

School of Mathematics and Statistics  
MAST30028 Numerical Methods & Scientific Computing  
Week 10

**Drag and drop the folder Week10 from L: \MAST30028 to C:\...\MATLAB and include it in the path.** Now MATLAB knows how to find the files in Week10.

## Exercise Set 1

This relates to material in Lecture 18.

### Levenberg-Marquardt method

- a. To see how L-M performs on the banana function, run `bandem.m` in MATLAB R2015b or earlier, which comes from the Optimization Toolbox. In the GUI which pops up, click on the last button L-M to run the Levenberg-Marquardt method for this problem. It finds the minimum after 34 function evaluations.
- b. An implementation of Levenberg-Marquardt by Kelley is `levmarCorr.m`. A driver for Heath's problem is `kelleylsqr.m`. Run it to see how L-M performs for both good and poor guesses, and see how the Levenberg-Marquardt parameter  $\lambda$  is changed at each iteration.

How does L-M perform compared to undamped and damped G-N?

### The Optimization toolbox

The Curve fitting toolbox is just a GUI interface for the commands `lsqcurvefit` and `lsqnonlin` from the Optimization Toolbox. `lsqcurvefit` is itself a wrapper for data fitting purposes of the nonlinear least squares solver `lsqnonlin`. Options to these functions are set using the command `optimset`. We will see a similar method for setting options when we meet ODE solvers.

- a. Since the 'banana' function has the form of a sum of squares, we can fool MATLAB into minimizing it by calling `lsqnonlin`. It requires as input a function handle that returns the residual vector  $\mathbf{R}(\mathbf{x})$ . `lsqnonlin` forms the sum of squares itself i.e. the cost function. Other functions in the Optimization Toolbox require the cost function itself as input.  
To see how `lsqnonlin` performs on the banana function, see my `bananaScript.m` which uses both the default MATLAB method, then sets an option to use Levenberg-Marquardt. Notice how the L-M parameter  $\lambda$  changes by factors of 10 in MATLAB, different to Kelley's code. What is the stopping criterion used?
- b. To see how these codes can be used on the Heath fitting problem, see my `heathScript.m`. It first uses `lsqnonlin`, then uses `lsqcurvefit` with identical results. `lsqcurvefit` requires a function handle to describe the fitting model, as well as the data  $\{T_i, Y_i\}$ . Finally, we set an option to use Levenberg-Marquardt on the same problem.

## Exercise Set 2: Euler's method for a scalar 1st order ODE

This relates to material in Lecture 19.

### Error propagation in Euler's method

In solving initial value problems, it is important to understand that one is in effect jumping between neighbouring solutions from a family of solutions. If the differential equation is asymptotically stable with respect to initial conditions, these solutions get closer to each other; if it's unstable, they diverge from each other.

- To see the error propagation of the Euler method, run the script `ShowTrunc`. At each time step, the previous error is propagated by following the appropriate solution curve — whether this grows or shrinks depends on  $J = \frac{\partial f}{\partial y}$ . In this case,  $J = \frac{\partial f}{\partial y} = -5$ . In addition, at each time step a new local truncation error is made, so the numerical solution hops onto a new solution curve.
- Now edit `ShowTrunc` to make  $J = \frac{\partial f}{\partial y} = 5$  and run to see what difference it makes to the error propagation.

This explains why errors tend to grow with time when  $J > 0$  and decay when  $J < 0$ .

### Accuracy and stability

- Look at the code `FixedEuler` to see how fixed step Euler's method could be coded.
- Run the code `testEuler` that I showed in lectures. It uses `FixedEuler` on 3 problems with known solutions, so I can compute the errors. It pauses between the 3 problems, so you have to hit a key to continue.

I used them to illustrate the accuracy (order) of the method and the (numerical) stability of the method. By comparing the ten times error using  $n = 1000$  (`10*error3`) with the error using  $n = 100$  (`error2`) (and similarly for the error using  $n = 10$ ) and seeing to what extent the global error

$$GE_k \equiv y(t_k) - y_k^{EM}$$

is proportional to  $h$ . Except for the case when the errors blow up catastrophically, it seems to hold fairly well.

- In the next lecture, I will show that Euler's method is numerically unstable unless

$$|1 + hJ| < 1$$

Using this criterion, explain the case when the errors blow up catastrophically.

### Try yourself

- Use `FixedEuler` to solve the IVP

$$y' = y^2$$

where  $y(0) = 1$ , over the interval  $[0, 2]$ . First try with  $n = 10$ , then with  $n = 100$ . What do you think is going on?

Hint: find the exact solution using first year maths. Also use the Variable Browser (from the Workspace) to see the values of the numerical solution.

## Exercise Set 3: Euler's method for systems

### Converting to systems

Most IVP software expects higher order ODEs to be converted to systems of first order DEs by the user. Try your hand at the following.

a.

$$\ddot{\theta} + \sin \theta = 0$$

the simple pendulum

b.

$$y''' + 3x^2yy'' - \sin(y)y'^2 = \cos(x)$$

c.

$$\ddot{x} = -x/r^3; \quad \ddot{y} = -y/r^3; \quad r = \sqrt{x^2 + y^2}$$

the equations for a planet orbiting the Sun (the Kepler problem). The equations describing this are Newton's equations for the x and y components of acceleration.

### Vectorized Euler's Method

- a. To apply Euler's method to systems of ODEs, we need to *vectorize* `FixedEuler` i.e. write it so that it will work with a function that accepts a scalar  $t$  and a vector  $\mathbf{y}$  and returns a vector of derivatives  $\mathbf{y}'$ . One possible solution is given in my code `FixedEulerVec`.

Run `FixedEulerVec` over the interval  $[0, 20]$  with  $n = 2,000$  for the following systems:

(a)

$$\ddot{\theta} + \sin \theta = 0$$

using ICs:  $\theta(0) = \pi$ ,  $\dot{\theta}(0) = 0$

(b)

$$\begin{aligned} \dot{y}_1 &= -\frac{8}{3}y_2 \\ \dot{y}_2 &= -10y_2 + 10y_3 \\ \dot{y}_3 &= -y_1y_2 + 28y_2 - y_3 \end{aligned}$$

using ICs:  $y_1(0) = 1$ ;  $y_2(0) = 1$ ;  $y_3(0) = 1$

Repeat for  $n = 20,000$ .

Create suitable plots to answer the questions:

- Is system a above periodic? ( Use a phase plot).
- Is system b above periodic? ( Use a 3D phase plot).