

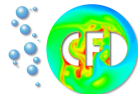
Efficient, accurate and flexible Finite Element solvers for Chemotaxis

Konrad Zuse Institut Berlin

Robert Strehl Andriy Sokolov Stefan Turek

Technische Universität Dortmund
Institut für Angewandte Mathematik/Numerik, LS III

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- 1 underlying models
- 2 numerical challenges
- 3 applications

1 underlying models

2 numerical challenges

3 applications

Chemotaxis describes an oriented movement towards or away from regions of higher concentrations of chemical agents and plays a vitally important role in the evolution of many living organisms.

<http://dictybase.org/Multimedia/motility/motility.htm>

It is common to use continuous models \rightarrow system of partial differential equations (PDE)

Minimal Keller-Segel model (1970) for chemotaxis:

$$\begin{array}{ll}
 \text{equation for motile} & \frac{\partial u}{\partial t} = \nabla \cdot \left(\underbrace{\nabla u}_{\text{diffusion}} - \underbrace{\chi u \nabla c}_{\text{chemotaxis}} \right) \\
 \text{species } u: & \\
 \text{equation for the} & \frac{\partial c}{\partial t} = \underbrace{\Delta c}_{\text{diffusion}} - \underbrace{c + u}_{\text{reaction}} \\
 \text{chemical agent } c: &
 \end{array}$$

Since 1970 various models have been proposed (especially in the recent decades).

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$$\begin{aligned}
 \frac{\partial u}{\partial t} &= \nabla \cdot \left(\underbrace{D(u)\nabla u}_{\text{diffusion}} - \underbrace{\chi(u, c)\nabla c}_{\text{chemotaxis}} \right) \\
 \frac{\partial c}{\partial t} &= \underbrace{\Delta c}_{\text{diffusion}} - \underbrace{\alpha c + \beta(u)u}_{\text{reaction}}
 \end{aligned}$$

(nonlinear) coefficients modeling e.g. $D(u), \chi(u, c), \beta(u) \xrightarrow{u \rightarrow \infty} 0$
saturation effects:

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$$\begin{aligned}
 \frac{\partial u}{\partial t} &= \nabla \cdot \left(\underbrace{D(u)\nabla u}_{\text{diffusion}} - \underbrace{\chi(u, c)\nabla c}_{\text{chemotaxis}} \right) + \underbrace{f(u)}_{\text{kinetics}} \\
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 \end{aligned}$$

(nonlinear) coefficients modeling e.g. $D(u), \chi(u, c), \beta(u) \xrightarrow{u \rightarrow \infty} 0$
saturation effects:

introducing kinetics: e.g. $f(u) = \nu u(1 - u)$ (logistic)

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$$\frac{\partial u_i}{\partial t} = \nabla \cdot \left[\left(\sum_{l=1}^N D_{i,l}^u(u_i) \nabla u_l \right) - \left(\sum_{k=1}^M S_{i,k}(u_i) \nabla c_k \right) \right] + f_i(u_i)$$

$$\frac{\partial c_j}{\partial t} = D_j^c \Delta c_j - \sum_{k=1}^M \alpha_{k,j} c_k + \sum_{l=1}^N \beta_{l,j} u_l$$

(nonlinear) coefficients modeling saturation effects: e.g. $D(u), \chi(u, c), \beta(u) \xrightarrow{u \rightarrow \infty} 0$

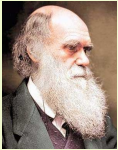
introducing kinetics:

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multispecies:

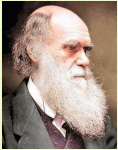
e.g. species u_1, \dots, u_N , chemical agents c_1, \dots, c_M

Biology



- models are well motivated
- all ingredients for their own are well understood

Biology



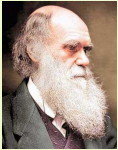
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Mathematics

- existence and uniqueness are nontrivial
- analysis revealed mathematical artifacts



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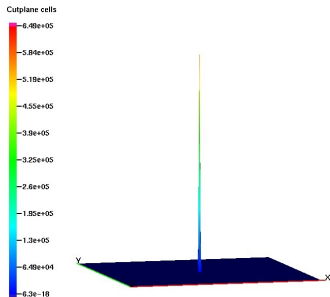
→ numerical ansatz is highly desired to validate models and obtain more insights from mathematical point of view

Mathematics

- existence and uniqueness are nontrivial
- analysis revealed mathematical artifacts



1) the minimal model may lead to blowing up solutions. From biological point of view, those unbounded solutions do not make any sense.



minimal model

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

$$\frac{\partial c}{\partial t} = \Delta c - c + u$$

- \mathbb{R}^1 : all solutions are bounded
- \mathbb{R}^2 : blow-up iff $\|u_0\|_1 > 8\pi/\chi$
- $\mathbb{R}^{\geq 3}$: no explicit threshold is known

2) Slime molds aggregate to form more energetic structures. The underlying regularized model introduces quorum-sensing alike nonlinearities.

regulated model

$$\begin{aligned}\frac{\partial u}{\partial t} &= \nabla \cdot \left(D \nabla u - \chi \frac{u}{(1+c)^2} \nabla c \right) \\ \frac{\partial c}{\partial t} &= \Delta c - c + \omega \frac{u^2}{\mu + u^2}\end{aligned}$$

global existence is proven

→ saturating signal production,
signal-dependent sensitivity,
quorum-sensing

T. Gregor, <http://tglab.princeton.edu/>

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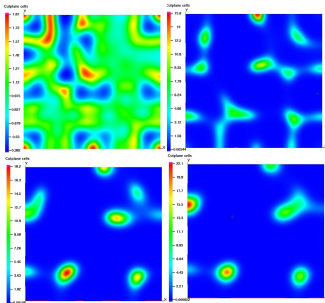
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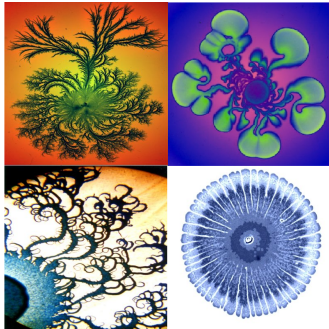
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3) Stunning results were obtained when biologists study certain mutated bacteria colonies. Their proliferation follow certain patterns.



E. Ben-Jacob,
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kinetic model

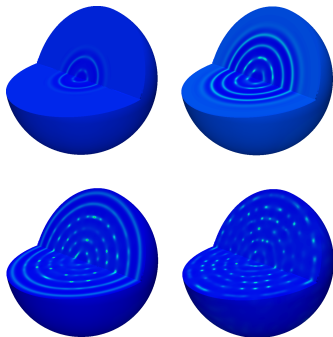
$$\begin{aligned}\frac{\partial u}{\partial t} &= \nabla \cdot (Du - \chi u \nabla c) + \nu u(1 - u) \\ \frac{\partial c}{\partial t} &= \Delta c - \beta c + u\end{aligned}$$

$\mathbb{R}^{1,2}$: unique global weak solution
(at least for $\nu \gg 1$)

$\mathbb{R}^{\geq 3}$: far less is known

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In order to obtain a reliable solver for chemotaxis PDEs many (numerical) concerns has to be tackled:

challenges

- high-order resolution (of sharp interfaces; 'shock capturing')
- fast solver techniques
- smart memory management
- robustness for a variety of parameters
- user interface (arbitrary coefficients)
- mass conservation (when applicable) and positivity preservation

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Especially the last three are of particular interest in the presence of chemotaxis PDEs.

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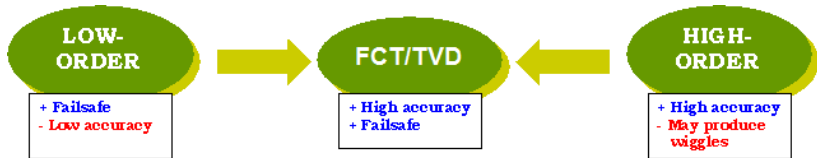
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REMEDY: merging the two approaches leads to FCT/TVD which combines all desired properties



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a monolithic approach:

$$\underbrace{\begin{pmatrix} A_{11} & A_{12} \\ A_{21} & A_{22} \end{pmatrix}}_{=: A(u_n, c_n)} \begin{pmatrix} u_n \\ c_n \end{pmatrix} = \begin{pmatrix} b_1 \\ b_2 \end{pmatrix}$$

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Generic super-model

The current underlying generic (single-species) model reads:

$$\begin{aligned}\frac{\partial u}{\partial t} &= \nabla \cdot (D(u) \nabla u - \chi(u, c) \nabla c) + f(u) \\ \frac{\partial c}{\partial t} &= \Delta c - \alpha c + \beta(u) u\end{aligned}$$

→ all coefficients may be user-prescribed

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Certainly, applied mathematicians look for practical benefits of their work. Since chemotaxis plays a key role for organisms, plenty applications come into mind.

- proliferation of bacteria (not only in petri dishes)
- tumour growth/angiogenesis/haptotaxis
- breeding concerns (insemination of sea urchins)
- immunology (production of chemokines at infection sites)

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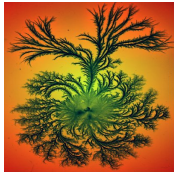
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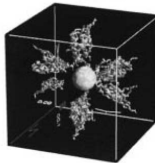
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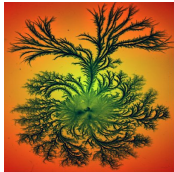
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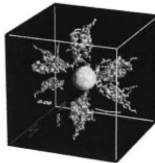
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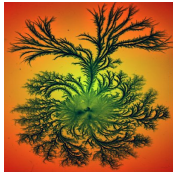
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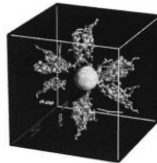
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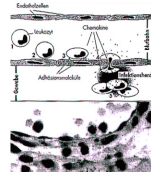
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M.A.J. Chaplain,
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L. Kinzel, LMU

The developed software embeds the following features:

- supported domains: $\Omega \subset \mathbb{R}^2, \mathbb{R}^3$ (reasonable mesh restrictions)
- spatial discretization via Q_1, Q_2, \dots elements
- temporal discretization: θ -scheme
- reasonable boundary conditions at will: Dirichlet, Neumann, periodic,...
- user-prescribed parameters/coefficients/callback functions (module-based Open Source Software)
- FCT/TVD stabilized solver (preservation of physical entities)
- embedded nonlinear solvers: (Deuffhard) damped Newton-like methods, fixpoint, Picard-linearization
- graphical output via GMV/PARAVIEW

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Further aims for the software:

- extend the framework to multi-species systems
- implementation of fast multigrid-solvers
- spatial (h-, r-) and temporal (t-) adaptivity
- parallelization
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Further informations:

- email: robert.strehl@math.tu-dortmund.de
- homepage: <http://www.mathematik.tu-dortmund.de/~rstrehl/downloads.html>
- software: <http://www.featflow.de>
- model organism: <http://dictybase.org>
- next conference: <http://www.biomath.bg>

list of figures: <http://dictybase.org/Multimedia/motility/motility.htm> ; <http://www.youtube.com/watch?v=hpHpBHJZQvU> ;

<http://star.tau.ac.il/~eshel/image-flow.html> ; M. A. J. Chaplain, Mathematical modelling of angiogenesis, Journal of Neuro-Oncology, Vol.

50, pp. 37-51, 2000 ; Catarina Pietschmann, MaxPlanckForschung 2009 Heft 2, Wo, bitte, geht's denn hier zum Ei? ; Linda Kinzel,

Seminar Autoimmunität, Einführung Chemokine, 24./25. Juni 2006