

Dynamic Coarsening for Efficient Simulation of Geothermal Energy Applications

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- Hot underground aquifers are appealing resources for energy production and storage
 - Renewable ✓ Always on ✓ Available anywhere ✓
- Viability depends a number of factors (Glassley [2010], Stober and Bucher [2013])
 - Efficiency, storage capacity, operational and drilling costs, legal regulations, ...
- Assessment requires solid system knowledge (Andersson [2007])
 - Aquifer/aquiclude geology, groundwater chemistry, flow properties, ...

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0.953.5em Complexity and size typically renders numerical simulations the only viable option
(O'Sullivan et al. [2000], Lee [2010], Stober and Bucher [2013])

Motivation

- Transport of geothermal heat chiefly confined to proximity of wells
- Difficult to determine appropriate grid resolution apriori
- Many geomodels not suitable for conventional grid refinement methods

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- Transport of geothermal heat chiefly confined to proximity of wells
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- Reservoir engineering applications:

cells in simulation grid \ll # cells in geocellular model

- State-of-the-art multiscale methods (attempt to) bridge gap for pressure problems [Jenny et al., 2006, Møyner and Lie, 2016, Lie et al., 2017], etc.
- Here: attempt to bridge this gap for transport problems by **dynamic coarsening**
 - Implementation in the MATLAB Reservoir Simulation Toolbox (MRST)

Governing equations and discretization

- Single-phase conservation of mass on semi-discrete, implicit form

$$R_f^{n+1} = \frac{1}{\Delta t^n} (M_f^{n+1} - M_f^n) + \nabla \cdot \vec{V}_f^{n+1} - Q_f = 0$$

Mass Flux Sources/sinks

- Mass flux from Darcy's law: $\vec{V}_f = -\frac{\rho_f}{\mu_f} K(\nabla p - \rho_f \vec{g})$

Governing equations and discretization

- Conservation of energy on semi-discrete, implicit form

$$R_e^{n+1} = \frac{1}{\Delta t^n} ([M_f u_f + M_r u_r]^{n+1} - [M_f u_f + M_r u_r]^n) + \nabla \cdot (\vec{V}_f h_f + \vec{H})^{n+1} - Q_f h_f^{n+1} = 0$$

Internal energy

Advective heat flux

Conductive heat flux

Enthalpy

- Heat flux from Fourier's law: $\vec{H} = -(\lambda_f + \lambda_r) \nabla T$

Governing equations and discretization

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Internal energy

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- Heat flux from Fourier's law: $\vec{H} = -(\lambda_f + \lambda_r) \nabla T$
- Finite-volume + implicit timestepping → stable over wide range of parameters

Newton's method: make system $R(x) = 0$, linearize, neglect higher-order terms

$$x^{k+1} = x^k + \Delta x, \quad -\frac{\partial R}{\partial x} \Delta x = R(x^k)$$

Sequential implicit formulation

1. Form pressure equation as weighted sum of \mathcal{R}_f and \mathcal{R}_e

$$\mathcal{R}_p = \omega_f \mathcal{R}_f + \omega_e \mathcal{R}_e, \quad \frac{\partial(\omega_f \mathcal{M}_f^{n+1})}{\partial v^i} + \frac{\partial(\omega_e [M_f u_f + M_r u_r]^{n+1})}{\partial v^i} = 0, \quad v^i \neq \text{pressure}$$

2. Solve $\mathcal{R}_p = 0$ with fixed temperature and transport variables
→ pressure + intercell fluxes
3. Solve $\mathcal{R}_f = 0$ and $\mathcal{R}_e = 0$ with fixed pressure and intercell fluxes
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Sequential implicit formulation

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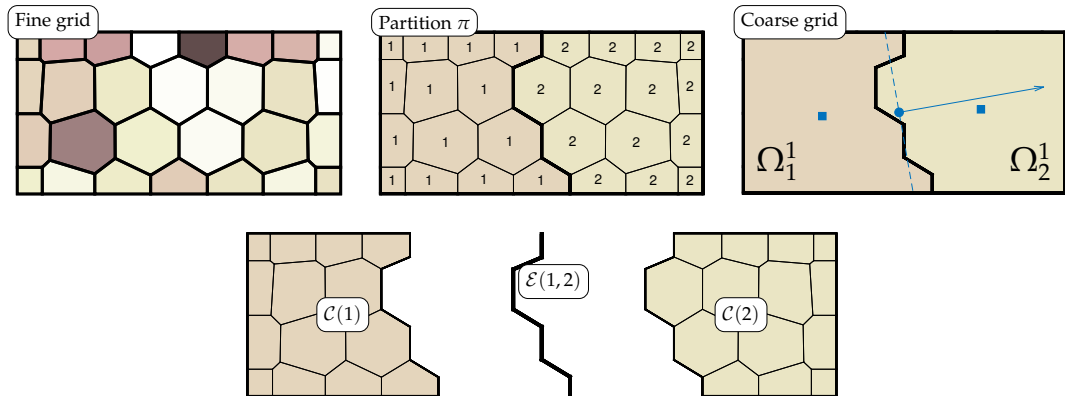
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Transport formulation: solve for **temperature** T and **total saturation** S_t
→ allow total saturation to be $\neq 1$, multiply mass and fluxes by total saturation

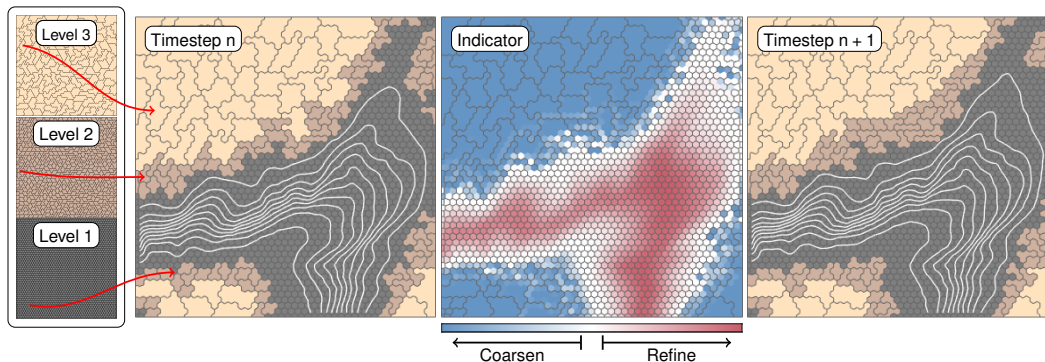
$$\mathcal{M}_f \rightarrow S_t \mathcal{M}_f u_f, \quad \mu_f \rightarrow \mu_f / S_t, \quad \lambda_\alpha \rightarrow S_t \lambda_\alpha$$

Dynamic coarsening – Coarse grids



Hauge et al. [2012], Karimi-Fard and Durlofsky [2014], Jones et al. [2020], Klemetsdal and Lie [2020],
Klemetsdal et al. [2021]

Dynamic coarsening – Constructing dynamic grids



Keep track of which cells to refine/coarsen using coarsening indicator $\mathcal{I}(u) \in \mathbb{R}_+^N$

Coarse block comprising fine-scale cells \mathcal{C}

coarsen if $\mathcal{I}_i < \varepsilon_c$ for **all** $i \in \mathcal{C}$, **refine** if $\mathcal{I}_i > \varepsilon_r$ for **any** $i \in \mathcal{C}$

Dynamic coarsening – Mapping quantities

Mapping should be **energy conservative**

$$|\Omega^a|(\mathcal{M}_f^a u_f^a + \mathcal{M}_r^a u_r^a) = \sum_{i \in \mathcal{C}} |\Omega_i| (\mathcal{M}_{f,i} u_{f,i} + \mathcal{M}_{r,i} u_{r,i})$$

1. Pressure, Temperature, and total intercell fluxes

$$p^a = \underbrace{\frac{1}{\phi^a |\Omega^a|} \sum_{i \in \mathcal{C}} \phi_i |\Omega_i| p_i}_{\text{pore-volume-weighted}}$$

$$T^a = \underbrace{\frac{1}{\phi^a |\Omega^a|} \sum_{i \in \mathcal{C}} \phi_i |\Omega_i| T_i}_{\text{pore-volume-weighted}}$$

$$v^a = \underbrace{\sum_{(m,n) \in \mathcal{E}} v_{mn}}_{\text{sum fine-scale fluxes}}$$

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2. Compute energy on adapted grid $\rightarrow |\Omega^a|(\mathcal{M}_f^a u_f^a + \mathcal{M}_r^a u_r^a)$

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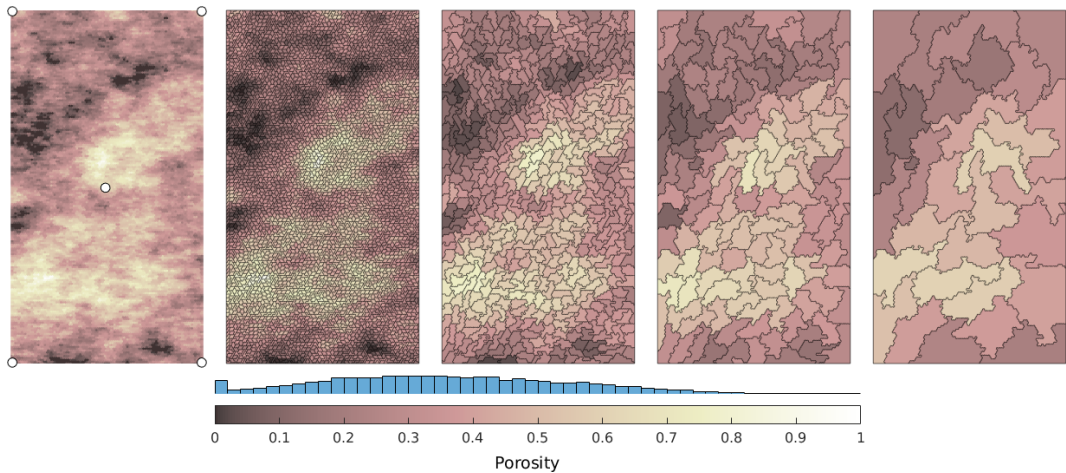
2. Compute energy on adapted grid $\rightarrow |\Omega^a|(\mathcal{M}_f^a u_f^a + \mathcal{M}_r^a u_r^a)$
3. Set total saturation equal to **energy discrepancy**

$$S_t = \frac{\sum_{i \in \mathcal{C}} |\Omega_j|(\mathcal{M}_{f,i} u_{f,i} + \mathcal{M}_{r,i} u_{r,i})}{|\Omega^a|(\mathcal{M}_f^a u_f^a + \mathcal{M}_r^a u_r^a)} = \frac{\text{accumulated energy from fine grid}}{\text{energy on adapted grid}}$$

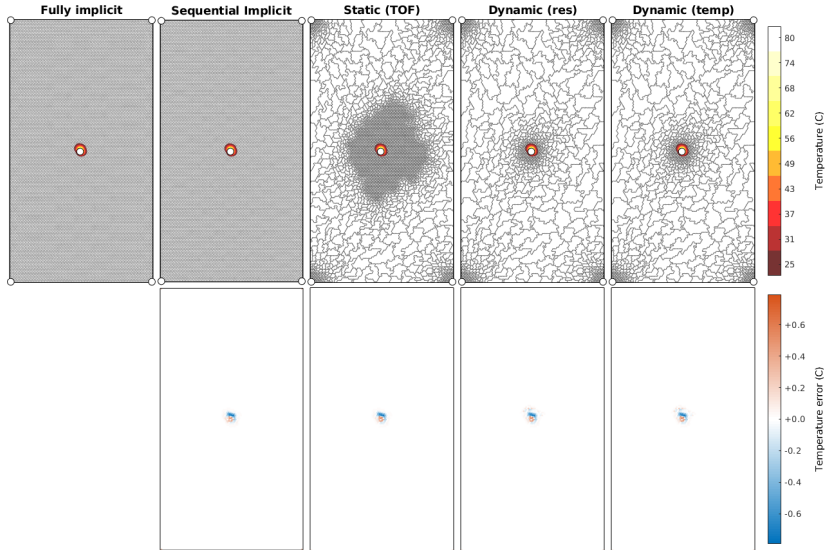
Example: SPE10 Model 2

- Heat storage in two different layers of SPE10 Model 2
- Three one-year cycles of storage in center well with pressure support in corner wells
 1. **Load phase:** 3 months of injection at 80 °C, bhp = 70 bar
 2. **Rest phase:** 3 months with no driving forces
 3. **Unload phase:** 3 months of extraction, bhp = 1500 bar
 4. **Rest phase:** 3 months with no driving forces
- Three coarsening approaches
 1. Static based on incompressible time-of-flight
 2. Dynamic with residual-based indicator
 3. Dynamic with temperature indicator

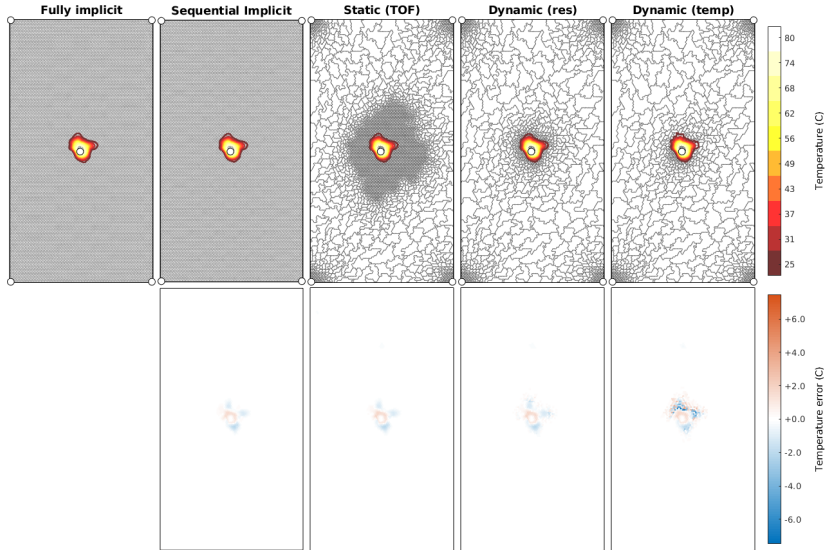
Example: SPE10 Model 2 – Tarbert Formation (layer 10)



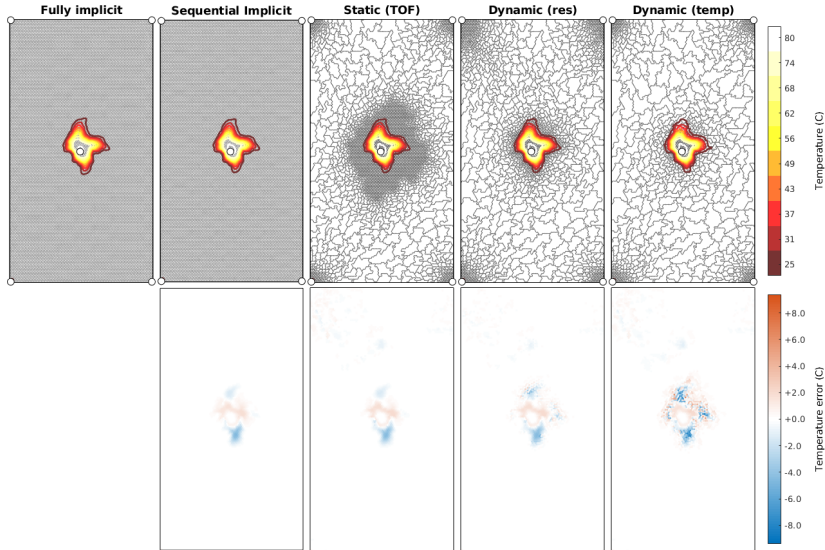
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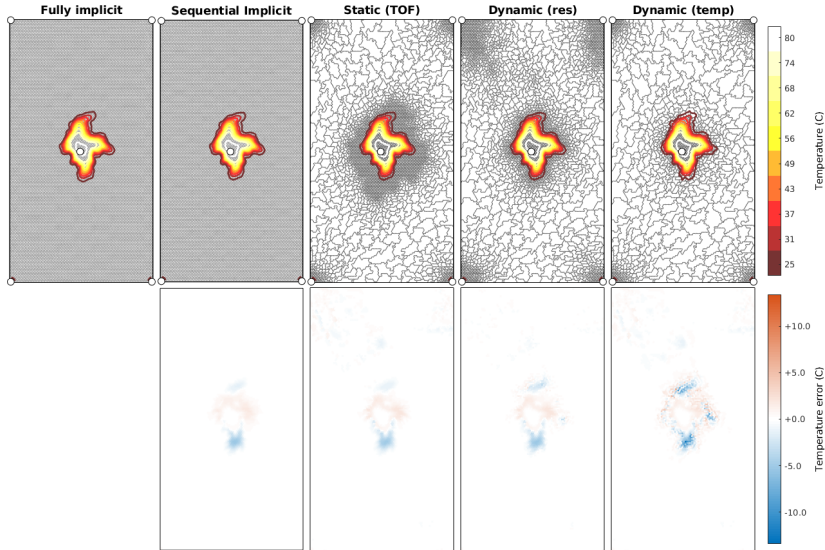
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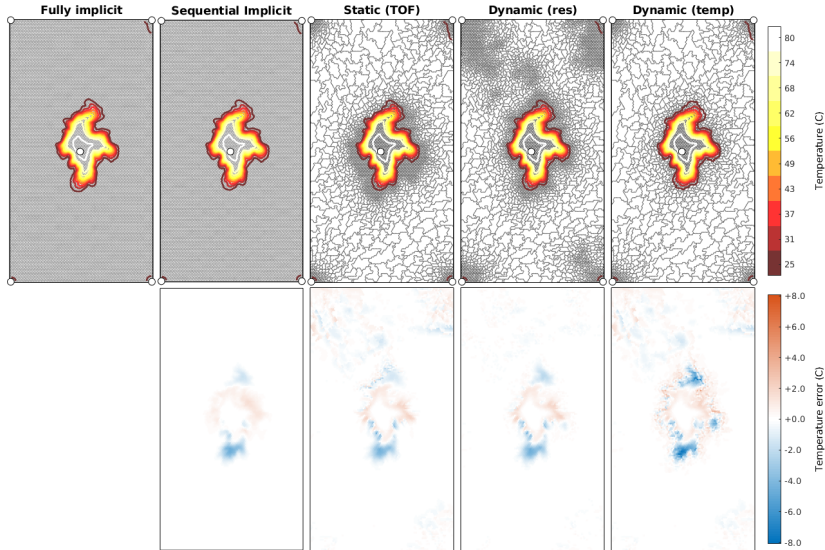
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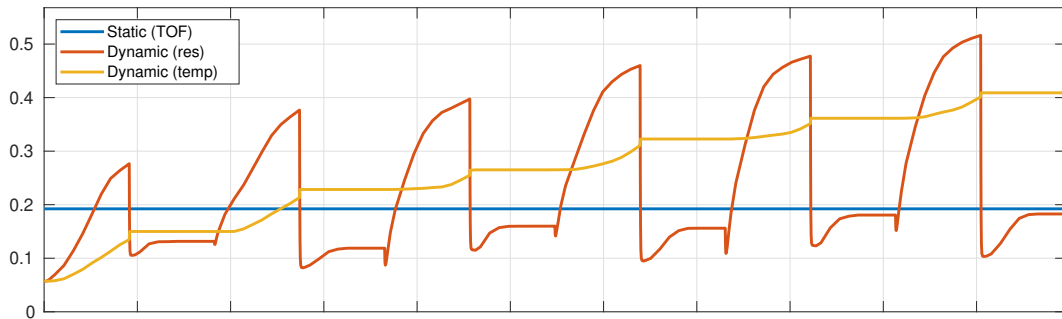


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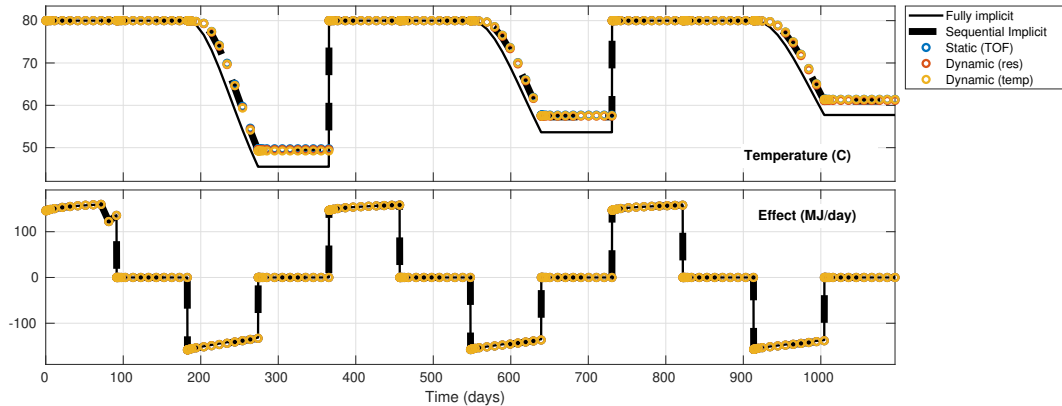
Example: SPE10 Model 2 – Tarbert Formation (layer 10)

Dynamic grid relative cell count

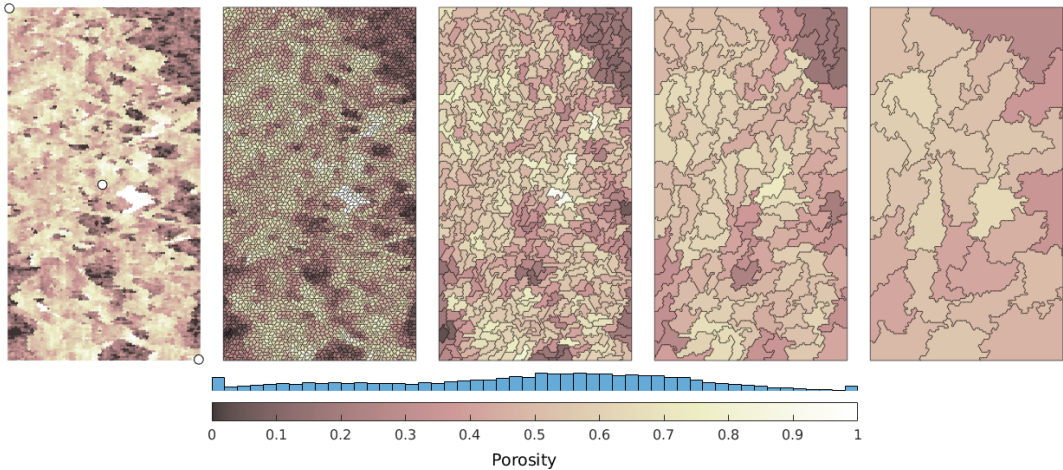


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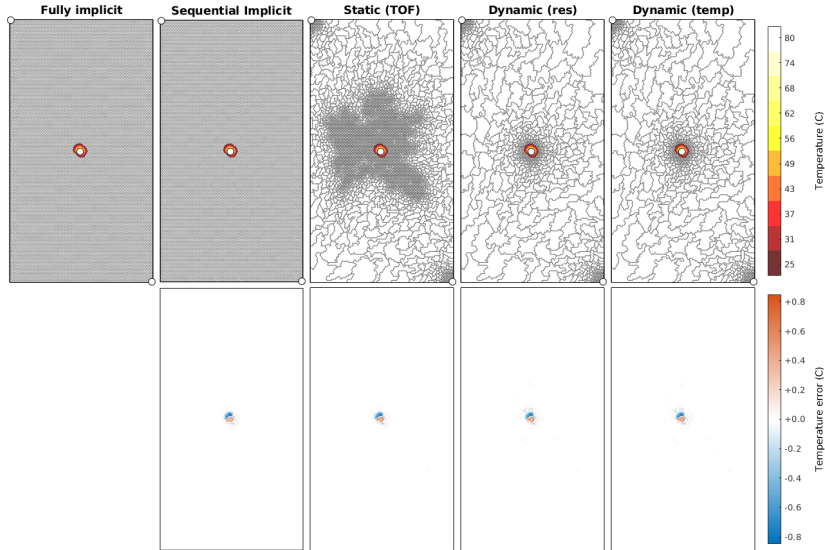
Injection well output



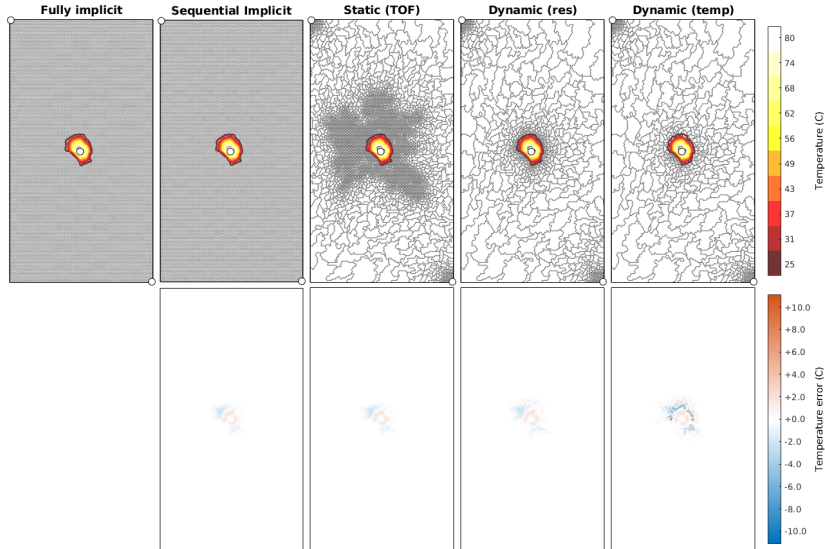
Example: SPE10 Model 2 – Upper Ness Formation (layer 85)



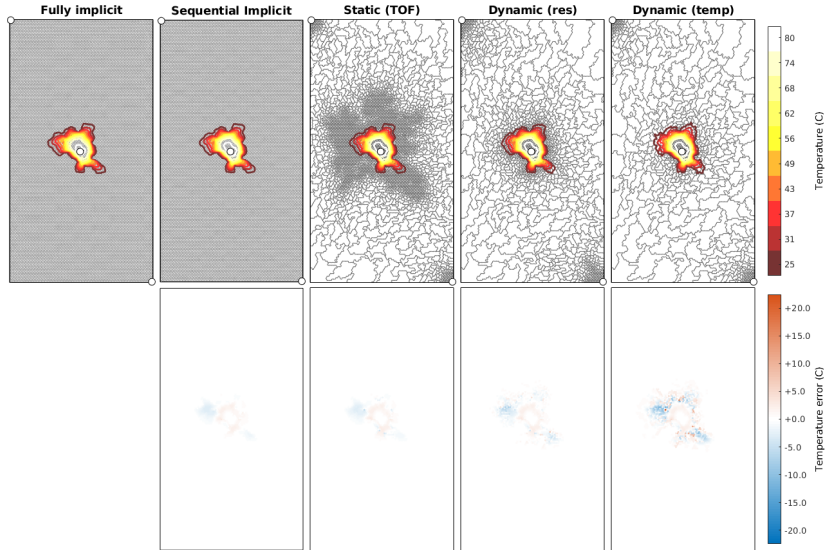
Example: SPE10 Model 2 – Upper Ness Formation (layer 85)



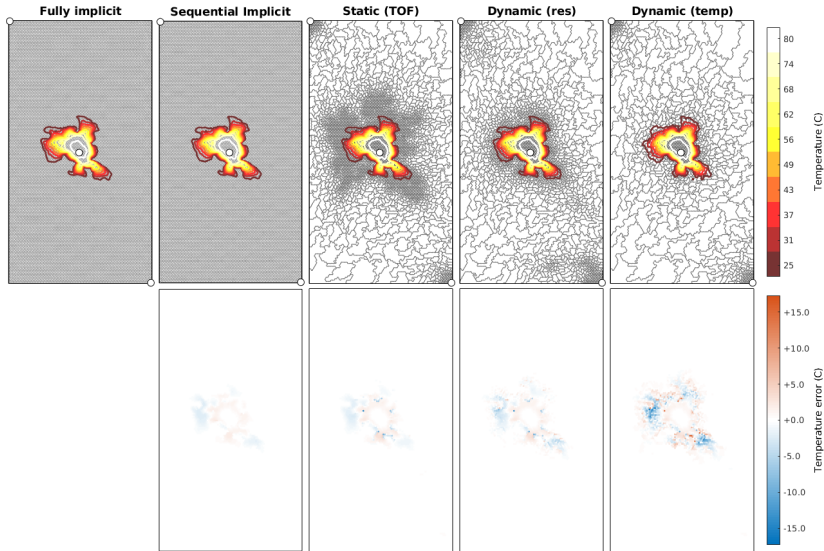
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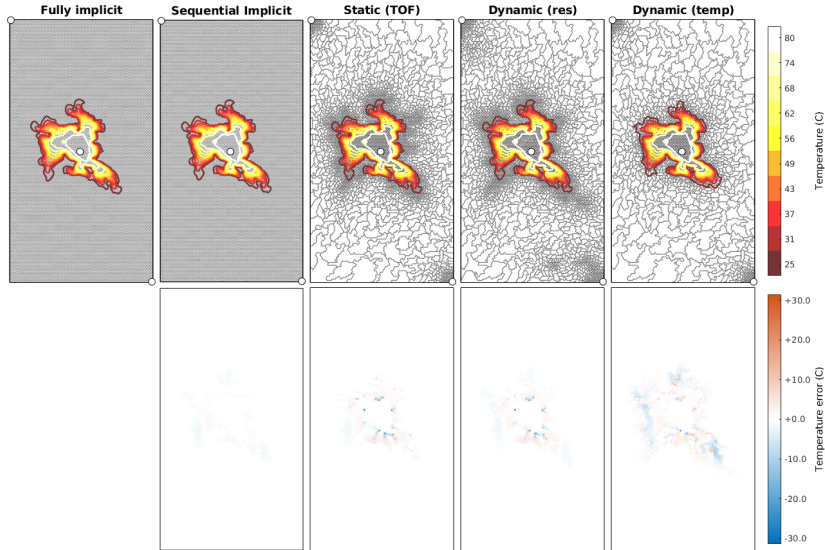
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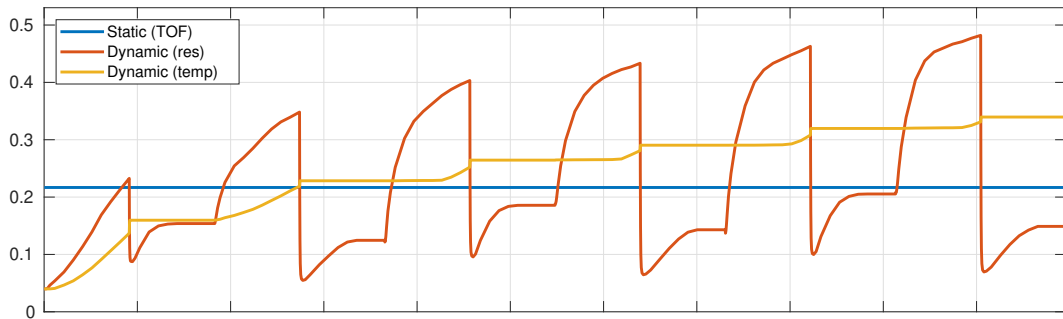


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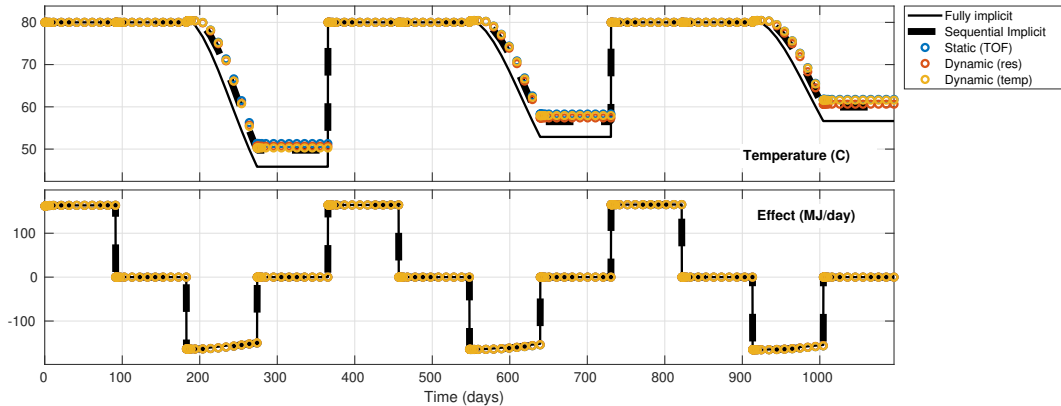
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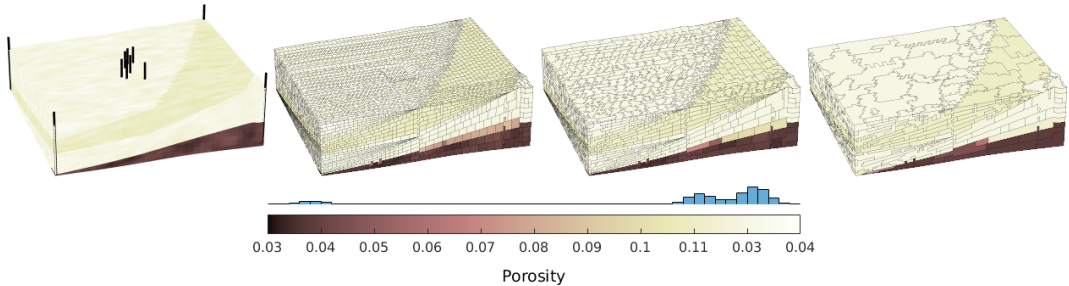
Injection well output



Example: SPE10 Model 2

- Very close match with fine-scale results for all indicators and coarsening strategies
 - Between 49% and 96% reduction in # transport problem dofs
- Point-wise large temperature differences
- Energy discrepancy correction ensures conservation of energy between scales

Example: Real(istic) Model

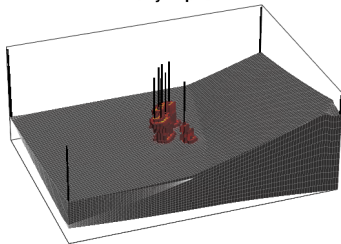


- Model of real geothermal storage site, provided by Ruden AS
- Group of wells in the center inject at 73 °C over period of four months
- Corner wells provide pressure support
- Dynamic coarsening with residual-based indicator

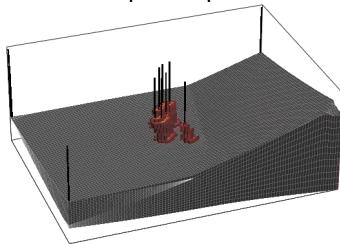
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Reservoir temperature

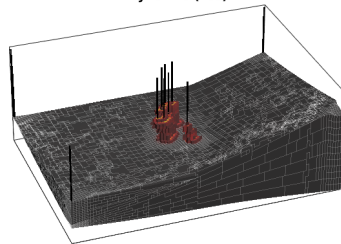
Fully implicit



Sequential implicit



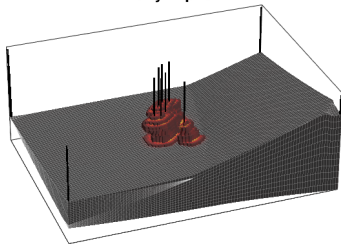
Dynamic (res)



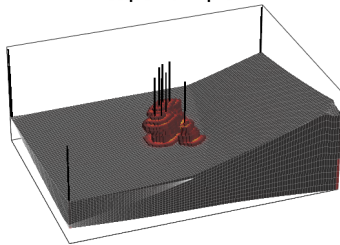
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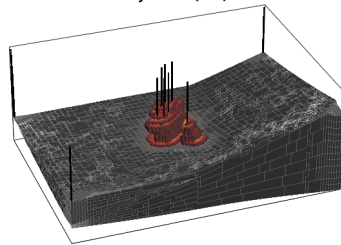
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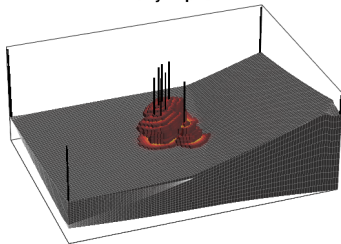
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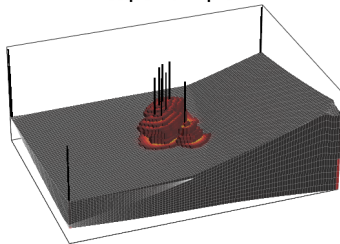
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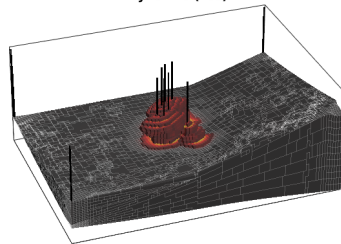
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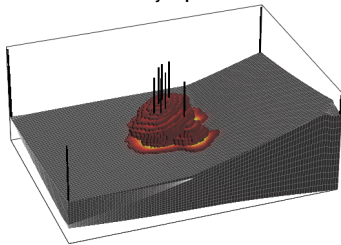
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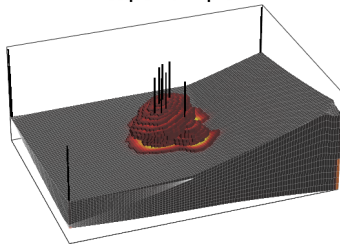
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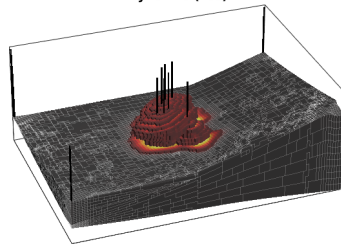
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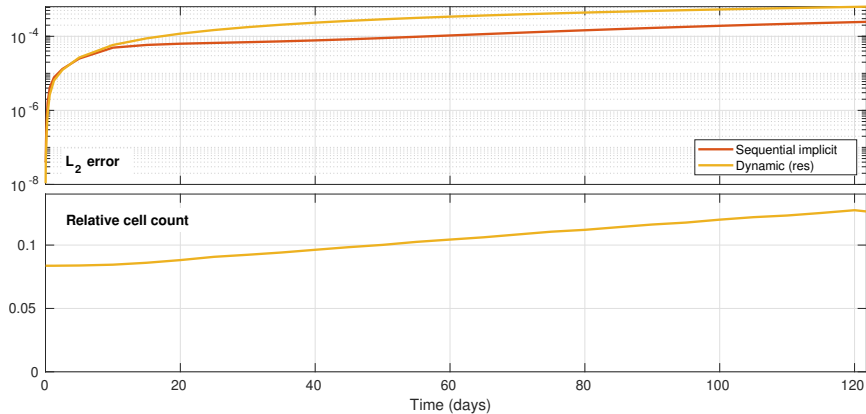


Dynamic (res)



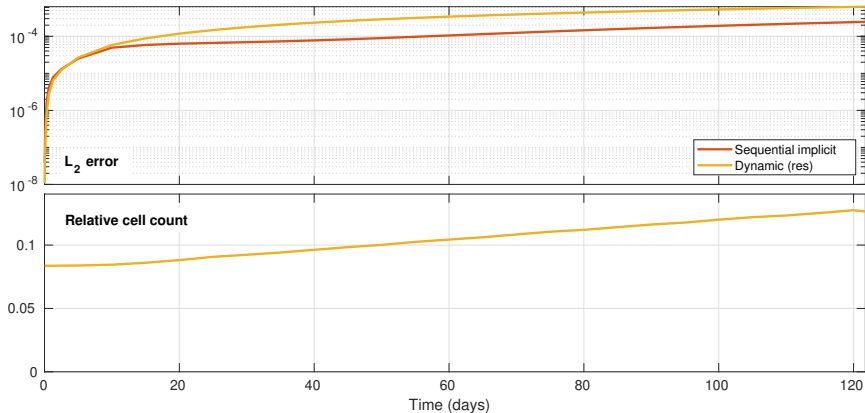
Example: Real(istic) Model

Relative L_2 error and dynamic grid relative cell count



Example: Real(istic) Model

Relative L_2 error and dynamic grid relative cell count



Less than 10^{-3} maximum relative L_2 error with at least **87% reduction** in # transport problem dofs

Conclusions

- Highly flexible **dynamic coarsening** method for geothermal simulations in MRST
 - Sequential splitting of flow and transport/energy
 - Applicable to unstructured, polytopal grids
 - Energy discrepancy correction ensures **conservation of energy**
 - Capable of simulating low- to moderate enthalpy geothermal systems
- Method demonstrated on two examples
 - **Significant reduction** in # dofs in the transport subproblem
 - Very good match with fine-scale solution

Concluding Remarks

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Further work

- Optimize implementation and investigate actual CPU speedup
- Test method for high-enthalpy systems (phase changes)
- Solve each subproblem at its appropriate timescale
 - Multiple transport steps for each pressure step

Thanks to Marine Collignon (Uni Geneva), Olav Møyner and Knut-Andreas Lie (SINTEF Digital) for valuable support and discussions
Thanks to Ruden AS for allowing use of the field model in this work

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