## Worksheet for ODE in Python

## Utils to define integration methods

```
#!/usr/bin/env python3
# -*- coding: utf-8 -*-
Created on Wed Feb 9 10:43:39 2022
Qauthor: H. El-Otmany
a This file contain all numerical method for ODE
a Input data:
    - dydt = f(t,y),
    - start value t=a,
    - end value t=b,
    - number of subdivison n
    - Initial condition vo
a Output : numerical solution y
@Algorithme d Euler (Runge Kutta d ordre un)
Euler(f , yo, t_o, t_f , N)
Input: f fonction donnees
(to; yo) point initial
t f abscisse final
N nombre de points de [t_0; t_f]
   h <--- (t_f -t_0)/N
    Ly <--- yo, Lt ← to
Pour k de 1 a N faire
    yo <---yo + h.f(to, yo)
    to <---to + h
    Ly <---Ly, yo; # stocker les solutions
    Lt <---Lt, to # stocker les abscisses
Ouptut : Ly liste des ordonnees yk, k = 0; 1; ... ; N
         Lt liste des ordonnees tk, k = 0; 1;...; N
import numpy as np
import matplotlib.pyplot as plt
from scipy.optimize import newton
from scipy.integrate import odeint
from scipy.integrate import solve ivp
#Euler method for iniline function
def ode_EulerExp(f, a, b, yo, N):
    h = (b-a) / N #step size if h is constant
    Lt = [a] #Time list
    Ly = [yo] #Initial condition of velocity dy/dt
    t = a
    v = vo
    for i in range(1,N+1):
        #if h isn't constant, we use h=t[i+1]-t[i]
        y = y + h*f(t, y)
        t = t + h
        Lt.append(t)
        Lv.append(v)
    return (Lt, Ly)
#Euler method for vector functions F(t,y1,y2,....)
#Ok for inline function
def ode_VectEulerExp(f, a, b, ic, N):
      h = (b - a) / N #step size if h is constant
      Lt = np.linspace(a, b, N)
      Ly = np.empty((N, np.size(ic)), dtype = float)
      Ly[0,:] = ic
```

```
for i in range(N-1):
         #if h isn't constant, we use h=t[i+1]-t[i]
         Ly[i+1,:] = Ly[i,:] + h*f(Lt[i],Ly[i,:])
     return (Lt, Ly)
#Runge-Kutta second order for iniline function & vector function
def ode RK2(f, a, b, ic, N):
     h = (b - a) / N
                          #step size if h is constant
     Lt = np.linspace(a, b, N)
     Ly = np.empty((N, np.size(ic)),dtype = float)
     Ly[0,:] = ic
     for i in range(N-1):
         #if h isn't constant, we use h = t[i+1]-t[i]
         k1 = h*f(Lt[i], Ly[i,:])
         k2 = h*f(Lt[i] + h/2, Ly[i,:]+k1/2)
         Ly[i+1,:] = Ly[i,:] + k2
     return (Lt, Lv)
#Runge-Kutta fourth order for iniline function & vector function
def ode_RK4(f, a, b,ic, N):
     h = (b - a) / N
                           #step size if h is constant
     Lt = np.linspace(a, b, N)
     Ly = np.empty((N, np.size(ic)),dtype = float)
     Ly[0,:] = ic
     for i in range(N-1):
          #if h isn't constant, we use h=t[i+1]-t[i]
         k1 = h*f(Lt[i], Ly[i,:])
         V1 = LV[i,:] + 1/2*k1
         k_2 = h * f(Lt[i] + h/2, y_1)
         y2 = Ly[i,:] + 1/2*k2
         k_3 = h * f(Lt[i] + h/2, y_2)
         y3 = Ly[i,:] + k3
         k4 = h * f(Lt[i] + h, y3)
         k = (k_{1+2}*k_{2+2}*k_{3}+k_{4})/6
         Ly[i+1,:] = Ly[i,:] + k
     return (Lt, Lv)
#Backward Euler or Implicit Euler for iniline function
def ode ForwardEuler(f, a, b, yo, N):
    h = (b-a) / N #step size if h is constant
    Lt = np.linspace(a,b,N)
    Ly = np.zeros(N)
    Lv[0] = v0
    for i in range(N-1):
        #if h isn't constant, we use h=t[i+1]-t[i]
       s = newton(lambda u: u - Ly[i] - f(Lt[i+1],u) * h, Ly[i+1])
        Ly[i+1] = s
    return (Lt. Lv)
#Heun method
def ode_Heun(f, a, b, ic, N):
   h = (b - a) / N
                        #step size if h is constant
    Lt = np.linspace(a, b, N)
    Ly = np.empty((N, np.size(ic)),dtype = float)
    Ly[0,:] = ic
    for i in range(N-1):
        #if h isn't constant, we use h=t[i+1]-t[i]
        k1 = f(Lt[i], Ly[i,:])
        k2 = f(Lt[i+1], Ly[i,:] + h * k1)
       Ly[i+1,:] = Ly[i,:] + h * (k1 + k2) / 2
    return (Lt, Ly)
```

```
#Computing errors
def error(method, f, a, b, ic, N, sol):
    Lt, Ly = method(f, a, b, ic, N)
    err = 0
    for i in range(N):
         err = max(err, abs(Ly[i] - sol(Lt[i])))
    return err
# Print errors
def error_printing(f, a, b, ic, N, sol):
    print("Errors for N = {} : ".format(N))
    print("Explicit Euler : {}".format(error(ode_EulerExp,f, a, b, ic, N, sol)))
    print("RK2 : {}".format(error(ode RK2,f, a, b, ic, N, sol)))
    print("RK4 : {}".format(error(ode_RK4,f, a, b, ic, N, sol)))
    print()
# Necessary rank N to obtain an uniform apporximation to eps
def necessary_rank(method, f, a, b, ic, N, sol, eps):
    if error(method, f, a, b, ic, N, sol)>eps: #error(methode, no) > epsilon:
    p = 2
    r = N
    while r - p > 1:
         q = (p + r) // 2
         if error(method, f, a, b, ic, q, sol)>eps: #error(methode, c) > epsilon:
         else:
             r = q
    return r
# def order log2():
       print('The order of a numerical approximation methods')
       for method in ['ode_VectEulerExp', 'ode_RK2', 'ode_RK4']:
           meth = eval(method)
           order = error(meth,f3,a,b,ic,N,exac3)/error(meth,f3,a,b,ic,N,exac3)
           print("order "+ method +" : {}".format(log(order,2)))
       print()
```

## testCase to define test functions

```
#!/usr/bin/env python3
# -*- coding: utf-8 -*-
Created on Tue Feb 8 21:15:05 2022
a This file contain all test cases
Qauthor: H. El-Otmany
a This file contain all functions used in TP2
import numpy as np
from math import exp, sin, pi
#Example 1: definition of function y'=-y + t
def f1(t, y):
    return - y + t
def exac1(t):
    return t - 1 + exp(-t)
#Example 2: definition of function for ODE: y" + y = t
\#Y = (y, y'), compute Y' = (y', y'') = (y', t-y)
def f2(t,y):
    [z, dz] = y
    return np.array([dz, -z +t])
def exac2(t):
    return t - sin(t)
#Example 3: definition of function y' = y + y**2
```

```
def f3(t, y):
    return y + y**2
def exac3(t):
    return exp(t)/(2-exp(t))
#Example 4: exo3-TD3, ODE: y'' + ty' + (1 - t)y = 2
\#Y = (y, y'), compute Y' = (y', y'') =
\#F(t,Y)=(y', 2-ty'+(1-t)y)
def Fexo3_TD3(t, Y):
    V = Y[0]
    dv = Y[1]
                                  # y'
                                 # y'' = 2-ty'+(1-t)y
    ddv = 2 - t*dv + (1-t)*v
    return np.array([dv , ddv])
#Example 5: exo4-TD3, ODE: y'' + ty' + (1 - t)y = 2
\#Y = (y,y',z), compute Y' = (y',y'',z') = F(t,Y)
\#F(t,Y) = (y',t+ty'-2z,(4t^2+1,y') = \exp(t)y 2z)/3)
def Fexo4_TD3(t, Y):
    V = Y[0]
    u = Y[1]
                                #y
    W = Y[2]
                                #z
                                # y'' = t+ty'-2z
    ddy = t + t*v
    dz = (4*t*t+1-u-exp(t)*v-2*w)/3 \ \#z' = (4t^2+1 \ y' \ exp(t)y \ 2z)/3
    return np.array([dy ,ddy , dz])
#Example 6: exo4-TD3, ODE: y' = sin(y(t)) + sin(t) on [o;T]
def Fexo3_TD4(t, y):
    return sin(y) + sin(t)
```

## mainProg used for Execution

```
#!/usr/bin/env python3
# -*- coding: utf-8 -*-
Created on Wed Jan 19 18:43:39 2022
@author: Hammou El-Otmany
a this file used for testing
FYI: corrinfo12
a solving with solve_ip, we can use :
  *Without tolerence
    - sol = solve_ivp(f2, [a, b], [0, 0], t_eval=t)
    - sol = solve_ivp(f2, [a, b], [o, o], method= 'RK23', t_eval=t)
    - sol = solve_ivp(f2, [a, b], [o, o], method= 'RK45', t_eval=t)
    - sol = solve_ivp(f2, [a, b], [o, o], method= 'LSODA', t_eval=t)
  *with relative and obsolute tolerences
     - sol = solve_ivp(f2, [a, b], [o, o], method= 'LSODA', t_eval=t, rtol = 1e-8, atol = 1e-8
a solving with odeint, we can use :
    - sol = odeint(f2, y0, t, p, tfirst=True)
@Computing errors and orders by using : order_log2()
aComputing necassary rank N to obtain an uniform apporximation to eps by using
    - necessary rank(method, f, a, b, ic, N,sol, eps)))
import sys
from math import *
import numpy as np
from numpy import inf
import matplotlib.pyplot as plt
from matplotlib.pylab import *
from scipy.integrate import odeint
from scipy.integrate import solve ivp
# Call all functions defined on utils and testCase
from utils import *
from testCase import *
```

```
#define variables (a,b,N) and initial conditions ic=yo
                                                                                                          plt.plot(T,Y, label = 'Theoretical solution')
a = 0
                                                                                                          plt.xlabel('t')
b = 2
                                                                                                          plt.ylabel('y and dy/dt')
ic = 0
                                                                                                      plt.title('Comparison methods-solving ODE: y"+y=t on [0; 5]')
# Question 1 - Exemple 1
                                                                                                      plt.legend()
def example1 Q1():
                                                                                                      plt.grid()
                                                                                                      ###Saving figure for reporting
    """To Compute for different value of N, change the line
    'for N in [100]' to 'for N in [10, 100,1000]' ""'
                                                                                                      #plt.savefig("/Users/mac/Desktop/IPSA2022/Module Ma322 2022/TP Ma322/PythonTex2/ex201
    for N in [10, 100, 1000]:
        plt.figure(N+1)
                                                                                              example2_Q1()
        ###You can also use T,Y = ode EulerExp(f1, a, b, ic, N)
        T,Y= ode VectEulerExp(f1, a, b, ic, N)
        #T,Y = ode_VectEulerExp(f1, a, b, ic, N)
                                                                                              #Question 1 - Exemple 3
        plt.plot(T,Y,label = 'Explicit Euler with N='+ str(N))
                                                                                              #define variables (a,b,N) and initial conditions (y(0),y'(0))
        ###Runge-Kutta 2 - vector
        T,Y= ode_RK2(f1, a, b, ic, N)
                                                                                             b = 0.5
        plt.plot(T,Y,label = 'RK2 with N='+ str(N))
                                                                                             ic = 1
        ###Runge-Kutta 2 - vector
                                                                                             def example3_Q1():
        T,Y = ode RK4(f1, a, b, ic, N)
                                                                                                  """To Compute for different value of N, change the line
       plt.plot(T,Y,label = 'RK4 with N='+ str(N))
                                                                                                  'for N in [100]' to 'for N in [10, 100,1000]' """
        if exac1:
                                                                                                 for N in [100]:
            Y = [exac1(x) for x in T]
                                                                                                      plt.figure(N+3)
            plt.plot(T,Y, label = 'Theoretical solution')
                                                                                                      ###You can also use
            plt.xlabel('t')
                                                                                                      #X,Y= ode_EulerExp(f3, a, b, ic, N)
            plt.ylabel('y and dy/dt')
                                                                                                      ###Euler explicite-vector
        plt.title('Comparison methods-solving ODE: y'=-y +t on [0; 2]')
                                                                                                     T,Y = ode_VectEulerExp(f3, a, b, ic, N)
        plt.legend()
                                                                                                      plt.plot(T,Y,label = 'Explicit Euler with N='+ str(N))
       plt.grid()
                                                                                                      ###Runge-Kutta 2 - vector
                                                                                                      T,Y = ode_RK2(f3, a, b, ic, N)
        ###Saving figure for reporting
        #plt.savefig("/Users/mac/Desktop/IPSA2022/Module Ma322 2022/TP Ma322/PythonTex2/ex1Q1.png ")plt.plot(T,Y,label = 'RK2 with N='+ str(N))
example1 Q1()
                                                                                                      ###Runge-Kutta 4 - vector
                                                                                                      T,Y = ode_RK4(f3, a, b, ic, N)
#Question 1 - Exemple 2
                                                                                                      plt.plot(T,Y,label = 'RK4 with N='+ str(N))
#define variables (a,b,N) and initial conditions (y(o),y'(o))
                                                                                                      if exac3:
a = 0
                                                                                                          Y = [exac_3(x) \text{ for } x \text{ in } T]
                                                                                                         plt.plot(T, Y, label = 'Theoretical solution')
plt.xlabel('t')
b = 5
ic = np.array([0,0])
def example2 Q1():
                                                                                                          plt.ylabel('y and dy/dt')
    """To Compute for different value of N, change the line
                                                                                                      plt.title('Comparison methods-solving ODE: dy/dt=y+y*y on [0; 1/2]')
    'for N in [100]' to 'for N in [10, 100,1000]' """
                                                                                                      plt.legend()
    for N in [10, 100, 1000]:
                                                                                                     plt.grid()
       plt.figure(N+2)
                                                                                                      ###Saving figure for reporting
        ###Explicit Euler for vector function
                                                                                                      #plt.savefig("/Users/mac/Desktop/IPSA2022/Module Ma322 2022/TP Ma322/PythonTex2/exo30
        T,Y= ode VectEulerExp(f2, a, b, ic, N)
        y = Y[:, o]
        dy = Y[:,1]
                                                                                              #Computing log order in base 2 of of a numerical approximation methods
                                                                                              #define variables (a,b,N) and initial conditions (ic=y(o)) in example 1
        ###To plot the phase portrait, plot of (y, dy)
        \#plt.plot(y, dy, label = 'Explicit Euler: phase with N='+ str(N))
                                                                                             a = 0
        ###To plot the solutions y as a function of time
                                                                                             b = 0.5
        plt.plot(T, y,label = 'Explicit Euler: solution y(t) with N='+ str(N))
                                                                                             N = 10000
        ###Using solve ip of scipv.integrate
                                                                                             ic = 1
        t = np.linspace(a,b,N) # you can use directty t eval=T
                                                                                             # print relative errors
        sol = solve_ivp(f2, [a, b], [0, 0], t_eval=t)
                                                                                             error_printing(f3, a, b, ic, N, exac3)
        ###To plot the phase portrait, plot (y,dy)
        \#plt.plot(sol.y[o], sol.y[1], label = 'Solve ip: phase with N='+ str(N))
                                                                                              #Necessary rank N to obtain an uniform apporximation to eps
                                                                                             print('Rank for Euler Expl., 1e-2: {}'.format(necessary_rank(ode_VectEulerExp, f3,a,b,ic,N, explicitly)
        ###To plot the solutions y as a function of time
                                                                                             print('Rank for RK2, 1e-2: {}'.format(necessary_rank(ode_RK2, f3, a,b,ic,N,exac3, 1e-2)))
        plt.plot(T, sol.y[o], label = 'Solve ip: solution y(t) with N='+ str(N))
                                                                                             print('Rank for RK4, 1e-2: {}'.format(necessary_rank(ode_RK4, f3, a,b,ic,N,exac3, 1e-2)))
        ###Runge-Kutta 2 - vector
        T,Y = ode RK2(f2, a, b, ic, N)
        y, dy = Y[:,0], Y[:,1]
                                                                                              . . .
        plt.plot(T,y,label = 'RK2: solution y(t) with N='+ str(N))
        ###Runge-Kutta / - vector
                                                                                             aExo3 - TD3
                                                                                             #define variables (a,b,N) and initial conditions (y(0)=0,v'(0)=0)
        T,Y = ode RK4(f2, a, b, ic, N)
       y, dy = Y[:,0], Y[:,1]
                                                                                             #I=[a;b]=[0;1]
        plt.plot(T,y,label = 'RK4: solution y(t) with N='+ str(N))
       if exac2:
                                                                                             a = 0
            Y = [exac2(x) \text{ for } x \text{ in } T]
                                                                                             b = 1
```

```
ic = np.array([0,0])
                                                                                                    t = np.linspace(a,b,N) # you can use directly t eval=T
def exo3_TD3():
                                                                                                    sol = solve_ivp(Fexo4_TD3, [a, b], [0, 0, 0], t_eval=t)
    """To Compute for different value of N, change the line
                                                                                                    ###To plot the solutions y as a function of time
   'for N in [100]' to 'for N in [10, 100,1000]' """
                                                                                                    plt.plot(T, sol.y[o], label = 'Solve ip: solution y(t) with N='+ str(N))
   for N in [100]:
                                                                                                    plt.plot(T, sol.y[2],label = 'Solve_ip: solution z(t) with N='+ str(N))
       plt.figure(N+4)
                                                                                                    ###Runge-Kutta 2 - vector
       ###Euler explicite-vector
                                                                                                    T,Y = ode_RK2(Fexo4_TD3, a, b, ic, N)
       T, Y = ode_VectEulerExp(Fexo3_TD3, a, b, ic, N)
                                                                                                    y, dy, z = Y[:,0], Y[:,1], Y[:,2]
                                                                                                    plt.plot(T,y,label = 'RK2: solution y(t) with N='+ str(N))
       y, dy = Y[:,0], Y[:,1]
       ###To plot the phase portrait, plot of (y, dy)
                                                                                                    plt.plot(T,z,label = 'RK2: solution z(t) with N='+ str(N))
       \#plt.plot(y, dy, label = 'Explicit Euler: phase with N='+ str(N))
                                                                                                     ###Runge-Kutta 4 - vector
       ###To plot the solutions y as a function of time
                                                                                                    T,Y = ode_RK4(Fexo4_TD3, a, b, ic, N)
                                                                                                    y, dy, z = Y[:,0], \bar{Y}[:,1], Y[:,2]
       plt.plot(T, y,label = 'Explicit Euler: solution y(t) with N='+ str(N))
                                                                                                    plt.plot(T,y,label = 'RK4: solution y(t) with N='+ str(N))
       ###Using solve ip of scipy.integrate
       t = np.linspace(a,b,N) # you can use directty t_eval=T
                                                                                                    plt.plot(T,z,label = 'RK4: solution z(t) with N='+ str(N))
       sol = solve_ivp(Fexo3_TD3, [a, b], [0, 0], t_eval=t)
                                                                                                    plt.title('Comparison methods-solving of DS')
       \#plt.plot(sol.y[o], sol.y[1], label = 'Solve_ip: phase with N='+ str(N))
                                                                                                    plt.legend()
       ###To plot the solutions y as a function of time
                                                                                                    plt.grid()
       plt.plot(T, sol.y[0],label = 'Solve_ip: solution y(t) with N='+ str(N))
                                                                                                    ###Saving figure for reporting
                                                                                                     #plt.savefig("/Users/mac/Desktop/IPSA2022/Module Ma322 2022/TP Ma322/PythonTex2/exo4Ti
       ###Runge-Kutta 2 - vector
       T,Y = ode_RK2(Fexo3_TD3, a, b, ic, N)
                                                                                            exo4_TD3()
       y, dy = Y[:,0], Y[:,1]
                                                                                             0.00
       plt.plot(T,y,label = 'RK2: solution y(t) with N='+ str(N))
       ###Runge-Kutta 4 - vector
                                                                                            @Exo3 - TD4
       T,Y = ode RK4(Fexo3 TD3, a, b, ic, N)
                                                                                            #define variables (a,b,N) and initial conditions (y(o)=0,y'(o)=0,y'(o)=0)
       y, dy = Y[:,0], Y[:,1]
                                                                                            #I = [0;T] = [0;1]
       plt.plot(T,y,label = 'RK4: solution y(t) with N='+ str(N))
                                                                                            #ODE: y' = sin(y(t)) + sin(t)'
       plt.title('Comparison methods-solving ODE: ddydt + tdydt + (1 - t)y = 2 on [0; 1]')"""
       plt.legend()
                                                                                            a = 0
       plt.grid()
                                                                                            b = 1
       ###Saving figure for reporting
                                                                                            ic = ⊙
        #plt.savefig("/Users/mac/Desktop/IPSA2022/Module_Ma322_2022/TP_Ma322/PythonTex2/exojdef3.exo3_TD4():
                                                                                                 """To Compute for different value of N, change the line
exo3 TD3()
                                                                                                 'for N in [100]' to 'for N in [10, 100,1000]' ""
                                                                                                for N in [100]:
                                                                                                    plt.figure(N+6)
@Exo4 - TD3
#define variables (a,b,N) and initial conditions (y(0)=0,y'(0)=0, y''(0)=0)
                                                                                                    ###Euler explicite-vector
                                                                                                    T, Y = ode VectEulerExp(Fexo3 TD4, a, b, ic, N)
\#I = [0;T] = [0;1]
#eq1: ddydt - tdydt+2z=t;
                                                                                                    ###To plot the solutions y as a function of time
\#eq2: dydt + e^ty + 3dzdt2z = 4t^2 + 1
                                                                                                    plt.plot(T, Y, label = 'Explicit Euler: solution y(t) with N='+ str(N))
                                                                                                    ###Using solve_ip of scipy.integrate
a = 0
                                                                                                    t = np.linspace(a,b,N) # you can use directty t_eval=T
b = 1
                                                                                                    sol = solve_ivp(Fexo3_TD4, [a, b],[o], t_eval=T)
ic = np.array([0,0,0])
                                                                                                    ###To plot the solutions y as a function of time
def exo4_TD3():
                                                                                                    plt.plot(t, sol.y[o],label = 'Solve_ip: solution y(t) with N='+ str(N))
    """To Compute for different value of N, change the line
                                                                                                    ###Runge-Kutta 2 - vector
   'for N in [100]' to 'for N in [10, 100, 1000]' """
                                                                                                    T,Y = ode RK2(Fexo3 TD4, a, b, ic, N)
   for N in [100]:
                                                                                                    plt.plot(T,Y,label = 'RK2: solution y(t) with N='+ str(N))
       plt.figure(N+5)
                                                                                                    ###Runge-Kutta 4 - vector
       ###Euler explicite-vector
                                                                                                    T,Y = ode_RK4(Fexo3_TD4, a, b, ic, N)
       T, Y = ode_VectEulerExp(Fexo4_TD3, a, b, ic, N)
                                                                                                    plt.plot(T,Y,label = 'RK4: solution y(t) with N='+ str(N))
       y, dy, z = Y[:,0], Y[:,1], Y[:,2]
                                                                                                    plt.title('Comparison methods-solving of DS')
       ###To plot the phase portrait, plot of (y, dy)
                                                                                                    plt.legend()
       #plt.plot(y, dy,label = 'Explicit Euler: phase with N='+ str(N))
                                                                                                    plt.grid()
       ###To plot the solutions y as a function of time
                                                                                                    ###Saving figure for reporting
       plt.plot(T, y,label = 'Explicit Euler: solution y(t) with N='+ str(N))
                                                                                                     #plt.savefig("/Users/mac/Desktop/IPSA2022/Module_Ma322_2022/TP_Ma322/PythonTex2/exo3Ti
       plt.plot(T, z,label = 'Explicit Euler: solution z(t) with N='+ str(N))
                                                                                            exo3 TD4()
       ###Using solve_ip of scipy.integrate
```