

December 5, 2024

Announcements

- Final
- HW10
- ICES
- Bring questions for Tue.

Goals

Callab's cheat sheet for the final

- Richardson
- IVPs

Review

- CS 555 : Numerical Methods
For PDE
- CS 556 : $O(n)$ mm linear algebra
- CS 554 : Parallel numerics

CS 598 EUS : tensor
APK : integral equations

Richardson Extrapolation

Deriving high-order methods is hard work. Can I just do multiple low-order approximations (with different h and get a high-order one out?

Suppose we have $F = \tilde{F}(h) + O(h^p)$ and $\tilde{F}(h_1)$ and $\tilde{F}(h_2)$.

Assume: $\tilde{F} = \tilde{F}(h) + a h^p + O(h^q)$ often $q = p+1$
↑ not known

$$F = \alpha \tilde{F}(h_1) + \beta \tilde{F}(h_2) + O(h^q)$$

$$\alpha h_1^p + \beta h_2^p = 0 \quad , \quad \alpha + \beta = 1$$

$$\alpha h_1^p + (1 - \alpha) h_2^p = 0 \quad \Leftrightarrow \beta = 1 - \alpha$$

$$\alpha(h_1^p - h_2^p) + h_2^p = 0 \quad \Leftrightarrow \alpha = \frac{-h_2^p}{h_1^p - h_2^p}$$

Richardson Extrapolation: Observations,

What are α and β for a first-order (e.g. finite-difference) method if we choose $h_2 = h_1/2$?

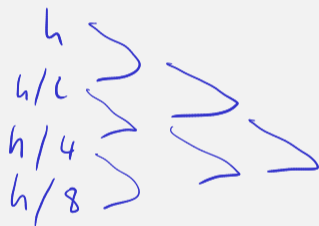
$$\alpha = \frac{-h_2^p}{h_1^p - h_2^p} = \frac{-(\frac{1}{2})}{1 - \frac{1}{2}} = -1$$

$$\beta = 2.$$

Demo: Richardson with Finite Differences [cleared]

Romberg Integration

Can this be used to get *even higher order* accuracy?



Outline

Introduction to Scientific Computing

Systems of Linear Equations

Linear Least Squares

Eigenvalue Problems

Nonlinear Equations

Optimization

Interpolation

Numerical Integration and Differentiation

Initial Value Problems for ODEs

Existence, Uniqueness, Conditioning

Numerical Methods (I)

Accuracy and Stability

Stiffness

Numerical Methods (II)

Boundary Value Problems for ODEs

Partial Differential Equations and Sparse Linear Algebra

Fast Fourier Transform

Additional Topics

What can we solve already?

- ▶ Linear Systems: **yes**
- ▶ Nonlinear systems: **yes**
- ▶ Systems with derivatives: **no**

Some Applications

$$y_1(t) \propto y_1(t)$$

IVPs	BVPs
<ul style="list-style-type: none">▶ Population dynamics $y_1' = y_1(\alpha_1 - \beta_1 y_2)$ (prey) $y_2' = y_2(-\alpha_2 + \beta_2 y_1)$ (predator)▶ chemical reactions▶ equations of motion	<ul style="list-style-type: none">▶ bridge load▶ pollutant concentration (steady state)▶ temperature (steady state)▶ waves (time-harmonic)

Demo: Predator-Prey System [cleared]

$$\vec{y}_0 = \vec{y}(0)$$

$$y'(h) = f(\vec{y}(h))$$

$$\vec{y}(h) = \vec{y}_0 + f(\vec{y}_0) \cdot h$$

Initial Value Problems: Problem Statement

Want: Function $\mathbf{y} : [0, T] \rightarrow \mathbb{R}^n$ so that

- ▶ $\mathbf{y}^{(k)}(t) = \mathbf{f}(t, \mathbf{y}, \mathbf{y}', \mathbf{y}'', \dots, \mathbf{y}^{(k-1)})$ (*explicit*), or
- ▶ $\mathbf{f}(t, \mathbf{y}, \mathbf{y}', \mathbf{y}'', \dots, \mathbf{y}^{(k)}) = 0$ (*implicit*)

are called explicit/implicit k th-order ordinary differential equations (ODEs).

Give a simple example.

Not uniquely solvable on its own. What else is needed?

need initial conditions

$y(0) = g_0 \dots \quad y^{(k-1)}(0) = g_{k-1}$

Reducing ODEs to First-Order Form

A k th order ODE can always be reduced to first order. Do this in this example:

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

$$y' = v$$

$$v' = w$$

$$w' = \dots$$

$$u = y$$

$$v = y'$$

$$\left(\begin{array}{l} u' = v \\ v' = (y'') = f(y) \end{array} \right)$$

Conditioning

Unfortunate terminology accident: "Stability" in ODE-speak
To adapt to conventional terminology, we will use 'Stability' for

- ▶ the conditioning of the IVP, *and*
- ▶ the stability of the methods we cook up.

Some terminology:

An IVP is **stable** if and only if...



An IVP is **asymptotically stable** if and only if

Example I: Scalar, Constant-Coefficient

$$\begin{cases} y'(t) = \lambda y \\ y(0) = y_0 \end{cases} \quad \text{where } \lambda = a + ib$$

Solution?

When is this stable?

Example II: Constant-Coefficient System

$$\begin{cases} \mathbf{y}'(t) = A\mathbf{y}(t) \\ \mathbf{y}(t_0) = \mathbf{y}_0 \end{cases}$$

Assume $V^{-1}AV = D = \text{diag}(\lambda_1, \dots, \lambda_n)$ diagonal. Find a solution.

When is this stable?

Euler's Method

Discretize the IVP

$$\begin{cases} y'(t) = f(y) \\ y(t_0) = y_0 \end{cases}$$



- ▶ Discrete times: t_1, t_2, \dots with $t_{i+1} = t_i + h$
- ▶ Discrete function values: $y_k \approx y(t_k)$.

$$\vec{y}(t) = \vec{y}_0 + \int_0^t y' d\tau = \vec{y}_0 + \int_0^t f(y(\tau)) d\tau$$

$$= \vec{y}_0 + \sum_{i=0}^n f(y(\tau_i)) \omega_i$$

left rect. rule

$$\rightarrow \vec{y}_0 + f(y_0) h$$

not known

right rect. rule

backward. \rightarrow
$$\underbrace{y(t)}_{y_{nh}} = \vec{y}_0 + f(\underbrace{\vec{y}(t)}_{y_{nh}}) \cdot h$$

Euler's method: Forward and Backward

$$\mathbf{y}(t) = \mathbf{y}_0 + \int_{t_0}^t \mathbf{f}(\mathbf{y}(\tau))d\tau,$$

Use 'left rectangle rule' on integral:

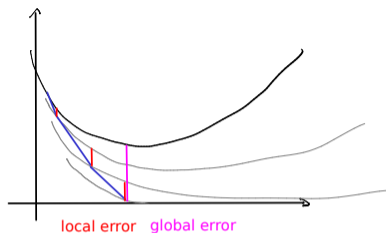


Use 'right rectangle rule' on integral:



[Demo: Forward Euler stability \[cleared\]](#)

Global and Local Error



Let $u_k(t)$ be the function that solves the ODE with the initial condition $u_k(t_k) = y_k$. Define the **local error** at step k as...

Define the **global error** at step k as...

About Local and Global Error

Is global error = \sum local errors?



A time integrator is said to be *accurate of order p* if...



ODE IVP Solvers: Order of Accuracy

A time integrator is said to be *accurate of order p* if $\ell_k = O(h^{p+1})$

This requirement is one order higher than one might expect—why?



Stability of a Method

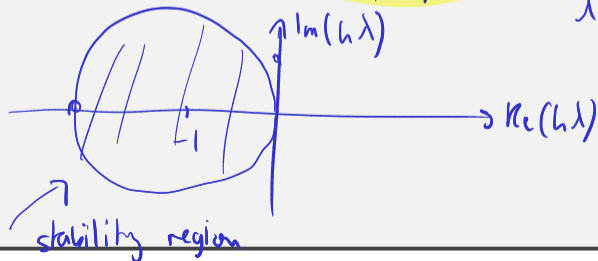
Find out when forward Euler is stable when applied to $y'(t) = \lambda y(t)$.

$$\begin{aligned}y_n &= y_{n-1} + h \lambda y_{n-1} \\ &= y_{n-1} (1 + h \lambda) \\ &= y_0 (1 + h \lambda)^k\end{aligned}$$

stable \Leftrightarrow

$$|1 + h \lambda| < 1$$

$\lambda \in \mathbb{C}$



Stability: Systems

What about stability for systems, i.e.

$$\mathbf{y}'(t) = A\mathbf{y}(t)?$$

diagonalize

Stability: Nonlinear ODEs

What about stability for nonlinear systems, i.e.

$$\mathbf{y}'(t) = \mathbf{f}(\mathbf{y}(t))?$$

linearize, diagonalize.

Stability for Backward Euler

Find out when backward Euler is stable when applied to $y'(t) = \lambda y(t)$.

$$y_n = y_{n-1} + h\lambda y_n$$

$$y_n(1 - h\lambda) = y_{n-1}$$

$$y_n = y_{n-1} \left(\frac{1}{1 - h\lambda} \right)^{|k|}$$

$$= y_0 \left(\frac{1}{1 - h\lambda} \right)^k$$

4/4

$$|1 - h\lambda| \geq 1$$



ODE stable \Leftrightarrow Re(λ) < 0

all stable w/ backward Euler

Demo: Backward Euler stability [cleared]