

# Numerical Methods for Differential Equations: Homework 4

Due by 2pm Tuesday 10th November. **Please submit your hardcopy at the start of lecture.** The answers you submit should be attractive, brief, complete, and should include program listings and plots where appropriate. The use of “publish” in MATLAB is one possible approach.

**Problem 1: Step-size control** Here is a simple *embedded Runge–Kutta method* consisting of forward Euler and modified Euler sharing common *intermediate stage values*:

$$\begin{aligned}a &= f(t_n, v^n), \\b &= f\left(t_n + \frac{k}{2}, v^n + \frac{k}{2}a\right), \\v^{n+1} &= v^n + ka, \\\tilde{v}^{n+1} &= v^n + kb.\end{aligned}$$

Write a function that takes exactly one step of size  $k$  and returns both  $\tilde{v}^{n+1}$  and  $v^{n+1}$  (from a common state  $v^n$ ). Your code should work for vector  $v^n$  and  $f$ . Show the outputs of your code for the three-body problem from HW3, using  $k = 0.001$ .

Now we will write a code which does adaptive time-stepping:

- Estimate the *one-step error* in  $v^{n+1}$  using the difference of the two solutions.

$$\text{Err} \approx v^{n+1} - \tilde{v}^{n+1}.$$

(Think about why this should be so?) We want the error at each step less than a specified tolerance ATOL. Maybe  $10^{-6}$  is a reasonable value.

- If the error is too large, reject the step and try again (with a smaller step).
- If the error is OK, accept the step, keeping  $v^{n+1}$ . Now take another one (possibly with a larger step), using  $v^{n+1}$  as the new initial condition (i.e., discard  $\tilde{v}^{n+1}$ ).
- In either case, you need a new step size (to either repeat the step, or for the next one). Here’s one approach. From Taylor series analysis, we expect the error to be of the form

$$\|\text{Err}\|_\infty = Ck^{q+1} \quad (+HOT, \text{ ignore them}),$$

where  $q = 1$  is order of the forward Euler method and  $C$  is a constant. What we want is the optimal step  $k_{\text{opt}}$  such that

$$\text{ATOL} = Ck_{\text{opt}}^{q+1}.$$

So solve (on paper) these equations for  $k_{\text{opt}}$ .

- Multiply your chosen  $k_{\text{opt}}$  by a safety factor of 0.8 (as rejecting steps is expensive).

Run your code on the three-body problem from HW3 Question 2 (and [1, Ch. II, pg 129]). Make a plot. Does it work better than a constant step? Count how many rejected steps and accepted steps you make.

(In practice, another algorithm would estimate an initial step size as well; this is not necessary for your implementation: use  $k = 0.001$  for the first step).

**Problem 2: Convergence Study** This is [2, Exercise 1.2], m-files referred to are from <http://faculty.washington.edu/rjl/fdmbook/matlab>

1. Use the method of undetermined coefficients to set up the  $5 \times 5$  Vandermonde system that would determine a fourth-order accurate finite difference approximation to  $u''(x)$  based on 5 equally spaced points,

$$u''(x) = c_{-2}u(x - 2h) + c_{-1}u(x - h) + c_0u(x) + c_1u(x + h) + c_2u(x + 2h) + O(h^4).$$

2. Compute the coefficients using the Matlab code `fdstencil.m` available from the website above and check that they satisfy the system you determined in part (a).

3. Test this finite difference formula to approximate  $u''(1)$  for  $u(x) = \sin(2x)$  with values of  $h$  from the array `hvals = logspace(-1, -4, 13)`.
4. Make a table of the error vs.  $h$  for several values of  $h$  and compare against the predicted error from the leading term of the expression printed by `fdstencil`. You may want to look at the m-file `verbchap1example1.m` for guidance on how to make such a table.

Also produce a log-log plot of the absolute value of the error vs.  $h$ .

You should observe the predicted accuracy for larger values of  $h$ . For smaller values, numerical cancellation in computing the linear combination of  $u$  values impacts the accuracy observed.

### Problem 3: Smoothness

1. Using the *method of undetermined coefficients*, re-derive the “1 -2 1” rule again, being careful to work out the Big Oh error term. How smooth do you expect a function needs to be to observe this error behaviour? (that is, how many derivatives must exist and be continuous?)
2. Design and perform a numerical test that demonstrates the error term of the second-order centered second derivative “1 -2 1” rule behaves as expected with regards to smoothness of the function. Specifically, what happens if the function is just a bit less smooth than the theory requires?

You might reuse your answer here in the next exercise.

### Problem 4: A collaborative test set (Required for 607E, optional for 405.)

See the `diff_matrices1d.m` code from <https://github.com/cbm755/fdmatrices>. Fork that repository and clone it to your local computer.

Now write at least one test function with a name like `test_conv_study_sin` (that is, starting with the lowercase characters “`test_`”).

- Your test should return ‘true’ if the test passed, otherwise ‘false’.
- It should take two arguments: `test_mine(plots, verbose)`. Both should default to false. That is, I should be able to write `test_mine()` and it will be neither verbose nor make any plots. Of course your function might not need to make any plots even if these are true.
- Your test should be reasonably fast (say max 30 seconds).
- Your test should have a reasonable name that says what it does.
- Your test should be reasonably different from others’. For example, if someone else tests `Dxx` you could test `Dxf`.
- A good idea for a test is a convergence study: pick a problem, choose one of the types of boundary conditions, and check that the error decreases appropriately (e.g., close to 4 when  $h$  goes down by 2).
- Other possible test ideas: (i) `diff_matrices1d` gives the same matrix as a small hardcoded case you worked out by-hand, (ii) it does something expected for unreasonable input (nan, inf), (iii) it gives you a matrix of the correct type (i.e., sparse not dense), or anything else you can think of.
- Submit your test as a “pull request” to the original repository. You should review one of your colleagues’ merge requests and give it a “+1” (or suggest changes until you can give it a “+1”)

You should occasionally fetch the latest version (“git fetch”, “git pull”) as the pull requests (hopefully) get merged. For your written work, submit a screenshot showing your pull request, and another screenshot showing your review of a colleague’s pull request.

For bonus points, we should get “Travis CI” running continuous integration tests for us...

## References

- [1] E. Hairer, S. P. Nørsett, and G. Wanner. *Solving ordinary differential equations I: Nonstiff problems*. Springer-Verlag, second edition, 1993.
- [2] R. J. LeVeque. *Finite Difference Methods for Ordinary and Partial Differential Equations: Steady-State and Time-Dependent Problems*. SIAM, 2007.