# **Numerical Simulation Methods in Geophysics, Part 1: Foundations**

1. MGPY+MGIN, 3. MDRS+MGEX-CMG

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## Introduction

#### Content

- 0. Some introduction
- 1. Partial differential equations in geophysics
- 2. Finite Differences
- 3. Numerical integration
- 4. Integral equations and Method of Moments
- 5. Solving linear systems
- 6. Finite element method
- 7. Finite Volume method
- 8. High-performance computing

#### **Schedule**

**Lectures** Wednesday, 11:30, MEI-2122 ⇒ Meeting room MEI-211

14 slots: 16.10., 23.10., 30.10., 06.11., (13.11.), 27.11., 04.12., 11.12., 18.12., 08.01., 15.01., 22.01., 28.01., 05.02.

Exercises Thursday, 08:00-09:30, CIP pool MEI1203a

14 slots: 17.10., 24.10., 07.11., 14.11., 21.11., 28.11., 05.12., 12.12., 19.12., 09.01., 16.01., 23.01., 29.01., 06.02.

Grade: submitting a report including codes

#### What should you know already?

- Higher mathematics: differential equations, algebra (1.-2. BSc)
- Experimental and theoretical physics: governing equations
- Numerics for engineers (2. BSc)
- Programming (1. BSc), Software development (3. BSc)
- Geophysics: feeling for physical fields & methods
- Electromagnetics (5. BSc), Theory EM,
- now: Scientific programming, HPC, seismic imaging

#### Topics to be covered

- recap on partial differential equations
- (1D) heat equation: stationary and instationary (Geothermics course)
- 2D: magnetotellurics
- 3D DC modelling (content of Spitzer videos)
- 2D ground-penetrating radar (EM) and pressure waves (seismics)
- excurse to hydrodynamic modelling
- modelling the Eikonal equation (the travelling saleman)
- exercises: code FD & FE by hand, use packages to obtain feeling

## Literature

- Haber (2015): Computational methods geophysical electromagnetics
- Morra (2018): Pythonic Geodynamics Implementations for fast computing, frei verfügbar unter https:// doi.org/10.1007/978-3-319-55682-6, zum Eintauchen ins Programmieren (MSc)
- Warnick: Numerical Methods for Engineering : An Introduction Using MATLAB® and Computational Electromagnetics Examples Link
- Igel (2007): Numerical modelling in geophysics, short course https:// www.geophysik.uni-muenchen.de/~igel/nmg-short/ https:// www.geophysik.uni-muenchen.de/~igel/downloads/
- Logg et al. (2011): Automated Solution of Differential Equations by the Finite Element Method: Link
- Press (2007): Numerical recipes: the art of scientific computing,

#### **Further links**

- pyGIMLi: Python Geophysical Inversion and Modelling Library https:// pygimli.org
- Geoscience.XYZ: https://geosci.xyz
- Fenics handbook
- Theory of electromagnetics https://ruboerner.github.io/ThEM/

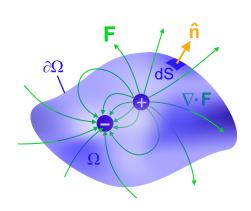
#### **Differential operators**

- single derivative in space  $\frac{\partial}{\partial x}$  or time  $\frac{\partial}{\partial t}$
- gradient  $\mathbf{\nabla} = (\frac{\partial}{\partial x}, \frac{\partial}{\partial y}, \frac{\partial}{\partial z})^T$

• divergence 
$$\mathbf{\nabla \cdot F} = (\frac{\partial F_x}{\partial x}, \frac{\partial F_y}{\partial y}, \frac{\partial F_z}{\partial z})^T = \begin{pmatrix} \frac{\partial F_x}{\partial x} \\ \frac{\partial F_y}{\partial y} \\ \frac{\partial F_z}{\partial z} \end{pmatrix}$$

Gauss': what's in (volume) comes out (surface)

$$\int_{V} \mathbf{\nabla \cdot F} \ dV = \iint_{S} \mathbf{F \cdot n} \ dS$$



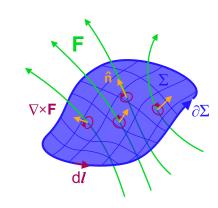
Gauss's theorem in EM

## **Curl (rotation)**

$$ullet$$
 curl  $oldsymbol{
abla} imesoldsymbol{\mathbf{F}}=(rac{\partial F_z}{\partial y}-rac{\partial F_y}{\partial z},rac{\partial F_x}{\partial z}-rac{\partial F_z}{\partial x},rac{\partial F_y}{\partial x}-rac{\partial F_y}{\partial y})^T$ 

Stoke: what goes around comes around

$$\int_{S} \mathbf{\nabla} imes \mathbf{F} \cdot \mathbf{d}S = \iint_{S} \mathbf{F} \cdot \mathbf{d}l$$



Stoke's theorem in EM

- ullet curls have no divergence:  $oldsymbol{
  abla} \cdot (oldsymbol{
  abla} imes oldsymbol{\mathbf{F}}) = 0$
- ullet potential fields have no curl  $oldsymbol{
  abla} imes(oldsymbol{
  abla}u)=0$

#### **Numerical simulation**

Mostly: solution of partial differential equations (PDEs) for either scalar (potentials) or vectorial (fields) quantities

PDE Types:

- ullet elliptic PDE:  $abla^2 u = f$
- ullet parabolic PDE  $abla^2 u a rac{\partial u}{\partial t} = f$
- ullet hyperbolic  $abla^2 u c^2 rac{\partial^2 u}{\partial t^2} = f$  (plus diffusive term)

$$rac{\partial^2 u}{\partial x^2} - c^2 rac{\partial^2 u}{\partial t^2} = 0$$

- ullet coupled  $abla \cdot u = f$  & u = K 
  abla p = 0 (Darcy flow)
- nonlinear  $(\nabla u)^2 = s^2$  (Eikonal equation)

#### Poisson equation

potential field u generates field  $\vec{F} = -\nabla u$ 

causes some flow  $ec{j}=aec{F}$ 

a is some sort of conductivity (electric, hydraulic, thermal)

continuity of flow: divergence of total current  $\mathbf{j}+\mathbf{j}_s$  is zero

$$\mathbf{\nabla \cdot} (a \nabla u) = -\mathbf{\nabla \cdot j}_s$$

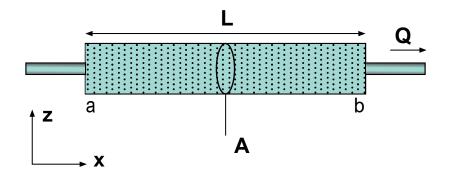
## Darcy's law

volumetric flow rate  ${\cal Q}$  caused by gradient of pressure p

$$Q=rac{kA}{\mu L}\Delta p$$

$$\mathbf{q}=-rac{k}{\mu}
abla p$$

$$\nabla \cdot \mathbf{q} = -\nabla \cdot (k/\mu \nabla p) = 0$$



Darcy's law

#### The heat equation in 1D

sought: Temperature T as a function of space and time

heat flux density  $\mathbf{q} = \lambda \mathbf{\nabla} T$ 

q in W/m²,  $\lambda$  - heat conductivity/diffusivity in W/(m.K)

Fourier's law:  $\frac{\partial T}{\partial t} - a \nabla^2 T = s$  (s - heat source)

temperature conduction  $a=rac{\lambda}{
ho c}$  (ho - density, c - heat capacity)

#### Maxwell's equations

Faraday's law: currents & varying electric fields ⇒ magnetic field

$$\mathbf{
abla} imes\mathbf{H}=rac{\partial\mathbf{D}}{\partial t}+\mathbf{j}$$

• Ampere's law: time-varying magnetic fields induce electric field

$${f 
abla} imes {f E} = -rac{\partial {f B}}{\partial t}$$

- $\nabla \cdot \mathbf{D} = \varrho$  (charge  $\Rightarrow$  ),  $\nabla \cdot \mathbf{B} = 0$  (no magnetic charge)
- ullet material laws  ${f D}=\epsilon{f E}$  and  $ec B=\mu{f H}$

#### Helmholtz equations

$$abla^2 u + k^2 u = f$$

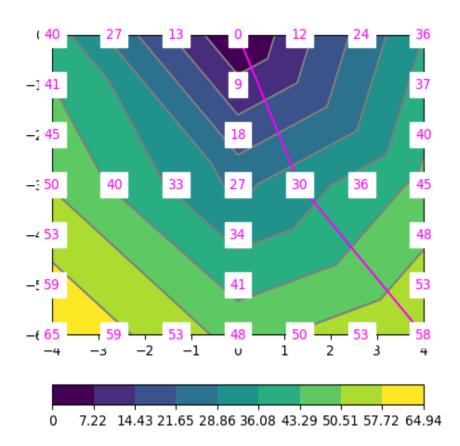
results from wavenumber decomposition of diffusion or wave equations

approach: 
$$\mathbf{F}=\mathbf{F_0}e^{\imath\omega t}$$
  $\Rightarrow$   $\frac{\partial\mathbf{F}}{\partial t}=\imath\omega\mathbf{F}$   $\Rightarrow$   $\frac{\partial^2\mathbf{F}}{\partial t^2}=-\omega^2\mathbf{F}$   $\nabla^2\mathbf{F}-a
abla_t\mathbf{F}-c^2
abla_t^2\mathbf{F}=0$   $\Rightarrow$   $\nabla^2\mathbf{F}-a\imath\omega\mathbf{F}+c^2\omega^2\mathbf{F}=0$ 

#### The eikonal equation

Describes first-arrival times t as a function of velocity (v) or slowness (s)

$$|\mathbf{\nabla}t| = s = 1/v$$



## **Taylor expansion**