Fourth International Workshop on

# VALIDATION OF COMPUTATIONAL MECHANICS MODELS

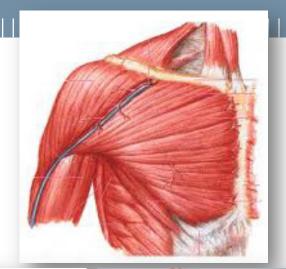
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Validation of multi-physics models: from the material scale to the boundary value prot Anna Pandolfi, Politecnico di Milano, Italy

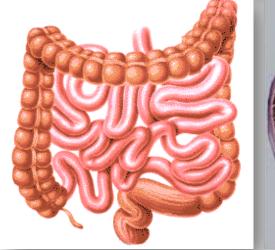
# Multi-physics & Multi-scale Challenges in Computational Mechanics

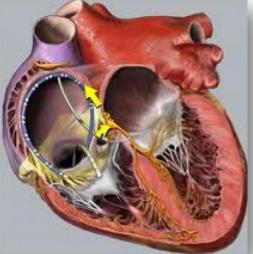
Two representative examples

- Faults and fractures permeated of water in geomechanical materials
- Collagen fiber architecture and electric activity in biological tissues









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## Validation of Computational Mechanics Models

## • Equations governing physical phenomena are well known

- Linear and angular momentum balance
- Mass balance
- Energy balance
- Thermodynamics principles...
- Modelling, based on weak or strong assumptions, typically involves
  - **geometry**, suggested by the particular shape of a body (structure: beam, plate, shell...)
  - **boundary conditions and interactions** with surrounding bodies
  - **material**, suggested by experimental tests on materials
- Modelling requires the assessment of the correspondence with the real world (validation).

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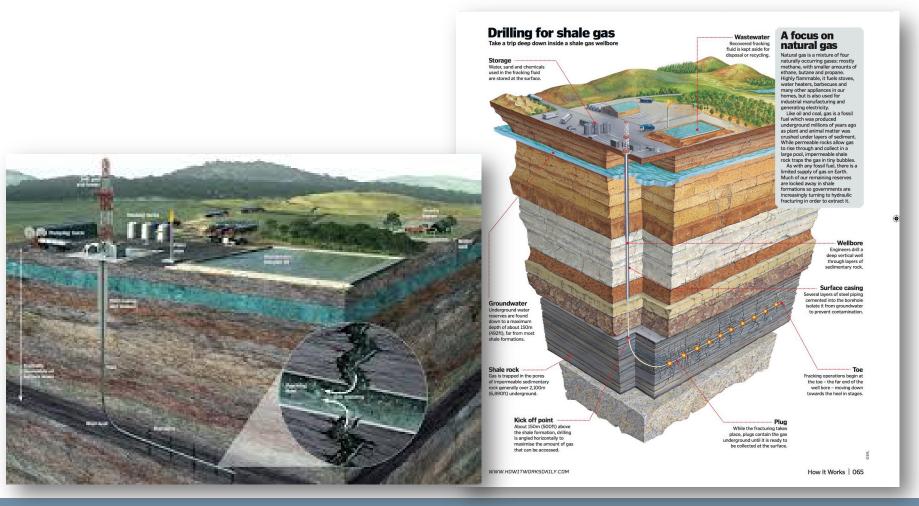
## **Material Modelling**

Material models can be roughly classified in

- **Phenomenological models**: Experimental behaviors are translated into mathematical equations governed by generic parameters, calibrated to best fit experimental data.
  - 1. Pros. Easy implementation, moderate computational cost.
  - 2. Contra. Unable to capture response under various loads for the same parameters.
- **Microstructural models**: The main characteristics of the microscopic organization of the material are explicitly included in the model.
  - Pros. Model parameters possess a direct physical meaning and remain the same for multiple loadings. The model is predictive.
  - Contra. Heavy implementation, high computational cost.
- The nowadays challenge is on microstructural models (see metamaterials...)

## Fracking: inelastic hydro-mechanical coupling in geomechanics

- Fractures and discontinuities in natural rocks can evolve due to the action of gravity, superposed localized pressure, and shear tractions
- Fractures are related to porosity and permeability of rocks
- Actual great interest: damage induced by hydraulic stimulation in oil/gas reservoirs in view of increasing the reservoir production
- Resort to a multiscale Porous Brittle Damage Model [Pandolfi et al, JMPS, 2006]



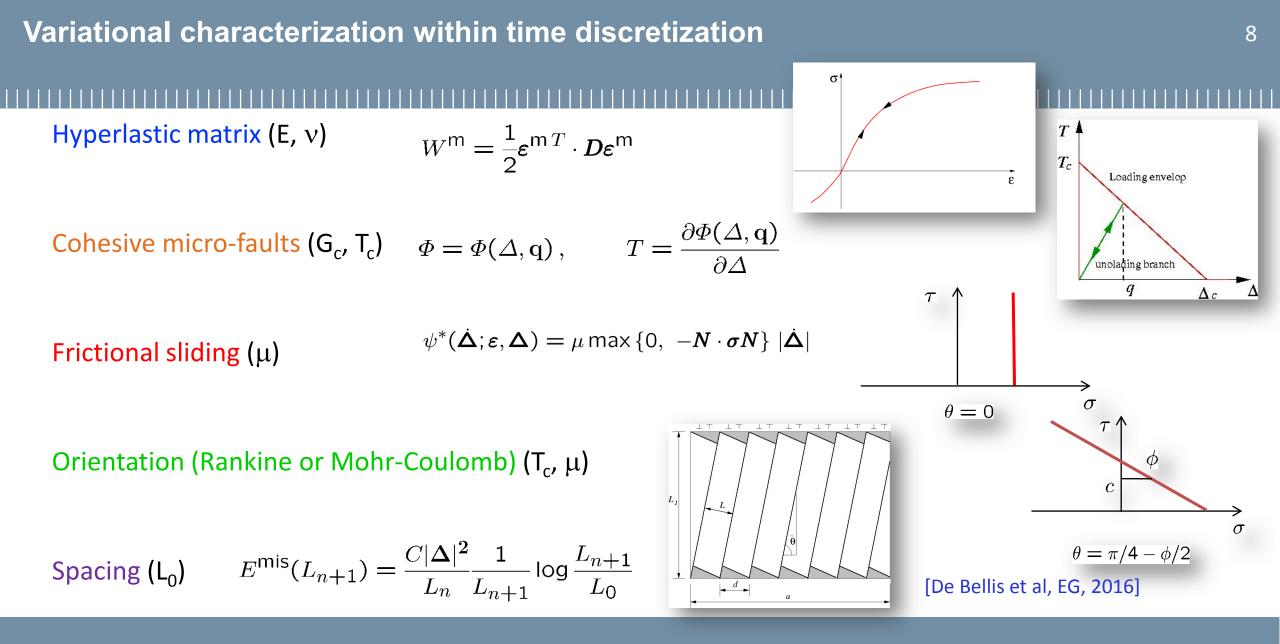
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- Particular class of microstructures, consisting of nested families of equi-spaced cohesive faults bounding elastic (or any other) matrix material.
- Each family characterized by an orientation N and a spacing L (microstructural feature of the material that derives from optimality conditions on the system energy).
- The average macroscopic strain tensor admits the additive decomposition [De Bellis et al, EG, 2016]

$$\varepsilon = \operatorname{sym} \nabla u = \varepsilon^{\mathsf{m}} + \varepsilon^{\mathsf{f}}$$

$$\varepsilon^{\mathsf{f}} = \operatorname{sym} \nabla u^{\mathsf{f}} = \frac{1}{2L} (\Delta \otimes N + N \otimes \Delta)$$

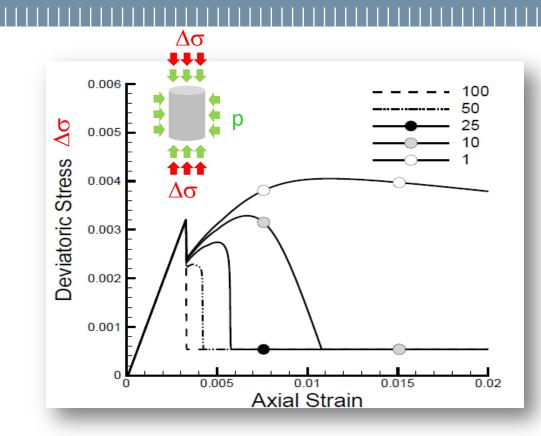
$$\overset{\mathsf{P}_{\mathsf{f}}}{\longrightarrow} \qquad \overset{\mathsf{Displacement jump}}{\longrightarrow} \qquad \overset{\mathsf{Displacem$$



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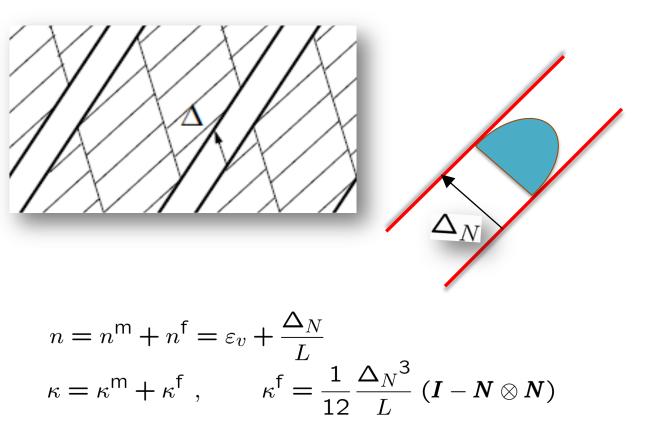
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## Scale parameter L<sub>0</sub>, extension to porous material permeability and porosity



- Small L<sub>0</sub> : many distributed faults
- Large L<sub>0</sub> : a few localized faults



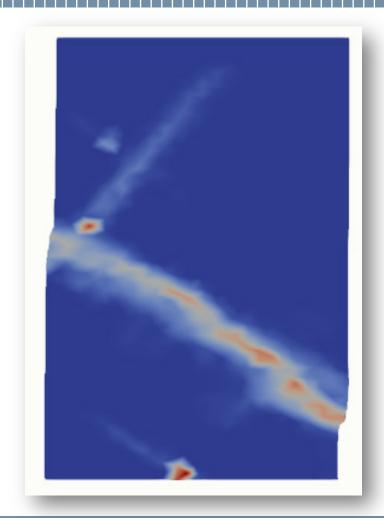


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## Interpretation of the global failure mechanism



- The **global failure mechanism** derives from the **sliding within microstructures**.
- Microscopic cracks oriented almost orthogonally the macroscopic shear band.



- No explicit modelling of fractures is requested by the approach.
- Macro-cracks are natural outcomes of the calculation defined by the distribution of the damaged zone.

#### Displacements NOT magnified

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• Linear momentum balance

$$\nabla \cdot \boldsymbol{\sigma} + \boldsymbol{b} = \boldsymbol{0}$$

• Continuity equation (fully saturated porous media, incompressible fluid and incompressible soil particles), *n* porosity,  $\varepsilon_v$  volumetric strain

$$\frac{\partial n}{\partial t} = -\nabla \cdot \boldsymbol{q} \qquad \frac{\partial n}{\partial t} = \frac{\partial \varepsilon_v}{\partial t}$$

• Terzaghi's effective stress principle, *p* pore pressure

$$\sigma = \sigma' + pI$$

• Constitutive relations

$$\sigma' = \sigma'(\varepsilon), \qquad \varepsilon = \varepsilon^{\mathsf{m}} + \varepsilon^{\mathsf{f}}$$

• Constitutive relation for fluid flow in porous media (Darcy law), h hydraulic head, k permeability tensor

$$\mathbf{q} = -\kappa \frac{\rho_f g}{\mu} \nabla h$$
  $h = \frac{p}{\rho_f g} + z$ 

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## **Coupled field problem solution strategy**

# • Two field equation: linear momentum balance and continuity equation

$$\nabla \cdot \boldsymbol{\sigma} + \boldsymbol{b} = \mathbf{0}$$
$$\frac{\partial \varepsilon_v}{\partial t} = -\nabla \cdot \boldsymbol{q}$$

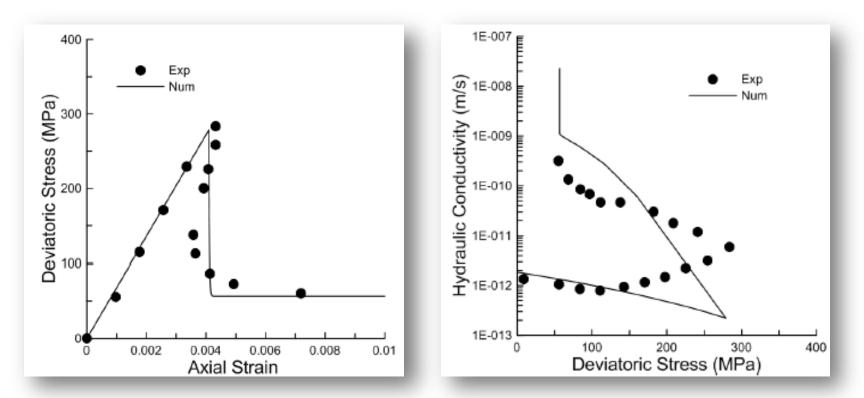
• Weak form (unknowns u and p, introduce the test functions v and  $\eta$ )

$$\int_{V} (\sigma'_{ij} + \delta_{ij}p) \frac{\partial v_{j}}{\partial x_{i}} dV = \int_{\Gamma_{t}} \overline{t}_{j} v_{j} d\Gamma + \int_{V} b_{j} v_{j} dV .$$
$$\int_{V} \frac{\partial n}{\partial t} \eta dV + \int_{V} \frac{\partial \eta}{\partial x_{j}} q_{j} dV = \int_{\Gamma_{q}} q_{n} \eta d\Gamma .$$

• After spatial discretization obtain the matrix form (similar to the consolidation equations)

$$\begin{cases} F^{\text{ext}} - F^{\text{int}}(U) = H^T P \\ KP = Q^{\text{ext}} + H\dot{U} \end{cases}$$

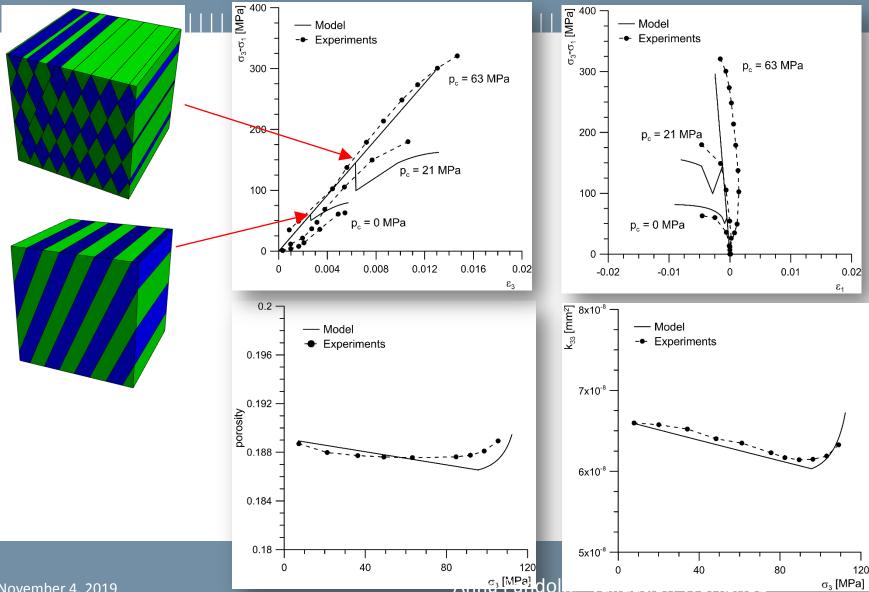
• which is solved with a staggered approach (explicit in *u*, implicit in *p*).



Inada sandstone (Kiyama et al, 1996)

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## Material point: validation of the coupled behavior 3



## Experiments on berea • sandstone [Morita et al., 1992]

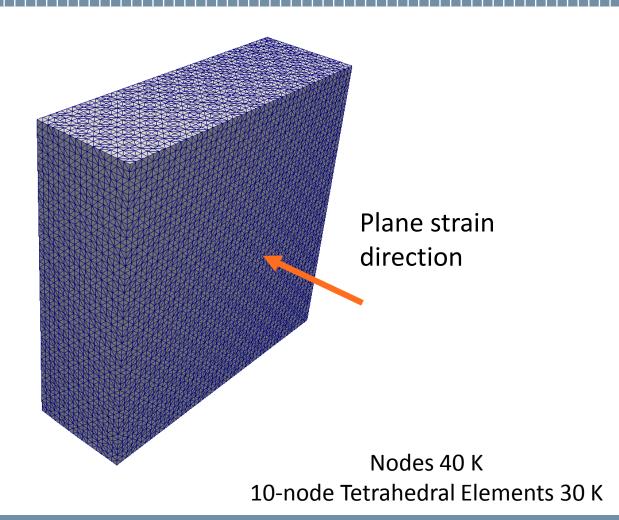
- Axial and radial stress strain curves
- Porosity and permeability in axial direction curves

[De Bellis et al, JMPS, 2017]

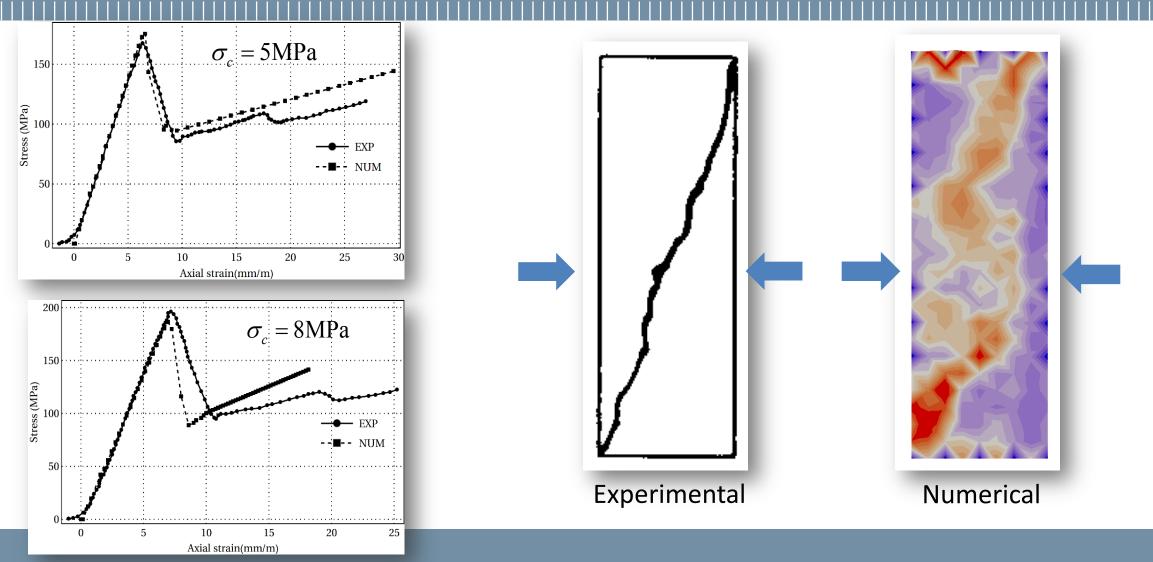
# Boundary value problem 1. Dry compression of a block in plane strain

- Compressed block of sandstone with a stiff frame system applying plane strain boundary conditions [Yumlu & Ozbay, IJRMMS&G, 1995]
- Specimen size 30x30x10 mm
- Consider two confinement pressure

E [GPa]	28
ν	0.25
T <sub>c</sub> [MPa]	83
G <sub>c</sub> [N/mm]	100
φ [Deg]	52



## Boundary value problem 1. Validation with global curves and failure pattern



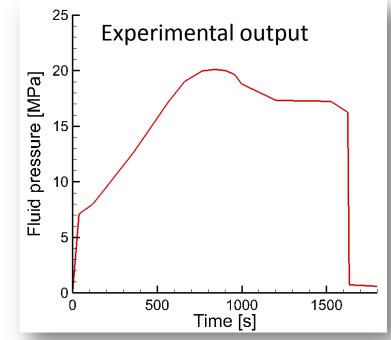
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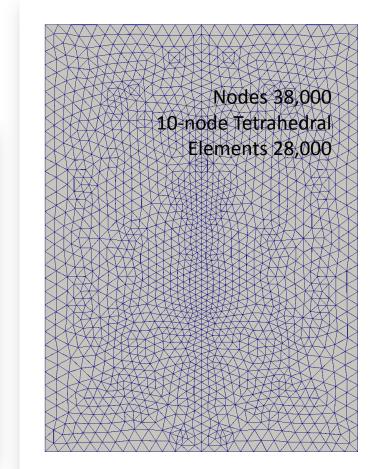
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## Boundary value problem 2. Triaxial loading of a cement block

Experimental data on a compressed block of cement pressurized with a fluid in a small cylindrical cavity at the center of the specimen [Athavale & Miskimins, SPE, 2008]  $s_z = 24.2 \text{ MPa}$  $s_x = 17.3 \text{ MPa}$  $s_y = 10.4 \text{ MPa}$ Max fluid pressure = 20 MPa

 $\sigma_{x} \xrightarrow{\sigma_{y}} \sigma_{x}$ 





 $\sigma_{z}$ 

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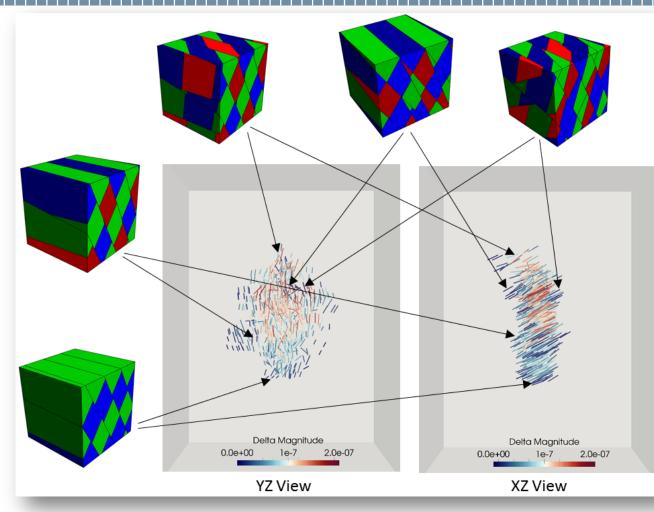
## Boundary value problem 2. Validation with failure patterns



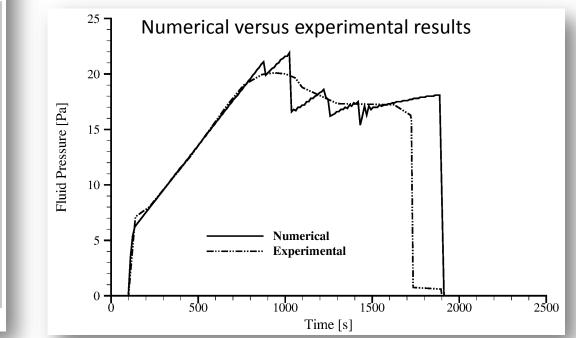
• Missing strength properties estimated from the literature. Assume  $G_c = 100 \text{ N/m}$ ,  $T_c = 5 \text{ MPa}$ , and  $\phi = 31 \text{ degrees}$ . A posteriori damage variable (0 no damage, 1 full damage)

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## Boundary value problem 2. Validation with global curves



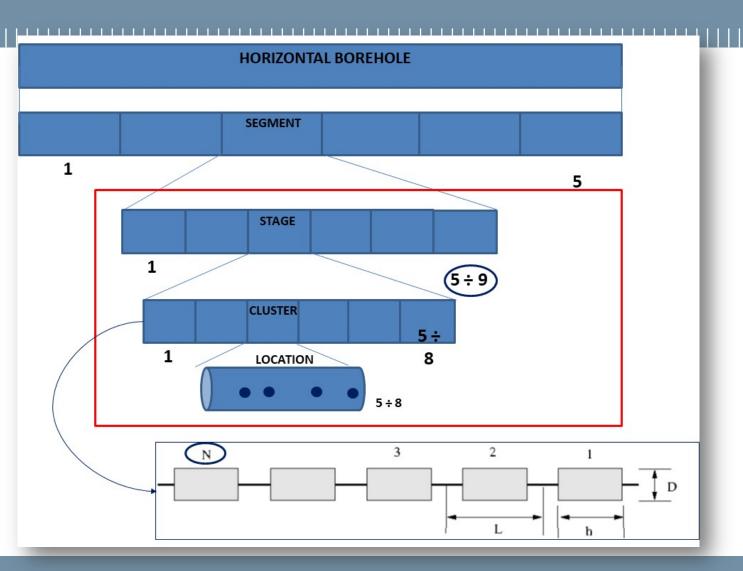
- Faults form according the Mohr–Coulomb criterion.
- Colored lines: aligned along the fault normal, colored as the magnitude of the sliding jump.



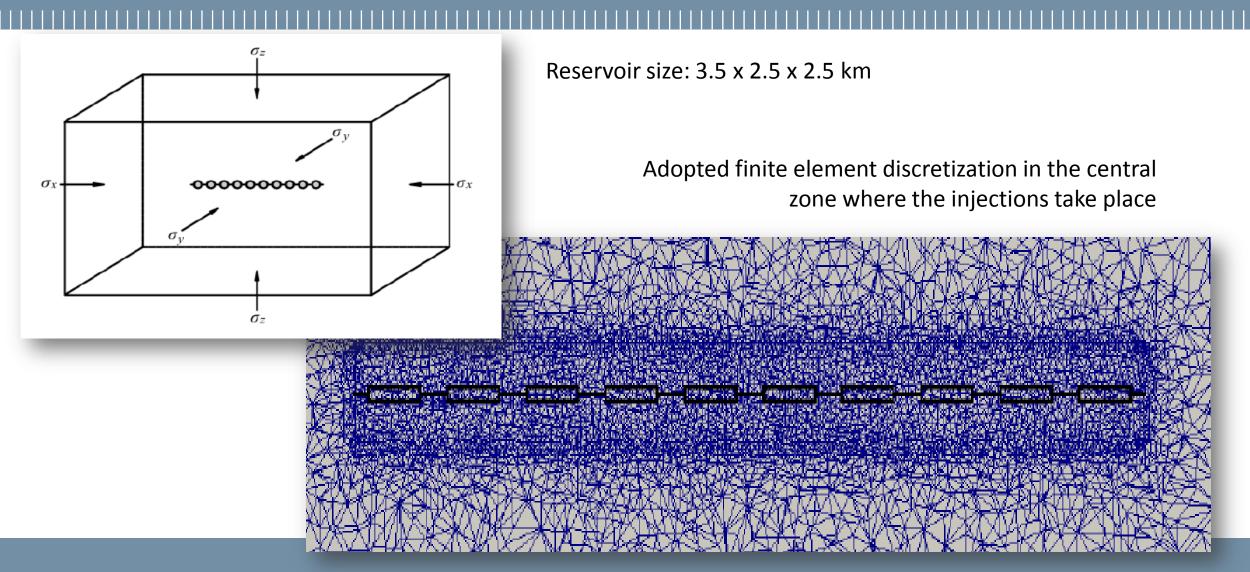
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## Boundary value problem. A simulation of a fracking process

- Most material and geometry data are unknowns
- Only the relevant feature of the fracking process are described
- The elementary fracking unit is the cluster. Requested
  - Orientation
  - Diameter D
  - Spacing L
  - Cluster length  $h \leq L$



## Example of a 10 cluster fracking process in a horizontal well

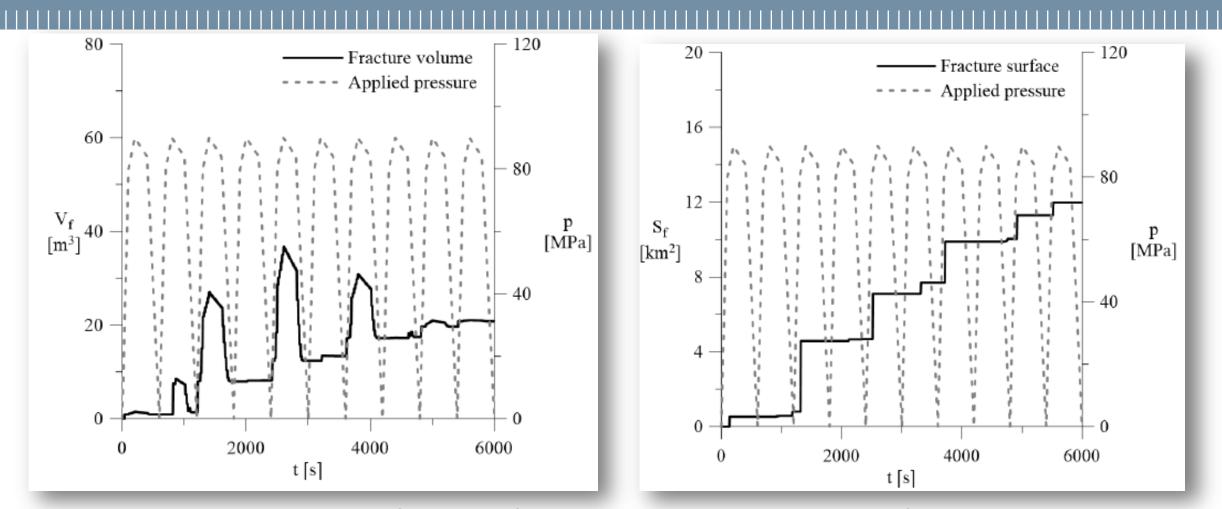


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## Simulation results: fracture volume and fracture surface



Fracture volume history and fracture surface history, together with the applied fluid pressure

## Permeability change after 10 fracked clusters



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## Longitudinal effective stress after 10 fracked clusters



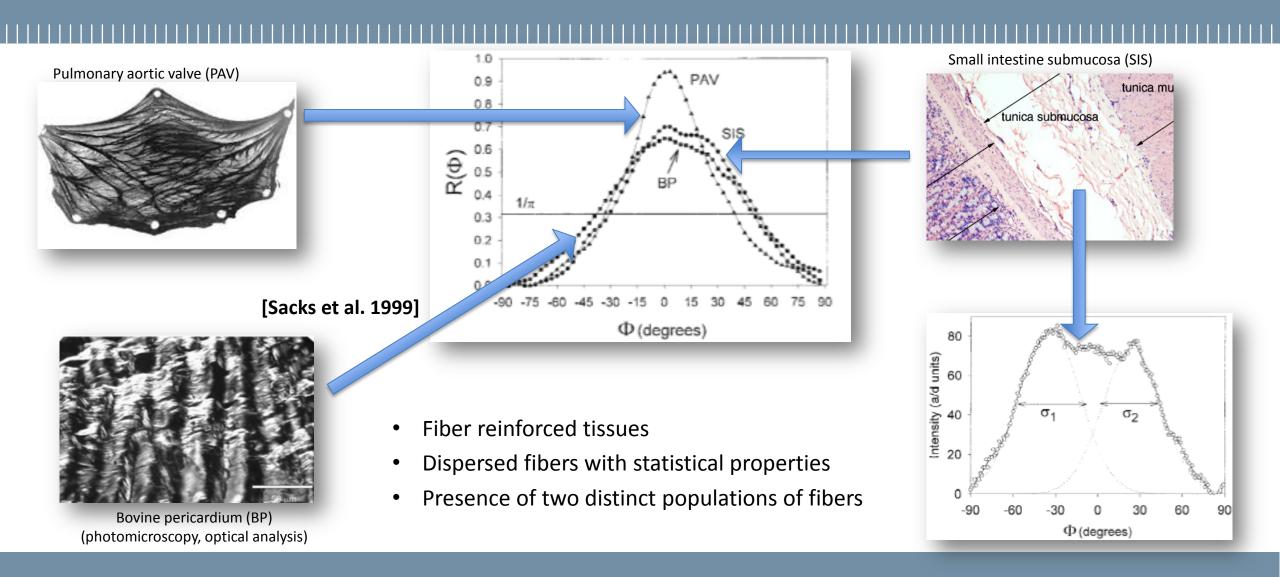
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## Active (deformable under an electric stimulus) bio-tissues

# HeatMusclesIntestinesEye's iris

- Biological active tissues: heart, skeletal muscle, gastro-intestine, eye's iris...
- Show the ability to develop contractions, producing the mechanical forces necessary to the organ's function.
- Contractions originated by an electric potential due to transmembrane (K<sup>-</sup>, Na<sup>-</sup>) and intracellular currents (Ca<sup>++</sup>)

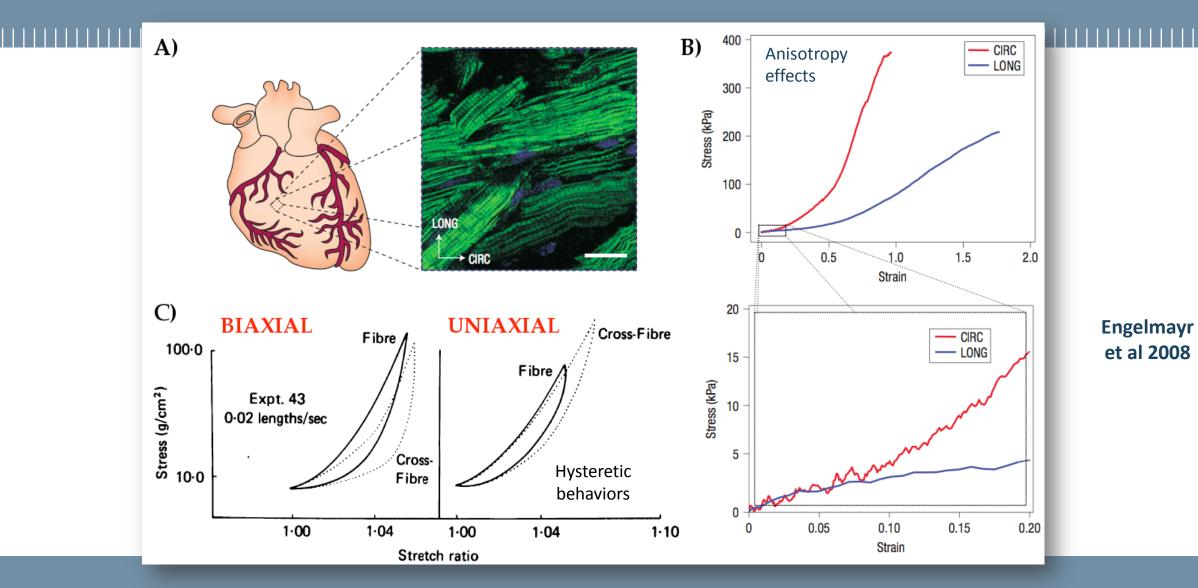
## Anisotropy associated to spatial dispersion of collagen fibers



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## Mechanical passive behavior of muscles: anisotropy, hysteresis, viscosity



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## **Distributed fibers: healthy to diseased**

- Spatial distribution of muscular fibers at the mesoscopic level
- In healthy physiological condition, observe small dispersion of fibers following a Gaussian profile
- In some pathological cases observe large and less regular dispersion
- Fiber dispersion characterize both the response of the material in both passive and active behaviors



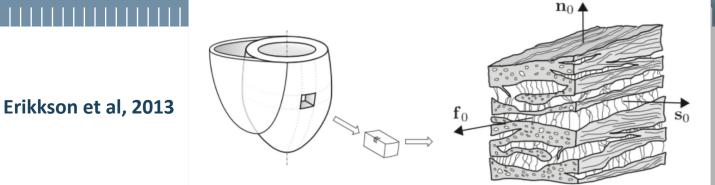
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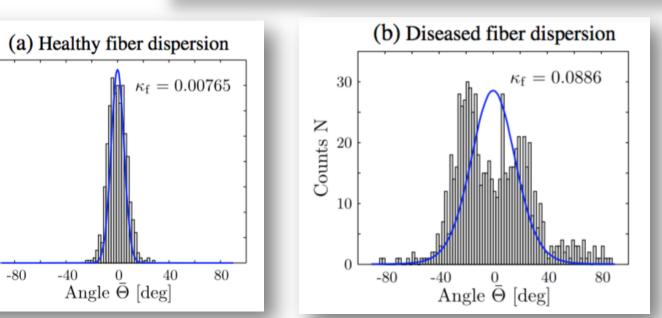
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20

Z

40 Counts





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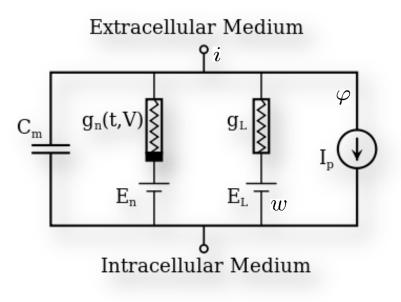
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## • Prototype of an exciting dynamic system. Based on two variables:

- A voltage-like variable  $\varphi$  having cubic nonlinearity that allows regenerative self-excitation via a fast feedback
- A *recovery variable w* having a linear dynamics that provides a slower negative feedback.
- The cell membrane consists of three components:
  - capacitor C<sub>m</sub> representing the membrane capacitance;
  - nonlinear current-voltage device for the fast current i,
  - resistor g<sub>L</sub>, inductor and battery E<sub>L</sub> in series for the recovery current w.
- Governing equations:

$$\frac{\partial \varphi}{\partial t} = F(\varphi) - i - w, \qquad \frac{\partial w}{\partial t} = a(bw - c\varphi)$$



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Linear and angular momentum balance: V velocity, P first Piola-Kirchhoff stress tensor, F deformation gradient, ρ<sub>0</sub> material density (plus corresponding b.c.):

$$\rho_0 \frac{d\mathbf{V}}{dt} = \nabla_{\mathbf{X}} \cdot \mathbf{P} + \rho_0 \mathbf{B}, \qquad \mathbf{P} \mathbf{F}^T = \mathbf{F} \mathbf{P}^T$$

• Energy balance: U internal energy, **D** dielectric displacement or induction,  $\varphi$  electric potential, **E** electric field:

$$\dot{U} = \mathbf{P} : \dot{\mathbf{F}} + \mathbf{E} \cdot \dot{\mathbf{D}}, \qquad \mathbf{E} = -\nabla_{\mathbf{X}} \varphi$$

• Electric potential dynamics through the cell membrane described by a diffusion-reaction equation, combined with intercellular coupling in cardiac tissue. **Q** is the conductivity tensor [Rogers & McCulloch, 1994; Aliev & Panfilov, 1996]:

$$C_m \frac{d\varphi}{dt} = \frac{1}{J} \nabla_{\mathbf{X}} \cdot (\mathbf{Q} \nabla_{\mathbf{X}} \varphi) - k\varphi(\varphi - a)(\varphi - 1) - w\varphi + I_{\text{ext}}$$

• Recovery current circulation equation (*L* inductance, *R* resistance,  $\varphi_0$  potential gain):

$$L\frac{\partial w}{\partial t} + Rw = \varphi - \varphi_0$$

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## **Finite kinematics approach**

# • Active deformation can be easily introduced in the mechanical framework under the assumptions of

• Multiplicative decomposition of the deformation gradient:

$$\mathbf{F} = \mathbf{F}^e \mathbf{F}^a, \qquad \mathbf{F} = \frac{d\mathbf{x}}{d\mathbf{X}},$$

• The free energy density decomposes in elastic and inelastic parts with separation of the arguments

 $A(\mathbf{F}, \mathbf{E}) = A^e(\mathbf{F}^e) + A^a(\mathbf{F}, \mathbf{E})$ 

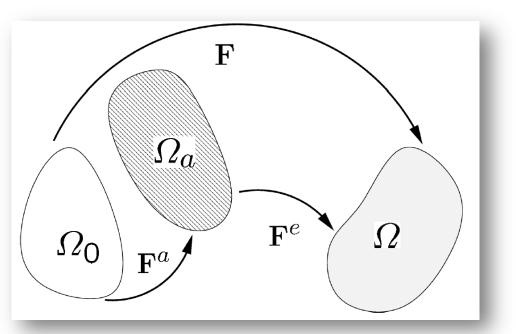
• Frame indifference considerations imply dependence on  $\mathbf{C} = \mathbf{F}^{\mathrm{T}}\mathbf{F}$ 

 $A(\mathbf{C}, \mathbf{E}) = A^e(\mathbf{C}^e) + A^a(\mathbf{C}, \mathbf{E})$ 

• Constitutive laws

 $\mathbf{P}^E = \partial_{\mathbf{F}} A(\mathbf{C}, \mathbf{E}), \qquad \mathbf{D} = \partial_{\mathbf{E}} A(\mathbf{C}, \mathbf{E})$ 

The inelastic (active) part accounts for the deformation of the tissue due to the electric field.



Lagrangian formulation [Dorfmann & Ogden, 2006; Cherubini et al, 2008; Rosato & Miehe, 2010; Ask et al, 2010, 2012, 2013]

- Active stress: usual approach in cardiac electro-mechanics (McGarry et al 2010)
- Active strain: described by means of eigen-deformations (Ambrosi et al 2011)
- A definition of active stress consistent with active strain can be derived through thermodynamics arguments that allow for the definition of all the constitutive relationships (Gizzi et al, 2015):

$$\mathbf{P} = \partial_{\mathbf{F}} A^{e}(\mathbf{C}^{e}) + \partial_{\mathbf{F}} A^{a}(\mathbf{C}, \mathbf{E}) = \mathbf{P}^{p} + \mathbf{P}^{a}$$

- Advantages:
  - The general structure of the constitutive equations will be extended easily to any mechanical behavior, accounting for viscosity, damage, anisotropy, growth;
  - Other coupled phenomena, such as electro-chemical diffusion, are easily accounted for (Yang et al, 2006)
- Convenient expression of elastic strain energy density for fibrous tissues through C's invariants (a is a preferential fiber orientation an  $A = a \otimes a$ ) to model the passive behavior:

$$A^{e}(\mathbf{C}^{e},\mathbf{A}) = A^{e}_{\mathsf{vol}}(J^{e}) + A^{e}_{\mathsf{iso}}(\bar{I}_{1},\bar{I}_{2}) + A^{e}_{\mathsf{aniso}}(\bar{I}_{4}) \qquad \overline{C}^{e} = J^{e-2/3}\mathbf{C}^{e} \qquad I_{4} = \overline{\mathbf{C}}^{e} : \mathbf{A}$$

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## Passive behavior: statistical distribution of the reinforcing fibers

• Probability density function of the orientation, with normalization and symmetry properties

$$\int_{\omega} \bar{\rho}(\mathbf{a}) d\omega = \int_{0}^{\pi} \int_{0}^{2\pi} \bar{\rho}(\mathbf{a}) \sin \theta d\phi d\theta = 4\pi, \ \bar{\rho}(-\mathbf{a}) = \bar{\rho}(\mathbf{a})$$

• Amount of fibers in the range  $\bar{\rho}(\mathbf{a}) \sin \theta d\phi d\theta$ 

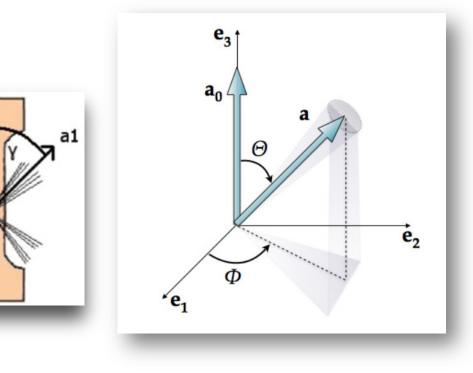
 $[(\theta, \theta + d\theta), (\phi, \phi + d\phi)]$ 

• Average of a function  $f(\mathbf{a})$  over the unit sphere is

$$< f > = \int_{\omega} \bar{
ho}(\mathbf{a}) f(\mathbf{a}) d\omega$$

• Expression of the single fiber strain energy density

$$A_{\text{aniso}}(I_4) = \frac{k_1}{2k_2} \exp[k_2(I_4 - 1)^2] - \frac{k_1}{2k_2} \quad I_4 = \mathbf{C} : \mathbf{a} \otimes \mathbf{a}$$



a2

• Anisotropic strain energy of the fiber distribution

$$< A_{aniso} > = \int_{\omega} \bar{\rho}(\mathbf{a}) A_{aniso}(I_4) \, d\omega$$

- Closed forma approximations of the energy allows for the analytical derivation of stress and elasticity tensors. Among others:
- Generalized structure tensor model (GST) [Gasser et al, 2006]

$$A_{\text{aniso}}^{GST} \approx A_{\text{aniso}}(I_4^*)$$
  $I_4^* = I_4^*(\mathbf{H}) = \langle I_4 \rangle$   $\mathbf{H} = \langle \mathbf{A} \rangle$ 

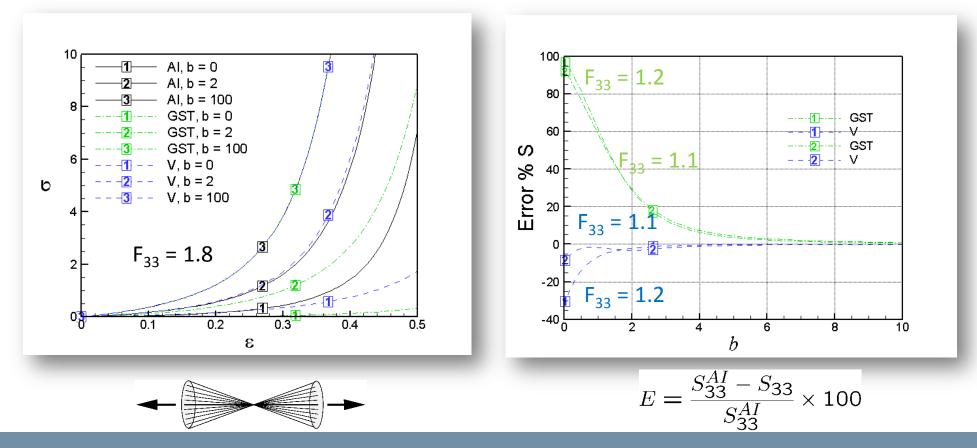
• Variance model (V) [P & Vasta, 2012]

$$A_{\text{aniso}}^{V} \approx A_{\text{aniso}}(I_{4}^{*})(1+K^{*}\sigma_{I_{4}}^{2}) \qquad \sigma_{I_{4}}^{2} = \sigma_{I_{4}}^{2}(\mathbf{H}, \mathbb{H})$$
$$\mathbb{A} = \mathbf{A} \otimes \mathbf{A} = \mathbf{a} \otimes \mathbf{a} \otimes \mathbf{a} \otimes \mathbf{a}, \qquad \mathbb{H} = \langle \mathbb{A} \rangle = \int_{\omega} \mathbb{A}\rho(\mathbf{a})d\omega$$

- The models have been studied for von Mises distributions.
  - Both models show a good performance for fibers with strongly aligned orientations
  - V model performs better for more dispersed sets of fibers

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Assume a von Mises type distribution, characterized by a unique dispersion coefficient b. Compare approximations with exact integration [P. & Vasta 2012]



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## Ansatz: active behavior of distributed fiber models

Extend the statistical treatment to active behavior. The generic orientation a (and thus the tensor A) is an aleatoric variable, thus both elastic and inelastic energy depend are aleatoric

 $A(\mathbf{C}, \mathbf{E}, \mathbf{A}) = A^e(\mathbf{C}^e, \mathbf{I}_4) + A^a(\mathbf{C}, \mathbf{E}, \mathbf{A})$ 

• Want to generalize the inelastic free energy adopted for a deterministic orientation [Gizzi et al, 2015]

$$A^{a}(\mathbf{C}, \mathbf{E}, \mathbf{A}) = -\frac{1}{2}\varepsilon_{0}J\mathbf{E}\left[\mathbf{C}^{-1} + \boldsymbol{\chi}(\mathbf{C}(\mathbf{E}), \mathbf{A})\right]\mathbf{E}$$

• And assume an additive decomposition of the permittivity tensor

$$\chi(C(E), \mathbf{A}) = \chi_{iso} (J(E)) + \chi_{aniso} (I_4(E, \mathbf{A}))$$

• We begin by defining the active deformation gradient F<sup>a</sup>, making that strong assumption that the active mapping excludes rigid rotations and leads only to proper deformations (length and angle changes).

## [Pandolfi et al, 2016]

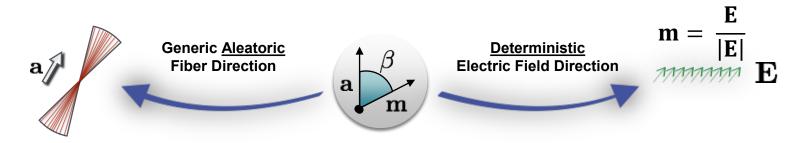
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## Kinematics of the active deformation

• Assume the following expression for the directional deformation gradient (single fiber):

 $\mathbf{F}^{a}(\mathbf{a}) = g_{1}(\mathbf{E}) + g_{2}(\mathbf{E}, \mathbf{a}) \mathbf{A} = \mathbf{F}^{aT}$ 

$$g_1(\mathbf{E}) = f_1(\mathbf{E}), \quad g_2(\mathbf{E}, \mathbf{a}) = f_2(\mathbf{E}) \cos\beta, \quad \cos\beta = \mathbf{ma}$$



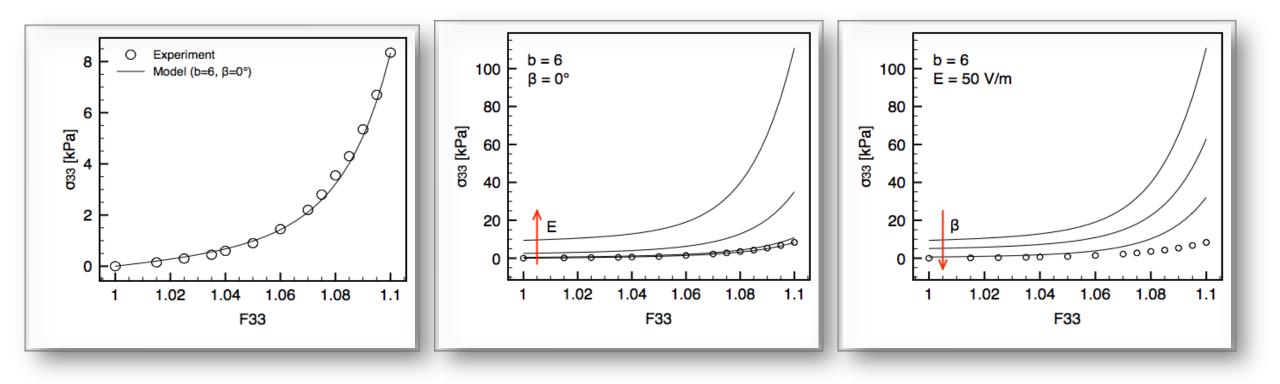
• The active deformation gradient for the fiber distribution is the integral over the unit sphere

$$\mathbf{F}^{a} = g_{1}(\mathbf{E})\mathbf{I} + \int_{\omega} g_{2}(\mathbf{E})\mathbf{A}\rho(\mathbf{a})d\omega$$

• It retains a deterministic nature, though derived from aleatoric microstructural contributions.

## Validation of the material model and predictability

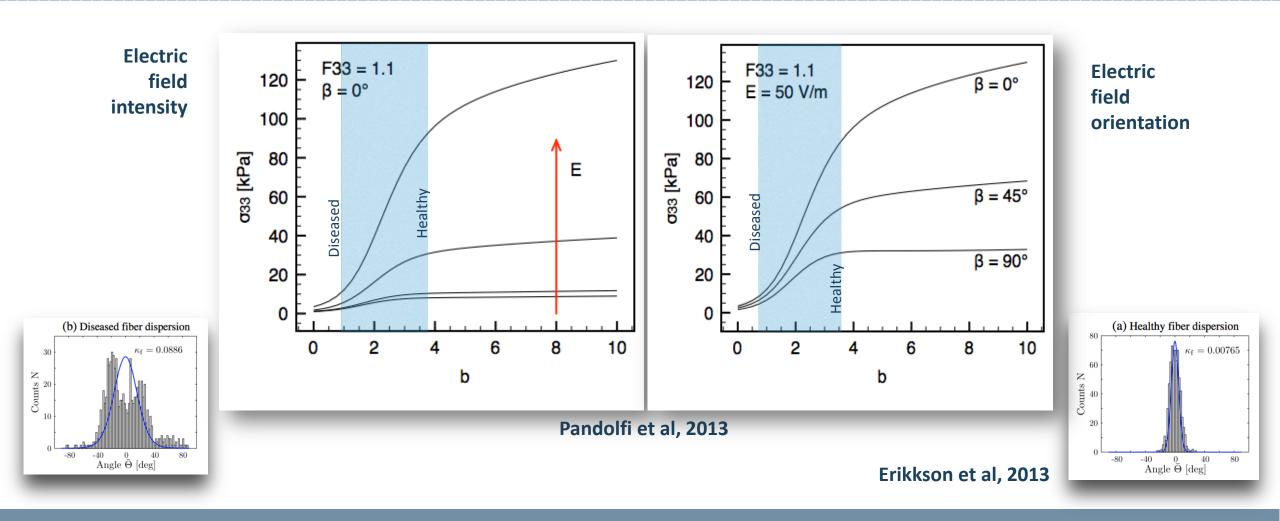
 Validation of the proposed active model against equi-biaxial tests on cardiac tissues showing non-zero stress at null strain (experiments Sommer et al, 2015, simulations Pandolfi et al, 2016)



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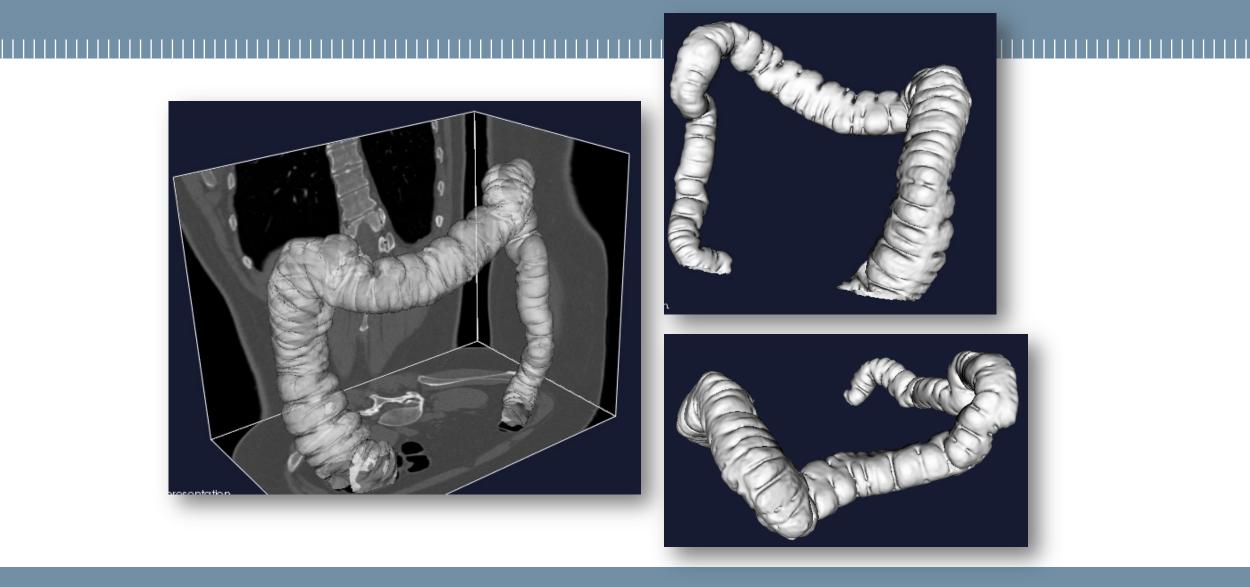
## Expected mechanical response (E intensity and angle $\beta$ with fibers)



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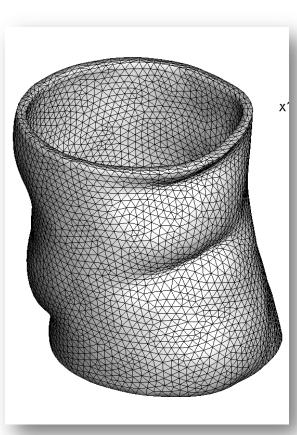
## MRI of colon portions – VMTK toolkit

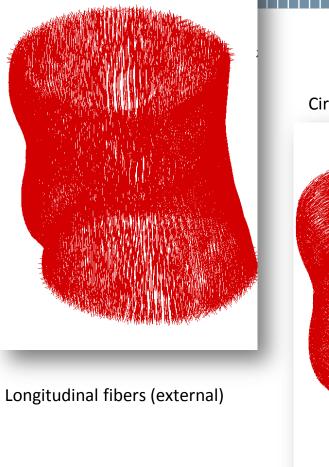


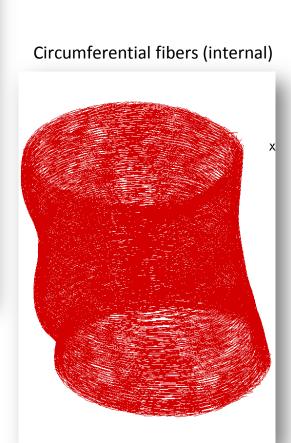
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## Numerical model and fiber orientation

Computational FE mesh ~ 10K nodes ~ 40K elements



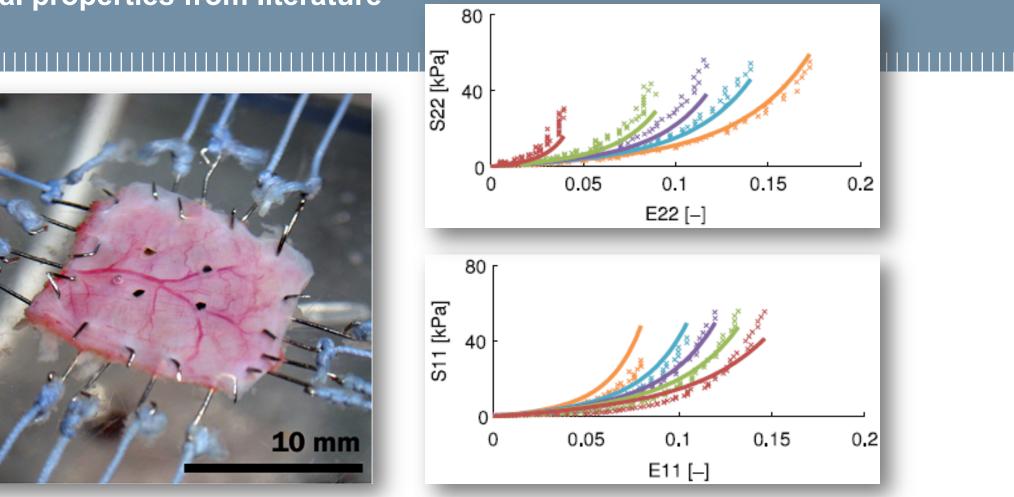




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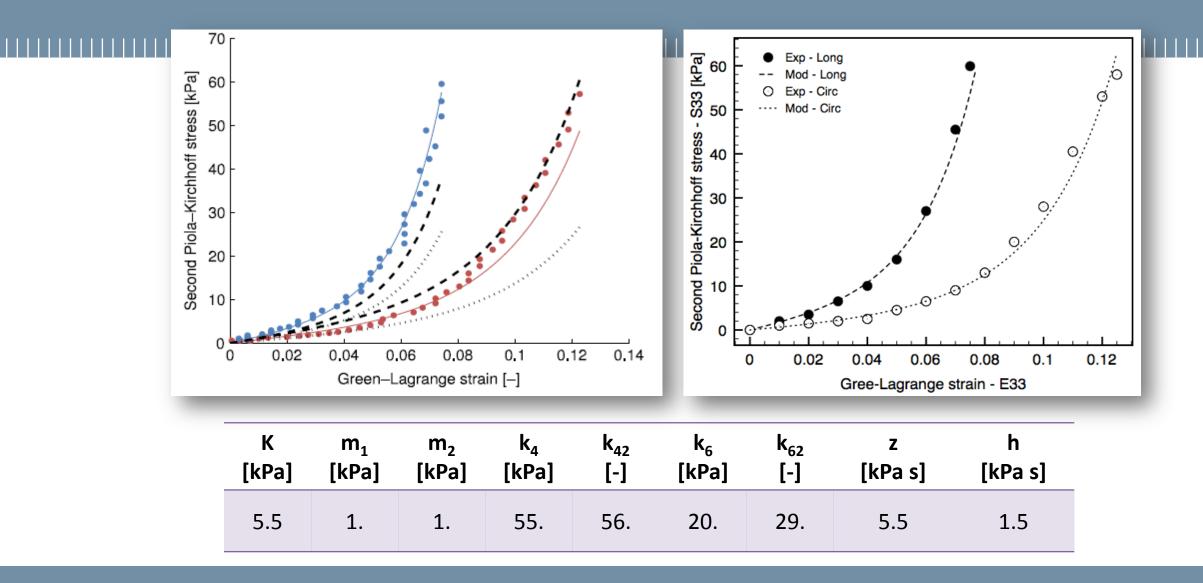
## **Elastic material properties from literature**



- Experimental data on porcine intestine biaxial test [Bellini et al., JMBBM 2011]
- Loaded circumferential (left) and longitudinal directions (right) with different stretch ratio on a portion of jejunum.

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## Calibration of the passive elasticity



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## **Electro-active simulation**

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## Summary and conclusion

- Coupled problems represent the forefront of modern computational mechanics
- Computational methods require the definition of models and of space/time discretization
- Models include geometry, boundary condition and, especially, materials
- Modelling requires validation against real world data
- Many materials explored with computational methods are characterized by complexity
  - Multiple internal scales
  - Spatial distribution of micro-components (faults, fibers, voids, ...) that define a micro-structure
  - Behavior of complex materials differentiate according to the loading
- Validation of complex materials is complex (comparison with multiple tests to assess the correct modelling of the microstructure)
- Validation of coupled models is in general difficult because coupled experiments are hard to be performed and usually only a few data are recorded.