

## General remarks

### Objectives

1. learn how to solve problems numerically
2. use numerical methods as a tool to investigate and learn about interesting problems
3. Get familiar with tools that could be used for research project

Work in teams during afternoon sessions

- complete during session, but maybe more will need
- ok to work w/ other team; don't leave anyone out

Work extended individually

- Jupyter notebooks w/ places to add code / plot / discussion
- Discuss w/ others freely, but what you turn in should be your own work
- turn in completed notebooks for all projects at the end of term

Use python + jupyter

### Projects

1. Intro to numerical methods + diffusion eq.
2. Ocean mixing + river pollution
3. Tsunami
4. Storms

Here, focus on numerical methods to solve partial differential equations (PDEs)

Need to discretize space and time derivatives

PDE solvers are classified based on spatial discretization

### Methods:

#### 1. Finite difference (FD)

Approximate function and derivatives on grid w/ spacing  $\Delta x$

$$\text{recall } \frac{dy}{dx} = \lim_{\delta x \rightarrow 0} \frac{y(x+\delta x) - y(x)}{\delta x}$$

inspired by this, approximate

$$\frac{dy}{dx} \approx \frac{y(x+\Delta x) - y(x-\Delta x)}{2\Delta x}$$

"centered difference"

## 2. Spectral Method

Apply a spectral (e.g. Fourier) transform to the PDE and solve for the coefficients of the spectral basis.

Fourier transform

$$\hat{y}(k) = \int_{-\infty}^{\infty} y(x) e^{-ikx} dx$$

e.g. consider  $\frac{\partial y}{\partial t} + c \frac{\partial y}{\partial x} = 0$

F.T.  $\Rightarrow \int_{-\infty}^{\infty} \left( \frac{\partial y}{\partial t} + c \frac{\partial y}{\partial x} \right) e^{-ikx} dx = 0$

$$\frac{\partial \hat{y}}{\partial t} + c \int_{-\infty}^{\infty} \frac{\partial y}{\partial x} e^{-ikx} dx = 0$$

$$= \underbrace{\left[ y e^{-ikx} \right]_{-\infty}^{\infty}}_{=0 \text{ if } \lim_{x \rightarrow \pm\infty} y = 0} - \int_{-\infty}^{\infty} y(x) (-ik) e^{-ikx} dx$$

hence  $\frac{\partial \hat{y}}{\partial t} + ik\hat{y} = 0$

diffusion equation:

$$\frac{\partial y}{\partial t} = k \frac{\partial^2 y}{\partial x^2} = k \frac{\partial}{\partial x} \left( \frac{\partial y}{\partial x} \right)$$

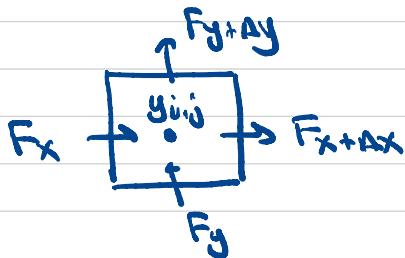
$$\Rightarrow \frac{\partial \hat{y}}{\partial t} = -k k^2 \hat{y}$$

PRO: Allows accurate and fast solution  
of PDEs.

CON: Boundary conditions more difficult  
to impose

### 3 Finite Volume

Calculate the evolution of a quantity in a cell by evaluating the fluxes through the cell edges, typically using FD method.



$$\frac{dy}{dt} = F_x - F_{x+\Delta x} + F_y - F_{y+\Delta y}$$

PRO: Conservation laws satisfied on discrete grid  
CONS: Irregular grids w/ unequal Δ faces difficult

### 4 Finite Element

Represent function within cells w/ polynomial



PRO: Allows irregular grids, good for complex geometries  
CONS: conservation laws difficult to maintain

## Timestepping

Consider  $\frac{dy}{dt} = f(y, t)$

discretize time :  $t = t_0, t_1, \dots, t_n, t_{n+1}, \dots, t_N$   
 denote  $y_n = y(t_n)$ , etc.

Suppose we know  $y$  at  $t_0, t_1, \dots, t_n$  and  
 want to find  $y(t_{n+1})$

Explicit methods evaluate  $f$  based on  $y$  at  
 previous times  $y(t_0), y(t_1), \dots, y(t_n)$

Implicit methods evaluate  $f$  using  $y(t_{n+1})$

## Examples

Explicit Euler :  $\frac{y_{n+1} - y_n}{\Delta t} = f(y_n, t_n)$   
 $(\Delta t = t_{n+1} - t_n)$

Crank-Nicolson (semi-implicit)

$$\frac{y_{n+1} - y_n}{\Delta t} = \frac{1}{2} (f(y_n, t_n) + f(y_{n+1}, t_{n+1}))$$

