

# Elin\_Ahlstrand\_Exercises\_9

## Problem 1: N-dimensional linear dynamics

### Part 1: Diagonal multi-dimensional dynamics

Suppose you have a set of independent, separate, one-dimensional differential equations  $\dot{x}_i = \lambda_i x_i$ . Write the set of  $\lambda_i$  into a diagonal matrix,

$$D = \begin{bmatrix} \lambda_1 & 0 & 0 \\ 0 & \lambda_2 & 0 \\ 0 & 0 & \dots \end{bmatrix}$$

You can then think of your set of independent differential equations as a single vector differential equation,  $\dot{x} = Dx$

Thinking in multidimensional terms, what are the conditions under which the multi-dimensional origin,  $x = 0$ , is a stable point? What happens if some  $\lambda_i$  are less than zero and others are greater than zero?

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The conditions under which the multi-dimensional origin,  $x = 0$ , is a stable point are when:

- All  $\text{Re}(\lambda_i) < 0$

If some  $\lambda_i$  are less than zero and others are greater than zero we get:

- A **saddle** F.P. (mixed stability) where there is a mix of  $\text{Re}(\lambda_i) < 0$  &  $\text{Re}(\lambda_i) > 0$
- 

### Part 2: Non-diagonal multi-dimensional dynamics

a) Find a matrix  $M$  that will satisfy the equation below

$$\begin{bmatrix} \dot{x} \\ \dot{y} \end{bmatrix} = M \begin{bmatrix} x \\ y \end{bmatrix} \text{ (for the first network)}$$
$$\begin{bmatrix} \dot{x} \\ \dot{y} \\ \dot{z} \end{bmatrix} = M \begin{bmatrix} x \\ y \\ z \end{bmatrix} \text{ (for the second network)}$$

```
M1
2x2 Array{Float64,2}:
 0.3  -1.2
 1.0  -0.8
```

```
M2
3x3 Array{Float64,2}:
-0.5  -0.5   0.0
-0.5   0.1  -1.0
-1.0   0.0  -1.0
```

- b) We can tell that  $[x, y] = [0, 0]$  and  $[x, y, z] = [0, 0, 0]$  are fixed points in each of the neural network dynamics. Predict if this fixed point is stable or not based on the eigenvalues of M.

```
eigvals(M1)
2-element Array{Complex{Float64},1}:
-0.25 + 0.945im
-0.25 - 0.945im
```

Since  $\text{Re}(\text{eig}) < 0$  we predict that the F.P.  $[x, y] = [0, 0]$  is *stable*

```
eigvals(M2)
3-element Array{Complex{Float64},1}:
-1.428 + 0.0im
0.014 + 0.374im
0.014 - 0.374im
```

Since  $\text{Re}(\text{eig}) < \> 0$  we predict that the F.P.  $[x, y, z] = [0, 0, 0]$  is *unstable* (saddle point)

- c) Use Euler integration to numerically solve for x and y (and z in the second neural network) for  $t$  running from 0 to 20 with  $dt = 0.001$ . Set the initial values as  $x(t=0) = 0.001, y(t=0) = -0.001$  (, and  $z(t=0) = 0.002$  in the second neural network). Plot the time courses of x and y (and z in the second neural network) against  $t$  resulting from the Euler integration.
- d) Get the analytical solutions for x and y (and z in the second neural network) for  $t$  running from 0 to 20 with  $dt = 0.001$ . Use the same initial values as c). Plot the time courses of x and y (and z in the second neural network) against  $t$  resulting from the analytical solution. Compare this plot with the plot you made in c). They should look similar if everything is correct.

```
##===== 2-Neuron System
# Numerical
M = [0.3 -1.2; 1 -0.8];
dt = 0.001; t = 0:dt:20;
x = zeros(2,length(t))
x[:,1] = [0.001,-0.001]
```

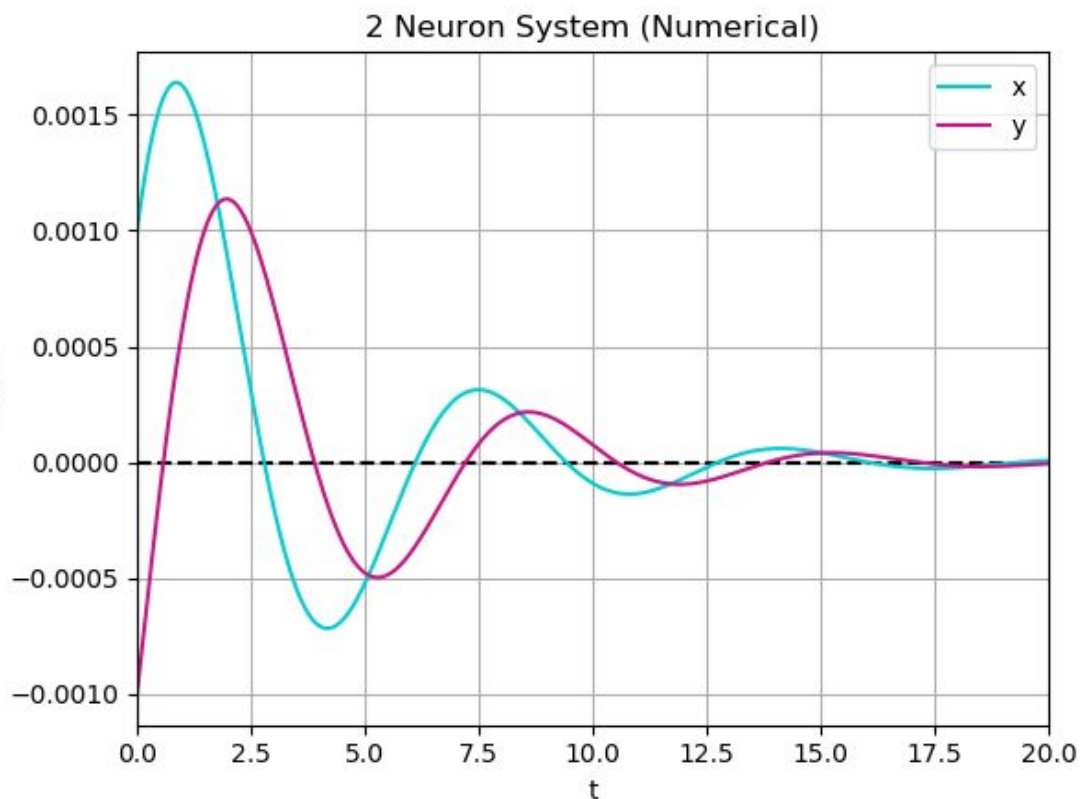
```

for i=1:length(t)-1
    x[:,i+1] = x[:,i] + dt*M*x[:,i] # Euler recipe
end

figure("EX9_1.2d1"); clf();
plot(t, x[1,:], color="darkturquoise", label="x")
plot(t, x[2,:], color="mediumvioletred", label="y")

hlines(0, 0, 20, linestyle = "--", color="black")
xlabel("t"); ylabel("values");grid("on");xlim(0,20)
title("2 Neuron System (Numerical)");legend()

```



```

# Analytical
eigenspace = eigen(M).vectors
eigenvalues = eigen(M).values
initial_xy = [0.001, -0.001];
uv_o = inv(eigenspace) * initial_xy

uv_t = zeros(length(initial_xy), length(t))

```

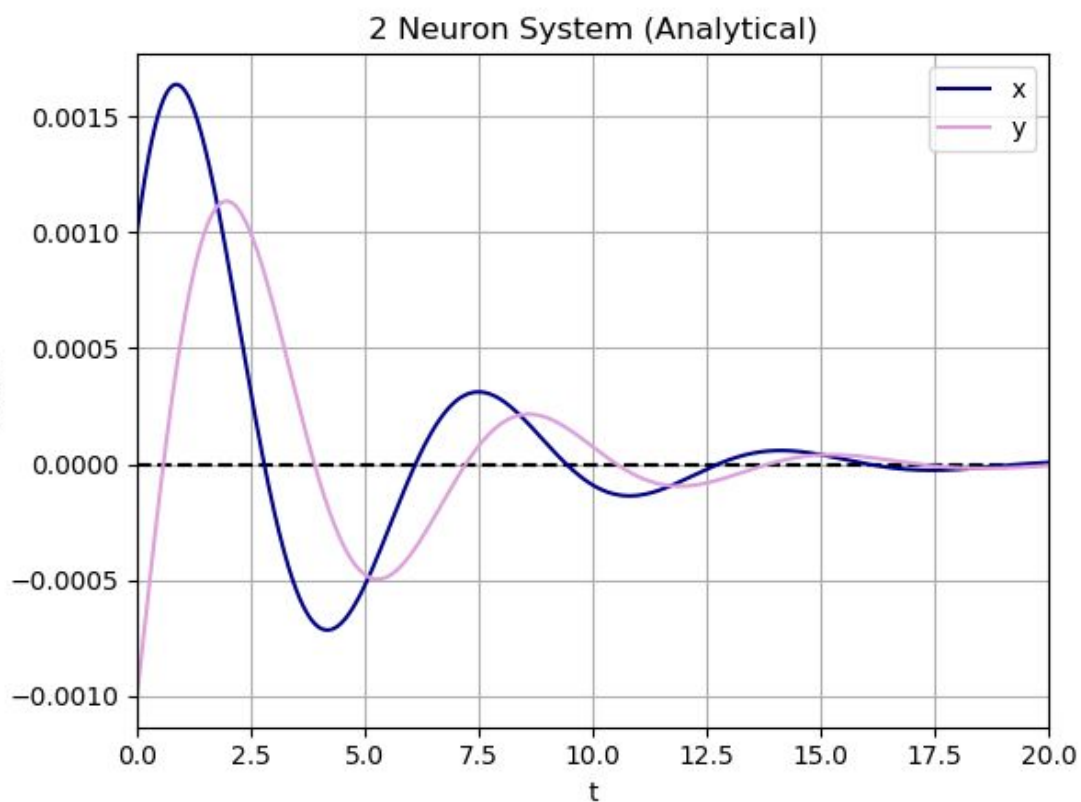
```

uv_t = complex(uv_t)

for i = 1:length(initial_xy)
    uv_t[i, :] = uv_o[i] * exp.(t * eigenvalues[i])
end
xy_t_analytical = eigenspace * uv_t;

figure("EX9_1.2d2"); clf();
plot(t, xy_t_analytical[1,:], color="darkblue", label = "x")
plot(t, xy_t_analytical[2,:], color="plum", label = "y")
hlines(0, 0, 20, linestyle = "--", color="black")
xlabel("t"); ylabel("values");grid("on");xlim(0,20)
title("2 Neuron System (Analytical)");legend()
#

```



```

fig = figure("EX9_1.2d3",figsize=(10,10));
subplot(211)
plot(t, x[1,:], color="darkturquoise", label="x")
plot(t, x[2,:], color="mediumvioletred", label="y")

hlines(0, 0, 20, linestyle = "--", color="black")
xlabel("t"); ylabel("values");grid("on");xlim(0,20)
title("Numerical");legend()

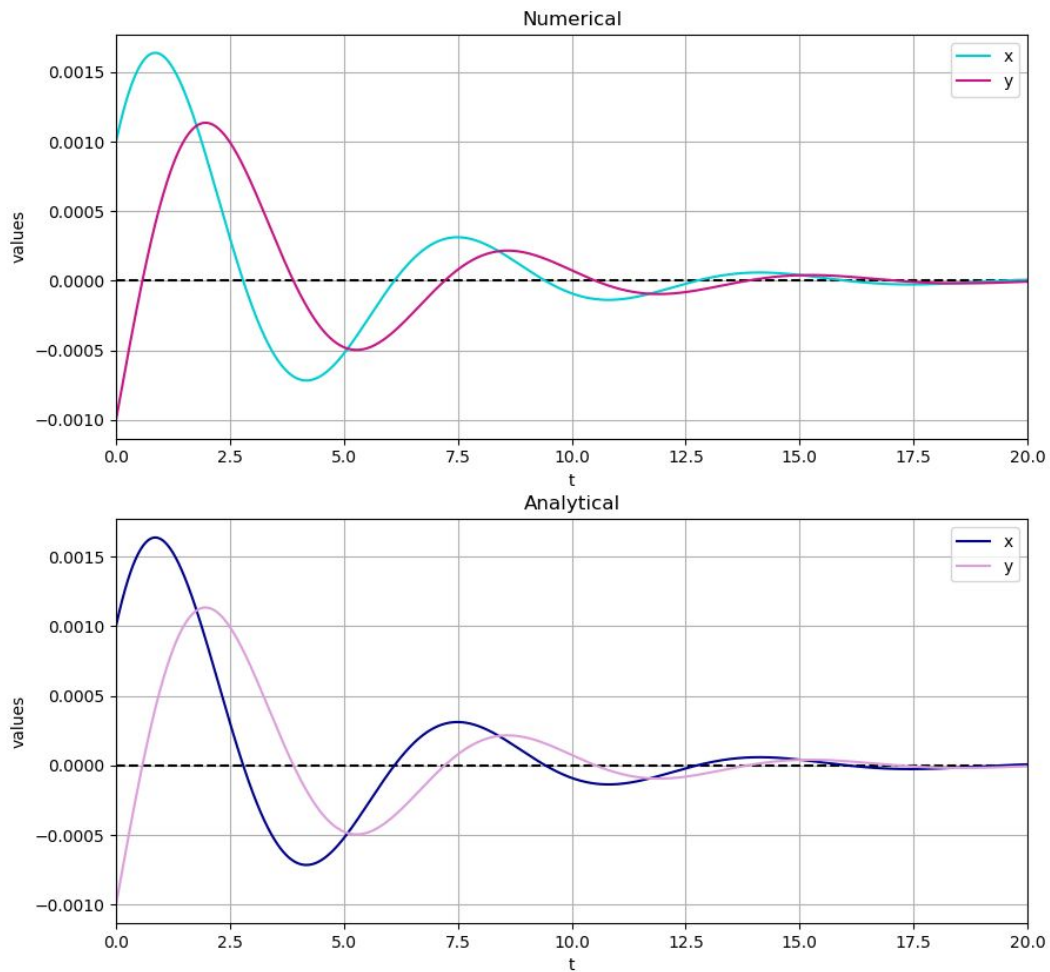
```

```

subplot(212)
plot(t, xy_t_analytical[1,:], color="darkblue", label = "x")
plot(t, xy_t_analytical[2,:], color="plum", label = "y")
hlines(0, 0, 20, linestyle = "--", color="black")
xlabel("t"); ylabel("values");grid("on");xlim(0,20)
title("Analytical");legend()

##=====

```



These two solutions look similar!

```

##===== 3-Neuron System
M = [-0.5 -0.5 0; -0.5 0.1 -1; -1 0 -1]

dt = 0.001; t = 0:dt:20
x = zeros(3,length(t))
x[:,1,1] = [0.001,-0.001,0.002]

for i=1:length(t)-1

```

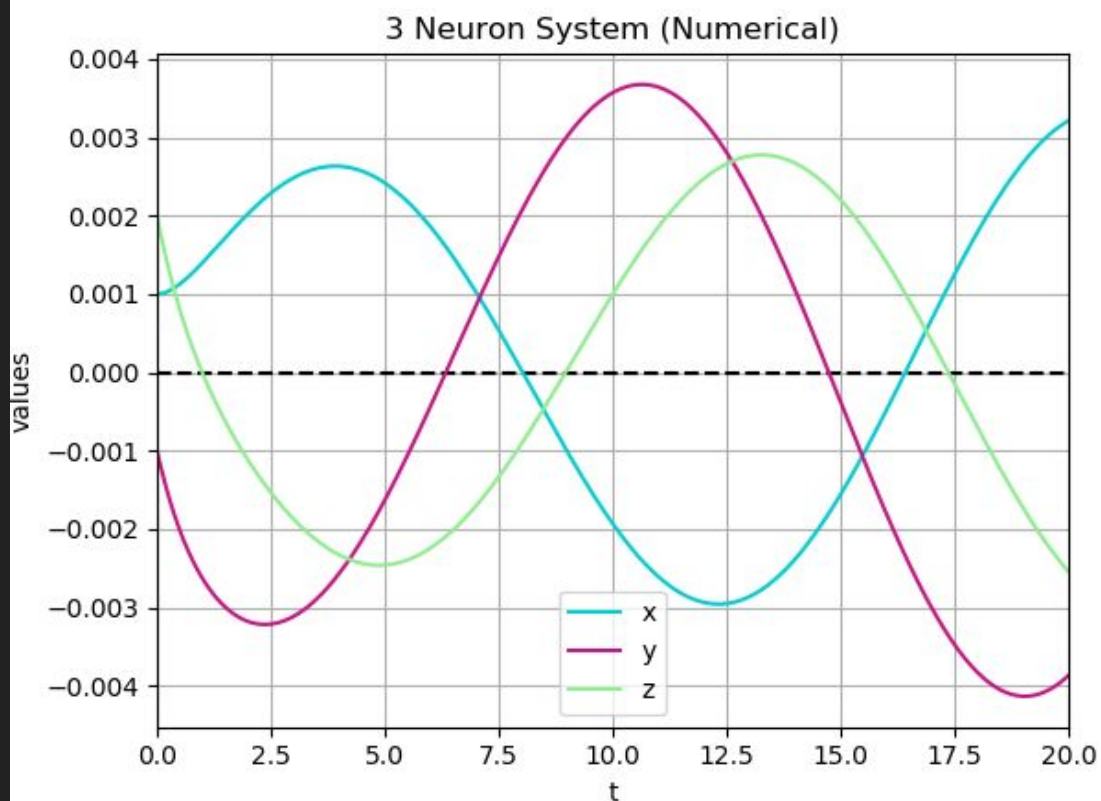
```

x[:,i+1] = x[:,i] + dt*M*x[:,i] # Euler recipe
end

figure("EX9_1.2d4"); clf();
plot(t, x[1,:], color="darkturquoise", label="x")
plot(t, x[2,:], color="mediumvioletred", label="y")
plot(t, x[3,:], color="lightgreen", label="z")

hlines(0, 0, 20, linestyle = "--", color="black")
xlabel("t"); ylabel("values");grid("on");xlim(0,20)
title("3 Neuron System (Numerical)");legend()
#

```



```

## Analytical
eigenspace = eigen(M).vectors
eigenvalues = eigen(M).values
initial_xy = [0.001,-0.001,0.002];
uv_o = inv(eigenspace) * initial_xy

uv_t = zeros(length(initial_xy), length(t))
uv_t = complex(uv_t)

for i = 1:length(initial_xy)

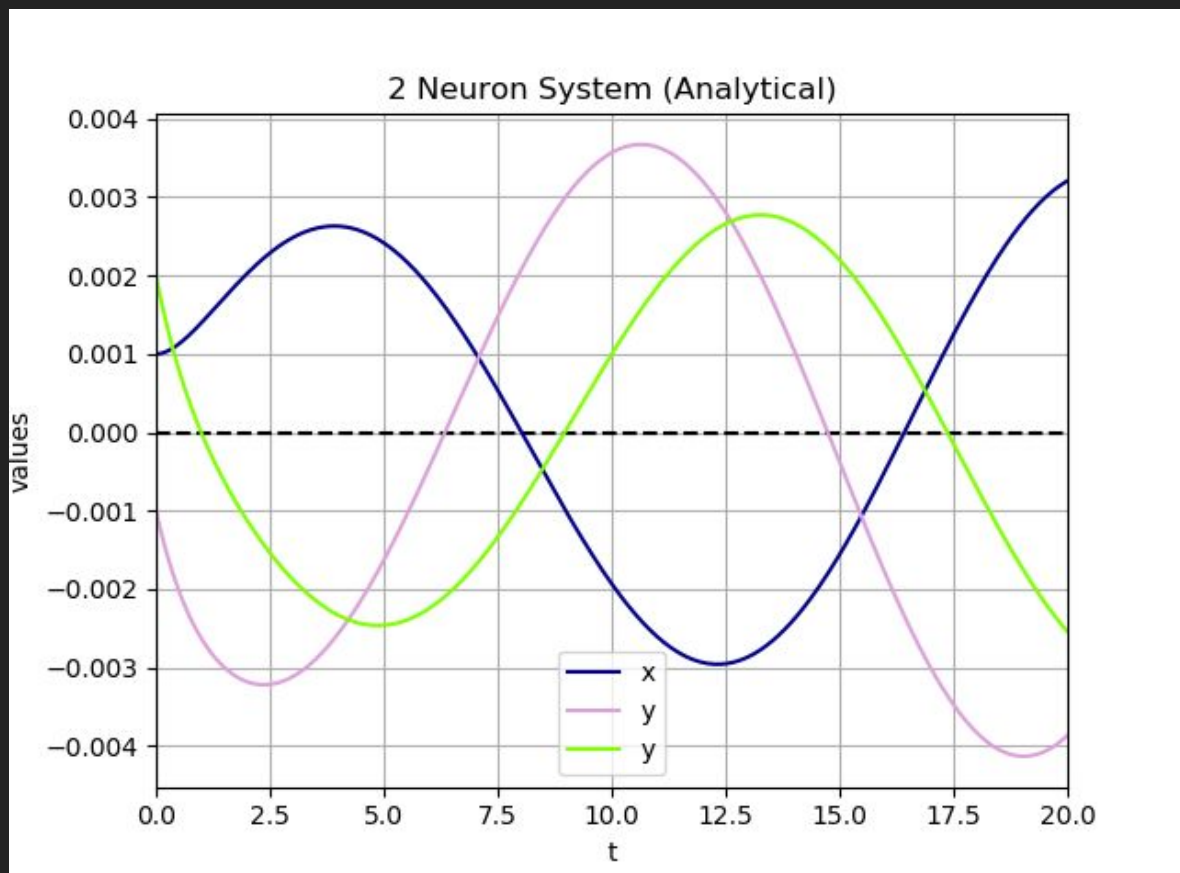
```

```

        uv_t[i, :] = uv_o[i] * exp.(t * eigenvalues[i])
    end
    xy_t_analytical = eigenspace * uv_t;

    figure("EX9_1.2d5"); clf();
    plot(t, xy_t_analytical[1,:), color="darkblue", label = "x")
    plot(t, xy_t_analytical[2,:), color="plum", label = "y")
    plot(t, xy_t_analytical[3,:), color="chartreuse", label =
"y")
    hlines(0, 0, 20, linestyle = "--", color="black")
    xlabel("t"); ylabel("values");grid("on");xlim(0,20)
    title("2 Neuron System (Analytical)");legend()
    #

```



```

fig = figure("EX9_1.2d6",figsize=(10,10));
subplot(211)
plot(t, x[1,:), color="darkturquoise", label="x")
plot(t, x[2,:), color="mediumvioletred", label="y")
plot(t, x[3,:), color="lightgreen", label="z")
    hlines(0, 0, 20, linestyle = "--", color="black")
    xlabel("t"); ylabel("values");grid("on");xlim(0,20)
    title("Numerical");legend()

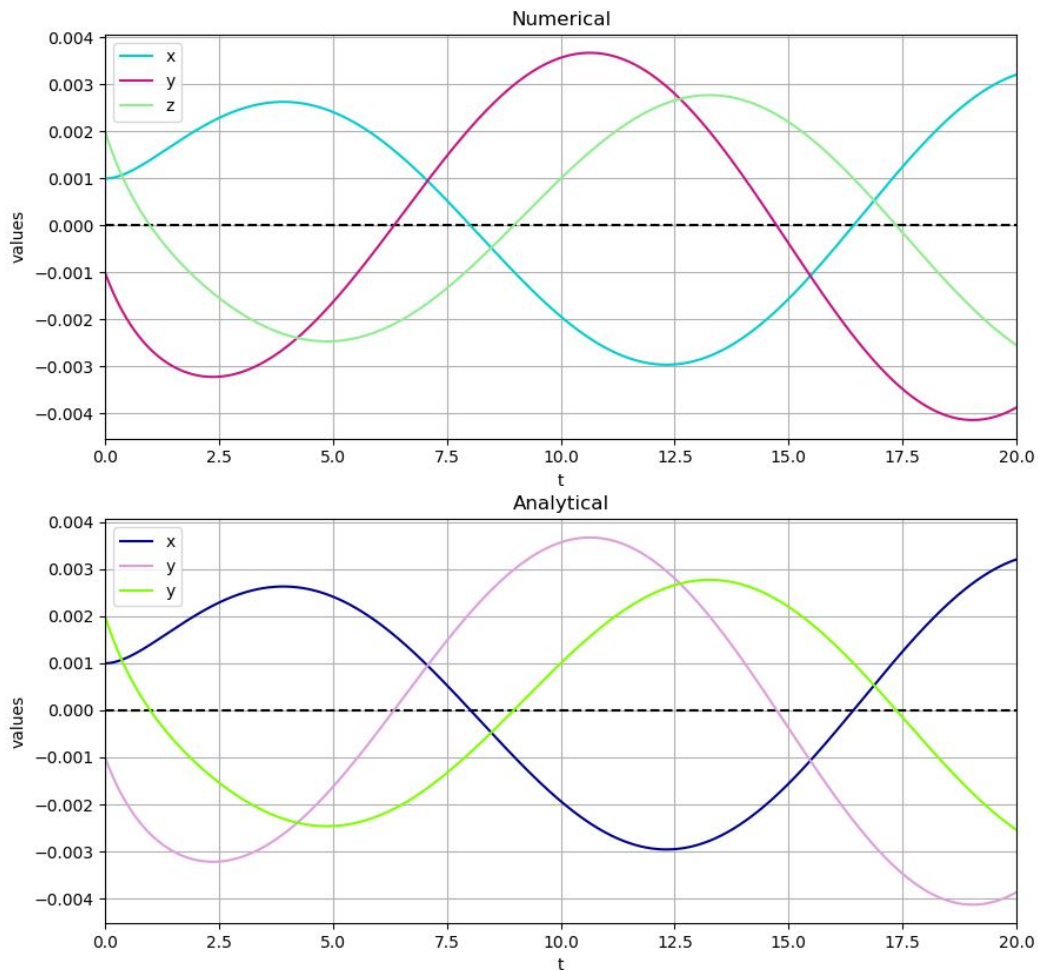
```

```

subplot(212)
plot(t, xy_t_analytical[1,:], color="darkblue", label = "x")
plot(t, xy_t_analytical[2,:], color="plum", label = "y")
plot(t, xy_t_analytical[3,:], color="chartreuse", label = "y")
    hlines(0, 0, 20, linestyle = "--", color="black")
    xlabel("t"); ylabel("values");grid("on");xlim(0,20)
    title("Analytical");legend()

```

#



These solutions look similar!

e) For the first neural network, plot the trajectory on a x-y plane for  $t = 0$  to 20.

```

figure("EX9_1.2e",figsize=(8.5,7)); clf();
xlim([-0.001, 0.002]); ylim([-0.0011, 0.0012]);
hlines(0, -0.001, 0.002, color="black")
vlines(0, -0.0011, 0.0012, color="black")
grid("on")

```



```

plot(x[1,:), x[2,:), color="darkturquoise", label= "[x(t),y(t)]")
# plot(x[1,:), x[2,:), "d")
plot(x[1,1], x[2,1], "x", color="slategrey", label="start")
plot(x[1,end], x[2,end], "o", color="red", label="stop")
xlabel("x"); ylabel("y"); title("[x,y] time course")
legend()

```

