

Adventures in Co-Teaching a Data Driven Modeling Course

SIMIODE EXPO 2021
February 12-13

Rebecca Sanft
Department of Mathematics
UNC Asheville

Anne Walter
Department of Biology
St. Olaf College

Exploring Mathematical Modeling in Biology

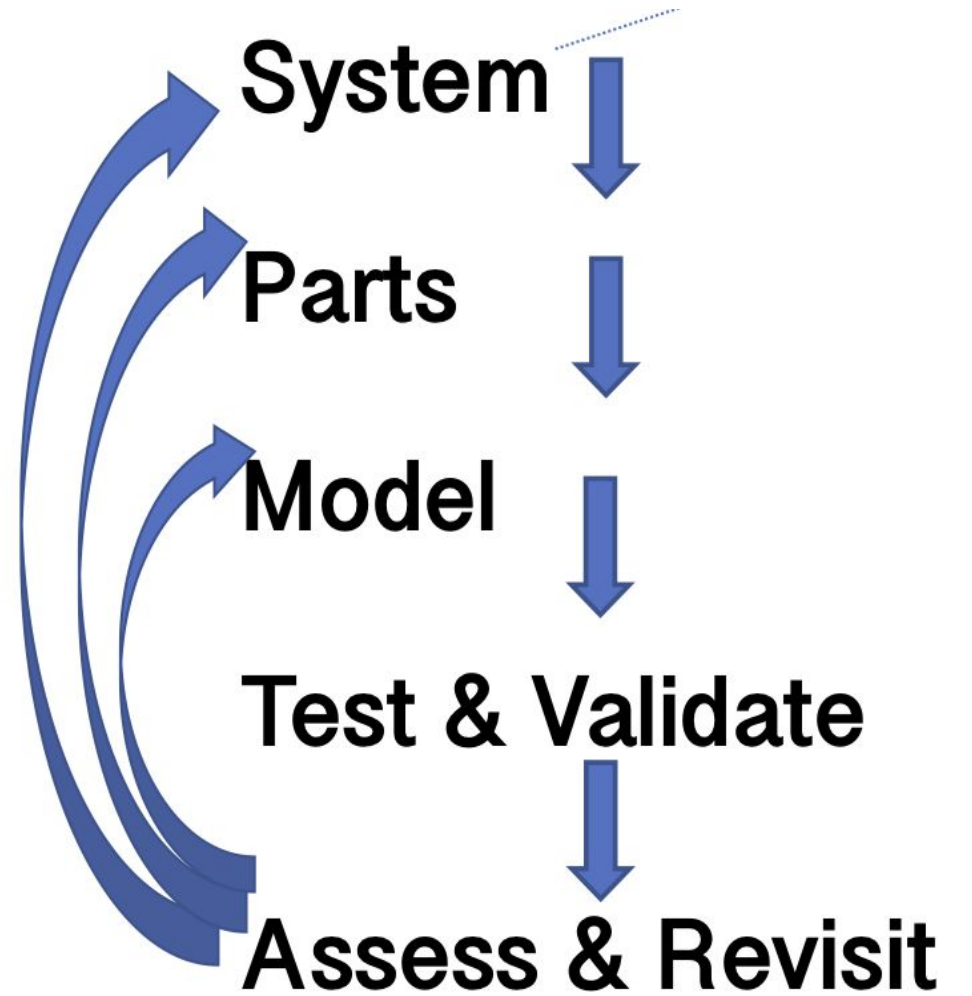
Through Case Studies and
Experimental Activities

Rebecca Sanft
Anne Walter





Integrate modeling steps with data collection in the lab or literature to address real questions with opportunities to assess & revisit each step.



Audience: Ours and those we can envision

Audience

- Undergraduate biology and math students with at least a minimal math background (e.g., Calculus I).
- Faculty teaching undergrads in STEM

Applicable

- Beginning modeling courses, especially those intended for students from multiple disciplines ± lab
- Supplement math or life sciences courses with individual cases & labs
- Any class introducing R will find R tutorial helpful



Ideal support includes a peer teach assistant for lab & an R-tutor.

Unit 1: Preliminaries: Models, R and Lab Techniques

Practice:

- Matrices
- Data Frames
- Plotting
- Data Files
- Iteration
- Fitting linear regression & residuals

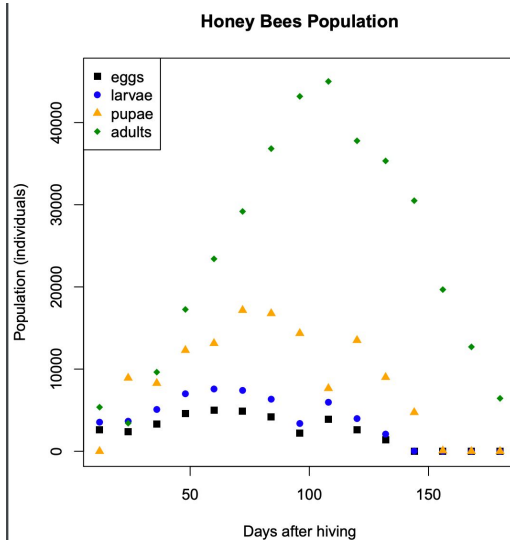
Putting it together:

- Life expectancy vs. birth year
- Allometric scaling using linearized power law for metabolic rate vs. body mass
- Another power law: species vs. area curves for bird species on West Indian Islands.

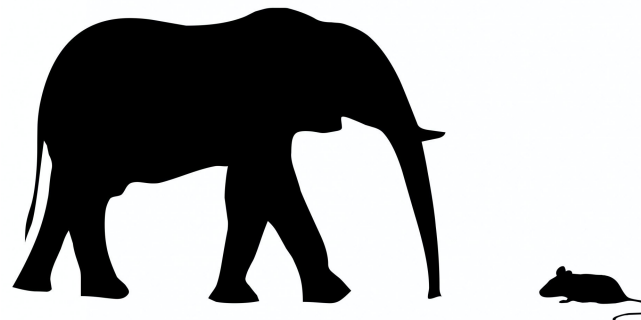
Pre-lab: Practicing the Fundamentals



- Pipets
- Serial dilutions
- Spectrophotometry
- Plotting data to ask different questions:
 - Absorbance vs. dilution step (exponential)
 - Absorbance vs. concentration (linear)



(all exercises with biological data)



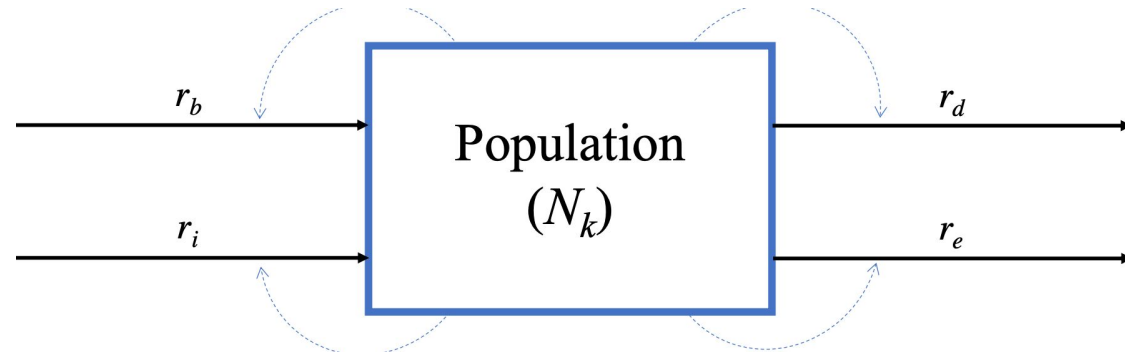
Unit 2: Introduction to Modeling Using Difference Equations

Modeling process

- Articulate assumptions
- Define questions
- Units
- Discrete-time equations
- Linear regression

Practice

- Develop models with difference equations
- Find solutions
- Population growth models of increasing complexity
- Calibrate by linear regression



Putting it all together:

When will the whooping crane population reach a sustainable size e.g., 1000 individuals?

Given annual crane count from 1938-2009, use population growth models to project when $N_p = 1000$.



Unit 2: Introduction to Modeling Using Difference Equations

Island Biogeography

Species Source

Colonization rate constant (r_C) decreases with distance.

Extinction rate constant (r_E) decreases with size.

Pharmacokinetics

shutterstock.com • 548869246

Invasive Species

Lab: Population Dynamics

<https://commons.wikimedia.org/w/index.php?curid=77361059>

100 μL bacterial culture

900 μL sterile water in each tube

10⁻¹ 10⁻² 10⁻³ 10⁻⁴ 10⁻⁵ 10⁻⁶ 10⁻⁷

Mix

Repeat for each sequential tube.

Add 100 μL of final dilutions to nutrient agar plate

P_{n+1}

P_n

Unit 3: Differential Equations: Model Formulation, Nonlinear Regression, Model Selection (serious modeling & lots of basics!)

Exercises:

Math & Model concepts

- rates vs rate constants
- mass action
- Feedback -- positive & negative
- Saturation

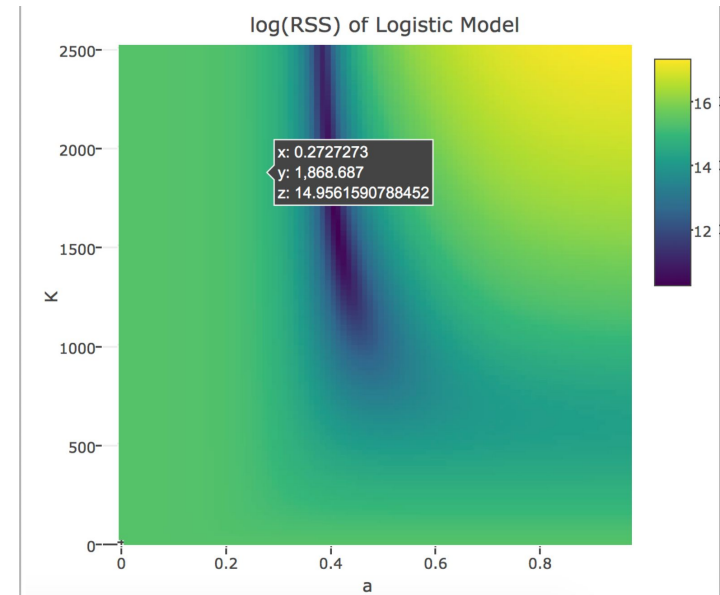
Investigating parameter space with sliders

Using sum of the squared residuals (RSS) for nonlinear fits

Heat maps

Model selection -- one tool AICc

- "filling the bathtub"
- rate constants
- Predator - prey models
- Tumor Immunotherapy, a system of three equations
- Apply RSS to bacteria assuming logistic growth model
- Compare models for temperature dependence of photosynthesis

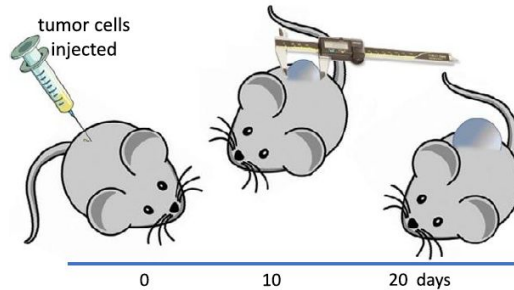


Unit 3: Differential Equations: Model Formulation, Nonlinear Regression, Model Selection

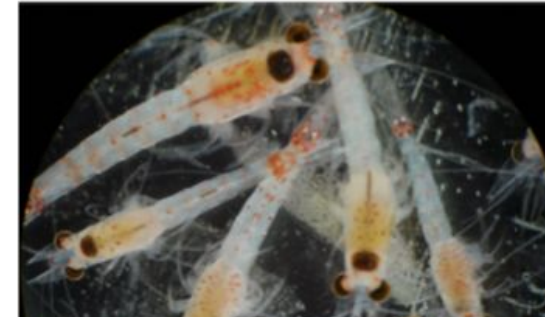
Leaf Decomposition



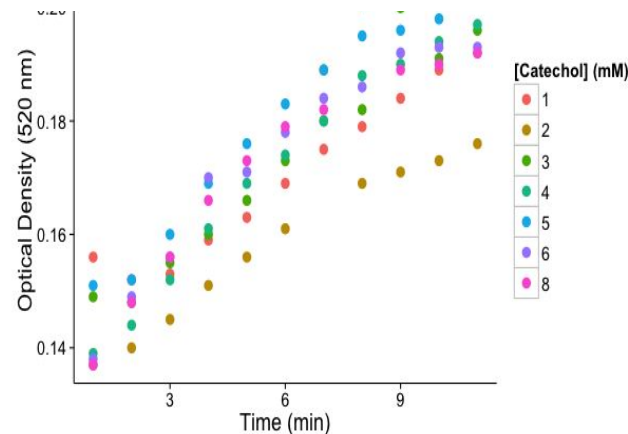
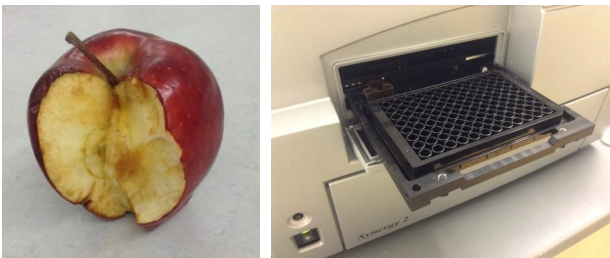
Tumor Growth Models



Predator-Prey Responses



Lab: Enzyme Kinetics



$$V_0 = \frac{V_{max}[S]}{K_M + [S]}$$

Unit 4: Differential Equations: Numerical Solutions, Model Calibration, Sensitivity Analysis

Exercises:

*Numerical solutions starting with logistic growth.

*Sensitivity analysis
Global sensitivity
Local sensitivity
with simple logistic growth...

Spruce budworm population depends on forest and predation by birds.

Tumor growth with carrying capacity dependent on volume ... two differential equations.



Putting it all together: Ebola virus infects cells

1. Frame the model
2. Numerical solution using best guess estimates
3. Data are viruses vs. time
4. Fitting parameters/calibrating
5. Sensitivity analysis

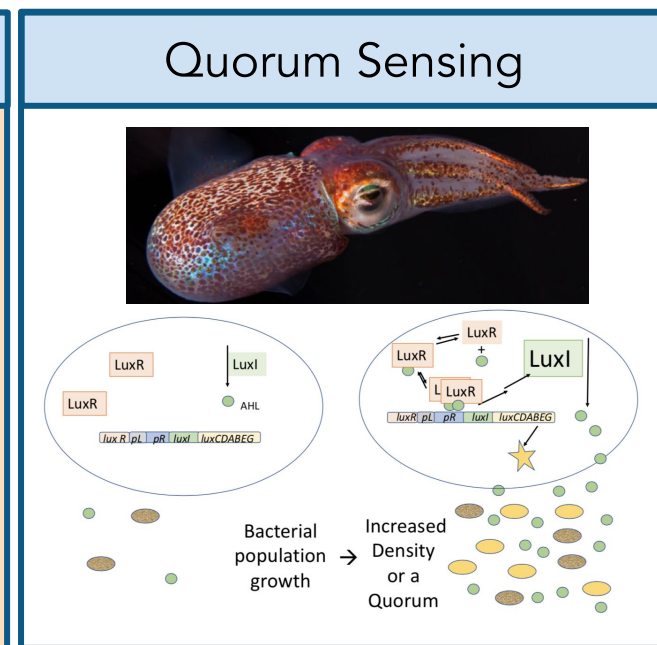
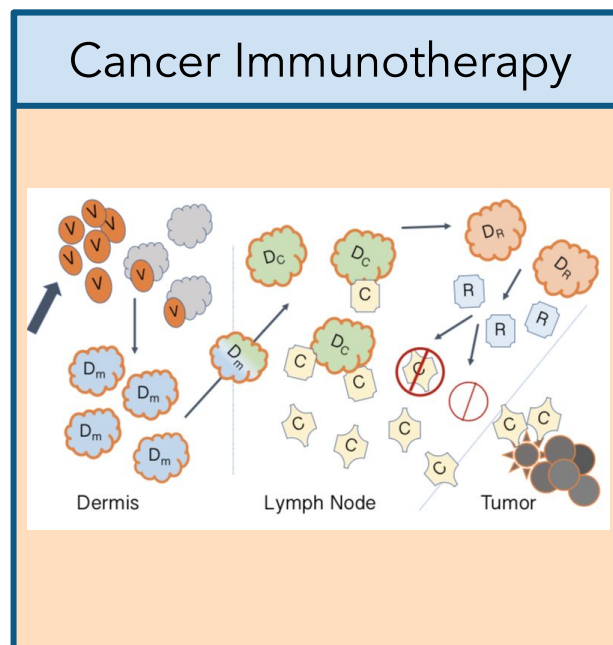
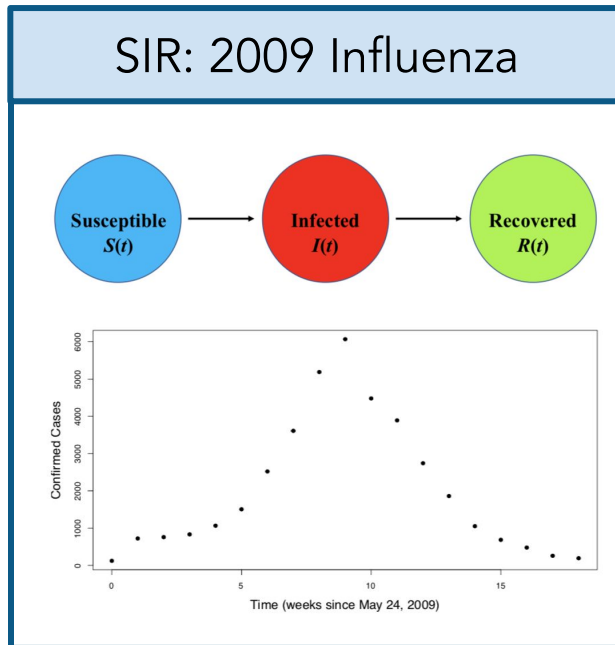
$$\frac{dU}{dt} = \lambda - \alpha U - \beta UV$$

$$\frac{dI}{dt} = \beta UV - \delta I$$



$$\frac{dV}{dt} = \rho I - cV$$

Unit 4: Differential Equations: Numerical Solutions, Model Calibration, Sensitivity Analysis

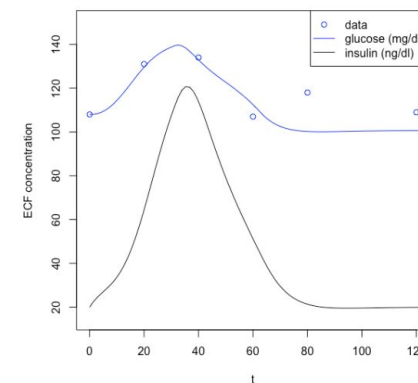


Lab: Homeostasis: Glucose & Insulin



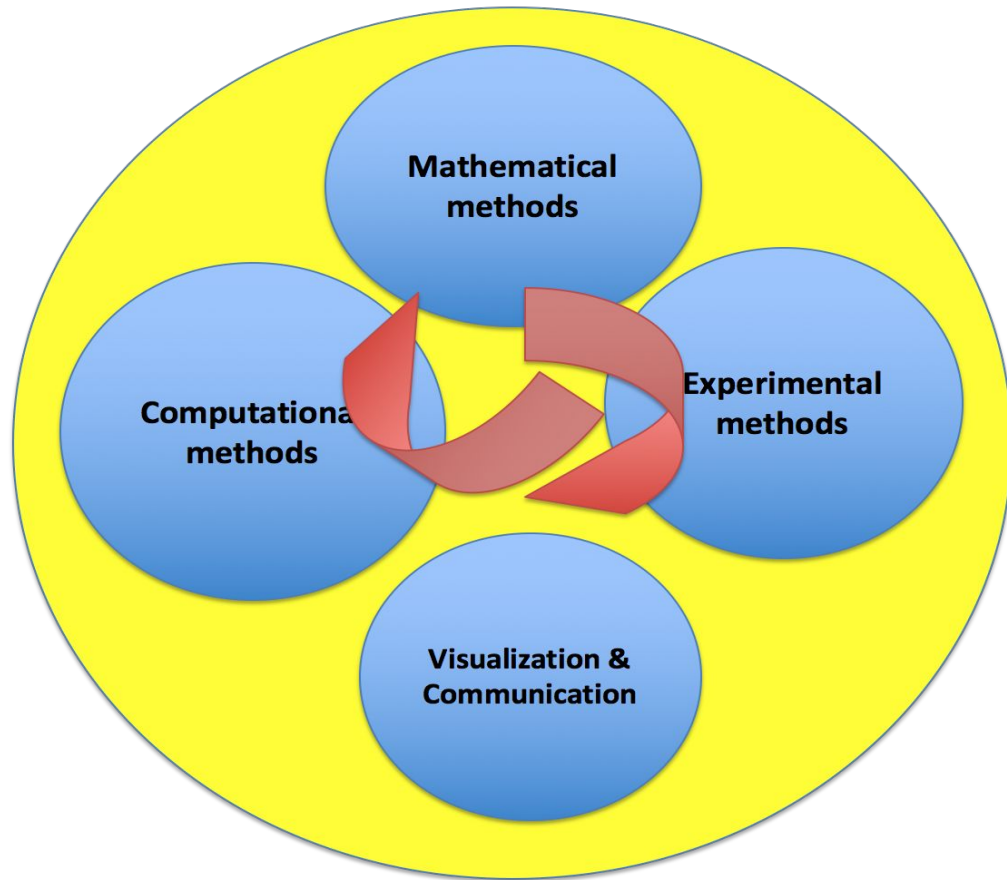
$$\frac{dG}{dt} = \text{glucose delivery} - \text{glucose uptake}$$

$$\frac{dI}{dt} = \text{insulation secretion} - \text{insulin breakdown}$$



Culminating Project:

Students generate and complete small independent projects in interdisciplinary teams



Preparation

- Paper writing exercises from data set & prompt

Steps:

- Hypothesis & research plan including data analysis
- Team oral presentation

Topics:

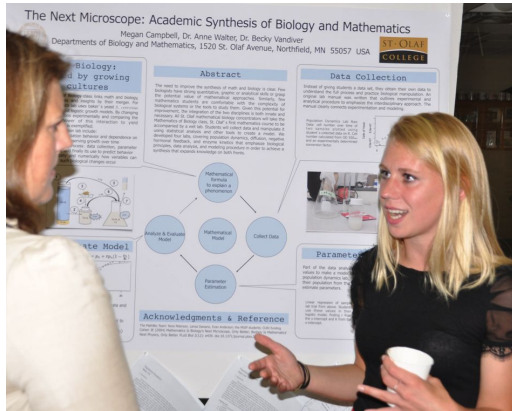
- Variation on Labs
- Extensions of Case Study Topics

Frequently asked questions!

- I've never taught a lab before!
 - a. Not essential but worth trying even if only one.
 - b. Technical support & alternative labs including "dry" activities in the end of the book.
 - c. partner with a biologist!
 - d. hire a biology major as a teaching assistant
- Is team teaching necessary?
 - a. No but it is fun.
 - b. Problems come alive with biologist and math more nuanced with a mathematician.
 - c. Individual exercises can be modified for use in many classes without a "team".
- How is team teaching supported?
 - a. Limiting expectations so increase in FTE is minimal (e.g., 4 hrs/week)
 - b. cross-listing, general education requirements

Acknowledgements

- Matt Richey (former St. Olaf Associate Dean)
- Nora Peterson, Megan Campbell and Lansa Dawano



-
- Sanft, Rebecca, and Anne Walter. "Experimenting with Mathematical Biology." PRIMUS 26.1 (2016): 83-103.
 - <https://wp.stolaf.edu/mathbio/>
 - Sanft, Rebecca, and Anne Walter. *Exploring Mathematical Modeling in Biology Through Case Studies and Experimental Activities*. Academic Press, 2020.

Assessment: Quotes from Course Reflection Papers

“I am taking an introductory computer science class next semester. My decision to do so was based in part on my experiences in this class; I want to have the capability to utilize computing power to explore real-world systems.”

“Next year I will be working as an ecological research assistant and I fully expect this class to influence the way I think and do work.”

“The process of modeling taught me greater intentionality in my problem-solving. The math bio course has pushed me to think in ways that are not the most intuitive for me. I think I have become a stronger student because of this.”

“This class gave me confidence in my ability to collaborate with students/colleagues in other fields.”