

Numerical modeling of two-phase flow in fractured porous media

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Computational Techniques and Applications Conference 2020

September 2, 2020





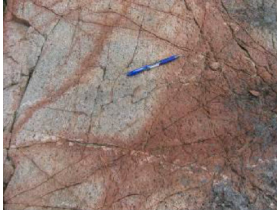
Why fractures?

- Omnipresent: almost any geological formation is naturally fractured
- May control flow pattern

Characteristics

- Very large $\frac{\text{length}}{\text{width}}$ ratio
- Extreme contrast in hydrodynamical properties: **fracture**/**matrix**
- Exist at many scales: from few *cm* to *km* (faults)

Motivation



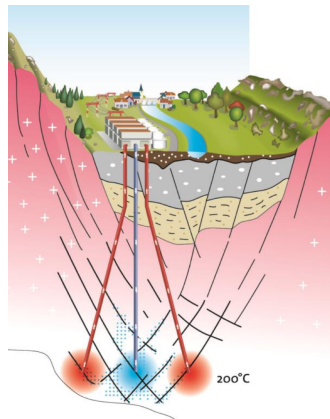
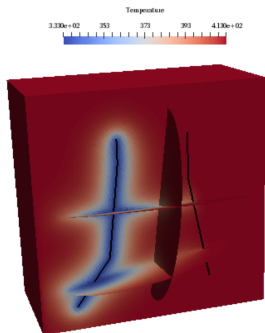
Multiple industrial applications

- Geothermal energy production
- Tight gas and oil extraction
- Nuclear safety

Application: High temperature geothermal energy

Geothermal energy extraction

- Flow mainly through fracture network
- Heat exchange with matrix



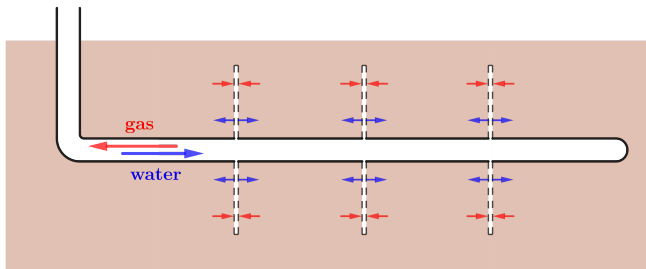
Application: Tight gas production

Gas extraction from **low permeability** reservoir

- create new or activate existing fractures

Features:

- Strong **capillary forces** at matrix-fracture interface
- **Mass exchange** between matrix and fracture

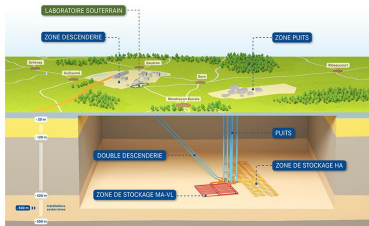


Application: Deep geological radioactive waste repository

Storage project Cigéo:

- High- and intermediate-level waste
- 500m below the ground
- Very low permeability clay:

$$K_m \approx 10^{-20} m^2$$

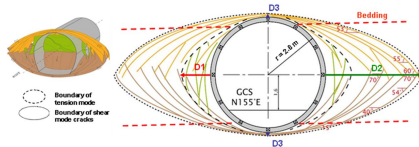


Small fractures: $d_f = 10\mu m - 1mm$

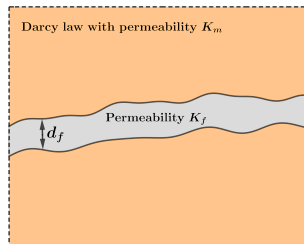
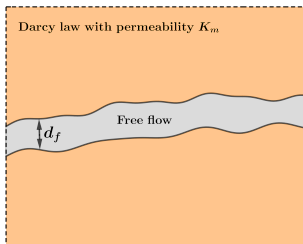
- originated during excavation phase

Fracture permeability

$$K_f = \frac{d_f^2}{12} = 10^{-11} - 10^{-7} m^2 \gg K_m$$



Drains vs. barriers



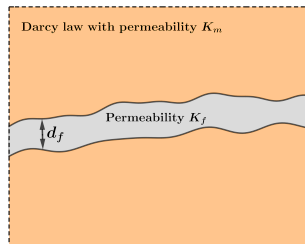
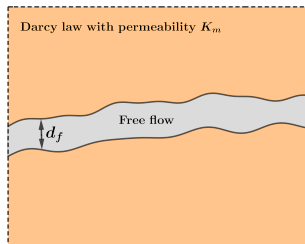
Kinds of fractures

- Open or filled with porous material
- Drains or barriers

Characterization

- Apertures d_f distribution
- Permeability and porosity

Drains vs. barriers



Kinds of fractures

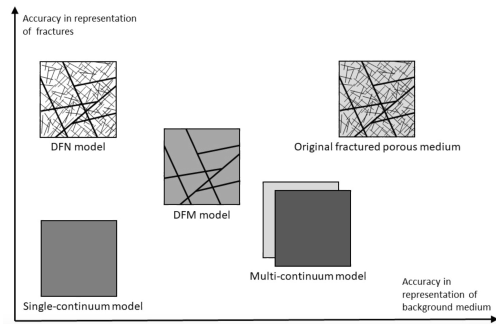
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- Drains or barriers

Characterization

- Apertures d_f distribution
- Permeability and porosity

Highly conductive fractures are the most studied

Discrete Fractures Matrix model



I. Berre *et al.*, 2018

Fracture modeling

- **Upscaling:** one or multiple (overlapping) equivalent media
- **Discrete Fracture** models:
 - DFN - only fractures
 - DFM - fractures and matrix

Single-phase DFM

- Drains and barriers
- Numerical modeling

Two-phase DFM

- Two-phase flow in homogeneous and heterogeneous media
- Drains are barriers?!

Acceleration of Newton's method

- Variable switching
- Nonlinear Jacobi preconditioning

Single-phase DFM

- **Drains and barriers**
- Numerical modeling

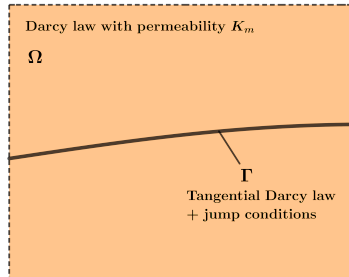
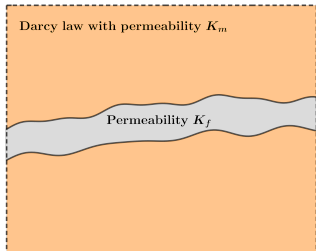
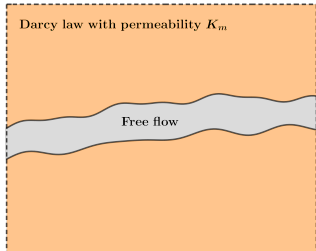
Two-phase DFM

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Dimension reduction

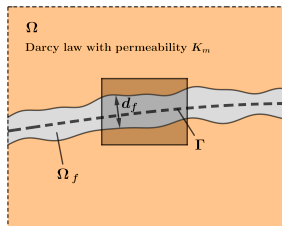


Reduced model:

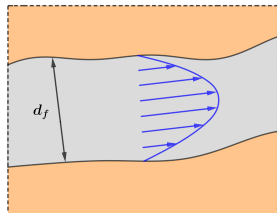
- Tangential flow equation
- Matrix-fracture coupling conditions
 - continuous pressure
 - discontinuous pressure

Open fractures/continuous pressure model

Equi-dimensional representation



Zoom to selected area



Assumptions:

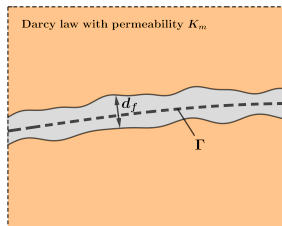
- Laminar flow parabolic velocity profile along Γ with an average velocity

$$\mathbf{v}_f = -\frac{d_f^2}{12\mu} (\nabla_\tau p_f + \rho \mathbf{g}_\tau)$$

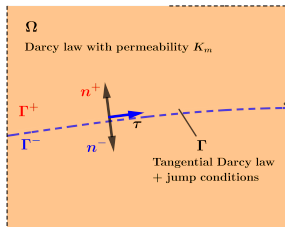
- No pressure drop across Γ

Open fractures/continuous pressure model

Equi-dimensional representation



Hybrid-dimensional model



Matrix equations:

$$\operatorname{div} \mathbf{q}_m = 0, \quad \mathbf{q}_m = -\frac{K_m}{\mu} (\nabla p_m + \rho \mathbf{g})$$

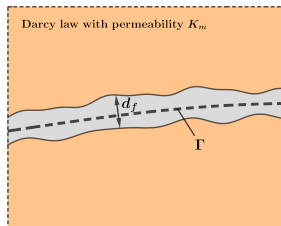
Fracture equations:

$$\operatorname{div}_\tau \mathbf{q}_f = \underbrace{\mathbf{q}_m|_{\Gamma^+} \cdot \mathbf{n}^+ + \mathbf{q}_m|_{\Gamma^-} \cdot \mathbf{n}^-}_{\text{jump of the normal trace across } \Gamma}, \quad \mathbf{q}_f = d_f \mathbf{v}_f = -\frac{d_f^3}{12\mu} (\nabla_\tau p_f + \rho \mathbf{g}_\tau)$$

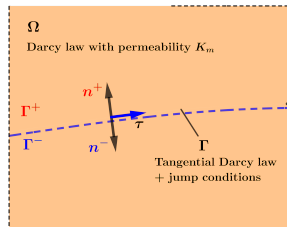
No pressure drop: $p_m|_{\Gamma^+} = p_m|_{\Gamma^-} = p_f$.

Open fractures/continuous pressure model

Equi-dimensional representation



Hybrid-dimensional model



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Fracture equations:

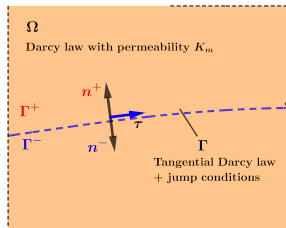
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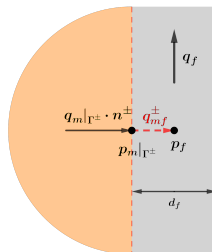
■ Remark: $p_m \in H^1(\Omega) \cap H^1(\Gamma)$

Filled fractures/discontinuous pressure model

Equi-dimensional representation



Transmission condition



Fracture mass balance:

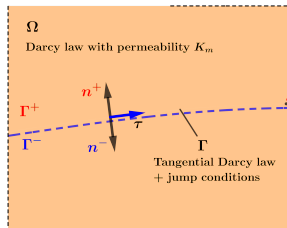
$$\operatorname{div}_\tau \mathbf{q}_f = \mathbf{q}_m|_{\Gamma^+} \cdot \mathbf{n}^+ + \mathbf{q}_m|_{\Gamma^-} \cdot \mathbf{n}^-$$

Width-averaged Darcy law: $\mathbf{q}_f = -d_f \frac{K_f}{\mu} (\nabla_\tau p_f + \rho \mathbf{g}_\tau)$

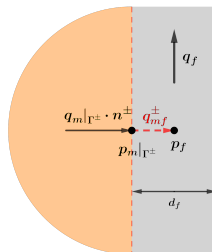
Matrix-fracture flow: $\mathbf{q}_m|_{\Gamma^\pm} \cdot \mathbf{n}^\pm = \mathbf{q}_{mf}^\pm := -\frac{K_f}{\mu} \left(\frac{p_m|_{\Gamma^\pm} - p_f}{d_f/2} - \rho \mathbf{g} \cdot \mathbf{n}^\pm \right)$

Filled fractures/discontinuous pressure model

Equi-dimensional representation



Transmission condition



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Remarks:

- Pressure jumps across Γ : $p_m \in H^1(\Omega \setminus \Gamma)$ and $p_f \in H^1(\Gamma)$
- Extension: Rigorous derivation leads to a family of coupling conditions

Similarities: Coupling of Darcy flow in matrix (3D) and fracture (2D)

$$\begin{cases} \operatorname{div} \mathbf{q}_m = 0 \\ \operatorname{div}_\tau \mathbf{q}_f = \mathbf{q}_m|_{\Gamma^+} \cdot \mathbf{n}^+ + \mathbf{q}_m|_{\Gamma^-} \cdot \mathbf{n}^- \end{cases}$$

Continuous pressure model

- No pressure jump across Γ

$$p_m|_{\Gamma^+} = p_m|_{\Gamma^-} = p_f.$$

- Extra regularity:

$$p_m \in H^1(\Omega) \cap H^1(\Gamma)$$

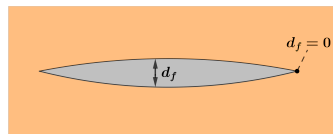
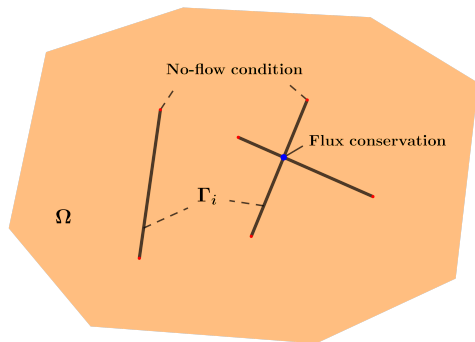
Discontinuous pressure model

- Pressure jump-flux relation on Γ^\pm

$$\mathbf{q}_m|_{\Gamma^\pm} \cdot \mathbf{n}^\pm = -\frac{K_f}{\mu} \left(\frac{p_m|_{\Gamma^\pm} - p_f}{d_f/2} - \rho \mathbf{g} \cdot \mathbf{n}^\pm \right)$$

- Broken Sobolev space: $p_m \in H^1(\Omega \setminus \Gamma)$

Fracture network model



- Flux conservation at fracture intersections
- No-flow condition at fracture tips

Single-phase DFM

- Drains and barriers
- **Numerical modeling**

Two-phase DFM

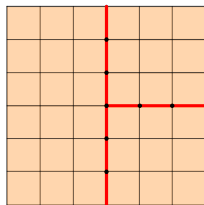
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Acceleration of Newton's method

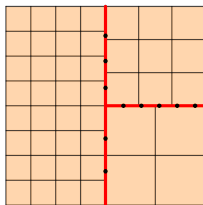
- Variable switching
- Nonlinear Jacobi preconditioning

- **Geometric complexity:** dense networks, acute angles
 - Efficient mesh generators
 - Nonconforming methods
- **Linear solvers:** high contrasts (barriers, drains), large correlation length
 - Direct solvers
 - Domain decomposition with an adequate coarse space

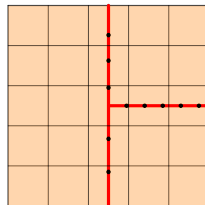
Conforming



Geometrically conforming



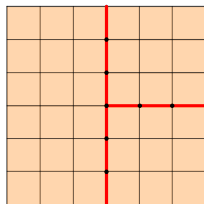
Non-conforming



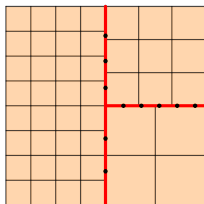
Usual assumption: planar fractures

- Conforming methods: Mesh on Γ is made of faces of the mesh on Ω_m
 - FVM, FEM, DG, VEM, HHO, ...
- Geometrically conforming methods: computational mesh resolves $\Omega \setminus \Gamma$
 - Domain decomposition, mortar methods
- Nonconforming: Ω and Γ are meshed independently
 - X-FEM, E-FEM

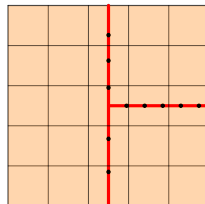
Conforming



Geometrically conforming



Non-conforming



Usual assumption: planar fractures

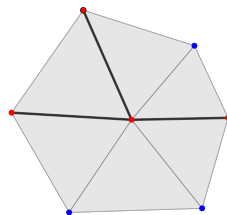
- Conforming methods: Mesh on Γ is made of faces of the mesh on Ω_m
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- Nonconforming: Ω and Γ are meshed independently
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Motivation: much fewer DOF at tetrahedral meshes

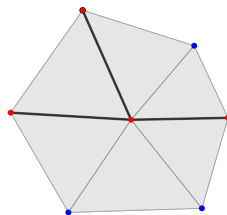
P_1 FEM discretization

- Conforming mesh \mathcal{T}_h
- A broken $\mathbb{P}_1(\mathcal{T}_h)$ space of element-wise affine functions

Conforming mesh



No extra DOF

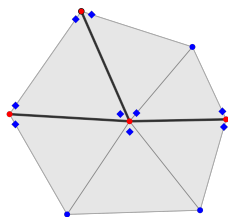


Continuous pressure model

- Discrete functional space $V_h = \mathbb{P}_1(\mathcal{T}_h) \cap H^1(\Omega)$
- Weak formulation (modulo [B.C. on \$\partial\Omega\$](#)): Find $p \in V_h$

$$\int_{\Omega} K_m \nabla p \cdot \nabla v d\mathbf{x} + \int_{\Gamma} K_f \nabla_{\tau} p|_{\Gamma} \cdot \nabla_{\tau} v|_{\Gamma} d\sigma(\mathbf{x}) = 0 \quad \forall v \in V_h$$

Extra DOF



Discontinuous pressure model

- Discrete functional spaces

$$V_{m,h} = \mathbb{P}_1(\mathcal{T}_h) \cap H^1(\Omega \setminus \Gamma) \quad \text{and} \quad V_{f,h} = \mathbb{P}_1(\mathcal{T}_h)|_{\Gamma} \cap H^1(\Gamma)$$

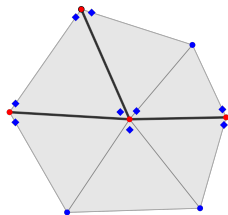
- Weak formulation (modulo B.C. on $\partial\Omega$): Find p_m and p_f

$$\int_{\Omega} K_m \nabla p_m \cdot \nabla v_m \, d\mathbf{x} + \int_{\Gamma} K_f \nabla_{\tau} p_f \cdot \nabla_{\tau} v_f \, d\sigma(\mathbf{x}) + \sum_{\pm} \int_{\Gamma} \frac{2K_f}{d_f} \llbracket p \rrbracket_{\pm}^{\pm} \llbracket v \rrbracket_{\pm}^{\pm} \, d\sigma(\mathbf{x}) = 0$$

for all $v_m \in V_h(\mathcal{T}_h)$, $v_f \in V_h(\Gamma)$.

Standard jump operator defined as $\llbracket u \rrbracket_{\pm}^{\pm} = u_m|_{\Gamma^{\pm}} - u_f$

Extra DOF



Discontinuous pressure model

- Discrete functional spaces

$$V_{m,h} = \mathbb{P}_1(\mathcal{T}_h) \cap H^1(\Omega \setminus \Gamma) \quad \text{and} \quad V_{f,h} = \mathbb{P}_1(\mathcal{T}_h)|_{\Gamma} \cap H^1(\Gamma)$$

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for all $v_m \in V_h(\mathcal{T}_h)$, $v_f \in V_h(\Gamma)$.

Jump operator defined as $\llbracket u \rrbracket_{\pm}^{\pm} = \pi_h u_m|_{\Gamma^{\pm}} - \pi_h u_f$ using mass lumping

Single-phase DFM

- Drains and barriers
- Numerical modeling

Two-phase DFM

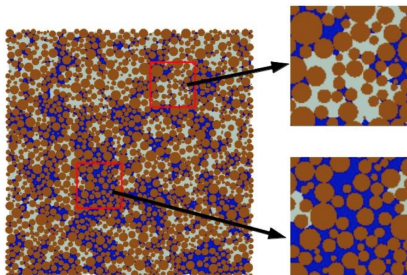
- **Two-phase flow in homogeneous and heterogeneous media**
- Drains are barriers?!

Acceleration of Newton's method

- Variable switching
- Nonlinear Jacobi preconditioning

Two-phase flow in porous media

Two fluids shares the pore space

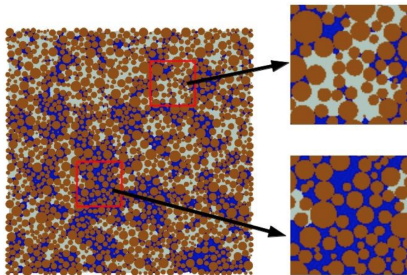


Assumptions

- Two **immiscible** phases: sharp interfaces at pore scale
- **Wetting** (say liquid) and **non-wetting** (say gas) phases

Two-phase flow in porous media

Two fluids shares the pore space



Assumptions

- Two **immiscible** phases: sharp interfaces at pore scale (essential)
- Phases are: liquid **wetting** and gas **non-wetting**

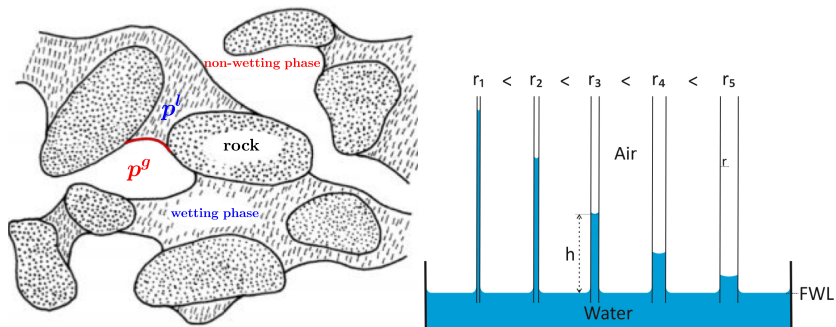
Saturation of phase α

$$s^\alpha = \frac{\text{volume of phase } \alpha \text{ in REV}}{\text{volume of void space in REV}}$$

Volume conservation $\sum_{\alpha} s^\alpha = 1$

Capillary pressure

Capillary pressure



At the pore scale: **pressure jump** across free surface

- Laplace capillary pressure law:

$$\Delta p = \sigma \left(\frac{1}{R_1} + \frac{1}{R_2} \right)$$

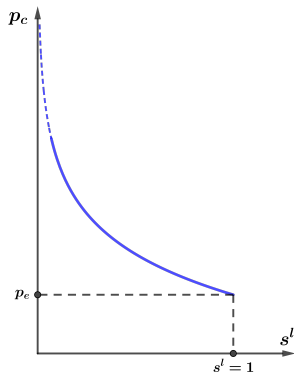
Observations:

- Small pore size \Rightarrow large pressure jump (if shared by both phases!)
- Wetting phase “prefers” small pores

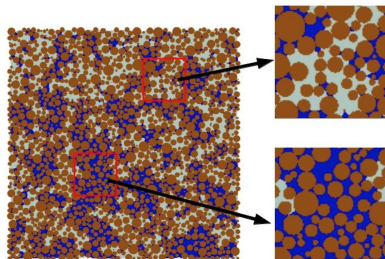
Macroscopic capillary pressure

Capillary pressure at Darcy scale

$$p^g - p^l = p_c(s^l)$$

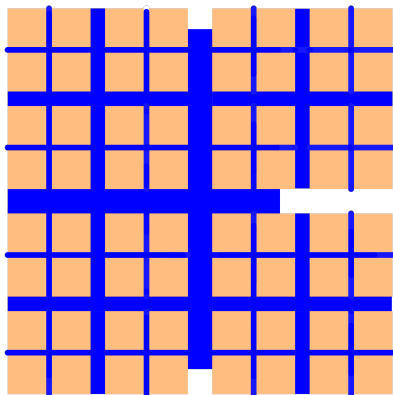
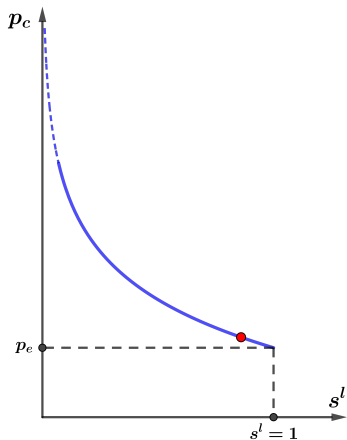


■ Entry pressure p_e



■ Capillary pressure law depends on pore-size distribution

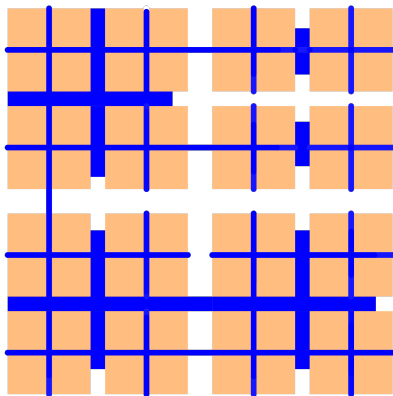
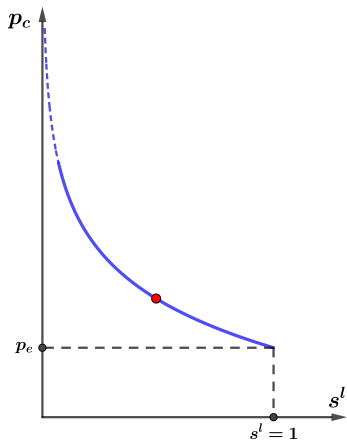
Macroscopic capillary pressure



As the rock **dries**

- Interface between the phases moves to **smaller pores** \Rightarrow pressure jump increases

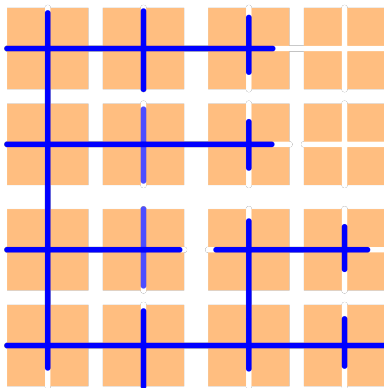
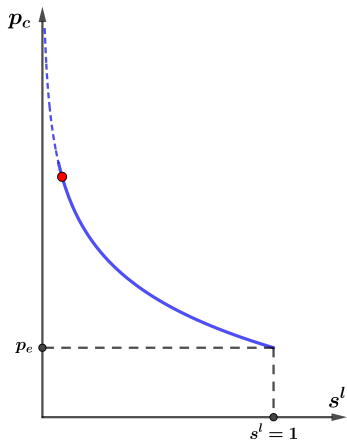
Macroscopic capillary pressure



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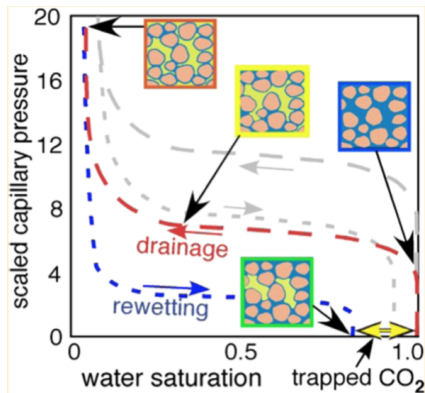
Macroscopic capillary pressure



As the rock **dries**

- Interface between the phases moves to **smaller pores** \Rightarrow pressure jump increases

Capillary hysteresis (not covered)



Capillary pressure depends on the **rate of wetting** (or drying):

$$p_c = p_c \left(s^l, \partial_t s^l \right)$$

Incompressible two-phase flow equations

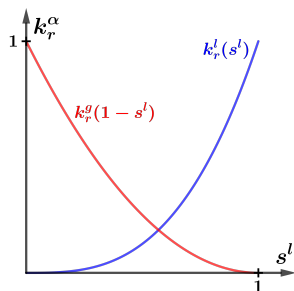
Conservation of each phase $\alpha = l, g$

$$\phi \partial_t s^\alpha + \operatorname{div} \mathbf{q}^\alpha = 0, \quad \mathbf{q}^\alpha = -\frac{k_r^\alpha(s^\alpha) K}{\mu^\alpha} (\nabla p^\alpha + \rho^\alpha \mathbf{g})$$

Closure laws

$$\sum_{\alpha} s^\alpha = 1 \quad \text{and} \quad p^g - p^l = p_c(s^l)$$

Relative permeability $k_r^\alpha : [0, 1] \rightarrow [0, 1]$



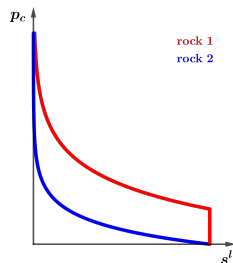
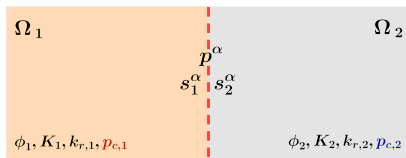
Natural energy estimate:

$$\sum_{\alpha} \int_0^T \int_{\Omega} \frac{k_r^\alpha(s^\alpha) K}{\mu^\alpha} |\nabla p^\alpha|^2 \leq C^{te}$$

Loss of control on $\|\nabla p^\alpha\|_{L^2(L^2)}$ as $s^\alpha \rightarrow 0$

Flow in heterogeneous porous medium

Piece-wise constant rock properties



Flow equations

$$\phi_i \partial_t s^\alpha - \operatorname{div} \left(\left(\frac{k_{r,i}^\alpha(s^\alpha) K_i}{\mu^\alpha} \nabla p^\alpha - \rho^\alpha \mathbf{g}_\tau \right) \right) = 0 \quad \text{in } \Omega_i$$

Interface conditions:

- Flux continuity
- Continuity of some variable?
 - Pressure continuity (in some sens)
 - Saturation is not continuous

If $s_1^\alpha, s_2^\alpha > 0$ then p^α is cont. and

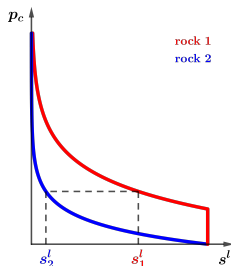
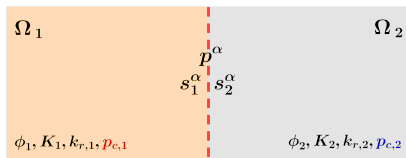
$$p_{c,1}(s_1^l) = p_{c,2}(s_2^l)$$

If $s_1^l = 0$ then

$$p_{c,1}(s_1^l) \cap p_{c,2}(s_2^l) \neq \emptyset$$

Flow in heterogeneous porous medium

Piece-wise constant rock properties



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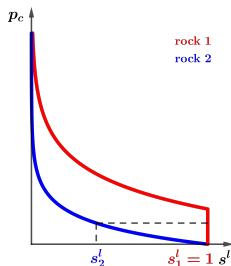
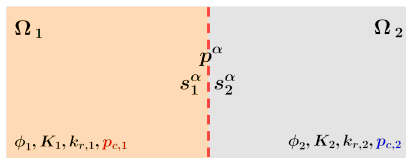
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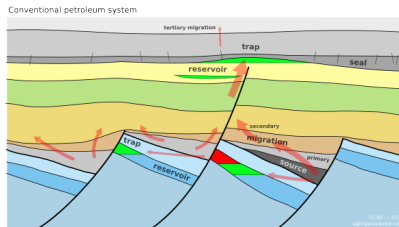
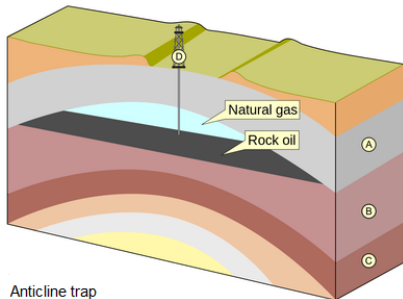
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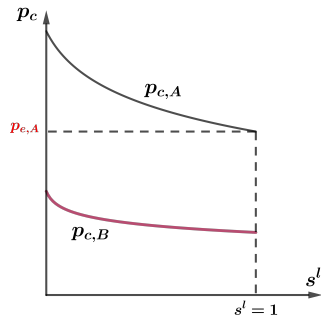
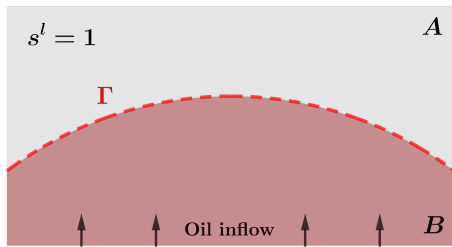
Interface capillary processes: Trapping

Oil and gas **reservoir formation**:

- Generation of the hydrocarbons in a deep formations
- Upward migration due to buoyancy
- Why hydrocarbons **don't reach** the ground surface?



Interface capillary processes: Oil trapping

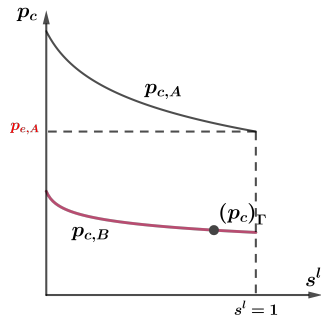
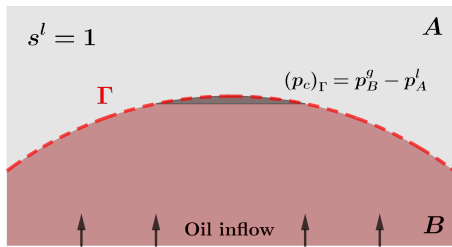


- Capillary pressure at the interface Γ

$$(p_c)_\Gamma = \underbrace{p_B^g}_{\text{oil pressure below}} - \underbrace{p_A^l}_{\text{water pressure above}}$$

- Extra oil pressure due to buoyancy $\Delta p \approx \Delta \rho g \times \text{depth}$
- No oil flow trough Γ as long as $p_B^g \leq p_A^l + p_{e,A}$

Interface capillary processes: Oil trapping

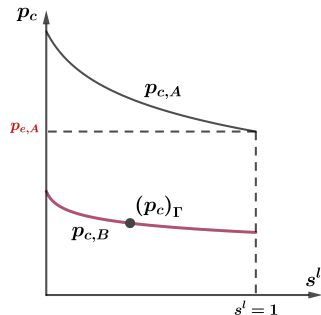
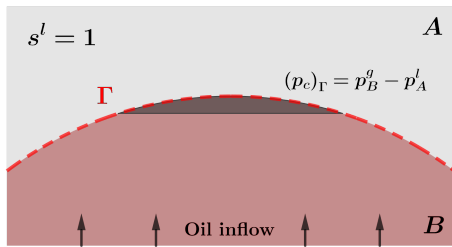


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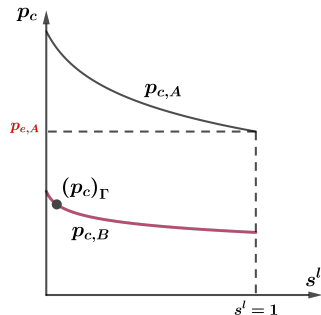
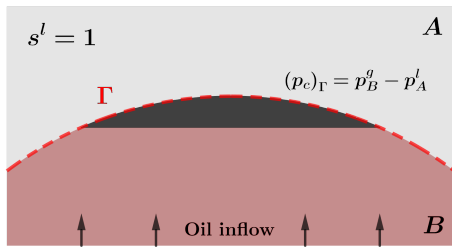


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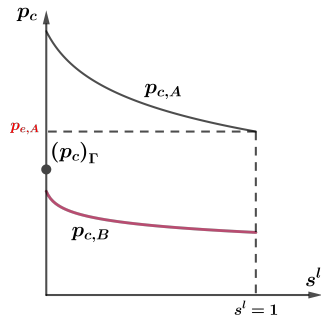
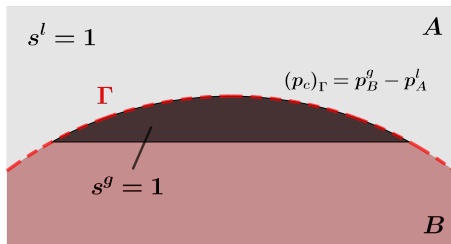


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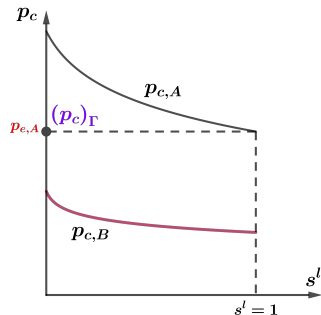
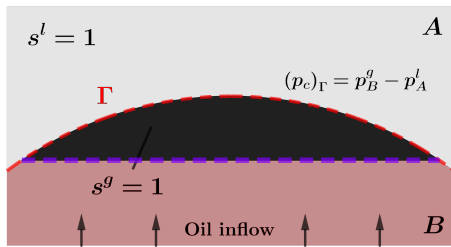


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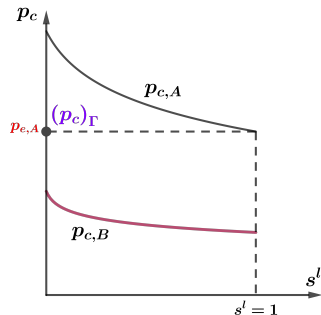
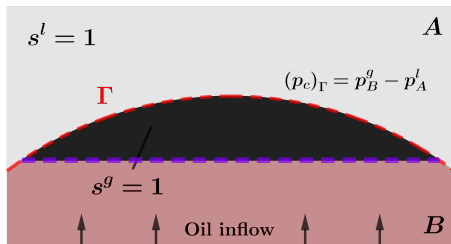


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Interface capillary processes: Oil trapping



- Capillary trapping controls **reservoir depth**
- Similar process can be used for **geological CO2 sequestration**

Single-phase DFM

- Drains and barriers
- Numerical modeling

Two-phase DFM

- Two-phase flow in homogeneous and heterogeneous media
- **Drains are barriers?!**

Acceleration of Newton's method

- Variable switching
- Nonlinear Jacobi preconditioning

Coupled flow in matrix and fracture network

$$\begin{cases} \operatorname{div} \mathbf{q}_m & = 0 \\ \operatorname{div}_\tau \mathbf{q}_f & = \mathbf{q}_m|_{\Gamma^+} \cdot \mathbf{n}^+ + \mathbf{q}_m|_{\Gamma^-} \cdot \mathbf{n}^- \end{cases}$$

Continuous pressure model

- No pressure jump across Γ

$$p_m|_{\Gamma^+} = p_m|_{\Gamma^-} = p_f.$$

Discontinuous pressure model

- Pressure jump-flux relation on Γ^\pm

$$\mathbf{q}_m|_{\Gamma^\pm} \cdot \mathbf{n}^\pm = -\frac{K_f}{\mu} \left(\frac{p_m|_{\Gamma^\pm} - p_f}{d_f/2} \right)$$

Coupled flow in matrix and fracture network

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Relative permeability **upwinding**

Discontinuous pressure model

Matrix-fracture interface

- Interface **capillary pressure**

$$p_{c,m}|_{\Gamma^\pm} = (p_m^g - p_m^l)|_{\Gamma^\pm}$$

- **Saturation jump** at the interface

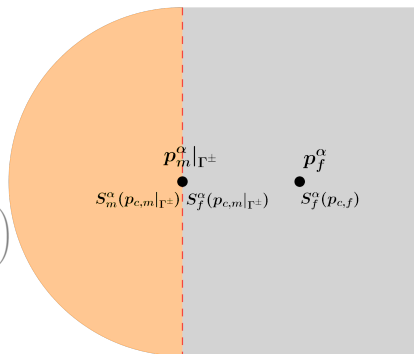
$$S_m^\alpha(p_{c,m}|_{\Gamma^\pm}) \text{ and } S_f^\alpha(p_{c,m}|_{\Gamma^\pm})$$

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- Relative permeability upwinding

$$s_{mf}^\alpha = \begin{cases} S_f^\alpha(p_{c,m}|_{\Gamma^\pm}), & p_m^\alpha|_{\Gamma^\pm} - p_f^\alpha \geq 0 \\ S_f^\alpha(p_{c,f}), & p_m^\alpha|_{\Gamma^\pm} - p_f^\alpha < 0 \end{cases}$$



Discontinuous pressure model

Matrix-fracture interface

- Interface **capillary pressure**

$$p_{c,m}|_{\Gamma^\pm} = (p_m^g - p_m^l)|_{\Gamma^\pm}$$

- **Saturation jump** at the interface

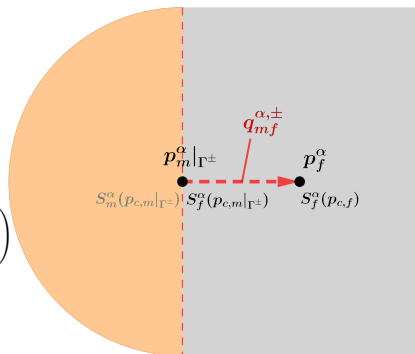
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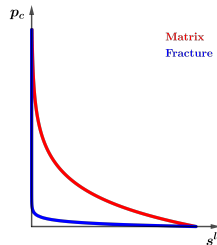
Validity of cont. pressure models: drains becomes barriers?

Test case: Drying of a damaged zone

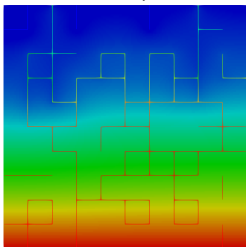
- Domain $\Omega = (0, 10m)^2$
- Fracture width $d = 1mm$
- Permeability contrast $K_f/K_m = 10^4$
- Capillary pressure contrast
- Boundary conditions

Saturated top: $s_m^l = 1, \quad p^g = 1atm$

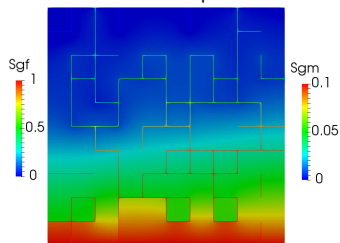
Dry bottom: $s_m^l = 0.9, \quad p^g = 1atm$



Continuous pressure

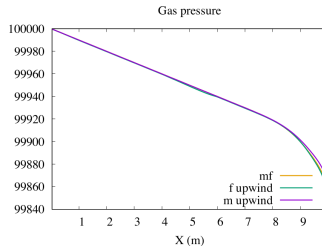
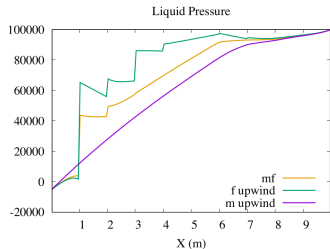


Discontinuous pressure



- Disc. pressure model: some fractures acts as barriers. Why?

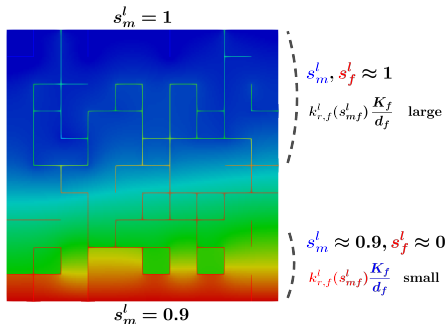
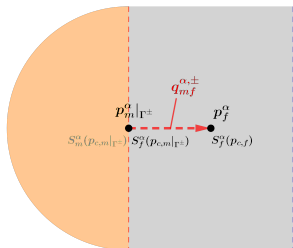
Continuous pressure models: validity



p^l and p^g plot over a vertical line

- disc. pressure
- cont. pressure

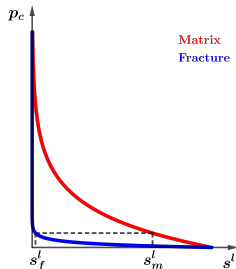
Fracture as capillary barrier



Pressure jump-flux relation for liquid

$$\mathbf{q}_m^l |_{\Gamma^\pm} \cdot \mathbf{n}^\pm = -k_{r,f}^l(s_m^l) \frac{K_f}{\mu^l d_f / 2} (p_m^l |_{\Gamma^\pm} - p_f^l)$$

$$s_{mf}^\alpha = \begin{cases} S_f^\alpha(p_{c,m} |_{\Gamma^\pm}), & p_m^\alpha |_{\Gamma^\pm} - p_f^\alpha \geq 0 \\ S_f^\alpha(p_{c,f}), & p_m^\alpha |_{\Gamma^\pm} - p_f^\alpha < 0 \end{cases}$$



Single-phase DFM

- Drains and barriers
- Numerical modeling

Two-phase DFM

- Two-phase flow in homogeneous and heterogeneous media
- Drains are barriers?!

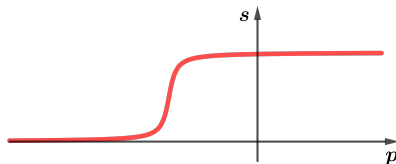
Acceleration of Newton's method

- **Variable switching**
- Nonlinear Jacobi preconditioning

Model problem

$$\partial_t S(p) - \Delta p = 0$$

- Homogeneous medium



Discrete problem: $\mathcal{F}(S(\mathbf{p}), \mathbf{p}) = 0$

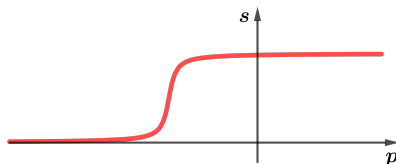
Apply Newton's method to

- $\mathcal{F}(S(\mathbf{p}), \mathbf{p}) = 0$: p -formulation
- $\mathcal{F}(\mathbf{s}, S^{-1}(\mathbf{s})) = 0$: s -formulation

Model problem

$$\partial_t S(p) - \Delta p = 0$$

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Discrete problem: $\mathcal{F}(S(\mathbf{p}), \mathbf{p}) = 0$

Apply Newton's method to

- $\mathcal{F}(S(\mathbf{p}), \mathbf{p}) = 0$: p -formulation
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Questions:

- Which formulation to chose?
- Does the choice matters?

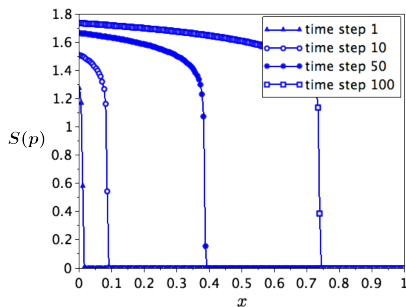
Example: 1D porous media equation

Porous media equation on $(0, 1) \times (0, T)$

$$\partial_t S(p) - \partial_{xx}^2 p = 0, \quad S(p) = p^{1/m}, \quad m > 1$$

with Neumann boundary conditions

- Inflow at $x = 0$: $-\partial_x p(0, t) = q \geq 0$
- No-flow at $x = 1$
- Almost "dry" initial condition: $S(p(x, 0)) = 10^{-10}$



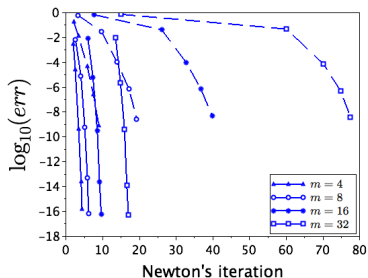
Typical solution profile

Original p -formulation:

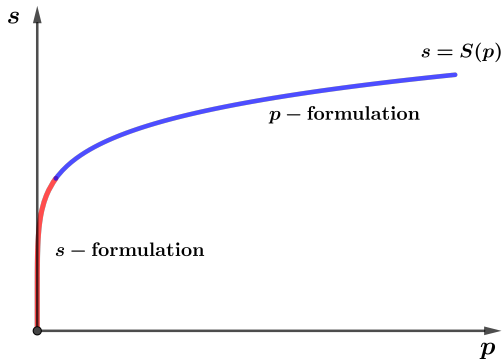
$$\partial_t S(p) - \partial_{xx}^2 p = 0,$$

Alternative s -formulation:

$$\partial_t s - \partial_{xx}^2 S^{-1}(s) = 0$$



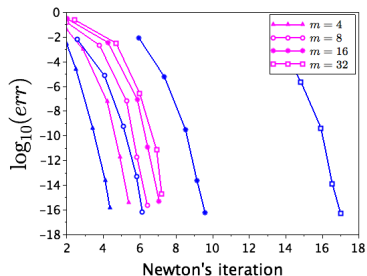
- s -formulation (solid) is much more efficient
- Can we find an **even better** primary variable?



- Switching between s and p may be a good idea
- Well-known for Richards' equation

Efficiency of variable switching

- *s*-formulation: $\partial_t s - \Delta S^{-1}(s) = 0$
- variable switching: PDE?



- Variable switching: is more **efficient** and is **robust** w.r.t. m
- Drawback: implementation using **if/else** conditions

Parametrization of the graph $s = S(p)$:

Let $\bar{p}, \bar{s} : \mathbb{R}^+ \rightarrow \mathbb{R}^+$ such that

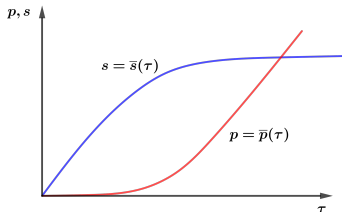
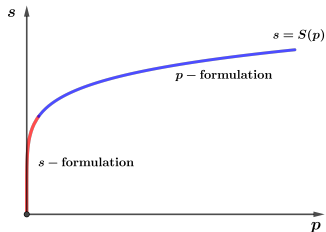
$$\bar{s}(\tau) = S(\bar{p}(\tau)) \quad \forall \tau \in \mathbb{R}^+$$

PDE in terms of the **new variable** τ

$$\partial_t \bar{s}(\tau) - \Delta \bar{p}(\tau) = 0$$

Variable switching:

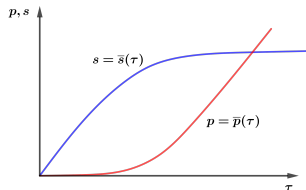
$$\max(\bar{s}'(\tau), \bar{p}'(\tau)) = 1$$



Estimates on $F_\tau(\boldsymbol{\tau}) = \mathcal{F}(\bar{s}(\boldsymbol{\tau}), \bar{p}(\boldsymbol{\tau}))$

$$\|F'_\tau(\boldsymbol{\tau})\|, \|F'_\tau(\boldsymbol{\tau})\|^{-1} < C$$

uniformly w.r.t. $\boldsymbol{\tau}$ and the form of S .



Corollaries:

- Control of $\text{cond}(F'_\tau)$
- Stopping criterion:

$$\|F_\tau(\boldsymbol{\tau})\| < \epsilon \Rightarrow \|\boldsymbol{\tau} - \boldsymbol{\tau}_\star\| < C\epsilon \Rightarrow \begin{cases} \|\bar{s}(\boldsymbol{\tau}) - \mathbf{s}_\star\| < C\epsilon, \\ \|\bar{p}(\boldsymbol{\tau}) - \mathbf{p}_\star\| < C\epsilon \end{cases}$$

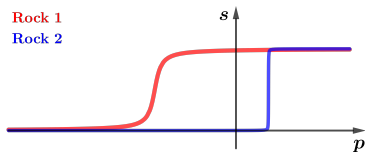
Application to the flow in heterogeneous porous medium

Heterogeneous model PDE

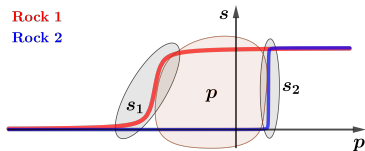
$$\partial_t S(p, \mathbf{x}) - \Delta p = 0$$

Piece-wise constant $S(\cdot, \mathbf{x})$

■ $S(p, x)|_{\Omega_i} = S_i(p), \quad i = 1, 2$



Multiple variable switching



via simultaneous parametrization of $S_1(p)$ and $S_2(p)$

Using notations $\Lambda^\alpha = \frac{k_r^\alpha(s^\alpha)K}{\mu^\alpha}$ and neglecting gravity

$$\begin{cases} \phi \partial_t s^l & - \operatorname{div}(\Lambda^l \nabla p^l) & = & 0 \\ \phi \partial_t s^g & - \operatorname{div}(\Lambda^g \nabla p^g) & = & 0 \end{cases}$$

Use s^l and p^g to eliminate dependent variables with $p^l = p^g - p_c(s^l)$ and $\sum_\alpha s^\alpha = 1$

$$\begin{cases} \phi \partial_t s^l & - \operatorname{div}(\Lambda^l \nabla p^g - \Lambda^l \nabla p_c(s^l)) & = & 0 \\ -\phi \partial_t s^l & - \operatorname{div}(\Lambda^g \nabla p^g) & = & 0 \end{cases}$$

Using notations $\Lambda^\alpha = \frac{k_r^\alpha(s^\alpha)K}{\mu^\alpha}$ and neglecting gravity

$$\begin{cases} \phi \partial_t s^l & - \operatorname{div} (\Lambda^l \nabla p^l) & = & 0 \\ \phi \partial_t s^g & - \operatorname{div} (\Lambda^g \nabla p^g) & = & 0 \end{cases}$$

Use s^l and p^g to eliminate dependent variables with $p^l = p^g - p_c(s^l)$ and $\sum_\alpha s^\alpha = 1$

$$\begin{cases} \phi \partial_t s^l & - \operatorname{div} (\Lambda^l \nabla p^g - \Lambda^l \nabla p_c(s^l)) & = & 0 \\ & - \operatorname{div} ((\Lambda^g + \Lambda^l) \nabla p^g - \Lambda^l \nabla p_c(s^l)) & = & 0 \end{cases}$$

Using notations $\Lambda^\alpha = \frac{k_r^\alpha(s^\alpha)K}{\mu^\alpha}$ and neglecting gravity

$$\begin{cases} \phi \partial_t s^l - \operatorname{div}(\Lambda^l \nabla p^l) = 0 \\ \phi \partial_t s^g - \operatorname{div}(\Lambda^g \nabla p^g) = 0 \end{cases}$$

Use s^l and p^g to eliminate dependent variables with $p^l = p^g - p_c(s^l)$ and $\sum_\alpha s^\alpha = 1$

Primary variable selection in two-phase flow

Using notations $\Lambda^\alpha = \frac{k_r^\alpha(s^\alpha)K}{\mu^\alpha}$ and neglecting gravity

$$\begin{cases} \phi \partial_t s^l & - \operatorname{div}(\Lambda^l \nabla p^l) & = & 0 \\ \phi \partial_t s^g & - \operatorname{div}(\Lambda^g \nabla p^g) & = & 0 \end{cases}$$

Use s^l and p^g to eliminate dependent variables with $p^l = p^g - p_c(s^l)$ and $\sum_\alpha s^\alpha = 1$

$$\begin{cases} \phi \partial_t s^l & - \operatorname{div}(\overbrace{\Lambda^l \nabla p^g}^{\text{convection}} - \overbrace{\Lambda^l \nabla p_c(s^l)}^{\text{diffusion}}) & = & 0 \\ & - \operatorname{div}(\underbrace{(\Lambda^g + \Lambda^l)}_{\geq cK \text{ with } c > 0} \nabla p^g - \Lambda^l \nabla p_c(s^l)) & = & 0 \end{cases}$$

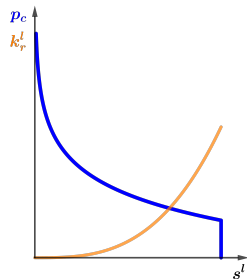
- Elliptic equation for p^g
- Degenerate parabolic equation for s^l

Primary variable selection in two-phase flow

$$\begin{cases} \phi \partial_t s^l & - \operatorname{div} K (\Lambda^l \nabla p^g - \Lambda^l \nabla p_c(s^l)) & = 0 \\ & - \operatorname{div} K ((\Lambda^g + \Lambda^l) \nabla p^g - \Lambda^l \nabla p_c(s^l)) & = 0 \end{cases}$$

Primary variable selection

- Good choice (p^g, s^l) : $\Lambda^l p'_c(s^l) < \infty$
- Bad choice (p^g, p_c) : $\frac{\partial s^l}{\partial p_c}$ and Λ^l vanish at dry regions:
equation gives $0 \approx 0$

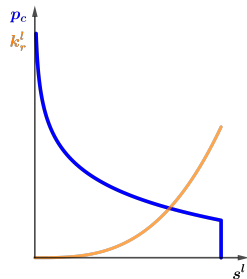


Primary variable selection in two-phase flow

$$\begin{cases} \phi \partial_t s^l & - \operatorname{div} K (\Lambda^l \nabla p^g - \Lambda^l p'_c(s^l) \nabla s^l) & = 0 \\ & - \operatorname{div} K ((\Lambda^g + \Lambda^l) \nabla p^g - \Lambda^l \nabla p_c(s^l)) & = 0 \end{cases}$$

Primary variable selection

- Good choice (p^g, s^l) : $\Lambda^l p'_c(s^l) < \infty$
- Bad choice (p^g, p_c) : $\frac{\partial s^l}{\partial p_c}$ and Λ^l vanish at dry regions:
equation gives $0 \approx 0$

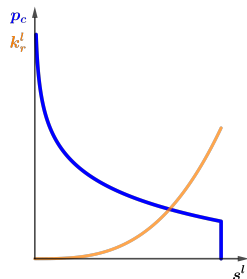


Primary variable selection in two-phase flow

$$\begin{cases} \phi(p_c^{-1})' \partial_t p_c - \operatorname{div} K (\Lambda^l \nabla p^g - \Lambda^l \nabla p_c) & = 0 \\ - \operatorname{div} K ((\Lambda^g + \Lambda^l) \nabla p^g - \Lambda^l \nabla p_c(s^l)) & = 0 \end{cases}$$

Primary variable selection

- **Good** choice (p^g, s^l) : $\Lambda^l p_c'(s^l) < \infty$
- **Bad** choice (p^g, p_c) : $\frac{\partial s^l}{\partial p_c}$ and Λ^l vanish at **dry regions**:
equation gives $0 \approx 0$



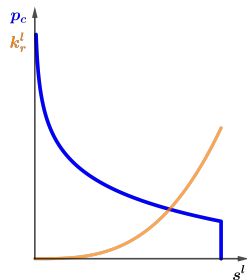
Primary variable selection in two-phase flow

$$\begin{cases} \phi(p_c^{-1})' \partial_t p_c - \operatorname{div} K (\Lambda^l \nabla p^g - \Lambda^l \nabla p_c) & = 0 \\ - \operatorname{div} K ((\Lambda^g + \Lambda^l) \nabla p^g - \Lambda^l \nabla p_c(s^l)) & = 0 \end{cases}$$

Primary variable selection

- **Good** choice (p^g, s^l) : $\Lambda^l p_c'(s^l) < \infty$
- **Bad** choice (p^g, p_c) : $\frac{\partial s^l}{\partial p_c}$ and Λ^l vanish at **dry regions**:
equation gives $0 \approx 0$

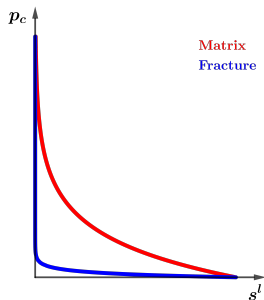
PV selection is more tricky in heterogeneous setting



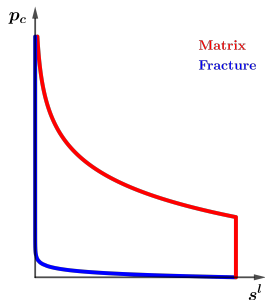
Primary variable selection in two-phase flow

Heterogeneous two-phase flow problem

- Multiple switching of the “second” primary variable



Without entry pressure:
 $(p^g, s_f^l - s_m^l)$

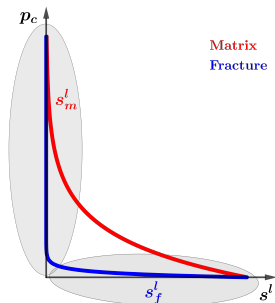


With entry pressure:
 $(p^g, s_f^l - p_c - s_m^l)$

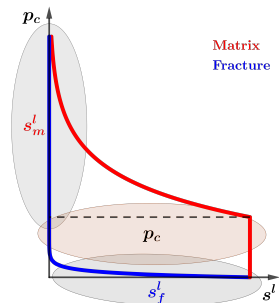
Primary variable selection in two-phase flow

Heterogeneous two-phase flow problem

- Multiple switching of the “second” primary variable

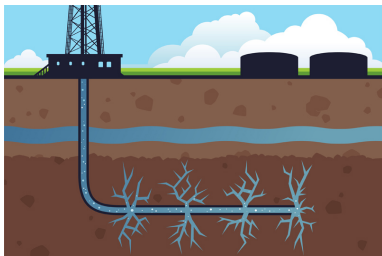


Without entry pressure:
 $(p^g, s_f^l - s_m^l)$

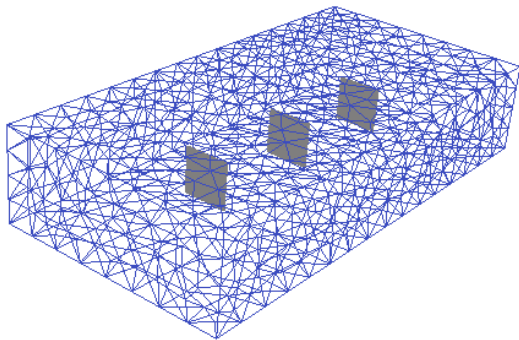


With entry pressure:
 $(p^g, s_f^l - p_c - s_m^l)$

Tight gas recovery test case: configuration



Continuous pressure model

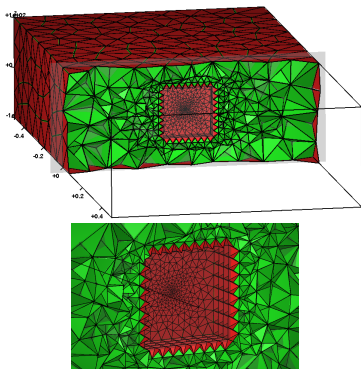
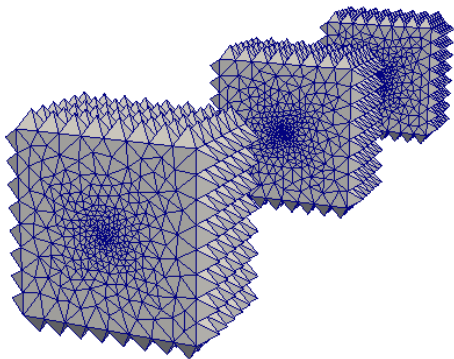


Test case scenario

- Water injected at $100 \cdot 10^6 \text{ Pa}$ for one day
- Wells are closed for 3 days
- Production of gas

Tight gas recovery test case: mesh

Hybrid mesh: prismatic, pyramidal and tetrahedral elements using TetGen



Nodal space discretization

Nb_{cells}	Nb_{nodes}	Nb_{FracF}	linear system d.o.f.
232 920	45 193	1 634	46 827

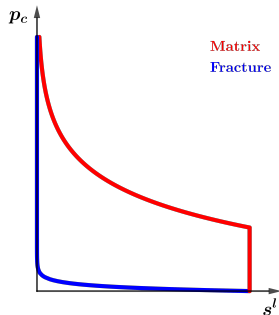
Tight gas recovery test case: p_c model

Bentsen-Anli model

$$P_{c,i}(s^l) = \begin{cases} [-\infty, p_{ent,i}], & s^l = 1 \\ p_{ent,i} - b_i \log(s^l), & \text{else} \end{cases}$$

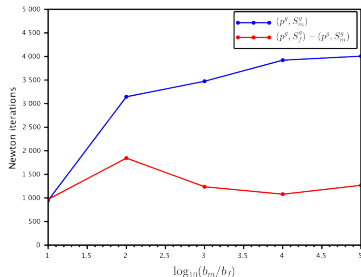
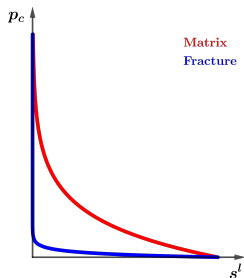
Parameters

- Entry pressure p_{ent}
- Shape parameter b



Performance: (p^g, s_m^l) vs. $(p^g, s_f^l - s_m^l)$

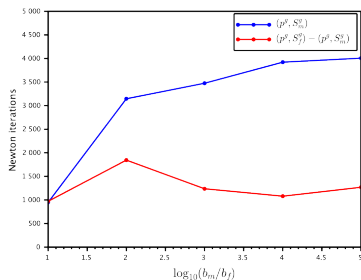
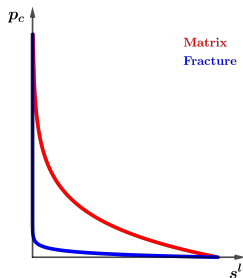
No entry pressure: $p_{c,i} = -b_i \log(s^l)$, $b_m = 10^5$



$\frac{b_m}{b_f}$	(p^g, s_m^l)					$(p^g, s_f^l - s_m^l)$				
	N_{dt}	N_{Chop}	N_{Newton}	N_{GMRes}	CPU(s)	N_{dt}	N_{Chop}	N_{Newton}	N_{GMRes}	CPU(s)
10	226	2	4.2	25.9	4 638	226	2	4.3	26.2	5 523
10^2	294	21	10.7	20.1	14 557	246	8	7.5	22.2	9 016
10^3	297	22	11.7	19.7	16 183	225	1	5.5	24.2	6 245
10^4	304	24	12.9	19.8	17 742	225	1	4.8	25.1	5 492
10^5	313	26	12.8	19.6	18 346	235	4	5.4	23.9	6 260
∞	n/a	n/a	n/a	n/a	n/a	235	4	5.3	23.9	6 448

Performance: (p^g, s_m^l) vs. $(p^g, s_f^l - s_m^l)$

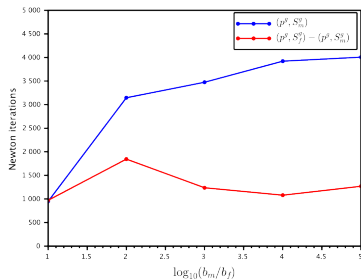
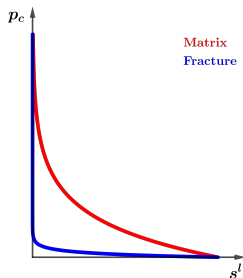
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$\frac{b_m}{b_f}$	(p^g, s_m^l)					$(p^g, s_f^l - s_m^l)$				
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Performance: (p^g, s_m^l) vs. $(p^g, s_f^l - s_m^l)$

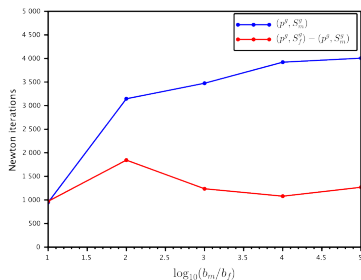
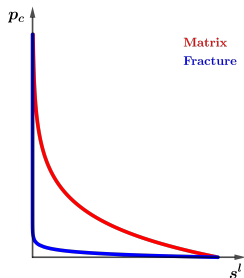
No entry pressure: $p_{c,i} = -b_i \log(s^l)$, $b_m = 10^5$



$\frac{b_m}{b_f}$	(p^g, s_m^l)					$(p^g, s_f^l - s_m^l)$				
	N_{dt}	N_{Chop}	N_{Newton}	N_{GMRes}	CPU(s)	N_{dt}	N_{Chop}	N_{Newton}	N_{GMRes}	CPU(s)
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∞	n/a	n/a	n/a	n/a	n/a	235	4	5.3	23.9	6 448

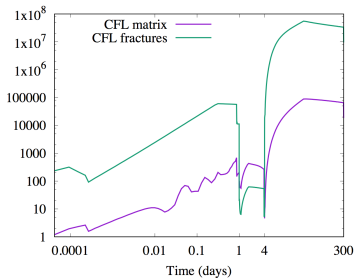
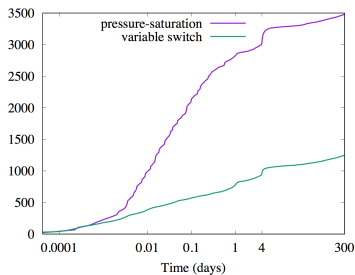
Performance: (p^g, s_m^l) vs. $(p^g, s_f^l - s_m^l)$

No entry pressure: $p_{c,i} = -b_i \log(s^l)$, $b_m = 10^5$



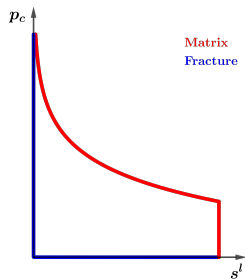
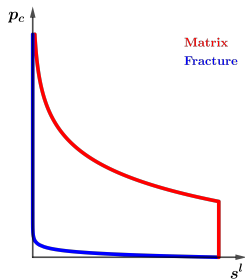
$\frac{b_m}{b_f}$	(p^g, s_m^l)					$(p^g, s_f^l - s_m^l)$				
	N_{dt}	N_{Chop}	N_{Newton}	N_{GMRes}	CPU(s)	N_{dt}	N_{Chop}	N_{Newton}	N_{GMRes}	CPU(s)
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∞	n/a	n/a	n/a	n/a	n/a	235	4	5.3	23.9	6 448

Performance: (p^g, s_m^l) vs. $(p^g, s_f^l - s_m^l)$



For $\frac{b_m}{b_f} = 1000$: Cumulated number of Newton iterations and CFL numbers

Performance: (p^g, s_f^l) vs. $(p^g, s_f^l - p_c - s_m^l)$



	(p^g, s_f^l)					$(p^g, s_f^l - p_c - s_m^l)$				
$\frac{b_m}{b_f}$	N_{dt}	N_{Chop}	N_{Newton}	N_{GMRes}	CPU(s)	N_{dt}	N_{Chop}	N_{Newton}	N_{GMRes}	CPU(s)
2	221	0	3	29.2	3 937	221	0	3.1	28.9	4 479
10	398	52	9.9	20.2	23 400	262	13	6.8	22.7	10 378
10^2	n/c	n/c	n/c	n/c	n/c	269	14	9.9	20.8	14 185
10^3	n/c	n/c	n/c	n/c	n/c	285	18	8.9	20.1	13 740
10^4	n/c	n/c	n/c	n/c	n/c	242	6	6.9	22.8	9 067
10^5	n/c	n/c	n/c	n/c	n/c	276	16	7.5	21.3	11 516
∞	n/a	n/a	n/a	n/a	n/a	299	22	8.1	19.1	10 770

Single-phase DFM

- Drains and barriers
- Numerical modeling

Two-phase DFM

- Two-phase flow in homogeneous and heterogeneous media
- Drains are barriers?!

Acceleration of Newton's method

- Variable switching
- **Nonlinear Jacobi preconditioning**

Model problem

$$\partial_t S(p) - \Delta p = 0$$

Discretized algebraic problem at each time step

$$S(\mathbf{p}) + L\mathbf{p} = \mathbf{b}, \quad \mathbf{b} \geq 0$$

Assumptions:

- $S : \mathbb{R}^+ \rightarrow \mathbb{R}^+$ increasing and concave, $S'(0) \leq +\infty$
- $S'(\mathbf{p}) + L$ is **M-matrix**

Let

$$F(\mathbf{p}) = S(\mathbf{p}) + L\mathbf{p} - \mathbf{b}$$

Newton's method:

$$\mathbf{p}_{k+1} = \mathbf{p}_k - F'(\mathbf{p}_k)^{-1}F(\mathbf{p}_k), \quad k \geq 0$$

Theorem (Monotone Newton Theorem (Baluev '52; Ortega & Rheinboldt '70))

Let \mathbf{p}_0 satisfy $F(\mathbf{p}_0) \leq 0$, then

- \mathbf{p}_k converges to the unique solution \mathbf{p}_\star
- $\mathbf{p}_k \leq \mathbf{p}_{k+1} \leq \mathbf{p}_\star$ for all $k \geq 0$

Illustration ($N = 1$)

The method is semi-globally convergent, but is very slow!

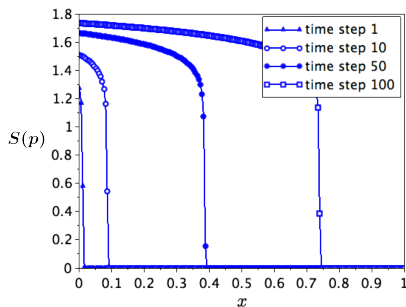
Example: 1D porous media equation

Porous media equation on $(0, 1) \times (0, T)$

$$\partial_t S(p) - \partial_{xx}^2 p = 0, \quad S(p) = p^{1/m}, \quad m > 1$$

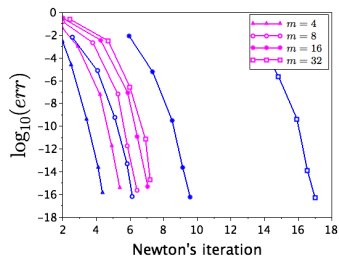
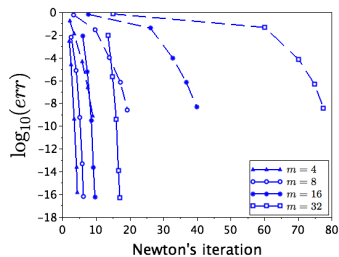
with Neumann boundary conditions

- Inflow at $x = 0$: $-\partial_x p(0, t) = q \geq 0$
- No-flow at $x = 1$
- Almost "dry" initial condition: $S(p(x, 0)) = 10^{-10}$



Typical solution profile

Recap on different formulations



$$u \text{ - formulation : } S(\mathbf{p}) + L\mathbf{p} - \mathbf{b}_n = 0$$

$$v \text{ - formulation : } \mathbf{s} + LS^{-1}(\mathbf{s}) - \mathbf{b}_n = 0$$

$$\tau \text{ - formulation : } \bar{v}(\boldsymbol{\tau}) + L\bar{p}(\boldsymbol{\tau}) - \mathbf{b}_n = 0$$

- p -formulation is the worst!
- v - and τ - formulations provide better performance, **but** no convergence theorem
- Is it possible to **have both**?

Nonlinear Jacobi method:

- Separate diagonal and off-diagonal terms

$$\underbrace{S(\mathbf{p}) + \text{diag}(L)\mathbf{p}}_{f(\mathbf{p})} + \underbrace{(L - \text{diag}(L))\mathbf{p}}_{A\mathbf{p}} = \mathbf{b}$$

- Use fixed-point iterations

$$\mathbf{p}_{k+1} = g(\mathbf{b} - A\mathbf{p}_k), \quad g = f^{-1}$$

Idea: use Jacobi method **as preconditioner not a solver**

- Left preconditioned method: apply Newton to

$$\mathbf{p} - g(\mathbf{b} - A\mathbf{p}) = 0$$

- Right preconditioned method: apply Newton to

$$\mathbf{p} + Ag(\mathbf{p}) - \mathbf{b} = 0$$

Preconditioned methods **satisfy MNT**.

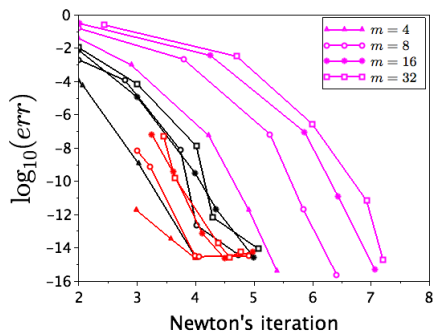
Efficiency of the preconditioned methods

Left-preconditioned:

$$\mathbf{p} - g(\mathbf{b} - A\mathbf{p}) = 0$$

Right-preconditioned:

$$\mathbf{p} + Ag(\mathbf{p}) - \mathbf{b} = 0$$

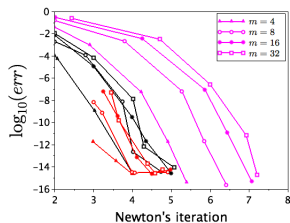
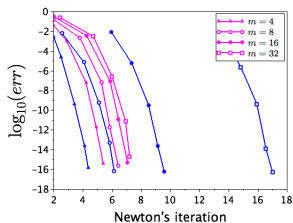
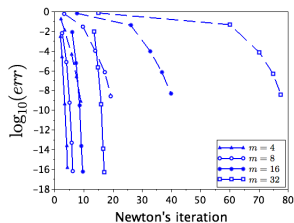


■ **Left** and **right** preconditioned methods beat τ -formulation!

Jacobi preconditioning: conclusion

Nonlinear Jacobi preconditioning

- accelerates convergence of Newton's method,
- while preserving monotone convergence



$$u \text{ - formulation : } \quad S(\mathbf{p}) + L\mathbf{p} - \mathbf{b} \quad = \quad 0$$

$$v \text{ - formulation : } \quad \mathbf{s} + LS^{-1}(\mathbf{s}) - \mathbf{b} \quad = \quad 0$$

$$\tau \text{ - formulation : } \quad \bar{\mathbf{s}}(\boldsymbol{\tau}) + L\bar{\mathbf{p}}(\boldsymbol{\tau}) - \mathbf{b} \quad = \quad 0$$

$$\text{Left-preconditioned : } \quad \mathbf{p} - g(\mathbf{b} - A\mathbf{p}) \quad = \quad 0$$

$$\text{Right-preconditioned : } \quad \mathbf{p} + Ag(\mathbf{p}) - \mathbf{b} \quad = \quad 0$$

Single-phase DFM

- Two kinds of models
- Large spectrum of numerical methods

Two-phase DFM

- Capillary effects are crucial
- Validity of models is less clear
- Numerical analysis is sparser

Acceleration of Newton's method

- Variable switching is extended to heterogeneous problems
- Nonlinear Jacobi preconditioning is under investigation

Single-phase DFM

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Two-phase DFM

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Acceleration of Newton's method

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Definition

We say that A is an M-matrix if

- A is invertible and $A^{-1} \geq 0$;
- Off-diagonal elements of A are nonpositives.

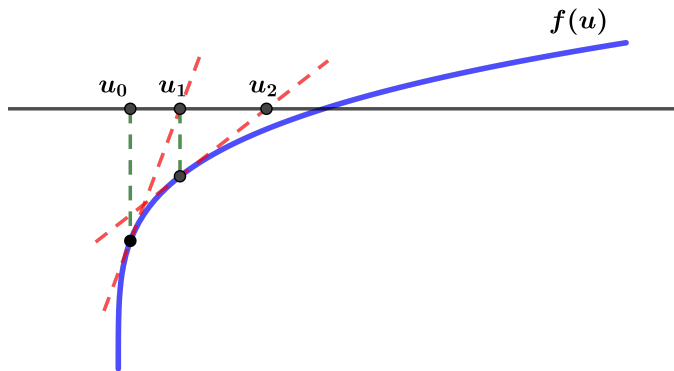
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Appendix II: 1d Newton's method for a concave problem

Newton's method for

$$f(p) = 0, \quad p \in \mathbb{R}$$

- f concave and increasing



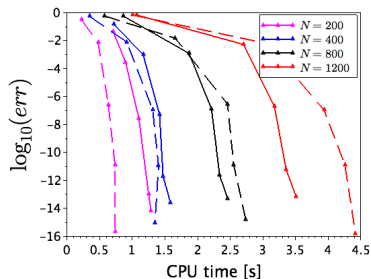
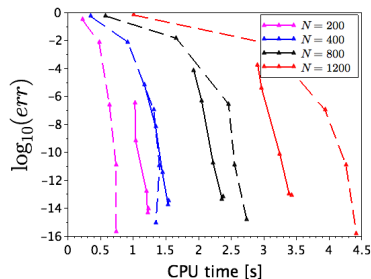
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CPU time efficiency

Preconditioned methods have to evaluate $g = f^{-1}$.

- At each Newton's iteration one solves a system of N uncoupled equations

How expensive is that?



Relative error versus CPU time for different grid sizes.

τ -formulation = dashed lines

preconditioned method = solid lines

- Preconditioned methods are more efficient for large problems ($N \gtrsim 400$) because they require less linear solves

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