

Aula 16

Melhorando a solução de equações diferenciais com aproximações de 2ª e 4ª ordem

De volta à lei de Newton do arrefecimento

$$\frac{dT}{dt} = -\alpha(T - T_{ar})$$

Solução exata:

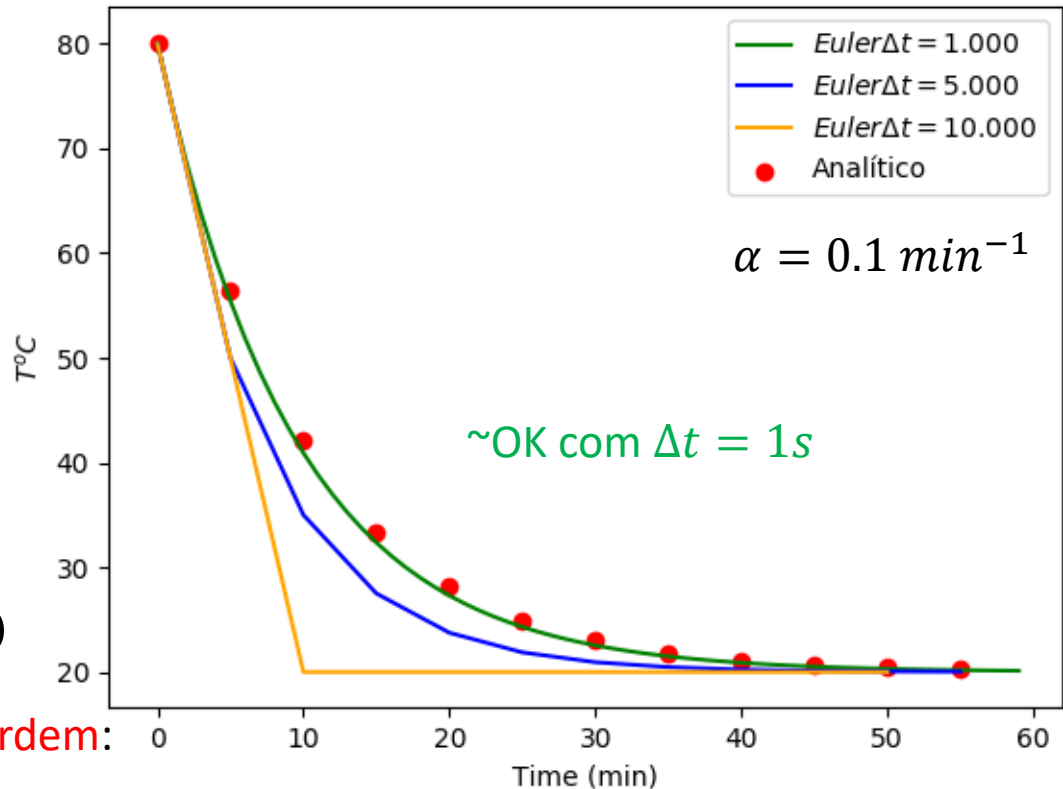
$$T = (T_0 - T_{ar})e^{-\alpha t}$$

Método de Euler:

$$T(t + \Delta t) = T(t) - \alpha\Delta t(T(t) - T_{ar})$$

Trata-se de uma aproximação de **1ª ordem**:

$$\left(\frac{dT}{dt}\right)_{t=t} \approx \frac{T(t + \Delta t) - T(t)}{\Delta t} + E(\Delta t)$$



Diferenças centradas (2ª ordem)

$$\left(\frac{dy}{dt}\right)_{t=a} \approx \frac{y(a + \Delta t) - y(a - \Delta t)}{2\Delta t} + E(\Delta t^2)$$

Que se pode escrever:

$$\left(\frac{dy}{dt}\right)_{t=a+\Delta t/2} \approx \frac{y(a + \Delta t/2) - y(a - \Delta t/2)}{\Delta t} + E(\Delta t^2)$$

ou

$$T(t + \Delta t) = T(t) - \alpha \Delta t \left(T\left(t + \frac{\Delta t}{2}\right) - T_{ar} \right)$$
$$T(t + \Delta t) = T(t) - \alpha \Delta t \left(\frac{T(t + \Delta t) + T(t)}{2} - T_{ar} \right)$$

$$T(t + \Delta t) \left(1 + \frac{\alpha \Delta t}{2} \right) = T(t) - \alpha \Delta t \left(\frac{T(t)}{2} - T_{ar} \right)$$

ou

$$T(t + \Delta t) = \left[T(t) - \alpha \Delta t \left(\frac{T(t)}{2} - T_{ar} \right) \right] \left(1 + \frac{\alpha \Delta t}{2} \right)^{-1}$$

Em vez de (Euler):

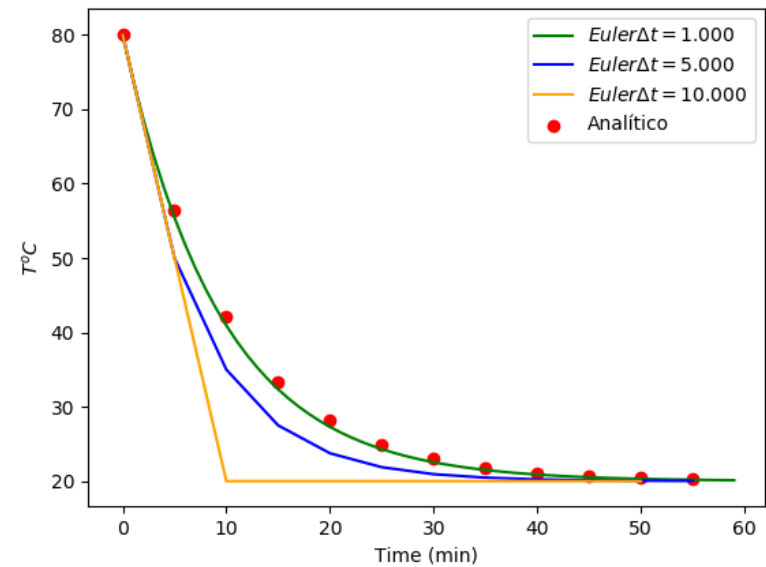
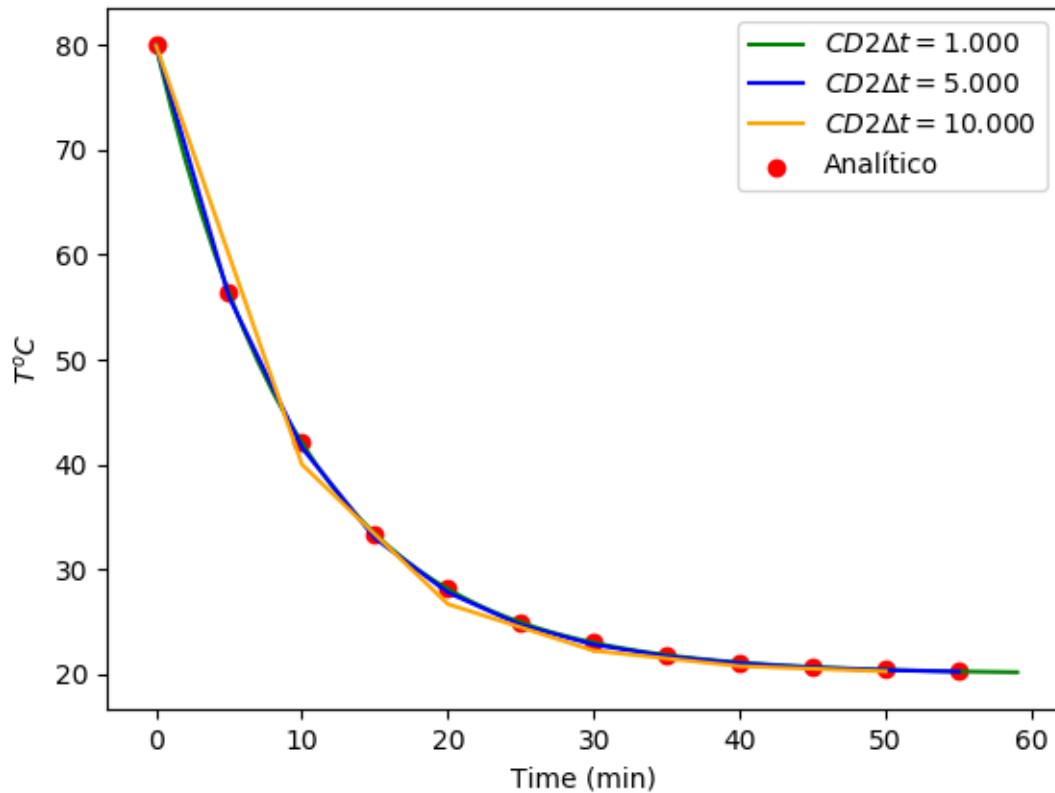
$$T(t + \Delta t) = T(t) - \alpha \Delta t (T(t) - T_{ar})$$

```

kc=0
for dt in dts:
    tempo=np.arange(0.,timemax,dt)
    n=len(tempo)
    T=np.zeros(tempo.shape)
    T[0]=Tinicial
    for k in range(1,n):
        T[k]=(T[k-1]-alpha*(0.5*T[k-1]-Tar)*dt)\
            /(1+0.5*alpha*dt)
    plt.plot(tempo,T,color=cores[kc],\
             label=r'$CD2 \Delta t=%6.3f$'%(dt))
    plt.xlabel('Time (min)')
    plt.ylabel(r'$T^{o} C$')
    kc=kc+1

```

Dif Centrada vs Euler



Perfeito com $\Delta t = 5s$

Aproximação de 4ª ordem de Runge-Kutta

$$\frac{\partial \phi}{\partial t} = f(\phi, t), \Delta t = t^{n+1} - t^n$$

$$k_1 = \Delta t f(\phi^n, t^n)$$

$$k_2 = \Delta t f\left(\phi^n + \frac{k_1}{2}, t^n + \frac{\Delta t}{2}\right)$$

$$k_3 = \Delta t f\left(\phi^n + \frac{k_2}{2}, t^n + \frac{\Delta t}{2}\right)$$

$$k_4 = \Delta t f(\phi^n + k_3, t^n + \Delta t)$$

$$\phi^{n+1} = \phi^n + \frac{k_1}{6} + \frac{k_2}{3} + \frac{k_3}{3} + \frac{k_4}{6}$$

Runge-Kutta

```
def RK4x(x, dxdt, dt) :  
    k1=dxdt(x) *dt  
    k2=dxdt(x+k1/2) *dt  
    k3=dxdt(x+k2/2.) *dt  
    k4=dxdt(x+k3) *dt  
    xP=x+1./6.*(k1+2*k2+2*k3+k4)  
    return xP  
  
def dTdt(T) :  
    Tar=20.  
    alpha=0.1  
    c=-alpha*(T-Tar)  
    return c
```

$$\frac{\partial \phi}{\partial t} = f(\phi, t)$$

Não depende de t

kc=0

for dt in dts:

...

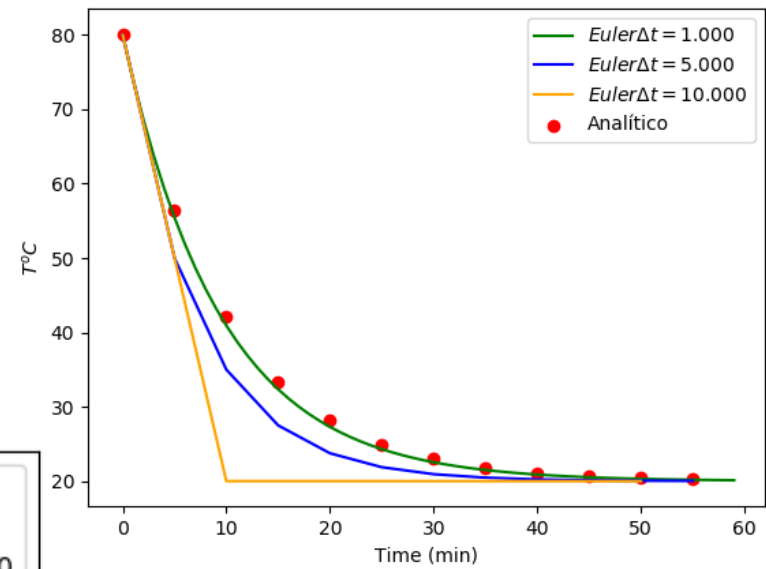
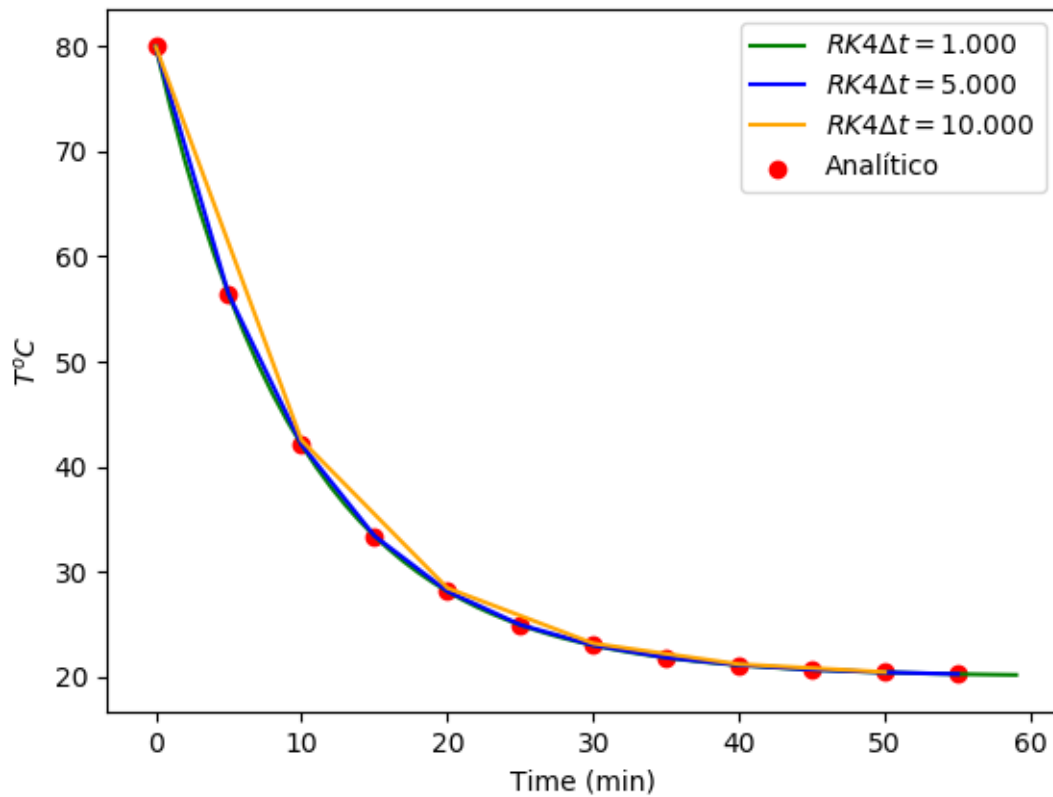
T[0]=Tinicial

for k in range(1,n):

 T[k]=RK4x(T[k-1], dTdt, dt)

...

RK4 vs Euler



Perfeito com $\Delta t = 10s$

Equações mais complicadas

Vamos voltar ao pêndulo gravítico:

$$\frac{dv}{dt} = L \frac{d\omega}{dt} = L \frac{d^2\theta}{dt^2} = -g \sin \theta$$

São duas equações **acopladas** de 1ª ordem:

$$\frac{d\omega}{dt} = -\frac{g}{L} \sin \theta$$

$$\frac{d\theta}{dt} = \omega$$

Pêndulo gravítico

$$\frac{d\omega}{dt} = -\frac{g}{L} \sin \theta$$

$$\frac{d\theta}{dt} = \omega$$

O **acoplamento** resulta do facto de a taxa de variação de cada variável depender da outra.

Runge-Kutta⁴ $\frac{d\omega}{dt} = -\frac{g}{L} \sin \theta ; \frac{d\theta}{dt} = \omega$

$$\frac{\partial \omega}{\partial t} = f(\theta)$$

$$\frac{\partial \theta}{\partial t} = f(\omega)$$

$$m_1 = \Delta t f(\theta^n)$$

$$k_1 = \Delta t f(\omega^n)$$

$$m_2 = \Delta t f\left(\theta^n + \frac{k_1}{2}\right)$$

$$k_2 = \Delta t f\left(\omega^n + \frac{m_1}{2}\right)$$

$$m_3 = \Delta t f\left(\theta^n + \frac{k_2}{2}\right)$$

$$k_3 = \Delta t f\left(\omega^n + \frac{m_2}{2}\right)$$

$$m_4 = \Delta t f(\theta^n + k_3)$$

$$k_4 = \Delta t f(\omega^n + m_3)$$

$$\theta^{n+1} = \theta^n + \frac{k_1}{6} + \frac{k_2}{3} + \frac{k_3}{3} + \frac{k_4}{6} \quad \omega^{n+1} = \omega^n + \frac{k_1}{6} + \frac{k_2}{3} + \frac{k_3}{3} + \frac{k_4}{6}$$

RK4 para o pêndulo gravítico

```
def domegadt(theta):
```

```
    g=9.8065;L=1.
```

```
    dfdt=-g/L*np.sin(theta)
```

```
    return dfdt
```

$$\frac{d\omega}{dt} = -\frac{g}{L} \sin \theta$$

```
def dthetadt(omega):
```

```
    dfdt=omega
```

```
    return dfdt
```

$$\frac{d\theta}{dt} = \omega$$

$$\frac{\partial x}{\partial t} = f(u) \quad \begin{array}{l} x \equiv \theta \\ u \equiv \omega \end{array}$$

```
def rk4S(x,u,dxdt,dudt,dt):
```

```
    k1=dxdt(u)*dt
```

```
    m1=dudt(x)*dt
```

```
    k2=dxdt(u+m1/2)*dt
```

```
    m2=dudt(x+k1/2)*dt
```

```
    k3=dxdt(u+m2/2.)*dt
```

```
    m3=dudt(x+k2/2.)*dt
```

```
    k4=dxdt(u+m3)*dt
```

```
    m4=dudt(x+k3)*dt
```

```
    xP=x+1./6.*(k1+2*k2+2*k3+k4)
```

```
    uP=u+1./6.*(m1+2*m2+2*m3+m4)
```

```
    return xP,uP
```

$$k_1 = \Delta t f(u^n, t^n)$$

$$k_2 = \Delta t f\left(u^n + \frac{m_1}{2}, t^n + \frac{\Delta t}{2}\right)$$

$$k_3 = \Delta t f\left(u^n + \frac{m_2}{2}, t^n + \frac{\Delta t}{2}\right)$$

$$k_4 = \Delta t f(u^n + m_3, t^n + \Delta t)$$

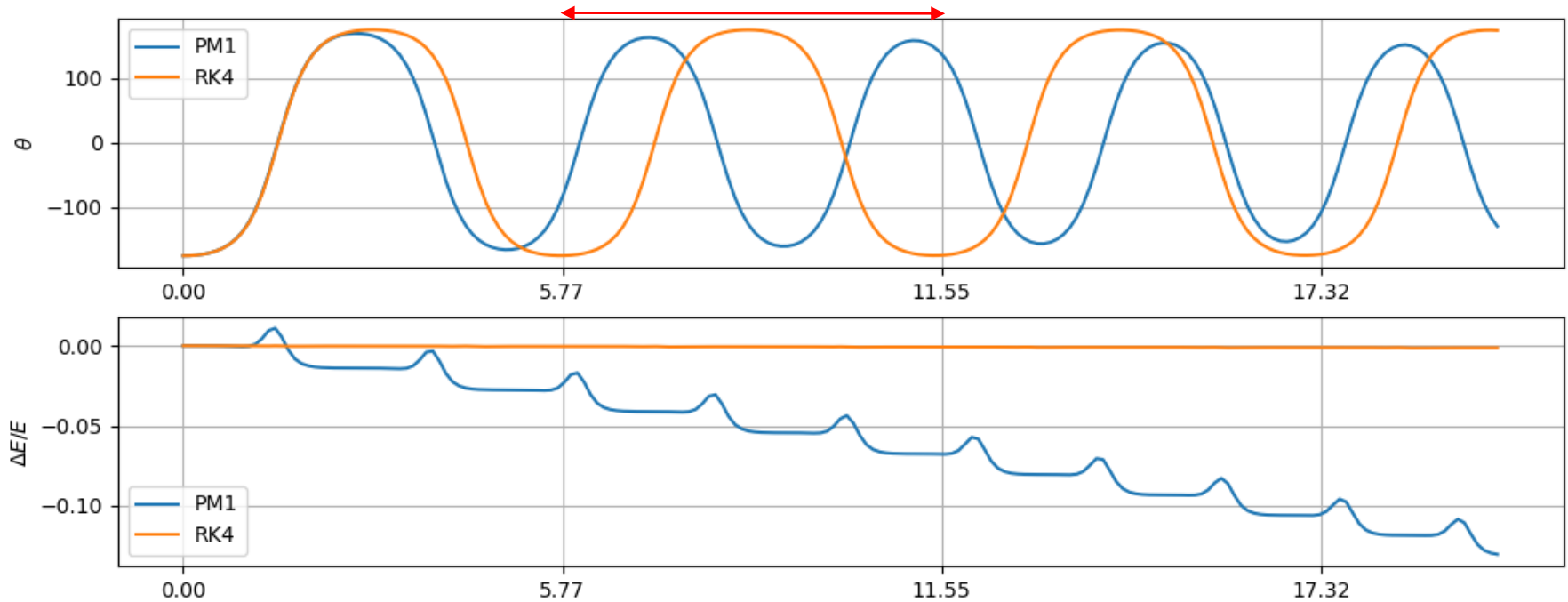
$$x^{n+1} = x^n + \frac{k_1}{6} + \frac{k_2}{3} + \frac{k_3}{3} + \frac{k_4}{6}$$

Pêndulo

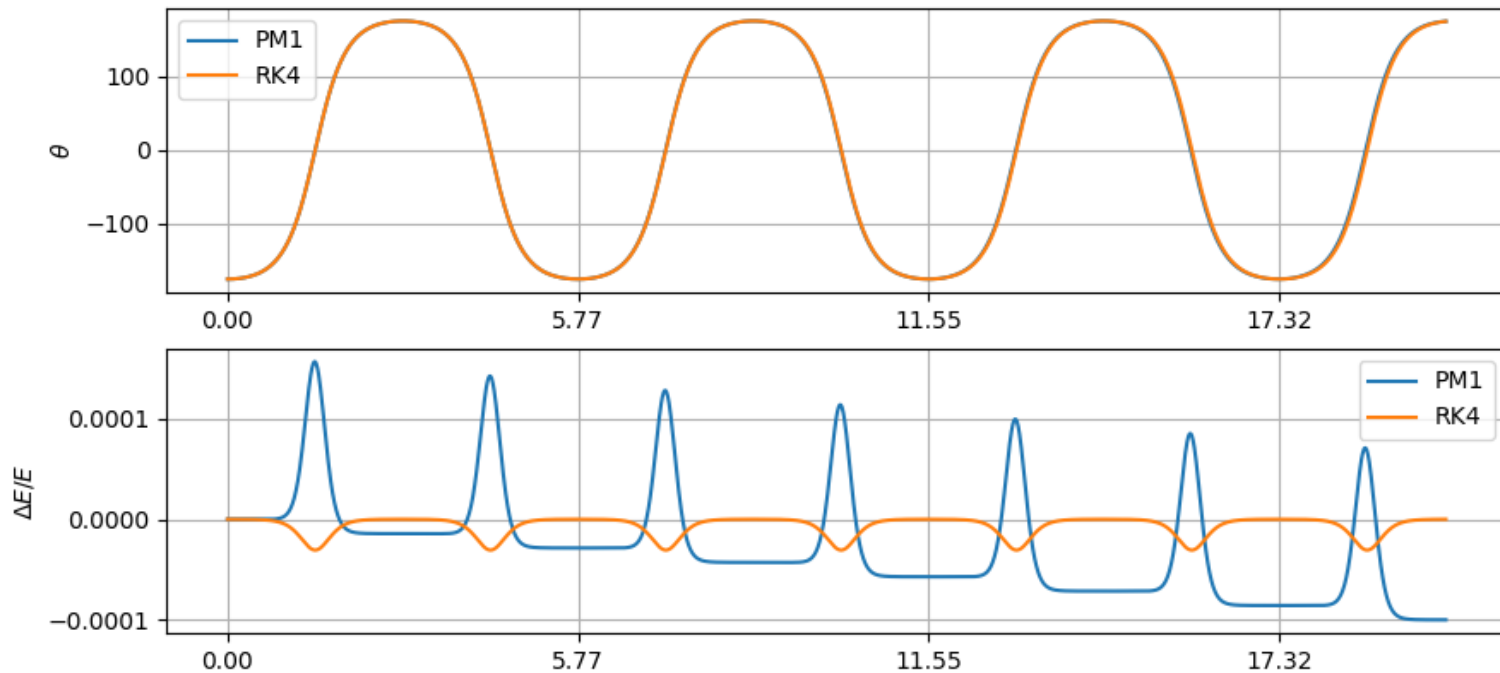
```
dt=0.1 #passo de tempo
theta0=-175./180.*np.pi #amplitude em radianos
omega0=0. #velocidade angular inicial
T=2*np.pi*np.sqrt(L/g)
t=np.arange(0.,10*T,dt) #vetor de tempos (10T)
n=len(t)
theta=np.zeros(t.shape); omega=np.copy(theta)
theta[0]=theta0; omega[0]=omega0
for kt in range(1,n):
    omega[kt],theta[kt]=\
    rk4S(omega[kt-1],theta[kt-1],\
    domegadot,dthetadot,dt)
```

$$\Delta t = 0.1s$$

Período teórico



$$\Delta t = 0.01s$$



Como esperado converge quando $\Delta t \rightarrow 0$, mas RK4 mantém-se melhor (energia)