Fast Simulation Tools for Flow in Heterogeneous Porous Media

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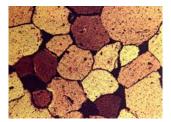
Simulation support for two main areas:

- Increase recovery of petroleum resources (planning and management): understand reservoir and fluid behavior, test hypotheses and scenarios, assimilate data, optimize production, etc.
- Ensure storage of carbon: how fast can one inject, will the injected CO₂ leak, where will the CO₂ move?

 \longrightarrow robust, efficient, and accurate simulation methods for partial differential equations with highly heterogeneous parameters on complex grids

The scales that impact fluid flow in subsurface rocks range from

- the micrometer scale of pores and pore channels
- via dm-m scale of well bores and laminae sediments
- to sedimentary structures that stretch across entire reservoirs

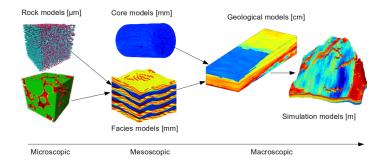




Porous media flow – a multiscale problem



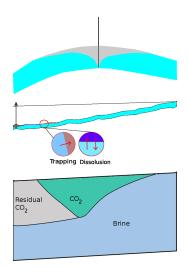




Example: injection and migration of CO₂

Physical process:

- supercritical CO₂ injected into an aquifer or abandoned reservoir
- forms a liquid phase that is lighter, less dense, and weakly soluble in water
- the CO₂-phase will migrate upward in the formation, limited above by the caprock, displacing the resident brine
- the displacement front is mainly driven by gravity (but also processes like dissolution, vaporization, salt precipitation, drying, etc)



Example: injection and migration of CO₂



Spatial scales:

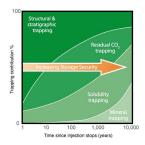
- horizontal extent of geological formation: 10–100 km
- height of formation: 10–200 m
- the tip of the CO₂-plume: 0.1–1 m

Time scales:

- pressure buildup: hours
- injection period: 20–50 years
- ▶ migration: 100–10000 years

See plenary talk by Prof. M. Celia.





Macroscopic models of flow in porous media



► Single-phase, incompressible flow: conservation of mass + Darcy's law:

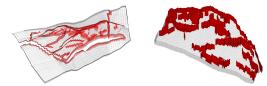
$$\vec{v} = -\mu^{-1} \mathbf{K} \nabla p, \qquad \nabla \cdot \vec{v} = q$$

Multiphase, compressible flow:

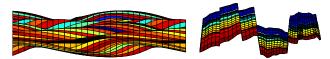
$$\vec{v} = -\lambda \mathbf{K} \left(\nabla p - \sum_{j} \rho_{j} f_{j} \vec{g} \right)$$
$$\nabla \cdot \vec{v} = q - c_{t} \frac{\partial p}{\partial t} + \left(\sum_{j} c_{j} f_{j} \vec{v} + \alpha(p) \mathbf{K} \vec{g} \right) \cdot \nabla p$$
$$\phi \frac{\partial s_{j}}{\partial t} + \nabla \left(f_{j} \left(\vec{v} + h_{j} \mathbf{K} \vec{g} \right) \right) = q_{j}$$

Grid - volumetric representation of the reservoir

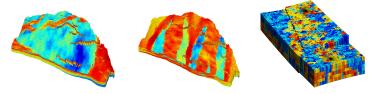
The structure of the reservoir (geological surfaces, faults, etc)



The stratigraphy of the reservoir (sedimentary structures)

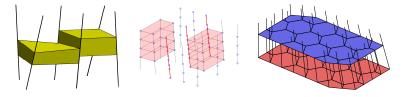


Petrophysical parameters (permeability, porosity, net-to-gross, ...)

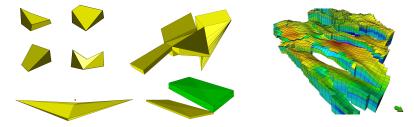


Grid - volumetric representation of the reservoir

Industry standard: stratigraphic grids (corner-point, 2.5D PEBI, etc)



Geometrical and numerical challenges: high aspect ratios, unstructured connections, many faces/neighbors, small faces, ...



Research challenge: consistent discretizations

Poisson type problem:

$$\nabla \cdot \vec{v} = q, \qquad \vec{v} = -\mu^{-1} \mathbf{K} \nabla p$$

Design of methods capable of handling anisotropic (full-tensor) \mathbf{K} on general polyhedral grids with curved faces

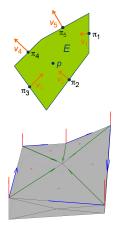
Basic discretization – relation between flux and pressure on a single cell ${\cal E}$

$$egin{aligned} oldsymbol{M}oldsymbol{v}_E &= poldsymbol{e} - oldsymbol{\pi} \ oldsymbol{M} &= rac{1}{|E|}oldsymbol{C}oldsymbol{K}^{-1}oldsymbol{C}^{ op} + oldsymbol{Q}_N^{ op}oldsymbol{S}_Moldsymbol{Q}_N^{ op} \end{aligned}$$

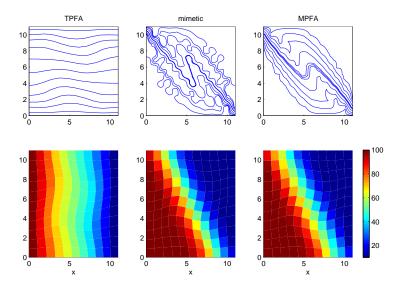
General class: TPFA, MPFA, mixed, mimetic, ...

Mixed (hybrid) formulation:

$$\begin{bmatrix} B & C & D \\ C^{\mathsf{T}} & 0 & 0 \\ D^{\mathsf{T}} & 0 & 0 \end{bmatrix} \begin{bmatrix} v \\ -p \\ \pi \end{bmatrix} = \begin{bmatrix} 0 \\ q \\ 0 \end{bmatrix}$$



Research challenge: consistent discretizations



Homogeneous $\mathbf{K} = \operatorname{diag}([1, 1000])$ rotated 30°, pressure drop from left to right

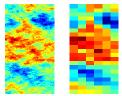
Research challenge: computationally efficient/tractable

Simulators incapable of handling required model detail. Example:

- geological models: $10^7 10^9$ cells
- ▶ simulators: 10⁵-10⁶ cells

Demand for complexity is continuously increasing.

Particular challenge: lack of scale separation



Upscaling (homogenization): bottleneck in workflow, inefficent and not sufficiently robust

Research challenge: computationally efficient/tractable

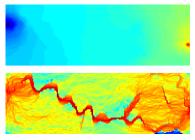
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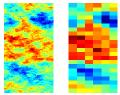
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Multiscale methods





Upscaling (homogenization): bottleneck in workflow, inefficent and not sufficiently robust

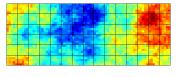
- Up-/downscaling in one step
- Pressure on coarse grid
- Fluxes on fine grid

Incorporate impact of subgrid heterogeneity in approximation spaces

Advantages: utilize more geological data, more accurate solutions, geometrical flexibility

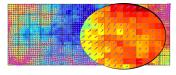
Multiscale methods

Coarse partitioning:



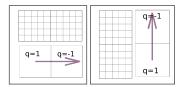
 \Downarrow

Flow field with subresolution:

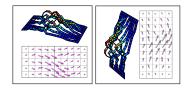




Local flow problems:



Flow solutions \rightarrow basis functions:



Make the following assumption

$$oldsymbol{v} = oldsymbol{\Psi} oldsymbol{v}_c + ilde{oldsymbol{v}}$$
 $oldsymbol{p} = oldsymbol{\mathcal{I}} oldsymbol{p}_c + ilde{oldsymbol{p}}$



 Ψ – matrix with basis functions

 $\boldsymbol{\mathcal{I}}$ – prolongation from blocks to cells

Make the following assumption

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 Ψ – matrix with basis functions

 $\boldsymbol{\mathcal{I}}$ – prolongation from blocks to cells

Reduction to coarse-scale system:

$$\begin{bmatrix} \boldsymbol{\Psi}^{\mathsf{T}} & \boldsymbol{0} \\ \boldsymbol{0} & \boldsymbol{\mathcal{I}}^{\mathsf{T}} \end{bmatrix} \begin{bmatrix} \boldsymbol{B} & \boldsymbol{C} \\ \boldsymbol{C}^{\mathsf{T}} & \boldsymbol{0} \end{bmatrix} \begin{bmatrix} \boldsymbol{\Psi} \boldsymbol{v}_c + \tilde{\boldsymbol{v}} \\ -\boldsymbol{\mathcal{I}} \boldsymbol{p}_c - \tilde{\boldsymbol{p}} \end{bmatrix} = \begin{bmatrix} \boldsymbol{0} \\ \boldsymbol{\mathcal{I}}^{\mathsf{T}} \boldsymbol{q} \end{bmatrix}$$

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- Ψ matrix with basis functions
- $\boldsymbol{\mathcal{I}}$ prolongation from blocks to cells

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Multiscale basis function:

$$egin{bmatrix} oldsymbol{B} & C \ C^{\mathsf{T}} & 0 \end{bmatrix} egin{bmatrix} \Psi \ \Phi \end{bmatrix} = egin{bmatrix} 0 \ w \end{bmatrix}$$

Set of equations located to coarse blocks. Flow driven by weight \boldsymbol{w}

Reduction to coarse-scale system:

$$egin{aligned} & \left[egin{aligned} \Psi^{\mathsf{T}} & \mathbf{0} \\ \mathbf{0} & \mathcal{I}^{\mathsf{T}} \end{bmatrix} & \left[egin{aligned} B & C \\ C^{\mathsf{T}} & \mathbf{0} \end{bmatrix} & \left[egin{aligned} \Psi v_c + ilde v \\ -\mathcal{I}p_c - ilde p \end{bmatrix} = \begin{bmatrix} \mathbf{0} \\ \mathcal{I}^{\mathsf{T}}q \end{bmatrix} \ & \left[egin{aligned} \Psi^{\mathsf{T}}B\Psi & \Psi^{\mathsf{T}}C\mathcal{I} \\ \mathcal{I}^{\mathsf{T}}C^{\mathsf{T}}\Psi & \mathbf{0} \end{bmatrix} & \left[egin{aligned} v_c \\ -p_c \end{bmatrix} = \begin{bmatrix} -\Psi^{\mathsf{T}}B ilde v + \Psi^{\mathsf{T}}C ilde p \\ q_c - \mathcal{I}^{\mathsf{T}}C^{\mathsf{T}} ilde v \end{bmatrix} \end{aligned}$$

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Set of equations located to coarse blocks. Flow driven by weight w

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Additional assumptions:

• Since p is immaterial, assume $\boldsymbol{w}^{\mathsf{T}} \tilde{\boldsymbol{p}} = 0$. Hence, $p_c^i = \int_{\Omega_c} wp \, dx$

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Additional assumptions:

• Since p is immaterial, assume $\boldsymbol{w}^{\mathsf{T}} \tilde{\boldsymbol{p}} = 0$. Hence, $p_{e}^{i} \neq \int_{\Omega_{i}} wp \, dx$ • Assume that Ψ spans velocity space, i.e., $\tilde{\boldsymbol{v}} \equiv \mathbf{0}$. Example: Velocity basis function ψ_{ij} solves a local system of equations in Ω_{ij} :

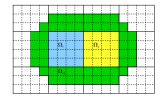
$$ec{\psi}_{ij} = -\mu^{-1} \mathbf{K}
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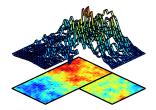
$$\nabla \cdot \vec{\psi}_{ij} = \begin{cases} w_i(\vec{x}), & \text{if } \vec{x} \in \Omega_i, \\ -w_j(\vec{x}), & \text{if } \vec{x} \in \Omega_j, \\ 0, & \text{otherwise.} \end{cases}$$

with no-flow conditions on $\partial\Omega_{ij}$

Source term: $w_i \propto \text{trace}(K_i)$ drives a unit flow through Γ_{ij} .

If there is a sink/source in T_i , then $w_i \propto q_i$.





Alternative: use good approximation to set 'global' boundary conditions for each block

To get a convergent method, we need to also account for variations that are not captured by the basis functions $^1\longrightarrow$ solve a residual equation

$$\begin{bmatrix} \boldsymbol{B} & \boldsymbol{C} \\ \boldsymbol{C}^\mathsf{T} & \boldsymbol{0} \end{bmatrix} \begin{bmatrix} \boldsymbol{\Psi} \boldsymbol{v}_c + \tilde{\boldsymbol{v}} \\ -\boldsymbol{\mathcal{I}} \boldsymbol{p}_c - \boldsymbol{D}_\lambda \boldsymbol{\Phi} \boldsymbol{v}_c - \tilde{\boldsymbol{p}} \end{bmatrix} = \begin{bmatrix} \boldsymbol{0} \\ \boldsymbol{q} \end{bmatrix}$$

¹The term $CD_{\lambda}\Phi v_c$ corresponds to subscale pressure variations modelled by the numerically computed basis functions for pressure, which should scale similar to Ψ since $B\Psi - C\Phi = 0$.

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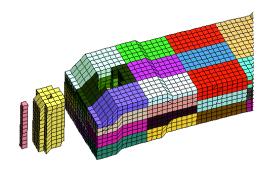
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To solve this equation, we will typically use a (non)overlapping domain-decomposition method.

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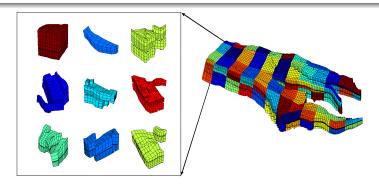
(Unique) grid flexibility:

Given a method that can solve local flow problems on the subgrid, the MsMFE method can be formulated on any coarse grid in which the coarse blocks consist of a connected collection of fine-grid cells



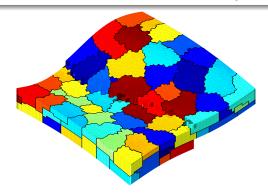
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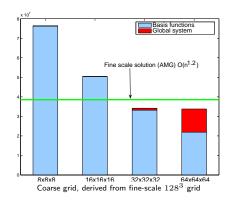
Multigrid will often be more efficient when computing pressure once.

Why bother with multiscale pressure solvers?

- Basis functions need not be recomputed or be updated infrequently

Also:

- Lower memory requirements possible to solve very large problems
- Easy parallelization computation of basis functions



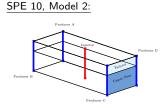
Typical applications

- 'Interactive' screening of flow patterns during geological modelling
- Simulation of multiple realizations to quantify uncertainty
- Production optimization: well rates, well placement, ...
- History matching

Key ideas:

- ► Having 80–90% of the answer in 5–10% of the time enables geologists and engineers to explore more modelling choices
- 'Full physics' is seldom needed early in the modelling workflow, focus on the *important* effects

Example: highly efficient streamline simulation

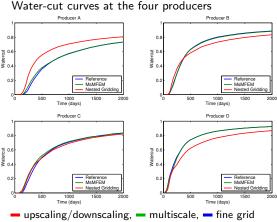


Fine grid: $60 \times 220 \times 85$ 2000 days production 25 time steps

Inhouse code from 2005: multiscale: 2 min and 20 sec multigrid: 8 min and 36 sec

Fully unstructured Matlab/C code from 2010:

mimetic : 5-6 min



Computational efficiency of a prototype code fine-scale mimetic versus a multiscale mimetic solver in a commercial solver. Neither prototypes have been optimized

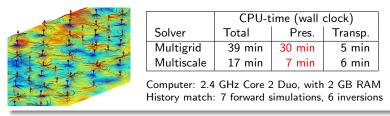
Three versions of the SPE10 model (upscaled, original, 3×3 repeat)

Model	Solver	Grid	Steps	Init	Basis	Assembly	Pressure	Transp	Total
56 k	AMG	30×110×17	13	3	—	26	96	2	129
			50	8	—	89	261	14	373
	M-S	6× 22×17	13	3	13	2	2	5	27
			50	8	11	2	4	18	44
1.1 M	AMG	60×220×85	13	46	_	525	1,787	38	2,424
	M-S	$12 \times 44 \times 17$	13	46	350	27	14	45	514
10 M	AMG	$180 \times 660 \times 85$	13	470	—	4,803	25,538	398	31,401
	M-S	36×132×17	13	470	2,597	193	169	305	3,925

Assimilation of production data to calibrate model

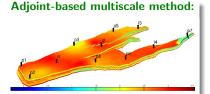
- ▶ 1 million cells, 32 injectors, and 69 producers
- 2475 days \approx 7 years of water-cut data

Generalized travel-time inversion (quasi-linearization of misfit functional) with analytical sensitivities along streamlines, Datta–Gupta et al.

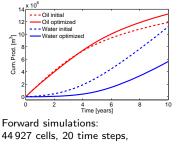


No parallelization of basis functions, streamline tracing, and 1D transport solves

Example: rate optimization of water-flood



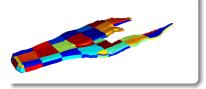
Grid model: from offshore Norway



< 5 sec in Matlab, $\sim 100 \times$ speedup

Specialized simulator with different grid for pressure and transport solvers

Pressure grid:





In addition: efficient communication between the two coarse grids

Simplest approach – four key components:

- $\label{eq:liptic_basis} {\rm Elliptic \ basis \ functions, \ constructed \ with \ } w(x) \propto \phi(x)$
- ② Coarse-scale system

$$\begin{bmatrix} \boldsymbol{\Psi}^{\mathsf{T}} \boldsymbol{B} \boldsymbol{\Psi} & \boldsymbol{\Psi}^{\mathsf{T}} \boldsymbol{C} \boldsymbol{\mathcal{I}} \\ \boldsymbol{\mathcal{I}}^{\mathsf{T}} (\boldsymbol{C}^{\mathsf{T}} \boldsymbol{\Psi} - \boldsymbol{P}_{\nu} \boldsymbol{D}_{\lambda} \boldsymbol{\Phi}) & \boldsymbol{\mathcal{I}}^{\mathsf{T}} \boldsymbol{P}_{\nu} \boldsymbol{\mathcal{I}} \end{bmatrix} \begin{bmatrix} \boldsymbol{v}_{c}^{\nu+1} \\ -\boldsymbol{p}_{c}^{\nu+1} \end{bmatrix} = \begin{bmatrix} \boldsymbol{\Psi}^{\mathsf{T}} \boldsymbol{f}_{\nu} \\ \boldsymbol{\mathcal{I}}^{\mathsf{T}} \boldsymbol{g}_{\nu} \end{bmatrix}$$

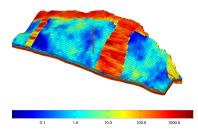
8 Residual equation

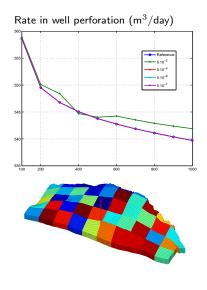
$$\begin{bmatrix} \boldsymbol{B} & \boldsymbol{C} \\ \boldsymbol{C}^{\mathsf{T}} & \boldsymbol{P} \end{bmatrix} \begin{bmatrix} \hat{\boldsymbol{v}}^{\nu+1} \\ -\hat{\boldsymbol{p}}^{\nu+1} \end{bmatrix} = \begin{bmatrix} \boldsymbol{f}_c - \boldsymbol{\Psi}^{\mathsf{T}} \boldsymbol{B} \boldsymbol{\Psi} \boldsymbol{v}_c + \boldsymbol{\Psi}^{\mathsf{T}} \boldsymbol{C} \boldsymbol{\mathcal{I}} \boldsymbol{p}_c \\ \boldsymbol{g}_c - \boldsymbol{\mathcal{I}}^{\mathsf{T}} (\boldsymbol{C}^{\mathsf{T}} \boldsymbol{\Psi} - \boldsymbol{P}_{\nu} \boldsymbol{D}_{\lambda} \boldsymbol{\Phi}) \boldsymbol{v}_c + \boldsymbol{\mathcal{I}}^{\mathsf{T}} \boldsymbol{P}_{\nu} \boldsymbol{\mathcal{I}} \boldsymbol{p}_c \end{bmatrix}$$

Iterations over multiscale and residual equations

Example: primary production

- Shallow-marine reservoir (realization from SAIGUP)
- ▶ Model size: 40 × 120 × 20
- Initially filled with gas, 200 bar
- Single producer, bhp=150 bar
- Multiscale solution for different tolerences compared with fine-scale reference solution.





Presented a multiscale framework that can be used to reduce computational complexity by

- resolving effects on different scales
- utilizing sparsity
- (systematically) reusing computations

Well tested for two-phase, incompressible flow. Research needed for more complex flow physics:

- basis function dictionary by bootstrapping
- model reduction
- better error control

Matlab Reservoir Simulation Toolbox (MRST)

MRST core

- routines for creating and manipulating grids and physical properties
- basic incompressible flow and transport solvers



Modules

Add-on software that extends, complements, and overrides existing MRST features. Presently implements more advanced solvers and tools:

- adjoint methods, experimental multiscale, fractures, MPFA, upscaling
- black-oil models, three-phase flow, vertically integrated models, ...
- streamlines, (flow-based) coarsening, ...
- Octave support, C-acceleration, . . .

Download

http://www.sintef.no/MRST/

Version 2011a was released on the 22nd of February, 2011, and can be downloaded under the terms of the GNU General Public License (GPL)