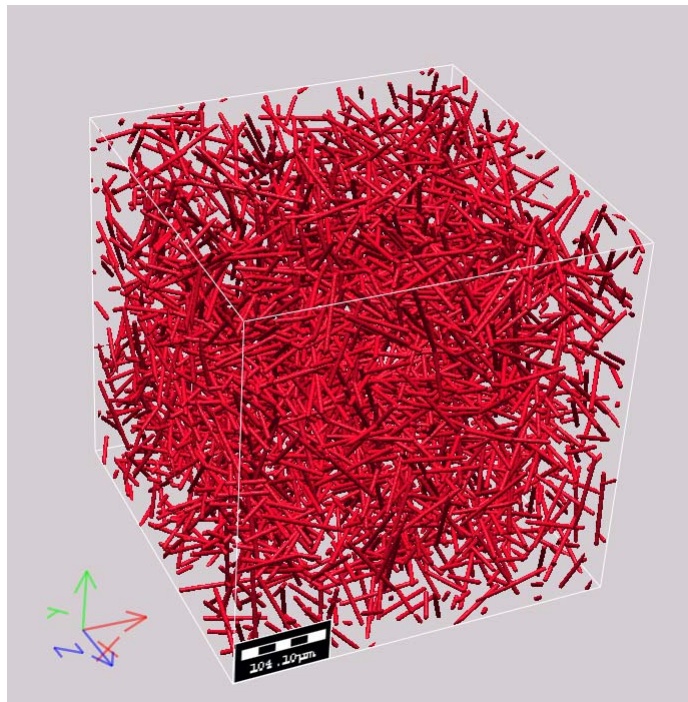
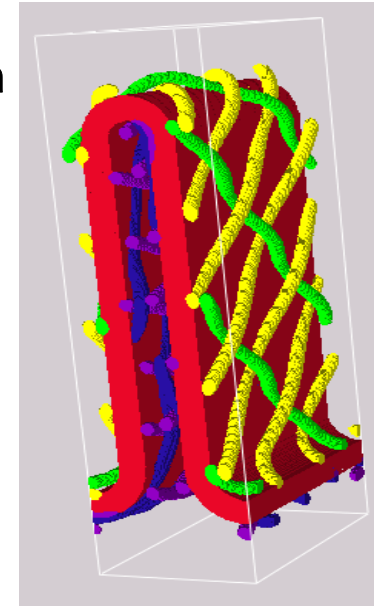

Microstructure Simulation and Virtual Material Design



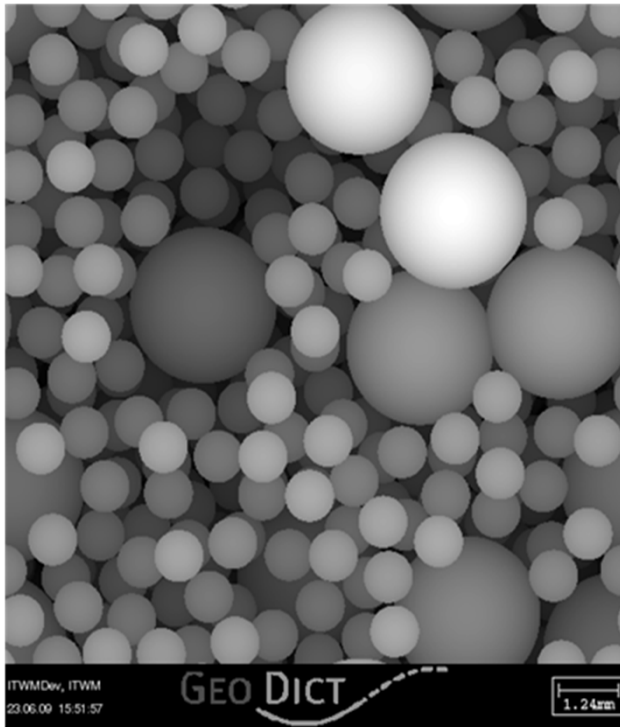
Andreas Wiegmann

 **Fraunhofer**
ITWM

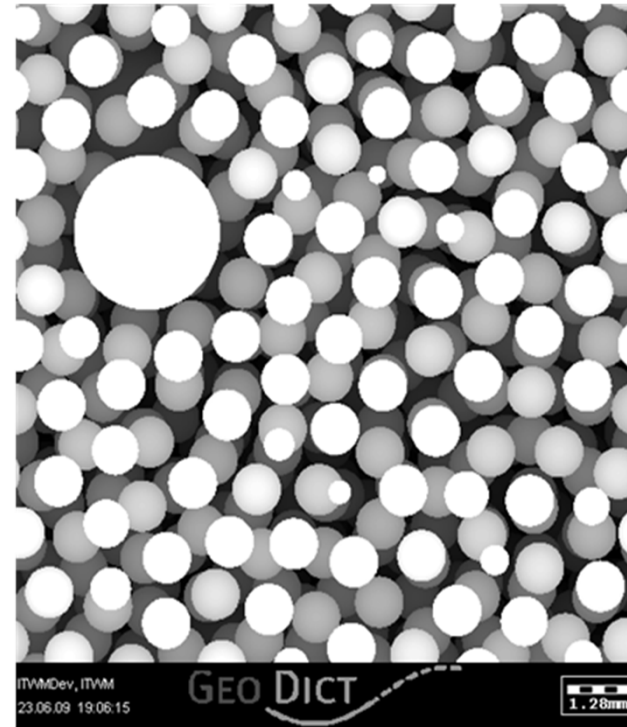
1. Microscopic geometry governs macroscopic properties
 - Permeability depends on the pores in fibrous media
 - Conductivity depends on connectivity of the fibers
2. Some times, only 3d models will do
 - Flow through densely packed spheres or circles
 - Supporting mesh in a filter pleat
3. Materials are random
 - Under microscope , details at different locations are different
 - Multiple experiments yield mean value and standard deviation
 - Capture this in geometric models and property predictions
4. Computations must be fast and completely automatic
 - Materials are "cheap" and no CAD data exist
 - For material design, many simulation runs may be necessary



Packed bed of spheres and floating spheres



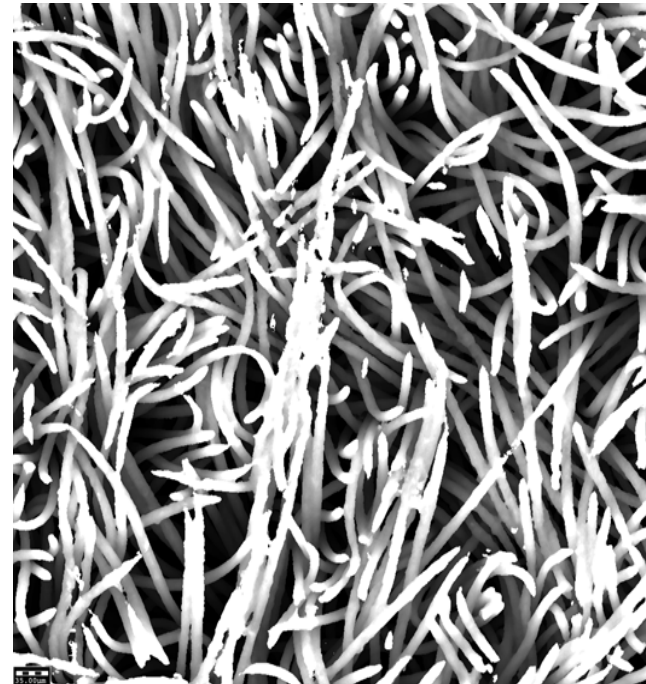
svf 0.64



svf 0.30

Option a): import 3d image of existing media

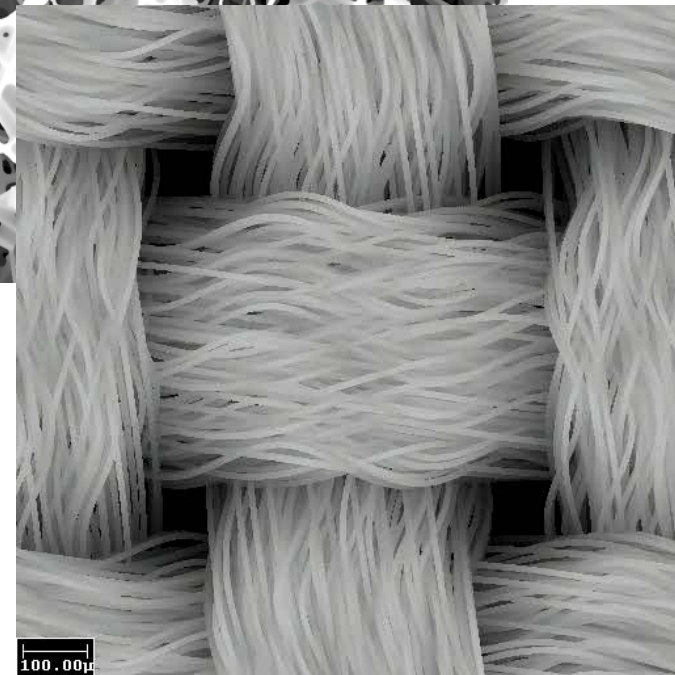
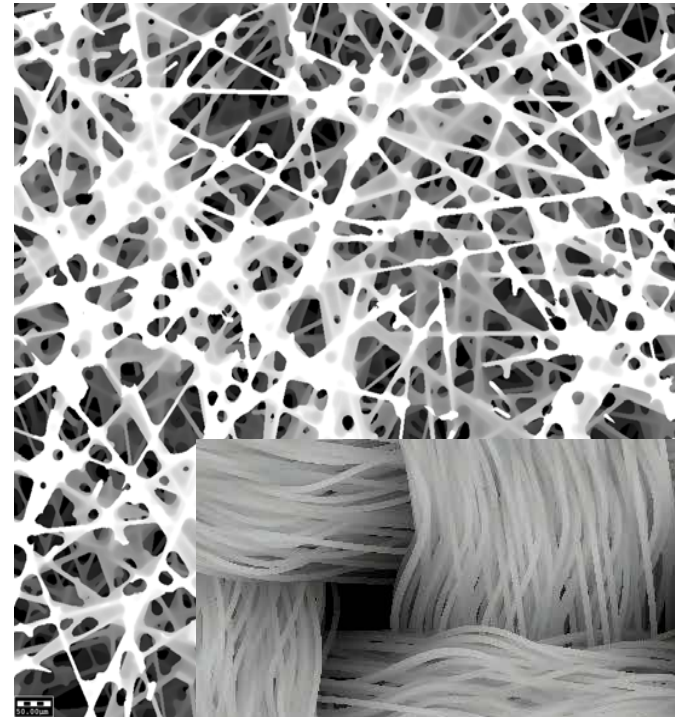
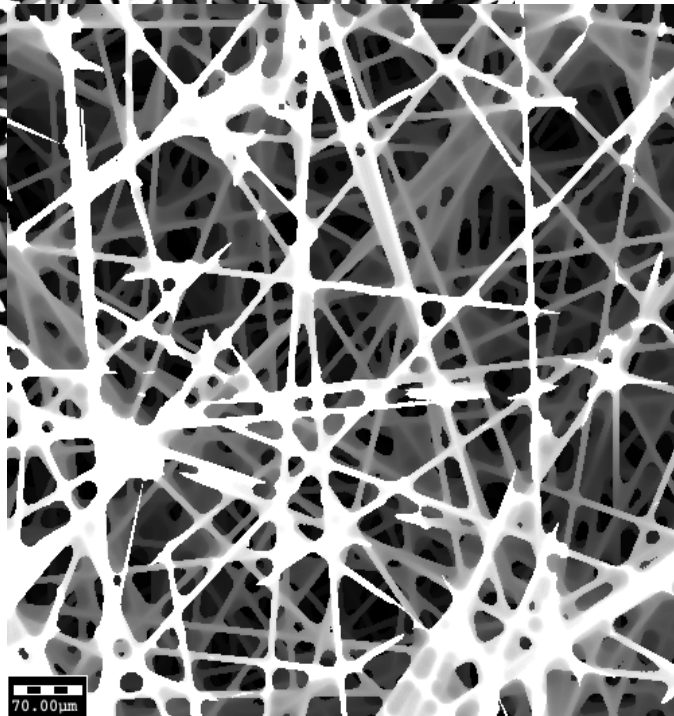
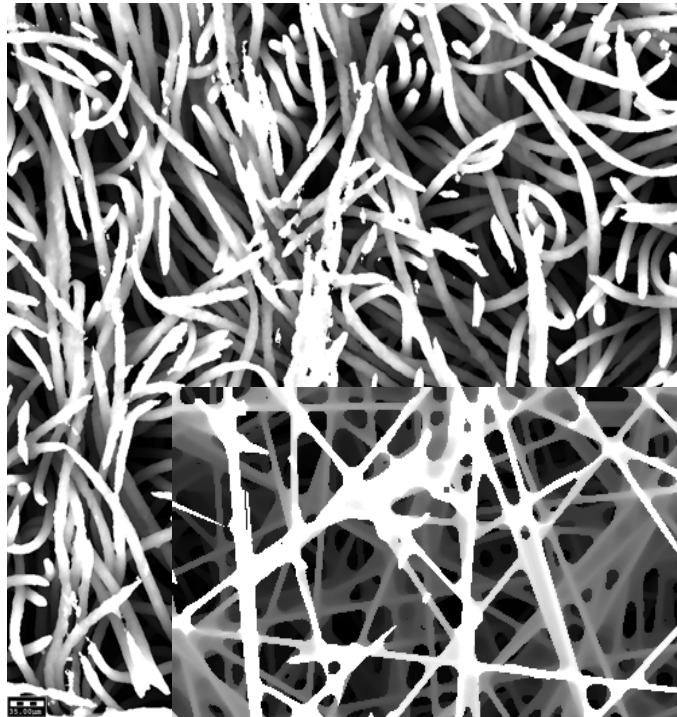
- Input: 3d gray-valued image obtained by DVI, tomography or similar 3d imaging method
- Options:
 - choice of threshold
 - filtering
 - edge smoothing



Typical voxel length: $1\mu\text{m}$

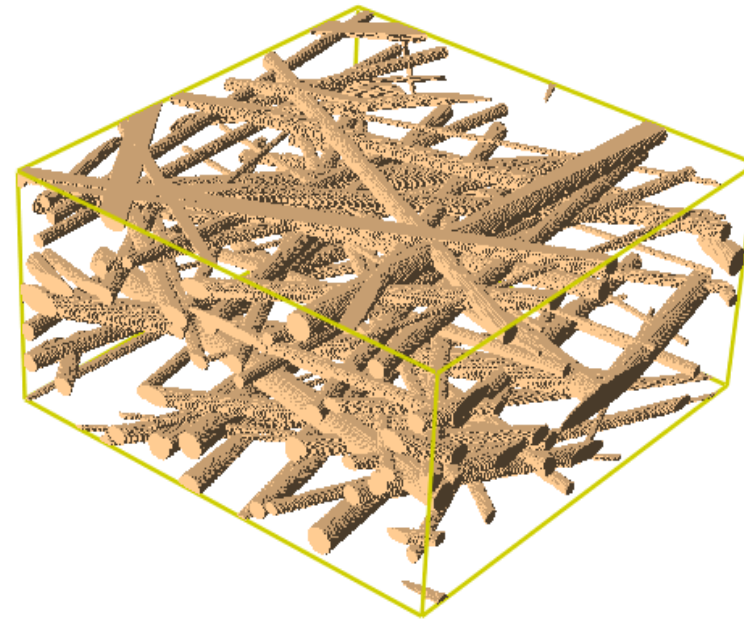
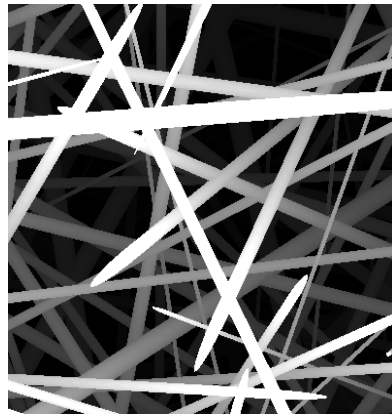
Current μCT images: up to $3\text{mm} \times 3\text{mm} \times 3\text{mm}$ voxels, *a 128 GB drive*

Virtual Textile Generation



Option b): Virtually Generated Nonwovens: Input Parameters

- Porosity
- Fiber orientation distribution (anisotropy)
- Fiber diameter (distribution)
- Fiber cross sectional shape
- Fiber length (distribution)

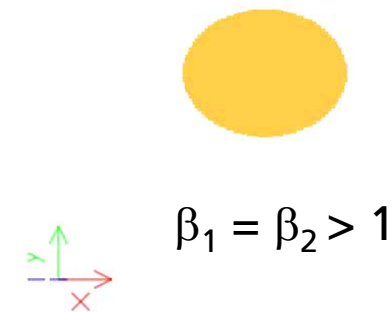
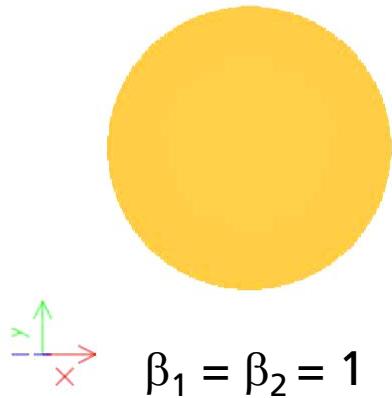


In the “overlapping” model, fibers are placed at random positions with appropriately randomized orientation and without consideration of each other

It is a surprise that such a simple model works!

Fiber anisotropy:

orientation parameter β



$\xi \in [-1, 1]$, uniformly distributed,

$\Phi \in [0, 2\pi)$, uniformly distributed,

$$u = \frac{\beta_1 \cos \Phi \sqrt{1 - \xi^2}}{\sqrt{\xi^2 + (1 - \xi^2) \{ \beta_1^2 \cos \Phi + \beta_2^2 \sin \Phi \}}},$$

$$v = \frac{\beta_2 \sin \Phi \sqrt{1 - \xi^2}}{\sqrt{\xi^2 + (1 - \xi^2) \{ \beta_1^2 \cos \Phi + \beta_2^2 \sin \Phi \}}},$$

$$w = \frac{\xi}{\sqrt{\xi^2 + (1 - \xi^2) \{ \beta_1^2 \cos \Phi + \beta_2^2 \sin \Phi \}}}.$$

Uniform distribution of directions gets mapped to non-uniform one by picking point with uniform ξ and ϕ on $(\beta_1, \beta_2, 1)$ ellipsoid and pulling it back to the unit sphere.

K. Schladitz, S. Peters, D. Reinel-Bitzer, A. Wiegmann and J. Ohser, *Design of acoustic trim based on geometric modelling and flow simulation for non-woven*, Computational Materials Science, Volume 38, Issue 1, 2006, pp 56-66.

Solving the Poisson equation on a 3d image

$$\operatorname{div}(\beta(\vec{x})\nabla\bar{U}_3) = \operatorname{div}(\beta(\vec{x}))\cdot\nabla\bar{U}_3 + \beta(\vec{x})\operatorname{div}(\nabla\bar{U}_3) = 0, \quad \vec{x} \in \Omega = (0, d_1) \times (0, d_2) \times (0, d_3),$$

with boundary conditions

$$\bar{U}_3(x_1, x_2, 0) = \bar{U}_3(x_1, x_2, d_3) - d_3,$$

$$\bar{U}_3(x_1, 0, x_3) = \bar{U}_3(x_1, d_2, x_3),$$

$$\bar{U}_3(0, x_2, x_3) = \bar{U}_3(d_1, x_2, x_3),$$

$$\beta(x_1, x_2, 0) \frac{\partial \bar{U}_3(x_1, x_2, 0)}{\partial x_3} = \beta(x_1, x_2, d_3) \frac{\partial \bar{U}_3(x_1, x_2, d_3)}{\partial x_3},$$

$$\beta(x_1, 0, x_3) \frac{\partial \bar{U}_3(x_1, 0, x_3)}{\partial x_2} = \beta(x_1, d_2, x_3) \frac{\partial \bar{U}_3(x_1, d_2, x_3)}{\partial x_2},$$

$$\beta(0, x_2, x_3) \frac{\partial \bar{U}_3(0, x_2, x_3)}{\partial x_1} = \beta(d_1, x_2, x_3) \frac{\partial \bar{U}_3(d_1, x_2, x_3)}{\partial x_1}.$$

A. Wiegmann and A. Zemitis, *EJ-HEAT: A Fast Explicit Jump Harmonic Averaging Solver for the Effective Heat Conductivity of Composite Materials*, Bericht des Fraunhofer ITWM, Nr. 94, 2006.

Discretization by harmonic averaging

Uniform Cartesian grid (mesh width h) on box domain results in
 "simple" discretization of $\text{div}(\beta(\vec{x})\nabla\bar{U}_3)$:

$$\begin{aligned} & \frac{1}{h} \left(\left(\frac{\beta_{i+1,j,k} + \beta_{i,j,k}}{2\beta_{i+1,j,k}\beta_{i,j,k}} \right)^{-1} \frac{u_{i+1,j,k} - u_{i,j,k}}{h} - \left(\frac{\beta_{i,j,k} + \beta_{i-1,j,k}}{2\beta_{i,j,k}\beta_{i-1,j,k}} \right)^{-1} \frac{u_{i,j,k} - u_{i-1,j,k}}{h} \right. \\ & + \left(\frac{\beta_{i,j+1,k} + \beta_{i,j,k}}{2\beta_{i,j+1,k}\beta_{i,j,k}} \right)^{-1} \frac{u_{i,j+1,k} - u_{i,j,k}}{h} - \left(\frac{\beta_{i,j,k} + \beta_{i,j-1,k}}{2\beta_{i,j,k}\beta_{i,j-1,k}} \right)^{-1} \frac{u_{i,j,k} - u_{i,j-1,k}}{h} \\ & \left. + \left(\frac{\beta_{i,j,k+1} + \beta_{i,j,k}}{2\beta_{i,j,k+1}\beta_{i,j,k}} \right)^{-1} \frac{u_{i,j,k+1} - u_{i,j,k}}{h} - \left(\frac{\beta_{i,j,k} + \beta_{i,j,k-1}}{2\beta_{i,j,k}\beta_{i,j,k-1}} \right)^{-1} \frac{u_{i,j,k} - u_{i,j,k-1}}{h} \right) = 0 \end{aligned}$$

Regions of repeating coefficients create shifted identical rows in
 the matrix – devise implicit solvers that takes less memory than it
 would take to store the matrix!

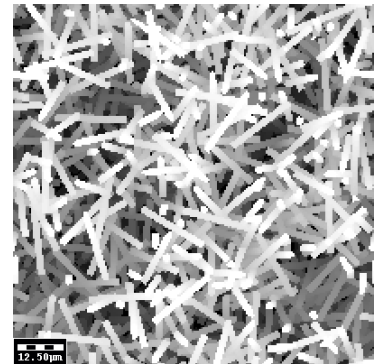
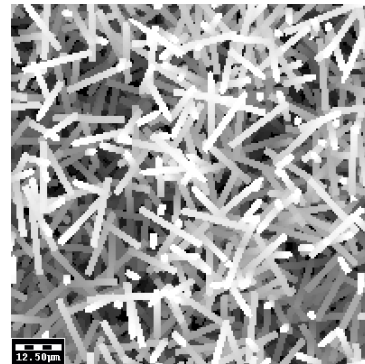
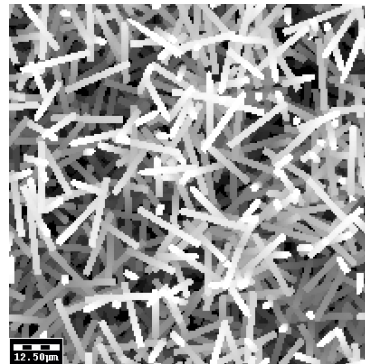
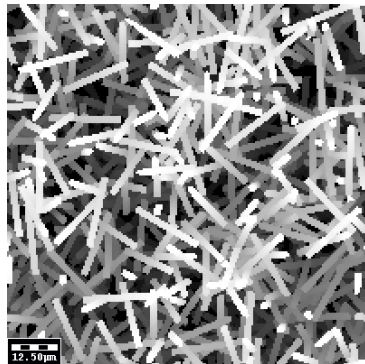
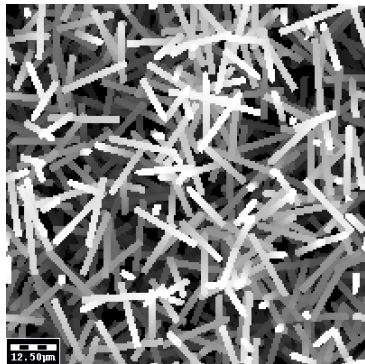
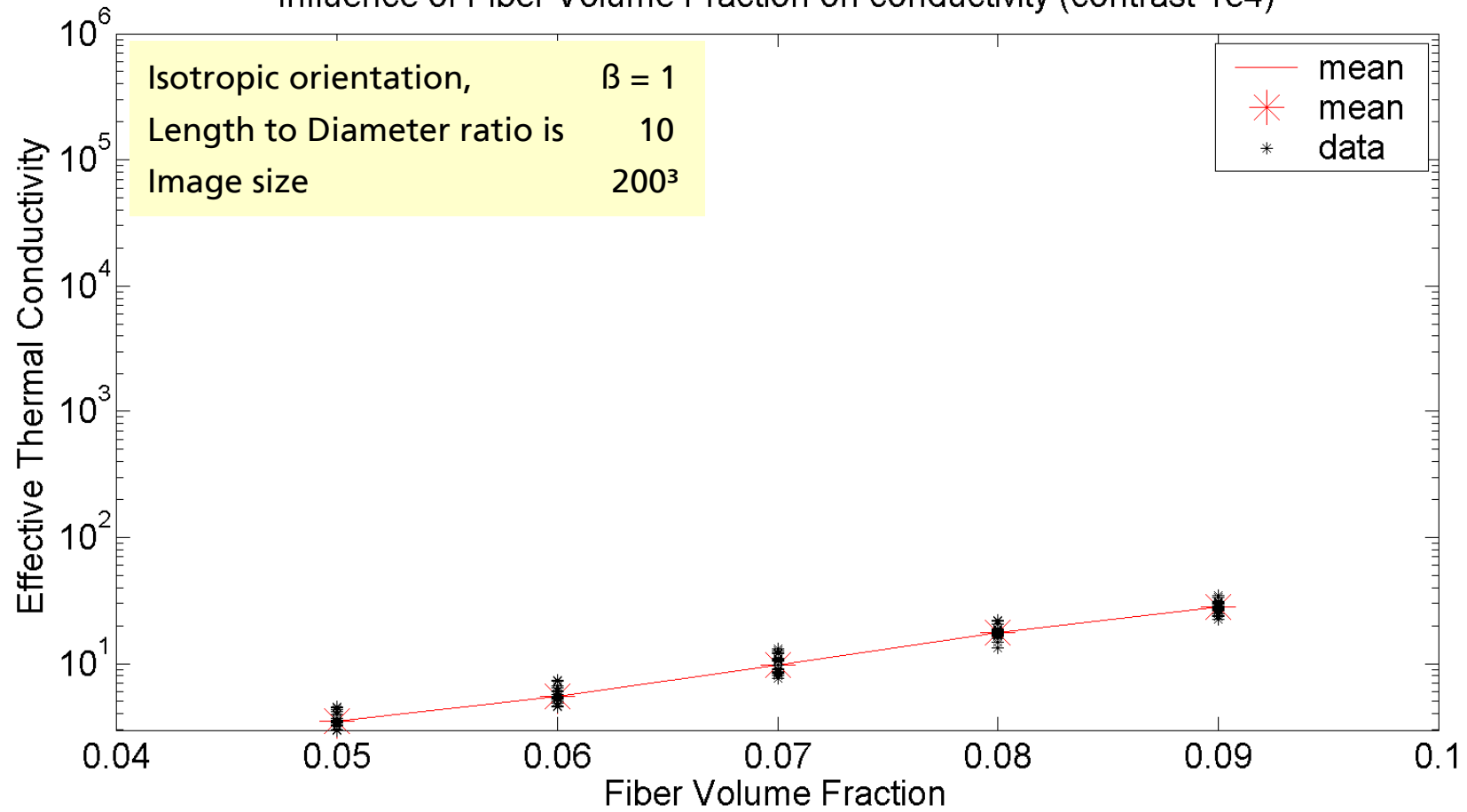
Effective conductivity via homogenization

$$\begin{aligned}\nabla \cdot (\beta(\vec{x})(\nabla U_l + \vec{e}_l)) &= 0, \quad \vec{x} \in \Omega, \\ U_l(\vec{x} + id_1\vec{e}_1 + jd_2\vec{e}_2 + kd_3\vec{e}_3) &= U_l(\vec{x}), \quad i, j, k \in \mathbb{Z}, l = 1, 2, 3\end{aligned}$$

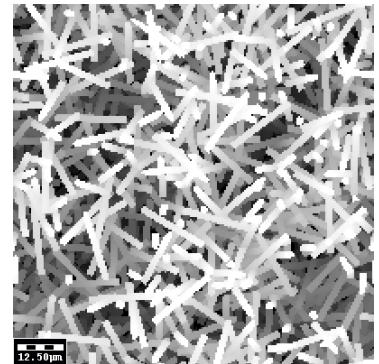
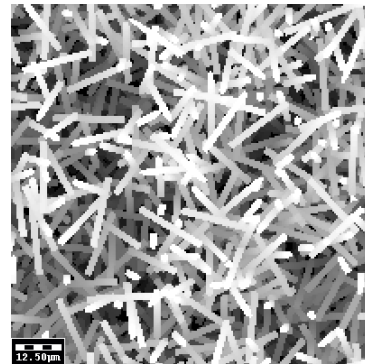
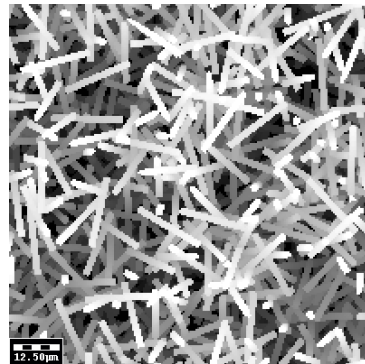
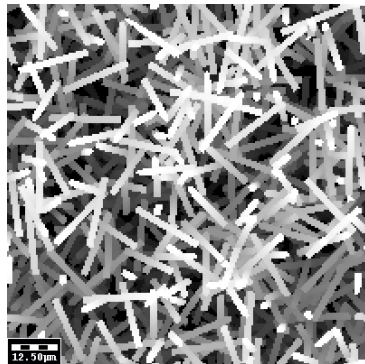
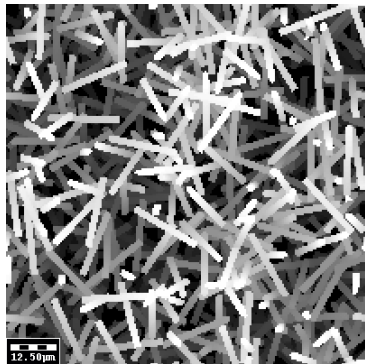
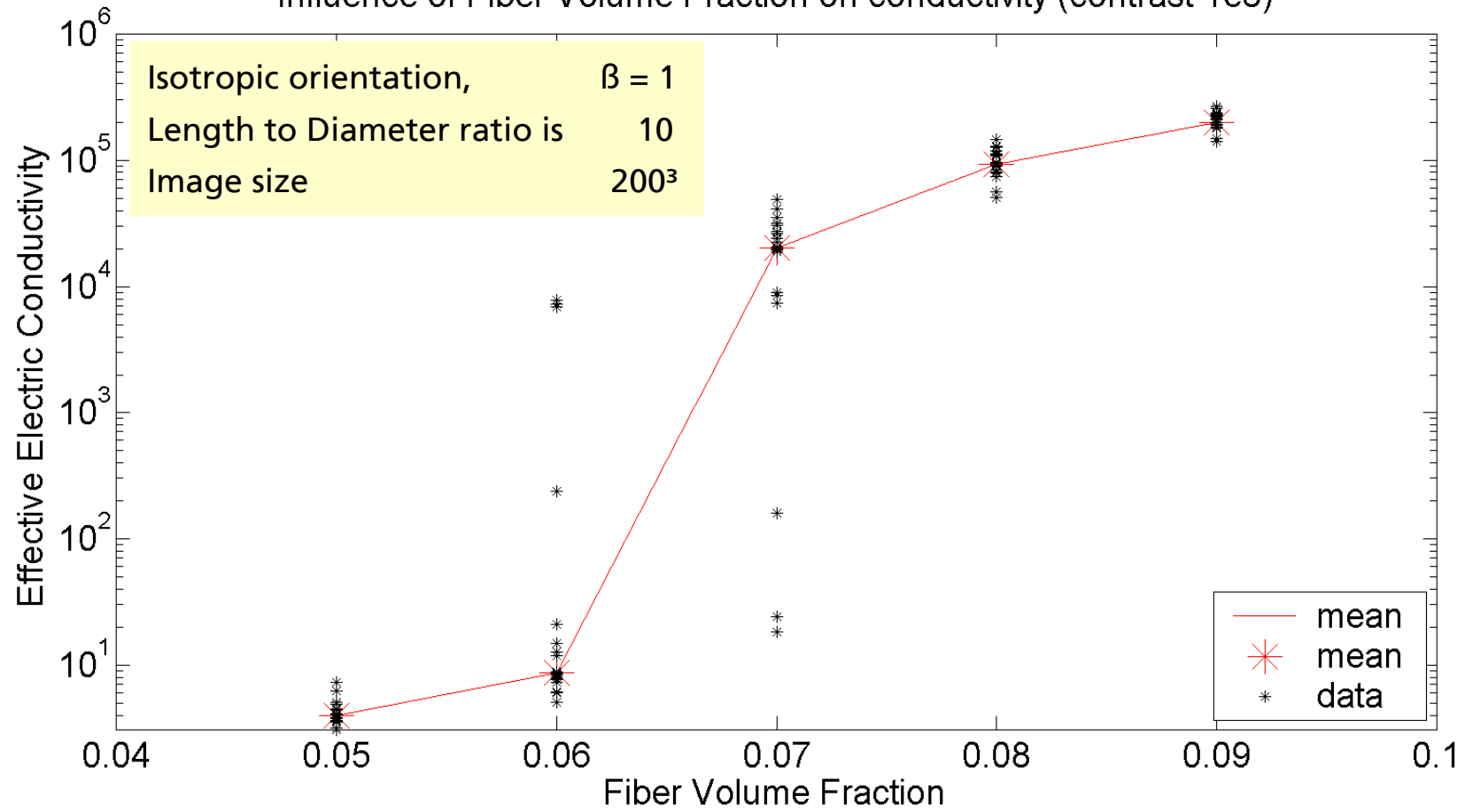
$$\beta_{ml}^* = \frac{1}{d_1 d_2 d_3} \int_{\Omega} \langle \vec{e}_m, \beta(\vec{x})(\nabla U_l + \vec{e}_l) \rangle d\vec{x}, \quad l = 1, 2, 3; \quad m = 1, 2, 3,$$

U_l has kinks where β is discontinuous – must be careful evaluating ∇U_l .

Influence of Fiber Volume Fraction on conductivity (contrast 1e4)

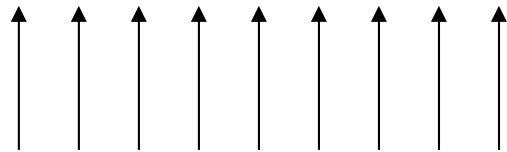
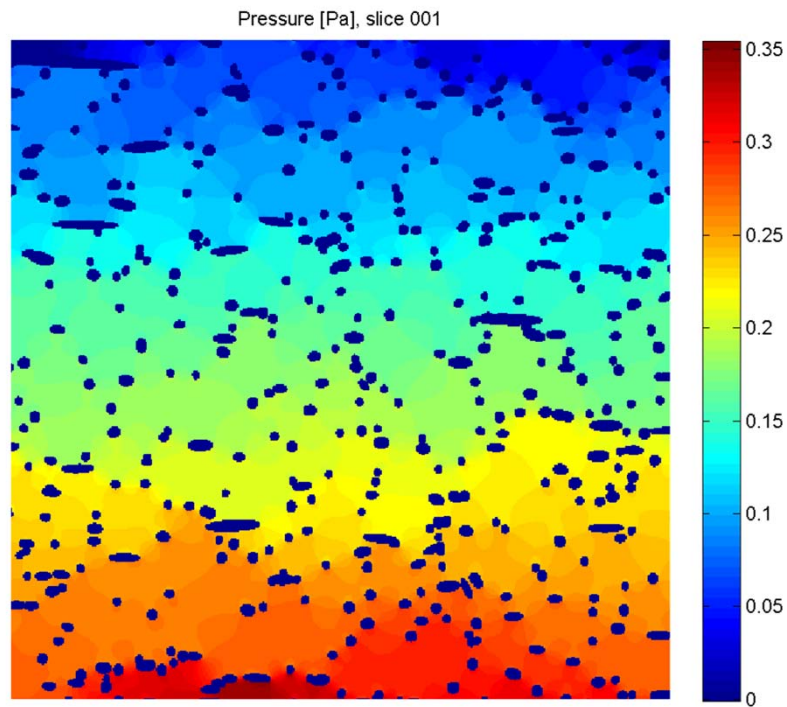


Influence of Fiber Volume Fraction on conductivity (contrast 1e8)

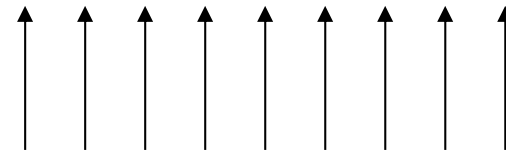
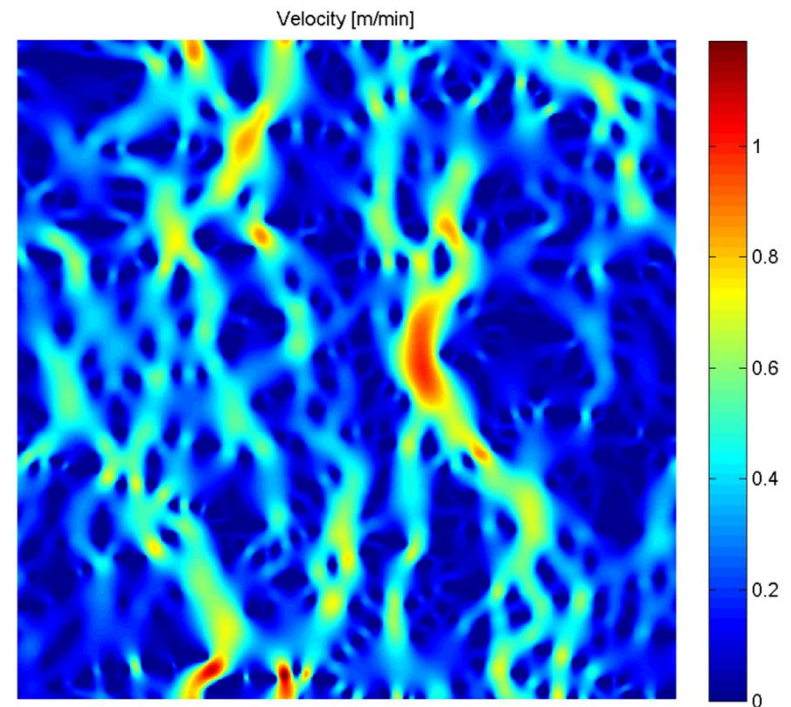


Pressure and velocity

Pressure (p)



Velocity (\vec{u})



Computation of permeability

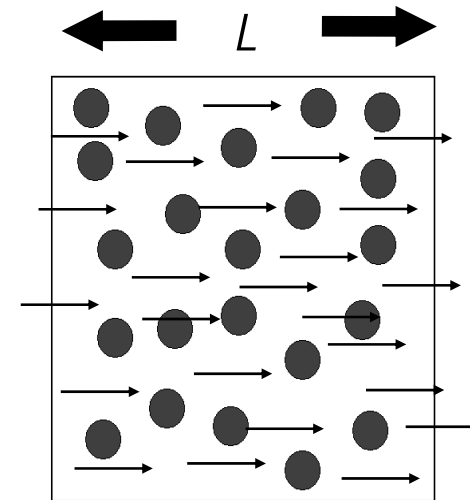
$\bar{\mathbf{u}}$: Macroscopic (creeping) flow velocity

\mathbf{K} : Permeability tensor

$\Delta \mathbf{p}$: Pressure difference

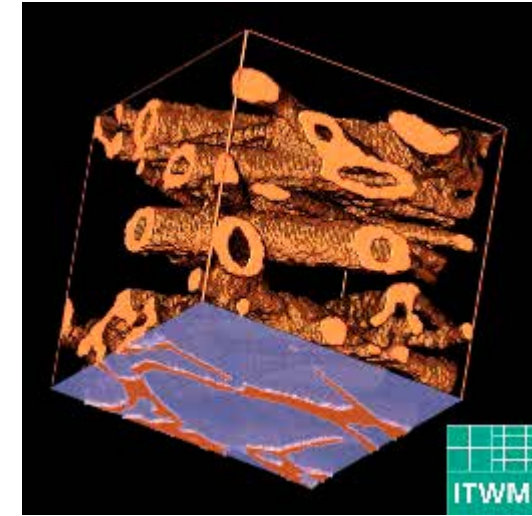
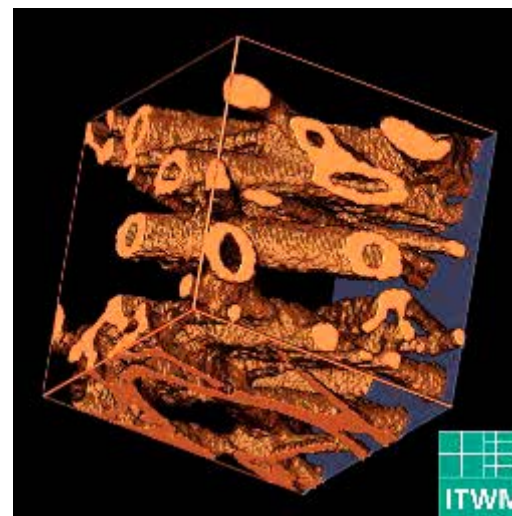
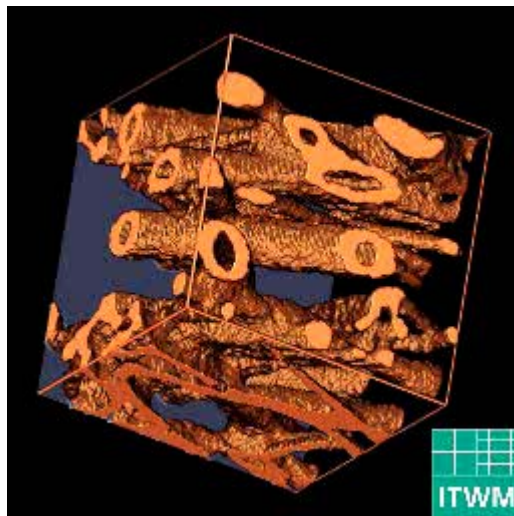
The flow solver provides the microscopic flow field for $\bar{\mathbf{u}}$ given pressure difference, averaging yields

$$\text{Darcy-Law: } \bar{\mathbf{u}} = \frac{1}{L} \mathbf{K} \cdot \Delta \mathbf{p} \quad \text{Generalized: } \bar{\mathbf{u}} = -\kappa \cdot \nabla \mathbf{p}$$



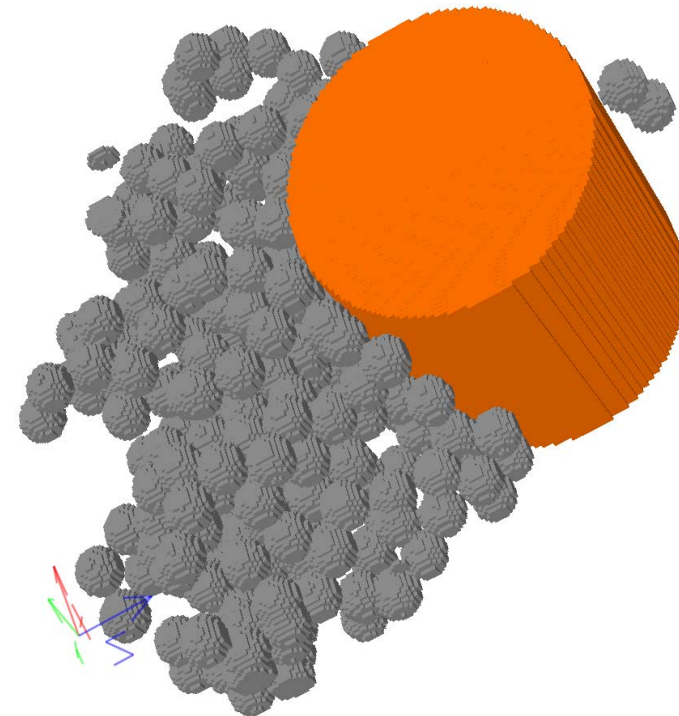
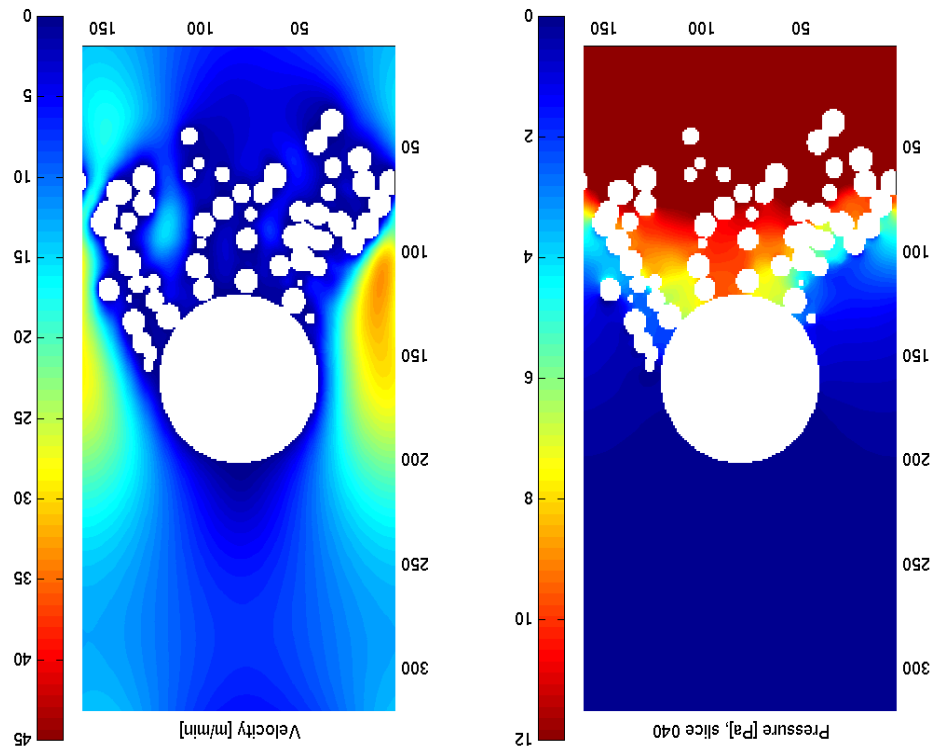
Computation of permeability

Permeability tensor: $\mathbf{K} = \begin{pmatrix} k_{11} & k_{12} & k_{13} \\ k_{21} & k_{22} & k_{23} \\ k_{32} & k_{32} & k_{33} \end{pmatrix}$ \longrightarrow Find anisotropic material behavior



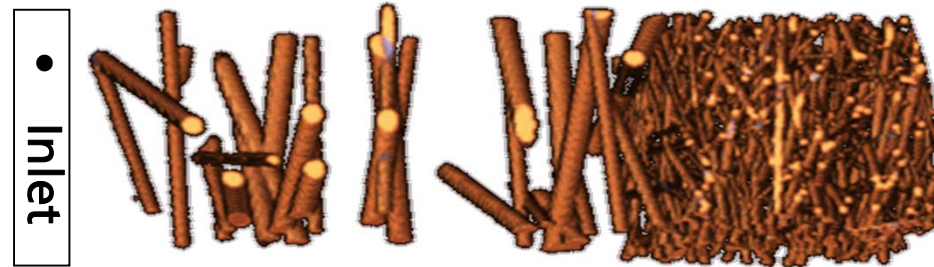
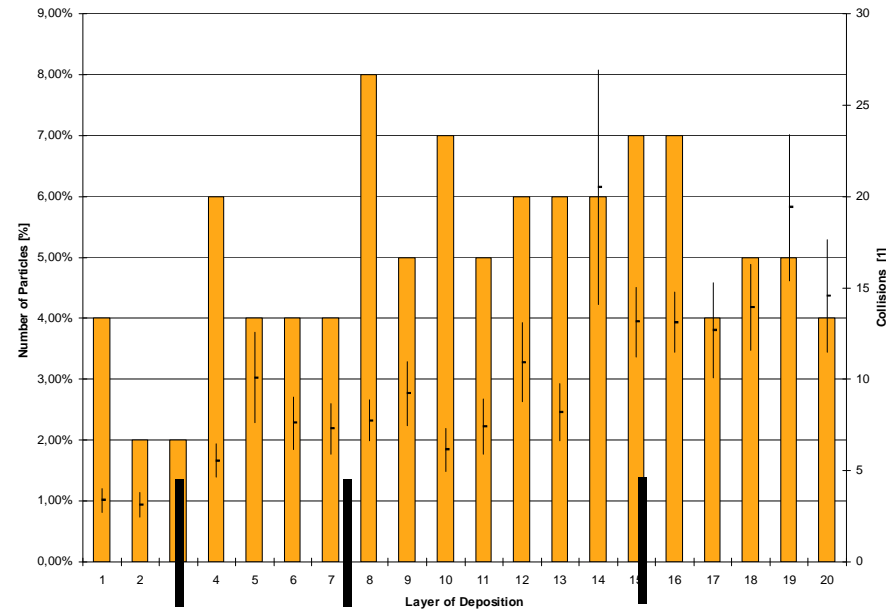
Pressure and Velocity in Clogging Simulation

Filtration is multiple physics!



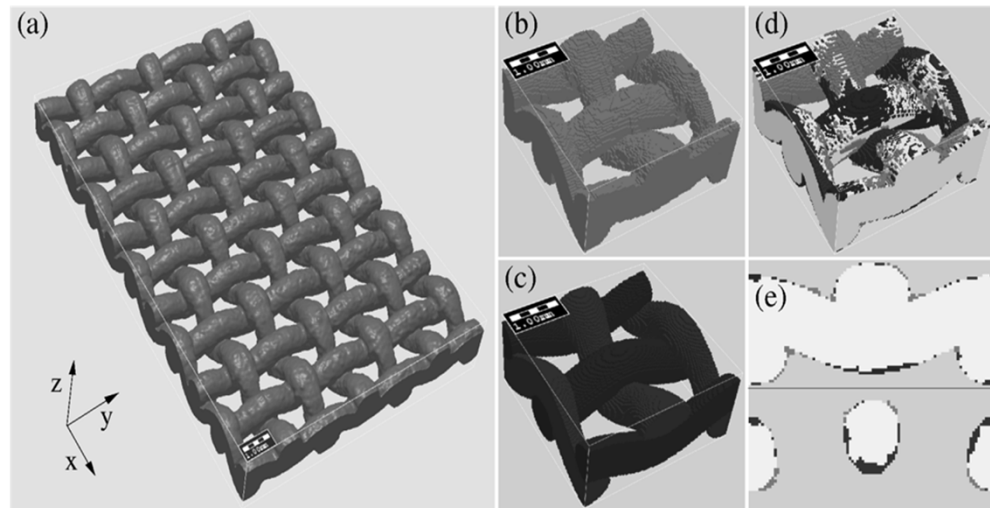
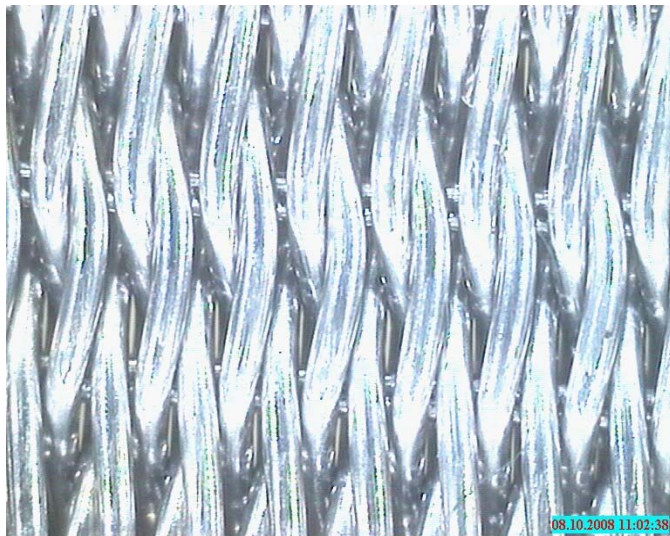
Deposition Diagram

- Deposition locations are 20 $64\mu\text{m}$ layers.
- Orange: particle numbers
- Lines: mean value and standard deviation of number of collisions
- Example: Layer 15 contains 7% of the filtered particles. Those had on average 13.15 collisions with standard deviation 1.9
- 4 layers of gradient material indicated by thick black lines:



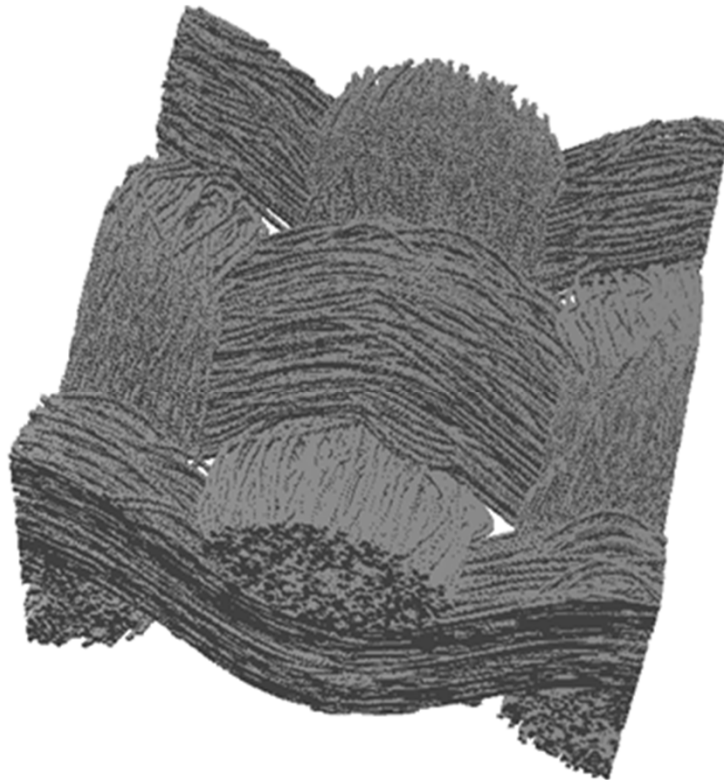
On 8 cores 64GB Linux desktop:
400 x 400 x 1200 filter media

Reconstruction of Woven



Microscopy Courtesy M. Knefel, Gebr.
Kufferath AG.

Carbon fiber multi-filament woven



3D Visualization (generated)



SEM (real)

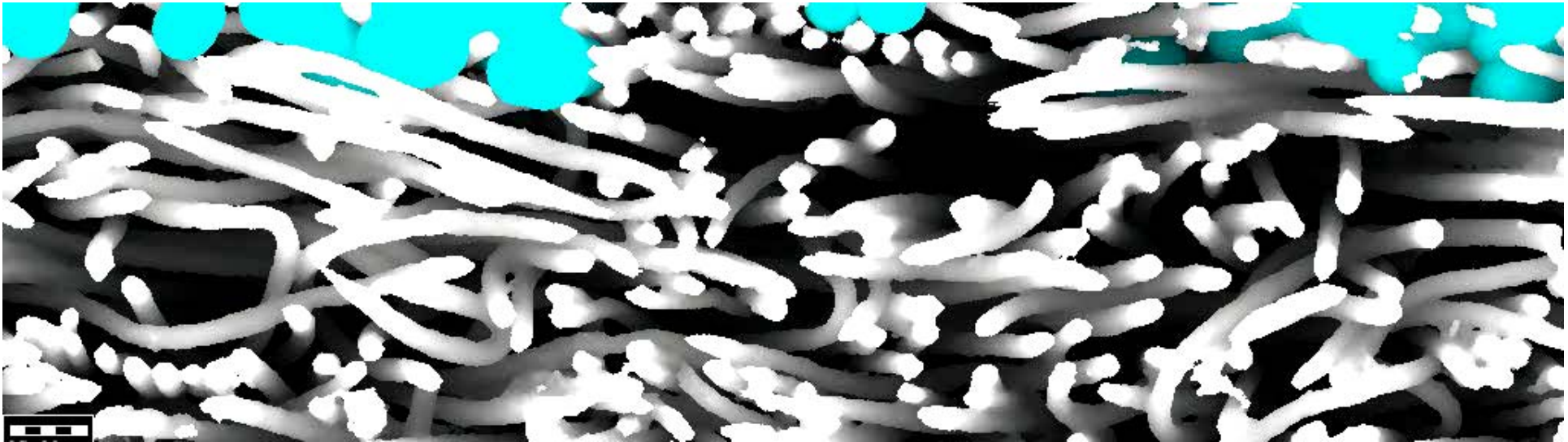
(courtesy of Jeff Gostick, Univ. of Waterloo)

V.P. Schulz, P.P. Mukherjee, J. Becker, A. Wiegmann and C.Y. Wang, *Modeling of Two-phase Behavior in the Gas Diffusion Medium of Polymer Electrolyte Fuel Cells via Full Morphology Approach*, Journal of the ECS, Issue 4, Vol. 154, 2007, pp B419-B426.

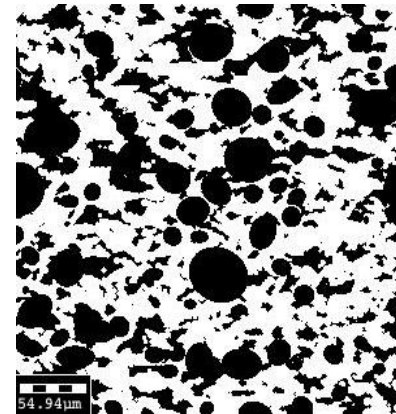
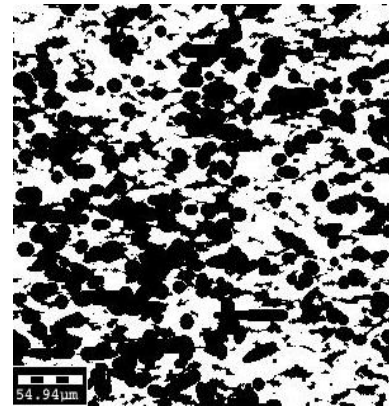
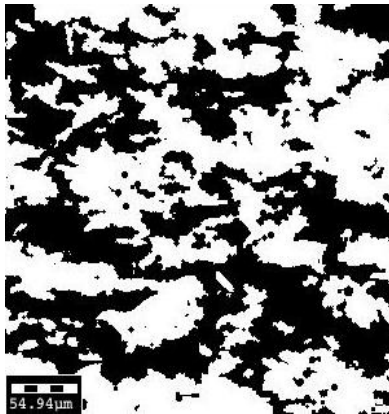
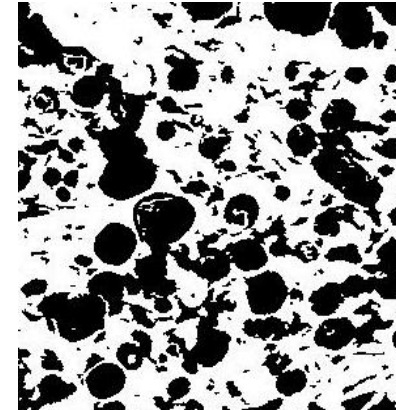
Simulated mercury Distribution at Bubble Point in tomography

$p_c = 10.6 \text{ kPa}$

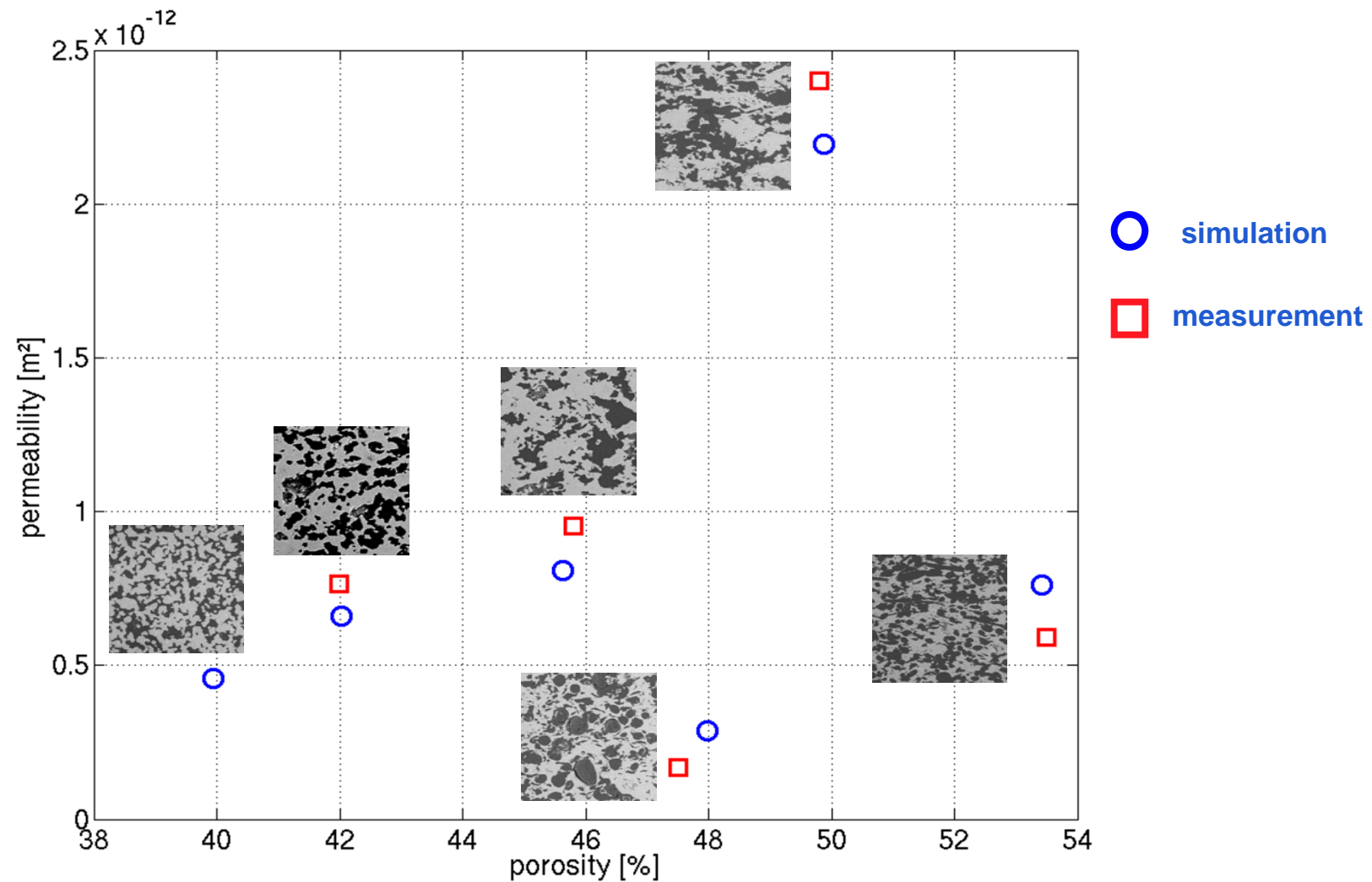
$(r = 10.5 \text{ } \mu\text{m})$



Binarized SEM (top) and virtual sintered ceramics (bottom)



Computed vs measured porosities and permeabilities



CAE of Materials – Modules of the GeoDict Software

- **FiberGeo**, **SinterGeo**, **WeaveGeo**, **GridGeo**, **PackGeo**, **PleatGeo** , **PaperGeo**
(structure generators)
- **ProcessGeo** (3d image processing)
- **LayerGeo** (layered media)
- **ImportGeo** (e.g. tomographie, STL, .gad)
- **ExportGeo** (e.g. Fluent, Abaqus)
- **FlowDict** (single phase flow properties)
- **PleatDict** (porous media flow)
- **ElastoDict** (effective elastic properties)
- **ThermoDict** (effective conductivity)
- **DiffuDict** (effective diffusivity)
- **FilterDict** (pressure drop, efficiency, life time)
- **SatuDict** (two phase flow properties)
- **PoroDict** (pore size measures)
- **AcoustoDict** (acoustic absorption)



Target hardware:

Solver: Workstation or cluster

Pre + Post: Laptop

GeoDict contributors: 2001 - 2010

GeoDict

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Jürgen Becker
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Stefan Rief
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Ashok Kumar Vaikuntam
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Porodict

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SinterGeo

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PleatGeo

Erik Glatt
Andreas Wiegmann
Jürgen Becker

PackGeo

Erik Glatt
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Joachim Seibt

GridGeo

Erik Glatt
Liping Cheng
Andreas Wiegmann
Rolf Westerteiger

RenderGeo

Matthias Groß
Sven Linden
Carsten Lojewski
Rolf Westerteiger

PaperGeo

Erik Glatt

Conclusions and Restrictions

- Materials random – no CAD but 3d digital images (CT) available, segment into ST
- Optimize meaningful design variables, not voxels
- Generators convert design variables into random realizations (ST)
- Solving pde on ST avoids meshing step
- Solution of pde can be
 - averaged for effective property
 - used as flow field for particle tracking
- Requests repeat – developed software tool GeoDict
- **Must be able to solve pde on very large 3d images**
- **Voxels do not allow boundary layers**
- **Large contrast deteriorates performance**
- **...**

Find out more:

Demo from
www.geodict.com

Thank you for your attention

www.itwm.fhg.de

GEO DICT 