

Simulation of flows in heterogeneous porous media with Feel++

Obed SABA

Project M1
Master CSMI

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Main objective:

*Simulation of flows in heterogeneous porous media with Feel++.
Heterogeneous, because the porous medium is composed of several materials with different properties.*

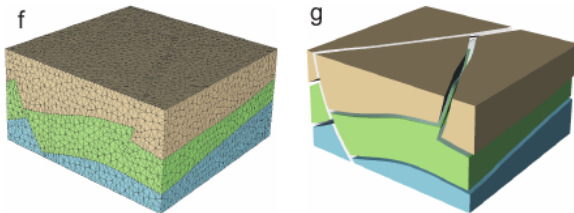


Figure: *Example of heterogeneous porous medium*

Work plan and Intermediate steps

Work plan:

- Presentation of the models
- Presentation the mesh generation in 3D with Gmsh
- Presentation of the 3D of Richards model
- Presentation of the 3D of two-phase flow : CFPDEs
- Conclusion

Intermediate steps:

- Generation of a suitable mesh for a 3D simulation.
- Explore the Richards model in 3D cases with CFPDEs
- Adapting time step in case of non-convergence when solving Richards equations with Feel++
- Investigate the Two-phase model in 3D

The work was organised and coordinated via the following tools:

- **Slack** : for internal communication.
- **Github** : for code sharing, version management and issue tracking.
- **Python** : for the implementation of the numerical model.
- **Gmsh** : for the generation of the mesh.
- **Feel++** : for the numerical simulation.
- **Jupyter notebook** : for the presentation of the results.

MESHING FRACTURED DOMAINS

Example of a fractured domain

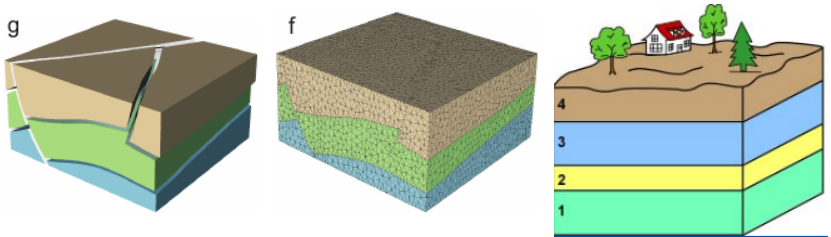


Figure: *Example of a fractured domain*

Mesh Generation

- Mesh with a one fracture

Mesh with a one fracture

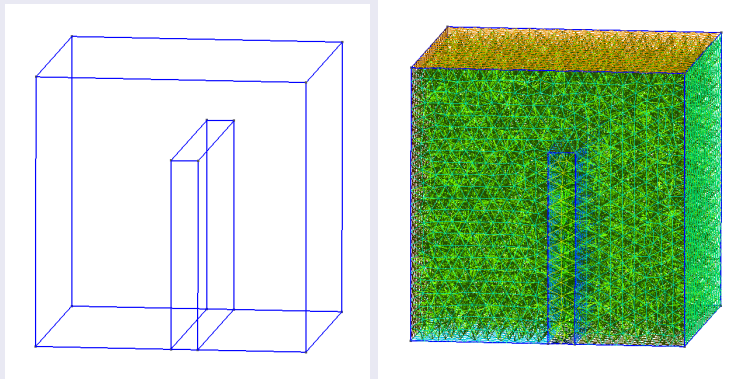


Figure: *Mesh in 3D with 1 fracture*

Mesh Generation

- Complex Mesh with three fractures

Complex Mesh with three fractures

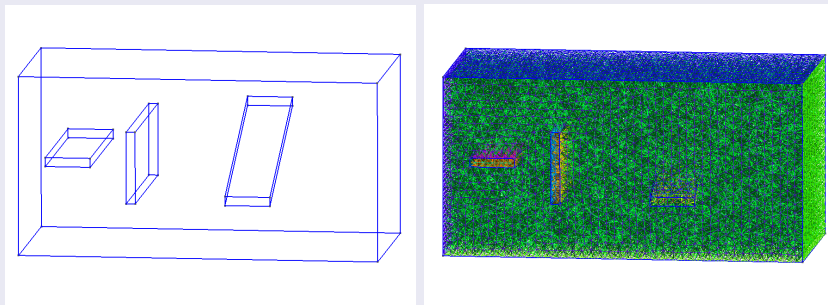


Figure: *Mesh in 3D with 3 fractures see*

Mesh Generation

- Complex terrain Mesh with fractures

Complex terrain Mesh with fractures

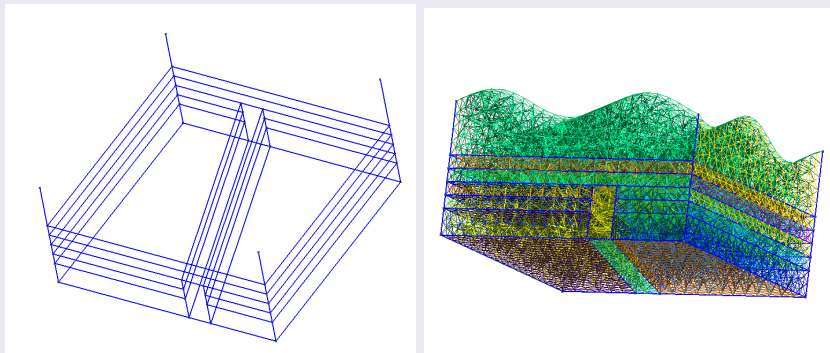


Figure: *Mesh in 3D with 6 fractures see*

SOLVING RICHARDS' PDES OVER FRACTURED DOMAINS

PDE Model: Two-Phase Model

Mass conservation equation:

$$\begin{cases} \frac{\partial(\phi \rho_{\omega} S_{\omega})}{\partial t} + \operatorname{div}(\rho_{\omega} \vec{V}_{\omega}) = 0 \\ \frac{\partial(\phi \rho_0 S_0)}{\partial t} + \operatorname{div}(\rho_0 \vec{V}_0) = 0 \end{cases}$$

Two phase Darcy laws:

$$\begin{cases} \vec{V}_{\omega} = -\frac{k_{r,\omega}(S_{\omega})}{\mu_{\omega}} K(\nabla P_{\omega} - \rho_{\omega} \vec{g}) \\ \vec{V}_0 = -\frac{k_{r,0}(S_0)}{\mu_0} K(\nabla P_{\omega} + \nabla P_c(S_{\omega}) - \rho_0 \vec{g}) \end{cases}$$

Pore volume conservation:

$$S_{\omega} + S_0 = 1$$

Where:

- ϕ : porosity.
- S_i : saturation.
- V : velocity.
- K : permeability.
- P_i : pressure.

Towards Simplification: The Richards Model

Considering the intricate nature and numerical cost of our primary model, we turn to the Richards model for a more streamlined approximation.

Assumptions:

- Air viscosity is much less than water's.
- Air is continuously connected to the atmosphere ($p_{atm} = 0$).
- Solid skeleton is rigid; water is uniform and incompressible.

Resulting in:

$$\begin{cases} \partial_t s - \nabla \cdot (\lambda(s)(\nabla p - g)) = 0 \\ s = S(p) \end{cases} \quad (1)$$

Where:

- s : saturation.
- $\lambda(s)$: hydraulic conductivity
- g : gravity.
- $S(p)$: relation between s and p

The Brooks-Corey law $S(p)$

$$S_1(p) = \begin{cases} \left(\frac{p}{p_b}\right)^{\frac{1}{\beta}} & \text{if } p \leq p_b \\ 1 & \text{if } p > p_b \end{cases} \quad (2)$$

$$S_2(p) = \frac{1}{1 + e^{-\beta p - 1}} \quad (3) \quad S_3(p) = \tanh(ap + b) \quad (4)$$

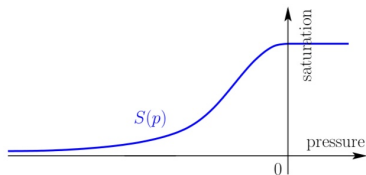


Figure: $S(p)$ function from [5]

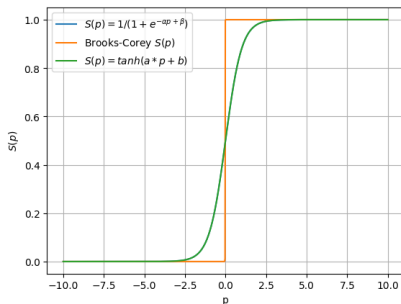


Figure: approximate saturation function

What is CFPDE?

CFPDE is a generalization of PDEs, introducing function-based coefficients to encapsulate more complex behaviors and dependencies in the equation. A typical CFPDE is:

$$d(u)\partial_t u + \nabla \cdot (-c(u)\nabla u - \alpha(u)u + \gamma(u)) + \beta(u)\nabla u + a(u)u = f(u) \quad (5)$$

Where:

- $d(u)$: Time dependency.
- $c(u)$: Diffusion coefficient.
- $\alpha(u)$: Convection coefficient.
- $\gamma(u)$: Reaction term.
- $\beta(u)$: Gradient influence.
- $a(u)$: Source/sink term.
- $f(u)$: External force function.

Configuring CFPDE for Richards

Identifications on Equation 1:

- $u = s$
- $d(u) = 1$
- $\gamma(u) = -\lambda(s)(\nabla p - \vec{g})$
- All other coefficients (c, α, β, a, f) are zero.

JSON Configuration:

```
1 {  
2   "saturation": {  
3     "setup": {  
4       "unknown": {  
5         "basis": "Pch1",  
6         "name": "S",  
7         "symbol": "s"  
8       },  
9       "coefficients": {  
10        "d": "1.0",  
11        "gamma": "{-saturation_s^m * materials_permkx * (pressure_grad_p_0 -  
          gx), -saturation_s^m * materials_permky * (pressure_grad_p_1 - gy)}:",  
          saturation_s: pressure_grad_p_0: pressure_grad_p_1: gx: gy: materials_permkx:  
          materials_permky: m"  
12      }  
13    }  
14 }  
15 }
```


Configuring CFPDE for Richards

Identifications on Equation 2:

- $u = p$
- $f(u) = s - S(p)$
- All other coefficients (c , α , β , a , γ) are zero.

JSON Configuration:

```
1 {  
2   "pressure": {  
3     "setup": {  
4       "unknown": {  
5         "basis": "Pch1",  
6         "name": "P",  
7         "symbol": "p"  
8       },  
9       "coefficients": {  
10        "f": "{saturation_s - materials_sigmoid}:saturation_s:  
11        materials_sigmoid"  
12      }  
13    }  
14 }
```

Results in 2D

With permeability

$$K = \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix} \quad \text{and} \quad S(p) = \frac{1}{1 + e^{(-p-1)}} \quad (6)$$



Figure: Results of the simulation in 2D with opening

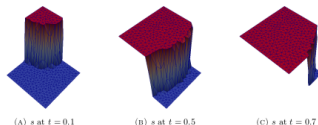


Figure: Results taken from the book

Results in 2D

2D simulation



Heterogeneous permeability

$$K = \begin{bmatrix} 1 + 10(y < 0.7) & 0 \\ 0 & 1 + 10(y < 0.7) \end{bmatrix} \quad \text{and} \quad \alpha = 1, \beta = -1 \quad (7)$$

Heterogeneous permeability

2D simulation



$$K = \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix} \quad \text{and} \quad S(p) = \frac{1}{1 + e^{(-p-1)}} \quad (8)$$

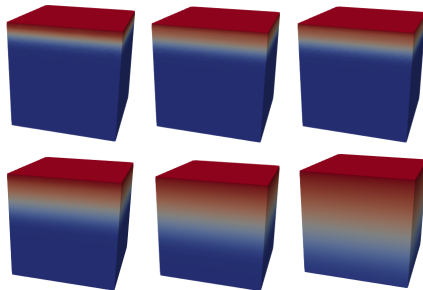


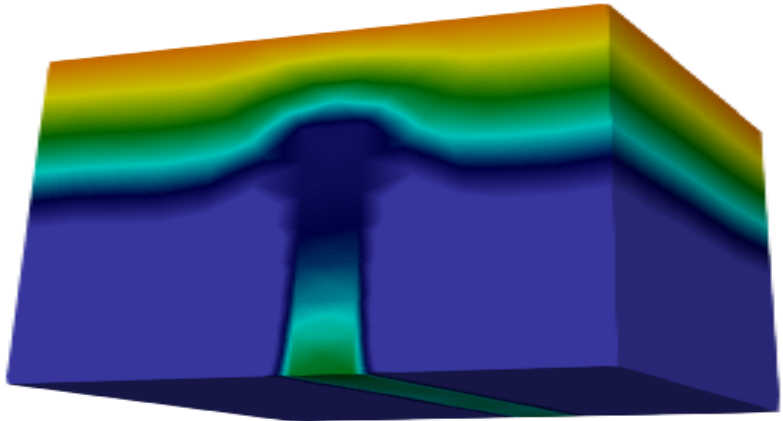
Figure: Results of the simulation in 3D

We consider Ω_1 as the matrix and Ω_2 as fractures :

$$K_{\Omega_1} = \begin{pmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0.2 \end{pmatrix} \quad \text{and} \quad K_{\Omega_2} = \begin{pmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 1 \end{pmatrix} \quad (9)$$

Results in 3D

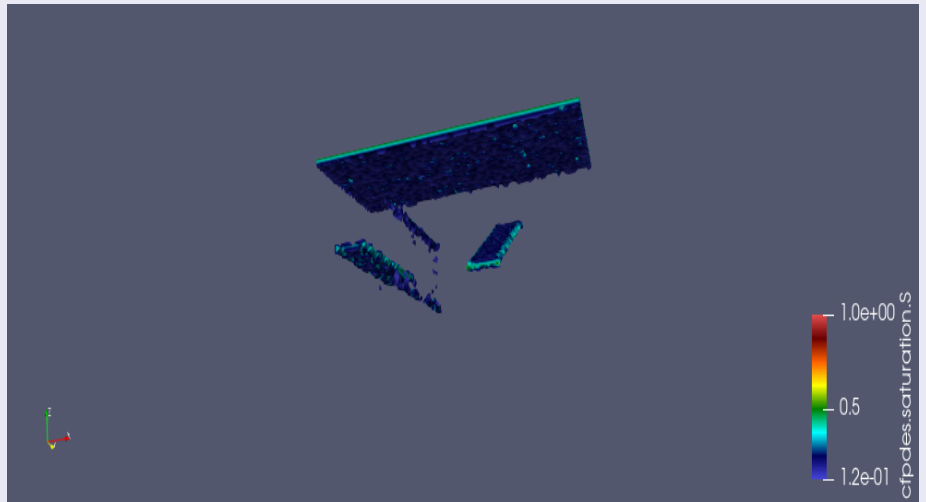
Heterogeneous permeability



We consider Ω_1 as the matrix and $\Omega_2, \Omega_3, \Omega_4$ as fractures :

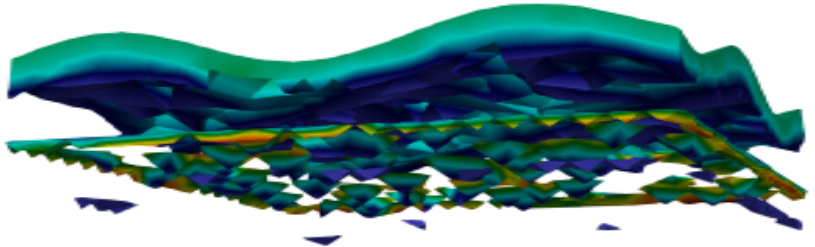
$$\left\{ \begin{array}{l} K_{\Omega_1} = \begin{pmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0.2 \end{pmatrix} \\ K_{\Omega_3} = \begin{pmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 1 \end{pmatrix} \end{array} \right. \text{ and } \left\{ \begin{array}{l} K_{\Omega_2} = \begin{pmatrix} 0.1 & 0 & 0 \\ 0 & 0.1 & 0 \\ 0 & 0 & 1 \end{pmatrix} \\ K_{\Omega_4} = \begin{pmatrix} \cos(1.11) & 0 & 0 \\ 0 & \cos(0.46) & 0 \\ 0 & 0 & \cos(0.57) \end{pmatrix} \end{array} \right. \quad (10)$$

Heterogeneous permeability



$$\left\{ \begin{array}{l} K_{\Omega_1} = \begin{pmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0.9 \end{pmatrix} \quad \text{and} \quad K_{\Omega_2, \Omega_6} = \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 0.2 \end{pmatrix} \\ K_{\Omega_3, \Omega_5} = \begin{pmatrix} 0.9 & 0 & 0 \\ 0 & 0.9 & 0 \\ 0 & 0 & 1 \end{pmatrix} \quad \text{and} \quad K_{\Omega_4} = \begin{pmatrix} 0.85 & 0 & 0 \\ 0 & 0.85 & 0 \\ 0 & 0 & 0.2 \end{pmatrix} \\ K_{\Omega_7} = \begin{pmatrix} \cos(-1.262) & 0 & 0 \\ 0 & \cos(-0.291) & 0 \\ 0 & 0 & \cos(-0.983) \end{pmatrix} \end{array} \right. \quad (11)$$

Heterogeneous permeability



Adapting time step in case of non-convergence with Feel++

Adapting time step in case of non-convergence with Feel++

GOAL: adapt the time step to save time on the simulations

```
1{
2def richards(hsize, json, dim=3, verbose=False):
3    if verbose:
4        print(f"Solving the richards problem for hsize = {hsize}...")
5    feelpp.Environment.setConfigFile("../feel/richards.cfg")
6    richards = cfpdes(dim=dim, keyword=f"cfpdes-{dim}d")
7    richards.setMesh(getMesh(f"16.geo", hsize=hsize, dim=dim, verbose=verbose))
8    richards.setModelProperties(json)
9    richards.init(buildModelAlgebraicFactory=True)
10   richards.printAndSaveInfo()
11   richards.startTimeStep()
12   measures = None
13   if richards.isStationary():
14       try:
15           richards.solve()
16       except Exception as e:
17           print(f"Error encountered during solve: {e}")
18           return None
19       richards.exportResults()
20   else:
21       while not richards.timeStepBase().isFinished():
22           if richards.worldComm().isMasterRank():
23               print("
24               print("time simulation: ", richards.time(), "s \n")
25               print("
26}
```

Adapting time step in case of non-convergence with Feel++

```
1{
2    dt = richards.timeStepBase().timeStep()
3    while dt > 1e-10: # lower limit for time step
4        start_time = time.time()
5        try:
6            converged = richards.solve()
7            solve_time = time.time() - start_time
8            if solve_time < 1000.0: # threshold for solve time
9                break # if solve() is fast enough, exit the inner while loop
10           else:
11               print(f"Solve() took too long ({solve_time} seconds),
12               reducing time step")
13               dt *= 0.5 # reduce time step by a factor of two
14               richards.setTimeStep(dt) # set new time step
15           except Exception as e:
16               print(f"Error encountered during solve: {e}")
17               traceback.print_exc() # print traceback to see where the error
18               occurred
19               if not converged:
20                   print(f"Warning: solve() did not converge : {converged}")
21                   dt *= 0.5
22                   richards.setTimeStep(dt) # set new time step
23               if dt <= 1e-10: # lower limit for time step
24                   print("Warning: Time step became too small even though solve() takes
25                   too long. Exiting simulation.")
26                   return None
27               richards.exportResults()
28               richards.updateTimeStep()
29 if measures :
30     measures = richards.postProcessMeasures().values()
31     return measures
32 }
```

Numerical simulation with the two-phase model

CFPDEs : two-phase model

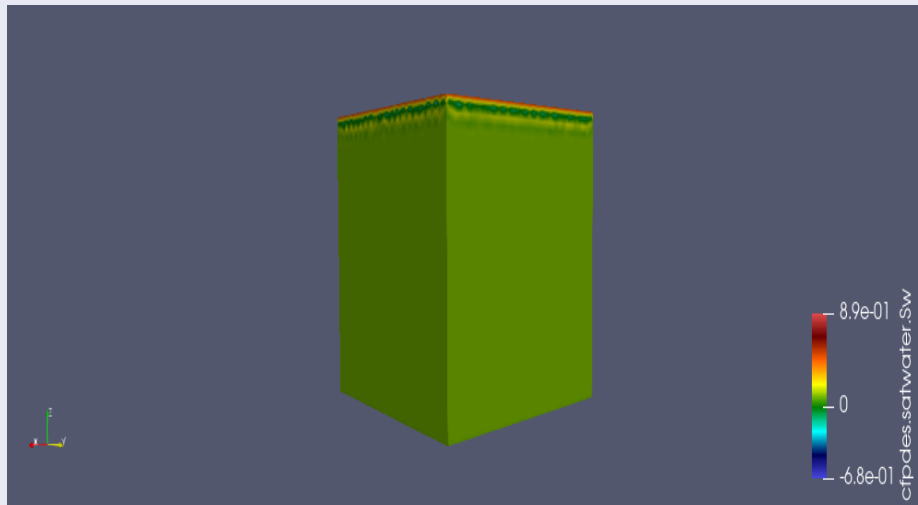
$$\begin{cases} \frac{\partial(\phi\rho_w S_w)}{\partial t} + \operatorname{div}(-\rho_w \frac{S_w^2}{\mu_w} K(\nabla P_w - \rho_w \vec{g})) = 0 \\ \frac{\partial(\phi\rho_o(1-S_w))}{\partial t} + \operatorname{div}(-\rho_o \frac{(1-S_w)^2}{\mu_o} K(\nabla P_w + \nabla P_c(S_w) - \rho_o \vec{g})) = 0 \end{cases} \quad (12)$$

$$K = \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix} \quad \text{for the permeability}$$

$$\text{and } P_c = -((S_w - 0.5)^3 + 5) \quad \text{for the pressure}$$

Numerical Results

Two Phase-Flow simulation



Conclusion

Conclusion

We understood how to model and simulate heterogeneous environments with Feel++.

Perspectives :

- Fix the two-phase simulations
- Fix the adaptive time steppings

Reflection on the Learning Experience

- Deepened understanding of flow simulation in porous media.
- Hands-on experience and application with Feel++.
- Acquired efficient methodologies for tackling challenges in the field.
- *Gentleness*: My instructor was remarkably kind, always approaching topics with a gentle demeanor, which made the learning environment comfortable.
- *Understanding*: More than just teaching, my instructor demonstrated a deep understanding of the topics, ensuring that complex ideas were broken down and presented in an approachable manner.
- *Patience*: No matter the challenge, there was always an aura of patience. This greatly assisted in my ability to tackle and understand even the most difficult subjects.
- *Rigour*: The patience and kindness never compromised the rigour of the coursework. Standards were maintained, ensuring a quality education and thorough understanding.

Thank you for your attention

References



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