

# EXERCISE SET 3

## Numerical Methods for Hyperbolic Partial Differential Equations

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Lecturer: Dr. Philipp Öffner

Teaching Assistant: Davide Torlo

In this exercise sheet we study the implicit central difference method (ICD), i.e., the central difference method with implicit euler method.

Given the conservation laws

$$\partial_t u + \partial_x F(u) = 0, \quad (1)$$

the ICD reads

$$u_j^{n+1} = u_j^n - \frac{\Delta t}{2\Delta x} (F(u_{j+1}^{n+1}) - F(u_{j-1}^{n+1})), \quad (2)$$

where we consider a uniform point distribution  $\{x_j\}_{j=1}^{N+1}$  over the interval  $[a, b]$ , where  $x_1 = a$  and  $x_{N+1} = b$  and  $u_j \approx u(x_j)$ , while the superscript  $n$  denotes the timestep  $t^n$ , hence,  $u_j^n \approx u(t^n, x_j)$ .

We consider, in particular, the linear transport equations, i.e.,  $F(u) = c \cdot u$ , with  $c \in \mathbb{R}$  the transport speed. This allows to collect all the  $n + 1$  terms on the left hand side and obtain a matrix  $M$  that we can invert to have the method ICD written as

$$\mathbf{u}^{n+1} = M^{-1} \mathbf{u}^n. \quad (3)$$

Moreover, we consider periodic boundary conditions, so that  $u(t^n, a) = u_1^n = u_{N+1}^n = u(t^n, b)$ , for every  $t^n$ .

### Problem 3.1 Mass matrix (2pts)

1. Write explicitly the scheme for the linear transport equation and the mass matrix  $M$  and highlight which parameters it depends on.

#### Solution

The ICD method for the transport equation can be written as

$$u_j^{n+1} = u_j^n - \frac{c\Delta t}{2\Delta x} (u_{j+1}^{n+1} - u_{j-1}^{n+1}) \quad (4)$$

$$u_j^{n+1} + \frac{c\Delta t}{2\Delta x} (u_{j+1}^{n+1} - u_{j-1}^{n+1}) = u_j^n. \quad (5)$$

Hence, if we define  $\beta = \frac{c\Delta t}{2\Delta x}$  the mass matrix is on a general line  $j$

$$M_{j,j} = 1, \quad M_{j,j+1} = \beta, \quad M_{j,j-1} = -\beta, \quad j = 2, \dots, N-1. \quad (6)$$

For the first and last line ( $N$ th line, we skip the point  $N + 1$  which is identical to the first because of the periodic boundary conditions) we have to apply the periodic boundary conditions. So,

$$\begin{aligned} M_{1,1} &= 1, & M_{1,2} &= \beta, & M_{1,N} &= -\beta \\ M_{N,N} &= 1, & M_{N,1} &= \beta, & M_{N,N-1} &= -\beta. \end{aligned}$$

2. Find the condition under which the matrix  $M$  is diagonally dominant by rows and, hence, invertible.

### Solution

The matrix  $M$  is diagonally dominant by row if

$$|M_{j,j}| > \sum_{k \neq j} |M_{j,k}|$$
$$1 > 2|\beta|.$$

This condition is verified when

$$2|\beta| = \frac{|c|\Delta t}{\Delta x} < 1. \quad (7)$$

This condition is the so-called CFL (Courant–Friedrichs–Levy) condition.

### Problem 3.2 Energy stability (2pts)

Define the energy of the discrete solution  $\mathbf{u}^n$  as

$$\mathcal{E}(\mathbf{u}^n) = \sum_{j=1}^N \frac{(u_j^n)^2}{2}. \quad (8)$$

Prove that the ICD is energy stable, i.e.,  $\mathcal{E}(\mathbf{u}^{n+1}) \leq \mathcal{E}(\mathbf{u}^n)$ .

### Solution

We recall the definition of the ICD scheme

$$u_j^{n+1} - u_j^n + \frac{c\Delta t}{2\Delta x} (u_{j+1}^{n+1} - u_{j-1}^{n+1}) = 0. \quad (9)$$

Now, we multiply by  $u_j^{n+1}$  the whole scheme and we obtain

$$u_j^{n+1}(u_j^{n+1} - u_j^n) + \beta (u_j^{n+1}u_{j+1}^{n+1} - u_j^{n+1}u_{j-1}^{n+1}) = 0. \quad (10)$$

Using the equality  $\alpha_1(\alpha_1 - \alpha_2) = \frac{\alpha_1^2}{2} - \frac{\alpha_2^2}{2} + \frac{1}{2}(\alpha_1 - \alpha_2)^2$ , we can write

$$\frac{(u_j^{n+1})^2}{2} - \frac{(u_j^n)^2}{2} + \frac{1}{2}(u_j^{n+1} - u_j^n)^2 + \beta (u_j^{n+1}u_{j+1}^{n+1} - u_j^{n+1}u_{j-1}^{n+1}) = 0. \quad (11)$$

Summing over  $j$  and collecting the terms that sum up to the energy, we have

$$\mathcal{E}(\mathbf{u}^n) = \sum_j \frac{(u_j^n)^2}{2} = \sum_j \left( \frac{(u_j^{n+1})^2}{2} + \frac{1}{2}(u_j^{n+1} - u_j^n)^2 + \beta (u_j^{n+1}u_{j+1}^{n+1} - u_j^{n+1}u_{j-1}^{n+1}) \right) \quad (12)$$

$$= \underbrace{\mathcal{E}(\mathbf{u}^{n+1}) + \sum_j \frac{1}{2}(u_j^{n+1} - u_j^n)^2}_{\geq 0} + \underbrace{\beta \sum_j (u_j^{n+1}u_{j+1}^{n+1} - u_j^{n+1}u_{j-1}^{n+1})}_{=0, \text{ telescopic sum}} \geq \mathcal{E}(\mathbf{u}^{n+1}). \quad (13)$$

Hence, the energy is decreasing in time, so the ICD scheme is energy stable.

### Problem 3.3 Von Neumann Stability (2pts)

Prove that the ICD is also von Neumann stable. Suppose that  $u$  is a wave with wave number  $\lambda \in \mathbb{N}^+$  and it grows exponentially in time, i.e.,

$$u(t, x) = e^{\alpha t} e^{i\lambda x}. \quad (14)$$

This is a solution for the transport equation with periodic boundary conditions on  $[0, 2\pi]$  for  $\alpha = 0$ . If for the method  $\alpha(\lambda)$  is positive for any  $\lambda$ , the scheme is unstable, if  $\alpha(\lambda)$  is non-positive for all  $\lambda$ , the scheme is stable.

Prove that ICD is von Neumann stable.

#### Solution

Starting from the definition of the ICD scheme, we substitute the ansatz (14) and the discretizations  $t^n = n\Delta t$  and  $x_j = j\Delta x$ , obtaining

$$u_j^{n+1} - u_j^n + \beta (u_{j+1}^{n+1} - u_{j-1}^{n+1}) = 0, \quad (15)$$

$$e^{\alpha t^{n+1}} e^{i\lambda x_j} - e^{\alpha t^n} e^{i\lambda x_j} + \beta (e^{\alpha t^{n+1}} e^{i\lambda x_{j+1}} - e^{\alpha t^{n+1}} e^{i\lambda x_{j-1}}) = 0, \quad (16)$$

$$e^{\alpha t^n} e^{i\lambda x_j} (e^{\alpha \Delta t} - 1 + e^{\alpha \Delta t} \beta (e^{i\lambda \Delta x} - e^{-i\lambda \Delta x})) = 0, \quad (17)$$

$$e^{\alpha \Delta t} = \frac{1}{1 + i2\beta \sin(\lambda \Delta x)}. \quad (18)$$

Now, we can study the absolute value of the amplification factor  $|e^{\alpha \Delta t}|$ , which is  $|1 + i2\beta \sin(\lambda \Delta x)|^{-1} = 1/\sqrt{1 + 4\beta^2 \sin^2(\lambda \Delta x)} < 1$  for all possible  $\lambda \neq 0$ . Hence, the ICD is also von Neumann stable.

### Problem 3.4 Implementation of the method (4pts)

Implement the ICD in MATLAB (or Python or Julia). Use already implemented functions for the inversion of the matrix.

Keep as input variables  $c$  the speed of the transport equation,  $N$  number of subintervals of the domain, CFL number ( $c\Delta t \leq \text{CFL}\Delta x$ ),  $T$  the final time,  $a$  and  $b$  the domain extrema,  $u_0$  the initial conditions.

At the end, test your code with the following parameters and plot the initial and final solutions on the same figure.  $c = 1$ ,  $N = 200$ ,  $\text{CFL} = 0.75$ ,  $T = 2$ ,  $a = 0$ ,  $b = 1$ ,  $u_0 = \sin(2\pi x)$ .

Submit the code.

#### Solution

```

1 % We implement the implicit central difference method for transport
  % equation
3 % d_t u + a d_x u=0
  % with periodic boundary conditions.
5 % The method reads
  % u^{n+1}_j = u^n_j - c dt/2dx (u^{n+1}_{j+1} - u^{n+1}_{j-1})
7 plot_evolution=1;
  close all
9
  c=1;
11 CFL = 0.75; %dt/dx

13 N=200;
  T=2;

```

```

15 u0=@(x) sin(2*pi*x);
17 a=0;
18 b=1;
19
20 %%
21 [UU,xx,tt,XX,TT]=ICD(c,N,CFL,T,a,b,u0);
22 %for plotting purposes
23
24 mesh(XX,TT,UU)
25 xlabel('x')
26 ylabel('time')
27
28 figure()
29 plot(xx,UU(1,:), 'DisplayName','t=0')
30 hold on
31 plot(xx,UU(end,:), 'DisplayName','t=T')
32 xlabel('x')
33 legend()
34
35 %%
36
37 if(plot_evolution)
38     for n=[1:ceil(numel(tt)/20):numel(tt),numel(tt)]
39         figure(4)
40         plot(xx,UU(n,:),...
41              xx,u0(xx-c*tt(n)), 'r—')
42         legend('numerical','analytical','Location','SE')
43         xlabel x
44         ylabel u
45         title(sprintf('upwind, t=%g',tt(n)))
46         ylim([-1.5,1.5])
47         disp(n)
48         drawnow
49         pause(.02)
50     end
51 end
52
53 function [UU,xx,tt,XX,TT]=ICD(c,N,CFL,T,a,b,u0)
54 % Tools of the method
55
56 dx=(b-a)/N;
57 dt=dx/CFL/c;
58 Nt=ceil(T/dt);
59 dt=T/(Nt);
60
61 xx=linspace(a,b,N+1);
62 xx=xx(1:end-1);
63
64 tt=linspace(0,T,Nt+1);
65
66 [XX,TT]=meshgrid(xx,tt);
67
68 UU=zeros(size(XX));
69 UU(1,:)=u0(XX(1,:));
70 %Iteration matrix to be inverted is defined as
71 % M_{ii}=1, M_{i,i+1}=c*dt/2dx, M_{i,i-1}=-c*dt/2dx
72 M=eye(N) + c*dt/dx/2*(diag(ones(N-1,1),1) -diag(ones(N-1,1),-1));
73 M(N,1)=c*dt/dx/2;
74 M(1,N)=-c*dt/dx/2;

```

```
79 invM=inv(M);  
81 un=reshape(UU(1,:),N,1);  
   for it=1:Nt  
83     UU(it+1,:)=invM*reshape(UU(it,:),N,1);  
   end  
85 end
```

Listing 1: implicitCD.m

**Organiser:** Davide Torlo, Office: home (davide.torlo@math.uzh.ch)

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