## Exercise set 5

### Numerical Methods for Hyperbolic Partial Differential Equations

IMATH, FS-2020

Lecturer: Dr. Philipp Öffner Teaching Assistant: Davide Torlo

# Problem 5.1 Lax-Friedrichs scheme (5pts + 1 extra point)

We study in this exercise the Lax-Friedrichs scheme. For a conservation law

$$\partial_t u(t,x) + \partial_x f(u(t,x)) = 0, (1)$$

with  $x \in [a, b]$  and  $t \in [0, T]$ , the method reads

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

with the usual FD notation.

1. Prove that the scheme is first order accurate: define the local truncation error as

$$E = u(t^{n+1}, x_j) - u_j^{n+1}, (3)$$

supposing that  $u(t^n, x_j) = u_j^n$  for all j and that u(t, x) is regular enough, prove that  $E = \mathcal{O}(\Delta t^2)$ , with the usual CFL conditions  $\Delta t = \lambda \Delta x$ .

### Solution

Let us use the Taylor expansion in  $u_j^n$  for all the terms in (2) and the properties of the equation (1). Using the notation  $u = u_i^n$ , we have that

$$\begin{split} u_j^{n+1} &= \frac{u_{j-1}^n + u_{j+1}^n}{2} - \frac{\Delta t}{\Delta x} \frac{f(u_{j+1}^n) - f(u_{j-1}^n)}{2} = \\ &= \frac{u - \Delta x u_x + \frac{\Delta x^2}{2} u_{xx} + u + \Delta x u_x + \frac{\Delta x^2}{2} u_{xx}}{2} \\ &- \frac{\Delta t}{\Delta x} \frac{f(u) + \Delta x f(u)_x + \frac{\Delta x^2}{2} f(u)_{xx} - f(u) + \Delta x f(u)_x - \frac{\Delta x^2}{2} f(u)_{xx}}{2} + \mathcal{O}(\Delta x^3) = \\ &= u + \frac{\Delta x^2}{2} u_{xx} - \Delta t f(u)_x + \mathcal{O}(\Delta x^3). \end{split}$$

Now, we can compute the local truncation error

$$E = u + \Delta t u_t + \frac{\Delta t^2}{2} u_{tt} - u - \frac{\Delta x^2}{2} u_{xx} + \Delta t f(u)_x + \mathcal{O}(\Delta x^3) =$$

$$= \Delta t \underbrace{(u_t + f(u)_x)}_{=0} + \frac{\Delta x^2}{2} (\lambda^2 u_{tt} - u_{xx}) + \mathcal{O}(\Delta x^3) = \mathcal{O}(\Delta t^2)$$

2. Find the conditions under which the scheme is von Neumann stable (use periodic boundary conditions and linear transport equation  $f(u) = c \cdot u$ ).

### Solution

With the usual, we have that

$$e^{\alpha \Delta t} u_j^n = \frac{e^{i\Delta xk} + e^{-i\Delta xk}}{2} u_j^n - \lambda c \frac{e^{i\Delta xk} - e^{-i\Delta xk}}{2} u_j^n = \tag{4}$$

$$= (\cos(\Delta x k) + i\lambda c \sin(\Delta x k)) u_i^n. \tag{5}$$

Then we know that  $|e^{\alpha \Delta t}|^2 = \cos^2(\Delta x k) + \lambda^2 c^2 \sin^2(\Delta x k)$ . The Lax–Friedrichs scheme is von Neumann stable if  $\lambda |c| \leq 1$ , the usual CFL conditions.

- 3. Code the method for a linear transport equation with periodic boundary conditions. Pass as input c the speed of the transport equation, N number of subintervals of the domain, CFL number ( $\Delta t := \text{CFL}\Delta x/|c|$ ), T the final time, a and b the domain extrema,  $u_0$  the initial conditions.
- 4. Test the code with c = 1, N = 200, CFL = 0.9, T = 1, a = -1, b = 1,  $u_0 = \cos(\pi x)$ .
- 5. Check the numerical order of accuracy: for number of cells  $N \in \{2^k | k = 1, ..., 10\}$ , run the Lax-Friedrichs scheme and compute the final  $\mathbb{L}^2$  error with respect to the exact solution

$$||u(T) - u_{ex}(T)||_2 := \sqrt{\Delta x \sum_{j=1}^{N} (u(T, x_j) - u_{ex}(T, x_j))^2}.$$
 (6)

Plot the error vs  $\Delta x$  and a reference first order decay. Verify that they have the same rate of convergence.

### Solution

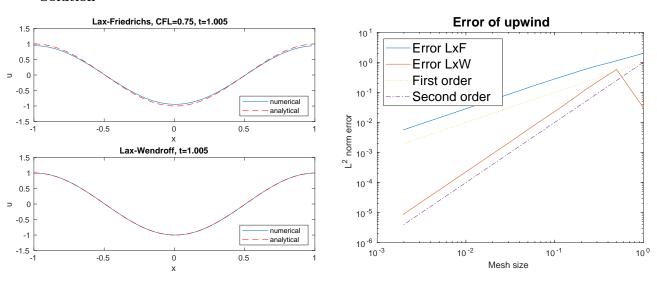


Figure 1: Lax Friedrichs and Lax Wendroff schemes CFL=0.75: test on left, error on right

6. (Extra 1 point) Run again the script for the order convergence with CFL=1. What do you observe and why?

### Solution

If CFL are 1, i.e.,  $\lambda |c| = 1$ , we have that in the local truncation error, the second order term

$$\frac{\Delta x^2}{2} \left( \lambda^2 u_{tt} - u_{xx} \right) = \left( \lambda^2 c^2 u_{xx} - u_{xx} \right) = 0. \tag{7}$$

We showed like this that the scheme becomes at least a second order scheme. One can proceed with higher order terms and see that all of them vanish, resulting in an exact scheme. More precisely, the even terms of the spatial derivatives come from the term  $\frac{u_{j-1}^n + u_{j+1}^n}{2}$ , while the odd terms come from the  $\Delta t \frac{f(u_{j+1}^n) - f(u_{j-1}^n)}{\Delta x}$ .

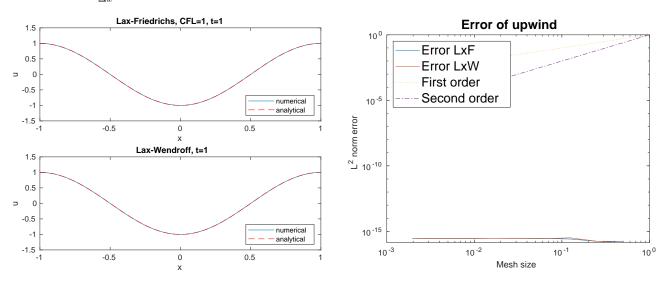


Figure 2: Lax Friedrichs and Lax Wendroff schemes CFL=1: test on left, error on right

```
function [u,t,x, varargout] = lxf(c, N, cfl, T, a,b, u0, varargin)
            Solve the advection equation u_{-}t + c u_{-}x = 0 using the
       upwind/downwind scheme. The solution is computed on the periodic domain
  %
      [-a, b) up to t=tMax.
       if nargin>7
           with_error=1;
           with_error=0;
      end
11
    % Create the mesh
    x = linspace(a, b, N+1);
    dx = x(2)-x(1);
                       \% Mesh with ghost cells \{\,x\_0\,\,,\ \dots,\ x\_\{N+1\}\}
    x = [x(N), x];
                     \% Index into the internal mesh 1, \dots, N
      = 2 : N+1;
17
    % Set initial data and advection speed
19
    aMax = abs(c);
       if with_error
           u_exact=0(x,t) u0(x-c*t);
21
         uu_exact(1,:) = u_exact(x,0);
23
      u(1,:) = u0(x);
    % Set the timestep and make sure that tMax/dt is an integer
27
    dt = cfl * dx/aMax;
    nt = ceil(T / dt) + 1;
    t = [0:nt-1]*dt; \% linspace(0, T, nt);
    %dt = t(2)-t(1);
31
    lambda = dt/dx;
    % Run the simulation
```

```
for n = 2:nt
35
        % Update the solution
        u\,(\,n\,,\,j\,) \;=\; (\,u\,(\,n\,-\,1\,,\,j\,+\,1\,) + u\,(\,n\,-\,1\,,\,j\,-\,1\,)\,)\,/\,2 \;\;-\; lambda/2 * \, c * \, (\,u\,(\,n\,-\,1\,,\,j\,+\,1\,) - u\,(\,n\,-\,1\,,\,j\,-\,1\,)\,) \;;
37
        \% Set boundary conditions
39
        u(n,1) = u(n,N+1);
        u(n, N+2) = u(n, 2);
41
              if with_error
                    uu_exact(n,:) = u_exact(x,t(n));
              end
        end
45
         if \quad with\_error
           errL2end= norm(u(end,:)-uu_exact(end,:))*sqrt(dx);
47
              varargout={uu_exact, errL2end};
         else
49
              varargout = \{\};
        end
     % Remove the ghost cell to the left
     x = x(2: end -1);
     u = u(:, 2: end -1);
   end
```

Listing 1: lxf.m

```
| \text{function} [u, t, x, \text{varargout}] = \text{lxw}(c, N, \text{cfl}, T, a, b, u0, \text{varargin}) 
             Solve the advection equation u_{-}t + c u_{-}x = 0 using the
       upwind/downwind scheme. The solution is computed on the periodic domain
  %
       [-a, b) up to t=tMax.
       if nargin>7
            with_error=1;
       else
            with_error=0;
       end
    % Create the mesh
    x = linspace(a, b, N+1);
13
    dx = x(2)-x(1);
                       \% Mesh with ghost cells \{x\_0\,,\ \dots,\ x\_\{N\!+\!1\}\} % Index into the internal mesh 1\,,\dots\,,N
    \mathbf{x} = [\mathbf{x}(\mathbf{N}), \mathbf{x}];
     j = 2 : N+1;
    % Set initial data and advection speed
19
    aMax = abs(c);
       if with_error
           u_exact=@(x,t) u0(x-c*t);
          uu_exact(1,:) = u_exact(x,0);
       end
23
       u(1,:) = u0(x);
    \% Set the timestep and make sure that tMax/dt is an integer
     dt = cfl * dx/aMax;
     nt = ceil(T / dt) + 1;
    t = [0:nt-1]*dt; \% linspace(0, T, nt);
    %dt = t(2)-t(1);
31
    lambda = dt/dx;
33
    % Run the simulation
    for n = 2:nt
35
       % Update the solution
       u(n,j) = u(n-1,j) - lambda/2*c*(u(n-1,j+1)-u(n-1,j-1)) \dots
37
                 + c.^2 * lambda^2 / 2 * (u(n-1,j-1)-2 * u(n-1,j)+u(n-1,j+1));
39
       % Set boundary conditions
```

```
u(n,1) = u(n,N+1);
41
      u(n,N+2) = u(n,2);
           if with_error
43
               uu_exact(n,:) = u_exact(x,t(n));
           end
45
       end
       if \quad with\_error
         errL2end= norm(u(end,:)-uu_exact(end,:))*sqrt(dx);
           varargout={uu_exact,errL2end};
49
           varargout={};
51
       end
    % Remove the ghost cell to the left
    x = x(2: end -1);
    u = u(:, 2: end -1);
  end
```

Listing 2: lxw.m

```
% test lxf
   c=1;
   \%cfl=0.75;
   T=1;
   a = -1:
   u0=@(x) cos(pi*x);
10 % run lxf scheme
_{12} | Nx = 100;
   tfin = 1.;
   cfl = 1;
    with_error=1;
   plot_evolution=1;
   [\,u\,l\,x\,f\,\,,\,t\,\,,\,x\,\,,\,e\,x\,\,,\,e\,r\,r\,\,] \,\,=\,\,l\,x\,f\,(\,c\,\,,\,\,\,N\,x\,,\,\,\,c\,f\,l\,\,,\,\,\,t\,f\,i\,n\,\,\,,\,\,\,a\,\,,\,b\,\,,\,\,\,u\,0\,\,,\,\,\,w\,i\,t\,h\,\,\_\,e\,r\,r\,o\,r\,\,)\,\,;
    [ulxw,t,x,ex,err] = lxw(c, Nx, cfl, tfin, a,b, u0, with\_error);
   % plot evolution
   dx = x(2)-x(1);
   u0 = @(x) \cos(pi*x);
24
   fig=figure(1);
    if ( plot_evolution )
          for n = [1: ceil(numel(t)/20): numel(t), numel(t)]
26
               figure (1)
28
               subplot (211)
               plot(x, ulxf(n,:),...
    x, u0(x-c*t(n)),'r--')
legend('numerical','analytical','Location','SE')
30
32
               xlabel x
               ylabel u
                title\left(sprintf(\,{}^{\backprime}Lax-Friedrichs\;,\;CFL\!\!=\!\!\%\!g\,,\;\;t\!\!=\!\!\%\!g\,{}^{\backprime},cfl\;,t\left(n\right)\right))
               ylim([-1.5,1.5])
36
               subplot (212)
38
                plot(x, ulxw(n,:),...
               x,u0(x-c*t(n)),'r--')
legend('numerical','analytical','Location','SE')
40
42
               xlabel x
               ylabel u
                title(sprintf('Lax-Wendroff, t=\%g',t(n)))
               ylim([-1.5, 1.5])
```

```
46
           %
            drawnow
48
            pause (.02)
       \quad \text{end} \quad
50
52
   saveas(fig , 'LxFtest.pdf')
   % plot TV instability for upwind
56
   fig=figure
   TVlxf=zeros(size(t));
58
   ulxf_1=zeros(size(ulxf));
   ulxf_1(:,1:end-1)=ulxf(:,2:end);
60
   ulxf_1(:,end)=ulxf(:,1);
   TVlxw=zeros(size(t));
   ulxw_1=zeros(size(ulxw));
   ulxw_1(:,1:end-1)=ulxw(:,2:end);
   ulxw_1(:,end)=ulxw(:,1);
   for n=1:numel(t)
       TVlxf(n) = sum(abs(ulxf(n,:)-ulxf_1(n,:)))*dx;
68
       TVlxw(n) = sum(abs(ulxw(n,:)-ulxw_1(n,:)))*dx;
70
   end
   semilogy(t,TVlxf,'DisplayName','LxF')
  hold on
   semilogy(t,TVlxw,'DisplayName','LxW')
   xlabel('t', 'FontSize', 16)
  ylabel ('Total Variation', 'FontSize', 16)
title ('Total Variation', 'FontSize', 16)
   legend('FontSize',15,'Location','NW')
   hold off
saveas (fig, 'TVlxflxw.pdf')
84 % plot error convergence
   tfin = 1.;
  cfl = 0.75;
   with_error=1;
   nn=10;
  Nxs = 2.^{[1:nn]};
   errlxf=zeros(size(Nxs));
   errlxw=zeros(size(Nxs));
92
   for k=1:nn
       Nx=Nxs(k);
94
       hs(k)=2/Nx;
       [ulxf,t,x,ex, err] = lxf(c, Nx, cfl, tfin, a,b, u0, 1);
96
       errlxf(k)=err;
       [ulxw, t, x, ex, err] = lxw(c, Nx, cfl, tfin, a,b, u0, 1);
98
       errlxw(k)=err;
100
  end
102 | fig=figure()
   loglog(hs, errlxf, 'DisplayName', 'Error LxF')
   hold on
   loglog(hs,errlxw, 'DisplayName', 'Error LxW')
  title ('Error of upwind', 'FontSize', 16)
   ylabel ('L^2 norm error')
  xlabel('Mesh size')
   hold on
```

```
loglog(hs,hs,':','DisplayName','First order')
loglog(hs,hs.^2,'-.','DisplayName','Second order')
legend('Location','NW','FontSize',16)
saveas(fig,sprintf('errorLxFcfl%g.pdf',cfl))
```

Listing 3: testLxF.m

# Problem 5.2 Source terms (5pts + 2 extra pts)

Consider now the linear transport equation with a source term

$$\partial_t u(t,x) + c\partial_x u(t,x) = S(u(x,t)) \tag{8}$$

with initial condition  $u_0(x)$ .

1. Compute the exact solution of (8) for smooth initial data  $u_0$  when the source is  $S(u(t,x)) = s \cdot u(t,x)$  for  $s \in \mathbb{R}$ .

### Solution

We know the solution of the homogeneous problem  $u_t + cu_x = 0$  which is  $u(t, x) = u_0(x - ct)$ . To obtain the solution of the source problem, we can consider an ODE, with initial condition the solution just found, i.e.

$$\begin{cases} \frac{du}{dt} = su\\ u_0 = u_0(x - ct). \end{cases}$$
(9)

The solution is clearly  $u(x,t) = e^{st}u_0(x-ct)$  and we can verify it substituting the solution in the equation. We get that

$$\partial_t u(t,x) + c\partial_x u(t,x) = S(u(x,t)) \tag{10}$$

$$se^{st}u_0(x-ct) - ce^{st}u_0'(x-ct) + ce^{st}u_0'(x-ct) = se^{st}u_0(x-ct).$$
(11)

2. Write an explicit first order scheme based on the Lax–Friedrichs (2) to solve the linear equation with a source term. The update formula for  $u_j^{n+1}$  should depend only on  $u_{j-1}^n$ ,  $u_j^n$  and  $u_{j+1}^n$ , i.e., the footprint of the stencil is 3 (there are infinitely many possibilities). Prove that it is first order accurate with Taylor expansions as in (3).

#### Solution

There are many options as we need just a first order scheme. One non totally trivial is

$$u_j^{n+1} = \frac{u_{j-1}^n + u_{j+1}^n}{2} - \frac{\Delta t}{\Delta x} \frac{f(u_{j+1}^n) - f(u_{j-1}^n)}{2} + \Delta t \frac{S(u_{j-1}^n) + S(u_{j+1}^n)}{2}.$$
 (12)

We can actually write all the possible schemes as

$$u_j^{n+1} = \frac{u_{j-1}^n + u_{j+1}^n}{2} - \frac{\Delta t}{\Delta x} \frac{f(u_{j+1}^n) - f(u_{j-1}^n)}{2} + z_{-1} S(u_{j-1}^n) + z_0 S(u_j^n) + z_1 S(u_{j+1}^n). \tag{13}$$

Then we can check which condition we need to impose on the coefficients zs in order to get a first order scheme. Consider now the local truncation error

$$E = u + \Delta t u_t + \frac{\Delta t^2}{2} u_{tt} - u - \frac{\Delta x^2}{2} u_{xx} + \Delta t f(u)_x - \left(z_{-1} S(u_{j-1}^n) + z_0 S(u_j^n) + z_1 S(u_{j+1}^n)\right) + \mathcal{O}(\Delta x^3) =$$

$$= \Delta t u_t + \frac{\Delta t^2}{2} u_{tt} - \frac{\Delta x^2}{2} u_{xx} + \Delta t f(u)_x - \left(z_{-1} + z_0 + z_1\right) S(u) + \Delta t \Delta x \left(z_1 - z_{-1}\right) S(u)_x + \mathcal{O}(\Delta x^3) =$$

$$= \Delta t \left(u_t + f(u)_x - \frac{z_{-1} + z_0 + z_1}{\Delta t} S(u)\right) + \frac{\Delta t^2}{2} u_{tt} - \frac{\Delta x^2}{2} u_{xx} + \Delta t \Delta x \left(z_1 - z_{-1}\right) S(u)_x + \mathcal{O}(\Delta x^3).$$

Since we want a 1st order scheme, we just have to check that the  $\mathcal{O}(\Delta x^2)$  should vanish. Knowing that  $u_t + f(u)_x - S(u) = 0$ , it is clear that  $z_{-1} + z_0 + z_1 = \Delta t$ . This condition guarantees that the scheme is consistent and first order accurate.

- 3. Create a new function that implements your method for the linear equation with the linear source term  $S(u) = s \cdot u$  (modify the function of the previous exercise, adding also an extra input s).
- 4. Test it with s = -0.5 and c = 1, CFL = 0.9, T = 1, a = -1, b = 1,  $u_0 = \cos(\pi x)$  and compute the numerical error decay as in (6). Is the accuracy of the scheme correct?
- 5. Consider the following semi-implicit scheme based on the Lax-Wendroff method

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

$$(14)$$

What is its order of accuracy? Use the Taylor expansion.

### Solution

Using the notation  $u=u_j^n,\,\lambda=\frac{\Delta t}{\Delta x}$ , we expand with the Taylor series all the terms of the local truncation error till the second order terms:

$$-E = -u - \Delta t u_t - \frac{\Delta t^2}{2} u_{tt} + u - c \underbrace{\lambda \Delta x}_{=\Delta t} u_x + c^2 \underbrace{\lambda^2 \frac{\Delta x^2}{2}}_{=\Delta t^2/2} u_{xx} + \Delta t S(u) + \frac{\Delta t^2}{2} S(u)_t - \frac{c \Delta t^2}{2} S(u)_x + \mathcal{O}(\Delta t^3) =$$

$$= -\Delta t \underbrace{\left(u_t + c u_x - S(u)\right)}_{=0} - \frac{\Delta t^2}{2} \left(u_{tt} - c^2 u_{xx} - S(u)_t + c S(u)_x\right) + \mathcal{O}(\Delta t^3) =$$

$$= -\frac{\Delta t^2}{2} \left((-c u_x + S(u))_t - c^2 u_{xx} - S(u)_t + c S(u)_x\right) + \mathcal{O}(\Delta t^3) =$$

$$= -\frac{\Delta t^2}{2} \left((-c(-c u_x + S(u))_x) + S'(u) u_t - c^2 u_{xx} - S(u)_t + c S(u)_x\right) + \mathcal{O}(\Delta t^3) =$$

$$= -\frac{\Delta t^2}{2} \left(c^2 u_{xx} - c S'(u) u_x + S'(u) u_t - c^2 u_{xx} - S(u)_t + c S(u)_x\right) + \mathcal{O}(\Delta t^3) = \mathcal{O}(\Delta t^3).$$

6. (Extra 2 points) Implement the method (14) for the linear source  $S(u) = s \cdot u$  and periodic boundary conditions and test the numerical accuracy of the scheme.

#### Solution

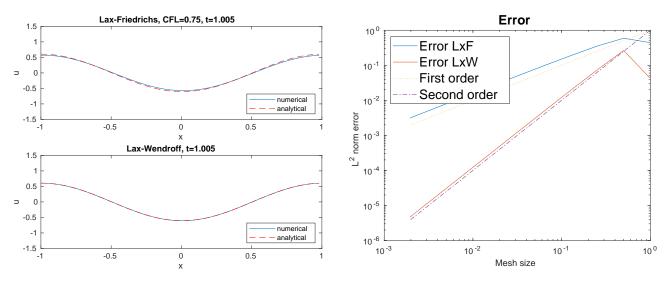


Figure 3: Lax Friedrichs with central source and Lax Wendroff type scheme (14) at CFL=0.8: test on left, error on right

```
if nargin>8
           with_error=1;
            \label{eq:with_error} \text{with}_-\text{error}\!=\!0;
       end
    % Create the mesh
     x = linspace(a, b, N+1);
    dx = x(2)-x(1);
     x = [x(N), x];
                         \% Mesh with ghost cells \{\,x\mbox{-}0\,,\ \dots,\ x\mbox{-}\{N\mbox{+}1\}\}
                       \% Index into the internal mesh -1\;,\ldots\;,N
     j = 2 : N+1;
17
    % Set initial data and advection speed
    aMax = abs(c);
19
       if with_error
           u_exact=@(x,t) exp(s*t)*u0(x-c*t);
21
         uu_exact(1,:) = u_exact(x,0);
23
       u(1,:) = u0(x);
25
    % Set the timestep and make sure that tMax/dt is an integer
27
     dt = cfl * dx/aMax;
     nt = ceil(T / dt) + 1;
     t = [0:nt-1]*dt; \% linspace(0, T, nt);
    %dt = t(2)-t(1);
31
     lambda = dt/dx;
    % Run the simulation
     for n = 2:nt
       % Update the solution
       u(n,j) = (u(n-1,j+1)+u(n-1,j-1))/2 - lambda/2*c*(u(n-1,j+1)-u(n-1,j-1))...
37
                +dt*0.5*s*(u(n-1,j+1)+u(n-1,j-1));
39
      % Set boundary conditions
       u(n,1) = u(n,N+1);
41
       u(n,N+2) = u(n,2);
            if with_error
                uu_exact(n,:) = u_exact(x,t(n));
```

Listing 4: lxfSource.m

```
function [u,t,x, varargout] = lxwSourceImplicit(c, N, cfl, T, a,b, u0, s, varargin)
  %LAXFR
             Solve the advection equation u_t + c u_x = s u using the
       upwind/downwind scheme. The solution is computed on the periodic domain
  %
       [-a, b) up to t=tMax.
       if nargin>8
            with_error=1;
       else
            with_error=0;
       end
    \% Create the mesh
     x = linspace(a, b, N+1);
     dx = x(2)-x(1);
                       \% Mesh with ghost cells \{x\_0\,,\ \dots,\ x\_\{N\!+\!1\}\} % Index into the internal mesh 1\,,\dots\,,N
     x = [x(N), x];
     j = 2 : N+1;
     % Set initial data and advection speed
18
     aMax = abs(c);
       if with_error
20
            u_exact=@(x,t) exp(s*t)*u0(x-c*t);
          uu_exact(1,:) = u_exact(x,0);
       end
24
       u(1,:) = u0(x);
    % Set the timestep and make sure that tMax/dt is an integer
28
     dt = cfl * dx/aMax;
     nt = ceil(T / dt) + 1;
     t = [0:nt-1]*dt; \% linspace(0, T, nt);
30
     %dt = t(2)-t(1);
     lambda = dt/dx;
32
    % Run the simulation
34
     for n = 2:nt
       % Update the solution
       u\,(\,n\,,\,j\,) \;=\; u\,(\,n\,-\,1\,,\,j\,\,) - \;\; lambda\,/\,2 * \, c * (\,u\,(\,n\,-\,1\,,\,j\,+\,1) - u\,(\,n\,-\,1\,,\,j\,-\,1)\,) \quad \ldots
                + \ c.^2*lambda^2/2*(u(n-1,j-1)-2*u(n-1,j)+u(n-1,j+1))\dots
                +dt*0.5*s*(u(n-1,j)) ...
                 -c*dt^2/4/dx*s*(u(n-1,j+1)-u(n-1,j-1));
40
       u(n, j)=u(n, j)/(1-dt*s/2);
       % Set boundary conditions
42
       u(n,1) = u(n,N+1);
       u(n,N+2) = u(n,2);
44
            if with_error
                 uu_exact(n,:) = u_exact(x,t(n));
46
            \quad \text{end} \quad
       end
       if with_error
```

Listing 5: lxwSourceImplicit.m

```
% test lxf
   clear all
   close all
  c = 1:
   cfl = 0.75;
   t fin = 1;
   a = -1;
  b=1;
   u0=0(x) \cos(pi*x);
   % run lxf scheme
14
  Nx = 100;
   with_error=1;
   plot_evolution=1;
   s = -0.5;
18
   [\,ulxf\,,t\,,x\,,ex\,,err\,]\,\,=\,\,lxfSource\,(\,c\,,\,\,Nx,\,\,cfl\,\,,\,\,tfin\,\,,\,\,a\,,b\,,\,\,u0\,,\,\,s\,,\,\,with\_error\,)\,;
   [ulxw,t,x,ex,err] = lxwSourceImplicit(c, Nx, cfl, tfin, a,b, u0, s, with_error);
   % plot evolution
   dx = x(2)-x(1);
   u0 = @(x) \cos(pi*x);
   fig = figure(1)
   if (plot_evolution)
        for n=[1:ceil(numel(t)/20):numel(t),numel(t)]
             figure (1)
30
             subplot (211)
             plot(x, ulxf(n,:),...
32
             x, \exp(s*t(n))*u0(x-c*t(n)), 'r-')
legend('numerical', 'analytical', 'Location', 'SE')
             xlabel x
36
              title\left(sprintf\left(\text{'Lax-Friedrichs'},\text{ CFL=}\%g,\text{ t=}\%g\text{',cfl',t(n)}\right)\right)
             ylim([-1.5,1.5])
38
             subplot (212)
40
             plot(x, ulxw(n,:),...
             x,exp(s*t(n))*u0(x-c*t(n)),'r--')
legend('numerical', 'analytical', 'Location', 'SE')
             xlabel x
             ylabel u
              title (sprintf ('Lax-Wendroff, t=\%g',t(n)))
             ylim([-1.5, 1.5])
             drawnow
50
             pause (.02)
        end
52
```

```
end
saveas(fig , 'LxFSorucetest.pdf')
% plot error convergence
tfin = 1.;
cfl = 0.8;
with_error=1;
nn=10;
Nxs = 2.^{[1:nn]};
errlxf=zeros(size(Nxs));
errlxw=zeros(size(Nxs));
for k=1:nn
     Nx=Nxs(k);
     hs(k)=2/Nx;
     [u]xf,t,x,ex, err] = lxfSource(c, Nx, cfl, tfin, a,b, u0, s, 1);
     errlxf(k)=err;
     [ulxw,t,x,ex, err] = lxwSourceImplicit(c, Nx, cfl, tfin, a,b, u0, s, 1);
     errlxw(k)=err;
end
fig=figure()
loglog(hs, errlxf, 'DisplayName', 'Error LxF')
hold on
loglog(hs, errlxw, 'DisplayName', 'Error LxW')
title ('Error', 'FontSize', 16)
ylabel('L^2 norm error')
xlabel('Mesh size')
hold on
loglog(hs,hs,':','DisplayName','First order')
loglog(hs,hs.^2,'-.','DisplayName','Second order')
legend('Location','NW','FontSize',16)
saveas(fig , 'errorLxFLxWSource.pdf')
```

Listing 6: testLxFSource.m

Submit the code for both exercises.

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

Published: Apr 2, 2020

**Due date:** Apr 9, 2020, h10.00 (use the upload tool of my.math.uzh.ch, see wiki.math.uzh.ch/public/student\_upload\_homework or if you have troubles send me an email).