

# 1 January 8

## 1.1 Logistics

Within the three body problem is the entirety of this course.

“In mathematics you don’t understand things. You just get used to them.” - John von Neumann. (Bro von Neumann is so washed for this.) For context, von Neumann was challenged that he didn’t actually understand the method of characteristics. He was talking about this with his Dad, who just retired as a math prof from Ohio State, and he didn’t like it. Joel’s alternate form: “In mathematics it takes time for ideas and examples to sink in.”

Click here for course website link.

Content: Parts of Chapters 10-12, 14-16 of textbook by Ascher and Greif (online, free). Topics: Interpolation, approximation (Ch 10 - 12); Differentiation, Integration, ODE’s [PDE’s] (Ch 14-16). Back in the day, 303 was meant as a followup to 302, but not anymore, so may be some repeated material (norms and condition numbers, but not the point of this course anyway).

Discussion: please post to piazza page. If this fails, please email to jf@cs.ubc.ca with subject CPSC 303.

Grading:  $(10\%) \max(h, m, f) + (35\%) \max(m, f) + (55\%) f$  where  $h$  is homework,  $m$  is midterm,  $f$  is final. So technically, can ace final and ace course. Because back in the day, Joel knew someone who couldn’t attend any classes, but got 100% in the final only to get C+ in the course. There is a phenomena where if someone gets 100 on the midterm, stops doing homework. But really, these assessments are good preparation and indicators of where you stand in the course.

Please sign up for piazza and gradescope through canvas.ubc.ca (especially gradescope).

Homework: Set Thursday 11:59pm and due Thursday 11:59pm. There is both individual and group homework. Group homework: at most 4 people, and will cover most material; only submit one. Individual homework: These are the types of things he wants to make sure everyone can do, and will be like the things on exams; you must write up your own solution even if you work with others.

## 1.2 Intro to ODE’s

1.2 and 4.2 (norms), 14.2 (differentiation), 16.1 and 16.2 (ODE’s).

He typically begins courses with the most difficult stuff the course will get. This is tough, but not the worst. Now, this course only requires two terms of calculus, but with how pertinent ML is now, most people are taking multivariable calc anyway. We will get some idea of what to expect and some intuition, but will revisit later in the course. The reason the emphasis is on ODEs and not PDEs is because the general theory for ODEs really applies to all of them, even if you have to solve differently. Families of PDEs have their own properties that have to be studied separately.

We are heading towards Ordinary Differential Equations (Ch. 16).

### 1.2.1 Absolute vs. Relative Error

If  $v \in \mathbb{R}$  is an approximation to  $u \in \mathbb{R}$ , then absolute error (in  $v$ ) (as an approximation to  $u$ ) is  $|u - v|$ , and the relative error is  $\frac{|u - v|}{|u|}$ . The same works in  $\mathbb{R}^n$  (or any normed vector space):

$$\|\vec{u}\|_2 = \|(u_1, \dots, u_n)\|_2 = \sqrt{u_1^2 + u_2^2 + \dots + u_n^2}$$

We also use  $\|\vec{u}\|_1 = |u_1| + \dots + |u_n|$  and  $\|\vec{u}\|_{\max} = \|\vec{u}\|_{\infty} = \max_{1 \leq i \leq n} |u_i|$ . The absolute error in  $\vec{v}$  as an approximation to  $\vec{u}$  is  $\|\vec{u} - \vec{v}\|_p$  and the relative error is  $\frac{\|\vec{u} - \vec{v}\|_p}{\|\vec{u}\|_p}$  where  $p = 1, 2, \infty$ .

### 1.2.2 Taylor’s Theorem (p. 5)

**Theorem 1.** For  $f: (a, b) \rightarrow \mathbb{R}$  where  $f$  is  $k + 1$  differentiable (so  $f^{(k+1)}(x)$  exists in  $(a, b)$ ), for some  $x_0, x_0 + h$  that lie in  $(a, b)$ ,

$$f(x_0 + h) = f(x_0) + hf'(x_0) + \frac{h^2}{2} f''(x_0) + \dots + \frac{h^k}{k!} f^{(k)}(x_0) + \text{error}$$

where the error is  $\frac{h^{k+1}}{(k+1)!} f^{(k+1)}(\xi)$  where  $\xi$  is between  $x_0$  and  $x_0 + h$ .

*Remark 1.*  $h$  can be negative.

We'll learn how to approximate derivatives, and then ODE solution.

## 2 January 10

Housekeeping:

- HW1 will be assigned on Jan 11, due on Gradescope on Jan 18
- Access Gradescope via Canvas
- Today: Separable ODE's (see, e.g. CLP 2, Appendix D of Ascher and Grief)

Last time: Ch 1: "Reviewing" terminology. Ch 4:  $\|\vec{u}\|_2 = \sqrt{u_1^2 + \dots + u_n^2}$  for  $\vec{u} \in \mathbb{R}^n$ . We saw classes of functions, Taylor Series, and ODE's. An ODE is where the derivatives are a function of the same variable?? So  $y' = f(t, y)$ . PDEs on the other hand have partial derivatives  $h = h(t, x_1, \dots, x_n)$ , and maybe something like the heat equation  $\frac{\partial h}{\partial t} = -\Delta_{x_1, \dots, x_n} h$ . There might be a course on the foundations of elliptic PDEs, parabolic PDEs, etc., but won't be the focus here.

And then he talks about a sketch of proof of Taylor's, except I literally did it this morning. Essentially, we use MVT to get better approximations (not rigorously). We have

$$f(x_0 + h) = f(x_0) + hf'(x_0) + \frac{h^2}{2}f''(x_0) + \frac{h^3}{6}f'''(\xi_1)$$

$$hf'(x_0) = f(x_0 + h) - f(x_0) - \frac{h^2}{2}f''(\xi_2)$$

$$f'(x_0) = \frac{f(x_0 + h) - f(x_0)}{h} - \frac{h}{2}f''(\xi_2) = \frac{f(x_0 + h) - f(x_0)}{h} + \text{Order}(h)$$

where  $O(h)$  is some function (depends on  $f, x_0$ ). We have  $|\text{Order}(h)| \leq \frac{h}{2}M_2$  where  $M_2$  is bound on  $f''$  in the interval  $[x_0, x_0 + h]$ . By definition,  $f'(x_0) = \lim_{h \rightarrow 0} \frac{f(x_0 + h) - f(x_0)}{h}$ . All this is really taken from [A&G], Ch. 14, Sections 1,2.

We will continue our discussion of derivatives, but first, some useful notation. If  $a < b \in \mathbb{R}$ ,  $C[a, b] := \{f: [a, b] \rightarrow \mathbb{R} \text{ such that } f \text{ is continuous}\}$ . When  $k \in \mathbb{N}$ ,

$$C^k(a, b) = \{f: (a, b) \rightarrow \mathbb{R} \text{ such that } f \text{ has } k \text{ continuous derivatives } \forall x \in (a, b)\}$$

, and similarly for  $C^k[a, b]$ .  $C^\infty(a, b)$  is the set of  $f$  that has derivatives of all order.

*Definition 1* (Real Analytic Functions).

$$C^\omega(a, b) := \{f: (a, b) \rightarrow \mathbb{R} \text{ such that for all } x_0 \in (a, b), f(x_0 + h) = f(x_0) + hf'(x_0) + \frac{h^2}{2!}f''(x_0) + \dots\}$$

A function  $f: (a, b) \rightarrow \mathbb{R}$  is real analytic when  $f \in C^\omega(a, b)$ .

Real analytic is a stronger condition than  $C^\infty$ , so  $C^\omega \subset C^\infty \subset \dots \subset C^2 \subset C^1 \subset C^0$ . [Hmm... I would like a better definition of convergence here ff]

For example,  $e^x$  ff he scrolled.

### 2.1 Start ODE

Simple ODE [A&G]:

$$y' = f(t, y)$$

where we use the notation  $y' = \frac{dy}{dt} = \dot{y}$ . (Caution: math textbooks typically use  $y' = \frac{dy}{dx} = f(x, y)$ .)

To solve for  $y = y(t)$ , we are given an "initial condition", that is we have  $y_0, t_0 \in \mathbb{R}$  and impose  $y(t_0) = y_0$ .

We expect a unique solution. Say we are given  $A \in \mathbb{R}$ , and find a  $y$  that satisfies

$$y'(t) = Ay(t)$$

We claim that  $y(t) = e^{At}C$  is a solution. We can verify:  $y'(t) = (e^{At}C)' = (Ae^{At})C = Ay(t)$ . So we have solved it by shamelessly guessing.

We can plug in our  $t_0$  and  $y_0$  which fixes  $C = y_0 e^{-At_0}$ . Then

$$y(t) = y_0 e^{A(t-t_0)}$$

So when  $A$  is big enough (greater than 0), we have exponential growth.

Is this solution unique? Can we simply guess and it provides the only solution? More on Friday.

### 3 January 12

Today:

- ODE:  $y' = y$  “isoclines”
- ODE's of the form  $y' = f(y)$
- Later  $\vec{y}' = \vec{f}(t, \vec{y})$ , system of  $m$  ODE's where  $\vec{y} = \vec{y}(t): \mathbb{R} \rightarrow \mathbb{R}^m$  and  $\vec{f}(t, \vec{y}): \mathbb{R} \times \mathbb{R}^m \rightarrow \mathbb{R}^m$ .
- Examples;  $y' = y^2$ ,  $y' = |y|^{1/2}$ .

Question, what could possibly go wrong?

Solve  $y' = f(y)$ ,  $y(t_0) = y_0$ . Then

- If  $f$  continuous near  $y = y_0$  then a solution exists locally
- Moreover, if  $f$  is Lipschitz (or differentiable) near  $y = y_0$ , the local solution is unique
- If  $f$  is analytic near  $y = y_0$ , the unique local solution is analytic
- If  $|f(y)| \leq Ky$  for some  $K$  constant, then there is a global solution

We will start looking at Matlab next week: we will specifically be looking for how it breaks. He doesn't cover as much content as other people do in 303, but more in depth. “I just became a grandfather last week, so I get to say back in my day we always had to make our own software.” So we always knew how it broke. Now we have to figure out why other people's code breaks.

Recall last time, we were looking at  $y' = Ay$ ,  $y(t_0) = y_0$  where  $y: \mathbb{R} \rightarrow \mathbb{R}$ . Isocline picture: slopes at unit points in the  $y-t$  plane. And then we guessed an answer last time:  $y(t) = e^{A(t-t_0)}y_0$ . Now, if we had a theorem that said this was unique, we'd be done.

We can solve this with integration:  $y' = y \implies \frac{dy}{y} = dt \implies \int \frac{1}{y} dy = \int dt$ , and so  $\ln(y) + c_1 = t + c_2$  hence  $y = e^{t+c}$ . Now with  $t_0, y_0$ , we can determine our constant to get  $y(t) = e^{t-t_0}y_0$ . However, this method is not foolproof. Our solution could blow up to infinity. Consider  $y' = y^2$  and  $y(1) = 1$ . And then  $\frac{1}{y^2} dy = dt \implies \frac{-1}{y} = t + c$ . Then,  $y = \frac{-1}{t+c}$ , and plugging in the initial conditions, we get  $c = -2$ . So  $y = \frac{1}{2-t}$ . Singularities can happen, as  $y(t) \rightarrow \infty$  as  $t \rightarrow 2$ .

What about  $y' = |y|^{1/2}$ ? What could possibly go wrong? When  $y > 0$  we have  $y' = y^{1/2}$ . Solving in the way we did before, we can get  $y^{1/2} = \frac{1}{2}(t+C)$  so  $y(t) = \frac{1}{4}(t+C)^2$ . Note  $y(-C) = 0$ ... but our slope should always be increasing, yet is 0 at a point? ff idk Now when  $y < 0$ , we can find (with the method as before) that  $y = -\frac{1}{4}(t+C)^2$ . So we have piecewise function of  $y$  depending on if  $y > 0$  or  $y < 0$ .

Is this a unique solution? Actually, let  $a < b$ . Then

$$y(t) = \begin{cases} \frac{1}{4}(t-b)^2 & b \leq t \\ 0 & a \leq t \leq b \\ -\frac{1}{4}(t-a)^2 & t \leq a \end{cases}$$

is also a solution. The bad situation occurs when  $y = 0$ . We could stay “arbitrarily” long at  $y = 0$ , even if to the right and left are parabola! We will continue looking at  $y' = |y|^{1/2}$  next time.

## 4 January 17

Today's outline:

- Euler's method
- MATLAB and Euler's method
- Plugging in  $y' = Ay, y(t_0) = y_0$

### 4.1 Euler's Method

Say we are given  $y' = f(t, y)$  (or  $y' = f(y)$ , or  $\vec{y}' = \vec{f}(t, \vec{y})$ , etc.) where  $f$  is a function, and we have) initial value  $y(t_0) = y_0, y_0, t_0 \in \mathbb{R}$ . We have the approximation

$$y'(t) \approx \frac{y(t+h) - y(t)}{h}$$

for small  $h$ , since  $y'(t) = \lim_{h \rightarrow 0} \frac{y(t+h) - y(t)}{h}$ . But

$$y'(t) \approx \frac{y(t+h) - y(t-h)}{2h}$$

is a much better approximation (usually). Rearranging gives  $y(t+h) \approx y(t) + hy'(t)$ ; in fact, by Taylor's theorem,  $y(t+h) = y(t) + hy'(t) + \frac{h^2}{2}y''(\xi)$  for some  $\xi$  between  $t$  and  $t+h$ . Substituting  $f$ , we have

$$y(t+h) = y(t) + hf(t, y) + \frac{h^2}{2}y''(\xi)$$

So for small  $h$ ,

$$y(t+h) \approx y(t) + hf(t, y)$$

(we will ignore the final term for now, but will be useful later for calculating error). This last approximation is the essence of Euler's method.

So given  $t_0 =$  initial time and  $y_0 =$  initial value,

Step 1. Start with  $y(t_0) = y_0$ . [Pick a value of  $h$ , smaller the better (usually)]

Step 2.  $y(t_0 + h) = y_0 + hf(t_0, y(t_0)) := y_1$

Step 3.  $y(t_0 + 2h) = y_1 + hf(t_1, y_1) := y_2$  where  $t_i = t_{i-1} + h = ih + t_0$ .

Step  $n$ . Repeat

Actual ODE solvers (like in MATLAB) change  $h$  based off of  $f$  (especially makes  $h$  small when  $f$  is very large or  $f$  is changing quickly). When we saw the three body problem, we had error when two bodies got close because the gravitational force got so big it couldn't make  $h$  small enough to figure out what was going on.

If  $y' = 2y$  and given  $y_0, t_0$ , recall that the exact solution was  $y(t) = e^{2(t-t_0)}$ . With the numerical approximation, we get  $y_1 = y_0 + h(2y_0) = y_0(1 + 2h)$  and  $y_2 = y_1 + h(2y_1) = (1 + 2h)y_1$ . So  $y(t_i) = y(t_0 + ih) = (1 + 2h)^i y_0$ . Now say we fix a  $t_{\text{end}}$ , perhaps  $N$  steps and so  $t_{\text{end}} = t_0 + Nh$ . Then  $h = \frac{t_{\text{end}} - t_0}{N}$ . So

$$y(t_{\text{end}}) = (1 + 2h)^N y_0 = \left(1 + \frac{2(t_{\text{end}} - t_0)}{N}\right)^N y_0 = \left(1 + \frac{\text{something}}{N}\right)^N y_0$$

Hmm... this looks a lot like a definition of  $e$ . As  $N \rightarrow \infty$ , we have  $e^{\text{something}} y_0 = e^{2(t_{\text{end}} - t_0)} y_0$ . We will see this in MATLAB. On the homework, we will see MATLAB not working too well for  $y' = |y|^{1/2}$ .

And then he shows us his MATLAB for Euler's method. MATLAB is quirky. The first function you define in a file will always be run when you call the file, and it will assume the other functions in the file are not meant to be run globally.