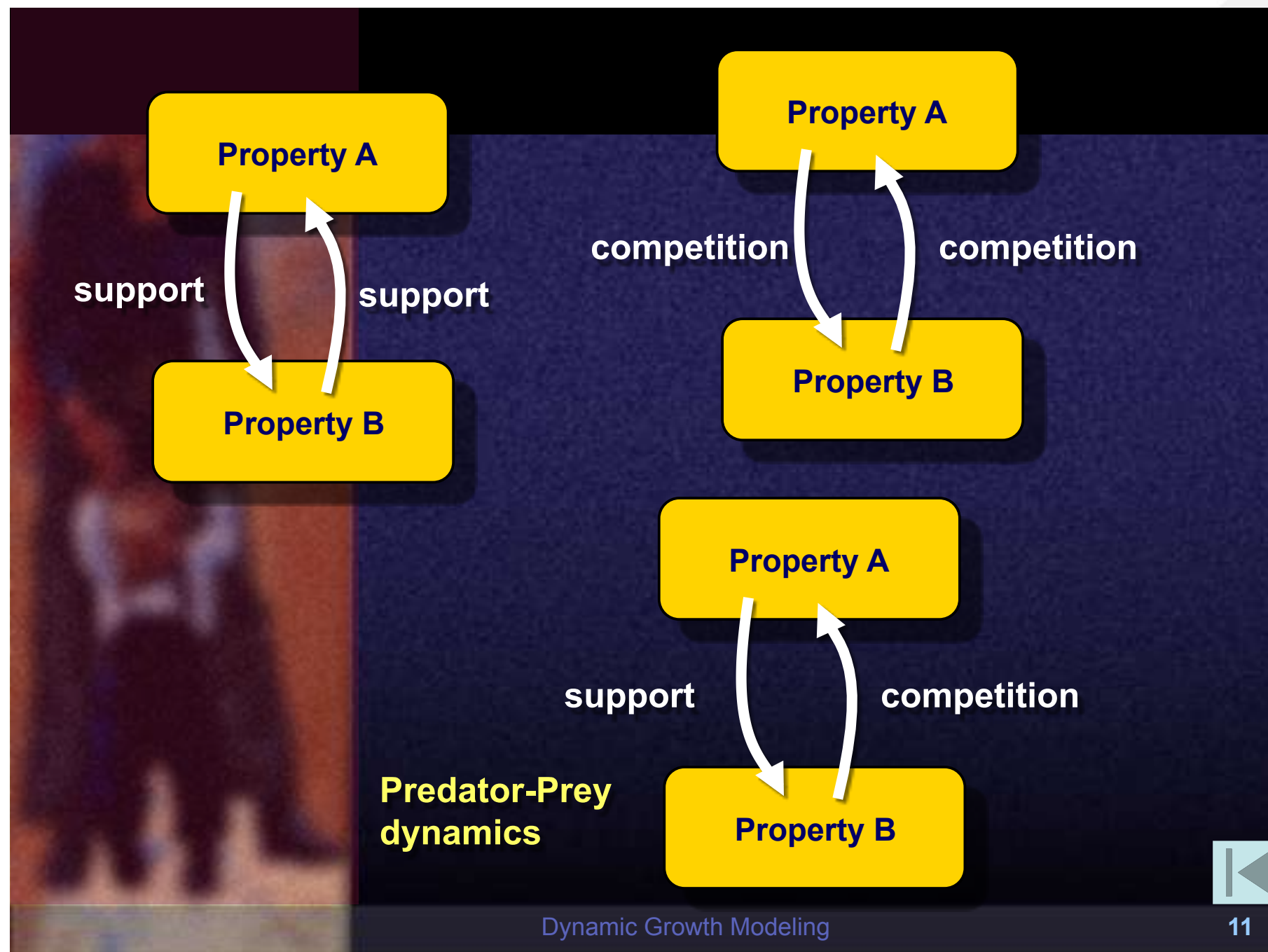


# Coupled dynamics

# Simple Interaction dynamics



# Multivariate Models... Multivariate State Space

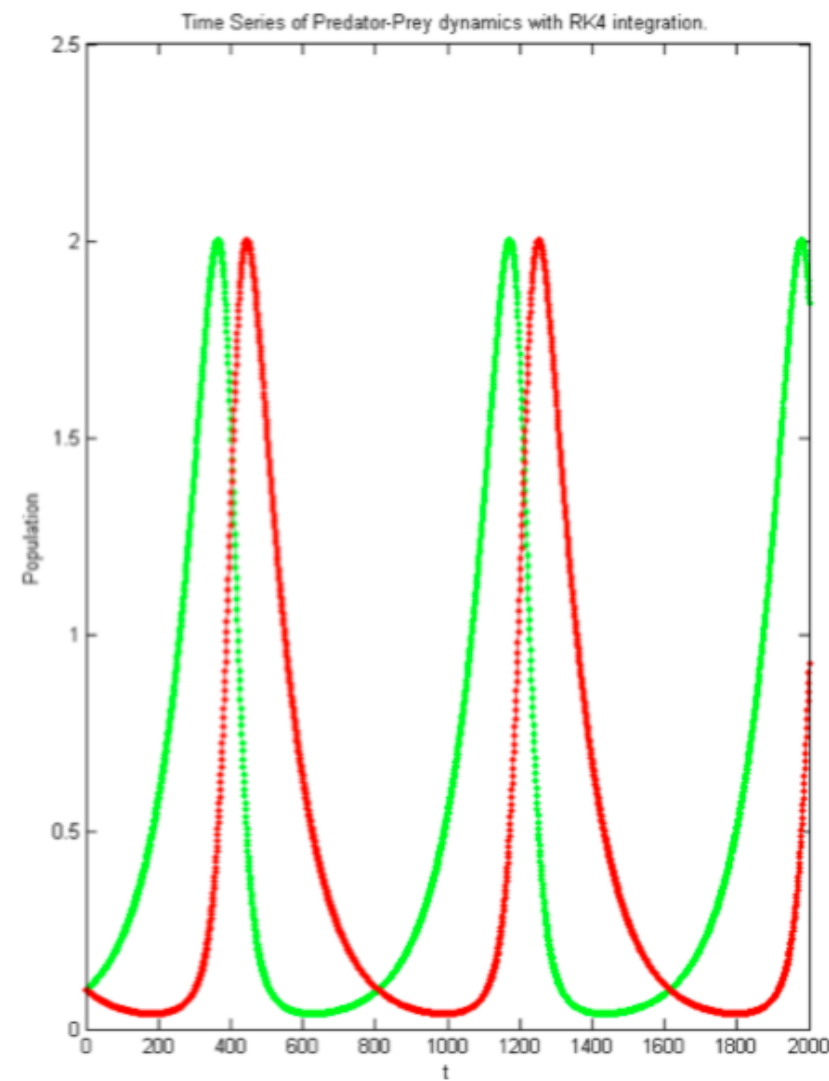
## Predator-Prey model (Lotka-Volterra)

$$\begin{aligned}\frac{dR}{dt} &= (a - b \times F) \times R, \\ \frac{dF}{dt} &= (c \times R - d) \times F.\end{aligned}$$

A 2-D state space  
2 coupled flows ~

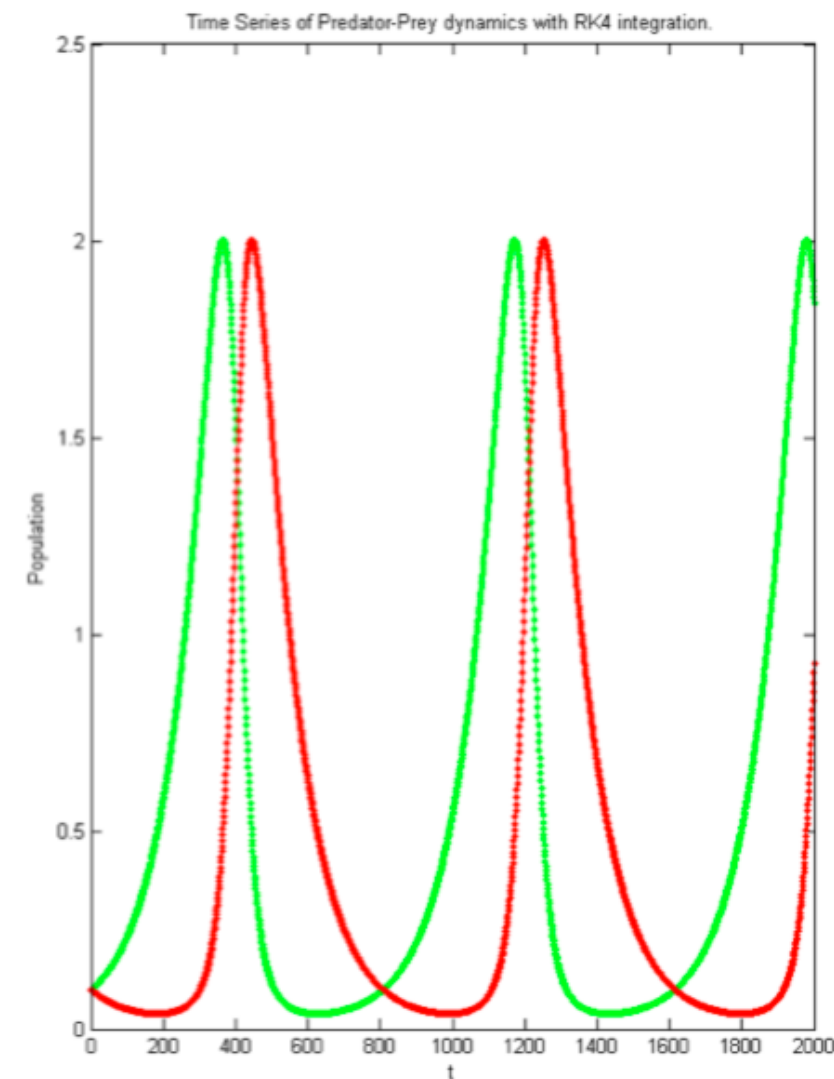
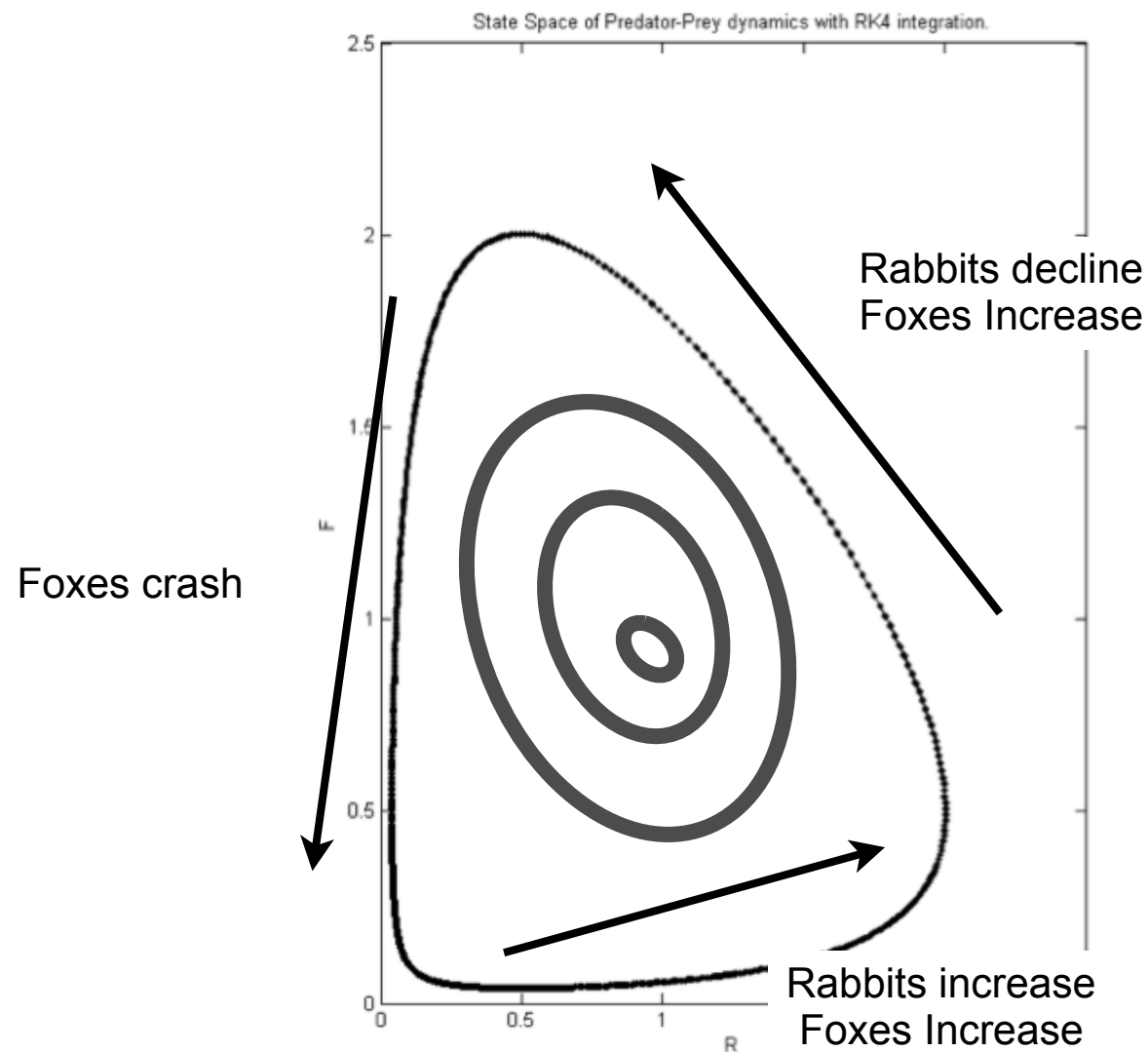
- $R$  is the **number of rabbits** in a year
- $F$  is the **number of foxes** in a year

# Multivariate Models... Multivariate State Space



Time Series

# Multivariate Models... Multivariate State Space



# Lorenz System

$$\begin{aligned}\frac{dx}{dt} &= a(y - x), \\ \frac{dy}{dt} &= x(b - z) - y, \\ \frac{dz}{dt} &= xy - cz.\end{aligned}$$

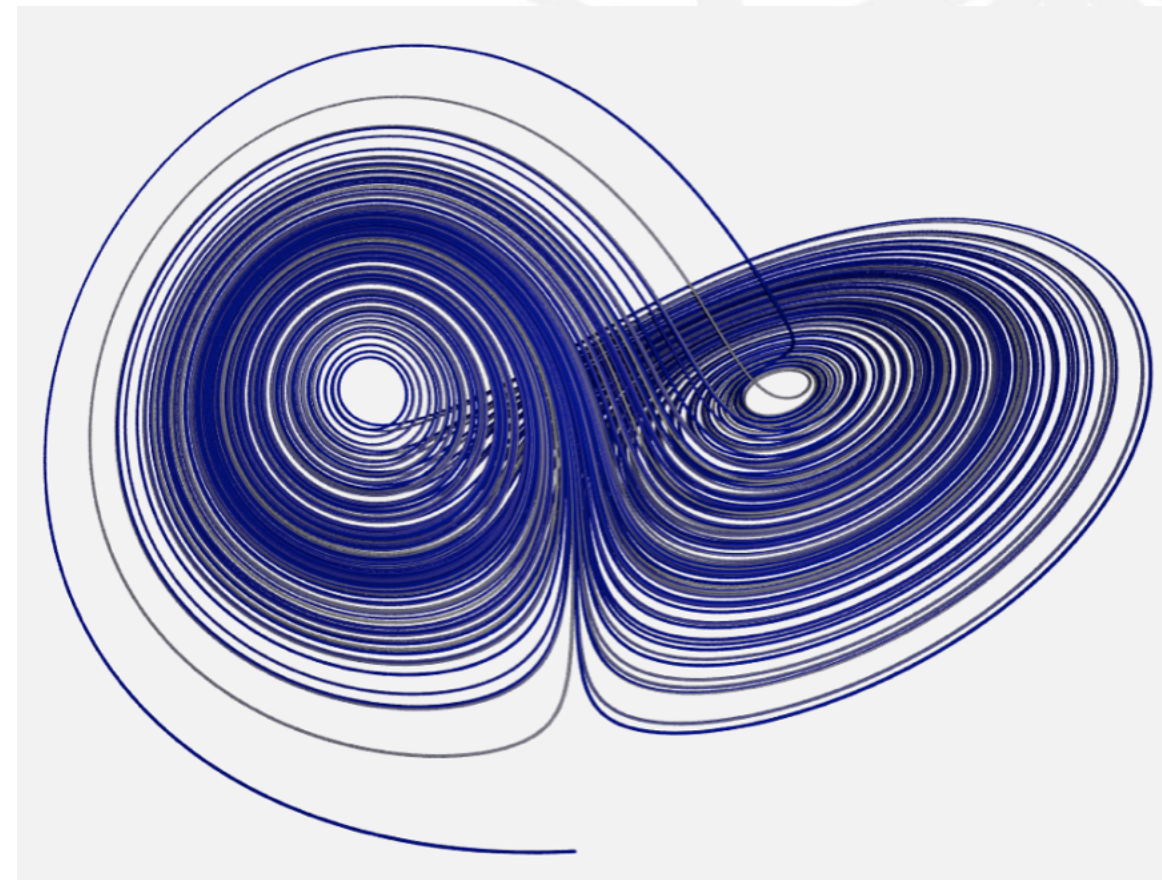
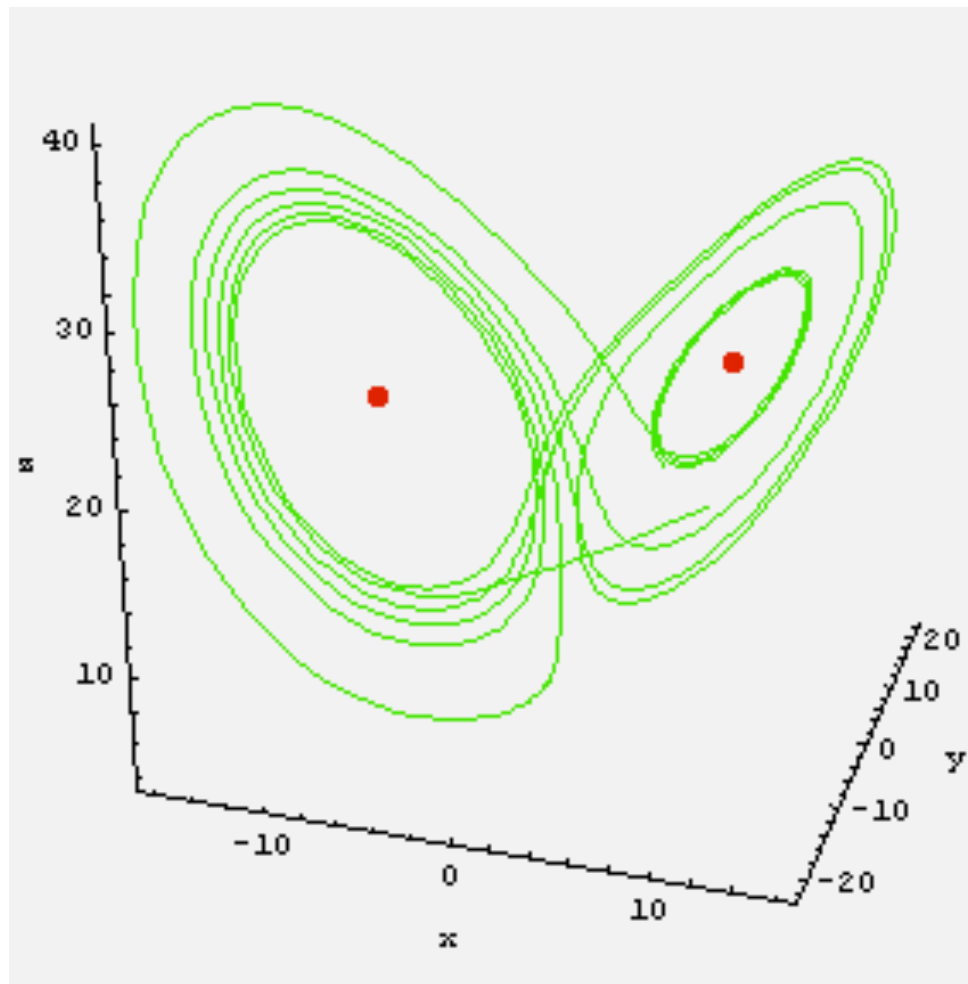
Interaction dominant dynamics  
Multiple processes (3)  
Multiple Scales (time)

x depends on y and x  
y depends on x, y and z  
z depends on x, y and z

A 3-D state space  
3 coupled flows ~



# Lorenz Attractor



# A note on simulating differential equations: ~flows ~

Differential equations are **continuous**...

To find out how they behave when there is no solution we need to 'discretize' them and approximate the solution with a difference equation: Numerical integration

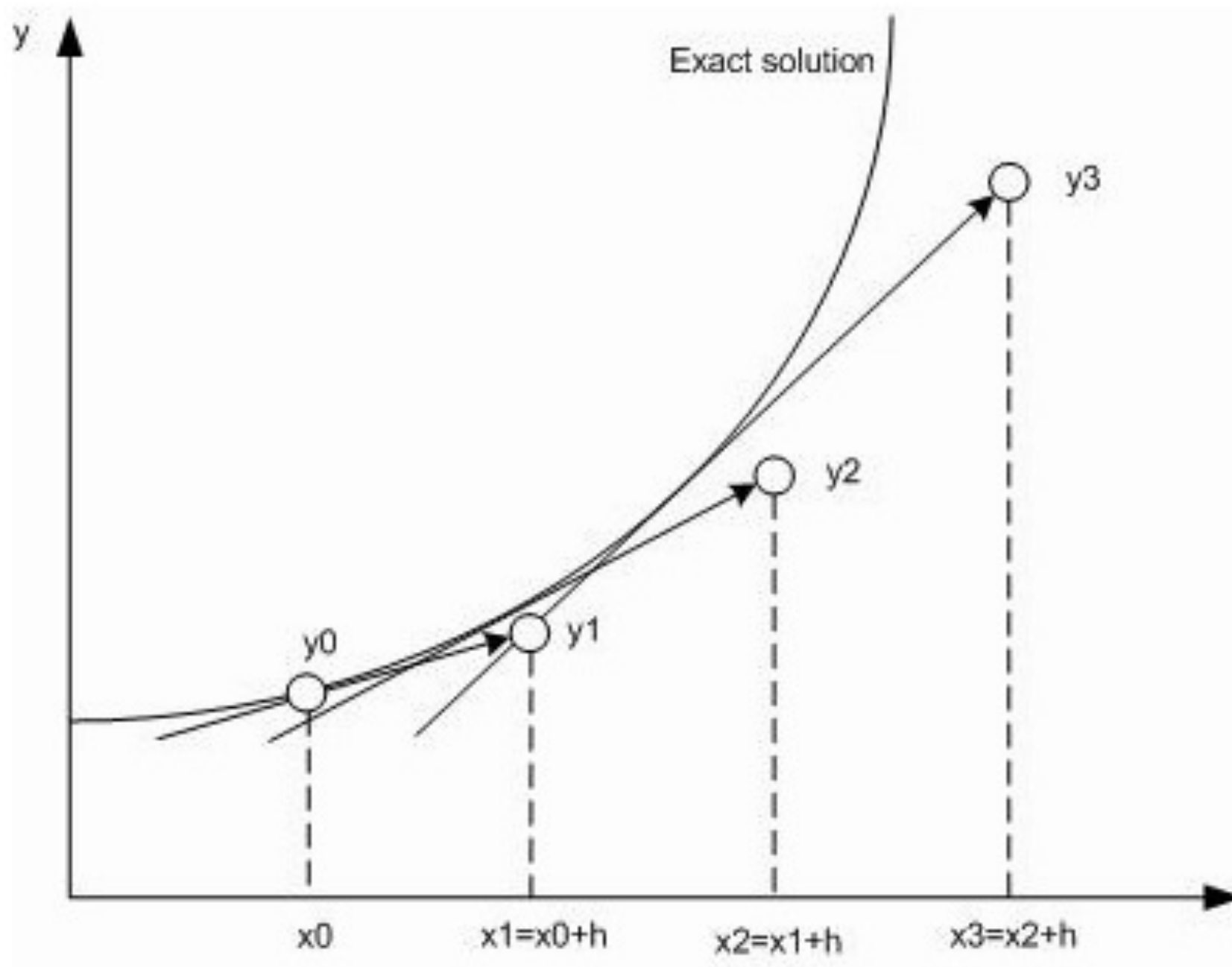
The easiest (but most error prone) method is Euler's method (18th century):

$$\mathbf{X}_{n+1} = \mathbf{X}_n + \mathbf{H} * \mathbf{f}(\mathbf{X}_n) \quad \text{where } \mathbf{H} = \text{step length}$$

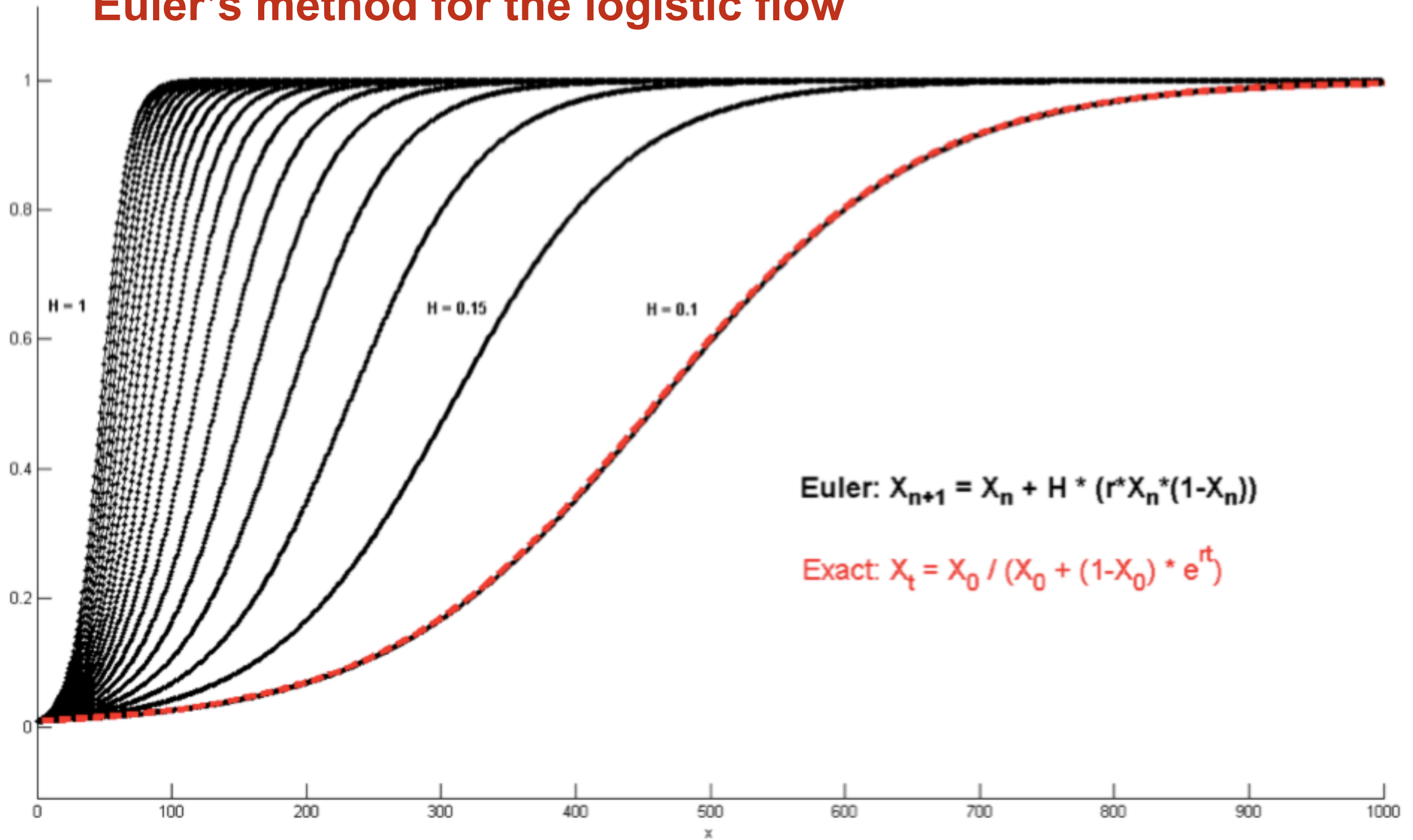
Checking how well the approximation is, can easily be done if we know an analytic algebraic solution



## A note on simulating differential equations: ~flows ~ Euler's method



## Euler's method for the logistic flow



## Runge-Kutta 4th Order Method

$$\mathbf{k}_1 = h \cdot f(\mathbf{y}_n)$$

$$\mathbf{k}_2 = h \cdot f\left(\mathbf{y}_n + \frac{\mathbf{k}_1}{2}\right)$$

$$\mathbf{k}_3 = h \cdot f\left(\mathbf{y}_n + \frac{\mathbf{k}_2}{2}\right)$$

$$\mathbf{k}_4 = h \cdot f(\mathbf{y}_n + \mathbf{k}_3)$$

$$\Rightarrow \mathbf{y}_{n+1} = \mathbf{y}_n + \frac{\mathbf{k}_1}{6} + \frac{\mathbf{k}_2}{3} + \frac{\mathbf{k}_3}{3} + \frac{\mathbf{k}_4}{6}$$

## Comparison of methods

