

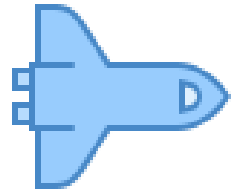
Reduced Order Homogenization for Multiscale Analysis of Nonlinear Composites

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Supervisor: Prof. Ferdinando Auricchio

Coadvisor: Prof.ssa Sonia Marfia



Heterogeneous materials

Usually regarded as composite materials or **Composites**, this class of materials is characterized by a **heterogeneous microstructure** in which two or more constituents are combined in order to reach improved properties.

- Natural and artificial composites
- Large amount of engineering applications
- Constituents with different shapes, dimensions, material properties and many possible different arrangements
- Complex inner geometries

PROs and Cons



- **Improved mechanical properties**
- Hot topic in scientific and industrial research
- Increasing usage
- Towards **Metamaterials**



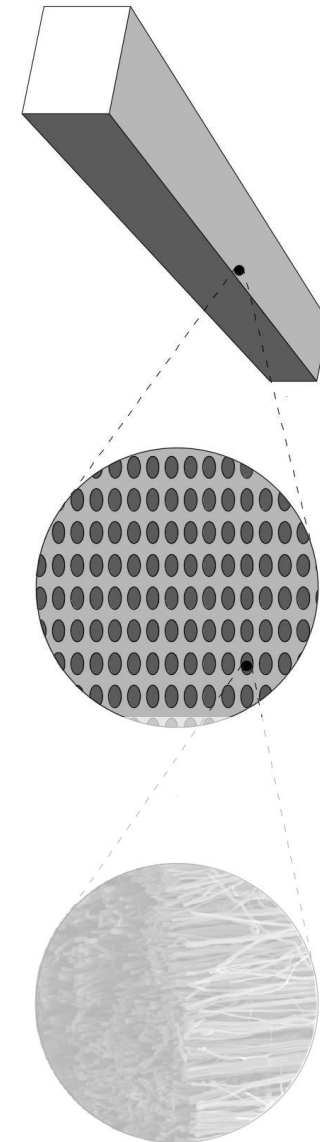
- Increasing performances and safety requirements
- Constituents characterized by **nonlinear behaviour**
- Structural response depending from the inelastic phenomena arising at the microstructure

Numerical Analysis

Microscopic structure have to be considered in order to understand how the nonlinearities occurring in the microstructure influence the overall behavior of the composite material.

Observation Scales

- **Structural** or **Macroscopic scale** having characteristic dimension L . Structural elements can be considered as a homogeneous material, mechanical properties at this scale mimic the overall properties of the composite material.
- **Microscopic scale** or **Microscale**, having characteristic size $l \ll L$. The micro-structural constituents and their complex arrangement can be easily identified.





Macroscale [m]

Microscale [mm]



Nanoscale [μm]

Modeling strategies for Nonlinear Composites

Macroscopic modeling: heterogeneous structure a fictitious homogeneous continuum.

- stress and strain fields are considered as average fields
 - phenomenological approach
-
-  Easily implemented in the framework of FEA (coarse mesh with respect to inhomogeneities dimensions)
 - Inexpensive calculations
-
-  Impossible to consider the different constituents
 - Inaccurate

Microscopic modeling: discontinuities between the different constituents of the heterogeneous material are considered.

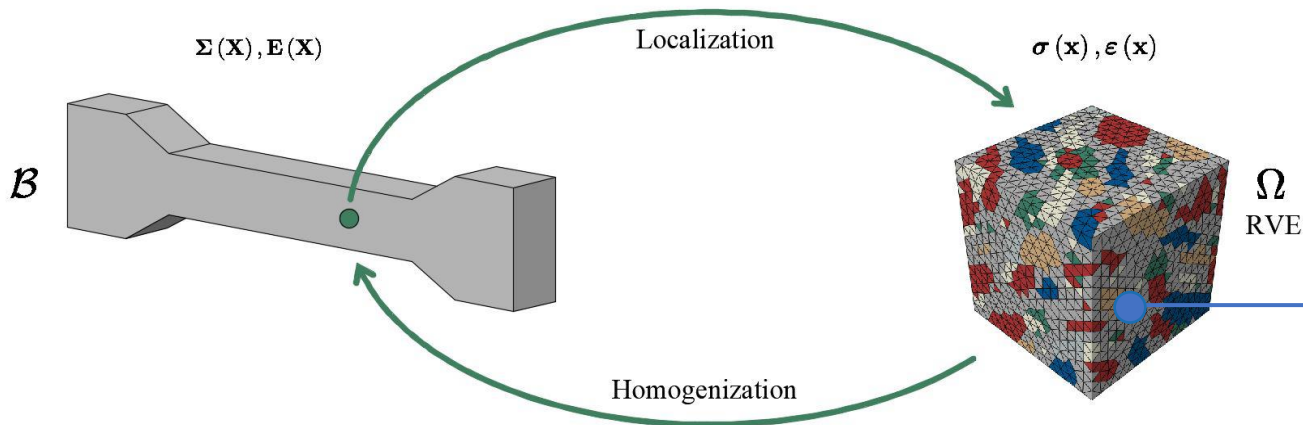
-  Captures the local phenomena
 - High accuracy
-
-  Very high computational burden (high number of history variables)
 - memory and computational time issues

Modeling strategies for Nonlinear Composites

Multiscale Analysis: a modeling approach considering both the microscale and the structural or macroscale, also known as **two-scale technique**.

MACROSCOPIC SCALE

MICROSCOPIC SCALE



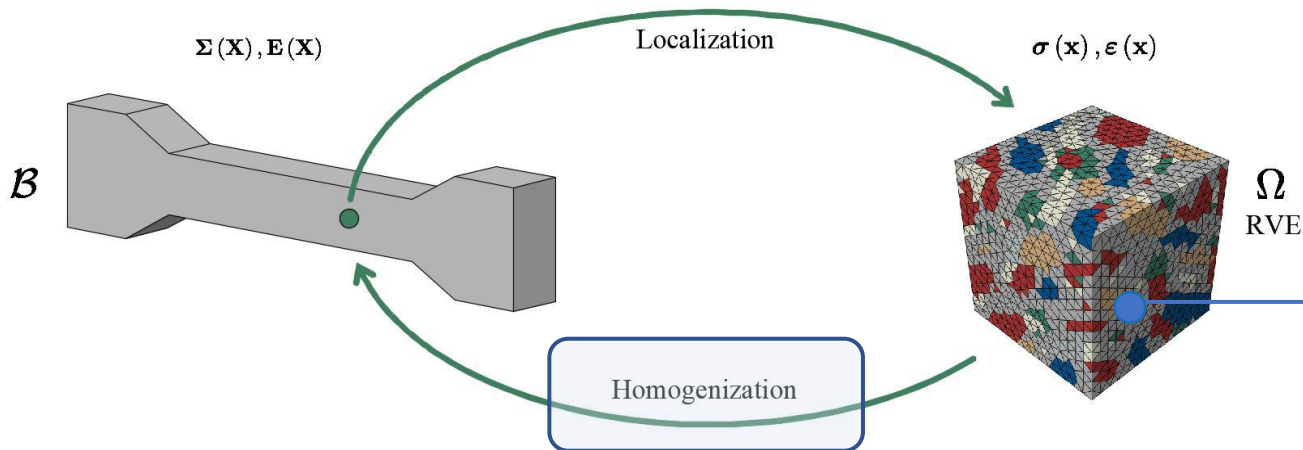
- Based on the **Principle of Scales Separations**
Nonlinear constituents

Modeling strategies for Nonlinear Composites

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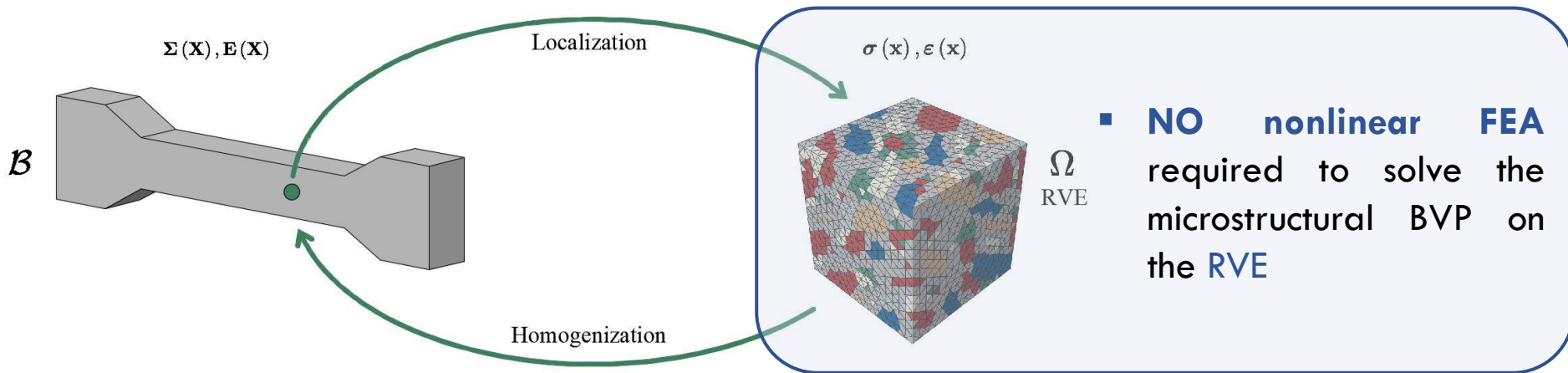
- **Analytical Homogenization Schemes** like the Hashin-Shtrikman (HS) variational principle introducing a reference material: very low number of unknowns, limited accuracy
- **Computational Homogenization Schemes** like the well known FE^2 : high accuracy but prohibitive computational effort

Reduced Order Models (ROMs)

- Numerical tool for **reducing the computational burden in computational homogenization** procedures

MACROSCOPIC SCALE

MICROSCOPIC SCALE



- A well known ROM is **the Transformation Field Analysis**, based on the use of eigenstrains in order to consider the inelastic deformation arising from the material nonlinearity

The main goals are

- The introduction of Reduced Order Models as an efficient numerical tool for lowering the computational cost in Computational Homogenization
- Developing a novel Hashin-Shtrikman based Reduced Order Homogenization Scheme (PWUHS) for studying the micromechanical response of composites having nonlinear constituents
- Implementing the proposed Homogenization Scheme in the framework of Multiscale Analysis to provide a software which is a reasonable compromise between efficiency and numerical accuracy
- The application of the proposed Reduced Order Homogenization for the Multiscale Analysis of 3D-Printed Composites

- The **PWUHS** Reduced Order Model
 - PWUHS Homogenization Scheme
 - Numerical Procedure
 - Numerical applications
 - Remarks
- **PWUHS** comparison to **PWUTFA**
 - Equivalence between PWUHS and PWUTFA
 - Numerical applications
 - Convergence study
 - Remarks
- **Multiscale Analysis** using PWUHS
 - Experimental validation
 - Auxetic composites
 - Implementing the Multiscale Procedure
 - Multiscale Analysis of Auxetic Honeycombs
- Concluding remarks

Macroscopic Problem

$$\mathbf{E} = \mathbf{B} \mathbf{U}$$

$$\mathbf{B}^T \boldsymbol{\Sigma} + \mathbf{b} = \mathbf{0} \quad \text{in } \mathcal{B}$$

$$\mathbf{N} \boldsymbol{\Sigma} = \mathbf{t} \quad \text{on } \mathcal{S}_t$$

$$\mathbf{U} = \mathbf{U}^* \quad \text{on } \mathcal{S}_u$$

- $\boldsymbol{\Sigma}$ not directly obtained from $\mathbf{E} \longrightarrow$ Solve Microscopic BVP

Microscopic Problem

- Average Strain

$$\mathbf{E} = \frac{1}{A} \int_{\Omega} \boldsymbol{\varepsilon} dA \quad \text{Scale transition}$$

- Subsets division

$$\Omega = \bigcup_{j=1}^m \Omega^j \longrightarrow$$

- Strain in each subset

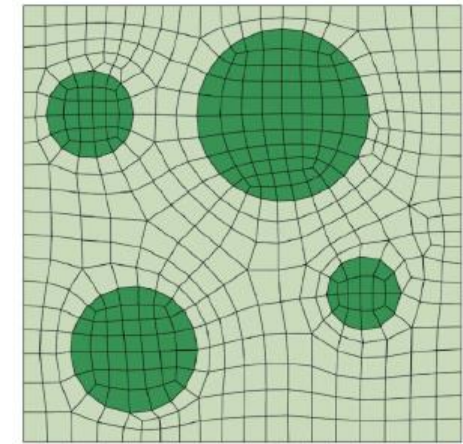
$$\boldsymbol{\varepsilon}^j = \mathbf{E} + \hat{\boldsymbol{\varepsilon}}^j \quad \text{Strain fluctuation}$$

- Stress in each subset

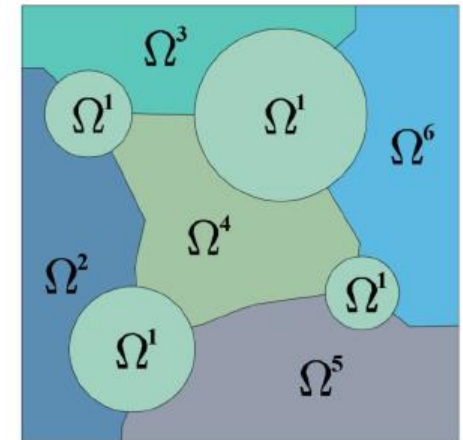
$$\boldsymbol{\sigma}^j = \mathbf{C}^j (\boldsymbol{\varepsilon}^j - \boldsymbol{\pi}^j) \quad \text{Nonlinear material}$$

- Average Stress

$$\boldsymbol{\Sigma} = \frac{1}{A} \int_{\Omega} \boldsymbol{\sigma} dA$$



Ω
RVE

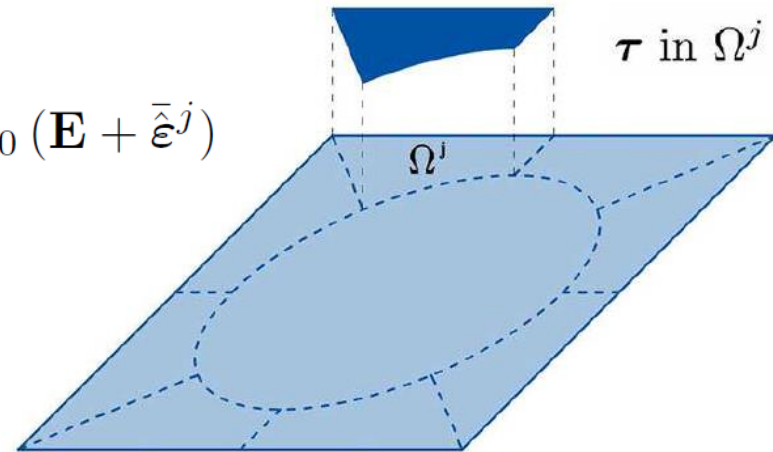


□ Introduction of an elastic reference material (Hashin-Shtrikman formulation)

- Uniform elasticity matrix \mathbf{C}_0 of the reference material
- Coupling via an **eigenstress**, the **polarization stress** $\boldsymbol{\tau}^j(\mathbf{x}) = \boldsymbol{\sigma}^j(\mathbf{x}) - \mathbf{C}_0 \boldsymbol{\varepsilon}^j(\mathbf{x})$
- Piecewise Uniform distribution of the polarization stress (**PWUHS**)

□ Constant polarization stress $\boldsymbol{\tau}^j$ in each subset Ω^j with $j = 1, \dots, m$

- Average polarization stress $\bar{\boldsymbol{\tau}}^j = \bar{\boldsymbol{\sigma}}^j - \mathbf{C}_0 (\mathbf{E} + \bar{\bar{\boldsymbol{\varepsilon}}}^j)$
- Polarization stresses $\mathbf{T} = \{\bar{\boldsymbol{\tau}}^1, \dots, \bar{\boldsymbol{\tau}}^m\}^T$
- Periodic strain fluctuation $\hat{\boldsymbol{\varepsilon}}^j(\mathbf{x}) = \boldsymbol{\Gamma}^j(\mathbf{x}) \mathbf{T}$
- Average strain fluctuation $\bar{\bar{\boldsymbol{\varepsilon}}}^j = \bar{\boldsymbol{\Gamma}}^j \mathbf{T}$



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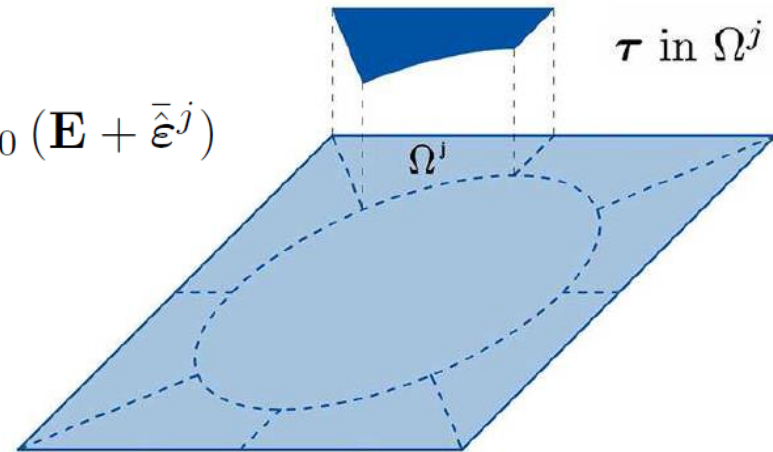
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- Periodic strain fluctuation $\hat{\boldsymbol{\varepsilon}}^j(\mathbf{x}) = \boldsymbol{\Gamma}^j(\mathbf{x}) \mathbf{T}$

- Average strain fluctuation $\bar{\bar{\boldsymbol{\varepsilon}}}^j = \boxed{\bar{\boldsymbol{\Gamma}}^j} \mathbf{T}$ Average Localization Matrices



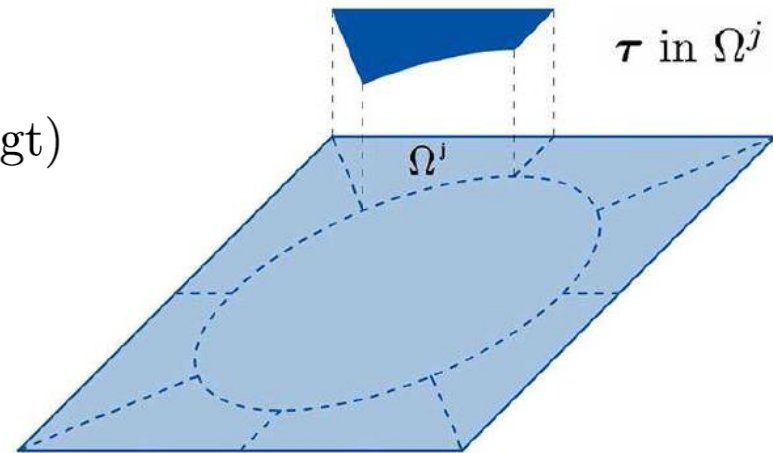
Precomputations on the elastic reference material

□ Construction of m average Localization Matrices $\bar{\mathbf{\Gamma}}^j$

- $3 \times m$ micromechanical elastic analyses (FEAP)
- a unit value is assigned to only one of the $3 \times m$ polarization stress components in \mathbf{T}

□ Choice of the reference elasticity matrix $\mathbf{C}_0 = \bar{\mathbf{C}}$

- elastic matrix of the composite $\bar{\mathbf{C}}$
- Voigt Homogenization theory $\mathbf{C}_0 = \bar{\mathbf{C}}(\text{Voigt})$
- FE homogenization $\mathbf{C}_0 = \bar{\mathbf{C}}(\text{FE})$



Precomputations on the elastic reference material

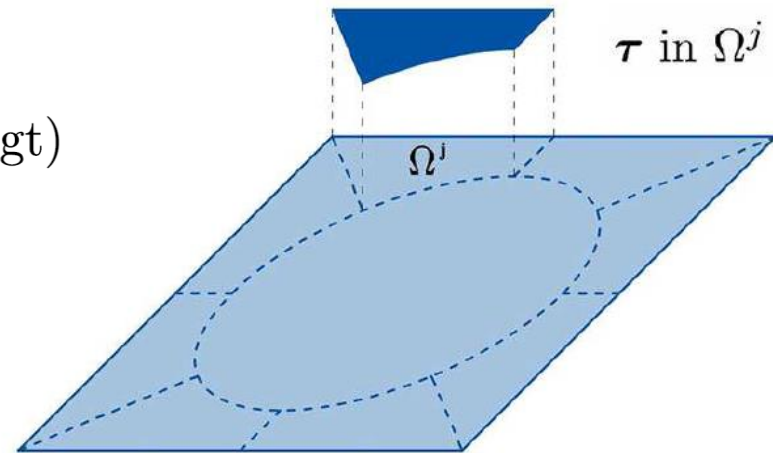
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- Voigt Homogenization theory $\mathbf{C}_0 = \bar{\mathbf{C}}(\text{Voigt})$
- FE homogenization $\mathbf{C}_0 = \bar{\mathbf{C}}(\text{FE})$

3 additional precomputations assigning a unit value to \mathbf{E} and averaging the stresses



Updated secant modulus approach

□ Correction of the elasticity matrix

$$\mathbf{C}_0 = \mu_0 \begin{bmatrix} \frac{1-\nu_0}{1-2\nu_0} & \frac{\nu_0}{1-2\nu_0} & 0 \\ \frac{\nu_0}{1-2\nu_0} & \frac{1-\nu_0}{1-2\nu_0} & 0 \\ 0 & 0 & \frac{1}{2} \end{bmatrix}.$$

- Updated secant shear modulus $\mu_0^t = \frac{1}{2} \frac{\|\boldsymbol{\Sigma}'\|}{\|\mathbf{E}'\|}.$
- Scaling factor $f_0 = \frac{\mu_0^t}{\mu_0}.$
- Correction of the average reference elastic matrix $\mathbf{C}_0^t = f_0 \mathbf{C}_0.$
- Correction of the average localization matrix $\bar{\mathbf{\Gamma}}^t = \frac{1}{f_0} \bar{\mathbf{\Gamma}}.$

Algorithm 1 PWUHS Homogenization Scheme

- **Offline stage (Precomputations):**

Perform $3 \times m$ elastic analyses, get localization tensors $\bar{\Gamma}^j$

- **Online stage at the typical time step t :**

```

1: Assign  $\mathbf{E}$ 
2: With the history variables  $\mathbf{\Pi}_n$  and  $\alpha_n$  at  $t_n$ , a trial state is
   evaluated in all the subsets (prediction)
3: if  $f^j \leq 0$  for  $j = 1, \dots, m$  then
4:   exit (elastic step)
5: else
6:   Get residual  $\mathbf{R}$  (correction)
7:   if  $|\mathbf{R}| > tol$  then (Newton loop)
8:     Solve the linearized problem
9:   Update the unknowns  $\mathbf{S}$ 
   go to line 6 for next iteration
10: else
11:   store  $\bar{\sigma}^j$  and the history variable  $\mathbf{\Pi}$  and  $\alpha$ 
12: end if
13: update  $\mathbf{C}_0$  and  $\bar{\Gamma}^j$  via the secant modulus approach (optional)
14: end if
    
```

Plasticity with isotropic hardening

- Average stress in Ω^j

$$\bar{\sigma}^j = \mathbf{C}^j (\mathbf{E} + \bar{\varepsilon} - \pi^j)$$

- Activation function

$$f = q - \sigma_y - K \alpha$$

- Accumulated plastic strain

$$\alpha = \int_0^t \|\dot{\pi}\| dt$$

- Evolution of π , α

$$\dot{\pi} = \dot{\gamma} \frac{\partial f}{\partial \sigma}, \quad \dot{\alpha} = \dot{\gamma}$$

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Backward Euler implicit
scheme time integration

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Predictor-Corrector
approach

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Trial state

$$\mathbf{\Pi} = \mathbf{\Pi}_n, \quad \alpha = \alpha_n$$

$$\bar{\tau}^j = \bar{\sigma}^j - \mathbf{C}_0 (\mathbf{E} + \bar{\varepsilon}^j)$$

$$\bar{\varepsilon}^j = \bar{\Gamma}^j \mathbf{T}$$

$$\bar{\sigma}^j = \mathbf{C}^j (\mathbf{E} + \bar{\varepsilon} - \pi^j)$$

$$f^j = q - \sigma_y - K \alpha^j$$

$$q^j = \sqrt{\frac{3}{2} \bar{\sigma}^T \mathbf{M} \bar{\sigma}}$$

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→ Elastic Step

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Correction

System of $13xm$ nonlinear
equations solved via
Newton Method

Algorithm 1 PWUHS Homogenization Scheme

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- **Online stage at the typical time step t :**

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3: **if** $f^j \leq 0$ for $j = 1, \dots, m$ **then**

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11: store $\bar{\sigma}^j$ and the history variable Π and α

12: **end if**

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→ Variables storing at convergence

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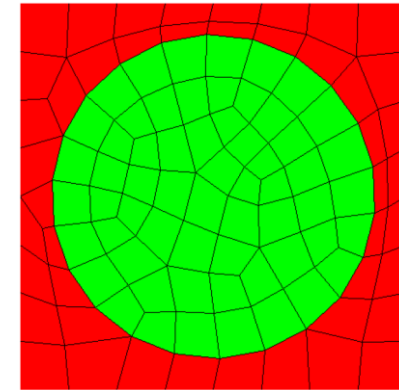
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➡ Reference and localization
matrix updates

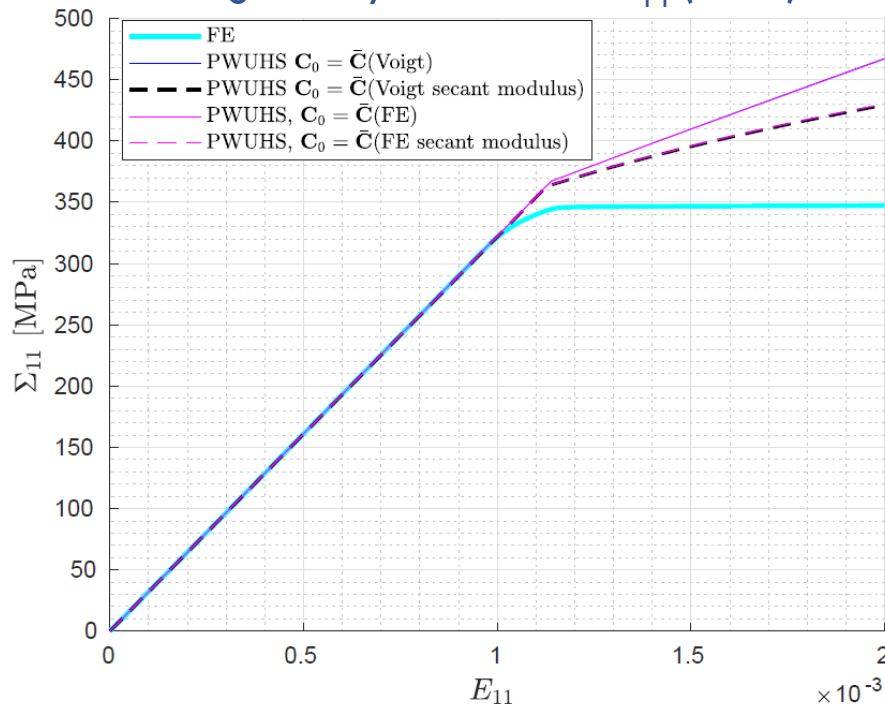
Ceramic inclusion in a metal matrix

E^1 [GPa]	ν^1	k [MPa]	σ_y [MPa]	E^2 [GPa]	ν^2
210	0.3	100	300	300	0.25

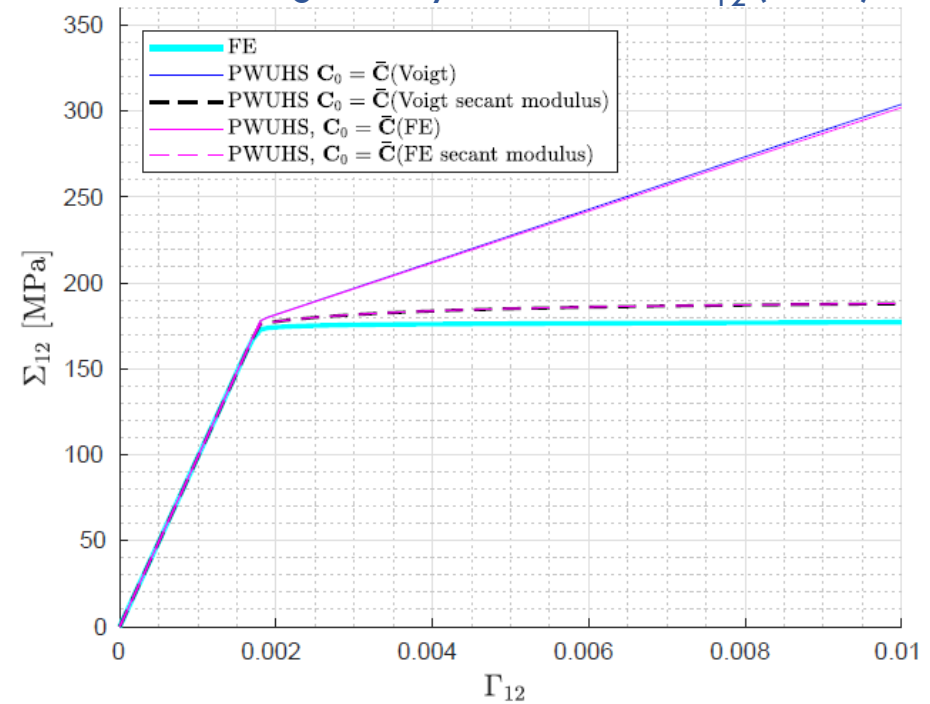


- Single inclusion UC (UC-1), 10x10mm, $c^2 = 0.54$
- Number of history variables: FE = 420, PWUHS = 8

Loading history in terms of E_{11} (LC-1)



Loading history in terms of Γ_{12} (LC-2)

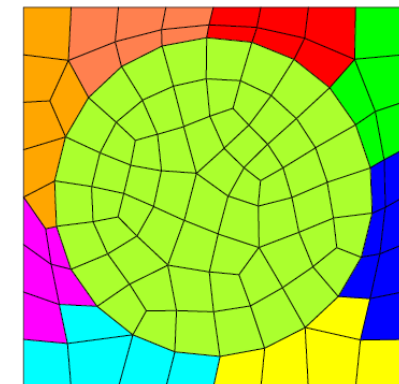
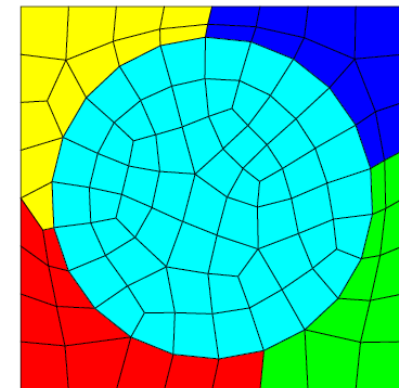
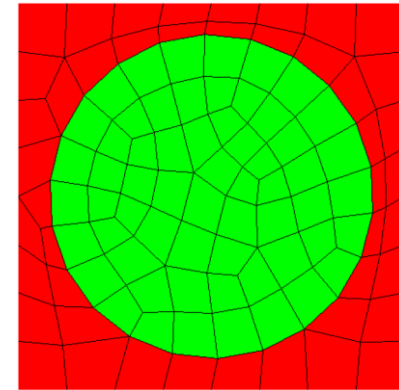
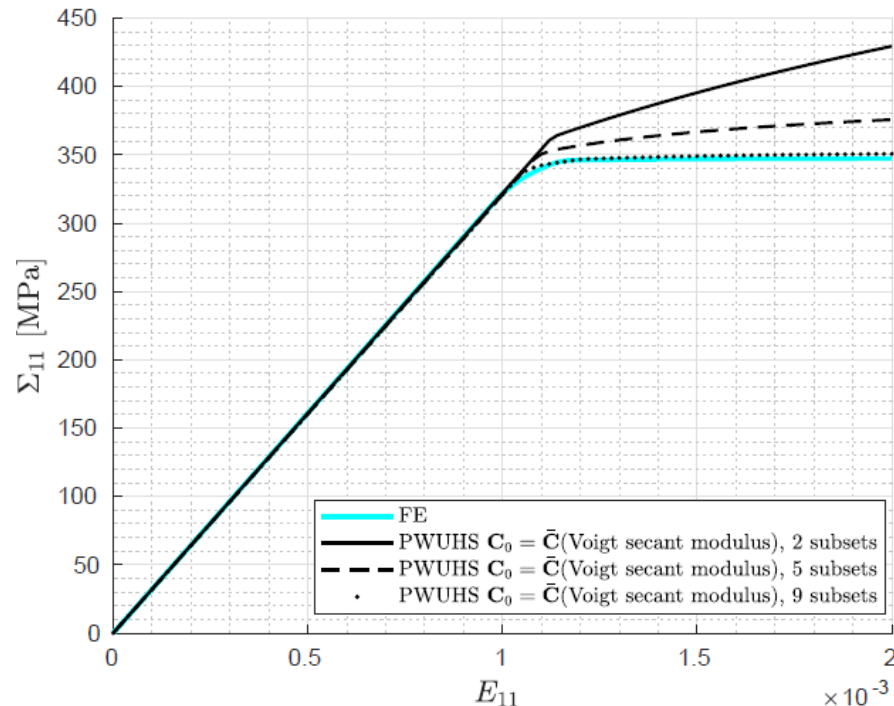


Ceramic inclusion in a metal matrix

E^1 [GPa]	ν^1	k [MPa]	σ_y [MPa]	E^2 [GPa]	ν^2
210	0.3	100	300	300	0.25

- Increasing number of subsets (2, 5, 9) in UC-1
- 8, 20, 36 history variables

LC-1



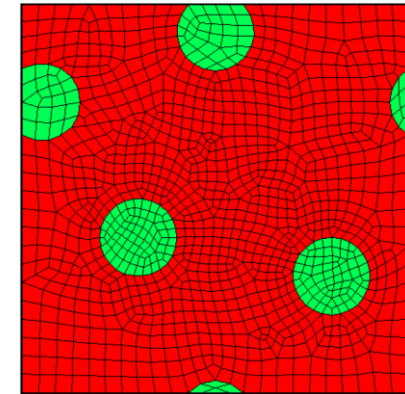
PWUHS numerical applications



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Ceramic inclusion in a metal matrix

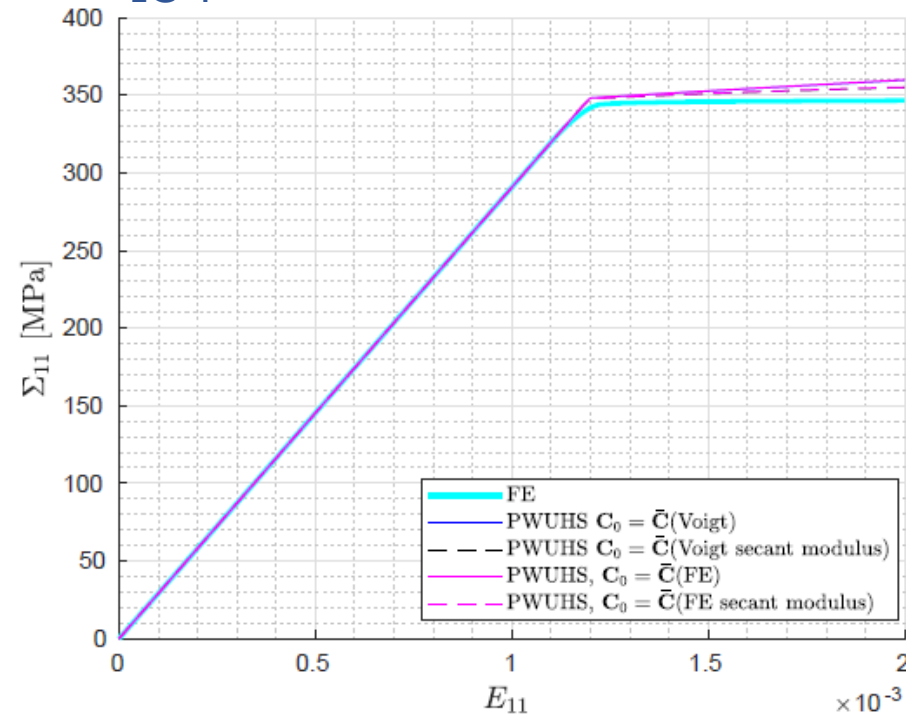
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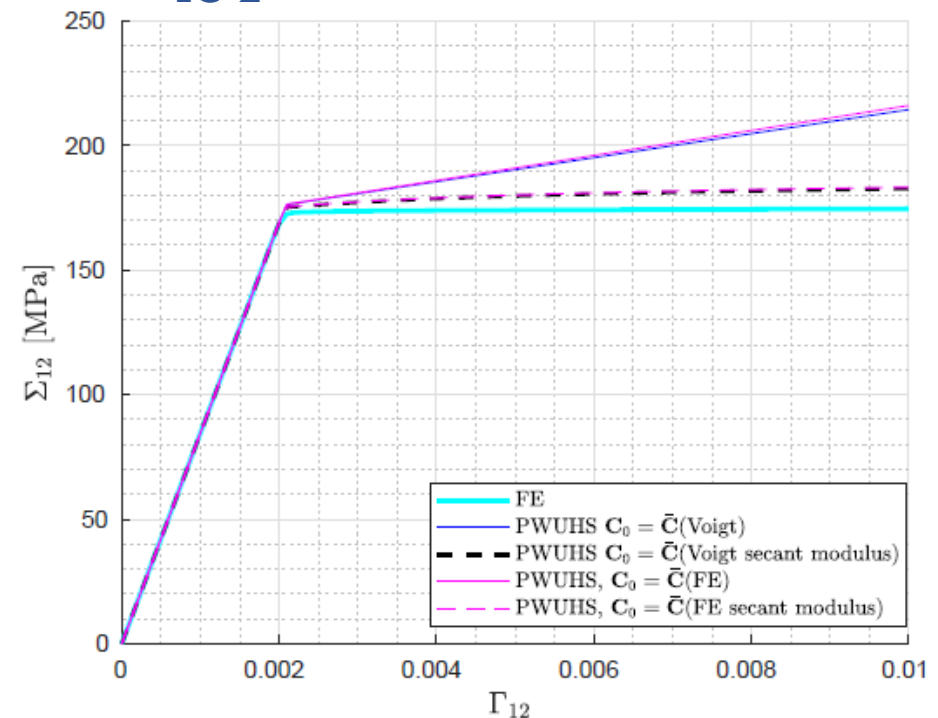
■ Complex UC, $c^2 = 0.12$ (UC-2)

■ Number of history variables: FE = 4856, PWUHS = 8

■ LC-1



■ LC-2



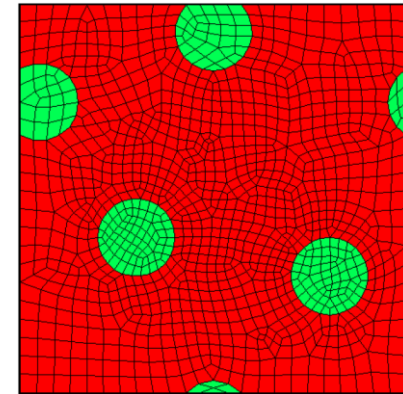
PWUHS numerical applications



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Fiber reinforced epoxy resin

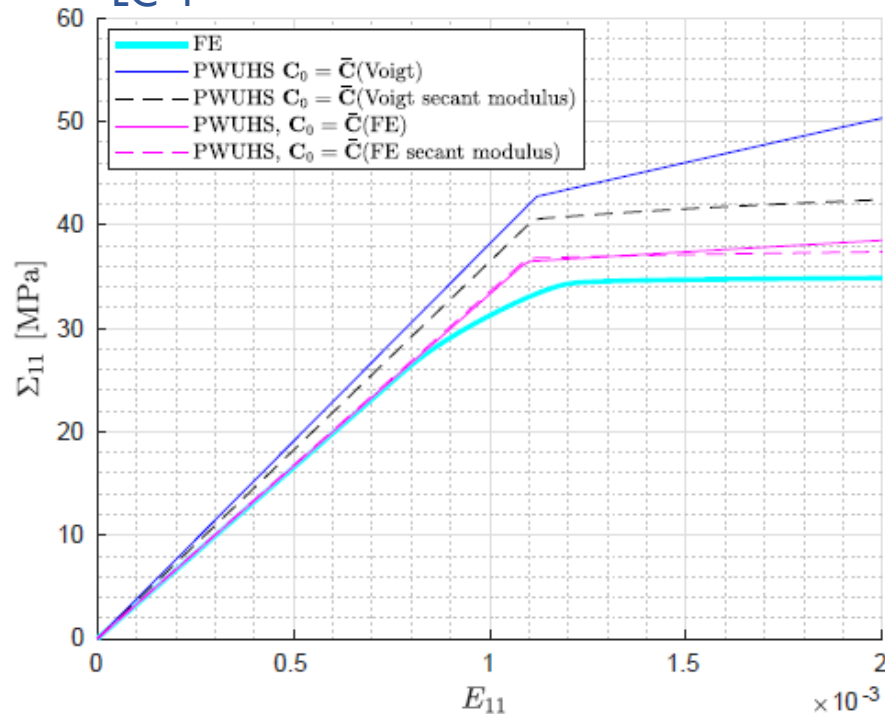
E^1 [GPa]	ν^1	k [MPa]	σ_y [MPa]	E^2 [GPa]	ν^2
21	0.3	100	30	210	0.25



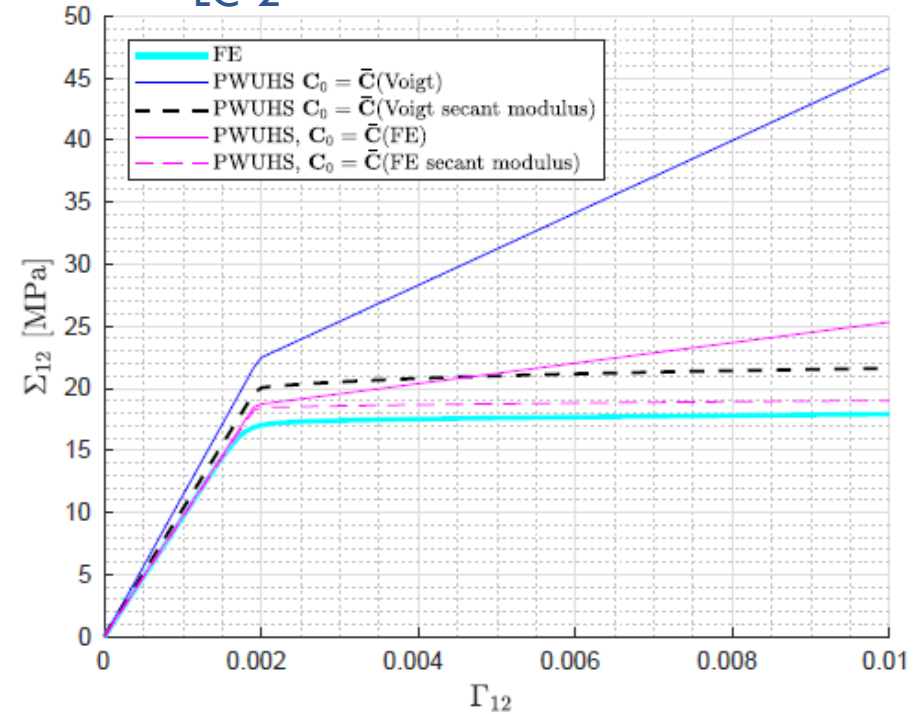
■ UC-2, $c^2 = 0.12$

■ Number of history variables: FE = 4856, PWUHS = 8

■ LC-1



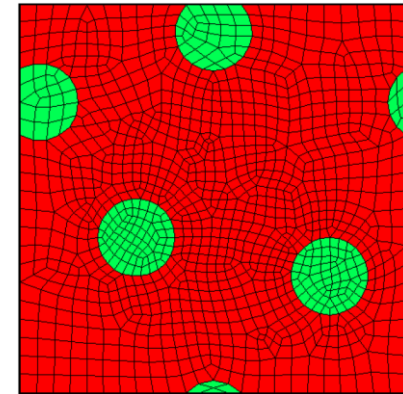
■ LC-2



Fiber reinforced epoxy resin

History Variables (elastoplasticity with isotropic hardening)

- FE = 4856
- PWUHS = 8



Load Case	\mathbf{C}_0	CPU time FE [s]	PWUHS speed-up
LC-1	$\bar{\mathbf{C}}$ (Voigt)	711.07	4182.76
	$\bar{\mathbf{C}}$ (FE)		582.84
	$\bar{\mathbf{C}}$ (Voigt), secant		1341.64
	$\bar{\mathbf{C}}$ (FE), secant		470.90
LC-2	$\bar{\mathbf{C}}$ (Voigt)	855.31	4072.90
	$\bar{\mathbf{C}}$ (FE)		562.70
	$\bar{\mathbf{C}}$ (Voigt), secant		425.52
	$\bar{\mathbf{C}}$ (FE), secant		409.23

REMARKS

- ❑ PWUHS is an efficient numerical tool for the analysis of composites, results are in agreement with the nonlinear FE analyses
- ❑ A remarkable reduction of the number of history variables and computational effort, with respect to FE analysis, is achieved
- ❑ Deriving the overall elasticity matrix by FE homogenization $\mathbf{C}_0 = \bar{\mathbf{C}}(\text{FE})$ increases the method accuracy
- ❑ The **updated secant modulus approach** increases the method accuracy slightly affecting the computational efficiency

- ❑ The PWUHS Reduced Order Model
 - Homogenization of Nonlinear Composites
 - Numerical Procedure
 - Numerical applications
 - Remarks
- ❑ PWUHS comparison to PWUTFA
 - Equivalence between PWUHS and PWUTFA
 - Numerical applications
 - Convergence study
 - Remarks
- ❑ Multiscale Analysis using PWUHS
 - Auxetic composites
 - Implementing the Multiscale Procedure
 - Multiscale Analysis of Auxetic Honeycombs
 - Experimental validation
- ❑ Concluding remarks

□ Eigenstrain based Reduced Order Model

- Uniform inelastic strain distribution (UTFA)
- Piecewise Uniform Inelastic Strain distribution (**PWUTFA**)
- Nonuniform inelastic strain distribution (NUTFA)

□ Constant inelastic strain π^j in each subset Ω^j with $j = 1, \dots, m$

- Periodic strain fluctuation $\hat{\epsilon}^j(x) = e^j(x) + p^j(x)$

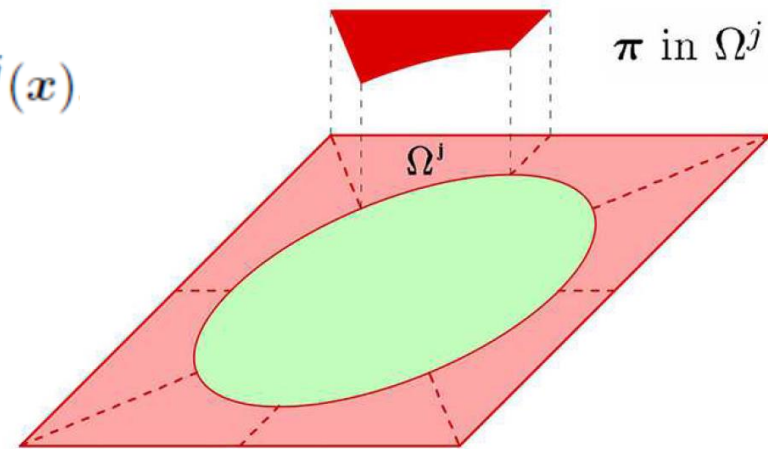
- Macro strain localization $e^j(x) = \mathbf{L}_E^j(x)\mathbf{E}$

- Inelastic strain $\mathbf{\Pi} = \{\pi^1, \dots, \pi^m\}^T$

- Inelastic strain localization $p^j(x) = \mathbf{L}_\pi^j(x)\mathbf{\Pi}$

- Average strain fluctuation $\bar{\epsilon}^j = \boxed{\bar{\mathbf{L}}_E^j} \mathbf{E} + \boxed{\bar{\mathbf{L}}_\pi^j} \mathbf{\Pi}$

Average Localization Matrices



Precomputations on the real composite

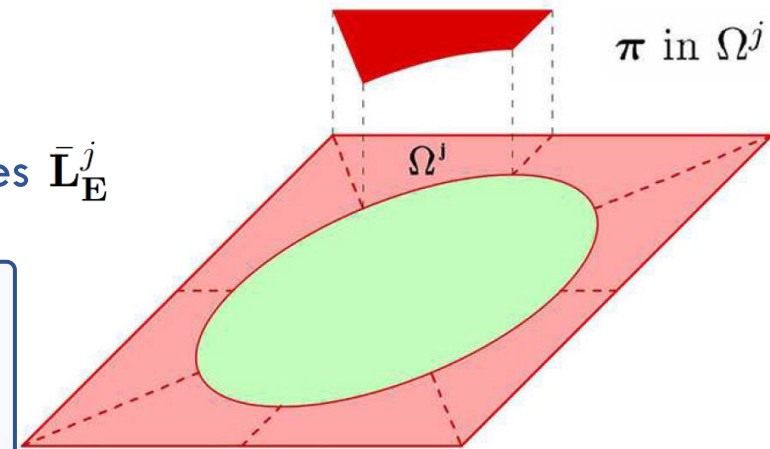
□ Construction of m average Localization Matrices $\bar{\mathbf{L}}_{\mathbf{E}}^j$

- 3 micromechanical elastic analyses
 - unit value is assigned to one of the three macrostrain \mathbf{E} components
- NOT REQUIRED IN PWUHS HOMOGENIZATION

□ Construction of m average Localization Matrices $\bar{\mathbf{L}}_{\mathbf{E}}^j$

- $3 \times m$ micromechanical nonlinear analyses
- a unit value is assigned to only one of the $3 \times m$ inelastic strain components in $\mathbf{\Pi}$

ELASTIC IN PWUHS HOMOGENIZATION



Backward Euler implicit scheme time integration

□ Predictor-corrector approach

- History variables

$$\mathbf{\Pi} = \mathbf{\Pi}_n, \quad \alpha = \alpha_n$$

- Trial state

$$\bar{\bar{\epsilon}}^j = \bar{\mathbf{L}}_{\mathbf{E}}^j \mathbf{E} + \bar{\mathbf{L}}_{\pi}^j \mathbf{\Pi}$$

$$\bar{\sigma}^j = \mathbf{C}^j (\mathbf{E} + \bar{\bar{\epsilon}} - \pi^j)$$

$$f^j = \sqrt{\frac{3}{2}} \|\bar{\sigma}^j\| - \sigma_y - K \alpha^j$$

IF $f^j \leq 0$, in all the subsets Ω^j \longrightarrow Elastic Step

else \longrightarrow Correction via Newton-Raphson method

Plasticity with isotropic hardening

- Average stress in each subset

$$\bar{\sigma}^j = \mathbf{C}^j (\mathbf{E} + \bar{\bar{\epsilon}} - \pi^j)$$

- Activation function

$$f = q - \sigma_y - K \alpha,$$

PWUHS comparison to PWUTFA

Equivalence between PWUHS and PWUTFA

- Composite made by two materials is divided in two subsets Ω^1 and Ω^2
- Assuming that:
 - **Material 1** in subset Ω^1 is **elastic**, $\pi^1 = 0$;
 - **Material 2** in subset Ω^2 is **elastoplastic**, $\pi^2 \neq 0$;
 - Same elastic properties $E^1 = E^2$, $\nu^1 = \nu^2 \rightarrow C^1 = C^2 = C$

PWUHS

$$C^1 = C^2 = C = C_0$$

$$\bar{\tau}^1 = 0,$$

$$\bar{\tau}^2 = -C\pi^2$$

$$\rightarrow \mathbf{T} = \{0, \bar{\tau}^2\}^T,$$

$$\bar{\bar{\epsilon}}^1 = \bar{\Gamma}^1 \mathbf{T},$$

$$\bar{\bar{\epsilon}}^2 = \bar{\Gamma}^2 \mathbf{T},$$

$$\bar{\sigma}^1 = C \left(\mathbf{E} + \bar{\Gamma}^1 \mathbf{T} \right),$$

$$\bar{\sigma}^2 = C \left(\mathbf{E} + \bar{\Gamma}^2 \mathbf{T} - \pi^2 \right)$$

PWUTFA

$$\bar{\bar{\epsilon}}^1 = \bar{\mathbf{L}}_\pi^1 \Pi,$$

$$\bar{\bar{\epsilon}}^2 = \bar{\mathbf{L}}_\pi^2 \Pi,$$

$$\bar{\sigma}^1 = C \left(\mathbf{E} + \bar{\mathbf{L}}_\pi^1 \Pi \right)$$

$$\bar{\sigma}^2 = C \left(\mathbf{E} + \bar{\mathbf{L}}_\pi^2 \Pi - \pi^2 \right)$$

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PWUHS

$$C^1 = C^2 = C = C_0$$

$$\begin{aligned} \bar{\tau}^1 &= 0, \\ \bar{\tau}^2 &= -C\pi^2 \end{aligned}$$

$$\mathbf{T} = \{0, \bar{\tau}^2\}^T$$

$$\begin{aligned} \bar{\epsilon}^1 &= \bar{\Gamma}^1 \mathbf{T}, \\ \bar{\epsilon}^2 &= \bar{\Gamma}^2 \mathbf{T} \end{aligned} \quad \rightarrow \quad \begin{aligned} \bar{\epsilon}^1 &= \bar{\Gamma}^1 \mathbf{T} = -\bar{\Gamma}^1 C \Pi \\ \bar{\epsilon}^2 &= \bar{\Gamma}^2 \mathbf{T} = -\bar{\Gamma}^2 C \Pi \end{aligned}$$

$$\bar{\sigma}^1 = C \left(\mathbf{E} + \bar{\Gamma}^1 \mathbf{T} \right),$$

$$\bar{\sigma}^2 = C \left(\mathbf{E} + \bar{\Gamma}^2 \mathbf{T} - \pi^2 \right)$$

PWUTFA

$$\bar{\epsilon}^1 = \bar{\mathbf{L}}_\pi^1 \Pi$$

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PWUHS

$$C^1 = C^2 = C = C_0$$

$$\bar{\tau}^1 = 0,$$

$$\bar{\tau}^2 = -C\pi^2$$

$$\bar{\varepsilon}^1 = \bar{\Gamma}^1 T,$$

$$\bar{\varepsilon}^2 = \bar{\Gamma}^2 T,$$

$$\bar{\sigma}^1 = C(E + \bar{\Gamma}^1 T),$$

$$\bar{\sigma}^2 = C(E + \bar{\Gamma}^2 T - \pi^2)$$

$$T = \{0, \bar{\tau}^2\}^T,$$

$$\begin{aligned} \bar{\varepsilon}^1 &= \bar{\Gamma}^1 T = -\bar{\Gamma}^1 C \Pi \\ \bar{\varepsilon}^2 &= \bar{\Gamma}^2 T = -\bar{\Gamma}^2 C \Pi \end{aligned}$$

$$\begin{aligned} \bar{L}_\pi^1 &= -\bar{\Gamma}^1 C \\ \bar{L}_\pi^2 &= -\bar{\Gamma}^2 C \end{aligned}$$

PWUTFA

$$\begin{aligned} \bar{\varepsilon}^1 &= \bar{L}_\pi^1 \Pi \\ \bar{\varepsilon}^2 &= \bar{L}_\pi^2 \Pi \end{aligned}$$

$$\bar{\sigma}^1 = C(E + \bar{L}_\pi^1 \Pi)$$

$$\bar{\sigma}^2 = C(E + \bar{L}_\pi^2 \Pi - \pi^2)$$

PWUHS comparison to PWUTFA

Equivalence between PWUHS and PWUTFA

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$$\bar{\varepsilon}^1 = \bar{\Gamma}^1 T = -\bar{\Gamma}^1 C \Pi$$

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$$\bar{\varepsilon}^1 = \bar{L}_\pi^1 \Pi$$

$$\bar{\varepsilon}^2 = \bar{L}_\pi^2 \Pi$$

$$\bar{\sigma}^1 = C(E + \bar{\Gamma}^1 T),$$

$$\bar{\sigma}^2 = C(E + \bar{\Gamma}^2 T - \pi^2)$$

$$\bar{\sigma}^1 = C(E + \bar{L}_\pi^1 \Pi)$$

$$\bar{\sigma}^2 = C(E + \bar{L}_\pi^2 \Pi - \pi^2)$$

$$\Sigma = c^1 \bar{\sigma}^1 + c^2 \bar{\sigma}^2$$

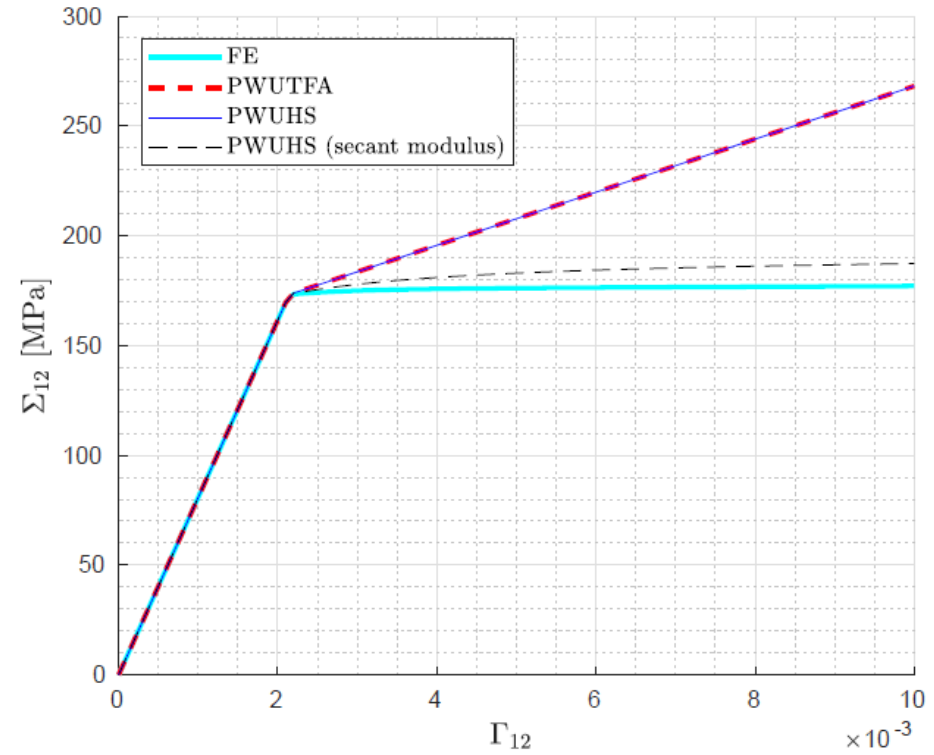
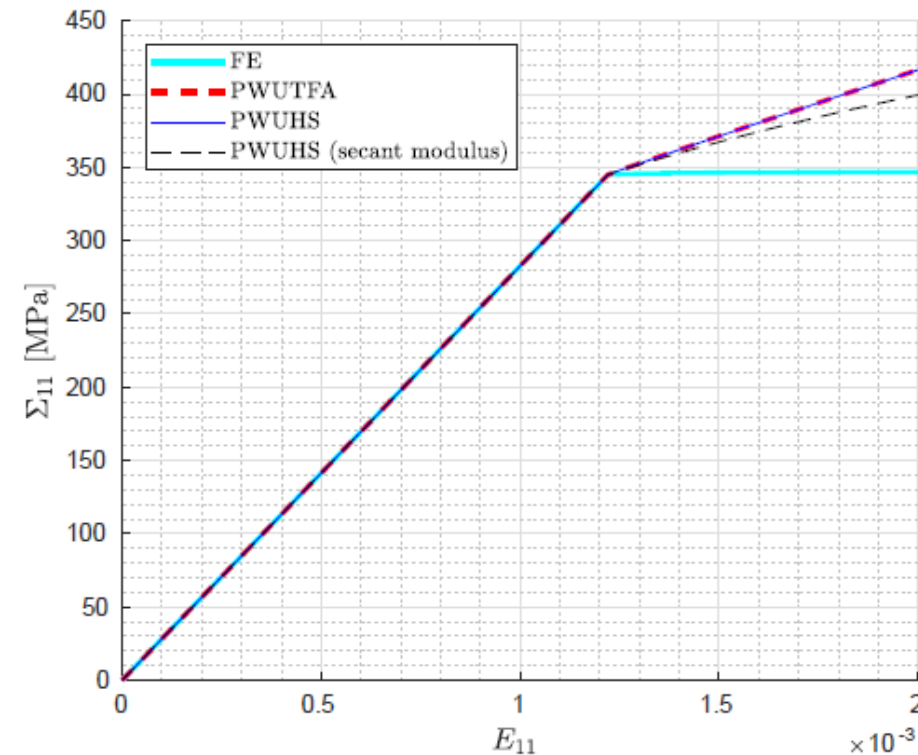
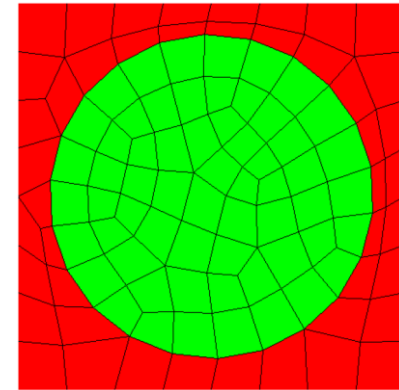
PWUHS comparison to PWUTFA



Numerical applications:

Homogeneous composite material

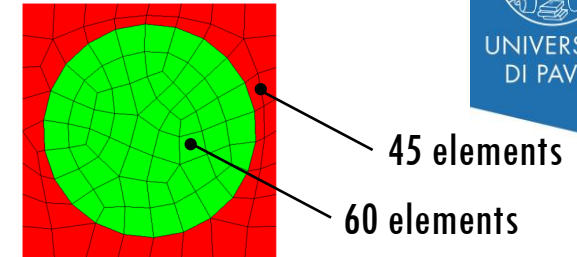
E^1 [GPa]	ν^1	k [GPa]	σ_y [MPa]	E^2 [GPa]	ν^2
210	0.3	100	300	210	0.3



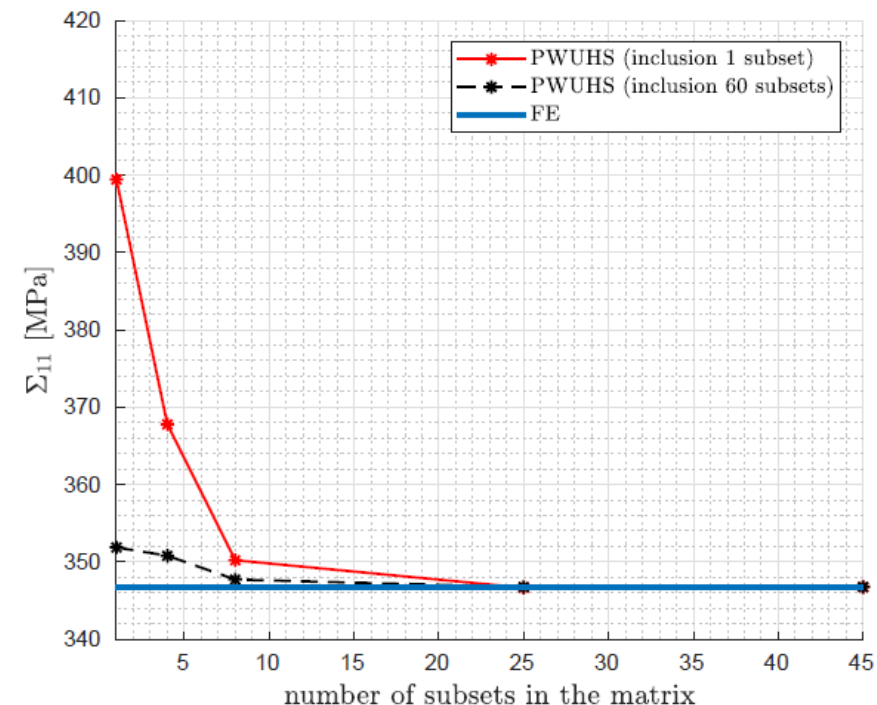
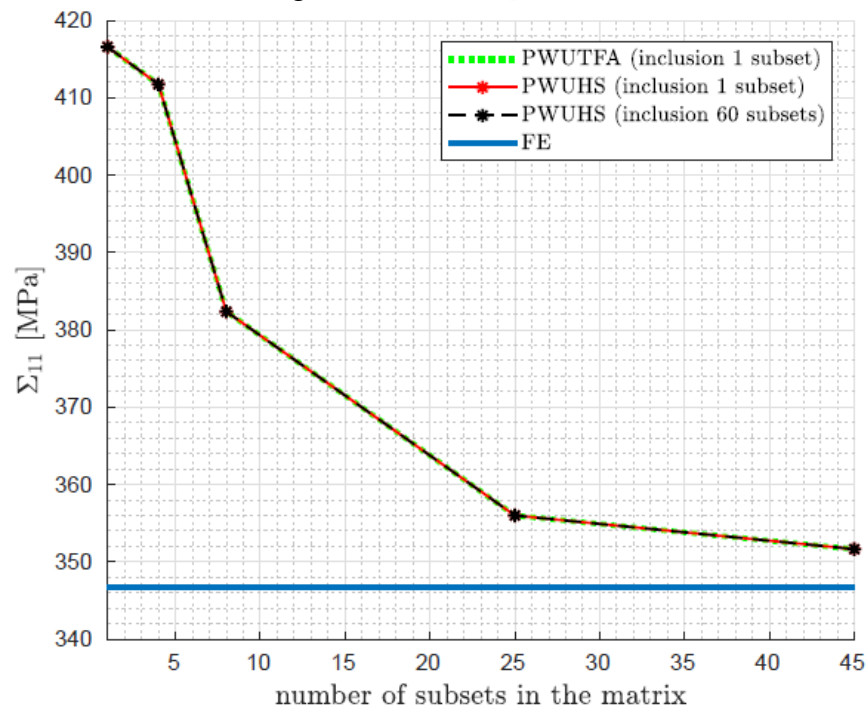
PWUHS comparison to PWUTFA

Convergence study:

- **PWUTFA**: 1 subset in the inclusion, subsets refinement in the matrix (up to 45);
- **PWUHS**: 1 or 60 subsets in the inclusion and subsets refinement in the matrix considering fixed C_0



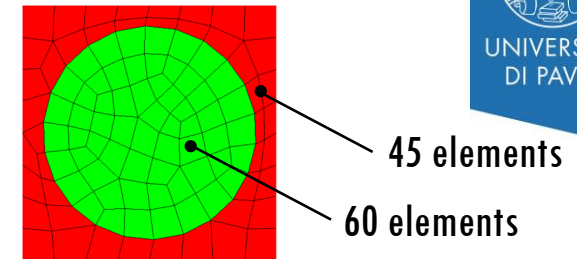
- **PWUHS**: 1 or 60 subsets in the inclusion, subsets refinement in the matrix (up to 45) using the **secant modulus approach**



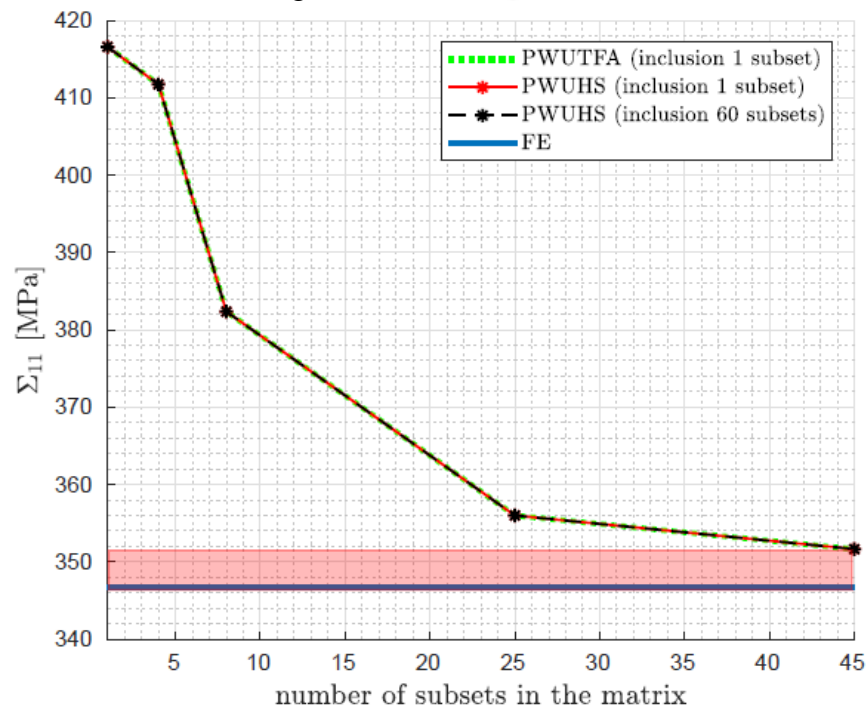
PWUHS comparison to PWUTFA

Convergence study:

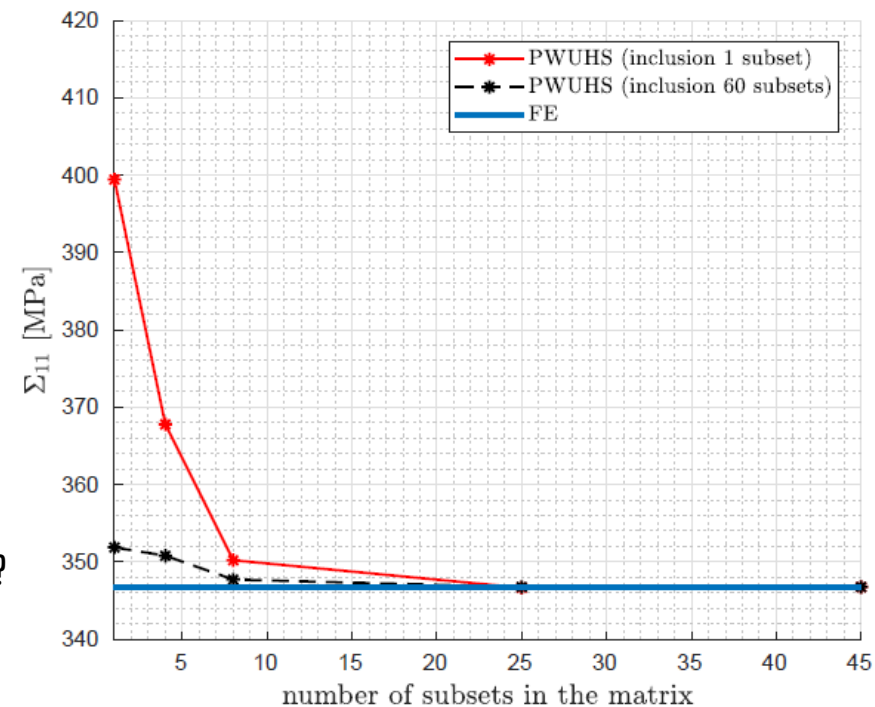
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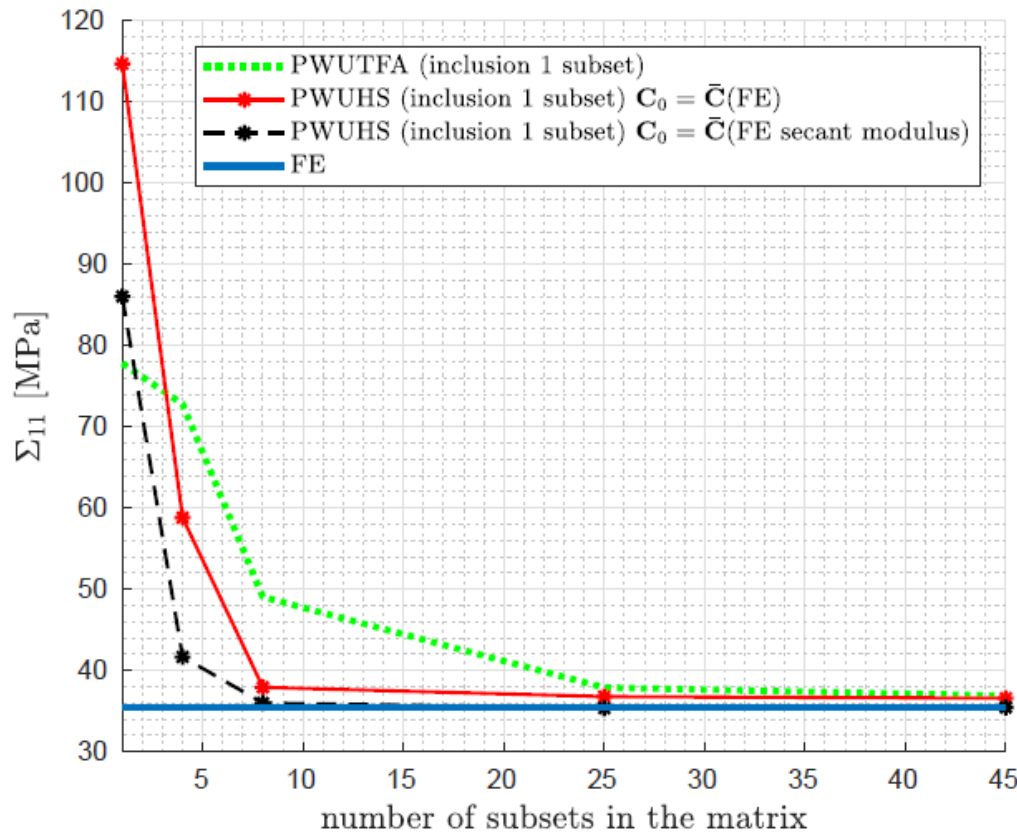
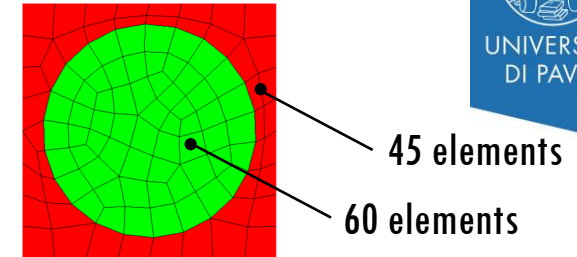
LOCKING ?



PWUHS comparison to PWUTFA

□ Convergence study:

- 1 subset in the inclusion, subsets refinement in the matrix (up to 45)



□ Fiber reinforced epoxy resin

E^1 [GPa]	ν^1	k [MPa]	σ_y [MPa]	E^2 [GPa]	ν^2
21	0.3	100	30	210	0.25

PWUHS comparison to PWUTFA



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Numerical application:

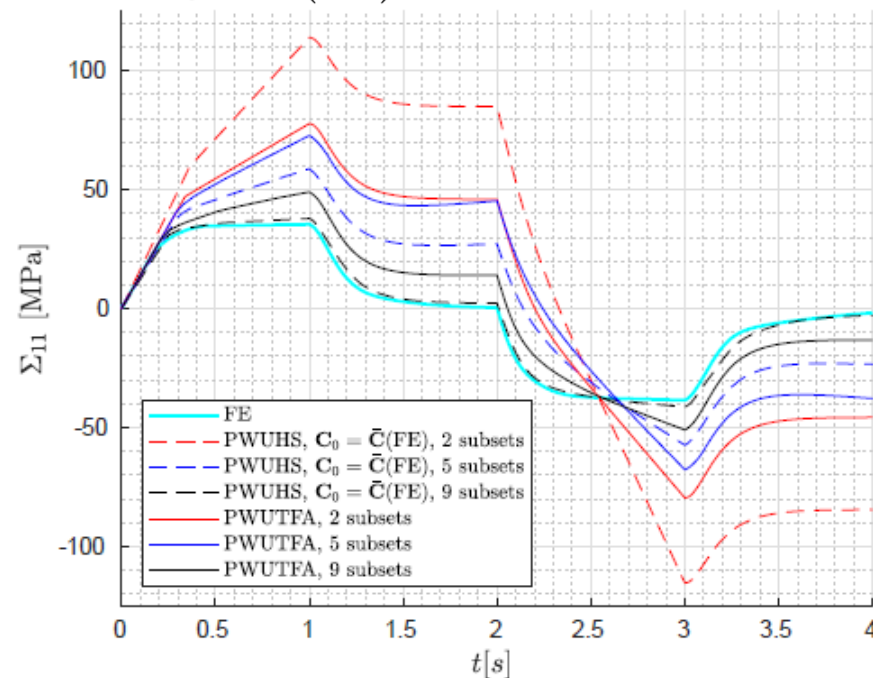
- Heterogeneous composite material
- Increasing number of subsets

E^1 [GPa]	ν^1	k [MPa]	σ_y [MPa]	E^2 [GPa]	ν^2
21	0.3	100	30	210	0.25

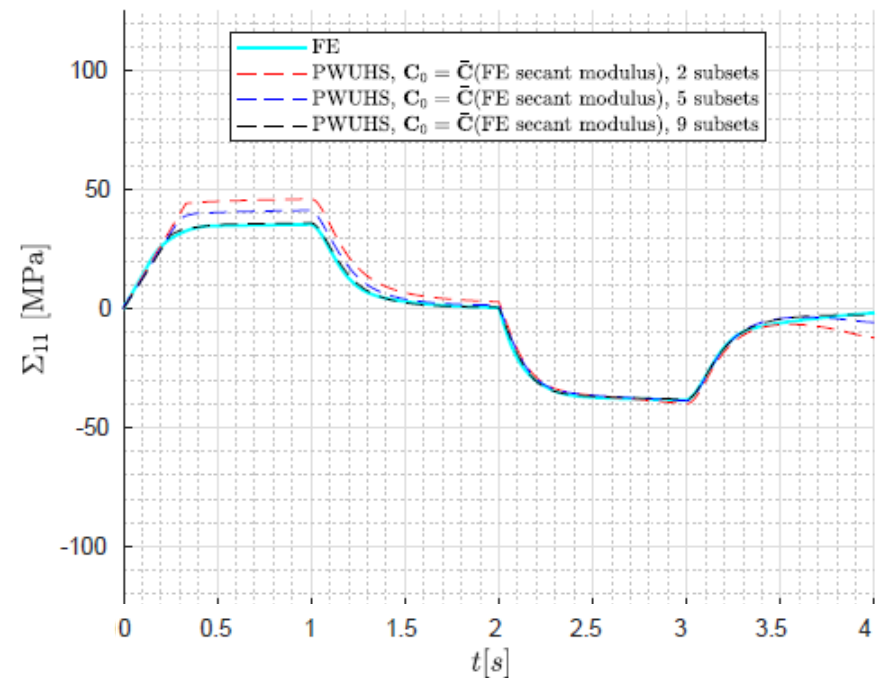
LC-3

t [s]	E_{11}	E_{12}
0	0	0
1	0.002	0
2	0.002	0.01
3	-0.002	0.01
4	-0.002	0

$C_0 = \bar{C}(\text{FE})$



Updated secant modulus approach



PWUHS comparison to PWUTFA



Relative error in numerical applications

$$\text{err} = \frac{\|\Sigma_t - \Sigma_t^{\text{FE}}\|}{\|\Sigma_t^{\text{FE}}\|}$$

■ Σ_{11}

	$t = 1$			$t = 2$			$t = 3$			$t = 4$		
subsets	2	5	9	2	5	9	2	5	9	2	5	9
PWUHS, $\mathbf{C}_0 = \bar{\mathbf{C}}$	2.216	0.659	0.069	199.099	63.095	4.288	1.997	0.491	0.075	47.951	12.532	0.665
PWUHS, $\mathbf{C}_0 = \bar{\mathbf{C}}$, secant	0.301	0.167	0.017	5.790	2.251	0.250	0.038	0.006	0.009	6.066	2.363	0.586
PWUTFA	1.194	1.053	0.383	107.205	105.600	32.084	1.067	0.758	0.324	25.458	20.865	6.600

■ Σ_{22}

	$t = 1$			$t = 2$			$t = 3$			$t = 4$		
subsets	2	5	9	2	5	9	2	5	9	2	5	9
PWUHS, $\mathbf{C}_0 = \bar{\mathbf{C}}$	0.486	0.120	0.176	134.447	219.465	16.600	0.409	0.271	0.119	316.208	114.960	92.263
PWUHS, $\mathbf{C}_0 = \bar{\mathbf{C}}$, secant	0.188	0.206	0.213	24.106	4.502	2.906	0.134	0.151	0.194	163.867	67.057	42.529
PWUTFA	0.082	0.087	0.080	241.957	449.935	42.721	0.063	0.302	0.050	447.873	301.884	79.570

■ Σ_{12}

	$t = 1$			$t = 2$			$t = 3$			$t = 4$		
subsets	2	5	9	2	5	9	2	5	9	2	5	9
PWUHS, $\mathbf{C}_0 = \bar{\mathbf{C}}$	—	—	—	1.824	0.388	0.079	160.854	23.243	4.378	0.079	0.053	0.001
PWUHS, $\mathbf{C}_0 = \bar{\mathbf{C}}$, secant	—	—	—	0.074	0.002	0.018	8.944	0.717	0.278	0.048	0.005	0.024
PWUTFA	—	—	—	1.034	0.825	0.670	91.878	56.333	54.449	0.059	0.078	0.027

REMARKS

- Numerical evidence of the **equivalence** between the two reduced order models, **PWUTFA** and **PWUHS**, for composites with the **same elastic properties**, is given
- Convergence study proves that both ROMs results tend toward to FE solution increasing the number of subsets
- **PWUHS** using the **updated secant modulus approach** gives an **accurate prediction of the macroscopic stresses** Σ also for complex loading-unloading history, even if a discretization in a low number of subsets is considered
- The updated secant modulus approach gives a faster convergence to the FE solution in comparison to PWUTFA and PWUHS with fixed $\mathbf{C}_0 = \bar{\mathbf{C}}$

Publications:

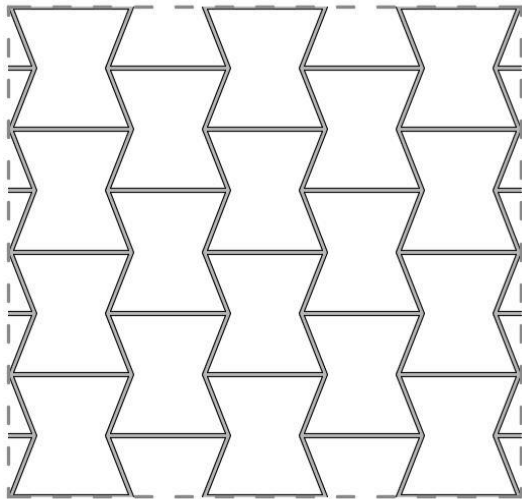
A. Castrogiovanni, S. Marfia, F. Auricchio, E. Sacco, “TFA and HS based homogenization techniques for nonlinear composites”, International Journal of Solids and Structures, Volume 225, 2021

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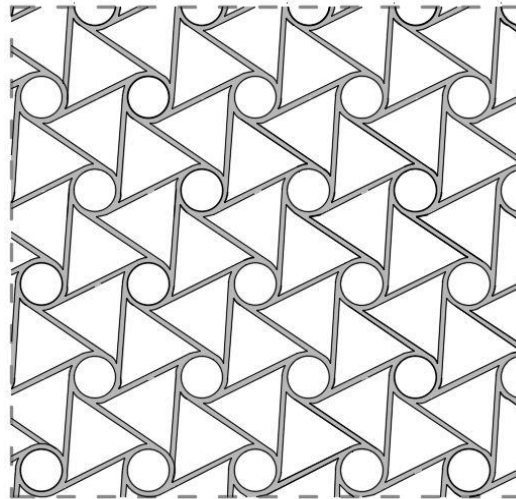
Auxetic materials

- **Negative Poisson ratio**
- Enhance the mechanical properties of crash absorbers
- Auxetic foams, auxetic laminates , **auxetic honeycombs**

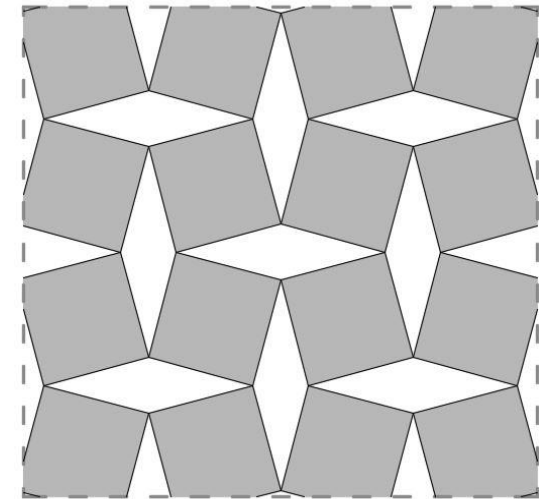
▪ RE-ENTRANT TYPE



▪ CHIRAL TYPE



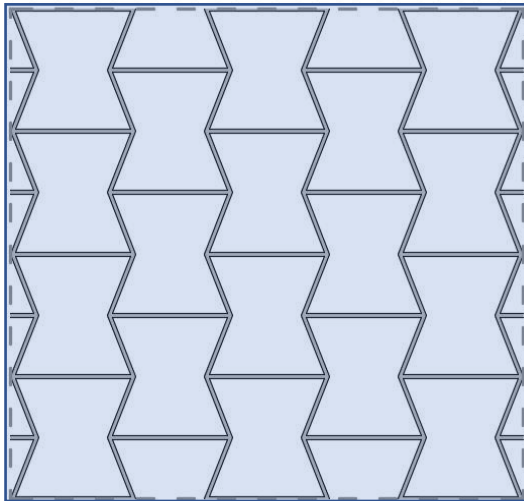
▪ ROTATING POLYGONS



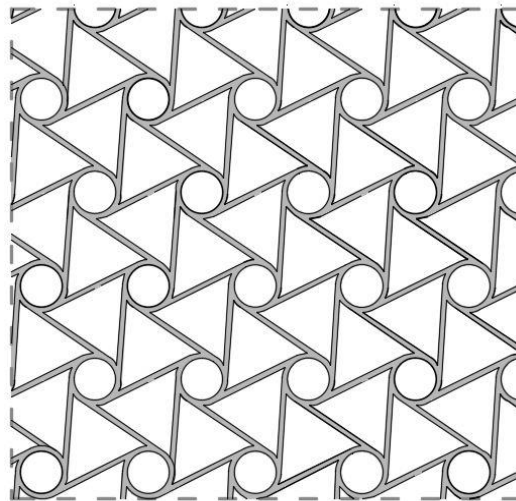
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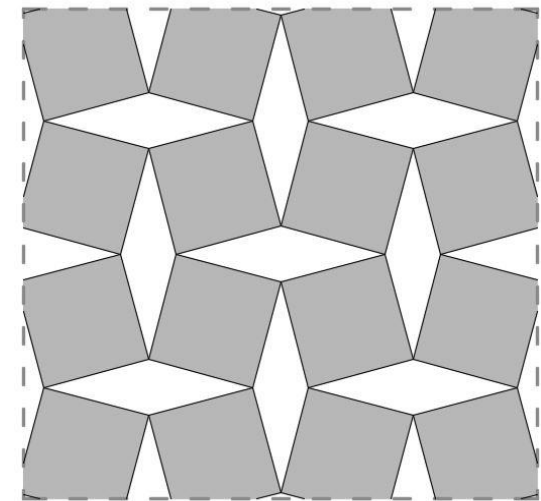
▪ RE-ENTRANT TYPE



▪ CHIRAL TYPE



▪ ROTATING POLYGONS



3D Printed Foam-Filled Auxetic Honeycomb

□ 3D Printed polymeric (Polyamide, PA12) **auxetic frame**

- Re-entrant auxetic honeycomb geometry
- “3D High Reusability PA 12” produced by HP is referred for the material properties
- The **Elastic-perfectly plastic material** model is considered

E [MPa]	ν	σ_y [MPa]
1700	0.41	48

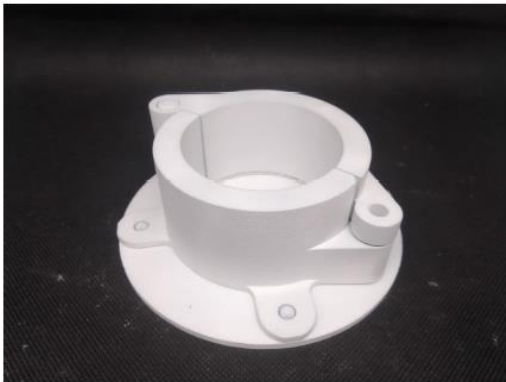
□ Rigid Polyurethane **foam filler**

- Polyol + Isocyanate + Water = Polyurethane (PU)
- Mechanical properties not known *a priori*



PU foam material characterization

- ❑ PU foams provided by BCI Polyurethane Europe S.R.L.
 - Isocyanate Isotem® P200
 - Polyols: Promol® DP 25/10B1 (low density), Promol® VA 50/6A3 (high density)
- ❑ Experimental setup
 - “Standard Test Method for Compressive Properties of Rigid Cellular Plastics”, ASTM
 - MTS Insight Testing System equipped with a 10KN load cell and two steel compression plates
 - Specimens dimensions: $\phi = 60 \text{ mm}$, $h = 40 \text{ mm}$

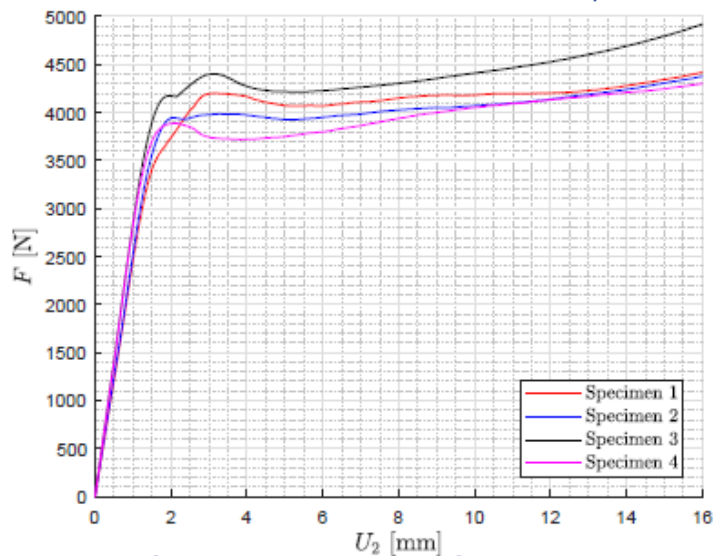


Multiscale analysis using PWUHS

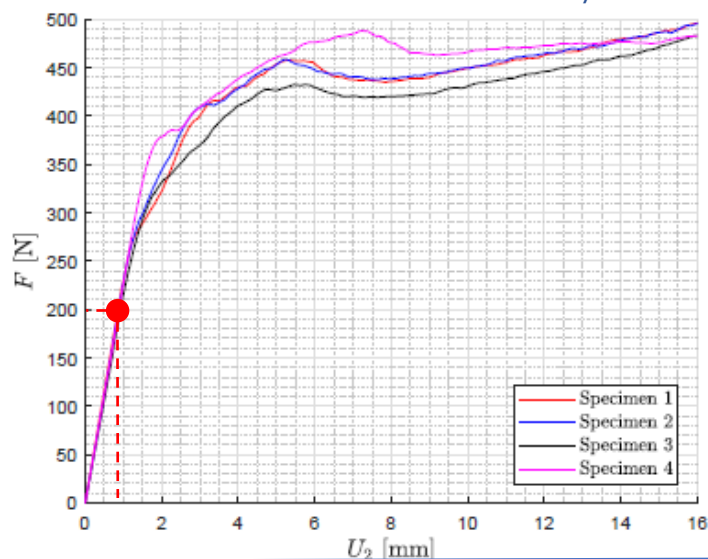


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Isotem® P200 + Promol® VA 50/6A3



Isotem® P200 + Promol® DP 25/10B1



DP 25/10B1 - Isotem P200

Diameter ϕ [mm]				
Measurement n	1	2	3	Average
Specimen 1	59.48	60.07	59.89	59.81
Specimen 2	59.55	59.58	59.99	59.71
Specimen 3	59.84	59.4	59.44	59.56
Specimen 4	59.59	59.71	59.78	59.69

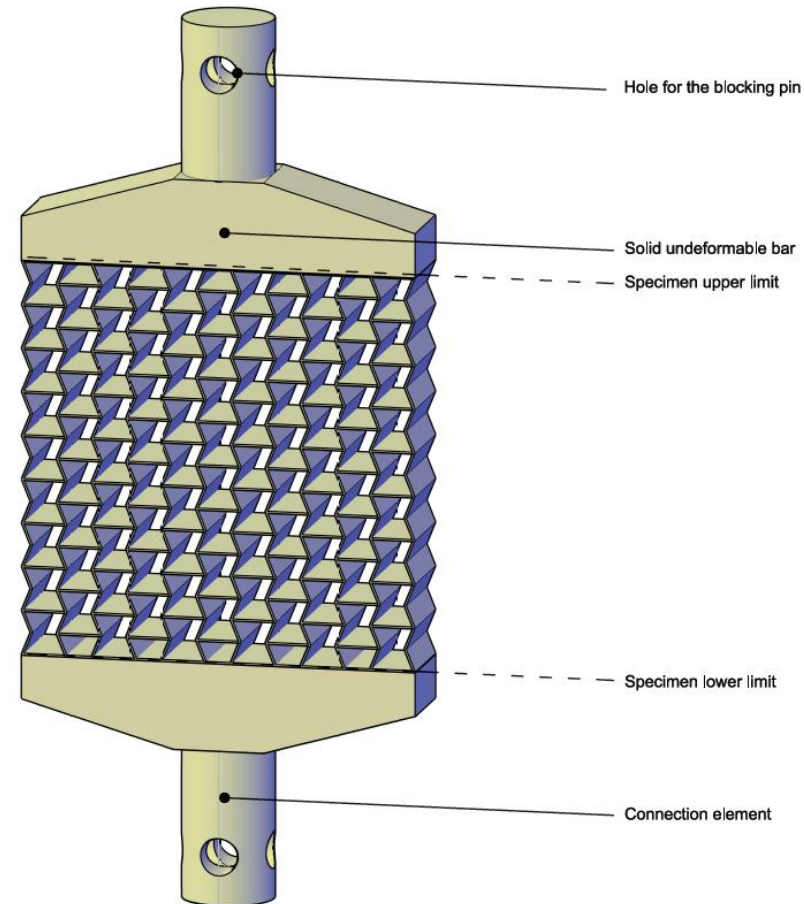
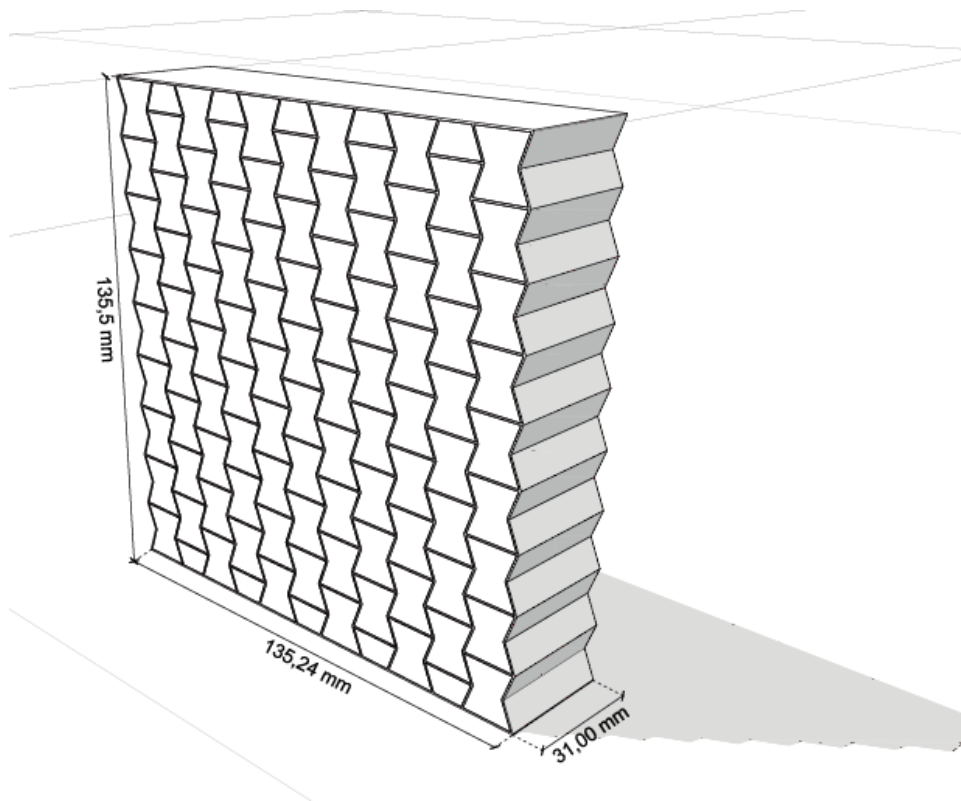
Height h [mm]				
Measurement n	1	2	3	Average
Specimen 1	40.09	40.09	40.22	40.13
Specimen 2	39.88	39.99	40.10	39.99
Specimen 3	40.11	40.30	40.56	40.32
Specimen 4	41.05	40.99	40.76	40.93

	Base Area A [mm ²]	Elastic Modulus E [MPa]
Specimen 1	2809.87	3.34
Specimen 2	2799.85	3.12
Specimen 3	2786.12	3.09
Specimen 4	2798.60	3.32

E [MPa]	ν	σ_y [MPa]	k [MPa]	Elastoplasticity with isotropic hardening
3.22	0.27	0.13	0.1	

Experimental investigation

- Polymeric PA12 frame 3D printed using “HP Multi Jet Fusion” (MJF) technology
- DP 25/10B1 PU foam filler



Experimental investigation

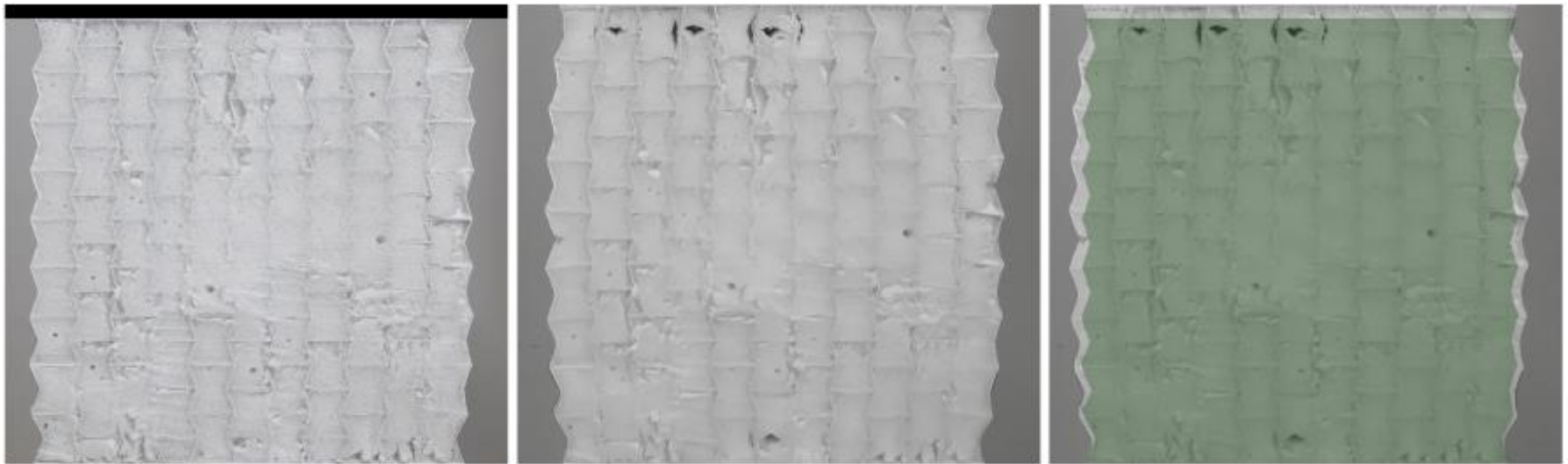
- ❑ Test in compression $U_0 = -10$ mm



- ❑ Arising of buckling phenomena
- ❑ **Comparison** with the numerical counterpart (small strain regime) is **not possible**

Experimental investigation

- ❑ Test in tension $U_0 = 10$ mm
- ❑ Failure of the foam-filled composite at $U_0 = 4.6$ mm due to decohesion



- ❑ **Considered for comparison** with the numerical counterpart

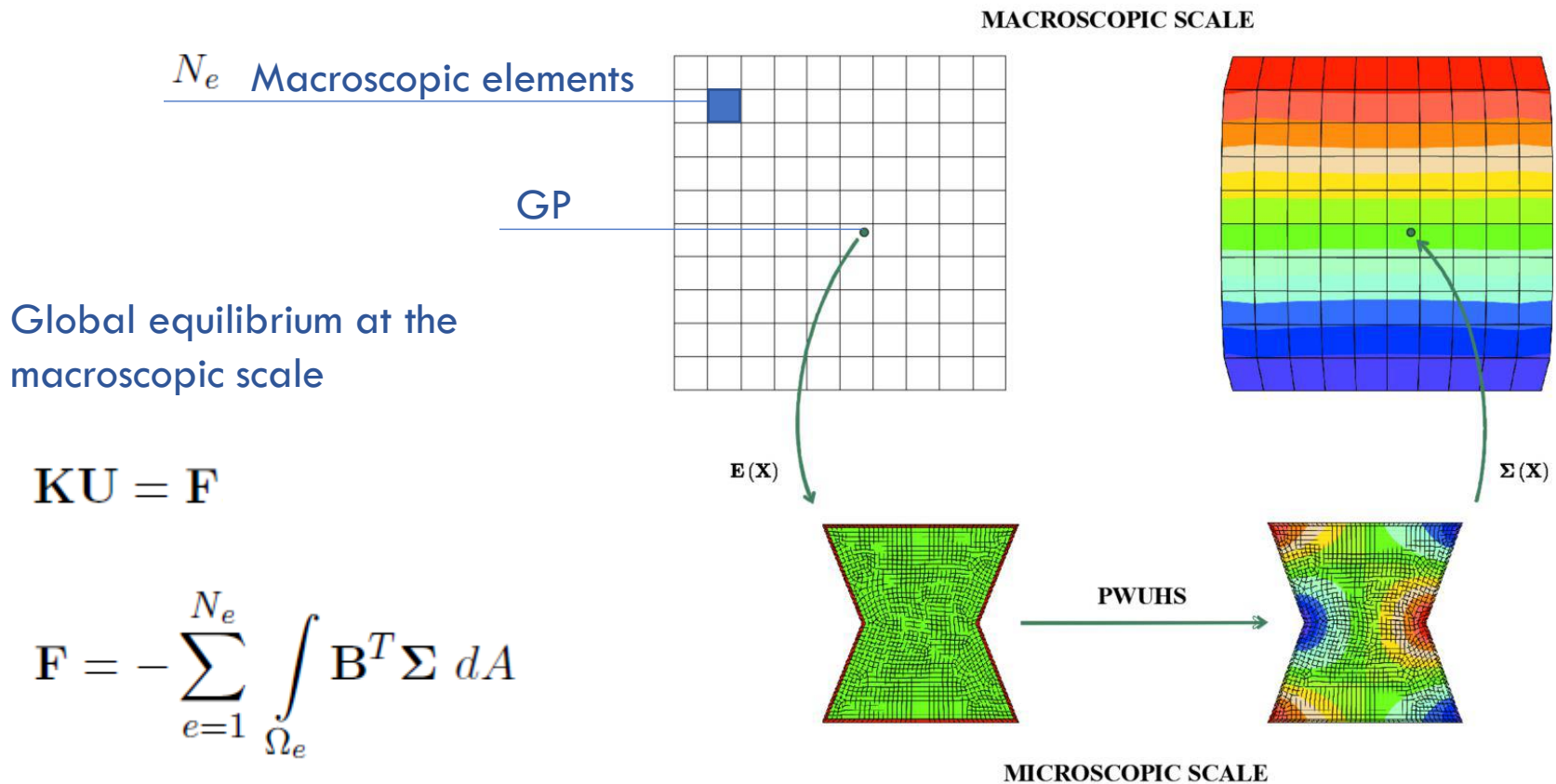
Multiscale analysis using PWUHS



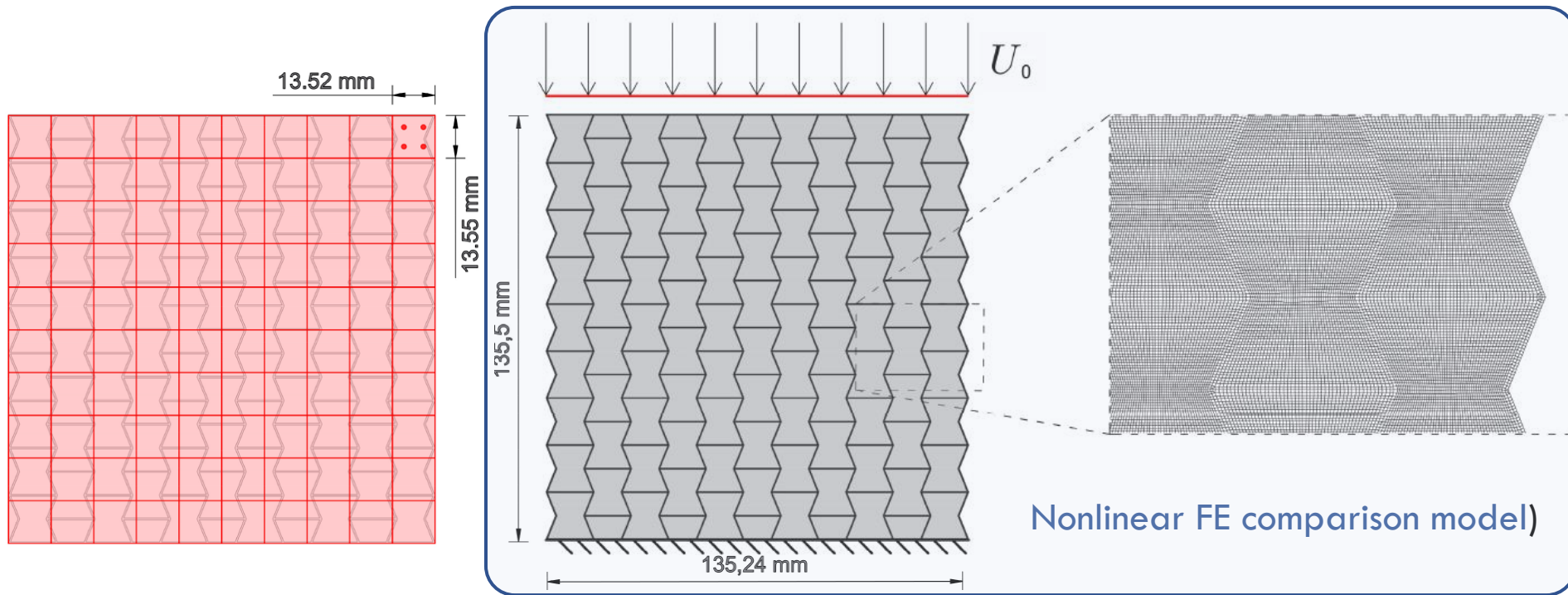
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Numerical procedure

- Precomputations on UC
- Solution of the structural problem (Online stage)
- Multiscale analysis and PWUHS implemented in a finite element code (**FEAP**)



Analysis of Auxetic honeycomb structure



Equivalent homogeneous macroscopic model

- 100 elements (4GP)
- 11200 history variables

Nonlinear FE

- 320286 quad elements
- 5124576 history variables

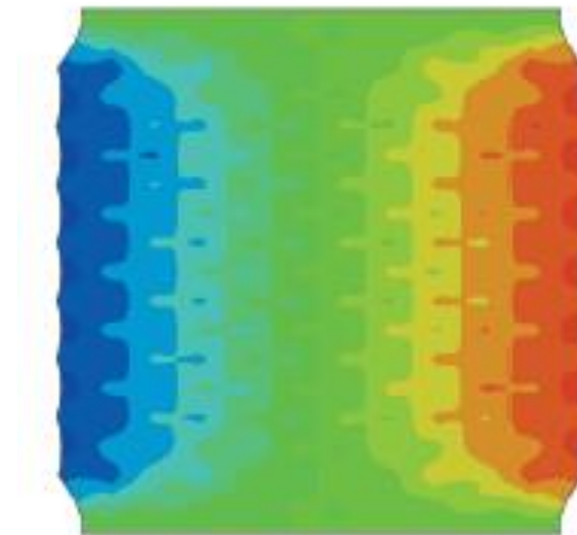
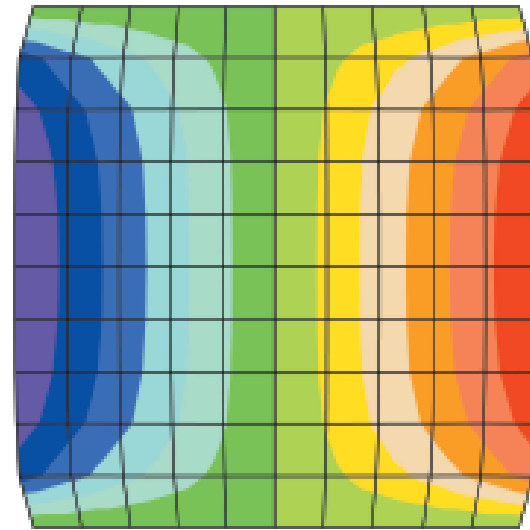
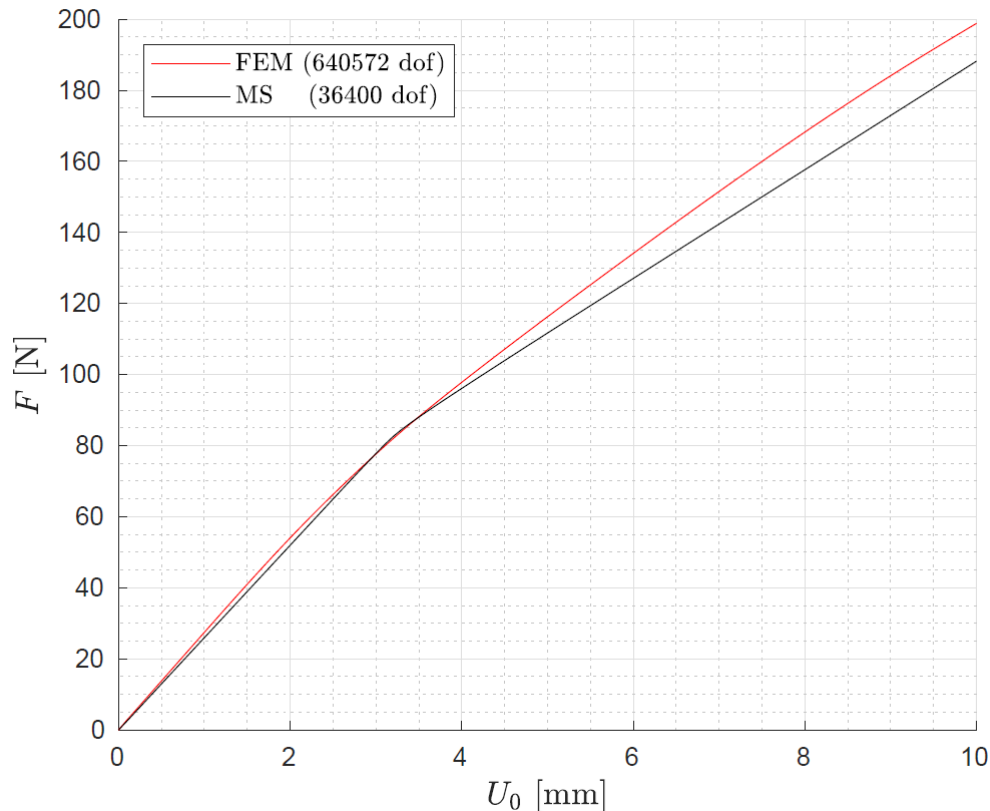
Multiscale analysis using PWUHS



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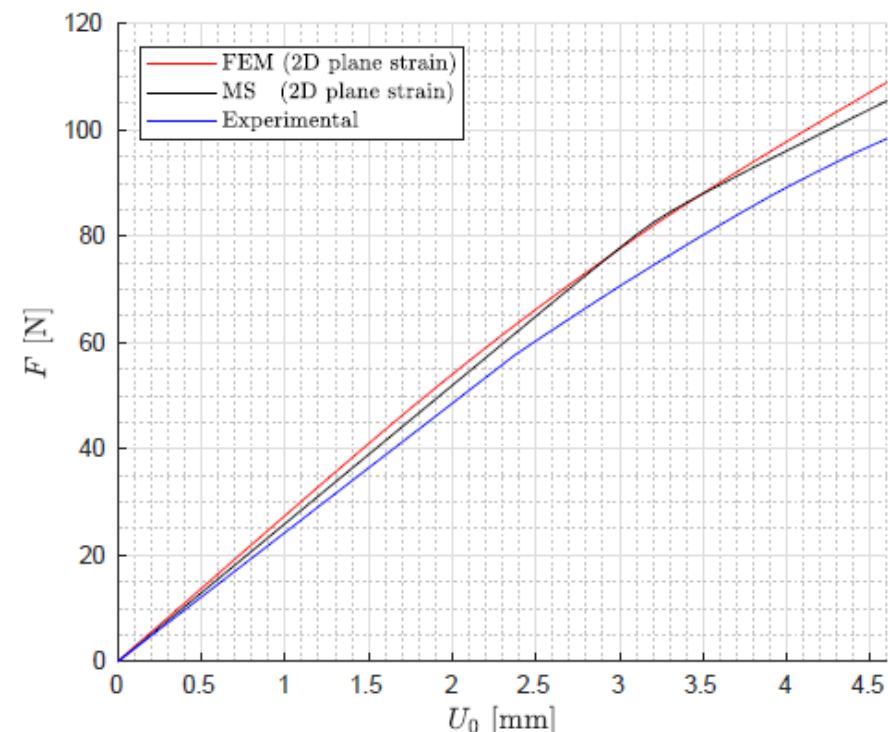
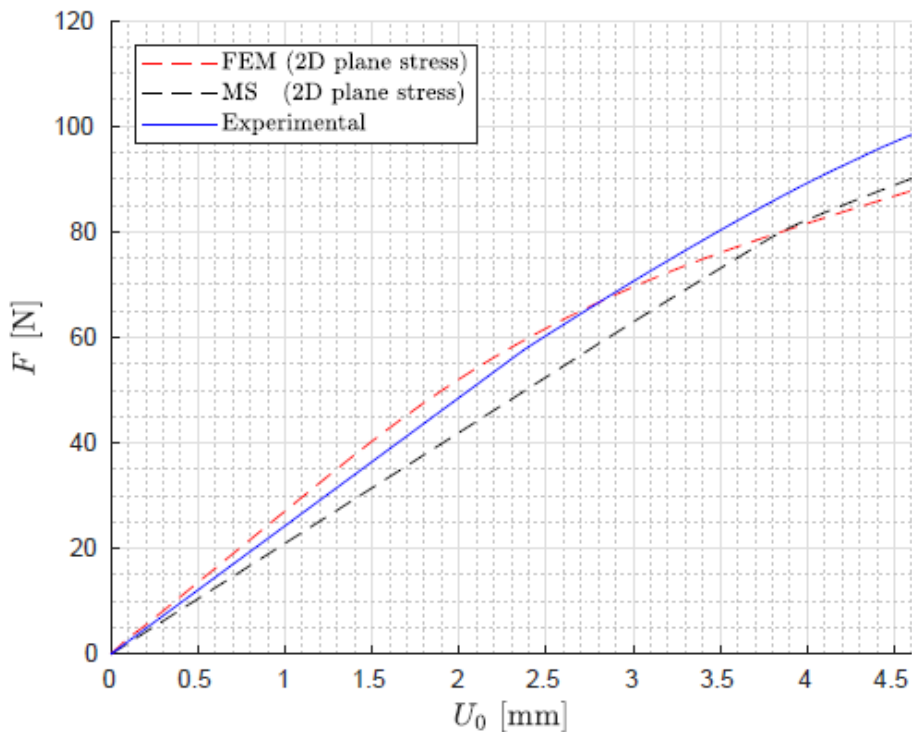
Analysis of Auxetic honeycomb structure

- Multiscale analysis in **plane strain** condition
- Tension loading history $U_0 = 10$ mm



Comparison with Experimental investigations

- numerical and experimental results in terms of the resultant force F before failure at $U_0 = 4.6$ mm



- ❑ PWUHS is introduced for the homogenization of nonlinear composites.
- ❑ A novel approach for the calculation of the elastic reference matrix using the FE homogenization of the composite is proposed.
- ❑ A comparative study between PWUTFA and PWUHS shows the similarities and differences between the two ROMs.
- ❑ PWUHS ROM is an efficient numerical tool for reducing the computational cost in Multiscale Analysis of nonlinear composites.
- ❑ Multiscale Analysis predicts the behaviour of 3D-Printed Auxetic Composites structures with a drastically reduced number of history variables in comparison to the FE solution.
- ❑ Results of the Multiscale scheme are in line with experimental tests on foam-filled auxetic honeycomb.

What's next?

- ❑ Introduction of a clustering technique during the precomputations for the division of the RVE in **optimized subsets**.
- ❑ Investigation of the **influence of UC's dimensions in Multiscale Analysis**, with respect to the structural size, on the model capability to naturally account for size effects.
- ❑ Extension of the FE code with implemented PWUHS homogenization to **parallel computing**



THANK YOU ALL !

UC homogenization

□ UC identification by mean of periodicity directions (UC-A)

- 7 subsets
- $4 \times 7 = 28$ history variables (7160 in FE)

