# Homework 5

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March 19, 2021

#### Problem 0

The correction I made is in line 29 of the rk4 code, in the calculation of the K4 coefficient, the error having potentially come from copy/pasting without changing some subtly different variables.

```
def rk4(f,t0,y0,h,m):
2
        b21 = 1/2
3
        b31 = 0
4
        b32 = 3/4
5
        b41 = 2/9
        b42 = 0
        b43 = 1/3
        b51 = 1/6
        b52 = 1/3
10
        b53 = 1/3
11
        b54 = 1/6
12
13
        t = t0
14
        y = np.array(y0)
15
16
        ya = np.empty((len(y0),m+1))
17
        ya[:,0] = y
18
        ta = np.linspace(t0,t0+m*h,m+1)
19
20
        for k in range(m):
21
            t = t0 + k*h
22
            K1 = f(t,y)
^{23}
            y1 = y + h*b21*K1
24
            K2 = f(t+h*b21,y1)
25
            y2 = y + h*(b31*K1 + b32*K2)
26
```

```
K3 = f(t+h*(b31 + b32), y2)
27
          y3 = y + h*(b41*K1 + b42*K2 + b43*K3)
          \#K4 = f(t+h*(b31 + b32 + b43), y3)
29
          K4 = f(t+h*(b41 + b42 + b43), y3)
30
          y4 = y + h*(b51*K1 + b52*K2 + b53*K3 + b54*K4)
31
          y = y4
32
          ya[:,k+1] = y
33
34
       return ta,ya
35
```

#### Problem 1

(a) The code to solve the problem from class is reprinted below.

```
import numpy as np
1
2
    def rk4(f,t0,y0,h,m):
3
        b21 = 1/2
5
        b31 = 0
6
        b32 = 3/4
7
        b41 = 2/9
        b42 = 0
9
        b43 = 1/3
10
        b51 = 1/6
11
        b52 = 1/3
12
        b53 = 1/3
13
        b54 = 1/6
14
15
16
        t = t0
        y = np.array(y0)
17
18
        ya = np.empty((len(y0),m+1))
19
        ya[:,0] = y
20
        ta = np.linspace(t0,t0+m*h,m+1)
^{21}
22
        for k in range(m):
23
            t = t0 + k*h
24
            K1 = f(t,y)
25
            y1 = y + h*b21*K1
26
            K2 = f(t+h*b21,y1)
27
            y2 = y + h*(b31*K1 + b32*K2)
28
            K3 = f(t+h*(b31))
                                 + b32
                                          ), y2)
29
            y3 = y + h*(b41*K1 + b42*K2 + b43*K3)
30
            \#K4 = f(t+h*(b31))
                                  + b32
                                            + b43
                                                     ), y3)
31
            K4 = f(t+h*(b41))
                                 + b42
                                           + b43
                                                    ), y3)
32
            y4 = y + h*(b51*K1 + b52*K2 + b53*K3 + b54*K4)
33
            y = y4
34
            ya[:,k+1] = y
35
36
        return ta, ya
37
38
    def f(x,Y):
39
        global p,q,phi
40
41
        y,yp = Y
        return np.array([ yp, phi(x) -p(x)*yp - q(x)*y ])
```

```
43
    def p(x):
               return 5*x**2
    def q(x):
                 return 30+50*np.sin(30*x)
45
    def phi(x): return 50*np.cosh(x)
    x0,x1 = 0,1
47
    alpha = 1
48
    beta = 10
49
    y0 = alpha
50
51
    m = 501
52
   h = (x1-x0)/m
53
54
    sa = np.array([0,50])
55
    y1a = np.empty(2)
56
57
    for i, sigma in enumerate(sa):
58
        ta, Ya = rk4(f,x0,[y0,sigma],h,m)
59
        plt.plot(ta,Ya[0,:])
60
        y1a[i] = Ya[0,-1]
61
62
    {\tt rho} = ({\tt beta} - {\tt y1a[0]}) / ({\tt y1a[1]} - {\tt y1a[0]})
    s3 = sa[0] + rho*(sa[1] - sa[0])
                                                      # Slope to hit desired target
    ta, Ya = rk4(f,x0,[y0,s3],h,m)
                                                      # Solution to BVP
```

The plot of exploratory shots and solution is included below.

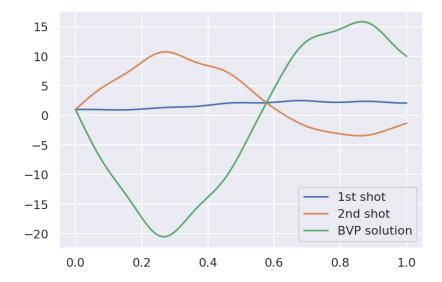


Figure 1: Solutions for various initial slopes; 1st shot: 0, 2nd shot: 50, 3rd shot as calculated.

This results in the following estimates, truncated at 8 decimal places:

$$y'(0) = -116.08319842$$
  
 $y(0.2) = -17.39286367$   
 $y(1) = 9.999999999$ 

### Problem 2

```
import numpy as np
   def rk4(f,t0,y0,h,m):
3
        b21 = 1/2
5
        b31 = 0
6
        b32 = 3/4
        b41 = 2/9
8
        b42 = 0
9
        b43 = 1/3
10
        b51 = 1/6
11
        b52 = 1/3
12
        b53 = 1/3
        b54 = 1/6
14
15
        t = t0
16
        y = np.array(y0)
17
18
        ya = np.empty((len(y0),m+1))
19
        ya[:,0] = y
20
        ta = np.linspace(t0,t0+m*h,m+1)
21
^{22}
        for k in range(m):
23
            t = t0 + k*h
24
            K1 = f(t,y)
25
            y1 = y + h*b21*K1
26
            K2 = f(t+h*b21,y1)
27
            y2 = y + h*(b31*K1 + b32*K2)
            K3 = f(t+h*(b31))
                                + b32 ), y2)
29
            y3 = y + h*(b41*K1 + b42*K2 + b43*K3)
            \#K4 = f(t+h*(b31)
                                 + b32
                                         + b43 ), y3)
31
                                        + b43 ), y3)
            K4 = f(t+h*(b41))
                                + b42
32
            y4 = y + h*(b51*K1 + b52*K2 + b53*K3 + b54*K4)
33
            y = y4
34
            ya[:,k+1] = y
35
36
        return ta,ya
37
38
   def f(t,Y):
39
        x,y,z = Y
40
        return np.array([10*y - 10*x,
41
                         28*x - y - x*z,
42
                         -8/3*z + x*y
```

```
44
    def Df(t,Y):
45
        x,y,z = Y
46
        return np.array([[-10, 10, 0],
                         [28 - z, -1, -x],
48
                         [y, x, -8/3]
49
50
    def Vp(t,Y,V):
51
        return np.matmul( Df(t,Y), V )
52
53
   V0 = np.eye(3)
54
    Y0 = np.array([-5, -8, 15])
55
    def dZ(t,Z):
57
        V = Z[:-3].reshape((3,3))
58
        Y = Z[-3:]
59
        dV = Vp(t,Y,V)
60
        dY = f(t,Y)
61
        return np.append(dV.reshape(-1,1), dY)
    Z0 = np.append(V0.reshape(-1,1), Y0)
    t0 = 0
   tf = 10.8
   m = 10**5
67
   h = (tf - t0)/m
69
   ta, Ya = rk4(dZ, t0, Z0, h, m)
   xa,ya,za = Ya[-3:,:]
```

A plot of part of the solution is included for reference below.

From this, we get

$$V(10.8) = \begin{bmatrix} 765.005 & -402.375 & -2779.392 \\ -21340.573 & 11230.615 & 77546.916 \\ -24387.797 & 12833.677 & 88618.627 \end{bmatrix},$$

with singular values  $\sigma_1=1.233\times 10^5,\ \sigma_2=3.8238\times 10^{-1},\ {\rm and}\ \sigma_3=6.6589\times 10^{-13}.$ 

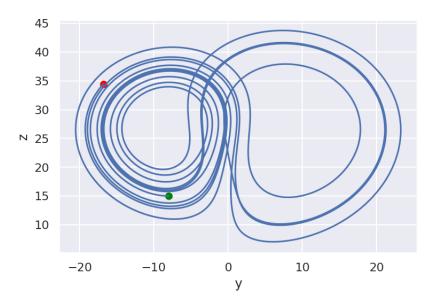


Figure 2: Solution to Lorenz equation, inital condition (green) and solution at ending time (red) indicated.

(b) In our case, these singular values can be thought of as representing the degree to which Y(10.8) changes under perturbations in Y(0). In particular,  $s_1 = 1.233 \times 10^5$  denotes that there is a direction in which we can push Y(0) that can cause approximately 5 orders of magnitude larger a change in the value of Y(10.8). This is the singular value responsible for the chaotic behavior of the system. Small changes in Y(0) along the direction associated with  $\sigma_2 = 3.8238 \times 10^{-1}$  results in a change of roughly comparable size in the value of Y(10.8), and small changes in the direction associated with  $\sigma_3 = 6.6589 \times 10^{-13}$  will have essentially no influence on the value of Y(10.8).