

# Scientific Computing: Lecture 22

- General classifications of PDEs
- Boundary and initial conditions
- Explicit solutions
  - FTCS, Lax, Lax-Wendroff
  - Stability
- Example: Wave equation

## CLASS NOTES

- ✘ HW09 due next Friday (optional for undergrad students).
- ✘ Some materials posted on web.
- ✘ Proposal Comments back to you electronically.



# General Classifications of PDEs

- Partial differential equations mathematically describe a system which depends on multiple variables and their derivatives.
- Examples:
  - Wave equation (acoustics, optics)
  - Laplace equation (electrostatics)
  - Schrodinger equation (quantum mechanics)
  - Navier-Stokes equation (fluid flow)
- Several general classes of PDEs often dictate different numeric approaches



# Classes of PDEs

- Consider a generic 2<sup>nd</sup> order PDE with variables  $x$  and  $y$

$$a \frac{\partial^2 A}{\partial x^2} + b \frac{\partial^2 A}{\partial x \partial y} + c \frac{\partial^2 A}{\partial y^2} + d \frac{\partial A}{\partial x} + e \frac{\partial A}{\partial y} + f A(x, y) + g = 0$$

where  $A$  is the solution and the rest are constants.

- **hyperbolic** if:  $b^2 - 4ac > 0$
- **parabolic** if:  $b^2 - 4ac = 0$
- **elliptic** if:  $b^2 - 4ac < 0$



# Some examples

- 1D Wave equation is hyperbolic:

$$\frac{\partial^2 A}{\partial t^2} = c^2 \frac{\partial^2 A}{\partial x^2}$$

- Diffusion equation is parabolic:

$$\frac{\partial}{\partial t} T(x, t) = \kappa \frac{\partial^2}{\partial x^2} T(x, t)$$

- Poisson's equation is elliptic:

$$\frac{\partial^2 \Phi}{\partial y^2} + \frac{\partial^2 \Phi}{\partial x^2} = -\frac{1}{\epsilon_0} \rho(x, y)$$



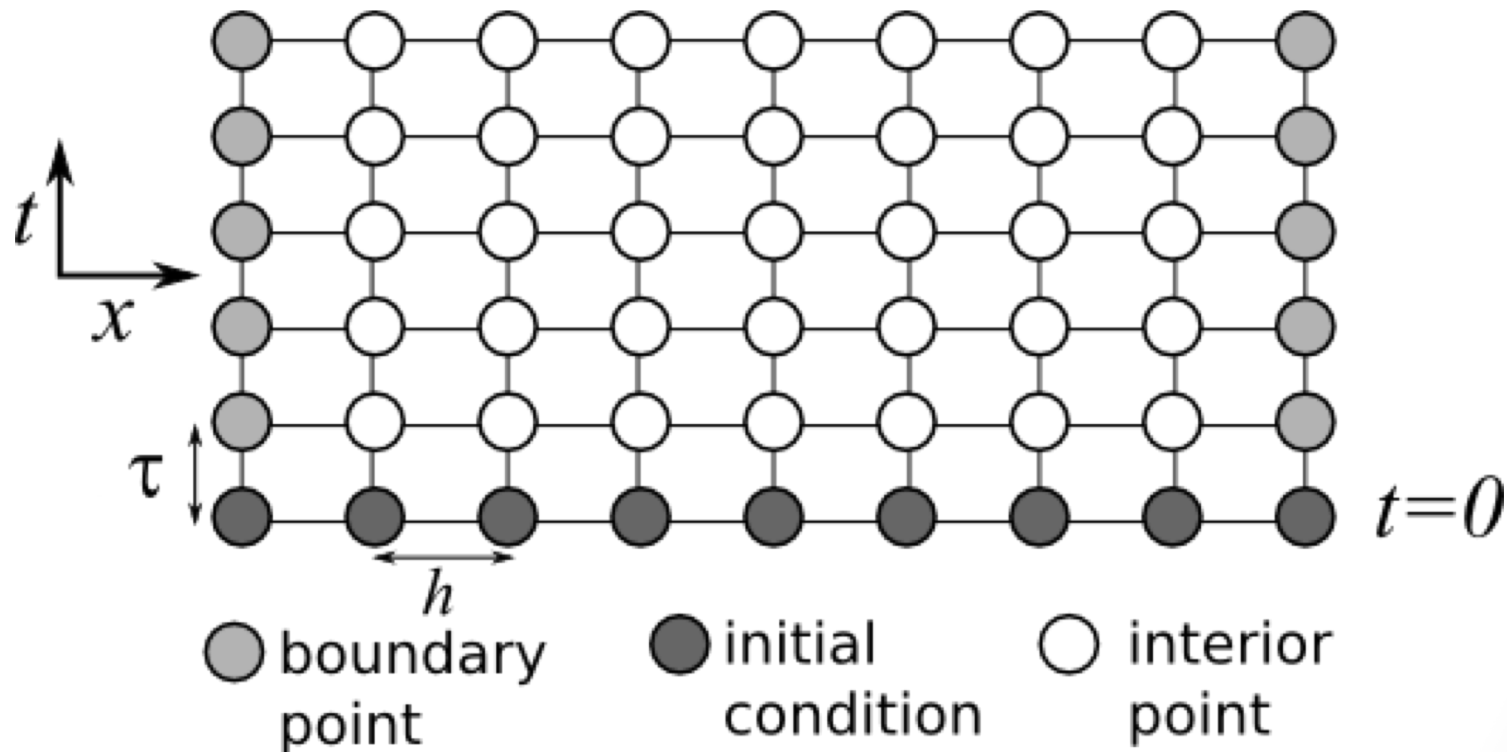
# Initial and Boundary Conditions

- Initial Conditions
  - Consider one independent variable is time and another is space in 1 dimension (say  $x$ ).
  - We need an initial value (at  $t=0$ ) for all positions along  $x$ .
- Boundary conditions
  - We also need values at both ends of the space domain which are known for all times.
- Driving terms
  - Known values of the solution at interior points which may change with time.



# Typical PDE Grid (1 space and time)

- Space stencil:  $h$  and time stencil:  $\tau$



# Types of Boundary Conditions

- Dirichlet Boundary Conditions
  - Also known as ‘fixed’
  - Values of the solution at the end points are known for all times – like for a flexible string which is clamped at both ends.
- Neumann Boundary Conditions
  - Values for the derivative of the solution are known for all times – like heat energy flux at the end of a rod.
- Cauchy Boundary Condition
  - BOTH the above are known – the value of the solution AND the normal derivative – liked a clamped stiff bar.



# Discretization of PDEs

- Typical idea is to:
  - 1. Convert all partial derivatives into finite difference equations via FDA, BDA, or CDA
    - Higher order derivatives require more terms
  - 2. Algebraically solve for the values of the solution at the next time (or space) step in terms of values at previous times (or spaces).
- Example: the Advection equation

$$\frac{\partial A}{\partial t} = -c \frac{\partial A}{\partial x}$$





# Forward Time-Center Space (FTCS)

- Using forward difference method for time and center difference method for space derivative, this becomes:

$$\frac{A_i^{n+1} - A_i^n}{\tau} = -c \frac{A_{i+1}^n - A_{i-1}^n}{2h}$$

where  $n$  is time index and  $i$  is space index.

- Now solve for the solution of  $A$  at the  $n+1$  time step:

$$A_i^{n+1} = A_i^n - \frac{c\tau}{2h} (A_{i+1}^n - A_{i-1}^n)$$

- Unfortunately FTCS is unstable for ALL values of the time step! Solution will eventually “blow up”.



# Lax Method

- We can improve stability by averaging for the value of  $A$  at space points before and after:

$$A_i^{n+1} = \frac{1}{2} (A_{i+1}^n + A_{i-1}^n) - \frac{c\tau}{2h} (A_{i+1}^n - A_{i-1}^n)$$

- Courant-Friedrichs-Lewy (CFL) stability condition. “ $c$ ” has units of speed, so this amounts to saying that the numerics must be able to “move” faster than the system.

$$\tau_{max} = \frac{h}{c}$$

- Numeric “speed” is:  $\frac{h}{\tau}$



# Lax-Wendroff Method

- FTCS and Lax methods are based on dropping 2<sup>nd</sup> order terms.
- Stability and accuracy are improved by dropping 3<sup>rd</sup> order terms.
- This makes expressions for finite differences more complicated algebraically (not shown here).
- Schemes are identical IF:  $\tau = \tau_{max}$
- For a large time step, Lax method grows (eventually blows up)
- For a smaller time step, Lax method decays to 0!
- Sometimes called numeric damping or viscosity.



# Example: Wave Equation

- Recall wave equation for homogeneous media and no damping can be written as

$$\frac{\partial^2 A}{\partial t^2} = c^2 \frac{\partial^2 A}{\partial x^2}$$

- Which involve 2<sup>nd</sup> order derivatives. Prescription is the same – convert to 2<sup>nd</sup> order finite difference equations and solve for next time step.
- up: u at time plus 1, u: current time, um: time minus 1

while t <= tstop:

  t\_old = t; t+=dt

  if method == 's':

    for i in range(1,n):

      up[i] = -um[i] + 2\*u[i] + C2\*(u[i-1] - 2\*u[i] + u[i+1]) + dt2\*f(x[i],t\_old)



# Looping trick in Python

- Here we are looping over time (**while** loop), then looping over space (**for** loop).
- Since these are arrays, we can leverage the fast underlying C code which handles array slicing.
- Called “vectorizing” the code.
- The **for** loop is replaced by

```
up[1:n] = -um[1:n] + 2*u[1:n] + C2*(u[0:n-1] - 2*u[1:n] + u[2:n+1]) + dt2*f(x[1:n],t_old)
```

- Recall `u[1:n]` means `u[1], u[2], u[3], ..., u[n]`
- This provides a HUGE speed up by pushing the looping down to the compiled C code level.
- This is almost as fast as writing the program in C.



# Output with Dirichlet BCs

