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Report of the application project at the Faculty of AMP

# Simulation of a medical therapy method with finite elements

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# 1. Introduction to radio frequency ablation

Lets talk about:

- Medical Treatment of Tumor
- Radio frequency ablation
- Why RFA Simulation is important
- Motivation / This project in General

## 2. Computer-aided simulation of radio frequency ablation

### 2.1. Discrete Numerical Simulation

- In real world physics models are often bounded by reality
- Geometrical boundary conditions are often vague
- In most cases there is no reasonable analytical approach to solve these problems
- Modern numerical approaches are very flexible in this regard
- Simulations done right can be easily modified and adapted to different models and boundaries

### 2.2. About Errors in simulations and numerical approaches

- see TUM dissertation
- There are different sources for errors following the simulation from the line from the real problem down to the discrete solution
- Idealization error: discrepancy between reality and the idealized reality and the idealized constitutive laws and boundary conditions -> Systems are often way more complex in reality, every patient is different
- Modeling errors: discrepancy between mathematical formulation and physical model -> e.g. using dimensionally reduced approaches, like linear dependencies or even constant parameters
- Discretization errors: discrepancy between the continuous description and discrete description of the model
- Solution errors: using iterative approximation methods and rounding errors
- It's basically a butterfly effect

- Optimizing one error source often conflicts with another one -> e.g. handling nonlinearity can cause fatal numerical errors (at least that's what Kroeger said ...)

## 2.3. The physics behind radio frequency ablation

- Generating electrical energy with a generator
- Generated heat is distributed on the tissue
- Temperature rises do to constant electrical energy input
- Interesting is: - Temperature distribution over time
- What else? TODO
- Electrical energy can be approximated by the potential of the electrodes on the probes

$$\varphi : \text{TODO} \tag{1}$$

$$\text{ElectricalEnergy} : \text{TODO} \tag{2}$$

- No energy is lost
- Electrical Energy becomes heat energy by Tissue resistance
- Heat Energy is distributed by heat equation

$$\text{Heatequation} : \text{TODO} \tag{3}$$

- Discretization of the equation in space and time domain
- Time can be modeled continuously or in discrete intervalls
- Discrete intervalls are typically more practical in modeling but less efficient or exact
- Discrete intervalls can be refined if necessary

## 3. Mathematical aspects of discrete simulation

### 3.1. Theory of finite elements

#### 3.1.1. Elliptical problems

- Elliptical problems in general
- Parabolic / time-dependent problems
- build up system of PDE's to describe problem
- Using the cylindric domain, different domains

#### 3.1.2. Parabolic problems

- Solving systems of ODE over discrete time intervalls

#### 3.1.3. FEM in Electrostatics

- special domain
- boundary conditions

#### 3.1.4. FEM in Temperature Fields / perhaps Fluid Dynamics

- boundary condition (heat source or sink)

### 3.2. Numerical solution of system of ODE's

### 3.3. Axial symmetrie

- Using axial symmetrie to simplify computations
- reducing one dimension 3D -> 2D
- problems are qsuivalent
- significant savings calculations time and complexity

- approach: fourier decomposition in angular direction to reduce dependency on the angular  $\varphi$
- using static models, only dependency on space
- maybe Torus elements

## 4. Discretization of PDEs

### 4.1. Computational Domain

- Using one needle, whole geometry domain is axis symmetric around one needle
- Problem can be reduced to 2D problem using ring elements and cylindric coordinates
- Eliminate dependency on angular  $\phi$  from the calculations
- For visualisation, symmetric results can be reconstructed to 3D
- Whole calculation will be in cylindric coordinates

### 4.2. FEM in cylindric Coordinates

- Rewrite the equations to cylindric coordinates
- Calculations are made on a cross-section with angular  $\phi = 0$
- Define boundaries -> new artificial boundary around the rotation axis to be taken into consideration
- Explain how the new boundary can be treated

Laplace in cartesian coordinates:

$$\nabla^2 := \Delta := \frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2} + \frac{\partial^2}{\partial z^2} \quad (4)$$

Laplace in cylindric coordinates:

$$\Delta := \frac{\partial^2}{\partial r^2} + \frac{1}{r} \frac{\partial}{\partial r} + \frac{1}{r^2} \frac{\partial^2}{\partial \phi^2} + \frac{\partial^2}{\partial z^2} \quad (5)$$

TODO : Write something

Laplace in polar coordinates:

$$\Delta := \frac{\partial^2}{\partial r^2} + \frac{1}{r} \frac{\partial}{\partial r} + \frac{1}{r^2} \frac{\partial^2}{\partial \phi^2} \quad (6)$$

### 4.3. PDE for Electric potential

#### 4.3.1. Weak formulation of the problem

4 areas can be distinguished from a mathematical point of view

- Inner domain
- Fixed Potential of electrodes
- Outer boundaries with no fixed potential -> Robin
- Rotation axis, artificial boundary -> Neumann

Constant material parameters:

#### 4.3.2. Inner Domain

- The electric potential of the inner domain is described as :

$$-\nabla \cdot (\sigma(x, y, z, t) \nabla \varphi(x, y, z, t)) = 0 \quad (7)$$

- Elliptical boundary problem
- Assuming constant material parameters:  $\nabla \sigma = 0$
- Solution is independent from  $\sigma$  so we can cut it out - Equation becomes Laplaces' equation, phi becomes time independent

$$-\Delta \varphi(x, y, z) = 0 \quad (8)$$

- Using a cylindric domain, we can use cylinder coordinates (see ref Laplace in cylinder)

$$-\Delta \varphi(r, \phi, z) = -\frac{1}{r} \frac{\partial \varphi}{\partial r} - \frac{\partial^2 \varphi}{\partial r^2} - \frac{1}{r^2} \frac{\partial^2 \varphi}{\partial \phi^2} - \frac{\partial^2 \varphi}{\partial z^2} = 0 \quad (9)$$



- Since the domain has axis symmetry, the solution for  $\varphi$  is independent from the angular  $\phi$
- So equation simplifies to

$$-\frac{1}{r} \frac{\partial \varphi}{\partial r} - \frac{\partial^2 \varphi}{\partial r^2} - \frac{\partial^2 \varphi}{\partial z^2} = 0 \quad (10)$$

#### 4.3.3. Electrodes

- Potential difference on the electrodes is fixed by definition
- For calculations, potential will be defined as  $\pm 1$

$$\varphi = \pm 1 \quad (11)$$

#### 4.3.4. Outer boundary

- For first try, a simplification with natural boundary conditions

$$n \cdot \nabla \varphi = 0 \quad (12)$$

- In cylindrical coordinates

$$TODO \quad (13)$$

#### 4.3.5. Rotation axis

- Axis symmetry, so here apply natural neumann boundary conditions TODO

### 4.4. Calculation of electrical energy

- $\varphi$  can be calculated on every discrete point
- Calculate power for every point
- Tissue Resistance
- Effective power

- Calculate electric energy from electric power

## 4.5. PDE for temperature Distribution

### 4.5.1. Weak formulation

From physics above, the temperature distribution is modeled by the heat equation:

$$\partial_t(\rho c T) - \nabla \cdot (\lambda \nabla T) = Q \quad (14)$$

The heat equation is a well known parabolic partial differential equation.

We are assuming  $\rho$  and  $c$  are constant

$\rho$  = density

$c$  = specific heat capacity

$\lambda$  = thermal conductivity, which is depending on  $T$

$T = T(r, z, t)$  = temperature

$Q = Q(r, z, t)$  = heat energy

Cylindrical coordinates: see 'Transient Heat Transfer in a Partially Cooled Cylindrical Rod' from Lawrence Agbezuge

$$\rho c \frac{\partial T}{\partial t} - \frac{d\lambda}{dT} \left[ \left( \frac{\partial T}{\partial r} \right)^2 + \left( \frac{\partial T}{\partial z} \right)^2 \right] - \lambda \left( \frac{\partial^2 T}{\partial r^2} + \frac{1}{r} \frac{\partial T}{\partial r} + \frac{\partial^2 T}{\partial z^2} \right) = Q \quad (15)$$

For the first run, we assume  $\lambda$  is also constant too, which greatly reduces the complexity of the problem to the form

$$\rho c \frac{\partial T}{\partial t} - \lambda \left( \frac{\partial^2 T}{\partial r^2} + \frac{1}{r} \frac{\partial T}{\partial r} + \frac{\partial^2 T}{\partial z^2} \right) = Q \quad (16)$$

**TODO: explain Q her**

$$Q_{total} = Q_{rf} + Q_{perf} \quad (17)$$

- $Q_{rf}$  is described above
- $Q_{perf}$  is blood perfusion
- TODO: Maybe explain this in the physics above???

## 5. Applied FEM technologies

### 5.1. Weak solutions

#### 5.1.1. Electric potential

Electric potential / Laplace's equation in cylindrical domain:

$$a_w(u, v) := \int_{\Omega} (\partial_r u \partial_r v + \partial_z u \partial_z v) r dr dz = \int_{\Omega} f v r dr dz \quad (18)$$

- $u \in H_r^1(\Omega) \cap \{v|_{\Gamma_0} = 0\}$
- $v \in H_r^1(\Omega) \cap \{v|_{\Gamma_0} = 0\}$

Approximate with linear regression functions

Linear regression functions for reference triangles:

$$\phi_1(\xi, \eta) = 1 - \xi - \eta \quad (19)$$

$$\phi_2(\xi, \eta) = \xi \quad (20)$$

$$\phi_3(\xi, \eta) = \eta \quad (21)$$

Specific PDE for electric potential, inner domain:

$$a_w(u, v) := \int_{\Omega} (\partial_r u \partial_r v + \partial_z u \partial_z v) r dr dz = 0 \quad (22)$$

### 5.1.2. Temperature Distribution

This is basically the problem above but as a hyperbolic problem

Using semidiscrete solution and iterate solution over time

We are applying method of the discontinuous galerkein fem

For reference see Jung, Langer : Methode der finiten Elemente für Ingenieure, chapter 7.1

Weak formulation for the problem:

We are looking for  $u(r, z, t) \in V_{g1}$  with  $\dot{u} \in L_2(\Omega)$  for almost every  $t \in (0, T)$ , so

$$(\dot{u}, v)_0 + a(t; u, v) = \langle F(t), v \rangle \text{ for all } v \in V_0 \quad (23)$$

and for almost every  $t \in (0, T)$  is the "Anfangsbedingung -> suche englische Formulierung"

$$(u(r, z, 0), v)_0 = (u_0, v)_0 \text{ for all } v \in V_0 \quad (24)$$

The formal model above is given by

$$\begin{aligned} (\dot{u}, v)_0 &= \int_{\Omega} \dot{u}(r, z, t) v(r, z) dr dz = \int_{\Omega} \frac{\partial u(r, z, t)}{\partial t} v(r, z) dr dz, \\ a(t; u, v) &= \int_{\Omega} \left[ \lambda_1(r, z, t) \frac{\partial u}{\partial r} \frac{\partial v}{\partial r} + \lambda_2(r, z, t) \frac{\partial u}{\partial z} \frac{\partial v}{\partial z} \right] \cdot r \cdot dr dz + \int_{\Gamma_3} \alpha(r, z, t) u(r, z, t) v(r, z) ds, \\ \langle F(t), v \rangle &= \int_{\Omega} f(r, z, t) v(r, z) dr dz + \int_{\Gamma_2} g_2(r, z, t) v(r, z) ds + \int_{\Gamma_3} \alpha(r, z, t) u_A(r, z, t) v(r, z) ds, \\ V_{g1} &= \text{TODO}, \\ V_0 &= \text{TODO} \end{aligned}$$

Adapted for the temperature distribution, assuming  $\lambda$  and all material parameters are constant:

$$a_w(t; u, v) := \int_{\Omega} \rho c (\partial_t u \cdot v) dr dz + \int_{\Omega} \lambda (\partial_r u \partial_r v + \partial_z u \partial_z v) r dr dz = \int_{\Omega} f v r dr dz \quad (25)$$

## 5.2. Discretization / Triangulation

### 5.2.1. Grid generation

### 5.2.2. Grid refinement

## 5.3. Assembling system of equation

### 5.3.1. Assemble elementwise

### 5.3.2. Add boundary Conditions

## 5.4. Error estimations

### 5.4.1. H1-Norm

### 5.4.2. L2-Norm

### 5.4.3. Evtl energy norm

## 6. Numerical challenges / Numerical aspects in general

### 6.1. Numerical integration

### 6.2. Numerical gradient on discrete points

### 6.3. Surface integral

### 6.4. Grid refinement

### 6.5. Solving the system of equations

## 7. Applied simulation

### 7.1. Generating TestData / Get reference data

### 7.2. Solving the PDEs

### 7.3. Combine everything to continuous time dependent simulation

### 7.4. Interpretation of result numbers

- Interpret numbers
- Compare with data from experiment or other simulations

## 8. Programming technologies

### 8.1. Performance Optimization

### 8.2. MatLab vs C++

- Could have done the whole simulation using only MATLAB
- MATLAB is a scripting language that calls Fortran Subroutines, which are highly efficient in calculating problems of linear algebra
- However, MATLAB has to call these subroutines in an efficient way to take these performance advantages
- It is extremely easy to write bad and inperformant code in MATLAB, if it is used in the wrong way
- Efficient implementation required hardcoding routines and is very stiff
- To me it was important to write flexible code, that can be easily adapted and extended to try out different modification
- This is way easier when using loops and subroutines instead of hard coded implementations, also the code because way more easier to read and fix
- So I was going for a combined implementation of MatLab and C++
- When using flexible code design, C++ allows performance advantages in using loops etc over MATLAB
- However, MATLAB allows easy function hadnling, what makes the algorithms more accessible for the reader
- In the end I combined the advantages of both languages
- MatLab serves as frame for the pre- and postprocessing, like grid generation and graphical output of the numerical results.
- Also the scripts serve as a mathematical documentation of the whole simulation for the reader
- Computation intense subroutines are done in C++

### 8.3. Graphical output

## 9. Summary and Outlook

### 9.1. Project Summary

- One could argue that writing a simulation from scratch is a waste of time
- There are many highly useful numerical software solutions for numerical simulation and numerical problems
- Usually there is no need to write an own detailed implementation
- Creating own scripts and implementations helps to understand numerical problems and error sources
- This approach helps enormously to increase the ability to use these software products effectively and to generate better simulations and is mandatory to improve
- There can also be no software developer without understanding how a computer works numbers

#### 9.1.1. strengths and flaws

- why is it good, why is it bad - good: numerical results do match the general expectation
- bad: model is too simplified to represent real world conditions

#### 9.1.2. future modifications

- Material parameters are dependent on Temperature and potential ->
- Using variable instead of fixed material parameters
- Take the evaporation of water into account
- Different types of perfusion
- Defining more realistic and complex boundary conditions
- Perhaps a second needle in a 3D simulation



## 9.2. State of the current Research

- Research in the simulation of medical therapy methods
- 

## 9.3. Other FEM projects and software

- FENICS
- COMSOL
- ANSYS

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## A. Source code Visual C++

Listing 1: For loop to print numbers from 1 to 10

```
1 // Print numbers from 1 to 10
2 #include <stdio.h>
3 int main() {
4     int i;
5     for (i = 1; i < 11; ++i)
6     {
7         printf("%d_", i);
8     }
9     return 0;
10 }
```

---

## B. Source code MatLab

TODO