### Ideas and Algorithms

- Not perfect
  - Mathematics courses teach analytical techniques
  - Engineering courses work on real problems
- Not efficient
  - Mathematics courses analyze numerical algorithms
  - Engineering and computer science implement the software
- Formula-based  $\rightarrow$  solution-based

### Introduction

- Modeling: applied mathematics
  - Identify the key quantities in the problem
  - Connect them by differential equations or matrix equations
  - Study of special functions
  - Constructing the equations of equilibrium and motion (balance equations)
- Solving: scientific computing
  - Those equations
  - Numerical analysis of the algorithm to test its accuracy and stability
  - Solving steady state and time-dependent matrix and differential equations

# Four Simplifications (1)

- Nonlinear  $\rightarrow$  Linear
  - Hooke's law in mechanics: displacement  $\infty$  force
  - Ohm's law in networks: current  $\infty$  voltage difference
  - Scaling law in economics: output  $\infty$  input
  - Linear regression in statistics: a straight line or a hyperplane can fit the data
  - Physical nonlinearity vs. geometric nonlinearity
  - Curvature formula in the bending of a beam:  $\frac{u''}{\sqrt{(1+(u')^2)^3}} \xrightarrow{\text{small } u''} u''$
- Continuous  $\rightarrow$  Discrete
  - Laplace's equation: gradient, divergence, curl
  - To discretize the continuous equation into Ku = f (Ch.3)
    - Finite element method
    - Finite difference method

# Four Simplifications (2)

- To solve for u (Ch.7)
  - Direct elimination
  - · Iterations with preconditioning
- For very large K, good solution algorithm (multigrid) better than a supercomputer
- Stability for the discretization in the initial-value problems (Ch.6)
- Multidimensional  $\rightarrow$  One-dimensional
  - Separation of variables: u(x, t) = A(x)B(t)
  - Spectral method (Ch.5)
- Variable coefficients  $\rightarrow$  Constants
  - Fourier transform (Ch.4)
    - Sines, cosines, exponentials
    - physical domain (x, t)  $\rightarrow$  frequency domain (k,  $\omega$ )

### **Computational Science and Engineering**

- Large scale computation?
- Fundamentals of scientific computing with short codes to implement the key concepts
  - Symmetric positive definite matrices A<sup>T</sup>CA: stiffness, conductance, multigrid matrices
  - A: geometry, C: physical properties
  - Spring-mass systems, networks, least squares, differential equations like div(c grad u)=f

# Applications (1)

- Computational Engineering
  - Finite element method (computational mechanics)
  - Reliable and efficient for the mechanics of structures
  - 1D introduction in Section 3.1, 2D code in Section 3.6
  - Differential equations in weak form integrated against test functions
  - Stresses and displacements approximated by polynomials
  - Fluid-structure interactions, high-speed impact?
- Computational Electromagnetics
  - SPICE codes: solve network problems with many circuit elements
    - Variations of Newton's method  $J\Delta u=-g$  (Section 2.6) for g(u)=0
  - Finite differences on a staggered grid (Yee's method) for Maxwell's equations
  - Helmholtz equation separates variables: indefinite equation with negative eigenvalues for high frequencies

## Applications (2)

- Computational Physics and Chemistry
  - Large computation over many time steps, resolution for high accuracy → multigrid (Section 7.3)
  - Stability and accuracy over many periods: mu"=f(u) in Section 2.2
    → atomic oscillation, orbits in space
  - Computational fluid dynamics (Sections 6.6-6.7): convections with diffusion, divergence-free projection to solve the Navier-Stokes equations
- Computational Biology
  - Differential equations (part of biology)
  - Another large part: networks of nodes and edges (Section 2.4), combinatorial problems, probability, very large amount of data
  - Data mining: probability, statistics, signal processing, optimization

## Applications (3)

- Computational Simulation and Design
  - Quicker and easier than physical experiments
  - Series of tests with varying parameters to approach an optimal design
  - Numerical simulations reliable? Problem of quantifying uncertainty
  - Validation (solving the right equations): modeling
  - Verification (solving the equations right): estimate of numerical error
    - Discretization:  $O((\Delta x)^2)$ ,  $O((\Delta t)^4)$
    - derivatives→difference, functions→polynomials, integrals→finite sums
  - Sensitivity analysis: *d*(output)/*d*(input) Section 8.7
  - Ill-posed inverse problem vs. well-posed forward problem

## Applications (4)

- Computational Finance
  - Black-Scholes equation: Ito's lemma, Brownian motion (Section 6.5)
  - Constant volatility: reduce to the heat equation  $u_t = u_{xx}$
  - Variable volatility: finite differences
  - Monte Carlo methods
- Computational Optimization
  - Compute a minimum or maximum subject to constraints
  - Lagrange multipliers: sensitivity of the solution to changes in the data
  - duality for least squares (Section 8.1)
  - Calculus of variations: function of x or t
    - Lagrangians and Hamiltonians in mechanics

# Basics of Scientific Computing (1)

- Matrix equations (problems of linear algebra)
  - Iu(A): Ax = b by elimination and A=LU (triangular factors)
  - eig(A): Ax= $\lambda$ x leading to diagonalization A=S $\Lambda$ S<sup>-1</sup> (eigenvalues in  $\Lambda$ )
  - qr(A): Au≈b by solving  $A^TA\hat{u}=A^Tb$  with orthogonalization A=QR
  - svd(A): Best bases from the Singular Value Decomposition  $A=U\Sigma V^T$
- Differential equations in space and time: boundary and initial values
  - Explicit solution by Fourier and Laplace transforms
  - Finite difference solutions with tests for accuracy and stability
  - Finite element solutions using polynomials on unstructured meshes
  - Spectral methods of exponential accuracy by Fast Fourier Transform

# Basics of Scientific Computing (2)

- Large sparse systems of linear and nonlinear equations
  - Direction solution by reordering the unknowns before elimination
  - Multigrid solution by fast approximation at multiple scales
  - Iterative solution by conjugate gradients and MINRES
  - Newton's method: linearization with approximate Jacobians

#### Applied Mathematics for Computational Design and Analysis 전산설계 및 해석을 위한 응용수학

Ch	Contents	
1	Applied Linear Algebra	$\bigcirc$
2	A Framework for Applied Mathematics	$\bigcirc$
3	Boundary Value Problems	$\bigcirc$
4	Fourier Series and Integrals	
5	Analytic Functions	
6	Initial Value Problems	
7	Solving Large Systems	
8	<b>Optimization and Minimum Principles</b>	$\bigcirc$

#### Advanced Numerical Methods in Engineering 수치해석특론

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	Variational Method	$\bigcirc$