## Study Guide: Vibration ODEs

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## Sep 4, 2013

## Contents

1	$\mathbf{A} \mathbf{s}$	imple vibration problem	1		
	1.1	A centered finite difference scheme; step 1 and 2	1		
	1.2	A centered finite difference scheme; step 3	1		
	1.3	A centered finite difference scheme; step 4	2		
	1.4	Computing the first step	2		
	1.5	The computational algorithm	2		
	1.6	Operator notation; ODE	3		
	1.7	Operator notation; initial condition	3		
	1.8	Computing $u'$	3		
2	Imp	plementation	3		
	2.1	Core algorithm	3		
	2.2	Plotting	4		
	2.3	Main program	4		
	2.4	User interface: command line	4		
	2.5	Running the program	4		
3	Verification				
	3.1	First steps for testing and debugging	5		
	3.2	Checking convergence rates	5		
	3.3	Implementational details	5		
	3.4	Nose test	6		
4	Long time simulations				
	4.1	Effect of the time step on long simulations	6		
	4.2	Using a moving plot window	7		

5	Ana	lysis of the numerical scheme	7
	5.1	Deriving an exact numerical solution; ideas	7
	5.2	Deriving an exact numerical solution; calculations (1)	7
	5.3	Deriving an exact numerical; calculations (2)	8
	5.4	Polynomial approximation of the phase error	8
	5.5	Plot of the phase error	9
	5.6	Exact discrete solution	9
	5.7	Stability	9
	5.8	The stability criterion	10
	5.9	Summary of the analysis	10
6	Alte	ernative schemes based on 1st-order equations	11
	6.1	Rewriting 2nd-order ODE as system of two 1st-order ODEs	11
	6.2	The Forward Euler scheme	11
	6.3	The Backward Euler scheme	11
	6.4	The Crank-Nicolson scheme	11
	6.5	Comparison of schemes via Odespy	12
	6.6	Forward and Backward Euler and Crank-Nicolson	12
	6.7	Phase plane plot of the numerical solutions	13
	6.8	Plain solution curves	13
	6.9	Observations from the figures	13
	6.10	Runge-Kutta methods of order 2 and 4; short time series	14
		Runge-Kutta methods of order 2 and 4; longer time series	16
		Crank-Nicolson; longer time series	18
	6.13	Observations of RK and CN methods	19
		The Euler-Cromer method; idea	19
		The Euler-Cromer method; complete formulas	20
		Equivalence with the scheme for the second-order ODE	20
		Comparison of the treatment of initial conditions	20
		A method utilizing a staggered mesh	21
		Centered differences on a staggered mesh	21
		Comparison with the scheme for the 2nd-order ODE	21
7	Gen	eralization: damping, nonlinear spring, and external exci-	
	tatio	on	<b>22</b>
	7.1	A centered scheme for linear damping	22
	7.2	Initial conditions	22
	7.3	A centered scheme for quadratic damping	22
	7.4	Using a geometric mean to linearize the equation	23
	7.5	Initial condition for quadratic damping	23
	7.6	Algorithm	23
	7.7	Implementation	23
	7.8	Verification	24
	7.9	Demo program	24

## 1 A simple vibration problem

$$u''t + \omega^2 u = 0$$
,  $u(0) = I$ ,  $u'(0) = 0$ ,  $t \in (0, T]$ . (1)

Exact solution:

$$u(t) = I\cos(\omega t). \tag{2}$$

u(t) oscillates with constant amplitude I and (angular) frequency  $\omega$ . Period:  $P=2\pi/\omega$ .

## 1.1 A centered finite difference scheme; step 1 and 2

- Strategy: follow the four steps<sup>1</sup> of the finite difference method.
- Step 1: Introduce a time mesh, here uniform on [0,T]:  $t_n = n\Delta t$
- Step 2: Let the ODE be satisfied at each mesh point:

$$u''(t_n) + \omega^2 u(t_n) = 0, \quad n = 1, \dots, N_t.$$
 (3)

## 1.2 A centered finite difference scheme; step 3

Step 3: Approximate derivative(s) by finite difference approximation(s). Very common (standard!) formula for u'':

$$u''(t_n) \approx \frac{u^{n+1} - 2u^n + u^{n-1}}{\Delta t^2}$$
 (4)

Use this discrete initial condition together with the ODE at t=0 to eliminate  $u^{-1}$  (insert (4) in (3)):

$$\frac{u^{n+1} - 2u^n + u^{n-1}}{\Delta t^2} = -\omega^2 u^n \,. \tag{5}$$

## 1.3 A centered finite difference scheme; step 4

Step 4: Formulate the computational algorithm. Assume  $u^{n-1}$  and  $u^n$  are known, solve for unknown  $u^{n+1}$ :

$$u^{n+1} = 2u^n - u^{n-1} - \omega^2 u^n. (6)$$

Nick names for this scheme: Stormer's method or Verlet integration<sup>2</sup>.

 $<sup>^1 \\ \</sup>text{http://tinyurl.com/k3sdbuv/pub/decay-sphinx/main\_decay.html\#the-forward-euler-scheme} \\ ^2 \\ \text{http://en.wikipedia.org/wiki/Velocity\_Verlet}$ 

## 1.4 Computing the first step

- The formula breaks down for  $u^1$  because  $u^{-1}$  is unknown and outside the mesh!
- And: we have not used the initial condition u'(0) = 0.

Discretize u'(0) by a centered difference

$$\frac{u^1 - u^{-1}}{2\Delta t} = 0 \quad \Rightarrow \quad u^{-1} = u^1 \,. \tag{7}$$

Inserted in (6) for n = 0 gives

$$u^{1} = u^{0} - \frac{1}{2}\Delta t^{2}\omega^{2}u^{0}. \tag{8}$$

## 1.5 The computational algorithm

- 1.  $u^0 = I$
- 2. compute  $u^1$  from (8)
- 3. for  $n = 1, 2, \dots, N_t 1$ :
  - (a) compute  $u^{n+1}$  from (6)

More precisly expressed in Python:

```
t = linspace(0, T, Nt+1) # mesh points in time
dt = t[1] - t[0] # constant time step.
u = zeros(Nt+1) # solution

u[0] = I
u[1] = u[0] - 0.5*dt**2*w**2*u[0]
for n in range(1, Nt):
    u[n+1] = 2*u[n] - u[n-1] - dt**2*w**2*u[n]
```

Note: w is consistently used for  $\omega$  in code.

#### 1.6 Operator notation; ODE

With  $[D_tD_tu]^n$  as the finite difference approximation to  $u''(t_n)$  we can write

$$[D_t D_t u + \omega^2 u = 0]^n. (9)$$

 $[D_tD_tu]^n$  means applying a central difference with step  $\Delta t/2$  twice:

$$[D_t(D_t u)]^n = \frac{[D_t u]^{n+1/2} - [D_t u]^{n-1/2}}{\Delta t}$$

which is written out as

$$\frac{1}{\Delta t}\left(\frac{u^{n+1}-u^n}{\Delta t}-\frac{u^n-u^{n-1}}{\Delta t}\right)=\frac{u^{n+1}-2u^n+u^{n-1}}{\Delta t^2}\,.$$

## 1.7 Operator notation; initial condition

$$[u=I]^0, \quad [D_{2t}u=0]^0,$$
 (10)

where  $[D_{2t}u]^n$  is defined as

$$[D_{2t}u]^n = \frac{u^{n+1} - u^{n-1}}{2\Delta t} \,. \tag{11}$$

#### 1.8 Computing u'

u is often displacement/position, u' is velocity and can be computed by

$$u'(t_n) \approx \frac{u^{n+1} - u^{n-1}}{2\Delta t} = [D_{2t}u]^n.$$
 (12)

## 2 Implementation

## 2.1 Core algorithm

```
from numpy import *
from matplotlib.pyplot import *

def solver(I, w, dt, T):
    """
    Solve u'' + w**2*u = 0 for t in (0,T], u(0)=I and u'(0)=0,
    by a central finite difference method with time step dt.
    """
    dt = float(dt)
    Nt = int(round(T/dt))
    u = zeros(Nt+1)
    t = linspace(0, Nt*dt, Nt+1)

u[0] = I
    u[1] = u[0] - 0.5*dt**2*w**2*u[0]
    for n in range(1, Nt):
        u[n+1] = 2*u[n] - u[n-1] - dt**2*w**2*u[n]
    return u, t
```

#### 2.2 Plotting

```
def exact_solution(t, I, w):
    return I*cos(w*t)

def visualize(u, t, I, w):
    plot(t, u, 'r--o')
    t_fine = linspace(0, t[-1], 1001) # very fine mesh for u_e
    u_e = exact_solution(t_fine, I, w)
    hold('on')
    plot(t_fine, u_e, 'b-')
    legend(['numerical', 'exact'], loc='upper left')
    xlabel('t')
    ylabel('u')
    dt = t[1] - t[0]
    title('dt=%g' % dt)
```

```
umin = 1.2*u.min(); umax = -umin
axis([t[0], t[-1], umin, umax])
savefig('vib1.png')
savefig('vib1.pdf')
savefig('vib1.eps')
```

## 2.3 Main program

```
I = 1
w = 2*pi
dt = 0.05
num_periods = 5
P = 2*pi/w  # one period
T = P*num_periods
u, t = solver(I, w, dt, T)
visualize(u, t, I, w, dt)
```

#### 2.4 User interface: command line

```
import argparse
parser = argparse.ArgumentParser()
parser.add_argument('--I', type=float, default=1.0)
parser.add_argument('--w', type=float, default=2*pi)
parser.add_argument('--dt', type=float, default=0.05)
parser.add_argument('--num_periods', type=int, default=5)
a = parser.parse_args()
I, w, dt, num_periods = a.I, a.w, a.dt, a.num_periods
```

## 2.5 Running the program

vib\_undamped.py<sup>3</sup>:

Terminal> python vib\_undamped.py --dt 0.05 --num\_periods 40

Generates frames tmp\_vib%04d.png in files. Can make movie:

Terminal> avconv -r 12 -i tmp\_vib%04d.png -vcodec flv movie.flv

Can use ffmpeg instead of avconv.

Format	Codec and filename
Flash	-vcodec flv movie.flv
MP4	<pre>-vcodec libx64 movie.mp4</pre>
Webm	<pre>-vcodec libvpx movie.webm</pre>
Ogg	<pre>-vcodec libtheora movie.ogg</pre>

 $<sup>^3 \</sup>verb|http://tinyurl.com/jvzzcfn/vib/vib_undamped.py|$ 

## 3 Verification

## 3.1 First steps for testing and debugging

- Testing very simple solutions: u = const or u = ct + d do not apply here (without a force term in the equation:  $u'' + \omega^2 u = f$ ).
- Hand calculations: calculate  $u^1$  and  $u^2$  and compare with program.

## 3.2 Checking convergence rates

The function below

- performs m simulations with halved time steps:  $2^{-k}\Delta t$ ,  $k=0,\ldots,m-1$ ,
- computes the  $L_2$  norm of the error,  $E = \sqrt{\Delta t_i \sum_{n=0}^{N_t-1} (u^n u_e(t_n))^2}$  in each case,
- estimates the rates  $r_i$  from two consecutive experiments  $(\Delta t_{i-1}, E_{i-1})$  and  $(\Delta t_i, E_i)$ , assuming  $E_i = C\Delta t_i^{r_i}$  and  $E_{i-1} = C\Delta t_{i-1}^{r_i}$ :

## 3.3 Implementational details

```
def convergence_rates(m, num_periods=8):
    Return m-1 empirical estimates of the convergence rate
    based on m simulations, where the time step is halved
    for each simulation.
    w = 0.35; I = 0.3
    dt = 2*pi/w/30 # 30 time step per period <math>2*pi/w
    T = 2*pi/w*num_periods
    dt_values = []
E_values = []
    for i in range(m):
        u, t = solver(I, w, dt, T)
u_e = exact_solution(t, I, w)
        E = sqrt(dt*sum((u_e-u)**2))
        dt_values.append(dt)
        E_values.append(E)
        dt = dt/2
    r = [log(E_values[i-1]/E_values[i])/
         log(dt_values[i-1]/dt_values[i])
         for i in range(1, m, 1)]
    return r
```

Result: r contains values equal to 2.00 - as expected!

#### 3.4 Nose test

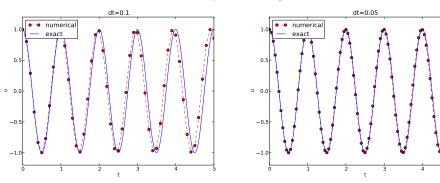
Use final r[-1] in a unit test:

```
def test_convergence_rates():
    r = convergence_rates(m=5, num_periods=8)
    # Accept rate to 1 decimal place
    nt.assert_almost_equal(r[-1], 2.0, places=1)
```

Complete code in vib\_undamped.py<sup>4</sup>.

## 4 Long time simulations

## 4.1 Effect of the time step on long simulations



- The numerical solution seems to have right amplitude.
- There is a phase error which is reduced by reducing the time step.
- The total phase error seems to grow with time.

## 4.2 Using a moving plot window

- In long time simulations we need a plot window that follows the solution.
- Method 1: scitools.MovingPlotWindow.
- Method 2: scitools.avplotter (ASCII vertical plotter).

Example:

Terminal> python vib\_undamped.py --dt 0.05 --num\_periods 40

Movie of the moving plot window<sup>5</sup>.

<sup>4</sup>http://tinyurl.com/jvzzcfn/vib/vib\_undamped.py

 $<sup>^5 \</sup>texttt{mov-vib/vib\_undamped\_dt0.05/index.html}$ 

## 5 Analysis of the numerical scheme

## 5.1 Deriving an exact numerical solution; ideas

- Linear, homogeneous, difference equation for  $u^n$ .
- Has solutions  $u^n \sim A^n$ , where A is unknown (number).
- Here:  $u_{e}(t) = I\cos(\omega t) \sim I\exp(i\omega t) = I(e^{i\omega\Delta t})^{n}$
- Trick for simplifying the algebra:  $u^n=A^n$ , seek  $A=\exp{(i\tilde{\omega}\Delta t)}$  and find  $\tilde{\omega}$
- $\tilde{\omega}$ : unknown numerical frequency (easier to calculate than A)
- $\omega \tilde{\omega}$  is the phase error
- Use the real part as the physical relevant part of a complex expression

## 5.2 Deriving an exact numerical solution; calculations (1)

$$u^n = A^n = \exp(\tilde{\omega}\Delta t n) = \exp(\tilde{\omega}t) = \cos(\tilde{\omega}t) + i\sin(\tilde{\omega}t)$$
.

$$[D_t D_t u]^n = \frac{u^{n+1} - 2u^n + u^{n-1}}{\Delta t^2}$$

$$= I \frac{A^{n+1} - 2A^n + A^{n-1}}{\Delta t^2}$$

$$= I \frac{\exp(i\tilde{\omega}(t + \Delta t)) - 2\exp(i\tilde{\omega}t) + \exp(i\tilde{\omega}(t - \Delta t))}{\Delta t^2}$$

$$= I \exp(i\tilde{\omega}t) \frac{1}{\Delta t^2} (\exp(i\tilde{\omega}(\Delta t)) + \exp(i\tilde{\omega}(-\Delta t)) - 2)$$

$$= I \exp(i\tilde{\omega}t) \frac{2}{\Delta t^2} (\cosh(i\tilde{\omega}\Delta t) - 1)$$

$$= I \exp(i\tilde{\omega}t) \frac{2}{\Delta t^2} (\cos(\tilde{\omega}\Delta t) - 1)$$

$$= -I \exp(i\tilde{\omega}t) \frac{4}{\Delta t^2} \sin^2(\frac{\tilde{\omega}\Delta t}{2})$$

## 5.3 Deriving an exact numerical; calculations (2)

The scheme (6) with  $u^n = \exp(i\omega \tilde{\Delta}t n)$  inserted gives

$$-\exp\left(i\tilde{\omega}t\right)\frac{4}{\Delta t^2}\sin^2\left(\frac{\tilde{\omega}\Delta t}{2}\right) + \omega^2\exp\left(i\tilde{\omega}t\right) = 0,\tag{13}$$

which after dividing by  $\exp(i\tilde{\omega}t)$  results in

$$\frac{4}{\Delta t^2} \sin^2(\frac{\tilde{\omega}\Delta t}{2}) = \omega^2. \tag{14}$$

Solve for  $\tilde{\omega}$ :

$$\tilde{\omega} = \pm \frac{2}{\Delta t} \sin^{-1} \left( \frac{\omega \Delta t}{2} \right) \,. \tag{15}$$

- Phase error because  $\tilde{\omega} \neq \omega$ .
- But how good is the approximation  $\tilde{\omega}$  to  $\omega$ ?

## 5.4 Polynomial approximation of the phase error

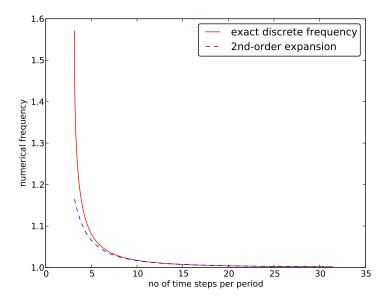
Taylor series expansion for small  $\Delta t$  gives a formula that is easier to understand:

```
>>> from sympy import *
>>> dt, w = symbols('dt w')
>>> w_tilde = asin(w*dt/2).series(dt, 0, 4)*2/dt
>>> print w_tilde
(dt*w + dt**3*w**3/24 + O(dt**4))/dt # observe final /dt
```

$$\tilde{\omega} = \omega \left( 1 + \frac{1}{24} \omega^2 \Delta t^2 \right) + \mathcal{O}(\Delta t^3). \tag{16}$$

The numerical frequency is too large (to fast oscillations).

## 5.5 Plot of the phase error



## 5.6 Exact discrete solution

$$u^n = I\cos(\tilde{\omega}n\Delta t), \quad \tilde{\omega} = \frac{2}{\Delta t}\sin^{-1}\left(\frac{\omega\Delta t}{2}\right).$$
 (17)

Ideal for verification and analysis!

## 5.7 Stability

- Numerical solution has constant amplitude (desired!), but phase error.
- Constant amplitude requires  $\sin^{-1}(\omega \Delta t/2)$  to be real-valued  $\Rightarrow |\omega \Delta t/2| \le 1$
- $\sin^{-1}(x)$  is complex if |x| > 1, and then  $\tilde{\omega}$  becomes complex.

What is the consequence of complex  $\tilde{\omega}$ ?

- Set  $\tilde{\omega} = \tilde{\omega}_r + i\tilde{\omega}_i$ .
- Since  $\sin^{-1}(x)$  has a negative\* imaginary part<sup>6</sup> for x > 1,  $\exp(i\omega \tilde{t}) = \exp(-\tilde{\omega}_i t) \exp(i\tilde{\omega}_r t)$  leads to exponential growth  $e^{-\tilde{\omega}_i t}$  when  $-\tilde{\omega}_i t > 0$ .
- This instability because the qualitative behavior is wrong.

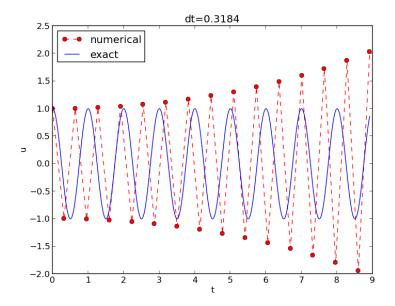
### 5.8 The stability criterion

Cannot tolerate growth and must therefore demand a stability criterion

$$\frac{\omega \Delta t}{2} \le 1 \quad \Rightarrow \quad \Delta t \le \frac{2}{\omega} \,. \tag{18}$$

Try  $\Delta t = \frac{2}{\omega} + 9.01 \cdot 10^{-5} \ (\pi^{-1}$ :

 $<sup>^6 \</sup>texttt{http://www.wolframalpha.com/input/?i=arcsin\%28x\%29\%2C+x+in+\%280\%2C3\%29}$ 



## 5.9 Summary of the analysis

We can draw three important conclusions:

- 1. The key parameter in the formulas is  $p = \omega \Delta t$ .
  - (a) Period of oscillations:  $P = 2\pi/\omega$
  - (b) Number of time steps per period:  $N_P = P/\Delta t$
  - (c)  $\Rightarrow p = \omega \Delta t = 2\pi N_P \sim N_P$
  - (d) The smallest possible  $N_P$  is  $2 \Rightarrow p \in (0, \pi]$
- 2. For  $p \leq 2$  the amplitude of  $u^n$  is constant (stable solution)
- 3.  $u^n$  has a relative phase error  $\tilde{\omega}/\omega \approx 1 + \frac{1}{24}p^2$ , making numerical peaks occur too early

## 6 Alternative schemes based on 1st-order equations

6.1 Rewriting 2nd-order ODE as system of two 1st-order ODEs

$$u'' + \omega^2 u = 0$$

Introduce auxiliary variable v = u':

$$u' = v, (19)$$

$$v' = -\omega^2 u. (20)$$

Initial conditions: u(0) = I and v(0) = 0.

#### 6.2 The Forward Euler scheme

$$[D_t^+ u = v]^n,$$
  

$$[D_t^+ v = -\omega^2 u]^n,$$

or written out,

$$u^{n+1} = u^n + \Delta t v^n, \tag{21}$$

$$v^{n+1} = v^n - \Delta t \omega^2 u^n \,. \tag{22}$$

## 6.3 The Backward Euler scheme

$$[D_t^- u = v]^{n+1}, (23)$$

$$[D_t^- v = -\omega u]^{n+1} \,. \tag{24}$$

Written out:

$$u^{n+1} - \Delta t v^{n+1} = u^n, (25)$$

$$v^{n+1} + \Delta t \omega^2 u^{n+1} = v^n \,. \tag{26}$$

This is a *coupled*  $2 \times 2$  system for the new values at  $t = t_{n+1}$ !

## 6.4 The Crank-Nicolson scheme

$$[D_t u = \overline{v}^t]^{n + \frac{1}{2}},\tag{27}$$

$$[D_t v = -\omega \overline{u}^t]^{n + \frac{1}{2}}. (28)$$

Also a coupled system:

$$u^{n+1} - \frac{1}{2}\Delta t v^{n+1} = u^n + \frac{1}{2}\Delta t v^n,$$
 (29)

$$v^{n+1} + \frac{1}{2}\Delta t\omega^2 u^{n+1} = v^n - \frac{1}{2}\Delta t\omega^2 u^n.$$
 (30)

## 6.5 Comparison of schemes via Odespy

Can use Odespy<sup>7</sup> to compare many methods for first-order schemes:

<sup>&</sup>lt;sup>7</sup>https://github.com/hplgit/odespy

```
import odespy
import numpy as np
def f(u, t, w=1):
    \# u is array of length 2 holding our [u, v]
    u, v = u
    return [v, -w**2*u]
def run_solvers_and_plot(solvers, timesteps_per_period=20,
                           num_periods=1, I=1, w=2*np.pi):
    P = 2*np.pi/w # one period
    dt = P/timesteps_per_period
    Nt = num_periods*timesteps_per_period
    T = Nt*dt
    t_mesh = np.linspace(0, T, Nt+1)
    legends = []
    for solver in solvers:
        solver.set(f_kwargs={'w': w})
solver.set_initial_condition([I, 0])
        u, t = solver.solve(t_mesh)
```

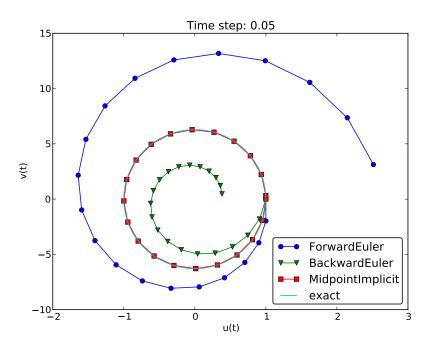
#### 6.6 Forward and Backward Euler and Crank-Nicolson

```
solvers = [
  odespy.ForwardEuler(f),
  # Implicit methods must use Newton solver to converge
  odespy.BackwardEuler(f, nonlinear_solver='Newton'),
  odespy.CrankNicolson(f, nonlinear_solver='Newton'),
]
```

Two plot types:

- u(t) vs t
- Parameterized curve (u(t), v(t)) in phase space (exact:  $(I\cos\omega t, -\omega I\sin\omega t)$  = ellipse)
- Notice: The curve (u(t), v(t)) is closed and periodic  $(P = 2\pi/\omega)$

## 6.7 Phase plane plot of the numerical solutions



## 6.8 Plain solution curves

## 6.9 Observations from the figures

- ullet Forward Euler has growing amplitude and outward (u,v) spiral pumps energy into the system.
- Backward Euler is opposite: decreasing amplitude, inward sprial, extracts energy.
- Forward and Backward Euler are useless for vibrations.
- Crank-Nicolson (MidpointImplicit) looks much better.

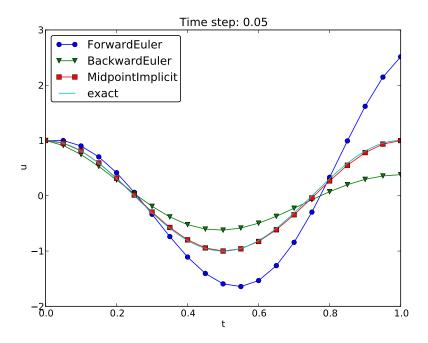
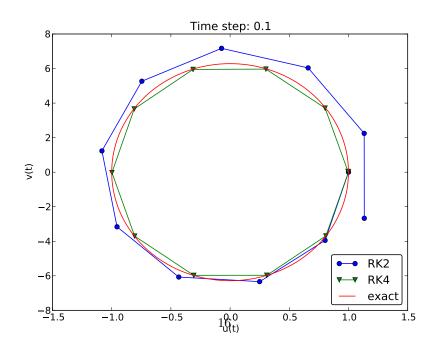
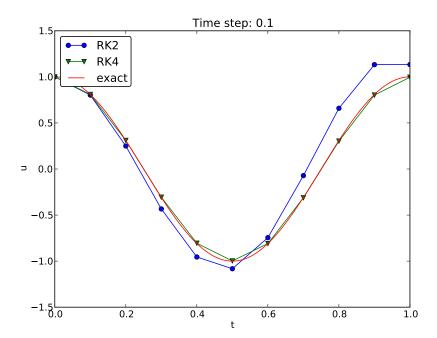


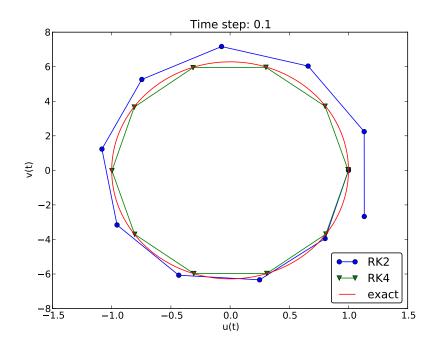
Figure 1: Comparison of classical schemes.

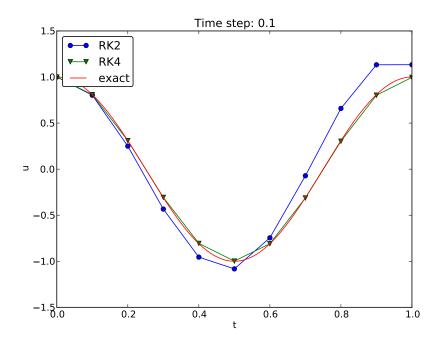
# 6.10 Runge-Kutta methods of order 2 and 4; short time series



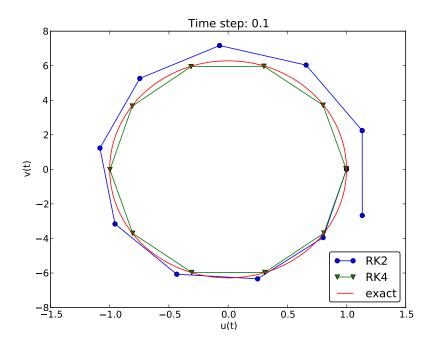


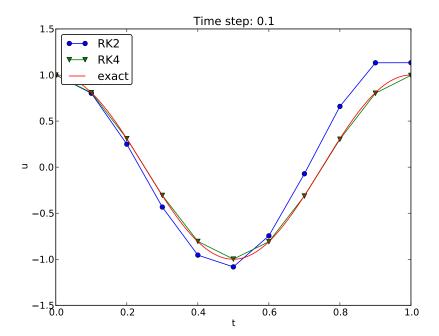
# 6.11 Runge-Kutta methods of order 2 and 4; longer time series





## 6.12 Crank-Nicolson; longer time series





(MidpointImplicit means CrankNicolson in Odespy)

## Observations of RK and CN methods

- 4th-order Runge-Kutta is very accurate, also for large  $\Delta t$ .
- 2th-order Runge-Kutta is almost as bad as Forward and Backward Euler.
- Crank-Nicolson is accurate, but the amplitude is not as accurate as the difference scheme for  $u'' + \omega^2 u = 0$ .

#### 6.14 The Euler-Cromer method; idea

Forward-backward discretization of the 2x2 system:

- $\bullet$  Update u with Forward Euler
- $\bullet$  Update v with Backward Euler, using latest u

$$[D_t^+ u = v]^n,$$
 (31)  
 $[D_t^- v = -\omega u]^{n+1}.$  (32)

$$[D_t^- v = -\omega u]^{n+1}. (32)$$

## 6.15 The Euler-Cromer method; complete formulas

Written out:

$$u^0 = I, (33)$$

$$v^0 = 0, (34)$$

$$u^{n+1} = u^n + \Delta t v^n, \tag{35}$$

$$v^{n+1} = v^n - \Delta t \omega^2 u^{n+1} \,. \tag{36}$$

Names: Forward-backward scheme, Semi-implicit Euler method<sup>8</sup>, symplectic Euler, semi-explicit Euler, Newton-Stormer-Verlet, and Euler-Cromer.

Forward Euler and Backward Euler are both  $\mathcal{O}(\Delta t)$ ) approximations. What about the overall scheme? Expect  $\mathcal{O}(\Delta t)$ ...

## 6.16 Equivalence with the scheme for the second-order ODE

Goal: eliminate  $v^n$ . We have

$$v^n = v^{n-1} - \Delta t \omega^2 u^n,$$

which can be inserted in (35) to yield

$$u^{n+1} = u^n + \Delta t v^{n-1} - \Delta t^2 \omega^2 u^n. \tag{37}$$

Using (35),

$$v^{n-1} = \frac{u^n - u^{n-1}}{\Delta t},$$

and when this is inserted in (37) we get

$$u^{n+1} = 2u^n - u^{n-1} - \Delta t^2 \omega^2 u^n \tag{38}$$

## 6.17 Comparison of the treatment of initial conditions

- The Euler-Cromer scheme is nothing but the centered scheme for  $u'' + \omega^2 u = 0$  (6)!
- The previous analysis of this scheme then also applies to the Euler-Cromer method!
- What about the initial conditions?

$$u' = v = 0 \quad \Rightarrow \quad v^0 = 0,$$

and (35) implies  $u^{1} = u^{0}$ , while (36) says  $v^{1} = -\omega^{2}u^{0}$ .

This  $u^1 = u^0$  approximation corresponds to a first-order Forward Euler discretization of u'(0) = 0:  $[D_t^+ u = 0]^0$ .

 $<sup>^{8} \</sup>verb|http://en.wikipedia.org/wiki/Semi-implicit_Euler_method|$ 

## 6.18 A method utilizing a staggered mesh

- $\bullet\,$  The Euler-Cromer scheme uses two unsymmetric differences in a symmetric way...
- We can derive the method from a more pedagogical point of view where we use a *staggered mesh* and only centered differences

Staggered mesh:

- u is unknown at mesh points  $t_0, t_1, \ldots, t_n, \ldots$
- v is unknown at mesh points  $t_{1/2}, t_{3/2}, \ldots, t_{n+1/2}, \ldots$  (between the u points)

## 6.19 Centered differences on a staggered mesh

$$[D_t u = v]^{n + \frac{1}{2}},\tag{39}$$

$$[D_t v = -\omega u]^{n+1}. (40)$$

Written out:

$$u^{n+1} = u^n + \Delta t v^{n+\frac{1}{2}},\tag{41}$$

$$v^{n+\frac{3}{2}} = v^{n+\frac{1}{2}} - \Delta t \omega^2 u^{n+1} \,. \tag{42}$$

or shift one time level back (purely of esthetic reasons):

$$u^n = u^{n-1} + \Delta t v^{n-\frac{1}{2}},\tag{43}$$

$$v^{n+\frac{1}{2}} = v^{n-\frac{1}{2}} - \Delta t \omega^2 u^n \,. \tag{44}$$

## 6.20 Comparison with the scheme for the 2nd-order ODE

- Can eliminate  $v^{n\pm 1/2}$  and get the centered scheme for  $u'' + \omega^2 u = 0$
- What about the initial conditions? Their equivalent too!

$$u(0) = 0$$
 and  $u'(0) = v(0) = 0$  give  $u^0 = I$  and

$$v(0) \approx \frac{1}{2} (v^{-\frac{1}{2}} + v^{\frac{1}{2}}) = 0, \quad \Rightarrow \quad v^{-\frac{1}{2}} = -v^{\frac{1}{2}}.$$

Combined with the scheme on the staggered mesh we get

$$u^1 = u^0 - \frac{1}{2}\Delta t^2 \omega^2 I,$$

#### Generalization: damping, nonlinear spring, and 7 external excitation

$$mu'' + f(u') + s(u) = F(t), \quad u(0) = I, \ u'(0) = V, \ t \in (0, T].$$
 (45)

Input data: m, f(u'), s(u), F(t), I, V, and T.

Typical choices of f and s:

- linear damping f(u') = bu, or
- quadratic damping f(u') = bu'|u'|
- linear spring s(u) = cu
- nonlinear spring  $s(u) \sim \sin(u)$  (pendulum)

#### A centered scheme for linear damping

$$[mD_tD_tu + f(D_{2t}u) + s(u) = F]^n (46)$$

Written out

$$m\frac{u^{n+1} - 2u^n + u^{n-1}}{\Delta t^2} + f(\frac{u^{n+1} - u^{n-1}}{2\Delta t}) + s(u^n) = F^n$$
 (47)

Assume f(u') is linear in u' = v:

$$u^{n+1} = \left(2mu^n + (\frac{b}{2}\Delta t - m)u^{n-1} + \Delta t^2(F^n - s(u^n))\right)(m + \frac{b}{2}\Delta t)^{-1}.$$
 (48)

## Initial conditions

u(0) = I, u'(0) = V:

$$[u = I]^0 \Rightarrow u^0 = I,$$
 (49)  
 $[D_{2t}u = V]^0 \Rightarrow u^{-1} = u^1 - 2\Delta tV$  (50)

$$[D_{2t}u = V]^0 \Rightarrow u^{-1} = u^1 - 2\Delta tV$$
 (50)

End result:

$$u^{1} = u^{0} + \Delta t V + \frac{\Delta t^{2}}{2m} (-bV - s(u^{0}) + F^{0}).$$
 (51)

Same formula for  $u^1$  as when using a centered scheme for  $u'' + \omega u = 0$ .

#### A centered scheme for quadratic damping

- f(u') = bu'|u'| leads to a quadratic equation for  $u^{n+1}$
- Instead of solving the quadratic equation, we use a geometric mean approximation

$$[mD_tD_tu + bu'|u'| + s(u) = F]^n, (52)$$

Compute u'|u'| by a geometric mean!

## 7.4 Using a geometric mean to linearize the equation

Geometric mean approximation:

$$w^n \approx w^{n-1/2} w^{n+1/2}$$
.

For |u'|u':

$$[u'|u'|]^n \approx u'(t_n + \frac{1}{2})|u'(t_n - \frac{1}{2})|.$$

For u' at  $t_{n\pm 1/2}$  we use centered difference:

$$u'(t_{n+1/2}) \approx [D_t u]^{n+1/2}, \quad u'(t_{n-1/2}) \approx [D_t u]^{n-1/2}.$$
 (53)

After some algebra:

$$u^{n+1} = (m+b|u^n - u^{n-1}|)^{-1} \times (2mu^n - mu^{n-1} + bu^n|u^n - u^{n-1}| + \Delta t^2(F^n - s(u^n))).$$
 (54)

## 7.5 Initial condition for quadratic damping

Simply use that u' = V in the scheme:

$$[mD_tD_tu + bV|V| + s(u) = F]^0$$
 (55)

which gives

$$u^{1} = u^{0} + \Delta t V + \frac{\Delta t^{2}}{2m} \left( -bV|V| - s(u^{0}) + F^{0} \right).$$
 (56)

## 7.6 Algorithm

The computational algorithm is a slight variation of the one in Section ??:

- 1.  $u^0 = I$
- 2. compute  $u^1$  from (51) if linear damping or (56) if quadratic damping
- 3. for  $n = 1, 2, \dots, N_t 1$ :
  - (a) compute  $u^{n+1}$  from (vib:ode2:step4) if linear damping or (54) if quadratic damping

## 7.7 Implementation

```
def solver(I, V, m, b, s, F, dt, T, damping='linear'):
    Solve m*u'' + f(u') + s(u) = F(t) for t in (0,T],
    u(0)=I and u'(0)=V,
    by a central finite difference method with time step dt.
   If damping is 'linear', f(u')=b*u, while if damping is 'quadratic', f(u')=b*u'*abs(u').
    F(t) and s(u) are Python functions.
    dt = float(dt); b = float(b); m = float(m) # avoid integer div.
    Nt = int(round(T/dt))
    u = zeros(Nt+1)
    t = linspace(0, Nt*dt, Nt+1)
    u[0] = I
    if damping == 'linear':
        u[1] = u[0] + dt*V + dt**2/(2*m)*(-b*V - s(u[0]) + F(t[0]))
    elif damping == 'quadratic':
        u[1] = u[0] + dt*V + 
                dt**2/(2*m)*(-b*V*abs(V) - s(u[0]) + F(t[0]))
    for n in range(1, Nt):
        if damping == 'linear':
            u[n+1] = (2*m*u[n] + (b*dt/2 - m)*u[n-1] +
                       dt**2*(F(t[n]) - s(u[n])))/(m + b*dt/2)
        elif damping == 'quadratic':
             u[n+1] = (2*m*u[n] - m*u[n-1] + b*u[n]*abs(u[n] - u[n-1])
                       + dt**2*(F(t[n]) - s(u[n]))/\
(m + b*abs(u[n] - u[n-1]))
    return u, t
```

#### 7.8 Verification

- $\bullet$  Exact linear solution of the discrete equations with linear s
- MMS

#### 7.9 Demo program

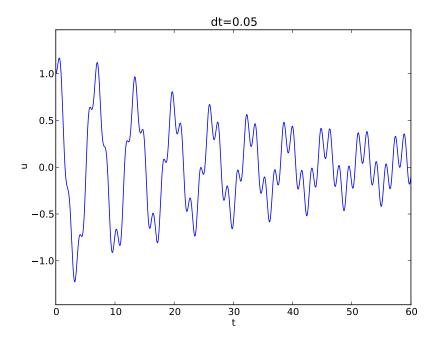
vib.py<sup>9</sup> supports input via the command line:

```
Terminal> python vib.py --s 'sin(u)' --F '3*cos(4*t)' --c 0.03
```

This results in a moving window following the function<sup>10</sup> on the screen.

<sup>9</sup>http://tinyurl.com/jvzzcfn/vib/vib.py

<sup>10</sup> http://tinyurl.com/k3sdbuv/pub/mov-vib/vib\_generalized\_dt0.05/index.html



## Index

```
frequency (of oscillations), 1

Hz (unit), 1

period (of oscillations), 1

stability criterion, 10

staggered Euler-Cromer scheme, 21

staggered mesh, 21
```