

Coupled formulations and coupling algorithms for reactive transport in porous media

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Microbiology and Reactive Transport in the Capillary Fringe

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1 Motivations

2 Basic models and methods

- Flow model
- Transport model
- Chemistry

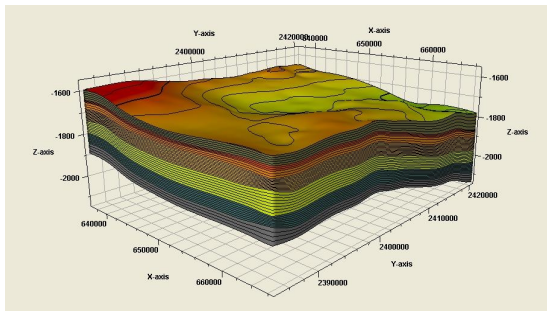
3 Formulations and solution methods

4 Examples

- Ion exchange
- CO2 example

5 Conclusions

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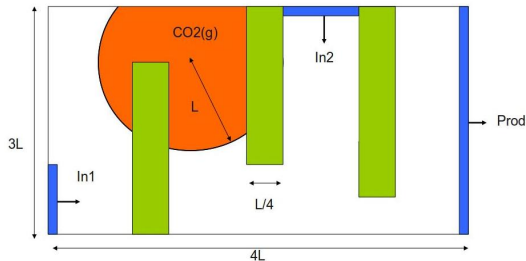
Geological model, BRGM (21 million grid points)

SHPCO2 project (funded by ANR) High Performance Simulation of CO₂ sequestration

- Long term capture of CO₂ in saline aquifer
- Simulation to understand CO₂ migration through salt
- Coupling of liquid and gas phase, reactive transport

CO₂ sequestration : a synthetic model

Minimal chemical system that still "looks like" realistic for CO₂ storage



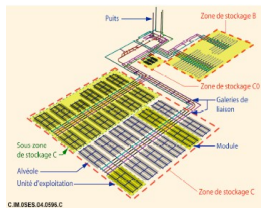
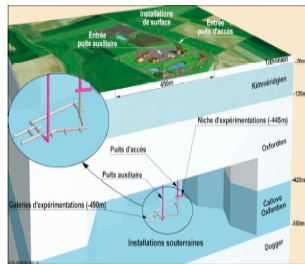
Dissolution of CO₂ in water, dissolution of calcite. Gas assumed immobile (capillary trapping), decouples two phase flow from reactive transport.

Chemical system

- $\text{H}_2\text{O} \rightleftharpoons \text{H}^+ + \text{OH}^-$ Water dissociation
- $\text{CO}_2(\text{g}) \rightleftharpoons \text{CO}_2(\text{aq})$ Gas dissolution
- $\text{H}_2\text{O} + \text{CO}_2(\text{aq}) \rightleftharpoons \text{HCO}_3^- + \text{H}^+$ Dissociation of aqueous CO₂
- $\text{CaCO}_3 + \text{H}^+ \rightleftharpoons \text{Ca}_2^+ + \text{HCO}_3^-$ Dissolution of calcite

Nuclear waste storage

- Assess safety of deep geological nuclear waste storage (clay layer)
- Long term simulation of radionuclide transport (one million years)
- Wide variation of scales : from package (meter) to regional (kilometers)
- Geochemistry : large number of species
- Strong government regulation



Present choice in France : a **sedimentary** geological formation (in the Meuse region)

Research in mathematical and numerical modeling is conducted in the CNRS **MOMAS** group (Director A. Ern).

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Flow equations : Darcy's law

$$\mathbf{q} = -K \nabla h$$

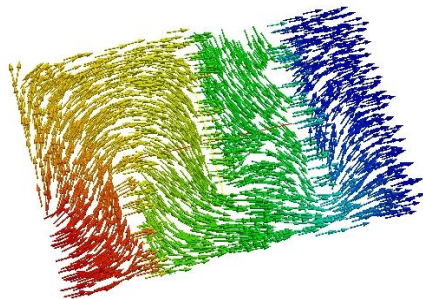
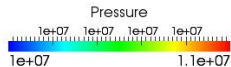
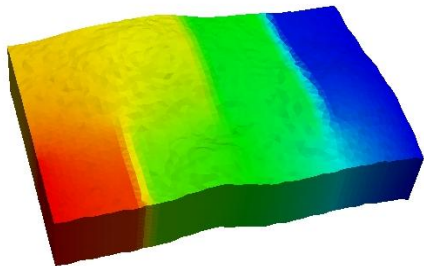
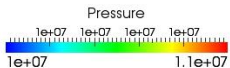
$$\nabla \cdot \mathbf{q} = 0$$

- h piezometric head
- \mathbf{q} Darcy velocity
- K permeability tensor (heterogeneous, anisotropic)

Mixed finite elements

- Approximate both **head** and **velocity**
- Locally **mass conservative**
- Continuous **flux** across element faces
- Allows **full** diffusion tensor

Pressure and velocity for CO2 example (A. Fumagalli, M. Franco)



Convection–diffusion equation

$$\phi \frac{\partial c}{\partial t} - \underbrace{\operatorname{div}(\mathbf{D} \operatorname{grad} c)}_{\text{dispersion}} + \underbrace{\operatorname{div}(\mathbf{u} c)}_{\text{advection}} + \phi \lambda c = f$$

- c : concentration [mol/l]
- λ radioactive decay [s^{-1}]
- ϕ : porosity [-]
- \mathbf{u} Darcy velocity [m/s]

Dispersion tensor

$$\mathbf{D} = d_e \mathbf{I} + |\mathbf{u}| [\alpha_l \mathbf{E}(\mathbf{u}) + \alpha_t (\mathbf{I} - \mathbf{E}(\mathbf{u}))], \quad E_{ij}(\mathbf{u}) = \frac{u_i u_j}{|\mathbf{u}|}$$

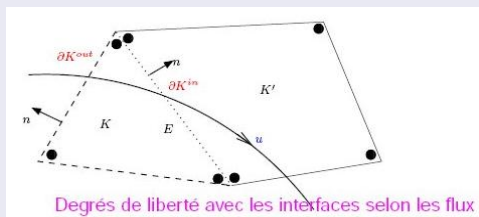
α_l, α_t dispersivity coeff. [m], d_e molecular diffusion [m/s^2]

Solution by operator splitting

Advection step

Explicit, finite volumes / discontinuous Galerkin

- Locally mass **conservative**
- Allows **unstructured** meshes
- CFL condition : use **sub-time-steps**



Dispersion step

Like flow equation (time dependent) : mixed finite elements (implicit)

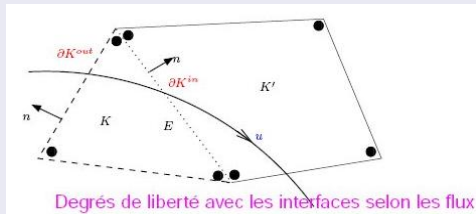
See Ackerer et al., Putti et al., Arbogast et al., ...

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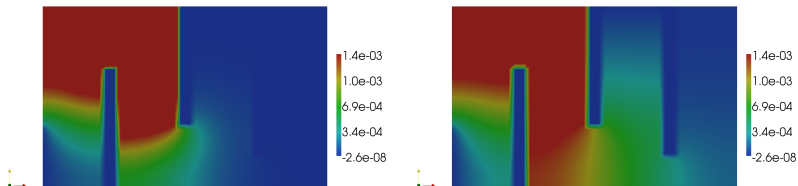
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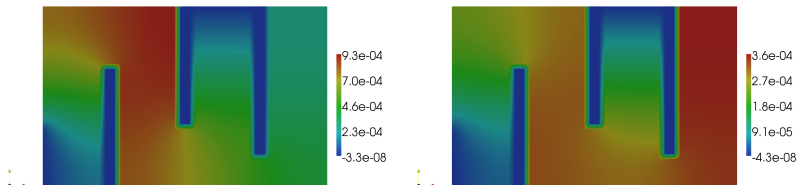
Condense transport solver, one time step

$$C^{n+1} = \Psi_T(f^n, C^n)$$

Transport for synthetic CO₂ example



Left $T = 1$ day, right $T = 6$ days



Left $T = 12$ day, right $T = 37$ days

Classification of chemical reactions

According to nature of reaction

Homogeneous In the same phase (aqueous, gaseous, ...)

Examples : Acid base, oxydo–reduction

Heterogeneous Involve different phases

Examples : Sorption, precipitation – dissolution, ...

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According to speed of reaction

Fast reactions Reversible, modeled using equilibrium

Examples : Aqueous reactions, sorption, precipitation – dissolution

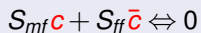
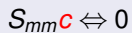
Slow reactions Irreversible, modeled using kinetic law

Examples : Precipitation – dissolution

Depends on relative speed of reactions and transport.

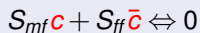
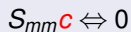
c_j aqueous (mobile) species, \bar{c}_j fixed (immobile) species,

Chemical reactions



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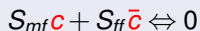
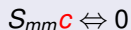


Let

$$\begin{pmatrix} P_{mm} & P_{mf} \\ 0 & P_{ff} \end{pmatrix} \begin{pmatrix} S_{mm}^T & S_{mf}^T \\ 0 & S_{ff}^T \end{pmatrix} = 0$$

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Chemical reactions



Let

$$\begin{pmatrix} P_{mm} & P_{mf} \\ 0 & P_{ff} \end{pmatrix} \begin{pmatrix} S_{mm}^T & S_{mf}^T \\ 0 & S_{ff}^T \end{pmatrix} = 0$$

System of non-linear equations

Mass action law

$$S_{mm} \log c = \log K,$$

$$S_{mf} \log c + S_{ff} \log \bar{c} = \log \bar{K}.$$

Mass conservation

$$P_{mm}c + P_{mf}\bar{c} = T$$

$$P_{ff}\bar{c} = W,$$

T, W known from transport

Numerical solution of nonlinear problem

Take concentration **logarithms** as main unknowns

Use **globalized** Newton's method (line search, trust region).

Mineral reactions

- Reactions with threshold, **which** species appear unknown a priori.
- Standard procedure : **combinatorial** search
- Reformulate as **complementarity** problem
- **Interior point** algorithm (Saaf et al. ('96), J.-Ch. Gilbert, I. Ben Gharbia)
- Also **semi-smooth** Newton (Kräutle)

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Role of chemical model

Given totals T (and W , known), split into

$$C = P_{mm}c, F = P_{mf}\bar{c}, G = P_{ff}\bar{c}.$$

Result of chemical problem

$$(F, G) = \Psi_C(T, W)$$

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Balance equations

$$\begin{aligned}\phi \partial_t \mathbf{c} + L\mathbf{c} &= S_{mm}^T R_e^a + S_{mf}^T R_e^h + P^T R_k(\mathbf{c}, \bar{\mathbf{c}}) \\ \phi \partial_t \bar{\mathbf{c}} &= S_{ff}^T R_e^h + Q^T R_k(\mathbf{c}, \bar{\mathbf{c}})\end{aligned}$$

R_e equilibrium rates **unknown**, R_k kinetic rates, known expression

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Example

$$R_k = \begin{cases} k_d(T) S_r M (1 - Q/K) & \text{for dissolution} \\ k_p(T) S_r M (Q/K - 1) & \text{for precipitation} \end{cases}$$

Q is solubility product, S_r reactive surface, k speed per unit surface.

Non Lipschitz

Elimination of equilibrium rates

$$\begin{aligned}\phi \partial_t C + \phi \partial_t F + LC &= S_T R_k(T, W) \\ \phi \partial_t W &= S_W R_k(T, W) \\ C + F &= T \\ (F, G) &= \Psi_C(T, W)\end{aligned}$$

Elimination of equilibrium rates

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Special case : no kinetic reactions

$$\begin{aligned}\phi \frac{\partial T^{ic}}{\partial t} + L(C^{ic}) &= 0, \quad ic = 1, \dots, N_c \\ T_{ix}^{ic} &= C_{ix}^{ic} + F_{ix}^{ic} \quad ic = 1, \dots, N_c \text{ and } ix = 1, \dots, N_x \\ F_{ix} &= \Psi_C(T_{ix}) \quad ix = 1, \dots, N_x.\end{aligned}$$

Fixed point (aka OS) Yeh–Tripathi, Carrayrou et al., Carrera et al.

- + easy to program, code reuse
- – not robust, small time steps

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DAE formulation Erhel and de Dieuleveult

- + use quality DAE software, accurate
- – expensive

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Elimination technique Knabner et al.

- + Efficient, accurate,
- – difficult to code

A global method from the fixed–point formulation (1)

Discrete non-linear system

$$C^{n+1} = \Psi_T \left(S_T R_k(T^{n+1}, W^{n+1}) - \phi \frac{F^{n+1} - F^n}{\Delta t}, C^n \right)$$

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Formulation without kinetic reactions

$$\begin{cases} C^{n+1} = \Psi_T \left(\phi \frac{F^n - F^{n+1}}{\Delta t}, C^n \right) \\ F^{n+1} = \Psi_C(C^{n+1} + F^{n+1}) \end{cases}$$

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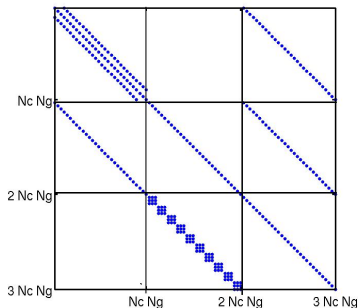
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A global method from the fixed–point formulation (2)

- + **Non-intrusive** approach
- + **Precipitation** can be included
- – One chemical equilibrium **solve** for each function evaluation

Solution by Newton–Krylov : keep transport and chemistry as black–boxes (up to Jacobian computation)

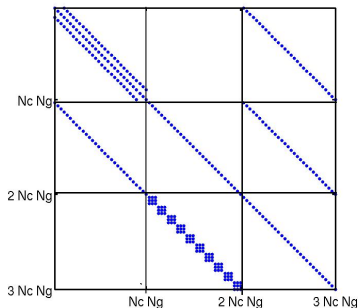


Jacobian structure

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Jacobian structure

Residual computation :

- 1 Apply Ψ_T : solve **transport** for each species,
- 2 Apply Ψ_C : solve **chemistry** for each grid cell.

Solution by Newton–Krylov

- Solve the linear system by an **iterative** method (GMRES)
- Requires only jacobian matrix by vector products.

Used for CFD, shallow water, radiative transfer (Keyes, Knoll, JCP 04), and for reactive transport (Hammond, Valocchi, Lichtner, Adv. Wat. Res. 05)

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Inexact Newton

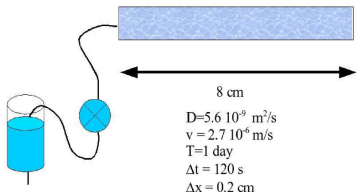
- **Approximation** of the Newton's direction $\|f'(x_k)d + f(x_k)\| \leq \eta \|f(x_k)\|$
- Choice of **the forcing** term η ?
 - Keep quadratic convergence (locally)
 - Avoid oversolving the linear system
- $\eta = \gamma \|f(x_k)\|^2 / \|f(x_{k-1})\|^2$ (Kelley, Eisenstat and Walker)

L. Amir's thesis, Amir, MK (Comp. Geosci. 09)

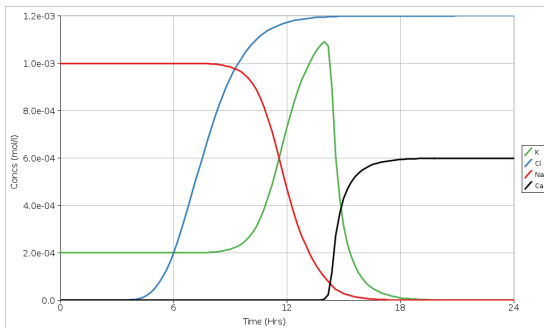
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Example : ion exchange

Column experiment (Phreeqc ex. 11)

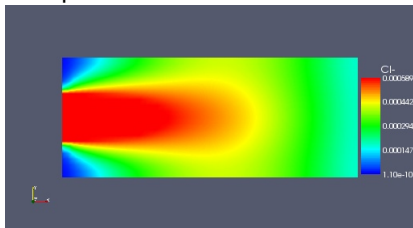


Column contains a solution with
1mmol Na, 0.2mmol K and
1.2mmol NO_3^- . Inject solution with
1.2mmol CaCl_2 . $CEC = 1.1 \cdot 10^{-3}$.

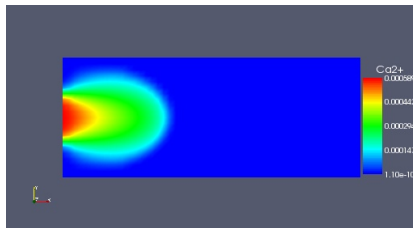


Ion exchange example (ctd)

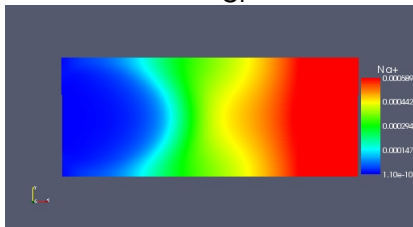
Snapshots at $t = 35$



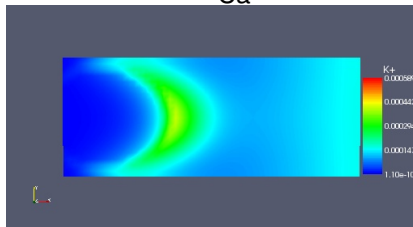
Cl



Ca



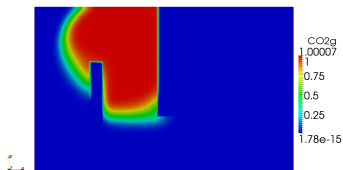
Na



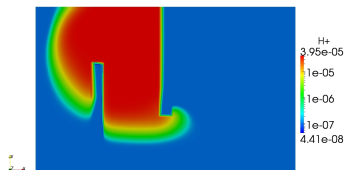
K

Application to CO2 model (LifeV, Kinsol)

Gas concentration

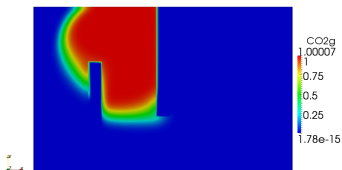


pH

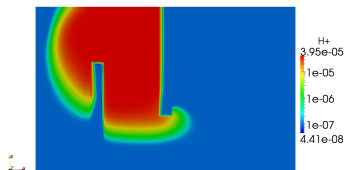


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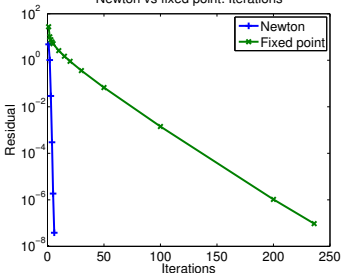
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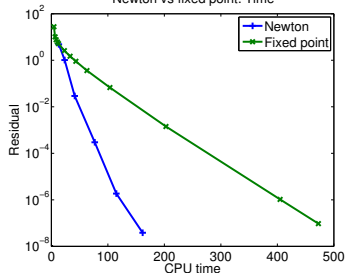
pH



Newton vs fixed point: Iterations



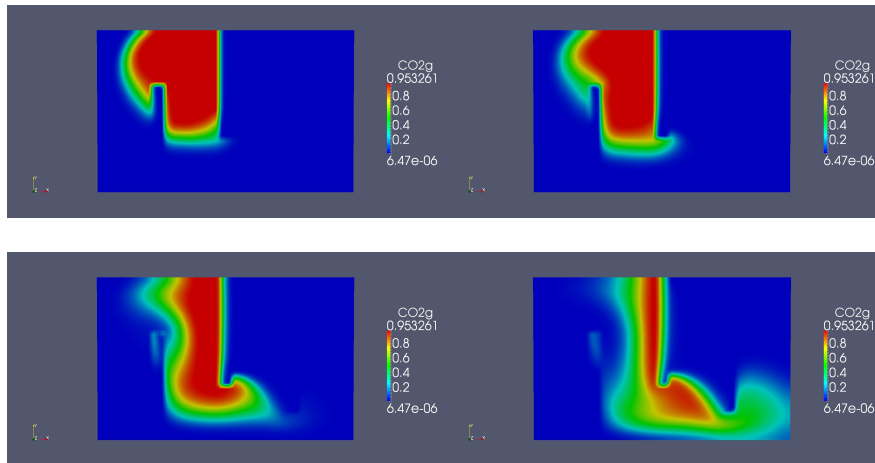
Newton vs fixed point: Time



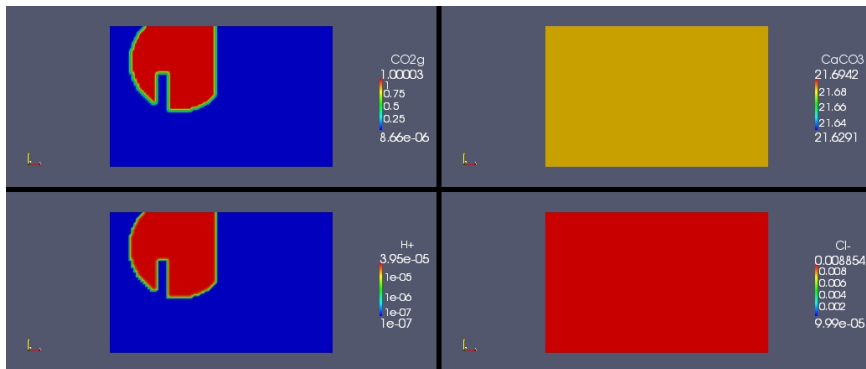
Iterations

time

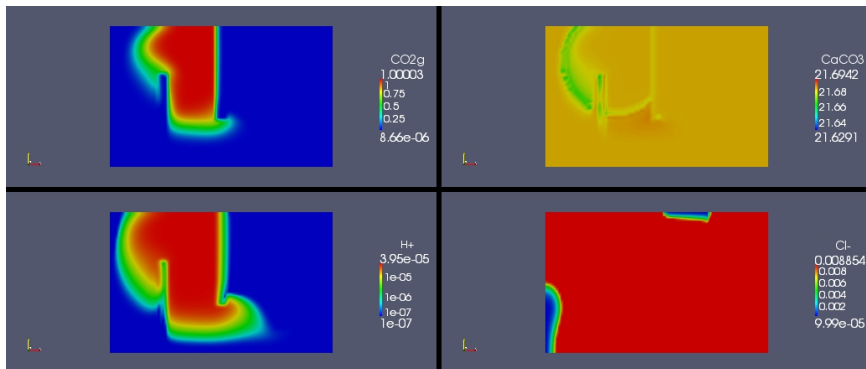
Evolution of CO2 concentration



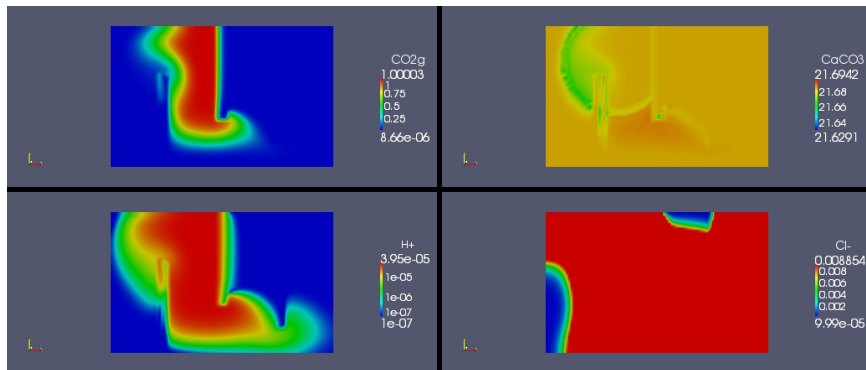
Evolution of concentrations



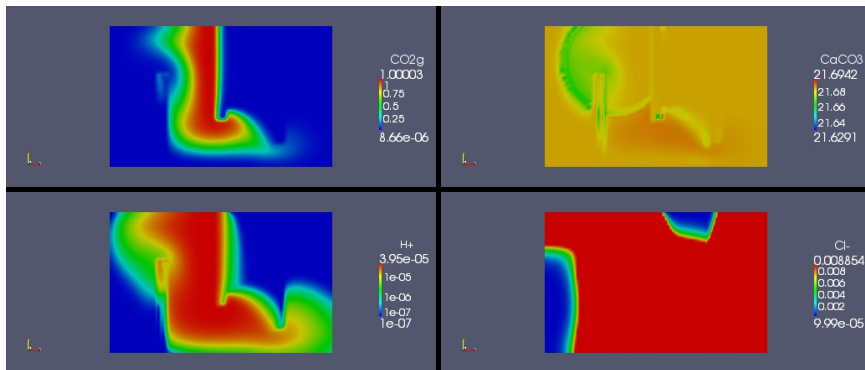
Evolution of concentrations



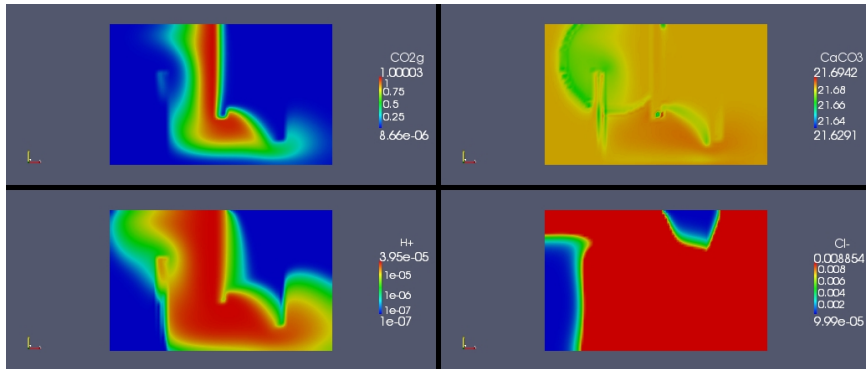
Evolution of concentrations



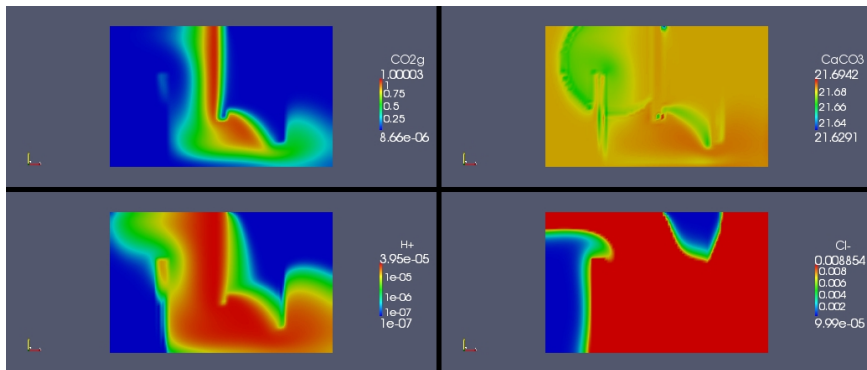
Evolution of concentrations



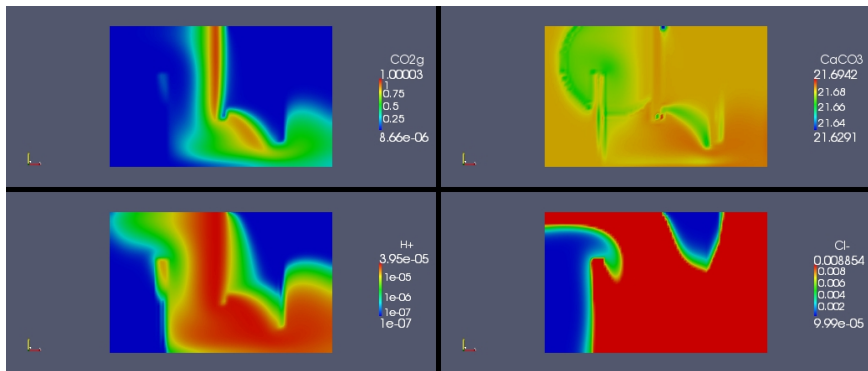
Evolution of concentrations



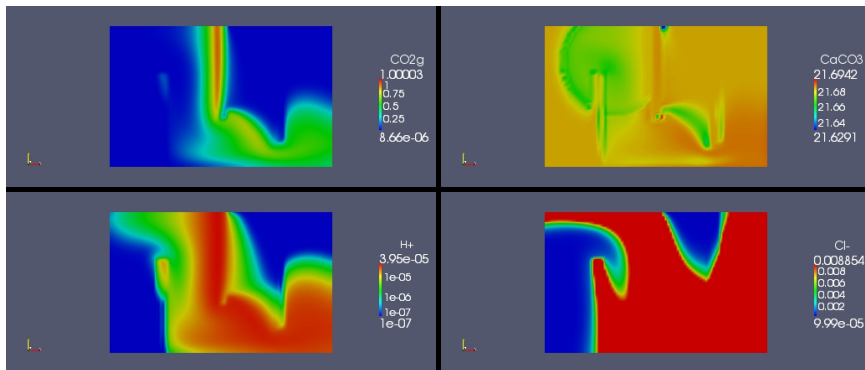
Evolution of concentrations



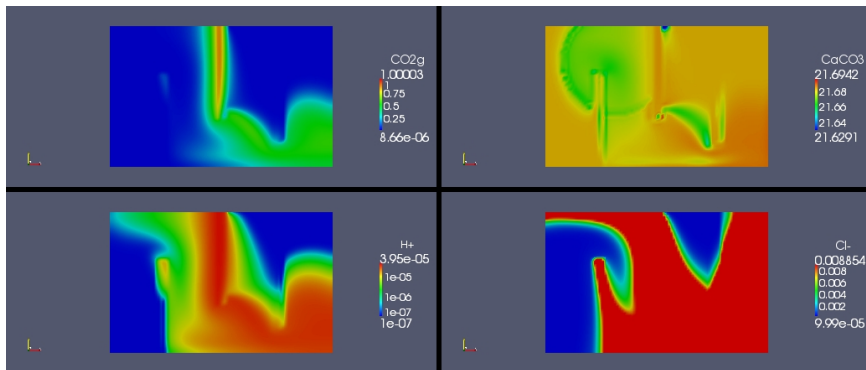
Evolution of concentrations



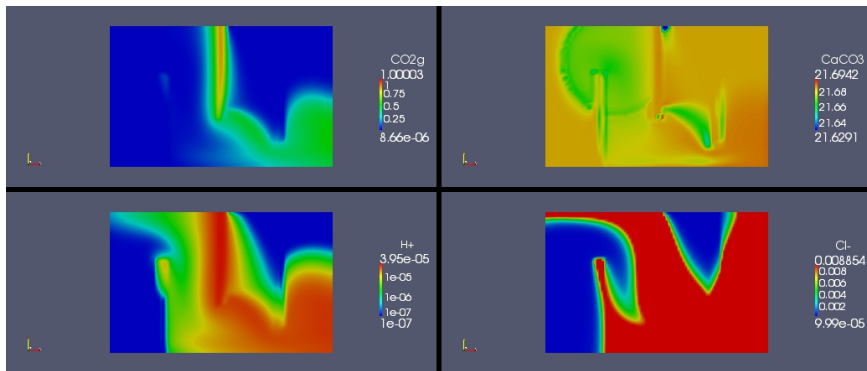
Evolution of concentrations



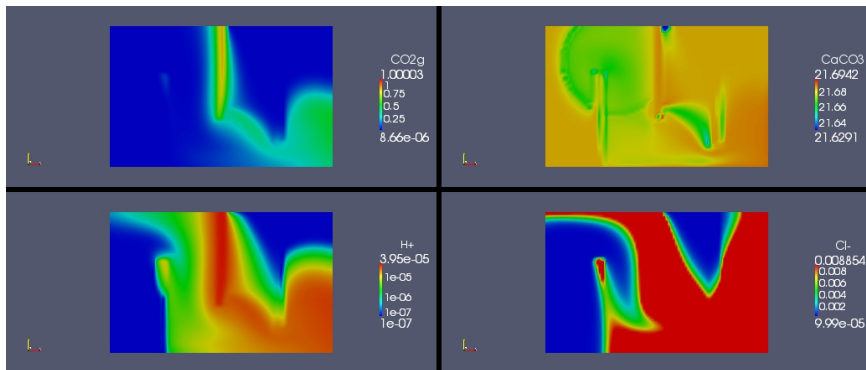
Evolution of concentrations



Evolution of concentrations



Evolution of concentrations



- 1 Motivations
- 2 Basic models and methods
 - Flow model
 - Transport model
 - Chemistry
- 3 Formulations and solution methods
- 4 Examples
 - Ion exchange
 - CO2 example
- 5 Conclusions

Conclusions – perspectives

- **Robust** methods for flow and transport
- **Newton–Krylov as a framework for code coupling**
- Extension of chemical solver to handle **minerals** and gas
- Preconditioner for simplified system, **mesh independent** convergence

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- **Newton–Krylov as a framework for code coupling**
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- Implement **analytical** Jacobian – vector product
- Implement **kinetic** reactions
- **Parallel** computing (w. MOX, Milano)
- Extension to **multiphase** (compositional) flow

A simplified one species model, with sorption

Coupled model

$$\phi \frac{\partial C}{\partial t} + \phi \frac{\partial F}{\partial t} + LC = 0,$$
$$F = \Psi(C) = \frac{k_f \sigma_0 C}{k_f C + k_b}.$$

Mathematical, numerical analysis : van Duijn, Knabner, Frolkovic

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Coupled problem

Coupled formulation

$$F \begin{pmatrix} C \\ F \end{pmatrix} = \begin{pmatrix} (\mathbf{M} + \Delta t \mathbf{L})C + \mathbf{M}F + b \\ F - \Psi(C) \end{pmatrix} = 0$$

Eliminate F $F_1(C) = (\mathbf{M} + \Delta t \mathbf{L})C + \mathbf{M}\Psi(C) - b^n$

Eliminate C $F_2(F) = F - \Psi((\mathbf{M} + \Delta t \mathbf{L})^{-1}(b - \mathbf{M}F))$

Jacobian for coupled formulation, with $D = \text{diag}(\Psi'(C_1), \dots, \Psi'(C_N))$

$$J = \begin{pmatrix} \mathbf{M} + \Delta t \mathbf{L} & \mathbf{M} \\ -\mathbf{D} & \mathbf{I} \end{pmatrix}$$

Block preconditioning

Jacobi $\mathbf{P}_J = \begin{pmatrix} \mathbf{M} + \Delta t \mathbf{L} & 0 \\ 0 & \mathbf{I} \end{pmatrix}, \quad \Lambda(P_J^{-1}J) \subset [1 - iCh, 1 + iCh]$

Gauss–Seidel $\mathbf{P}_{GS} = \begin{pmatrix} \mathbf{M} + \Delta t \mathbf{L} & 0 \\ -\mathbf{D} & \mathbf{I} \end{pmatrix}, \quad \Lambda(P_{GS}^{-1}J) \subset [1, 1 + Ch^2]$

Schur $J_2 = \mathbf{I} + \mathbf{D}(\mathbf{M} + \Delta t \mathbf{L})^{-1}\mathbf{M}, \quad \Lambda(J_2) \subset [1, 1 + Ch^2]$

Elimination of \mathbf{C} is **equivalent** to Schur complement of Gauss–Seidel.

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Nevertheless ...

Preconditioner performance

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	h		$h/2$		$h/4$		$h/8$	
	NI	LI	NI	LI	NI	LI	NI	LI
None	8	54	10	100	17	238	33	658

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	NI	LI	NI	LI	NI	LI	NI	LI
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BGS	8	11	10	15	14	22	21	36

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	h		$h/2$		$h/4$		$h/8$	
	NI	LI	NI	LI	NI	LI	NI	LI
None	8	54	10	100	17	238	33	658
BGS	8	11	10	15	14	22	21	36
Elimination	6	25	6	25	6	25	6	25

Inverting transport gives **mesh independent convergence** for both linear (LI) and nonlinear (NI) iterations.

In practice : approximate inverse should give spectral equivalence