

Math 5421

An Introduction to
Mathematical Climate Models

Spring 2025

1:25 – 3:20 Tuesdays and Thursdays

Blegen Hall 155

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www-users.cse.umn.edu/~mcgehee/

course website

https://www-users.cse.umn.edu/~mcgehee/Course/Math5421/

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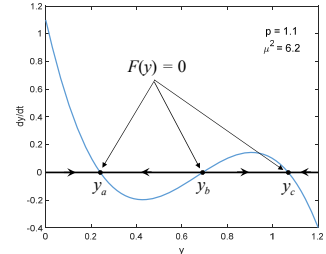
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Assignment 9

Cessi's Model

$\frac{dy}{dt} = -\left(1 + \mu^2 (y-1)^2\right)y + p = F(y)$



The rest points occur at points y where $F(y) = 0$.

The points y_a and y_c are stable, while y_b is unstable.

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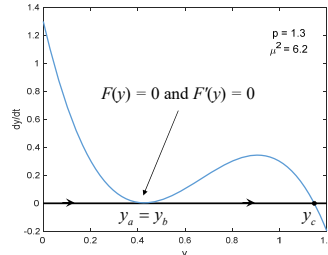
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Assignment 9

Cessi's Model

$\frac{dy}{dt} = -\left(1 + \mu^2 (y-1)^2\right)y + p = F(y)$



A saddle-node occurs where $F(y) = 0$ and $F'(y) = 0$.

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Bifurcation Theory

Reference

H. Kaper & H. Engler, *Mathematics & Climate*, SIAM Philadelphia 2013, Chapter 5.

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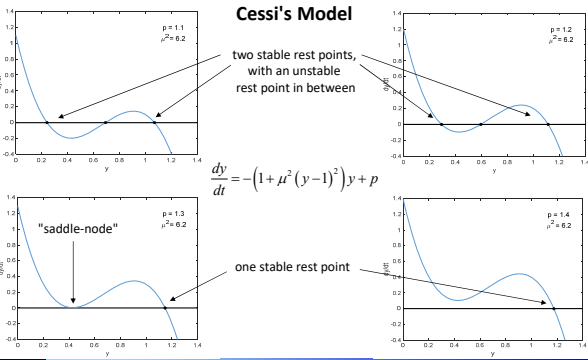
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Bifurcation Theory

Cessi's Model

$\frac{dy}{dt} = -\left(1 + \mu^2 (y-1)^2\right)y + p$



two stable rest points, with an unstable rest point in between

"saddle-node"

one stable rest point

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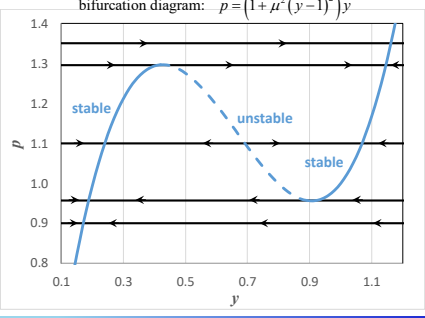
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Bifurcation Theory

Cessi's Model

bifurcation diagram: $p = \left(1 + \mu^2 (y-1)^2\right)y$



stable

unstable

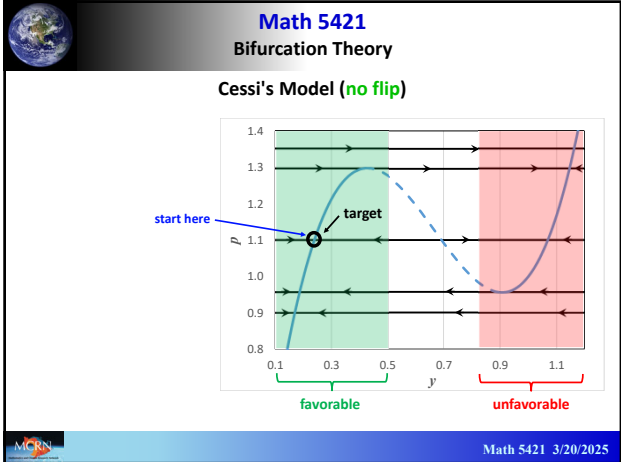
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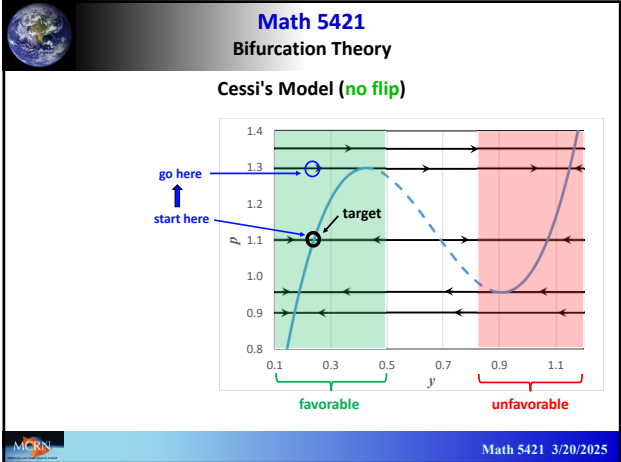
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Richard McGehee, University of Minnesota

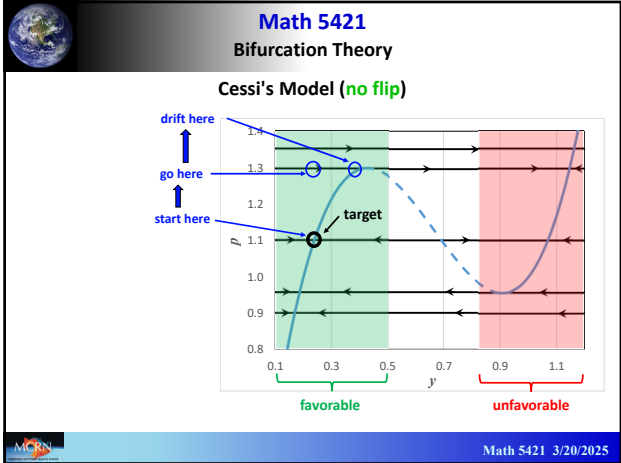
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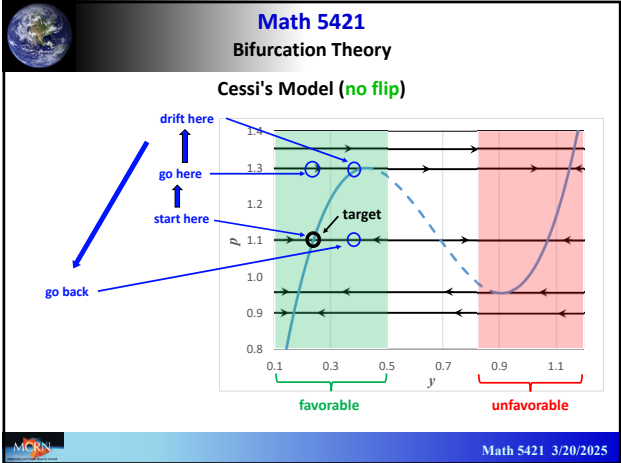
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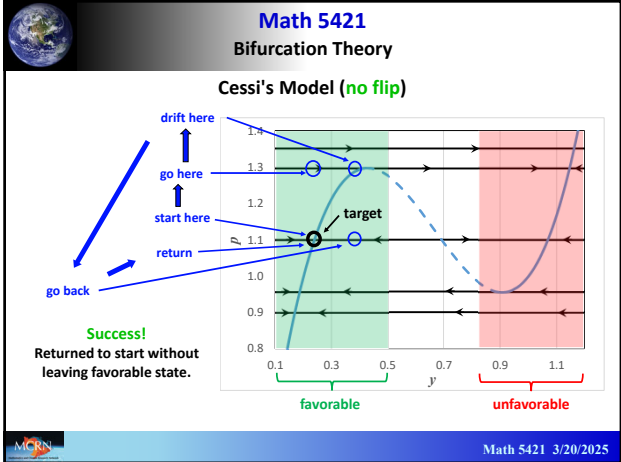
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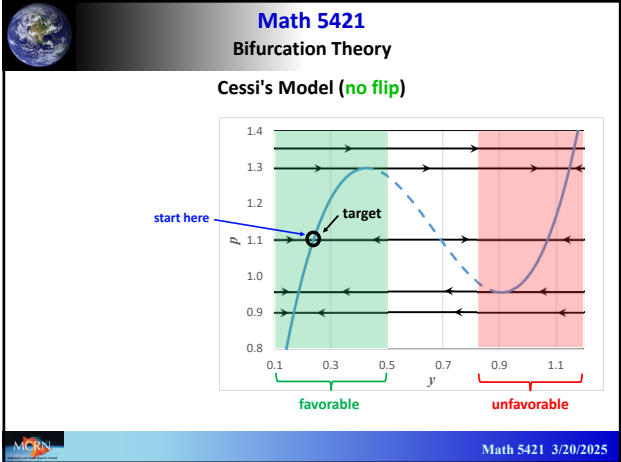
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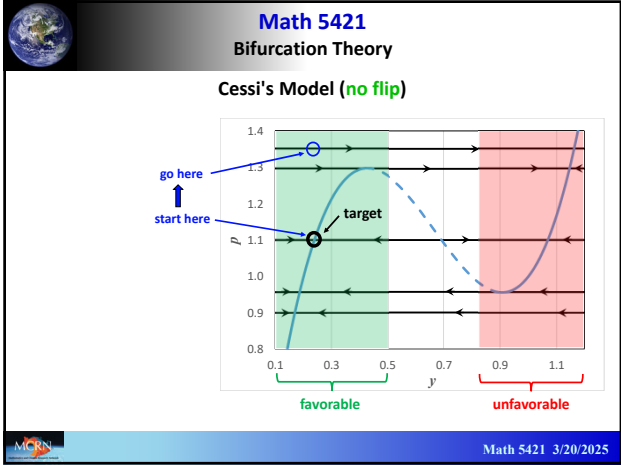
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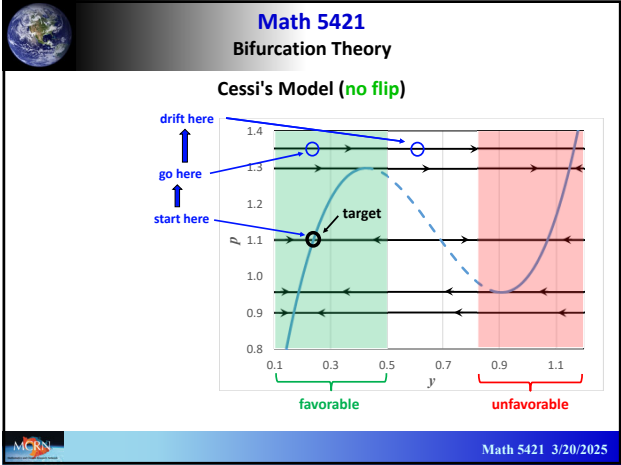
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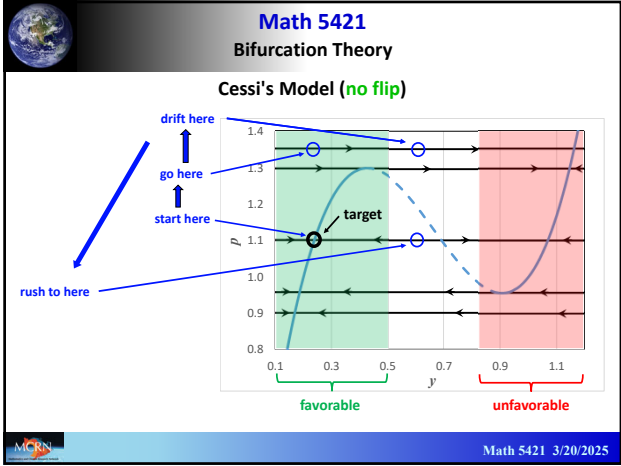
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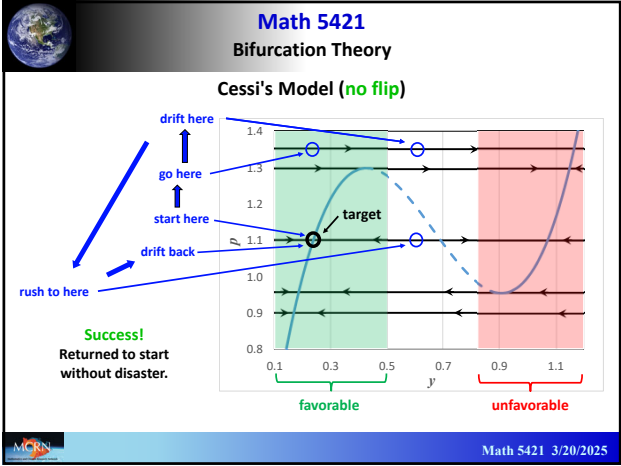
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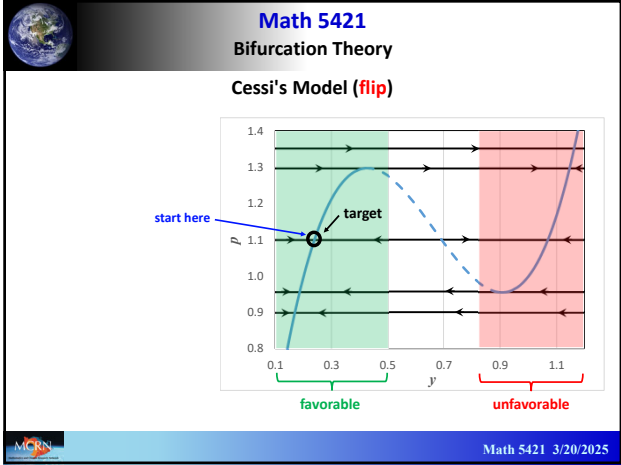
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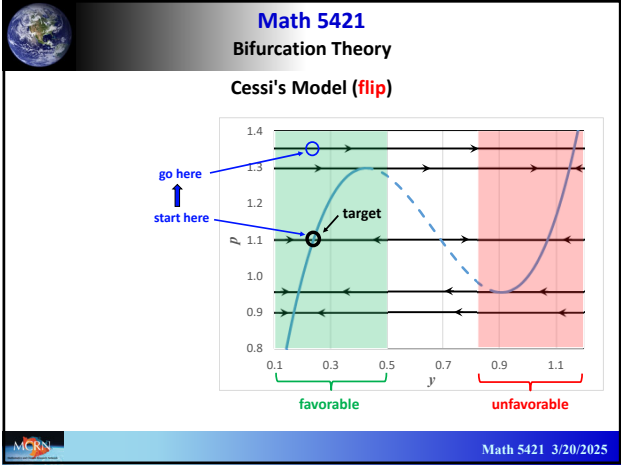
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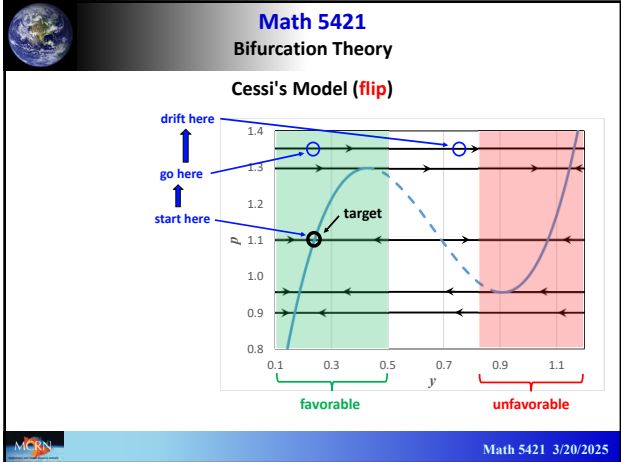
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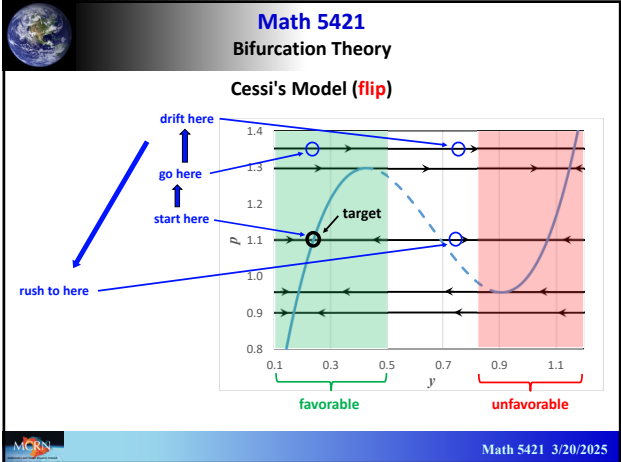
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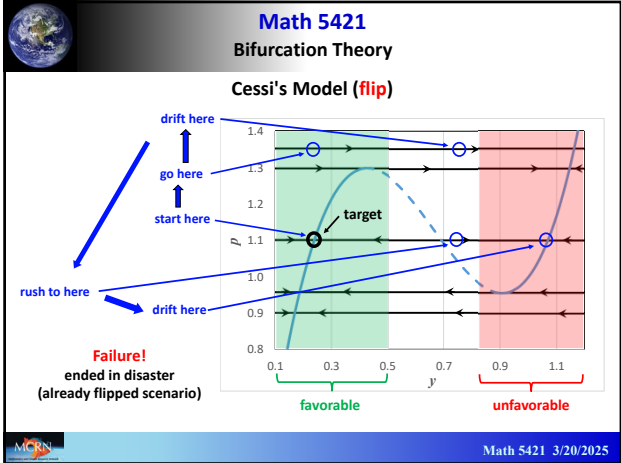
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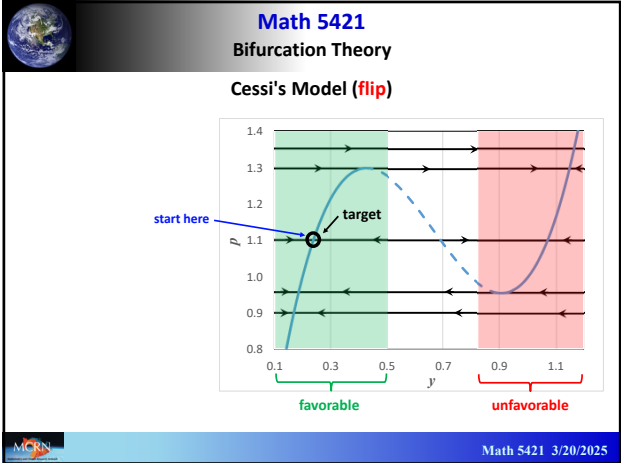
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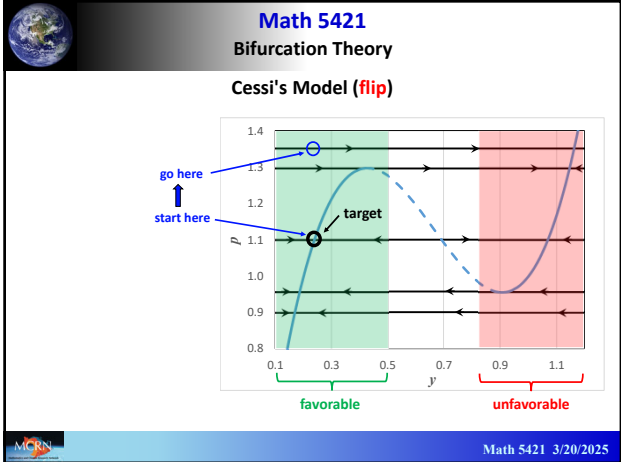
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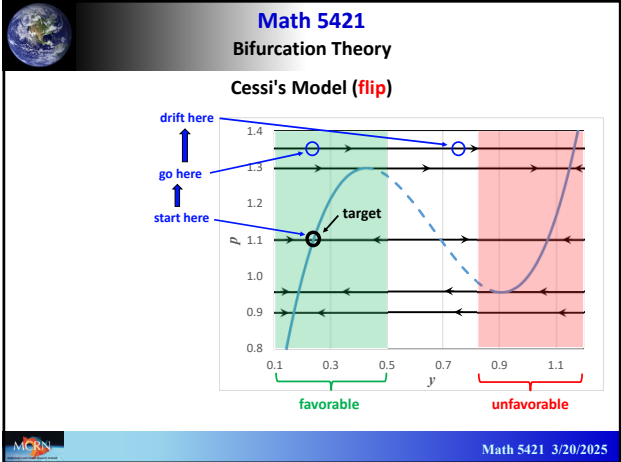
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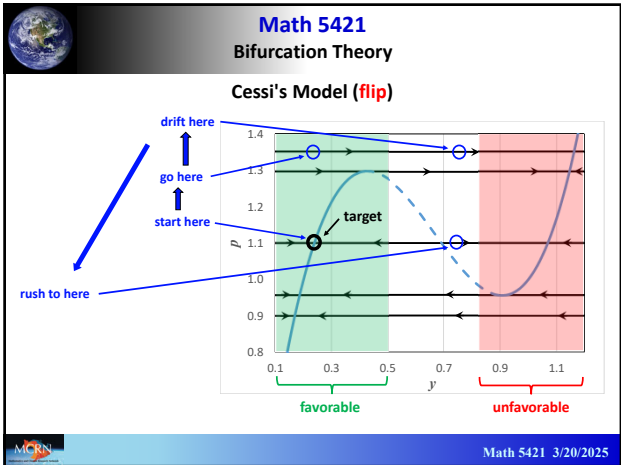
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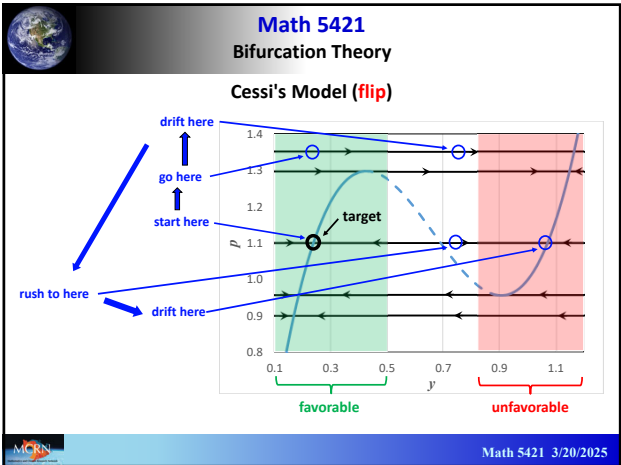
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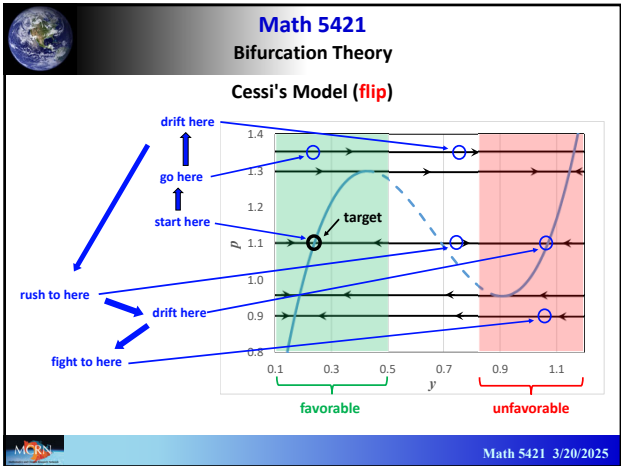
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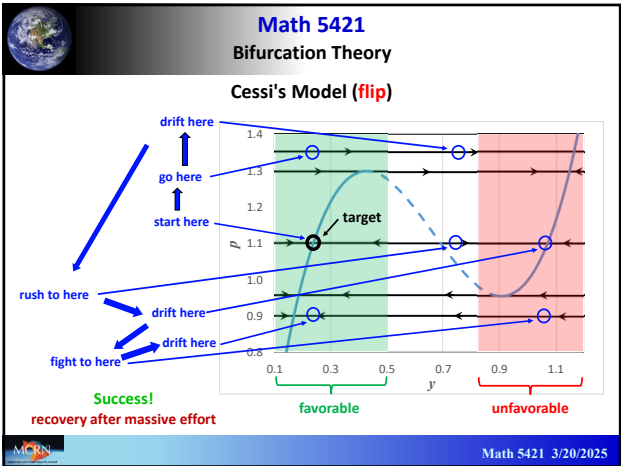
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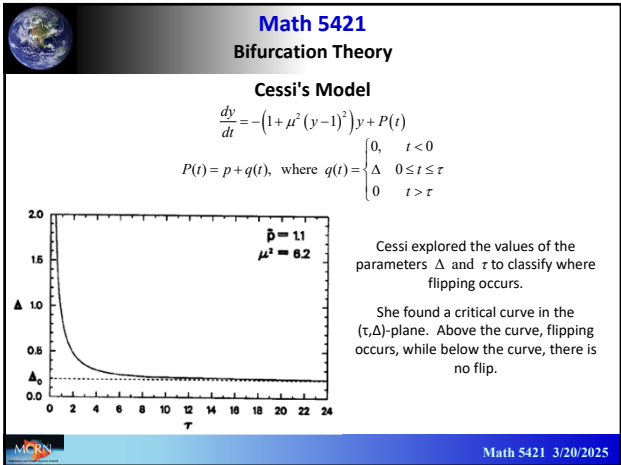
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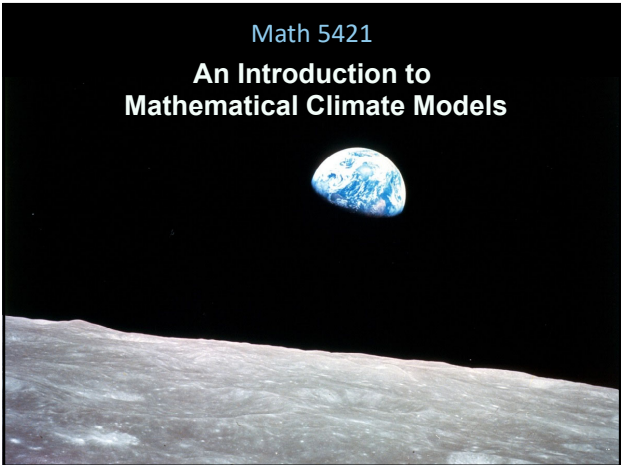
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Welander's Model


Reference

Pierre Welander, A simple heat-salt oscillator,
Dynamics of Atmospheres and Oceans **6** (1982)
233-242.



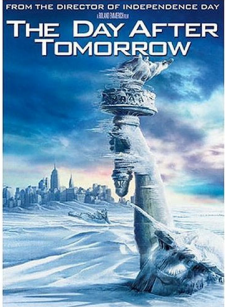
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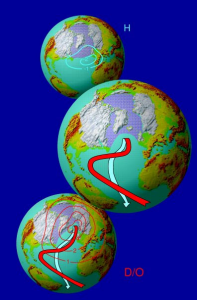


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Welander's Model


Heinrich and Dansgaard-Oeschger events



What did the film get right scientifically?




<http://www.pik-potsdam.de/~stefan/sampleimages.html>




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Welander's Model


 **INDEPENDENT**

April 12, 2018

Gulf Stream current at 'record low' with potentially devastating consequences for weather, warn scientists


The Atlantic meridional overturning circulation (AMOC), the system of currents that transports warm water from the tropics via the Gulf Stream to the North Atlantic, plays a major role in regulating the world's climate.

A fictional depiction of AMOC's collapse was portrayed in *The Day After Tomorrow*, and while the film's events were exaggerated, scientists say severe weather events are likely to result from the ongoing changes.



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Welander's Model

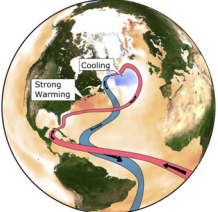
The Washington Post


April 11, 2018

The oceans' circulation hasn't been this sluggish in 1,000 years. That's bad news.

The Atlantic Ocean circulation that carries warmth into the Northern Hemisphere's high latitudes is slowing down because of climate change, a team of scientists asserted Wednesday, suggesting one of the most feared consequences is already coming to pass.


[Nature](#) volume 556, pages191–196 (2018)





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Welander's Model

Current Atlantic Meridional Overturning Circulation weakest in last millennium


The Atlantic Meridional Overturning Circulation (AMOC)—one of Earth's major ocean circulation systems—redistributes heat on our planet and has a major impact on climate. Here, we compare a variety of published proxy records to reconstruct the evolution of the AMOC since about AD 400. A fairly consistent picture of the AMOC emerges: **after a long and relatively stable period, there was an initial weakening starting in the nineteenth century, followed by a second, more rapid, decline in the mid-twentieth century, leading to the weakest state of the AMOC occurring in recent decades.**

NATURE GEOSCIENCE | VOL 14 | MARCH 2021 | 118–120 |
www.nature.com/naturegeoscience118



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Welander's Model

The Day After Tomorrow/Film synopsis

After climatologist Jack Hall (Dennis Quaid) is largely ignored by U.N. officials when presenting his environmental concerns, his research proves true when an enormous "superstorm" develops, setting off catastrophic natural disasters throughout the world. Trying to get to his son, Sam (Jake Gyllenhaal), who is trapped in New York with his friend Laura (Emmy Rossum) and others, Jack and his crew must travel by foot from Philadelphia, braving the elements, to get to Sam before it's too late.


Google Search





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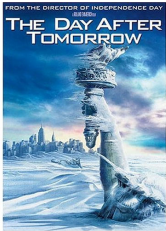
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Welander's Model


Dansgaard-Oeschger Events

"Global warming" can cause the Northern Hemisphere to cool.

Melting ice can lower the salinity of the North Atlantic, causing a decrease in the flow of the Atlantic Meridional Overturning Circulation (AMOC), slowing the heat transfer to the Northern Hemisphere.


This phenomenon is believed to have caused the Younger Dryas.





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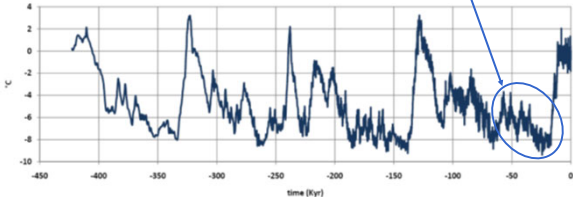
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Recent (last 400 Kyr) Temperature Cycles
Vostok Ice Core Data

What's with these oscillations?




J.R. Petit, et al (1999) Climate and atmospheric history of the past 420,000 years from the Vostok ice core, Antarctica, *Nature* 399, 429-436.



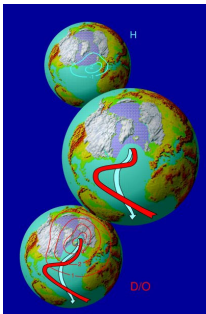
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Heinrich and Dansgaard-Oeschger events




<http://www.pik-potsdam.de/~stefan/sampleimages.html>



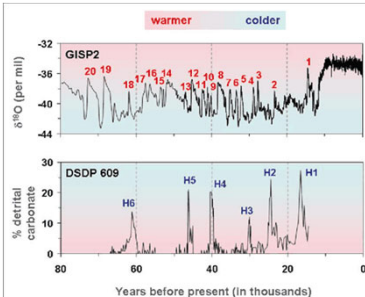
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Heinrich and Dansgaard-Oeschger events




<http://www.ncdc.noaa.gov/paleo/abrupt/data3.html>



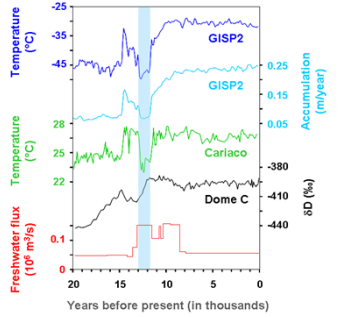
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Welander's Model


The Younger Dryas



Mountain Avens
(*Dryas octopetala*)




<https://www.ncdc.noaa.gov/abrupt-climate-change/the120Younger120Dryas>



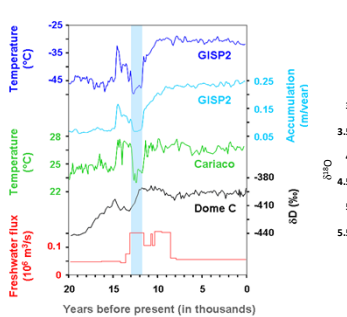
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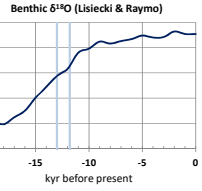
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The Younger Dryas



Only a minor impact on ice volume.


Benthic $\delta^{18}O$ (Lisiecki & Raymo)





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Welander's Model

What caused the Dansgaard-Oeschger Oscillations?

For glacial cycles, there is overwhelming evidence that they are "paced" by the Milankovitch cycles.


None of the Milankovitch cycles has periods short enough to trigger the Dansgaard-Oeschger events, and we can't think of any other external triggers.

Could they occur spontaneously?



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Welander's Model


What caused the Dansgaard-Oeschger oscillations?

They could be self-oscillations in the natural dynamics of ocean circulation.

Pierre Welander, A simple heat-salt oscillator, *Dynamics of Atmospheres and Oceans* 6 (1982) 233-242.




R/V Weelander is a 23-foot-long Beach Master work boat, informally named in honor of Professor Pierre Welander (1925—1996).



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Welander's Model


What caused the Dansgaard-Oeschger oscillations?

They could be self-oscillations in the natural dynamics of ocean circulation.

Welander constructed a simple (*conceptual!*) box model of ocean circulation and showed that the interactions of temperature and salinity with the atmosphere, the surface ocean, and the deep ocean could create self-oscillations.




R/V Weelander is a 23-foot-long Beach Master work boat, informally named in honor of Professor Pierre Welander (1925—1996).



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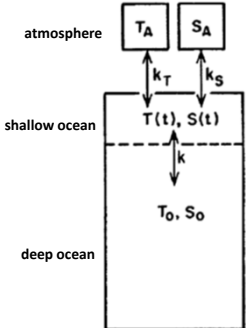


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Welander's Model


Welander's model divides the Earth into three components: the "atmosphere", the "shallow ocean", and the "deep ocean".

The "shallow ocean" is represented by its temperature T and its salinity S , both of which vary with time.

The "atmosphere" is a fictitious entity encompassing and simplifying all the interactions of the shallow ocean with the rest of the planet. It is assumed to have an "effective" temperature of T_A and an "effective" salinity of S_A .




The diagram shows three layers: atmosphere, shallow ocean, and deep ocean. The atmosphere is represented by two boxes labeled T_A and S_A . The shallow ocean is represented by a box labeled $T(t), S(t)$. The deep ocean is represented by a box labeled T_0, S_0 . Arrows indicate interactions: k_T and k_S between atmosphere and shallow ocean, and k between shallow and deep ocean.



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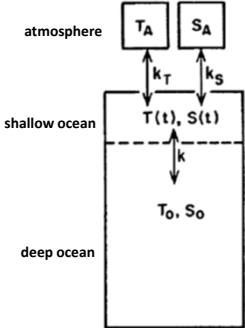
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Welander's Model

The "deep ocean" is assumed to have a constant temperature T_0 and a constant salinity S_0 .


The interaction between the shallow ocean and the atmosphere is modeled as a dynamic transfer of relaxation to equilibrium:

$$\frac{dT}{dt} = k_T(T_A - T),$$
$$\frac{dS}{dt} = k_S(S_A - S),$$

where k_T and k_S are constants.




The diagram shows three layers: atmosphere, shallow ocean, and deep ocean. The atmosphere is represented by two boxes labeled T_A and S_A . The shallow ocean is represented by a box labeled $T(t), S(t)$. The deep ocean is represented by a box labeled T_0, S_0 . Arrows indicate interactions: k_T and k_S between atmosphere and shallow ocean, and k between shallow and deep ocean.



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Dynamical Systems

How do we analyze equations like these?

$$\frac{dT}{dt} = k_T(T_A - T)$$
$$\frac{dS}{dt} = k_S(S_A - S)$$


Dynamical Systems

H. Kaper & H. Engler, *Mathematics & Climate*, SIAM Philadelphia 2013, Chapter 4.



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Dynamical Systems


Discussion
How do we solve this differential equation?

$$\frac{dT}{dt} = k_T(T_A - T)$$



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Dynamical Systems

Discussion
How do we solve this differential equation?

"separate variables"


$$\frac{dT}{T_A - T} = k_T dt \quad \frac{dT}{T - T_A} = -k_T dt \quad \int \frac{dT}{T - T_A} = \int -k_T dt$$
$$\ln(T - T_A) = -k_T t + c$$

arbitrary constants

$$T - T_A = e^{-k_T t + c} = e^c e^{-k_T t} = C e^{-k_T t}$$


$$T(t) = T_A + C e^{-k_T t}$$

general solution



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Dynamical Systems

Discussion
How do we solve this differential equation?

$$\frac{dT}{dt} = k_T(T_A - T)$$


$$T(t) = T_A + C e^{-k_T t}$$

general solution

check


$$\frac{dT}{dt} = \frac{d}{dt}(T_A + C e^{-k_T t}) = 0 + C e^{-k_T t} (-k_T) = -k_T C e^{-k_T t}$$
$$k_T(T_A - T) = k_T(T_A - (T_A + C e^{-k_T t})) = -k_T C e^{-k_T t}$$

checks!



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Dynamical Systems

Discussion


$$\frac{dT}{dt} = k_T(T_A - T)$$

Find an equilibrium solution.



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Dynamical Systems

Discussion


$$\frac{dT}{dt} = k_T(T_A - T)$$

Find an equilibrium solution.

Answer


$$0 = \frac{dT}{dt} = k_T(T_A - T)$$

$$T(t) = T_A$$



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Dynamical Systems

Discussion

$$\frac{dT}{dt} = k_T(T_A - T)$$


equilibrium solution: $T(t) = T_A$

Is it stable?



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Discussion

$$\frac{dT}{dt} = k_T(T_A - T)$$

equilibrium solution: $T(t) = T_A$


Is it stable?

Yes!

general solution: $T(t) = T_A + Ce^{-k_T t}$


$$\lim_{t \rightarrow \infty} T(t) = T_A$$

Note that we are assuming that k_T is positive.



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Dynamical Systems

Discussion


How do we solve this "initial value problem"?

$$\frac{dT}{dt} = k_T(T_A - T), \quad \text{equation}$$
$$T = T_0 \quad \text{when } t = 0. \quad \text{initial value}$$



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Dynamical Systems

Discussion


How do we solve this "initial value problem"?

$$\frac{dT}{dt} = k_T(T_A - T),$$
$$T = T_0 \quad \text{when } t = 0.$$

general solution: $T(t) = T_A + Ce^{-k_T t}$


$$T(0) = T_A + Ce^{-k_T \cdot 0} = T_A + C = T_0$$
$$C = T_0 - T_A$$
$$T(t) = T_A + Ce^{-k_T t}$$

$$T(t) = T_A + (T_0 - T_A)e^{-k_T t}$$



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Dynamical Systems

Discussion

How do we solve this "initial value problem"?

$$\frac{dT}{dt} = k_T(T_A - T),$$
$$T = T_0 \quad \text{when } t = 0.$$


solution: $T(t) = T_A + (T_0 - T_A)e^{-k_T t}$

check:

$$T'(t) = -k_T(T_0 - T_A)e^{-k_T t}$$
$$k_T(T_A - T) = k_T(T_A - (T_0 - T_A)e^{-k_T t}) = -k_T(T_0 - T_A)e^{-k_T t}$$


equal

$$T(0) = T_A + (T_0 - T_A)e^{-k_T \cdot 0} = T_A + (T_0 - T_A) = T_0 \quad \text{checks!}$$



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Dynamical Systems

Discussion

How do we solve this "initial value problem"?


$$\frac{dT}{dt} = k_T(T_A - T), \quad \text{equation}$$
$$T = T_0 \quad \text{when } t = 0. \quad \text{initial value}$$

alternative approach:
Introduce the departure from equilibrium

$$y = T - T_A, \quad T = T_A + y$$
$$\frac{dy}{dt} = \frac{dT}{dt} = k_T(T_A - T) = k_T(-y) = -k_T y$$


new initial value problem

$$\frac{dy}{dt} = -k_T y,$$
$$y = T_0 - T_A \quad \text{when } t = 0.$$



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Discussion


How do we solve this "initial value problem"?

$$\frac{dy}{dt} = -k_T y,$$
$$y = T_0 - T_A \quad \text{when } t = 0.$$



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Dynamical Systems

Discussion

How do we solve this "initial value problem"?

$\frac{dy}{dt} = -k_T y,$
 $y = T_0 - T_A \text{ when } t = 0.$

"separate variables"

$\frac{dy}{y} = -k_T dt$
 $\int_{T_0-T_A}^y \frac{dy}{y} = -k_T \int_0^t dt$
 $\ln y \Big|_{T_0-T_A}^y = -k_T t \Big|_0^t$
 $\ln y - \ln(T_0 - T_A) = -k_T t$
 $\frac{y}{T_0 - T_A} = e^{-k_T t}$
 $y(t) = (T_0 - T_A)e^{-k_T t}$


$y \rightarrow 0 \text{ as } t \rightarrow 0$

stable

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Dynamical Systems


Summary

$\frac{dT}{dt} = k_T(T_A - T)$
This differential equation has a stable equilibrium solution $T = T_A$.
Remember Welander?
 T is the Welander temperature.
Salinity:
 $\frac{dS}{dt} = k_S(S_A - S)$
This differential equation also has a stable equilibrium solution $S = S_A$.

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Dynamical Systems

Welander's Model

The interaction between the shallow ocean and the atmosphere is modeled as a dynamic transfer of relaxation to equilibrium:
 $\frac{dT}{dt} = k_T(T_A - T),$
 $\frac{dS}{dt} = k_S(S_A - S),$
where k_T and k_S are positive constants.
This system has a stable equilibrium point at $(T, S) = (T_A, S_A).$

atmosphere

T_A S_A

$\uparrow k_T$ $\uparrow k_S$

$T(t), S(t)$

$\downarrow k$

T_0, S_0


shallow ocean

deep ocean

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Dynamical Systems

Welander's Model

Atmosphere - Ocean Surface Interaction

system of differential equations

$\begin{cases} \frac{dT}{dt} = k_T(T_A - T) = -k_T(T - T_A), & T(0) = T_0, \\ \frac{dS}{dt} = k_S(S_A - S) = -k_S(S - S_A), & S(0) = S_0. \end{cases}$

initial condition

differential equation

$\frac{d}{dt} \begin{bmatrix} T \\ S \end{bmatrix} = \begin{bmatrix} -k_T & 0 \\ 0 & -k_S \end{bmatrix} \begin{bmatrix} T - T_A \\ S - S_A \end{bmatrix}, \quad \begin{bmatrix} T \\ S \end{bmatrix}(0) = \begin{bmatrix} T_0 \\ S_0 \end{bmatrix}.$

initial condition


singular! ONE vector equation

$\begin{bmatrix} T \\ S \end{bmatrix}(t) = \begin{bmatrix} T(t) \\ S(t) \end{bmatrix} = \begin{bmatrix} T_A + (T_0 - T_A)e^{-k_T t} \\ S_A + (S_0 - S_A)e^{-k_S t} \end{bmatrix}$

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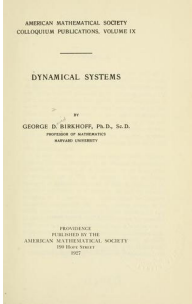
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Dynamical Systems

Dynamical Systems





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https://en.wikipedia.org/wiki/Henri_Poincar%C3%A9

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