# Modelling and Simulation of Filtration Processes - a practitioners overview -

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Kaiserslautern







#### Thanks to collaborators at Fraunhofer ITWM

#### Currently at ITWM:

➤ Heiko Andrä, Jürgen Becker, Liping Cheng, Oleg Iliev, Mathias Kabel, Peter Klein, Zarah Lakdawala, Arnulf Latz, Sven Linden, Barbara Planas, Vita Rutka, Katja Schladitz, Konrad Steiner, Aivars Zemitis.

#### Currently ITWM and Presenters at WFC 11:

Erik Glatt, Ralf Kirsch, Stefan Rief.

#### Formerly at ITWM:

➤ Donatas Elvikis, Irina Ginzburg, Dirk Kehrwald, Joachim Ohser, Doris Reinel-Bitzer, Kilian Schmidt, Christian Wagner, Ashok Kumar Vaikuntam, Rolf Westerteiger, Qing Zhang.



#### What about Math2Market GmbH & Fraunhofer ITWM / SMS?

Math2Market GmbH is a spin-off that markets and further develops the GeoDict software M2M incorporated Sept. 2011, 4 core team members phase from SMS to M2M in 2012. Andreas Wiegmann, PhD (the speaker), is

- ➤ Chief Executive Officer at Math2Market GmbH (50% now, 100% from July 2012)
- ➤ Deputy head of department SMS at Fraunhofer ITWM (50% now, 0% from July 2012) M2M provides
  - licenses,
  - software support,
  - > consulting regarding modelling,
  - simulation-based engineering services,
  - commercial-strength software engineering &
  - close ties to Fraunhofer ITWM when mathematical research is required

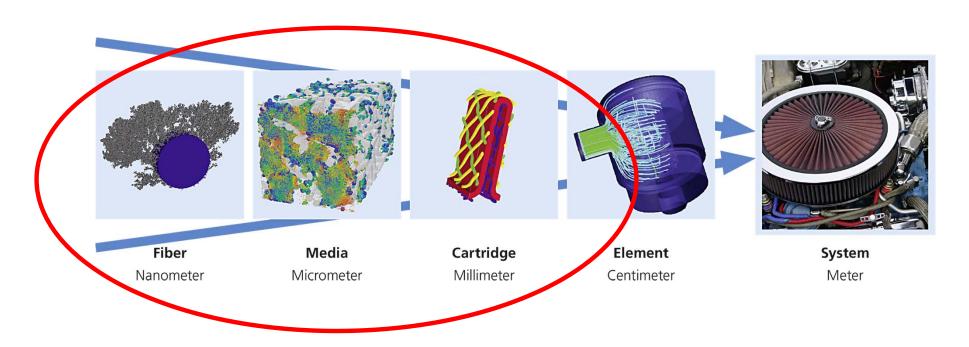


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# Why Computer Aided Filter Media Engineering?

- "Left" effects govern behavior on the right
- Understand to improve
- New Insights through tomography
- Today's PCs are supercomputers



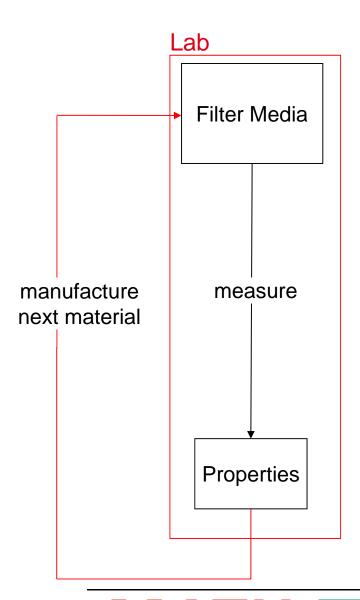


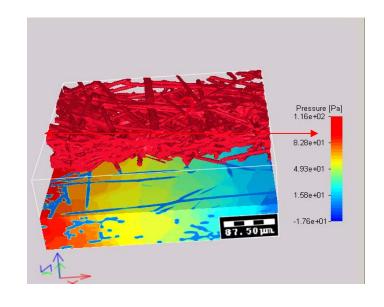
## How does (direct numerical) filtration simulation work, anyway?

- 1. Have a geometric model of the filter media or filter element
- 2. Have process conditions such as flow velocity, particle size and mass distributions, etc.
- 3. Know chemistry such as adhesion between particles and obstacles
- 4. Compute liquid or gas flow: get initial pressure drop
- 5. Compute motion and deposition of (first batch of) particles: get initial filter efficiency
- 6. Update geometric model by deposited particles
- 7. Update liquid or gas flow: get pressure drop over deposited mass
- 8. Compute motion and deposition of (next batch of) particles: get clogging and life time
- 9. Go back to 6



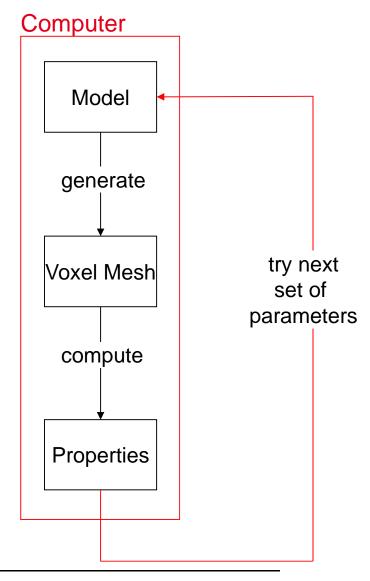
# **Computer Aided Filter Media Engineering**





#### Properties include:

- > pore size distribution
- pressure drop
- separation curve
- > filter efficiency
- filter capacity
- filter cake formation



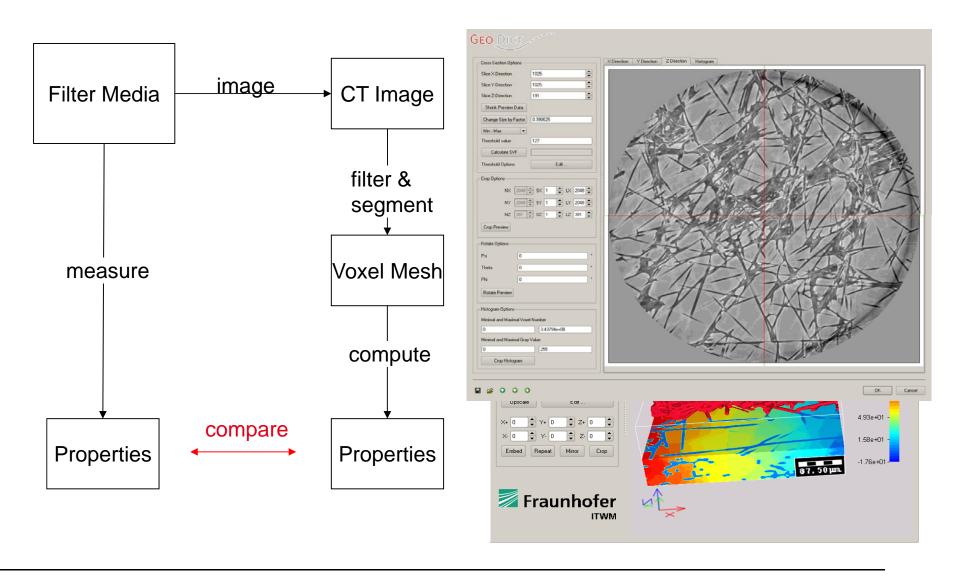


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### Validation - Step 1:

# **Property Computations**



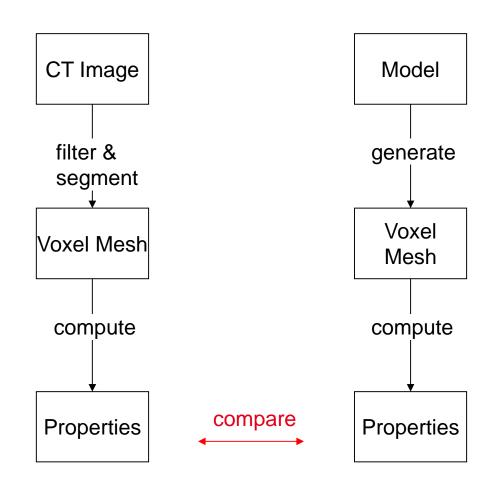


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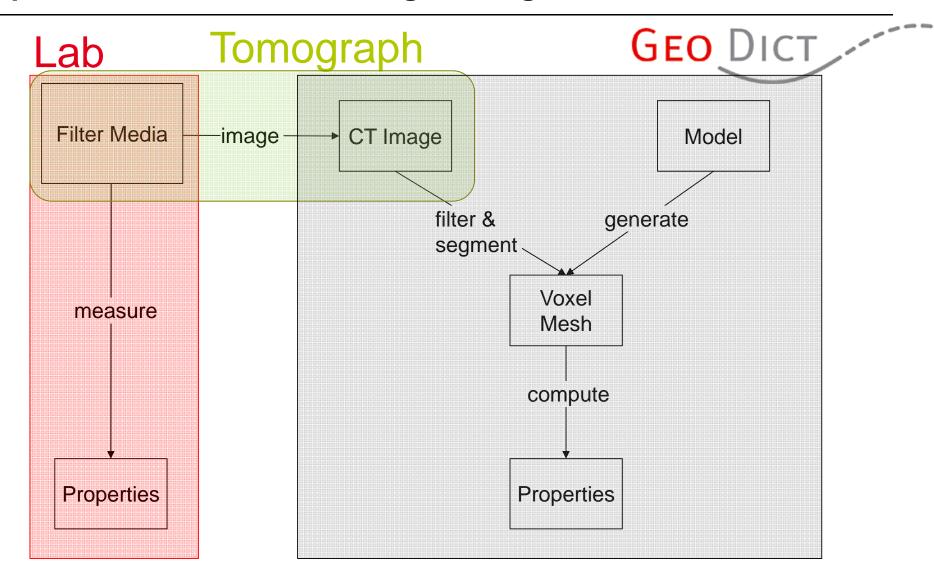
## Validation - Step 2:

#### **Material Models**





# **Computer Aided Filter Media Engineering**

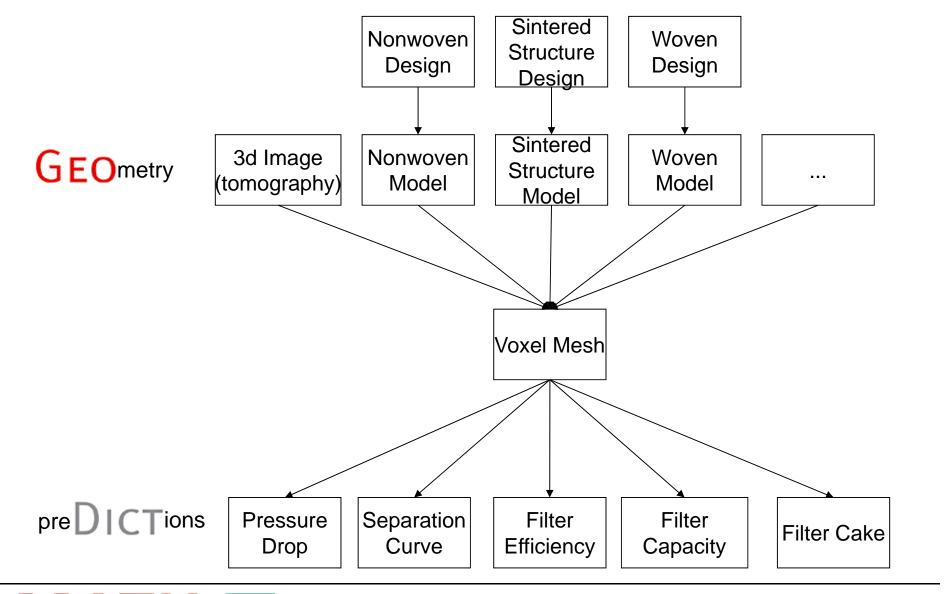




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# **Computer Aided Filter Media Engineering**

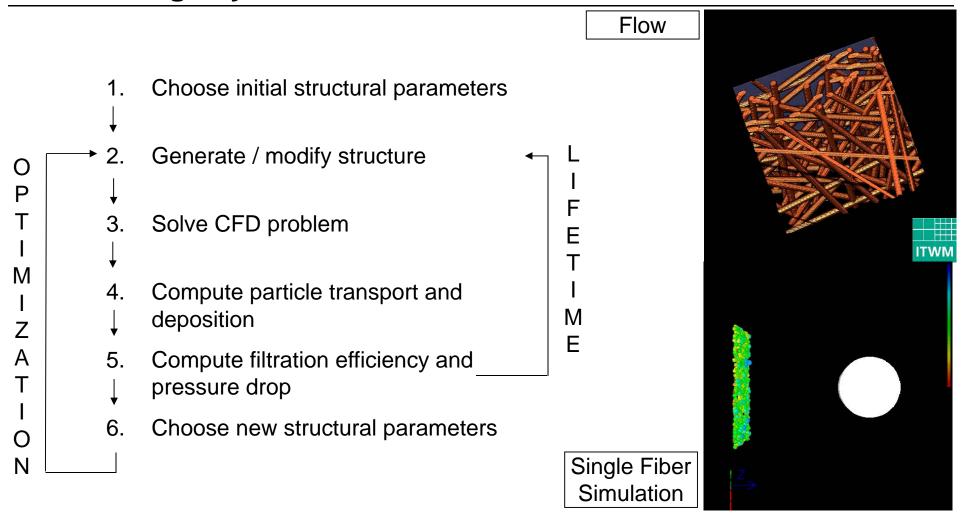




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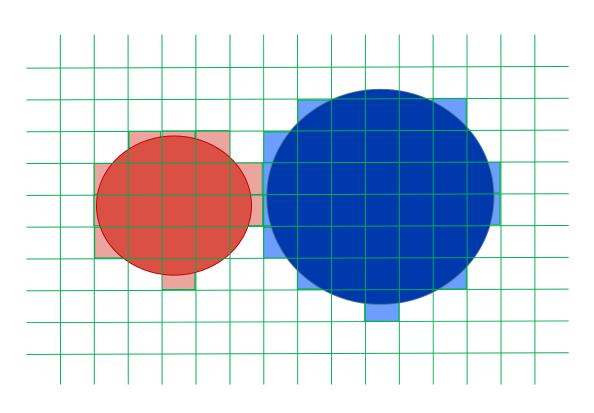
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## Virtual design cycle of filter media





#### All simulations done are based on structures of little cubes



#### **Advantages**

- Saves grid generation times
- Compatible with computer tomography
- Straight forward structure generation
- Straight forward solver implementation
- Straight forward parallel computations

#### **Disadvantages**

- Resolved features require many grid cells
- Leads to very large scale computations



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# Analytic, surface and volume representation

<Object1>

Color 1

Type ShortCircularFiber

Point1 6.64451173e-05,25.77604784e-

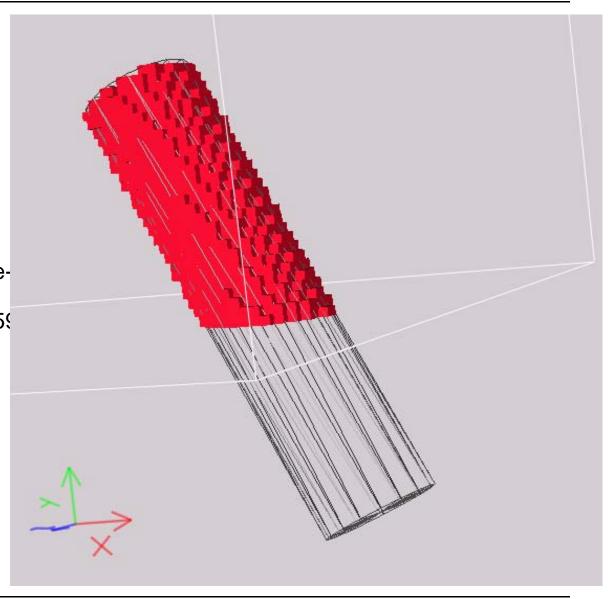
Point2 0.0000894540812,-2.040133859

FiberEndType1 0

FiberEndType2 0

Diameter 1.2e-05

</Object1>



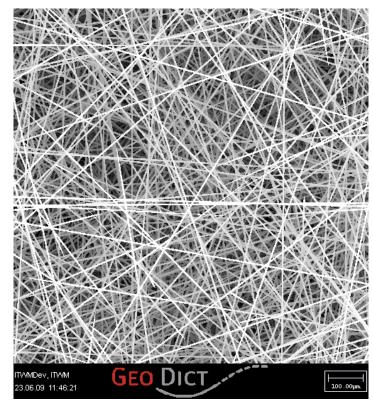


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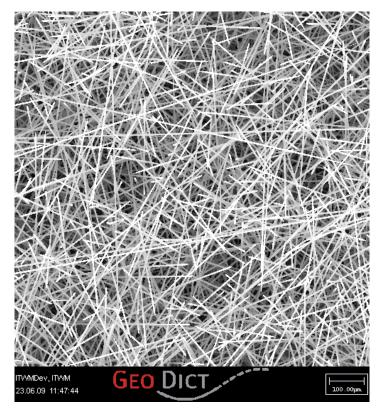
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#### Nonwoven

#### SEM visualization of 8 volume percent 5 micron fibers



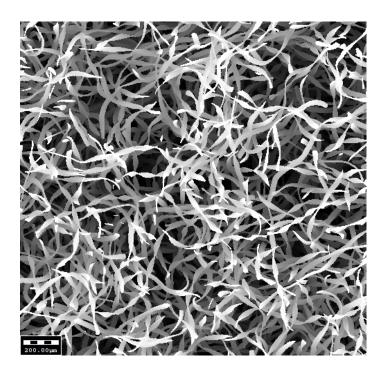
anisotropy 100

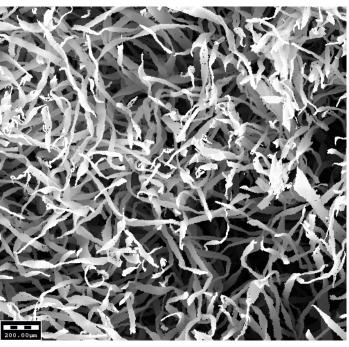


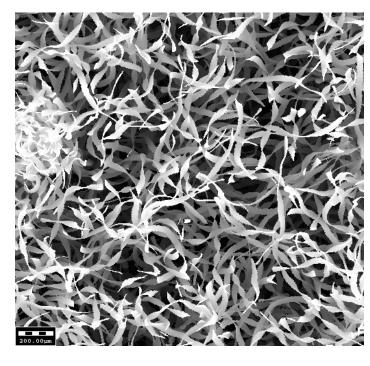
anisotropy 7



# **Curled and inhomogeneous nonwoven**







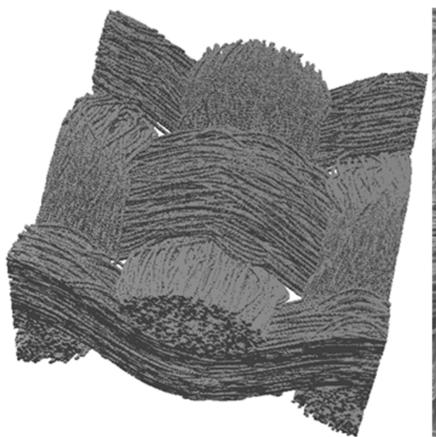
homogeneous

tomogram

inhomogeneous



#### Carbon fiber multi-filament woven





3D Visualization (generated)

SEM (real)

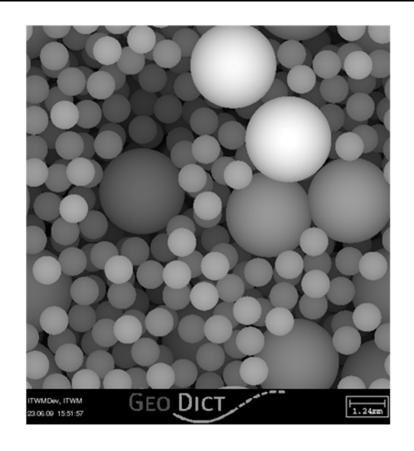
(SEM courtesy of Jeff Gostick, Univ. of Waterloo)

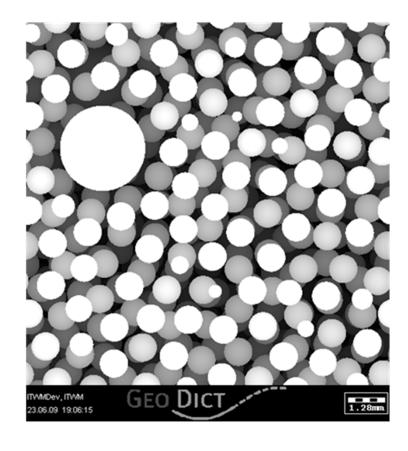


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# Packed bed of spheres and floating spheres

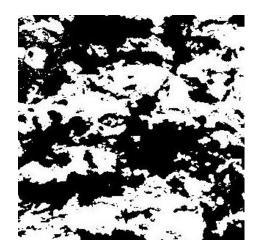


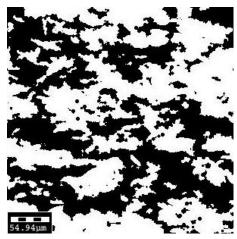


svf 0.64 svf 0.30



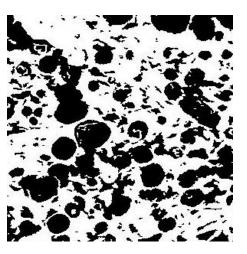
# Binarized SEM (top) and virtual sintered ceramics (bottom)

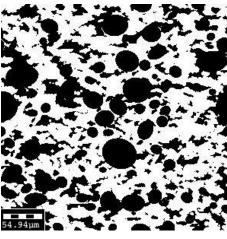












# Virtual paper: cellulose fibers & fines



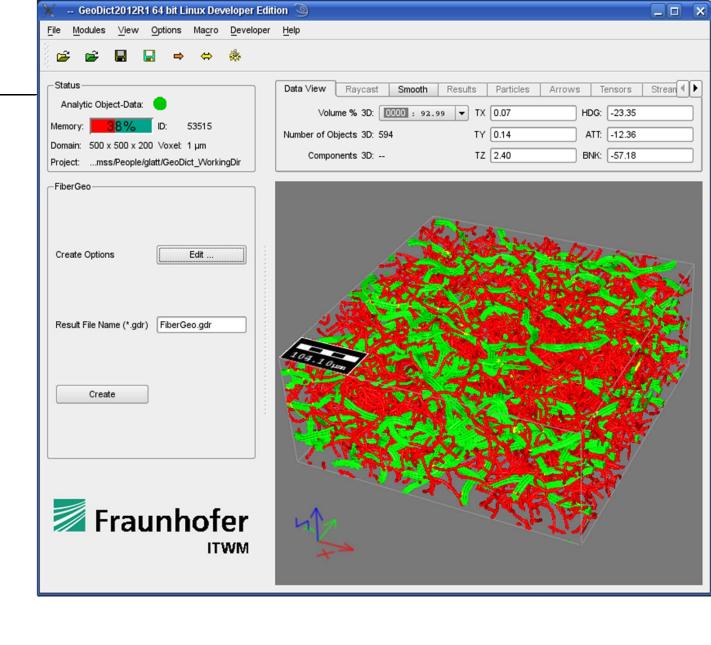
paper.gmc



paper.gad



paper.leS



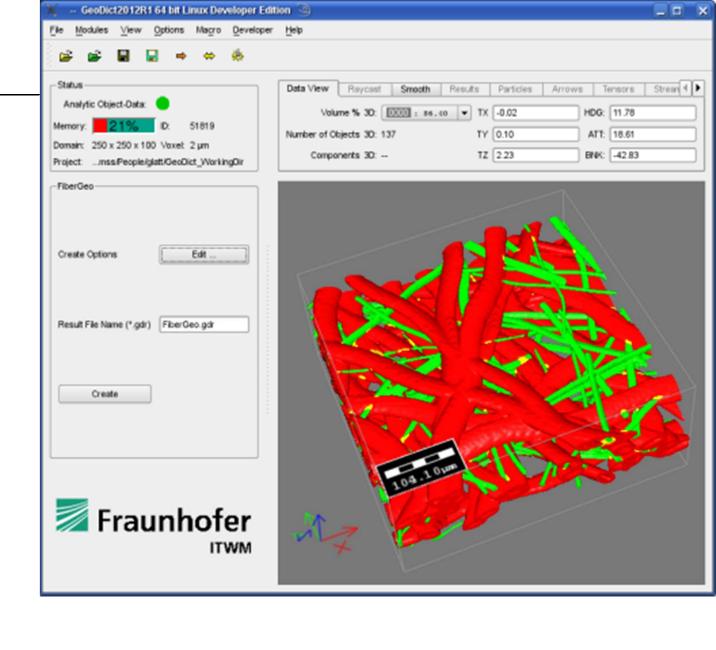


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# Virtual meltblown: curved fibers





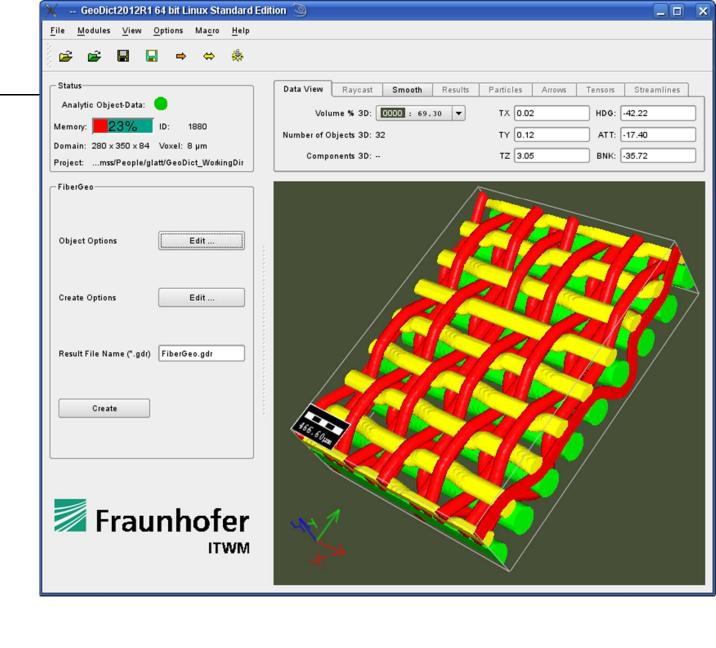


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# Virtual woven: multiple weft layers





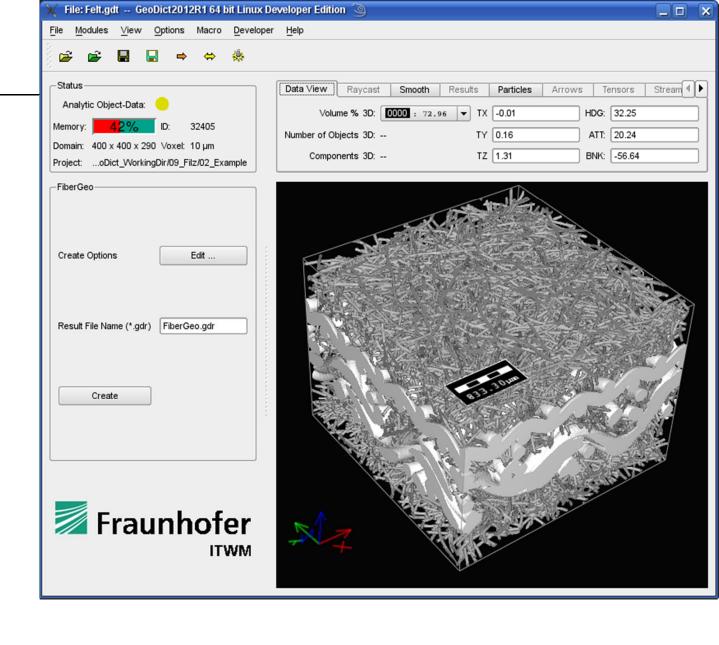


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Virtual felt: woven, nonwoven & needling





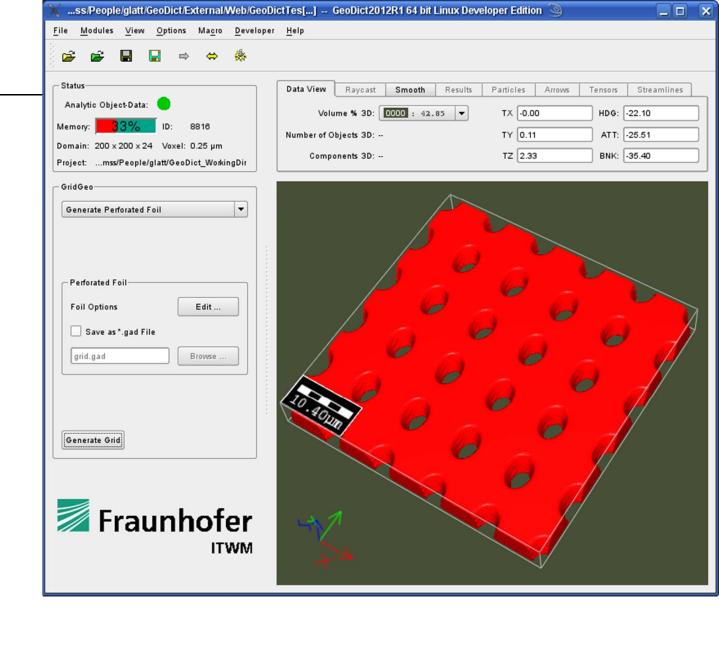


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# Virtual foil: oval & conical holes in arbitrary patterns





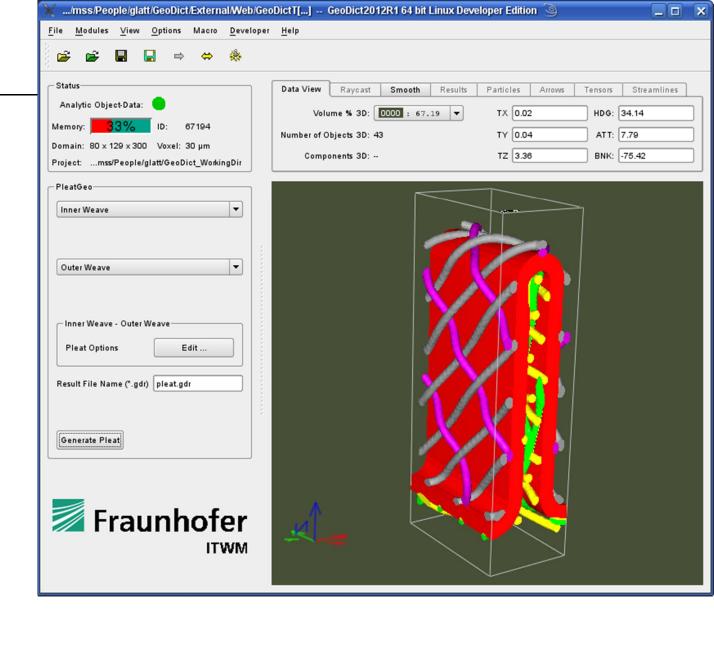


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# Virtual pleat: filter media + interior and exterior support structures







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# Stationary Stokes flow with no slip vs fractional slip

$$-\mu\Delta\vec{u} + \nabla\vec{u}\cdot\vec{u} + \nabla p = 0$$
 (momentum balance) 
$$\nabla\cdot\vec{u} = 0 \text{ (mass conservation)}$$
 
$$\vec{u} = 0 \text{ on } \Gamma \text{ (no-slip on fiber surfaces)}$$
 
$$P_{in} = P_{out} + c \text{ (pressure drop is given)}$$



 $ec{u}$  : velocity, periodic,

p: pressure, periodic up to pressure drop in flow direction.

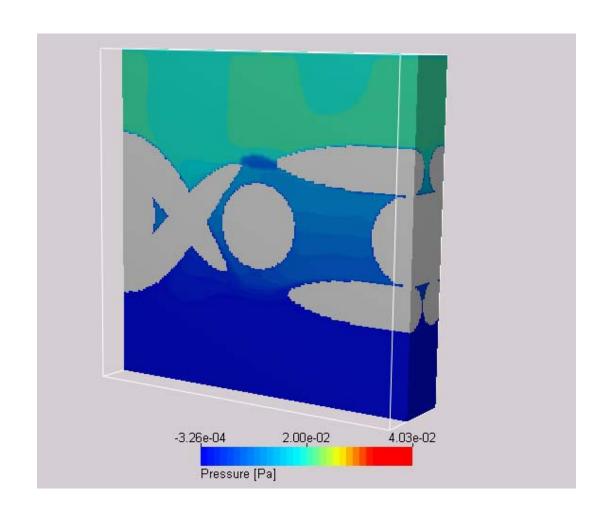
$$-\mu\Delta\vec{u}+\nabla p=0$$
 (momentum balance) 
$$\nabla\cdot\vec{u}=0 \text{ (mass conservation)}$$
 
$$\vec{n}\cdot\vec{u}=0 \text{ on } \Gamma \text{ (no flow into fibers)}$$
 
$$\vec{t}\cdot\vec{u}=-\lambda\vec{n}\cdot\nabla\left(\vec{u}\cdot\vec{t}\right) \text{ on } \Gamma \text{ (slip flow along fibers)}$$
 
$$P_{in}=P_{out}+c \text{ (pressure drop is given)}$$

 $\vec{n}$ : normal direction to the fiber surface,

 $\lambda$ : slip length,

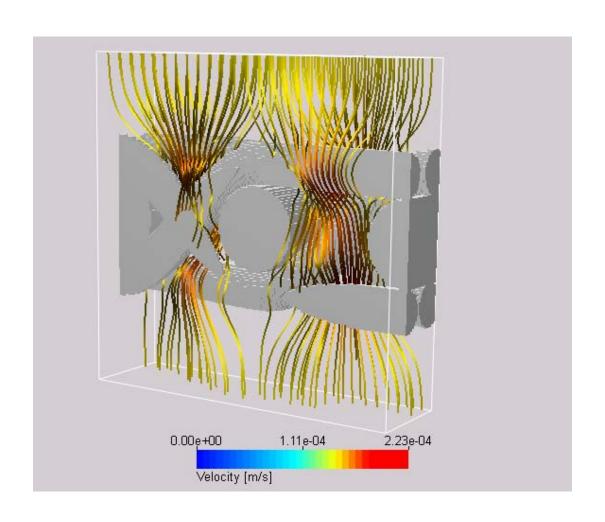
 $\vec{t}$ : any tangential direction with  $\vec{t} \cdot \vec{n} = 0$ .

# **Pressure Drop Visualization**



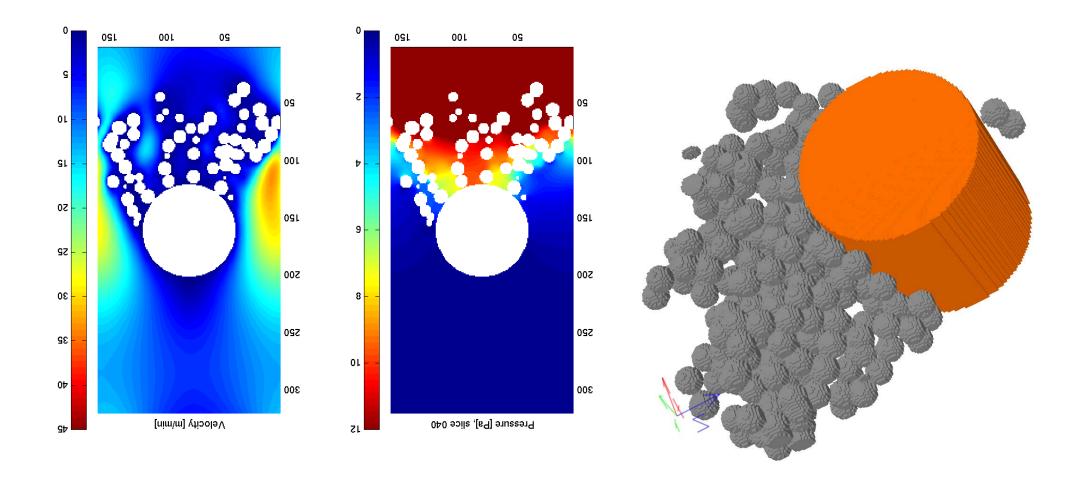


# Flow Field Visualization (streamlines)





# **Pressure and Velocity in Clogging Simulation**



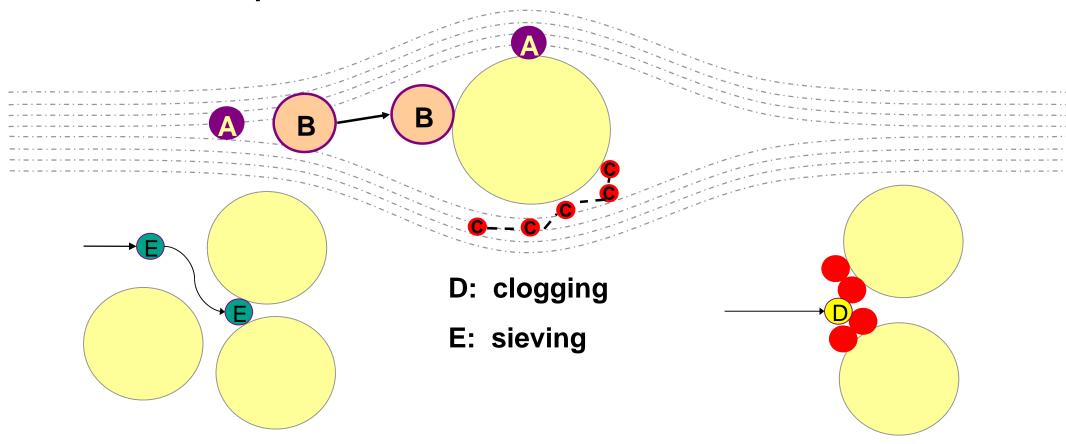


#### Filtration Effects I

A: direct interception

**B**: inertial impaction

C: diffusional deposition



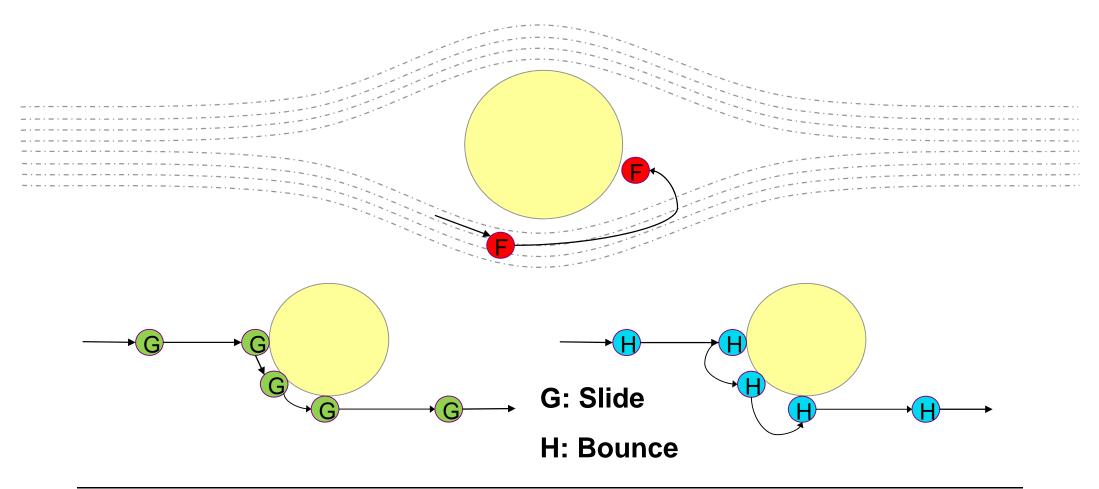


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# Filtration Effects II and modes of particle motion

#### F: electrostatic attraction





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# **Description of particle motion**

$$d\vec{x} = \vec{v} \ dt, \quad \text{Friction with fluid} \quad \text{Electric attraction Diffusive motion}$$
 
$$d\vec{v} = -\gamma \times (\vec{v}(\vec{x}) - \vec{v}_0(\vec{x})) \ dt + \frac{Q\vec{E}_0(\vec{x})}{m} \ dt + \sigma \times d\vec{W}(t),$$
 
$$C_c = 1 + Kn \left( 1.142 + 0.558e^{-0.999/Kn} \right),$$
 
$$\gamma = 6\pi\rho\mu\frac{R}{C_cm}, \qquad \gamma : \quad \text{friction coefficient}$$
 
$$\delta^2 = \frac{2k_BT\gamma}{m}, \qquad t: \quad \text{time} \qquad \vec{E}_0: \quad \text{electric field}$$
 
$$\delta_{ij}dt, \qquad \vec{x}: \quad \text{particle position} \quad \vec{v}_0: \quad \text{fluid velocity}$$
 
$$Kn = \frac{\lambda}{R}, \qquad R: \quad \text{particle radius} \quad \mu: \quad \text{fluid density}$$
 
$$\lambda = \frac{k_BT}{\sqrt{32}\pi R^2 P} \quad q: \quad \text{particle mass}$$
 
$$\lambda = \frac{k_BT}{\sqrt{32}\pi R^2 P} \quad q: \quad \text{particle charge}$$
 
$$T: \quad \text{ambient temperature}$$
 
$$P: \quad \text{total pressure}$$
 
$$d\vec{W}(t): \quad 3d \text{ probability (Wiener) measure}$$

A. Latz and A. Wiegmann, Simulation of fluid particle separation in realistic three dimensional fiber structures, Filtech, Düsseldorf, October 2003.



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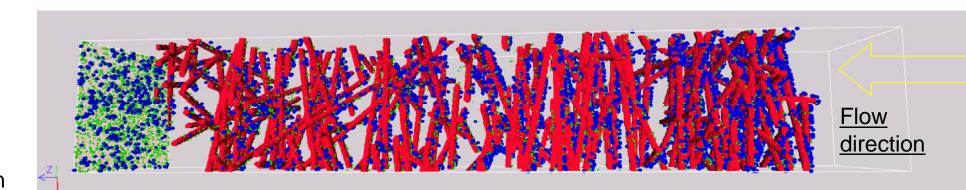
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# **Deposition effects**

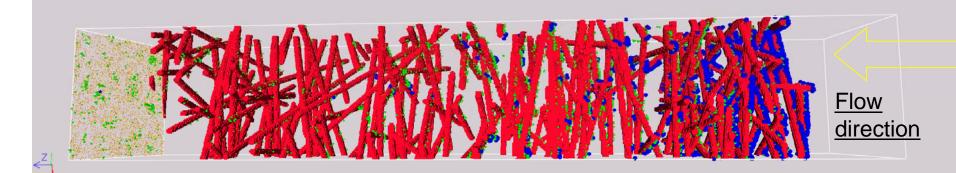
 $\alpha = 0.05$ ,

 $d_F = 14$ ,

v = 0.1 m/s



Interception

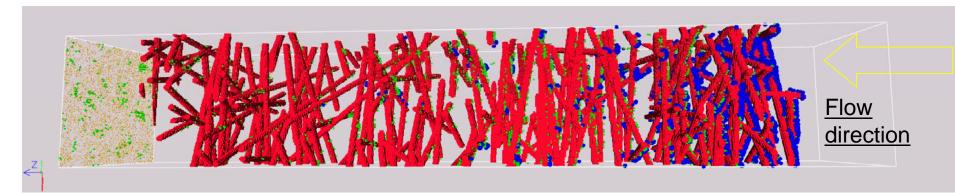


Interception

+ Impaction

Interception

- + Impaction
- + Diffusion



# **Velocity Effects**

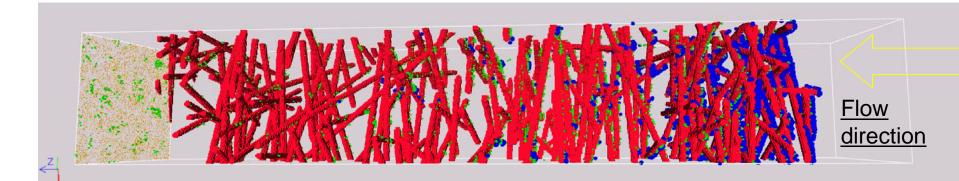
 $\alpha$  = 0.05,

dF = 14,

Interception + Impaction + Diffusion

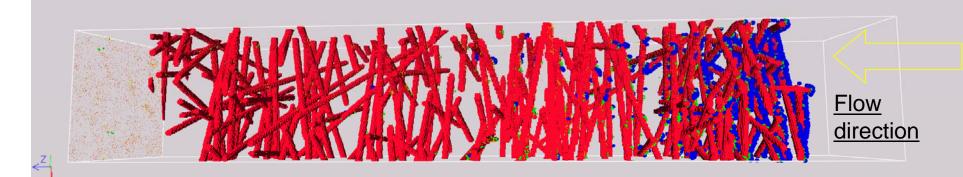


v = 0.1 m/s



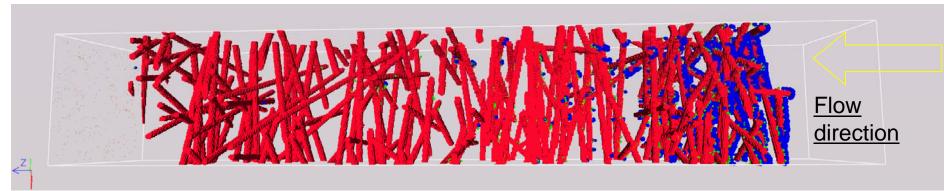
Velocity

v = 1 m/s



Velocity

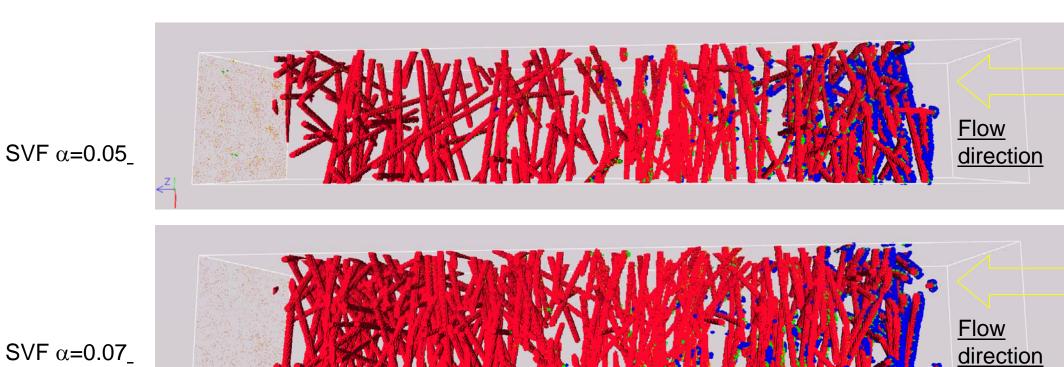
v= 10 m/s



# **Effect of grammage (here: SVF)**

dF = 14,v = 1 m/s,

Interception + Impaction + Diffusion

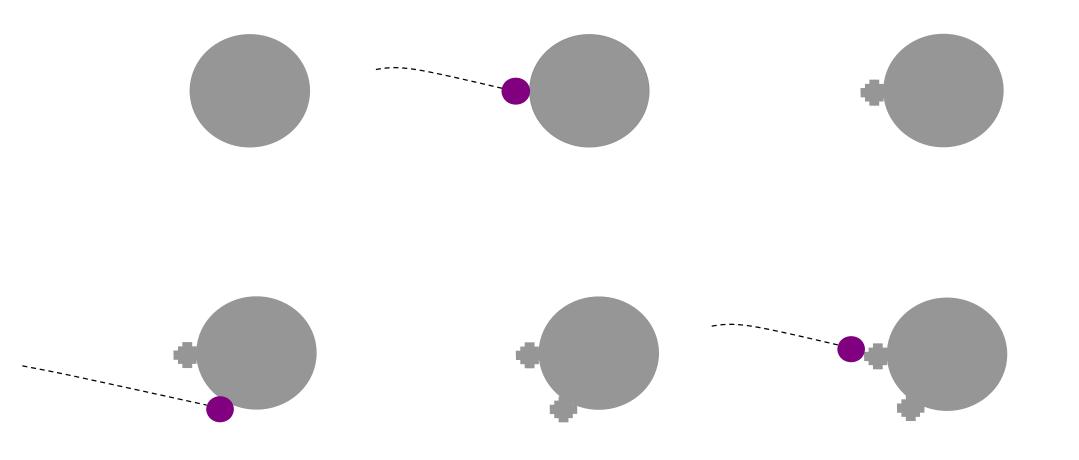


SVF  $\alpha$ =0.07\_

Flow direction

SVF  $\alpha$ =0.1

#### Nano-Modus

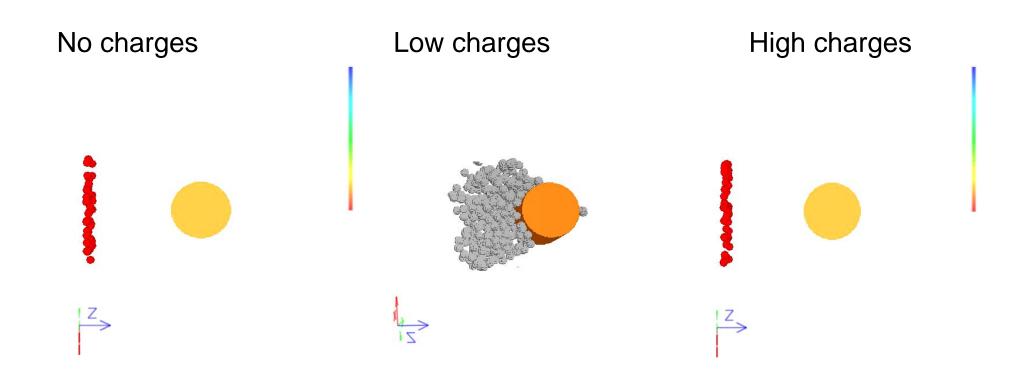




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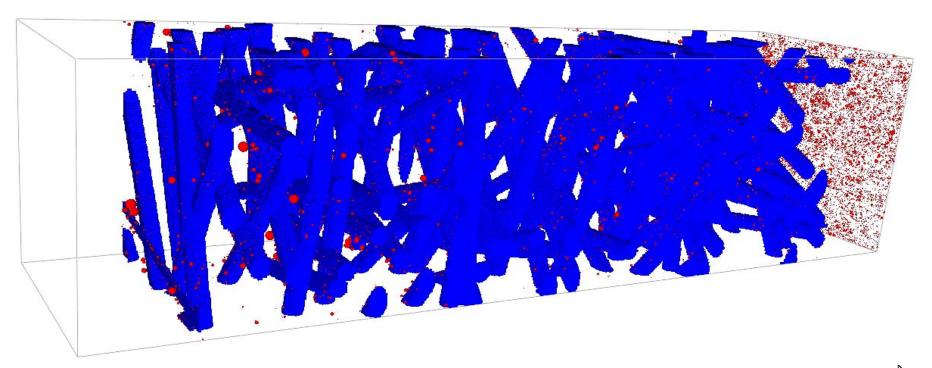
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# Influence of electric charge (air filtration)



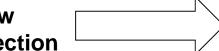


# Transition from depth filtration to cake filtration in a single simulation



- Particles resolved by the cubes
- Filtration by "caught on first touch"
- Recompute flow after "batch" of particles
- Clogging in depth and cake filtration







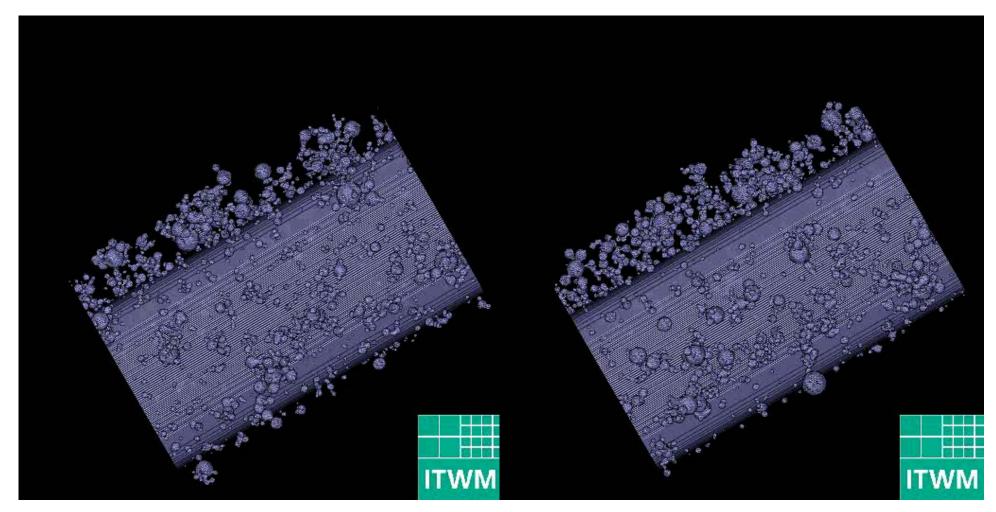
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### **Nano Simulations**

### 1.67cm/sec

### 10.0cm/sec





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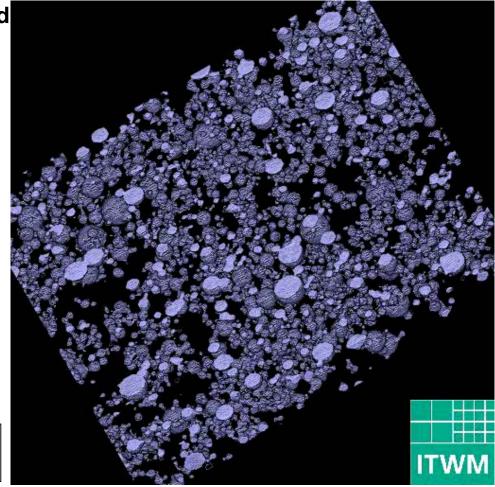
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### **Nano Simulations**

 Deposition patterns and porosity depend on far field velocity, particle size distribution, etc.

### Result:

- Find minimal porosity and permeability of the soot layers,  $s_{max}$  and  $\kappa_{min}$
- Derivation by layers from single fiber highly resolved simulations



**Soot Layer Cut-Out** 

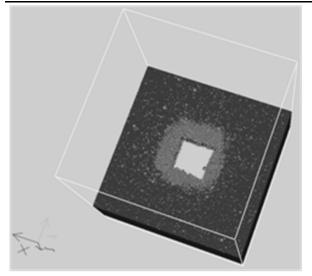
S. Rief, D. Kehrwald, A. Latz, K. Schmidt and A. Wiegmann, *Virtual Diesel Particulate Filters: Simulation of the Structure, Exhaust Gas Flow and Particle Deposition*, Filtration, No. 4, Vol. 9, 2009, pp 315-320.

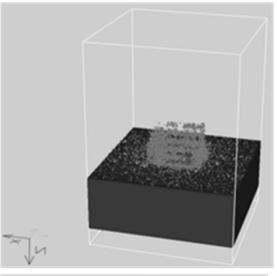


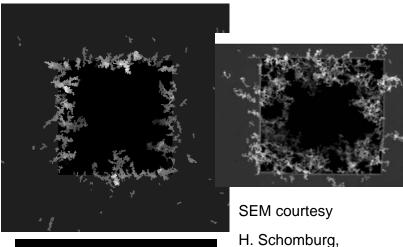
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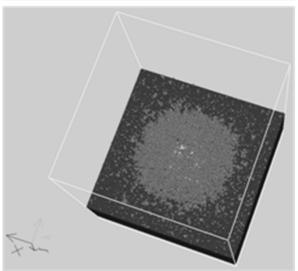
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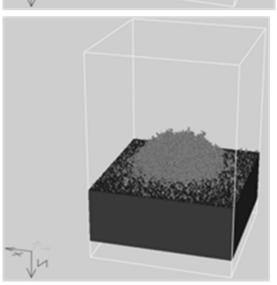
### 3d view, virtual SEM and real SEM (with FIB) of soot on micro sieve

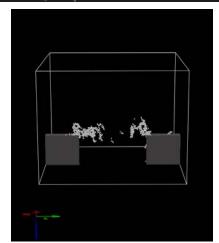












Robert Bosch GmbH

FIB & SEM courtesy
H. Schomburg,
Robert Bosch GmbH

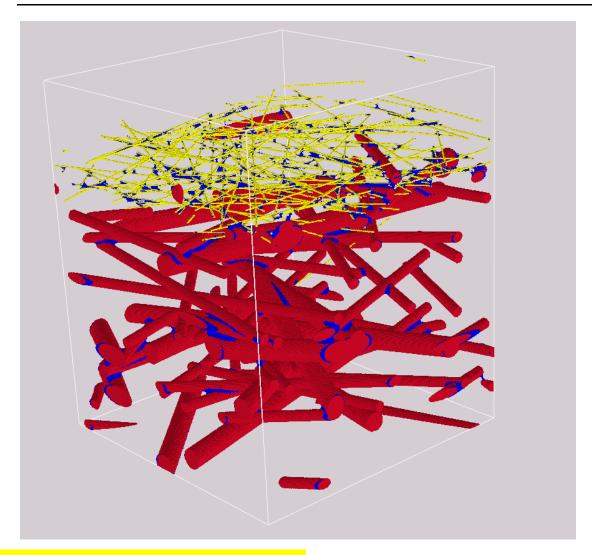
Dissertation Kilian Schmidt, Kaiserslautern Technical University, 2011.



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### Nonwoven with binder and layer of nano fibers



- 5.0 µm fibers (red)
- 2.5 µm fibers (red)
- 0.3 µm fibers (yellow)
- 2 vol % binder (blue)

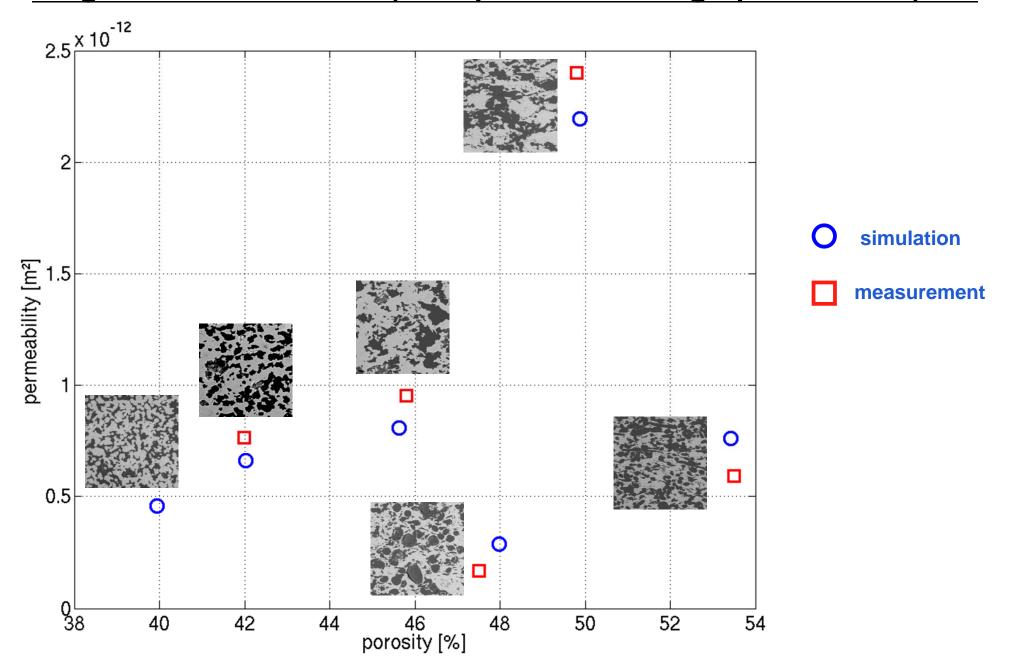
L. Cheng et al., Filtech 2009.



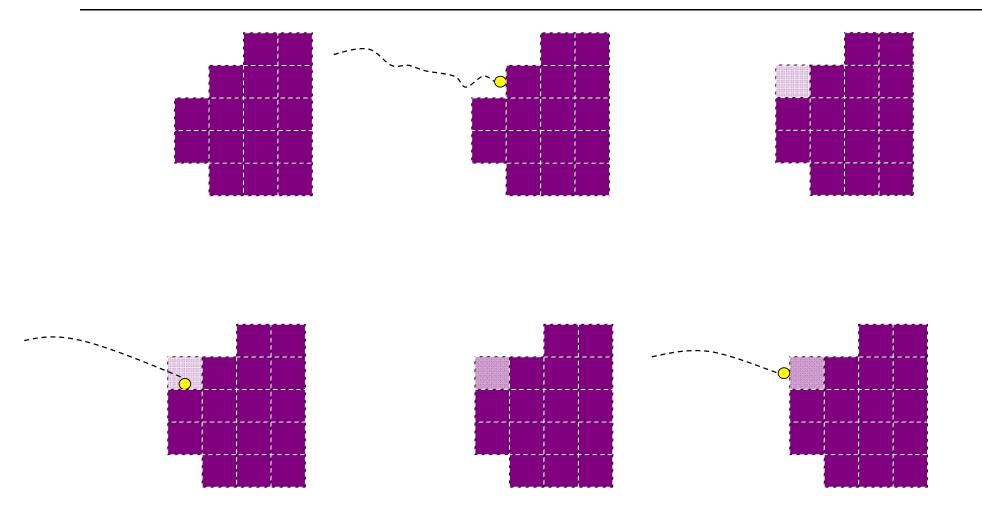
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# Computed and measured porosities and permeabilities of real & generated structures (from polished micrograph sections )



### Mikro-Modus





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### Stationary Flow with unresolved particles: Stokes-Brinkmann eqs

$$-\mu\Delta\vec{u}$$
  $+\nabla\vec{u}\cdot\vec{u}$   $+\nabla p$   $+\kappa^{-1}\vec{u}$   $=$   $\vec{f}$  (momentum balance)  $\nabla\cdot\vec{u}$   $=$  0 (mass conservation)  $\vec{u}$   $=$  0 on  $\Gamma$  (no-slip on fiber surfaces)

$$\vec{\mathbf{f}} = (0, 0, f)$$
: force in flow(z)-direction,

$$\kappa = \kappa_{min} \, \max \{1, s_{max}/s\}$$
 : porous voxel permeability,

s: solid volume fraction in a voxel

 $ec{u}$  : velocity,

 $\mu$  : fluid viscosity,

p: pressure and

 $\Gamma$ : fiber or deposited particle surfaces.

Solid volume fraction in voxel is increased until s<sub>max</sub> is reached. Voxel becomes "collision-solid". Neighbor voxels svf starts increasing upon particle arrival

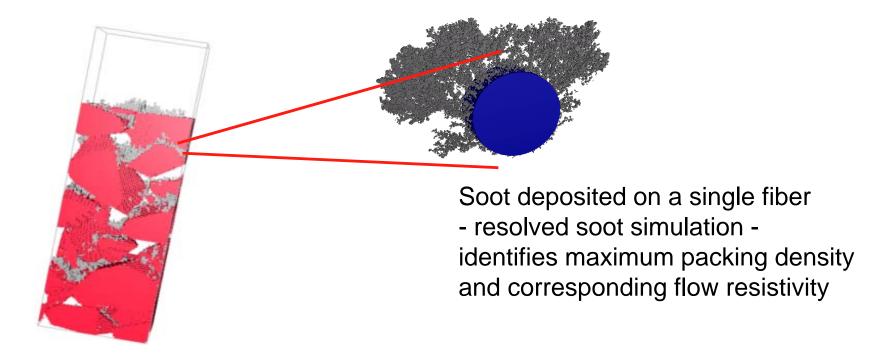
O. Iliev, V. Laptev: On Numerical Simulation of Flow through Oil Filters, J. Computers and Visualization in Science, vol. 6, 2004.139-146.



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### Particle Filtration Tasks: Multi-scale approach



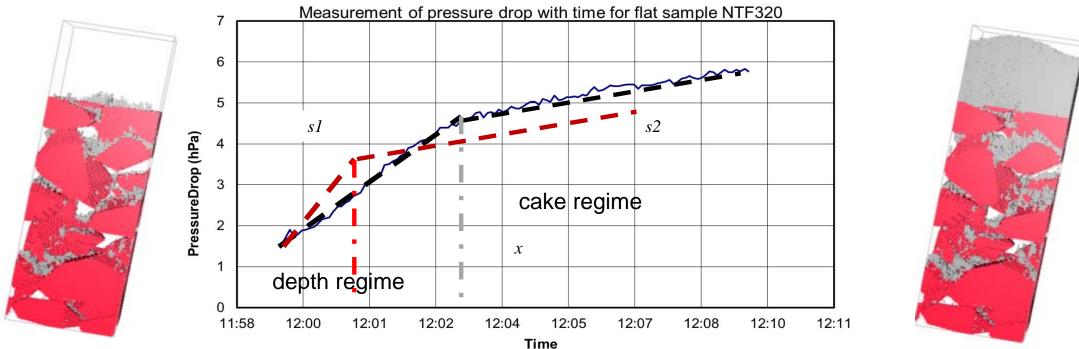
Soot deposited in ceramic DPF
- soot as porous media simulation —
requires maximum soot packing density
and corresponding flow resistivity



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### Depth vs cake filtration regime for DPF simulations



After fast initial pressure drop increase (s1, depth filtration phase) follows long slower pressure drop increase (s2, cake filtration phase)

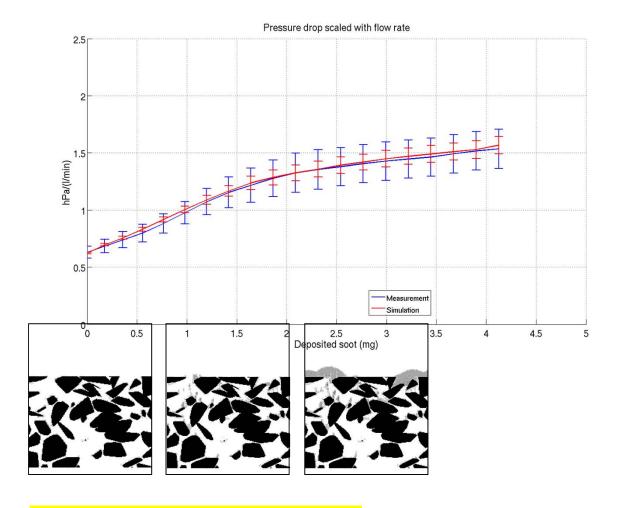
- Objectives:
- A. Match this behavior in simulations
- B. Reduce depth filtration phase to lower overall pressure drop
- C. Check that flat sample results are significant also for honeycombs (Fraunhofer IKTS)



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### **Horizonal layers**

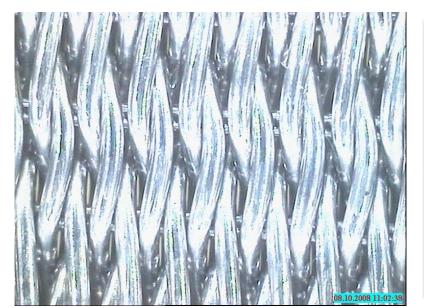


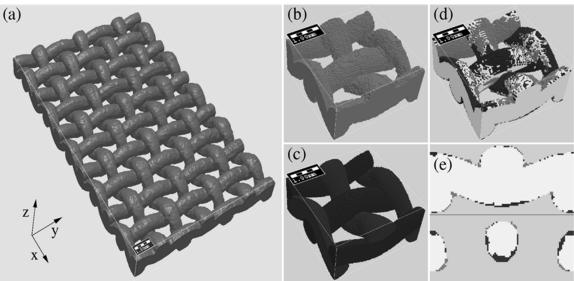
- Experimental and simulated pressure drop evolution with error bars induced by 5 measurements and 5 different realizations of the virtual structure.
- Match achieved by introducing different Brinkman parameters for depth and cake filtration.

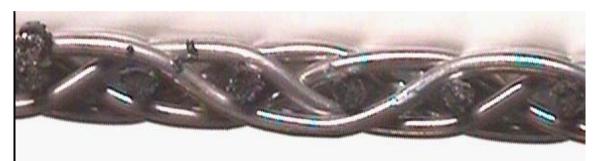
L. Cheng et al., WFC 11, 2012.



### **Reconstruction of Woven**







E. Glatt, S. Rief, A. Wiegmann, M. Knefel and E. Wegenke, *Structure and pressure drop of real and virtual metal wire meshes*, Bericht des Fraunhofer ITWM, Nr. 157, 2009.

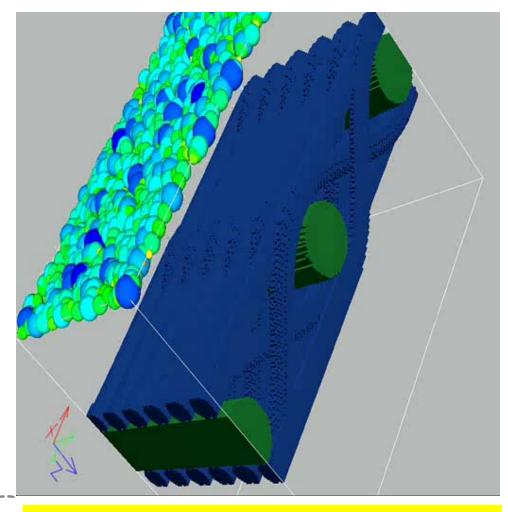


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### Surface filtration in metal wire cloth

- Filtration by "sieving"
- Recompute flow after "batch" of particles
- Cake formation in surface filtration
- Filter Cake more efficient filter than metal wire mesh
- Pressure drop increase also available



Computed & animated with GEO DICT

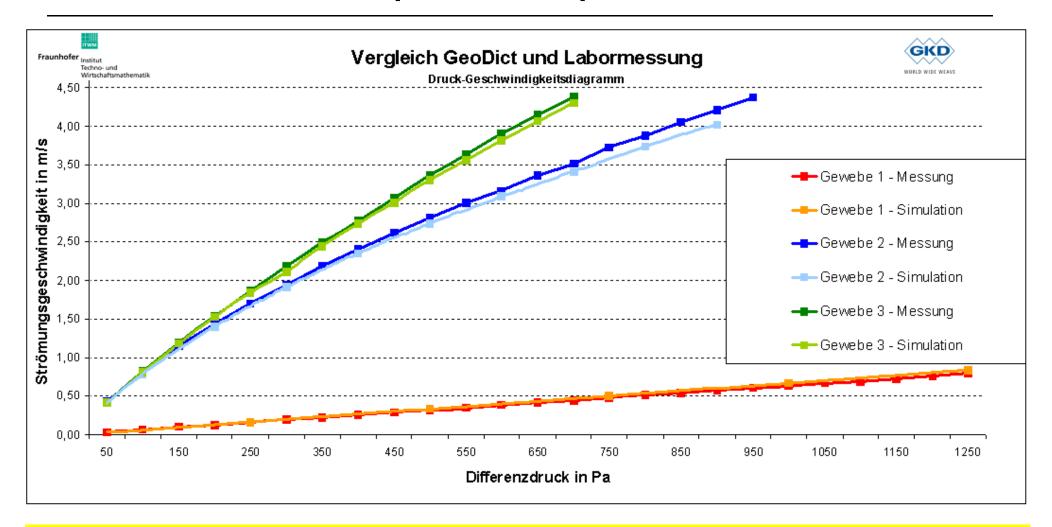
Courtesy M. Knefel, Gebr. Kufferath AG.



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### Measured vs Simulated pressure drop for GKD meshes



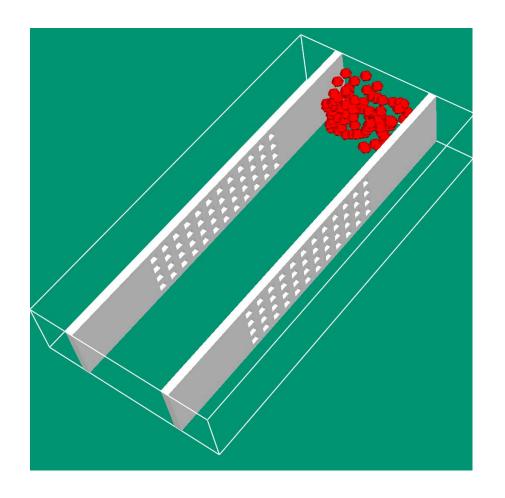
E. Glatt, S. Rief, A. Wiegmann, M. Knefel and E. Wegenke, *Structure and pressure drop of real and virtual metal wire meshes*, Bericht des Fraunhofer ITWM, Nr. 157, 2009.



**Andreas Wiegmann** 

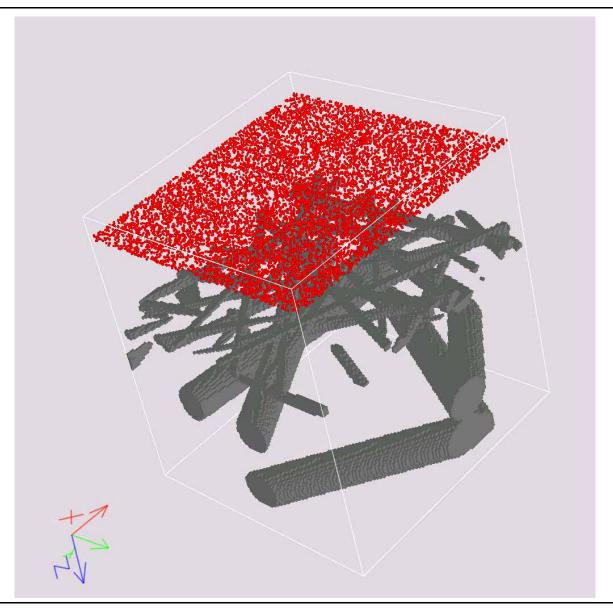
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### **Cross Flow Filtration**





## **Pulse cleaning**

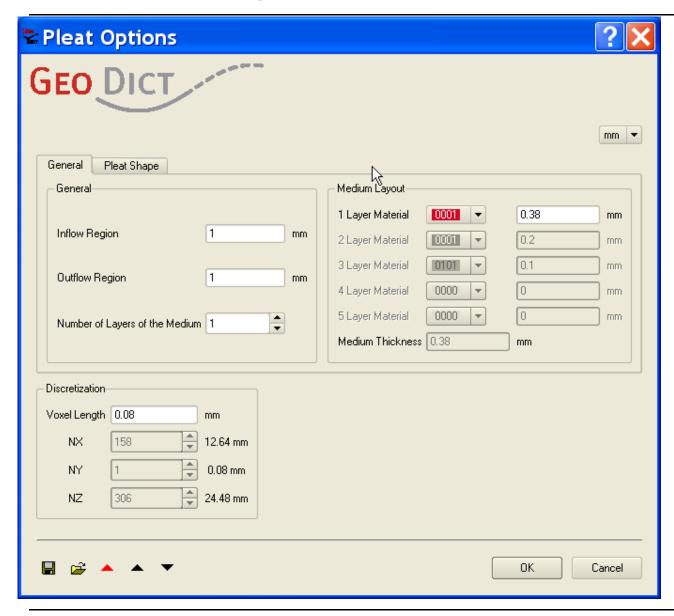


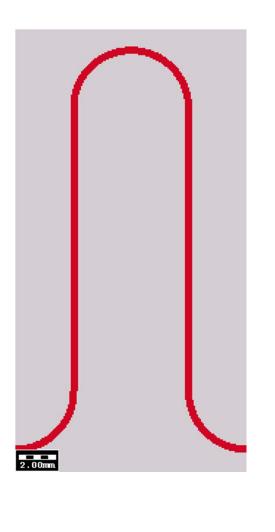


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### **General Pleat Options**





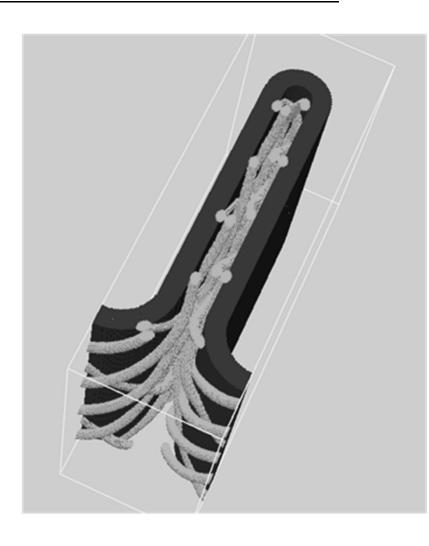


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### **Weave Pleat Options**





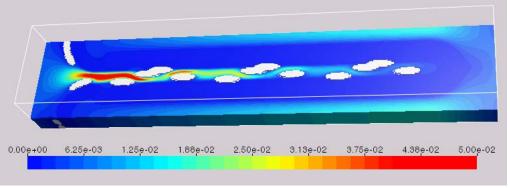


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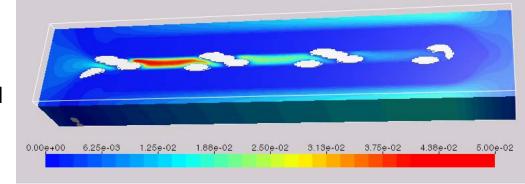
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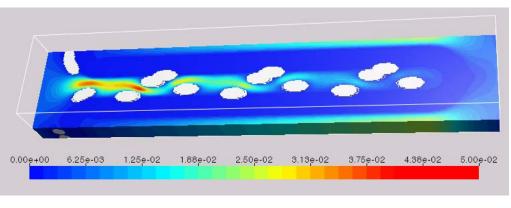
### Oil flow in pleats with support structure: velocity

- Velocity: 0.15 m/s
- Oil: density 850 kg/m³ viscosity 0.17 m²/s
- Same pleat count
- Different in- and outflow channel widths
- Grid resolution 40 μm
- 50 x 70 x 380 cells

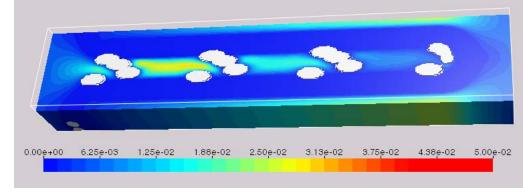


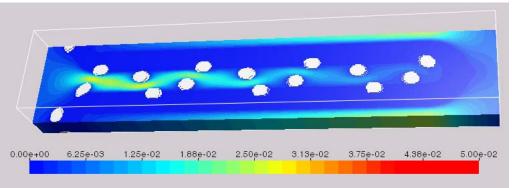
Narrow Channel



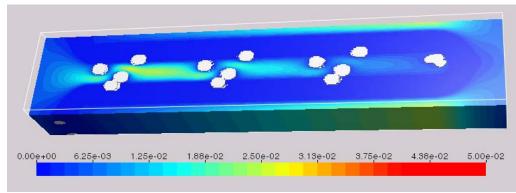


Thick Wire



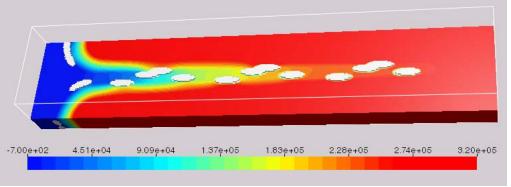


Thin Wire



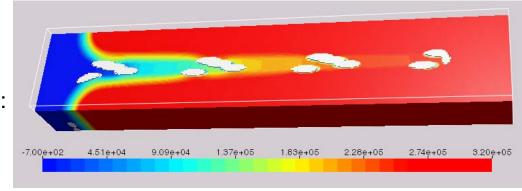
### Oil flow in pleats with support structure: pressure

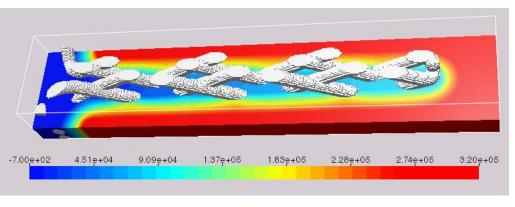
- Pressure in Pascal
- Oil: density 850 kg/m<sup>3</sup> viscosity 0.17 m<sup>2</sup>/s
- Same pleat count
- Different in- and outflow channel widths
- Grid resolution 40 μm
- 50 x 70 x 380 cells



Narrow Channel:

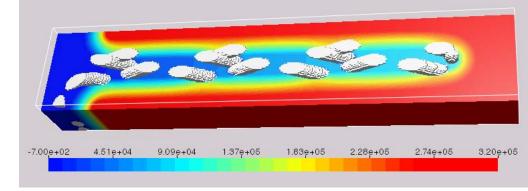
4 bar





Thick Wire:

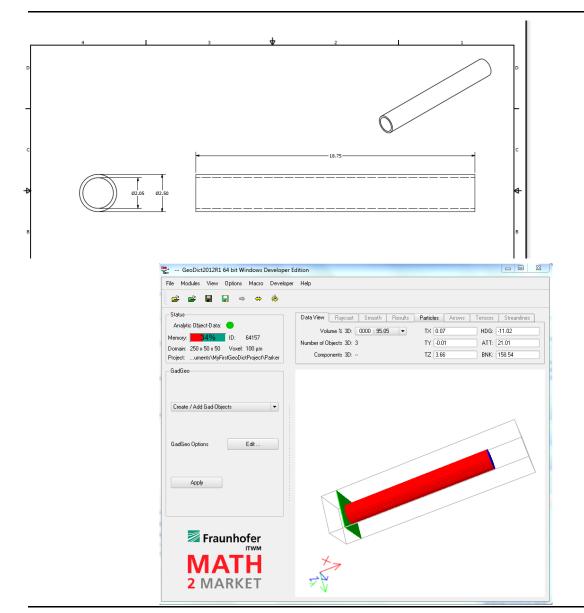
3.1 bar

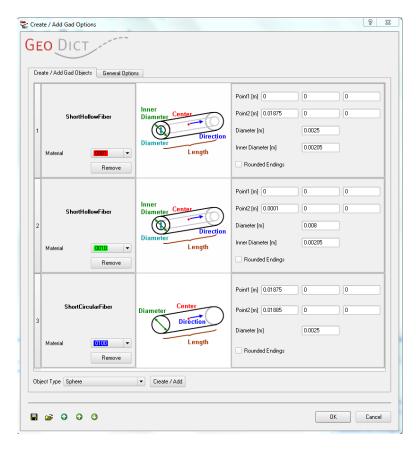


- A. Wiegmann, O. Iliev, and A. Schindelin, Computer Aided Engineering of Filter Materials and Pleated Filters, Global Guide of the Filtration and Separation Industry by E. von der Luehe. VDL Verlag, 2010, pp 191-198.
- B. Patent Argo-Hytos on twill support structure for hydraulic filters, 2009



### Pressure drop of Filter tube, Geometry



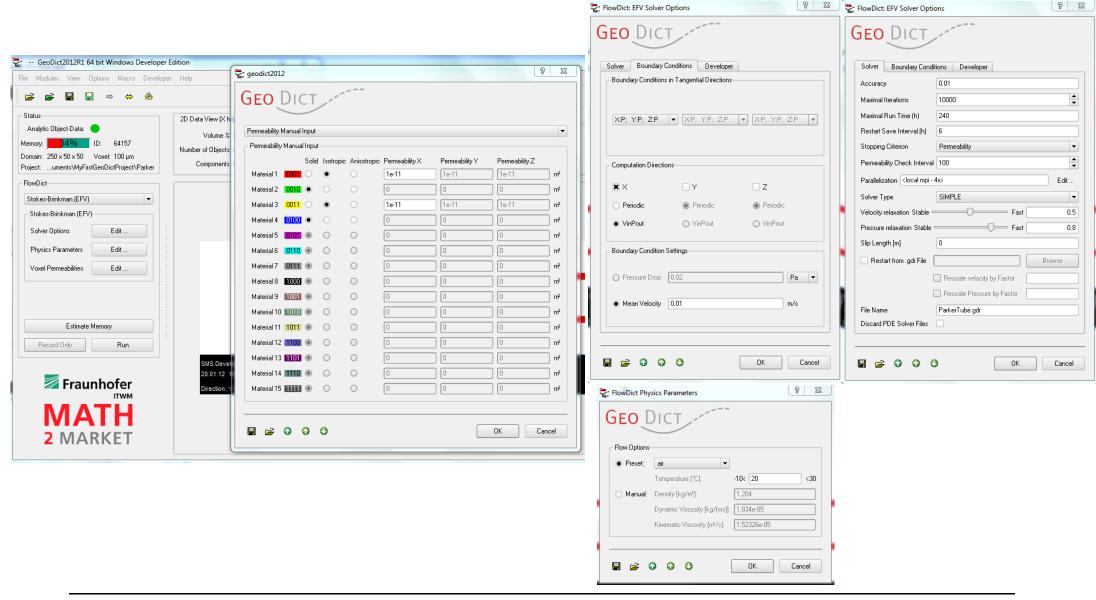




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### Pressure drop of Filter tube 1, parameters

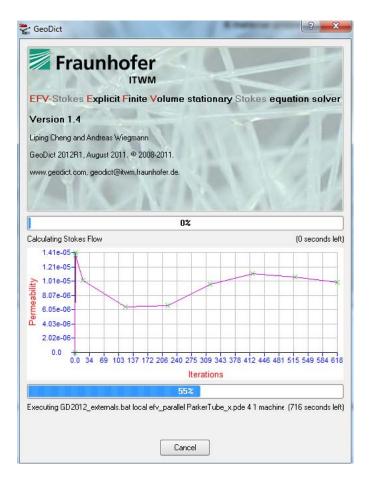


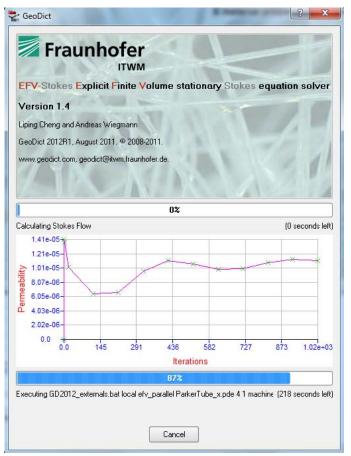


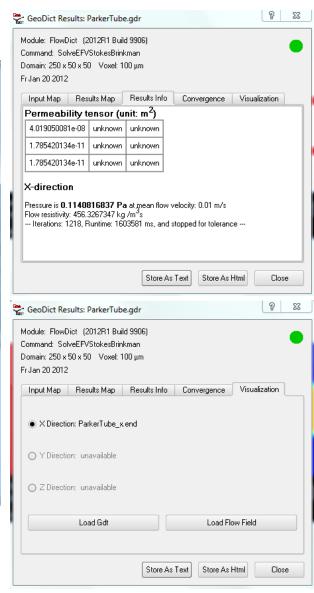
**Andreas Wiegmann** 

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### Pressure drop of Filter tube, solve





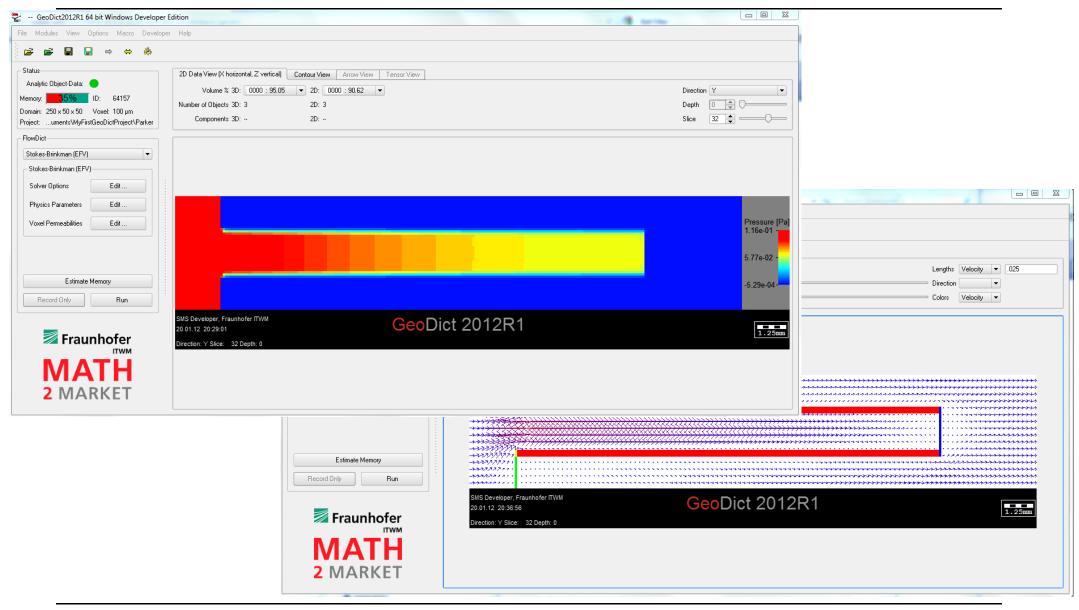




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### Pressure drop of Filter tube, results

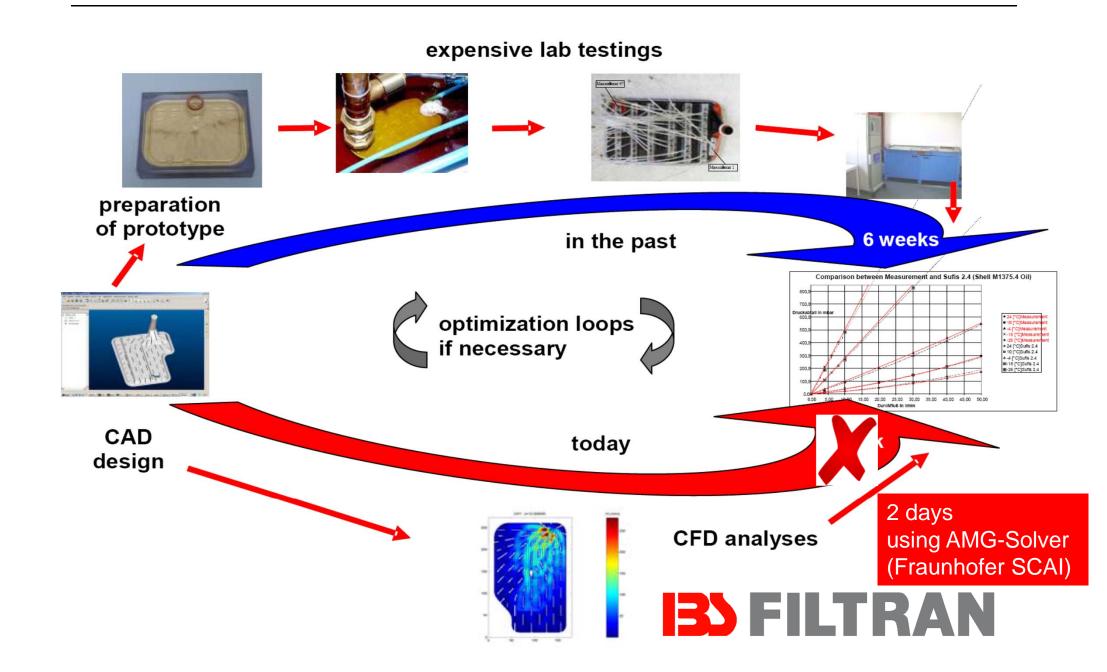




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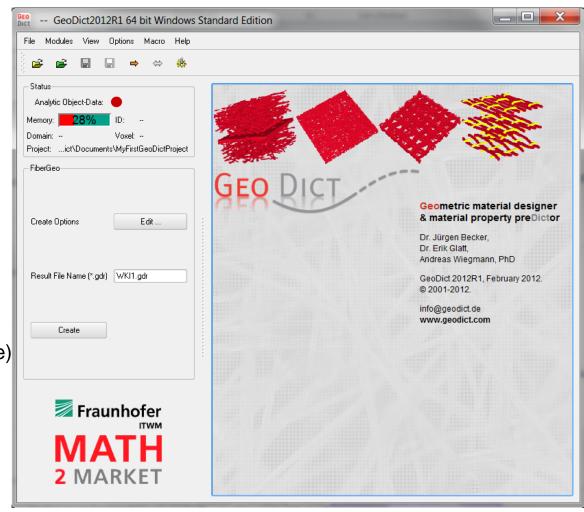


### Modules of the GeoDict Software for GAD and GAE of Materials

- FiberGeo, SinterGeo, WeaveGeo, GridGeo, PackGeo, PleatGeo, PaperGeo

(structure generators)

- ProcessGeo (3d image processing)
- LayerGeo (layered media)
- **ImportGeo** (e.g. tomographie, .stl)
- 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)
- AddiDict (advection diffusion adsorption)





**Andreas Wiegmann** 

WFC 11, Graz

### GeoDict contributors: 2001 - 2012

#### **GeoDict**

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#### **SatuDict**

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#### **FilterDict**

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#### RenderGeo

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### **PaperGeo**

Erik Glatt

### Conclusion: all issues and scales can be covered by simulation

- Filter media & pleat representation; solid particle representation
- Flow computation
- Particle tracking
- Collision & adhesion handling
- Solid & porous media update
  - e.g. cake formation
  - > e.g. particle re-entrainment & back wash
- Postprocessing as data and visualizations



### Outlook: aspects of all issues and scales still need to be addressed

- (1) Filter media representation:
  - Parameter identification for ceramics, cellular & meltblown models
  - Image denoising and limited resolution for tomography
- (2) Sheer domain sizes; parallel computing:
  - > Tomography data go towards 4000 x 4000 x 4000 cells
  - nano fibers require resolution of 20nm
  - Flow computations must be carried out with state-of-the-art algorithms on state-of-the-art computers
- (3) Flow computations
  - Slip modeling inconvenient on voxels
  - Fast flows are not stationary



### Outlook: aspects of all issues and scales still need to be addressed

### (4) Range of particle sizes usually requires Stokes-Brinkman

- Solvers converge slower
- Finding parameters is inconvenient (detailed work)
- Dropping the small particles leads to wrong cake resistivity

### (5) Cake formation

- Control of number of particles 2d/3d (overlap)
- Solver convergence for "stiffening" problem.

### (6) Particle adhesion and restitution forces

- Determination of 2 material-dependent parameters
  - > Sieving; Caught on first touch; Hamaker; Collision count; [Probability based]
- > Re-entrainment under changing flow conditions
  - pressure build-up; impulse cleaning



### **Challenges**

### **Inter-disciplinary nature**

- Process engineering
- Textile engineering
- > Software engineering
- > Chemistry
- > Physics
- Knowledge of testing equipment & validity
- Visualization
- High performance computing
- Numerical algorithms
- GUI-design
- **>** ...

### Continuity

- Software development needs are specific to filtration, hard to build into non-specific commercial CFD codes
- Software development needs are too large for a single customer project or single dissertation
- Filtration has little visibility for public funding agencies (compared to nuclear physics, energy, transportation and similar topics)

### **Despite the obstacles:**

Filtration and separation simulation is an irreversible trend in Academic and Industrial R&D



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Thank you for your kind attention

