# Analysis of Filter Media and Simulation of Filter Processes Based on $\mu$ CT Scans

Jürgen Becker, Cornelia Kronsbein, Liping Cheng Rolf Westerteiger, Andreas Wiegmann



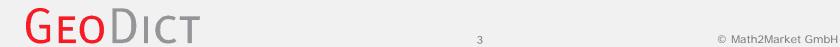
#### Who is Math2Market?

- Math2Market GmbH was founded 2011 in Kaiserslautern.
- Spin-off of Fraunhofer Institute for Industrial Mathematics, ITWM.
- Today: 13 full-time, 6 part-time employees, turnover >2 Mio € / year
- Our product: GeoDict software
  - Sales
  - Development and Customization
  - Consulting



GeoDict is a digital material laboratory

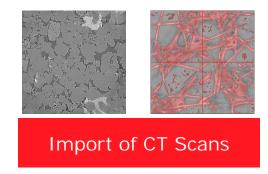
 Computer Aided Material Engineering and Design by providing Geometric models and preDictions of material properties.





### GeoDict is a digital material laboratory

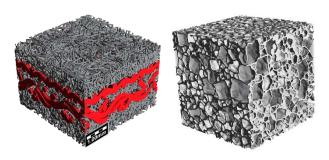
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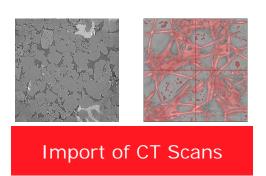
Create 3D Models of Micro-structures

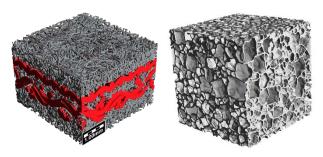




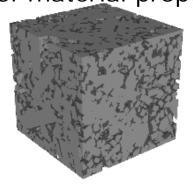
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Create 3D Models of Micro-structures



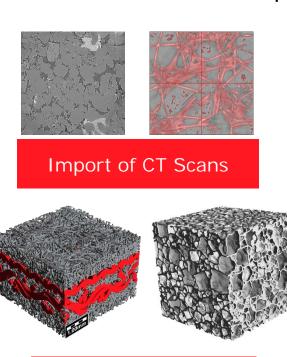
Geometric Analysis of 3D Structures



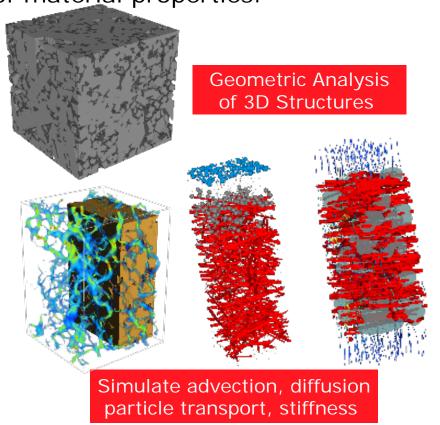


### GeoDict is a digital material laboratory

 Computer Aided Material Engineering and Design by providing Geometric models and preDictions of material properties.



Create 3D Models of Micro-structures





### How can simulations help to improve a filter?

Step 1: Understand the existing filter material

- CT Scan
- Simulations on CT Scan

Step 2: Create a model of the existing material

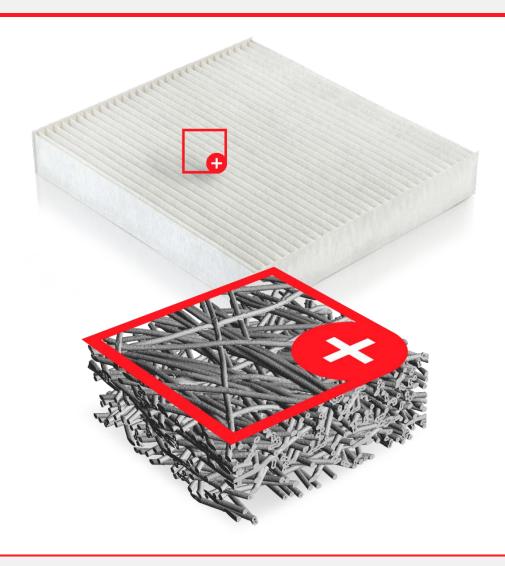
- Analyze CT Scan
- Create structure model
- Simulations on Structure model

Step 3: Modify the structure model





### Sample Structure: Cabin Air Filter



- Commercially available filter
- CT scan by service provider RJL Micro&Analytic



### Step 1:

# Understand the existing filter material

**GEODICT** 

### **Determine Flow Rate or Pressure Drop**

### Stationary Navier-Stokes flow:

$$-\mu \Delta \vec{u} + \rho (\vec{u} \cdot \nabla) \vec{u} + \nabla p = 0$$
$$\nabla \cdot \vec{u} = 0$$

$$\vec{u} = 0$$
 on  $\Gamma$   
 $P_{in} = P_{out} + const$ 

 $\vec{u}$ : velocity

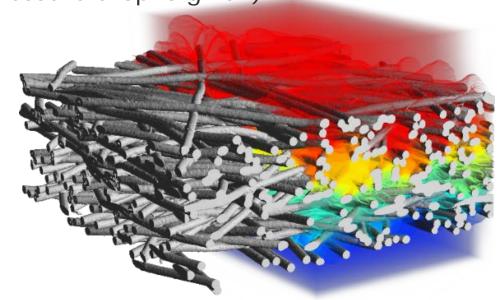
p: pressure

 $\mu$ : dynamic viscosity

 $\rho$ : fluid density

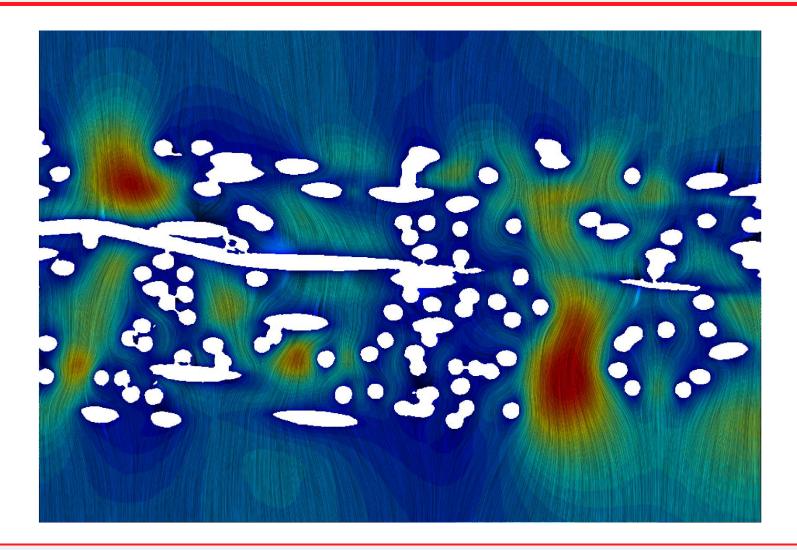
(momentum balance) (mass conservation)

(no-slip on surface)(pressure drop is given)





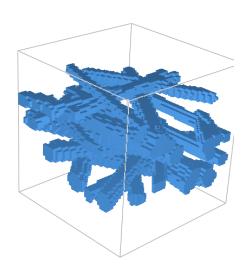
### Result for Clean Cabin Air Filter Media (Flat Sheet): Pressure drop of 7.35 Pa at 0.1 m/s mean velocity







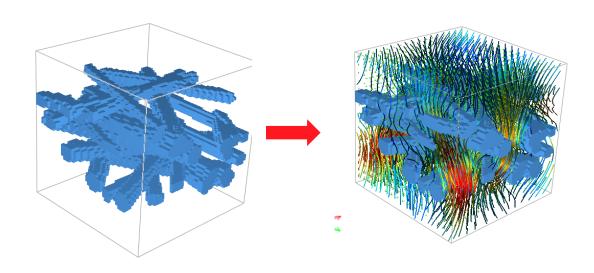
1. Filter media model







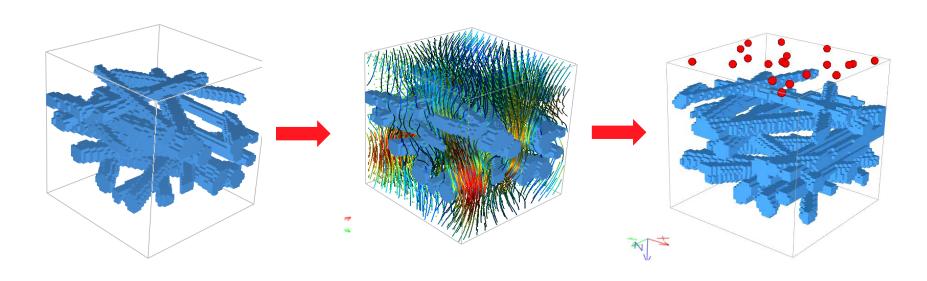
- 1. Filter media model
- 2. Determine flow field







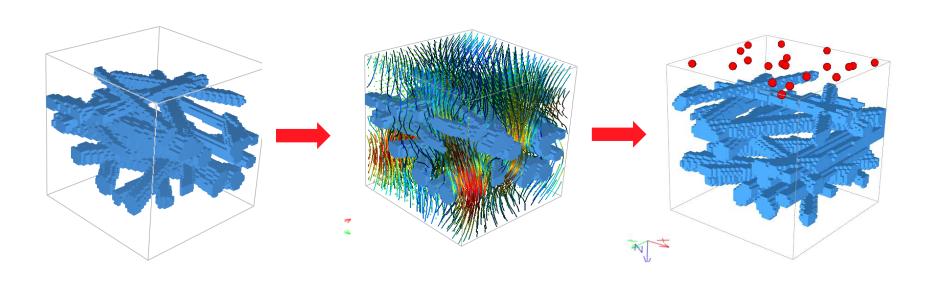
- 1. Filter media model
- 2. Determine flow field
- 3. Track particles (filtered or not?)





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- 1. Filter media model
- 2. Determine flow field
- 3. Track particles (filtered or not?)
- 4. Result: percentage of filtered particles of each size







### Movement of Particles in a Flow Field: Balance of Forces Equation

Impulse

Stokes Drag

Electrostatic Force

$$m\frac{d\vec{v}}{dt} = 6\pi\mu \frac{R}{C_c} \left( \vec{u} - \vec{v} + \sqrt{2D} \frac{d\vec{W}(t)}{dt} \right) + Q\vec{E}$$

 $\vec{v}$ : particle velocity [m/s]  $\mu$ : dynamic viscosity [kg/m·s]

 $\overrightarrow{u}$ : fluid velocity [m/s] Q: particle charge [C] R: particle radius [m] E: electric field [V/m]  $C_C$ : Cunningham correction D: Diffusivity [m²/s]

 $d\vec{W}$ : 3D Wiener process





### Movement of Particles in a Flow Field: Balance of Forces Equation

Impulse

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Electrostatic Force

$$m\frac{d\vec{v}}{dt} = 6\pi\mu \left(\frac{R}{C_c}\right) \left(\vec{u} - \vec{v} + \sqrt{2D}\frac{d\vec{W}(t)}{dt}\right) + Q\vec{E}$$

Cunningham Corrected Particle Radius

 $\bar{\sigma}$  : particle velocity [m/s]  $\mu$  : dynamic viscosity [kg/m·s]

 $\overrightarrow{u}$ : fluid velocity [m/s] Q: particle charge [C] R: particle radius [m] E: electric field [V/m]  $C_c$ : Cunningham correction D\_\_\_: Diffusivity [m²/s]

: particle mass [kg]  $d\overrightarrow{W}$  : 3D Wiener process





### Movement of Particles in a Flow Field: Balance of Forces Equation

**Impulse** 

Stokes Drag

Electrostatic Force

$$m\frac{d\vec{v}}{dt} = 6\pi\mu \left(\frac{R}{C_c}\right) \left(\vec{u} - \vec{v} + \sqrt{2D}\frac{d\vec{W}(t)}{dt}\right) + Q\vec{E}$$

**Brownian Motion** 

Cunningham Corrected Particle Radius

: particle velocity [m/s]  $\mu$  : dynamic viscosity [kg/m·s]

 $\overrightarrow{u}$ : fluid velocity [m/s] Q: particle charge [C] R: particle radius [m] E: electric field [V/m]  $C_c$ : Cunningham correction D: Diffusivity [m²/s]

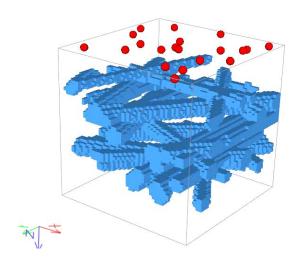
i: particle mass [kg]  $d\overline{W}$ : 3D Wiener process

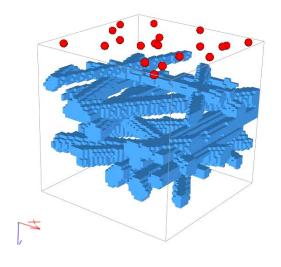


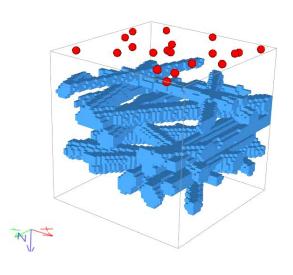


### **Particle Adhesion Models**

What happens when a particle touches a fiber?







Caught on first touch

Compare Kinetic and Adhesive Forces

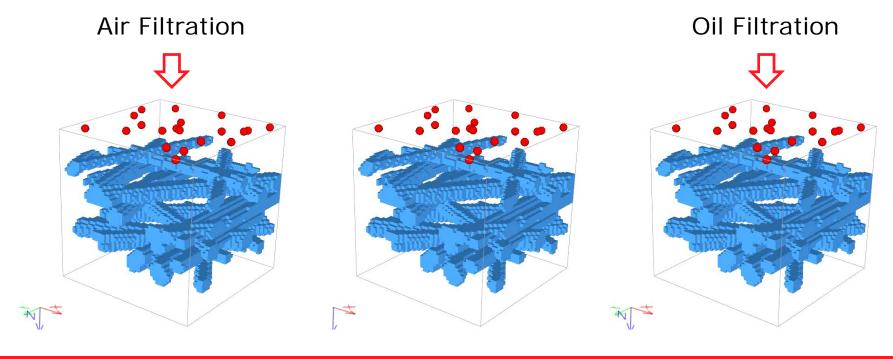
Sieving





#### **Particle Adhesion Models**

What happens when a particle touches a fiber?



Caught on first touch

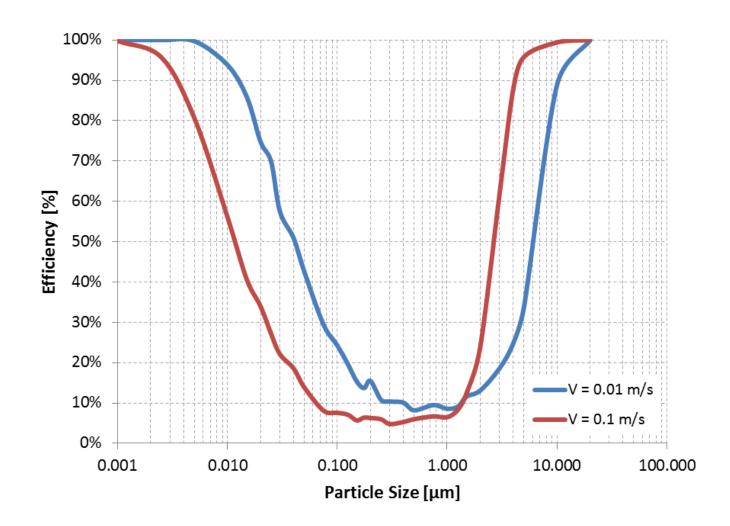
Compare Kinetic and Adhesive Forces

Sieving





### Cabin Air Filter Fractional Efficiency (w/o Electrostatic Attraction)



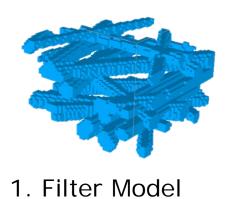


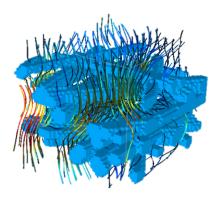




1. Filter Model

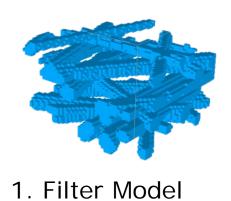


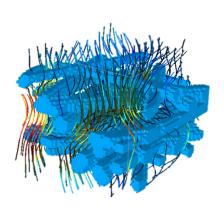




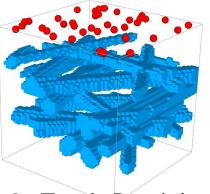
2. Flow Field



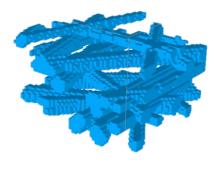




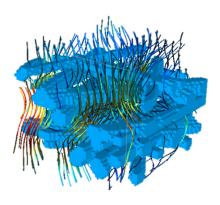




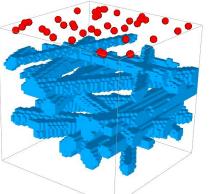
3. Track Particles



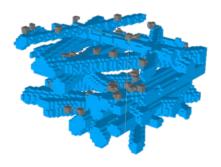




2. Flow Field



3. Track Particles



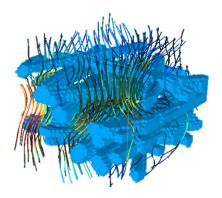
4. Deposit Particles



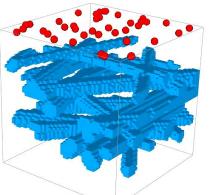




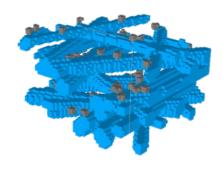
1. Filter Model



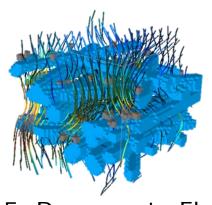
2. Flow Field



3. Track Particles



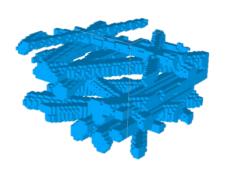
4. Deposit Particles



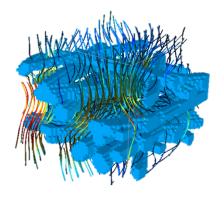
5. Recompute Flow



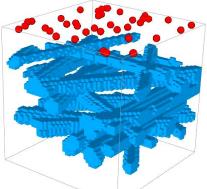




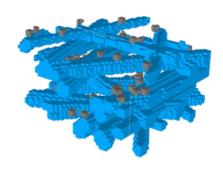
1. Filter Model



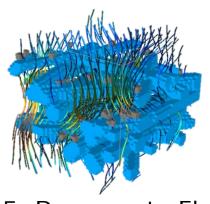
2. Flow Field



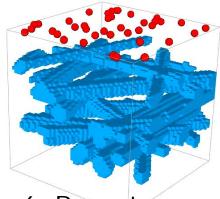
3. Track Particles



4. Deposit Particles



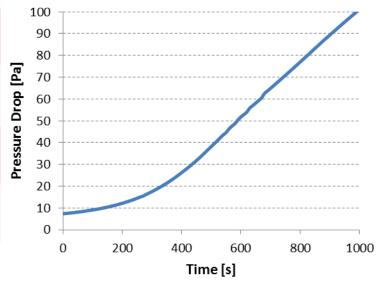
5. Recompute Flow

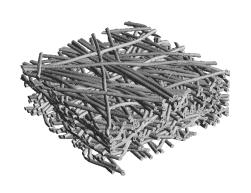


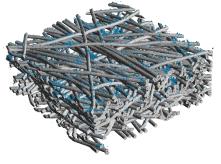
6. Repeat ...

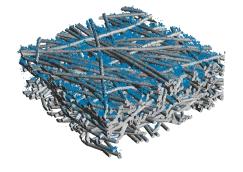
### Cabin Air Filter - Life Time Simulation

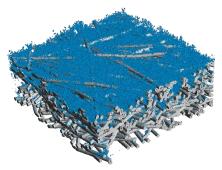
Initial pressure drop	7 Pa
Pressure drop after 1000s	101 Pa
Total deposited dust after 1000s	93 g/m²
Total filter efficiency	93% (weigth)











### Step 2:

# Create a model of the existing material

### Creating a filter model

Why create a filter model?

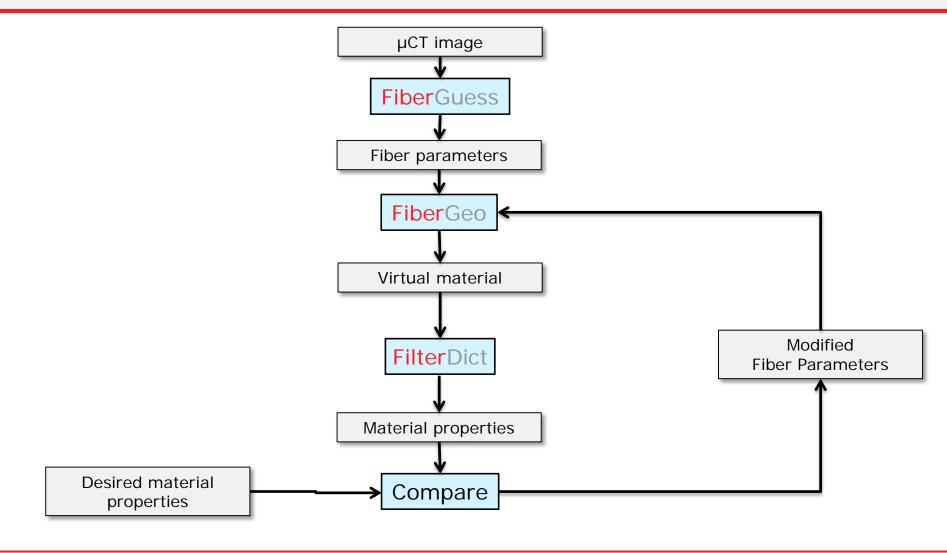
- A CT scan is an image!
  - It can only be changed voxel-by-voxel.
  - It is not possible to remove a fiber
  - It is not possible to change diameters or shape



=> We need to "understand" the image!



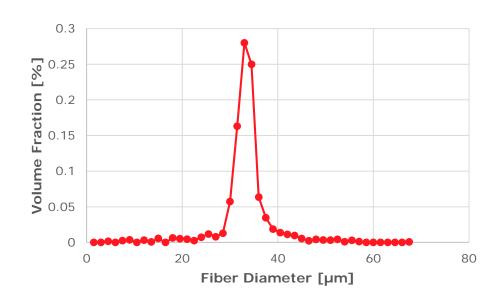
### **GeoDict Workflow**





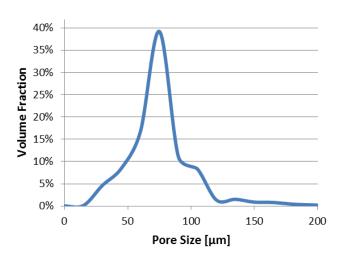


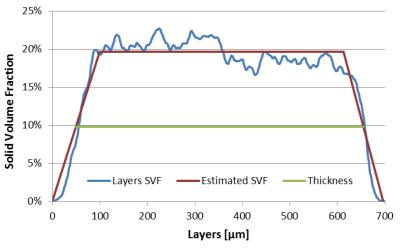
### Geometric Analysis I: Media Thickness, Porosity, Pore Sizes, Fiber Diameter



Average fiber diameter: 33.6 µm

Porosity: 80.4 % Thickness: 605 µm









### Geometric Analysis II: Fiber Orientation

### How is fiber orientation measured?







0.33	0	0
0	0.33	0
0	0	0.33

0.5	0	0
0	0.5	0
0	0	0

0.9	0	0
0	0.05	0
0	0	0.05

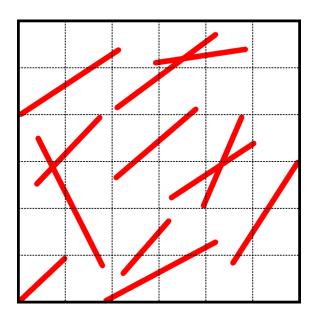
Orientation tensor describes probability of direction component.

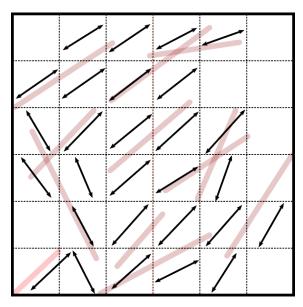


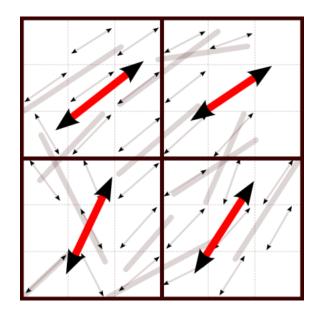


### Orientation analysis – Method 1: Principal Component Analysis (PCA)

- 1. PCA subdivides domain into windows of given size
  - Automatic window size estimates about 2x fiber diameter
- 2. For each window, finds fiber fragments and analyzes direction tensor
- 3. For each block, averages direction tensors over windows in that block







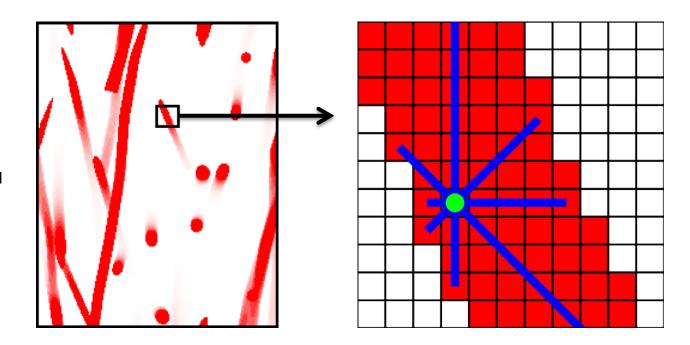




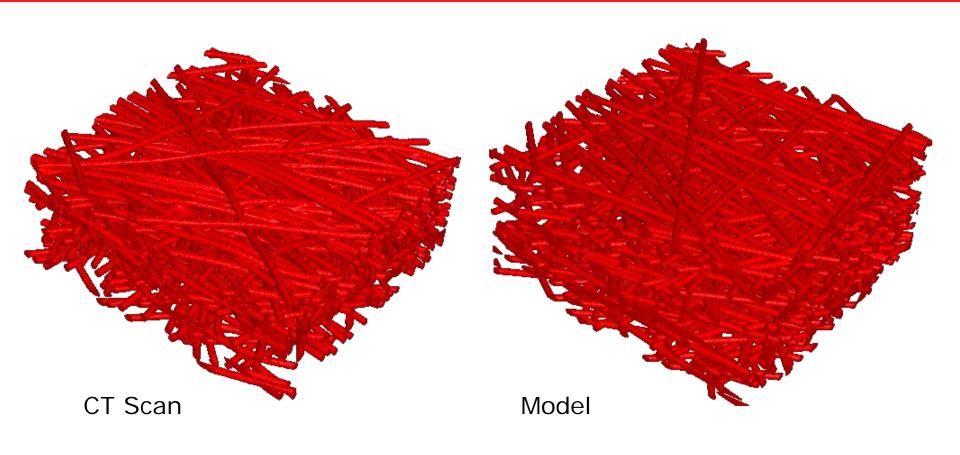
### Orientation analysis – Method 2: Star Length Distribution (SLD)

- For each voxel, SLD analyzes chord lengths through it for fixed set of directions
- The relative length of the chords gives per-voxel orientation tensor
- The tensors are averaged over all voxels in the block (similar to PCA)

Smit, Th H., E. Schneider, and A. Odgaard. "Star length distribution: a volume-based concept for the characterization of structural anisotropy." *Journal of microscopy* 191 (1998): 249-257.



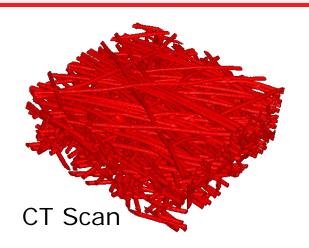
### **Comparison of CT Scan and Model**

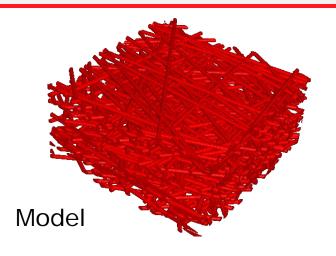






#### Comparison of CT Scan and Model





Input parameters found by CT-Scan analysis:

- media thickness
- porosity
- fiber diameter
- in-plane anisotropy

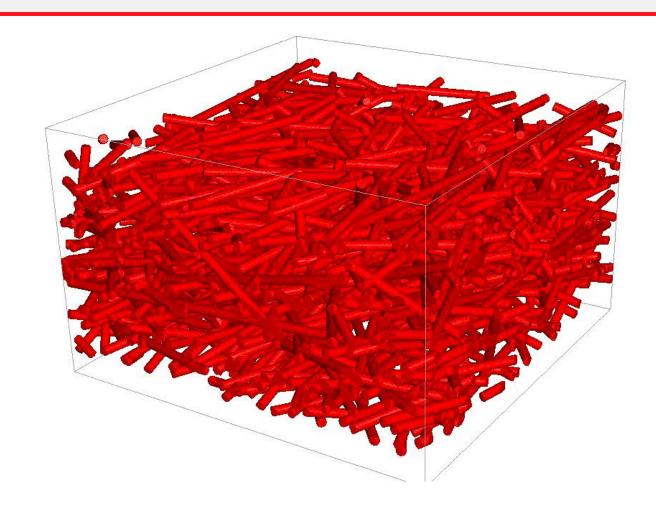
Input parameters taken from assumptions:

- straight fibers
- fibers oriented in-plane
- homogeneous distribution
- circular cross section



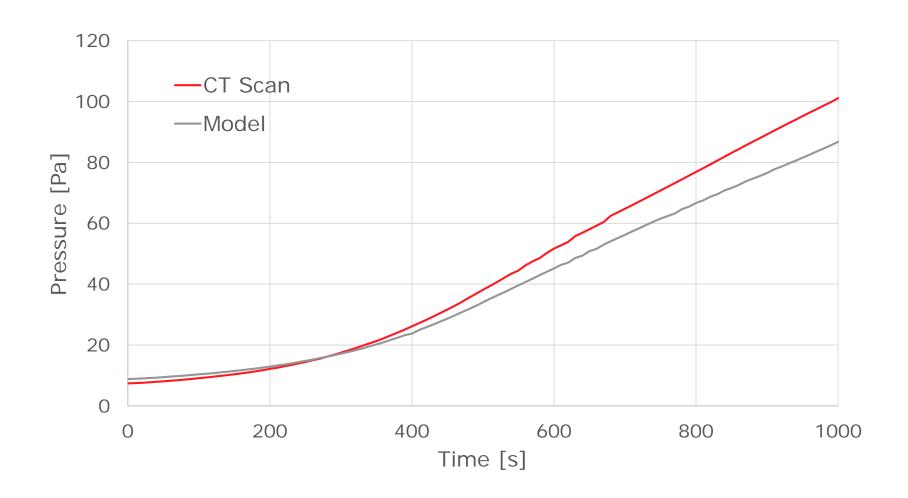


#### Filter Life Time





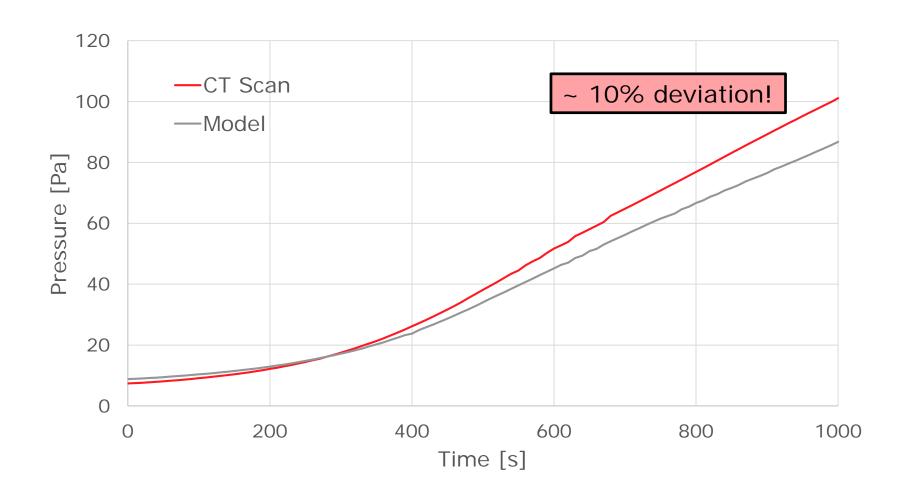
# Filter Life Time Simulation Comparison CT Scan vs Model







# Filter Life Time Simulation Comparison CT Scan vs Model





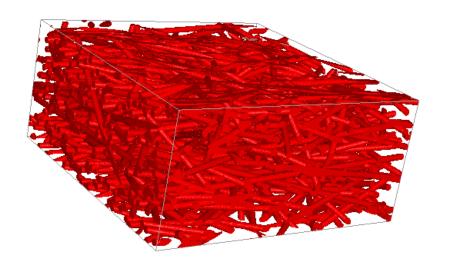


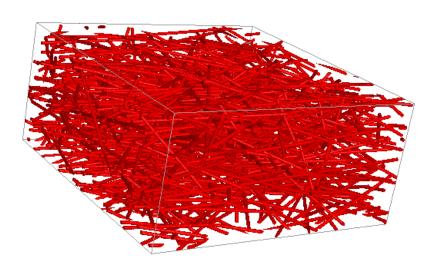
# Step 3:

# Modify the structure model



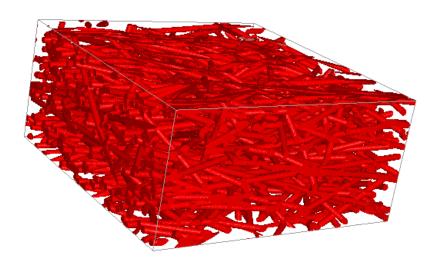
#### 1. Fiber diameter

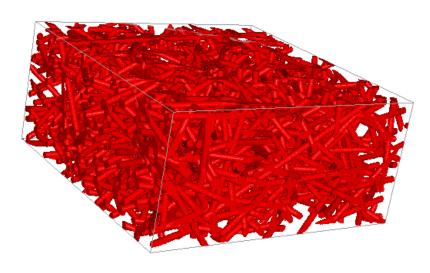






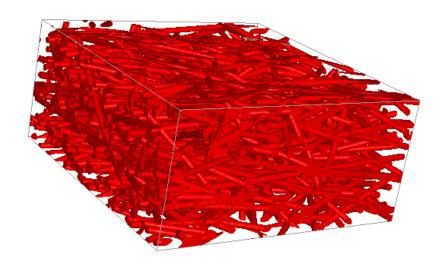
#### 2. Fiber orientation

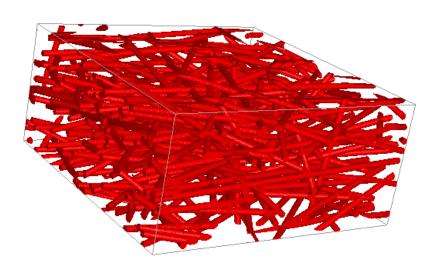






### 3. Porosity







- 4. Fiber cross sectional shape
- 5. Curved fibers instead of straight fibers
- 6. Density gradient in through-plane direction
- Media thickness
- 8. .....

#### **Summary and Outlook**

#### Overall goal of this work:

get from CT-Scan to Model structure automatically

#### **Current state:**

works for straight fibers with circular cross section

Work in progress: curved fibers with circular cross section

- Determine curvature distribution from CT
- Realize given curvature distribution in a model





## Thank You!

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