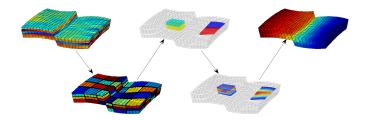
# Flow-Based Coarsening for Multiscale Simulation of Transport in Porous Media

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Workshop on Averaging, Upscaling, and New Theories in Porous Media Flow and Transport Bergen, October 14-15, 2010

### What is multiscale simulation?

### **Generally:**

Methods that incorporate fine scale information into a set of coarse scale equations in a way which is consistent with the local property of the differential operator

### Herein:

Multiscale pressure solver (upscaling + downscaling in one step)

$$\nabla \cdot \vec{v} = q, \qquad \vec{v} = -\lambda(S) \mathbf{K} \nabla p$$

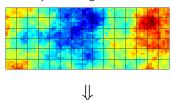
+ Transport solver (on fine, intermediate, or coarse grid)

$$\phi \frac{\partial S}{\partial t} + \nabla \Big( \vec{v} f(S) \Big) = q$$

= Multiscale simulation of models with higher detail

### What is multiscale simulation?

### Coarse partitioning:

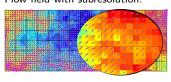


### Local flow problems:





### Flow field with subresolution:



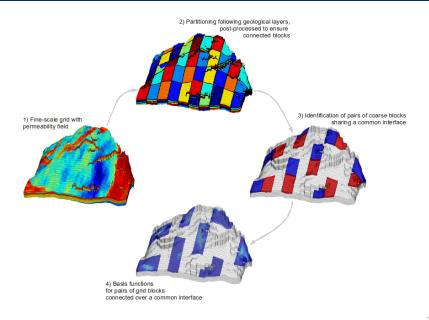


### Flow solutions $\rightarrow$ basis functions:





### What is multiscale simulation?



# What can you do with it?

### Example 1: Model 2 of SPE 10



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

Matlab/C solver (2010): ms-mimetic: 5–6 min

**Example 2: History matching** 

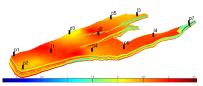


7 years: 32 injectors, 69 producers, 1 mill cells

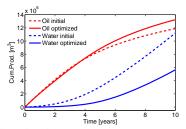
Generalized travel-time inversion + multiscale: 7 forward simulations, 6 inversions

	CPU-time (wall clock)					
Solver	Total	Pres.	Transp.			
Multigrid	39 min	30 min	5 min			
Multiscale	17 min	7 min	6 min			

**Example 3: Rate optimization** 



Reservoir geometry from a Norwegian Sea field



Forward simulations:

44 927 cells, 20 time steps, < 5 sec in Matlab

 $\sim 100$  times speedup

### State-of-the-art

### Capabilities:

- ✓ Incompressible (two-phase) flow
- ✓ Cartesian / unstructured grids
- √ Realistic flow physics ⇒ iterations
  - ► Correction functions + smoothing
  - ► Residual formulation + domain decomposition
- √ Pointwise accuracy ⇒ iterations

# State-of-the-art / What is missing?

### Capabilities:

- ✓ Incompressible (two-phase) flow
- √ Cartesian / unstructured grids
- $\checkmark$  Realistic flow physics ⇒ iterations
  - ► Correction functions + smoothing
  - Residual formulation + domain decomposition
- √ Pointwise accuracy ⇒ iterations

### Not yet there:

- ► Compressible three-phase black-oil + non-Cartesian grids
- Fully implicit formulation
- Parallelization
- ► Compositional, thermal, . . .
- Efficient and robust transport solvers

### Transport solvers on coarse grids

### Goal:

Given the ability to model velocity on geomodels and transport on coarse grids: Find a suitable coarse grid that best resolves fluid transport and minimizes loss of accuracy.

Formulated as the minimization of two measures:

- 1 the projection error between fine and coarse grid
- 2 the evolution error on the coarse grid

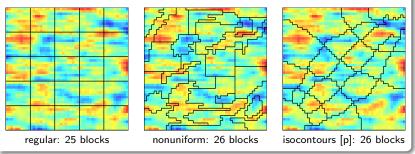
Difficult to formulate a practical and well-posed minimization problem for optimal coarsening  $\longrightarrow$  ad hoc algorithms

# Coarsening by amalgamation

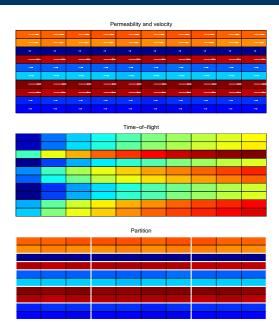
### Amalgamation of cells:

- lacktriangle coarse grid represented as partition vector: cell  $c_i$  in the fine grid is in coarse block  $B_j$  if  $p_i=j$
- coarsening process steered by a set of admissible and feasible amalgamation directions

### $50 \times 50$ lognormal permeability:



# Motiviation: layered reservoir



# Heuristic minimization algorithms

### Formulated using a set of:

create a partition vector based on grid topology, geometry, flow-based indicator functions, error estimates, or expert knowledge supplied by the user, thereby introducing the feasible amalgamation directions

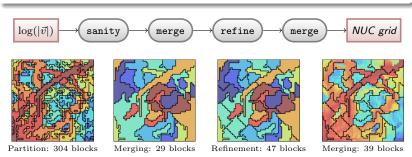
take a set of partition vectors as input and create a new partition as output, by

- combining/intersecting different partitions
- performing sanity checks, ensuring connected partitions etc
- modifying partition by merging small blocks or splitting large blocks

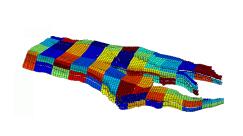
# Non-uniform coarsening

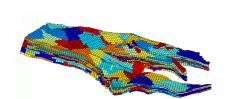
### Aarnes, Efendiev & Hauge:

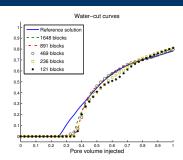
Use flow velocities to make a nonuniform grid in which each coarse block admits approximately the same total flow.

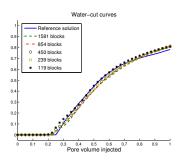


### Example: reservoir model from Norwegian Sea









# Abstracting the NUC algorithm

### **Underlying principles:**

► Minimize heterogeneity of flow field inside each block

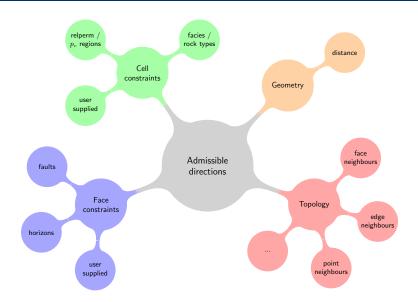
$$\min_{B_j} \left( \sum_{p_i = j} |I_1(c_i) - I_1(B_j)|^p |c_i| \right)^{\frac{1}{p}}, \qquad 1 \le p \le \infty,$$

Equilibrate indicator values over grid blocks

$$\min\left(\sum_{j=1}^{N} |I_2(B_j) - \bar{I}_2(\Omega)|^p |B_j|\right)^{\frac{1}{p}}, \quad 1 \le p \le \infty,$$

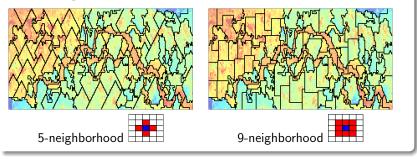
▶ Block size within prescribed lower and upper bounds

# Amalgamation: admissible directions (neighbourship)



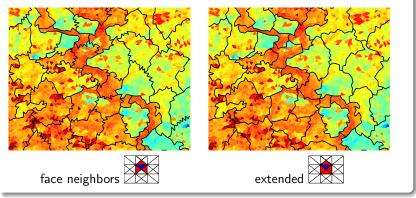
### Example: extended neighbourship

### Structured grid:

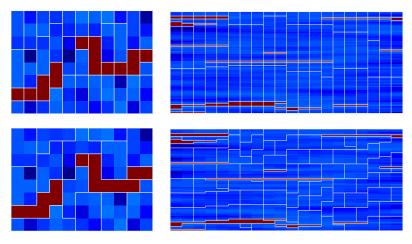


# Example: extended neighbourship



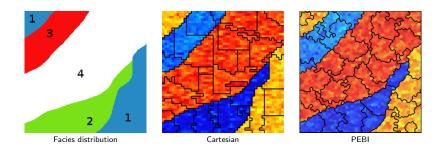


# Example: restricted neighbourship (topology)



 $\begin{array}{ll} \text{Upper row:} & \mathcal{N}(c_{ij}) = \{c_{i,j-1}, c_{i,j+1}\} \\ \text{Lower row:} & \mathcal{N}(c_{ij}) = \{c_{i,j\pm1}, c_{i\pm1,j}, c_{i\pm1,j\pm1}\} \end{array}$ 

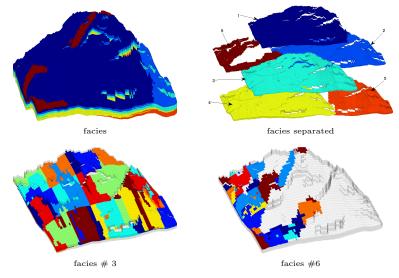
# Example: restricted neighbourship (facies)



Constraining to facies / saturation regions:

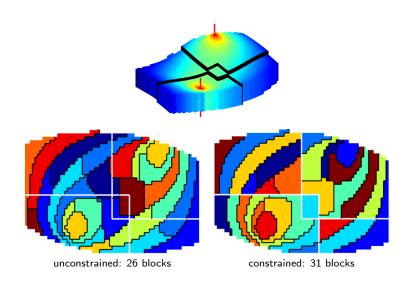
- ▶ useful to preserve heterogeneity
- lacktriangle useful to avoid upscaling  $k_r$  and  $p_c$  curves

# Example: restricted neighbourship (saturation regions)

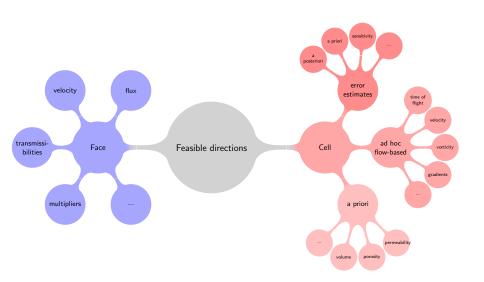


Realization from SAIGUP study, coarsening within six different saturation regions

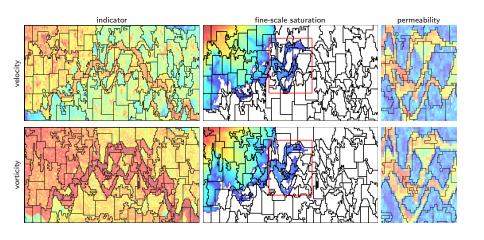
# Example: restricted neighbourship (faults)



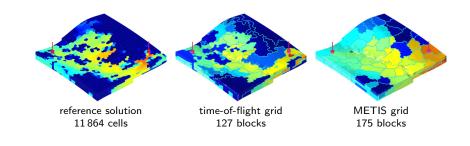
# Amalgamation: feasible directions (indicators)



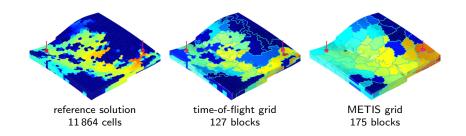
# Example: flow-based indicators



# Example: flow-based indicators



### Example: flow-based indicators



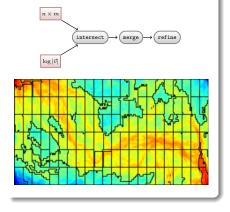
### General observations:

- ► Time-of-flight is a better indicator than velocity
- ► Velocity is a better indicator than vorticity
- ► Vorticity is a better indicator than permeability
- **.**..

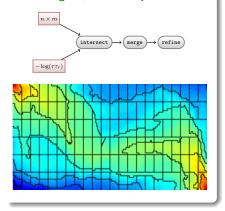
However, for smooth heterogeneities, the indicators tend to overestimate the importance of flow.

### Example: hybrid methods

### Velocity + Cartesian partition:



### Time-of-flight + Cartesian partition:



# Example: hybrid methods

# Satnum + velocity + Cartesian:

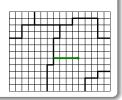
# Coarse-grid discretisation

### Bi-directional fluxes (upwind on fine scale):

This gives a centred scheme on the coarse scale

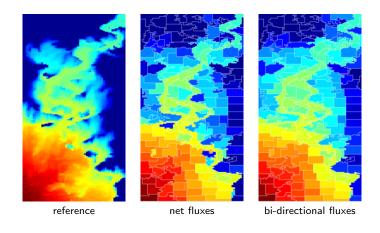
### Net fluxes:

$$\begin{split} S_\ell^{n+1} &= S_\ell^n - \frac{\Delta t}{\phi_\ell |B_\ell|} \sum_{k \neq \ell} \max \Bigl( f(S_\ell^{n+1}) \sum_{\Gamma_{k\ell}} v_{ij}, \\ &- f(S_k^{n+1}) \sum_{\Gamma_{k\ell}} v_{ij} \Bigr). \end{split}$$



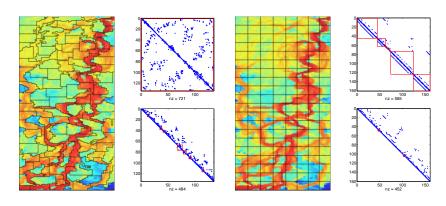
This gives an upwind scheme on the coarse scale

# Coarse-grid discretisation: numerical diffusion



Layer 37 from SPE10

# Coarse-grid discretisation: matrix structure



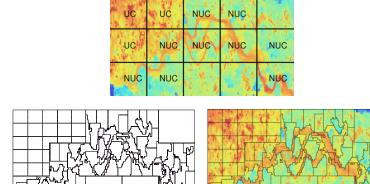
Layer 68 from SPE10

# Coarse-grid discretisation: numerical errors

	Tarbert formation			Upper Ness formation		
	NUC/Cart	NUC	Cartesian	NUC/Cart	NUC	Cartesian
$E_s(\mathcal{PR}S_f, S_f)$	0.0941	0.1042	0.0911	0.1371	0.1355	0.1772
$E_s(\mathcal{P}S_c, S_f)$	0.1910	0.2426	0.1687	0.2124	0.2243	0.2305
$E_s(S_c, \mathcal{R}S_f)$	0.1599	0.2100	0.1381	0.1522	0.1683	0.1604
$E_w(w_c, w_f)$	0.0695	0.0773	0.0701	0.0609	0.0668	0.0982
$E_s(\mathcal{P}S_c, S_f)$	0.1607	0.1875	0.1619	0.1795	0.1862	0.2191
$E_s(S_c, \mathcal{R}S_f)$	0.1237	0.1459	0.1302	0.1135	0.1225	0.1486
$E_w(w_c, w_f)$	0.0473	0.0444	0.0647	0.0237	0.0325	0.0844
# blocks	217-261	233-312	264	205-241	220-303	264
mean	236	275	264	222	264	264
# faces: mean	1069	1363	1090	1070	1309	1090
bi-directional fluxes			net fluxes	•		

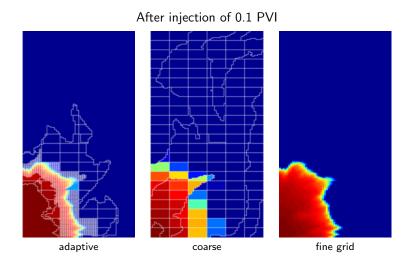
Average errors over all layers of the two formations in SPE10

# Supervised coarsening



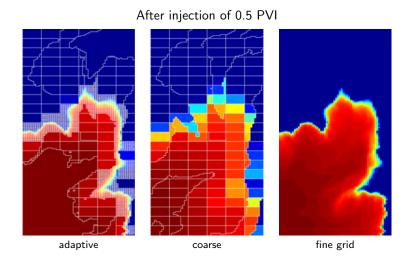
Layer 37 from SPE10

# Dynamical adaption



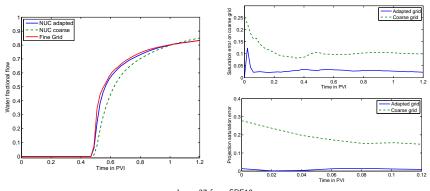
Layer 22 from SPE10

# Dynamical adaption



Layer 22 from SPE10

# Dynamical adaption



Layer 37 from SPE10

### Questions

How can these methods be useful? For what purpose would you apply them?

- ► As robust upscaling methods?
- As alternative to upscaling and fine-scale solution?
- ► To provide flow simulation earlier in the modelling loop?
- ▶ To get 90% of the answer in 10% of the time?
- Fit-for-purpose solvers in workflows for ranking, history matching, planning, optimization, . . .

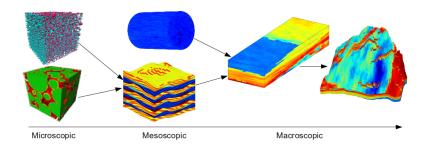
### Questions

Which capabilities should we try to develop?

- ► More complex flow physics?
- Modelling of fault/fractures?
- Multiphysics formulations?
- ▶ Automated methods with goal-oriented error control?
- **•** ...

What capabilities are sufficient for the methods to be more generally adopted?

### Questions



Ulitmate vision: 'truly' multiscale methods, bridging 'all' scales? Is incorporation of pore/core/facies models realistic?