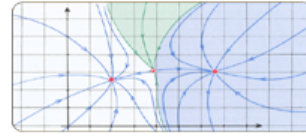
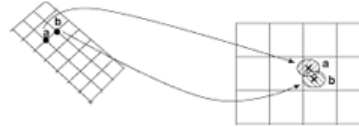


## Part 1: Dynamics

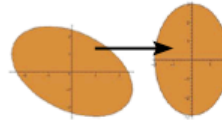
Jan 10 (01) **2-Dimensional flow geometries.** HW1



Jan 12 (02) **Discrete dynamics & Mappings.**



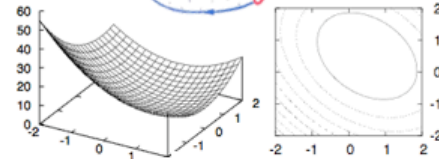
Jan 17 (03) **Diagonalization & eigenvalues.** HW2



Jan 19 (04) **Higher dimensional dynamics & linearization.**



Jan 24 (05) **Stability & Gradient systems.** HW3



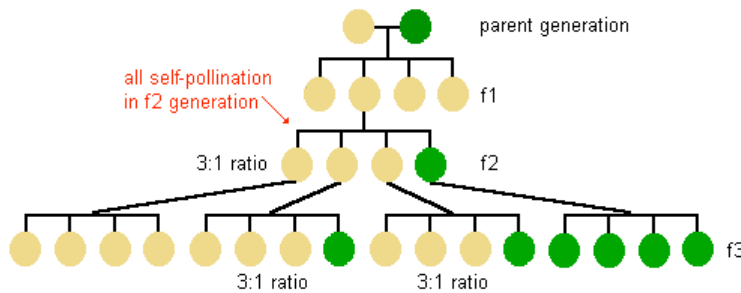
*Dynamics: The Geometry of Behavior*, Ralph Abraham and Chris Shaw (2005)  
*Nonlinear dynamics and chaos*, Steven H. Strogatz (1994)  
*Mathematical Models in Biology*, Leah Edelstein-Keshet (1988)

01\_Dynamics.psd

## Population Dynamics

Step 1. Draw a distinction  
*Multi-generational population*

Step 2. Specify an example  
*Mendel's Peas*



**How many survive with each generation?**

*Mathematical Models in Biology*, Leah Edelstein-Keshet (1988)

02\_PopulDyn.psd

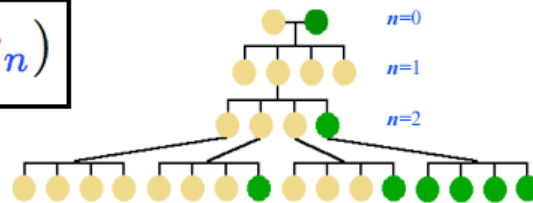
## Population Dynamics

Step 3. Quantify the salient features.

How **many** survive with each **generation**?

Discrete Problem:

$$x_{n+1} = f(x_n)$$



Step 4. Classify the dynamics.

*Mathematical Models in Biology*, Leah Edelstein-Keshet (1988)

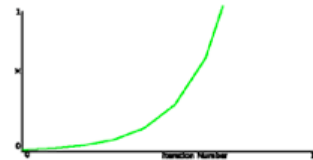
03\_PopulDyn.psd

## Population Dynamics: Unlimited Resources

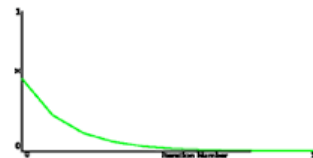
$$x_{n+1} = ax_n$$

### Exponential Growth or Decay

If  $|a| > 1$ , then exponential growth.



If  $|a| < 1$ , then exponential decay.



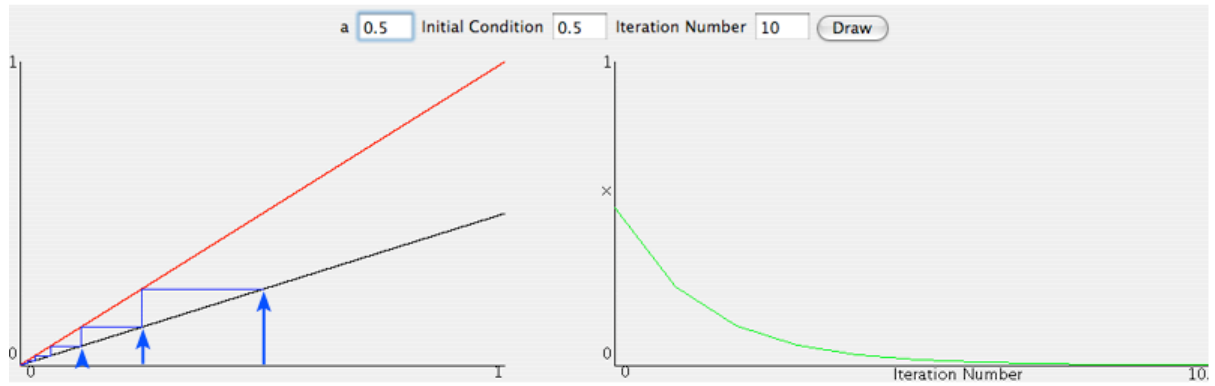
If  $a = 1$ , then perfect replenishment.



*Mathematical Models in Biology*, Leah Edelstein-Keshet (1988)

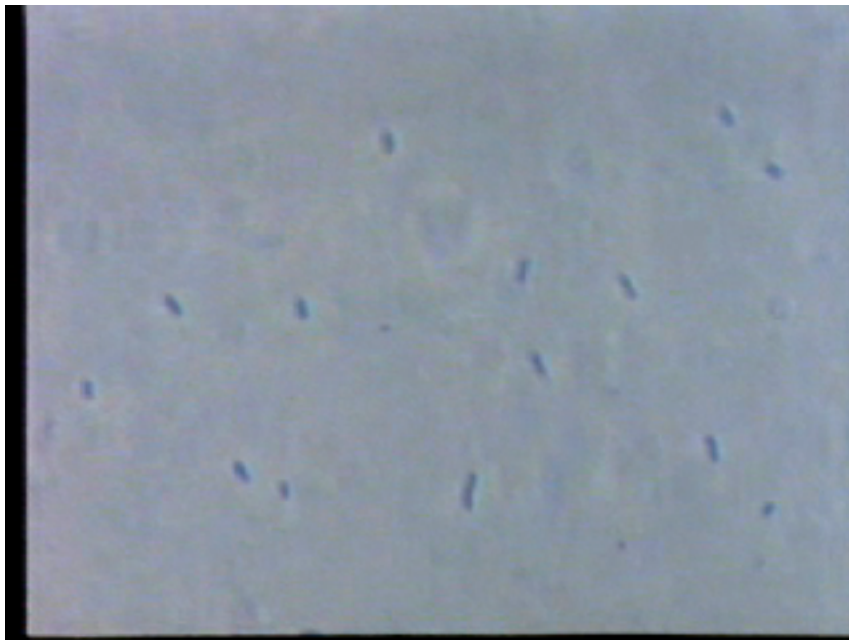
04\_unlimited.psd

## Linear, Recursive Mapping



$$x_{n+1} = ax_n$$

05\_simLinear.psd

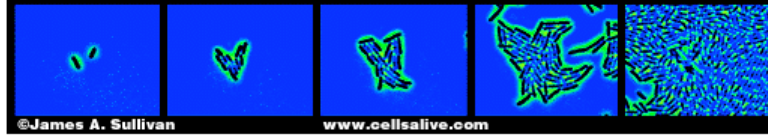


06a\_bacterial\_division.mov

## Population Dynamics: Bacterial Growth

Step 1. Draw a distinction  
*Multi-generational population*

Step 2. Specify an example  
*Fast Reproducing E. coli*



## Continuum Exponential Growth or Decay

$$\frac{dx}{dt} = ax$$

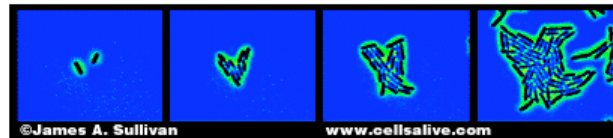
*Mathematical Models in Biology*, Leah Edelstein-Keshet (1988)

06b\_bacteria.psd

## Population Dynamics: Limited Bacterial Growth

Step 1. Draw a distinction.  
*Bacterial population + resources*

Step 2. Specify an example.  
*Fast Reproducing E. coli*



## Limited Resources = Limited Growth

$$\frac{dx}{dt} = ax(1 - x)$$

*Mathematical Models in Biology*, Leah Edelstein-Keshet (1988)

07\_limited.psd

## Digression: Solving differential equations

Logistic equation:  $\frac{dx}{dt} = ax(1 - x)$

$$\frac{dx}{x(1 - x)} = a dt$$

Use partial fractions by solving for A & B:  $\frac{1}{x(1 - x)} = \frac{A}{x} + \frac{B}{1 - x}$

$$\left[ \frac{1}{x} + \frac{1}{1 - x} \right] dx = a dt$$

$$\ln(x) - \ln(1 - x) = at + c$$

$$\frac{x}{1 - x} = e^{at+c}$$

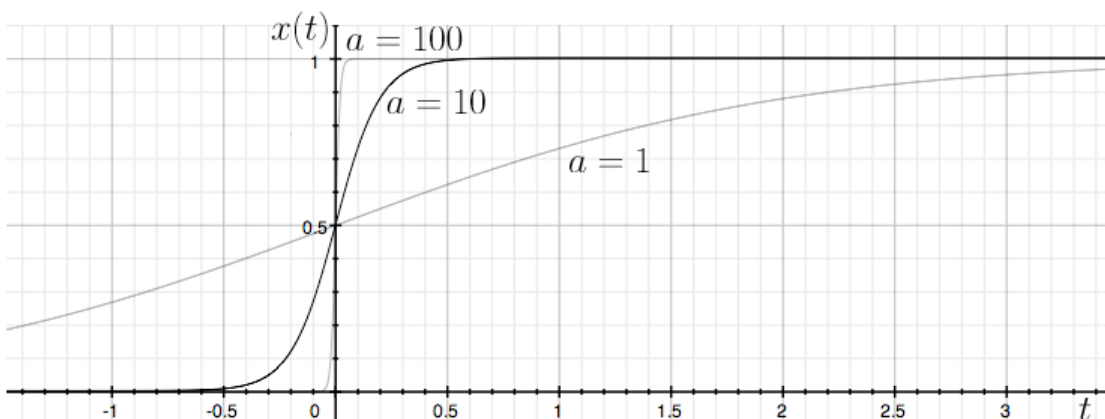
Sigmoid solution (saturation):  $x(t) = \frac{1}{1 + e^{-at+c}}$

08\_solve.psd

## Population Dynamics: Limited Bacterial Growth

$$x(t) = \frac{1}{1 + e^{-at+c}}$$

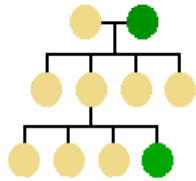
### Saturation with Growth Rate Parameter:



09\_saturation.psd

## Return to the Discrete Case: Annual Generations

Step 1. Draw a distinction  
*Multi-generational + limited resources*



Step 2. Specify an example  
*Mendel's Peas*



What are the new saturation dynamics?

Discrete logistic equation:

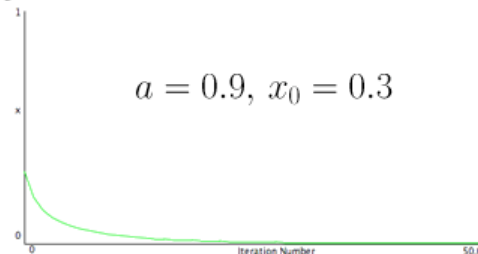
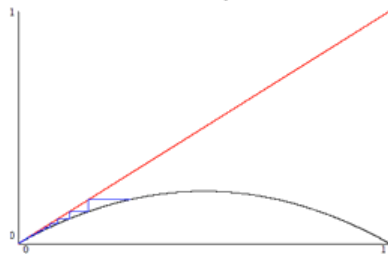
$$x_{n+1} = ax_n(1 - x_n)$$

10\_limitedPeas.psd

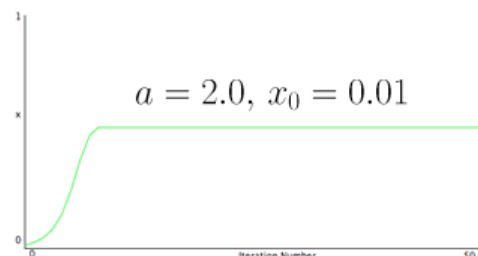
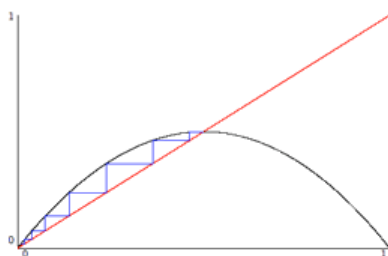
## Discrete Population Dynamics: Limited Resources

$$x_{n+1} = ax_n(1 - x_n)$$

If  $|a| < 1$ , then exponential decay?



If  $|a| > 1$ , then growth until saturation?



11\_limitedDyn.psd

## Fixed Points of a Mapping

$$\begin{aligned}x_{n+1} &= f_a(x_n) \\ &= ax_n(1 - x_n)\end{aligned}$$

What are the fixed points,  $\bar{x} = f_a(\bar{x})$  ?

**Fixed Point Theorem.** *Suppose that the map  $f_a(x)$  has a fixed point at  $\bar{x}$ . The fixed point is stable if*

$$\left| \frac{d}{dx} f_a(\hat{x}) \right| < 1,$$

*and it is unstable if*

$$\left| \frac{d}{dx} f_a(\hat{x}) \right| > 1.$$

*Nonlinear Dynamics and Chaos, Stephen Lynch(2004)*

11b\_fixedPt.psd

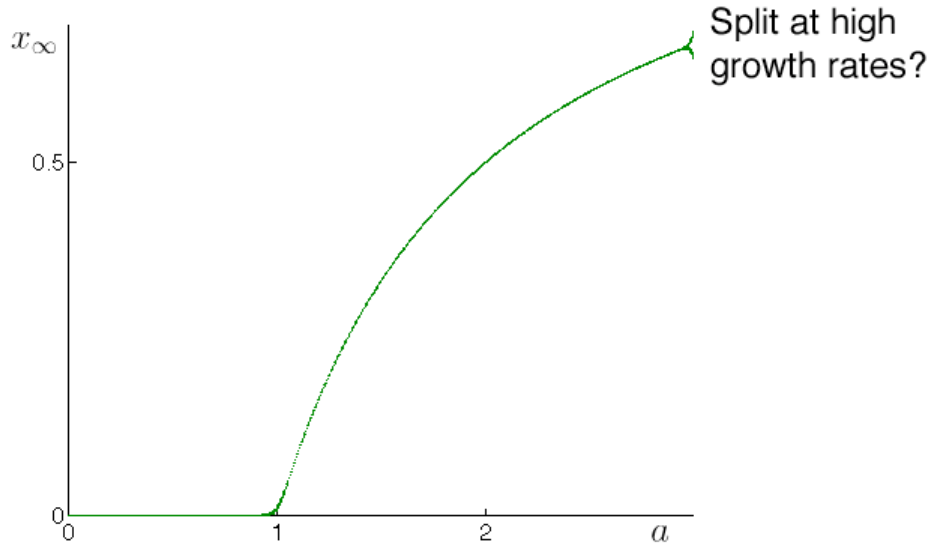
## Fixed Points of a Mapping

11c\_blackboard.psd

## Discrete Population Dynamics: Limited Resources

$$x_{n+1} = ax_n(1 - x_n)$$

Bifurcation Diagram for the Fixed Point (100 iterations):



12\_limitedDynBifur.psd

### Fixed Points of a Mapping

$$\begin{aligned} x_{n+2} &= f_a(f_a(x_n)) \\ &= a^2 x_n(1 - x_n)(1 - ax_n(1 - x_n)) \end{aligned}$$

What are the fixed points of period two,  $x_{n+2} = f_a(f_a(x_n))$ ?

**Fixed Point Theorem.** Suppose that the map  $f_a(x)$  has a fixed point at  $\bar{x}$ . The fixed point is stable if

$$\left| \frac{d}{dx} f_a(\hat{x}) \right| < 1,$$

and it is unstable if

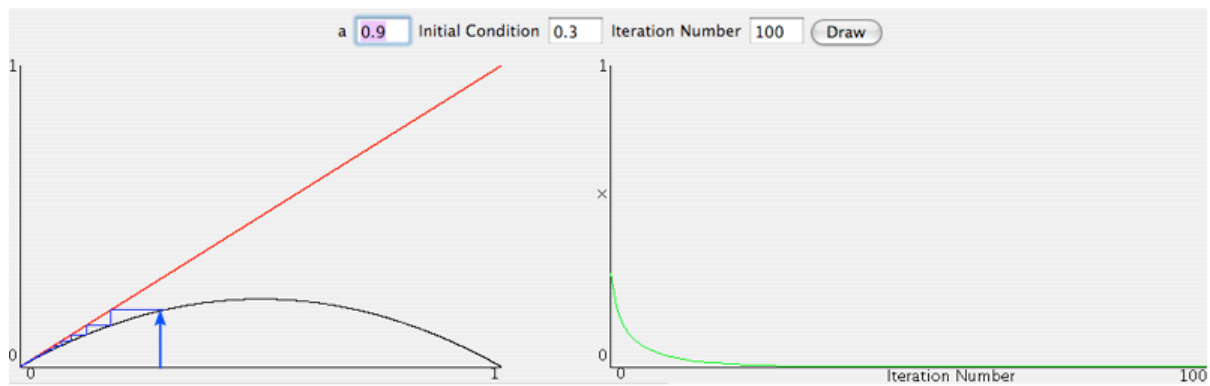
$$\left| \frac{d}{dx} f_a(\hat{x}) \right| > 1.$$



## Fixed Points of a Mapping

12c\_blackboard.psd

## Logistic Mapping



$$x_{n+1} = ax_n(1 - x_n)$$

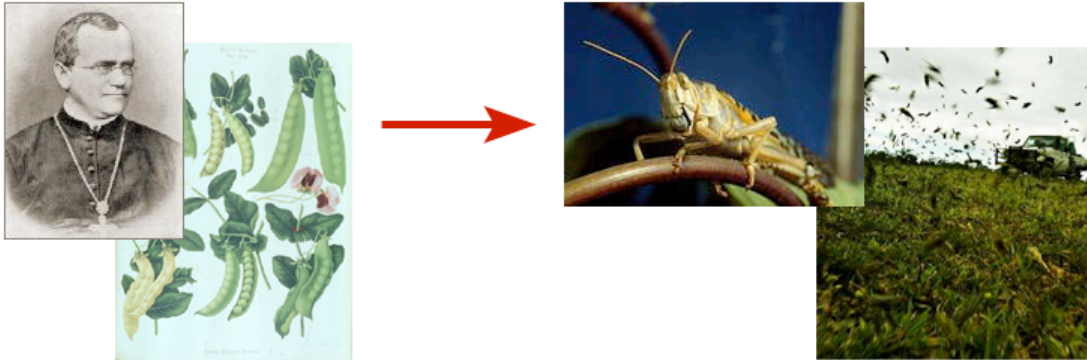
13\_simLogistic.psd

## Fast Growth in the Discrete Case: Large Generations

Step 2. Specify an example

*Mendel's Peas*

*Plague of Locusts*



What are the dynamics as the growth parameter becomes large?

Discrete logistic equation:

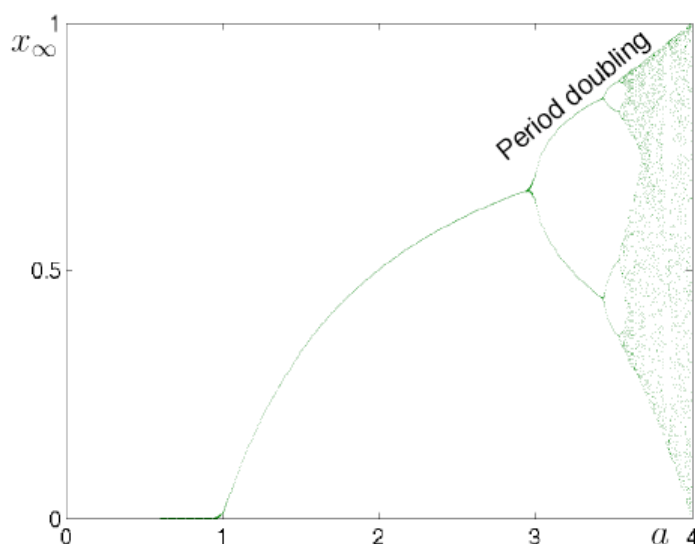
$$x_{n+1} = ax_n(1 - x_n)$$

14\_locusts.psd

## Discrete Population Dynamics: Limited Resources

$$x_{n+1} = ax_n(1 - x_n)$$

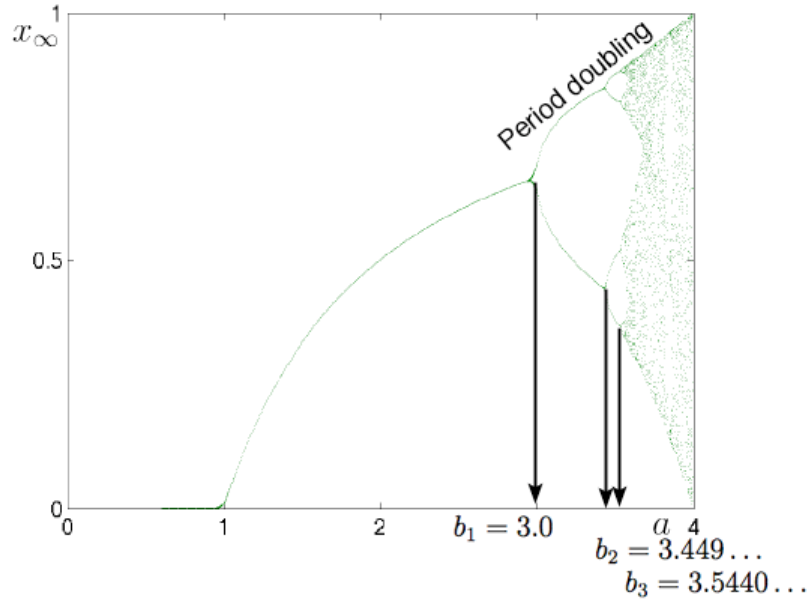
Bifurcation Diagram for the Fixed Point (100 iterations):



Chaos at high growth rates!

15\_limitedDynBifur4.psd

### Universality: Feigenbaum Number



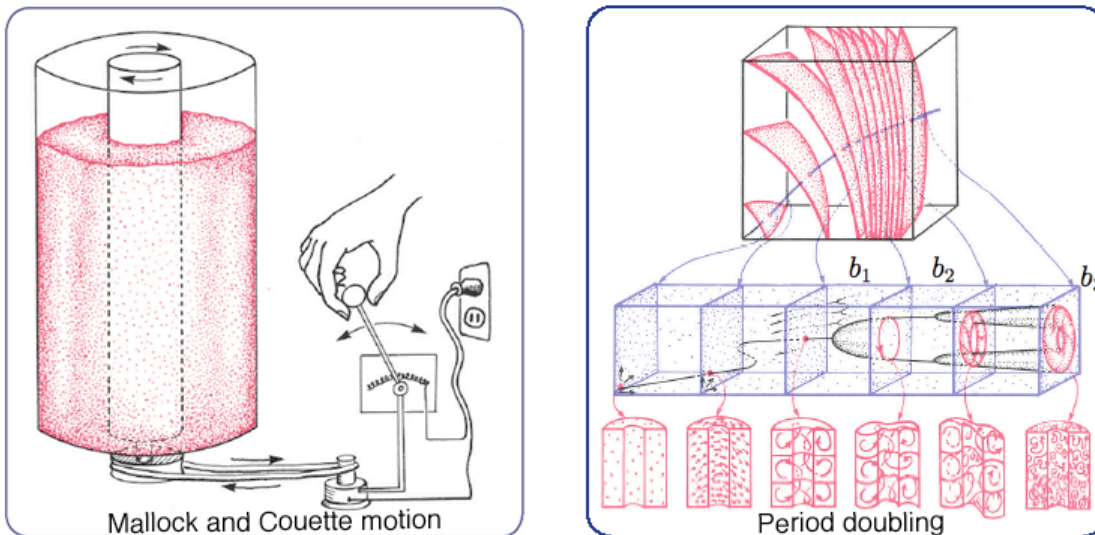
$$d_k = b_{k+1} - b_k$$

$$\delta = \lim_{k \rightarrow \infty} \frac{d_k}{d_{k+1}} = 4.669202 \dots$$

Found in all "period -doubling" cascades to chaos.

15b\_feigenbaum.psd

### Universality: Feigenbaum Number Onset of Turbulence



$$d_k = b_{k+1} - b_k$$

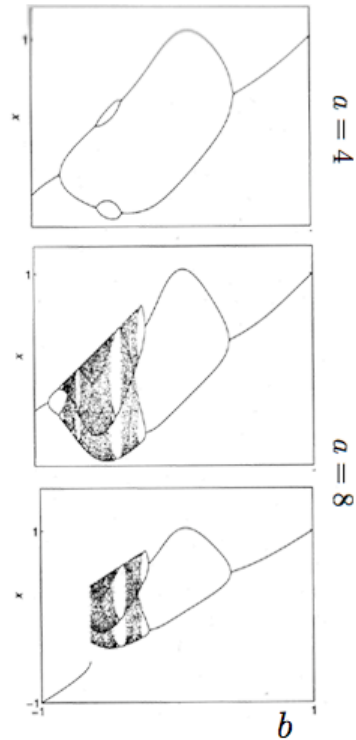
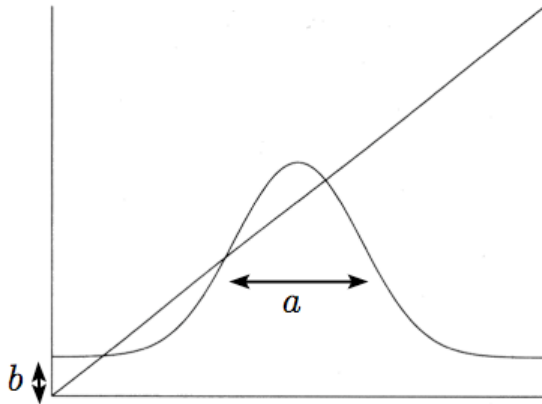
$$\delta = \lim_{k \rightarrow \infty} \frac{d_k}{d_{k+1}} = 4.669202 \dots$$

15c\_turbulence.psd

### Gaussian Map

$$x_{n+1} = f_a(x_n)$$

$$f_{a,b}(x_n) = e^{-ax_n^2} + b$$



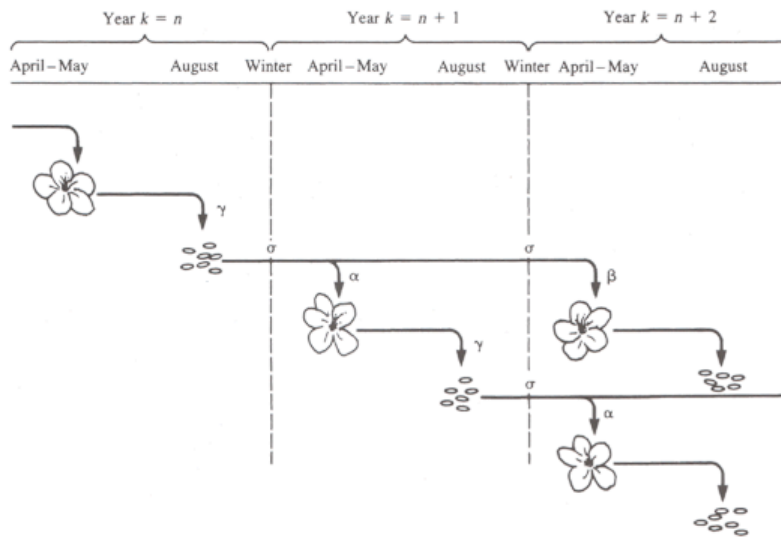
*Nonlinear Dynamics and Chaos*, Stephen Lynch(2004)

15d\_GaussianMap.psd

### Second-Order Population Dynamics

Step 1. Draw a distinction  
*Multi-seasonal population*

Step 2. Specify an example  
*Peas, again...*

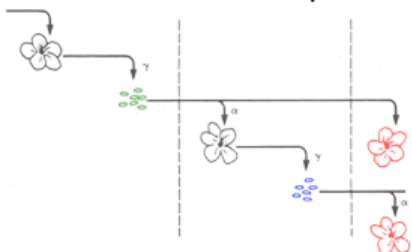


*Mathematical Models in Biology*, Leah Edelstein-Keshet (1988)

16\_2ndSeasonPopul.psd

## Second-Order Population Dynamics

Step 3. Quantify the salient features.



Let  $x_n$  be the numbers of peas in year  $n$ .  
 Let  $y_n$  be the number of plants.  
 Let  $\alpha$  be the fraction of seeds that sprout.  
 Let  $\gamma$  be the number of peas per plant.

$$x_n = \gamma y_n$$

$$y_n = \alpha x_{n-1} + (1 - \alpha)x_{n-2}$$

Eliminate the plant-variable to arrive at a second-order difference equation in peas:

$$x_{n+2} = \gamma(\alpha x_{n+1} + (1 - \alpha)x_n)$$

Step 4. Classify the dynamics.

*Mathematical Models in Biology*, Leah Edelstein-Keshet (1988)

17\_2ndSeasonPopul.psd

## Fibonacci Sequence

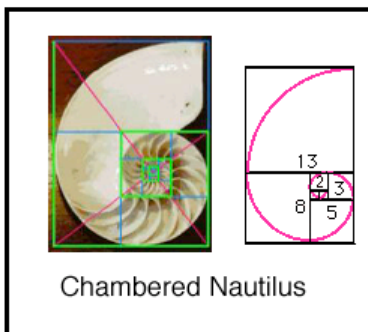
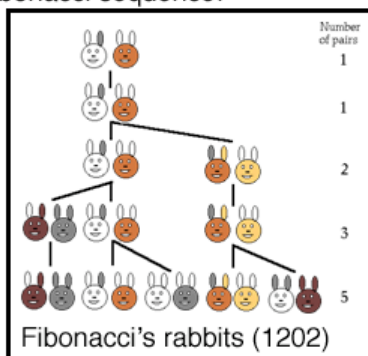
Let  $\gamma = 2$  and  $\alpha = 0.5$ , then we arrive at the Fibonacci sequence:

$$x_{n+2} = x_{n+1} + x_n$$

The Fibonacci sequence can be represented by a 2-dimensional system:

$$\begin{bmatrix} x_{n+2} \\ x_{n+1} \end{bmatrix} = \begin{bmatrix} 1 & 1 \\ 1 & 0 \end{bmatrix} \begin{bmatrix} x_{n+1} \\ x_n \end{bmatrix}$$

$$\vec{x}_{n+1} = \mathbf{A}\vec{x}_n$$

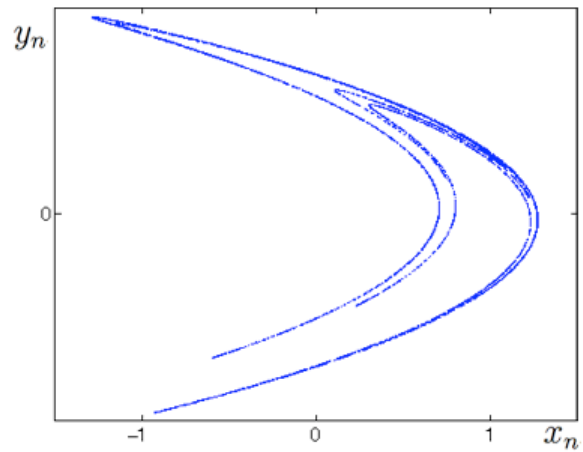


18\_Fibonacci.psd

## Hénon Map

In 1976, M.Hénon described a simple map that has a strange attractor  
 ( $a = 1.4$  and  $b = 0.3$ ).

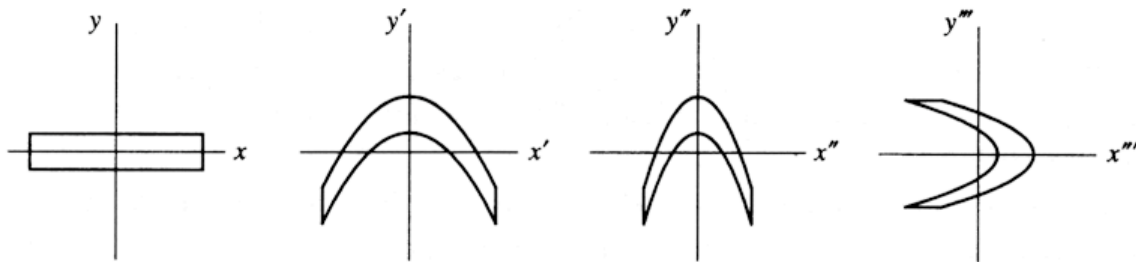
$$\begin{aligned} x_{n+1} &= 1 - ax_n^2 + y_n \\ y_{n+1} &= bx_n \end{aligned}$$



The Hénon map is widely studied. It is invertible and contracts areas.

20\_HenonMap.psd

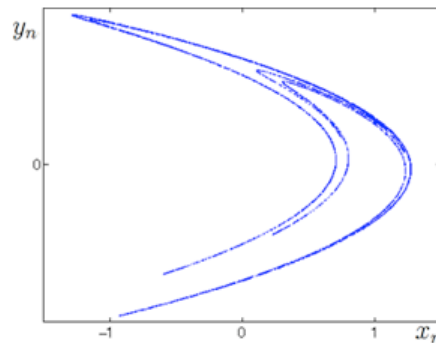
### Transformations that Generate the Hénon Map



$$\begin{aligned} T': x' &= x, y' = 1 + y - ax^2 \\ T'': x'' &= bx', y'' = y' \\ T''': x''' &= y'', y''' = x'' \end{aligned}$$

Then the composition yields the Hénon map

$$T = T''''T''T'$$



21\_HenonTransf.psd

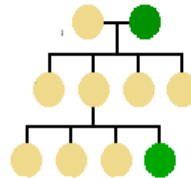
# Fixed Points of the Hénon Map

21b\_blackboard.psd

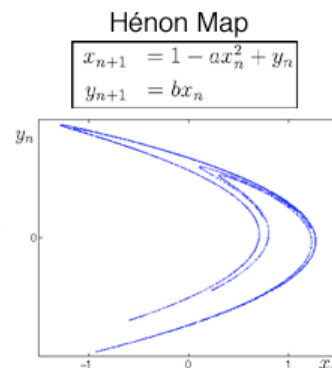
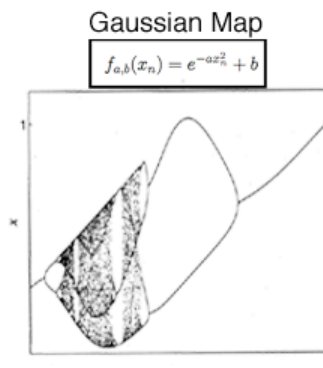
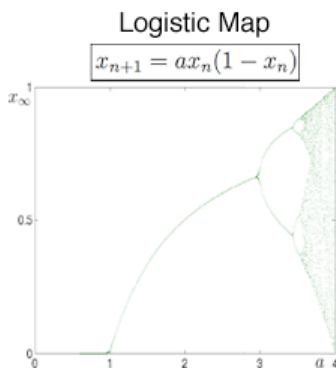
## Summary: Discrete Mappings

Applications: *Discrete processes*

$$x_{n+1} = f_a(x_n)$$



Classify the Dynamics: **1. Find the fixed points**  
**2. Determine stability**



22\_summary.psd

## Function Iteration and Julia Sets

$$z_{n+1} = z_n^2 + c$$

