Survey of new continuum numerical multiscale approaches and limitations

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Outline

- Review: finite element method(s) for elliptic problems
- Variational approach (conforming FE) and discretization
 - Numerical implementation and solving a linear system
- Variational approach (mixed FE) and discretization
- FE for multiscale problems: issues
- Effective and upscaled coefficients
 - Use multigrid/multilevel approaches
 - Homogenization based methods
 - Upscaling by averaging or pressure-based
- Survey of Multiscale FE methods for elliptic problems
 - MsFEM
 - Heterogeneous multiscale FEM
 - Variational and subgrid multiscale FEM
 - Mortar methods
- Non-elliptic and/or nonlinear problems
 - Reconstruction and downscaling
 - Double-porosity approaches for parabolic problems
 - Methods of moments, pseudo-functions for transport problems
- Recap and references

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Variational approach (conforming FE) and discretization Variational approach (mixed FE) and discretization FE for multiscale problems: issues

Model problem

Second order elliptic PDE on an open bounded $\Omega \subset \mathbb{R}^d$, d = 1, 2, 3, $\mathbf{K} = \mathbf{K}^T$, $\mathbf{K} = \mathbf{K}(x)$ bounded, strictly elliptic: $\lambda_{min}(x) \ge \lambda_0 > 0$

$$\begin{cases} -\nabla \cdot \mathbf{K} \nabla p = f, & x \in \Omega \\ p = 0, & x \in \partial \Omega \end{cases} \iff \begin{array}{c} Ap = f \\ X, Y \text{ are Banach (Hilbert) spaces} \\ A : X \mapsto Y \text{ or } A : X \mapsto Y' \end{cases}$$

• Sobolev spaces $H^m(\Omega)$, $m \ge 0$, ($\mathbf{K} \in C^1(\overline{\Omega})$, $\partial\Omega$ is C^2 smooth)

$$\underbrace{-\nabla\cdot\mathbf{K}\nabla}_{A}: \quad H^{m+2}(\Omega)\cap H^1_0(\Omega)\mapsto H^m(\Omega), m\geq 0$$

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$$\underbrace{-\nabla\cdot\mathbf{K}\nabla}_{A}: \quad H^{m+2}(\Omega)\cap H^1_0(\Omega)\mapsto H^m(\Omega), m\geq 0$$

• a weaker notion ($\mathbf{K} = \mathbf{K}(x)$ can be discontinuous, $\partial \Omega$ is polygonal)

$$A: H^1_0(\Omega) \mapsto H^{-1}(\Omega)$$

Sobolev spaces W^{m,p}, 1 ≤ p < ∞, when K = K(x, Θ) or is degenerate (also for transient problems)

Variational approach (conforming FE) and discretization Variational approach (mixed FE) and discretization FE for multiscale problems: issues

Weak (variational) formulation and FE formulation

Use smooth $q: q|_{\partial\Omega} = 0$, integrate by parts $-\nabla \cdot \mathbf{K} \nabla p = f$, use $p|_{\partial\Omega} = 0$ to get

$$\int_{\Omega} \mathbf{K}(x) \nabla p(x) \nabla q(x) dx = \int_{\Omega} f(x) q(x) dx,$$

Abstract setting

Define $V := H_0^1(\Omega), a(p,q) := \int_{\Omega} \mathbf{K} \nabla p \nabla q dx, (f,q) := \int_{\Omega} f q dx.$

Find $p \in V$: $a(p,q) = (f,q), \forall q \in V$

Theory: $\exists ! p :$ continuously depending on the data f, \mathbf{K}, Ω .

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FE for the model elliptic problem

(D) PDE and b.c $-\nabla \cdot \mathbf{K} \nabla \rho = f, \rho|_{\partial \Omega} = 0$

(V): weak form: $a(p,q) = (f,q), \forall q \in V$

Partition Ω_h = U_{T∈T} T ≈ Ω ⊂ ℝ^d into elements T: segments (1D) or triangles/quadrilaterals (2D), tetrahedra/prisms/bricks (3D)





 Define local polynomial basis (globally C⁰(Ω) only) of degree k = 1, 2, ... for space V^k_h(Ω)

(FE) Finite element solution:

find
$$p_h \in V_h^k$$
: $a(p_h, q_h) = (f, v_h), \forall q_h \in V_h^k$

Variational approach (conforming FE) and discretization Variational approach (mixed FE) and discretization FE for multiscale problems: issues

Error analysis

- $a(\cdot, \cdot)$ continuous: $a(p,q) \leq C \parallel p \parallel_V \parallel q \parallel_V$
- $a(\cdot, \cdot)$ elliptic: $a(u, u) \ge \alpha_0 \parallel u \parallel_V^2$
- Conforming FE: $V_h \subsetneq V$ (nonconforming \approx variational crimes)
- Galerkin orthogonality $a(p p_h, v_h) = 0$
- Céa's lemma $\| p p_h \|_V \le \inf_{q_h \in V_h} \| p q_h \|_V$
- Interpolation estimate(s) $|| u I_h u ||_V \le Ch || u ||_{H^2(\Omega)}$

lead to ...

$$\parallel p - p_h \parallel_{H^1(\Omega)} \leq Ch \parallel p \parallel_{H^2(\Omega)}$$

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lead to ...

$$\| p - p_h \|_{H^1(\Omega)} \leq Ch \| p \|_{H^2(\Omega)}$$

• use of Aubin-Nitzche duality "trick" based on $\| p \|_{H^2(\Omega)} \le \| f \|_{L^2(\Omega)}$:

$$\parallel \pmb{p} - \pmb{p}_h \parallel_{L^2(\Omega)} \leq \pmb{C} h^2 \parallel \pmb{p} \parallel_{\pmb{H}^2(\Omega)}$$

Survey of new continuum numerical multiscale approaches and limitations

Variational approach (conforming FE) and discretization Variational approach (mixed FE) and discretization FE for multiscale problems: issues

Finding p_h : implementation

Use $\{\phi_1(\mathbf{x}), \dots, \phi_{N_h}(\mathbf{x})\}$ as the (piecewise polynomial) basis for V_h^k Write $p_h = \sum_i p_i \phi_i(\mathbf{x})$ and $p_h \equiv \mathbf{P} = (p_i)_{i=1}^{N_h}$

(FE) Finite element solution $p_h \equiv \mathbf{P}$

$$\boldsymbol{a}(\boldsymbol{p}_h,\boldsymbol{q}_h) = (f,\boldsymbol{q}_h), \forall \boldsymbol{q}_h \in \boldsymbol{V}_h^k \leftrightarrow \sum_i \boldsymbol{p}_i \boldsymbol{a}(\phi_i,\phi_j) = (f,\phi_j), \forall j$$

Note: the system $\mathbf{AP} = \mathcal{F}$ has dimension N_h .

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Note: the system $\mathbf{AP} = \mathcal{F}$ has dimension N_h .

In practice the matrix entries $A_{ij} := a(\phi_i, \phi_j) = \int_{\Omega} \mathbf{K}(\mathbf{x}) \nabla \phi_i(\mathbf{x}) \nabla \phi_j(\mathbf{x}) dA = \sum_T \int_T \mathbf{K}(\mathbf{x}) \nabla \phi_i(\mathbf{x}) \nabla \phi_j(\mathbf{x}) dA$

are computed approximately using numerical integration (quadrature): $\overline{A_{ij}} \approx \sum_{T} (\int_{T} \mathbf{K}(\mathbf{x}) \nabla \phi_i(\mathbf{x}) \nabla \phi_j(\mathbf{x}) dA)_h$

Variational approach (conforming FE) and discretization Variational approach (mixed FE) and discretization FE for multiscale problems: issues

Numerical implementation and solving a linear system

- **Discretize**: define Ω_h , choose V_h^k
- Assembly process with quadrature: compute for each T the approximation

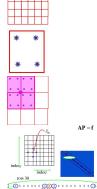
$$\int_{T} (\mathbf{K}(\mathbf{x}) \nabla \phi_i(\mathbf{x}) \nabla \phi_j(\mathbf{x}) dA)_h := \sum_m w_m \mathbf{K}(\mathbf{x}_m) \nabla \phi_i(\mathbf{x}_m) \nabla \phi_j(\mathbf{x}_m)$$

Add over all elements T adjacent to node j for each j (cost is $O(N_h)$)

• Solve linear system (A is sparse spd)

 $AP = \mathcal{F}$

...this requires $O(N_h^r)$ computational time r=3 for full GE ... to ... r=1 for Full Multigrid solvers,



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Mixed formulation: $\mathbf{u} = -\mathbf{K}\nabla p$, $\nabla \cdot \mathbf{u} = f$

$$\begin{split} \mathcal{W} &:= \mathcal{L}^2(\Omega) \text{ and } \mathbf{V} := \mathbf{H}(\mathbf{div}; \Omega). \text{ Find } \Theta := (\mathbf{u}, p) \in \mathbf{V} \times W \\ (\mathcal{K}^{-1}\mathbf{u}, \mathbf{v}) &= (p, \nabla \cdot \mathbf{v}) - \langle g, \mathbf{v} \cdot \mathbf{n} \rangle, \ \forall \mathbf{v} \in \mathbf{V} \\ (\nabla \cdot \mathbf{u}, w) &= (f, w), \ \forall w \in W \end{split}$$

Discrete mixed formulation

 $W_h \subset W$, $V_h \subset V$ are **RT**_[0] spaces. Find $\Theta_h := (\mathbf{u}_h, p_h) \in V_h \times W_h$:

$$\begin{aligned} (\mathcal{K}^{-1}\mathbf{u}_h,\mathbf{v}_h) &= (\mathcal{p}_h,\nabla\cdot\mathbf{v}_h) - \langle g_h,\mathbf{v}_h\cdot\mathbf{n} \rangle_{\partial\Omega}, & \forall \mathbf{v}_h\in\mathbf{V}_h, \\ (\nabla\cdot\mathbf{u}_h,w_h) &= (f,w_h), & \forall w_h\in W_h. \end{aligned}$$

Error estimates: $\| p - p_h \|_{L^2(\Omega)} = O(h), \| \mathbf{u} - \mathbf{u}_h \|_{\mathcal{K}} = O(h)$

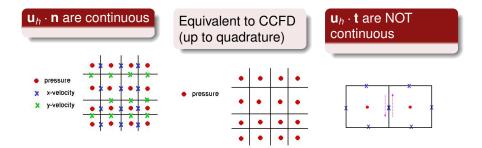


Variational approach (conforming FE) and discretization Variational approach (mixed FE) and discretization FE for multiscale problems: issues

Discrete mixed $\mathbf{RT}_{[0]}$ spaces \equiv cell-centered FD

Basis functions for **RT**_[0] spaces [RavTho77]

 $\mathbf{u}_h \in \mathbf{V}_h \subset V$ are piecewise linears \times piecewise constants $p_h \in W_h \subset W$ are piecewise constants



Variational approach (conforming FE) and discretization Variational approach (mixed FE) and discretization FE for multiscale problems: issues

Reality of FE computations vs theory

For optimal convergence of numerical methods

$$\parallel \pmb{p} - \pmb{p}_h \parallel_{L^2(\Omega)} \leq \pmb{C} h^2 \parallel \pmb{p} \parallel_{\pmb{H}^2(\Omega)}$$

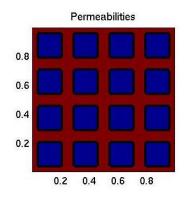
one needs (at least local) smoothness of the true solution $p \dots$ but in practice

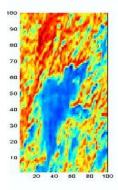
- *f*, Ω possibly not smooth
- K not smooth: multiscale character

Variational approach (conforming FE) and discretization Variational approach (mixed FE) and discretization FE for multiscale problems: issues

What is $\mathbf{K} = \mathbf{K}(x)$ like ?

 $\mathbf{K} = \mathbf{K}^{T}$ (permeability, conductivity, mobility,...) is in general anisotropic. Here we focus on two sources of difficulties:





two scales
$$rac{K_{fast}}{f_{fast}}$$
 / $rac{K_{slow}}{K} = 10^{eta}, eta \geq 1$ periodic character of **K**

strong heterogeneity

Variational approach (conforming FE) and discretization Variational approach (mixed FE) and discretization FE for multiscale problems: issues

Numerical simulation: periodic multiscale case

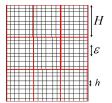
Assume $\mathbf{K}(\mathbf{x}) = \mathbf{K}^{\epsilon}(\mathbf{x}) = \mathbf{K}(\mathbf{x}, \frac{\mathbf{x}}{\epsilon})$



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Numerical simulation: periodic multiscale case

Assume
$$\mathbf{K}(\mathbf{x}) = \mathbf{K}^{\epsilon}(\mathbf{x}) = \mathbf{K}(\mathbf{x}, \frac{\mathbf{x}}{\epsilon})$$





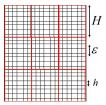
To resolve the scales in $K(\mathbf{x})$, we need a grid with $h << \epsilon$.. this means solving $\mathbf{AP} = \mathcal{F}$ with $O(N_h^r)$ complexity and may be prohibitively complex in \mathbb{R}^2 , \mathbb{R}^3 .

^aKeep in mind the big picture and solving nonlinear transient problems $\mathbf{K} = \mathbf{K}(\mathbf{x}, \rho, \nabla \rho)$

Review: finite element method(s) for elliptic problems

Effective and upscaled coefficients Survey of Multiscale FE methods for elliptic problems Non-elliptic and/or nonlinear problems Recap and references Variational approach (conforming FE) and discretization Variational approach (mixed FE) and discretization FE for multiscale problems: issues

How not to solve with h

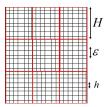


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How not to solve with h



Some solutions and ideas when using $\epsilon < H$

- use a special linear solver technique (multigrid ?)
- find effective \mathbf{K}^*_H and solve for $p^*_H \approx p^0$
- solve for p^{*}_H ≈ p⁰ using multiscale FE
- if needed, recover (reconstruct) next order effects (correctors, downscaling)

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Use multigrid/multilevel approaches Homogenization based methods Upscaling by averaging or pressure-based

Multigrid/multilevel methods

Well suited to handle large systems

$AP = \mathcal{F}$

- Standard multigrid not useful for problems with highly varying coefficients:
- Must use a special grid transfer operator (not bilinear)
- Idea: construct an effective K using a special grid transfer operator [Knapek, Moutlon, Dendy]

Use multigrid/multilevel approaches Homogenization based methods Upscaling by averaging or pressure-based

Find effective \mathbf{K}^*_H by homogenization

Homogenization formulas for K*

$$\begin{split} \mathbf{K}^*{}_{jk} &= \frac{1}{|\Omega_0|} \int_{\Omega_0} K_{jk}(\mathbf{y}) (\delta_{jk} + \partial_k \omega_j(\mathbf{y})) dA \\ \begin{cases} -\nabla \cdot \mathbf{K} \nabla \omega_j(\mathbf{y}) &= \nabla \cdot (\mathbf{K} \mathbf{e}_j), \ \mathbf{y} \in \Omega_0 \\ \omega_j & \Omega_0 - \text{periodic} \end{cases} \end{split}$$

- Analytical formulas and bounds² available for special geometries only
- Finding K* numerically: for every T_H, solve a local problem with grid h for K*_H(x)
- exploit two-scale numerical FE approaches [Matache/Schwab]

²Wiener, Matheron, Cardwell, Parsons, Torquato, Rubinstein, Hashin, Shtrikman, Dagan $+ \square \lor (\bigcirc \lor \lor (\supseteq \lor \lor (\supseteq \lor \lor))$

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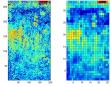
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Use multigrid/multilevel approaches Homogenization based methods Upscaling by averaging or pressure-based

Find an effective \mathbf{K}^*_H by upscaling

Examples of upscaled K^*_H using simple averaging:







Original field K_h with $h \approx 217x201$, upscaled K_H with $H \approx 34x26$ by arithmetic, harmonic averaging, and renormalization [King]

(P)ressure based upscaling: solve

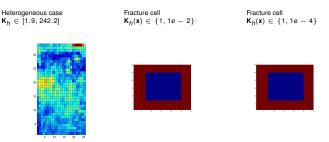
$$-\nabla \cdot \mathbf{K}^{\epsilon}(\mathbf{x}) \nabla w = \mathbf{0}, \ \mathbf{y} \in T_{H}$$
$$w|_{\partial T_{H}} = ?$$

Then get $\mathbf{K}^*_{H|_{T_H}}$ by matching fluxes with $\langle \nabla w \rangle$. Boundary conditions: Dirichlet (prevents crossflow) or periodic.

Use multigrid/multilevel approaches Homogenization based methods Upscaling by averaging or pressure-based

Comparison of upscaling methods

Given \mathbf{K}_h , $h \approx 34x26...$



... compute *effective* \mathbf{K}_H , $H \approx 1x1$

| method | heterogeneous | fracture 1e-2 | fracture 1e-4 | |
|------------------------|------------------|---------------|------------------|-------|
| (A)rithmetic | 89.5002 | 0.6436 | 0.6400 | |
| (H)armonic | 79.3953 | 0.0273 | 0.000273 | |
| (R)enormalization (6x) | 78.6652 | 0.4799 | 0.4703 | |
| (P)ressure based | 86.5225, 81.5955 | 0.455825 🖪 🗆 | ▶ 0.446895 ▶ ∢ 🗎 | ▶ ■ の |
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MsFEM Heterogeneous multiscale FEM Variational and subgrid multiscale FEM Mortar methods

MsFEM

Idea: solve on scale H

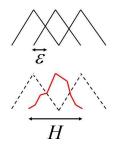
incorporate ϵ -scale of $\mathbf{K}^{\epsilon}(\mathbf{x})$ into basis functions [Babuska, Osborn'83], [Hou, Wu'97-],[Efendiev, Hou, Wu, '00]

Given original test functions $\{\phi_1(\mathbf{x}), \dots \phi_{N_H}(\mathbf{x})\}...$

solve local problem on T_H

$$-\nabla K^{\epsilon}(\mathbf{x}) \nabla \psi_{i} = \mathbf{0}, \ \mathbf{y} \in T_{H}$$
$$\psi_{i}|_{\partial T_{H}} = \phi_{i}$$

Use ψ_i to construct basis for V_H .



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MsFEM Heterogeneous multiscale FEM Variational and subgrid multiscale FEM Mortar methods

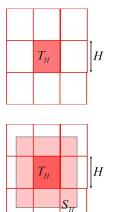
MsFEM and oversampling

MsFEM: solve on T_H

$$-\nabla K^{\epsilon}(\mathbf{x}) \nabla \psi_{i}^{\mathsf{T}} = \mathbf{0}, \ \mathbf{y} \in T_{\mathsf{H}}$$
$$\psi_{i}|_{\partial T_{\mathsf{H}}} = \phi_{i}$$

Use ψ_i to construct basis for V_H . Oversampling MsFEM: solve on S_H

$$\begin{aligned} -\nabla \mathcal{K}^{\epsilon}(\mathbf{x}) \nabla \psi_{i}^{\mathcal{S}} &= \mathbf{0}, \\ \psi_{i}|_{\partial \mathcal{S}} &= \phi_{i} \end{aligned}$$



MsFEM Heterogeneous multiscale FEM Variational and subgrid multiscale FEM Mortar methods

Analysis of MsFEM (periodic K)

Error estimates [Hou, Wu'97-], [Efendiev, Hou, Wu, '00]:

$$\| \boldsymbol{p} - \boldsymbol{p}_{H} \|_{L^{2}(\Omega)} \leq C(H^{2} + \frac{\epsilon}{H})$$
$$\| \boldsymbol{p} - \boldsymbol{p}_{H} \|_{H^{1}(\Omega)} \leq C(H + \epsilon + \sqrt{\frac{\epsilon}{H}})$$

Difficulties:

- Resonance effect partially removed by oversampling.
- Efficiency ... still solving on every **T**_H ...
- Applied in practice to non-periodic problems
- Extensions to nonlinear and transient cases [Efendiev, Pankov]

Also [Chen'05, Chen, Hou'02], for mixed FE methods.

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Heterogeneous multiscale FEM

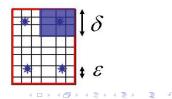
Idea: [E, Engquist'02], [Ming, Yue'03, E, Ming, Zhnag'04]

Solve with *H*, incorporate ϵ -scale of $\mathbf{K}^{\epsilon}(\mathbf{x})$ at quadrature points.

$$\begin{split} \int_{T} (\mathbf{K}(\mathbf{x}) \nabla \phi_{i}(\mathbf{x}) \nabla \phi_{j}(\mathbf{x}) d\mathbf{A})_{h} &:= \sum_{m} w_{m} \mathbf{K}(\mathbf{x}_{m}) \nabla \phi_{i}(\mathbf{x}_{m}) \nabla \phi_{j}(\mathbf{x}_{m}) \\ &\approx \sum_{m} w_{m} \mathbf{K}_{ij}^{\epsilon}(\mathbf{x}_{m}) \nabla \hat{\phi}_{i}(\mathbf{x}_{m}) \nabla \hat{\phi}_{j}(\mathbf{x}_{m}) \end{split}$$

Need to capture variation in $\mathbf{K}^{\epsilon}(\mathbf{x}):$ solve for $\hat{\phi}$

$$-\nabla \cdot \mathbf{K}^{\epsilon}(\mathbf{x}) \nabla \hat{\phi} = \mathbf{0}, \ \mathbf{x} \in T_{\delta}$$
$$\hat{\phi} - \phi \text{ periodic on } T_{\delta}$$



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Heterogeneous multiscale FEM: analysis

• Analysis: (periodic $\mathbf{K}^{\epsilon}(\mathbf{x})$)

$$\| \boldsymbol{p} - \boldsymbol{p}_{\mathcal{H}} \|_{L^{2}\Omega} \leq C \left(\mathcal{H}^{2} + \left\{ \begin{array}{cc} \mathcal{O}(\epsilon), & \delta = \epsilon \\ \mathcal{O}(\delta + \frac{\epsilon}{\delta}), & \delta > \epsilon \end{array} \right) \right.$$

• Special error estimates for random K.

- Computational cost: smaller than using h, competitive with MsFEM.
- Extensions to nonlinear cases



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MsFEM Heterogeneous multiscale FEM Variational and subgrid multiscale FEM Mortar methods

Variational and subgrid multiscale FEM

Idea of Bubbles:

provide enrichment of FE spaces [Hughes] used to stabilize convection-diffusion problems, CFD, or elasticity FE formulations, to resolve nonpolynomial behavior such as: boundary layers, numerical Green's functions

usual FE basis functions

Write
$$p_h = \bar{p} + p'$$

basis functions plus bubbles

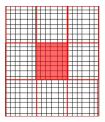
Subgrid methods for mixed FE methods [Arbogast, Keenan, Minkoff', Arbogast'00]

Idea: write $p_h = p_H + \delta p$, same for velocity variables.

MsFEM Heterogeneous multiscale FEM Variational and subgrid multiscale FEM Mortar methods

Subgrid upscaling

- Write $p_h = p_H + \delta p$, $\mathbf{v}_h = \mathbf{v}_H + \delta \mathbf{v}$
- Decouple coarse problems by the closure assumptions: no flow for $\delta \mathbf{v}$ on the coarse boundaries ∂T_H .
- Use higher order FE for velocity v_H (BDDF) and lower order (RT) for δv.
- Use numerical Green's functions to precompute for influence of coarse on fine scale.



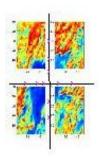
Error estimates and experiments for $\frac{H}{h}$ fixed

$$\| p - p_H \|_{L^2(\Omega)} = O(H), \quad \| \mathbf{v} - \mathbf{v}_H \|_{L^2(\Omega)} = O(H^2)$$

Recent extensions by [Aarnes et al] of Mixed MsFEM and Subgrid methods

MsFEM Heterogeneous multiscale FEM Variational and subgrid multiscale FEM Mortar methods

Mortar based methods

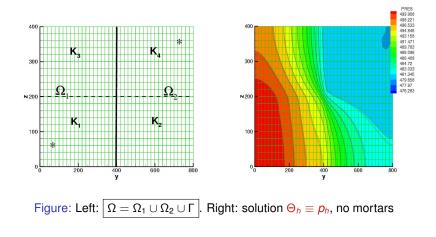


- Complete decoupling of problems on T_H: they are connected by mortars on interfaces
- optimal convergence: a-priori analysis [ACWY'00] and a-posteriori analysis [P05], [APWY'07] available
- mortar upscaling [PWY02]
- Computational savings achieved when efficient interface solvers are available
- No reconstruction necessary: solution at grid *h* available
- Automatic implementation of transient nonlinear problems

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MsFEM Heterogeneous multiscale FEM Variational and subgrid multiscale FEM Mortar methods

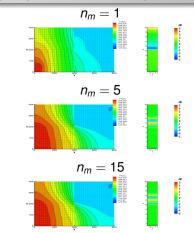
Example: adaptive mortar modeling [P05]

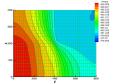


Survey of new continuum numerical multiscale approaches and limitations

MsFEM Heterogeneous multiscale FEM Variational and subgrid multiscale FEM Mortar methods

Results: mortars for single phase flow in porous media





Solution $\Theta_h \equiv \rho_h$ (no mortars)

Solution $\tilde{\Theta}_h = \tilde{p}_h$ (with mortars). Right: $\eta_{\Gamma,*}$

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Reconstruction and downscaling Double-porosity approaches for parabolic problems Methods of moments, pseudo-functions for transport problems

Flow coupled to transport $\mathcal{F}(\Theta) = 0$ with $\Theta = (\mathbf{u}, \mathbf{p}, \mathbf{c})$

Flow

$$\mathbf{u} = -\mathbf{K}\nabla \boldsymbol{\rho}, \ \nabla \cdot \mathbf{u} = \mathbf{0}$$

Diffusive-dispersive transport

$$\phi \frac{\partial \boldsymbol{c}}{\partial t} + \nabla \cdot (\mathbf{u}\boldsymbol{c} - \mathbf{D}(\mathbf{u})\nabla \boldsymbol{c}) = \mathbf{0}$$

Definitions

$$\begin{aligned} \mathbf{D}(\mathbf{u}) &:= & \text{diffusion} + \text{dispersion} \\ &:= & d_{mol}\mathbf{I} + |\mathbf{u}|(d_{long}\mathbf{E}(\mathbf{u}) + d_{transv}(\mathbf{I} - \mathbf{E}(\mathbf{u}))) \\ \mathbf{E}(\mathbf{u}) &= & \frac{1}{|\mathbf{u}|^2}u_iu_j \\ \mathbf{D}(\mathbf{u}) &\approx & d_{mol}\mathbf{I} + d_{long}|\mathbf{u}|\mathbf{E}(\mathbf{u}) \end{aligned}$$

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Reconstruction and downscaling Double-porosity approaches for parabolic problems Methods of moments, pseudo-functions for transport problems

Reconstruction and downscaling

Flow coupled to transport

$$\mathbf{u} = -\mathbf{K}\nabla \mathbf{p}, \quad \nabla \cdot \mathbf{u} = \mathbf{0}$$

$$\phi \frac{\partial \mathbf{c}}{\partial t} + \nabla \cdot (\mathbf{u}\mathbf{c} - \mathbf{D}(\mathbf{u})\nabla \mathbf{c}) = \mathbf{0}$$

Need accurate fine scale \mathbf{u}_h !

... have to reconstruct \mathbf{u}_h from \mathbf{u}_H

Ideas

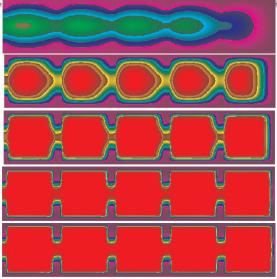
- [Oden, Vemaganti]: use the coarse solution p_H as boundary conditions for the local problem solved for p_h
- global-local upscaling [Durlofsky, Chen, Gerritsen]
- use global information [Efendiev'06,'07]

Review: finite element method(s) for elliptic problems Survey of Multiscale FE methods for elliptic problems Non-elliptic and/or nonlinear problems

Reconstruction and downscaling Double-porosity approaches for parabolic problems Methods of moments, pseudo-functions for transport problems

Recap and references

Small/large contrast diffusive-dispersive transport



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Multi-phase flow problems, phases $\alpha = w, n$

$$\frac{\partial}{\partial t}\phi S_{\alpha}\rho_{\alpha} - \nabla \cdot \mathbf{K}\lambda_{\alpha}\nabla P_{\alpha} = q_{\alpha}, \qquad (1)$$

$$P_n - P_w = P_c(S_w) \tag{2}$$

$$S_n + S_w \equiv 1 \tag{3}$$

Well–posedness results and character of solutions

degenerate parabolic/elliptic + parabolic/hyperbolic [altdibene,Arbogast,Chen]]

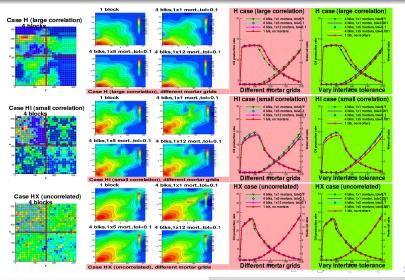
Handling transient nonlinearities

- use upscaled **K**; how to handle λ_{α} , P_c ? [Durlofsky et al, Trykozko and Zijl]
- If heterogeneity is ≈ periodic, use homogenization [Arbogast97,Bourgeat,BourKozMik95]

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Example: mortar upscaling for multi-phase flow

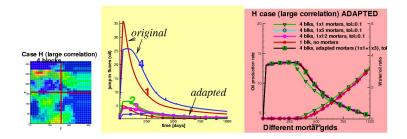


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Example: mortar adaptivity [P05]



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Recap

- Elliptic problems with multiscale coefficients lead to large linear systems
- Multiscale FE aim to reduce computational complexity
- Not all are applicable and/or perform equally well when applied to transient coupled nonlinear problems

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