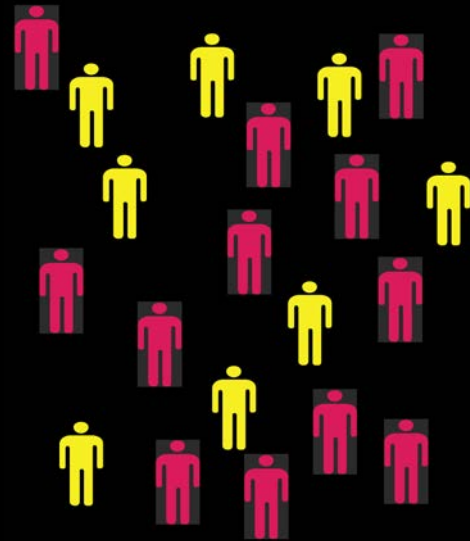
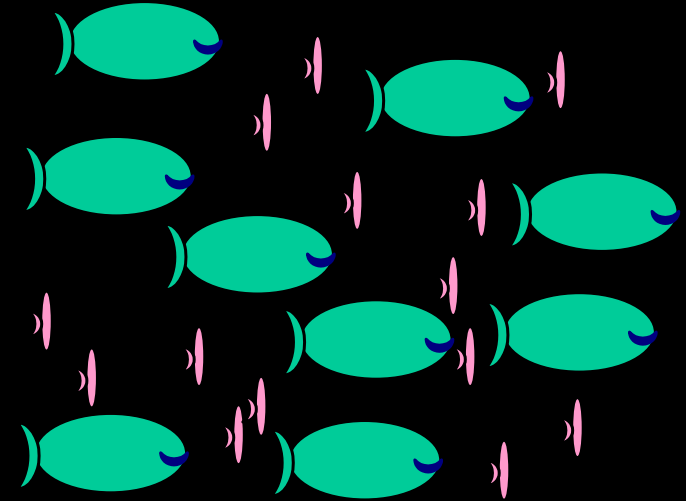


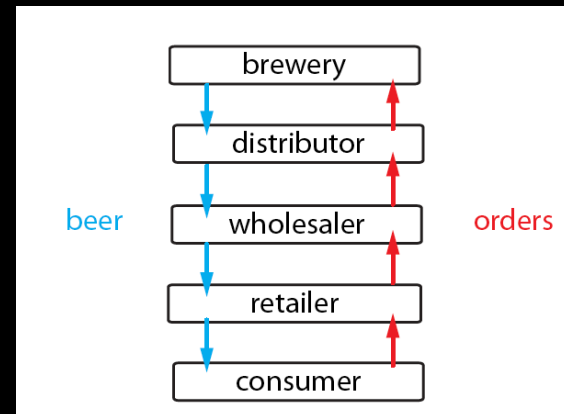
Teaching Dynamics to Biology Undergrads



susceptible
infected



Alan Garfinkel
Professor of Medicine
and Integrative Biology and Physiology
UCLA



OLSUME Oct 10 2023

HHMI



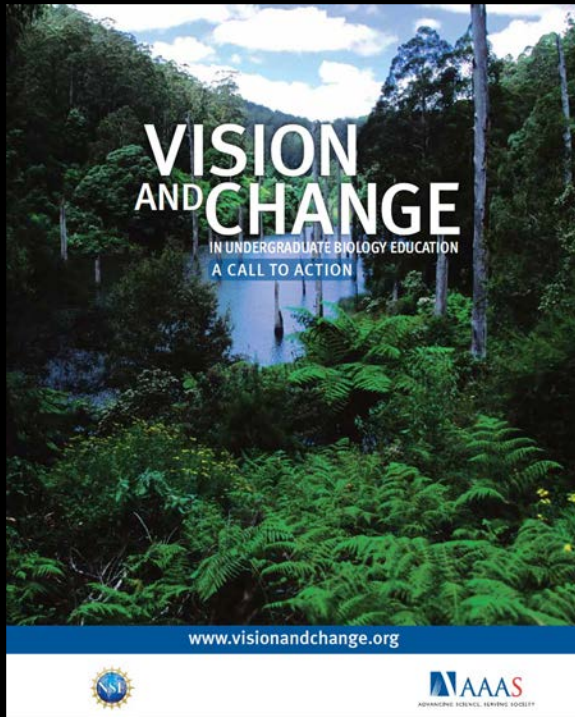
2009

Scientific Foundations for Future Physicians

“Undergraduate Competencies”

“Quantify and interpret changes in dynamical systems

- positive or negative feedback.
- **explain** how feedback mechanisms lead to damped oscillations **in glucose levels. ...**
- **Use the principles of feedback control to explain how specific homeostatic and reproductive systems maintain the internal environment and identify (1) how perturbations in these systems may result in disease and (2) how homeostasis may be changed by disease.”**



NSF
AAAS

2011

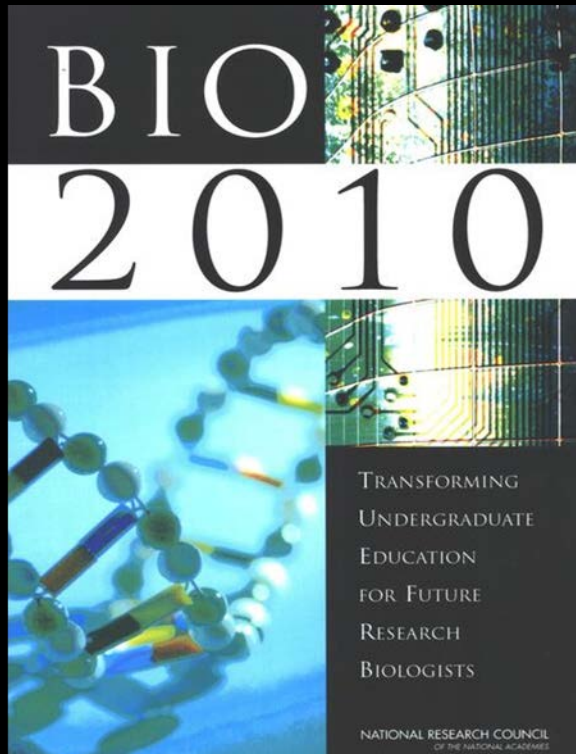
Alan Garfinkel UCLA

“Studying biological dynamics requires a greater emphasis on modeling, computation, and data analysis tools.

- the dynamic modeling of neural networks helps biologists understand emergent properties in neural systems.

- Systems approaches to examining population dynamics in ecology also require sophisticated modeling.

**what kind of math do we need to
study feedback loops?**



National Academy
of Sciences

“Mathematical/computational methods should be taught, but on a need-to know basis....”

The emphasis should not be on the methods per se, but rather on how the methods elucidate the biology.

...ordinary differential equations (made tractable and understandable via Euler’s method without any formal course in differential equations required)... “

Shortcomings of current Math department offerings

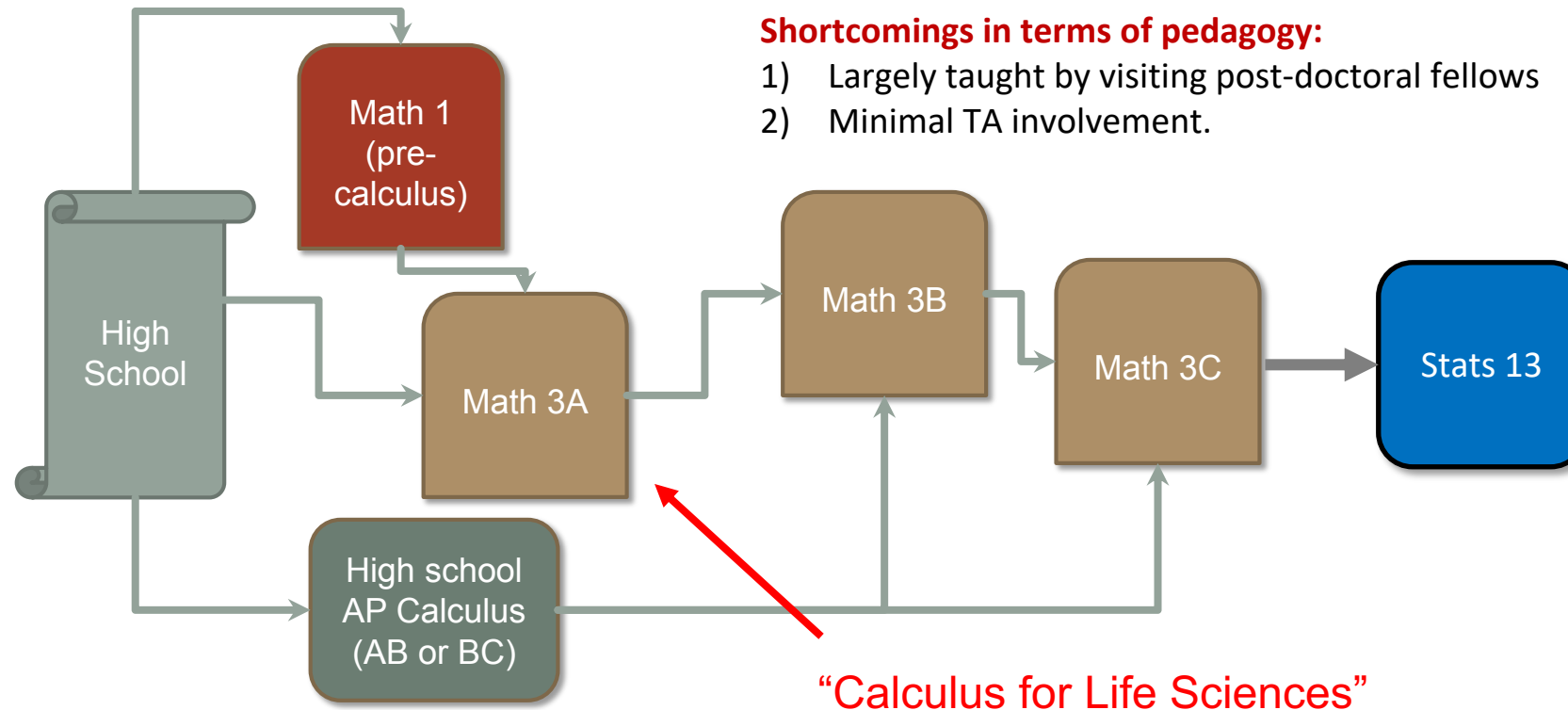


Shortcomings in terms of content:

- 1) Lack of biologically relevant examples and mathematical approaches.
- 2) No computational lab.

Shortcomings in terms of pedagogy:

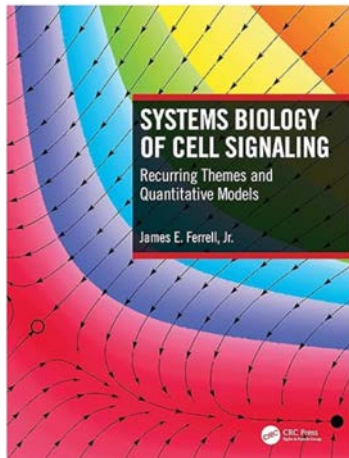
- 1) Largely taught by visiting post-doctoral fellows
- 2) Minimal TA involvement.





Life Sciences want:

- multivariable non-linear differential equations
- as models for biological phenomena
- studied through computer simulation and dynamical systems theory (equilibrium points, etc.)



our Instructors (research postdocs) cannot teach this.

our Grad students cannot TA this.



Do not agree with our emphasis on dynamics and modeling.



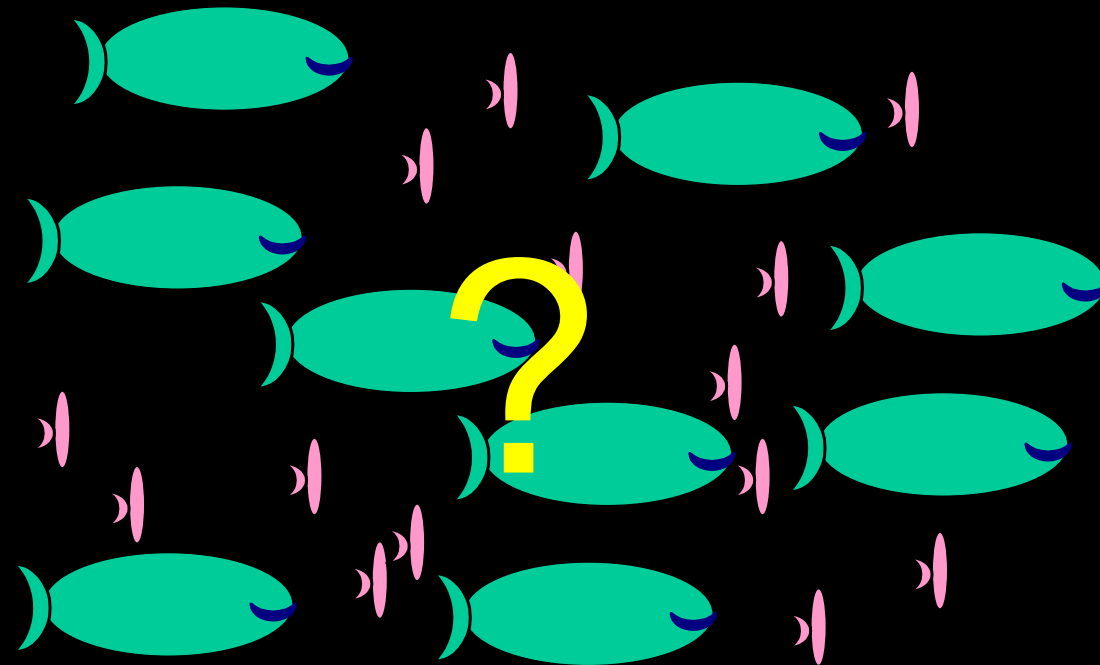
Strongly question whether the class would prepare students for Physics.

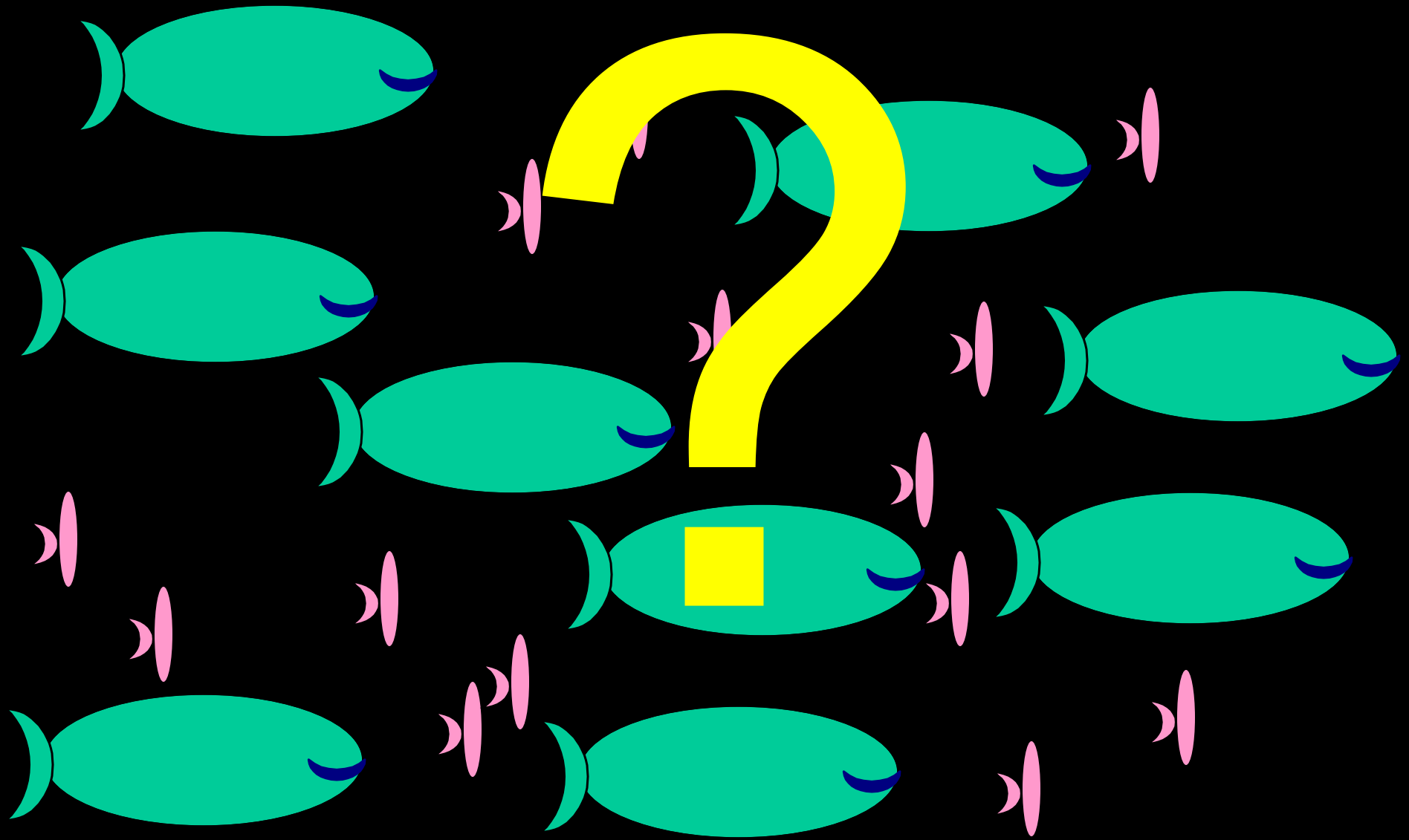


(to the Senior Dean for Life Sciences): “Victoria, computers play no role in mathematics”

UCLA LS30

- freshman biology students
- no prerequisite
- replaces “Calculus for Life Sciences”
- currently enrolling ~2000 students/yr

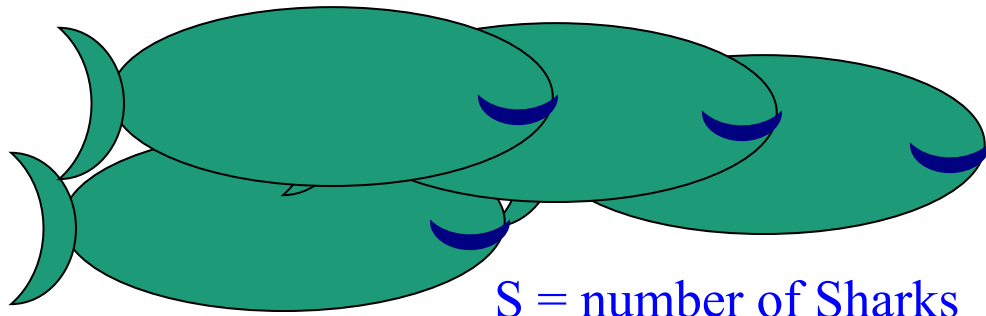




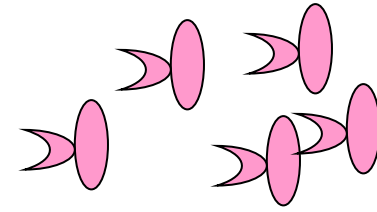
Why do we need mathematical modeling?

because you can't figure out
the behavior of a feedback
system by “intuition”

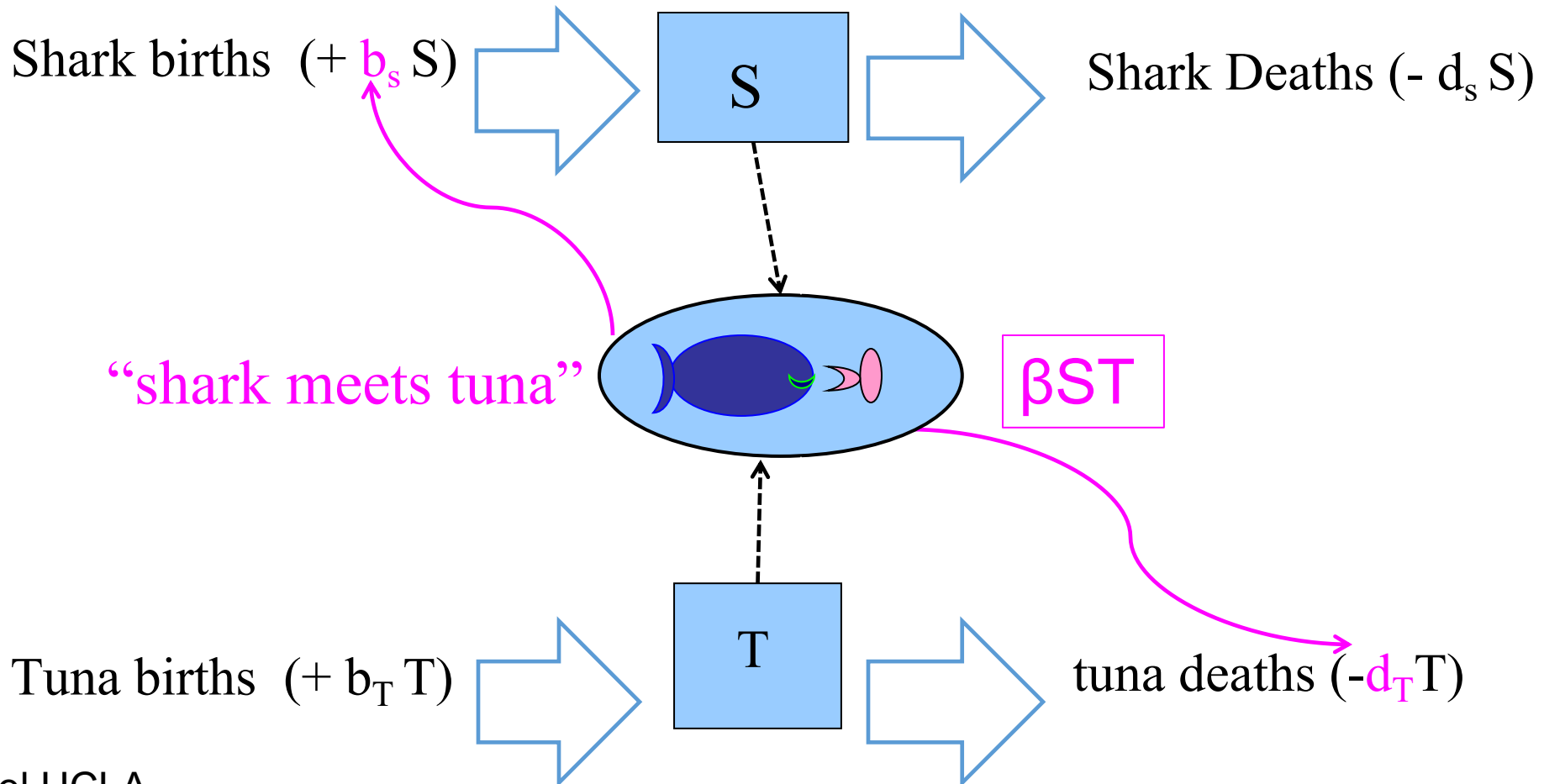
How to make a model



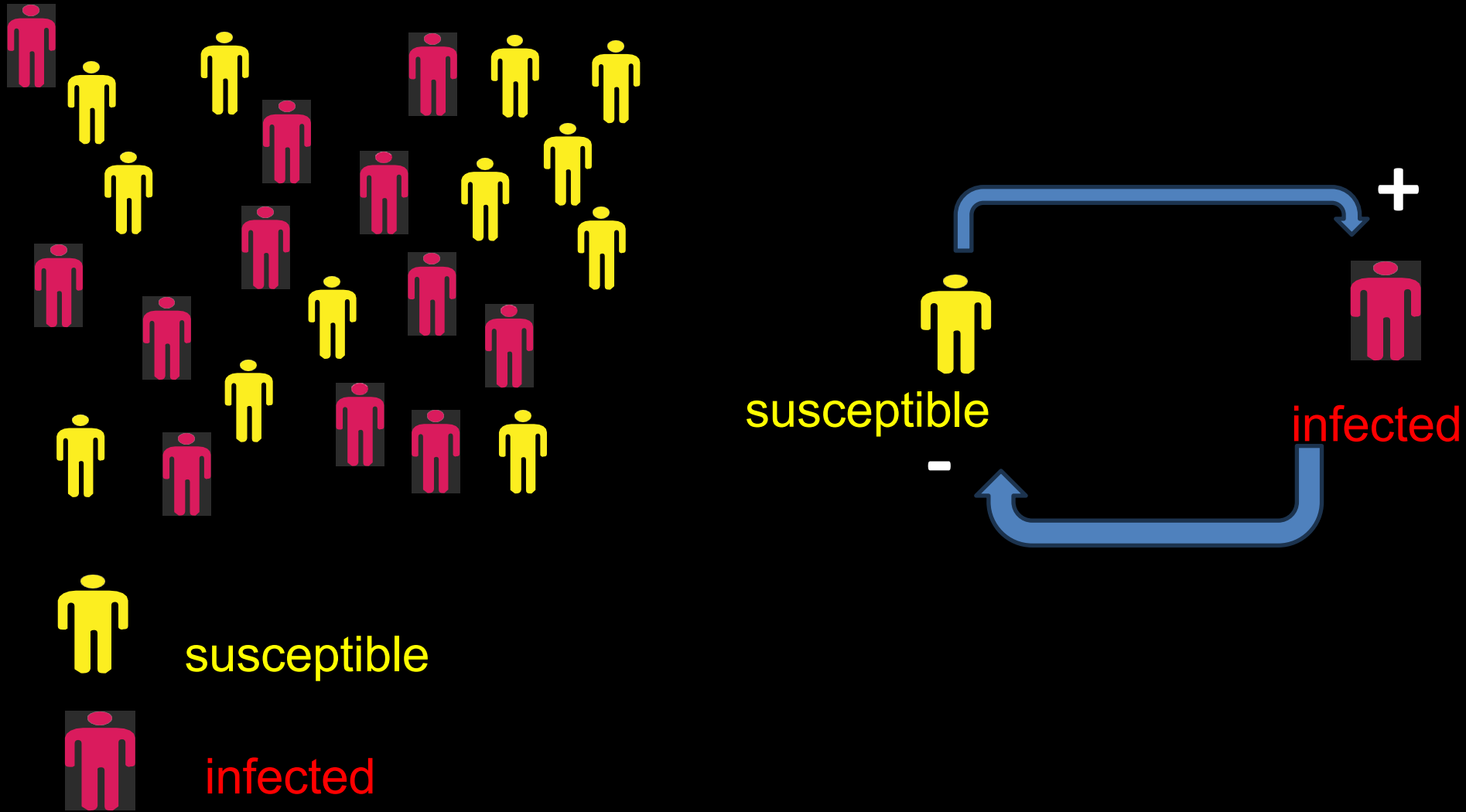
$S = \text{number of Sharks}$



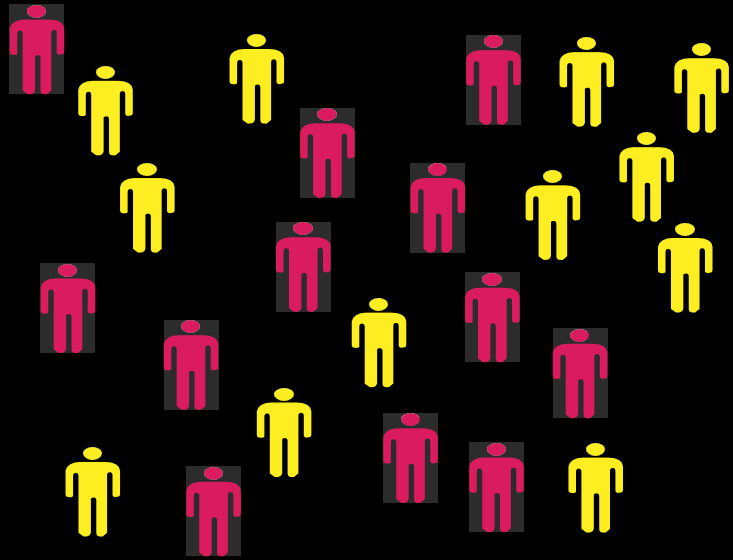
$T = \text{number of Tuna}$



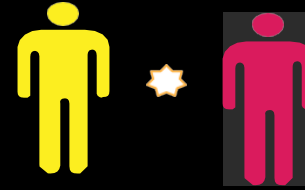
Epidemiology: feedback loops



Epidemiology



$$S' = b - mS - \beta SI$$
$$I' = -mI - dI + \beta SI$$



$$\beta * S * I$$

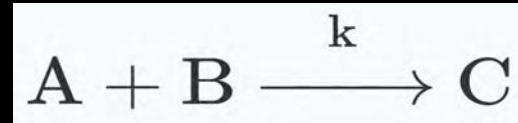
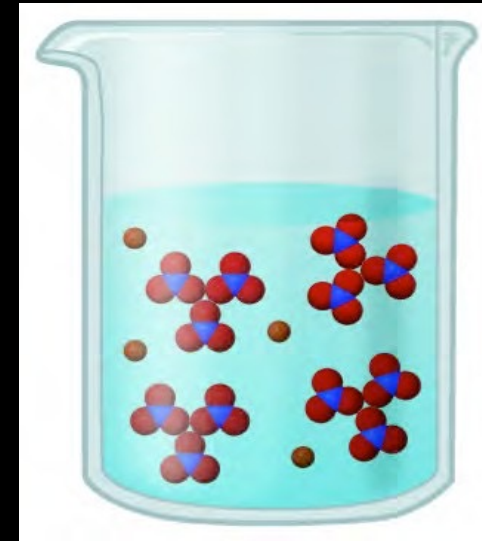
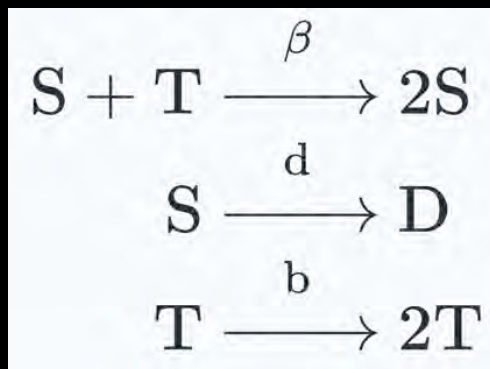


susceptible



infected

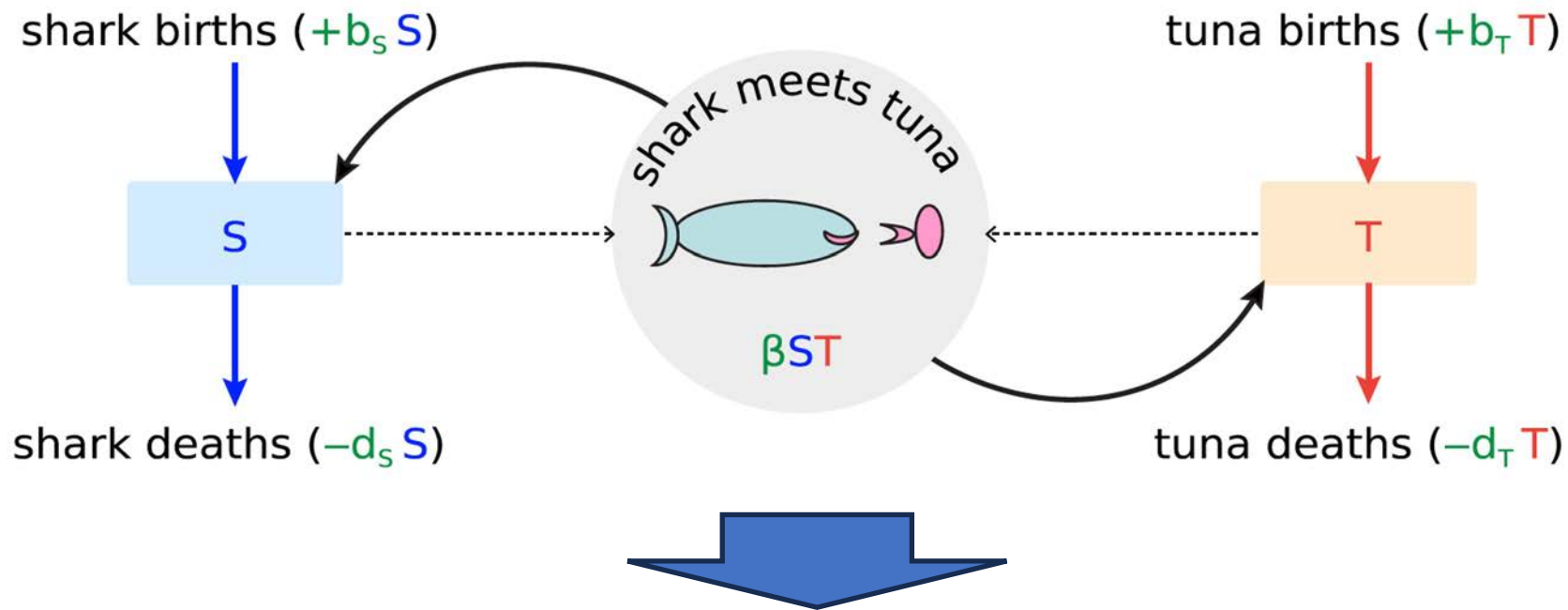
How is shark-tuna model like a chemical reaction?



$$A' = -kAB$$

$$B' = -kAB$$

$$C' = +kAB$$



“Change Equation”

“the change in S”

$$S' = \underbrace{+b_s S}_{\text{shark birth}} \quad \underbrace{-d_s S}_{\text{shark death}} \quad \underbrace{+k\beta ST}_{\text{shark eats tuna}}$$

“the change in T”

$$T' = \underbrace{+b_T T}_{\text{tuna birth}} \quad \underbrace{-d_T T}_{\text{tuna death}} \quad \underbrace{-\beta ST}_{\text{shark eats tuna}}$$

What do we do with a change equation?

“the change in S”

$$S' = +b_S S \quad -d_S S \quad +k\beta ST$$

shark birth shark death shark eats tuna

“the change in T”

$$T' = +b_T T \quad -d_T T \quad -\beta ST$$

tuna birth tuna death shark eats tuna

No symbolic manipulations!

$$\frac{dy}{dx} = 3y + 4e^{3x} \cos x$$

$$\frac{d}{dx} 4e^{3x} \sin x \stackrel{?}{=} 3(4e^{3x} \sin x) + 4e^{3x} \cos x$$

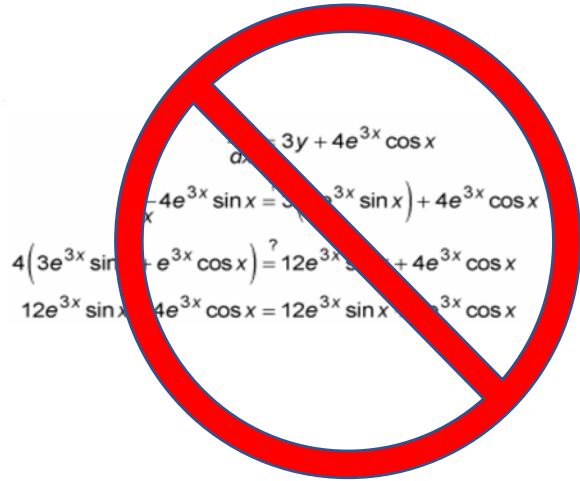
$$(3e^{3x} \sin x + e^{3x} \cos x) \stackrel{?}{=} 12e^{3x} \sin x + 4e^{3x} \cos x$$

$$e^{3x} \sin x + 4e^{3x} \cos x = 12e^{3x} \sin x + e^{3x} \cos x$$

The Shark-Tuna equations

$$S' = -d_S S + k\beta ST$$

$$T' = b_T T - \beta ST$$



have no analytic solution



Calculus: Fail

All the procedural tricks that constitute the standard approach to “Calculus” go out the window on the first day of real life

- infinitesimal limits and series; limit laws
- trigonometric identities
- procedural rules for differentiating famous functions
- L’Hopital’s rule
- integrals as anti-derivatives
- Integration by parts
- integration by substitution of variables
-

Calculus from Hell

Q: What is a derivative?

A: “yeah, I took calculus. Like, the derivative of X^2 is $2X$. You put the exponent in front of the variable, and then you have to drop the exponent by 1”

Michael C. Reed

DUKE UNIVERSITY

1987!!!

The first
problem on the exam was to differentiate $x^{\sin x}$ and I
said, “*That* is what is wrong with calculus.”

*Why should I spend all my time
worrying about how to differentiate
stupid looking functions like that? No
function like that has ever occurred in
the history of physics.*

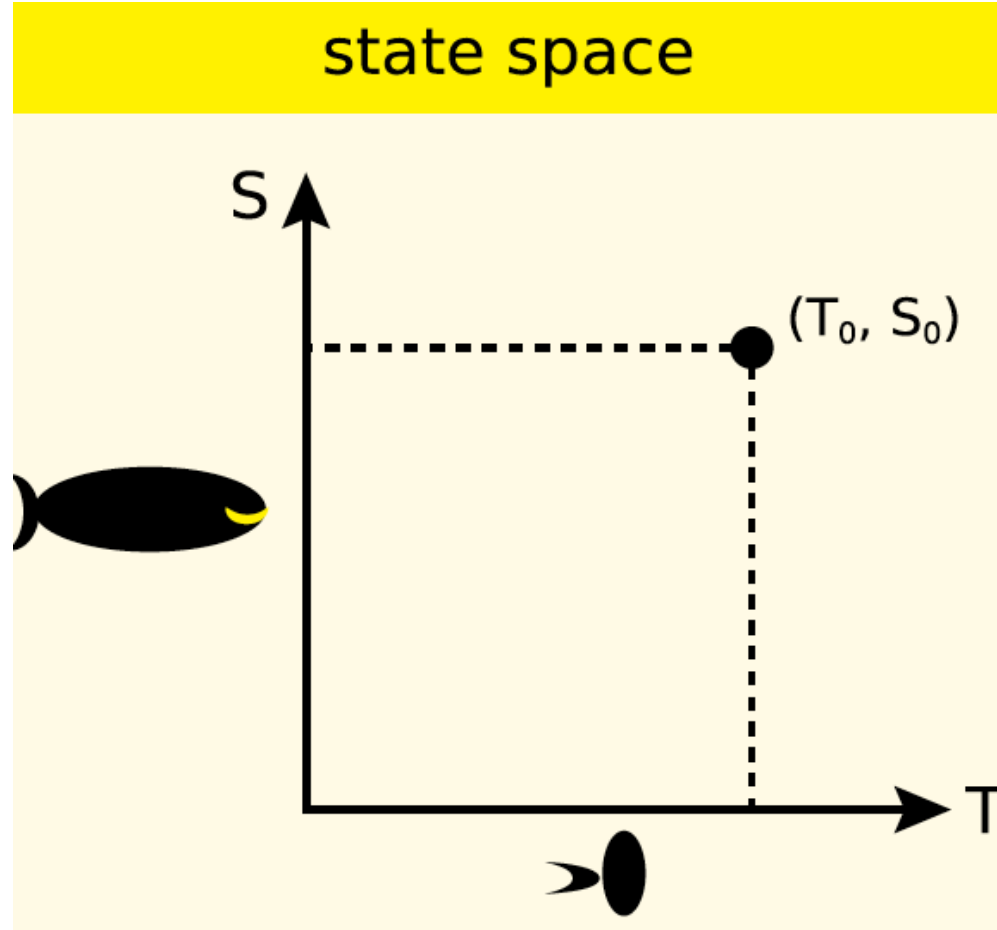
Well, it sounds like a joke, but it's not a joke. It means that the teaching of calculus has developed into a series of technical hurdles for students to go past, one after the other, bearing very little relation to what they're supposed to get out of the course.

$$\begin{aligned}
 S' &= \underbrace{-d_S S}_{\text{shark death}} + \underbrace{k\beta ST}_{\text{shark eats tuna}} \\
 T' &= \underbrace{+b_T T}_{\text{tuna birth}} - \underbrace{\beta ST}_{\text{shark eats tuna}}
 \end{aligned}$$

The “change equation” is a machine for spitting out the change instructions (change vectors) (S_0', T_0') for any given state (S_0, T_0)

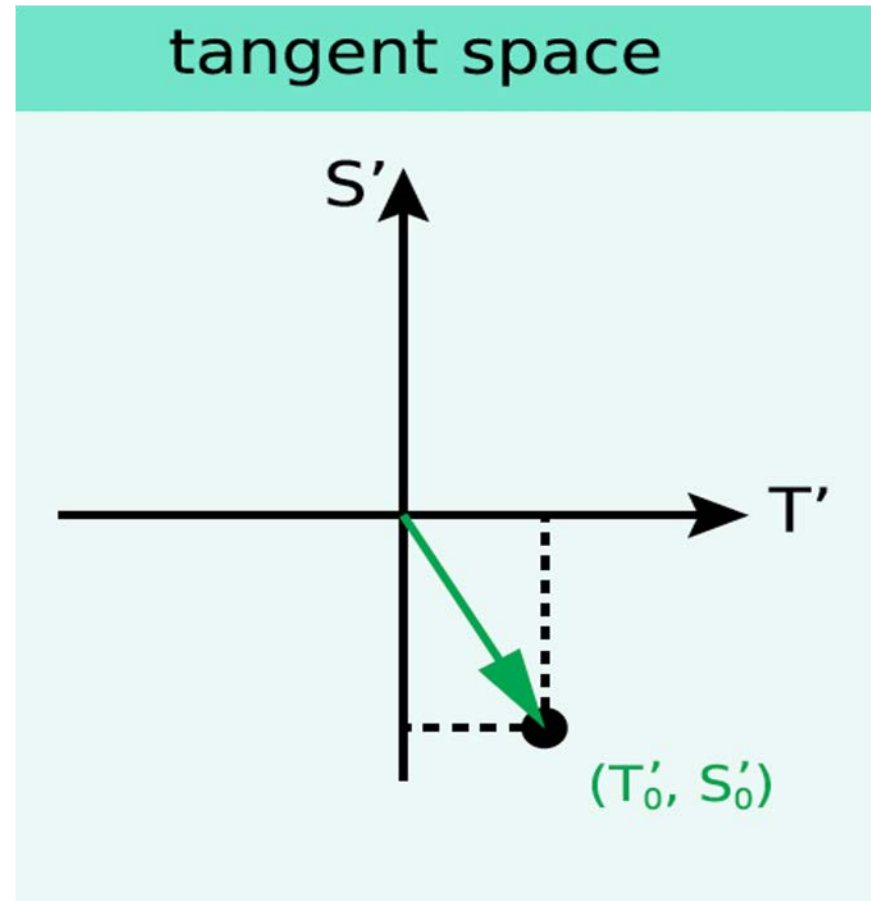
“If you are at (S_0, T_0) head in the direction of the change vector (S_0', T_0') , at a speed equal to the length of the change vector”

key concept #1: state space



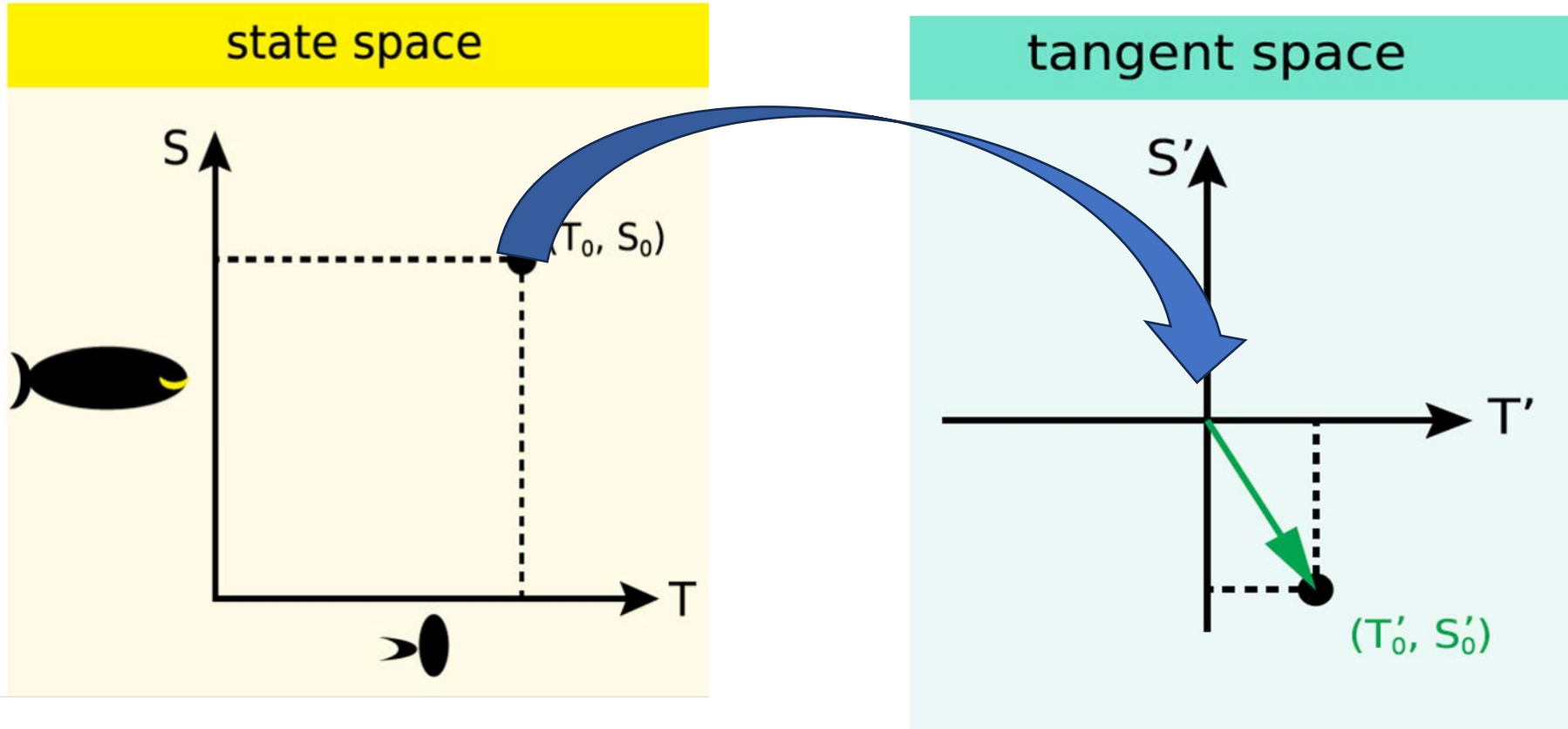
The system state (T_0, S_0) is a point in (T, S) state space

key concept # 2: change vector space



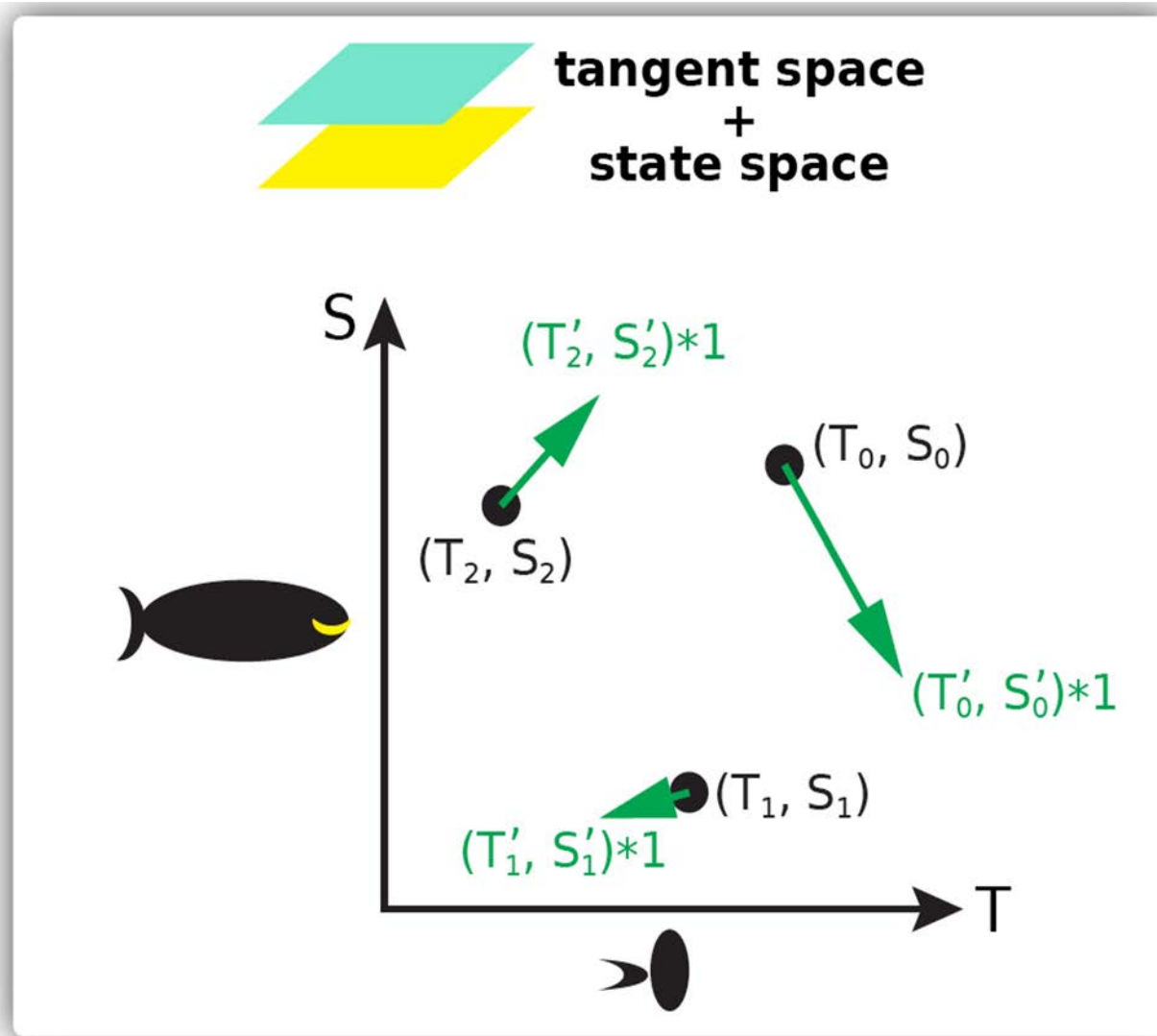
A point in tangent space is a change vector (T'_0, S'_0)

key concept #3: A “change equation” is a vectorfield

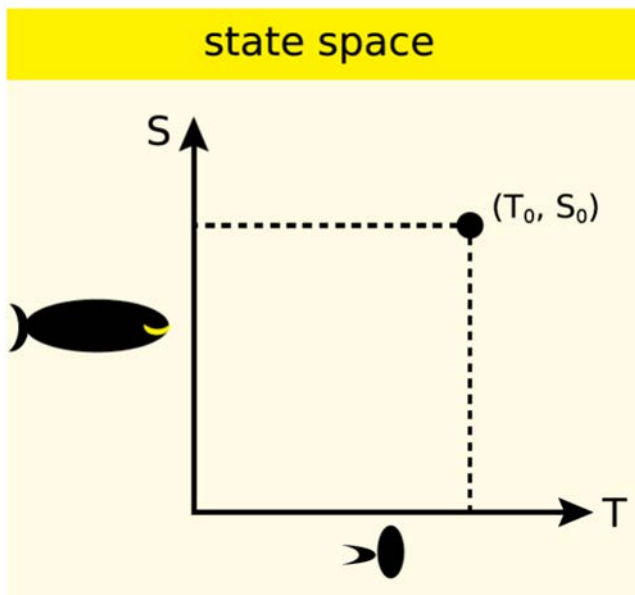


A *vectorfield* is a function from state space into tangent space

Writing the appropriate change arrows right on state space



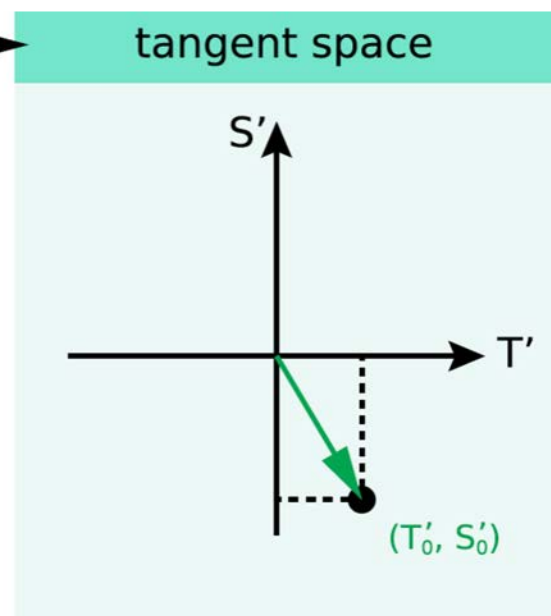
Multiply (T'_0, S'_0) by $1t$ (t has units of time) and put it right on the point (T_0, S_0)



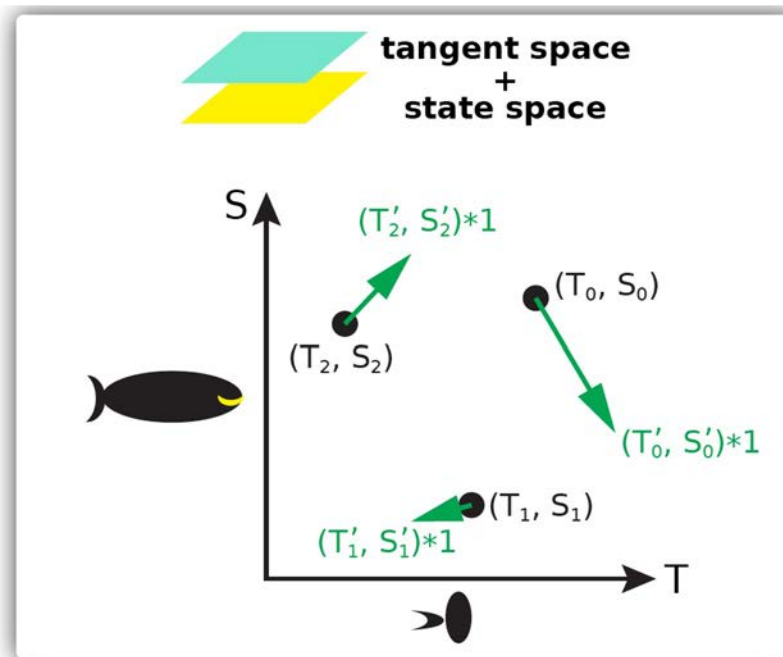
vectorfield

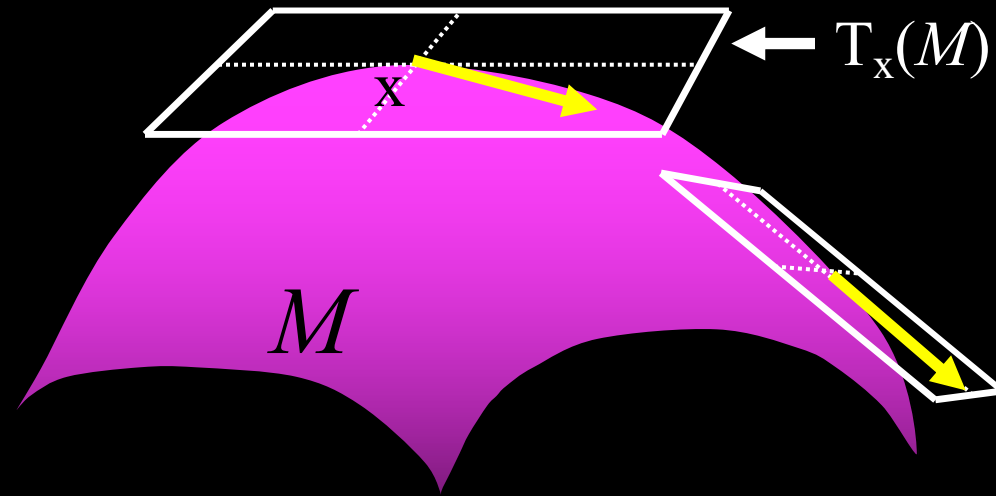
$$S' = f(S, T)$$

$$T' = g(S, T)$$



A vectorfield is a function from state space into tangent space





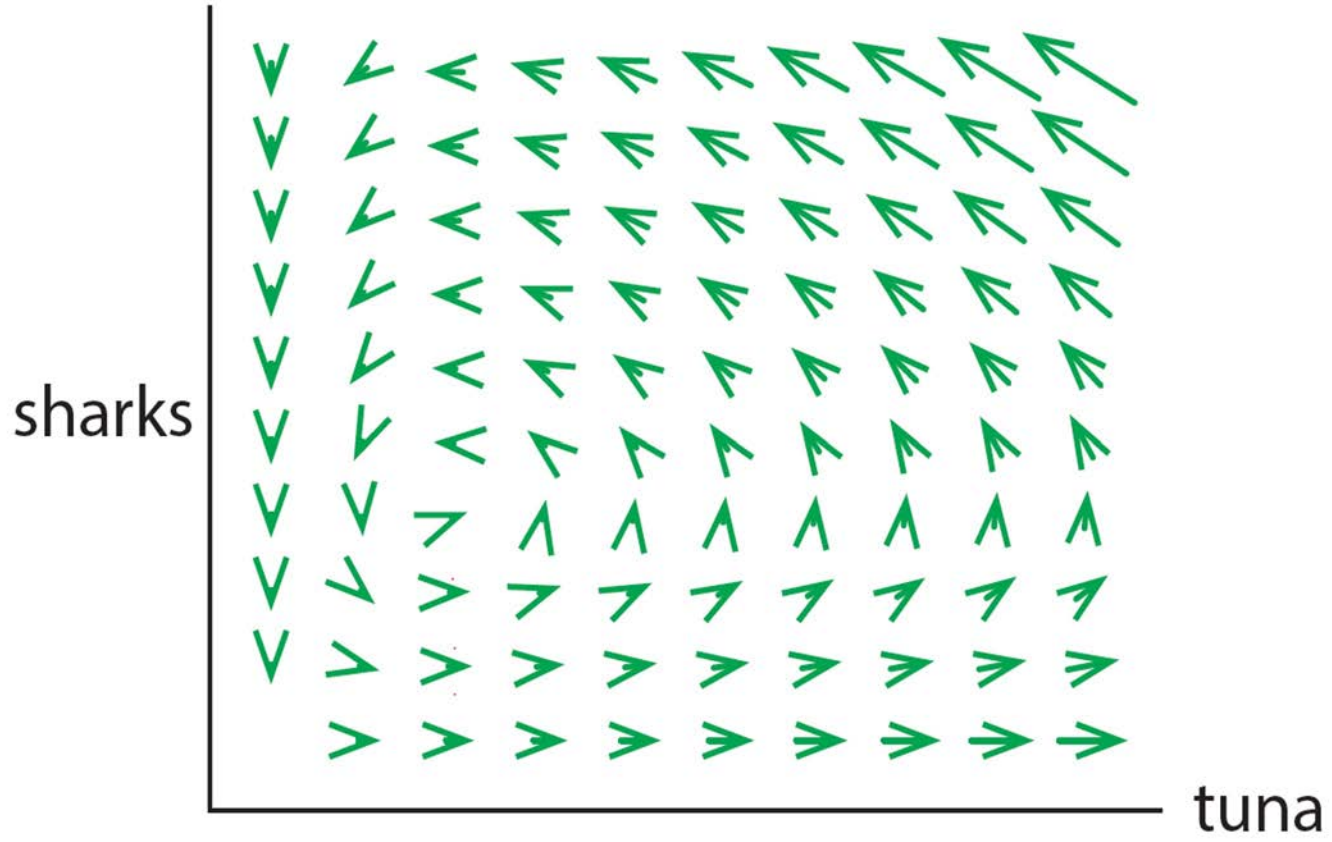
For each $x \in M$, $T_x(M)$ is tangent space at x

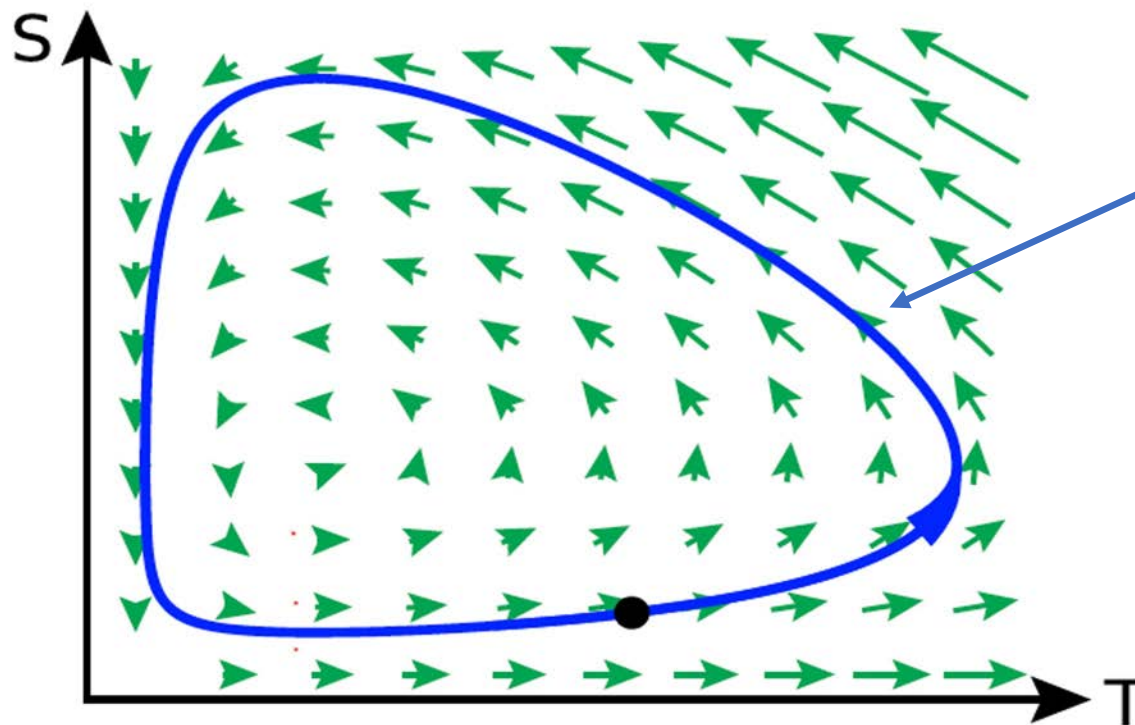
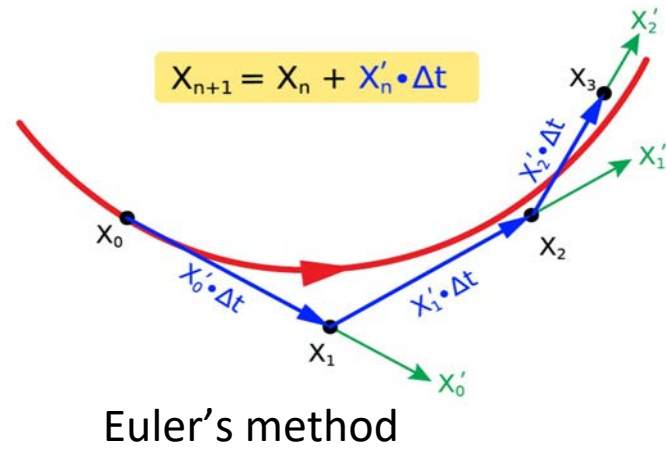
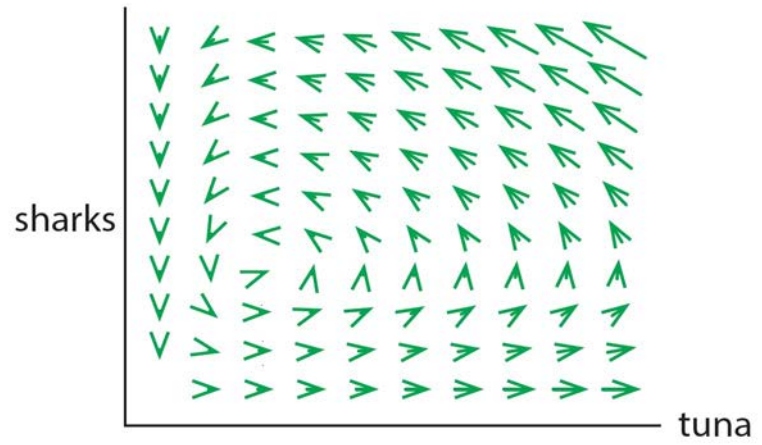
$$T(M) = \{ T_x(M) \mid x \in M \} \quad \pi: T(M) \rightarrow M$$

differential equation (vector field) V is a cross-section of the tangent bundle

$$V: M \rightarrow T(M)$$

$$\pi \circ V = 1_M$$





There is no equation for the blue curve

“I’m integrating a differential equation”

Let

$$I = \int e^{-x} \cos x dx$$

$$= \cos x (e^{-x}) - \int (-\sin x)(e^{-x}) dx$$

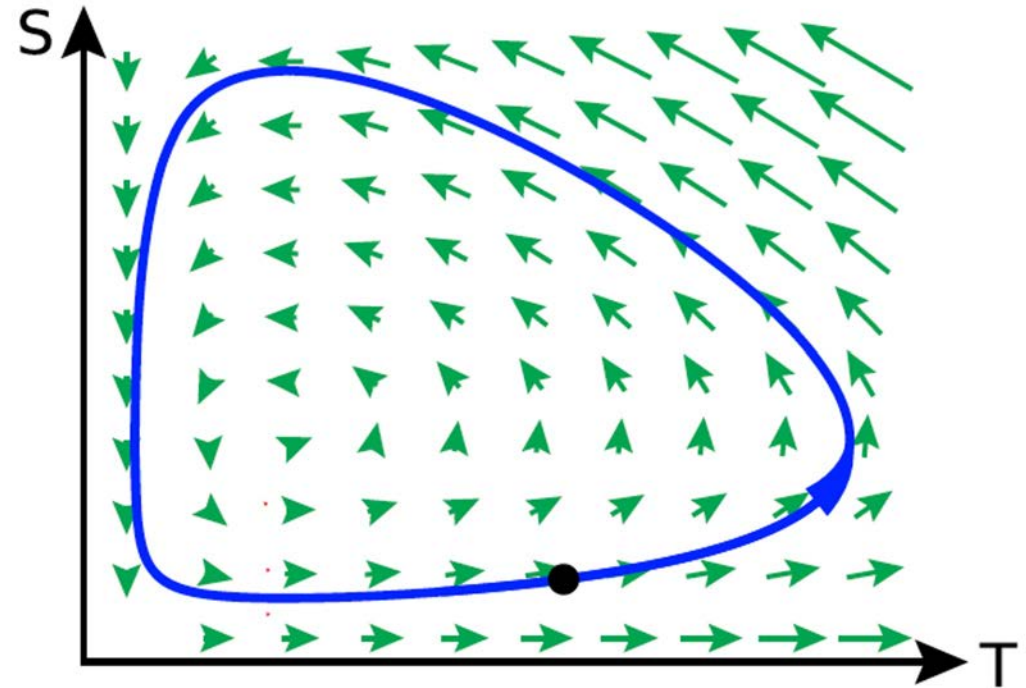
$$= -\cos x (e^{-x}) - \int \sin x e^{-x} dx$$

$$= -\cos x e^{-x} + \sin x e^{-x} - \int \cos x e^{-x} dx$$

$$I = -\cos x e^{-x} + \sin x e^{-x} - I$$

$$2I = (-\cos x e^{-x} + \sin x e^{-x})$$

$$I = \frac{(-\cos x e^{-x} + \sin x e^{-x})}{2}$$

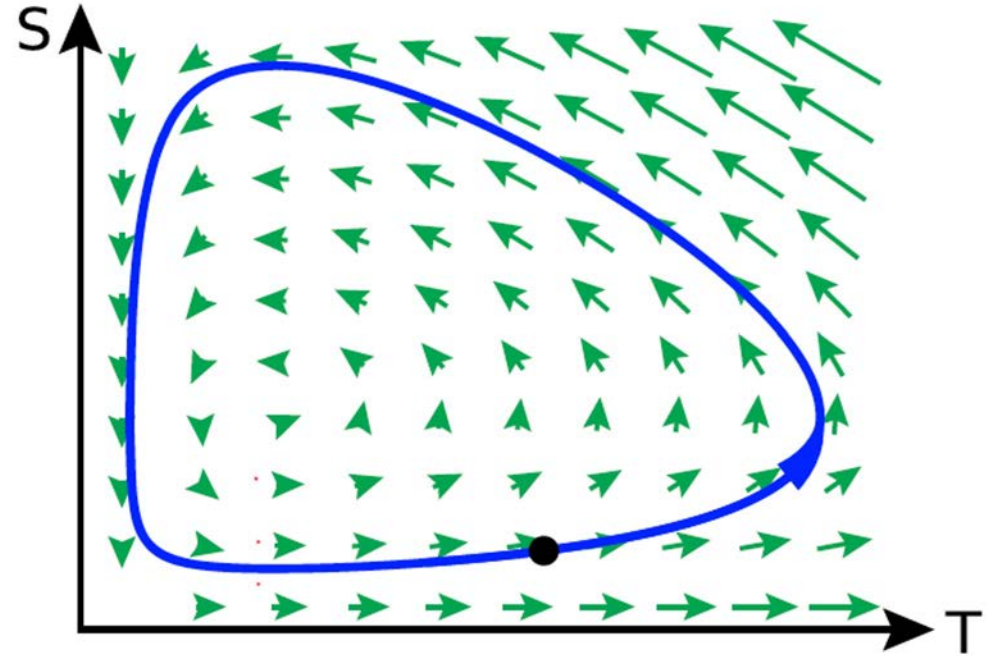


Python

```
import numpy as np
import matplotlib.pyplot as plt

n = 10
t, s = np.linspace(0, 2, n), np.linspace(0, 2, n)
T, S = np.meshgrid(t, s)
fT = T - T*S
fS = T*S - S

plt.quiver(t, s, fT, fS, color='g') # plot vector field
plt.streamplot(t, s, fT, fS,
               start_points=[[1.8, 1.2]], color="b")
```



19th century

Find an Integrating Factor, then solve the differential equation.

$$e^{\frac{2y}{y}} \cdot (y dx + (2xy - e^{-2y}) dy = 0)$$

Here $M = y$, $N = 2xy - e^{-2y}$

$$M_y = 1$$

$$N_x = 2y$$

$$\frac{M_y - N_x}{N} = \frac{1 - 2y}{2xy - e^{-2y}} \leftarrow \text{not a function of } x \text{ alone}$$

$$\frac{N_x - M_y}{M} = \frac{2y - 1}{y} = 2 - \frac{1}{y}$$

Then I.F., $\mu(y) = e^{\int 2 - \frac{1}{y} dy} = e^{2y - \ln y} = e^{2y} \cdot e^{-\ln y}, y > 0$
 $= e^{2y} \cdot \frac{1}{y}$

Multiply the diff eqn by $e^{\frac{2y}{y}}$, we get

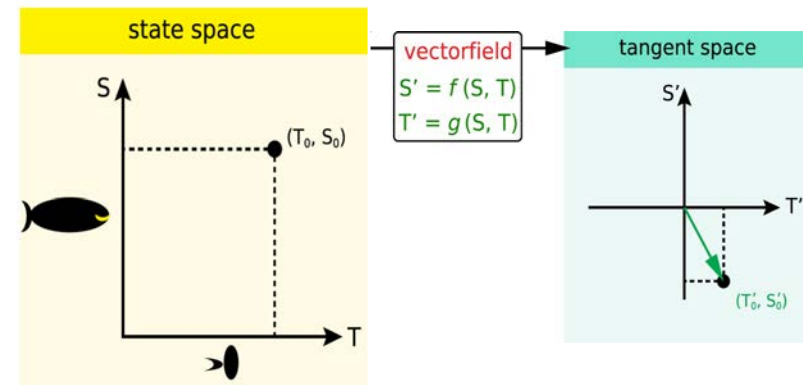
$$M dx + N dy = 0$$

$$M_y = N_x \Rightarrow \text{exact}$$

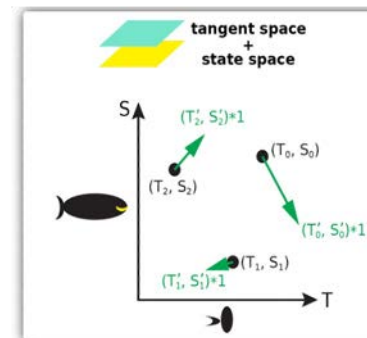
$$\frac{M_y - N_x}{N} \leftarrow \text{function of } x \text{ alone}$$

$$\frac{N_x - M_y}{M} \leftarrow \text{function of } y \text{ alone}$$

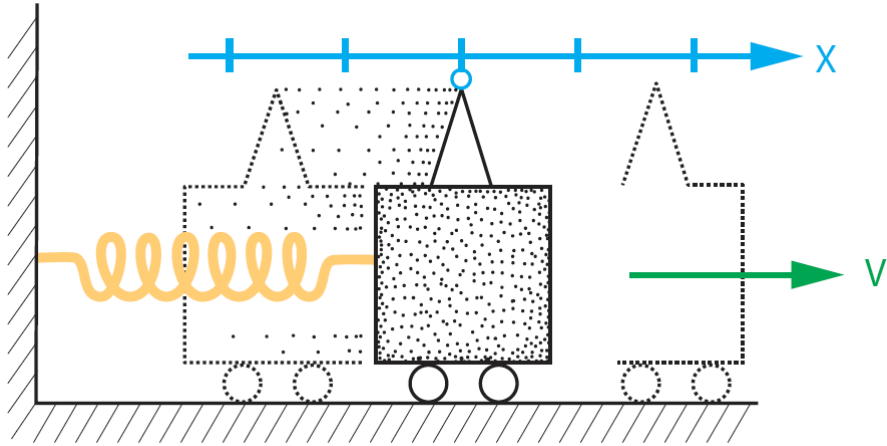
20th century



A vectorfield is a function from state space into tangent space



The 20th century concept is better pedagogy!

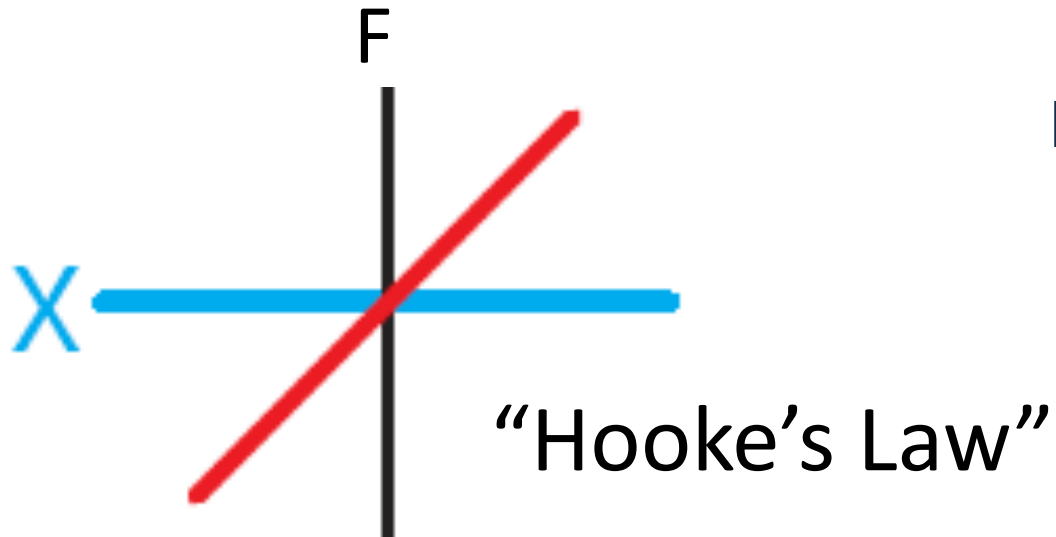


$$X' = V$$

$$V' = -F \quad (= \text{Force})$$

(better way of thinking about "F = ma")

What is F in this case?
"Spring Force"

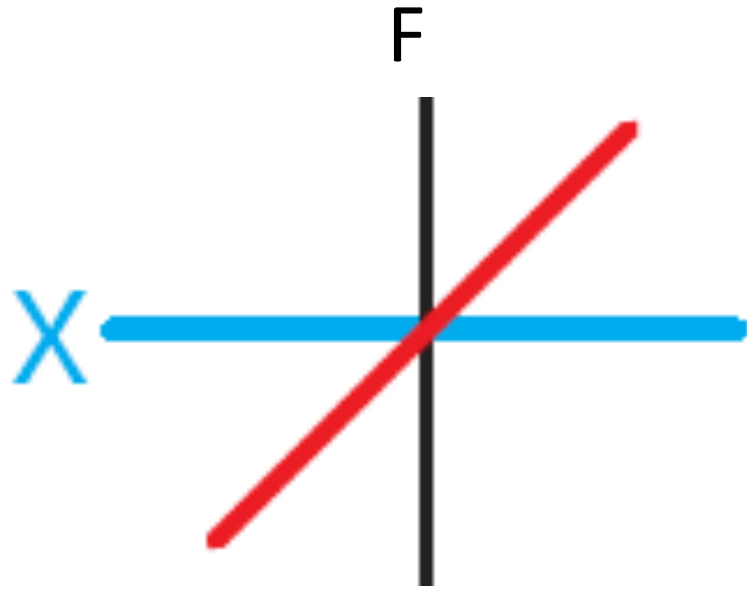


$$X' = V$$

$$V' = -X$$

$$X(t) = \cos(t)$$

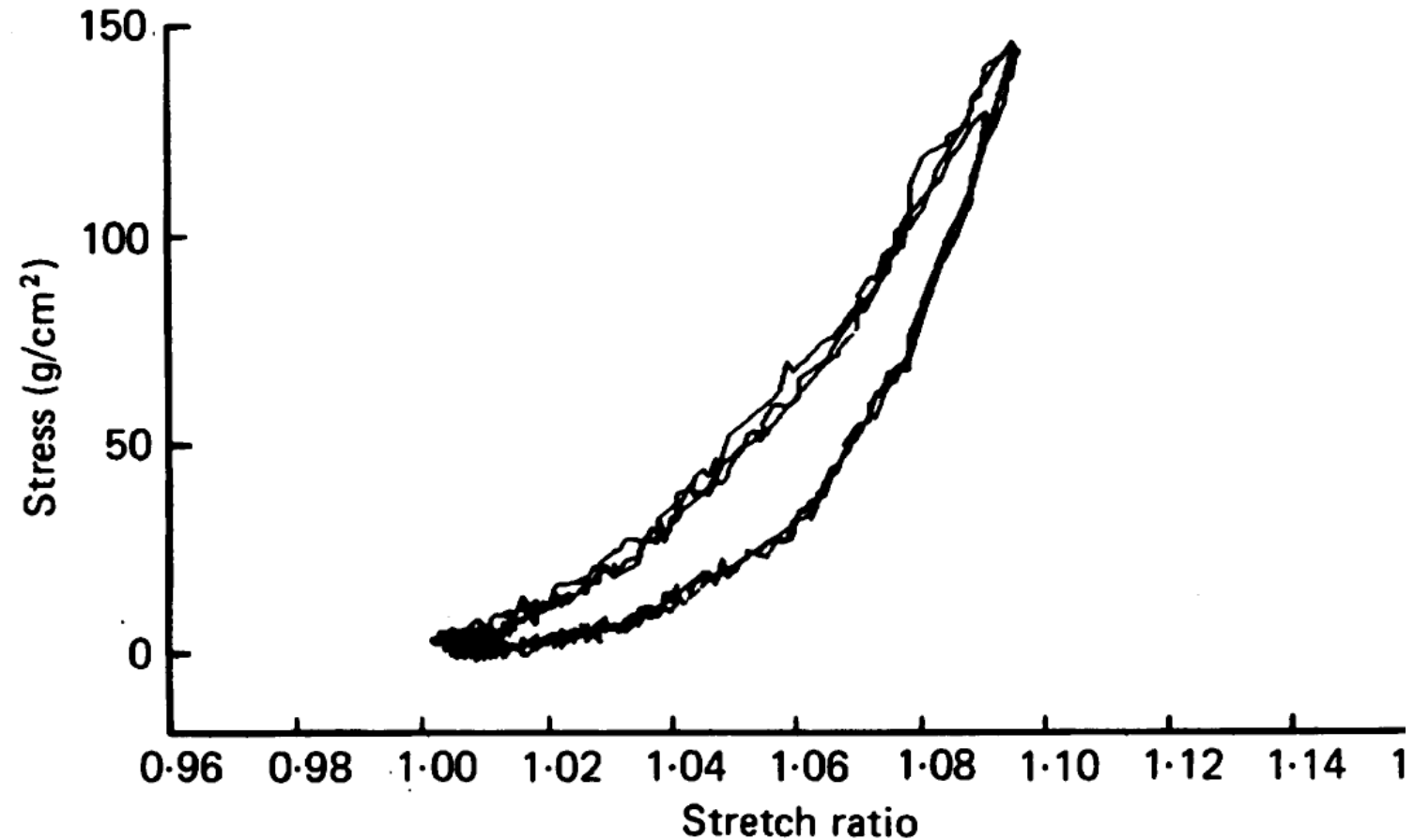
$$Y(t) = \sin(t)$$



“Hooke’s Law”

is false in biology!

The biological ‘spring’ (muscle, bone, cell membrane, etc.) is **nonlinear**



J. Physiol. (1983), 339, pp. 615–630

With 7 text-figures

Printed in Great Britain

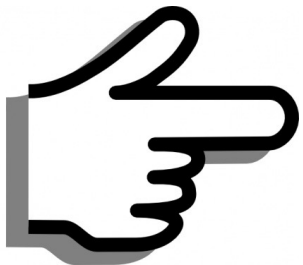
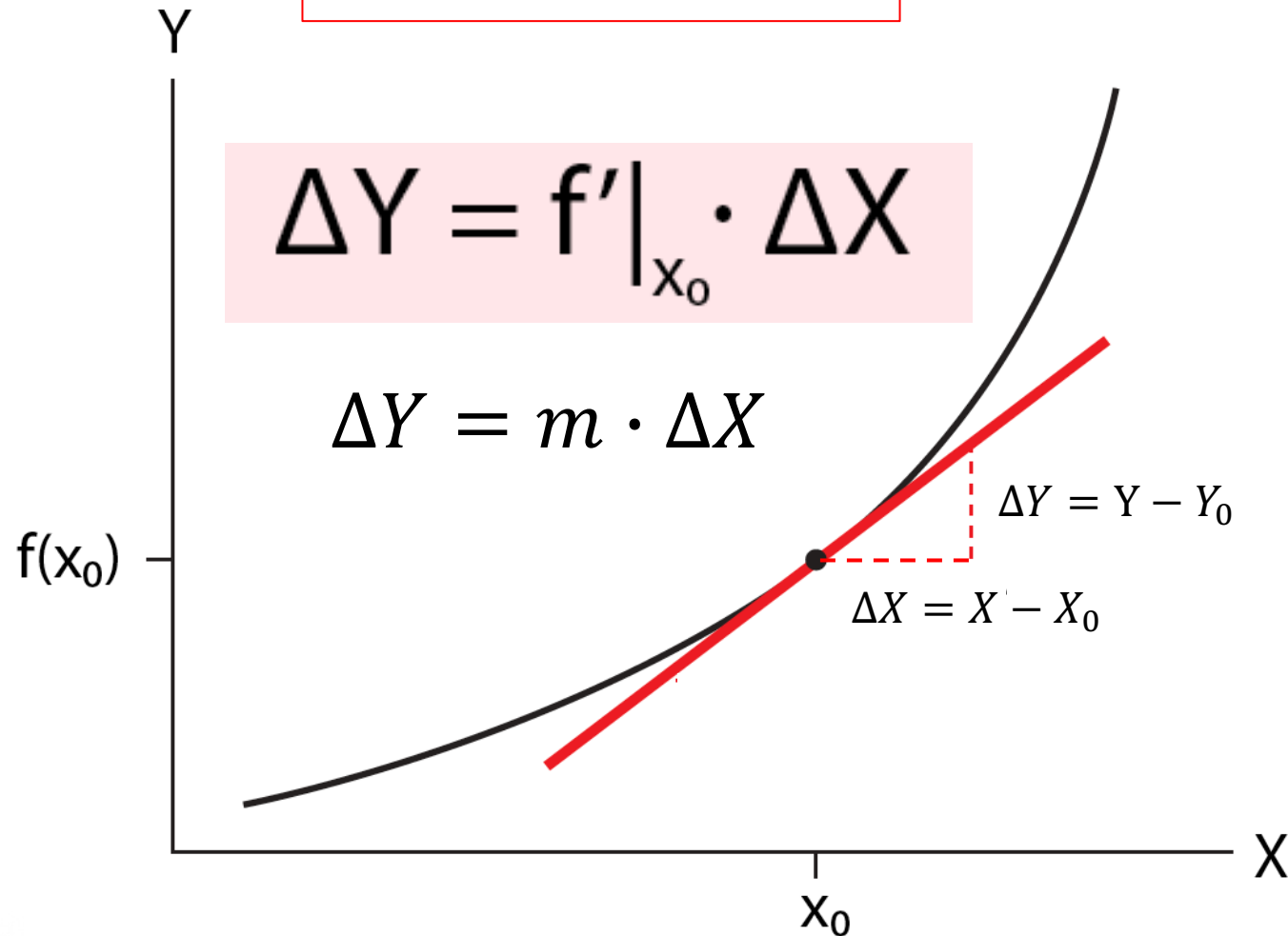
615

PASSIVE BIAXIAL MECHANICAL PROPERTIES OF ISOLATED CANINE MYOCARDIUM

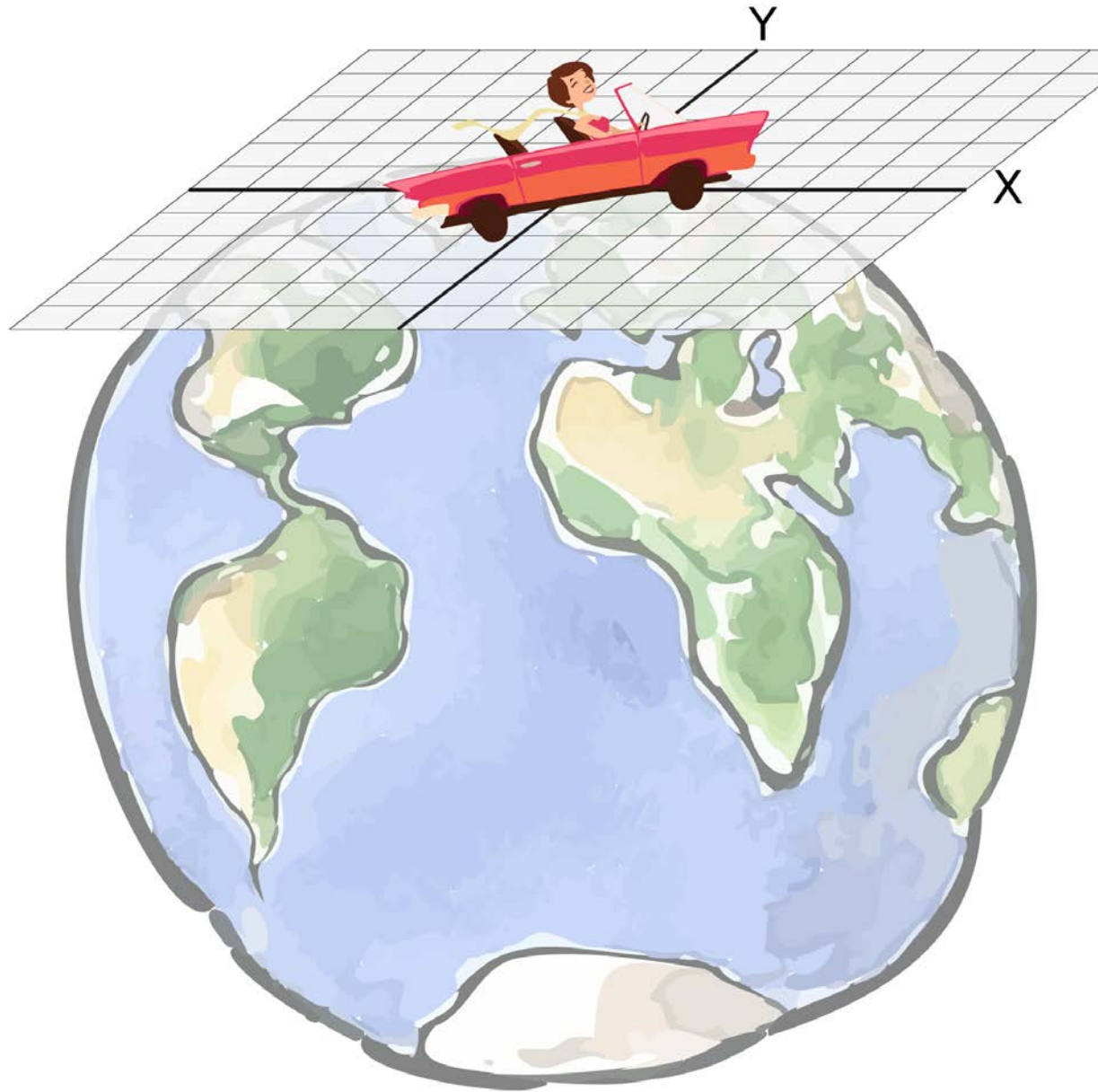
BY LINDA L. DEMER* AND FRANK C. P. YIN†

From the Departments of Biomedical Engineering and Medicine†,
Johns Hopkins Medical Institutions, Baltimore, MD 21205, U.S.A.*

The Derivative

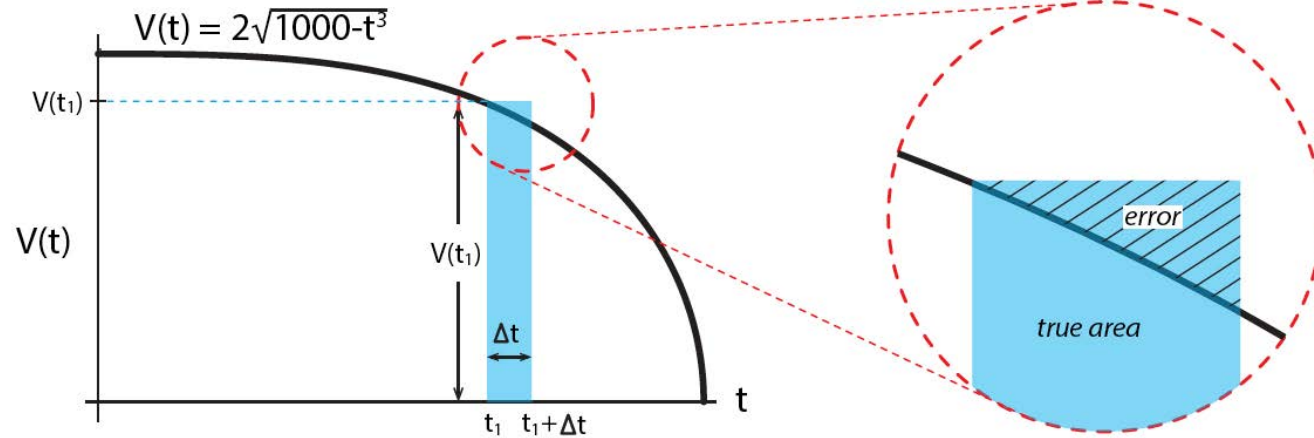
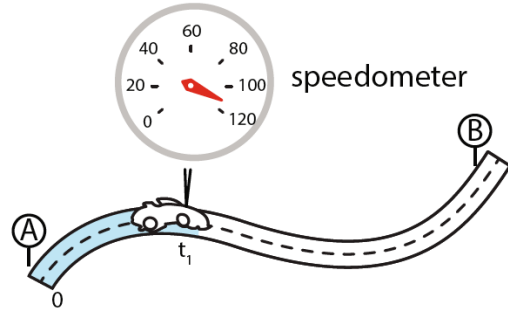


The derivative is the **linear approximation** to the function at a point

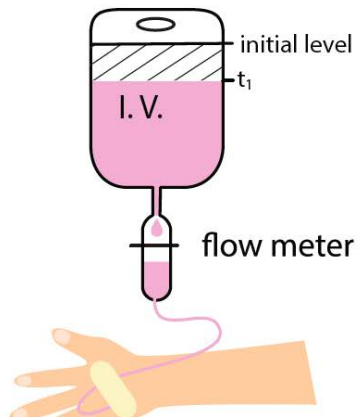


$$J = \begin{pmatrix} \frac{\partial f}{\partial x} & \frac{\partial f}{\partial y} \\ \frac{\partial g}{\partial x} & \frac{\partial g}{\partial y} \end{pmatrix}$$

integration



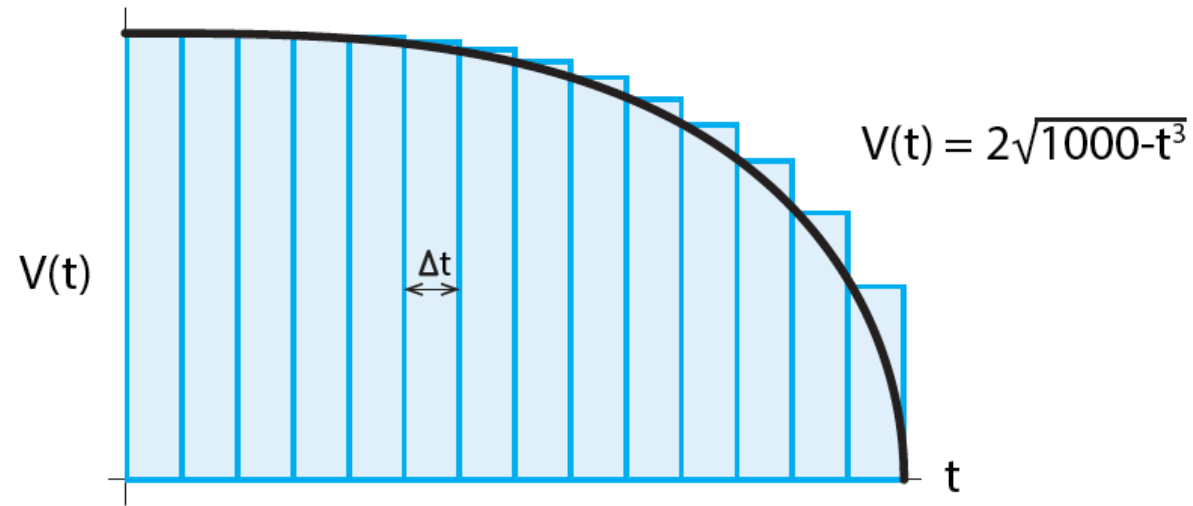
distance = velocity \times time



$$\begin{array}{rcl}
 \text{distance} & = & \text{velocity} \times \text{time} \\
 \updownarrow & & \updownarrow \quad \updownarrow \\
 V(t_1) \cdot \Delta t & = & V(t_1) \times \Delta t \\
 \updownarrow & & \updownarrow \quad \updownarrow \\
 \text{area} & = & \text{height} \times \text{width}
 \end{array}$$

$$\text{flow} = \text{flow rate} \times \Delta t$$

Integration: “add up the little rectangles”



$$X(t) \approx X(0) + \text{Sum}_{k=0}^{k=n} V(k \cdot \Delta t) \cdot \Delta t$$

$$X(t) = X(0) + \lim_{\Delta t \rightarrow 0} \sum_{k=0}^{k=n} V(k \cdot \Delta t) \cdot \Delta t$$

$$X(t) = X(0) + \int_0^t X' \cdot dt$$

Field Due to a Spherically Symmetric Charge Distribution

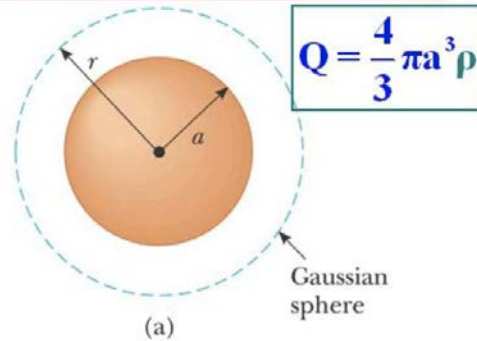
- Select a **sphere** as the Gaussian surface

Insulating solid sphere of radius a has a uniform charge density ρ

- For $r > a$

$$\Phi_E = \oiint \mathbf{E} \cdot d\mathbf{A} = \oiint E dA = \frac{q_{in}}{\epsilon_0}$$

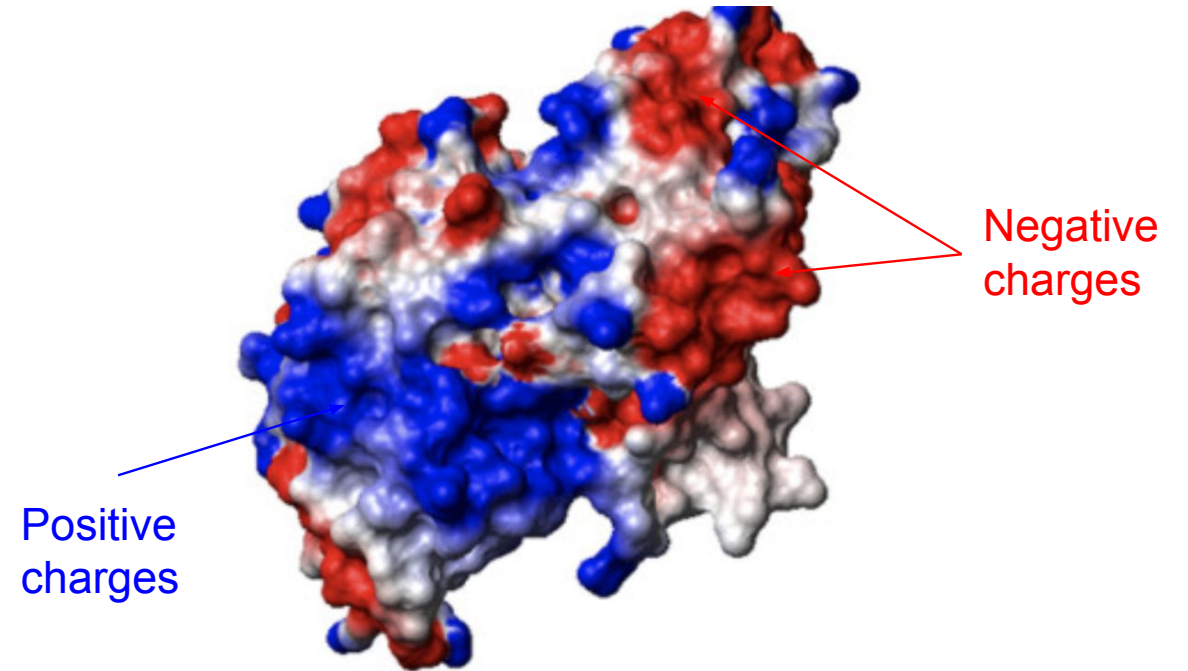
$$E 4\pi r^2 = \frac{Q}{\epsilon_0} \Rightarrow \boxed{E = \frac{Q}{4\pi\epsilon_0 r^2}}$$



©2004 Thomson - Brooks/Cole

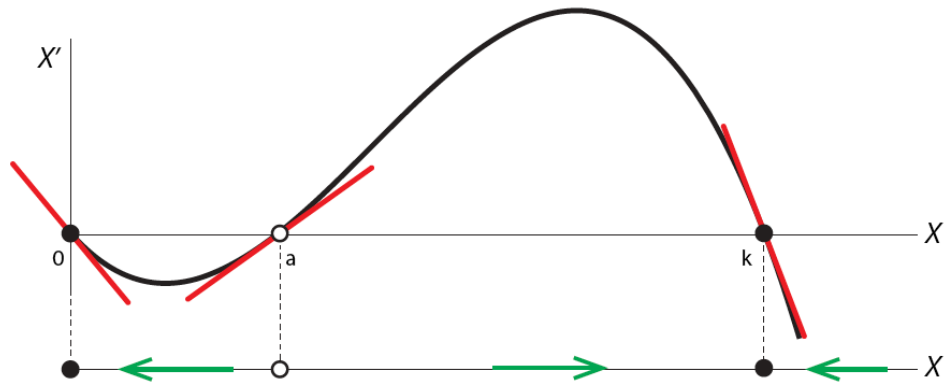
Uniform charge density?
Perfect Sphere?
Use Calculus!

Glyceraldehyde Phosphate Dehydrogenase

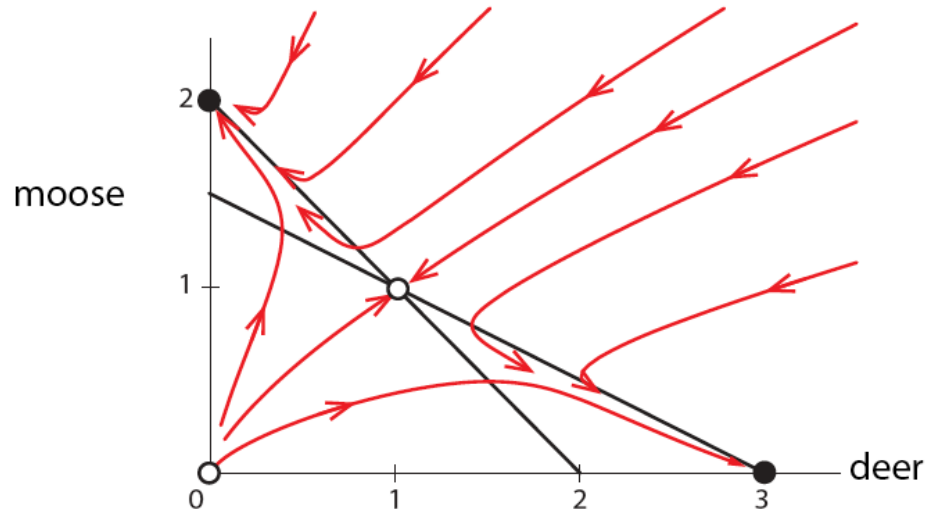


Actual molecule?
Add up the little rectangles
(with a computer)

Equilibrium Points



$$X' = rX\left(1 - \frac{X}{k}\right)\left(\frac{X}{a} - 1\right)$$



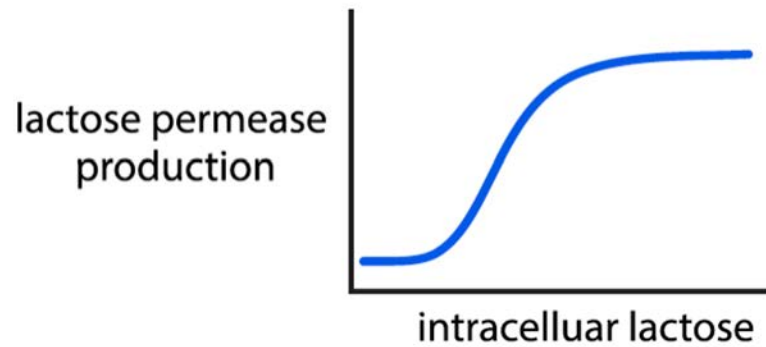
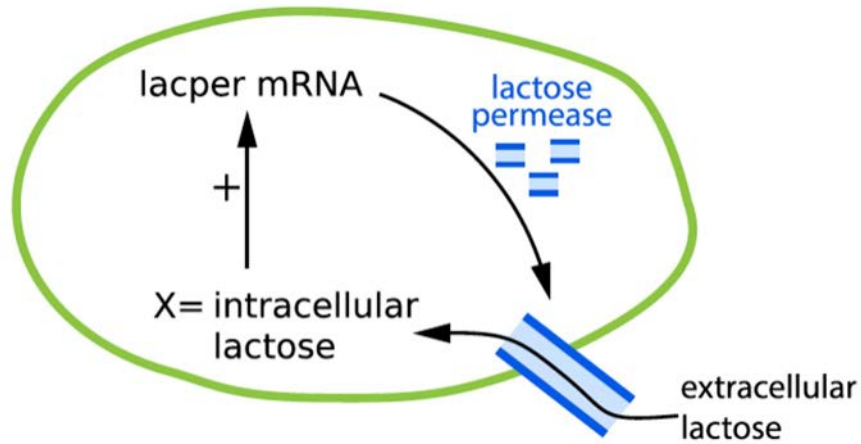
$$D' = 3D - 2MD - D^2$$

$$M' = 2M - DM - M^2$$

Stability of Equilibrium Points

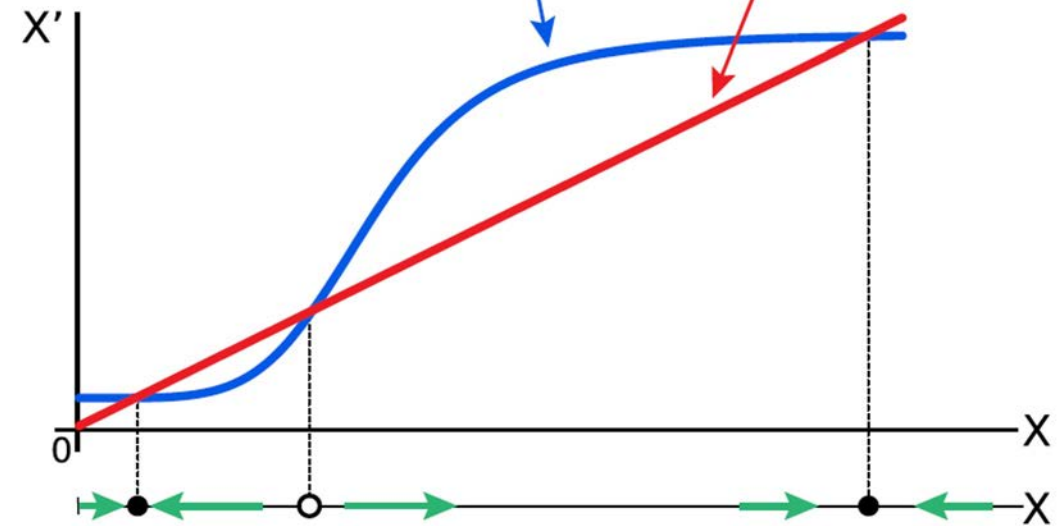
- simulation
- linearization (Hartman-Grobman Theorem)

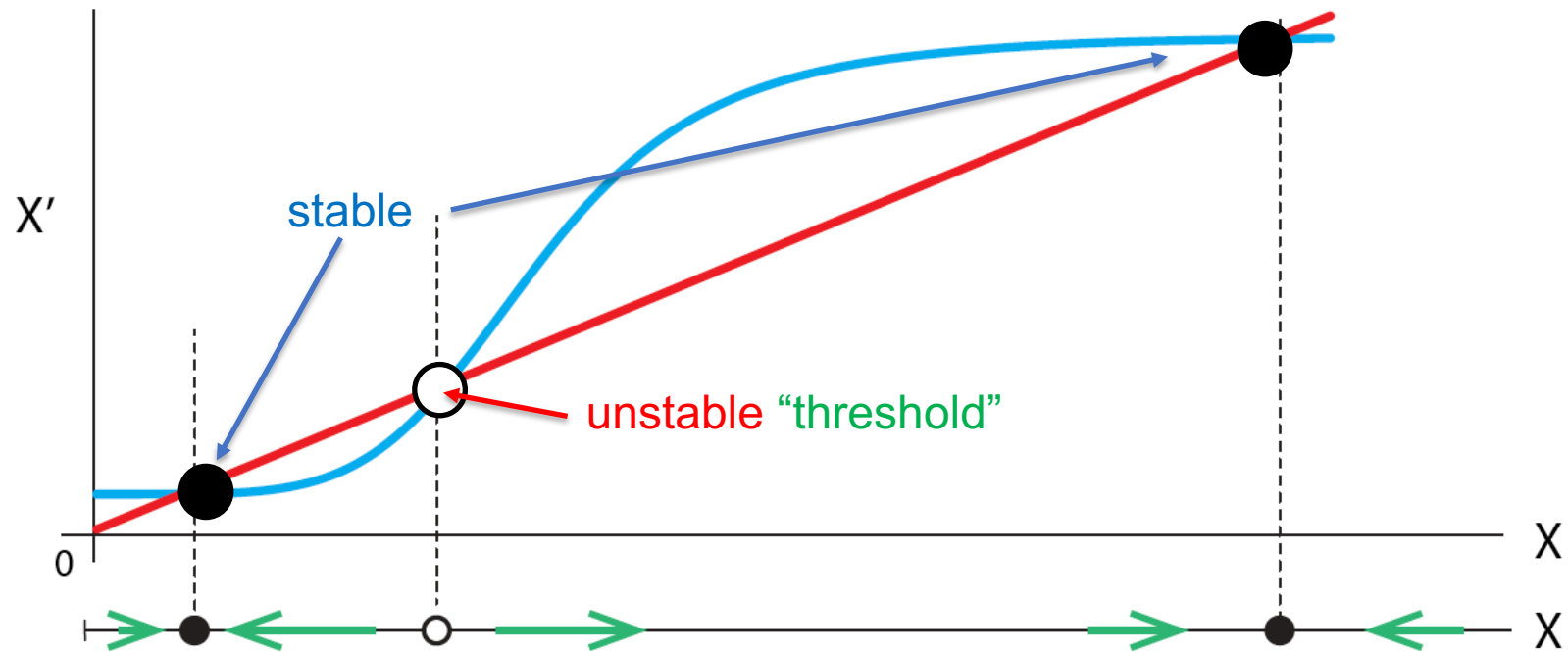
“Biological Switch” = bistable dynamical system



$$X' = \underbrace{\frac{a + X^2}{1 + X^2}}_{\text{lactose import}} - \underbrace{r}_{\text{lactose metabolic degradation}} \cdot 0.4X$$

change in lactose

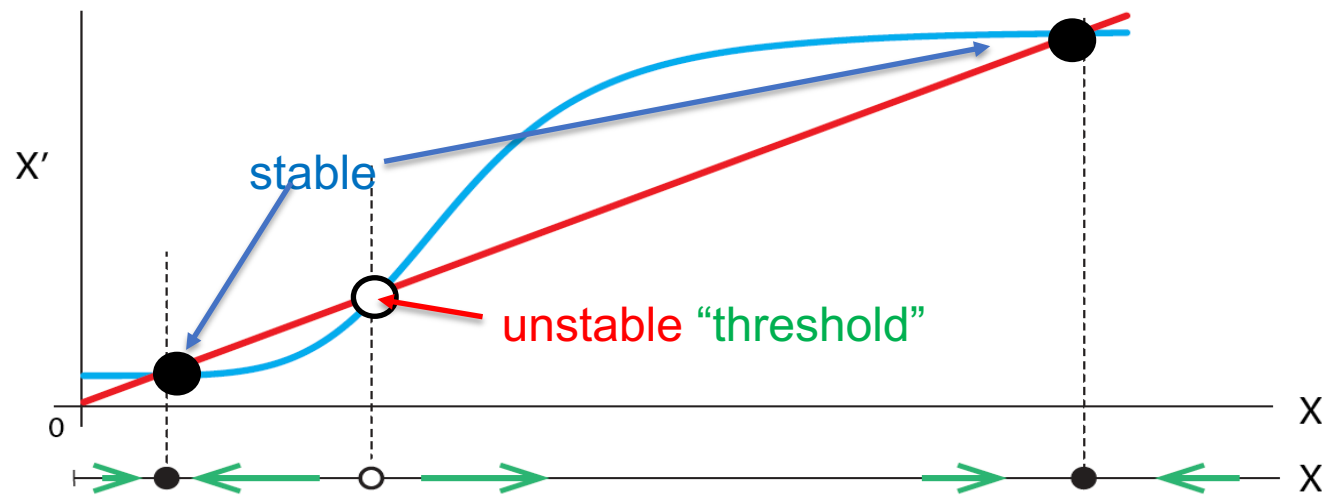




“Biological Switch” = bistable dynamical system

“Threshold” ??

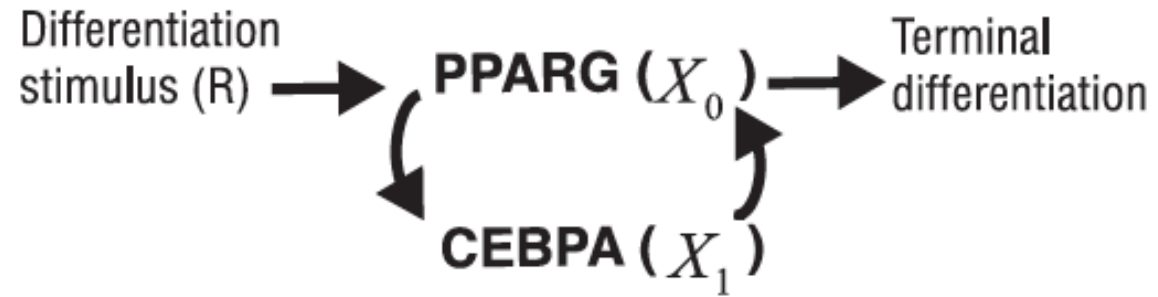
“If $X > X_T$, then do Y_1 , else do Y_2 ”



**Bifurcations: Qualitative Changes in Equilibrium
Structure as Parameters Vary**

“These pre-adipocytes differentiate through a **bistable switch mechanism** with a single threshold for activation in each cell that involves **positive feedback between two key transcription factors**, CCAAT/enhancer binding protein a (CEBPA) and peroxisome proliferator-activated receptor g (PPARG)”

rosiglitazone

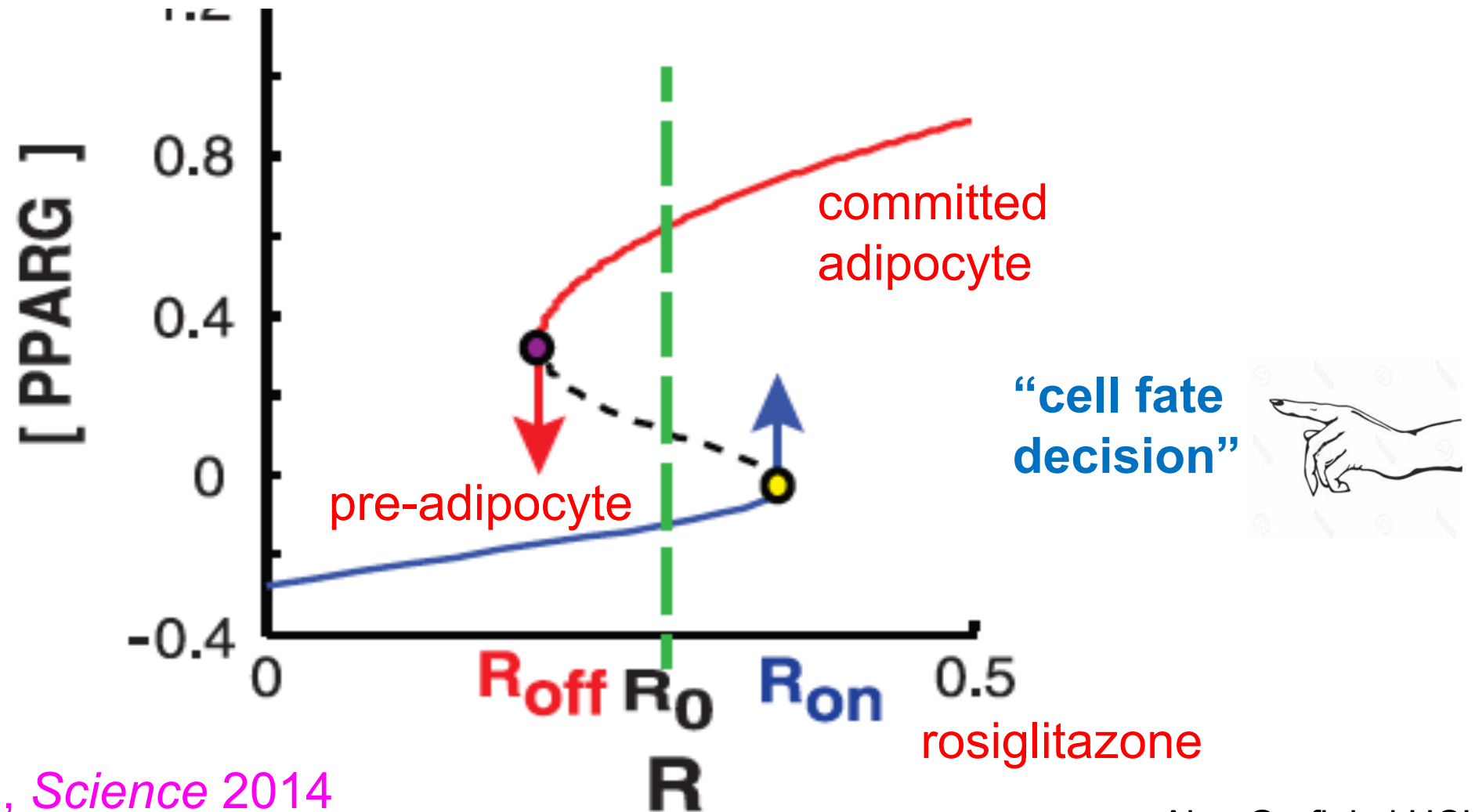


$$\frac{dX_0}{dt} = \epsilon_0 * R * \left(1 + \alpha * \frac{X_1^3}{1 + X_1^3} \right) - X_0$$

$$\frac{dX_1}{dt} = \epsilon_1 * X_0 - X_1$$

Teruel, *Science* 2014

“These pre-adipocytes differentiate through a **bistable switch mechanism** with a single threshold for activation in each cell that involves positive feedback...

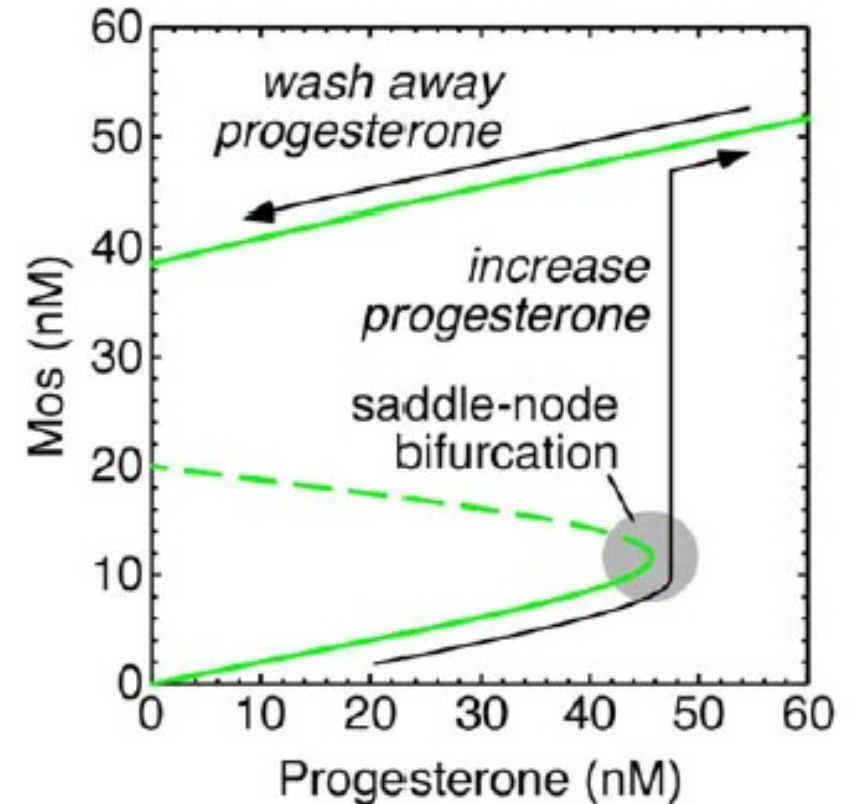
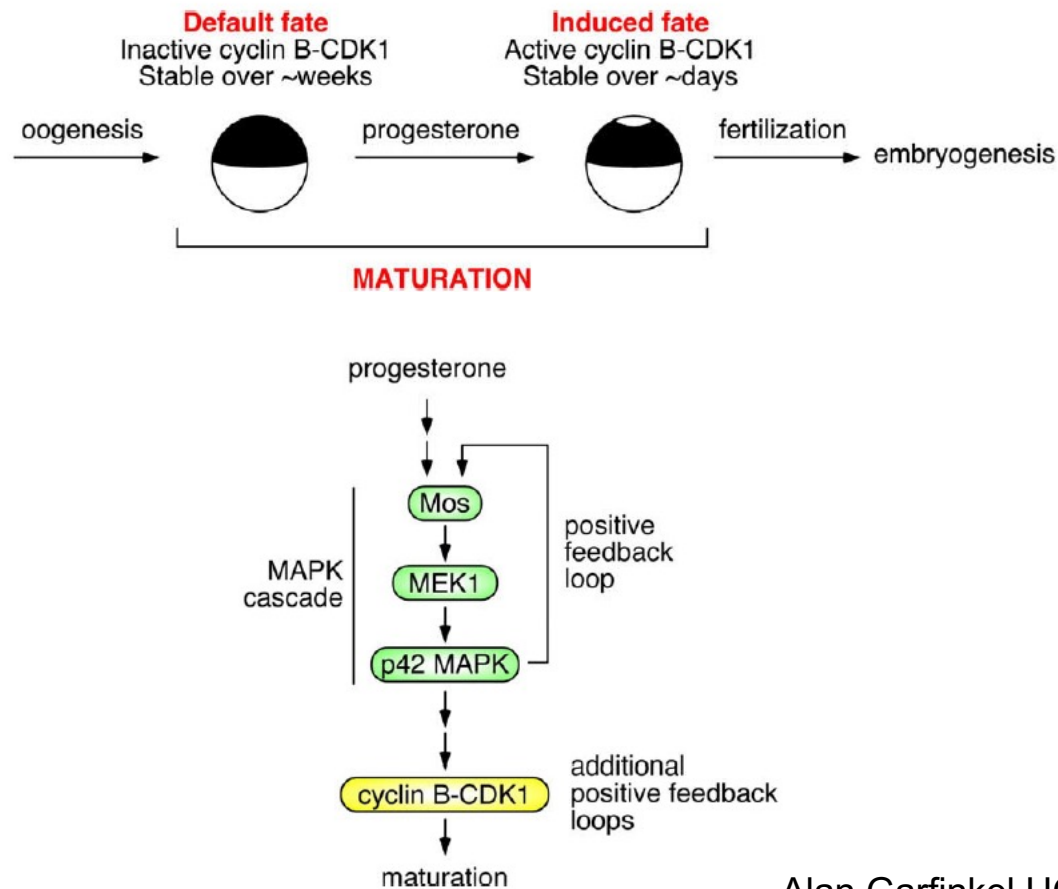


Teruel, *Science* 2014

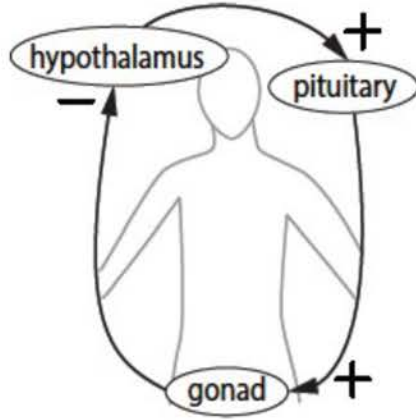
Simple, realistic models of complex biological processes: Positive feedback and bistability in a cell fate switch and a cell cycle oscillator

James E. Ferrell Jr. *, Joseph R. Pomerening, Sun Young Kim, Nikki B. Trunnell, Wen Xiong, Chi-Ying Frederick Huang, Eric M. Machleder

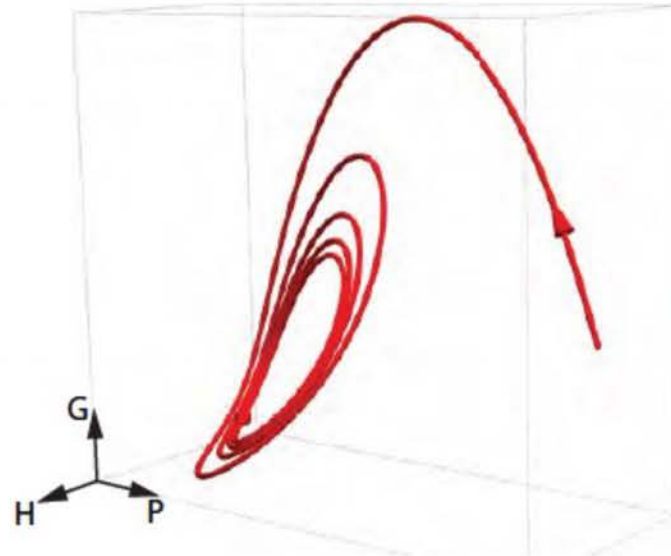
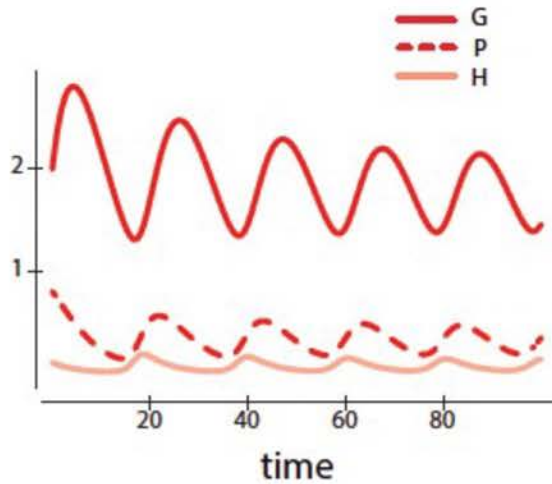
Department of Chemical and Systems Biology, Stanford University School of Medicine, Stanford, CA 94305-5174, USA



Hopf bifurcation: a system begins to oscillate as a parameter passes a critical point



$$H' = \frac{1}{1 + G^n} - k_1 H$$
$$P' = H - k_2 P$$
$$G' = P - k_3 G$$



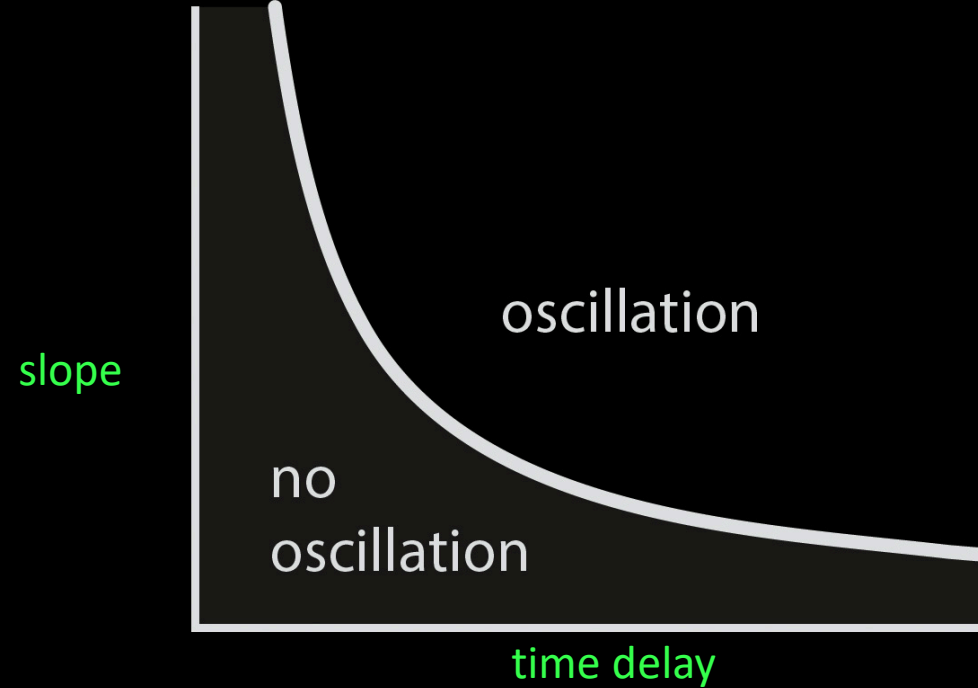
if $n > 8$, system exhibits stable oscillations

Lesson

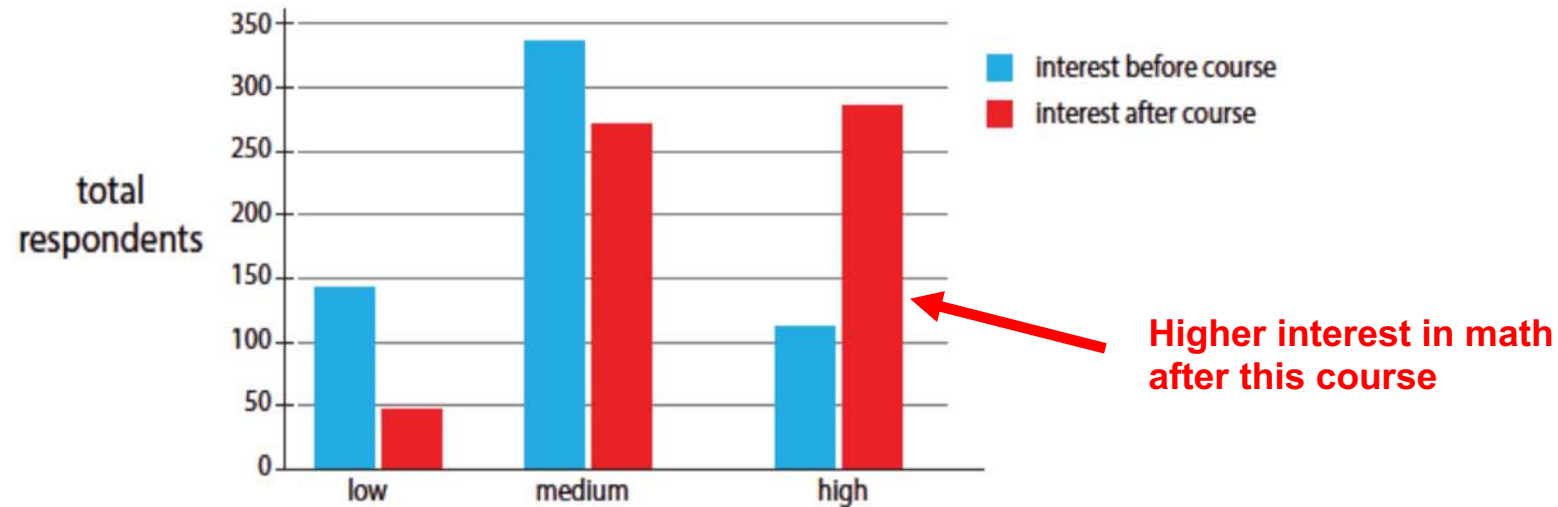
- Steeply-sloped (highly sensitive) negative feedback
- time delays



unstable behavior



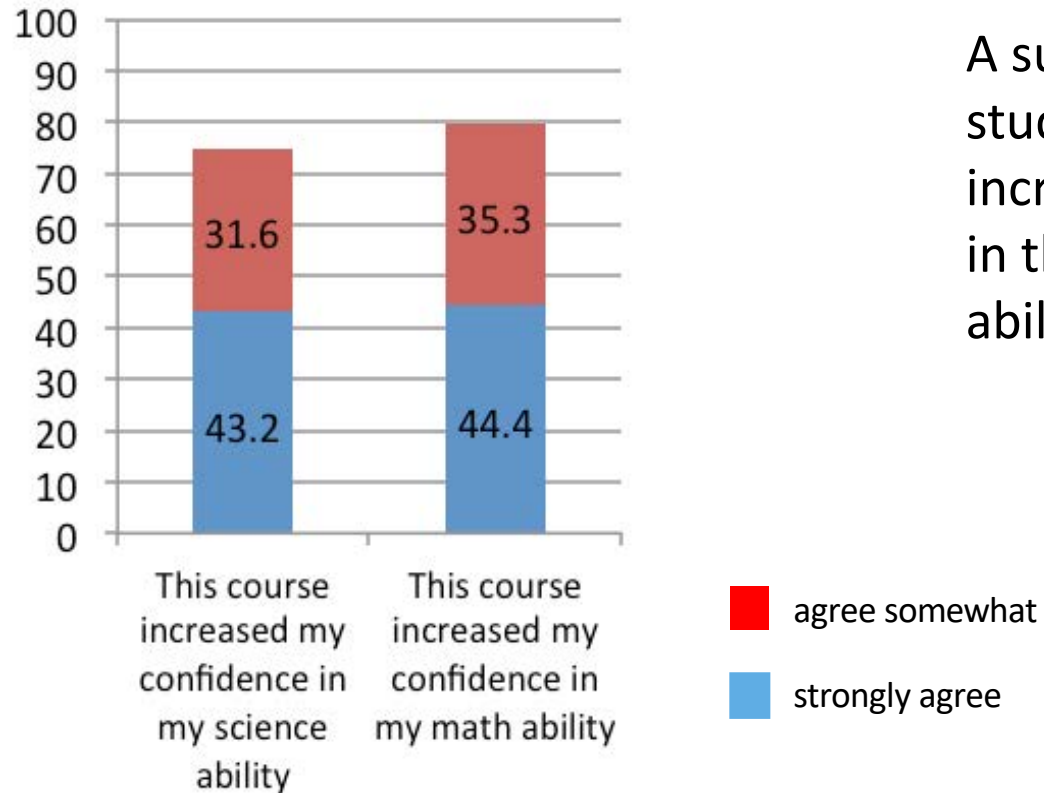
Student Outcomes



- **currently ~2000 students/year**
- **freshmen/sophomores**
- **45% no previous calculus**

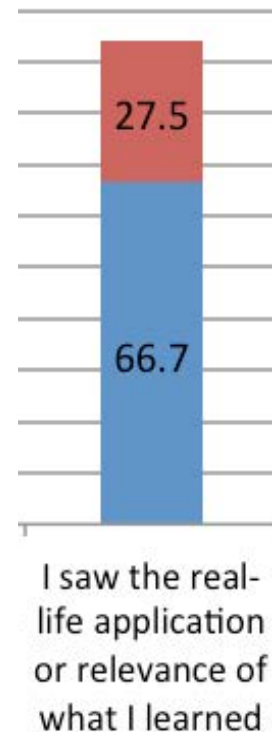
O'Leary, E. S., H. W. Sayson, C. Shapiro, A. Garfinkel, W. J. Conley, M. Levis-Fitzgerald, M. K. Eagan and B. Van Valkenburgh (2021). "Reimagining the Introductory Math Curriculum for Life Sciences Students." CBE—Life Sciences Education

Student Perceptions of LS30



A supermajority of LS 30 students felt that LS30 increased their confidence in their math and science abilities.

Student Perceptions of LS30



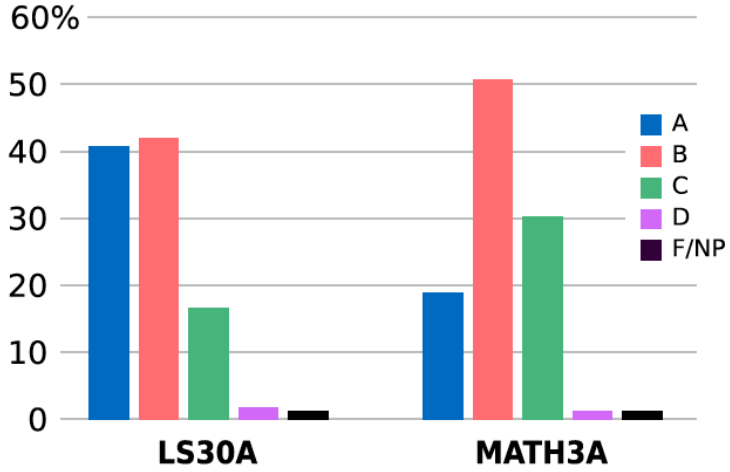
■ agree somewhat

■ strongly agree

In addition, after completing LS30, 94% of the students saw the relevance of the course.

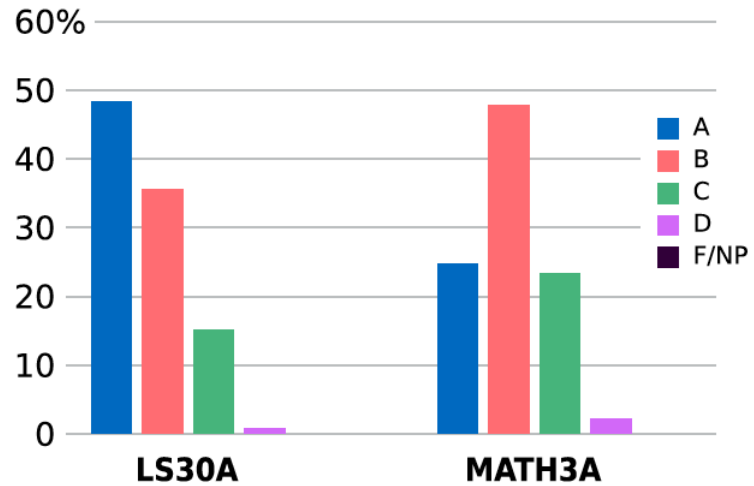
Whereas about 40% of the Math 3 students indicated what they learned was “useless” or “not applicable to other courses or majors.”

CHEM 14A Grade Distribution
by
First Math Course Taken



LS30A = our course
Math 3A = calculus

PHYSICS 6A Grade Distribution
by
First Math Course Taken



Under-Represented Minorities

URM students who had completed the LS30 series earned a grade of A or A+ in Physics 6A at nearly twice the rate of their URM counterparts in the Math 3 sample (11.8% versus. 6.0%).

	Non-URM		URM	
	LS30 (N=129)	Math 3 (N=792)	LS30 (N=34)	Math 3 (N=266)
A or A+	35.7	16.2	11.8	6.0
A- or B+	31.0	28.5	23.6	17.7
B or B-	20.9	31.5	26.5	30.4
C+ or C	8.5	15.3	35.3	27.8
C- or D+	2.4	4.4		9.0
D or D-		2.2		6.1
F	1.6	2.4	2.9	4.2

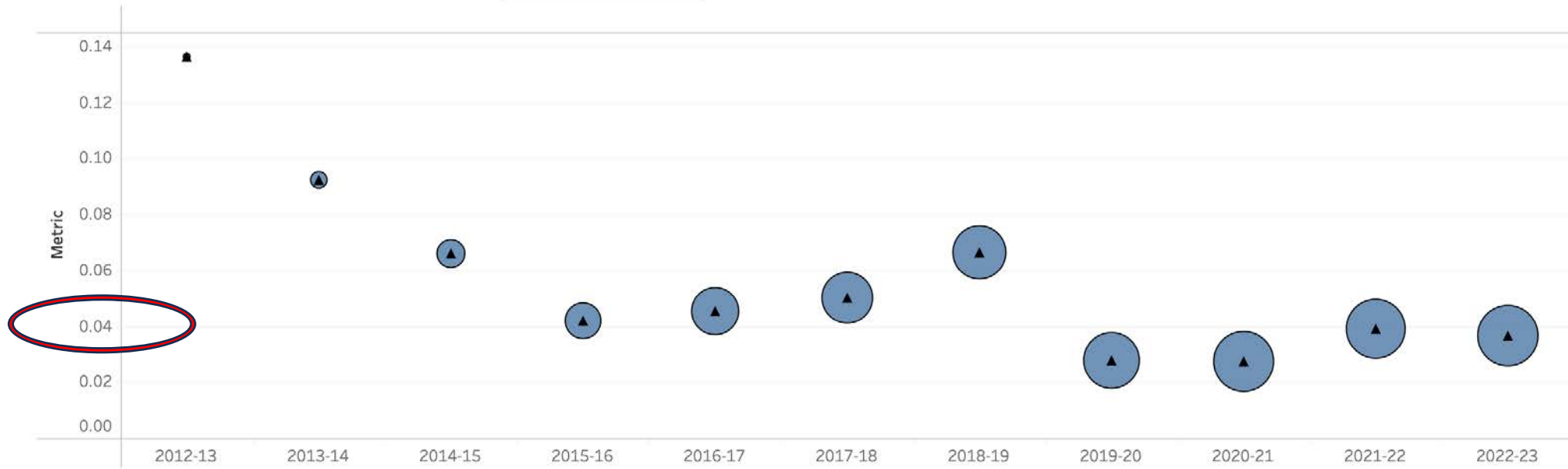
URM Mean

LS 30 2.79
Math 3 2.51

DFW Rate by Academic Year

Side-by-side comparison 🏆

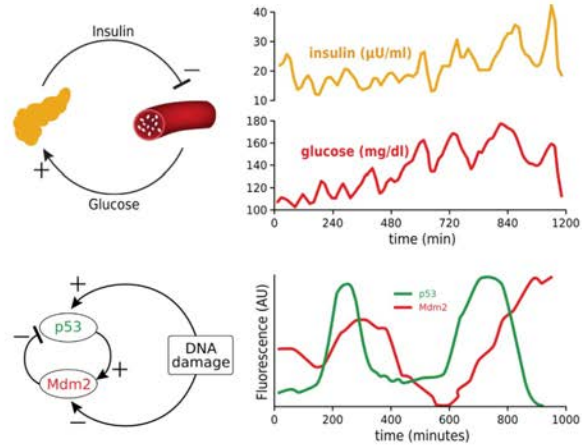
None ▼



MASTER CLASS IN
**TEACHING MATH MODELING
FOR LIFE SCIENCES**

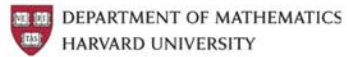
JULY 9TH - JULY 14TH

SCHEDULE



INSTRUCTORS

Alan Garfinkel | UCLA
Eric Deeds | UCLA



Organized by:

Brendan Kelly, Harvard

Jennifer Czocher, Texas State



~ 40 high school students
taught by 30 visiting faculty and Harvard Instructors

New effort aims to revamp calculus to keep students in science, technology, engineering fields



A material point method for snow simulation

Alexey Stomakhin
Craig Schroeder
Lawrence Chai
Joseph Teran
Andrew Selle

University of California - Los Angeles
Walt Disney Animation Studios

(contains audio)

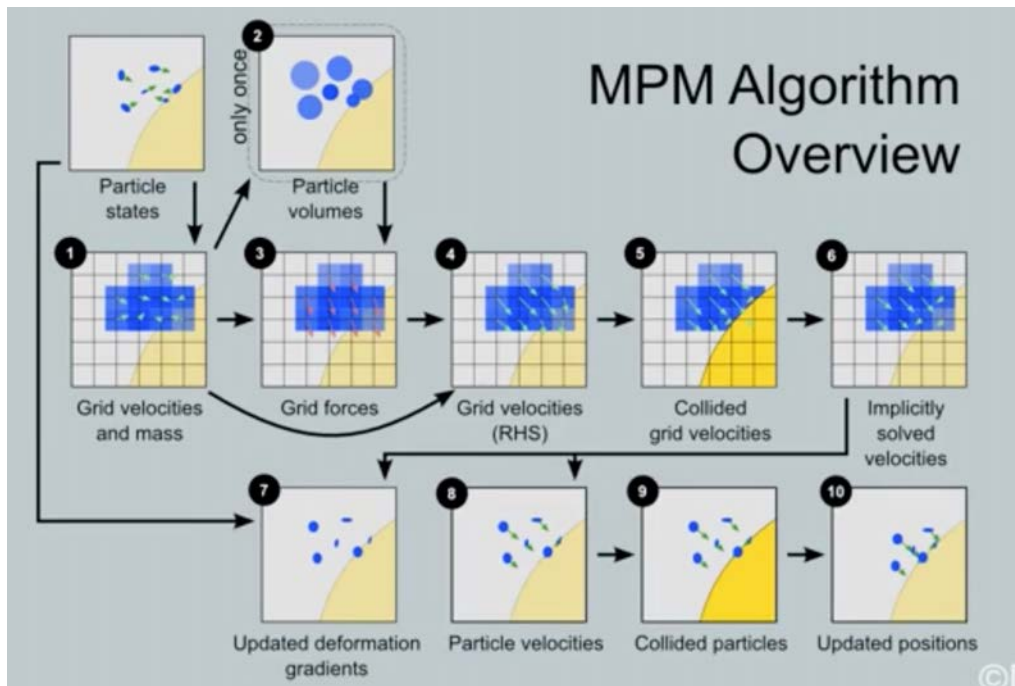


SIGGRAPH 2013

©Disney



©Disney



Schools that are adopting an LS30-style course

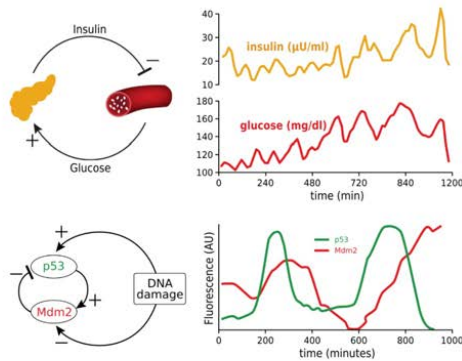


MASTER CLASS IN

TEACHING MATH MODELING FOR LIFE SCIENCES

JULY 9TH - JULY 14TH

SCHEDULE



INSTRUCTORS

Alan Garfinkel | UCLA
Eric Deeds | UCLA



We are doing this again in the Summer of 2024.

please apply!

ps. we are seeking funding!

Essay

Mathematics Is Biology's Next Microscope, Only Better; Biology Is Mathematics' Next Physics, Only Better

Joel E. Cohen

In the coming century, biology will stimulate the creation of entirely new realms of mathematics. In this sense, biology is mathematics' next physics, only better.



PLoS Biology | www.plosbiology.org

The End

