

## 偏微分方程式と物理現象

## Partial Differential Equations for Science and Engineering

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# Outline of Class

## Instructor

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## Recommended Textbook

➤ Advanced Engineering Mathematics by Erwin Kreyszig  
(Available in Tokyo Tech library)



# Outline of Class

- Fundamental knowledge of PDE, Analytical and **Numerical Solutions**.
- Lectures and exercises on problems in Science and Engineering, deriving the PDE for physical phenomena, properties of PDE, methods for obtaining analytical and numerical solutions.
- Acquire the **ability to perform numerical analyses** by combining lectures with computational exercises.



# Outline of Class

## Schedule:

- Lecture 1      Definition and types of PDE
- Lecture 2      Modeling of flow phenomena with the hyperbolic PDE
- Lecture 3      Analytical solution of the hyperbolic PDE (D'Alembert Solution)
- Lecture 4      Analytical solution of the hyperbolic PDE (Fourier series)
- Lecture 5      Modeling of diffusion phenomena with the parabolic PDE
- Lecture 6      Analytical solution of the parabolic PDE
- Lecture 7      Derivation and solution of elliptical equation Poisson
- Lecture 8      Test level of understanding (Exercise Problems for Lecture 1-7)
- Lecture 9      Introduction to Numerical analysis
- Lesson 10•11   Numerical solution of PDE – Parabolic equation
- Lesson 12•13   Numerical solution of PDE – Combined Parabolic/Hyperbolic
- Lesson 14•15   Numerical solution of PDE – Hyperbolic equation
- Term-end Report

## Grading System

mid-term examination (45%), term-end report (45%), short exercises (10%)



# Today's Objectives

- Schedule and Strategy
- Finite Difference Method
- Basic algorithm structure, outputting, and animation using python and ffmpeg.



# SCHEDULE & STRATEGY



# Style

- Sit and work together with assigned group to building the models in groups. May freely consult with other groups (free discussion) and myself.
- Tasks are given on the day.
- Concepts on numerical methods are taught on Mondays, computer programming on Thursdays.
- Compile a full report of tasks by November 27, 2017. (English language)
- Submission style: Print-outs and Soft-copies (zipped pdf and animations).
- Submission deadline: November 27, 2017, 17:15





## Grouping

Group			
1	Kiyo Kei	Ratchatawijin Maythawee	
2	Thumwanit Napat	Chin Riyu	
3	Zhou Lijun	Lerdbussarakam Tanad	Shagdar Zolbayar
4	Tsamara Tsani	Ka Kinzei	
5	Pongpattanayok Supatat	Jiang Lechuan	
6	Tumurbaatar Uyanga	Kiyo Yu	
7	Kadohiro Yasuki	Dolgormaa Banzragch	
8	Ka Jiyuntaku	Rudjito Rezkita Ramadhani	
9	Nasution Ghiffari Aby Malik	Kobayashi Yuki	
10	Chaijirawiwat Chawit	Chin Keitoku	
11	Sato Yaoki	Purevsuren Norovsambuu	
12	Do Khanh N	Kazama Tomohiro	





# Target PDEs

- 2-D diffusion phenomena
  - November 2, 2017 (Thursday)
- 2-D Burger's equation
  - November 9, 2017 (Thursday)
- 1-D Advection (Stability tests)
  - November 16, 2017 (Thursday)



# **FINITE DIFFERENCE METHOD**



# Discretization of Differential Equations

- Finite Difference Method (FDM) (1910~present)
  - Formulation is easy.
  - Widely popular.
  - Mesh must be structured.
  - Neumann boundary conditions are approximated.
- Finite Element Method (FEM) (1956~present)
  - More time consuming for solving non-linear PDEs.
  - On-going development and gaining popularity.
  - Good for complex geometries and unstructured meshes.
  - Neumann boundary conditions are enforced.
- Finite Volume Method (recent)
  - Derived from either FDM or FEM

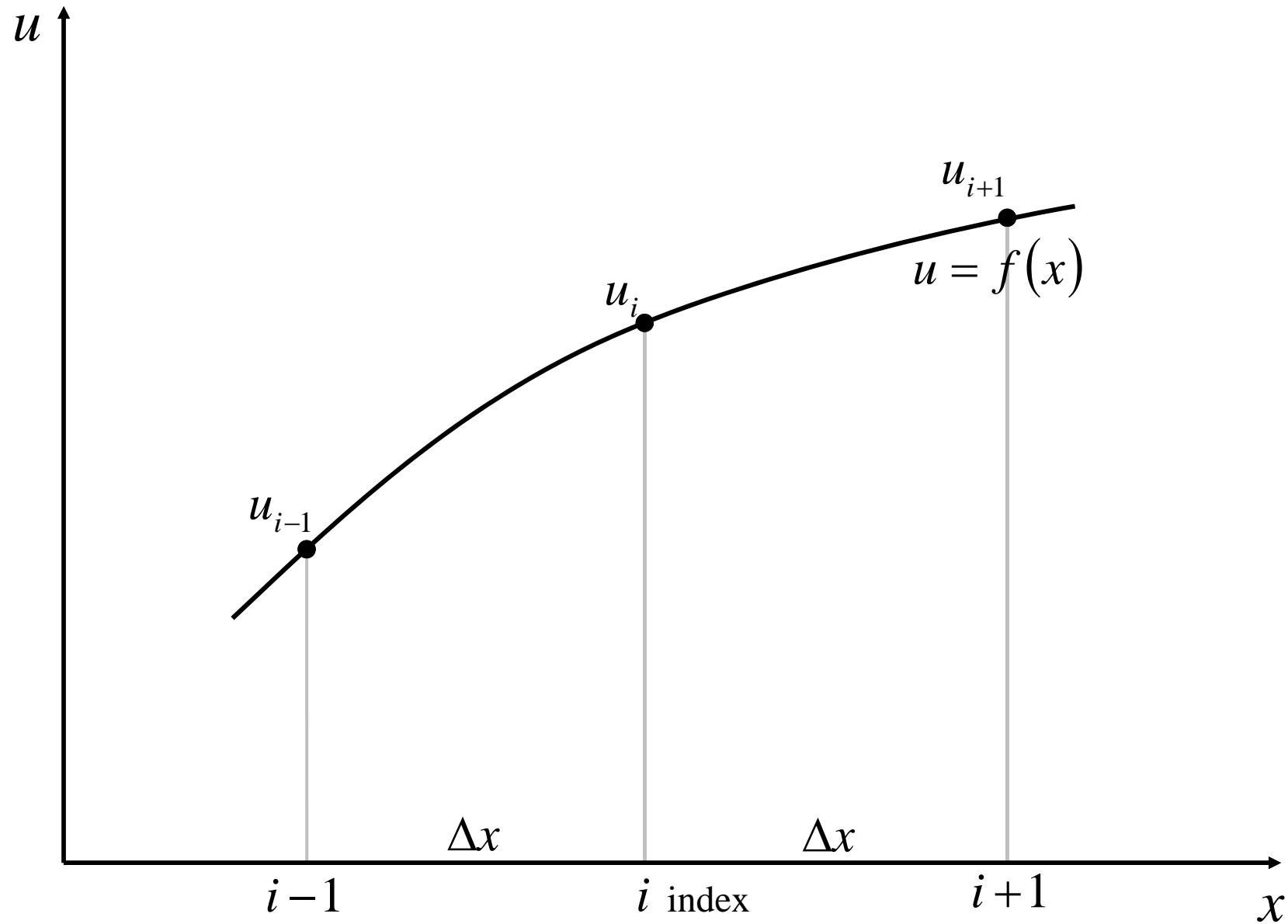


## Basic idea of FDM

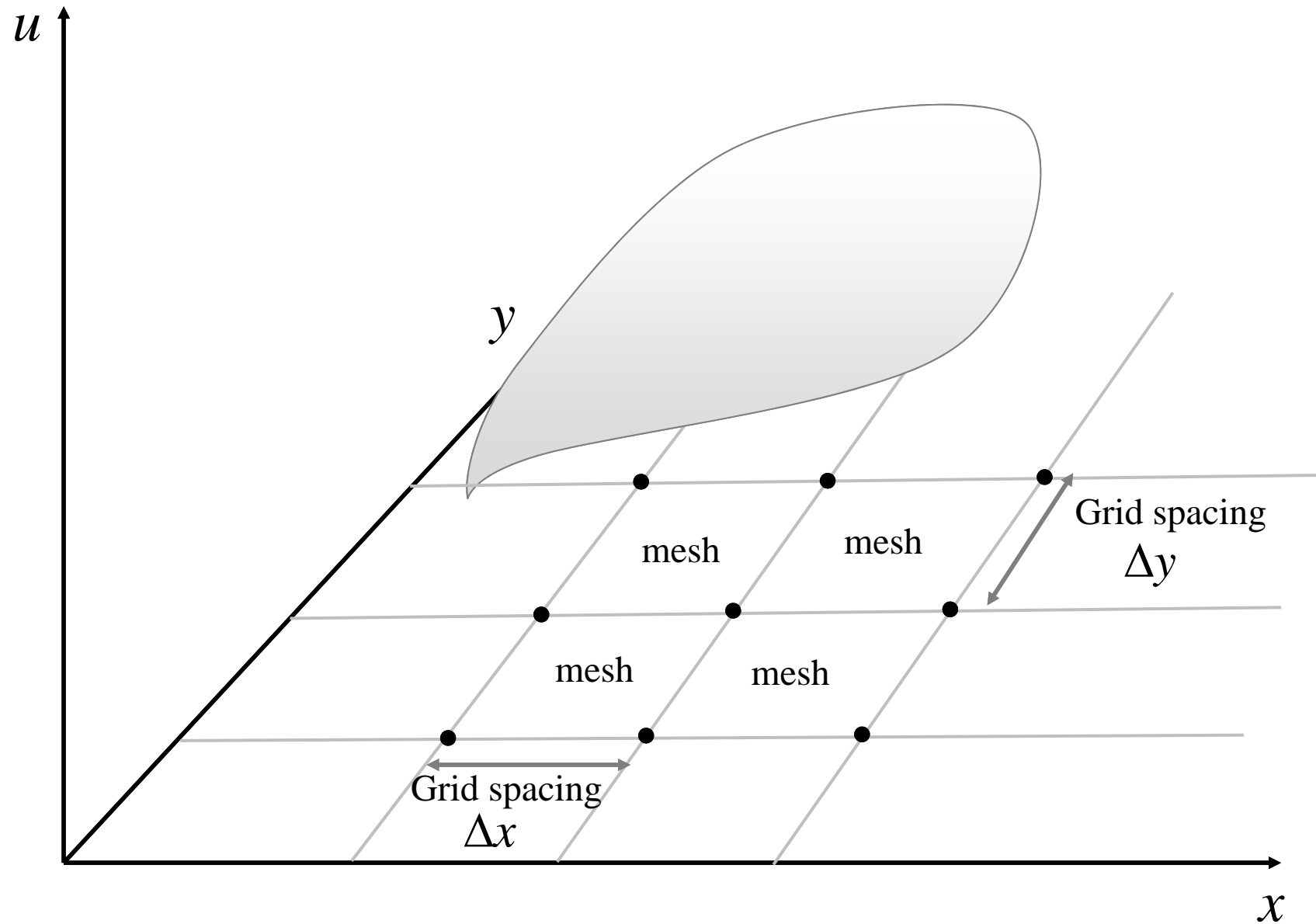
Derivatives in differential equations are written in terms of *discrete* quantities of dependent and independent variables, resulting in *simultaneous algebraic equations* with all unknowns prescribed at *discrete mesh points* for the entire *domain*.



# Discretizations in FDM

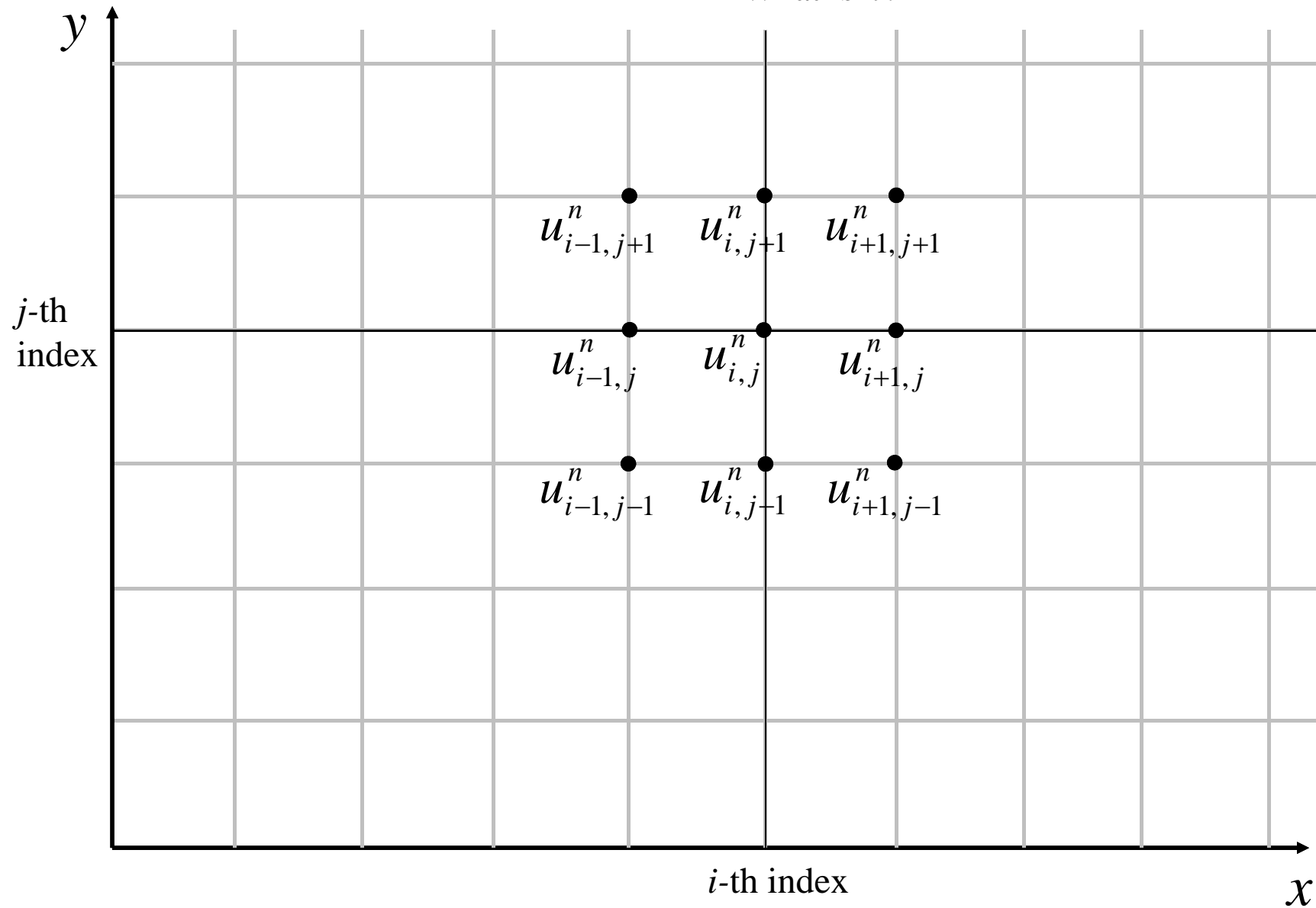


# Discretizations in FDM for 2D



# Discretizations in FDM for 2D

What is  $n$ ?



# Basic FDM Methods

Consider a function  $u(x)$  and its derivative at point  $x$ ,

$$\frac{\partial u(x)}{\partial x} = \lim_{\Delta x \rightarrow 0} \frac{u(x + \Delta x) - u(x)}{\Delta x}$$

Expanding  $u(x + \Delta x)$  using Taylor's series about  $u(x)$ ,

$$u(x + \Delta x) = u(x) + \Delta x \frac{\partial u(x)}{\partial x} + \frac{(\Delta x)^2}{2} \frac{\partial^2 u(x)}{\partial x^2} + \frac{(\Delta x)^3}{3!} \frac{\partial^3 u(x)}{\partial x^3} + \dots$$

Substituting  $u(x + \Delta x)$  to the derivative function,

$$\frac{\partial u(x)}{\partial x} = \lim_{\Delta x \rightarrow 0} \left( \frac{\partial u(x)}{\partial x} + \frac{(\Delta x)}{2} \frac{\partial^2 u(x)}{\partial x^2} + \dots \right)$$





# Basic FDM Methods

Simplifying,

$$\frac{u(x + \Delta x) - u(x)}{\Delta x} = \frac{\partial u(x)}{\partial x} + \frac{(\Delta x)}{2} \frac{\partial^2 u(x)}{\partial x^2} + \dots = \frac{\partial u(x)}{\partial x} + O(\Delta x)$$

Applying our pre-defined indexing,

$$\frac{u_{i+1} - u_i}{\Delta x} = \frac{\partial u(x)}{\partial x} + \frac{(\Delta x)}{2} \frac{\partial^2 u(x)}{\partial x^2} + \dots = \frac{\partial u(x)}{\partial x} + O(\Delta x)$$

Re-arranging we get an approximation (forward difference),

$$\frac{\partial u(x)}{\partial x} = \frac{u_{i+1} - u_i}{\Delta x} + O(\Delta x)$$



# Basic FDM Methods

Expanding  $u(x+\Delta x)$  using Taylor's series about  $u(x)$ ,

$$u(x + \Delta x) = u(x) + \Delta x \frac{\partial u(x)}{\partial x} + \frac{(\Delta x)^2}{2} \frac{\partial^2 u(x)}{\partial x^2} + \frac{(\Delta x)^3}{3!} \frac{\partial^3 u(x)}{\partial x^3} + \dots$$

$$\boxed{\frac{u_{i+1} - u_i}{\Delta x} = \frac{\partial u(x)}{\partial x} + \frac{(\Delta x)}{2} \frac{\partial^2 u(x)}{\partial x^2} + \dots = \frac{\partial u(x)}{\partial x} + O(\Delta x)}$$

Expanding  $u(x-\Delta x)$  using Taylor's series about  $u(x)$ ,

$$u(x - \Delta x) = u(x) - \Delta x \frac{\partial u(x)}{\partial x} + \frac{(\Delta x)^2}{2} \frac{\partial^2 u(x)}{\partial x^2} - \frac{(\Delta x)^3}{3!} \frac{\partial^3 u(x)}{\partial x^3} + \dots$$

$$\boxed{\frac{u_i - u_{i-1}}{\Delta x} = \frac{\partial u(x)}{\partial x} - \frac{(\Delta x)}{2} \frac{\partial^2 u(x)}{\partial x^2} + \dots = \frac{\partial u(x)}{\partial x} + O(\Delta x)}$$



## Basic FDM Methods

$$\frac{u_{i+1} - u_i}{\Delta x} = \frac{\partial u(x)}{\partial x} + \frac{(\Delta x)}{2} \frac{\partial^2 u(x)}{\partial x^2} + \dots = \frac{\partial u(x)}{\partial x} + O(\Delta x)$$

$$\frac{u_i - u_{i-1}}{\Delta x} = \frac{\partial u(x)}{\partial x} - \frac{(\Delta x)}{2} \frac{\partial^2 u(x)}{\partial x^2} + \dots = \frac{\partial u(x)}{\partial x} + O(\Delta x)$$

Adding both equations,

$$\boxed{\frac{u_{i+1} - u_{i-1}}{2\Delta x} = \frac{\partial u(x)}{\partial x}} + \frac{(\Delta x)^2}{3!} \frac{\partial^3 u(x)}{\partial x^3} + \dots = \frac{\partial u(x)}{\partial x} + O(\Delta x^2)$$



# Basic FDM Methods

Approximation for the 1<sup>st</sup> order,

$$\frac{\partial u(x)}{\partial x} = \frac{u_{i+1} - u_i}{\Delta x} + O(\Delta x) \quad \text{Forward Difference}$$

$$\frac{\partial u(x)}{\partial x} = \frac{u_i - u_{i-1}}{\Delta x} + O(\Delta x) \quad \text{Backward Difference}$$

$$\frac{\partial u(x)}{\partial x} = \frac{u_{i+1} - u_{i-1}}{2\Delta x} + O(\Delta x^2) \quad \text{Central Difference}$$

Approximation for the 2<sup>nd</sup> order,

$$\frac{\partial^2 u(x)}{\partial x^2} = \frac{u_{i+1} - 2u_i + u_{i-1}}{\Delta x^2} + O(\Delta x^2)$$



Considering the diffusion equation (w/ constant coefficient),

$$\frac{\partial u}{\partial t} - \alpha \frac{\partial^2 u}{\partial x^2} = 0$$

Utilizing the FTCS Method,

$$\frac{u_i^{n+1} - u_i^n}{\Delta t} = \alpha \frac{u_{i+1}^n - 2u_i^n + u_{i-1}^n}{\Delta x^2} + O(\Delta t, \Delta x^2)$$

$$u_i^{n+1} = u_i^n + \left( \frac{\alpha \Delta t}{\Delta x^2} \right) (u_{i+1}^n - 2u_i^n + u_{i-1}^n)$$



# Treatment of Boundary Conditions

Dirichlet conditions,

The  $u$  values at the boundaries are fixed for all  $n$ .

Neumann conditions,

The approximation for the derivate at the boundary is

$$\frac{u_{i+1}^n - u_0^n}{2\Delta x} = G$$

$$u_0^n = u_{i+1}^n - 2\Delta x(G) \quad (\text{Ghost point})$$



## Mission for the week

$$\frac{\partial T}{\partial t} - \alpha \left( \frac{\partial^2 T}{\partial x^2} + \frac{\partial^2 T}{\partial y^2} \right) = 0$$

Construct a diffusion model for a 2-D heat plate with dimensions 100 m. by 100 m.

1. Desired initial condition (distributed).
2. Investigate w/ or without Dirichlet or Neumann Boundary Conditions.
3. Investigate various influences of  $d = \frac{\alpha \Delta t}{\Delta x^2}$ .  
What is happening when its values range from 0. to 1.0.
4. Visualize the results by animation.



## Python Programming (python.org)

- High-level programming language for general purpose programming.
- Fewer lines of code compared to C++ and Java.
- Most linux operating systems have built-in Python.
- Compatible with various OS.
- Plotting can be done simultaneously within the program.
- Large resources online.
- Not named after a “snake”.





## Summary of basic python structure in this class

1. Import Statement (numpy, matplotlib)
2. Function Assignment (def)
3. The body - Main function (def main())

ffmpeg (ffmpeg.org)

1. Free software project that produces libraries and programs for handling multimedia data.
2. Fast video/audio conversion and editing tool.
3. Capable of creating high quality time-lapses.



# **DEMONSTRATING PYTHON PROGRAM WITH ANIMATION**



Given  $y(t,x)$  and the differential equation,

$$\frac{\partial y}{\partial t} = 1$$

Dirichlet boundary condition

$$y(0, x) = 0$$

Visualize the change of  $y$  from  $t = 0$  to 10 at 0.1  $t$ -intervals from the region  $x = 0$  to 10 with 100 grid points.



```

1 import numpy as np
2 import matplotlib.pyplot as plt
3 import os
4
5 directory = os.path.dirname(os.path.realpath(__file__))
6 os.chdir(directory)
7
8 def get_value(it):
9     y = t
10    return t
11
12 def main():
13     t = np.arange(0.,10.,0.1)
14     x = np.linspace(0.,10.,num=100)
15     y = np.copy(x)
16     y[:] = 0.
17     icount = 1
18     for it in t:
19         for i in range(0,y.shape[0]):
20             y[i] = get_value(it)
21         plt.clf()
22         plt.plot(x,y)
23         plt.xlim(0,10)
24         plt.ylim(0,10)
25         plt.savefig("test_%03di.jpg"%(icount))
26         icount+=1
27
28 if __name__ == "__main__":
29     main()

```

Change work directory to location of script.

Function declaration.

Main body of the program.

Setting boundaries, descritization

Looping in time and space.

Plot settings.

Save to file.

Calls the main function. Complete program syntax.



ffmpeg command

```
ffmpeg -r 1 -start_number 1 -i test_%03d.jpg -vcodec  
libx264 trial.mp4
```

-r [frames/images per second]

-start\_number [initial file number]

-I test\_%03d.jpg (test\_001.jpg,test\_002.jpg)

-vcodec [codec for video]

trial.mp4 (output video in mp4 format).



## Textbook reference

- Computational Fluid Dynamics by T.J. Chung
  - Downloadable via Tokyo Tech OPAC

