## AMATH 522: Problem Set 3

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## 1 Coupled Oscillators

The coupled oscillators are modeled by the differential equations written below.

```
function deriv = coup_osc(tspan ,y,dummy, g,p)

%Differntial Equations
dy = zeros(12,1);

%First Oscillator
dy(1) = -y(1) + p(1)/(1.+y(6)^p(4)) + p(2);
dy(2) = -y(2) + p(1)/(1.+y(4)^p(4)) + p(2);
dy(3) = -y(3) + p(1)/(1.+y(5)^p(4)) + p(2);
dy(4) = -p(3)*(y(4)-y(1)) + g*(y(10)-y(4));
dy(5) = -p(3)*(y(5)-y(2)) + g*(y(11)-y(5));
dy(6) = -p(3)*(y(6)-y(3)) + g*(y(12)-y(6));

%Second Oscillator
dy(7) = -y(7) + p(1)/(1.+y(12)^p(4)) + p(2);
dy(8) = -y(8) + p(1)/(1.+y(10)^p(4)) + p(2);
dy(9) = -y(9) + p(1)/(1.+y(11)^p(4)) + p(2);
dy(10) = -p(3)*(y(10)-y(7)) + g*(y(4)-y(10));
dy(11) = -p(3)*(y(11)-y(8)) + g*(y(5)-y(11));
deriv=dy;

deriv=dy;
```

We solve them in Matlab using ode45.

```
%Repressilator

clc; clear all; close all;
init = rand(12,1);
tspan=[0 200];

alpha=50;

alpha0=0;
beta=0.2;
n=2;
p = [alpha,alpha0,beta,n];

Wuncoupled Oscillations

[t,Y] = ode45('coup_osc',tspan,init,[],0,p);

figure(1)
set(gca,'FontSize',16)
plot3(Y(:,1),Y(:,3),Y(:,5),'g',Y(:,7),Y(:,9),Y(:,11),'LineWidth',3);
legend('m lalcl','m2 lalcl')

figure(2)
```

```
\begin{array}{l} \mathtt{set}\left(\mathtt{gca}\,,\, {}^{\backprime}\mathtt{FontSize}\,^{\backprime}\,, 16\right) \\ \mathtt{plot}\left(\mathtt{t}\,, \mathtt{Y}\left(:\,, 1:3\right)\,,\, {}^{\backprime}\mathtt{LineWidth}\,^{\backprime}\,, 3\right) \;\;; \;\; \mathtt{hold} \;\; \mathtt{on}\,; \end{array}
     plot(t, Y(:, 1:3), Elnewidth ', 3); hold on;
plot(t, Y(:, 4:6),:, 'LineWidth', 3); hold on;
plot(t, Y(:, 7:9), 'LineWidth', 3); hold on;
plot(t, Y(:, 10:12),:, 'LineWidth', 3); hold off;
legend('m lalcl', 'p lacl', 'm tetR', 'p tetR', 'm cl', 'p cl', 'm2 lalcl', 'p2 lacl', 'm2 tetR', 'p2 tetR', 'm2 cl', 'p2 cl')
31
     figure (3)
set (gca, 'FontSize', 16)
32
     plot(t,Y(:,1),'LineWidth',3); hold on;
plot(t,Y(:,7),'g','LineWidth',3); hold off;
legend('m_lalcl','m2_lalcl')
34
     xlabel('t');
37
     %Coupled Oscillations
40
      [t,Y] = ode45('coup_osc',tspan,init,[],10,p);
42
     figure (4)
43
     set(gca, 'FontSize',16)
plot3(Y(:,1),Y(:,3),Y(:,5),'g',Y(:,7),Y(:,9),Y(:,11),'LineWidth',3);
legend('m lalcl','m2 lalcl')
     figure (5)
     set(gca, 'FontSize',16)
plot(t,Y(:,1:3), 'LineWidth',3) ; hold on;
50
     plot(t,Y(:,4:6); 'LineWidth',3); hold on;
plot(t,Y(:,7:9), 'LineWidth',3); hold on;
plot(t,Y(:,10:12); 'LineWidth',3); hold off;
legend('m lalcl','p lacl','m tetR','p tetR','m cl','p cl','m2 lalcl','p2 lacl','m2 tetR'
                , 'p2 tetR', 'm2 cl', 'p2 cl')
57
    figure (6)
set (gca, 'FontSize',16)
plot(t,Y(:,1), 'LineWidth',3); hold on;
plot(t,Y(:,7),'g','LineWidth',3); hold off;
legend('m' lalcl', 'm2 lalcl')
58
     xlabel('t');
```

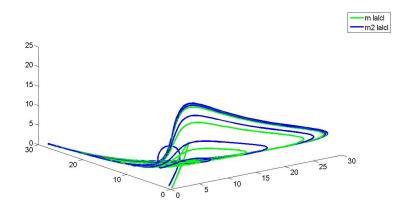


Figure 1: The uncoupled case

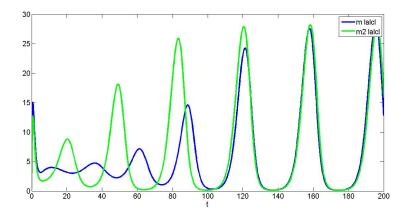


Figure 2: Oscillations in the uncoupled case  ${\cal C}$ 

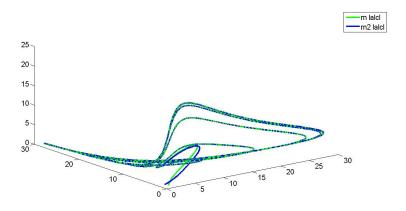


Figure 3: The coupled case  $\frac{1}{2}$ 

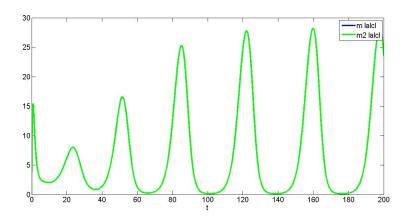


Figure 4: Converged oscillations in the uncoupled case

## 2 Systems biology and network motifs

Let us start with Shen-Orr's paper and try to model those odes before.

```
import scipy.integrate as si
import numpy as np
import matplotlib.pyplot as plt
#The forcing (X)
def sigm(t):
        if 2<t <6 :
                f = 1
        else:
                f = 0
        return f
#The function F
def sigm2(t):
        if 0.5<t
                f = 1
        else:
                f = 0
        return f
#The derivative
def ode(y, t):
        return [sigm(t)-y[0], sigm2(y[0])*sigm(t)-y[1]]
t = np.linspace(0, 10, 1000)
yzero = np.array([0.,0.])
y = si.odeint(ode, yzero, t)
#Plots
fig = plt.figure()
ax = fig.add_subplot(111)
plt.plot(t, y[:,0], label='y')
plt.plot(t, y[:,1], label='z')
handles, labels = ax.get_legend_handles_labels()
ax.legend(handles, labels)
plt.show()
```

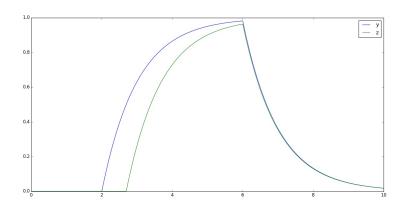


Figure 5: Shen-Orr odes

This matches quite well with the figure 2a in the paper.

However, Alon's results appears to follow a different path after the forcing is over. In fact, at t=6, the graphs seem to continue on unaffected. After doing a few trials and errors, we get graphs like the ones

below.

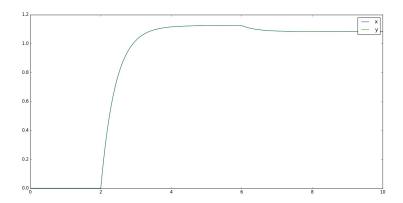


Figure 6: Trial and error graph

Alon's graphs appears to increase and don't seem to have the discontinuity at t=6. For this to happen, the derivative at t=6 must not have two values. Let p refer to the concentrations of both X and Y since they are identical.

Left derivative at 6 = right derivative at 6.

$$tF(p)F(x=6^{-}) + F(x=6^{-}) - bp = tF(p)F(x=6^{+}) + F(x=6^{+}) - bp$$
  
 $tF(p) + 1 - bp = -bp$   
 $tF(p) + 1 = 0$   
 $t = -1$ 

For the derivative to be single valued at 6, the coefficient of the non-linear term has to be -1. Plugging this in, we attempt to get new insights.

```
import scipy.integrate as si
import numpy as np
import matplotlib.pyplot as plt
#The forcing (X)
def sigm(t):
        if 2<t <6 :
                 f = 1
        else:
                 f = 0
        return f
#The function F
def sigm2(t):
        if 0.0<t
                 f = 1
        else:
                 f = 0
        return f
#The derivative
def ode(y, t):
        return[-1.*sigm2(y[1])*sigm(t)+sigm(t)-0.4*y[0],
        -1.*sigm2(y[0])*sigm(t)+sigm(t)-0.4*y[1]]
```

```
t = np.linspace(0, 10, 1000)
yzero = np.array([0.,0.])
y = si.odeint(ode, yzero, t)

#Plots
fig = plt.figure()
ax = fig.add_subplot(111)
plt.plot(t, y[:,0], label='y')
plt.plot(t, y[:,1], label='z')
handles, labels = ax.get_legend_handles_labels()
ax.legend(handles, labels)
plt.show()
```

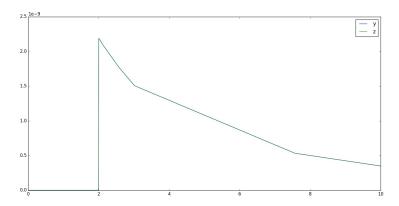


Figure 7: Cost of making the derivative exist

The derivative is continuous at 6 but this is far from the graph we want and thus, we assume that there is a jump in the derivative at t=6. So, each term in the derivative has an F(z) part. Using this, we can model our equations as

$$\frac{dx}{dt} = F(z)F(x) + F(z) - xF(z)$$
$$\frac{dy}{dt} = F(z)F(y) + F(z) - yF(z)$$

Where,

Scaling appropriately, we plug it into the code.

```
f = 1
        else:
                f = 0
        return f
def ode(y, t):
        return [0.5*sigm2(y[1])*sigm(t)+0.5*sigm(t)-y[0]*sigm(t),
        0.5*sigm2(y[0])*sigm(t)+0.5*sigm(t)-y[1]*sigm(t)]
t = np.linspace(0, 10, 1000)
yzero = np.array([0.,0.])
y = si.odeint(ode, yzero, t)
fig = plt.figure()
ax = fig.add_subplot(111)
plt.plot(t, y[:,0])
plt.plot(t, y[:,1])
plt.plot(t, y[:,0], label='x')
plt.plot(t, y[:,1], label='y')
handles, labels = ax.get_legend_handles_labels()
ax.legend(handles, labels)
plt.show()
```

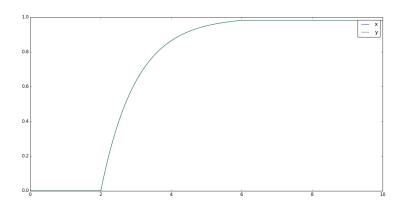


Figure 8: Double positive feedback loop

Similarly, for the negative feedback loop,

$$\frac{dx}{dt} = F(z)F(x) + F(z) - xF(z)$$
$$\frac{dy}{dt} = F(z)F(y) - F(z) - yF(z)$$

```
import scipy.integrate as si
import numpy as np
import matplotlib.pyplot as plt

#F(z)
def sigm(t):
    if 2<t <6:
        f=1
    else:
        f=0</pre>
```

```
return f
#F(x)/F(y)
def sigm2(t):
        if 0.0<t :
                 f = 1
         else:
                 f = 0
        return f
def ode(y, t):
        return [0.5*sigm2(y[1])*sigm(t)+0.5*sigm(t)-y[0]*sigm(t),
        1*sigm2(y[0])*sigm(t)-sigm(t)-y[1]*sigm(t)]
t = np.linspace(0, 10, 1000)
yzero = np.array([0.,0.])
y = si.odeint(ode, yzero, t)
#Plots
fig = plt.figure()
ax = fig.add_subplot(111)
plt.plot(t, y[:,0])
plt.plot(t, y[:,1])
plt.plot(t, y[:,0], label='x')
plt.plot(t, y[:,1], label='y')
handles, labels = ax.get_legend_handles_labels()
ax.set_ylim([-0,1.10])
ax.legend(handles, labels)
plt.show()
```

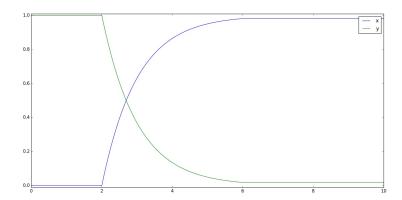


Figure 9: Double negative feedback loop

## 3 Python

• Exercise: Random guassian distribution

```
import numpy as np
m= 5
s = np.sqrt(2)
p=np.random.normal(5,s,100)
print(np.mean(p))
print(np.var(p))
```

The answer often varies but for one instance, mean was 5.09347742313 and the variance was 1.94676873609.

• Exercise 2: Solving an ode

```
import scipy.integrate as si
import numpy as np
import matplotlib.pyplot as plt
def ode(y, t):
   yprime = y
   return yprime
#1run
         ODE solving example: .
t = np.arange(0, 10.01, .01) #x time points on which to solve
yzero = np.array([1.])
y = si.odeint(ode, yzero, t)
print (y)
plt.plot(t, y)
plt.xlabel('t')
plt.ylabel('y')
plt.title('The ode')
plt.show()
```

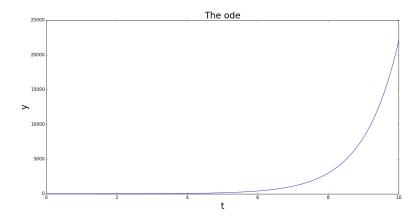


Figure 10: Exercise 2