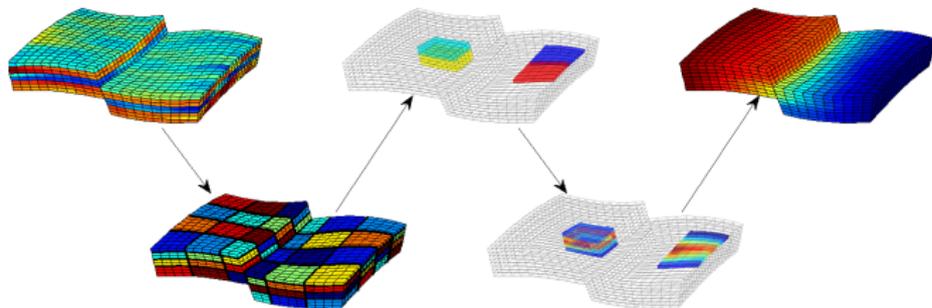


# Upgridding by Amalgamation: Flow-Adapted Grids for Multiscale Simulations

**Knut-Andreas Lie** and Jostein R. Natvig, SINTEF, Norway



SIAM Conference on  
Mathematical and Computational Issues in the Geosciences  
Long Beach, CA, March 21–24, 2011

# 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)

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

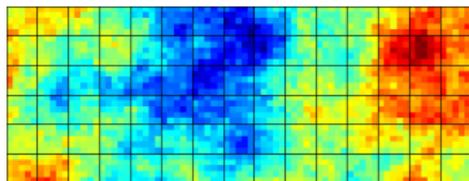
+ Transport solver (on fine, intermediate, or coarse grid)

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

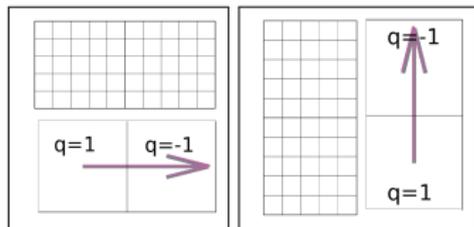
= Multiscale simulation of models with higher detail

# What is multiscale simulation?

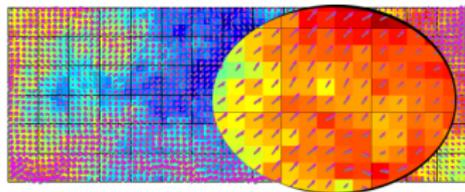
Coarse partitioning:



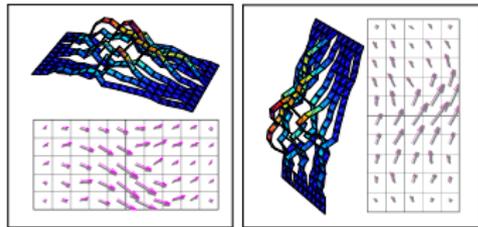
Local flow problems:



Flow field with subresolution:



Flow solutions  $\rightarrow$  basis functions:



## 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.

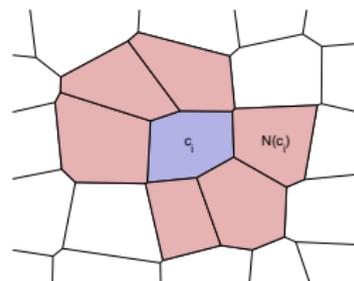
Formulated as the minimization of two measures:

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

# Flow-adapted coarsening

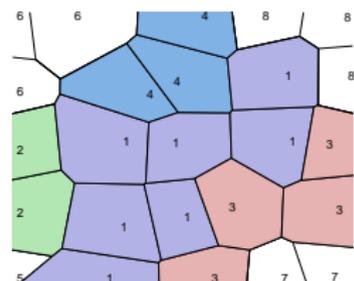
Assumptions:

- ▶ a matching polyhedral grid with  $n$  cells  $c_i$ ,
- ▶ a mapping  $\mathcal{N}(c)$  between cell  $c$  and its nearest neighbours,
- ▶ a set of flow indicators  $I(c_i)$  in cell  $c_i$



We seek a coarse grid that:

- ▶ adapts to the flow pattern predicted by indicator  $I$ ,
- ▶ is formed by grouping cells into  $N$  blocks  $B_\ell$ ,
- ▶ is described by a partition vector  $p$  with  $n$  elements, in which element  $p_i$  assumes the value  $\ell$  if cell  $c_i$  is member of block  $B_\ell$ .



- ▶ Minimize heterogeneity of flow field inside each block

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

- ▶ Equilibrate indicator values over grid blocks

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

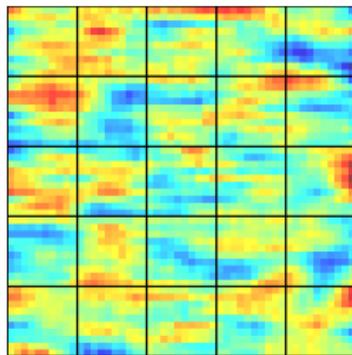
- ▶ Keep block sizes within prescribed lower and upper bounds

# Amalgamation algorithm

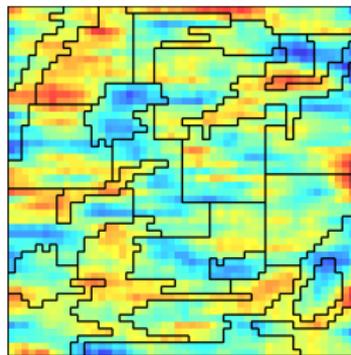
## Amalgamation of cells:

- ▶ Difficult to formulate a practical and well-posed minimization problem for optimal coarsening → **ad hoc algorithms**
- ▶ Coarsening process steered by a set of admissible and feasible amalgamation directions

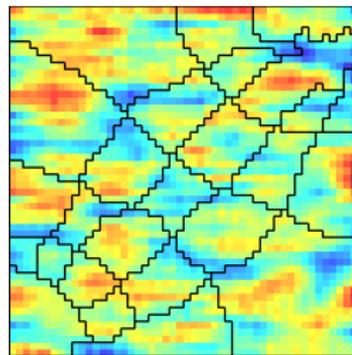
## 50 × 50 lognormal permeability:



regular: 25 blocks



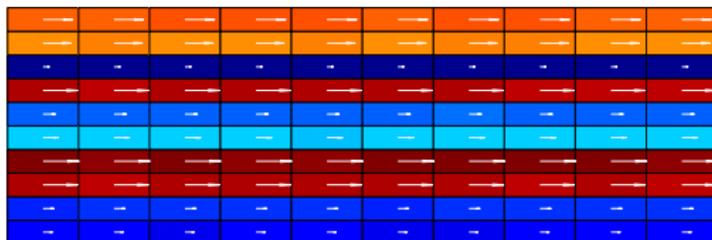
flow magnitude: 26 blocks



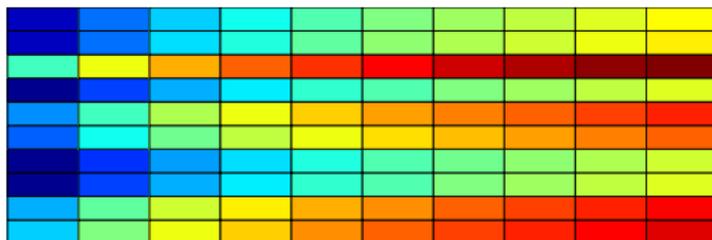
isocontours [p]: 26 blocks

# Motivation: layered reservoir

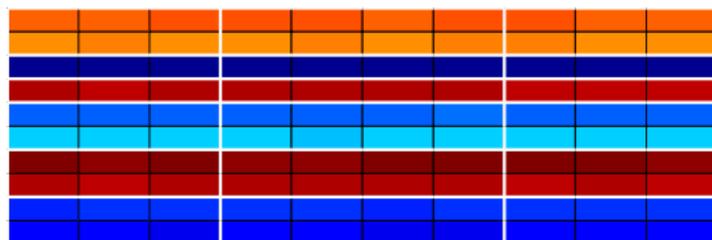
Permeability and velocity



Time-of-flight



Partition



# Heuristic minimization: algorithmic components

Formulated using a set of:

*sources*

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

*filters*

that 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 according to admissible directions, etc
- ▶ modifying partition by merging small blocks or splitting large blocks

# Heuristic minimization: algorithmic components

## Partition:

- ▶ prescribed topology or predefined shapes
- ▶ segmentation of cells  $c_i$  into bins  $\tilde{B}_\ell$

$$c_i \subset \tilde{B}_\ell \text{ if } I(c_i) \in [\ell, \ell + 1).$$

assuming indicator function  $I$  scaled to the interval  $[1, M + 1]$

## Intersection:

- ▶ intersect two or more partitions to produce a new partition
- ▶ split multiply connected blocks into sets of singly connected cells

# Heuristic minimization: algorithmic components

## Merging:

If block  $B$  violates the condition

$$I(B) |B| \geq \frac{N_L}{n} \bar{I}(\Omega) |\Omega|,$$

for a prescribed constant  $N_L$ , the block is merged with the neighbouring block  $B'$  that has the closest indicator value, i.e.,

$$B' = \operatorname{argmin}_{B'' \subset \mathcal{N}(B)} |I(B) - I(B'')|.$$

## Refinement:

Refine blocks  $B$  that violate the condition

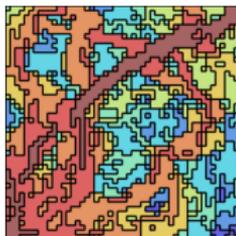
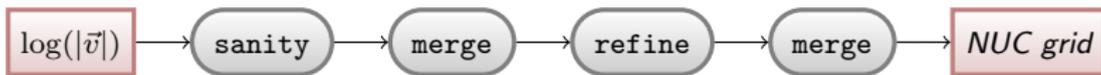
$$I(B) |B| \leq \frac{N_U}{n} \bar{I}(\Omega) |\Omega|,$$

for a prescribed constant  $N_U$

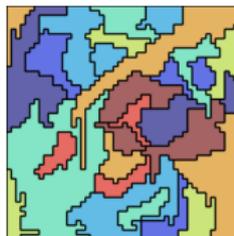
# Example: non-uniform coarsening

**Aarnes, Efendiev & Hauge (2007):**

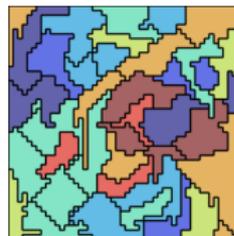
Use flow velocities to make a nonuniform grid in which each coarse block admits approximately the same total flow.



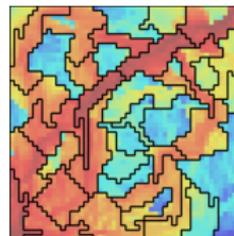
Partition: 304 blocks



Merging: 29 blocks

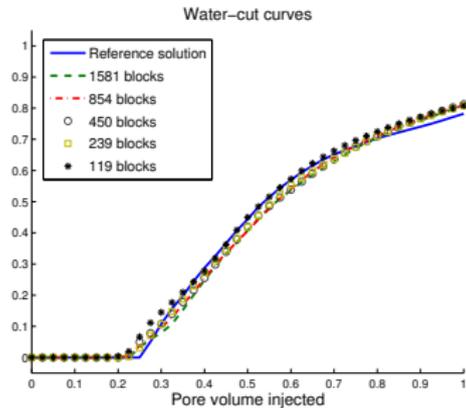
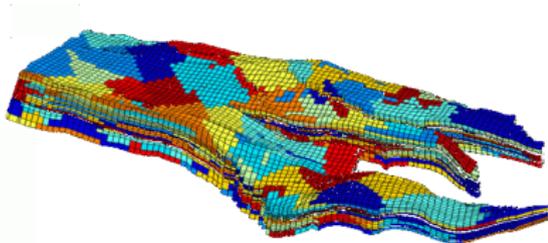
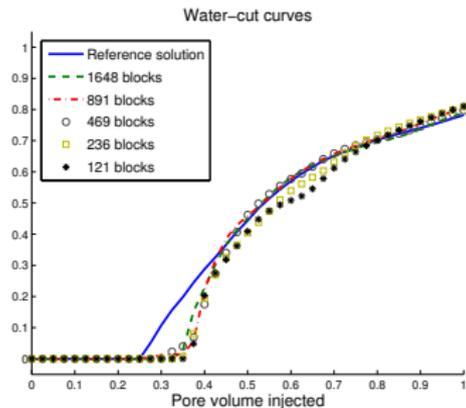
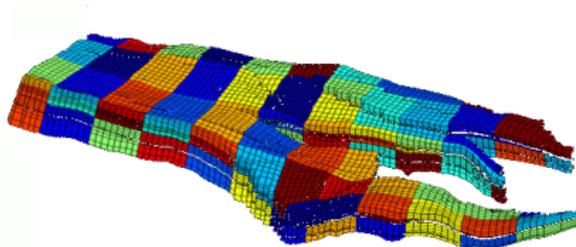


Refinement: 47 blocks

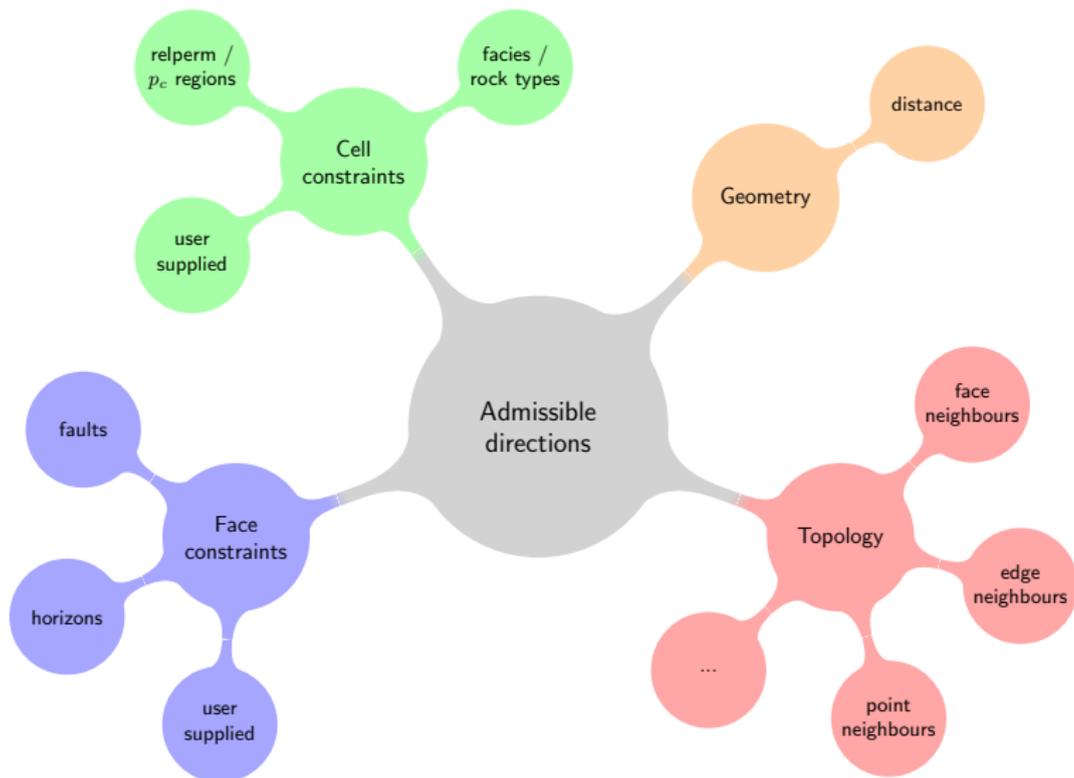


Merging: 39 blocks

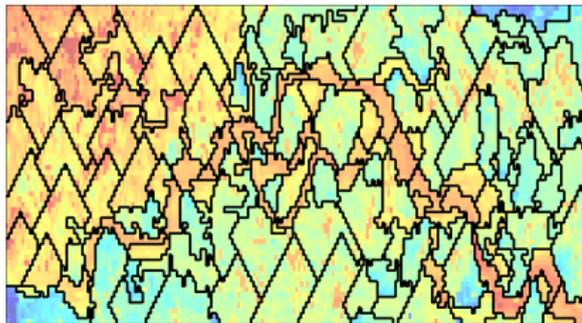
# Example: non-uniform coarsening



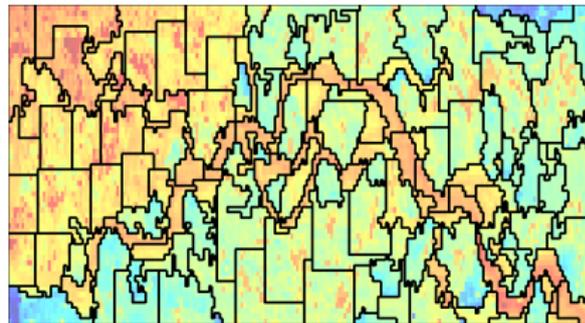
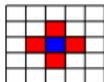
# Amalgamation: admissible directions (neighbourship)



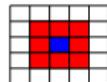
# Amalgamation: extended neighbourhood (topology)



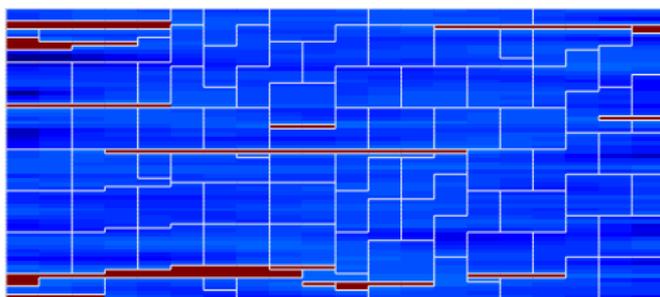
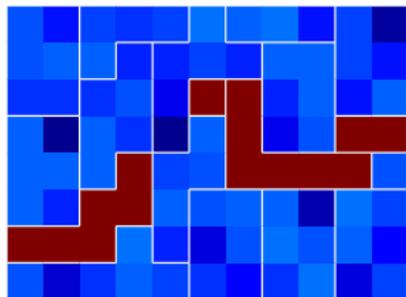
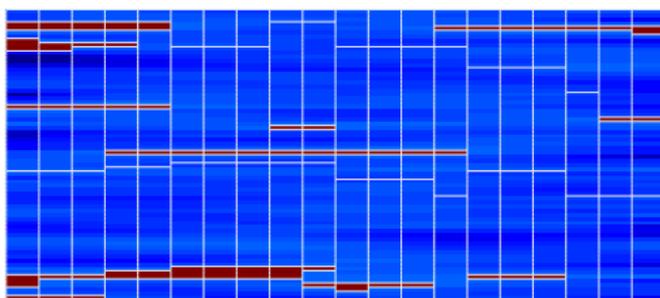
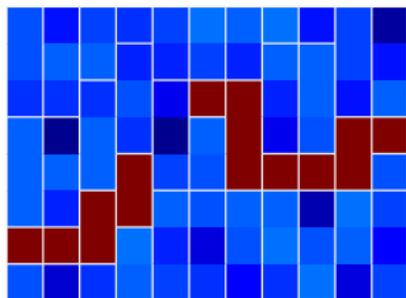
5-neighborhood



9-neighborhood



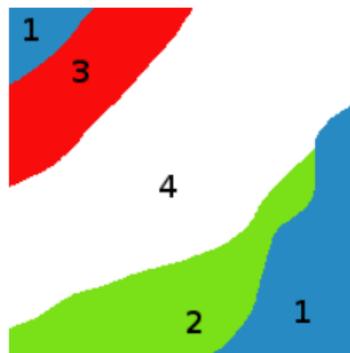
# Amalgamation: restricted neighbourhood (topology)



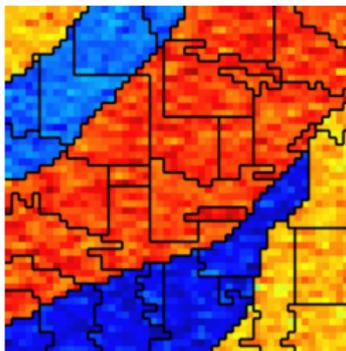
Upper row:  $\mathcal{N}(c_{ij}) = \{c_{i,j\pm 1}\}$

Lower row:  $\mathcal{N}(c_{ij}) = \{c_{i,j\pm 1}, c_{i\pm 1,j}, c_{i\pm 1,j\pm 1}\}$

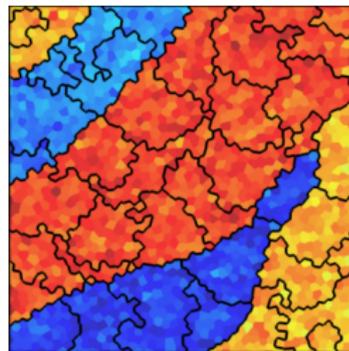
# Amalgamation: restricted neighbourhood (facies)



Facies distribution



Cartesian

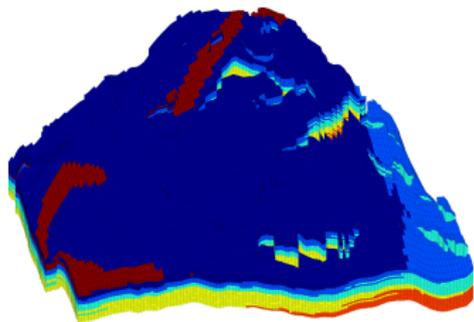


PEBI

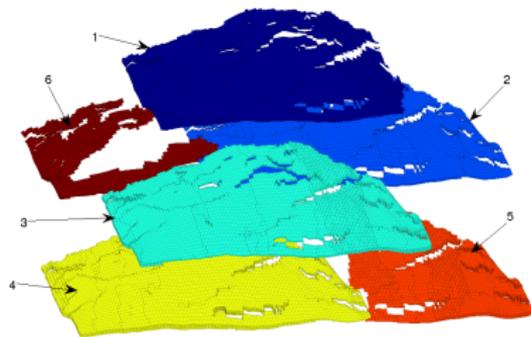
Constraining to facies / saturation regions:

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

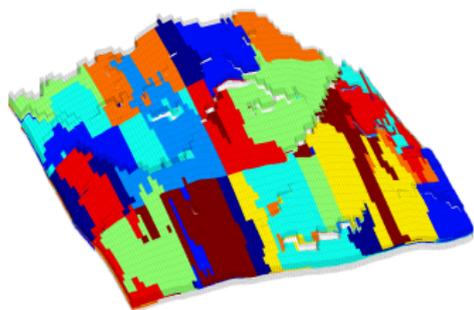
# Amalgamation: restricted neighbourhood (satnum)



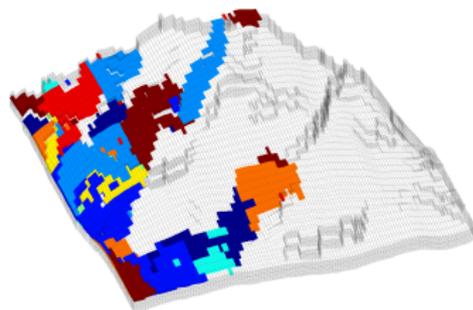
saturation regions



regions separated



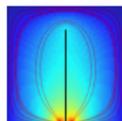
region # 3



region #6

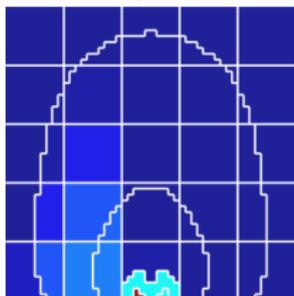
Realization from SAIGUP study, coarsening within six different saturation regions

# Amalgamation: restricted neighbourhood (faults)



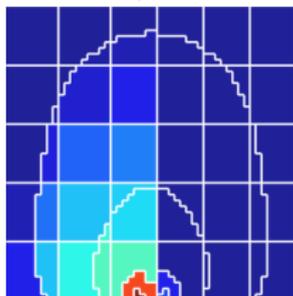
unconstrained

5 × 5 partition



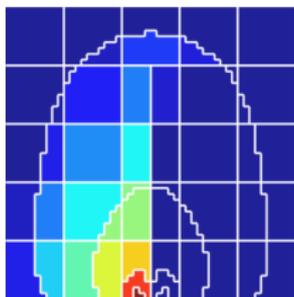
46 blocks

6 × 5 partition

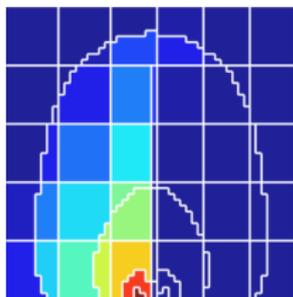


52 blocks

constrained

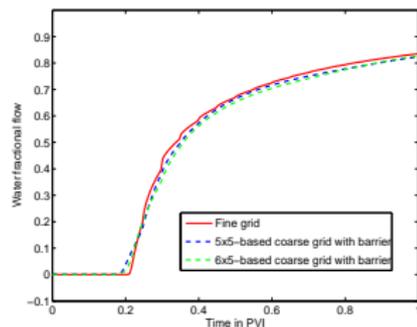
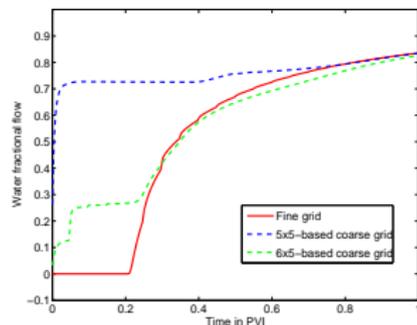


52 blocks

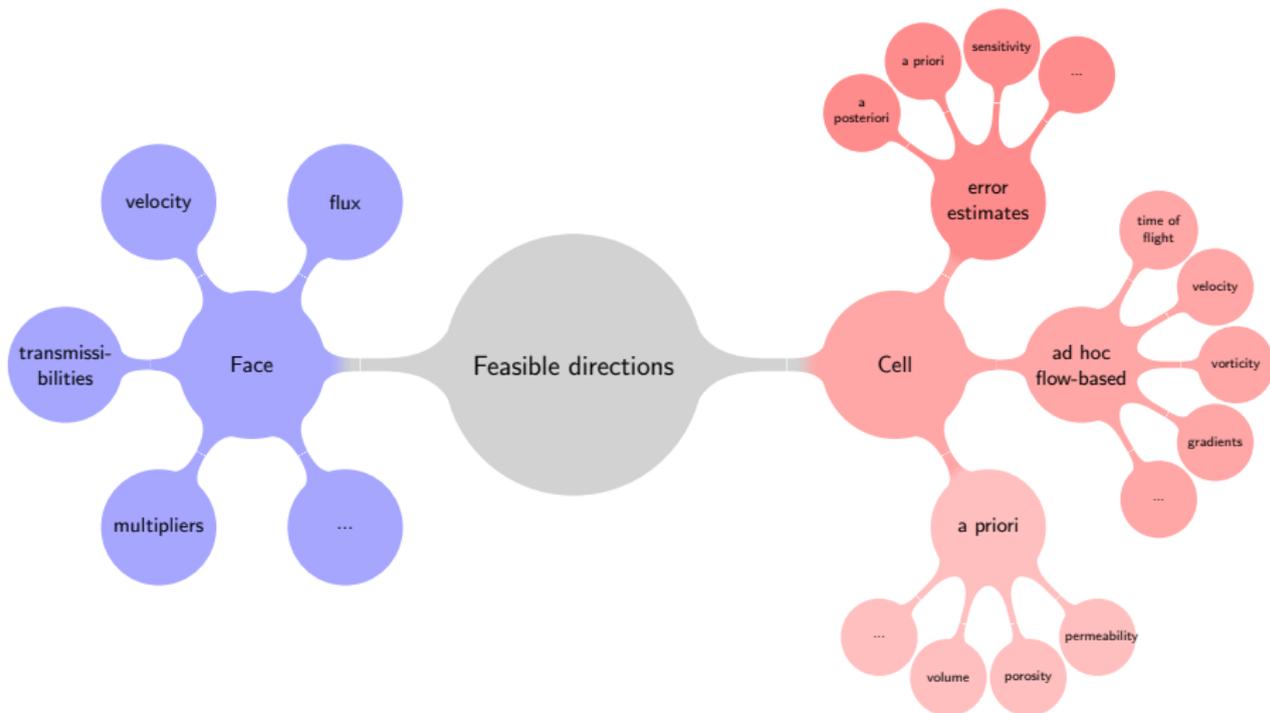


58 blocks

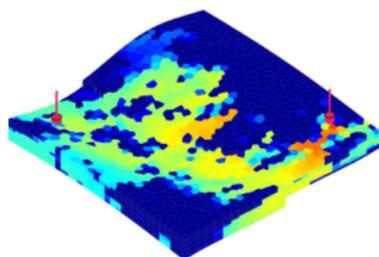
water-cut curves



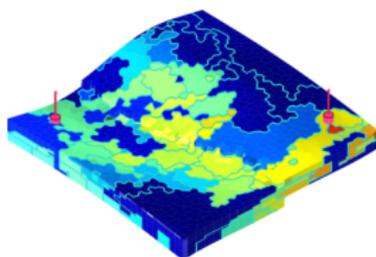
# Amalgamation: feasible directions (indicators)



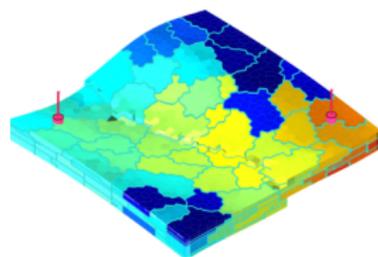
# Example: flow-based indicators



reference solution  
11 864 cells



time-of-flight grid  
127 blocks



METIS grid  
175 blocks

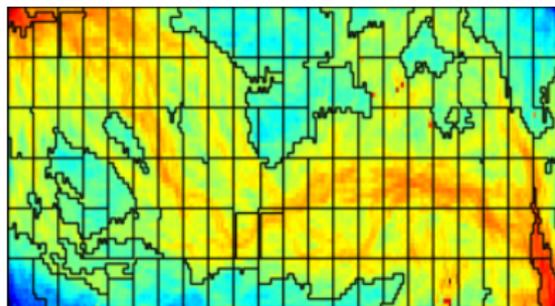
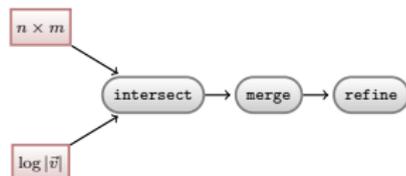
## General observations:

- ▶ Time-of-flight is typically a better indicator than velocity
- ▶ Velocity is a better indicator than vorticity
- ▶ Vorticity is a better indicator than permeability
- ▶ ...

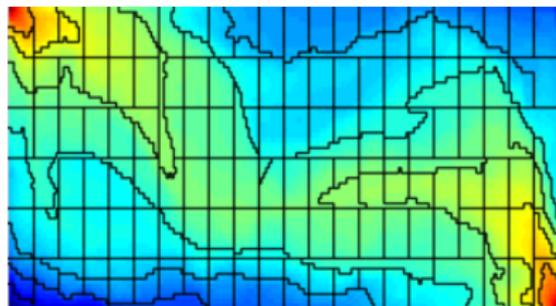
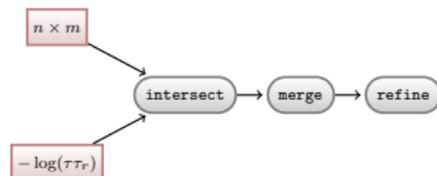
However, for smooth heterogeneities, the indicators tend to overestimate the importance of flow.

# Example: hybrid methods

## Velocity + Cartesian partition:

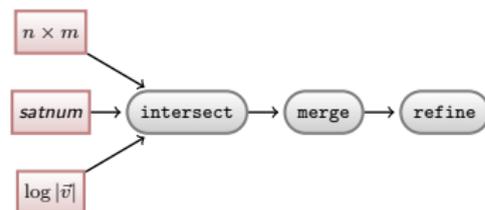
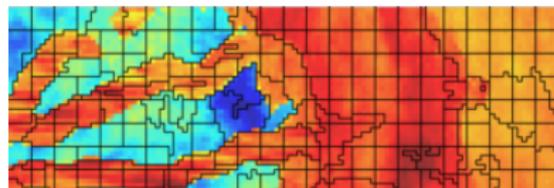
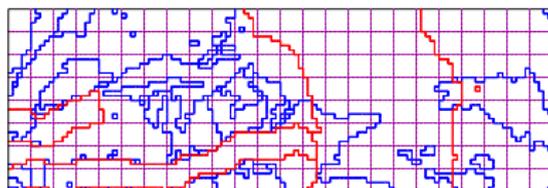


## Time-of-flight + Cartesian partition:



# Example: hybrid methods

Satnum + velocity + Cartesian:



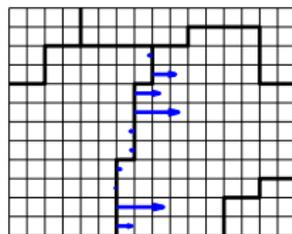
# Flow-adapted coarsening: summary

- ▶ Developed a general and flexible framework
  - ▶ Heuristic algorithms: good rather than optimal grid
  - ▶ Algorithmic components: partition, intersection, merging, refinement
  - ▶ Key concepts: flow indicator, admissible and feasible directions
- ▶ Systematic way of generating fit-for-purpose grids
  - ▶ Several existing methods appear as special cases
- ▶ Inclusion of geological information and expert knowledge important
  - ▶ Facies, saturation regions, surfaces, faults, etc.
  - ▶ Predefined shapes and topologies

# Coarse-grid discretisation

Bi-directional fluxes (upwind on fine scale):

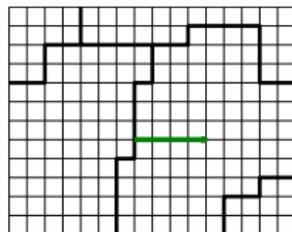
$$S_\ell^{n+1} = S_\ell^n - \frac{\Delta t}{\phi_\ell |B_\ell|} \left[ f(S_\ell^{n+1}) \sum_{\partial B_\ell} \max(v_{ij}, 0) - \sum_{k \neq \ell} \left( f(S_k^{n+1}) \sum_{\Gamma_{k\ell}} \min(v_{ij}, 0) \right) \right].$$



This gives a **centred scheme** on the coarse scale

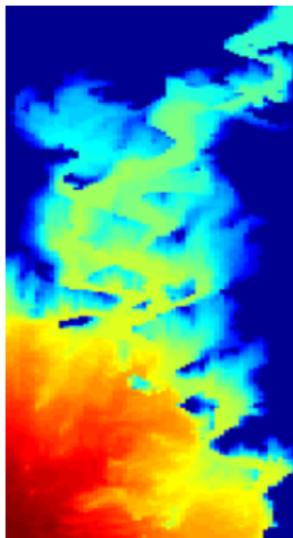
Net fluxes:

$$S_\ell^{n+1} = S_\ell^n - \frac{\Delta t}{\phi_\ell |B_\ell|} \sum_{k \neq \ell} \max \left( f(S_\ell^{n+1}) \sum_{\Gamma_{k\ell}} v_{ij}, -f(S_k^{n+1}) \sum_{\Gamma_{k\ell}} v_{ij} \right).$$

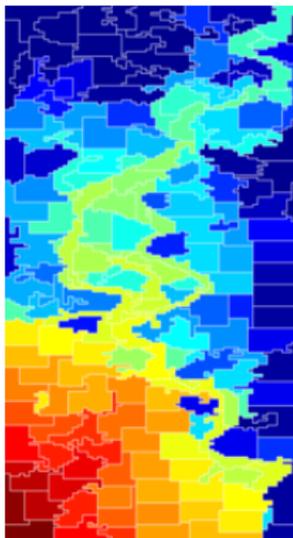


This gives an **upwind scheme** on the coarse scale

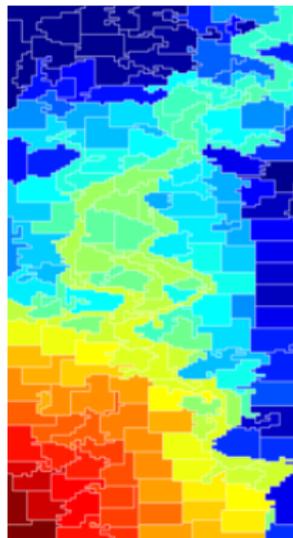
# Coarse-grid discretisation: numerical diffusion



reference



net fluxes

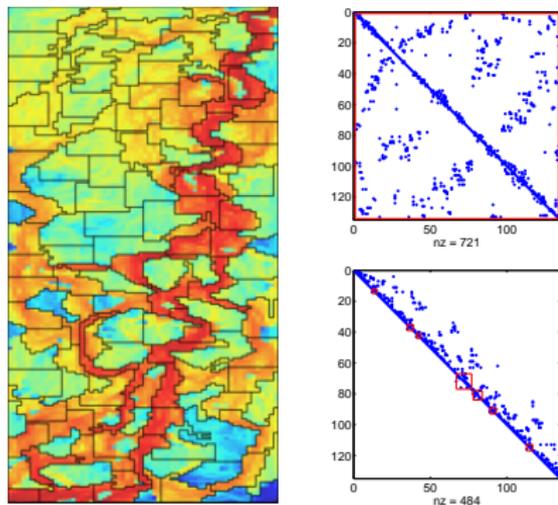


bi-directional fluxes

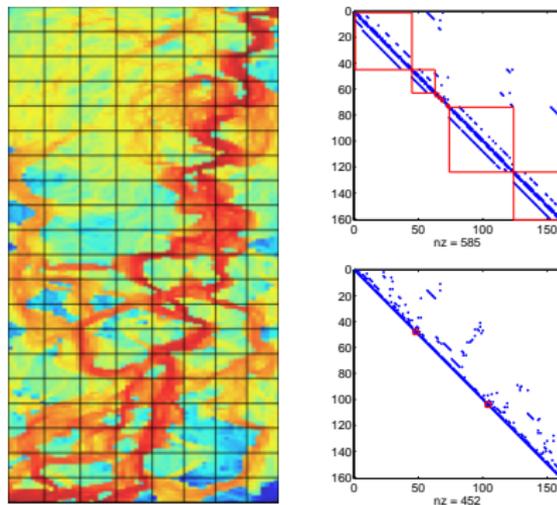
Layer 37 from SPE10

# Coarse-grid discretisation: matrix structure

Flow-adapted grid

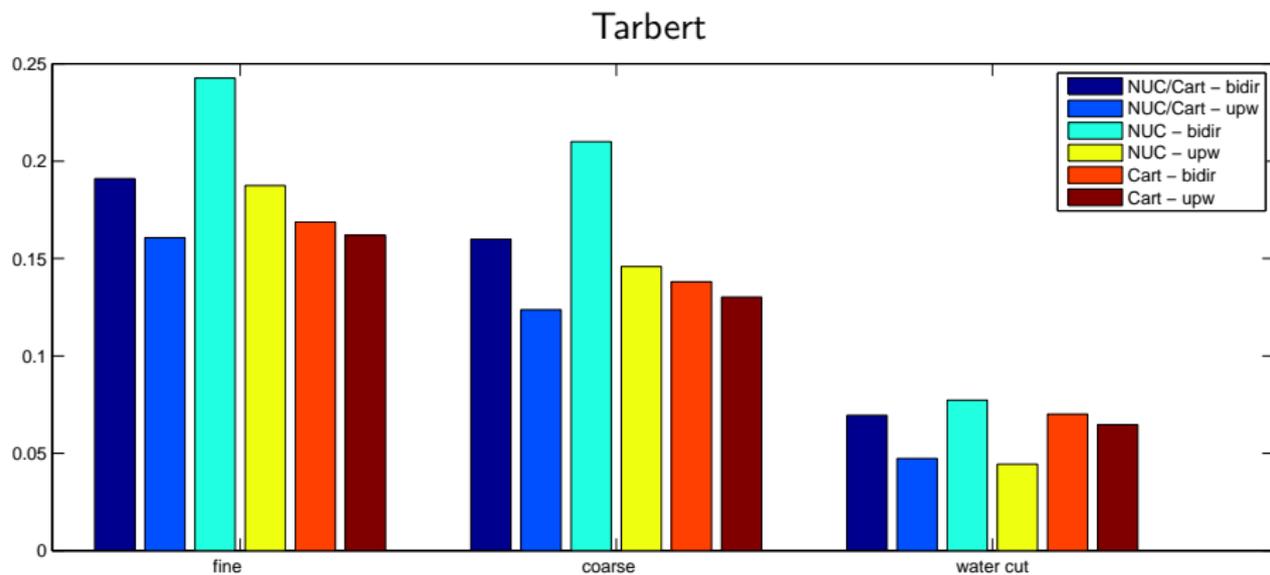


Cartesian grid



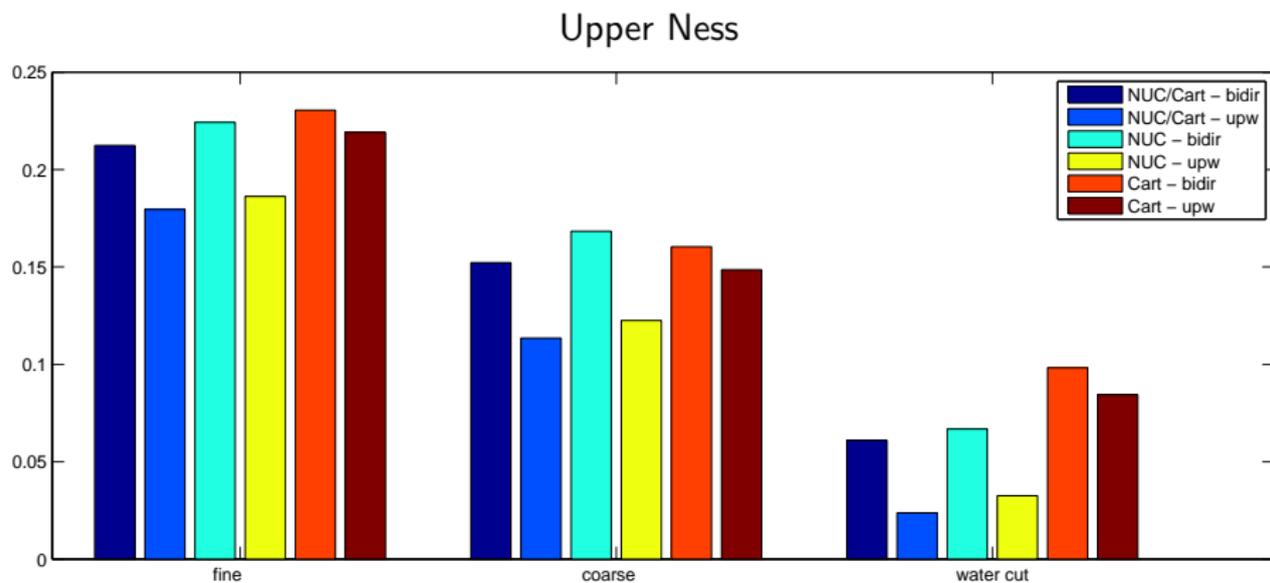
Layer 68 from SPE10. Top: bi-directional fluxes. Bottom: net fluxes

# Coarse-grid discretisation: numerical errors



Average errors over all layers of the two formations in SPE10

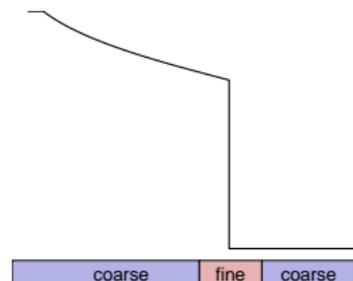
# Coarse-grid discretisation: numerical errors



Average errors over all layers of the two formations in SPE10

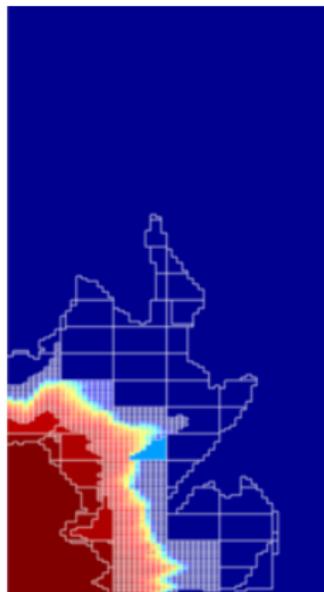
# Dynamical adaption

- ▶ Inaccurate representation of strong displacement fronts can lead to significant errors.
- ▶ **Idea:** Refine dynamically around strong fronts.
- ▶ For a Buckley–Leverett displacement:
  - ▶ Unswept region ahead of the displacement: coarse grid.
  - ▶ Swept region behind the front: coarse grid.
  - ▶ At the front: fine or intermediate grid.

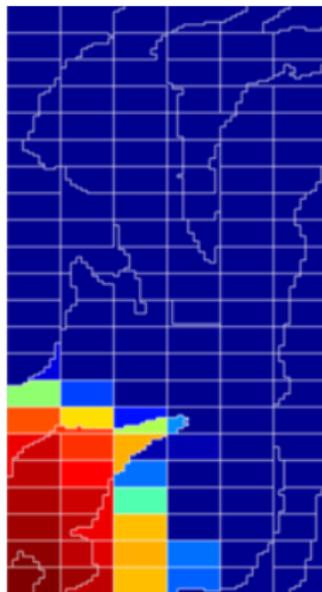


# Example: layers from SPE10

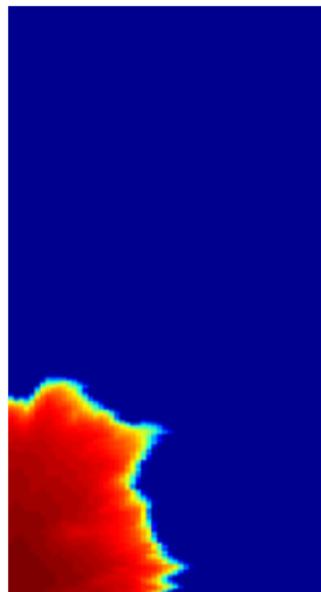
After injection of 0.1 PVI



adaptive



coarse

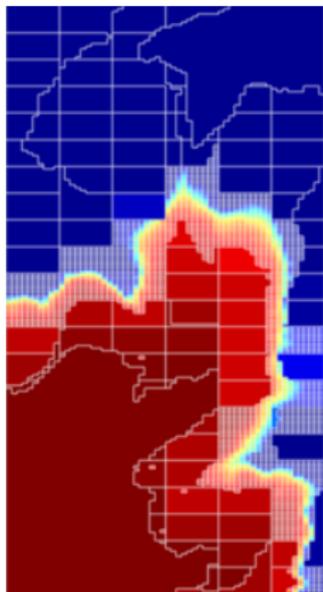


fine grid

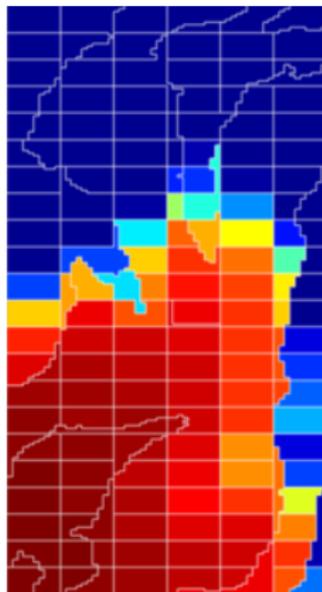
Layer 22 from SPE10

# Example: layers from SPE10

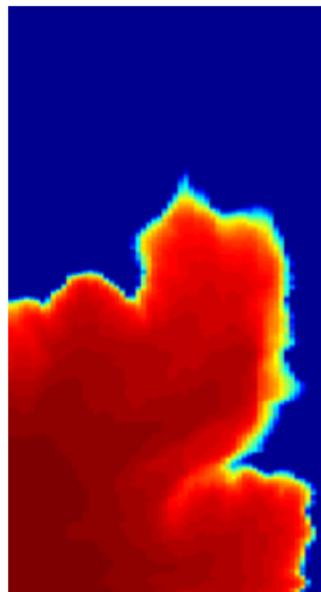
After injection of 0.5 PVI



adaptive



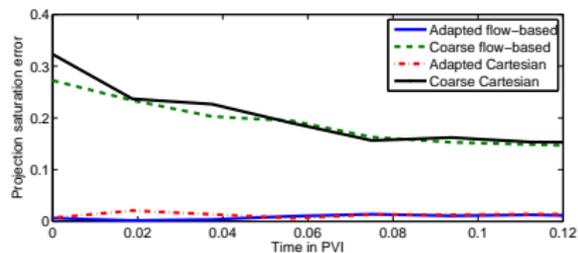
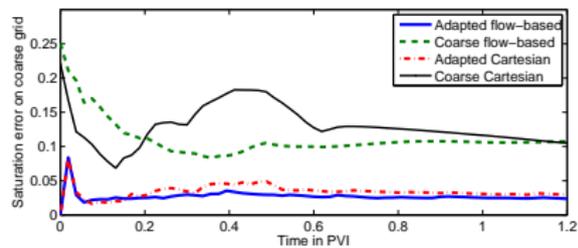
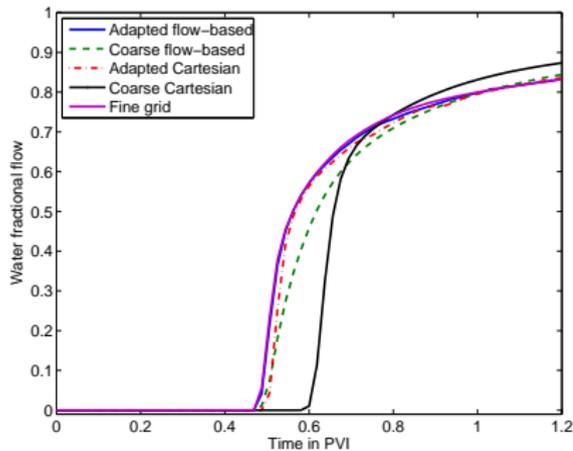
coarse



fine grid

Layer 22 from SPE10

# Example: layers from SPE10



Layer 37 from SPE10