

# Coupled reaction-diffusion equations

A solver for general coupled reaction-diffusion equations has recently been written.

$$\frac{\partial u_i}{\partial t} - \nabla \cdot (D_i \nabla u_i) = f_i(\mathbf{x}, u_1, \dots, u_p, v_1, \dots, v_p),$$

$$\frac{dv_i}{dt} = g_i(\mathbf{x}, u_1, \dots, u_p, v_1, \dots, v_p),$$

where  $u_i$  and  $v_i$  denote the extracellular and intracellular concentrations of solute  $i$  respectively, and with BCs

$$u_i = u_i^*(\mathbf{x}), \quad \text{on } \Gamma_1$$

$$\mathbf{n} \cdot (D_i(\mathbf{x}) \nabla u_i) = g_i(\mathbf{x}), \quad \text{on } \Gamma_2$$

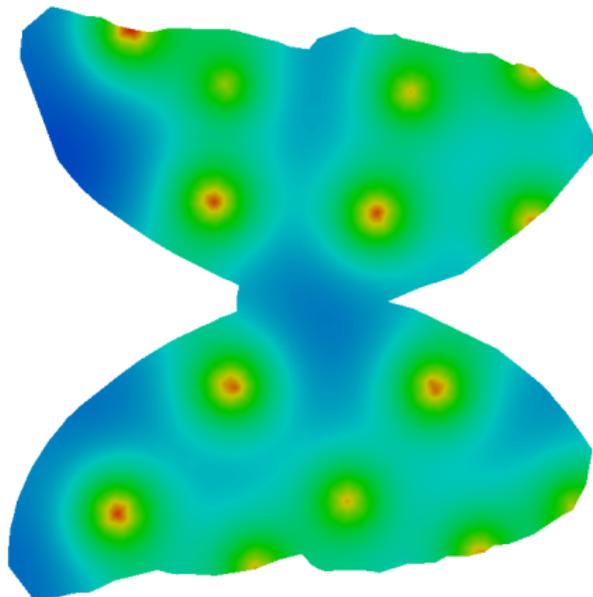
$$u_i(0, \mathbf{x}) = u_i^{(0)}(\mathbf{x}),$$

$$v_i(0, \mathbf{x}) = v_i^{(0)}(\mathbf{x}),$$



Chaste

# Coupled reaction-diffusion equations



See the tutorial `LinearParabolicPdeSystemsWithCoupledOdeSystems` for more details



## An overview of alternative methods for solving PDEs

# The finite difference method

- Finite differences are conceptually the simplest method for solving PDEs
- Set up a (generally regular) grid on the geometry, aim to compute the solution at the gridpoints
- All derivatives in the PDE (and in Neumann BCs) are replaced with difference formulas

For a regular grid in 1D  $x_0, x_1, \dots, x_N$ , stepsize  $h$ : some possible difference formulas and corresponding error introduced are: forward, backward and central differences:

$$\frac{du}{dx}(x_i) = \frac{x_{i+1} - x_i}{h} + \mathcal{O}(h)$$

$$\frac{du}{dx}(x_i) = \frac{x_i - x_{i-1}}{h} + \mathcal{O}(h)$$

$$\frac{du}{dx}(x_i) = \frac{x_{i+1} - x_{i-1}}{2h} + \mathcal{O}(h^2)$$

and

$$\frac{d^2u}{dx^2}(x_i) = \frac{x_{i+1} - 2x_i + x_{i-1}}{h^2} + \mathcal{O}(h^2)$$

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## The finite difference method

For example, for the heat equation  $u_t = u_{xx} + f$ , suppose we choose a fully explicit time-discretisation, and then discretise in space:

Heat equation: 
$$u_t = u_{xx} + f$$

Semi-discretised: 
$$u^{n+1} - u^n = \Delta t u_{xx}^n + \Delta t f(t_n)$$

Fully discretised: 
$$u_i^{n+1} - u_i^n = \frac{\Delta t}{h^2} (u_{i+1}^n - 2u_i^n + u_{i-1}^n) + \Delta t f(t_n, x_i)$$

(Since this is an explicit scheme there will be a condition required for stability:  $\frac{\Delta t}{h^2} \leq \frac{1}{2}$ . Such results are obtained using *Von Neumann (Fourier) stability analysis*).

Let us write the above as a linear system:  $\mathbf{U}^{n+1} = \mathbf{U}^n + \frac{\Delta t}{h^2} D\mathbf{U}^n + \Delta t \mathbf{F}^n$ , where  $\mathbf{U}^n = [U_1^n, \dots, U_N^n]$ ,  $\mathbf{F}^n = [f(t_n, x_1), \dots, f(t_n, x_N)]$ , and  $D$  is a matrix with  $-2$ s on the diagonal and  $1$ s above and below the diagonal.

The first and last rows of the linear system have to be altered to take into account Dirichlet and/or Neumann boundary conditions.

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Compare the finite difference equation:

$$\mathbf{U}^{n+1} = \mathbf{U}^n + \frac{\Delta t}{h^2} D\mathbf{U}^n + \Delta t \mathbf{F}^n$$

with the equivalent finite element equation:

$$M\mathbf{U}^{n+1} = M\mathbf{U}^n + \Delta t K\mathbf{U}^n + \Delta t \mathbf{b}^n$$

In fact, for a regular grid in 1D and with linear basis functions,  $K = D/h$  (except for first/last rows).

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## Finite volume methods

- Very commonly used for hyperbolic PDEs (for which the FE method tends to have trouble) and in computational fluid dynamics
- As with FE, FV is based on *integral formulations*.
- The domain is broken down into *control volumes* (similar to 'elements').
- One unknown computed per element (i.e. no need for 'node')—this can be considered to be the average value of  $u$  in the control volume.

Consider the advection equation  $u_t + \nabla \cdot \mathbf{f}(u) = 0$ . Integrate over a control volume  $\Omega_i$  of volume  $V_i$ :

$$\int_{\Omega_i} u_t \, dV = \int_{\Omega_i} -\nabla \cdot \mathbf{f}(u) \, dV = - \int_{\partial\Omega_i} \mathbf{f}(u) \cdot \mathbf{n} \, dS$$

Using an explicit time-discretisation, and  $\int_{\Omega_i} U^n \, dV \approx V_i U_i^n$ , we obtain

$$U_i^{n+1} = U_i^n - \frac{\Delta t}{V_i} \int_{\partial\Omega_i} \mathbf{f}(u^n) \cdot \mathbf{n} \, dS$$

See eg <http://www.comp.leeds.ac.uk/meh/Talks/FVTutorial.pdf> for more details

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## Methods of weight residuals

In FE we used an *integral formulation of the PDE*, eg: find  $\mathbf{u} \in \mathcal{V}$  such that:

$$\int_{\Omega} \nabla \mathbf{u} \cdot \nabla \mathbf{v} \, dV = \int_{\Omega} f \mathbf{v} \, dV + \int_{\Gamma_2} g \mathbf{v} \, dS \quad \forall \mathbf{v} \in \mathcal{V}$$

Write this as: find  $\mathbf{u} \in \mathcal{V}$  such that:  $a(\mathbf{u}, \mathbf{v}) = l(\mathbf{v}) \quad \forall \mathbf{v} \in \mathcal{V}$

To *discretise* the integral equation, we replace  $\mathcal{V}$  by *finite-dimensional subspaces* (of dimension  $N$ ): find  $\mathbf{u}^{\text{approx}} \in \mathcal{W}_1$  such that:

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Choosing bases:

$$\mathcal{W}_1 = \text{span}\{\phi_1, \dots, \phi_N\}$$

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(ie  $\mathbf{u}^{\text{approx}} = \sum \alpha_i \phi_i$ ), we can obtain  $N$  equations for  $N$  unknowns.

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- **Collocation methods:** use  $\delta$ -functions for  $\chi$ 's (i.e. replace integrals with point evaluations (at  $N$  collocation points  $x_1, x_2, \dots, x_N$ ))
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  - As we know in practice we just consider 1 canonical element and define the basis functions on this (the *shape functions*)
  - Elements could be tetrahedral/hexahedral, shape functions could be linear, quadratic, cubic Hermite and more...
- **Discontinuous Galerkin FEM:**  $\phi_i$  piecewise polynomial but no longer continuous across elements
- **Spectral methods:**  $\phi_k$  globally continuous and infinitely differentiable (for example,  $\phi_k(x) = \exp(ikx)$ )

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  - Elements could be tetrahedral/hexahedral, shape functions could be linear, quadratic, cubic Hermite and more...
- **Discontinuous Galerkin FEM:**  $\phi_i$  piecewise polynomial but no longer continuous across elements
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## Methods of weight residuals

Find  $u^{\text{approx}} \in \mathcal{W}_1$  such that:

$$a(u^{\text{approx}}, v) = l(v) \quad \forall v \in \mathcal{W}_2$$

with:

$$\mathcal{W}_1 = \text{span}\{\phi_1, \dots, \phi_N\}.$$

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# Spectral methods

- There are both spectral-collocation methods (work with the strong form) or spectral-Galerkin methods (work with the weak form)
- Various choices of basis functions ( $\mathcal{W}_1$ ) are possible, for example
- For problems with **periodic boundary conditions**, use  $\phi_k(x) = \exp(ikx)$ 
  - i.e.  $u^{\text{approx}} = \sum \alpha_k \phi_k$  approximates  $u$  with a cut-off Fourier series
- For problems with **non-periodic boundary conditions**: use a set of 'orthogonal polynomials' for  $\phi_k$ , such a Legendre or Chebychev polynomials
- For problems with *smooth data* (initial condition, boundary conditions, forces etc are smooth functions), spectral methods give exceptional rates of convergence.
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# Continuum Mechanics

# Overview

## 1 Introduction: solids and fluids

2 Kinematics\*

3 Balance equations\*

4 Material laws\*

5 Overall governing equations\*

6 Weak problem and numerical method\*\*

7 Objected-oriented design in Chaste\*\*

\* Focussing on nonlinear elasticity, but also mentioning linear elasticity & fluids

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## Introduction: solids and fluids

# Solids versus fluids



# Solids versus fluids



Pitchdrop experiment, Queensland. Experiment begun 1927 (1930). Drops fell in: 1938, 1947, 1954, 1962, 1970, 1979, 1988, 2000

## Solids versus fluids

“Fluids cannot resist deformation force”. Shape will change as long as the force is applied. Whereas a solid can change shape but not indefinitely.

More specifically, fluids cannot resist shear forces

- For solids, force is related to *deformation* (coefficient: *stiffness*)
- For fluids, force is related to *deformation-rate* (coefficient: *viscosity*)

Some materials are fluid under some conditions (excl. temperature) and solid under others (see, for example, [youtube:walking on custard](#))

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# Types of solid

For solids, force is related to deformation (stress related to strain):

## Elastic

- When an applied force is removed, the solid returns to its original shape
- For small enough forces/strains, stress is usually proportional to strain (*linear elasticity*)

## Visco-elastic

- Also exhibit a *viscous response*, for example, slow change of shape if a force is held constant / slow decrease of stress if strain held constant
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## Plastic

- Once a large enough stress is applied (the *yield stress*), the material undergoes permanent deformation (*flows*), due to internal rearrangement. If the stress is removed it won't return back to original state.

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# Types of fluid

For fluids force is related to deformation-rate (stress is related to strain-rate)

## Newtonian

- Stress is related *linearly* to the strain-rate

## Non-Newtonian

- Stress is related *non-linearly* to the strain-rate

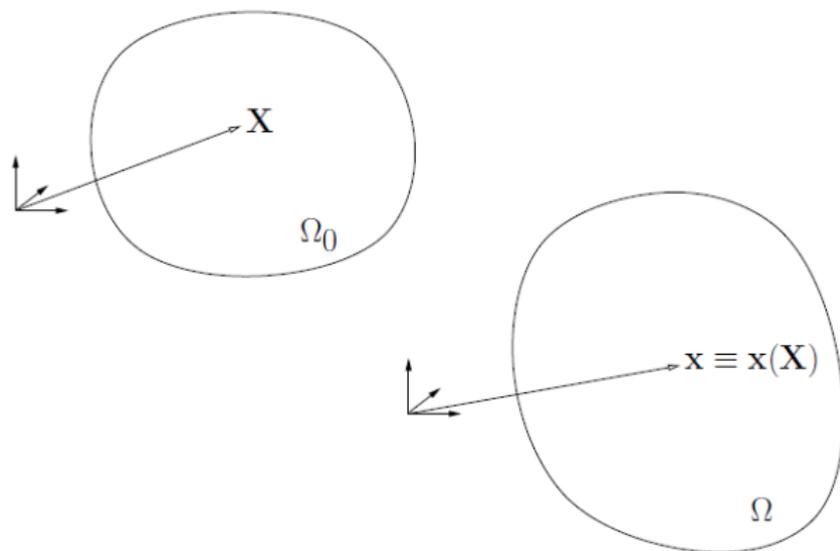
## Kinematics of solids

# Kinematics of solids

In the later section we will write down balance equations relating the internal stresses in the body to external forces.

What are the internal stresses a function of?

# Undeformed and deformed states



- Let  $\Omega_0$  represent the unloaded, unstressed body
- Let  $\Omega_t$  represent the deformed body at time  $t$ 
  - For time-independent problems, we denote the deformed body  $\Omega$
- Let  $\mathbf{X}$  represent a point in the undeformed body
- Let  $\mathbf{x} \equiv \mathbf{x}(t, \mathbf{X})$  represent the corresponding deformed position
- Let the displacement be denoted  $\mathbf{u} = \mathbf{x} - \mathbf{X}$

# The deformation gradient

Let  $F_{iM} = \frac{\partial x_i}{\partial X_M}$  be the deformation gradient. This describes the deformation, excluding rigid body translations.

Any deformation can be decomposed into a (local) translation, rotation, and stretch. Correspondingly,  $F$  can be decomposed into a rotation and a stretch:  $F = RU$ , where  $R$  is a rotation matrix, and  $U$  is a positive-definite symmetric matrix representing stretch.

Examples, in 2D:

- let  $\mathbf{x} = \begin{bmatrix} \alpha X \\ \beta Y \end{bmatrix}$ , then  $F = \begin{bmatrix} \alpha & 0 \\ 0 & \beta \end{bmatrix}$  (simple bi-axial stretch)
- let  $\mathbf{x} = \begin{bmatrix} X - \alpha Y \\ Y \end{bmatrix}$ , then  $F = \begin{bmatrix} 1 & -\alpha \\ 0 & 1 \end{bmatrix}$  (simple shear)

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# The deformation gradient

## $\det F$

$F$  is the jacobian of the mapping from  $\Omega_0$  to  $\Omega$ , therefore  $\det F$  represents the change in local volume. Hence:

- $\det F > 0$  for all deformations
- For incompressible deformations (also known as *isochoric* or *isovolumetric* deformations),  $\det F = 1$  (everywhere)

Define  $J = \det F$

## Principal stretches

The eigenvalues of  $U$  are of the *principal stretches*, denoted  $\lambda_1, \lambda_2, \lambda_3$

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# Lagrangian measures of strain

The (*right*) *Cauchy-Green deformation tensor* is

$$C = F^T F$$

Note that

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The *Green-Lagrange strain tensor* is

$$E = \frac{1}{2} (C - I)$$

and is the nonlinear generalisation of the simple 1d strain measure  $(l - l_0)/l_0$

Can work with either  $C$  or  $E$ . Note: for no deformation  $C = I$  vs  $E = 0$ .

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