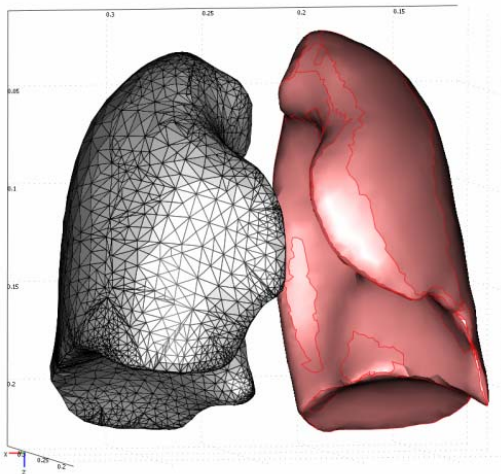




Presented at the COMSOL Conference 2008 Hannover

Modeling of Respiratory Lung Motion as a Contact Problem of Elasticity Theory



R. Werner, J. Ehrhardt, H. Handels

Department of Medical Informatics,
University Medical Center Hamburg-Eppendorf,
Hamburg, Germany

Motivation / Clinical Background

- Breathing-induced motion of lung tumors and organs is a significant source of error in radiotherapy of lung tumors
- Enlarging safety margins increases radiation dose delivered to healthy tissues



Motivation / Clinical Background

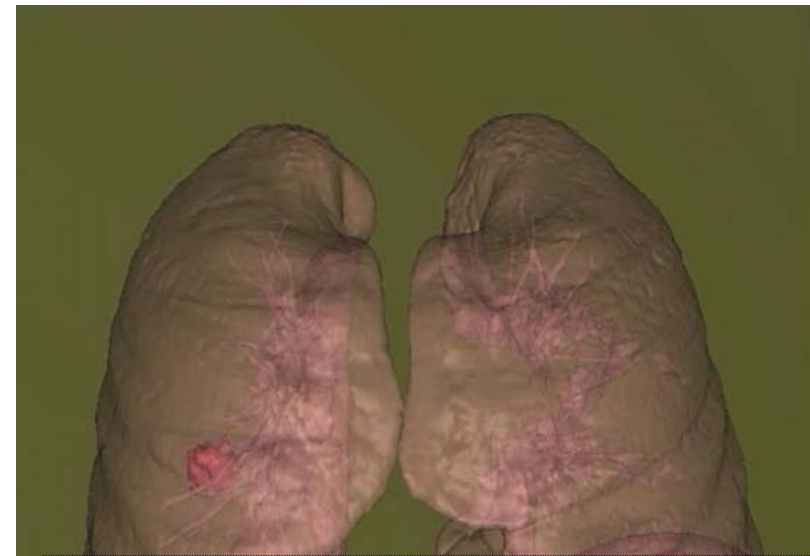
- Breathing-induced motion of lung tumors and organs is a significant source of error in radiotherapy of lung tumors
- Enlarging safety margins increases radiation dose delivered to healthy tissues
- **Searched for:**
Methods to compensate for respiratory motion during radiation delivery



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- **Searched for:**
Methods to compensate for respiratory motion during radiation delivery



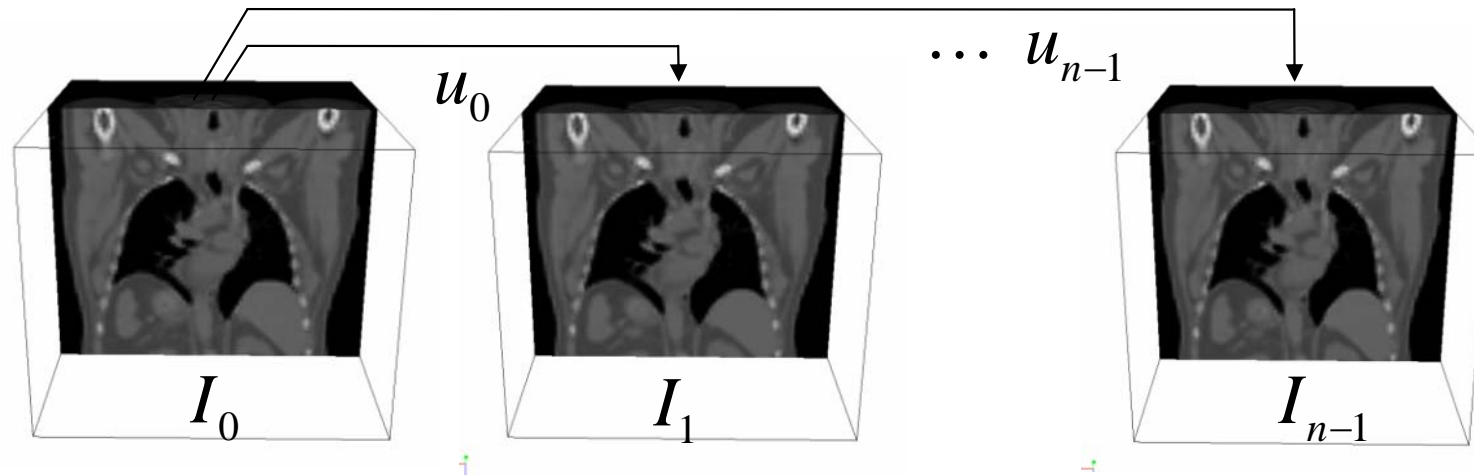
Requires detailed knowledge about breathing dynamics

⇒ **Motion analysis**

⇒ **Motion modeling**

Motivation / Clinical Background

Key aspect in modeling and motion analysis:
Estimation of motion fields in 4D (=3D+t) Data

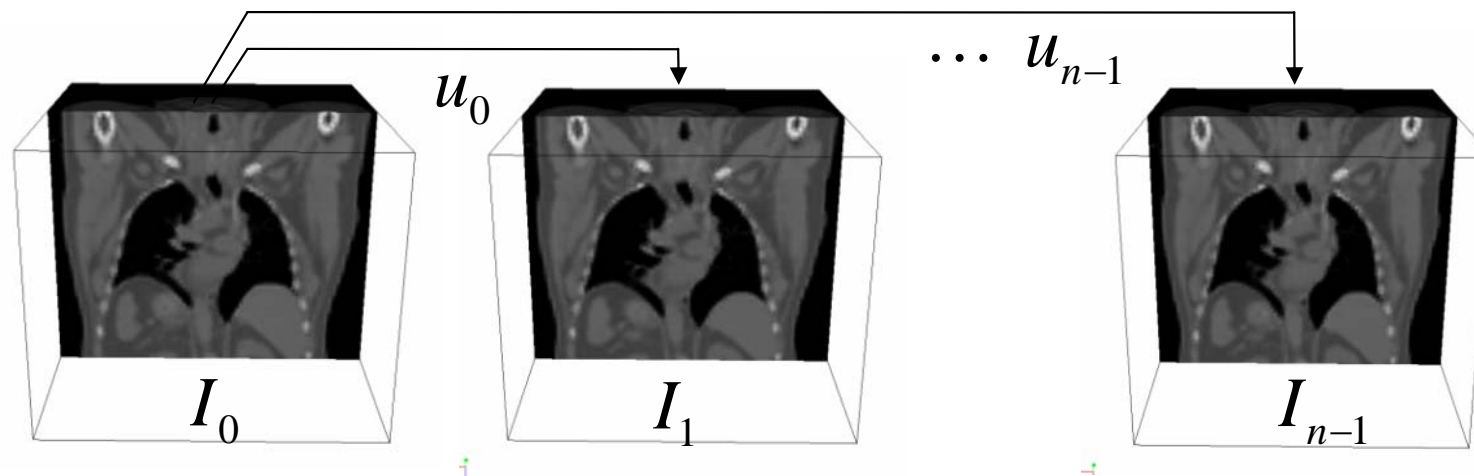


$I_i \subset \mathbb{R}^3$ image data at different breathing phases

$u_i : I_i \rightarrow I_{i+1}$ motion field estimators

Motivation / Clinical Background

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$I_i \subset R^3$ image data at different breathing phases

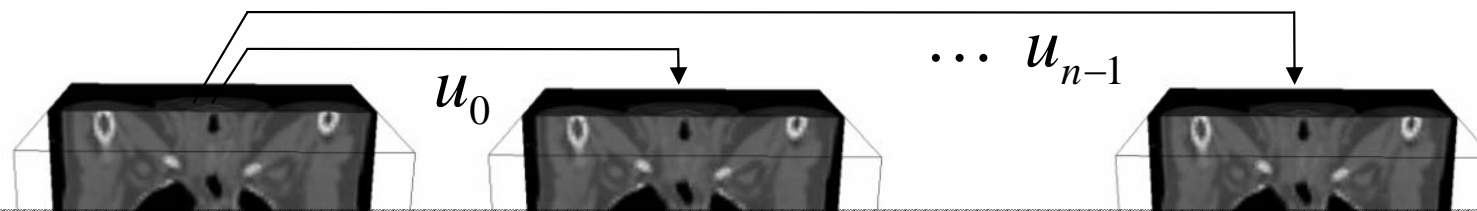
$u_i : I_i \rightarrow I_{i+1}$ motion field estimators

- Application 1: to quantify respiratory motion (Werner et al., Meth Inform Med 2007)
- Application 2: dose accumulation (Keall et al., Med Phys 33, 2007)

Motivation / Clinical Background

Key aspect in modeling and motion analysis:

Estimation of motion fields in 4D (=3D+t) Data



How to integrate (a-priori) knowledge about breathing anatomy and physiology into the modeling process?

- Application 1: to quantify respiratory motion (Werner et al., Meth Inform Med 2007)
- Application 2: dose accumulation (Keall et al., Med Phys 33, 2007)

Methods: Modeling Approach

Aspect to model: Process of lung ventilation

Contraction of breathing muscles
(diaphragm, intercostals)



Expansion of the thoracic cavity



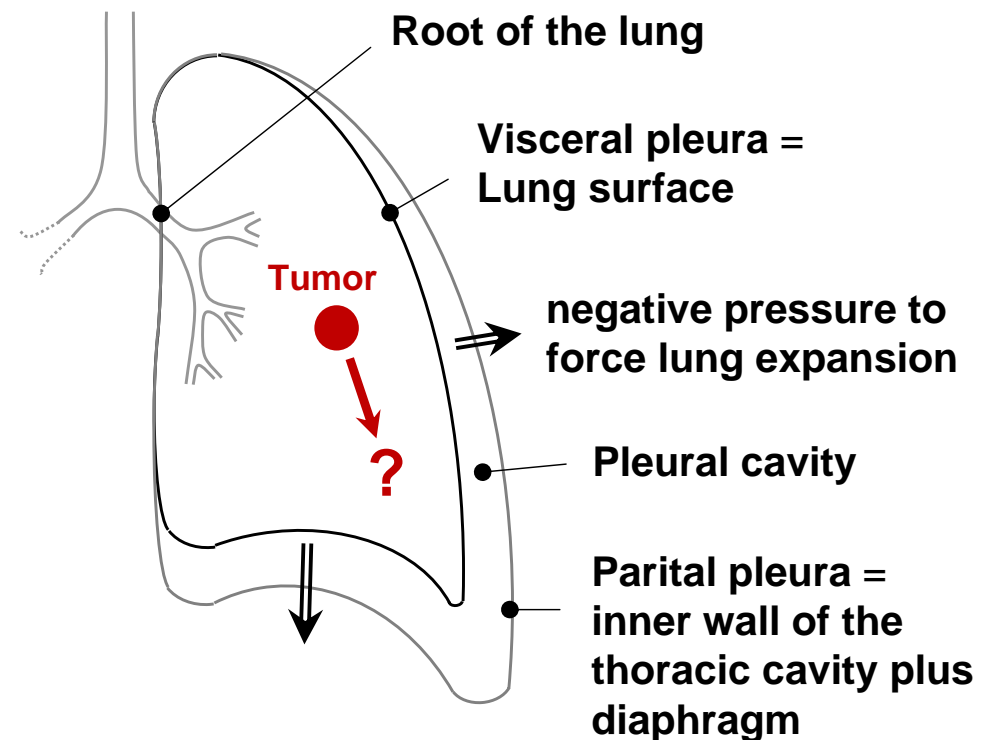
Intrapleural pressure increases



Pressure states a surface force,
applied to the lung surface



Lung expands, following the
expansion of the thoracic cavity



Methods: Modeling Approach

Modeling idea: Lung ventilation as a contact problem

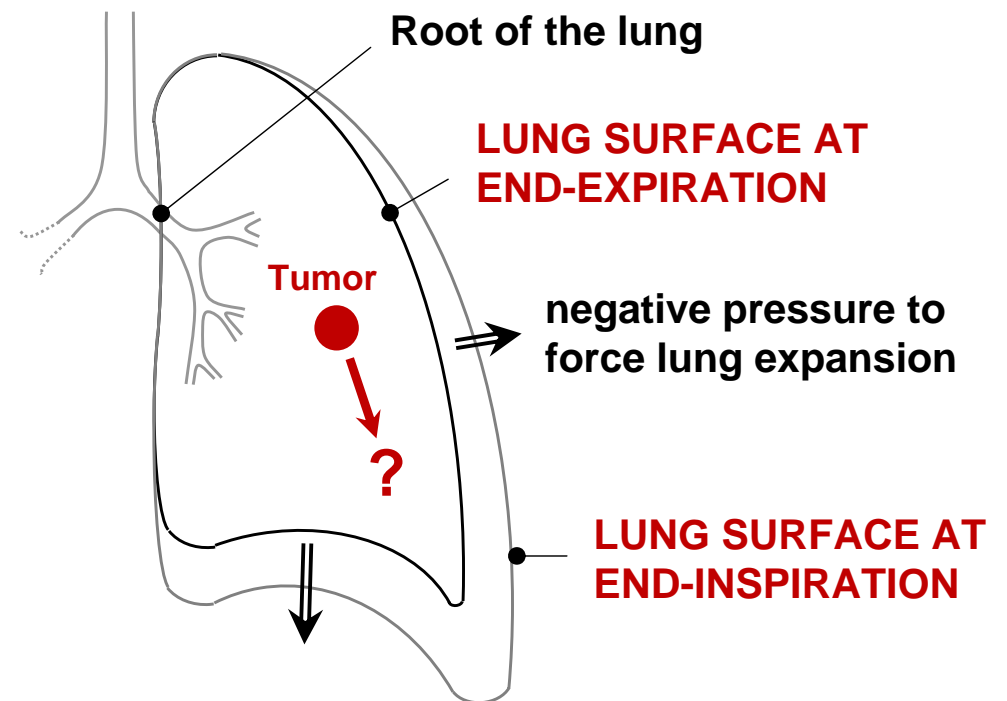
(Zhang et al., Medical Physics 31, 2004; Sarrut et al., IEEE Transactions on Medical Imaging 26, 2007)

Starting Point:

- Lung geometry at end-expiration (EE geometry)
- Lung geometry at end-inspiration (EI geometry)

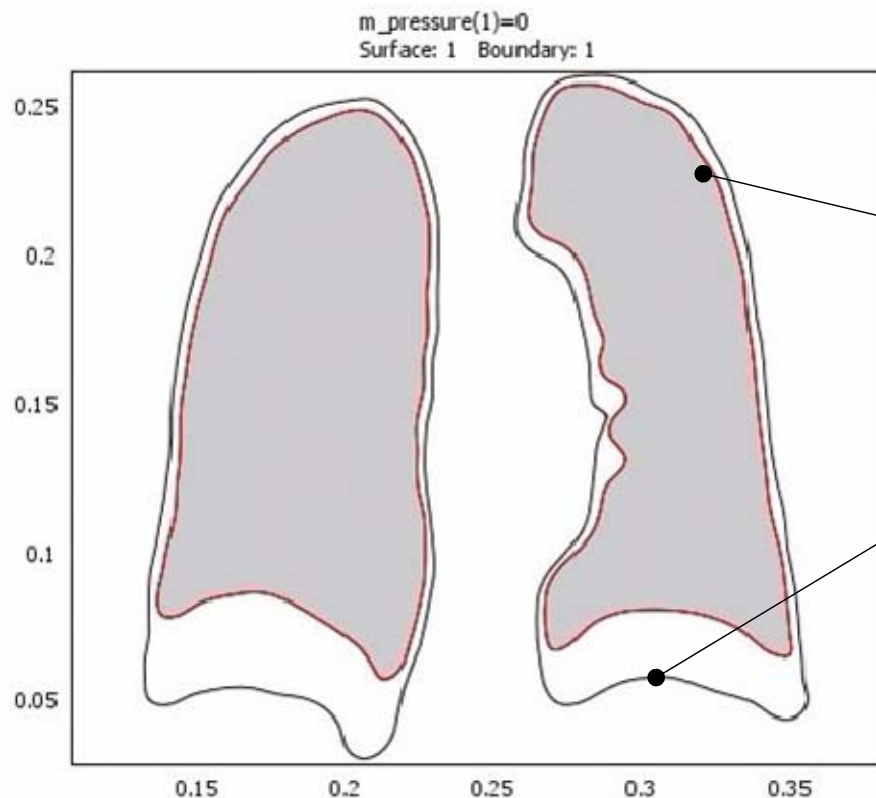
Modeling Process:

- Apply pressure to expand EE geometry
- Increase the pressure until EE and EI geometries nearly match
- Searched for: Displacement field for the deformed state



Methods: Modeling Approach

Modeling idea: Lung ventilation as a contact problem



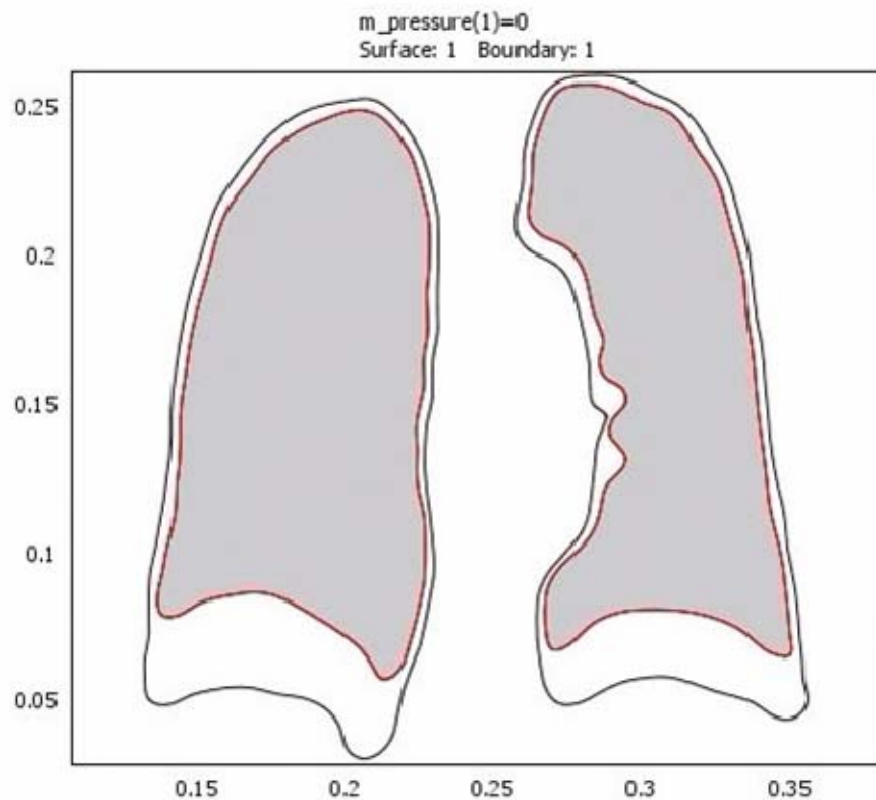
Lung boundary at end expiration
(red: deformed boundary)

Lung boundary at end inspiration
(= limiting boundary)

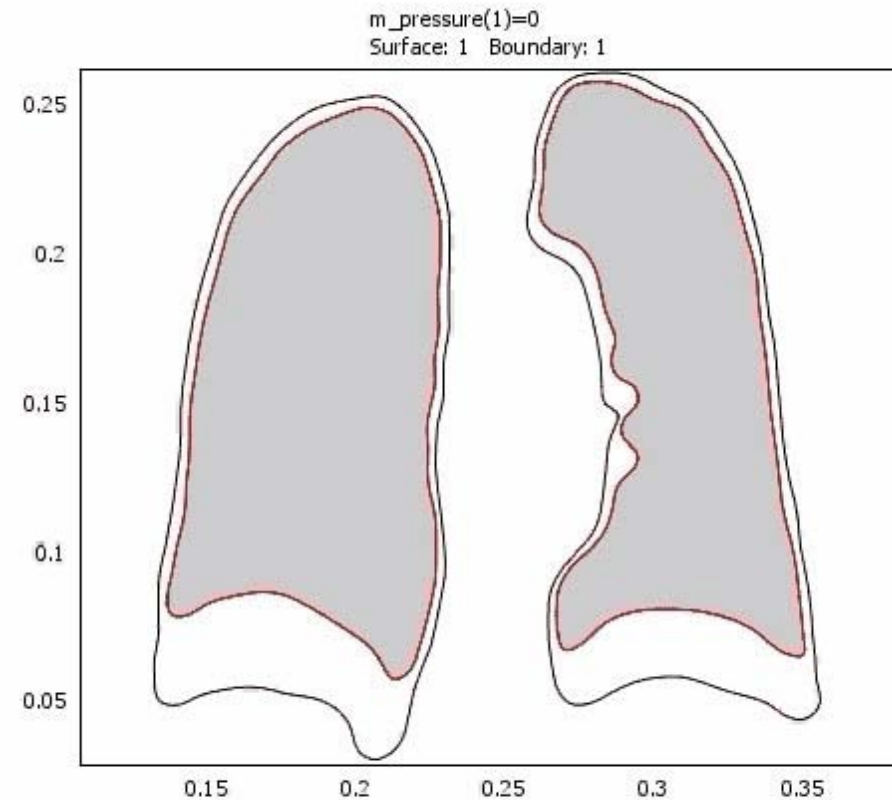
Initial situation

Methods: Modeling Approach

Modeling idea: Lung ventilation as a contact problem



Initial situation



Modeling process

Methods: Modeling Approach

Modeling idea: Lung ventilation as a contact problem

- Searched for: $u : R^3 \rightarrow R^3$
- Equilibrium: $\nabla \cdot \sigma = 0$ with $\sigma = \frac{1}{\det F} F S F^T$

σ : Cauchy stress tensor

S : 2. Piola-Kirchhoff stress tensor

$F = \nabla u + I$: Deformation gradient

- Constitutive equation (generalized Hook's law):

$$S = C(E, \nu) \varepsilon \quad \text{with} \quad \varepsilon = \frac{1}{2} (\nabla u + \nabla u^T + \nabla u^T \nabla u)$$

S : 2. Piola-Kirchhoff stress tensor

ε : Green-Lagrange strain tensor

C : elasticity tensor

E : Young's modulus

ν : Poisson's ratio

Methods: Modeling Approach

Modeling idea: Lung ventilation as a contact problem

- Dirichlet BC's:

$u = 0$ for the limiting geometry and
at the root of the lung

- von Neumann BC's:

$$\sigma n = p_{\text{int}} n + p_{\text{contact}} n$$

p_{int} : intrapleural pressure

n : surface normal

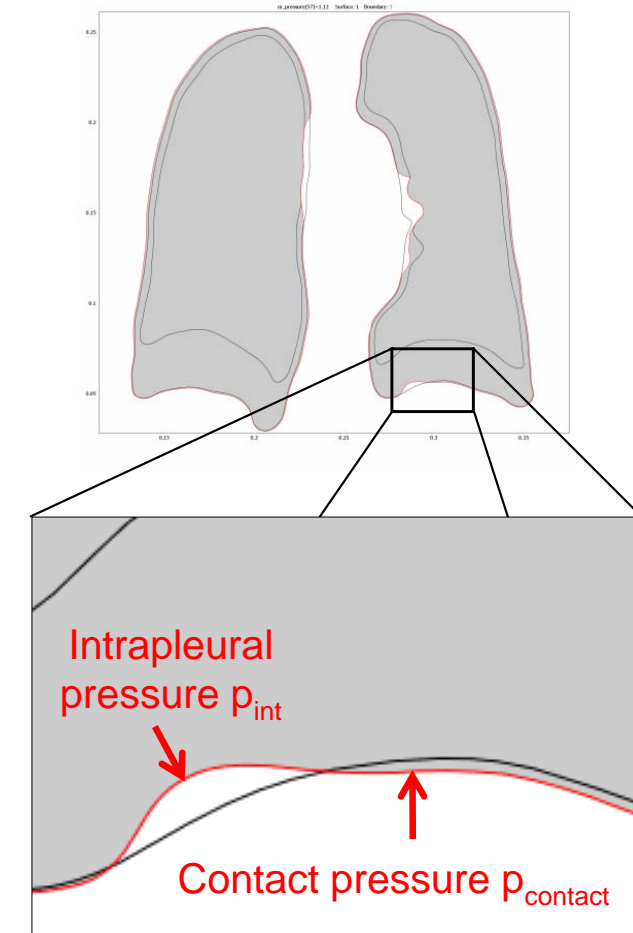
p_{contact} : contact pressure

- Signorini conditions:

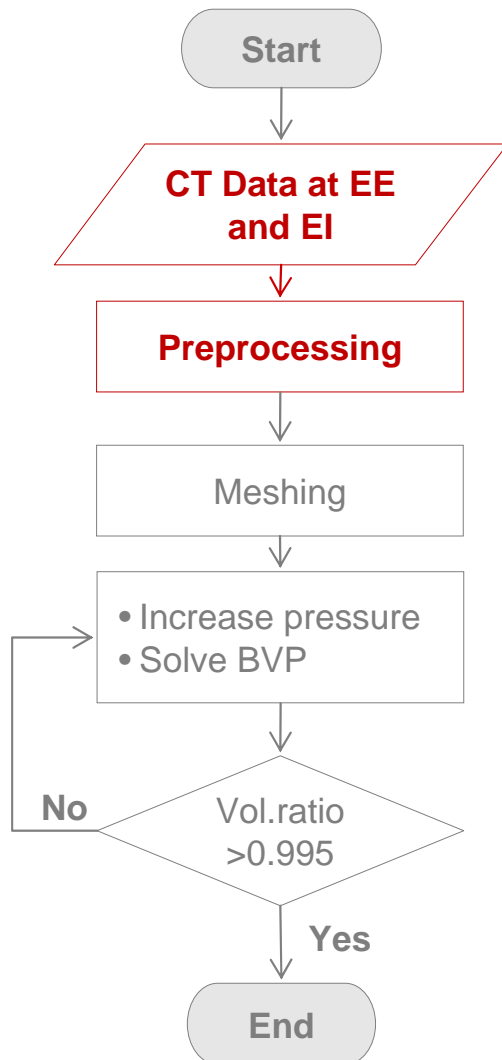
$$g \geq 0 \wedge p_{\text{contact}} \leq 0 \wedge p_{\text{contact}} \cdot g = 0$$

g : gap between EI and deformed EE geometries

Contact conditions



Methods: Implementation



- **Data base: 4D CT data**

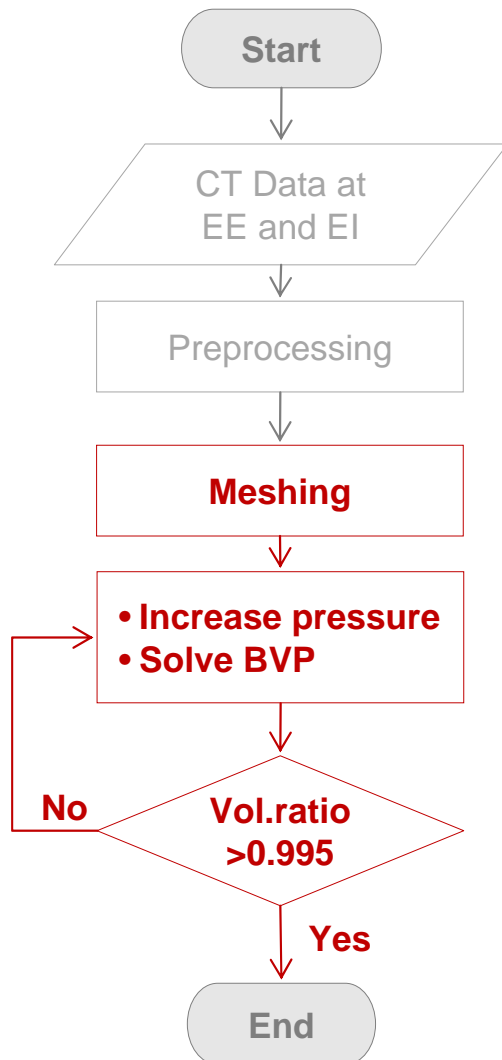
(Ehrhardt, Werner et al., Medical Physics 34, 2007)

- 12 Lung tumor patients
 - » 6 data sets with small tumors ($\emptyset < 3$ cm)
 - » 3 with “middle sized” tumors ($3 \text{ cm} < \emptyset < 5$ cm)
 - » 3 with big tumors ($\emptyset > 5$ cm)
- Spatial resolution: 1.0 x 1.0 x 1.5 mm
- 14 breathing phases each patient

- **Preprocessing:**

- Lung segmentation at EE and EI
- Generation of lung surface models (Marching Cubes, Laplace smoothing)
- Import of surface models to COMSOL via STL

Methods: Implementation



- **Meshing:**

- Tetrahedral meshes, by COMSOL mesher

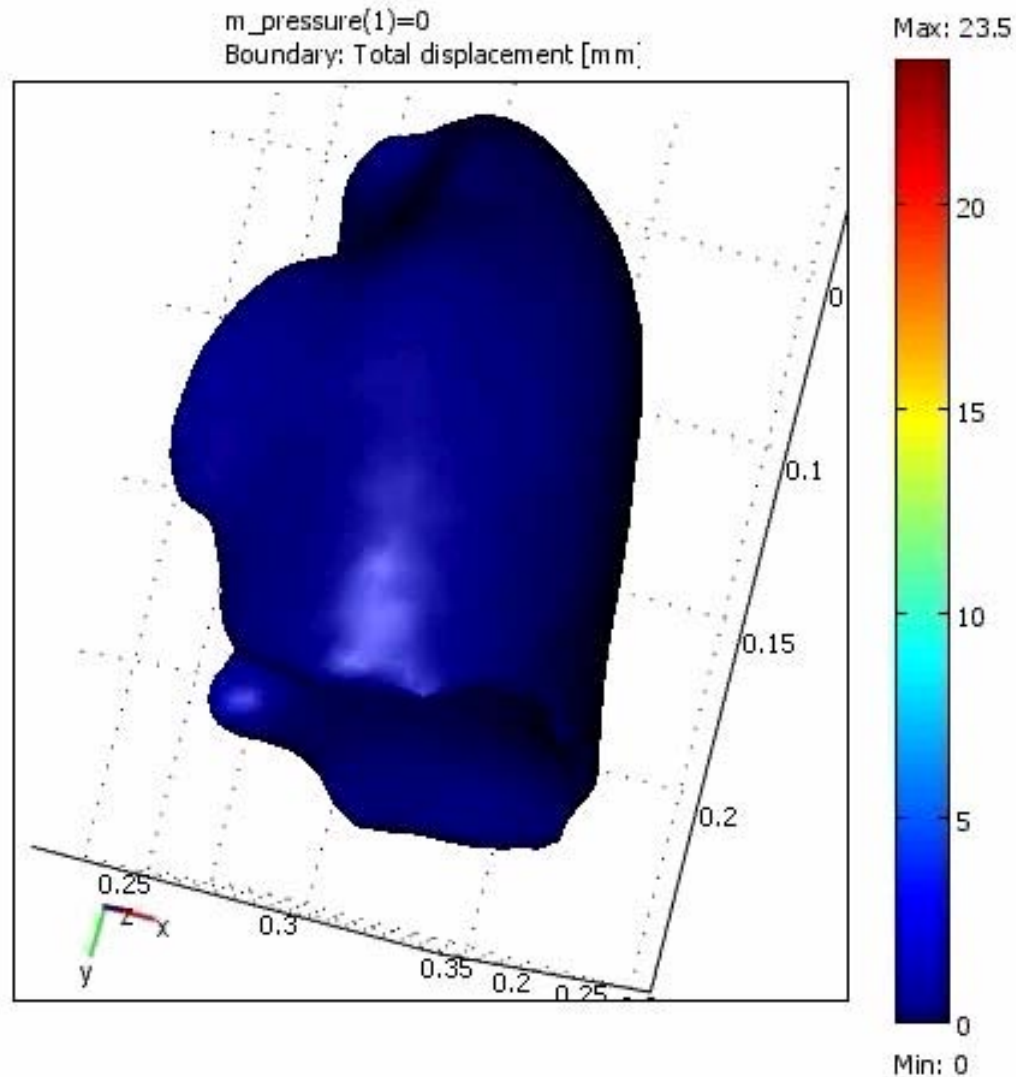
- **Solving process:**

- Increase pressure gradually until:

$$\frac{\text{Volume of deformed EE geometry}}{\text{Volume of limiting geometry}} > 0.995$$

- Each pressure value: Solve contact problem by the Augmented Lagrange algorithm
 - » Iterative process, solving the problem in a segregated way
 - » Part of the Structural Mechanics Module

Results



Modeling process: Expansion of the initial lung geometry

Color coded:

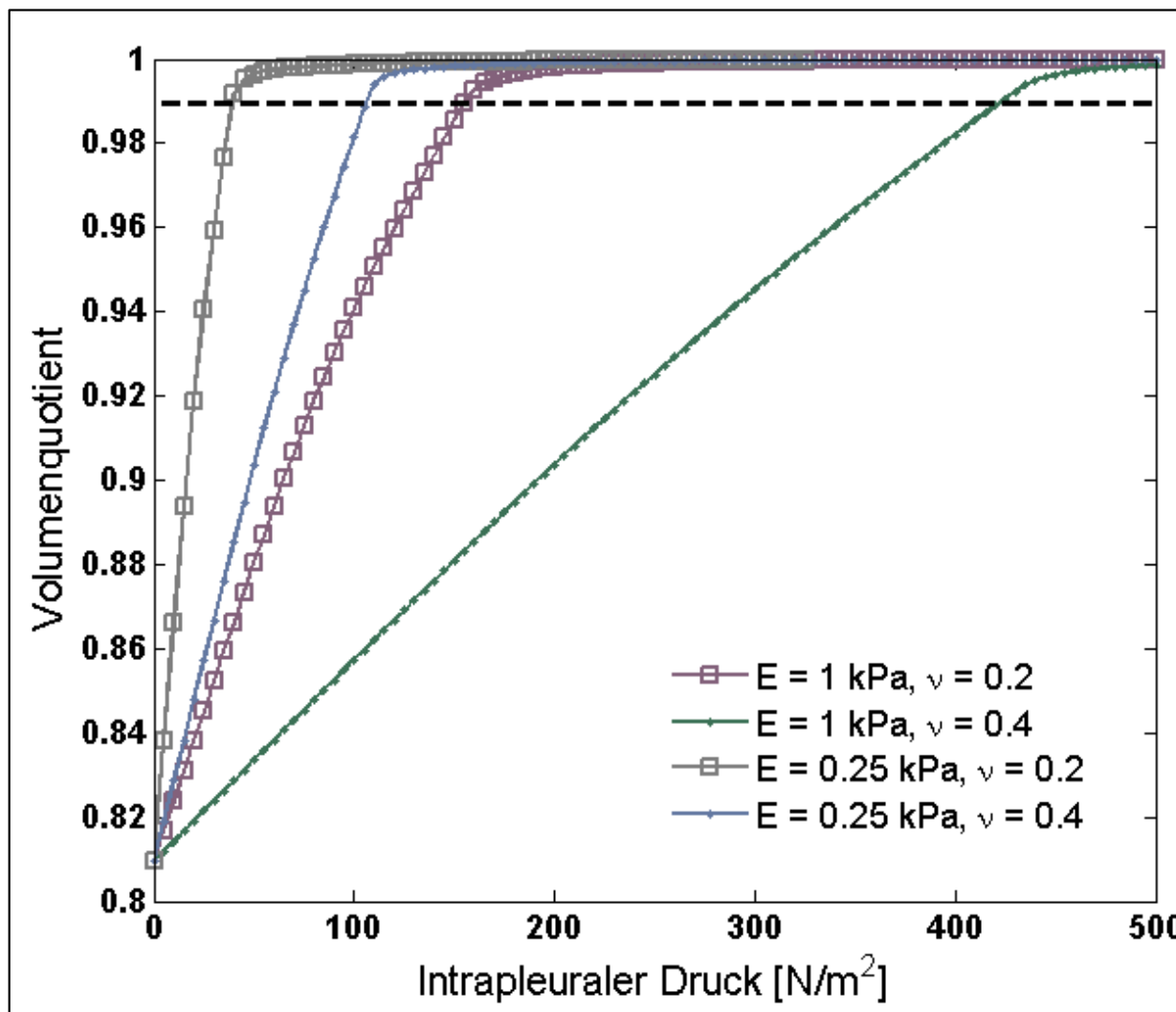
distance of surface points
with respect to their
initial positions (in mm)

Details:

Approx. 60 000 tetrahedrons
Solving time: approx. 0.5 h

Results

A) Influence of the elastic constants:



Literature values:

| | E [kPa] | ν |
|--|---------|-------|
| West et al., J Appl Physiol 32 , 1972 | 0.25 | 0.3 |
| De Wilde et al., J Appl Physiol 52 , 1981 | 0.73 | 0.3 |
| Zhang et al., Med Phys 31 , 2004 | 4 | 0.35 |
| Sundaram et al., Med Image Anal 9 , 2005 | 0.1 | 0.2 |
| Villard et al, MediVis 2005 | 0.823 | 0.3 |

Results

A) Influence of the elastic constants:

- 1) Pressure to fulfill a volume ratio of >0.995 depends on E and ν values
- 2) BUT:
Differences in displacement vectors are small (for the given application!): < 0.5 mm in magnitude
 \Rightarrow Choice of E and ν values of minor impact!

Literature values:

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Results

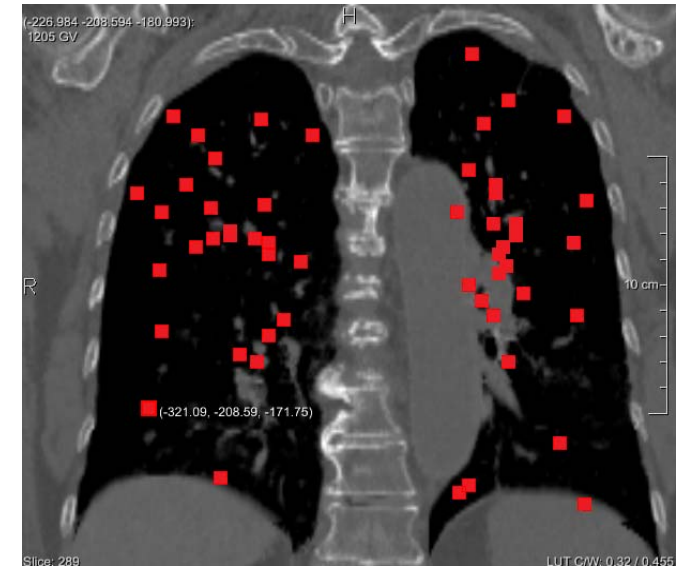
B) Modeling accuracy

Evaluation concept:

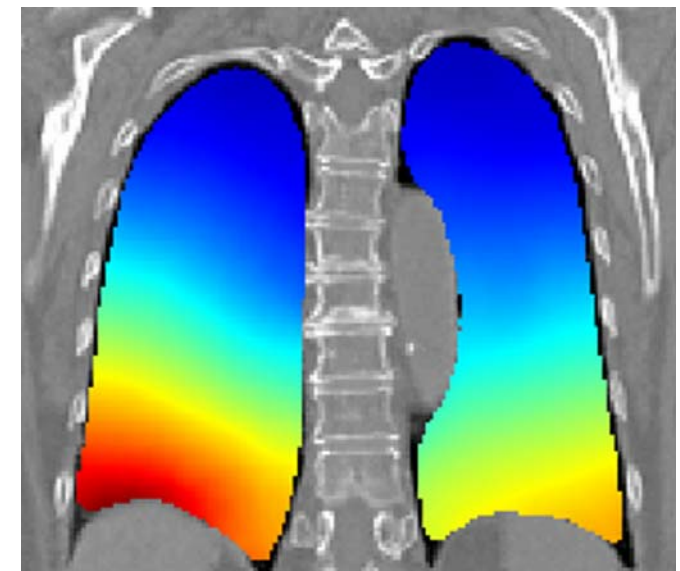
- Evaluation based on landmarks identified by a medical expert
- 35 to 45 landmarks each lung and each breathing phase (here: only EE and EI)
- Quality measure of model based predicted motion field:

$$R_k = \delta p_k^{[predicted]} - \delta p_k^{[actual]}$$

[„Registration residual“]



Landmark locations



Motion field estimator

Results

B) Modeling accuracy

Results averaged over all patients:

- Mean landmark motion observed: **6.6 ± 5.2 mm**
- Intraobserver variability: **0.9 ± 0.8 mm**
- No systematic prediction error: **$R_{CC} \cong R_{AP} \cong R_{ML} \cong 0$**
- Registration residual magnitude: **3.3 ± 2.1 mm**

Results

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Literature values (non-linear registration),
e.g. Vik et al. [Philips Medical Systems], SPIE Medical Imaging 2008:

- » 2.5 ± 2.2 mm (surface-tracking)
- » 2.9 ± 3.1 mm (B-Spline based reg.)
- » 3.3 ± 3.1 mm (non-parametric reg.)

Results

B) Modeling accuracy

Influence of lung tumors on modeling accuracy:

| | Registration residual magnitude $\ R\ $ in mm | | | |
|--------------------|---|---------------|---------------|--------------------------|
| Lanc | | | | or $> 65.4 \text{ cm}^3$ |
| in th | | | | 4.2 ± 2.6 |
| near the pleura | 2.9 ± 1.8 | 3.5 ± 1.7 | 4.4 ± 2.2 | 4.2 ± 2.3 |
| close to the tumor | — | 3.0 ± 1.5 | 4.1 ± 2.2 | 6.3 ± 3.1 |
| mean | 2.8 ± 1.6 | 3.1 ± 1.6 | 4.2 ± 2.4 | 4.6 ± 2.7 |

⇒ **Modeling accuracy decreases with increasing tumor size!**

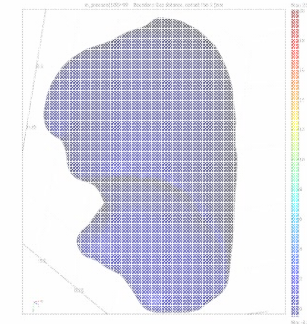
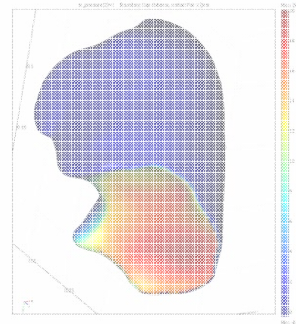
Summary & Discussion

- Biophysical approach to modeling respiratory lung motion
 - Lung ventilation as a contact problem of linear elasticity theory
- Implementation using FEM / COMSOL SME Module
- Evaluation of model accuracy by means of 4D CT data
 - Registration residual of approx. 3 mm

⇒ **Modeling approach promising, but ...**

- Assumption of lung tissue to be homogenous oversimplifying!
 - Explicit modeling of inner lung structures
 - Import of “complex” structures to COMSOL?

Gap between initial and final
geometry (red: > 20 mm)



Thank you for your attention.

Left lung at EE (i.e. the initial,
the undeformed geometry)

Deformed left lung (i.e. lung at the final
situation, the predicted lung shape at E)