

Mini-course on Geometric Numerical Integration: Solutions to the Assignments

David Cohen
Umeå University and University of Innsbruck
✉ david.cohen@umu.se

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This document gives propositions for the solutions to the assignments.

1 Background: Ordinary differential equations and first numerical schemes

Task 1: The code for this task could read

```
%% Code for task 1
clear all
k=0.1+10^(-3)*77; % growth parameter
p0=10; % initial number of parameter
5 tExact=[0:0.05:20]; % time interval
pExact=p0.*exp(k.*tExact); % exact solution

% plot of the exact solution
figure(), plot(tExact,pExact) % plot solution wrt time
10 xlabel('Time','FontSize',15) % x-axis
legend('Exact solution') % legend
title('Parasites in my body') % title
%print -djpeg90 task1a.jpg % can be used to save of the plot

15 % Euler's method for h=0.5
h=0.5;
t0=0;tend=20;
N=tend/h;% compute the number of steps
tE=t0;
20 pE=p0;
for n=1:N
    % compute one step of the method
    tE=tE+h;
    pE=pE+h*k*pE;
25 tEuler1(n)=tE;
    pEuler1(n)=pE; % approx at pExact(t_n) for step size h
end
```

```

% Euler's method for h=0.25
30 h=0.25;
    t0=0;tend=20;
    N=tend/h;% compute the number of steps
    tE=t0;
    pE=p0;
35 for n=1:N
    % compute one step of the method
    tE=tE+h;
    pE=pE+h*k*pE;
    tEuler2(n)=tE;
40 pEuler2(n)=pE; % approx at pExact(t_n) for step size h
end

% Euler's method for h=0.1
h=0.1;
45 t0=0;tend=20;
    N=tend/h;% compute the number of steps
    tE=t0;
    pE=p0;
    for n=1:N
50 % compute one step of the method
    tE=tE+h;
    pE=pE+h*k*pE;
    tEuler3(n)=tE;
    pEuler3(n)=pE; % approx at pExact(t_n) for step size h
55 end
tExact=[t0:h:tend]; % time interval
pExact=p0.*exp(k.*tExact); % exact solution
figure(),plot(tExact,pExact,tEuler1,pEuler1,'.-', ...
              tEuler2,pEuler2,'.-',tEuler3,pEuler3,'.-')
60 xlabel('Time','FontSize',15) % x-axi
legend('Exact solution','Euler with h=0.5','Euler with h=0.25', ...
      'Euler with h=0.1','Location','NorthWest') % legend

```

Task 2: Heun's method can be rewritten as

$$\begin{aligned}
 k_1 &= f(x_0, y_0) \\
 k_2 &= f(x_0 + h, y_0 + hk_1) \\
 y_1 &= y_0 + \frac{h}{2}(k_1 + k_2).
 \end{aligned}$$

This is a Runge-Kutta method with $s = 2$ and having the Butcher tableau

$$\begin{array}{c|cc}
 0 & & \\
 1 & 1 & \\
 \hline
 & 1/2 & 1/2
 \end{array}$$

A Taylor expansion in x followed by one in y gives

$$\begin{aligned} f(x_0 + h, y_0 + hf(x_0, y_0)) &= f(x_0, y_0 + hf(x_0, y_0)) + \frac{\partial f}{\partial x}(x_0, y_0 + hf(x_0, y_0))h + \mathcal{O}(h^2) \\ &= f(x_0, y_0) + h \frac{\partial f}{\partial y}(x_0, y_0) f(x_0, y_0) + h \frac{\partial f}{\partial x}(x_0, y_0) + \mathcal{O}(h^2) \\ &= y'(x_0) + h \left(\frac{\partial f}{\partial x}(x_0, y_0) + \frac{\partial f}{\partial y}(x_0, y_0) f(x_0, y_0) \right) + \mathcal{O}(h^2) \\ &= y'(x_0) + hy''(x_0) + \mathcal{O}(h^2). \end{aligned}$$

Now it follows that

$$\begin{aligned} y_1 - y(x_0 + h) &= y_0 + \frac{h}{2} f(x_0, y_0) + \frac{h}{2} f(x_0 + h, y_0 + hf(x_0, y_0)) - y_0 - y'(x_0)h - \frac{h^2}{2} y''(x_0) + \mathcal{O}(h^3) \\ &= y_0 + \frac{h}{2} f(x_0, y_0) + \frac{h}{2} (y'_0 + hy''_0 + \mathcal{O}(h^2)) - y_0 - y'_0 h - y''_0 \frac{h^2}{2} + \mathcal{O}(h^3) = \mathcal{O}(h^3). \end{aligned}$$

This implies that $p = 2$ and thus the order of convergence of Heun's method is 2.

2 Geometric Numerical Integration: A taste

Task 1: We have

$$\frac{du}{dv} = \frac{u(v-2)}{v(1-u)}$$

which is equivalent to

$$\frac{1-u}{u} du = \frac{v-2}{v} dv$$

and after integration to

$$\ln(u) - u = v - 2 \ln(v) + \text{Const.}$$

or, after rearrangement of the terms,

$$I(u, v) := \ln(u) - u + 2 \ln(v) - v = \text{Const.}$$

Task 2: The code could look like this

```

clear all;
% Initial values:
e=0.6;
q1(1)=1-e;
q2(1)=0;
p1(1)=0;
p2(1)=sqrt((1+e)/(1-e));
% Time steps
h=2*10^-3;
t=0:h:40*2*pi;
N=round(40*2*pi/h)-1;

% Explicit Euler
for n = 1:N
    p1(n+1)=p1(n)-h*q1(n)/(q1(n)^2+q2(n)^2)^(3/2);
    p2(n+1)=p2(n)-h*q2(n)/(q1(n)^2+q2(n)^2)^(3/2);

```

```

    q1(n+1)=q1(n)+h*p1(n);
    q2(n+1)=q2(n)+h*p2(n);
end
20 % Energy:
H=1/2*(p1.^2+p2.^2)-1./sqrt(q1.^2+q2.^2);
% Angular momentum:
L=q1.*p2-q2.*p1;

25 % Plots
subplot(3,3,1)
plot(q1,q2)
xlabel('q_1(t)');
ylabel('q_2(t)', 'rotation', 0);
30 title('Explicit Euler');

subplot(3,3,2)
plot(t,H)
axis([0 20*2*pi -0.6 0.6]);
35 xlabel('t');
ylabel('H', 'rotation', 0);
title('Explicit Euler');

subplot(3,3,3)
40 plot(t,L)
axis([0 20*2*pi 0.75 1]);
xlabel('t');
ylabel('L', 'rotation', 0);
title('Explicit Euler');

45 % Midpoint rule
for n=1:N
    p1_it=p1(n);
    p2_it=p2(n);
50    q1_it=q1(n);
    q2_it=q2(n);
    p1(n+1)=p1(n)-h*((q1(n)+q1_it)/2)/ ...
        (((q1(n)+q1_it)/2)^2+((q2(n)+q2_it)/2)^2)^(3/2);
    p2(n+1)=p2(n)-h*((q2(n)+q2_it)/2)/ ...
55    (((q1(n)+q1_it)/2)^2+((q2(n)+q2_it)/2)^2)^(3/2);
    q1(n+1)=q1(n)+h*(p1(n)+p1_it)/2;
    q2(n+1)=q2(n)+h*(p2(n)+p2_it)/2;

    while norm([p1(n+1);p2(n+1);q1(n+1);q2(n+1)]- ...
60    [p1_it;p2_it;q1_it;q2_it])>10^-6
        p1_it=p1(n+1);
        p2_it=p2(n+1);
        q1_it=q1(n+1);
        q2_it=q2(n+1);
65    p1(n+1)=p1(n)-h*((q1(n)+q1_it)/2)/ ...
        (((q1(n)+q1_it)/2)^2+((q2(n)+q2_it)/2)^2)^(3/2);
    p2(n+1)=p2(n)-h*((q2(n)+q2_it)/2)/ ...
        (((q1(n)+q1_it)/2)^2+((q2(n)+q2_it)/2)^2)^(3/2);
    q1(n+1)=q1(n)+h*(p1(n)+p1_it)/2;
70    q2(n+1)=q2(n)+h*(p2(n)+p2_it)/2;

```

```
    end
end
% Energy+momentum
H=1/2*(p1.^2+p2.^2)-1./sqrt(q1.^2+q2.^2);
75 L=q1.*p2-q2.*p1;
% Plots
subplot(3,3,4)
plot(q1,q2)
xlabel('q_1(t)');
80 ylabel('q_2(t)', 'rotation', 0);
title('Midpoint');

subplot(3,3,5)
plot(t,H)
85 axis([0 20*2*pi -0.6 0.6]);
xlabel('t');
ylabel('H', 'rotation', 0);
title('Midpoint');

90 subplot(3,3,6)
plot(t,L)
axis([0 20*2*pi 0.75 1]);
xlabel('t');
95 ylabel('L', 'rotation', 0);
title('Midpoint');

% Symplectic Euler

for n=1:N
100 p1(n+1)=p1(n)-h*q1(n)/(q1(n)^2+q2(n)^2)^(3/2);
p2(n+1)=p2(n)-h*q2(n)/(q1(n)^2+q2(n)^2)^(3/2);
q1(n+1)=q1(n)+h*p1(n+1);
q2(n+1)=q2(n)+h*p2(n+1);
end
105 % Energy+momentum
H=1/2*(p1.^2+p2.^2)-1./sqrt(q1.^2+q2.^2);
L=q1.*p2-q2.*p1;
% Plots
110 subplot(3,3,7)
plot(q1,q2)
xlabel('q_1(t)');
ylabel('q_2(t)', 'rotation', 0);
title('Symplectic Euler');

115 subplot(3,3,8)
plot(t,H)
axis([0 20*2*pi -0.6 0.6]);
xlabel('t');
ylabel('H', 'rotation', 0);
120 title('Symplectic Euler');

subplot(3,3,9)
plot(t,L)
axis([0 20*2*pi 0.75 1]);
```

```

125 xlabel('t');
    ylabel('L', 'rotation', 0);
    title('Symplectic Euler');

```

3 Numerical integration of Hamiltonian systems

Task 1: By the fundamental Theorem of calculus, an application of the chain rule, the definition of the AVF scheme, and the skew-symmetry of J^{-1} , we have

$$\begin{aligned}
 H(y_{n+1}) - H(y_n) &= \int_0^1 \frac{d}{d\theta} \left(H(\theta y_{n+1} + (1-\theta)y_n) \right) d\theta \\
 &= \int_0^1 \nabla H(\theta y_{n+1} + (1-\theta)y_n)^T (y_{n+1} - y_n) d\theta \\
 &= \left(\int_0^1 \nabla H(\theta y_{n+1} + (1-\theta)y_n) d\theta \right)^T h J^{-1} \\
 &\quad \left(\int_0^1 \nabla H(\theta y_{n+1} + (1-\theta)y_n) d\theta \right) = 0.
 \end{aligned}$$

This implies $H(y_{n+1}) = H(y_n)$ for all n .

Task 2: The code could look like

```

clear all

Qzero=1.;
Pzero=0.2;

5 t_0=0;
  t_end=50;

h=2^-6;
10 Nt=floor((t_end-t_0)./h);

y0=[Pzero; Qzero];y1t=y0;

for t=1:Nt
15  %% AVF
  err=1;
  while err > 10.^(-6)
    yint1=@(x)( -sin(y0(2)+x.*(y1t(2)-y0(2))) );
    yint2=@(x)( y0(1)+x.*(y1t(1)-y0(1))) );
20    y1=y0+[quadr(yint1,0,1)*h;quadr(yint2,0,1)*h];
    err=norm(y1-y1t,2);y1t=y1;
  end
  y0=y1;y1t=y0;
  Qep(t)=y1(2);Pep(t)=y1(1);
25  t*h
end

% plot of energy and position Q VS time
kk=1;
30 ttime=[0:h:t_end];

```

```

time=ttime(1:kk:end);
EnergEP=Pep(1:kk:end).^2./2-cos(Qep(1:kk:end));
figure ,
plot(time,[Pzero.^2./2-cos(Qzero) EnergEP], 'k')
35 title('Energy','FontSize',20)
xlabel('Time')
axis([0 t_end -1 1])
figure ,
kk=1;
40 ttime=[0:h:t_end];
time=ttime(1:kk:end);
set(0,'DefaultLineMarkerSize',6)
plot(time,[Qzero Qep(1:kk:end)], 'k')
title('Positions','FontSize',20)
45 xlabel('Time')
axis([0 t_end -2 2])

```

4 Highly oscillatory problems

Task 1: This is done using the definition of symplecticity $\Phi'_h(Y)J\Phi'_h(Y) = J$ and the definition 4.1 of the trigonometric methods $Y_{n+1} = \Phi_h(Y_n)$, see lecture notes.

Task 2: (a) The solution of the linear system

$$\begin{pmatrix} x'(t) \\ x''(t) \end{pmatrix} = \underbrace{\begin{pmatrix} 0 & t \\ -t\omega^2 & 0 \end{pmatrix}}_{tA} \begin{pmatrix} x(t) \\ x'(t) \end{pmatrix}$$

is given by

$$\begin{pmatrix} x(t) \\ x'(t) \end{pmatrix} = \exp(tA) \begin{pmatrix} x_0 \\ x'_0 \end{pmatrix}.$$

Since the exponential function is analytic, we compute the series expansion thereof. Computing

$$\begin{aligned} A^2 &= \begin{pmatrix} -(t\omega)^2 & 0 \\ 0 & -(t\omega)^2 \end{pmatrix} \\ A^{2k} &= \begin{pmatrix} (-1)^k (t\omega)^{2k} & 0 \\ 0 & (-1)^k (t\omega)^{2k} \end{pmatrix} \\ A^{2k+1} &= \begin{pmatrix} \frac{1}{\omega} (-1)^k (t\omega)^{2k+1} & 0 \\ 0 & -\omega (-1)^k (t\omega)^{2k+1} \end{pmatrix} \end{aligned}$$

one thus obtains

$$\begin{aligned} \exp(tA) &= \sum_{k \geq 0} \frac{1}{k!} A^k \\ &= \sum_{k \geq 0} \frac{1}{(2k)!} \begin{pmatrix} (-1)^k (t\omega)^{2k} & 0 \\ 0 & (-1)^k (t\omega)^{2k} \end{pmatrix} + \sum_{k \geq 0} \frac{1}{(2k+1)!} \begin{pmatrix} \frac{1}{\omega} (-1)^k (t\omega)^{2k+1} & 0 \\ 0 & -\omega (-1)^k (t\omega)^{2k+1} \end{pmatrix} \\ &= \begin{pmatrix} \cos(t\omega) & t \operatorname{sinc}(t\omega) \\ -\omega \operatorname{sinc}(t\omega) & \cos(t\omega) \end{pmatrix}. \end{aligned}$$

Since all the appearing trigonometric functions are also analytic, this matrix exists and this yields the desired result.

(b) Midpoint rule: Applying the midpoint rule to the above differential equation gives

$$\begin{aligned} \begin{pmatrix} x_{n+1} \\ x'_{n+1} \end{pmatrix} &= \begin{pmatrix} x_n \\ x'_n \end{pmatrix} + hA \begin{pmatrix} \frac{1}{2}(x_{n+1} + x_n) \\ \frac{1}{2}(x'_{n+1} + x'_n) \end{pmatrix} && \Leftrightarrow \\ (I - \frac{h}{2}A) \begin{pmatrix} x_{n+1} \\ x'_{n+1} \end{pmatrix} &= (I + \frac{h}{2}A) \begin{pmatrix} x_n \\ x'_n \end{pmatrix} && \Leftrightarrow \\ \begin{pmatrix} \omega x_{n+1} \\ x'_{n+1} \end{pmatrix} &= \begin{pmatrix} \omega & 0 \\ 0 & 1 \end{pmatrix} (I - \frac{h}{2}A)^{-1} (I + \frac{h}{2}A) \begin{pmatrix} \frac{1}{\omega} & 0 \\ 0 & 1 \end{pmatrix} \begin{pmatrix} \omega x_n \\ x'_n \end{pmatrix}. \end{aligned}$$

Now we compute the matrix $M(h\omega)$:

$$\begin{aligned} (I - \frac{h}{2}A)^{-1} &= \begin{pmatrix} 1 & -\frac{h}{2} \\ \frac{h}{2}\omega^2 & 1 \end{pmatrix}^{-1} = \frac{1}{1 + (\frac{h\omega}{2})^2} \begin{pmatrix} 1 & \frac{h}{2} \\ -\frac{h}{2}\omega^2 & 1 \end{pmatrix} \\ (I - \frac{h}{2}A)^{-1} (I + \frac{h}{2}A) &= \frac{1}{1 + (\frac{h\omega}{2})^2} \begin{pmatrix} 1 - (\frac{h\omega}{2})^2 & h \\ -h\omega^2 & 1 - (\frac{h\omega}{2})^2 \end{pmatrix} \\ M(h\omega) &= \frac{1}{1 + (\frac{h\omega}{2})^2} \begin{pmatrix} 1 - (\frac{h\omega}{2})^2 & h\omega \\ -h\omega & 1 - (\frac{h\omega}{2})^2 \end{pmatrix}. \end{aligned}$$

Finally, we compute the eigenvalues of the matrix $M(h\omega)$. To do this, we set $z = h\omega$ and first consider the matrix without the prefactor.

$$\begin{aligned} (1 - (\frac{z}{2})^2 - \lambda)^2 + z^2 &= 0 && \Rightarrow \\ (1 - (\frac{z}{2})^2)^2 - 2(1 - (\frac{z}{2})^2)\lambda + \lambda^2 + z^2 &= 0 && \Leftrightarrow \\ (1 + (\frac{z}{2})^2)^2 - 2(1 - (\frac{z}{2})^2)\lambda + \lambda^2 &= 0 && \Rightarrow \\ \lambda_{12} &= 1 - (\frac{z}{2})^2 \pm \sqrt{(1 - (\frac{z}{2})^2)^2 - (1 + (\frac{z}{2})^2)^2} \\ &= 1 \pm iz - (\frac{z}{2})^2 && \Rightarrow \\ |\lambda_{12}|^2 &= (1 - (\frac{z}{2})^2)^2 + z^2 = (1 + (\frac{z}{2})^2)^2. \end{aligned}$$

Dividing by the prefactor we obtain the eigenvalues of the matrix $M(h\omega)$, which are of modulus 1 independently of $z = h\omega$. Therefore, the midpoint rule is stable for all time step sizes.

(c) Störmer-Verlet method: One first applies the numerical method to the above second-order

differential equation. Using again the notation $z = h\omega$, one gets

$$\begin{aligned} x'_{n+1/2} &= x'_n - \frac{z}{2}\omega x_n \\ x_{n+1} &= x_n + h\left(x'_n - \frac{z}{2}\omega x_n\right) = \left(1 - \frac{z^2}{2}\right)x_n + hx'_n \\ x'_{n+1} &= x'_n - \frac{z}{2}\omega x_n - \frac{z}{2}\omega\left(\left(1 - \frac{z^2}{2}\right)x_n + hx'_n\right) = \omega\left(\frac{z^3}{4} - z\right)x_n + \left(1 - \frac{z^2}{2}\right)x'_n \implies \\ \begin{pmatrix} x_{n+1} \\ x'_{n+1} \end{pmatrix} &= \begin{pmatrix} 1 - \frac{z^2}{2} & h \\ \omega z\left(\frac{z^2}{4} - 1\right) & 1 - \frac{z^2}{2} \end{pmatrix} \begin{pmatrix} x_n \\ x'_n \end{pmatrix} \implies \\ \begin{pmatrix} \omega x_{n+1} \\ x'_{n+1} \end{pmatrix} &= \begin{pmatrix} 1 - \frac{z^2}{2} & z \\ z\left(\frac{z^2}{4} - 1\right) & 1 - \frac{z^2}{2} \end{pmatrix} \begin{pmatrix} \omega x_n \\ x'_n \end{pmatrix} \end{aligned}$$

Next, we compute the eigenvalues of the matrix $M(h\omega)$:

$$\begin{aligned} \left(a - \frac{z^2}{2} - \lambda\right)^2 - z^2\left(\frac{z^2}{4} - 1\right) &= 0 && \iff \\ \lambda^2 - \lambda(2 - z^2) + 1 &= 0 \end{aligned}$$

We know that $\lambda_1 + \lambda_2 = 2 - z^2$ and $\lambda_1\lambda_2 = 1$. From the latter relation we can see, that either one of the eigenvalues is larger than 1 in modulus or both are equal to 1 in modulus. The method is stable only in the case, where both eigenvalues are less than or equal to 1 in modulus, therefore in this case, both eigenvalues are equal to 1 in modulus. Now we consider the first relation.

$$\begin{aligned} 1 = |\lambda_1| = |2 - z^2 - \lambda_2| &\geq |2 - z^2| - |\lambda_2| = |2 - z^2| - 1 && \iff \\ &2 \geq |2 - z^2| && \iff \\ 2 \geq 2 - z^2 \quad \text{and} \quad -2 \leq 2 - z^2 &&& \iff \\ 0 \geq -z^2 \quad \text{and} \quad 4 \geq z^2. \end{aligned}$$

The last relation yields $|h\omega| \leq 2$ in order for the Störmer-Verlet scheme to be stable.

5 GNI for SDEs

Task 1: Propositions for the codes are

(a)

```

clear all
randn('state', 100)
% discretised BM for dt=2^(-4)
Tend=1;
5 dt=2^(-4);
N=1/dt;
W(1)=0;
for l=1:N
    dW=sqrt(dt)*randn(1,1);
10 W(l+1)=W(l)+dW;
end
randn('state', 101)
% discretised BM for dt=2^(-6)
    
```

```
Tend=1;
15 dt1=2^(-6);
N=1/dt1;
W1(1)=0;
for l=1:N
    dW=sqrt(dt1)*randn(1,1);
20 W1(l+1)=W1(l)+dW;
end
randn('state',102)
% discretised BM for dt=2^(-8)
Tend=1;
25 dt2=2^(-8);
N=1/dt2;
W2(1)=0;
for l=1:N
    dW=sqrt(dt2)*randn(1,1);
30 W2(l+1)=W2(l)+dW;
end
% plot
figure(),
plot([0:dt:Tend],W,'b','LineWidth',3)
35 hold on
plot([0:dt1:Tend],W1,'k','LineWidth',3)
hold on
plot([0:dt2:Tend],W2,'r','LineWidth',3)
hold off
40 xlabel('$t_{\ell}$','Interpreter','latex','FontSize',15)
ylabel('$W_{\ell}$','Interpreter','latex','FontSize',15,'Rotation',0)
legend('2^{-4}','2^{-6}','2^{-8}')
set(gca,'FontSize',15);
```

```
clear all
randn('state',100)
% discretised BM for dt=2^(-8)
% 200 samples
5 Tend=1;dt=2^(-8);N=1/dt;
M=200; % samples
dW=sqrt(dt)*randn(M,N+1);
W=zeros(M,N+1);
W(:,1)=0;
10 for l=1:N
    W(:,l+1)=W(:,l)+dW(:,l);
end
Wmean=mean(W);
% discretised BM for dt=2^(-8)
% 2000 samples
15 Tend=1;dt=2^(-8);N=1/dt;
M=2000; % samples
dW=sqrt(dt)*randn(M,N+1);
W=zeros(M,N+1);
20 W(:,1)=0;
for l=1:N
    W(:,l+1)=W(:,l)+dW(:,l);
end
```

```
Wmean1=mean(W);
25 % discretised BM for dt=2^(-8)
% 20000 samples
Tend=1;dt=2^(-8);N=1/dt;
M=20000; % samples
dW=sqrt(dt)*randn(M,N+1);
30 W=zeros(M,N+1);
W(:,1)=0;
for l=1:N
    W(:,l+1)=W(:,l)+dW(:,l);
end
35 Wmean2=mean(W);
% plot mean over M samples
figure(),
plot([0:dt:Tend],Wmean,'b','LineWidth',3)
hold on
40 plot([0:dt:Tend],Wmean1,'k','LineWidth',3)
hold on
plot([0:dt:Tend],Wmean2,'m','LineWidth',3)
hold off
xlabel('Time','FontSize',15)
45 ylabel('Means','FontSize',15,'Rotation',0)
legend('200','2000','20000')
set(gca,'FontSize',15);
```

(b)

```
clear all
randn('state',100)
% discretised BM for dt=2^(-8)
% 50000 samples
5 Tend=1;dt=2^(-8);N=1/dt;
M=50000; % samples
dW=sqrt(dt)*randn(M,N+1);
W=zeros(M,N+1);
W(:,1)=0;
10 for l=1:N
    W(:,l+1)=W(:,l)+dW(:,l);
end
Wmean=mean(W);
% plot mean and some samples
15 figure(),
plot([0:dt:Tend],Wmean,'b','LineWidth',3)
hold on
plot([0:dt:Tend],[W(1:5,:)],'k','LineWidth',3) % plot 5 samples
hold off
20 xlabel('Time','FontSize',15)
ylabel('Means','FontSize',15,'Rotation',0)
set(gca,'FontSize',15);
```

Task 2: A proposition for the solution to this task reads

```
clear all
randn('state',100)
% Initial parameters
omega=5;X0=0;Y0=1;alpha=1;
```

```

5  % number of paths sampled for
   % the approximation of the expectation
   M=10^3;
   % initial energy
   Haminit=Y0^2./2+omega^2*X0^2./2
10  Tend=5;
   N=2^(5);
   h=Tend/N;

   Hamem=zeros(M,N);
15  Hamstm=zeros(M,N);

   for s=1:M
     % Initial values
     Xtempem=X0;Ytempem=Y0;
20    Xtempstm=X0;Ytempstm=Y0;
     for j=1:N
       Winc=sqrt(h)*randn(1,1);
       % EM
       X1em=Xtempem+h*Ytempem;
25      Y1em=Ytempem-h*omega^2*Xtempem+alpha*Winc;
       Xtempem=X1em;Ytempem=Y1em;
       % energy for EM
       Hamem(s,j)=.5*(Y1em^2+omega^2*X1em^2);

30      % STM
       X1stm=Xtempstm*cos(h*omega)+sin(h*omega)/omega*Ytempstm+ ...
         alpha*sin(h*omega)/omega*Winc;
       Y1stm=-omega*Xtempstm*sin(h*omega)+cos(h*omega)*Ytempstm+ ...
         alpha*cos(h*omega)*Winc;
35      Xtempstm=X1stm;Ytempstm=Y1stm;
       % energy for STM
       Hamstm(s,j)=.5*(Y1stm^2+omega^2*X1stm^2);
     end
   end
40  end

   % numerical drift
   set(0,'DefaultFontSize',12)
   set(0,'DefaultAxesFontSize',12)
   set(0,'DefaultLineLineWidth',2)
45  set(0,'DefaultLineMarkerSize',10)

   Dtvals=[h:h:Tend];
   figure(),
   plot(Dtvals,mean(Hamem),'ks-', ...
50  Dtvals,mean(Hamstm),'k+-', ...
   Dtvals,Haminit+alpha^2.*Dtvals./2,'r'),
   axis([Dtvals(1) Dtvals(end) 0 30])
   hold off
   xlabel('Time','FontSize',14)
55  ylabel('Energy','Rotation',0,'FontSize',14)
   legend('EM','STM','Exact')
   set(gca,'FontSize',15);

```