

Numerical Methods in Biomechanics

ME-484

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EPFL - Laboratory of Biomechanical Orthopedics

Content - schedule

W01: Organization, introduction and examples

W02: External lecturers

W03: Partial Differential Equations

W04: Solid mechanics in numerical biomechanics

W05: Fluid mechanics in numerical biomechanics

W06: The Finite Element Method (FEM), and its extensions

W07: Midterm project presentations

W08: Midterm evaluation

W09: Multiphysics and coupling

W10: Example 1

W11: Example 2

W12: Example 3

W13: Final project presentation

Partial Differential Equations

Most biomechanical systems can be described by

- A set of Partial Differential Equations (PDEs)
- Completed with constitutive equations
- Boundary conditions
- Initial conditions

PDEs

- Solid (deformation) mechanics (stress, strain)
- Fluid mechanics (fluid velocity, pressure)
- Heat (temperature)
- Transport (diffusion, advection, concentration)
- Electromagnetism (electric & magnetic potential)
- Wave propagations (EM, acoustic)
- Coupling in multi-physics

Ordinary Differential Equations (ODE)

- Differential equation of 1 dependent (function) variable y with 1 independent variable t
- Linear/nonlinear
- Order (highest derivative)
- Homogeneous/nonhomogeneous (source term)
- Existence, uniqueness (Cauchy–Lipschitz theorem)

$$\frac{dy}{dt} = F(t, y), y(t_0) = y_o$$

Ordinary Differential Equations (ODE)

- System of linear ODEs
- ODE of order n can reduce to n 1st order ODEs
- Non constant coefficients : $A = A(x, t)$
- Nonhomogeneous ODE ($b \neq 0$)
- Boundary problem (x), or initial value problem (t)

$$\frac{dy}{dt} = A \cdot y(t) + b(t), \quad y(t_0) = y_0$$

ODE example: Lotka-Volterra

- Predator-prey model
 - Predators' number rate depend on prey's number
 - Prey's number rate depend on predators' number
 - With few predators, preys can reproduce
 - If predators over-exploit preys, they decrease
- Applied to animals, cells, chemicals
- Typically oscillating solutions



ODE example: Lotka-Volterra

P : predators (concentration)

H : prey (concentration)

r : growth rate of H

a : predation rate coefficient

b : growth rate of P

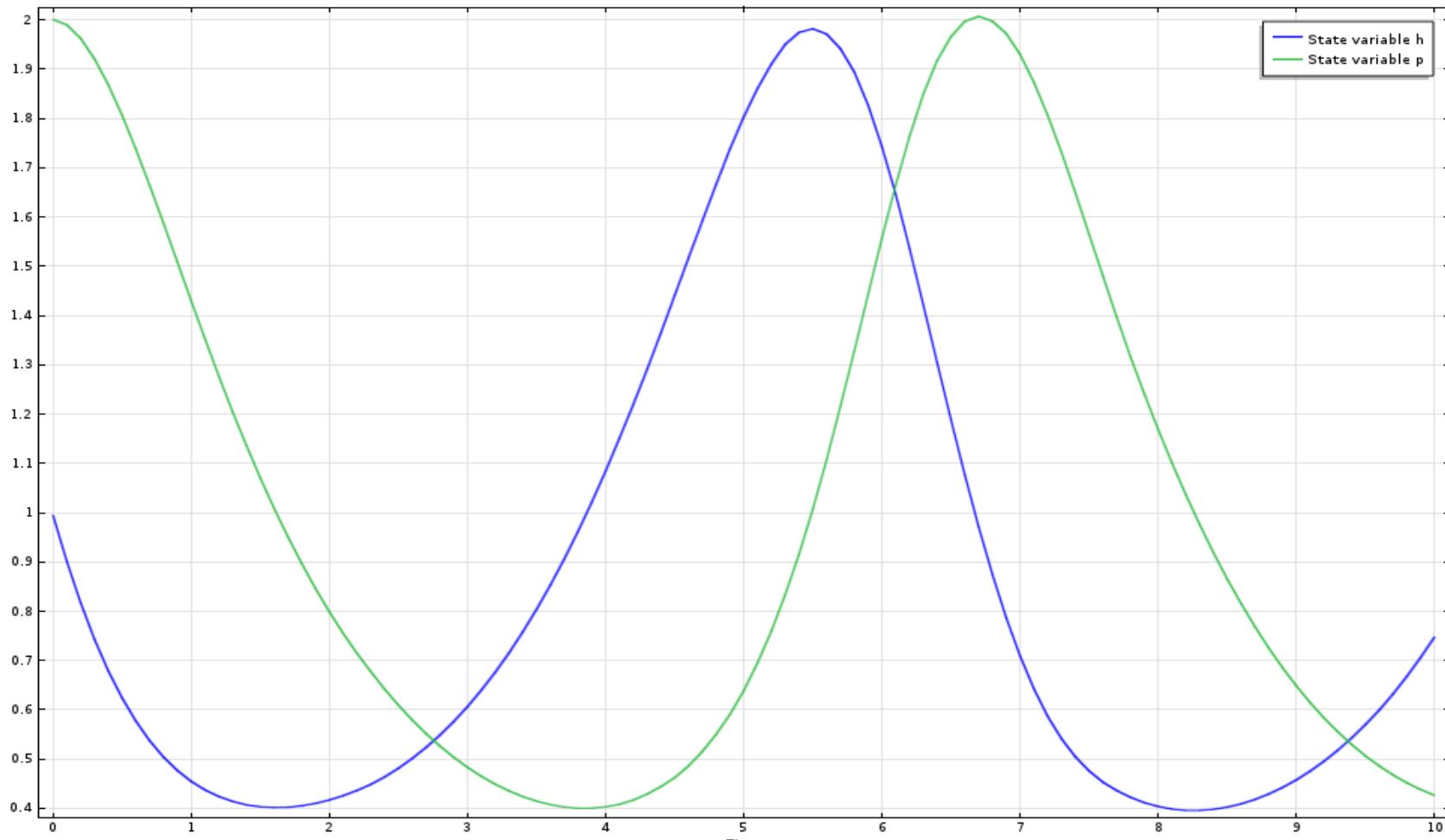
m : mortality rate of P

Constants: $r = a = b = m = 1$

Initial condition: $H(0) = 1, P(0) = 2$

$$\begin{cases} \frac{dH}{dt} = (r - aP)H \\ \frac{dP}{dt} = (bH - m)P \end{cases}$$

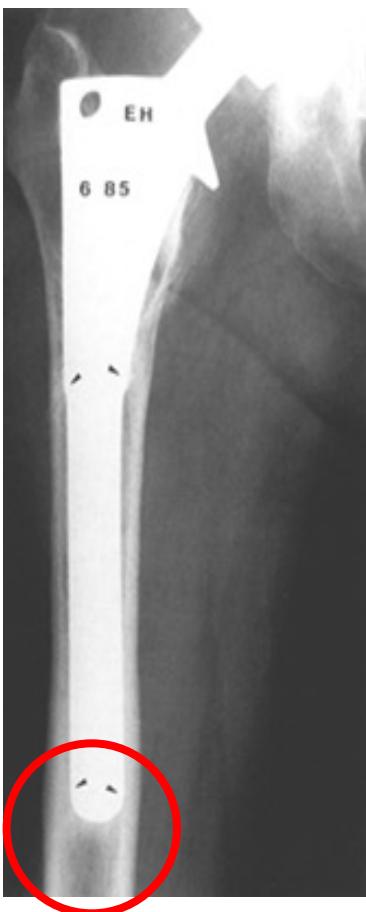
ODE example: Lotka-Volterra



Try with other initial conditions (stationary point: $H_0 = P_0 = 1$) or constants

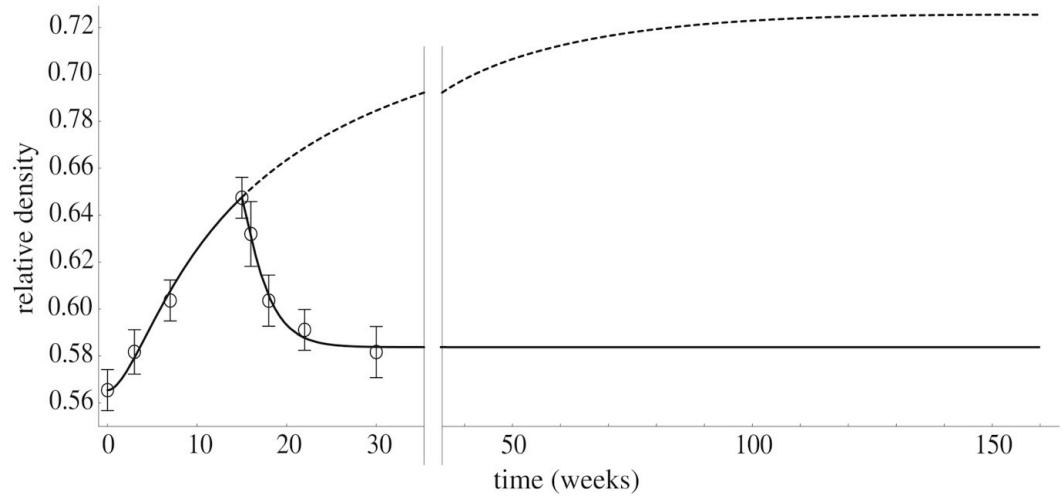
ODE example: bone adaptation

post-surgery after 1 year



$$\frac{\partial \rho(x, t)}{\partial t} = v(\psi(x, t) - \psi_e)$$

$$\frac{d\rho}{dt} = v \left(\frac{\rho_c^2 \sigma^2}{2E_c \rho^3} - \psi_e \right)$$



ODE example: bone adaptation

$$\frac{d\rho}{dt} = \nu \left(\frac{A}{\rho^3} - B \right)$$

ρ : bone density (dependent variable)

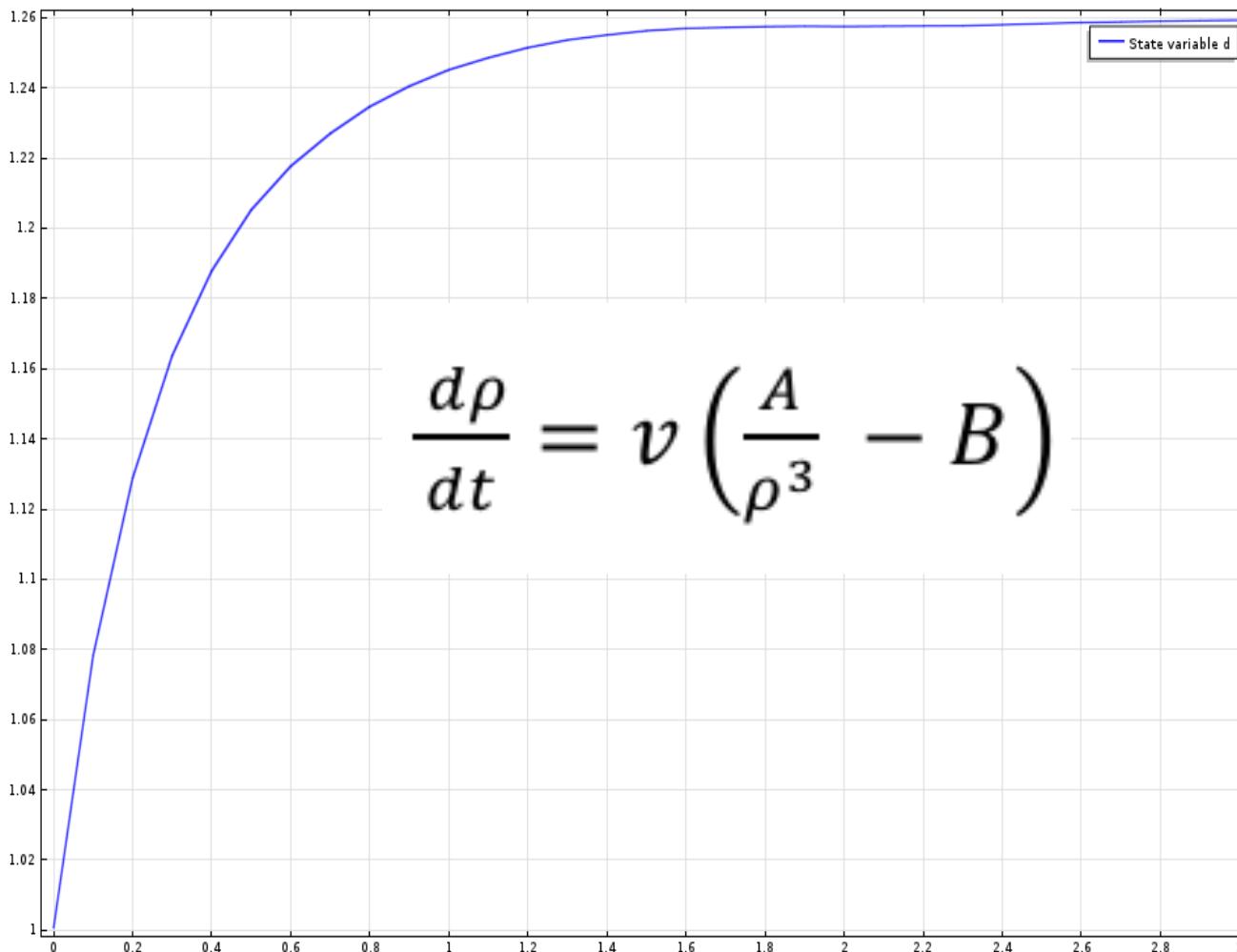
A : mechanical (actual) stimulus ($A = 2$)

B : equilibrium stimulus ($B = 1$)

ν : remodeling rate ($\nu = 1$)

Initial value $\rho(0) = 1$

ODE example: bone adaptation



Try with other initial conditions or constants

Partial Differential Equation (PDE)

$$F(x_1, \dots, x_n, u, \frac{\partial}{\partial x_1}u, \dots, \frac{\partial}{\partial x_n}u, \frac{\partial^2}{\partial x_1 \partial x_1}u, \frac{\partial^2}{\partial x_1 \partial x_2}u, \dots) = 0$$

- u_i dependent variables (functions)
- x_i independent variables
 - $x_1 = t$ (time)
 - $x_2 = x, x_3 = y, x_4 = z$ (space)
- No time dependency (steady state or equilibrium)
- Existence and uniqueness not guaranteed in general, but usually locally if well-posed

Well-posed PDE

- Regular PDE and domain (Cauchy problem)
- Constitutive equations
- Boundary conditions
- Initial conditions

⇒ A unique & stable solution exists (locally)

Boundary conditions

- Value of the dependent variable u (and/or its derivative) on the boundary for all time t
- **Dirichlet:** u imposed on the boundary
- **Neumann:** du/dn imposed on the boundary
- Mixed: Dirichlet and Neumann on boundary parts
- Cauchy: Dirichlet and Neumann on boundary
- Robin : $u + du/dn$ imposed on the boundary

Initial conditions

- Value of the dependent variable, and/or its derivatives, at time $t = 0$, for the entire domain
- Initial value problem

$$u(x, t = 0) = u_0(x)$$

Typical PDE operators

Differential operators

- Gradient:

$$\nabla = \frac{\partial}{\partial x} \hat{\mathbf{x}} + \frac{\partial}{\partial y} \hat{\mathbf{y}} + \frac{\partial}{\partial z} \hat{\mathbf{z}}$$

- Divergence:

$$\operatorname{div} \vec{v} = \frac{\partial v_x}{\partial x} + \frac{\partial v_y}{\partial y} + \frac{\partial v_z}{\partial z} = \nabla \cdot \vec{v}$$

- Rotation (curl):

$$\operatorname{curl} \vec{v} = \left(\frac{\partial v_z}{\partial y} - \frac{\partial v_y}{\partial z} \right) \hat{\mathbf{x}} + \left(\frac{\partial v_x}{\partial z} - \frac{\partial v_z}{\partial x} \right) \hat{\mathbf{y}} + \left(\frac{\partial v_y}{\partial x} - \frac{\partial v_x}{\partial y} \right) \hat{\mathbf{z}} = \nabla \times \vec{v}$$

- Laplacian:

$$\Delta = \frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2} + \frac{\partial^2}{\partial z^2} = \nabla \cdot \nabla = \nabla^2$$

PDE: scalar coefficient form

$$e_a \frac{\partial^2 u}{\partial t^2} + d_a \frac{\partial u}{\partial t} + \nabla \cdot (-c \nabla u - \alpha u + \gamma) + \beta \cdot \nabla u + a u = f \quad \text{in } \Omega$$

$$\mathbf{n} \cdot (c \nabla u + \alpha u - \gamma) + q u = g - h^T \mu \quad (\text{Generalized Neumann}) \text{ on } \partial\Omega$$
$$u = r \quad (\text{Generalized Dirichlet}) \text{ on } \partial\Omega$$

- Coefficients $(c, \alpha, \gamma, \beta, a, h)$ and f, g , and r can depend on x, y, z, t
- PDE is linear when coefficients depend only on (x, y, z) , or constant
- PDE is nonlinear if coefficients depend on u (or its derivatives)
- **Initial condition is required**

Partial Differential Equation (PDE)

Most physical PDE are 2nd order, with linear coef.

- Elliptic: solid, heat (steady state)

$$\frac{\partial^2 w}{\partial x^2} + \frac{\partial^2 w}{\partial y^2} = 0$$

- Parabolic: heat, diffusion

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

- Hyperbolic: wave, advection

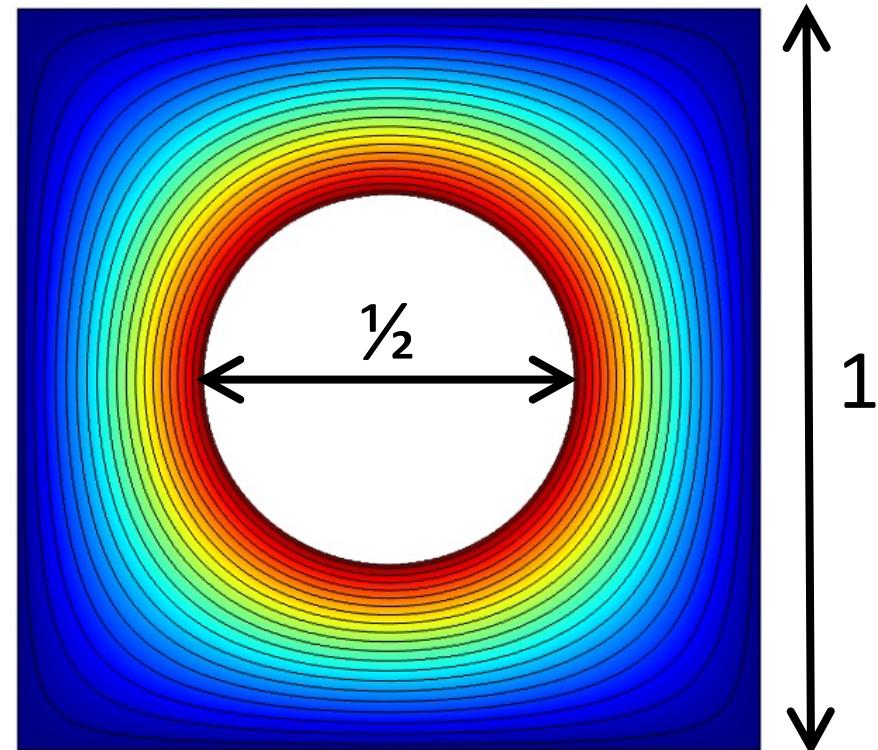
$$\frac{\partial^2 w}{\partial t^2} - \frac{\partial^2 w}{\partial x^2} = 0$$

Example of elliptic PDE

- Laplace equation $\nabla \cdot (\nabla u) = 0$
- Static solid deformation (displacement u)
- Static heat equation (temperature u , heat flux du/dx)
 - Dirichlet: Fixed temperature (u) on boundary
 - Neumann: Fixed heat flux (insolation) on boundary
- Electromagnetism, astronomy, fluid dynamics

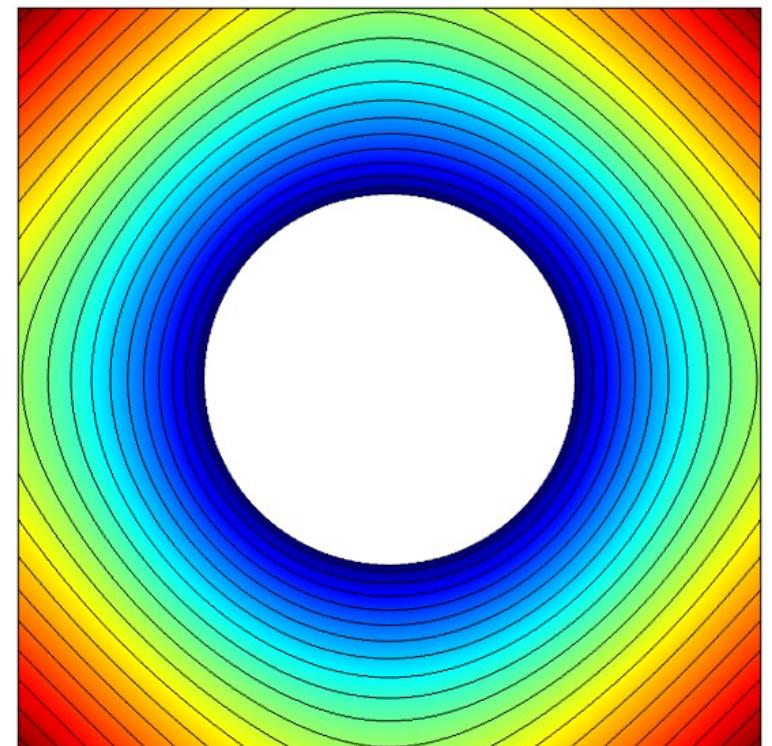
Example of elliptic PDE

- 2D Laplace on a square domain with a hole
- $u_{xx} + u_{yy} = 0$
- Dirichlet conditions
 - $u = 1$ (int. circle)
 - $u = 0$ (ext. frame)



Example of elliptic PDE

- 2D Laplace on a square domain with a hole
- $u_{xx} + u_{yy} = 0$
- Mixed (Dirichlet + Neumann)
 - $u = 1$ (int. circle)
 - $du/dn = 1$ (ext. frame)



Example of parabolic PDE

Equation of heat

$$\rho C_p \frac{\partial T}{\partial t} + \rho C_p \mathbf{u} \cdot \nabla T = \nabla \cdot (k \nabla T) + Q$$

Convective term

Diffusive term

ρ is the density (SI unit: kg/m³)

C_p is the specific heat capacity at constant pressure (SI unit: J/(kg·K))

T is absolute temperature (SI unit: K)

\mathbf{u} is the velocity vector (SI unit: m/s)

k is the thermal conductivity (SI unit: W/(m·K))

Q contains heat sources other than viscous heating (SI unit: W/m³)

Example of parabolic PDE

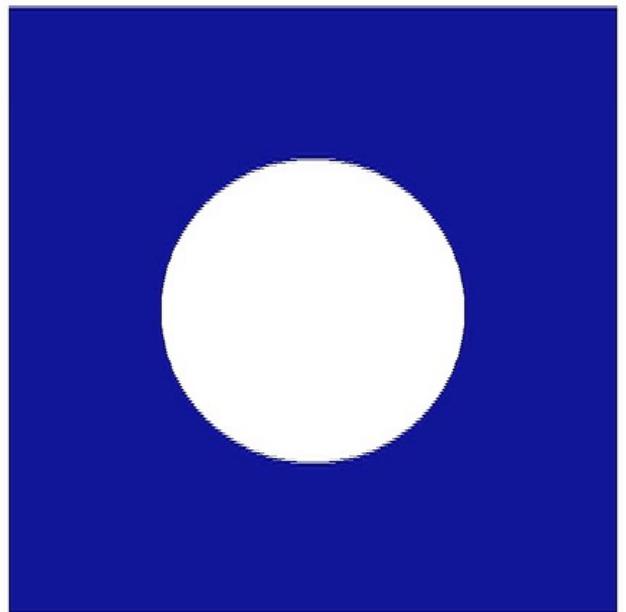
- Parabolic heat equation
- No source $f = 0$
- Evolution of $u(t)$, $t \in [0, 0.1]$

$$u(t_0) = 0$$

$$du/dn = 1 \text{ (int. circle)}$$

$$u = 0 \text{ (ext. frame)}$$

$$d_a \frac{\partial u}{\partial t} - \nabla \cdot (c \nabla u) = f$$



Well-posed problem

- Domain (geometry)
- PDE (physics)
- Constitutive laws (material)
- Initial conditions
- Boundary conditions

Summary

- Most biomechanical (bioengineering) systems (problems) can be represented by Partial Differential Equations (PDEs)
- Well-posed PDEs have a unique solution
- Most PDEs can't be solved analytically
- Many PDEs can be solved by numerical methods
- Some PDEs can't be solved by numerical methods

Sophus Lie (1842-1899)

"Among all of the mathematical disciplines, the theory of differential equations is the most important... It furnishes the explanation of all those elementary manifestations of nature which involve time."



EPFL

Campus
Lecture

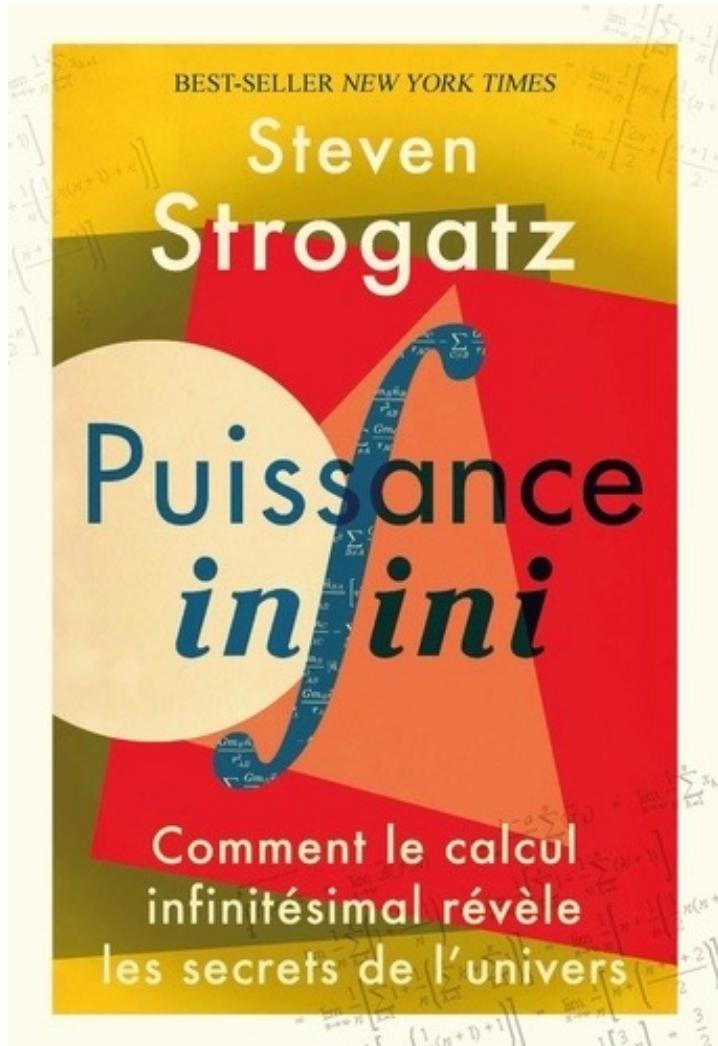
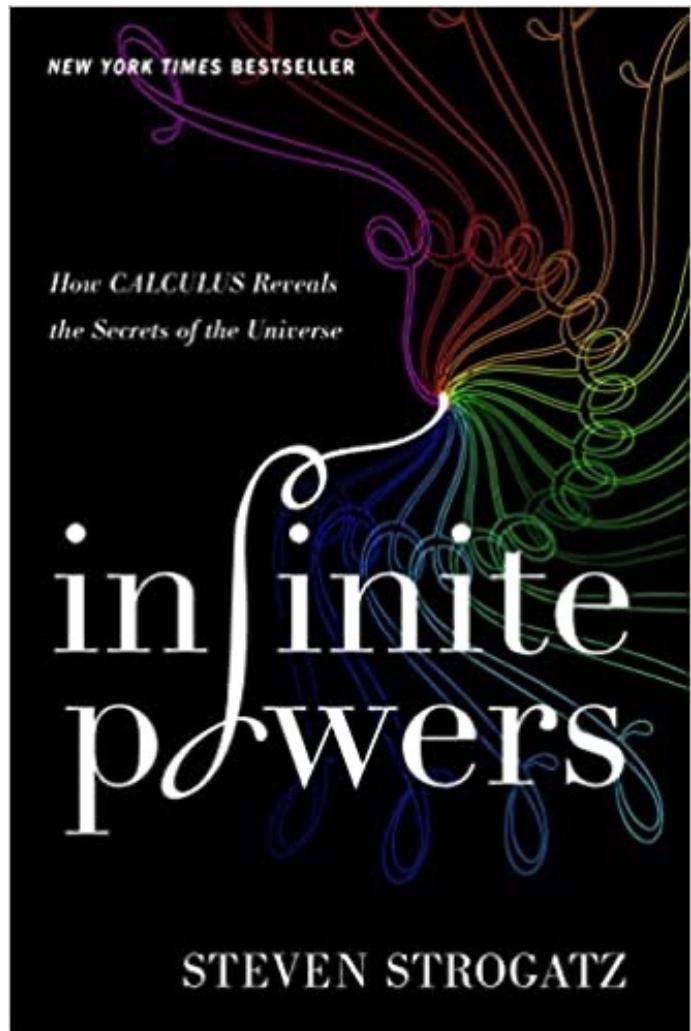
Tuesday,
December 8th,
14:30 - 16:00,
Online
Conference



Steven
Strogatz

**“Infinite Powers:
The story of calculus”**

<https://www.youtube.com/watch?v=3xP19pqUGIw>



References

- Partial Differential Equations I, Basic Theory, Michael E. Taylor
- Partial Differential Equations II, Qualitative Studies of Linear Equations, Michael E. Taylor
- Partial Differential Equations III, Nonlinear Equations, Michael E. Taylor
- Partial Differential Equations, Emmanuele DiBenedetto
- Partial Differential Equations, Modeling and Numerical Simulation, Roland Glowinski and Pekka Neittaanmäki
- Linear Partial Differential Equations for Scientists and Engineers, Tyn Myint-U and Lokenath Debnath
- Partial Differential Equations, Laurence C Evans