynamic Hopf

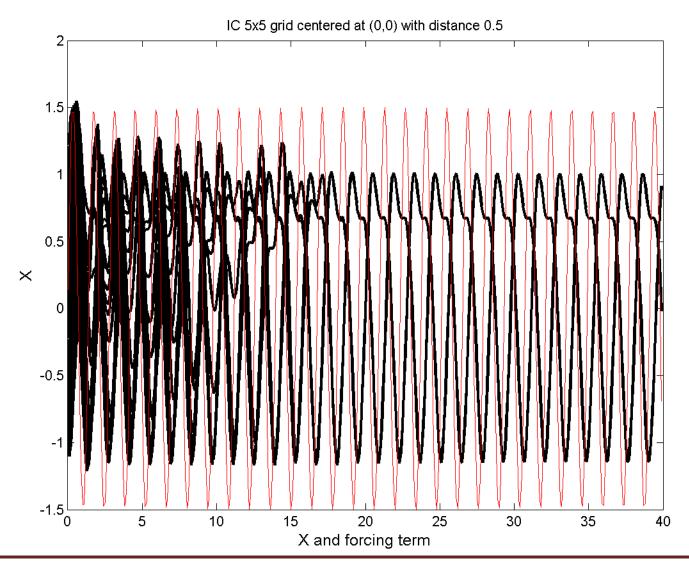


# Initial Conditions of Dynamic Hopf



One example of Sensitivity to Initial Condition at the neck.

### Initial Conditions of Dynamic Hopf



Order in Chaos: phenomena of stable trajectories in a dynamical system.

The Improved Maasch and Saltzman model suggests that an accurate accounting for Milankovitch cycles does not solve the phase angle discrepancy nor does it reduce or eliminate the initial condition sensitivity.

In order to formally question the assumption of phase angle correlation between a dynamic Hopf bifurcation and the external forcing, we must generalize the model...

#### Advertisement!

#### Tune in next week!

#### **Poincare Section Maps!**

