A Dynamical Systems Approach to the Pleistocene Climate - Part II of II

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#### May 24, 2017

# Outline

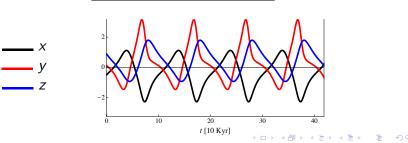
- Background
- Slow-fast approximation
- Center manifold approximation
- Slow passage(s)

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#### The 1990 Maasch-Saltzman Model

- ODE system for x = anomalies of ice mass, y = atmospheric CO<sub>2</sub> and z = North Atlantic (NA) deep water
- Dimensionless; parameters p, q, r, s > 0 are O(1)

$$\dot{x} = -x - y$$
  
$$\dot{y} = (r - z^2)y - (p - sz)z$$
  
$$\dot{z} = -qx - qz$$

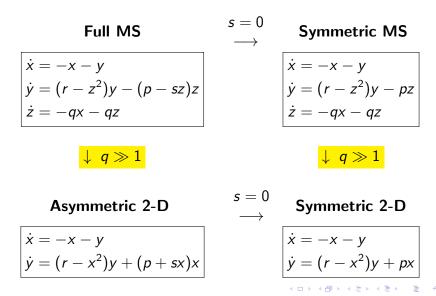


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# Reductions in this Talk



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### Slow-Fast System

- q > 1 is a ratio of time scales.
- Consider the case  $q \gg 1$  or  $\varepsilon = \frac{1}{q} \ll 1$ .
- Then x and y are slow, and z is fast.

$$\dot{x} = -x - y$$
  
$$\dot{y} = ry - pz + (s - y)z^{2}$$
  
$$\varepsilon \dot{z} = -x - z$$

- Invariant, normally attracting mfd  $\mathcal{M}_0=\{z=-x\}$  for  $\varepsilon=0$
- For small  $\varepsilon$ , invariant, normally attracting manifolds  $\mathcal{M}_{\varepsilon} = \{z = h_{\varepsilon}(x, y)\}$  persist (*Fenichel Theory*).

## Slow Manifold and Invariance Equation

Describe  $\mathcal{M}_{\varepsilon}$  with *invariance equation* 

$$\varepsilon \frac{d}{dt}h_{\varepsilon}(x,y) = -x - h_{\varepsilon}(x,y),$$

Expand  $h_{\varepsilon}(x, y) = h_0(x, y) + \varepsilon h_1(x, y) + \varepsilon^2 h_2(x, y) + \ldots$  and find the  $h_i$ .

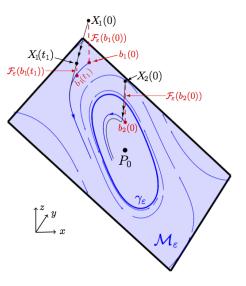
$$h_0(x, y) = -x$$
  

$$h_1(x, y) = -(x + y)$$
  

$$h_2(x, y) = -(x + y) + (ry + px + (s - y)x^2)$$

# Slow-Fast Decomposition of Typical Solutions

- A solution X(t) starts on the fast stable fiber F<sub>ε</sub>(b(0)).
  - It decomposes into a fast component decaying along F<sub>ε</sub>(b(t))
  - and a slow component that moves with the base point b(t).
- Thus  $b(t) \in \mathcal{M}_{\varepsilon}$ represents X(t) faithfully.



# The Slow–Fast System

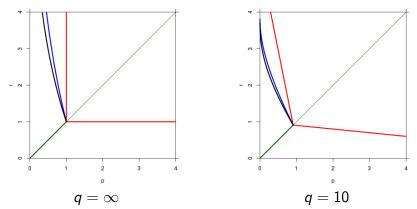
The system on  $\mathcal{M}_{\varepsilon}$  becomes

$$egin{aligned} \dot{x} &= -x - y \ \dot{y} &= ry - ph_arepsilon(x,y) + (s-y)(h_arepsilon(x,y))^2 \end{aligned}$$

- Consider the symmetric case s = 0 and use first order approximation h<sub>ε</sub>(x, y) = −x − ε(x + y) + O(ε<sup>2</sup>).
- The result is very similar to the case  $\varepsilon = 0$ .
- Equilibria at  $P_0 = (0,0)$  for all (p,r) and at  $P_{1,2} = (\pm \sqrt{r-p}, \mp \sqrt{r-p})$  if r > p
- At (p, r) = (<sup>1</sup>/<sub>1+ε</sub>, <sup>1</sup>/<sub>1+ε</sub>), P<sub>0</sub> undergoes a ℤ<sub>2</sub>-symmetric BT bifurcation (organizing center).
- All bifurcation curves emanate from this point.

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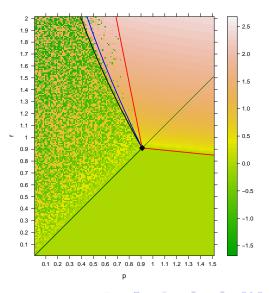
# Bifurcation of the Symmetric Slow–Fast System



- Linear stability analysis is similar (Hopf bifurcations)
- Bogdanov-Takens unfolding is similar (homoclinic bifurcation, saddle-node bifurcation)

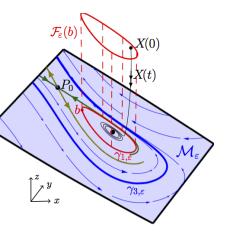
# Slow-Fast System: Limit Cycles

- Integrate the full system for q = 10( $\varepsilon = 0.1$ ) with random initial data and plot  $\overline{x}(p, r) = \limsup_{t} x(t)$ .
- Also shown are the bifurcation curves of the reduced system, using an *O*(ε<sup>3</sup>) approximation of *h*<sub>ε</sub>.



# Basin of Attraction $\mathcal{B}_1$ of $\mathcal{P}_1$

- (*p*, *r*) is between the Hopf curve and the homoclinic bifurcation curve.
- P<sub>1</sub> is stable and is surrounded by an unstable limit cycle γ<sub>1ε</sub> in M<sub>ε</sub>.
- Also shown: a large stable limit cycle  $\gamma_{3\varepsilon}$
- The fast stable fibres with base points on γ<sub>1ε</sub> form the boundary of B<sub>1</sub>.



### Back to the Full System

$$\dot{x} = -x - y$$
  
$$\dot{y} = (r - z^2)y - (p - sz)z$$
  
$$\dot{z} = -qx - qz$$

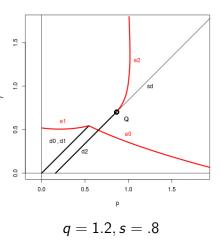
- Trivial equilibrium  $P_0 = (0, 0, 0)$
- Two additional equilibria if  $\rho = s^2 + 4(r p) > 0$ :

$$P_1 = x_1^* \cdot (1, -1, -1), \quad P_2 = x_2^* \cdot (1, -1, -1)$$
 with  $x_{1,2}^* = rac{1}{2} \left( -s \pm \sqrt{
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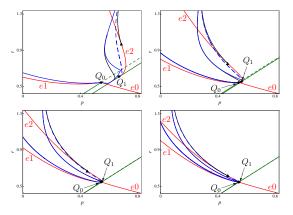
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# Linear Stability

- *P*<sub>1</sub>, *P*<sub>2</sub> exist above d2/sd (*ρ* = 0)
- *P*<sub>0</sub> is stable below **d0/d1** (*r* = *p*) and **e0**
- Hopf bifurcations off P<sub>0,1,2</sub> on e0, e1, e2
- Supercritical on e0, subcritical on e1, sub- to supercritical on e2
- Two organizing centers at  $Q_0$  (where **e0/e1** and **d0/d1** meet) and at  $Q = Q_1$



# Symmetry Breaking Near the Organizing Centers



- Fix q = 1.2 and reduce s → 0.5 → 0.2 → 0.1 → 0.05. The two organizing centers coalesce and the curves e1, e2 collapse into one curve.
- Homoclinic and fold bifurcation curves also collapse.

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### Center Manifolds

- Center manifolds associated with *P<sub>i</sub>* exist near both organizing centers.
- Main steps near  $Q_0 = (\frac{q}{1+q}, \frac{q}{1+q})$ , for  $P_0$  (or  $P_1$ ):
- Shift Q<sub>0</sub> to (0,0). Then p becomes p̃, r becomes r̃. The system is

$$\begin{pmatrix} \dot{x} \\ \dot{y} \\ \dot{z} \end{pmatrix} = A \begin{pmatrix} x \\ y \\ z \end{pmatrix} + \begin{pmatrix} 0 \\ n \\ 0 \end{pmatrix}, \quad A = \begin{pmatrix} -1 & -1 & 0 \\ 0 & \frac{q}{1+q} & -\frac{q}{1+q} \\ -q & 0 & -q \end{pmatrix}$$

where  $n = n(x, y, z, \tilde{p}, \tilde{r}, s, q)$ .

# Center Manifolds II

• Jordan normal form for A is

$$J = F^{-1}AF = \begin{pmatrix} 0 & 1 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & \lambda_3 \end{pmatrix}$$

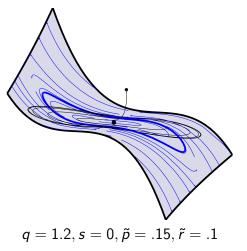
- Transform to Jordan normal form with new variables (u, v, w). The nonlinear term is now complicated but still has rank 1.
- The center manifold is  $\mathcal{W}^c = \{w = h(u, v, ...)\}.$
- There is an invariance equation for *h* that can be exploited.

## Center Manifold III

- Write h = h<sub>2</sub> + h<sub>3</sub> + ... as sum of homogeneous polynomials in u, v, p̃, r̃, with coefficients depending on q, s.
- Consistency check: Transform the expansion for W<sup>c</sup> back to (x, y, z) coordinates and compare to the slow manifold expansion. There is agreement as expected (to suitable powers of ε = q<sup>-1</sup> and of the state variables).

# Dynamics on Center Manifold

- The blue surface is W<sup>c</sup>, the blue streamlines indicate the flow on W<sup>c</sup>, the thick blue line is the stable limit cycle there.
- The black curve is a solution of the full system.

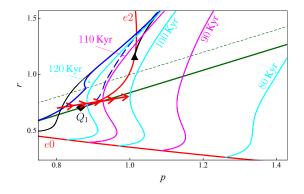


# Region of Validity

- For q < q<sub>c</sub> = q<sub>c</sub>(p, r, s), expect both Lyapunov type numbers to become < 1, and W<sup>c</sup> loses smoothness.
- Our approach to approximate  $q_c$  numerically:
  - Compute the eigenvalues at all three equilibrium points, for the system on W<sup>c</sup> (three pairs).
  - Compare their real parts to λ<sub>3</sub>, the transverse eigenvalue at Q<sub>0</sub> (six ratios).
  - $q pprox q_c$  when one of these ratios becomes 1
- For  $0 , this suggests <math>q_c < 1$ .
- The reduced systems provide reliable qualitative information about the full dynamics, over the entire parameter range.

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# **Outlook: Slow Passage**

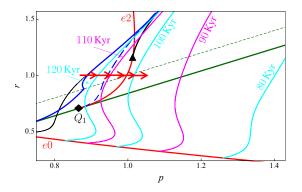


Maasch and Saltzman changed (p, r) slowly from (0.8, 0.7) to (1.0, 0.8) over 2Myr (red path), crossing several bifurcation loci. Limit cycles with the right periods were then observed.

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# Slow Passage



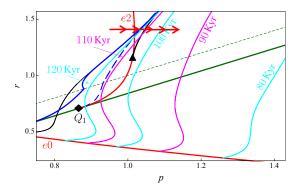
A less complicated path. The fold where  $P_1$  and  $P_2$  disappear is not crossed. The Hopf line is crossed in a subcritical place.

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# Slow Passage



Another alternative. The fold where  $P_1$  and  $P_2$  disappear is not crossed. The Hopf line is crossed in a supercritical place.

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#### Thank You!









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