



(1) – Motivation

- ▶ Models of polymer flooding account for several processes such as concentration dependent viscosity, adsorption, incomplete mixing, inaccessible pore space, and reduced permeability effects.
- ▶ The resulting nonlinear systems are strongly coupled, and challenging to solve numerically.
- ▶ In this work, we present a method that offers unconditional convergence for any time step, and demonstrate its applicability to industry grade complexity.

(2) – Model for polymer flooding

- ▶ Diluted polymer is modeled through an additional conservation equation:

$$\partial_t(\phi b_w c S_w + \rho_r(1 - \phi_0)c_a) + \nabla \cdot (c b_w \vec{v}_p) = b_w q_p.$$

- ▶ Diluted polymer and water is modeled as an immiscible system using the Todd-Longstaff model:

$$\vec{v}_w = -\frac{k_{rw}(S_w)K}{\mu_{w,eff}(c)R_k(c)}(\nabla p - \rho_w g \nabla z), \quad \vec{v}_p = m(c)\vec{v}_w.$$

Viscosity enhancement
Permeability reduction

- ▶ Industry grade polymer model in the MATLAB reservoir simulation toolbox (MRST) (Bao et al., 2016).

Todd-Longstaff mixing

c Polymer concentration, $0 \leq c \leq c^*$
 c_a Adsorption concentration
 ω Mixing parameter, $0 \leq \omega \leq 1$
 μ_m Viscosity of fully mixed system
 R_k Actual resistance factor

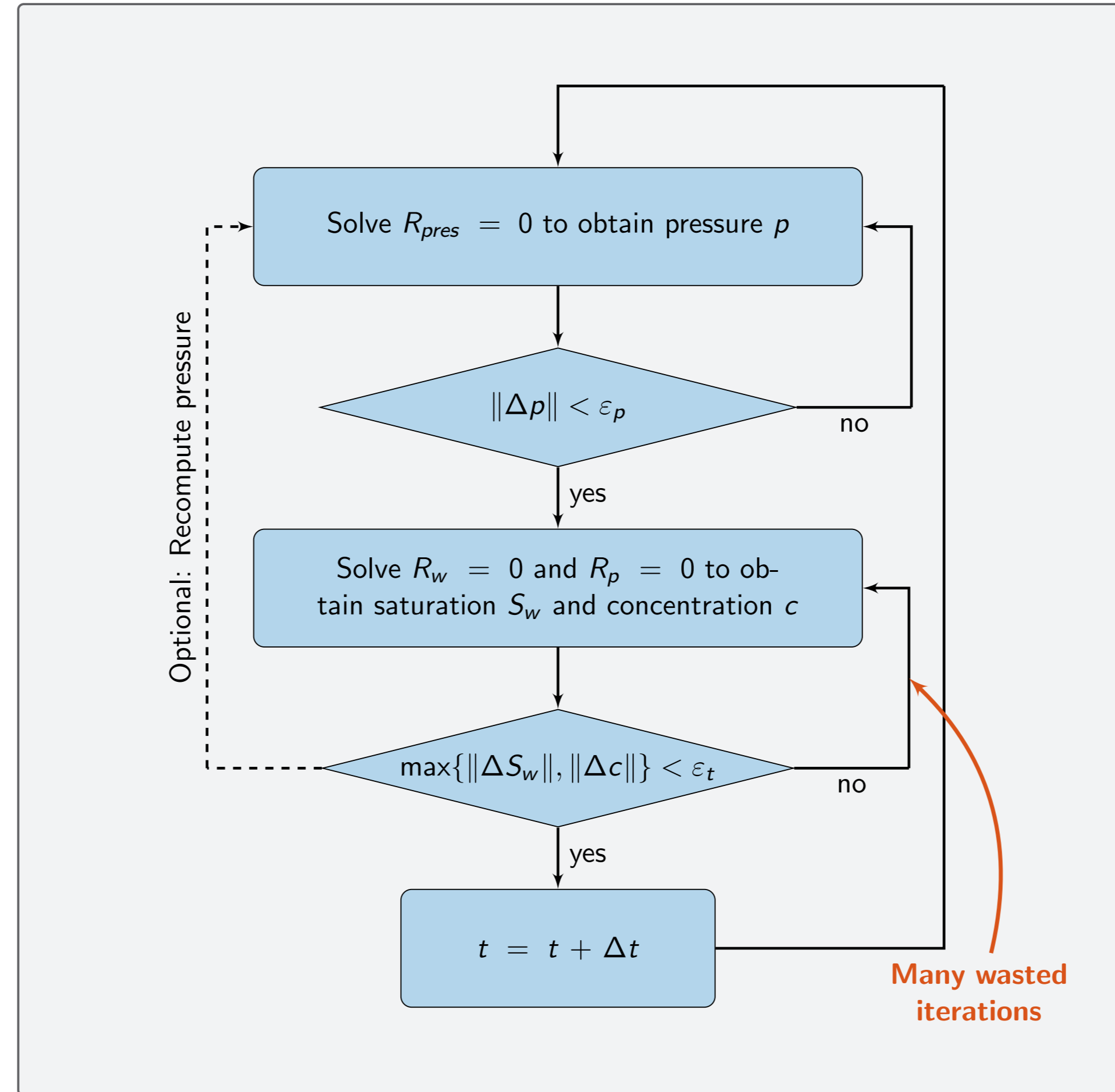
$$\frac{1}{\mu_{w,eff}} = \frac{1 - c/c^*}{\mu_m(c)^\omega \mu_w^{1-\omega}} + \frac{c/c^*}{\mu_m(c)^\omega \mu_m(c^*)^{1-\omega}}$$

$$m(c) = \left[\left(1 - \frac{c}{c^*}\right) \left(\frac{\mu_m(c^*)}{\mu_w}\right)^{1-\omega} + \frac{c}{c^*} \right]^{-1}$$

(3) – Sequential solution strategy

We introduce a grid consisting of cells C_i and integrate over each cell in space to obtain finite-volume residual equations for the water and polymer transport, and the pressure:

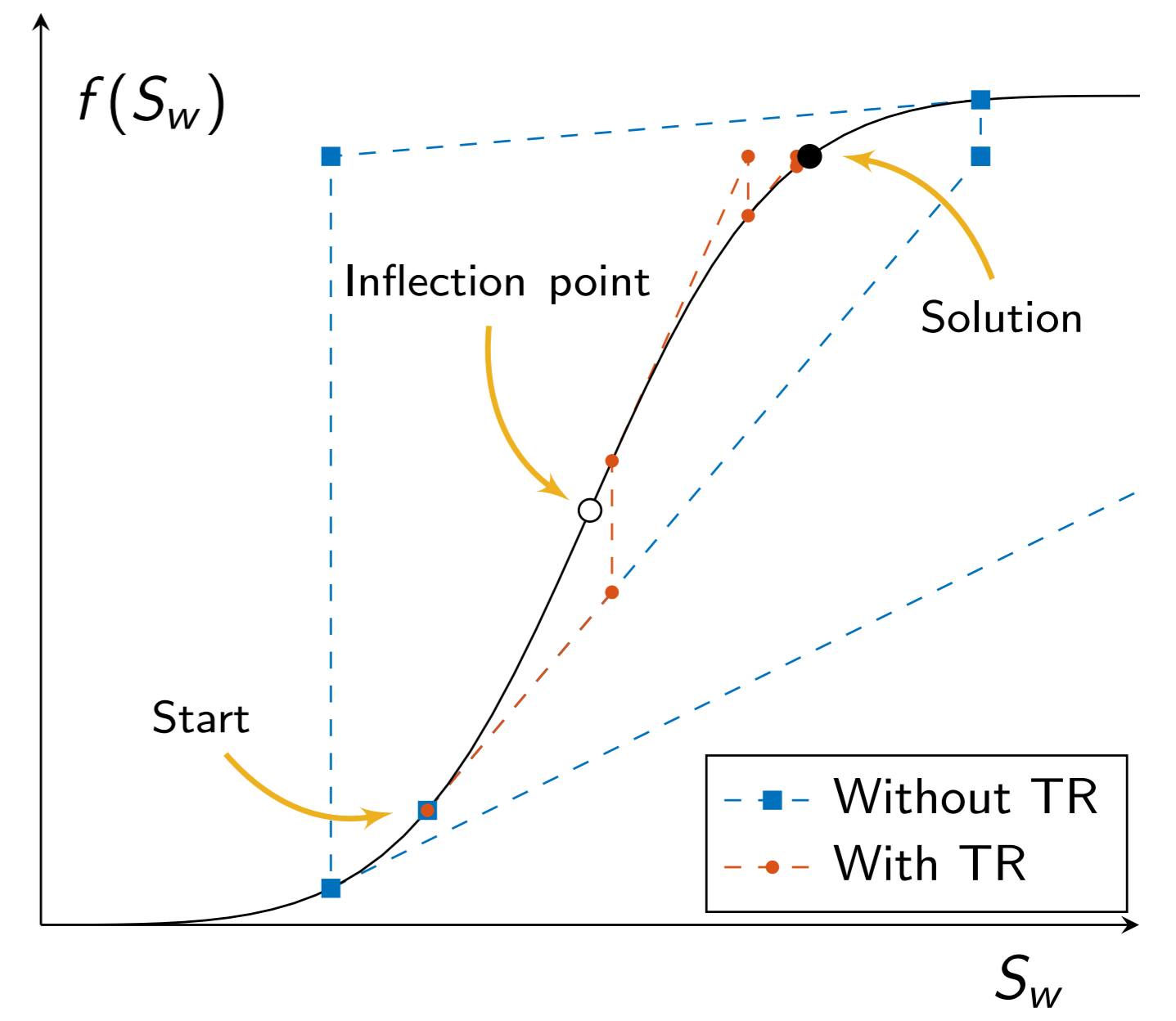
$$R_{w,i}(S_w, c) = 0, \quad R_{p,i}(S_w, c) = 0, \quad R_{pres,i}(p) = 0.$$



The industry standard is to heuristically chop the time step and/or dampen the saturation updates until the Newton solver converges, which may result in a huge number of wasted iterations.

(4) – Trust-region algorithm

Inflection points and kinks in the residual functions causes convergence problems in the Newton solver. The idea of the trust-region algorithm (Jenny et al., 2009) is to identify inflection points/kinks, and use them to determine safe updates.



- ▶ Transport problem: Find ξ such that $R(\xi) = 0$, where $\xi = (S_1, \dots, S_N, c_1, \dots, c_N)$, $R = (R_{w,1}, \dots, R_{w,N}, R_{p,1}, \dots, R_{p,N})$.
- ▶ Full Newton update: $\xi_i^{l+1} = \xi_i^l + \Delta \xi_i^l$, $\Delta \xi = -J(\xi)^{-1}R(\xi)$.
- ▶ Find damping factors $\theta_i \in [0, 1]$ so that updates do not pass far beyond problematic points: $\xi_i^{l+1} = \xi_i^l + \theta_i \Delta \xi_i^l$.
- ▶ Can be reduced to a 1D-problem (Møyner, 2016) by considering possible updates in the direction d of the Newton update at each interface: $d = \frac{(\Delta \xi_i, \Delta \xi_j)}{\|(\Delta \xi_i, \Delta \xi_j)\|}$, $\Delta \xi_\ell = (\Delta S_\ell, \Delta c_\ell)$.
- ▶ Gives damping factors $\theta_{\gamma,ij}$ for $\gamma = w, p$ and all interfaces $ij \rightarrow$ interface-localized.

Figure 1: Subset of SPE 10 Model 2

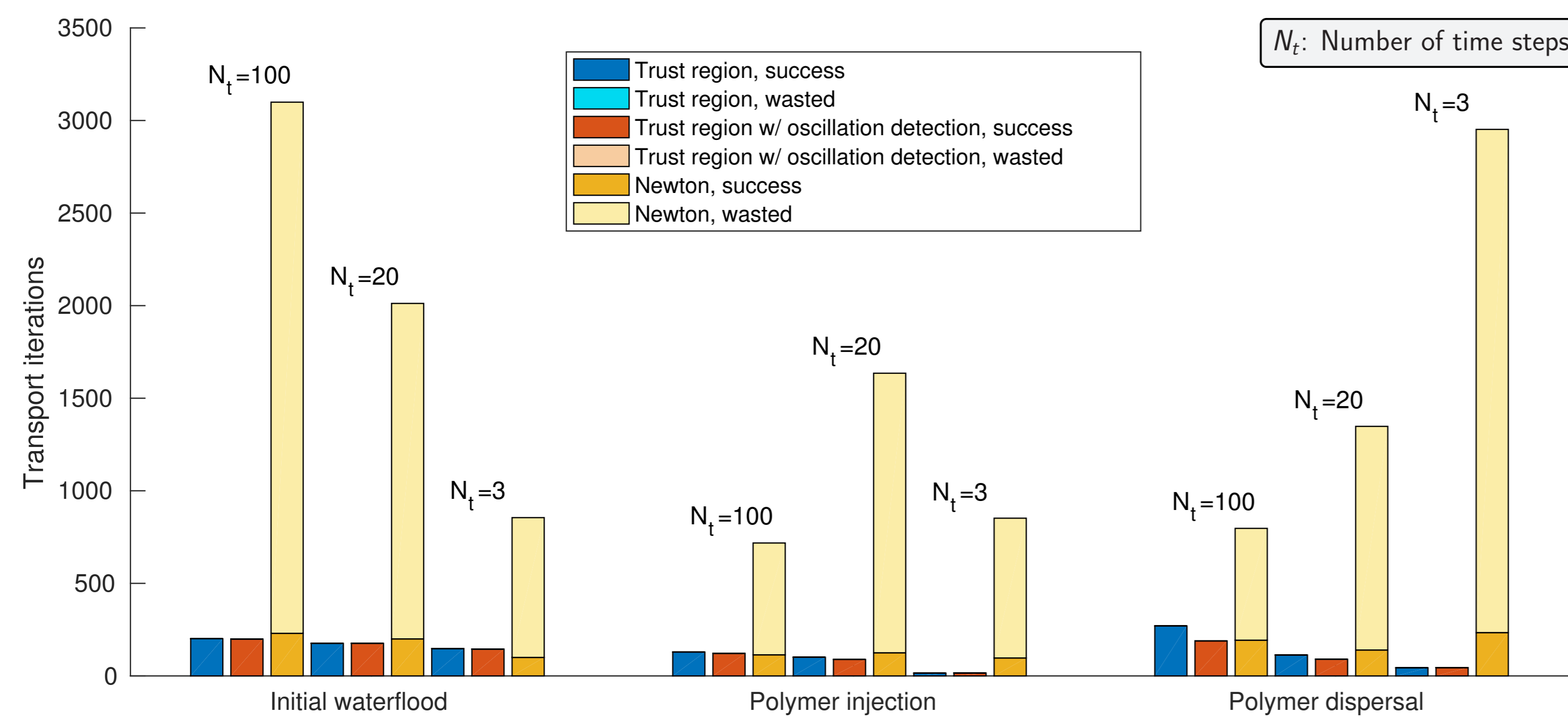
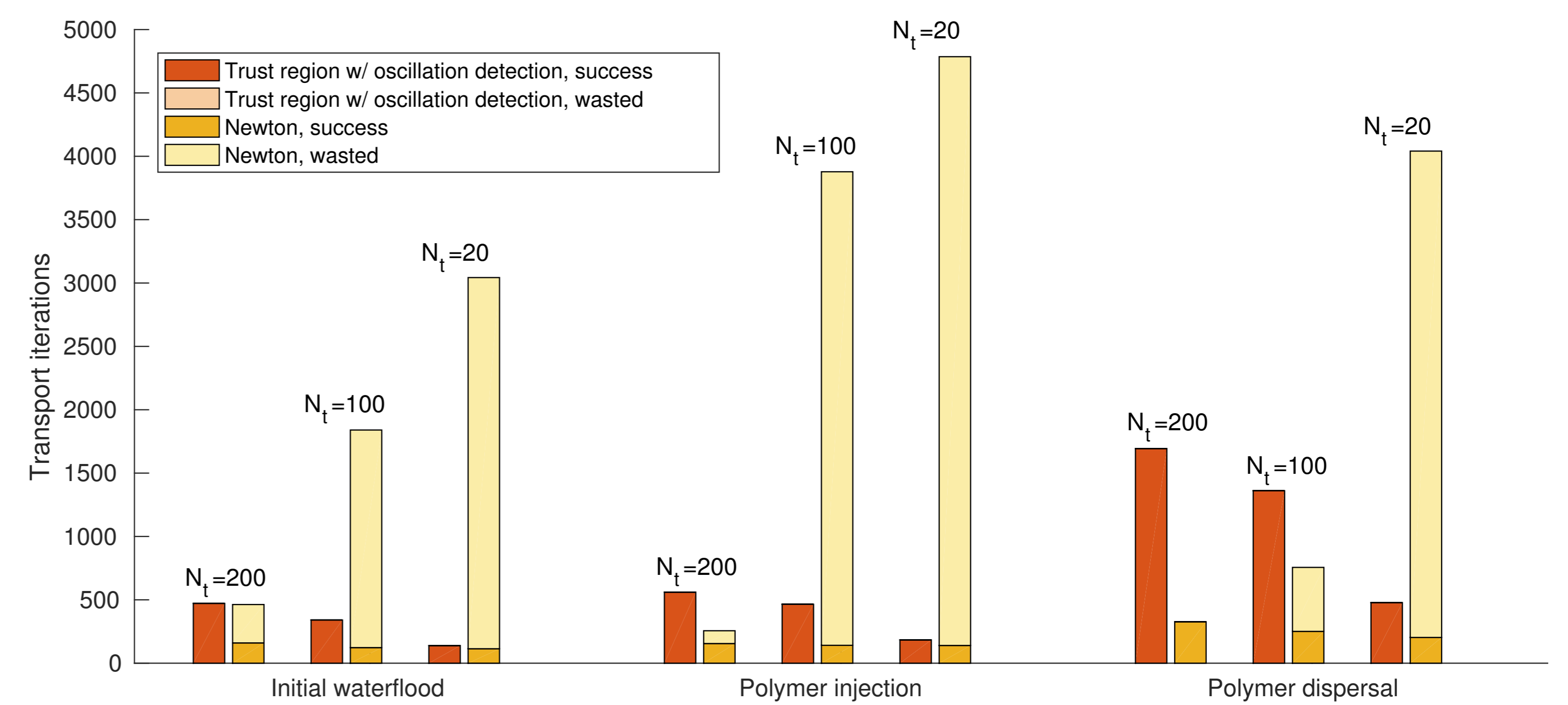


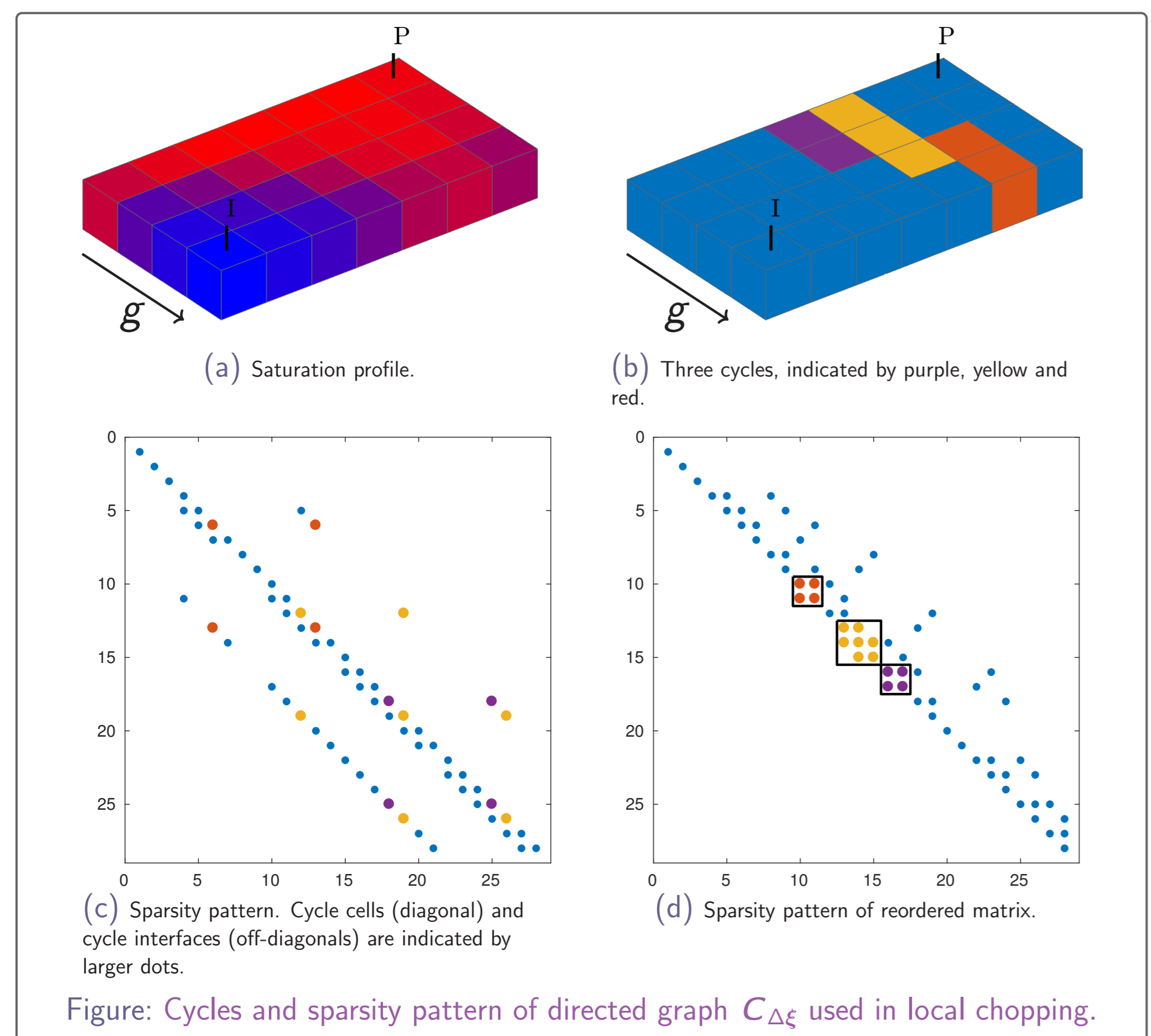
Figure 2: Field model



(5) – Algorithm improvements

Local vs. global chopping:

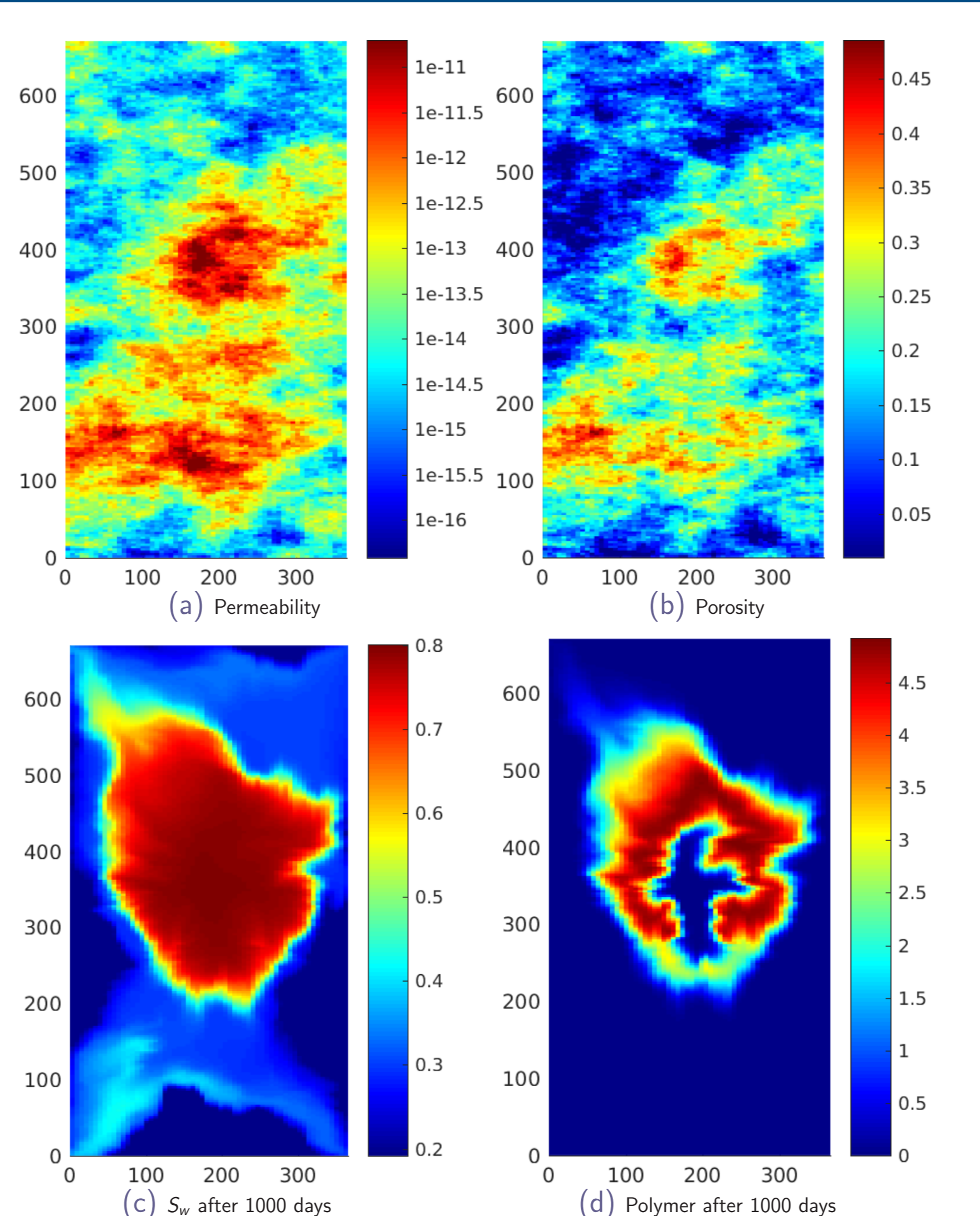
- ▶ Global approach: Set all damping factors equal to the smallest: $\theta = \min_{\gamma,ij} \{\theta_{\gamma,ij}\}$. May be overly conservative.
- ▶ Local approach (Møyner, 2016): Introduce directed graph $C_{\Delta \xi}$, where $(C_{\Delta \xi})_{i,j} = 1$ if either the saturation or concentration update in cell j has an impact on the saturation or concentration error in cell i larger than a given threshold. This is used to assign damping factors to each cell.



Oscillation detection

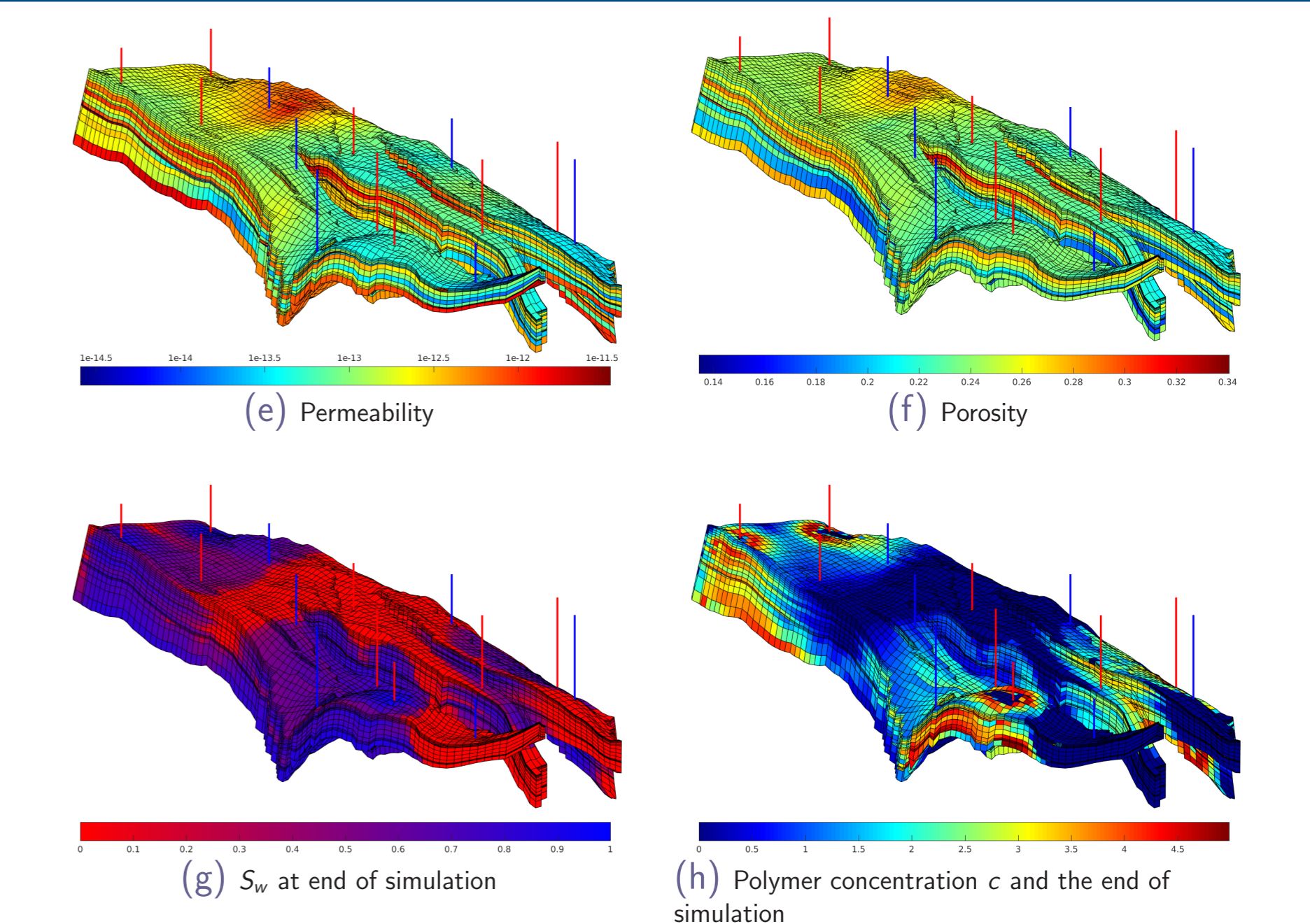
- ▶ If the saturation or concentration update changes sign from one iteration to the next, we have either passed the solution, an inflection point/kink, or a local min/max.
- ▶ To reduce unnecessary use of the trust-region algorithm, we only apply it if we detect oscillations in the updates.

(6) – Example: Subset of SPE 10 Model 2



- ▶ Horizontal layer from the SPE10 model 2.
- ▶ Polymer slug injected from 20 % to 40 % of the injection period.
- ▶ Three different simulation schedules with $N_t = 100, 20$ and 3 time steps, simulated using MRST (Krogstad et al., 2015).
- ▶ The Newton method performs a huge number of wasted iterations. The number of successful iterations are close to those of the trust-region method, which has no wasted iterations (Figure 1).

(7) – Example: Field model



- ▶ Slightly modified grid model of the Norne oil and gas field, with artificial well pattern.
- ▶ Polymer slug injected from 20 % to 40 % of the injection period in all injectors, assumed to be fully mixed with water.
- ▶ Schedules: $N_t = 200, 100$ and 20 uniform time steps.
- ▶ Trust-region solver is too conservative using 200 time steps, but uses significantly fewer iterations for 100 and 20 time steps. Moreover, it has no wasted iterations (Figure 2).

(8) – References

Bao, K., Lie, K.-A., Møyner, O., and Liu, M. (2016). Fully implicit simulation of polymer flooding with mrst. In *ECMOR XV-15th European Conference on the Mathematics of Oil Recovery*.

Jenny, P., Tchelepi, H. A., and Lee, S. H. (2009). Unconditionally convergent nonlinear solver for hyperbolic conservation laws with s-shaped flux functions. *J. Comput. Phys.*, 228(20):7497–7512.

Krogstad, S., Lie, K.-A., Møyner, O., Nilsen, H. M., Raynaud, X., and Skaflestad, B. (2015). MRST-AD – an open-source framework for rapid prototyping and evaluation of reservoir simulation problems. In *SPE Reservoir Simulation Symposium, 23–25 February, Houston, Texas*.

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