## Math 56 Compu & Expt Math, Spring 2013: Homework 3

due 10am Thursday April 18th

- 1. Here you learn how to "roll your own" finite difference formulae. Let's say you have access to f at only x, x + h, and x + 2h, and want a 2nd-order accurate approximation to f'(x). Note that this is at the leftmost point of the three; e.g. at the extreme end of a grid of values.
  - (a) Set  $f'(x) \approx af(x) + bf(x+h) + cf(x+2h)$ , expand the right-hand side via Taylor series about x, then write out the three rows of a linear system resulting from equating powers of  $h^0$ ,  $h^1$  and  $h^2$ . Write your linear system in matrix-vector notation.

- (b) Solve the system either by hand or computer, hence write your new finite difference formula. How do you know the solution is unique?
- (c) Give a *rigorous* upper bound on the error of this formula (in exact arithmetic, i.e. ignore rounding).
- 2. Stability.
  - (a) Show whether subtraction  $x_1 x_2$  is backwards stable (with respect to the two input data) under the rules of floating point.
  - (b) In a worksheet you found that 1 + x as done by the rules of floating point arithmetic is not backward stable. Show whether 1 + x is *stable* or not.
- 3. Here's a new formula for matrix 2-norm:

 $||A|| = \sqrt{\lambda_{\max}(A^T A)},$  where  $\lambda_{\max}(A^T A)$  is the largest eigenvalue of the matrix  $A^T A$ .

- (a) Let  $A = \begin{bmatrix} 1 & -1 \\ 2 & 2 \end{bmatrix}$ . Use the new formula to compute by hand ||A||. How does it compare to the size of the largest eigenvalue of A? (for which you can use **eig**)
- (b) Use this to compute the matrix condition number  $\kappa(A)$ . Is it well-conditioned?
- (c) Take 100 points  $\mathbf{x} \in \mathbb{R}^2$  equi-spaced on the unit circle, and plot them, and  $A\mathbf{x}$  for each. What geometric property does  $\kappa(A)$  measure of the ellipse produced?
- 4. Download the two  $100 \times 100$  matrices A1 and A2 from the HW page, and use textread to read them into Matlab (you will need to reshape them).
  - (a) Compare their matrix 2-norms and condition numbers. What worst-case relative errors do you expect for solving linear systems with matrix A1? With A2? (Use our backward stability theorem, and assume standard double precision.)
  - (b) Let's focus on A = A1, and load in the RHS  $\mathbf{b} = \mathbf{bvec}$  from the HW page. Solve  $A\mathbf{x} = \mathbf{b}$ . Then perturb  $\mathbf{b}$  by a random vector of norm  $\varepsilon_{\text{mach}}$  to get  $\tilde{\mathbf{b}}$  (this emulates rounding error applied to the RHS), and solve again  $A\tilde{\mathbf{x}} = \tilde{\mathbf{b}}$ . What relative norm change  $\|\tilde{\mathbf{x}} \mathbf{x}\| / \|\mathbf{x}\|$  results? Does this match your prediction from (a)?
  - (c) Repeat (b) except using the RHS c = cvec from the HW page. Surprising? Is it consistent with
    (a)? Repeat for random unit-norm RHS vectors—do they behave more like b or like c?
- BONUS Explain the different behaviors [hint:  $\|\mathbf{x}\|$ ], deducing how the directions of **b** and **c** relate to long and short axes of the ellipse of the image of the unit sphere under A.

- (d) Given A ∈ ℝ<sup>M×P</sup> and B ∈ ℝ<sup>P×N</sup>, prove a bound on ||AB|| in terms of the norms of the individual matrices. [Hint: HW2 6(c).]
- 5. Recursion, and some "turtle" drawing in the complex plane.
  - (a) Make a function y = koch(z,s) which given complex numbers z and s returns y = z + s and adds the line segment from z to y to the current figure (followed by hold on).
  - (b) Make a driver which uses four calls to koch to draw the generator for the Koch curve: \_\_\_\_\_\_\_\_\_\_\_ Each segment in the generator is length 1/3, and the angles are integer multiples of  $\pi/3$ . Here's how to do it using the stopping point y as the starting point for the next segment each time:

z = 0; y = koch(z,1/3); y = koch(y,1/3\*exp(1i\*pi/3)); ...

(c) Incorporate something like (b) into koch so that it draws a generator composed of four Koch curves unless  $|s| < 10^{-3}$ , in which case it reverts to the original simple line segment. As before, the y returned should be the final pen position. The call koch(0,1) should then produce a the Koch curve fractal—include a plot [Hint: it's a bit slow. Also, axes equal]