



## Practice 6: Final Project.

Departamento de Ingeniería Eléctrica y Electrónica, Ingeniería Biomédica

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## Información general



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## **Objetive**

In this study, we present a dynamical systems model designed to describe the progression of **metastatic melanoma**, an aggressive form of skin cancer characterized by rapid proliferation, tissue invasion, and immune system evasion. The model is formulated using a **three-population system**, represented by three first-order ordinary differential equations, which describe the temporal evolution of key biological populations within the tumor microenvironment.

Specifically, the model considers the interactions between:

$$\dot{x} = p_1 xyz + p_2 xy^2$$

$$\dot{y} = p_3 y - p_4 xy$$

$$\dot{z} = p_5 z - p_6 xz$$

## **Populations**

- x(t) the population of melanoma tumor cells
- y(t) the population of healthy skin tissue cells
- z(t) the population of effector immune cells, such as CD8<sup>+</sup> cytotoxic T lymphocytes and natural killer (NK) cells

### Interpretation

 $p_1xyz = tumor cell growth enhanced by the simultaneous presence of healthy tissue and immune cells (reflecting inflammatory microenvironment and immune evasion mechanisms).$ 

 $p_2xy^2$  = aggressive tumor proliferation fueled by the availability of abundant healthy tissue (early-stage expansion).

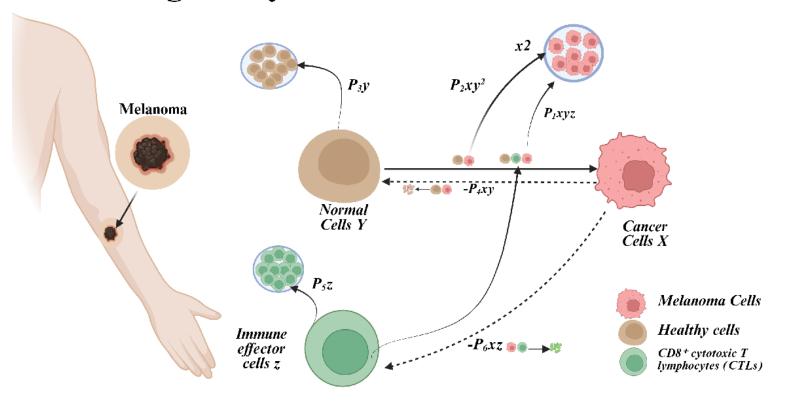
 $p_3y = physiological regeneration of healthy skin tissue.$ 

 $-p_{4}xy$  = destruction of healthy tissue due to tumor invasion and local damage.

 $p_{5Z}$  = activation and proliferation of effector immune cells in response to tumor presence.

 $-p_6xz = \text{tumor-induced immune suppression (e.g., via PD-L1 expression, TGF-<math>\beta$  secretion).

# Biological System on Metastatic Melanoma



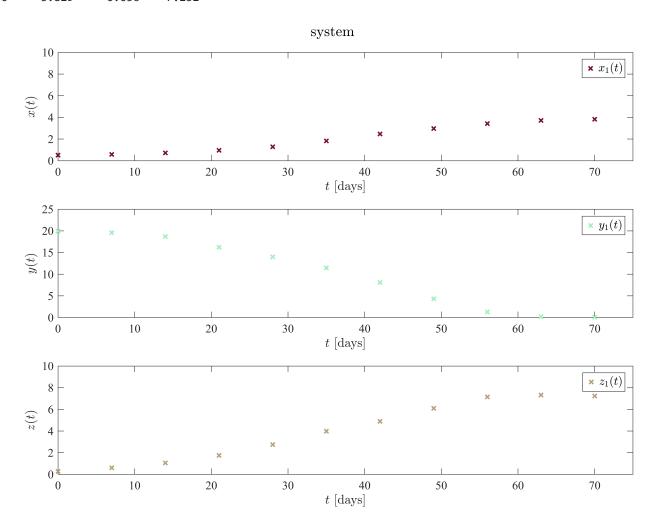
**Figure.** Diagram of the biological three-population system, where x(t) represents pathogenic (tumor) cells, y(t) represents healthy tissue cells, and z(t) represents effector immune cells.

### Simulation data

```
clc; clear; close all; warning('off','all')
filename = 'data2.csv';
sys = readmatrix(filename);
t = sys(:,1);
x1 = sys(:,2);
y1= sys(:,3);
z1 = sys(:,4);
T = array2table([t, x1, y1, z1], 'VariableNames', {'Time', 'x1(t)', 'y1(t)', 'z1(t)'});
disp(T); plotEDOsxd(t,x1,y1,z1); ttl = ' system'; sgtitle(ttl,'Interpreter','Latex')
```

Time	x1(t)	y1(t)	<b>z1(t)</b>
0	0.517	19.939	0.281
7	0.58	19.578	0.609
14	0.726	18.678	1.063

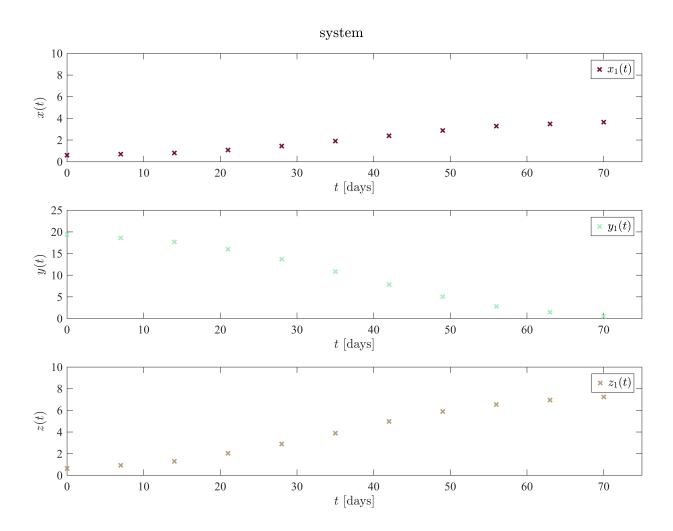
```
21
       0.965
                 16.215
                           1.758
28
       1.282
                 14.005
                           2.752
35
       1.825
                 11.467
                           3.975
42
       2.473
                  8.096
                           4.895
49
       2.974
                  4.327
                           6.096
                  1.287
56
        3.43
                           7.152
                           7.328
63
       3.717
                  0.194
70
       3.829
                  0.056
                           7.232
```



## **Smoothing**

```
x1s = smoothdata(x1);
y1s = smoothdata(y1);
z1s = smoothdata(z1);

plotEDOs2(t,x1s,y1s,z1s); ttl = ' system'; sgtitle(ttl,'Interpreter','Latex')
```



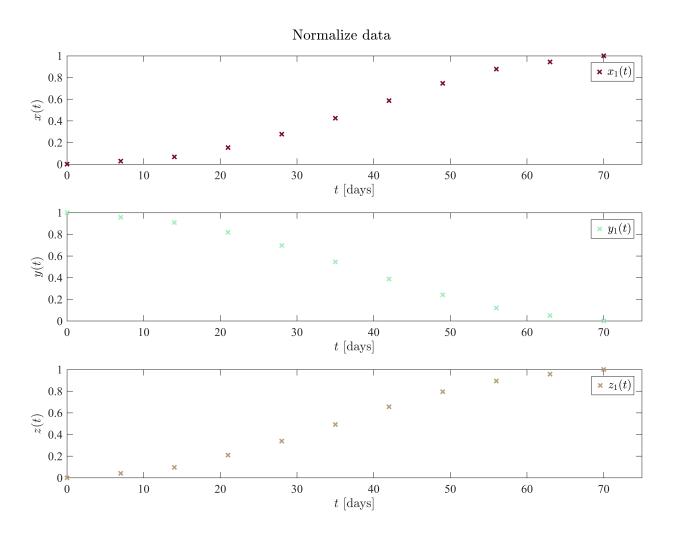
```
T1 = array2table([t, x1s, y1s, z1s], 'VariableNames', {'Time', 'x1(t)', 'y1(t)',
    'z1(t)'});
writetable(T1, 'Smooth_data2.csv');
```

#### Normalize data

```
filename = 'Smooth_data2.csv';
sys = readmatrix(filename);
t = sys(:,1);
x = sys(:,2);
y = sys(:,3);
z = sys(:,4);

% Normalización min-max
x_norm = (x - min(x)) / (max(x) - min(x));
y_norm = (y - min(y)) / (max(y) - min(y));
z_norm = (z - min(z)) / (max(z) - min(z));
```

```
% Graficar con la nueva función
plotEDOsNorm(t, x_norm, y_norm, z_norm); ttl = ' Normalize data';
sgtitle(ttl,'Interpreter','Latex')
```



## **Linear Regression**

```
% Leer el archivo correctamente
filename = 'Smooth_data2.csv';
sys = readmatrix(filename);
t = sys(:,1);
x = sys(:,2);
y= sys(:,3);
z = sys(:,4);
P0x = [0.000761528747328915, 5.40193151929626e-5];
```

```
P0y = [0.0139506931568651, 0.0288201962071527];

P0z = [0.0741556526131045, 0.0192439855016189];

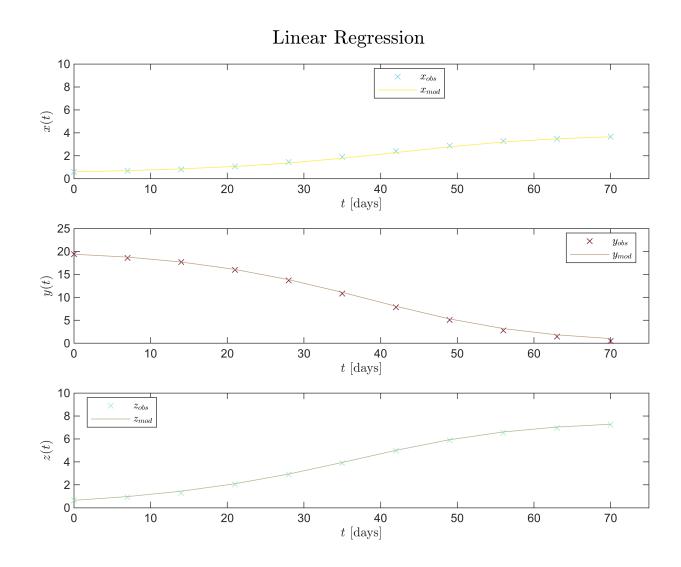
P0 = [P0x, P0y, P0z];

mdl = ModelXYZ(t, x, y, z, P0x, P0y, P0z);
```

--- Ajuste del Modelo XYZ ---Tamaño de muestra: 11 Parámetros ajustados: 6 Grados de libertad: 24 R^2 ajustado: 0.9954 AIC corregido: 84.3921

Parameter	Estimate	StdError	MoE	CI95		PValue
"p1"	0.00077525	6.6718e-05	0.0001377	0.00063755	0.00091295	2.4268e-11
"p2"	3.0776e-05	9.7428e-06	2.0108e-05	1.0667e-05	5.0884e-05	0.0042427
"p3"	0.015219	0.0016395	0.0033838	0.011835	0.018602	2.062e-09
"p4"	0.030408	0.002845	0.0058717	0.024536	0.03628	1.3188e-10
"p5"	0.071353	0.0020469	0.0042246	0.067129	0.075578	4.5322e-22
"p6"	0.018398	0.0016367	0.003378	0.01502	0.021776	4.7772e-11

```
Pest = table2array(mdl.Coefficients(:,1));
[~, x_fit, y_fit, z_fit] = simulateXYZ(t, x(1), y(1), z(1), Pest);
plotXYZResults(t, [x, x_fit], [y, y_fit], [z, z_fit]); ttl = ' Linear Regression';
sgtitle(ttl,'Interpreter','Latex')
```



## Equilibrium points and jacobian matrix

```
clc; clear; close all; warning('off','all')

syms x y z
p = sym('p', [1 6]); % Define un vector simbólico p(1) a p(7)

dx = p(1)*x*y*z + p(2)*x*y^2;
    dy = p(3)*y - p(4)*x*y;
    dz = p(5)*z - p(6)*x*z;
J = jacobian([dx, dy, dz], [x, y, z]);
fprintf('Jacobian matrix of the system:\n');disp(J)
```

Jacobian matrix of the system:

```
\begin{pmatrix} p_2 y^2 + p_1 z y & 2 p_2 x y + p_1 x z & p_1 x y \\ -p_4 y & p_3 - p_4 x & 0 \\ -p_6 z & 0 & p_5 - p_6 x \end{pmatrix}
```

```
eq1 = dx == 0;
eq2 = dy == 0;
eq3 = dz == 0;
edos = solve([eq1, eq2, eq3], [x, y, z]);

n = length(edos.x);
fprintf('Equilibrium Points of the system:\n');fprintf('The system has %d equilibrium point(s).\n\n', n);
```

Equilibrium Points of the system:
The system has 2 equilibrium point(s).

```
for i = 1:min(2,n)
    X = edos.x(i);
    Y = edos.y(i);
    Z = edos.z(i);
    syms x y z
    fprintf('Equilibrium point %d:\n', i);
    disp([x y z X Y Z])
end
```

Equilibrium point 1:

$$\left(x \quad y \quad z \quad \frac{p_5}{p_6} \quad 0 \quad 0\right)$$

Equilibrium point 2:  $(x \ y \ z \ 0 \ 0 \ 0)$ 

## Local stability

```
clc; clear; close all; warning('off','all')

% Parámetros
p1 = 0.000761528747328915;
p2 = 5.40193151929626e-5;
p3 = 0.0139506931568651;
p4 = 0.0288201962071527;
p5 = 0.0741556526131045;
p6 = 0.0192439855016189;

x1 = 0; y1 = 0; z1 = 0;
x2 = p3 / p4;
y2 = 1;
z2 = -p2 / p1;
x = [x1; x2];
```

```
y = [y1; y2];
z = [z1; z2];
var = {'(x0,y0,z0)'; '(x1,y1,z1)'};

Equilibria = table(x, y, z, 'RowNames', var);
Equilibria.Properties.VariableNames = {'xe','ye','ze'};
fprintf('Equilibrium points of the system:\n');disp(Equilibria)
```

Equilibrium points of the system:

```
    xe
    ye
    ze

    (x0,y0,z0)
    0
    0
    0

    (x1,y1,z1)
    0.48406
    1
    -0.070935
```

```
syms xs ys zs
J = [p2*ys^2 + p1*zs*ys, 2*p2*xs*ys + p1*xs*zs,
                                                     p1*xs*ys;
     -p4*ys,
                          p3 - p4*xs,
                                                    0;
                          0,
     -p6*zs,
                                                   p5 - p6*xs ];
L = zeros(2,3);
for i = 1:2
    Ji = double(subs(J, \{xs, ys, zs\}, \{x(i), y(i), z(i)\}));
    L(i,:) = sort(eig(Ji), 'descend');
end
% Tabla de autovalores
L1 = L(:,1); L2 = L(:,2); L3 = L(:,3);
Lambdas = table(L1, L2, L3, 'RowNames', var);
disp('Eigenvalues of the Jacobian matrix evaluated at each equilibrium
point:');disp(Lambdas)
```

```
Eigenvalues of the Jacobian matrix evaluated at each equilibrium point:
L1 L2 L3
```

```
(x0,y0,z0) 0.074156 0.013951+0i 0+0i
(x1,y1,z1) 0.064848 -3.8792e-06+0.00086804i -3.8792e-06-0.00086804i
```

## 2T prediction

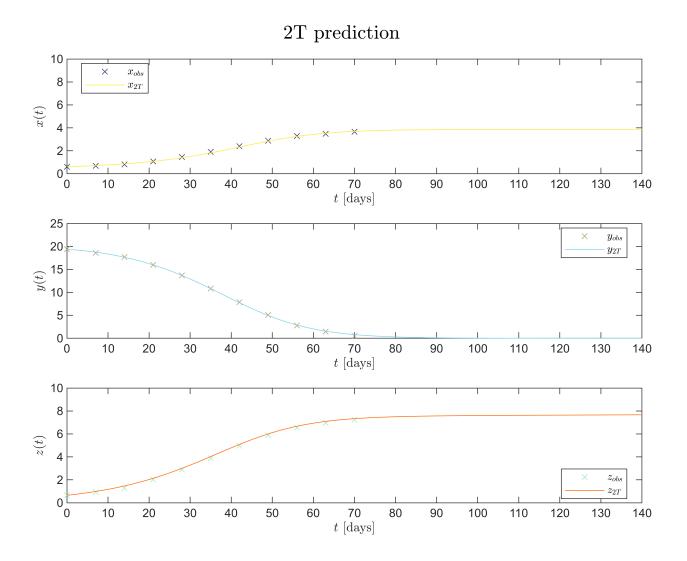
```
filename = 'Smooth_data2.csv';
sys = readmatrix(filename);
t = sys(:,1);
```

```
x = sys(:,2);
y= sys(:,3);
z = sys(:,4);
P0x = [0.000761528747328915, 5.40193151929626e-5];
P0y = [0.0139506931568651, 0.0288201962071527];
P0z = [0.0741556526131045, 0.0192439855016189];
P0 = [P0x, P0y, P0z]; % Vector total de parámetros
mdl = ModelXYZ(t, x, y, z, P0x, P0y, P0z);
```

--- Ajuste del Modelo XYZ --Tamaño de muestra: 11
Parámetros ajustados: 6
Grados de libertad: 24
R^2 ajustado: 0.9954
AIC corregido: 84.3921

Parameter	Estimate	Estimate StdError		CI95		PValue
"p1"	0.00077525	6.6718e-05	0.0001377	0.00063755	0.00091295	2.4268e-11
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"p3"	0.015219	0.0016395	0.0033838	0.011835	0.018602	2.062e-09
"p4"	0.030408	0.002845	0.0058717	0.024536	0.03628	1.3188e-10
"p5"	0.071353	0.0020469	0.0042246	0.067129	0.075578	4.5322e-22
"p6"	0.018398	0.0016367	0.003378	0.01502	0.021776	4.7772e-11

```
P = table2array(mdl.Coefficients(:,1));
dt = 1E-2;
tend = 1000;
[tp, xp, yp, zp] = Predict(x(1), y(1), z(1), dt, tend, P);
plotXYZPredict(t, x, y, z, tp, xp, yp, zp); ttl = ' 2T prediction';
sgtitle(ttl,'Interpreter','Latex')
```



### Conclusion

### **English**

The analyzed dynamic system models the interaction between tumor cells, healthy tissue, and immune effector cells using a set of nonlinear differential equations. Based on parameter estimation and stability analysis, the system exhibits no biologically stable equilibrium where all three populations coexist. Instead, equilibrium points either correspond to total cell absence or dominance of tumor cells in the absence of immune response and healthy tissue. This reflects an aggressive disease progression scenario, such as metastatic melanoma, where the tumor proliferates uncontrollably while suppressing the immune system and destroying surrounding tissue. Numerical simulations support this behavior, showing rapid tumor growth, immune stagnation, and tissue collapse. Overall, the system effectively captures a pathological, unstable biological environment and may serve as a foundation for exploring therapeutic strategies like immunotherapy in future studies.

#### **Español**

El sistema dinámico analizado modela la interacción entre células tumorales, tejido sano y células efectoras del sistema inmunológico mediante un conjunto de ecuaciones diferenciales no lineales. A partir de la estimación de parámetros y el análisis de estabilidad, se concluye que el sistema no presenta un equilibrio biológico estable donde coexistan las tres poblaciones. En su lugar, los puntos de equilibrio corresponden a estados sin células o con dominio absoluto del tumor, en ausencia de tejido sano y respuesta inmune. Esto representa un escenario de progresión agresiva de la enfermedad, como en el caso del melanoma metastásico, donde el tumor crece sin control, suprime al sistema inmunológico y destruye el entorno tisular. Las simulaciones numéricas respaldan esta dinámica, mostrando un crecimiento acelerado del tumor, estancamiento inmunológico y colapso del tejido sano. En conjunto, el sistema describe eficazmente un entorno biológico inestable y patológico, y puede servir como base para explorar estrategias terapéuticas como la inmunoterapia en estudios futuros.

#### MDL

```
function mdl = ModelXYZ(t, x, y, z, P0x, P0y, P0z)
    dt = 1E-1;
    fo = [diff(x)/dt; diff(y)/dt; diff(z)/dt];
    to = [t(2:end); t(2:end); t(2:end)];
    t_base = t;
    function f_pred = model(p, ~)
        [-, x_{}, y_{}, z_{}] = simulateXYZ(t_base, x(1), y(1), z(1), p);
        dxdt_ = diff(x_ ) / dt;
        dydt_ = diff(y_ ) / dt;
        dzdt_{-} = diff(z_{-}) / dt;
        f_pred = [dxdt_; dydt_; dzdt_];
    end
       P0 = [P0x, P0y, P0z];
    mdl = fitnlm(to, fo, @model, P0);
    Estimate = table2array(mdl.Coefficients(:,1));
    SE = table2array(mdl.Coefficients(:,2));
    Pvalue = table2array(mdl.Coefficients(:,4));
    CI95 = coefCI(mdl, 0.05);
    MoE = SE .* tinv(0.975, mdl.DFE);
    param_names = compose("p%d", 1:length(P0));
    Results = table(param_names', Estimate, SE, MoE, CI95, Pvalue, ...
        'VariableNames', {'Parameter', 'Estimate', 'StdError', 'MoE', 'CI95',
'PValue'});
```

```
fprintf('\n--- Ajuste del Modelo XYZ ---\n')
    fprintf('Tamaño de muestra: %d\n', length(x))
    fprintf('Parámetros ajustados: %d\n', length(P0))
    fprintf('Grados de libertad: %d\n', mdl.DFE)
    fprintf('R^2 ajustado: %.4f\n', mdl.Rsquared.Adjusted)
    fprintf('AIC corregido: %.4f\n\n', mdl.ModelCriterion.AICc)
    disp(Results)
end
function [dx, dy, dz] = dynamics(x, y, z, p)
    dx = p(1)*x*y*z + p(2)*x*y^2;
   dy = p(3)*y - p(4)*x*y;
   dz = p(5)*z - p(6)*x*z;
end
function [t_, x_, y_, z_] = simulateXYZ(t, x0, y0, z0, p)
    dt = mean(diff(t));
    t_{-} = (0:dt:max(t))';
    n = length(t_) - 1;
    x_{-} = zeros(n+1,1); x_{-}(1) = x0;
    y_{-} = zeros(n+1,1); y_{-}(1) = y0;
    z_{-} = zeros(n+1,1); z_{-}(1) = z0;
    for i = 1:n
        [dx1, dy1, dz1] = dynamics(x_(i), y_(i), z_(i), p);
        [dx2, dy2, dz2] = dynamics(x_(i)+dx1*dt, y_(i)+dy1*dt, z_(i)+dz1*dt, p);
        x_{(i+1)} = x_{(i)} + 0.5*(dx1 + dx2)*dt;
        y_{(i+1)} = y_{(i)} + 0.5*(dy1 + dy2)*dt;
        z_{(i+1)} = z_{(i)} + 0.5*(dz1 + dz2)*dt;
    end
    x_{=} = interp1(t_{,} x_{,} t);
    y_ = interp1(t_, y_, t);
    z_{-} = interp1(t_{-}, z_{-}, t);
end
```

#### **Functions**

## **Graphics**

```
function plotEDOsxd(t, x1, y1, z1)
    c1 = [116, 9, 56] / 255;
    c2 = [161, 238, 189] / 255;
    c3 = [181, 159, 120] / 255;
   figure('Color', 'w', 'Units', 'centimeters', 'Position', [2, 2, 28, 20]);
   % Subplot 1: x(t)
    subplot(3, 1, 1)
    set(gca, 'FontName', 'Times New Roman', 'FontSize', 12);
    hold on; box on; grid off;
    plot(t, x1, 'x', 'LineWidth', 1.5, 'Color', c1)
    xlabel('$t$ [days]', 'Interpreter', 'latex', 'FontSize', 13)
   ylabel('$x(t)$', 'Interpreter', 'latex', 'FontSize', 13)
    xlim([0 75]); xticks(0:10:75)
   ylim([0 10]); yticks(0:2:10)
    legend('$x_1(t)$', 'Interpreter', 'latex', 'FontSize', 12, 'Location',
'NorthEast')
   % Subplot 2: y(t)
    subplot(3, 1, 2)
    set(gca, 'FontName', 'Times New Roman', 'FontSize', 12);
    hold on; box on; grid off;
    plot(t, y1, 'x', 'LineWidth', 1.5, 'Color', c2)
    xlabel('$t$ [days]', 'Interpreter', 'latex', 'FontSize', 13)
   ylabel('$y(t)$', 'Interpreter', 'latex', 'FontSize', 13)
    xlim([0 75]); xticks(0:10:75)
    ylim([0 25]); yticks(0:5:25)
    legend('$y_1(t)$', 'Interpreter', 'latex', 'FontSize', 12, 'Location',
'NorthEast')
   % Subplot 3: z(t)
    subplot(3, 1, 3)
    set(gca, 'FontName', 'Times New Roman', 'FontSize', 12);
    hold on; box on; grid off;
    plot(t, z1, 'x', 'LineWidth', 1.5, 'Color', c3)
    xlabel('$t$ [days]', 'Interpreter', 'latex', 'FontSize', 13)
    ylabel('$z(t)$', 'Interpreter', 'latex', 'FontSize', 13)
    xlim([0 75]); xticks(0:10:75)
   ylim([0 10]); yticks(0:2:10)
    legend('$z 1(t)$', 'Interpreter', 'latex', 'FontSize', 12, 'Location',
'NorthEast')
end
```

```
function plotEDOs2(t, x1s, y1s, z1s)
    c1 = [116, 9, 56] / 255;
    c2 = [161, 238, 189] / 255;
    c3 = [181, 159, 120] / 255;
   figure('Color', 'w', 'Units', 'centimeters', 'Position', [2, 2, 28, 20]);
   % Subplot 1: x(t)
    subplot(3, 1, 1)
    set(gca, 'FontName', 'Times New Roman', 'FontSize', 12);
    hold on; box on; grid off;
    plot(t, x1s, 'x', 'LineWidth', 1.5, 'Color', c1)
   xlabel('$t$ [days]', 'Interpreter', 'latex', 'FontSize', 13)
   ylabel('$x(t)$', 'Interpreter', 'latex', 'FontSize', 13)
    xlim([0 75]); xticks(0:10:75)
    ylim([0 10]); yticks(0:2:10)
    legend('$x_1(t)$', 'Interpreter', 'latex', 'FontSize', 12, 'Location',
'NorthEast')
   % Subplot 2: y(t)
    subplot(3, 1, 2)
    set(gca, 'FontName', 'Times New Roman', 'FontSize', 12);
    hold on; box on; grid off;
    plot(t, y1s, 'x', 'LineWidth', 1.5, 'Color', c2)
    xlabel('$t$ [days]', 'Interpreter', 'latex', 'FontSize', 13)
   ylabel('$y(t)$', 'Interpreter', 'latex', 'FontSize', 13)
    xlim([0 75]); xticks(0:10:75)
    ylim([0 25]); yticks(0:5:25)
    legend('$y_1(t)$', 'Interpreter', 'latex', 'FontSize', 12, 'Location',
'NorthEast')
   % Subplot 3: z(t)
    subplot(3, 1, 3)
    set(gca, 'FontName', 'Times New Roman', 'FontSize', 12);
    hold on; box on; grid off;
    plot(t, z1s, 'x', 'LineWidth', 1.5, 'Color', c3)
    xlabel('$t$ [days]', 'Interpreter', 'latex', 'FontSize', 13)
   ylabel('$z(t)$', 'Interpreter', 'latex', 'FontSize', 13)
    xlim([0 75]); xticks(0:10:75)
   ylim([0 10]); yticks(0:2:10)
    legend('$z_1(t)$', 'Interpreter', 'latex', 'FontSize', 12, 'Location',
'NorthEast')
end
function plotXYZPredict(to, xo, yo, zo, tp, xp, yp, zp)
   % Definición fija de colores similar al segundo código
    colores = [116, 9, 56]
              161, 238, 189;
               170, 84, 134;
```

```
255, 101, 0;
           123, 211, 234;
           181, 159, 120;
           42, 54, 99;
           26, 26, 29;
           254, 236, 55;
           165, 182, 141] / 255;
% Selección fija de colores para obs y mod (6 colores al azar sin repetir)
rng('shuffle');
indices = randperm(size(colores,1),6);
c1 obs = colores(indices(1), :);
c1 mod = colores(indices(2), :);
c2_obs = colores(indices(3), :);
c2_mod = colores(indices(4), :);
c3 obs = colores(indices(5), :);
c3_mod = colores(indices(6), :);
figure(); set(gcf, 'Color', 'w')
set(gcf,'Units','Centimeters','Position',[2,2,20,15])
set(gca, 'FontName', 'Times New Roman')
fontsize(12,'points')
% Subplot X
subplot(3,1,1); hold on; box on;
plot(to, xo, 'x', 'Color', c1_obs)
plot(tp, xp, '-', 'Color', c1_mod)
ylabel('$x(t)$','Interpreter','latex')
xlabel('$t\ \mathrm{[days]}$', 'Interpreter','latex') % ← Corregido
legend({'$x_{obs}$','$x_{2T}$'}, 'Interpreter','latex', 'Location', 'Best')
xticks(0:10:140); xlim([0 140]);
ylim([0 10]); yticks(0:2:10)
% Subplot Y
subplot(3,1,2); hold on; box on;
plot(to, yo, 'x', 'Color', c2_obs)
plot(tp, yp, '-', 'Color', c2_mod)
ylabel('$y(t)$','Interpreter','latex')
xlabel('$t\ \mathrm{[days]}$', 'Interpreter','latex') % ← Corregido
legend({'$y_{obs}$','$y_{2T}$'}, 'Interpreter','latex', 'Location', 'Best')
xticks(0:10:140); xlim([0 140]);
ylim([0 25]); yticks(0:5:25)
% Subplot Z
subplot(3,1,3); hold on; box on;
plot(to, zo, 'x', 'Color', c3_obs)
plot(tp, zp, '-', 'Color', c3_mod)
xlabel('$t\ \mathrm{[days]}$', 'Interpreter','latex') % ← Corregido
ylabel('$z(t)$','Interpreter','latex')
legend({'$z_{obs}$','$z_{2T}$'}, 'Interpreter','latex', 'Location', 'Best')
```

```
xticks(0:10:140); xlim([0 140]);
   ylim([0 10]); yticks(0:2:10)
end
function plotXYZPredict2(to, xo, yo, zo, tp, xp, yp, zp)
    % Definición fija de colores similar al segundo código
    colores = [116, 9, 56;
               161, 238, 189;
               170, 84, 134;
               255, 101, 0;
               123, 211, 234;
               181, 159, 120;
               42, 54, 99;
               26, 26, 29;
               254, 236, 55;
               165, 182, 141] / 255;
   % Selección fija de colores para obs y mod (6 colores al azar sin repetir)
    rng('shuffle');
    indices = randperm(size(colores,1),6);
    c1 obs = colores(indices(1), :);
    c1_mod = colores(indices(2), :);
    c2 obs = colores(indices(3), :);
    c2_mod = colores(indices(4), :);
    c3_obs = colores(indices(5), :);
    c3 mod = colores(indices(6), :);
   figure(); set(gcf, 'Color', 'w')
    set(gcf, 'Units', 'Centimeters', 'Position', [2,2,20,15])
    set(gca, 'FontName', 'Times New Roman')
    fontsize(12, 'points')
   % Subplot X
    subplot(3,1,1); hold on; box on;
    plot(to, xo, 'x', 'Color', c1_obs)
    plot(tp, xp, '-', 'Color', c1_mod)
   ylabel('$x(t)$','Interpreter','latex')
    legend({'$x_{obs}$','$x_{2T}$'}, 'Interpreter','latex', 'Location', 'Best')
   xticks(0:100:1000); xlim([0 1000]);
   ylim([0 10]); yticks(0:2:10)
   % Subplot Y
    subplot(3,1,2); hold on; box on;
    plot(to, yo, 'x', 'Color', c2_obs)
    plot(tp, yp, '-', 'Color', c2_mod)
    ylabel('$y(t)$','Interpreter','latex')
```

```
legend({'$y_{obs}$', '$y_{2T}$'}, 'Interpreter', 'latex', 'Location', 'Best')
    xticks(0:100:1000); xlim([0 1000]);
    ylim([0 25]); yticks(0:5:25)

% Subplot Z
    subplot(3,1,3); hold on; box on;
    plot(to, zo, 'x', 'Color', c3_obs)
    plot(tp, zp, '-', 'Color', c3_mod)
    xlabel('$t\ \text{[días]}$', 'Interpreter', 'latex')
    ylabel('$t\ \text{[días]}$', 'Interpreter', 'latex')
    legend({'$z_{obs}}', '$z_{2T}$'}, 'Interpreter', 'latex', 'Location', 'Best')
    xticks(0:100:1000); xlim([0 1000]);
    ylim([0 10]); yticks(0:2:10)
end
```

#### Plot mdl

```
function plotXYZResults(t, X, Y, Z)
    colores = [116, 9, 56]
               161, 238, 189;
               170, 84, 134;
               255, 101, 0;
               123, 211, 234;
               181, 159, 120;
               42, 54, 99;
               26, 26, 29;
               254, 236, 55;
               165, 182, 141] / 255;
    rng('shuffle');
    indices = randperm(size(colores,1), 6);
    c1 obs = colores(indices(1), :);
    c1 mod = colores(indices(2), :);
    c2_obs = colores(indices(3), :);
    c2 mod = colores(indices(4), :);
    c3_obs = colores(indices(5), :);
    c3_mod = colores(indices(6), :);
    set(figure(),'Color','w')
    set(gcf, 'Units', 'Centimeters', 'Position', [2,2,20,15])
    set(gca, 'FontName', 'Times New Roman')
    fontsize(12, 'points')
```

```
% Subplot X
    subplot(3,1,1)
    hold on; box on;
    plot(t, X(:,1), 'x', 'Color', c1_obs)
   plot(t, X(:,2), '-', 'Color', c1_mod)
   ylabel('$x(t)$','Interpreter','latex')
    xlabel('$t\ \mathrm{[days]}$', 'Interpreter','latex') % ← Corregido
    legend({'$x_{obs}$','$x_{mod}$'}, 'Interpreter','latex', 'Location', 'Best')
    xlim([0 75]); xticks(0:10:75)
   ylim([0 10]); yticks(0:2:10)
   % Subplot Y
    subplot(3,1,2)
    hold on; box on;
    plot(t, Y(:,1), 'x', 'Color', c2_obs)
    plot(t, Y(:,2), '-', 'Color', c2_mod)
   ylabel('$y(t)$','Interpreter','latex')
    xlabel('$t\ \mathrm{[days]}$', 'Interpreter','latex') % ← Corregido
    legend({'$y_{obs}$','$y_{mod}$'}, 'Interpreter','latex', 'Location', 'Best')
    xlim([0 75]); xticks(0:10:75)
   ylim([0 25]); yticks(0:5:25)
   % Subplot Z
    subplot(3,1,3)
    hold on; box on;
    plot(t, Z(:,1), 'x', 'Color', c3_obs)
   plot(t, Z(:,2), '-', 'Color', c3_mod)
    xlabel('$t\ \mathrm{[days]}$', 'Interpreter','latex') % ← Corregido
   ylabel('$z(t)$','Interpreter','latex')
    legend({'$z_{obs}$','$z_{mod}$'}, 'Interpreter','latex', 'Location', 'Best')
    xlim([0 75]); xticks(0:10:75)
   ylim([0 10]); yticks(0:2:10)
end
```

#### Plot Normalized data

```
hold on; box on; grid off;
    plot(t, x1, 'x', 'LineWidth', 1.5, 'Color', c1)
    xlabel('$t$ [days]', 'Interpreter', 'latex', 'FontSize', 13)
   ylabel('$x(t)$', 'Interpreter', 'latex', 'FontSize', 13)
    xlim([0 75]); xticks(0:10:75)
   ylim([0 1]); yticks(0:0.2:1)
    legend('$x_1(t)$', 'Interpreter', 'latex', 'FontSize', 12, 'Location',
'NorthEast')
    subplot(3, 1, 2)
    set(gca, 'FontName', 'Times New Roman', 'FontSize', 12);
    hold on; box on; grid off;
    plot(t, y1, 'x', 'LineWidth', 1.5, 'Color', c2)
    xlabel('$t$ [days]', 'Interpreter', 'latex', 'FontSize', 13)
   ylabel('$y(t)$', 'Interpreter', 'latex', 'FontSize', 13)
   xlim([0 75]); xticks(0:10:75)
   ylim([0 1]); yticks(0:0.2:1)
    legend('$y_1(t)$', 'Interpreter', 'latex', 'FontSize', 12, 'Location',
'NorthEast')
    subplot(3, 1, 3)
    set(gca, 'FontName', 'Times New Roman', 'FontSize', 12);
    hold on; box on; grid off;
    plot(t, z1, 'x', 'LineWidth', 1.5, 'Color', c3)
    xlabel('$t$ [days]', 'Interpreter', 'latex', 'FontSize', 13)
   ylabel('$z(t)$', 'Interpreter', 'latex', 'FontSize', 13)
   xlim([0 75]); xticks(0:10:75)
   ylim([0 1]); yticks(0:0.2:1)
    legend('$z_1(t)$', 'Interpreter', 'latex', 'FontSize', 12, 'Location',
'NorthEast')
end
```

#### 2t Predict

```
function [t, x, y, z] = Predict(x0, y0, z0, dt, tend, P)

    rho1 = P(1);
    rho2 = P(2);
    rho3 = P(3);
    rho4 = P(4);
    rho5 = P(5);
    rho6 = P(6);
    %rho7 = P(7);

t = (0:dt:tend)';
N = length(t);
```

```
x = zeros(N, 1); x(1) = x0;
   y = zeros(N, 1); y(1) = y0;
    z = zeros(N, 1); z(1) = z0;
   for i = 1:N-1
       [fx, fy, fz] = f(x(i), y(i), z(i));
       xn = x(i) + fx * dt;
       yn = y(i) + fy * dt;
       zn = z(i) + fz * dt;
       [fxn, fyn, fzn] = f(xn, yn, zn);
       x(i+1) = x(i) + (fx + fxn) * dt / 2;
       y(i+1) = y(i) + (fy + fyn) * dt / 2;
       z(i+1) = z(i) + (fz + fzn) * dt / 2;
    end
   function [dx, dy, dz] = f(x, y, z)
         dx = rho1 * x * y * z + rho2 * x * y^2;
         dy = rho3 * y - rho4 * x * y;
         dz = rho5 * z - rho6 * x * z;
    end
end
```