

CIVIL-408

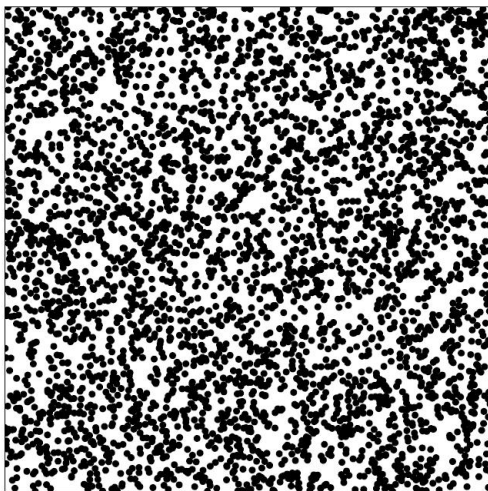
Multiscale Modeling in Mechanics

Prof. Kostas Karapiperis

Week 2

Statistical homogeneity

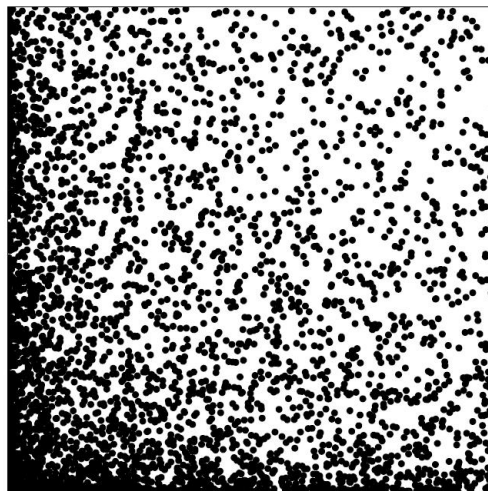
Statistically
homogeneous



- Statistical *properties* of the microstructure do not change from point to point at the macroscale

Properties: volume fraction, spatial correlation, ..

Statistically
inhomogeneous



- Otherwise, the material is statistically inhomogeneous (e.g. composite with a concentration gradient)

Effective response

We define **effective quantities** for a microstructure as spatial averages (with respect to the undeformed configuration)

$$\langle \cdot \rangle_{\Omega} = \frac{1}{V} \int_{\Omega} (\cdot) dV \quad \neq \quad \langle \cdot \rangle_{\varphi(\Omega)} = \frac{1}{v} \int_{\varphi(\Omega)} (\cdot) dv$$

e.g. **effective energy, effective stress, etc**

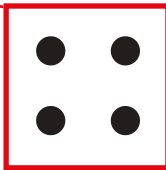
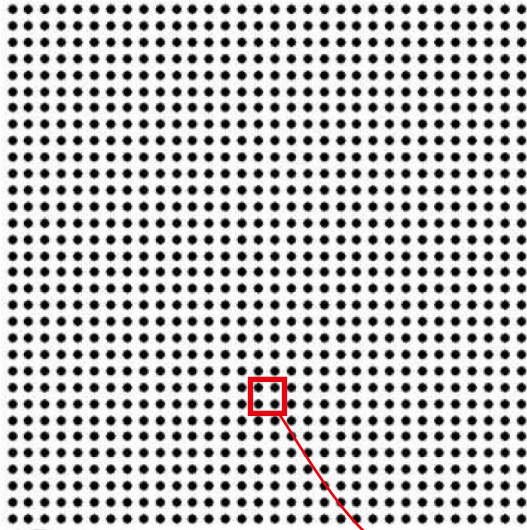
$$W_{\text{eff}} = \langle W \rangle$$

$$\boldsymbol{\sigma}_{\text{eff}} = \langle \boldsymbol{\sigma} \rangle$$

...

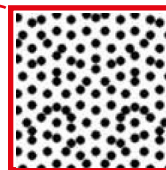
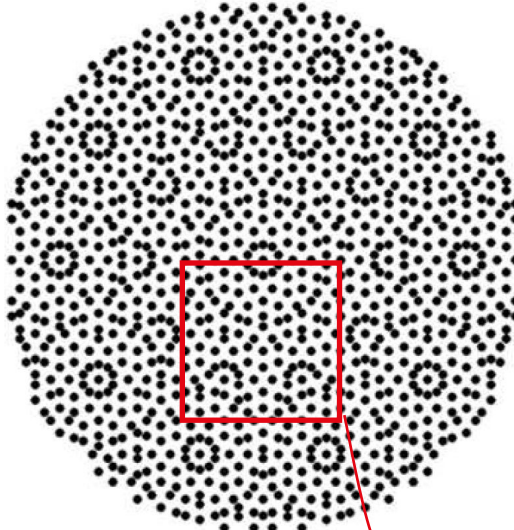
How to choose the averaging volume?

Periodic



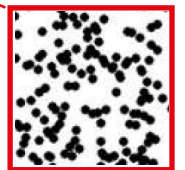
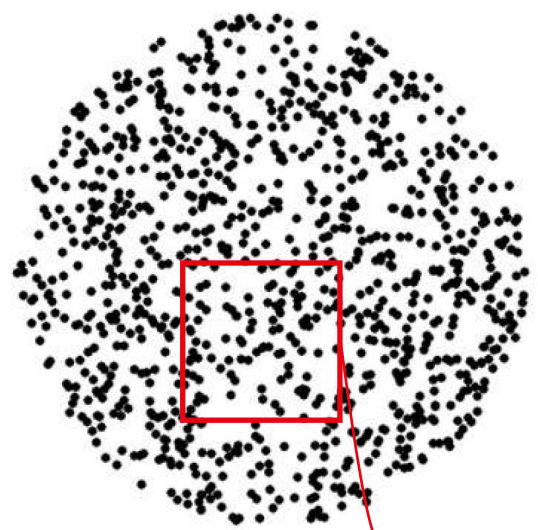
Unit cell

Quasiperiodic



RVE

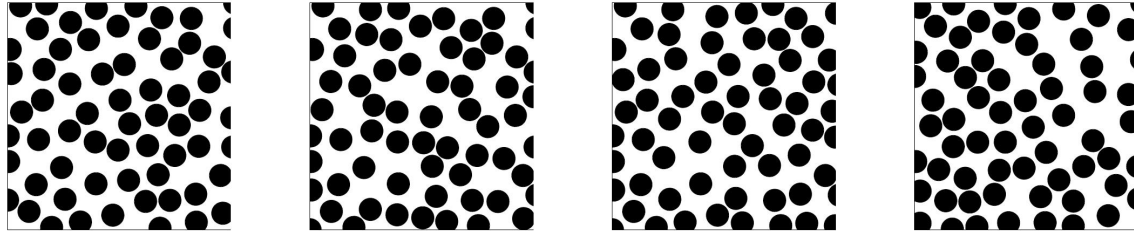
Random



RVE

EPFL Realizations and Ensemble Limit Theorem

Configurations (or realizations):



Ensemble: a set of multiple realizations

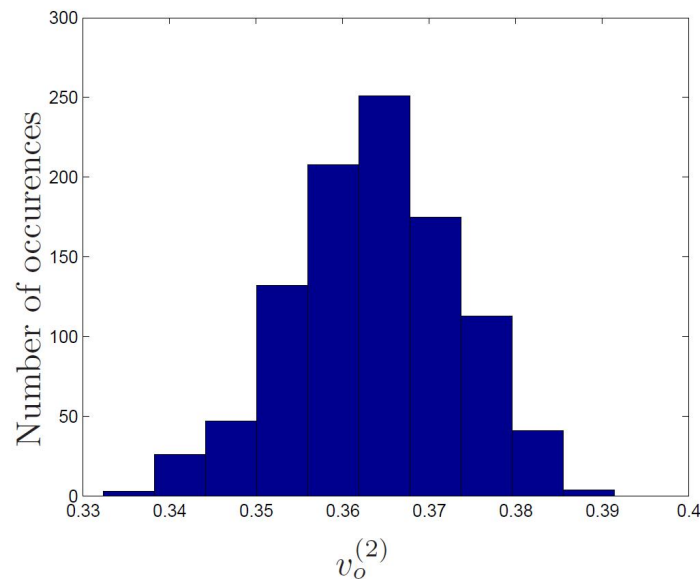
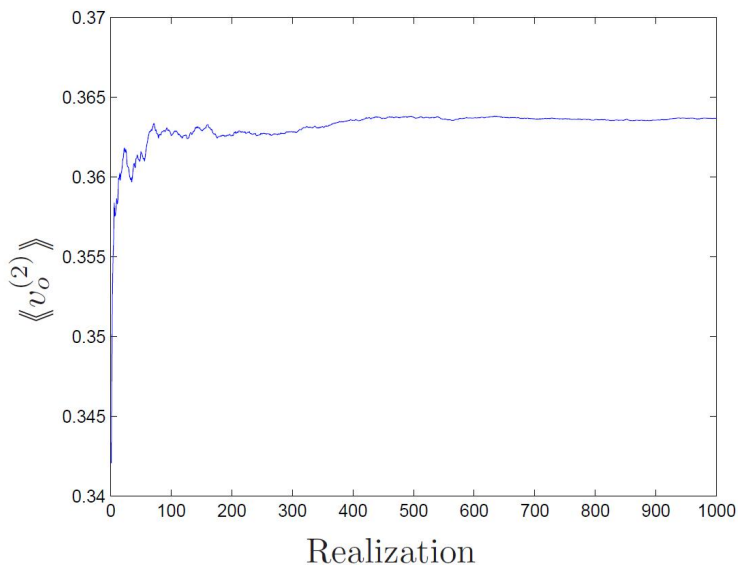
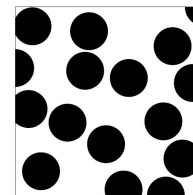
Assume that each configuration produces a **response** which generally differs between realizations (e.g., some averaged quantity).

Ensemble average of a response over a set of N realizations: $\langle\langle \cdot \rangle\rangle_N = \frac{1}{N} \sum_{i=1}^N (\cdot)_i$

Central limit theorem: $\lim_{N \rightarrow \infty} \langle\langle \cdot \rangle\rangle_N = \langle\langle \cdot \rangle\rangle_\infty$

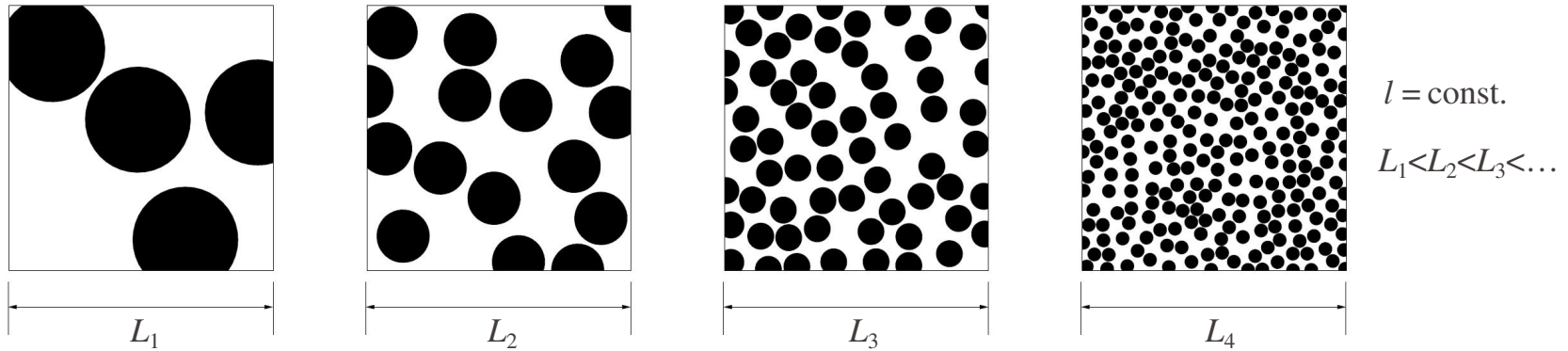
Ensemble enlargement

Example: volume fraction of particles for $N = 1000$ realizations of samples with a fixed number of particles (of uniform radii) randomly dispersed in a constant-size box.



$$\langle\langle v_2 \rangle\rangle_\infty = 0.3637$$

sample enlargement: increasing the size of the unit cell while keeping microstructural feature sizes constant



sample enlargement: increasing the size of the unit cell while keeping microstructural feature sizes constant

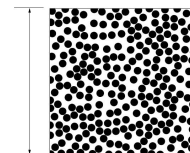
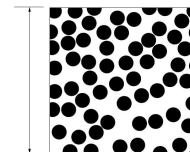
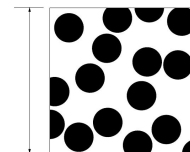
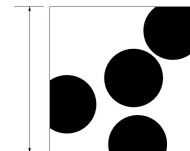
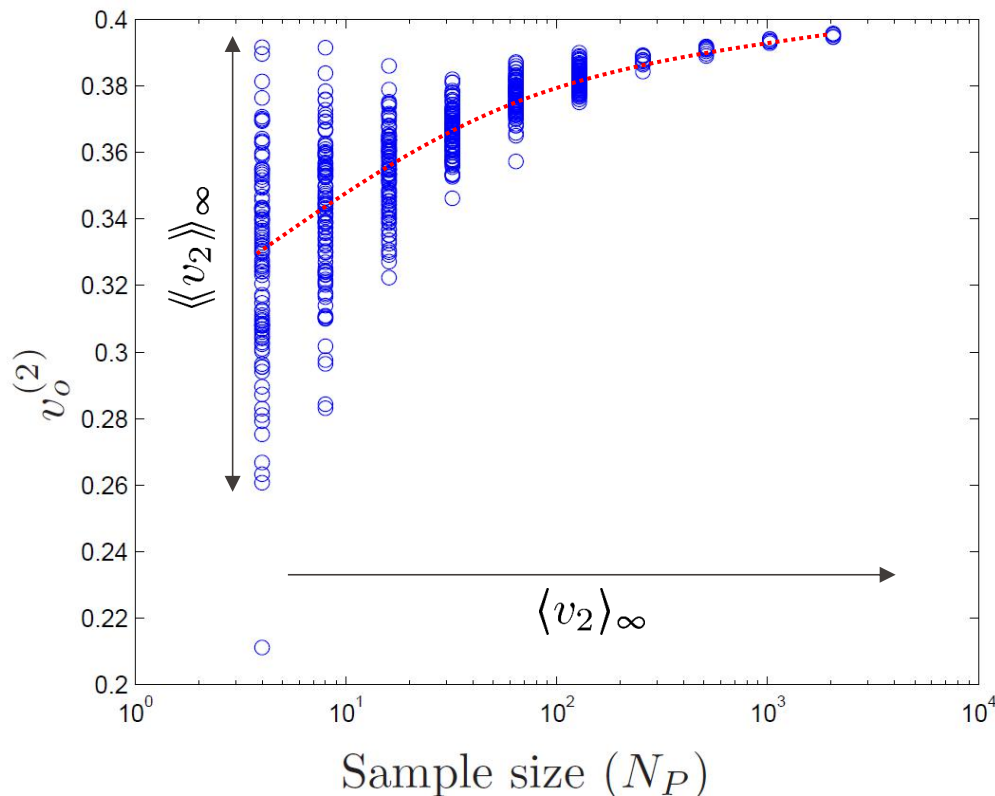
limit: $\langle \cdot \rangle_\infty = \lim_{L/l \rightarrow \infty} \langle \cdot \rangle_{\Omega(L)}$

$$\langle \cdot \rangle_\infty = \langle \langle \cdot \rangle_\infty \rangle_\infty$$

convergence by sample enlargement vs. ensemble averaging at fixed size is not the same and not equally uniform (ensemble average leads to smoother convergence) but in the sample enlargement limit, a single realization is sufficient

Ensemble and sample enlargement

Example revisited: volume fraction of particles with constant radii



Representative volume element

Ideally, we seek an *infinitely large* sample, so averages do not differ between realizations. Such a sample is **statistically representative**, and a single analysis is sufficient to reveal the response.

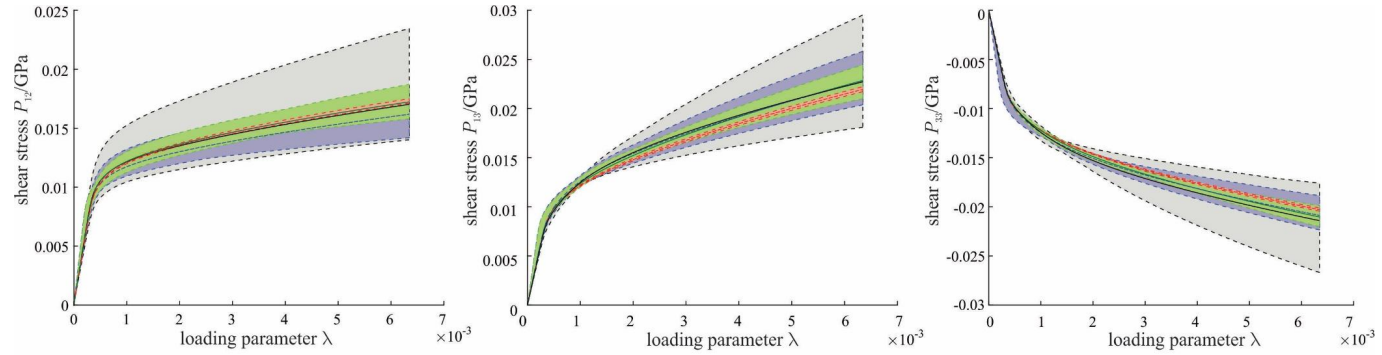
For all practical purposes, we cannot work with infinite RVE sizes but will choose a **finite-size RVE** whose response is as close to the infinite limit as needed (even though, strictly speaking, it is not an **RVE**).

For example, we can find the required number of realizations N or the size L of an RVE by checking for a specific response if, e.g.,

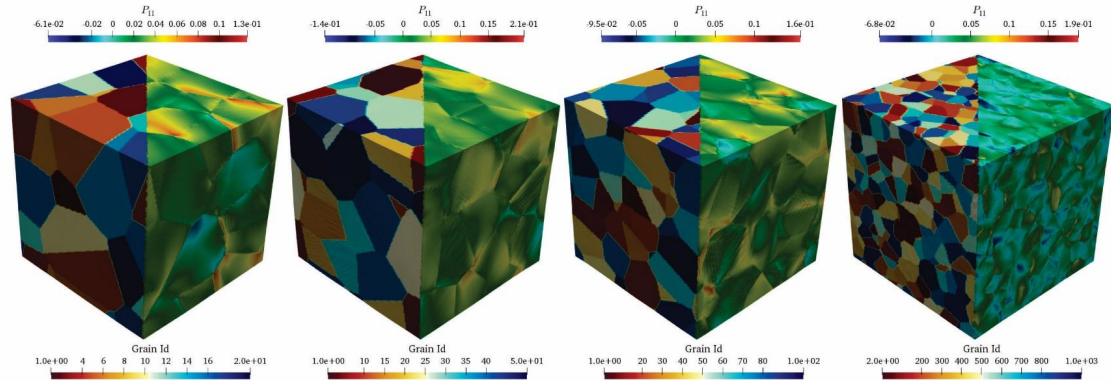
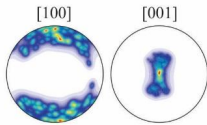
$$\frac{\langle\langle \cdot \rangle\rangle_{N+1} - \langle\langle \cdot \rangle\rangle_N}{\langle\langle \cdot \rangle\rangle_N} \leq \epsilon, \quad \frac{\langle \cdot \rangle_{\Omega(L_{i+1})} - \langle \cdot \rangle_{\Omega(L_i)}}{\langle \cdot \rangle_{\Omega(L_i)}} \leq \epsilon$$

More accurate are *statistical measures* (e.g., check standard deviation, comparison to extrapolated values at infinity, etc.).

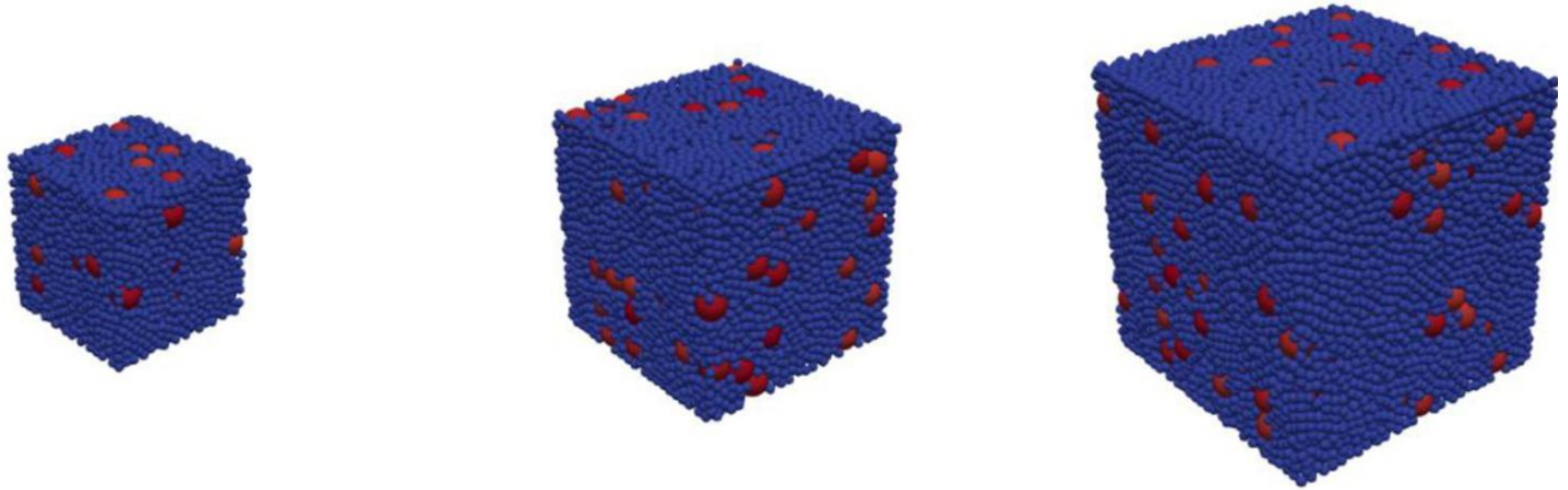
Plastic deformation in a magnesium alloy



- 20 grains
- - - 50 grains
- - - 100 grains
- - - 1000 grains

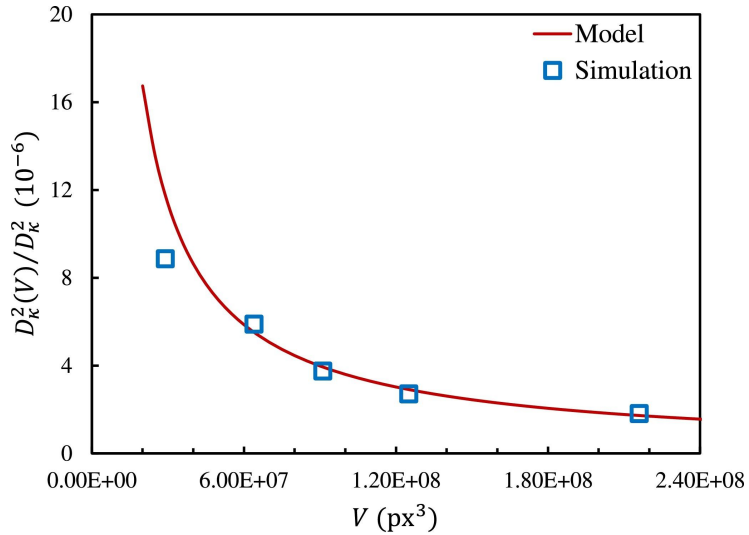


Mechanics behavior of bidisperse granular material

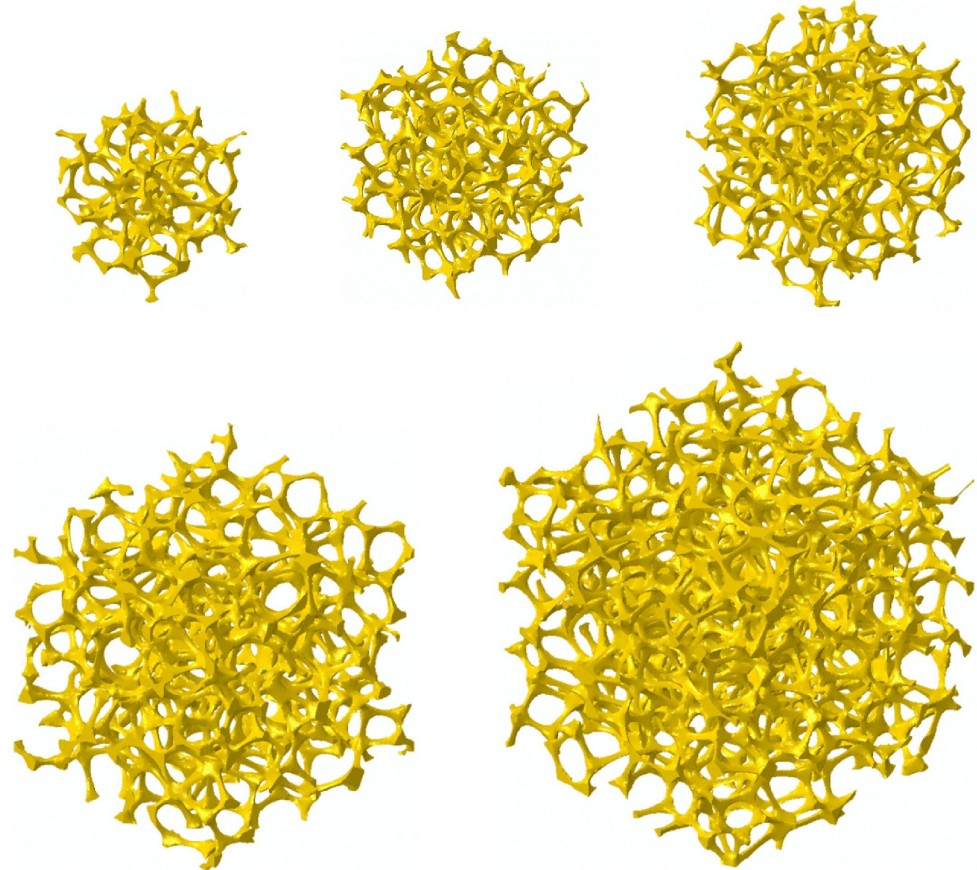


We generally choose the RVE size **as large as necessary, as small as possible**

Mechanical behavior of open cell random metallic foams

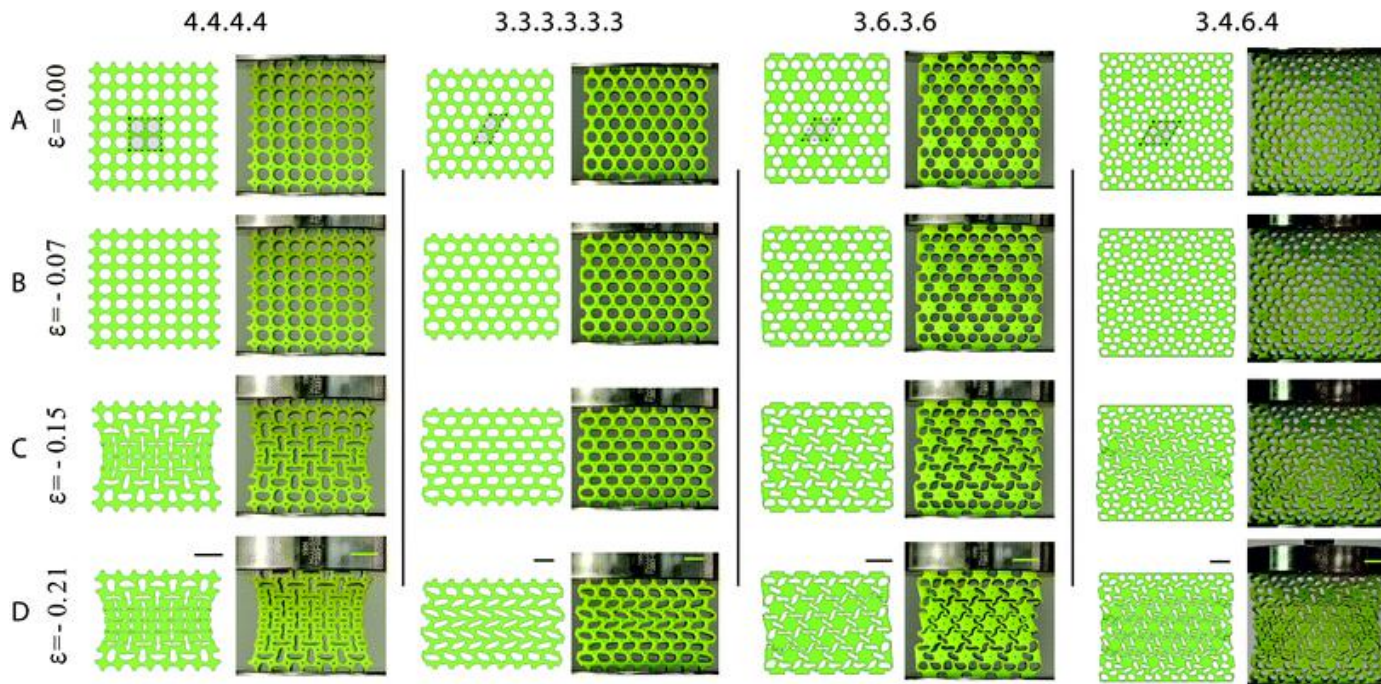


Variance of elastic moduli as a function of RVE size



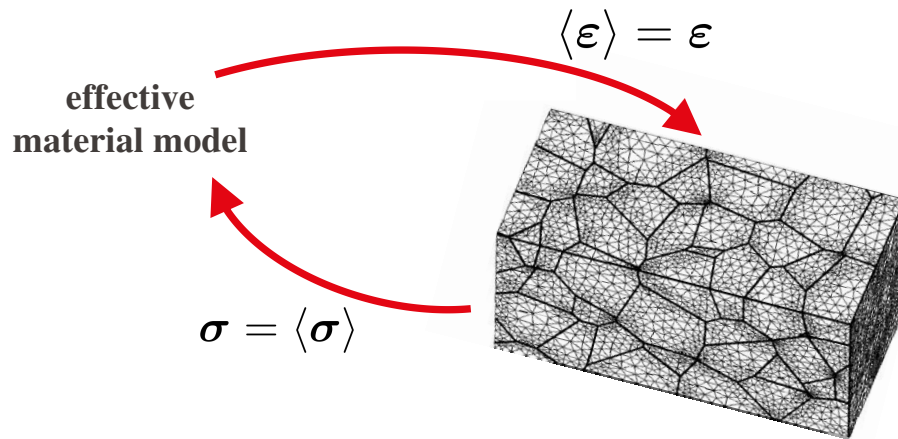
RVEs for periodic microstructures

For **periodic** microstructures, the RVE is identical to the **unit cell (UC)**, i.e., the smallest unit whose periodic tiling results in the complete microstructure. It is generally **not unique**. It also *depends on the problem*.



Homogenization strategy:

Compute the effective constitutive response of the material by solving a lower-scale boundary value problem from an RVE.



Questions:

How do we impose an effective macroscale strain tensor at the microscale?

How do we return an effective stress tensor from the microscale to the macroscale?

Note: Calculating averages is simple, imposing averages is not.

Averaging Theorems - Average strain

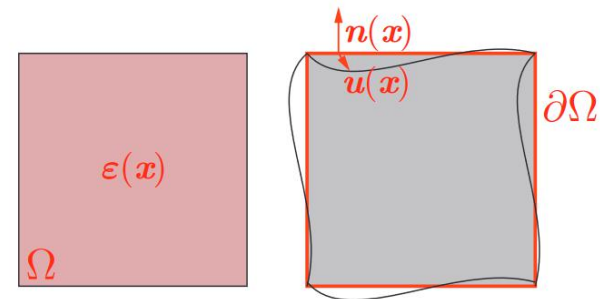
Consider a RVE Ω with volume $V = |\Omega|$

We can compute the volume-averaged strain tensor by using the divergence theorem to obtain (assuming smooth a displacement field)

$$\langle \varepsilon_{ij} \rangle = \frac{1}{V} \int_{\Omega} \varepsilon_{ij} dV = \frac{1}{2V} \int_{\Omega} (u_{i,j} + u_{j,i}) dV = \frac{1}{2V} \int_{\partial\Omega} (u_i n_j + u_j n_i) dS$$

Or in tensor notation:

$$\langle \boldsymbol{\varepsilon} \rangle = \frac{1}{V} \int_{\partial\Omega} \text{sym}(\mathbf{u} \otimes \mathbf{n}) dS$$



average strain calculation

Analogously the average stress tensor is derived by exploiting the relation:

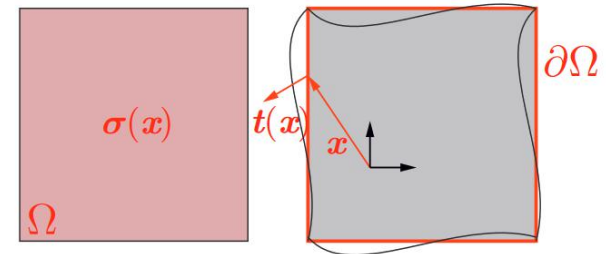
$$\sigma_{ij} = \sigma_{ik} \delta_{jk} = \sigma_{ik} x_{j,k}$$

Taking into consideration the balance of linear momentum and the definition of traction:

$$\begin{aligned} \langle \sigma_{ij} \rangle &= \frac{1}{V} \int_{\Omega} \sigma_{ij} dV = \frac{1}{V} \int_{\Omega} \sigma_{ik} x_{j,k} dV = \frac{1}{V} \left[\int_{\partial\Omega} \sigma_{ik} x_j n_k dS - \int_{\Omega} \sigma_{ij,k} x_j dV \right] \\ &= \frac{1}{V} \left[\int_{\partial\Omega} t_i x_j dS - \int_{\Omega} \rho (a_i - b_i) x_j dV \right] \end{aligned}$$

Or in tensor notation in the quasistatic case (with $b=0$):

$$\langle \boldsymbol{\sigma} \rangle = \frac{1}{V} \int_{\partial\Omega} \mathbf{t} \otimes \mathbf{x} dS$$



average stress calculation

EPFL Averaging Theorems - Numerical evaluation

Practically, in a finite element setting:

Strain:

$$\langle \boldsymbol{\varepsilon}^h \rangle = \frac{1}{V} \sum_{\alpha=1}^n \text{sym}(\mathbf{u}^\alpha \otimes \tilde{\mathbf{n}}^\alpha)$$

where:

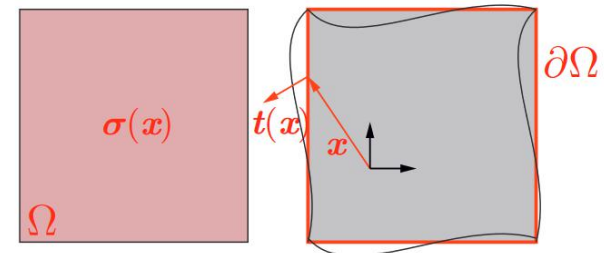
$$\tilde{\mathbf{n}}^\alpha = \frac{1}{d} \sum_e \mathbf{n}_e^\alpha A^\alpha$$

Stress:

$$\langle \boldsymbol{\sigma}^h \rangle = \frac{1}{V} \sum_{\alpha=1}^n \text{sym}(\mathbf{F}^\alpha \otimes \mathbf{x}^\alpha)$$

where:

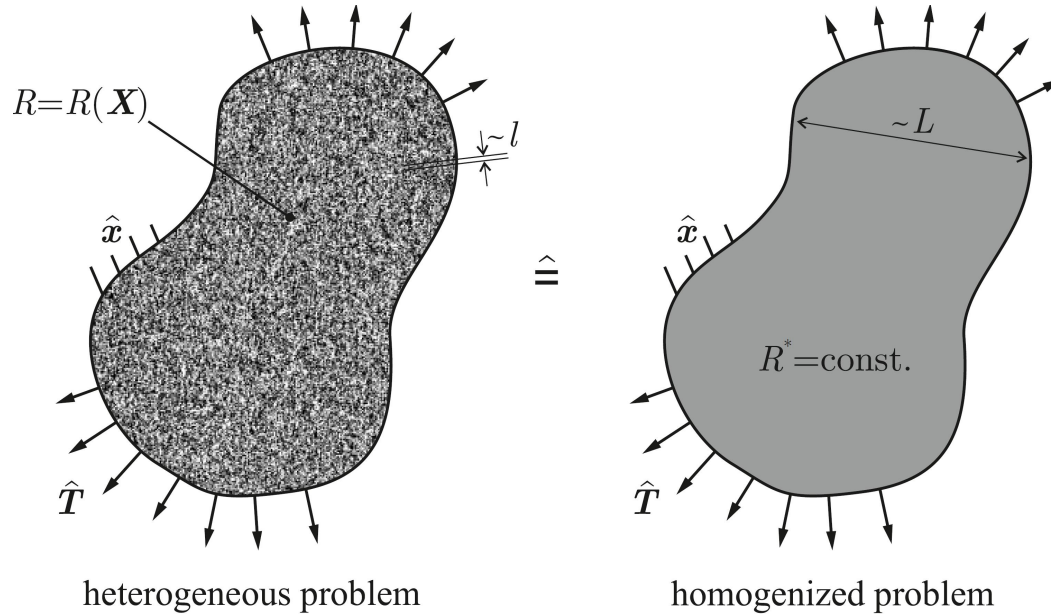
$$\mathbf{F}^\alpha = \sum_e \sum_\alpha \int_{\partial\Omega_e} \mathbf{t} N_e^\alpha dS$$



average stress calculation

EPFL Outlook: Computational homogenization

A sneak peek into the formal homogenization problem:



That's what I prepared for you today.

What would you like to discuss?

Reading for next class:

Multiscale Modeling, D.M. Kochmann

Chapters 4-5