



# **Statistical and Numerical Methods for Chemical Engineers**

(401-0675-00L)

Lecture for D-CHAB Autumn Semester 2023

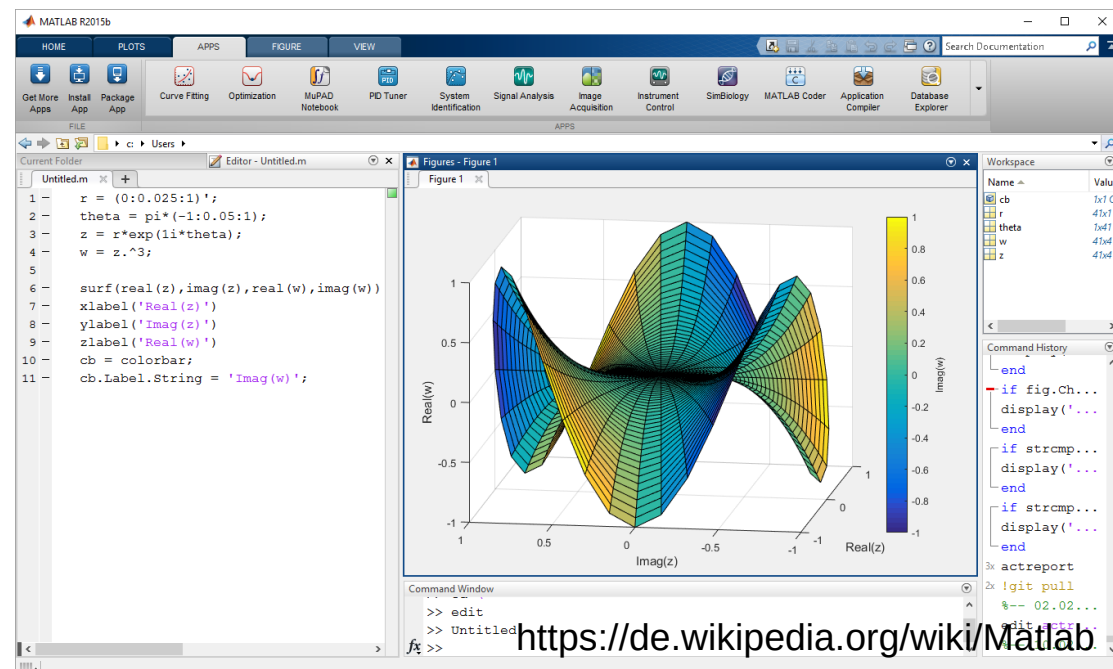
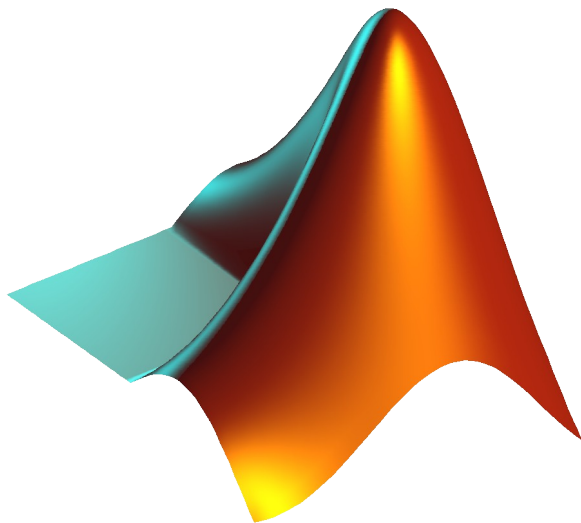
**Dr. Roger Käppeli**  
**Dr. Patric Müller**

# Statistical and Numerical Methods for Chemical Engineers

- Part one: Numerical methods (Käppeli)  
Lecture: Wednesday, 08:15-10:00, HG E 33.1  
20.09.; 27.09.; 04.10.; 11.10.; 18.10.;  
~~25.10.~~; 01.11.; 08.11.; 15.11.
- Part two: Statistical methods (Müller)  
Lecture: Wednesday, 08:15-10:00, HG E 33.1  
22.11.; 29.11.; 06.12.; 13.12.; 20.12.
- Exercises (Jiwoo Oh, Sarah Duclos Ivetch)
  - Tuesday, 07:45-09:30, HCI H 8.1  
From 26.09. until 19.12.  Start next week! This week  
MATLAB introduction on  
Thursday (email!)
- Case study week: 23.10.-27.10.  No lecture & exercise classes!

# MATLAB introduction

- Instructors: Jiwoo Oh, Sarah Duclos Ivetich
- Thursday, 21.09.23
  - HCI J 174 09:00- 16:00
- See email for exact details



# Exam

- Mode of examination: Oral 20 minutes
- Language: English or German
- Two parts:
  - ~13 minutes Numerical Methods
  - ~7 minutes Statistical Methods
- “Sample” exam for Numerical Methods part in last lecture

# Part one: Numerical Methods

- Lecture webpage:
  - <http://www.sam.math.ethz.ch/~karoger/numci/2023/index.html>
  - Lecture Notes (handwritten)
  - Script (work in progress...)
  - Slides
  - Some MATLAB codes
- Exercises webpage:
  - <https://shihlab.ethz.ch/education/Snm.html>

# Part one: Numerical Methods

- Outline
  1. Interpolation and Numerical Calculus
  2. Non-linear Equations
  3. Ordinary Differential Equations
  4. Partial Differential Equations
  5. Linear and Non-linear Least Squares
- This is a lot...

# Part one: Numerical Methods

- What are Numerical Methods?

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  - They are methods to give **approximate solutions** to hard problems (difficult or even impossible)
- Why can't I just use a Numerical Method?



# Part one: Numerical Methods

- What are Numerical Methods?
  - They are methods to give **approximate solutions** to hard problems (difficult or even impossible)
- Why can't I just use a Numerical Method?
  - Like with any other equipment (e.g. lab apparatus) one needs to have **a basic understanding** to judge the results

# Example 1: CSTR

Continuously Stirred-Tank Reactor

- CSTR operated isothermally, with negligible volume change, in inflow mode with constant fluid volume, and with two elementary reactions  
Perfectly mixed

Reactor volume

$V$

**OUTLET**

$c_j$

Output concentration

**INLET**

$v$

Volumetric flow rate

$c_{j,in}$

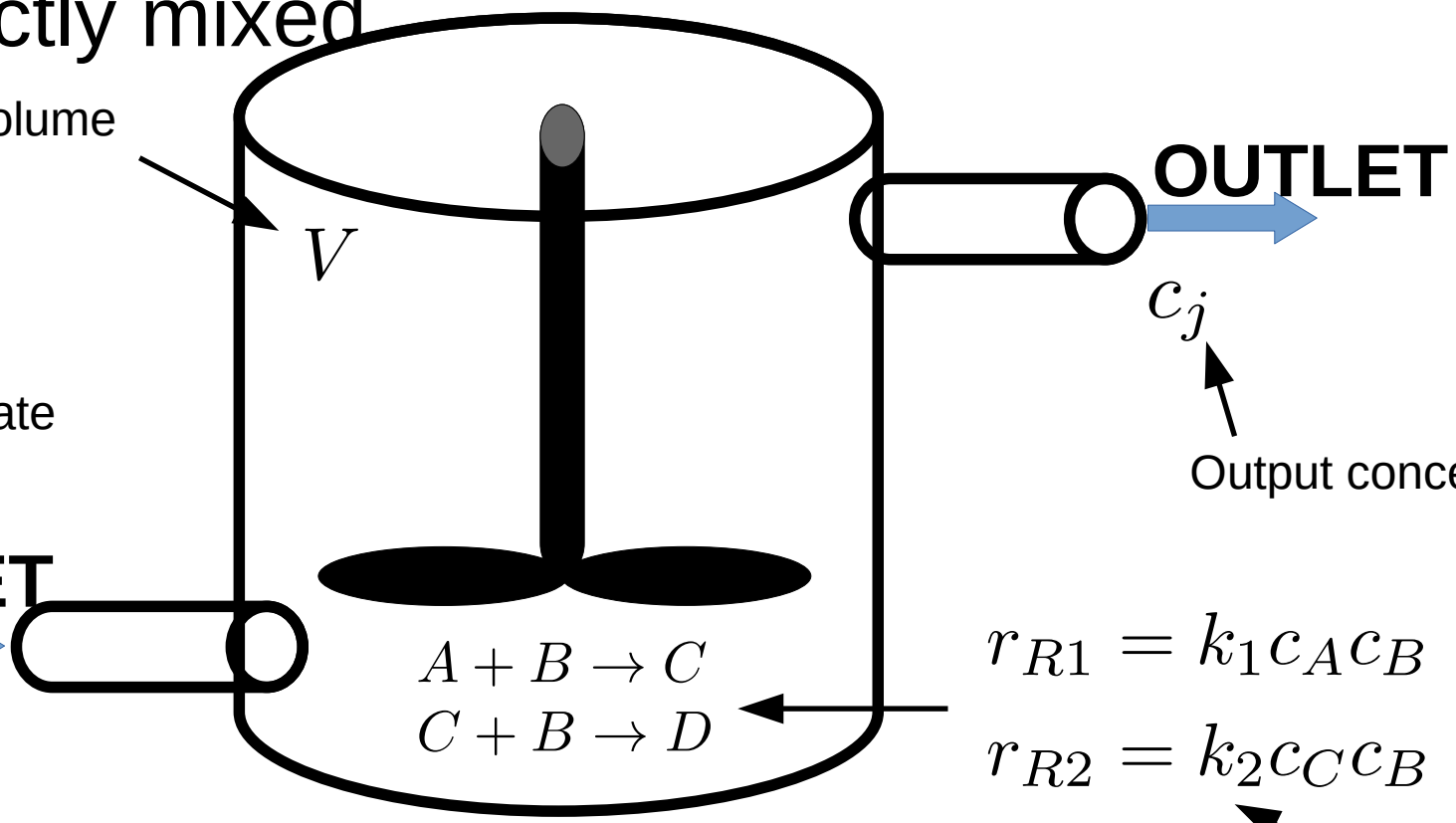
Input concentration



$$r_{R1} = k_1 c_A c_B$$

$$r_{R2} = k_2 c_C c_B$$

Rate constants



# Example 1: CSTR

Continuously Stirred-Tank Reactor

- Concentration of each species governed by set of mass balances

$$\frac{d}{dt} (V c_A) = \underbrace{v (c_{A,in} - c_A)}_{\text{Inflow}} + \underbrace{V (-k_1 c_A c_B)}_{\text{Reactions}}$$

$$\frac{d}{dt} (V c_B) = \underbrace{v (c_{B,in} - c_B)}_{\text{Inflow}} + \underbrace{V (-k_1 c_A c_B - k_2 c_C c_B)}_{\text{Reactions}}$$

$$\frac{d}{dt} (V c_C) = \underbrace{v (c_{C,in} - c_C)}_{\text{Inflow}} + \underbrace{V (+k_1 c_A c_B - k_2 c_C c_B)}_{\text{Reactions}}$$

$$\frac{d}{dt} (V c_D) = \underbrace{v (c_{D,in} - c_D)}_{\text{Inflow}} + \underbrace{V (+k_2 c_C c_B)}_{\text{Reactions}}$$

Inflow

Reactions

# Example 1: CSTR

Continuously Stirred-Tank Reactor

- Concentration of each species governed by set of mass balances

$$\frac{d}{dt} (V c_A) = v (c_{A,in} - c_A) + V (-k_1 c_A c_B)$$

$$\frac{d}{dt} (V c_B) = v (c_{B,in} - c_B) + V (-k_1 c_A c_B - k_2 c_C c_B)$$

$$\frac{d}{dt} (V c_C) = v (c_{C,in} - c_C) + V (+k_1 c_A c_B - k_2 c_C c_B)$$

$$\frac{d}{dt} (V c_D) = v (c_{D,in} - c_D) + V (+k_2 c_C c_B)$$

**Set of coupled nonlinear Ordinary Differential Equations**

**Solve Numerically!!!**  **Chap. 3**

# Example 1: CSTR

Continuously Stirred-Tank Reactor

- Concentration of each species governed by set of mass balances

**Steady state**  $\frac{d}{dt}(Vc_j) \rightarrow 0$

$$0 = v(c_{A,in} - c_A) + V(-k_1c_Ac_B)$$

$$0 = v(c_{B,in} - c_B) + V(-k_1c_Ac_B - k_2c_Cc_B)$$

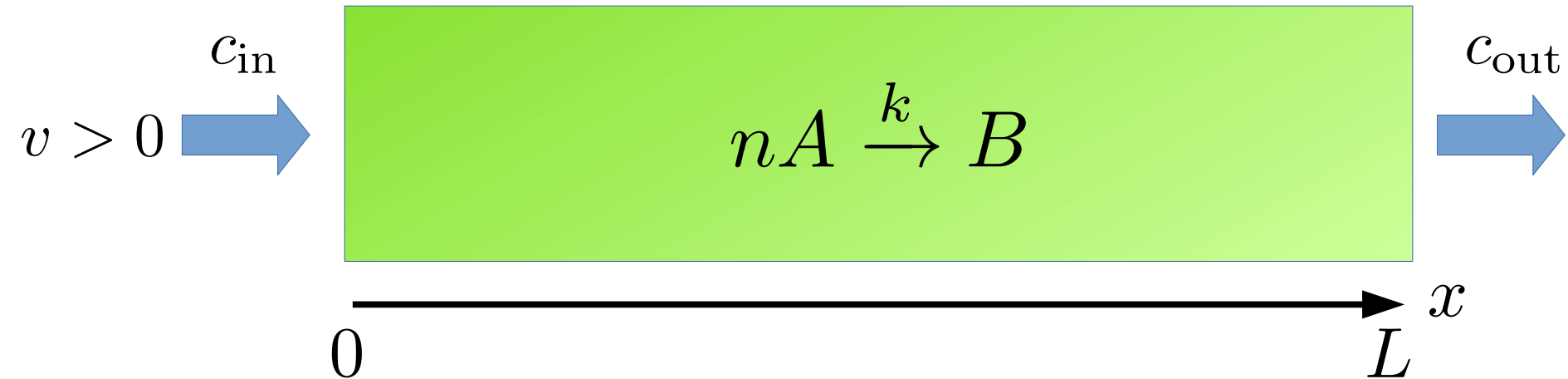
$$0 = v(c_{C,in} - c_C) + V(+k_1c_Ac_B - k_2c_Cc_B)$$

$$0 = v(c_{D,in} - c_D) + V(+k_2c_Cc_B)$$

**Set of coupled nonlinear Equations**

**Solve Numerically!!!**  **Chap. 2**

# Example 2: Tubular Reactor



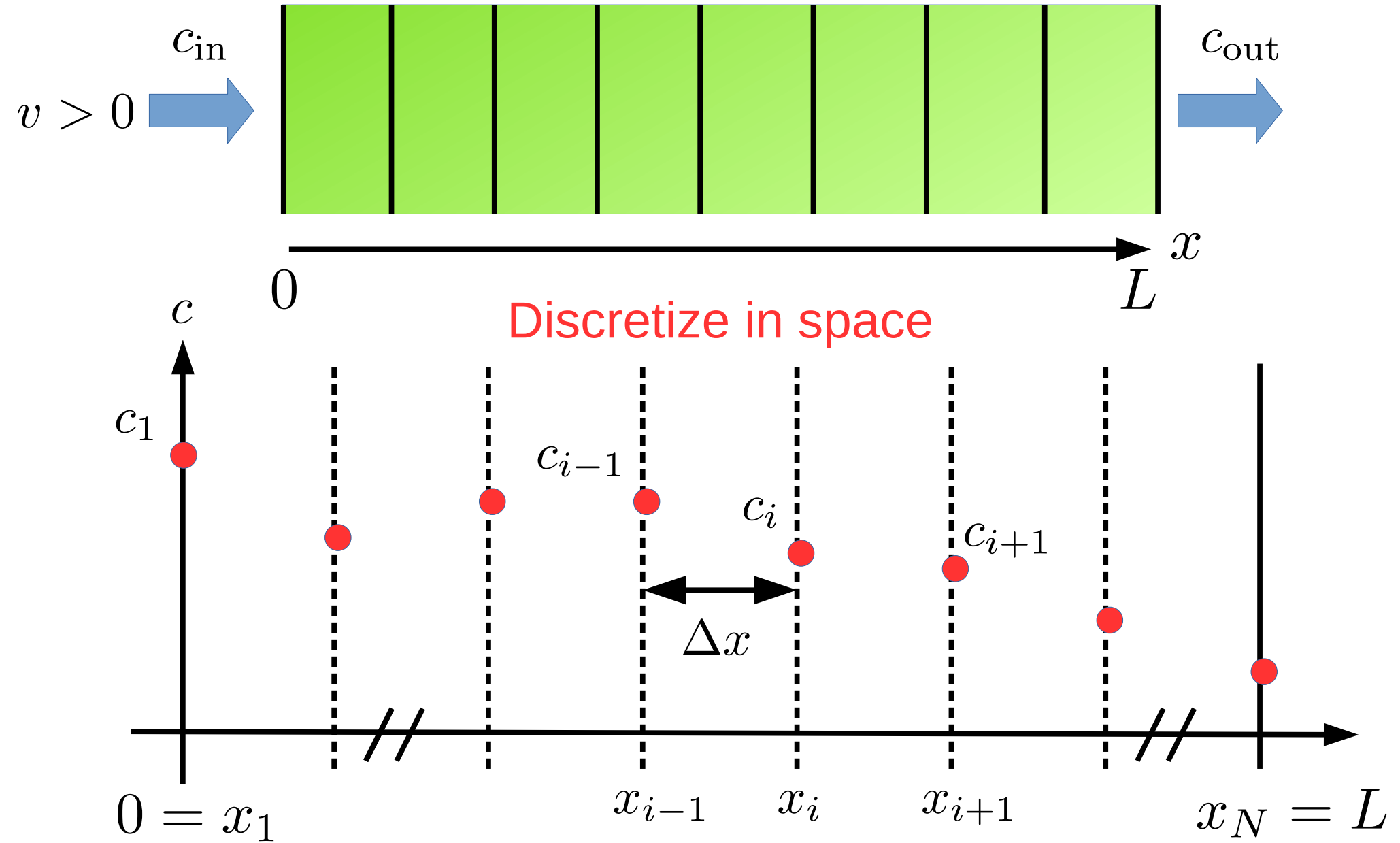
Mass balance:  $\frac{\partial c}{\partial t} = D \frac{\partial^2 c}{\partial x^2} - v \frac{\partial c}{\partial x} - kc^n$

Diffusion  $\nearrow$   $\nwarrow$  Advection/Convection  $\nwarrow$  Reaction

Boundary conditions:  $c(t, 0) - \frac{D}{v} \frac{\partial c}{\partial x}(0) = c_{in}$   $\frac{\partial c}{\partial x}(t, L) = 0$

**Solve Numerically!!!**  $\rightarrow$  **Chap. 4**

# Example 2: Tubular Reactor



# Example 2: Tubular Reactor

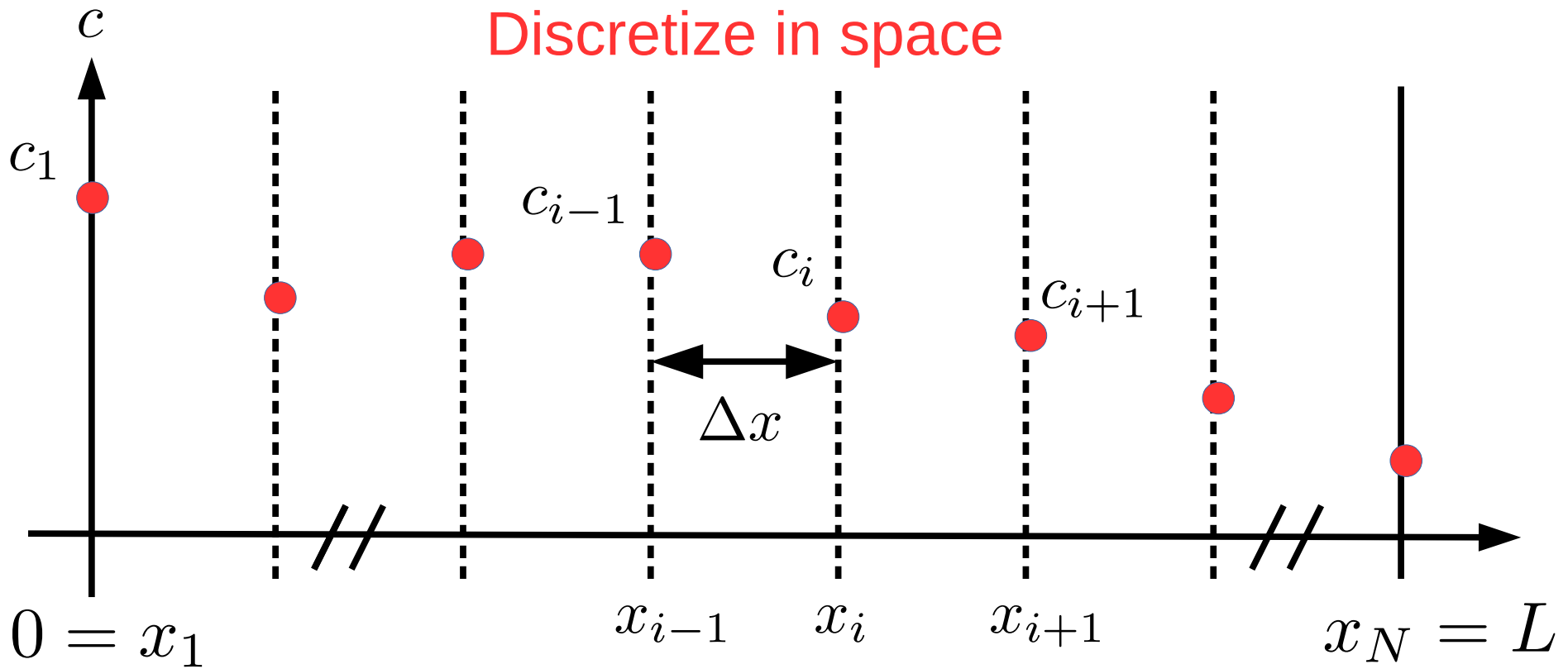
$$\frac{\partial c}{\partial t} = D \frac{\partial^2 c}{\partial x^2} - v \frac{\partial c}{\partial x} - kc^n$$

Chap. 1,2,3,4

ODEs

$$\frac{dc_i}{dt} = D \frac{c_{i+1} - 2c_i + c_{i-1}}{\Delta x^2} - v \frac{c_i - c_{i-1}}{\Delta x} - kc_i^n$$

Discretize in space





# Part one: Numerical Methods

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— ... “Preparation” for Statistical part

- This is a lot...  
Only an overview...  
Starter kit!



# Literature

- Not really needed to follow the course...
- But see e.g.
  - Press et al., “Numerical Recipes”
  - Ascher & Greif, “A First Course in Numerical Methods”
  - Beers, “Numerical Methods for Chemical Engineering”
  - ...