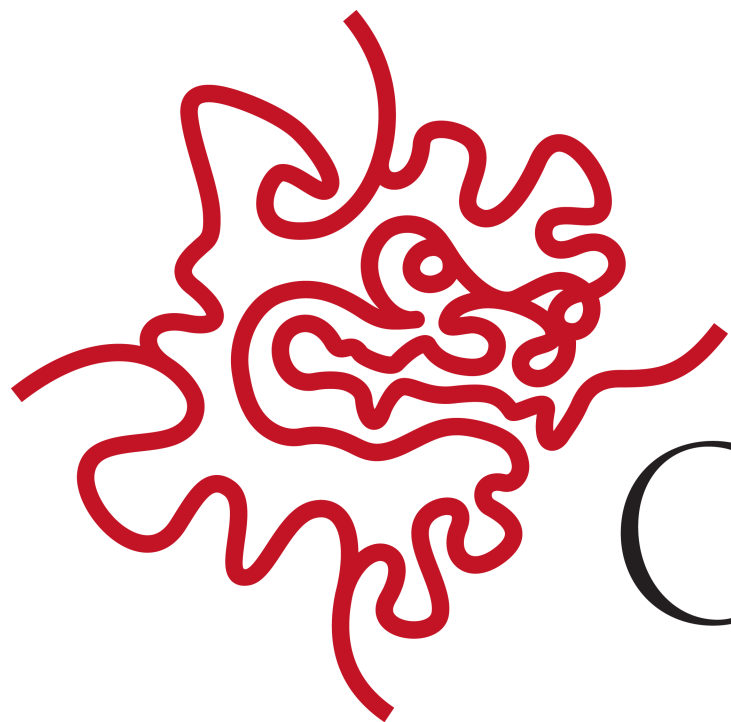




**Matlab Course: day 3**

# **Differential equations**

**Gabriela Capo Rangel**



OIST

# What is a differential equation?

An equation containing derivatives

The *order* of a differential equation is the order of the highest derivative in the equation.

1st order:  $\frac{dy}{dx} + xy^2 = 1$

2nd order:  $\frac{d^2x}{dt^2} = -\frac{k}{m}x$  (Simple harmonic motion)

nth order:

$$a_0y + a_1\frac{dy}{dx} + a_2\frac{d^2y}{dx^2} + \dots + a_{n-1}\frac{d^{n-1}y}{dx^{n-1}} + a_n\frac{d^ny}{dx^n} = b$$

# What is a differential equation?

Can classify differential equations as:  
**linear or non-linear**

Non-linear equations contain products of the function and its derivatives, or powers higher than one, i.e:

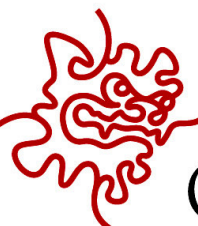
$$y \frac{dy}{dx} \quad \left( \frac{dy}{dx} \right)^4 \quad xy^3$$

## Ordinary Differential Equations

→ contain *ordinary* derivatives

## Partial Differential Equations

→ contain *partial* derivatives



# Why do we need differential equations?

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- To describe countless biological, physiological and chemical models
- Especially for Compartment models: One time dependent compartment an exchange between other compartments
- Examples: Predator Pray Model, Hodgkin-Huxley model, brain metabolism models, etc.

# Built in Matlab ODE solvers

Non-stiff differential equations		Stiff differential equations	
<b>ode45</b>	Medium accuracy	<b>ode15s</b>	Low to medium
<b>ode23</b>	Low accuracy	<b>ode23s</b>	Low
<b>ode113</b>	Low to High Accuracy	<b>ode23t</b>	Low
		<b>ode23tb</b>	Low

More info: <https://www.mathworks.com/help/matlab/math/choose-an-ode-solver.html>  
Or just type `helpode45` and you will see all details and alternatives

# ODE solver format

- **ode45** performs well with most ODE problems
- Good idea to use it as a first choice
- Stiffness: - appears when you have drastically different time scales. If ode45 returns a stiffness error or if it is extremely slow, you have to choose a stiff solver instead
- $[TOUT, YOUT] = \text{ode45}(\text{ODEFUN}, TSPAN, Y0)$

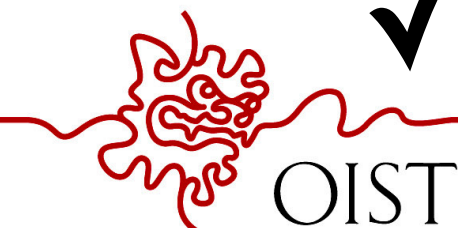
# ODE solver format

- The ode45 built in solver has the following structure:

**[TOUT,YOUT] = ode45(ODEFUN,TSPAN,Y0)**

where:

- ✓ ODEFUN = the rhs function of your differential equation or the system of differential equations
- ✓ TSPAN = [T0 TFINAL]
- ✓ Y0 is the initial condition(s)
- ✓ TOUT = time vector output
- ✓ YOUT = your solution (vector or matrix depending on nb of differential equations)
- ✓ To visualize your solution: PLOT(TOUT,YOUT)



# First example

$$\frac{dx}{dt} = 2e^{-t}$$

Which we can rewrite as:

$$\dot{x} = 2e^{-t}$$

Denote the rhs by:

$$f(t, x) = 2e^{-t}$$

Solve:  $\dot{x} = f(t, x)$  with initial conditions:

$$x(0) = 0$$



# STEP1: Define your rhs function

$$f(t, x) = 2e^{-t} \quad x(0) = 0$$

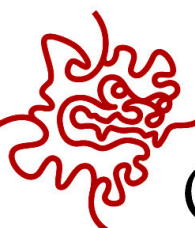
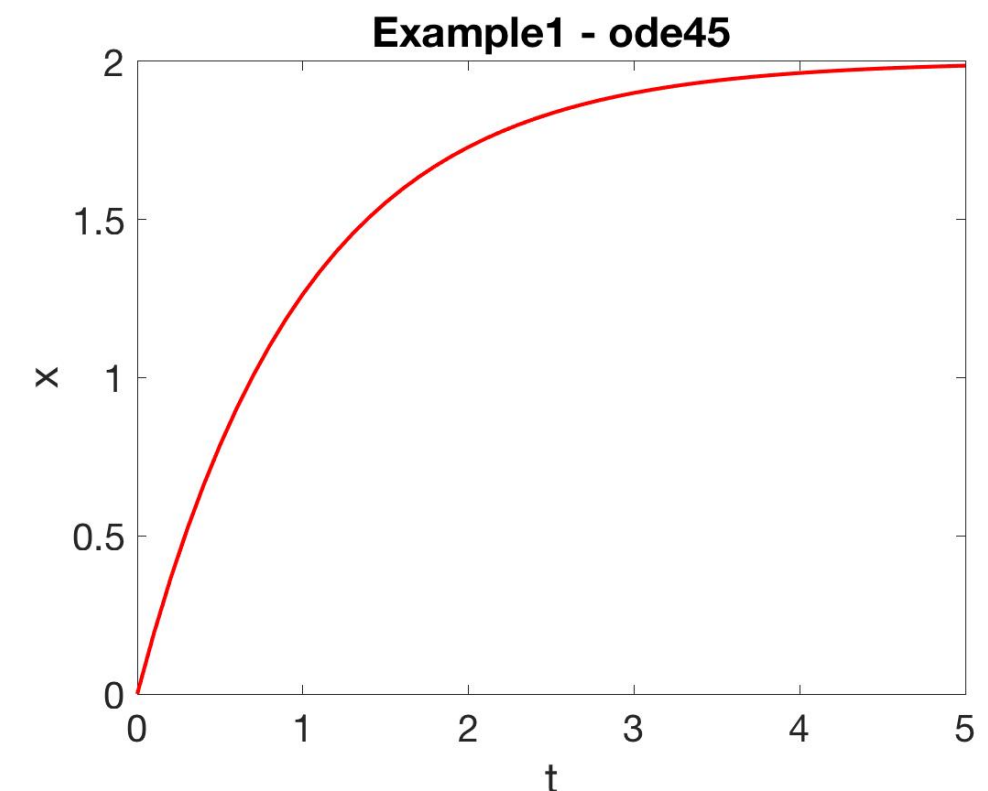
- How do we define a function in Matlab:
  - In the Editor open a new **Script**
  - Syntax:  

```
function dxdt = rhs(t,x)  
    dxdt = 2*exp(-t);  
end
```
  - Save the file with the name you chose, i.e. **rhs**.
  - Open a new Script
  - Let's use ode45 and call this function we defined

# First example: Matlab code

```
%Step 1: Define time scale
t = 0:0.1:5;
%Step 2: Define initial conditions:
IC = 0;
%Step 3: Call the desired ODE solver
[t,x] = ode45(@rhs,t,IC)

%Step 4: Plot
figure(1)
plot(t,x,'LineWidth',2,'Color','r')
set(gca,'FontSize',20)
xlabel('t');
ylabel('x');
title('Example1 - ode45');
```



# Let's calculate the analytical solution

- Our example was:  $\frac{dx}{dt} = 2e^{-t}$  for  $x(0) = 0$

- Let's integrate:

$$x = \int 2e^{-t} dt = -2e^{-t} + c_1$$

- According to the IC:

$$x(0) = 0 \implies -2e^0 + c_1 = 0 \implies c_1 = 2$$

- Our solution is:

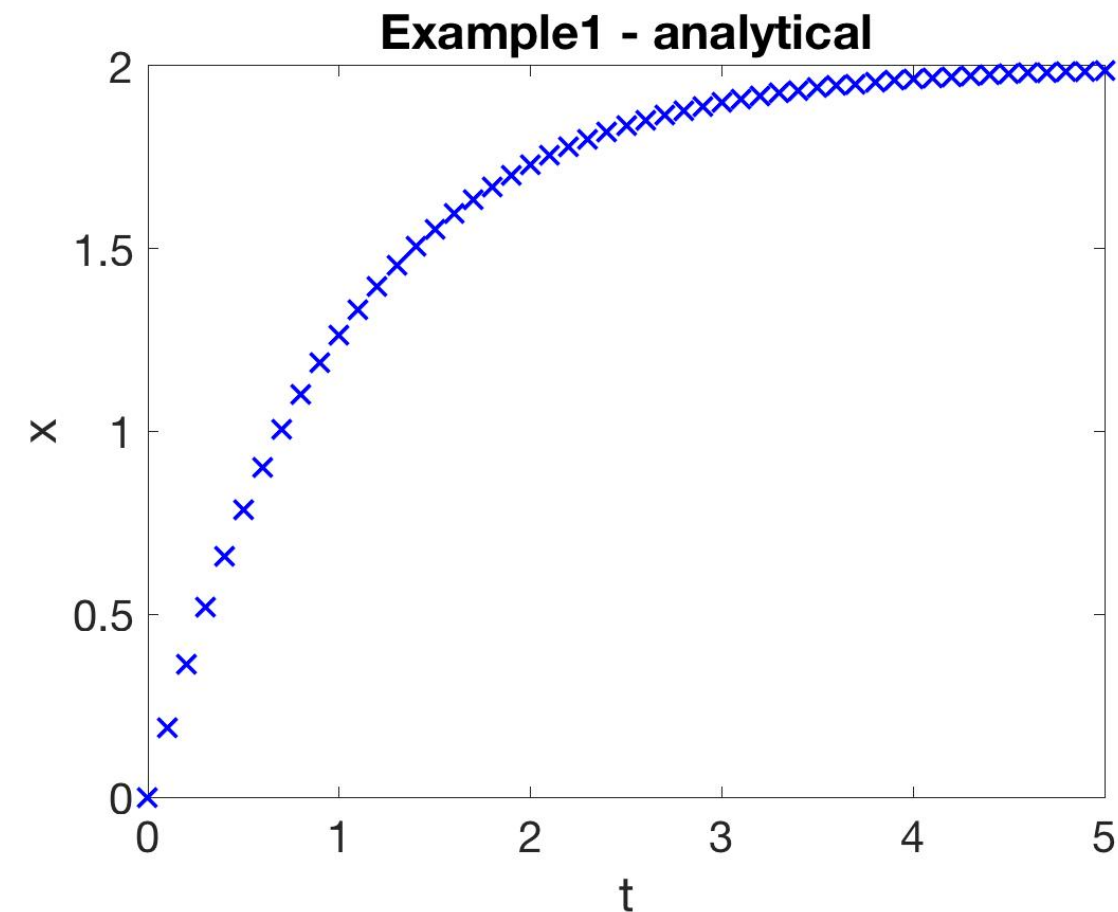
$$x(t) = -2e^{-t} + 2$$

Let's plot this!!

# First example - analytical solution

%Let's plot the analytical solution:

```
figure(2)
plot(t,x2,'x','MarkerSize',10,'Color','b','LineWidth',2);
set(gca,'FontSize',20)
xlabel('t');
ylabel('x');
title('Example1 - analytical')
saveas(gcf,'Example1b.jpg')
```



# Plot them on the same graph:

`%Let's plot the analytical solution:`

```
figure(3)
```

```
plot(t,x, 'LineWidth',2, 'Color', 'r');
```

```
hold on
```

```
plot(t,x2, 'x', 'MarkerSize',10, 'Color', 'b', 'LineWidth',2);
```

```
set(gca, 'FontSize',20)
```

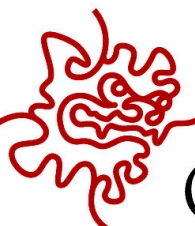
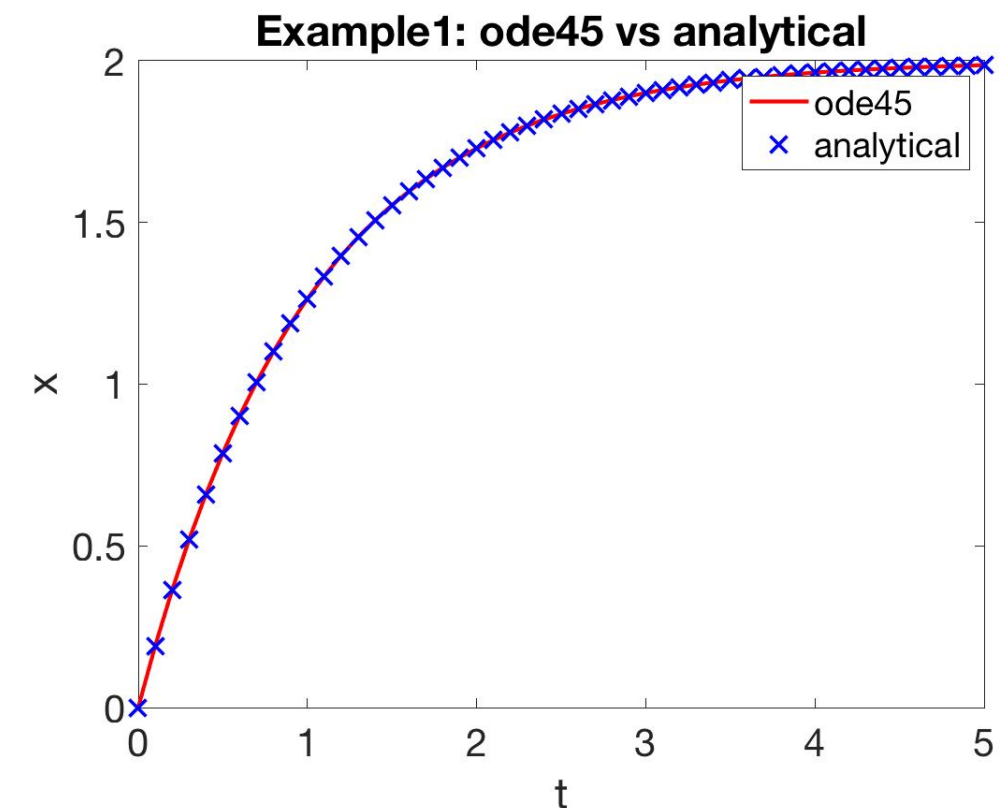
```
xlabel('t');
```

```
ylabel('x');
```

```
legend('ode45', 'analytical')
```

```
title('Example1: ode45 vs analytical')
```

```
saveas(figure(3), 'Example1ab.jpg')
```



# Example 2: System of ODEs

- Van der Pol equation:

autonomous system  
( $t$  doesn't appear explicitly)

$$\dot{x} = y$$

$$\dot{y} = (1 - x^2)y - x$$

- Denote:  $v = \begin{pmatrix} x \\ y \end{pmatrix}$
- Rewrite the system as:

$$\dot{v}[1] = v[2]$$

$$\dot{v}[2] = (1 - [v[1]]^2)v[2] - v[1]$$

Let's solve this for  $[0,20]$  with  $(v[1], v[2]) = (1, 0)$

# Example2: Implementation

- **Step1:** Write a Matlab function for the rhs

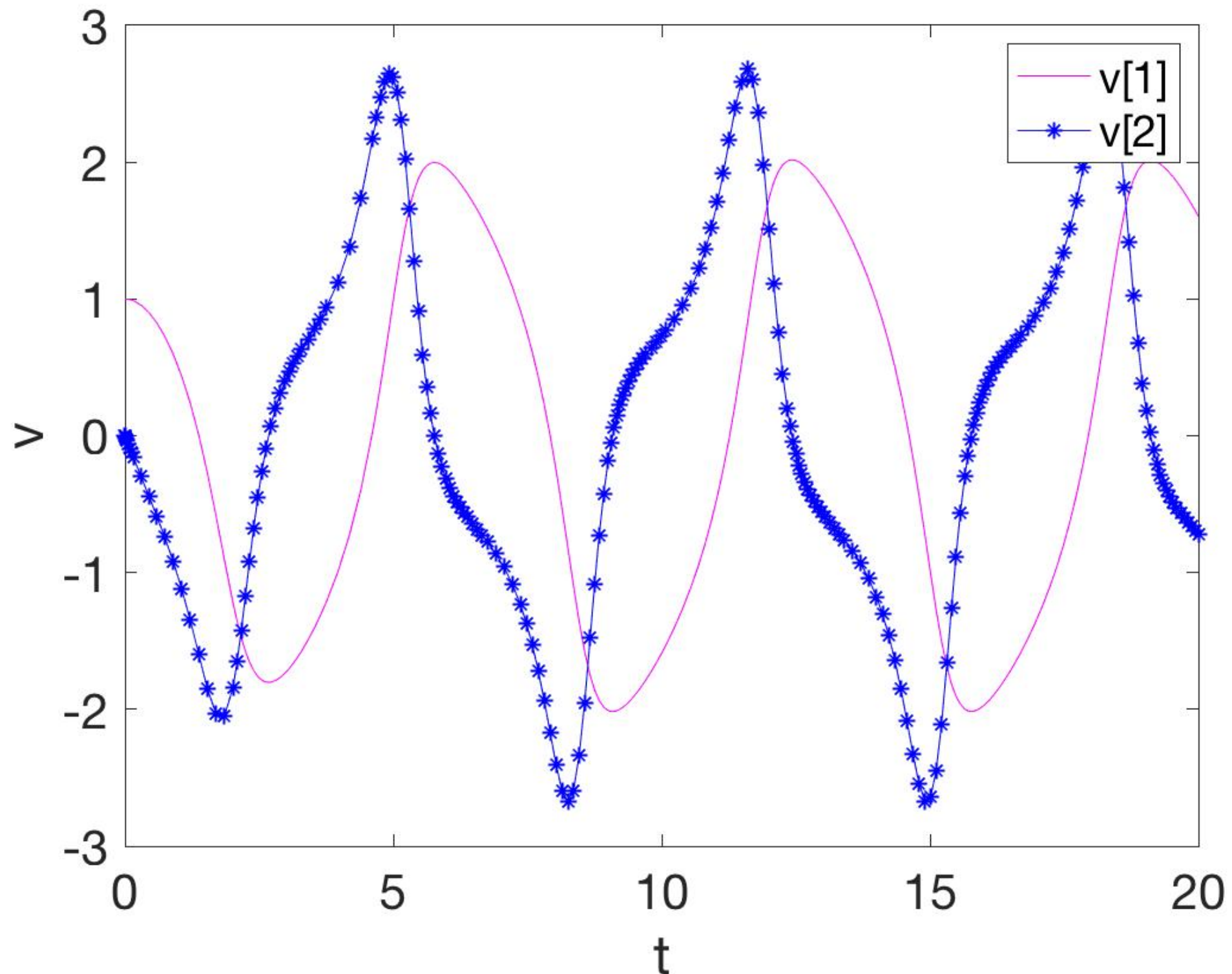
$$\dot{v}[1] = v[2]$$

$$\dot{v}[2] = (1 - [v[1]]^2)v[2] - v[1]$$

- **Step2:** Solve via ode45 for:  
TI = [0 20] and IC = [1 0]

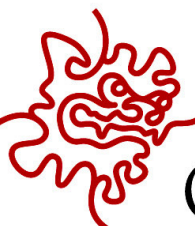
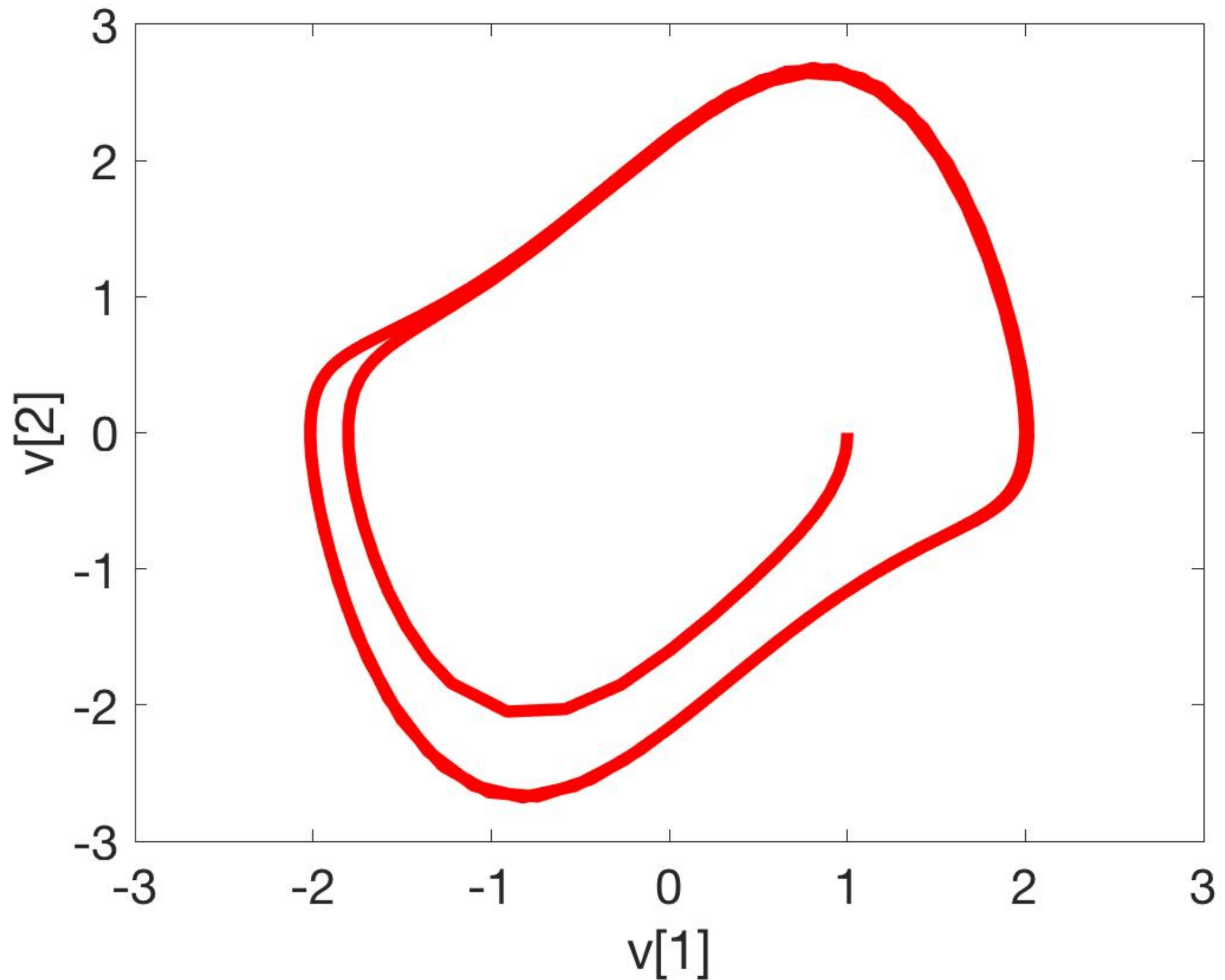
- **Step3:** Plot your results:
  - Plot1 - plot t vs v[1] and t vs v[2]
  - Plot2 - phase plane plot: v[1] vs v[2]

# Example 2: Plots





# Example 2: Phase plan Plot



# Example3: Let's experience stiffness

- Modify your system of differential equations:

$$\dot{v}[1] = v[2]$$

$$\dot{v}[2] = 1000(1 - [v[1]]^2)v[2] - v[1]$$

- Solve via ode45 for:

$$TI = [0 \ 3000] \text{ and } IC = [1 \ 0]$$

It takes forever, right?

- Plot  $v[1]$  and  $v[2]$  in **separate** figures.
- Type `size(t)` to check how many time steps ode45 requires.

For ode45:  
`size(t)=6758557`

# Example3: Let's experience stiffness

- Modify your system of differential equations:

$$\dot{v}[1] = v[2]$$

$$\dot{v}[2] = 1000(1 - [v[1]]^2)v[2] - v[1]$$

- Solve via ode45 for:

$$TI = [0 \ 3000] \text{ and } IC = [1 \ 0]$$

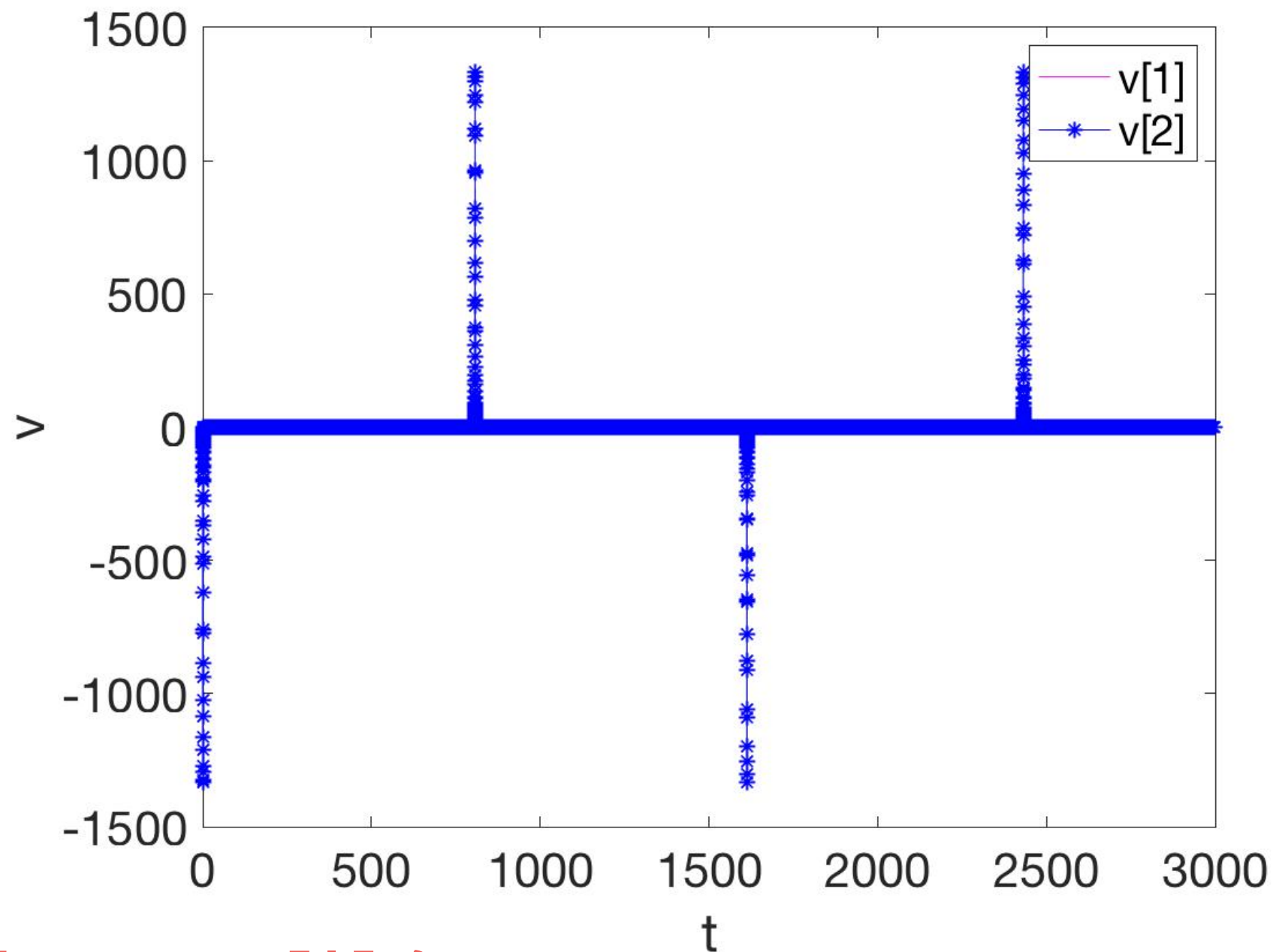
- Plot  $v[1]$  and  $v[2]$  in separate figures.
- Try an ODE solver for stiff problems: ode15s or ode23s

So much faster!!!

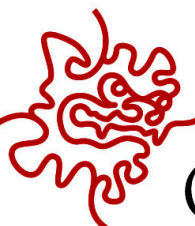
For ode15s:  
size(t)=716

# Example3 Plots

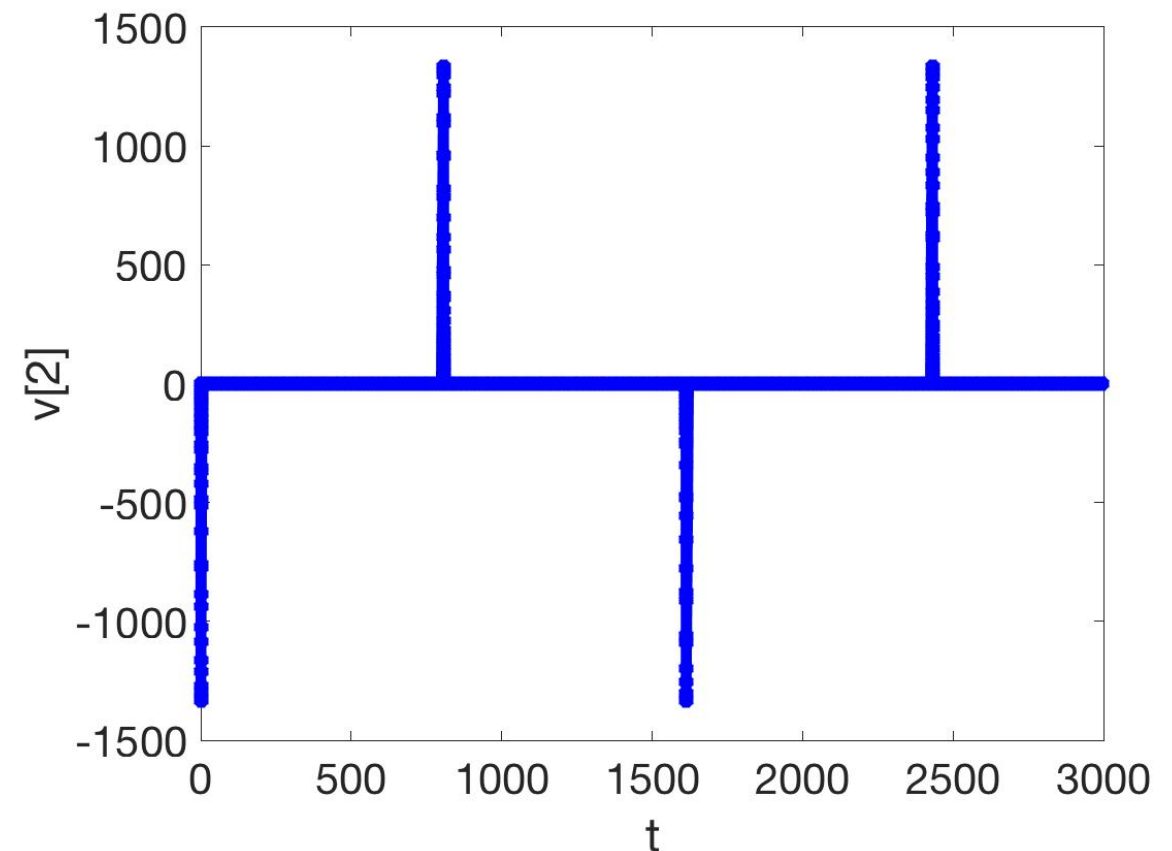
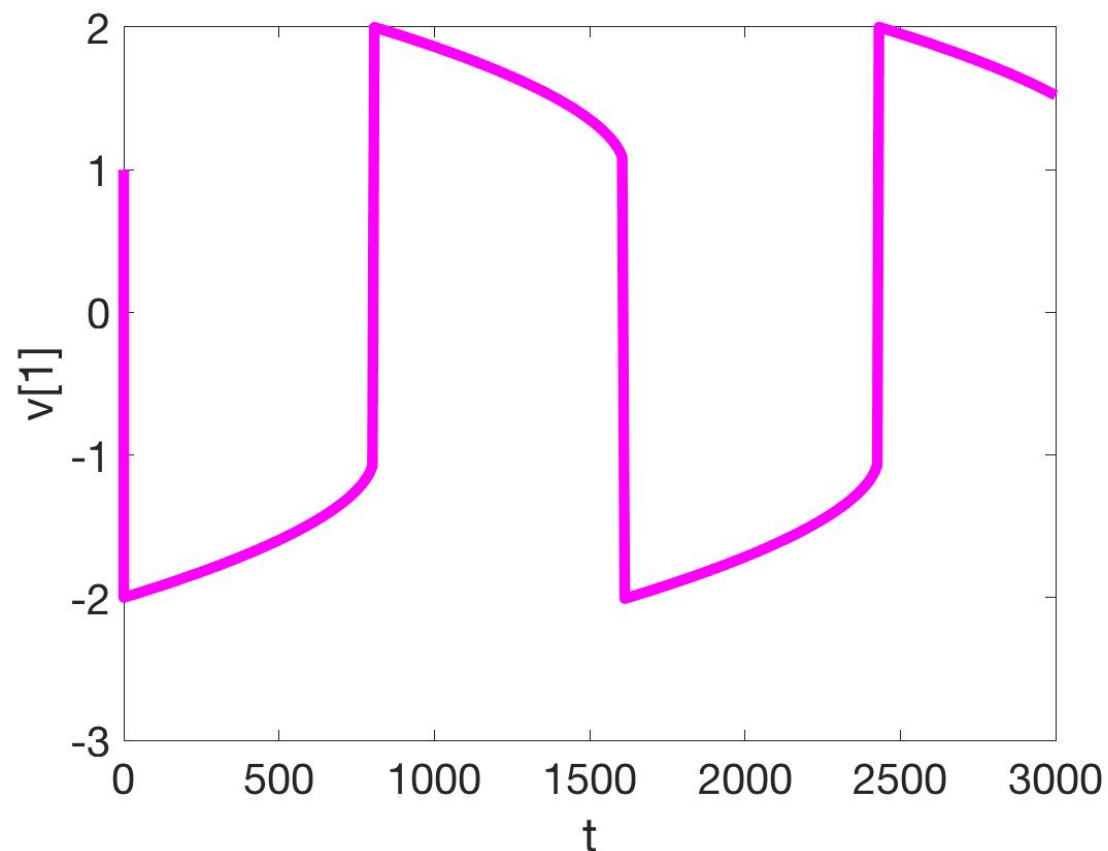
If you try to plot  $v[1]$  and  $v[2]$  on the same graph:



Where is  $v[1]$  ?



# Example3 Plots



## Take home messages:

- A. Careful how you plot variables, they can be on **very different time scales**
- B. Use an **adequate** Matlab solver, it will save you a lot of time!!





# Predator - Prey model (Lotka-Volterra model)

Lynx vs Snowshoe Hare

Prey population  $x$

Predator population  $y$

$$\frac{dx}{dt} = Ax - Bxy$$

SOLVE

$$\frac{dy}{dt} = -Cy + Dxy$$



Simplifying assumptions:

- ❖ The prey has unlimited supply of food
- ❖ There is no other threat to the prey
- ❖ The predator is dependent on only this type of prey



# Predator - Prey model (Lotka-Volterra model)

Lynx vs Snowshoe Hare

Prey population  $x$

Predator population  $y$

$$\frac{dx}{dt} = Ax - Bxy$$

SOLVE

$$\frac{dy}{dt} = -Cy + Dxy$$

Let's solve this for:

$$A = B = C = D = 1$$

$$X(0) = 6; Y(0) = 2$$

$$TI = [0,40]$$



A - Growth rate of prey

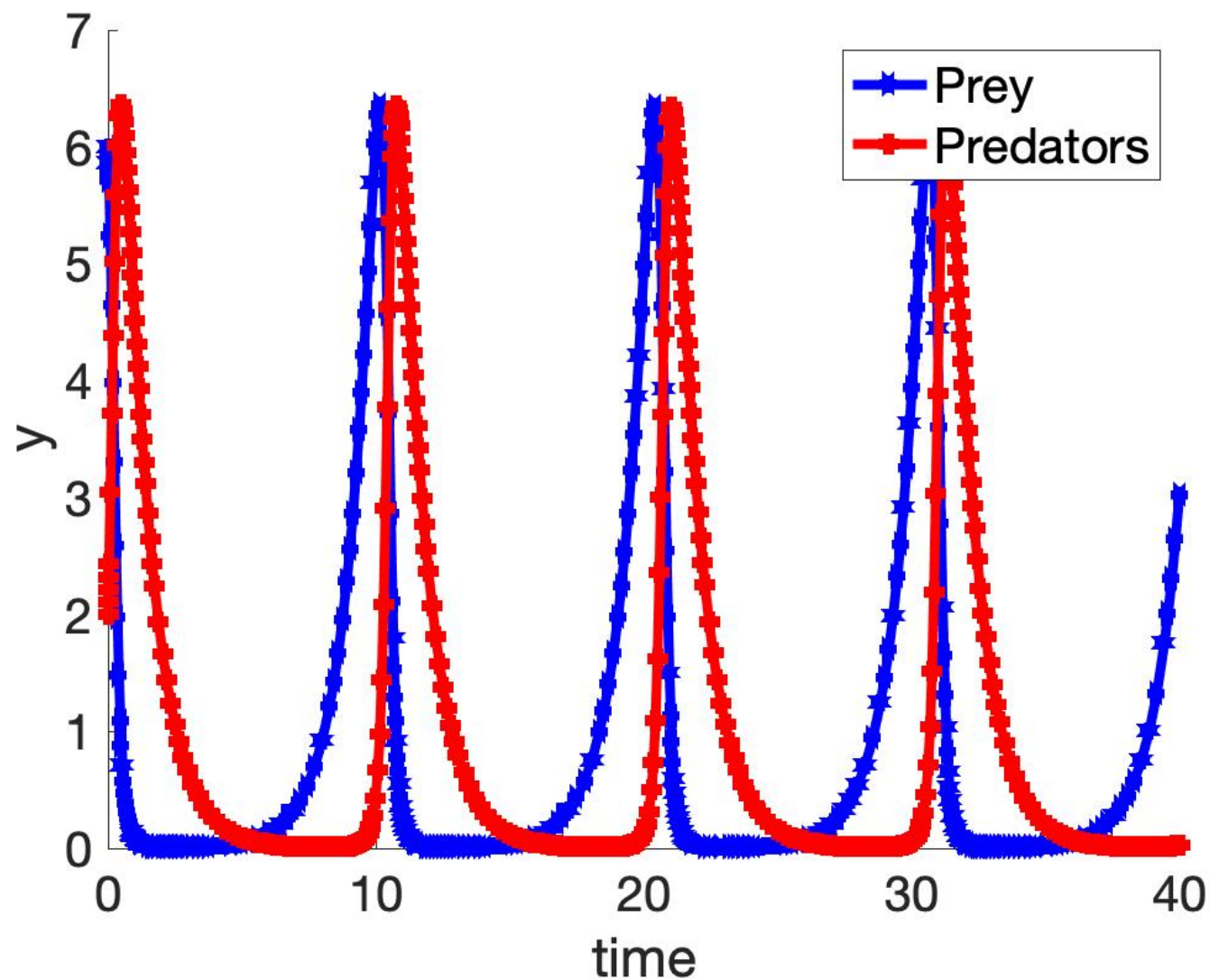
B - Rate at which predators destroy prey

C - Rate at which predators die off

D - Growth rate of predators

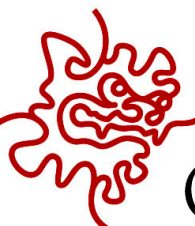
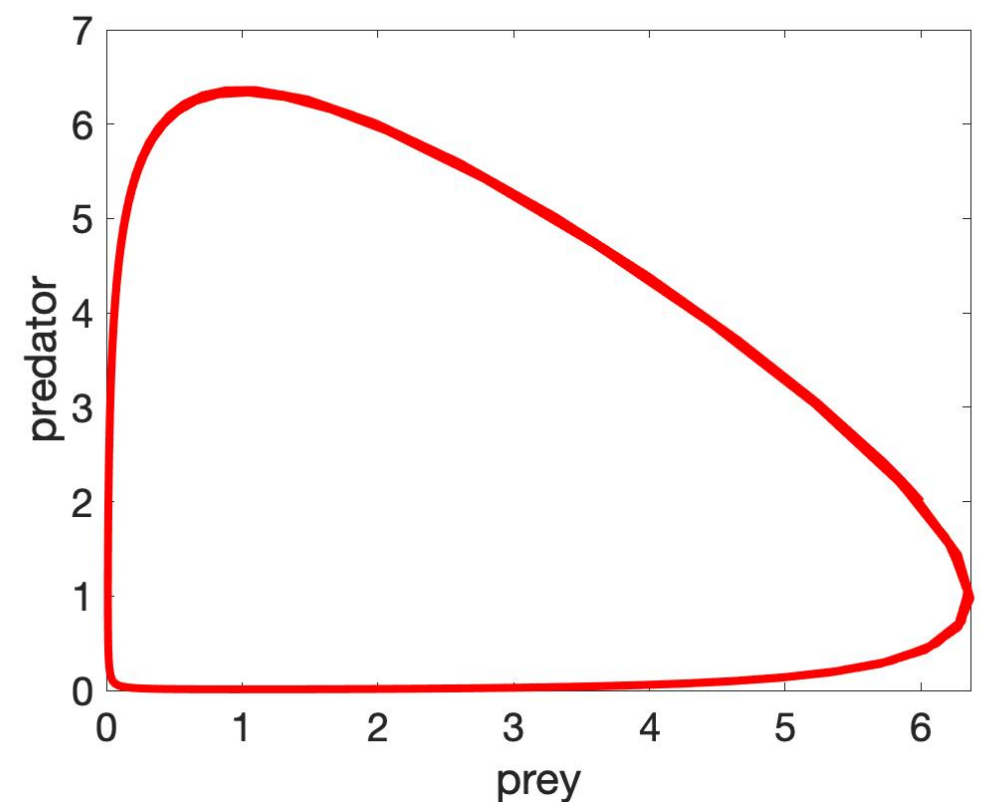


# Predator - Prey model (Lotka-Volterra model)



Result for parameter choice:

$$A = B = C = D = 1$$





# Predator - Prey model (Lotka-Volterra model)

**SOLVE**

$$\frac{dx}{dt} = Ax - Bxy$$
$$\frac{dy}{dt} = -Cy + Dxy$$

Let's solve this for:

$$A = 0.5; B = 0.02;$$

$$C = 0.4; D = 0.004;$$

$$X(0) = 70; Y(0) = 20$$

$$TI = [0, 40]$$

**Lynx** vs **Snowshoe Hare**



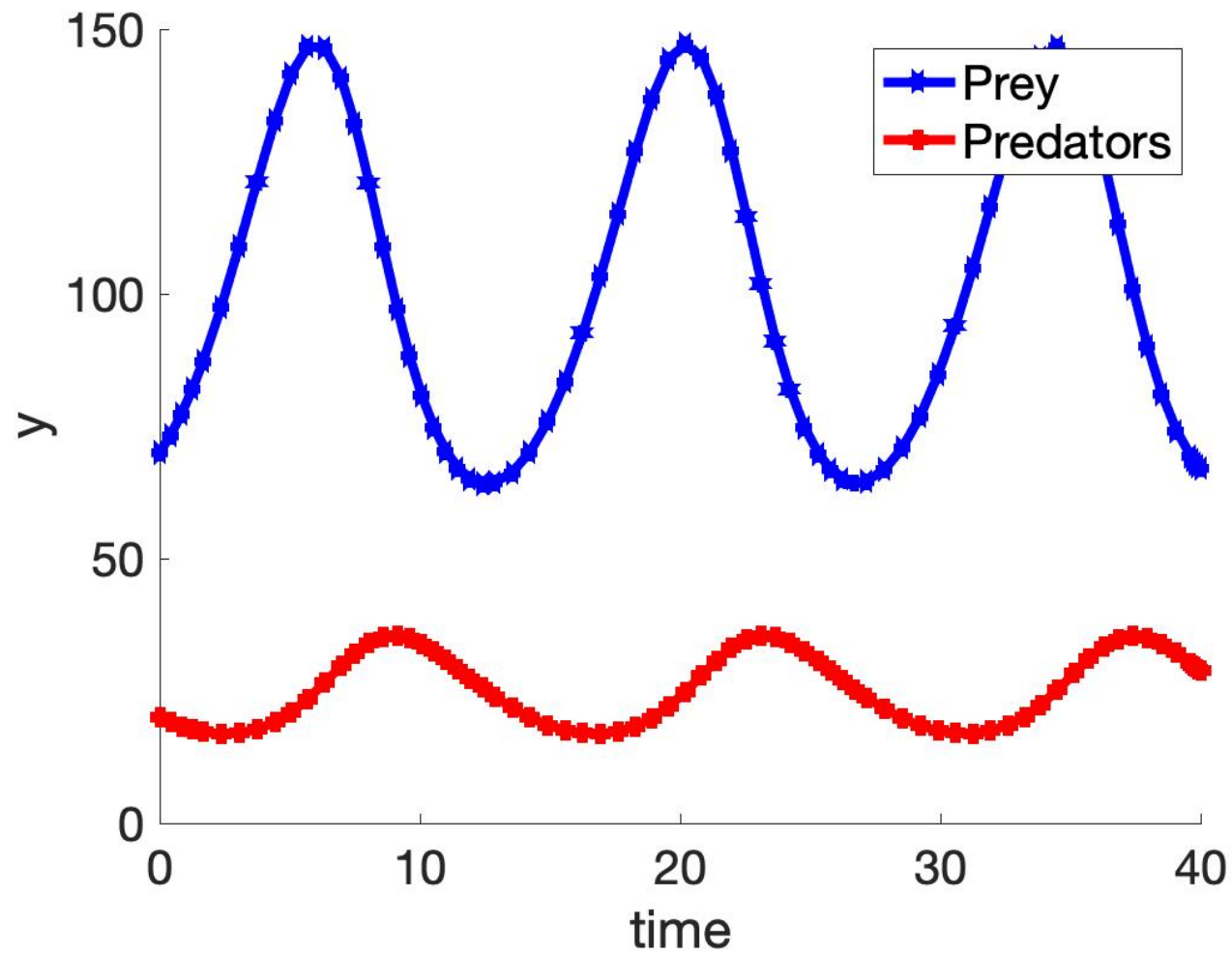
A - Growth rate of prey

B - Rate at which predators destroy prey

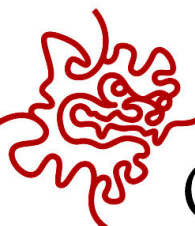
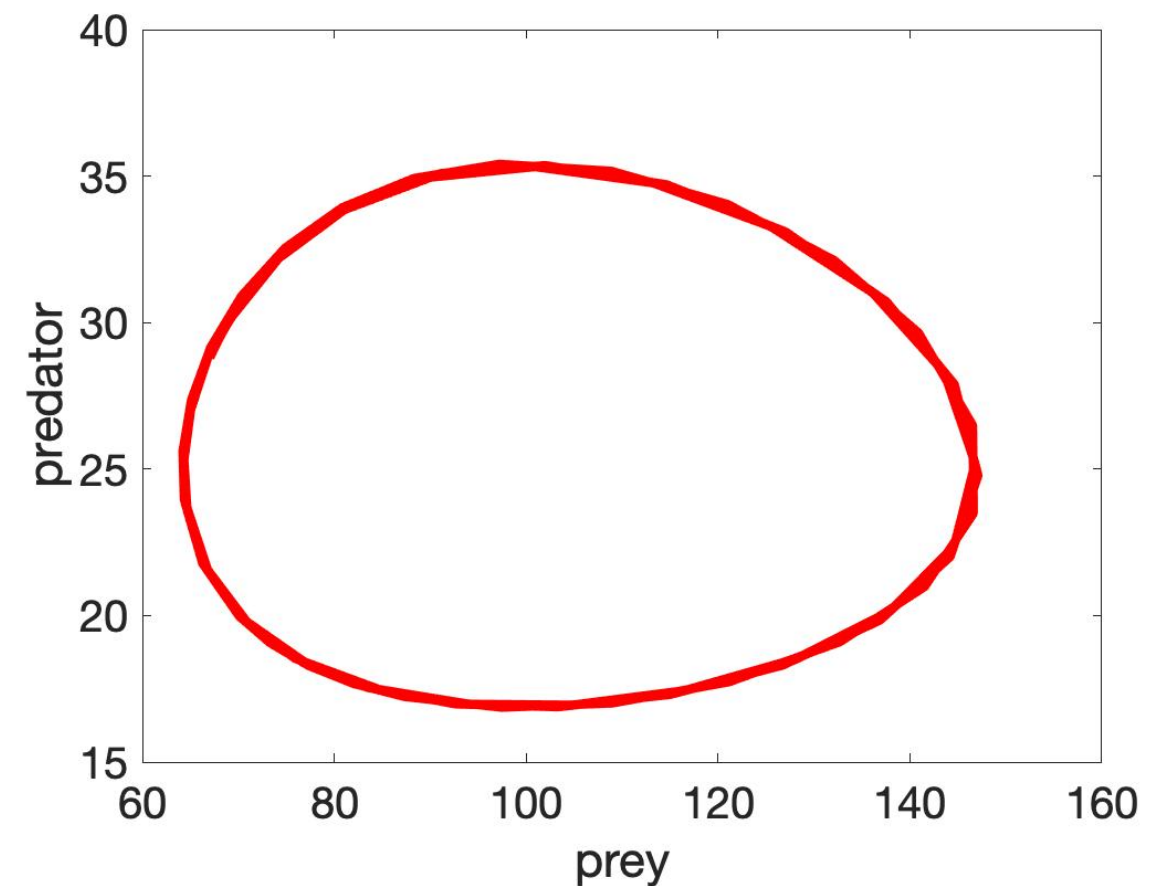
C - Rate at which predators die off

D - Growth rate of predators

# Predator - Prey model (Lotka-Volterra model)



$$A = 0.5; B = 0.02;$$
$$C = 0.4; D = 0.004;$$



# Predator - Prey model (Lotka-Volterra model)

**SOLVE**

$$\frac{dx}{dt} = Ax - Bxy$$
$$\frac{dy}{dt} = -Cy + Dxy$$

Let's solve this for:

$$A = 0.5; B = 0.02;$$

$$C = 0.4; D = 0.004;$$

Play with the initial conditions:

$$X(0) = 20; Y(0) = 20$$

$$TI = [0,40]$$

**Lynx** vs **Snowshoe Hare**



A - Growth rate of prey

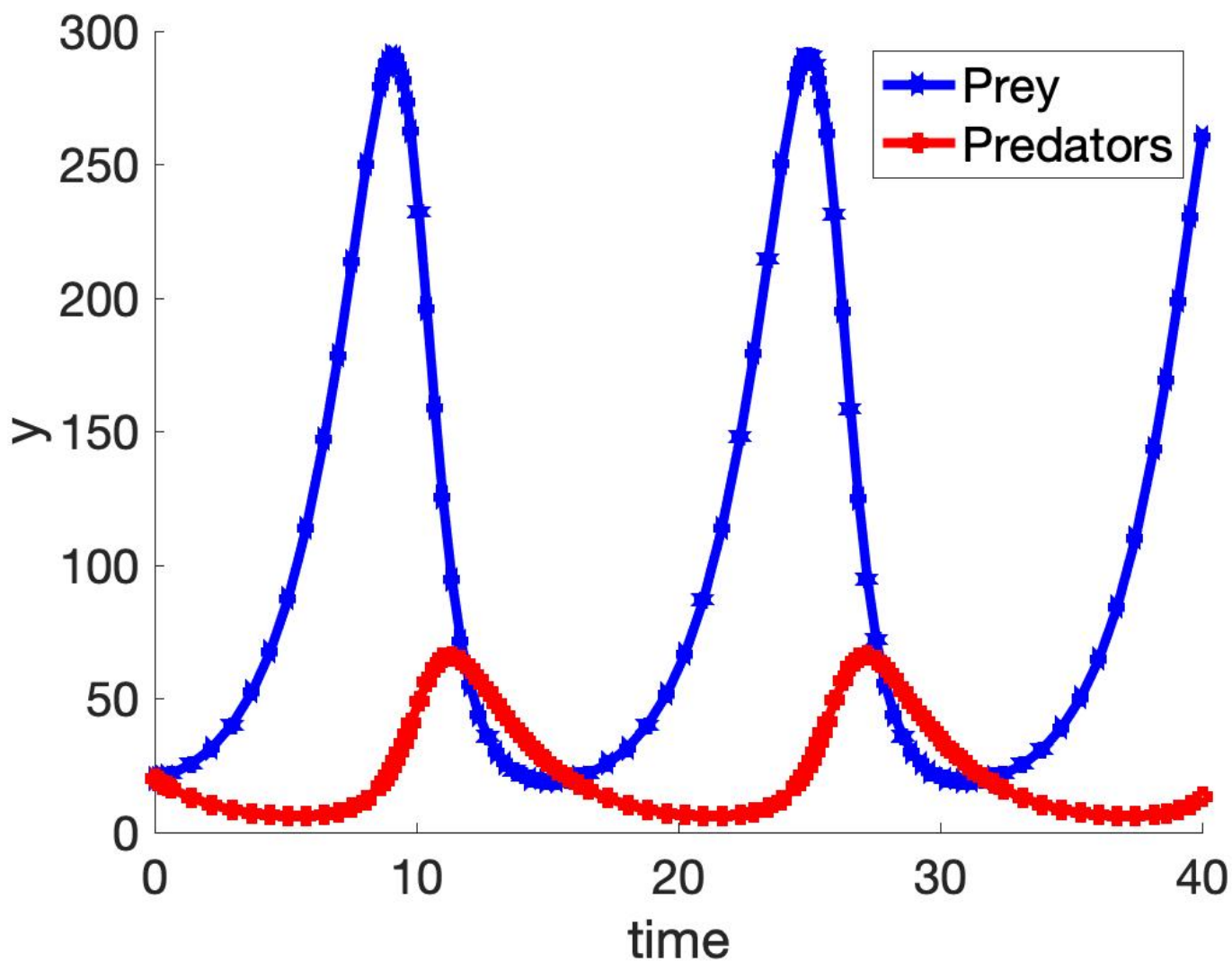
B - Rate at which predators destroy prey

C - Rate at which predators die off

D - Growth rate of predators

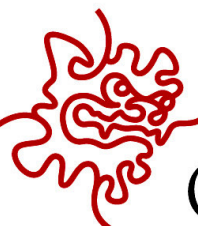
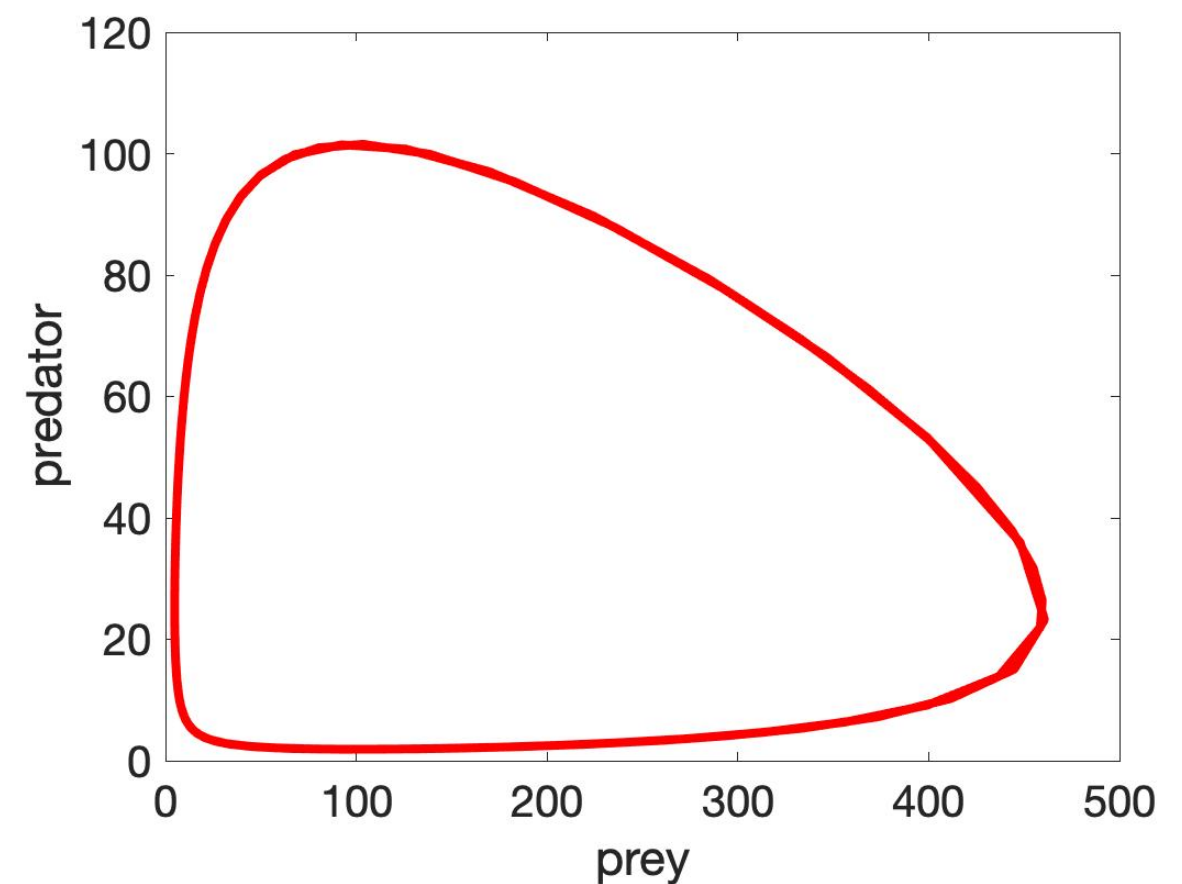


# Predator - Prey model (Lotka-Volterra model)



$$X(0) = 20; Y(0) = 20$$

$$TI = [0, 40]$$



# Further built-in examples

---

> help odeexamples  
> odeexamples('ode')

→ Run examples  
→ View code

Have fun!

---

# Thank you for your attention!

Next class: Image Analysis  
Tomorrow: 10am