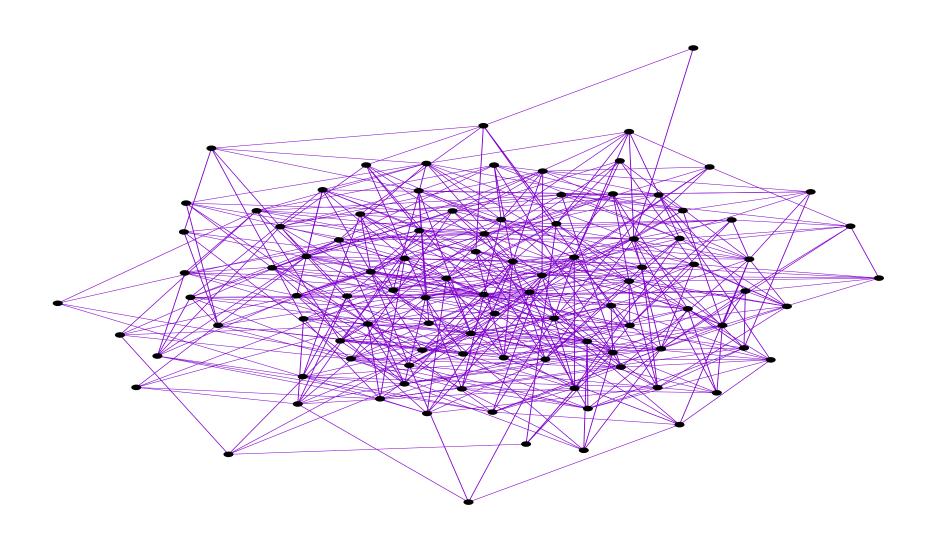
### Lecture 7: Feedbacks



### Intuitive Definitions

- Everyday language definitions
- Examples from Johnson/Emergence



http://www.sinc.co.uk/news/46/index.html



www.genniferflowers.com

### **Formal Definitions**

- "The state of a model entity has an effect on the entity itself"
- Inherently temporal
- Difference equations / differential equations
- Agent based models
- Loops
- Complex Systems

### Positive and Negative Feedbacks

- Positive: reinforcing
  - Chain reactions

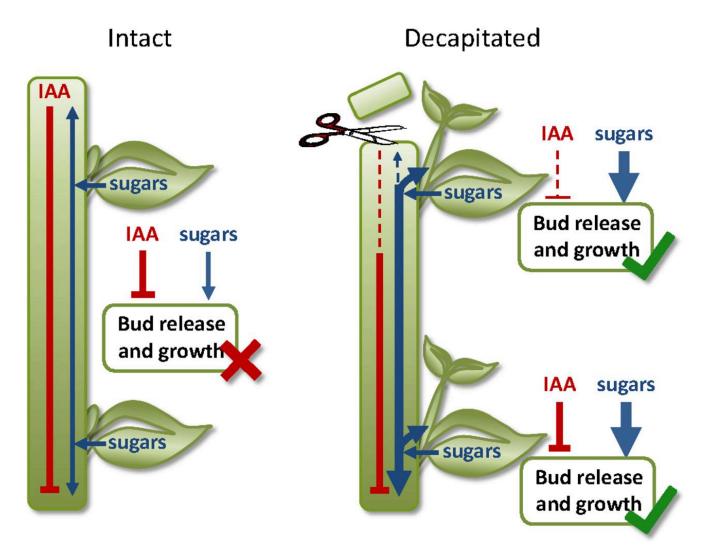
- Negative: regulating, damping/inhibiting
  - "homeostasis"

# Some Examples From Biology....

### Plant Physiology (!)

- Regulation of bud dormancy
  - Auxin (IAA) and Sugars
  - Actively growing buds inhibit other buds' growth
  - Removal of apical bud releases lower buds
  - Newly released buds inhibit others
  - Adaptive e.g. for herbivory

#### Apical dominance is controlled by sugar and hormone responses.

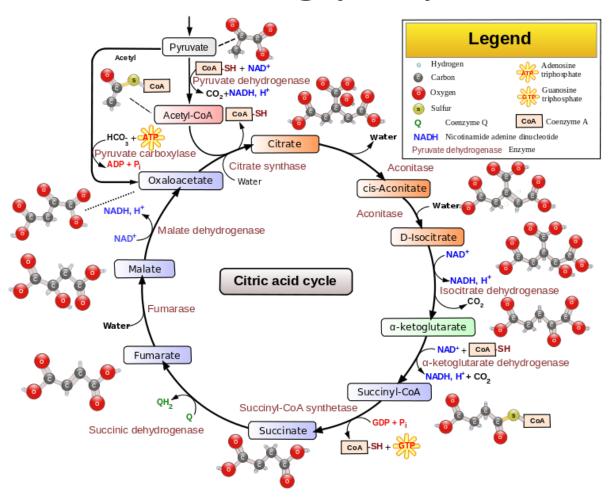


Michael G. Mason et al. PNAS 2014;111:6092-6097

### Biochemistry

- The Citric Acid Cycle
  - Many steps
  - Reaction rates regulated by concentrations of products

# High citrate concentration inhibits further glycolysis



### Sexual Selection

- Selection for morphological traits affecting mating success.
- Female choice (typically).
- Positive feedback loop.

### Sexual Selection: Extreme Phenotypes

Bird-of-paradise



### Sexual Selection: Extreme Phenotypes



### **Examples From Social Science**

- Product ratings/recommendations
- Urban Development
- Others?

# Some Formal, Mathematical Examples...

# Simplest Possible Feedback Model Examples:

1-variable, aspatial

Exponential population growth

$$X_{t+1} = \alpha X_t$$

Logistic population growth

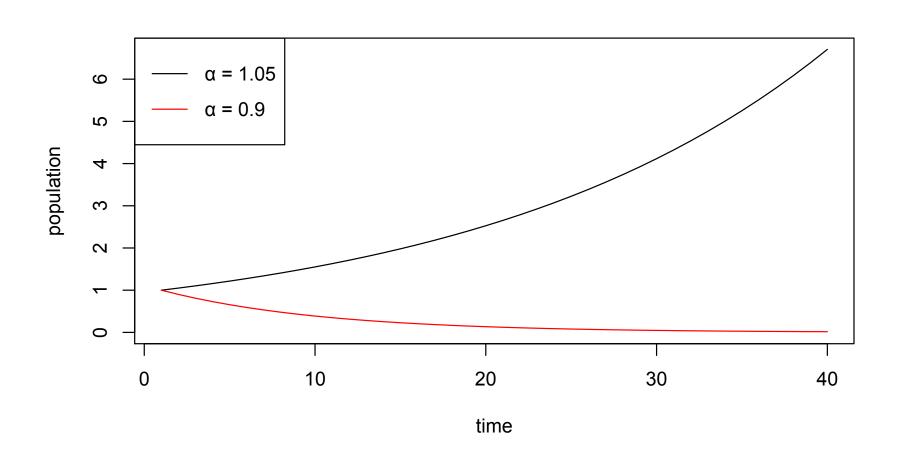
$$x_{t+1} = \alpha x_t (1 - x_t)$$

### **Exponential Population Growth**

$$x_{t+1} = \alpha x_t$$

Positive feedback (when  $\alpha > 1$ )

# **Exponential Population Growth**



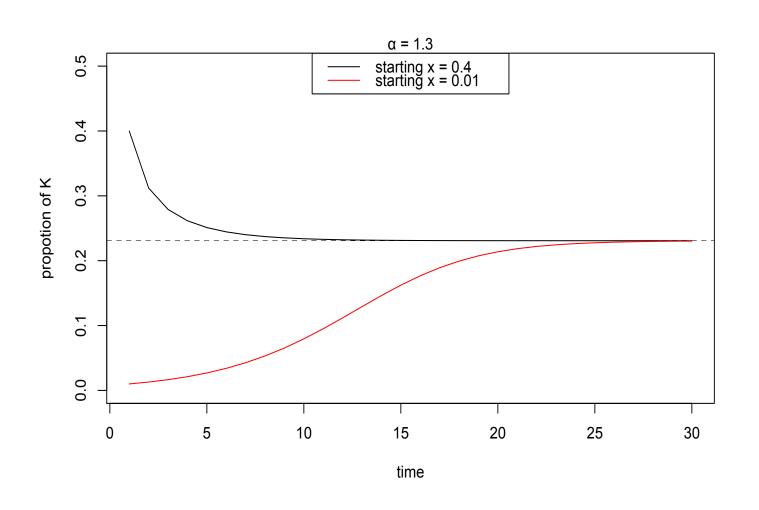
### Logistic Population Growth

$$x_{t+1} = \alpha x_t (1 - x_t)$$

**Positive** 

Negative

# Logistic Population Growth



## Logistic Population Growth

• At equilibrium:

$$X_{t+1} = X_t$$

Perturbations

# More complex feedback: 2-variables, coupled model

 Predator/Prey Interaction: the Lotka-Volterra Equations

Prey: 
$$\frac{dx}{dt} = \alpha x - \beta xy$$

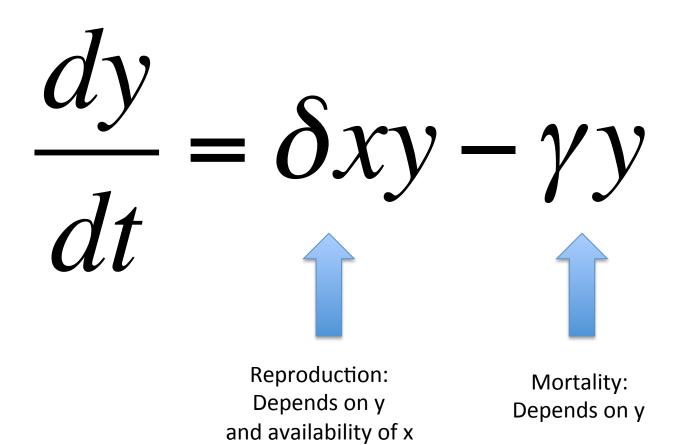
Predator: 
$$\frac{dy}{dt} = \delta xy - \gamma y$$

### **Prey Model**

$$\frac{dx}{dt} = \alpha x - \beta xy$$

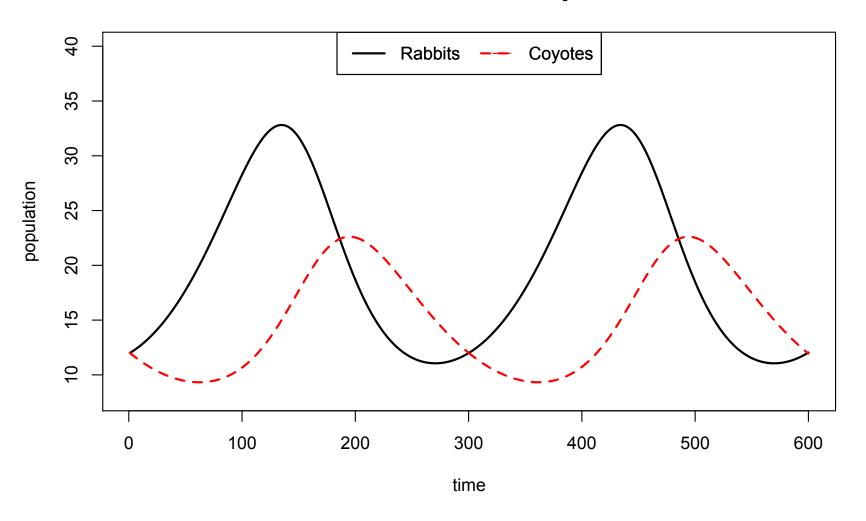
Reproduction: Depends on x Predation: Depends on x and y

### **Predator Model**



## Feedback can lead to cycles

#### **Lotka-Volterra Predtor/Prey Model**





### Feedbacks in Spatial Models

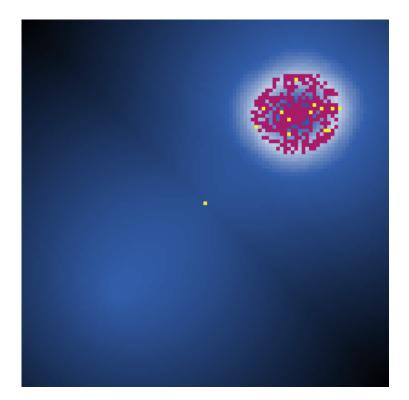
 Attempt to create a simple spatial predator/ prey model of Lotka-Volterra dynamics: What happens?

### Feedbacks in Spatial Models

- Attempt to create a simple spatial predator/prey model of Lotka-Volterra dynamics: What happens?
- Why model?
  - Expose prevailing wisdom as incompatible with available data
  - Challenge the robustness of prevailing theory through perturbations
  - Discover new questions
  - Among others...

### Feedbacks in Spatial Models

- Urban Development: The Brown et al. model
  - Spatial pattern of development affects subsequent development.
  - Path dependence



# A Complex System: Mount Pine Beetles

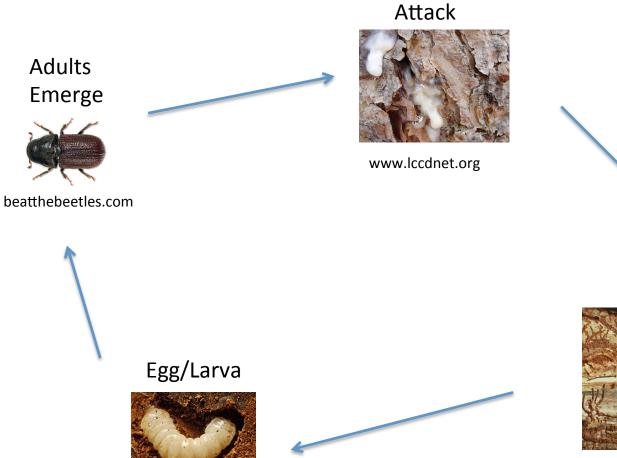


beatthebeetles.com



news.ubc.ca

# MPB Life Cycle Overview



apkxda.com

#### Reproduce



sdda.sd.gov

### System Drivers

- Climate: Temperature, Precipitation, Wind
- Fire: Severity
- Beetle Communication: Pheromones
- Temporal: Successional Stage
- Spatial: Environmental Heterogeneity
- Forest Policy: Fire Supression, Age Structure

### Feedbacks

- Pheromones: Aggregation and Repulsion
- Competitors
- Climate
- Age Structure

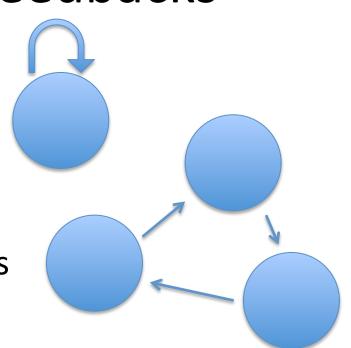
# MPB Endemic vs. Epidemic Phase

• Endemic: stable, low population size

Epidemic: population explosions

### Mechanics of Feedbacks

- Direct
  - Entity affects self directly
- Indirect
  - Feedback via intermediaries
- Cross-Scale
  - Processes occurring at different spatial/temporal scales



### Stochasticity

- What is stochasticity?
- How is stochasticity implemented in models?
- How is it related to uncertainty?

### Next Lab

Read Brown et al. through section 2.3