

Work Packages ACED and DONUT

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#### **Executive Summary**

This report contains the aims and learning outcomes, the training course description, and the abstracts, reading material and slides from the lectures given at the training course. The training was organized at the University of Bern, Switzerland on February 6-10, 2023.





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#### 1. Introduction

Geological disposal systems for radioactive materials consist of different engineered and natural materials; this in view of the multi-barrier principle. The interaction between the contrasting materials in the near field of a disposal system (both the engineered barrier system and the host rock) will induce geochemical changes of these materials. The geochemical evolution as a consequence of physical and chemical perturbations needs to be part of the safety and performance analyses of the repository as it will influence (i) the durability of the different materials, and (ii) speciation and mobility of radionuclides. Given the time scales involved (ten thousand to hundred thousand years), assessing the evolution can only be done with numerical models in which geochemistry is linked to transport, thus with reactive transport codes.

A key aspect in these models is the geochemical model in which the geochemical state variables are calculated based on thermodynamic equilibrium and kinetic processes. These geochemical models account for aqueous speciation reactions, dissolution/precipitation based on saturation state, sorption based on mechanistic sorption models (exchange reactions, surface complexation) and possible kinetic processes (related e.g. to the dissolution of glass or clay minerals or the corrosion of steel canisters).

Reactive transport codes typically couple these chemical models to solute transport equations. Stateof-the-art reactive transport codes may couple this also the water flow or heat transport. Geochemical solvers in state-of-the-art reactive transport codes are also capable of handling some (micro)biological reactions. Therefore, these codes are capable to simulate coupled thermal, hydraulic, chemical and biological (THCB) processes and possible feedback between the processes. They became a powerful tool for understanding and assessing these coupled processes and the consequences for containment.

Given the complexity of the system and the long-time scales, models typically have large computational times and many uncertainties associated with it. Recent developments in new couplings between different solvers, faster methods to solve equations including methods based on machine learning, and efficient algorithms for uncertainty analysis are crucial in the framework of the analysis of the long-term evolution, optimization and performance assessment of a radioactive waste repository.

In EURAD, the work packages ACED (Assessment of Chemical Evolution of ILW and HLW Disposal cells) DONUT (Development and improvement of numerical methods and tools for modelling coupled processes) improve and implement codes and models for assessing the geochemical evolution in the near field of a repository. In view of that, this training will continue from the state-of-the-art and introduce the new developments acquire in these work packages.

#### 1.1 Aims

The training aims at enlarging knowledge and expertise in geochemical and coupled reactive transport modelling in the framework of disposal of radioactive waste with the focus on geological disposal. The theoretical basis will be enhanced by lectures on (i) principles of geochemical and reactive transport modelling, (ii) their applications for processes and evolution of materials in a geological disposal (cementitious materials, glass, steel, clay, granite) (iii) speciation and migration of radionuclides, and (iv) advanced topics related to uncertainty and machine learning. Practical skills will be enhanced by computer sessions in which participants will use available software to implement and analyze models for calculating properties and evolution of materials and speciation of radionuclides.

#### 1.2 Learning outcomes

Upon completion of the training course, the participants should be able to:

- Understand the principles of geochemical thermodynamic and kinetic modelling and reactive transport modelling
- Use these principles for application in the field of radioactive waste disposal
- Transform specific research questions related to geochemical properties or evolution into a conceptual model





- Implement simple conceptual models into numerical codes for geochemical and reactive transport modelling
- Identify advanced methods for sensitivity analysis, uncertainty analysis and integration of machine learning techniques





#### 2. Training Course Description

The one-week training is built around two pillars:

- Lectures by experts in the field on topics on
  - Geochemical and reactive transport modelling, properties and evolution of materials in the engineered barrier system of a geological disposal, geochemical properties of the host matrix, and sorption of radionuclides.
  - Advanced topics on sensitivity and uncertainty studies and surrogate learning (machine learning)
  - Demonstration of state-of-the-art codes for implementing geochemical and reactive transport models.
- Practical sessions on applying numerical codes for geochemical and reactive transport models. The course will provide training sessions for some of the more widely-used codes (PHREEQC, GEMS and ORCHESTRA, and their coupling with transport models, as HPx) between which the participant can choose. The training sessions will be built around two examples that are used in the machine learning benchmark study of ACED DONUT:
  - Ageing/leaching and/or carbonation of cementitious materials based on ordinary Portland cement,
  - Uranium sorption on clay materials.
- Delivery strategy: Classroom-based training, practical sessions

Evaluation strategy: none





#### 3. Lectures

## 3.1 Lecture 1 Modelling geochemical systems – equilibrium, thermodynamics, reaction progress

Geochemical modelling aims at predicting partial equilibria between aqueous, solid and gas phases in a system of relevance for research and engineering where a solid solution may be stable over a wide range of conditions and compositions even if some or all its pure end members are unstable. Equilibrium compositions of co-existing solution phases depend on each other and on the temperature, pressure, and bulk elemental composition of the whole system. Hence, a non-linear computer-aided numerical method is needed to solve for the chemical speciation and to evaluate the partitioning of (minor) elements between phases, which is of major geochemical relevance.

A speciation algorithm requires as input the formula and standard thermodynamic properties for all chemical species, plus optional parameters of mixing in phases-solutions at temperature and pressure of interest. Such information is taken from a previously compiled and curated chemical thermodynamic database (TDB) – another crucial component of geochemical modelling along with the numerical algorithm. Methods of thermodynamic data calculation, correction and prediction are built into codes for computing thermodynamic properties of substances and chemical reactions.

At the Earth (sub)surface conditions, complete equilibria are almost never achieved. This is why modelling codes contain various tools for simulating partial equilibria or irreversible mass action processes (titration, oxidation/reduction, leaching etc.). In a partial equilibrium state, some species (e.g. atmospheric nitrogen) and/or some (solid) phases cannot react completely and thus remain in their metastable states. The saturation index logSI shows that a phase can be (i) stable in positive or zero amount when logSI  $\approx$  0; (ii) unstable in zero amount when logSI < 0; (iii) metastable in zero or positive amount when logSI < 0. Case (iii) is modeled using additional upper- or lower bound constraints on the mole amount of a species or a phase. Control on these additional constraints as functions of time, simulation step, pH, activities of ions, logSI, etc. makes it possible to simulate kinetic processes such as mineral dissolution or precipitation. This and other key concepts of geochemical thermodynamic modelling will be summarized in this talk.

#### Lecturer

D. Kulik, PSI, Switzerland

#### **Reading Material**

Leal A.M.M., Kulik D.A., Smith W.R., Saar M.O. (2017): An overview of computational methods for chemical equilibrium and kinetics calculations for geochemical and reactive transport modeling. Pure and Applied Chemistry 89, 597-643. <u>doi</u>.

Kulik D.A. (2010): Geochemical thermodynamic modelling of ion partitioning. Chapter 3 in: Ionpartitioning in ambient-temperature aqueous systems (eds. M.Prieto, H.Stoll), EMU Notes in Mineralogy 10, 65-138.

#### Slides











## What is geochemical modelling?

**Goal:** To improve and quantify our fundamental understanding of (slow) chemical processes in natural and engineered geochemical systems

**Geochemical system:** Heterogeneous, contains (non-ideal) solutions, exists in metastable (partial-equilibrium) states, "dirty" (multi-element)

**Requirements:** Data (bases) of standard thermodynamic properties of substances and reactions; of activity model parameters; of kinetic rate parameters

**Research tools:** numerical algorithms and computer codes for non-linear minimization of either total Gibbs energy or of mass balance residuals

Main types of problems: forward (find equilibrium speciation at *P*,*T*,*b*); inverse (find some inputs from known outputs)

**Relevance:** (Radioactive) waste disposal, (ore) geochemistry, geothermics, cement chemistry and other areas



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## 1. Geochemical systems

1. Geochemical systems: equilibrium and metastability

Equilibrium at P,T,b: stable phases and speciation in phases-solutions Metastability; mineral-water reaction kinetics

2. Numerical methods to solve for geochemical speciation

Gibbs Energy Minimization GEM, e.g. GEMS, Reaktoro

Law of Mass Action LMA, e.g. PHREEQC, ORCHESTRA

Forward and inverse modelling problems

3. Thermodynamic Data Bases TDB as main inputs

Thermochemical format (substances) – G°(P,T) for GEM

Reaction format (product- from master species) – logK°(P,T) for LMA

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## Phase equilibrium in a multisystem

where the number

of phases exceeds

elements and the

number of species exceeds number

the number of

of phases

#### Multisystem is a 'rich' chemical

system with (some or all):

- aqueous electrolyte;
- non-ideal gaseous fluids;
- non-ideal solid solutions;
- non-ideal (ionic) melts;
- adsorption, ion exchange;
- Many pure phases (s, l);
- metastable species, kinetics

Demo	:: ML	-B-CEM	:G:Minimal-c:0:0:1:25:	2:		_ 0
EqlC		EqP	h Eq <u>D</u> C	EqSurf EqGen	17/08/2022, 12:38	
linir	nal c	ement	system with CO2 (	for bench) w/b=0	.5 corr straetl	-
ONUT	ben	chmark	s corrected by DK	17.08.2022		
	I	Cnam	b	Cb	u	lgm_t
0	Al	е	0.0882688	0	-319.1387	-5.897203
1	с	e	1	1.111376e-16	-170.782	-4.58218
Z	Ca	е	1.123447	-1.111376e-16	-278.7023	-2.971495
3	н	h	5.550837	-2.222752e-16	-46.8358	-2.682543
4	0	o	7.262873	9.099392e-16	-2.005843	-1.99579
5	Si	е	0.615801	-4.514965e-17	-338.43	-2.403998
5						

nput: Sys	tem Definition Results	. Equilibrit			
Phase/s	pecies	L	ту	Amount (mol)	logSI/Activity (
• a	aq_gen	26	a	2.332649	1.776e-09
+ g	gas_gen	5	g	0	-1.296
+ s	CSHQ	4	s	0.1181959	-5.38e-08
€ s	Al(OH)3am	1	s	0	-1.955
. <b></b>	Al(OH)3mic	1	s	0	-1.045
+ s	Gibbsite	1	s	0	-0.5923
+ s	Kaolinite	1	s	0	1.464
• s	Graphite	1	s	0	-74.17
• s	CA	1	s	0	-14.92
• s	CA2	1	s	0	-16.63
+ s	C2AH75	1	s	0	-12.66
+ s	C3AH6	1	s	0	-17.47
+ s	C4AH11	1	s	0	-25.97
+ s	C4AH13	1	s	0	-24.23
+ s	C4AH19	1	s	0	-24.03
+ s	CAH10	1	s	0	-7.343
+ s	Chabazite	1	s	0.04413437	3.555e-12
+ s	ZeoliteP	1	s	0	-0.07223
+ s	straetlingite	1	S	0	-5.279
+ s	C4AcH9	1	S	0	-18.98
+ s	C4Ac0.5H105	1	s	0	-20.57
+ s	C4Ac0.5H12	1	s	0	-18.84
• s	C4Ac0.5H9	1	s	0	-23.57
• s	C4AcH11	1	s	0	-14.98
• S	Aragonite	1	s	0	-0.1438
• s	Calcite	1	S	0.9999989	4.968e-10
* S	lime	1	S	0	-16.09
* S	Portlandite	1	s	0	-6.313
+ s	Quartz	1	s	0.301243	1.032
€ s	Silica-amorph	1	s	0.02040118	5.486e-07

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## Equilibrium: phases-solutions, partitioning



io

### Partitioning of an ion (element) M:

- at least two chemical components (species) of M,
- present in at least two different phases,
- at least one of which is a solution phase

Partitioning is closely related to equilibrium solubility

**Uptake** is usually understood as a chemical transfer of  $\underline{\text{minor (trace) element}}$  Tr from aqueous solution into solid phase(s) upon equilibration of the system.

Measured by solid (solution) – aqueous *Tr* distribution ratios (e.g. in mole fraction)

nic 
$$k_d(Tr) = \frac{x_{TrL}}{m_{Tr^{Z^+}}}$$
 total  $R_d(Tr) = \frac{x_{TrL}}{m_{Tr,tc}}$ 

From known chemical speciation, all distribution ratios can always be obtained.

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## Equilibrium: Aqueous-Gas-Solid

• List of species:

H<sub>2</sub>O(aq), H<sup>+</sup>, OH<sup>-</sup>, Ca<sup>2+</sup>, CO<sub>3</sub><sup>2-</sup>, HCO<sub>3</sub><sup>-</sup>, H<sub>2</sub>CO<sub>3</sub>(aq); O2(g), CO2(g); CaCO3(cr)

• Mass balance equations:

$$[C]tot = mCO_3^{2} + mHCO_3^{-} + mH_2CO_3(aq)$$

[Ca]tot= mCa<sup>2+</sup> ...

- Charge balance: Charge=  $H^++2Ca^{2+}-OH^{-}-2CO_3^{2-}...=0$
- Law of mass action:

$$CaCO_{3(s)} = Ca^{2+} + CO_{3}^{2-}$$
  
 $K = aCa^{2+} \times aCO_{3}^{2-}/aCaCO_{3(s)}$   
 $HCO_{3}^{-} = H^{+} + CO_{3}^{2-}$   
 $K = aH^{+} \times aCO_{3}^{2-}/aHCO_{3}^{-}$ 

• Non-ideal activity of aqueous species: extended Debye-Hückel model:

$$log\gamma_i = \frac{Az_i^2\sqrt{I}}{1+a^\circ B\sqrt{I}} + \Gamma_\gamma + b_\gamma I$$

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## Equilibrium: many [pure] phases

- System components (C): Na-Fe-Si-O-H
- Phases (φ): Arf, Rbk, Aeg, Hem, Qtz, O<sub>2(g)</sub>, H<sub>2</sub>O<sub>(g)</sub>
- Gibbs phase rule:  $F=C+2-\phi$
- Standard Gibbs energy of mineral reaction Δ<sub>r</sub>G<sup>o</sup>(P,T): Arf+O<sub>2(g)</sub>=3Aeg+Hem+2Qtz+H<sub>2</sub>O<sub>(g)</sub>

$$logK = -\frac{\Delta_r G^{\circ}_{(P,T)}}{ln(10)RT}$$

- Schreinemakers rule for metastable/stable reactions
- Pseudosections and stability diagrams (P-T-x)
- Gibbs energy minimization (e.g. Perplex, Thermocalc, Melts). If only pure phases: linear programming (Simplex) method (PerpleX) General case: many [non]-ideal multicomponent phases-solutions –

need a non-linear Gibbs Energy Minimization algorithm

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CO<sub>2</sub>(g)

 $H_2O(aq)$ 

Calcite





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## 'Inert' vs 'excluded' mineral phase

**MB** = mass balance in system bulk composition;

**TDB** = chemical thermodynamic data base

Phase/species present:	(Over-)stable phase	Under-stable phase
Not in MB; not in TDB	Unknown (maybe large) metastability artifact	No effect on system state
Not in MB (by $\overline{n}_j = 0$ ) but in TDB	Known metastability ( $\Omega > 1$ ); effect on MB	No effect on system state $(\Omega < 1)$
In TDB; amount $\overline{n}_j$ constraint in MB	System 'oversaturated' $(\Omega > 1, precipitation)$	No effect on system state $(\Omega < 1)$
In TDB; amount <u>n</u> j constraint in MB	No effect on MB $(\Omega \ge 1, \text{ stable})$	System 'undersaturated' $(\Omega < 1, dissolution)$
In TDB; two-side amount constraint in MB $\frac{\overline{n}}{j}$	Effect on MB, metastability ( $\Omega \ge 1$ , 'oversaturation')	Effect on MB, metastability $(\Omega < 1, `undersaturation')$

Assuming all species formulae to be consistent with the bulk system stoichiometry;  $\Omega$  is phase stability (saturation) index.

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## 2. Numerical methods

1. Geochemical systems: equilibrium and metastability

Equilibrium at P,T,b: stable phases and speciation in phases-solutions Metastability; mineral-water reaction kinetics

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## **Computational Geochemistry**

From geochemical observations and laboratory experiments



To improved understanding of (geo)chemical systems and processes

& prediction of their evolution at changing T,p,b,t conditions

#### Numerical methods and codes:

#### **Gibbs Energy Minimization GEM**

Minimizes total Gibbs energy of the system G(n) at boundary conditions of mass balance- (An=b), metastability constraints, and G° for all substances

#### Law of Mass Action LMA

Minimizes mass balance residuals at boundary conditions of LMA expressions for all product species formation reactions with their logK<sup>o</sup> values

GEM and LMA are complementary!

Shortages of LMA are advantages of GEM

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## **Comparing GEM and LMA**

Using slides by Prof. Alex Gysi (with modifications)

## Aquatic geochemistry:

• Law of mass action LMA (using **logK**), e.g. PHREEQC, Vminteq, Geochemist's Workbench

# Metamorphic/igneous petrology and hydrothermal geochemistry:

 Gibbs energy minimization GEM (using G), e.g. PerpleX, Hch, Thermocalc, Gem-Selektor, Melts.

See also:

Leal et al. (2017), Pure and Applied Chemistry 89, Issue 5, 597-643 Kulik (2006), Chemical Geology 225, 189-212

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## **Classic LMA**

- Codes e.g. PHREEQC, ORCHESTRA, EQ3/6 and GWB
- Set of master species  $(CO_3^{2^-}, Ca^{2^+}, H^+, OH^-, H_2O_{(ag)})$
- Product species built from master species  $(CO_3^{2-} + H^+ = HCO_3^{-})$
- Database with equilibrium constants (logK<sub>r</sub>) at T generally at p<sub>sat</sub>
- LMA minimizes mass balance residuals using Newton-Raphson • method under boundary conditions of LMA for all product species
- Stable solids need to be known *a priori* (or by automated tricks)
- Redox must be set at input (Eh, pe or redox pair Fe(II)/Fe(III)) •
- pH set at input or by element charge balance
- Only limited (binary) solid solution models
- Fast convergence: kinetics rate laws and reactive transport models
- Easy to learn (Tableaus, F.M.M.Morel & J.Westall, MIT in 1970s)

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## Example: LMA Tableaux

#### Composition (recipe) H<sub>3</sub>PO<sub>4</sub> H<sub>2</sub>O H\* H<sub>2</sub>CO<sub>3</sub> Na<sup>1</sup> Cl Conc'n 0 1 0 10<sup>-3</sup> NaH<sub>2</sub>PO<sub>4</sub> -1 1 0 0 -2 0 2 0 4x10-4 Na<sub>2</sub>CO<sub>3</sub> 1 NaHCO<sub>3</sub> 0 -1 0 1 1 0 10-4 HCI 0 1 0 0 0 1 3x10-3 55.56 H<sub>2</sub>O 0 1 0 0 0 0 ΤΟΤΙ 55.56 1.1x10-3 **10**-3 5.0x10<sup>-4</sup> 1.9x10<sup>-3</sup> 3.0x10<sup>-3</sup>

#### LMA method was formulated in:

Brinkley, S. R., J. Chem. Phys., 15,107 (1947) Ingri, N., Kakolowicz, W., Sillén, L. G., Warnqvist, B., Talanta, 14, 1261 (1967) Morel, F.; Morgan, J., Environ. Sci. Technol. 1972, 6 (1), 58–67

Speciation upon acid-base titration

#### LMA reactions tableau H<sub>2</sub>O H\* H<sub>3</sub>PO<sub>4</sub> H<sub>2</sub>CO<sub>3</sub> Na<sup>+</sup> CIlog K $H_3PO_4$ 0 0 1 0 0 0 0 0 -1 0 0 -2.16 H<sub>2</sub>PO<sub>4</sub> 1 0 -2 HPO<sub>4</sub><sup>2</sup> 0 1 0 0 0 -7.20 PO43-0 -3 1 0 0 0 -21.71 H<sub>2</sub>CO<sub>3</sub> 0 0 0 1 0 0 0 0 -1 0 0 -6.35 HCO<sub>3</sub> 1 0 $CO_3^2$ 0 -2 0 1 0 0 -16.68 Na 0 0 0 0 1 0 0 CI-0 0 0 0 0 0 1 H\* 0 0 0 0 1 0 0 OH-1 -1 0 0 0 0 -14.00 H<sub>2</sub>O 1 0 0 0 0 0 0



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## Why (do I prefer) GEM?

Because **GEM can solve for phase speciation in complex chemical systems** with

- many (non)ideal solid, liquid, aqueous, gaseous solutions with various mixing models, including sublattice solutions and phase separation
- calculation of intrinsic redox states (f<sub>02</sub>, pe, Eh) and pH from the bulk chemical composition in wide T,P ranges
- multiple sorption phases with multi-surface-site complexation, implemented with- or without mole balances for "surface site ligands"
- multiple metastability constraints and simulation of mineral dissolution/ precipitation kinetics
- inverse modeling, advanced robustness and sensitivity studies of model setup and results (GEMSFITS)
- > and all other things that LMA speciation codes can do too!

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## **Classic GEM**

- e.g. GEM-Selektor, Hch, ChemSage, Reaktoro codes
- Mass balance using (IC) independent components (H, O, Al, ...) and electric charge Z
- Chemical species are (DC) dependent components (aqueous species, minerals, gases...) constructed from IC
- Uses database with standard Gibbs energy (G°) at P,T for each DC
- Gibbs energy minimization (GEM) to solve for equilibrium state
- pH, activities and redox (pe, Eh) calculated from minimization
- Slower convergence, but more output data from a single calculation: e.g. dual solution, phase volumes, fugacity, etc...
- Solves for equilibria in systems with complex non-ideal solutions
- Coupling with reactive transport models (Kulik et al., 2013)
- Steeper learning curve than LMA (need to know what you're doing)
- Born in 1958 (White, Johnson & Dantzig, 1958, GEM for gas mixture)

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european Joint Programme on Radioactive Waste Management





























## Thermodynamic modelling of sorption

#### **ClaySor model**



B&B (2SPNE SC/CE) model for Na-conditioned illite

Bayens & Bradbury (2009): Geoch. Cosmoch. Acta 73, 990-1003



Planar 'clay' sites: cation exchange capacity: CEC = 0.225 eq/kg Edge sites: surface complexation Capacities: ≡S<sup>s</sup>OH: 2 mmol/kg ≡S<sup>W1</sup>OH: 40 mmol/kg ≡S<sup>W2</sup>OH: 40 mmol/kg

#### log<sub>10</sub>K (protolysis on edges)

Protolysis reactions	≡SSOH	$\equiv S^{W1}OH$	≡S <sup>W2</sup> OH
$\equiv$ SOH + H <sup>+</sup> $\Leftrightarrow \equiv$ SOH <sub>2</sub> <sup>+</sup>	4.0	4.0	8.5
≡SOH ⇔ ≡SO <sup>-</sup> + H <sup>+</sup>	-6.2	-6.2	-10.5

#### Metals adsorption on edges

$$=S^{X}OH + Me^{+z} + yH_{2}O \Leftrightarrow =S^{X}OMe(OH)_{v}^{z-(y+1)} + (y+1)H^{+}$$

Kd of Eu(III) on 1 g/L illite, vs pH

pH edge for 1e-9 Eu in 0.1M NaClO4 solution with 1g/L NaIllite



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## Mineral-water reaction kinetics

























## Solving inverse problems massively: GEMSFITS

- A tool for multi-property, multiple parameters optimization against various types of experiments or geochemical data
- Uses state of the art optimization library (Nlopt)
- Has a graphical user interface
- Maintains a Database of experiments, tasks, results
- Goodness of fit, sensitivity analysis, correlation coefficients, parameter confidence intervals using Monte Carlo sampling

Miron G.D., Kulik D.A., et al. (2015). GEMSFITS: Code package for optimization of geochemical model parameters and inverse modeling. Appl. Geochem. 55, 28-45





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https://gems.web.psi.ch/GEMSFITS

## Thermodynamic data bases

1. Geochemical systems: equilibrium and metastability Equilibrium at P,T,b: stable phases and speciation in phases-solutions

Metastability; mineral-water reaction kinetics

Numerical methods to solve for geochemical speciation

Gibbs Energy Minimization GEM, e.g. GEMS, Reaktoro

Law of Mass Action LMA, e.g. PHREEQC, ORCHESTRA

Forward and inverse modelling problems

3. Thermodynamic Data Bases TDB as main inputs

Thermochemical format (substances) – G°(P,T) for GEM

Reaction format (product- from master species) – logK°(P,T) for LMA

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- standard heat capacity effect of reaction,  $\Delta_r C p^o_{T0,j}$
- standard molar volume effect of reaction,  $\Delta_r V_{T0,j}^o$

LMA calculations require input stoichiometry of reactions,  $\log_{10} K_{j,P,T}^o$ ,  $\Delta_r V_{P,T,j}^o$ . Values of  $\Delta_r S_{T0,j}^o$  or  $\Delta_r H_{T0,j}^o$ ,  $\Delta_r C p_{T0,j}^o$ ,  $\Delta_r V_{T0,j}^o$  are needed for converting  $\log_{10} K_{j,P0,T0}^o \Longrightarrow \log_{10} K_{j,P,T}^o$ , usually as  $\log_{10} K_{j,P,T}^o = f(P,T)$  polynomial coefficients

A logK° thermodynamic dataset can be converted into a GEM  $G_{T0,j}^{o}$  dataset after adding the missing information (elemental formulae, standard properties of master species)

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Hybrid / dual (C	G° / logK°) TDBs for GEM or LMA
Provide thermodynamic data for both GEM and LMA Most convenient TDBs & too long tradition SUPCRT92 ⇒ CHNOSZ, SUPCH PSI-Nagra 12/07 [GEMS], GEM CEMDATA07 to CEMDATA18 (B THERMODDEM (BRGM) Thermo@Hub Thermo@ Thermo@Hub Thermo@ Recent story of success: Cemdata18 TDB for GEM was using TermoMatch into LMA for up to 100 °C) and exported to	<pre>scats ls, ls, lstate ls l</pre>
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	Acknowledgments
<ul> <li>Partial financial sup</li> <li>My sincere gratitu and many other per</li> </ul>	<i>r attention! Questions?</i> oport from Nagra (Wettingen) is gratefully acknowledged de to Dan, Barbara, Alex, Enzo, Georg, Allan, Nikos, eople for helpful discussions!





# 3.2 Lecture 2 - Thermodynamic modelling of cementitious systems and their evolution

Hydraulic binders such as cement paste, mortar and concrete show rapid and complex evolution of pore water composition and mineral assemblage during hydration. Thermodynamic equilibrium calculations are a valuable tool to understand the consequences of different factors such as cement composition, hydration, leaching or temperature on the composition and the properties of a hydrated cementitious system on a chemical level. Equilibrium calculations can be used to compute the stable phase assemblages based on the solution composition as well as to model the stable phase assemblage in completely hydrated cements and thus to assess the influence of the chemical composition on the hydrate assemblage. In combination with a kinetic model, thermodynamic calculations can also be used to follow changes during hydration or, in combination with transport models, to calculate the interaction of cementitious systems with the environment. In all these applications, thermodynamic equilibrium calculations have been a valuable addition to experimental studies deepening our understanding of the processes that govern cementitious systems and interpreting experimental observations.

#### Lecturer

Barbara Lothenbach, EMPA, Switzerland

#### **Reading Material**

Lothenbach, B., *Thermodynamic equilibrium calculations in cementitious systems.* Materials and Structures, 2010: p. DOI 10.1617/s11527-010-9592-x.

Lothenbach, B., K. Scrivener, and R.D. Hooton, *Supplementary cementitious materials.* Cement and Concrete Research, 2011. **41**(12): p. 1244-1256.

Lothenbach, B., et al., *Influence of limestone on the hydration of Portland cements.* Cem. Concr. Res., 2008. **38**(6): p. 848-860.

#### Slides











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Cemdata	Cemdata18 database: Standard thermodynamic properties at 25 °Ca and 1 atm. Update of Cemdata07												
	The data are fully compatible with the GEMS version of the PSI/Nagra thermodynamic database [6, 7].												
	log	Kso	Δ <sub>f</sub> G <sup>*</sup>	$\Delta_{\rm f} {\rm H}^{\circ}$	5°	a <sub>0</sub>	aı	a <sub>2</sub>	a3	V°	Ref		
			[kJ/mol]	[kJ/mol]	[J/K/mol]	[J/K/mol]			[C	m <sup>3</sup> /mol	1		
	(AI-)ettringite <sup>a,b,c</sup>	-44.9	-15205.94	-17535	1900	1939	0.789			707	[3, 4]		
	C <sub>6</sub> As <sub>3</sub> H <sub>30</sub> <sup>c</sup>		-14728.1	-16950.2	1792.4	1452	2.156			708	[8]		
	C <sub>6</sub> As <sub>3</sub> H <sub>13</sub>		-10540.6	-11530.3	1960.4	970.7	1.483			411	[8]		
	C <sub>6</sub> As <sub>3</sub> H <sub>9</sub>		-9540.4	-10643.7	646.6	764.3	1.638			361	[8]		
	tricarboaluminate <sup>a</sup>	-46.5	-14565.64	-16792	1858	2042	0.559	$-7.78 \cdot 10^{6}$		650	[3, 4]		
	Fe-ettringite <sup>b</sup>	-44.0	-14282.36	-16600	1937	1922	0.855	2.02·10 <sup>6</sup>		717	[3, 9]		
	Thaumasite	-24.75	-7564.52	-8700	897.1	1031	0.263	-3.40-10 <sup>6</sup>		330	[10]		
	C <sub>3</sub> AH <sub>6</sub> <sup>d</sup>	-20.50	-5008.2	-5537.3	422	290	0.644	-3.25·10 <sup>6</sup>		150	[11, 12]		
	C.AS0.41H5.18	-25.35	-5192.9	-5699	399	310	0.566	-4.37·10 <sup>6</sup>		146	[12]		
	C3AS0.84H4.32	-26.70	-5365.2	-5847	375	331	0.484	-5.55·10 <sup>6</sup>		142	[12]		
	C3FH	-26.30	-4122.8	-4518	870	330	1.237	$-4.74 \cdot 10^{6}$		155	[12]		
	C3FS0.84H4.32 e,f	-32.50	-4479.9	-4823	840	371	0.478	-7.03·10 <sup>6</sup>		149	[12]		
	C3A0.5F0.5S0.84H4.32	-30.20	-4926.0	-5335	619	367	0.471	-8.10·10 <sup>6</sup>		146	[12]		
	C <sub>3</sub> FS <sub>1.34</sub> H <sub>3.32</sub>	-34.20	-4681.1	-4994	820	395	0.383	-8.39-10 <sup>6</sup>		145	[12]		
	C4AH198	-25.45	-8749.9	-10017.9	1120	1163	1.047		-1600	369	[11, 13]		
	C <sub>4</sub> AH <sub>13</sub>		-7325.7	-8262.4	831.5	208.3	3.13			274	[13]		
	C <sub>4</sub> AH <sub>11</sub>		-6841.4	-7656.6	772.7	0.0119	3.56	$1.34 \cdot 10^{-7}$		257	[13]		
	C2AH7.5	-13.80	-4695.5	-5277.5	450	323	0.728			180	[11]		
	CAH <sub>10</sub>	-7.60	-4623.0	-5288.2	610	151	1.113		3200	193	[11]		
	C <sub>4</sub> AsH <sub>16</sub>		-8726.8	-9930.5	975.0	636	1.606			351	[13, 14]		
	C <sub>4</sub> AsH <sub>14</sub> <sup>8</sup>		-8252.9	-9321.8	960.9	1028.5				332	[13, 14]		
	C <sub>4</sub> AsH <sub>12</sub> <sup>h</sup>		-7778.4	-8758.6	791.6	175	2.594			310	[13, 14]		
	C <sub>4</sub> AsH <sub>10.5</sub>		-7414.9	-8311.9	721	172	2.402			282	[13, 14]		
	C <sub>4</sub> AsH <sub>9</sub>		-7047.6	-7845.5	703.6	169	2.211			275	[13, 14]		
	C <sub>4</sub> AcH <sub>11</sub>	-31.47	-7337.46	-8250	657	618	0.982	-2.59·10 <sup>6</sup>		262	[3, 4]		
	C <sub>4</sub> AcH <sub>9</sub>		-6840.3	-7618.6	640.6	192.4	2.042			234	[13]		
	C <sub>4</sub> Ac <sub>0.5</sub> H <sub>12</sub>	-29.13	-7335.97	-8270	713	664	1.014	$-1.30 \cdot 10^{6}$	-800	285	[3, 4]		
	C <sub>4</sub> Ac <sub>0.5</sub> H <sub>10.5</sub>		-6970.3	-7813.3	668.3	0.0095	2.836	$1.07 \cdot 10^{-7}$		261	[13]		
	C <sub>4</sub> Ac <sub>0.5</sub> H <sub>9</sub>		-6597.4	-7349.7	622.5	0.0088	2.635	$9.94 \cdot 10^{-8}$		249	[13]		

Database: Cemdata18	Da Science and Technology
<ul> <li>PC: Focus on Portland cements and Portland-blends</li> <li>CSHQ (Kulik): Ca/Si 0.67 - 2.2 (portlandite limits to Ca/Si ≈ 1.6)</li> <li>(KOH)<sub>2.5</sub>SiO<sub>2</sub>H<sub>2</sub>O) and (NaOH)<sub>2.5</sub>SiO<sub>2</sub>H<sub>2</sub>O) to estimate alkali uptake</li> <li>Very stable hydrotalcite from Atkins: Mg<sub>4</sub>Al<sub>2</sub>O<sub>10</sub> 10H<sub>2</sub>O</li> <li>AAM18</li> </ul>	
<ul> <li>Focus on alkali activated materials</li> <li>CSHT (Kulik) with Na uptake and Al-uptake (in bridging site) (Myers ea 2014) Ca/Si 0.67 – 1.5</li> <li>Less stable hydrotalcite, variable Mg/Al (Myers ea 2015) Mg<sub>4</sub>Al<sub>2</sub>O<sub>10</sub> 10H<sub>2</sub>O, Mg<sub>6</sub>Al<sub>2</sub>O<sub>12</sub> 12H<sub>2</sub>O, Mg<sub>8</sub>Al<sub>2</sub>O<sub>14</sub> 14H<sub>2</sub>O</li> </ul>	
Cannot be used at the same time	
Further CSH models activated by introducing additional solid solutions in «Phase»:	
<ul> <li>Tob-jennite (Kulik and Kersten 2001, Lothenbach and Winnefeld 2006)</li> <li>CSHT (Kulik 2011)</li> <li>All details in Lothenbach et al. (2019) CCR 115, 472-506</li> <li>New CSH model with alkali, earth alkali and Al uptake in progress:</li> <li>Kulik ea (2022) CCR 151, 106585; Miron ea (2022) CCR 152, 106667; Miron ea (2022)</li> <li>M&amp;S 55(8), 212; Miron ea (2023) in preparation</li> </ul>	2 <i>2)</i> 38





























































































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## 3.3 Lecture 3 - Geochemistry of the host rock and natural barrier material (pore water chemistry, mineralogy, fracture-matrix)

In the framework of nuclear waste disposal, the natural geochemical conditions play a major role in the long-term stability of the materials used in the disposal (clays, concrete and cement phases, metals, glass...). The speciation of the radionuclides is also determined by the water chemistry and consequently, their potential out-diffusion from the disposal site or from the host rock. This lecture presents a strategy of data acquisition for determining the porewater chemistry of clay host rock and the global rock-water-gas equilibria. The main artifacts susceptible to change drastically the porewater chemistry are also described with the countermeasures that can insure a proper acquisition. Reliable experiments and the redundancy of the acquisition will allow to feed a numerical model following the phase rule adapted to a system considering also the ion exchange reactions. This critical review is focused on the methods that have been developed during the last two decades assuring and allowing a robust determination of the porewater chemistries in clayrocks and shales.

### Lecturer

Eric C. Gaucher, Rock-Water-Interaction group. University of Bern, Switzerland

### **Reading Material**

Gaucher, E.C., Tournassat, C., Pearson, F., Blanc, P., Crouzet, C., Lerouge, C. and Altmann, S. (2009) A robust model for pore-water chemistry of clayrock. Geochimica et Cosmochimica Acta 73, 6470-6487.

Lassin, A., Marty, N.C., Gailhanou, H., Henry, B., Trémosa, J., Lerouge, C., Madé, B., Altmann, S. and Gaucher, E.C. (2016) Equilibrium partial pressure of CO<sub>2</sub> in Callovian–Oxfordian argillite as a function of relative humidity: Experiments and modelling. Geochimica et Cosmochimica Acta 186, 91-104.

Pearson, F., Tournassat, C. and Gaucher, E.C. (2011) Biogeochemical processes in a clay formation in situ experiment: Part E–Equilibrium controls on chemistry of pore water from the Opalinus Clay, Mont Terri Underground Research Laboratory, Switzerland. Applied geochemistry 26, 990-1008.

Tournassat, C., Vinsot, A., Gaucher, E.C. and Altmann, S. (2015) Chemical conditions in clay-rocks, Developments in clay science. Elsevier, pp. 71-100.

Wersin, P., Mazurek, M., Gimmi, T (2022) Porewater chemistry of Opalinus Clay revisited: Findings from 25 years of data collection at the Mont Terri Rock Laboratory. Applied Geochemistrythis, 138, 105234.

Slides





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# Geochemistry of the host rock and natural barrier material

(pore water chemistry, mineralogy, fracture-matrix)

How to develop a strategy for geochemical data acquisition and modelling to define PoreWater chemistry in clay fo<u>rmations</u>?





### Geochimical data acquisition for Nuclear Waste storage in deep geological formations

- Geochemists must answer the following questions:
  - What is the chemistry of the porewater of the host rock?
    pH, Eh, TDS, major elements, minor elements
  - What is the chemistry of the surrounding aquifers?
  - How can understanding the past and present help us predict the future of the system?
  - How is the system buffered (or not) by the mineralogy of the host rocks?
  - How can the system evolve through interaction with concrete, glass, metals, gallery atmosphere, bacterial activity?
  - How are radioelements transported (or trapped) in geological environments?

### Clay rocks: an environment difficult to study

- Clay rocks are a compact, reduced and reactive system that can be chemically strongly modified by:
  - drilling fluids contamination,
  - oxidation,
  - dehydration,
  - bacterial activity,
  - degassing...
- After two decades, we have established a list of experiments which are necessary for a complete acquisition of the chemical parameters.





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## Reception of samples



### Lab experiments







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#### Mineralogy

Callovian-Oxfordian Formation Paris Basin France



Fig. 5. Scanning Electron Micrograph. Sample EST05474 (432.4 m). Mg-calcite with a variable composition from the centre to the border.











Fig. 6. Scanning Electron Micrograph. Sample EST05505 (442 m). Pyritosphere with organic matter (black).



Fig. 7. Scanning Electron Micrograph. Sample EST05632 (475 m). Bioclast filled with celestite and chalcedony (?).

## Selection of minerals for rock-water equilibrium model

List of minerals from Optical microscopy, X-Ray diffraction, Scanning electron microscopy, TEM...

The diagenetic studies are essential because they allow to identify the last phases which precipitated.

Lerouge, C., Grangeon, S., Claret, F., Gaucher, E., Blanc, P., Guerrot, C., Flehoc, C., Wille, G. and Mazurek, M. (2014) Mineralogical and isotopic record of diagenesis from the Opalinus Clay formation at Benken, Switzerland: Implications for the modeling of pore-water chemistry in a clay formation. Clay. Clay. Miner. 62, 286-312.

Lerouge, C., Grangeon, S., Gaucher, E.C., Tournassat, C., Agrinier, P., Guerrot, C., Widory, D., Fléhoc, C., Wille, G., Ramboz, C., Vinsot, A. and Buschaert, S. (2011) Mineralogical and isotopic record of biotic and abiotic diagenesis of the Callovian-Oxfordian clayey formation of Bure (France). Geochim. Cosmochim. Acta 75, 2633-2663.







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## Squeezing experiment







### Deviation of chloride concentrations at high squeezing pressures



Artifacts with Squeezing experiment

Mazurek, M., Oyama, T., Wersin, P. and Alt-Epping, P. (2015) Pore-water squeezing from indurated shales. Chem. Geol. 400, 106-121.








# Advective displacement experiment



Global characterization of the chemistry of the PW

Mäder, U. (2018) Advective Displacement Method for the Characterisation of Pore Water Chemistry and Transport Properties in Claystone. Geofluids 2018, 8198762.







 $X_2Ca + [(Ni(en)_3]^{2+} \Leftrightarrow X_2[(Ni(en)_3] + Ca^{2+}]$ 





#### Ion exchange equilibria

Homovalent exchange  
Na<sup>+</sup> + K-X 
$$\Leftrightarrow$$
 Na-X + K<sup>+</sup>  
 $K_{Na/K} = \frac{a_{Na-X}a_{K^+}}{a_{K-X}a_{Na^+}}$   
Heterovalent exchange  
 $2 \text{ Na}^+ + \text{Ca-X2} \Leftrightarrow 2 \text{ Na-X} + \text{Ca}^{2+}$   
 $K_{Na/Ca} = \frac{(a_{Na-X})2a_{Ca}^{2+}}{a_{Ca-X2}(a_{Na^+})2}$ 

Replace activities of exchanger species by equivalent fractions (meq/CEC)

$$[Na - X] = \beta_{Na_{-X}} = \frac{meq(Na - X)}{CEC} \text{ and } CEC = \Sigma meq_i$$
$$K_{Na/K}^{G-T} = \frac{[Na - X]}{[K - X]} \frac{a_{K^+}}{a_{Na^+}} \qquad K_{Na/Ca}^{G-T} = \frac{[Na - X]^2}{[Ca - X_2]} \frac{a_{Ca^{2+}}}{(a_{Na^+})^2}$$

G-T: Gaines-Thomas convention

#### Ion exchange - selectivity coefficients

Equatio	$n: Na^+ + 1/iI - X_i \leftrightarrow Na$	$A - X + 1/i I^{i+}$	with $K_{\text{Na} \setminus I}$	$= \frac{[\text{Na-X}] [I^{i+}]^{1/i}}{[I-X_i]^{1/i} [\text{Na}^+]}$	$\frac{i}{1} = \frac{\beta_{Na} [I^{i+}]^{1/i}}{\beta_I^{1/i} [Na^+]}$
Ion $I^+$	K <sub>Na\1</sub>	Ion 1 <sup>2+</sup>	K <sub>Na∖</sub>	Ion <i>I</i> <sup>3+</sup>	K <sub>Na∖/</sub>
Li <sup>+</sup>	1.2 (0.95-1.2)	Mg <sup>2+</sup>	0.50 (0.4-0.6)	Al <sup>3+</sup>	0.6 (0.5-0.9)
K+	0.20 (0.15-0.25)	Ca <sup>2+</sup>	0.40 (0.3-0.6)	Fe <sup>3+</sup>	?
$NH_4^+$	0.25 (0.2-0.3)	Sr <sup>2+</sup>	0.35 (0.3-0.6)		
Rb <sup>+</sup>	0.10	Ba <sup>2+</sup>	0.35 (0.2-0.5)		
Cs <sup>+</sup>	0.08	Mn <sup>2+</sup>	0.55		
		Fe <sup>2+</sup>	0.6		
		Co <sup>2+</sup>	0.6		
		Ni <sup>2+</sup>	0.5		
		Cu <sup>2+</sup>	0.5		
		$Zn^{2+}$	0.4 (0.3-0.6)		
		Cd <sup>2+</sup>	0.4 (0.3-0.6)		
		Pb <sup>2+</sup>	0.3		

Selectivity coefficients relative to Na+ (Gaines-Thomas convention), Appelo & Postma (1993)







# PCO<sub>2</sub> measure => a way to control the carbonate system and the pH







# PCO<sub>2</sub> measure



Example of experimental set up for pCO<sub>2</sub> measurement at a known relative humidity (from Lassin et al., 2016)







# Modeling with the phase rule

The number of phases is equal to the number of components. If we want to know the concentrations of Na, K, Mg, Ca, Sr, C, S, Cl, Br, Al, Si, Fe with the Eh and the pH, we should have 14 constraints for 14 elements

The conservative tracers, Cl<sup>-</sup> and Br<sup>-</sup> are fixed (AqEx, AD, SQ).

Knowing the relative occupancy of the cations on the clay surface (CEC Experiment) and choosing a selectivity coefficient for each exchange reaction allows calculating the concentration in solutions of the major cations (Na, K, Ca, Mg, Sr). Na, K, Mg, Ca, Sr are interdependent and knowing one constraint (Na concentration) is enough to calculate the other concentrations.

To constrain 8 parameters (Na, C, S, Al, Si, Fe, Eh and pH), 8 phases are required. In the model of Gaucher et al., 2009 (or Pearson et al., 2011, Tremosa et al., 2012) theses phases are: water, calcite, celestite, illite, quartz, siderite, pyrite, chlorite.

Control tests can be made. It is possible to compare the modelled  $pCO_2$  to the values obtained by the core degassing. Dolomite should be also at equilibrium.

# Modeling



Example of fully constrained porewater model in the system pH, pe, Na, K, Mg, Ca, Sr, C, S, Cl, Al, Si, Fe, (COx, Bure, France) after Gaucher et al., 2009





Phreeqc Modeling SELECTED\_OUTPUT -file Appendix 2.prn -reset false # First calculation block: preequilibration -pH true SOLUTION 1 -pe true -totals Cl S(6) Na K Ca Mg Fe Sr -molalities CoxNa CoxK Cox2Ca Cox2Mg Cox2Sr Cox2Fe pe -1 Na 150 charge Cl 41 S(6) 66 EXCHANGE 1 EXCHANGE MASTER SPECIES CoxNa 108.24 CoxK 41.7 Cox2Ca 154.9 Cox Cox-EXCHANGE\_SPECIES Cox2Mg 60.2 Cox2Fe 1.2 Cox2Fr 7.37 Cox- = Coxlog\_k 0 Cox- + Na+ = CoxNa log\_k 0 SAVE SOLUTION 1 END Cox + K = CoxK $log_k 1.2$ # Second calculation block: equilibration with celestite 2 Cox-+ Ca+2 = Cox2Ca log\_k 0.7 USE SOLUTION 1 EXCHANGE 2 CoxNa 1.0824 CoxK 0.417 Cox2Ca 1.549 2 Cox- + Mg+2 = Cox2Mg log\_k 0.7 Cox2Mg 0.602 Cox2Fe 0.012 Cox2Sr 0.0737  $2 \operatorname{Cox} + \operatorname{Fe} + 2 = \operatorname{Cox} 2\operatorname{Fe}$ log\_k 0.8 EOUILIBRIUM PHASES 2 Celestite 0 0 END  $2 \operatorname{Cox} + \operatorname{Sr} + 2 = \operatorname{Cox} 2 \operatorname{Sr}$ log\_k 0.6 # Fifth calculation block: equilibration with COX mineralogy: # Chlorite Cca-2 / Illite IMt-2 case \*\*\*\*\*\* \*\*\*\*\*\*\*\*\* # Third calculation block: equilibration with COX mineralogy. # Daphnite\_14A / Illite-Mg case вополновление подавление подавление и подавлени и подавление и подавл И подав USE SOLUTION 2 USE EXCHANGE 2 EQUILIBRIUM\_PHASES 5 Celestite 0 1 USE SOLUTION 2 USE EXCHANGE 2 EQUILIBRIUM\_PHASES 3 Calcite 0 1 Dolomite 0 1 Siderite 0 1 Celestite 0 1 Calcite 0 1 Quartz.alpha 0 1 Pyrite 0 1 Chlorite\_Cea-2 0 1 Illite\_IMt-2\_0 1 Quartz.alpha 0 1 Pyrite 0 1 Daphnite\_14A 0 1 Illite-Mg 0 1 END END encode control control control and a co USE SOLUTION 2 USE EXCHANGE 2 EQUILIBRIUM PHASES 5 Celestite 0 1 Calcite 0 1 USE SOLUTION 2 USE EXCILANCE 2 EQUILIBRIUM PHASES 4 Celestite 0 1 Calcite 0 1 Dolomite 0 1 Siderite 0 1 Dolomite 0 1 Siderite 0 1 Quartz.alpha 0 1 Pyrite 0 1 Quartz, alpha 0 1 Pyrite 0 1 Chlorite\_Cca-2 0 1 Daphnite 14A 0 1 Illite IMt-2 0 1 SAVE SOLUTION 2 Illite-Mg 01 END END





Rock-Water	$u^{\scriptscriptstyle \flat}$
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- > Take Home message
  - The combination of proven experiments provides a data set that can be used in numerical modeling.
  - The numerical modeling is based on thermodynamic constraints including ion exchange reactions.
  - Comparison with underground laboratory data shows the robustness of the modeling.
  - The numerical model of the intact host rock can be used to calculate chemical disturbance and radionuclide transport.

Rock-Water	$u^{\scriptscriptstyle \flat}$
INTERACTION www.geo.unibe.ch/rwi	D UNIVERSITÄT BERN

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### 3.4 Lecture 4 - Reactive Transport – Pore to Continuum scale

Reactive transport in the Earth and Environmental Sciences is at a crossroads today. The discipline has reached a level of maturity well beyond what could be demonstrated even 15 years ago. This is shown now by the successes with which complex and in many cases coupled behavior have been described in a number of natural Earth environments, ranging from corroding storage tanks leaking radioactive Cs into the vadose zone (Steefel et al. 2003), to field scale sorption behavior of uranium (Li et al. 2011) to the successful prediction of mineral and pore solution profiles in a 226 ka chemical weathering profile (Maher et al. 2009), to the prediction of ion transport in compacted bentonite and clay rocks (Tournassat and Steefel 2015; Tournassat and Steefel, 2019; Steefel and Tournassat, 2021).

So, is the "reactive transport problem" solved? Where do we go from here? This is the crossroads we are at now as we decide what are the challenges that need to be faced so as to continue advancing the field. Arguably the most significant challenges we now face are associated with the huge range of length scales that need to be addressed, since these extend from the molecular to nanoscale to pore scale all the way up to the watershed and continental scale. Across this extreme range of scales, the constitutive equations and parameters that are used to describe reactive transport processes often change as well, thus requiring mathematical and numerical models to become "scale aware". Charged porous media offers special challenges, since ion mobility can be strongly affected by electrostatic interactions, and this can lead to effects such as anion exclusion that are not captured by Fick's Law (Tournassat and Steefel 2015; Tournassat and Steefel, 2019). Where the charged porous media involves nanoscale porosity, off-diagonal coupling effects on transport between such master variables as fluid pressure, electrical current and chemical composition may become important (Tournassat and Steefel 2019: Steefel and Tournassat, 2021). At the watershed and continental scales, reactive transport is further complicated by the coupling with diverse Earth surface processes, including subsurface and surface water, vegetation, and the atmosphere, all played out typically in highly heterogeneous and transient settings. Interest has also increased in the effects of geomechanics on reactive transport ("chemo-mechanical effects), of which pressure solution is one of the examples (Hu et al., 2021).

#### Lecturer

Carl I. Steefel, Lawrence Berkeley National Laboratory, United States

#### **Reading Material**

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#### Slides







# **Eurad Training**

# Reactive Transport: Pore to Continuum Scales

Carl Steefel Lawrence Berkeley National Laboratory

February 7, 2023





# **Coupled Processes and Scales**







**Coupled Processes** 







# **Challenge of Multiscale in Earth and Environmental Sciences**





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# Pore to Continuum Scale

- Continuum models
- Solid, liquid, and gas all coexist in space within REV
- Reactions treated as if taking place throughout control volume
- Fluid phase is well mixed (no gradients in concentration or rate)
- Pore scale models
- Solid, gas, and liquid interfaces resolved
- Gradients in concentration and reaction rate can develop



Steefel, 2019

# **Equations: Pore to Continuum Scale**

	Pore Scale	Continuum or Darcy Scale
Flow	$\frac{\partial \boldsymbol{u}}{\partial t} + (\boldsymbol{u} \cdot \nabla)\boldsymbol{u} + \nabla \boldsymbol{p} = \boldsymbol{v} \Delta \boldsymbol{u}$ $\nabla \cdot \boldsymbol{u} = 0$	$q = -\frac{k}{\mu}\nabla p$ $\nabla \cdot (k\nabla p) = 0$
Transport	$\frac{\partial c}{\partial t} = \nabla \cdot (D\nabla c) - \nabla \cdot (uc)$	$\boldsymbol{\theta} \frac{\partial c}{\partial t} = \nabla \cdot (\mathcal{D} \nabla c) - \nabla \cdot (\boldsymbol{q} c)$ where $\mathcal{D} = \boldsymbol{\theta} \boldsymbol{\tau} D + \boldsymbol{\alpha}_{\boldsymbol{L}}  \boldsymbol{u} $
Reaction	$-D\nabla c \cdot \boldsymbol{n} = k f(\boldsymbol{c})$	$r = k  \boldsymbol{A}  f(\boldsymbol{c})$





# **Pore Scale Approaches**



# **Direct Numerical Simulation of Pore Scale Reactive Transport**



- Sharp interface resolution with Embedded Boundary (EB) method
- Fixed time divergence theorem for conservative discretization of fluxes



Direct resolution of reactive interfaces



#### Adaptive mesh refinement (AMR)



Moving reactive interphases influenced by Navier-Stokes flow and diffusion

Molins et al, 2014; Trebotich et al, 2014





# From Experiment to Characterization to High-Resolution Simulation



# Fracture Evolution in the Duperow Dolomite

#### High resolution pore scale model showing mineral dissolution and wormholing



 $\mathsf{scCO}_2$  saturated brine injected into fracture from left side





# Microscale MC Modeling of Granular Salt Creep



Geometry of the halite grains after pressure solution



Minimum principal stress after reaching equilibrium of compaction induced by pressure solution

(Hu, Steefel, and Rutqvist, 2021)

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#### Thermodynamic-Kinetic Model for Pressure Solution

- Assume that thermodynamic pressure is approximately equal to the minimum principal stress
- 2. Include dependence of Gibbs free energy on pressure

Solubility as a function of pressure (Anderson, 2005):

$$\ln K_P = \ln K_{P=1} - \Delta V_r \left(\frac{P-1}{RT}\right)$$

Helgeson–Kirkham–Flowers-modified-Redlich–Rosenfeld (HKFmoRR) to calculate partial molar volumes as function of pressure and temperature (Appelo et al. 2014)



(Appelo et al, 2014) Calculated as function of pressure  $\Delta V_r = V_{m,Na^+} + V_{m,Cl^-} - V_{Halite}$ and ionic strength Reactive transport Transition state theory (TST) rate law for equations for Na+ and Clthe kinetics of halite (Alkattan et al, 1997)  $r = -Ak\left(1 - \frac{Q}{K_P}\right)$  $\partial(\varphi C_{Na^+})$  $(\varphi^m D_{Na^+} \nabla C_{Na^+})$ -*dt* Ion activity product:  $\partial (\varphi C_{Cl} \nabla \cdot (\varphi^m D_{Cl^-} \nabla C_{Cl^-})$ ∂t  $Q = a_{Na^{+}}a_{Cl^{-}} = [\gamma_{Na^{+}}C_{Na^{+}}][\gamma_{Cl^{-}}C_{Cl^{-}}]$ 

(Hu, Steefel, Rutqvist, 2021)







#### **Stress Effects on Concentration**

**Pressure Solution within Halite Grain Pack** 



(Hu, Steefel, Rutqvist, 2021)

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# **Micro-Continuum Approaches**



Volume-Averaged Mineral Maps from Cranfield Pilot CO<sub>2</sub> Injection Site



Volume averaged over 16  $\mu m^2$  from 4  $\mu m$  BSE data

European Joint Programme on Radioactive Waste Management





## **Micro-Continuum Modeling Approach**

Combination of microscopic chemical mapping and micro-continuum modeling quantifies the reactivity in physically and chemically heterogeneous materials

Steefel et al., 2015

# Reactivity of Sediments, Nagaoka Japan



40 t  $CO_2$ /day, total of 10 kt  $CO_2$  stored  $CO_2$  injection period: 7/2003 –1/2005



Injection depth = 1100 mT =  $48^{\circ}\text{C}$ P = 108 bars

Haizume Formation Predominantly sandstone Thin layers of shales (siltstone to mudstone) interbedded within sandstone layers

Mineralogy (XRD) Abundant quartz, plagioclase, K-feldspar, smectite and pyroxene

> k = 6 mD Thickness = 60 m





### 2-D SEM-BSE & QEMSCAN of Nagaoka Sediment



Mineral	(A) Abundance %	(B) Accessible % (all BSE pores)	(C) Accessible 76 (connected macro and micro pores)
Quartz 🛛	27.64	20.16	13.71
lagioclase	22.65	19.48	14.54
Imeetite	16.99	32.43	36.33
C-feldspar	13.38	8.06	6.87
yroxene	7.21	7.22	11.10
Al Sitrap	2.74	1.63	3.73
Biotite	2.58	2.57	5.17
Amphibole	1.85	1.46	1.94
Others	1.41	2.44	2.65
'e Hydroxide	1.22	1.07	0.82
hlorite	1.17	1.34	1.31
Caolinite	0.41	1.08	1.21
yrite	0.36	0.41	0.23
Rementine	0.29	0.52	0.31
la- shosphate	0.07	0.08	0.06
alcite	0.03	0.06	0.03

Sediment dominated by smectite, plagioclase, pyroxene + volcanic glass

Beckingham et al, 2016

# Characterization Approach for Nagaoka Sediment



Beckingham et al, 2016, Geochimica





# Nagaoka Experimental Approach

- 1. Disaggregated sediment experiments in well-stirred reactor
- 2. Compare with intact coreflood experiments (pore structure intact)



## **Disaggregated Sediment Experiment**







# **Including Grain Size Distribution and Glass**



# Core Modeling with Pore-Accessible Reactive Surface Area



10x lower specific surface area compared to disaggregated sediment





# **Earth's Critical Zone**



#### **Critical Zone**









East River Watershed (Colorado)





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## Watershed Function High Performance Computing



Calculated Ca Concentration in Dry Summer



### **Southern Sierra Critical Zone Observatory**







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# Chemical Weathering (and Negative Emissions)



# CO<sub>2</sub> System



Atmospheric CO<sub>2</sub> at Mauna Loa Observatory





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### **Chemical Weathering**





### **Carbon Capture in Basaltic Rocks (Negative Emissions)**

- Reactive transport behavior in fracture networks
   mostly not considered previously
- Reactive transport behavior arises from highly focused but often connected flow paths
  - · Flow in matrix typically minor
  - · Fluid mixing may be important
- Fracture intersections may act like pore throats do at the pore scale
  - Can be locus of mineral precipitation having an outsized effect
- · Hypotheses:
  - Flow connectivity as key control?
  - Connectivity easily modified due to mineral precipitation



Steefel and Hu, submitted





# CO<sub>2</sub> Reaction with Forsterite → Magnesite



Steefel and Hu, WRR, 2022

## Subsurface CO<sub>2</sub> Trapping Mechanisms









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# **Contaminant Hydrology**



# **Redox Ladder**







# **Environmental Remediation**

Gas (carbon) leak is reducing, so inject oxygen to facilitate breakdown by microbes

٠



### Hanford 200E Area Uranium Plume



Used supercomputer to carry out 3D flow and reactive transport calculations



Hammond et al, 2010





# Hanford Nuclear Reservation, Washington



- 1942-1990 plutonium production for nuclear weapons
- 200,000 m<sup>3</sup> of high level radioactive waste, including abundant fission products (<sup>137</sup>Cs, <sup>90</sup>Sr)
- Nuclear waste stored in 177 underground tanks, 70 of which leaked
- Stored in single shelled stainless steel tanks, with radioactive waste heat production resulting in boiling of concentrated (most sodium nitrate) corrosive liquids some very high pH, some low pH depending on treatment



### **Cs Migration below Hanford SX-108 Tank**



- Greatest mobility of <sup>137</sup>Cs was below the Hanford SX-108 tanks
- Abject failure of K<sub>d</sub> models spawned a major Science and Technology Program at Hanford funded by the U.S. Department of Energy









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# **Clays and Clay Rocks**



























### Summary

- Reactive transport modeling has come a long way in its ability to describe important observations/processes
- · Earth's critical zone is the area of most intense interest presently
- · Much more model development is needed:
  - Chemo-mechanical coupling
  - Electrostatic effects on reactive transport
  - · Vegetation-hydrology-geochemistry interaction in Critical Zone
  - ...




# 3.5 Lecture 5 - Speciation of radionuclides – Including thermodynamic databases

To develop adequate strategies for radioactive waste management as well as to properly assess the impact of radionuclide migration in a repository system and/or the environment, radionuclide speciation calculations are needed. The assessment of radionuclide mobility in these systems is essential for the safety demonstration of the repository. One of the key factors influencing the rate of radionuclide transport out of the repository is the solubility of radionuclides released into the aqueous environment and their speciation. For this reason, the ability to model radionuclide speciation under repository conditions is an important issue when assessing the safety of a disposal system.

In this models, thermodynamic data on the stability of the complexes formed are really important. One of the particularities, which makes very challenging these models is that the different chemical properties of each radionuclides results in different speciation, migration and mobilization processes.

#### Lecturer

Vanessa Montoya, SCK CEN, Belgium

#### **Reading Material**

Gaona, X., Montoya, V., Colàs, E., Grivé, M. and Duro, L., 2008. Review of the complexation of tetravalent actinides by ISA and gluconate under alkaline to hyperalkaline conditions. Journal of Contaminant Hydrology, 102(3-4), pp.217-227.

Duro, L., Montoya, V., Colàs, E. and García, D., 2010. Groundwater equilibration and radionuclide solubility calculations. Nuclear Waste Management Organization Technical Report NWMO TR-2010-02. Toronto, Canada.

Montoya, V., Noseck, U., Mattick, F., Britz, S., Blechschmidt, I. and Schäfer, T., 2022. Radionuclide geochemistry evolution in the Long-term In-situ Test (LIT) at Grimsel Test Site (Switzerland). Journal of Hazardous Materials, 424, p.127733

#### Slides







sck cen

#### **Speciation of radionuclides** Including thermodynamic databases

Vanessa Montoya

03.03.2023



Montoya, V., et al. (2022).. Journal of Hazardous Materials, 424, 127733.



EURAD (Deliverable n° 2.3 and 4.3) - Training Material – Geochemical & Reactive Transport Modelling for Geological Disposal Dissemination level: PU Date of issue of this report: 04/05/2023



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Speciation of radionuclides Introduction



- Chemical model + thermodynamic model
- Aquatic speciation (relevant species, intrinsic colloids, ...)
- Redox (calculation of predominance fields, Eh measurements, exp. Validation)
- Solid phases (relevant solids, crystalline vs. amorphous, particle size,...)
- o Thermodynamic databases (NEA-TDB, extended TDBs...)







#### Theory

Chemical model













EURAD (Deliverable n° 2.3 and 4.3) - Training Material – Geochemical & Reactive Transport Modelling for Geological Disposal **Dissemination level: PU** Date of issue of this report: 04/05/2023



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#### Theory

Aqueous speciation



**Theory** Precipitation / dissolution – Interaction solid / fluid



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#### Theory

Thermodynamic databases



#### **Theory** Thermodynamic databases

Thermodynamic databases

Thermodynamic databases

Actinide (oxidation state)	Complexing ligand	Electrolyte matrix
		NaCl
Thorium(IV)	OH-	NaClO <sub>4</sub>
Protactinium(IV, V)	F'	MgCl <sub>2</sub>
Neptunium(IV, V, VI)	Cl-	CaCl <sub>2</sub>
Plutonium(III, IV, V, VI)	SO42-	(TMA-CI)
Americium(III)	NO3-	(NO <sub>3</sub> -)
Curium(III)	PO43-	
[Uranium(IV, VI)]	CO32-	Temperature range
	silicates	10 – 200°C





#### Theory

Thermodynamic databases



Table 7. Speciation scheme and stability constants selected for An(IV)-ISA and An(IV)-GLU complexes forming in alkaline to hyperalkaline conditions Species log\*β° U Th Np Pu -11.5±1.5 a,e -6.8±0.9 d -4.06±0.62 a,k -3.8±1.6 b,l,m An(OH)4(ISA)-An(OH)<sub>4</sub>(ISA)<sub>2</sub><sup>2-</sup> -11.2±1.5 b,f -4.9±1.0 b,j -2.20±0.62 a,k 0.4±1.1 b,l,m CaAn(OH)<sub>4</sub>(ISA)<sub>2</sub>(aq) -4.0±0.4 a,c,e,g,h An(OH)4(GLU)--13.2±1.0 b,i -5.2±1.0 b,j -3.5±1.1 d -2.8±1.5 b,l,n An(OH)4(GLU-H)2--22.4±1.0 b,i CaTh(OH)4(GLU)2(aq) -0.8±0.1 a,h a. recalculated in this work; b. determined in this work from the available experimental data; c. average of the available data; d. determined by LFER; e. Vercammen et al. (2001); f. Rai et al. (2004); g. Tits et al. (2002); h. Tits et al. (2005); i. Felmy (2004); j. Warwick et al. (2004); k. Rai et al. (2003); l. Moreton (1993); m. Greenfield et al. (1995); n. Cross et al. (1989). Gaona, X., Journal of Contaminant Hydrology 102, no. 3-4 (2008): 217-227. 17

**Theory** Thermodynamic databases

Thermodynamic databases

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Altmaier, M., et al. (2013).. Chemical reviews, 113(2), 901-943





#### Theory

Solid phases - solubility limit

Thermodynamic data based on estimations: Analogy with Ln(III) and An(III) as a function of ionic radii.

Pu<sup>3+</sup> + CO<sub>3</sub><sup>2-</sup> + H<sub>2</sub>O = Pu(CO<sub>3</sub>)(OH)(s) + 1H<sup>+</sup>

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Crystal radius stracted from Shannon (1976)

#### **Theory** Solid phases – crystallinity & particle size













#### Theory

Solid solutions



Data estimation procedures are of especial interest when the influence of temperature is taken into account. Virial equations classically used to account for temperature variations in thermodynamic databases require a good knowledge on the temperature dependence of heat capacities. Nevertheless, heat capacity data of radionuclides are seldom available. In the absence of experimental information on the temperature dependence of the standard heat capacities, the simplification described by the Van't Hoff equation (no effect of temperature on reaction enthalpy) can provide a reasonable estimate of temperature effect on stability for many systems. The application of the Van't Hoff equation is especially accurate below 100°C, when changes in temperature are not very important (few tens of degrees) or in the case of isocoulombic reactions (Grenthe et al., 1997).

The application of the Vant'Hoff equation needs values for the egiven temperature and the enthalpy of reaction. Enthalpies can l methods, although formation/reaction entropy and enthalpy of source pra-

$$\ln rac{K_2}{K_1} = rac{\Delta_r H^{\ominus}}{R} \left(rac{1}{T_1} - rac{1}{T_2}
ight).$$

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#### **Theory** Temperature



Temperature can affect transport parameters and geochemistry.

#### Low permeability of Opalinus Clay (anisotropic material)

- Conduction is the only heat transfer mechanism
- Diffusion is the only mass transport mechanism



Questions?	
03.03.2023	
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# 3.6 Lecture 6 - Molecular aspect and thermodynamic modelling of sorption phenomena

Lecture provides introduction into

- molecular mechanism of sorption phenomena by molecular simulations and spectroscopy
- physical and chemical processes at mineral surface interface
- foundation for development and application of mechanistic thermodynamic models for sorption
- assessments of model uncertainties

#### Lecturer

Sergey Churakov, PSI, Switzerland

#### **Reading Material**

B. Baeyens, M. and M. Fernandes (2018). Adsorption of heavy metals including radionuclides. <u>Surface and Interface Chemistry of Clay Minerals</u>. R. Schoonheydt, C. T. Johnston and F. Bergaya, Elsevier: 125-172.

Churakov, S. V., W. Hummel and M. Marques Fernandes (2020). "Fundamental Research on Radiochemistry of Geological Nuclear Waste Disposal." <u>Chimia</u> **74**(12): 1000-1009.

Keri, A., R. Dahn, M. Marques Fernandes, A. C. Scheinost, M. Krack and S. V. Churakov (2020). "Iron Adsorption on Clays Inferred from Atomistic Simulations and X-ray Absorption Spectroscopy." <u>Environmental Science & Technology</u> **54**: 1886-11893

Slides







08/02/2023



- · Retention and transport mechanics radionuclides
- · Sorption mechanism and fluid-surface interaction
- · Structure and properties of clay minerals
- · Development and validation of sorption models
- Types and sources of uncertainties
- · Application of sorption models in Safety Assessment Studies



FUTURe







- Dan Miron
- Dmitrii Kulik





• Knowledge on uptake mechanisms is essential for predictions of radionuclides and contaminants transport in the geosphere





## Solubility & solution chemistry



We cannot dissolve unlimited amounts of a solid in water.



Many salts (e.g. NaCl, CuSO<sub>4</sub>) dissolve in the order of grams per 100 g H<sub>2</sub>O, but most radionuclides are limited to very low concentrations.

$$\begin{split} UO_{2,(s)} + 2H_2O &\leftrightarrow U_{aq}^{4+} + 4OH_{aq}^- \\ K_{sp,\,UO_2} &= \{U^{4+}\}_{aq}\{OH^-\}_{aq}^4 \cong 10^{-56} \end{split}$$

Pore water solution is saturated with respect to rock forming minerals.

# Solubility & complexation

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FUTU(R)e

Metal ions (Me) are in equilibrium with solids and several complexes (X).



#### Solubility product

$$UO_{2,(s)} + 2H_2O \leftrightarrow U_{aq}^{4+} + 4OH_{aq}^-$$

$$K_{sp,\,UO_2} = \frac{\{U^{4+}\}_{aq}\{OH^-\}_{aq}^4}{\{H_2O\}_{aq}=1\,\{UO_2\}_s=1} = \{U^{4+}\}_{aq}\{OH^-\}_{aq}^4 \cong \,10^{-56}$$

Aqueous complexation equilibrium

$$U_{aq}^{4+} + OH_{aq}^{-} \leftrightarrow U(OH)_{4,(aq)}$$
$$K_{sp, UO_2}K = \frac{U(OH)_{4,(aq)}}{\{U^{4+}\}_{aq}\{OH^{-}\}_{aq}^{4}\{UO_2\}_{s=1}} \cong 10^{47}$$

Solubility

$$\sum_{tot,aq} Me = [Me]_{aq}^{n+} + [MeX_i]_{aq}^{m+/-} + [MeX_j]_{aq}^{p+/-} \dots$$





# Sorption



Is empirically defined esperimental measurements of

#### solid/liquid distribution coefficient $R_d$

 The quantity of a solute sorbed by a solid, per unit weight of solid, divided by the quantity of the solute dissolved in the water per unit volume of water.



$$R_d = \frac{[C]_{sorbed}}{M_{solid}} \cdot \frac{[C]_{eq}}{V_{aq}} = \frac{C_{init} - C_{eq}}{C_{eq}} \cdot \frac{V_{aq}}{M_{solid}} [L/kg]$$

C <sub>init</sub>	is the total initial nuclide concentration $\left[\frac{mol}{L}\right]$ ,
$[C]_{eq} \equiv [C]_{dissolve}$	$_{d}$ is the total equilibrium aqueous nuclide concentration $\left[\frac{mol}{L}\right]$
$V_{aq}$	is the volume of the liquid phase $[L = dm^3]$ ,
M <sub>solid</sub>	is the mass of the solid phase [kg]



Churakov & Schliemann (2021) AIPEA Educational Series (AES) doi: 10.14644/AES.003







#### Experimental data for mechanistic sorption modelling



<sup>(</sup>Montmorillonite, Bradbury & Baeyens, J. Contam. Hydrol. 1997; Illite, Bradbury & Baeyens, GCA 2009)







Generalised 2SPNE SC/CE model: Case study Eu (Montmorillonite, Bradbury & Baeyens, J. Contam. Hydrol. 1997; Illite, Bradbury & Baeyens, GCA 2009)









#### Stepwise modelling of sorption edge





Bradbury, M. H. and B. Baeyens (2011). Applied Clay Science 52: 27-33.







Stepwise modelling of sorption edge



Bradbury, M. H. and B. Baeyens (2011). Applied Clay Science 52: 27-33.



FUTURe

#### Stepwise modelling of sorption edge



Bradbury, M. H. and B. Baeyens (2011). Applied Clay Science 52: 27-33.







3: =S<sup>s</sup>OH + Eu<sup>3+</sup> + 2H<sub>2</sub>O ⇔ =S<sup>s</sup>OEu(OH)<sub>2</sub> + 3H<sup>+</sup> log <sup>s</sup>K<sub>3</sub> = -14.2

Stepwise modelling of sorption edge

Bradbury, M. H. and B. Baeyens (2011). Applied Clay Science 52: 27-33.

FUTURe







# Generalised Cs model for illite



FUTURe

To model the sorption isotherm on illite:

- 3 site types are required: Frayed Edge Sites (FES), Type II sites and Planar sites
- Selectivity coefficients of Cs with respect to other cations e.g. Na and K are required



Cation diffusion in the interlayer of montmorillonite

Cs sorption model summary				
Site type	Site capacity CEC illite = 200 meq k	: <b>g</b> -1		
FES	0.25 % of CEC			
Type II	20 % of CEC			
Planar	80 % of CEC			
0-11-0-0				
Cation exe	change reaction	LOG K <sub>c</sub>		
$Na-FES + K \Leftrightarrow K-FES + Na$		2.4		
$Na-FES + Cs \Leftrightarrow Cs-FES + Na$		7.0		
Na-II + K ⇔ K-II + Na		2.1		
Na-II + Cs ⇔ Cs-II + Na		3.6		

(Bradbury & Baeyens, 2000)

# Molecular dynamics simulation Cs (Yellow) – Na (Blue) - Montmorillonite ugg d Time scale: 1:10<sup>-11</sup>

T=300K, P=1bar

Froideval, et al.(2011) J. Nuc. Mat. 416, 242-251





# Molecular Nature of Cs sorption





Fuller et al. (2015) Appl. Clay Sci http://dx.doi.org/10.1016/j.clay.2015.02.008





Krejci P. (2023) in prep.





#### Signature of an atomic environment!



EXAFS spectroscopy: structural information at an atomistic scale!







# Mechanistic sorption model: Zn/Ni sorption on illiteture

3 site types are required: Strong sites (SS), Weak sites (WS) and Cation exchange sites (CE) Selectivity coefficients of Zn/Ni with respect to Na are required for the 3 sites









• Several concurrent reaction pathways;

Schliemann & Churakov (2021) Geochim Cosm. Acta. 293, 438-460; Schliemann & Churakov (2021) Geochim Cosm. Acta. 307, 42-55.

### Model parameter uncertainties

• "Synthetic datasets" by randomly sampling from a distributions according to the error intervals

• "Repeat the parameter estimation"  $\rightarrow$  standard deviation & mean



Anderson, G. M., 1976. Error propagation by Monte Carlo method in geochemical calculations. Bradbury and Baeyens (2009); [2] Marques Fernandes et al. (2015) Curtesy of Dan Miron



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FUTURe

 $f(\mathbf{y}) = \Delta t \mathbf{y}$ 



## Derivation of sorption databases for safety assesment





Bradbury and Baeyens (2009);





### Summary an outlook



- High quality experimental data are the basis for the development of the mechanistic sorption models
- Good understanding of sorption mechanism for uptake of monovalent and divalent cations as well as some actinides has been obtained by molecular simulations and spectroscopy
- Combination of molecular spectroscopy and simulations is particularly important for discrimination of co-existing surface complexes on different surfaces
- Further application and development of molecular simulations should allow for direct estimation of the sorption complexation constants





# 3.7 Lecture 7 - Modelling of kinetically controlled processes in radioactive waste disposal, from radiolytic corrosion to microbial activity

Reactive transport modelling (RTM) has been important for assessing the long-term performance of the geologic disposal of radioactive waste. RTM is capable of great generality since it can be applied to a wide range of natural processes, as well as to engineering issues such as metal corrosion or bentonite alteration. This requires an understanding how the various barriers evolve through space and time. Mass transfers are often driven by diffusion or very slow advective flows, which allows to model the geochemical reactions under thermodynamic equilibrium. But some key slow processes intrinsically remain under a kinetic control.

In a first stage, we will recall the main kinetic rate laws that are commonly used for RTM, such as the transition state theory with catalytic or inhibiting effects, Arrhenius dependency with temperature or the Monod microbial kinetic laws. We will also focus on the importance of reactive surfaces for heterogenous solid/liquid kinetics. Then we will introduce more specialized kinetic models, such as glass dissolution with passivating altered layer. Eventually, we will give an overview of kinetic databases.

In a second stage, we will study RTM applications where kinetics plays a key role using the reactive transport code HYTEC: 1) the radiolytic auto-dissolution of spent nuclear fuels driven by oxidants produced by the irradiation of water, 2) the corrosion of carbon steel canister driven by sulfato-reducing bacteria, 3) the long-term coupled evolution of the glass / steel / cement / claystone multi-barrier in a disposal cell.

#### Lecturer

L. De Windt, Mines Paris, France

#### **Reading Material**

Brantley, S.L., Kubicki, J.D., White, A.F. (2008). Kinetics of Water-Rock Interaction, Springer-Verlag (New York, US).

De Windt, L., Spycher, N. (2019). Reactive transport modeling: a key performance assessment tool for the geologic disposal of nuclear waste, Elements Vol. 15, 99.

van der Lee, J., De Windt, L., Lagneau, V., Goblet, P. (2003). Module-oriented modeling of reactive transport with HYTEC, Computers and Geosciences 29, 265.

#### Slides





TRAINING COURSE: Geochemical & RT Modeling for Geological Disposal Bern, 06 – 10 Feb 2023

# Modelling of kinetically controlled processes in radioactive waste disposal:

### from radiolytic corrosion to microbial activity

Laurent De Windt









Geosciences Dpt., Paris School of Mines (F)

Applied geochemistry radioactive waste disposal and environmental chemistry (DISCO, ACED European Projects)

Reactive transport modeling (RTM) code HYTEC



 $\label{eq:definition} \begin{array}{l} \mbox{Dewindtite crystal} \\ \mbox{Pb}_3(\mbox{H}(\mbox{UO}_2)_3\mbox{O}_2(\mbox{PO}_4)_2)_2 \ .12\mbox{H}_2\mbox{O} \end{array}$ 

Phosphate family, named by Professor M.A. Schoep of the University of Ghent (Belgium) in memory of his student Jean DeWindta distant cousin?, drowned in Lake Tanganyika in Congo.

Cr Acad Sci Paris 174 (1922)







#### 2. Main kinetic laws commonly used for RTM

- a. Mineral dissolution/precipitation with catalytic or inhibiting effects
- b. Reactive surfaces
- c. Arrhenius dependency with temperature
- d. Monod microbial kinetics
- e. Sources of kinetic data

#### 3. Examples of application to radwaste disposals

- a. Glass / steel / cement / claystone multi-barrier
- b. Radiolytic dissolution of spent nuclear fuels
- c. Steel corrosion driven by sulfato-reducing bacteria

# A few readings



#### **Geochemical kinetics**

Brantley, S.L., Kubicki, J.D., White, A.F. (2008). Kinetics of Water-Rock Interaction, Springer-Verlag (New York, US).

among many other very good books

#### Application of RTM to radwaste disposals

De Windt, L., Spycher, N. (2019). Reactive transport modeling: a key performance assessment tool for the geologic disposal of nuclear waste, Elements Vol. 15, 99.

#### The HYTEC RTM code

van der Lee, J., De Windt, L., Lagneau, V., Goblet, P. (2003). Module-oriented modeling of reactive transport with HYTEC, Computers and Geosciences 29, 265.





#### Context RTM and radwaste disposals 5 MINES PARIS Nuclear Steel Void Glass Canister Clay Saturated Clay Reactive transport modelling (RTM) are important for assessing the long-term Waste Form ±0.05 m Iron Saturation Oxydation Front Concrete. performance of the geologic disposal of 0 radioactive waste Bentonite Near Field RTM can be applied to a wide range of natural processes, as well as to engineering issues such as metal ±500 m corrosion or bentonite alteration Far Field This requires an understanding how the Host Rock various barriers evolve through space and Indurated Clay time

# **Context** Typical processes that need kinetic modeling

EESA18-056



De Windt et al. (2019), Elements



- Mass transfers are often driven by diffusion or very slow advective flows, which allows to model the geochemical reactions under thermodynamic equilibrium; i.e. the "characteristic time" is long
- But some key slow processes intrinsically remain under a kinetic control, such as
  - Vitrified wastes (nuclear glasses) due to their amorphous state
  - Corrosion of metals that are never stable in water, e.g. Mg(0) and Fe(0)
  - Radiolytic-enhanced processes
  - Microbially-driven reactivity
  - To a lesser extent: clay dissolution, cement carbonation or hydration





# Kinetics in RTM Mineral dissolution



SEM image of a heterogeneous MOx fuel  $U_{1-x}Pu_xO_2$ after leaching in carbonated water;

the corrosion pits corresponds to the  $\rm UO_2\mathchar`-enriched$  zones whereas  $\rm PuO_2\mathchar`-aggregates$  remain stable

Kinetic notions of reactive surface, thermodynamic effects, influence of the solution

Kerleger et al. (2020), JNM

[M] = mineral concentration [mol/L]

Q = Ion Activity Products

"Catalyst" if  $a_i$  is positive or "inhibitor" if  $a_i$  is negative Can combine several dependencies

*p* = empirical fitted parameter

k = intrinsic kinetic rate constant [mol/m<sup>2</sup>/s]  $A_v$  = volumic reactive surface area [m<sup>2</sup>/L]

 $K_s$  = thermodynamic equilibrium constant

## Kinetics in RTM Mineral dissolution



#### "Transition state theory" with catalytic or inhibiting effects

$$\frac{d[M]}{dt} = -kA_v$$

$$\frac{d[M]}{dt} = kA_v \left( \left(\frac{Q}{K_s}\right)^p - 1 \right)$$

$$\frac{d[M]}{dt} = kA_v \prod_i (A_i)^{a_i} \left( \left(\frac{Q}{K_s}\right)^p - 1 \right)$$

Example: calcite dissolution in acidic media

$$\frac{d[M]}{dt} = kA_v(H^+)^{1} \left( \left( \frac{(Ca^{2+})(CO_3^{2-})}{K_{Calcite}} \right) - 1 \right)^{1}$$





# Kinetics in RTM Mineral dissolution



#### "Transition state theory" with catalytic or inhibiting effects

$$\frac{d[M]}{dt} = -kA_v$$

$$\frac{d[M]}{dt} = kA_v \left( \left(\frac{Q}{K_s}\right)^p - 1 \right)$$

$$\frac{d[M]}{dt} = kA_v \prod_i (A_i)^{a_i} \left( \left(\frac{Q}{K_s}\right)^p - 1 \right)$$

Mineral dependency Heterogeneous kinetics, surface controlled

Thermodynamic equilibrium dependency

$$(\Omega - 1) \quad \left(\exp\left(\frac{\Delta G}{RT}\right) - 1\right)$$

Aqueous solution dependency

Example: calcite dissolution in acidic media

$$\frac{d[M]}{dt} = kA_v(H^+)^{1} \left( \left( \frac{(Ca^{2+})(CO_3^{2-})}{K_{Calcite}} \right) - 1 \right)^{1} \right)$$

Kinetics in RTM Mineral dissolution



$$CaCO_{3(s)} + H^{+}_{(aq)} = Ca^{2+}_{(aq)} + HCO^{-}_{3(aq)}$$
  

$$CaCO_{3(s)} + H_2CO_{3(aq)} = Ca^{2+}_{(aq)} + 2HCO^{-}_{3(aq)}$$
  

$$CaCO_{3(s)} + H_2O_{(aq)} = Ca^{2+}_{(aq)} + HCO^{-}_{3(aq)} + OH^{-}_{(aq)}$$



 $r = k_1 a_{H^+}$  $r = k_2 a_{H_2 CO_3^*}$  $r = k_3 a_{H_2 O}$ 

Kinetics of calcite dissolution vs. the chemistry of the solution

In Brantley et al. (2008)






$$r = k_H a_{H^+}^n + k_{OH} a_{OH^-}^m$$

 $r = k_H [\equiv SOH_2^+]^{q_1} + = k_{OH} [\equiv SO^-]^{q_2}$ 

Assumption of a control by surface sites



benzoate

2.5

2.0

-

C<sup>s</sup><sub>L</sub> (10<sup>-6</sup> mol m<sup>-2</sup>)

3.0

In Brantley et al. (2008)

Kinetics in RTM Mineral dissolution

SUCC

1.0

concentration des complexants

sur la surface

1.5

0.5

15

10

5

0





$$\frac{d[M]}{dt} = k_L [\equiv Al - L]$$

In Sigg et al. (2014)



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 $\langle 0 \rangle$ 





### Alternative evolution of surfaces

$$A = A_0 \left(\frac{M_0}{M}\right)^{\frac{2}{3}}$$

$$A = constant$$

Reactive surface increases while the spherical particles dissolves

Dissolution progressing in depth along the full surface

# Kinetics in RTM Reactive surface



Alternative evolution of surfaces (cond't)



Dissolution in a porous media

Dissolution of ceramic-like solid (e.g. UOx fuel)

Important to discriminate between

- calculated geometric surface
- BET measured surfaces, i.e. surface roughness





# Kinetics in RTM Mineral precipitation



Very often, one assumes that the dissolution law can be "reversed"

$$\frac{d[M]}{dt} = kA_v \left( \left(\frac{Q}{K_s}\right)^p - 1 \right)$$

Q > Ks, i.e. positive sign (formation) with a thermodynamic effect: the further from equilibrium, the faster the reaction

A minimum (nucleus) surface can be provided

- The correct theory of precipitation kinetics is complex and not always operational for "real" applications, e.g.
  - nucleation barrier vs. critical oversaturation  $\Omega_c$
  - · homogenous vs. heterogeneous nucleation, then crystal growth







# Kinetics in RTM Arrhenius law



• The speed of a reaction generally increases with the temperature

$$k(T) = A \exp\left(\frac{-E_A}{RT}\right)$$

k = intrinsic kinetic rate constant [mol/m<sup>2</sup>/s] A = pre-exponential factor  $E_A$  = activation energy [kJ/mol] T in °K

• More operational formulation

$$\lg k_{T} = \lg k_{T_{0}} - \frac{E_{a}}{2,3R} \left(\frac{1}{T} - \frac{1}{T_{0}}\right)$$

EA [kJ/mol]	Diffusion in water	Diffusion in solids	Fe corrosion	Clay dissolution	Quartz dissolution
Approxim.	20	500	25	60	90

## Kinetics in RTM Microbial kinetics



The presence of micro-organisms catalyzes reactions

Microbiologically-mediated multistep reactions

Monod equations, derived from enzyme catalysis laws (Michaelis Menten )



$$M = \prod_k \left(\frac{S_k^{a_k}}{K_k^{a_k} + S_k^{a_k}}\right)^{b_k}$$

when S << K, rate  $\infty$  [S]

when S >> K, maximum constant rate

K = half of the maximum constant rate









Catalyzed

Ex.: methanogen bacteria  $CO_2 + 4H_2 \rightarrow CH_4 + 2H_2O$ 

$$r = k \left( rac{[H_2]}{[H_2] + K_D} 
ight)$$

$$r = k'[B] \left(\frac{[H_2]}{[H_2] + K_D}\right)$$

Catalyzed and population growth B is the active biomass

$$r = k'[B] \left(rac{[H_2]}{[H_2] + K_D}
ight) \left(rac{K_I}{[CH_4] + K_I}
ight)$$

Catalyzed, population growth, and inhibition (poison)

# **Kinetics in RTM Microbial kinetics**



Anabolism= growth and then sustainability of the biomass vs. death (steady state)



Biofilm = bacterial community, contained in a matrix of exopolymers, adhering to a surface







# Kinetics in RTM Source of kinetic data



Mostly from individual papers from the literature

Brantley, Kubicki, White (2008). Kinetics of Water-Rock Interaction, Springer-Verlag (New York, US).

Palandri & Kharaka, Y. K. (2004). *A compilation of rate parameters of water-mineral interaction kinetics for application to geochemical modeling*. REPORT 2004-1068, Geological Survey Menlo Park CA.

Table 29. Clay Group Mineral Dissolution Rate Parameters.

	Acid Mechanism			Neutral Mechanism		Base Mechanism		
	<sup>a</sup> log k	ьE	°n	<sup>a</sup> log k	ьE	<sup>a</sup> log k	ьE	сn
kaolinite	-11.31	65.9	0.777	-13.18	22.2	-17.05	17.9	-0.472
<sup>d</sup> montmorillonite	-12.71	48.0	0.220	-14.41	48.0	-14.41	48.	-0.130
<sup>e</sup> smecite	-10.98	23.6	0.340	-12.78	35.0	-16.52	58.9	-0.400

Marty et al. (2015). A database of dissolution and precipitation rates for clay-rocks minerals, *Applied Geochemistry* 55.



- 2. Main kinetic laws commonly used for RTM
  - a. Mineral dissolution/precipitation with catalytic or inhibiting effects
  - b. Reactive surfaces
  - c. Arrhenius dependency with temperature
  - d. Monod microbial kinetics
  - e. Sources of kinetic data

### 3. Examples of application to radwaste disposals

- a. Glass / steel / cement / claystone multi-barrier
- b. Radiolytic dissolution of spent nuclear fuels
- c. Steel corrosion driven by sulfato-reducing bacteria







## Long-term evolution of multi-barrier Modeling approach





## Reactive transport modeling with HYTEC (De Windt, Elements, 2019)

- thermodynamics (ThermoChimie) + kinetics ==> 150 aqueous species, 35 minerals, 20 sorption sites
- 1D radial (axi-symmetry)
- diffusion-driven (with & without porosity/D<sub>eff</sub> evolution)
- water-saturated conditions
- (non)-isothermal conditions
- PA sensitivity analysis on
  - buffer thickness 5 30 100 cm
  - buffer composition CEM I concrete vs. cement/bentonite grout







# Long-term evolution of multi-barrier



Carbon-steel overpack

Kinetic coupling: cement/clay interactions will

slow down when pH will decrease









- Operational for 5.0  $\,\leq\,$  pH  $\,\leq\,$  10.5, T = 25 90 ٠
- °C Cracking ratio of the glass block



# Long-term evolution of multi-barrier Glass/steel/cement/claystone - 30 cm & 40 000 years





- 1. Main driving force of the whole system is the cement phase degradation by the clay host-rock
- 2. The lost of high-pH conditions leads to the speed-up of Csteel corrosion
- 3. Overpack breaching leads to the income of aqueous solution in contact with the nuclear glass, which releases Boron; Fe(0)/Fe-silicates sustains glass dissolution







## Radiolytic dissolution of spent-fuel Disposal cell and experimental set-up

























5

0

0

\*\*

100

200

Time [d]

300

400





# **Bio-corrosion of steel** Modeling of corrosion processes





(1) rod/argillite proximity => carbonated corrosion products

(2) Reducing  $D_{eff}$  in the corrosion layer => spatial segregation of OH<sup>-</sup> source (rod) and HCO<sub>3</sub> source (argillite) => Fe<sub>2</sub>(OH)<sub>2</sub>CO<sub>3</sub> and FeCO<sub>3</sub>

(3) BSR activity => FeS precipitation and increase in siderite stability

### With bacteria





# **Concluding remark** The unusual timeframe of radwaste disposal for humanity 39 MINES PARIS





@Geluck



Context: kinetics and radwaste diposals 1.

#### Main kinetic laws commonly used for RTM 2.

- a. Mineral dissolution/precipitation with catalytic or inhibiting effects
- b. Reactive surfaces
- c. Arrhenius dependency with temperature
- d. Monod microbial kinetics
- Sources of kinetic data e.

#### 3. Examples of application to radwaste disposals

- a. Glass / steel / cement / claystone multi-barrier
- b. Radiolytic dissolution of spent nuclear fuels
- Steel corrosion driven by sulfato-reducing bacteria c.





# 3.8 Lecture 8 - Integration of processes at larger scale – sensitivity (uncertainty) analyses

This lecture will present:

1) Conceptual and numerical reactive transport models for HLW radioactive waste disposal at the disposal cell scale. The reactive transport models simulate the geochemical evolution of HLW disposal cells in granite and clay for a time span of 50,000 years. The model considers the vitrified waste, the carbon-steel canister, the saturated bentonite buffer and the host rock. These models have been performed within the context of the ACED Work Package of the EURAD Joint Project.

2) Local sensitivity analyses of model predictions: methods and results.

3) Global sensitivity analyses: description of the methods and results obtained with the VARS (Variogram Analysis of Response Surface) method. These results have been obtained within the context of the DONUT Work Package of the EURAD Joint Project

4) Ongoing international initiatives (JOSA Group

### Lecturer

Javier Samper, University of A Coruña, Spain

### **Reading Material**

- Claret, F, A Dauzeres, D Jacques, P Sellin, B Cochepin, L De Windt, J Garibay-Rodriguez, J Govaerts, O Leupin, A Mon, L Montenegro, V Montoya, N I. Prasianakis, J Samper & J Talandier, (2022).
   Modelling of the long-term evolution and performance of engi-neered barrier system, EPJ Nuclear Sci. Technol. 8, 41. https://doi.org/10.1051/epjn/2022038.
- Claret, F., J Samper, J Samper II, AC Samper, A Mon, B Pisani, C López, C Yang, (2023). UDC Contribution to the "Report describing numerical improvement and developments and their application to treat uncertainty when dealing with coupled processes". WP DONUT. EURAD Joint Program. Deliverable D4.7 of the EURAD Joint Project. EC Grant Agreement no: 847593
- JOSA: Uncertainty Quantification and Sensitivity Analysis in Geologial Disposal: Joint Sensitivity Group (JOSA) Group: Volume 1. https://www.osti.gov/servlets/purl/1822591.
- Mon, A, J Samper, L Montenegro, A Naves, & J Fernández, (2017). Long-term nonisothermal reactive transport model of compacted bentonite, concrete and corrosion products in a HLW repository in clay, J Cont Hydrol, Vol 197: 1-16. http://dx.doi.org/10.1016/j.jconhyd.2016.12.006.
- Mon, A, J. Samper, L Montenegro, E Torres, MJ Turrero, J Cuevas, & L De Windt, (2023). Reactive transport models of geochemical interactions at the iron/bentonite interface in lab corrosion tests, Applied Clay Sciences, (submitted).
- Samper, J., L. Montenegro, L. De Windt, V. Montoya, J. Garibay-Rodríguez, D. Grigaliuniene, A. Narkuniene, & P. Poskas, (2021). Conceptual model formulation for a mechanistic based model implementing the initial SOTA knowledge (models and parameters) in existing numerical tools. Deliverable D2.16 of the EURAD Joint Project. EC Grant Agreement no: 847593.

### Slides













ainine

### **OUTLINE OF PART I**

- Modelling approach
- Description of the disposal cell concept in granite
- Conceptual model & narrative evolution
- Mathematical & numerical model
- Computer code
- Model results
- Sensitivity analysis



February 10th, 2023 Lecture 8: Integration of processes at larger scale – sensitivity (uncertainty) analyses







February 10th, 2023 Lecture 8: Integration of processes at larger scale – sensitivity (uncertainty) analyses



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eura



- Leads to the precipitation of conosion products (CP)
- The precipitation of corrosion products (CP) near the canister decreases the porosity of the bentonite and may clog the pores
- Interactions of CP and bentonite
  - Bentonite cementation due to the precipitation of CP and  ${\rm SiO}_2$  coming from montmorillonite transformation
  - · Replacement of bentonite minerals by Fe-rich smectites and non-swelling Fe-rich phyllosilicates
  - · Dissolution & alteration of montmorillonite

### Glass dissolution

- · The interactions of vitrified glass and corrosion products start in Period III after canister failure
- The vitrified glass is not treated as a boundary condition. Instead, it is considered explicitly in the reactive transport model and coupled with the canister, the buffer and host-rock evolution

February 10th, 2023 Lecture 8: Integration of processes at larger scale – sensitivity (uncertainty) analyses



















- Mineral volume fractions
- Changes in porosity



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### MODEL RESULTS OF THE BASE RUN AT THE END OF PERIOD II

- Canister corrosion leads to an increase in pH and the concentration of dissolved  $\ensuremath{\mathsf{Fe}^{2+}}$
- · Magnetite precipitates in the canister and in the bentonite (1 cm band)
- · Siderite and greenalite precipitate
  - In the canister near the bentonite interface
  - · In the bentonite: small amount in a thin band
- The bentonite near the canister gets enriched in exchanged and sorbed Fe<sup>2+</sup>
- The calculated porosity
  - Decreases in the canister due to magnetite precipitation reaching clogging before 10,000 years
  - Decreases in the bentonite (1 cm from the C/B interface) due to calcite, siderite and greenalite precipitation



February 10th, 2023 Lecture 8: Integration of processes at larger scale – sensitivity (uncertainty) analyses







- Porosity feedback effect
- · Corrosion rate depending on temperature and saturation index
- · Earlier canister failure with a shorter duration of Period II



February 10th, 2023 Lecture 8: Integration of processes at larger scale – sensitivity (uncertainty) analyses







February 10th, 2023 Lecture 8: Integration of processes at larger scale – sensitivity (uncertainty) analyses













### OUTLINE

- Introduction & motivation
- · Methods of global sensitivity and uncertainty analysis
- VARS (Variogram Analysis of Response Surface) method
  - Description
  - Parameters
  - Numerical implementation
  - VARS results
  - Future and ongoing work
- Ongoing international initiatives on sensitivity analysis (JOSA Group)



February 10th, 2023 Lecture 8: Integration of processes at larger scale – sensitivity (uncertainty) analyses

















#### February 10th, 2023

UNIVERSIDADE DA CORUÑA Geochemical & Reactive Transpor Modelling for Geological Disposal

### **GLOBAL METHODS OF SENSITIVITY ANALYSIS**

- Provide a global measure of the sensitivity of a model output Z to changes in model parameters
- Derivative-based methods: Morris "Elementary Effects"
  - Quantify the average mean change in Z due to perturbations in each input parameter
  - · Identify the dominant parameters
- Variance-based methods: Sobol indexes
  - Quantify the contributions of each parameter  $x_i$  to the total variance of the output Z
  - The total Sobol index quantifies the contribution of  $x_i$  to the variance of Z
  - · Provide measures of the "interactions" among parameters
- · Morris and Sobol methods require performing thousands of Monte Carlo simulations to get statistically significant results















February 10th, 2023 Lecture 8: Integration of processes at larger scale – sensitivity (uncertainty) analyses







- Computer codes
  - CORE<sup>2D</sup> V5 for reactive transport modelling
  - VARS Matlab version (open access)
- Reactive transport simulations were performed on a HPC infrastructure (FinisTerrae II cluster from the Galician Supercomputing Center, CESGA, <u>www.cesga.es</u>)
- CPU time for 27600 simulations
  - · 3 months of wall time
  - Equivalent to nearly 25 CPU-years
  - CPU time reduction by a factor of 100



February 10th, 2023 Lecture 8: Integration of processes at larger scale – sensitivity (uncertainty) analyses












#### VARS analysis of the computed pH after 5.10<sup>4</sup> years for a HLW repository in granite has been presented

- 5 parameters were considered
- Most influential parameters are
  - Corrosion rate, granite flux and Fe selectivity
- Morris, Sobol and VARS (IVARS-50) provide similar results in terms of rankings and significance

eu[rad] 42

February 10th, 2023 Lecture 8: Integration of processes at larger scale – sensitivity (uncertainty) analyses

















# 3.1 Lecture 9 - Machine learning for accelerating reactive transport model simulations and analysis

In several areas of geosciences it is of interest to conduct multiphysics simulations. Typically the involved processes are non-linear and strongly coupled. Reactive transport model (RTM) simulations can be computationally-demanding, especially when large grids and/or long simulation periods are considered. Furthermore, even for small domains and simulation periods, model analysis tasks that require repeated model runs such as sensitivity analysis or the inverse modelling of laboratory or underground experiments, can quickly become intractable, since in these cases several thousands of such model simulations are needed. In this lecture, we will review different situations where nonlinear regression by machine learning (ML) methods, such as artificial neural networks (NNs), can help to: a) make the coupling between codes and scales, b) accelerate parts of RTM codes, and c) accelerate the full RTM simulations for sensitivity analysis and uncertainty quantification. Parameter upscaling may be facilitated via ML interfaces. At the same time, in a typical RTM simulation the geochemical calculations are responsible for the largest part of the total computing cost. The geochemical solver can be replaced by metamodel (or surrogate model) which is several orders of magnitude faster. Coupling the а geochemical solver metamodel with the transport model can lead to a significant speed up of the computations. Finally, we illustrate how ML can be used to surrogate the full RTM over some input and boundary conditions, such that sensitivity analysis, uncertainty propagation and/or inverse modelling become possible. The computational acceleration provided by machine the learning techniques is a crucial component of the digital twin technology.

#### Lecturer

Nikoloas Prasianakis, PSI, Switzerland Eric Laloy, SCK CEN, Belgium

#### **Reading Material**

Churakov, S. V., Prasianakis, N. I. 2018. Review of the current status and challenges for a holistic processbased description of mass transport and mineral reactivity in porous media. American journal of science, 318(9), 921-948. <u>https://doi.org/10.2475/09.2018.03</u>

Laloy E., Jacques, D. 2019. Emulation of CPU-demanding reactive transport models: a comparison of gaussian processes, polynomial chaos expansion, and deep neural networks. Comput Geosci 23(5):1193–1215. <u>https://doi.org/10.1007/s10596-019-09875-y</u>.

Laloy E., Jacques D. 2022. Speeding up reactive transport simulations in cement systems by surrogate geochemical modeling: deep neural networks and k-nearest neighbors. Transp Porous Media 143(2):433–462. <u>https://doi.org/10.1007/s11242-022-01779-3</u>.

Prasianakis, N. I., Haller, R., Mahrous, M., Poonoosamy, J., Pfingsten, W., Churakov, S. V. 2020. Neural network based process coupling and parameter upscaling in reactive transport simulations. Geochimica et Cosmochimica Acta, 291, 126-143. <u>https://doi.org/10.1016/j.gca.2020.07.019</u>

#### Slides







Nikolaos Prasianakis :: Laboratory for Waste management :: Paul Scherrer Institut

Machine learning for accelerating reactive transport model simulations and analysis

EURAD Training, Bern 10.02.2023





### ETH-Domain: Paul Scherrer Institut

Poonoosamy (FZJ), W. Pfingsten, D. Miron





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Motivation: Geochemical digital twins



Digital Twin is a modelling based tool of increased realism. For geochemical applications, it should cover several spatial and temporal scales, as well as all major underlying mechanisms.





Geochemical evolution of repository is governed by mass transport and phase changes: all scales matter

Processes occurring at the atomic- and pore- scale control the evolution of the geochemical systems. Currently, there exist several mature numerical tools, and good process understanding, at each scale.



#### EURAD-DONUT Development and Improvement Of NUmerical methods and Tools for modelling coupled processes



#### Questions:

How to couple heterogeneous codes and processes ? How to accelerate calculations ?

Churakov & Prasianakis, Holistic process-based description of mass transport and mineral reactivity in porous media. Am. J. Science, 318 (9) 921-948 (2018)









Well established tools and process understanding exists at each scale: pore-scale benchmark example.

Such an example is the pore-scale dissolution benchmark with evolving fluid-solid interfaces. A calcite rock is dissolved due to the convective flow of acid solution. Six different codes participated and gave similar results.

Remaining Challenges: Transfer information and connect the scales / codes, Accelerate Calculations









- Bridging heterogeneous codes which describe processes at different scales
- · Accelerate reactive transport numerical simulations without loss of accuracy
- Accelerate sensitivity analysis without loss of accuracy
- How to exploit high performance computing (Parallel CPU/GPU Supercomputers)

#### machine learning is the key enabling technology



"Machine learning is the subset of *artificial intelligence (AI)* that focuses on building systems that learn, or improve performance, based on the data they consume" source: <u>Oracle.com</u>

"Deep learning is a subset of machine learning in which multi-layered neural networks 'learn' from large amounts of data" source: IBM.com





atomic scale

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### Bridging heterogeneous codes at different scales

*Example: upscaling pore-level results to macroscopic codes* 

nanopore scale





micropore scale

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Upscaling pore-level results to macroscopic codes

Calcite rock acidification: case specific porosity-permeability correlations, extracted from detailed pore-level simulations.



Bridging heterogeneous codes at different scales: Upscaling of Pore level ┫╬╡┣ porosity-permeability correlations to macroscopic darcy scale code

Darcy-scale

MCOTAC (finite volumes)

Calcite rock dissolution

1m

Discretization Dx=0.1m

Communication and interfacing of heterogeneous codes at different spatial scales can be based on neural networks. The scale specific mechanisms and their dependence on several parameters can be used as the training input.



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Discretization Dx=0.1µm



Trained neural networks are light and robust functions that can be easily integrated in any code, written in any of the major programming languages

Prasianakis, N.I., Haller, R., Mahrous, M., Poonoosamy, J., Pfingsten, W. and Churakov, S.V., (2020) Neural network based process coupling and parameter upscaling in reactive transport simulations. chimica et Cosmochimica Acta, 291, pp.126-143.

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Passing information from pore-scale level codes to Macroscopic codes: Process can be automated.



During dissolution/precipitation, the permeability-porosity correlations <u>deviate</u> from typical Kozeny-Carman, and depend highly on the chemical and flow gradients. The Peclet (Pe) and Damkohler (Da) numbers dictate the evolution paths (e.g. wormhole formation / face dissolution).



Machine Learning for accelerating codes: chemical reactions



#### Accelerating chemistry in the field of combustion, reactive flows (1996 - )

Christo, F. C. et al." Artificial neural network implementation of chemistry with PDF simulation of H2/CO2 flames." Combustion and Flame 106, no. 4 (1996): 406-427.

#### Accelerating geochemistry and geochemical reactive transport calculations (2016 - )

Jatnieks, J., De Lucia, M., Dransch, D. and Sips, M., (2016). Data-driven surrogate model approach for improving the performance of reactive transport simulations. Energy Procedia, 97, pp.447-453. Leal, A., Kyas S., Kulik D., Saar, M. arXiv:1708.04825 (2017). Transport in Porous Media (2020). Laloy, E., and Jacques, D., Computational Geosciences 23, no. 5 (2019): 1193-1215.

Prasianakis, N.I., Haller, R., Mahrous, M., Poonoosamy, J., Pfingsten, W. and Churakov, S.V., (2020). Geochimica et Cosmochimica Acta, 291, pp.126-143.

Laloy, E. and Jacques, D., Transport in Porous Media (2022), DOI: 10.1007/s11242-022-01779-3

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Advantages: miniaturized environment, shorter time-scales, small quantities of reactants, continuous monitoring, parallel

Challenges: in-situ conditions of flow and chemistry unknown, control of experiment, manufacturing, design of experiment



Collaboration with J. Poonoosamy, FZ-Jülich, Germany

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#### Digital Twin and Numerical JÜLICH ┫┽╡┣ diagnostics

Augmented reality by combining cross scale lattice Boltzmann modelling diagnostics. Numerical model includes: a classical nucleation theory (CNT) implementation (nanoscale processes), multicomponent transport, kinetic reactions. Injection of 10 mM SrCl<sub>2</sub> and 10 mM Na<sub>2</sub>SO<sub>4</sub>  $\rightarrow$  celestine precipitation, crystal growth



Poonoosamy, J., Westerwalbesloh, C., Deissmann, G., Mahrous, M., Curti, E., Churakov, S.V., Klinkenberg, M., Kohlheyer, D., Von Lieres, E., Bosbach, D., Prasianakis, N.I., A microfluidic experiment and pore scale modelline diaenostics for assessing mineral precipitation and dissolution in confined spaces. *Chemical Geology*. 528, 5, 119264 (2019)

























High Performance Computing: Transport is fast, chemistry is slow, hybrid computer architecture



Current supercomputers allow to simulate geometries with > 10 billion voxels (grid points). Most advanced systems have hybrid CPU/GPU computational nodes. Transport and chemical calculations take place at every voxel, at every timestep

Swiss Supercomputing Center (CSCS) Piz Daint Nvidia Tesla P100 GP-GPUs



X-ray tomogram (1 Billion Voxels)



In this setup, ANN proves to be orders of magnitude faster **(10'000 times !!!)** compared to LMA and extremely accurate also compared to lookup table. **Overall speed up > 1'000x** 

Comparision of Calculations per second

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### Cement Clay interfaces

- Laboratory and field experiments show a porosity reduction on the clay side
  Necessity to predict the transport properties of altered interfaces through
- experiments and numerical simulations



Illustration of a combined repository for SF/HLW and for L/ILW (NTB-21-01, 2022)



Time evolution of the water content in the OPC-Na montmorillonite laboratory sample C5 over a time of  $\sim$ 300 days. (Shafizadeh, Gimmi, Van Loon, Churakov et al.)

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EURAD DONUT: Machine Learning and geochemistry benchmark: so far > 10 modelling teams



- CROSS-EURAD Collaborative effort Participants inside/outside EURAD continue to join
- Meetings every 1-2 months to discuss progress
- · Joint Development of methodologies and codes. Modelling teams are working closely together.
- Open source software is heavily used.

several machine learning techniques are explored within EURAD-DONUT e.g. polynomial chaos expansion, Gaussian processes, reduced base approach



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### Content

- Why and how nonlinear regression using ML can be useful in RTM simulation
- Brief overview of three popular ML methods for regression
  - kNN (lookup table + interpolation)
  - Gaussian processes (GP, "non parametric")
  - Artificial neural networks (NN, parametric & high-dimensional)
- Examples
  - Surrogate geochemical modeling to accelerate 2D RT simulations in a cement system
  - Full RTM surrogate modeling to enable uncertainty analysis (SA, UP, Inverse modeling) for the 1D transport of UVI in a soil column
- Outlooks

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## Why ML is useful?

- Geochemical calculations typically consume most of the computational time of RT simulations, say 80% to 90%
- Over large domains and/or for long simulation periods, RT simulations may become intractable (see table with times by Nikoleos)
  - Replace the geochemical solver of the RTM by a trained ML surrogate model
  - Some recent works : Huang et al. (2018), Guérillot and Bruyelle (2019), Leal et al. (2020), Prasianakis et al. (2020), De Lucia and Kühn (2021), Laloy and Jacques (2022), Demirer et al. (2022)
- Even for small domain and simulation period, CPU-time might be quite long, thereby preventing tasks such as SA, Uncertainty propagation, inverse modeling (model calibration)
  - Emulate output(s) of interest for the full RTM (flow + geochemistry), for given initial and boundary conditions
  - Laloy and Jacques (2019)

### 

### **Nonlinear regression methods**





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3 ISC: Restricted

### Some nonlinear regression methods

$$f(\mathbf{x}) = GP[m(\mathbf{x}), k(\mathbf{x}, \mathbf{x}')]$$
  
$$\overline{f}(\mathbf{x}^*) = \mathbf{k}_*^{\mathrm{T}}(\mathbf{K} + \sigma_n \mathbf{I})^{-1} \mathbf{y} = \sum_{i=1}^n \alpha_i k_* (\mathbf{x}_i, \mathbf{x}_*)$$
  
$$V[f(\mathbf{x}^*)] = k_* (\mathbf{x}_*, \mathbf{x}_*) - \mathbf{k}_*^{\mathrm{T}} (\mathbf{K} + \sigma_n \mathbf{I})^{-1} \mathbf{k}_*$$



### Some nonlinear regression methods

• Feedforward fully connected DNN

$$\boldsymbol{M}(\mathbf{x}) = f_3 \{ \mathbf{W}_3 f_2 [\mathbf{W}_2 f_1 (\mathbf{W}_1 \mathbf{x} + \mathbf{b}_1) + \mathbf{b}_2] + \mathbf{b}_3 \}$$



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#### Full RTM surrogate modeling

- Problem
  - Desorption of U(VI) from radionuclide-contaminated sediment
  - Multi-rate surface complexation with dual domain mass transfer and alternating hydrochemical composition at the column inlet
  - 13 input parameters
  - Output: times series of dissolved U(VI) concentration (mol/l) in the outflow node of the mobile domain
  - 500 runs in 17 days (4-core parallel)

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### Full RTM surrogate modeling



- ML methods: DNN, GP, PCE
- Tasks: (1) plain emulation, (2) global sensitivity analysis (GSA), (3) uncertainty propagation (UP), and (4) probabilistic calibration or inversion
- Training: 25, 75, 175 and 500 samples

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#### **Plain emulation**



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### Sensitivity analysis







### **Uncertainty propagation**

DNN-75	GP-75	PCE-75	DNN-175	GP-175	PCE-175	DNN-500	GP-500	PCE-500
0.0207	0.0041	0.0156	0.0207	0	0	0.0166	0.0166	0.0250
$\mu_{\mathrm{MAX}}~(10^{-7}$	mol/l), true val	lue is 5.346						
5.066	5.029	5.176	5.048	5.000	5.064	5.357	5.125	5.211
$\sigma_{\rm MAX}~(10^{-7}$	mol/l), true val	ue is 3.786						
3.605	3.083	2.961	3.520	3.033	2.898	3.557	3.284	3.531

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#### **Inverse modeling**



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### Surrogate geochemical modeling within the RTM

- Replace PHREEQC in HPx RT model by trained
  - kNN
  - DNN
  - Speedup > 1000 on a GPU vs single-threaded PHREEQC for 10,000 predictions at once
- After each transport step calculated by Hydrus
  - The C++ written HPx main module calls the Python-based kNN or DNN emulator
  - For each node, emulation of aqueous concentrations from total amounts and re-calculation of the solid amounts
  - For each node and time step, mass balance is honored, but potentially wrong distribution between aqueous and solid phases

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### **Problems**

- 2D leaching from hardened cement paste, 61x61 (3721) and 121x121 (14641) nodes, advective flow
- Portlandite, C-S-H solid-solution (CSHQ model of Kulik, 2011)
- CaO-SiO<sub>2</sub> system
  - 2 inputs (total Ca, and Si) –
- 4 outputs (aqueous Ca, H, O and Si)
- CaO-SiO<sub>2</sub>-Al<sub>2</sub>O<sub>3</sub>-CO<sub>2</sub>-SO<sub>3</sub> system
   Calcite, straetlingite, monocarboaluminate and ettringite
   5 inputs (total Ca, Si, Al, C and S) –
   7 outputs (aqueous Ca, Si, Al, S, C, O, H



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 PHREEQC consumes 80% to 90% of HPx computational budget using 4-cores parallelization (or 94% to 97% on a single-thread)

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#### Ca-Si –2D aqueous concentration maps at given time step

DNN & kNN speedup of 7 (max = 7.7) against HP-4 cores, 24.5 (max = 28.5) against HP-1 core









#### Ca-Si –2D solid amount maps at given time step



DNN & kNN speedup of 7 (max = 7.7) against HP-4 cores, 24.5 (max = 28.5) against HP-1 core





### CaO-SiO<sub>2</sub>-Al<sub>2</sub>O<sub>3</sub>-CO<sub>2</sub>-SO<sub>3</sub> system

- Here training an emulator from a set of samples that cover the whole possible input space **does not work**
- Good accuracy in training/testing split test but poor accuracy in reactive transport simulation!
- This even if the emulator is trained with up to 4,000,000 samples obtained either by LHS or by a low-discrepancy sequence (e.g., Sobol, also called QMC sampling) that more uniformly covers the input space
- For this problem the input (5 total amounts) and output (7 aqueous concentrations) spaces are quite nonlinearly related and both cover 6 to 10 orders of magnitudes depending on the considered chemical element.
- Our considered solution
  - Run a cheap reactive transport simulation: small domain / time period and collect input-output pairs. This simulation indicates potentially interesting directions in the input space.
  - Enrich this dataset by kernel density sampling (KDE).
  - Train the emulators using the ensemble of samples created in steps 1 and 2.

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(a) (a) (a) 0.0125 0.0125 0.125 0.04 0.0100 0.0100 0.100 [lom] moli lom 0.03 0.007 0.0075 0.0050 0.02 0.0050 Ctot Catot 0.050 Stot Sitot 0.01 0.0025 0.0025 0.025 0.0000 -0.000 0.0000 0.00 0 005 0.010 0.00 0.010 0 000 0.005 0.010 0.010 Altot [mol] Altot [mol] Altot [mol] Altot [mol] (b) (b) (b) (c) 0.0125 0.0125 0.125 0.04 0.0100 0.0100 0.100 [low] [lom] [lom] 0.03 [mol] 0.0075 0.0075 0.07 0.02 0.005 0.0050 Ca<sup>tot</sup> 0.050 Stot Stot Sitot 0.0025 0.01 0.0025 0.02 0.000 0.0000 0.00 0.0000 0.000 0.005 0.010 0.010 0.005 0.010 0.10 0.000 0.005 0.000 0.0 Ctot [mol] C<sup>tot</sup> [mol] C<sup>tot</sup> [mol] Catct [mol] (c) (d) 0.04 0.04 [lom] KDE + correction [lom 0.03 0.03 KDE • 0.02 0.02 Sitot [ Sltot Original 0.01 0.01 0.00 0.00 0.10 0.00 0.05 0.000 0.005 0.010 Catot [mol] S<sup>tot</sup> [mol] sck cen | 20 ISC: Restricted Reference





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#### Conclusions

- Full RTM emulation especially useful for SA and calibration
- Replacing geochemical solver in RT model by ML
  - Using a GPU, kNN and DNN are very fast close to optimal speedup in RT simulation
  - For our "simple" cement case study, replacing geochemical solver (PHREEQC) by an emulator in a RTM (HP) works well
  - For our or more complex cement case study, no emulator that is globally accurate over the whole possible input space could be devised offline
  - Building training set based on a cheap/lower fidelity full reactive transport simulation: not fully satisfying
  - DNN extremely sensitive to representativeness of training set, kNN is more robust but will suffer from the curse of dimensionality at some point
- Outlooks
  - Quality of training set
  - Implement an accept/reject criterion of the ML predictions, enrich kNN training set online by full calculation data
  - Physics Informed Neural Networks (PINN)

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### 4. Codes

### 4.1 Code 1 – GEM – Selektor

GEMS (<u>https://gems.web.psi.ch</u>) has been developed at PSI during 23 years. To date, GEMS is the most popular freely-available open-source GEM code and TDB kit for geochemical modelling, with >10'000 downloads and ca. 1'000 active users (CemGEMS web app, <u>https://cemgems.app</u> has >530 registered users), and about 1'400 publications where it has been used. Main parts of GEMS are: GEM-Selektor code; GEMS3K numerical library for use in coupled codes; and GEMSFITS coupled code for inverse modelling and parameterization.

The GEM-Selektor GUI code is used for the forward thermodynamic modelling (in Equillibria mode) and for manipulation with input thermodynamic and reaction formats (in Database mode). The forward problem is to find mole amounts n and activities a of chemical species in an equilibrium state defined by pressure p, temperature T and bulk elemental composition b. This is done in the GEMS3K code library by applying the IPM-3 GEM algorithm (Kulik et al., 2013), now available also with C, C++11 and Python 3 interfaces. From GEM results, any species concentrations, activity coefficients in any phase, partition and fractionation coefficients of elements between phases, and saturation indices can be obtained. The applicability of GEM is limited only by the knowledge of standard-state molar properties of end members and interaction parameters for phase-solutions (some provided in database files supplied with the code).

If some of GEM outputs are known from the experiments or from observations, then some input thermodynamic properties or interaction parameters of models of mixing can be retrieved by solving inverse thermodynamic modelling problems. This is the purpose of the GEMSFITS (Miron et al., 2015) code that has been successfully used recently in a number of funded projects.

#### Lecturer

Dmitrii Kulik, PSI, Switzerland

#### **Reading Material**

Kulik D.A., Winnefeld F., Kulik A., Miron G.D., Lothenbach B. (2021): CemGEMS – an easy-to-use web application for thermodynamic modeling of cementitious materials. RILEM Technical Letters, 6, 36-52, <u>doi</u>.

Miron G.D., Kulik D.A., Dmytrieva S.V., Wagner T. (2015): GEMSFITS: Code package for optimization of geochemical model parameters and inverse modeling. Applied Geochemistry 55, 28-45. <u>doi</u>.

Kulik, D.A., Wagner T., Dmytrieva S.V., Kosakowski G., Hingerl F.F., Chudnenko K.V., Berner U. (2013): GEM-Selektor geochemical modelling package: revised algorithm and GEMS33K numerical kernel for coupled simulation codes. Computational Geosciences 17, 1-24, .doi

#### Slides




















# Two modes of GEM-Selektor operation

Equilibria calculation mode

#### Thermodynamic database mode









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### Workflow of a single equilibrium calculation

- Define a new system (b, P, T)
- Set up and check the input bulk chemical composition (b)
- Calculate equilibrium speciation (x)



















### Activities of species from GEM dual solution

For any species in any phase present in equilibrium, the first Karush-Kuhn-Tucker condition  $\upsilon - \mathbf{A}^T u \ge 0$  expands into a generic *DualTh* equation  $\eta_i = \upsilon_i$ , or

$$\sum_{i} a_{ij} u_{i} = \frac{g_{j,T}^{\circ}}{RT} + \ln C_{j} + \ln \gamma_{j} + \Xi$$
 (GDTE)

Activity of any component in any multi-component phase at equilibrium is:

$$\ln a_j = \sum_i a_{ij} u_i - \frac{g_j^o}{RT}, \quad j \in L, \quad i \in N$$
 (DTAE)

Compare with a traditional calculation of "primal" activities:

$$\ln a_j = \ln C_j + \Xi + \ln \gamma_j$$

Both concentration  $C_i$  and activity coefficient  $\gamma_i$  are functions of the primal solution

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 $\hat{n}^{(x)}$ 

# Calculation of pe, Eh and pH in GEMS v3

For aqueous electron 
$$e_{aq}$$
,  $\ln a_e = -1 \cdot u_{Charge}$ . By defining  $pe = -\log_{10} a_e$    

$$pe = -\frac{1}{\ln 10} (-u_{Charge})$$
No e- species molality or activity coefficient is needed!  
Because  $pe \cdot RT \cdot \ln 10 = F \cdot Eh$   

$$Eh = \frac{RT}{F} \cdot u_{Charge}$$
Volts,  $F = 96485 \text{ C} \cdot \text{mol}^{-1}$  is the Faraday's constant  

$$pH = -\frac{1}{\ln 10} (u_H + u_{Charge})$$
Corresponds to defining  $pe = -\log_{10} a(H^+)$   
and conventional  $g^o(H^+) = 0$  at any  $T$  and  $p$   
Wolts. The species molality and activity coefficient is required!  
DualTh-calculated activities and their functions are more accurate than primal ones



## Calculation of species fugacity or activity

 $\mu_i - \mu_i^o = RT \ln a_i = RT \left( \ln f_i - \ln f^o \right)$ Relative activity of a gas can be defined as where the standard-state fugacity  $f^{o} = 1$  bar. Hence

$$\ln f_j = \sum_i a_{ij} u_i - \frac{g_j^o}{RT}, \quad j \in L_g, \quad i \in N$$
 DTAE

Example: fugacity of ideal methane (CH<sub>4</sub>) at T = 25 °C in any system containing C and H

$$\log_{10} f_{CH_{4,g}} = \frac{1}{\ln 10} \left[ u_{C} + 4u_{H} - (-20.44) \right]$$

No CH<sub>4</sub>,g or even no gas phase needs to be present in the mass balance

For any stable (solid) solution, the activity of any end-member is found from DTAE

$$\log_{10} a_{\text{Stront},s} = \frac{1}{\ln 10} \left[ u_{\text{Sr}} + u_{\text{C}} + 3u_{\text{O}} - \left( -461.77 \right) \right]$$

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# Calculation of phase stability index: Proof

For a single-component (pure substance) phase, DTAE yields the saturation index SI:

$$\Omega_{Sp} = \frac{1}{\ln 10} \left( \sum_{i} \mathbf{a}_{ip} u_i - \frac{g_p^{\circ}}{RT} \right), \quad p \in L_p, \quad i \in N$$



,BL

Proof: For an ionic solid BL, compare with usual definition

$$10^{\Omega_{S,BL}} = \frac{Q_{S,BL}}{K_{S,BL}} = \frac{(a_{B+}a_{L-})}{K_{S}}$$

Activities of aqueous ions and their product Q<sub>S,BL</sub> can be found using DTAE:

$$\ln Q_{S,BL} = \left[ u_{B} + u_{Charge} - \frac{g_{B+}^{\circ}}{RT} \right] + \left[ u_{L} - u_{Charge} - \frac{g_{L-}^{\circ}}{RT} \right] = u_{B} + u_{L} - \left( g_{B+}^{\circ} + g_{L-}^{\circ} \right) / (RT)$$
solubility product  $K_{S,BL}$  is defined as
$$\ln K_{S,BL} = -\left( g_{B+}^{\circ} + g_{L-}^{\circ} \right) / (RT) + \frac{g_{S,BL}^{\circ}}{RT} \right]$$
Which is the proof
$$\Omega_{S,BL} = \frac{1}{\ln 10} \ln \left( \frac{Q_{S,BL}}{K_{S,BL}} \right) = \frac{1}{\ln 10} \left( u_{B} + u_{L} - \frac{g_{S,BL}^{\circ}}{RT} \right)$$
which is the proof
$$\frac{22}{\ln 10} \left( \frac{Q_{S,BL}}{RT} - \frac{Q_{B+}^{\circ}}{RT} \right) = \frac{1}{\ln 10} \left( \frac{Q_{B+}}{RT} - \frac{Q_{B+}^{\circ}}{RT} \right)$$





# Phase stability indices in GEM-Selektor output



### 2. Phase metastability and kinetics

### Partial Equilibrium State concept

is used for setting up thermodynamic models of 'real-world' geochemical systems

#### Examples:

- •Surface water open to the atmosphere
- •Seawater oversaturated to dolomite
- •Iron monosulfide in marine sediments
- •Clinker phases in hydrated cements
- •Suspension of solid with adsorption and Ostwald

```
ripening ......
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#### TYPICAL ASSUMPTIONS:

- At least one phase (reaction) is not in chemical equilibrium with the rest of the system
- > Dissolution of minerals is the rate-limiting step
- > Solid solutions dissolve stoichiometrically
- Precipitation of secondary minerals is usually faster than the primary mineral dissolution
- > Some species (N<sub>2</sub>atm) or solid phases are inert

#### Implementations using time-dependent:

Reaction-path and process-extent models in geochemical codes



- Additional constraints on reaction species or on phases
- Mineral specific surface areas and sorption capacities
- Amounts of metastable phases linked to other phases

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## Metastability constraints in GEM IPM 3

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At given *T*, *p*, *b*, *g*°, and parameters of mixing in solution phases, find

such amounts of species (dependent components)  $n^{(x)} = \{ n^{(x)_j}, j \in L \}$  that

Mole balance

Total Gibbs energy function:

$$G(n^{(x)}) = \sum_{j} n_j^{(x)} \upsilon_j, \quad j \in I$$

 $v_j$  is primal chemical potential of j-th species

$$\upsilon_j = \frac{g_j^{\circ}}{RT} + \ln C_j + \ln \gamma_j + \Xi, \quad j \in$$

Extended KKT conditions  
for a partial equilibrium stateImage: Constraint of the equilibrium state
$$v_j - \hat{\eta}_j \ge 0$$
,  
 $(v_j - \hat{\eta}_j)\hat{n}_j^{(x)} = 0$ ,  $\hat{n}_j^{(x)} \ge 0$  $j \in D_0$  $n_j$  $D$  $v_j - \hat{\eta}_j \ge 0$ ,  
 $(v_j - \hat{\eta}_j)(\underline{n}_j^{(x)} - \hat{n}_j^{(x)}) = 0$  $j \in D_1$  $\underline{n}_j$  $v_j - \hat{\eta}_j \ge 0$ ,  
 $(v_j - \hat{\eta}_j)(\hat{n}_j^{(x)} - \bar{n}_j^{(x)}) = 0$  $j \in D_2$  $\overline{n}_j$  $v_j - \hat{\eta}_j \ge 0$ ,  
 $(v_j - \hat{\eta}_j + p_j \ge 0,$   
 $(v_j - \hat{\eta}_j + p_j)(\underline{n}_j^{(x)} - \bar{n}_j^{(x)}) = 0$  $Both$  $\underline{n}_j$  $v_j - \hat{\eta}_j + p_j \ge 0$ ,  
 $(\hat{n}_j \ge 0, \hat{p}_j(\hat{n}_j^{(x)} - \bar{n}_j^{(x)}) = 0$  $Both$  $\underline{n}_j$  $\sum_j \mathbf{a}_{ij}\hat{n}_j^{(x)} = n_i^{(b)}, \quad i \in N, \ j \in L$ Common  
balance  
 $\hat{p}_j$  $Lagrange multiplier conjugate to$   
 $j-th non-trivial two-side constraints(Karpov et al. 2001, Geochemistry International)$ 

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0

dll Portlandite 0.01 mol

+ lower amount constraint in MB

0.0004 mol

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n(Portlandite) = 0.01 mol

 $\Omega$ (Portlandite) = 0.183

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# Simplified cement systems (DONUT)

Bulk elemental compositions of simplified cement systems used in DONUT ML benchmarking and training project (moles), w/b ratio 0.5, 1 bar 25 °C

Element	Simple-C	Simple	Minimal-C	Minimal	Primitive-C	Primitive
AI	0.0882688	0.0882688	0.0882688	0.0882688	0	0
С	0.001	0	1	0	0.96	0
Са	1.123447	1.123447	1.123447	1.123447	1.123447	1.123447
CI	0	0	0	0	0	0
н	5.550837	5.550837	5.550837	5.550837	5.550837	5.550837
к	0.02186929	0.02186929	0	0	0	0
Mg	0	0	0	0	0	0
Na	0	0	0	0	0	0
Nit	0	0	0	0	0	0
0	5.463155	5.386216	7.262873	5.262873	7.05047	5.13047
S	0.0624491	0.03746946	0	0	0	0
Si	0.615801	0.615801	0.615801	0.615801	0.615801	0.615801
Zz	0	0	0	0	0	0

See "Cement-systems.xslx" files for recipes and other settings, hands-on sessions

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# UO<sub>2</sub>-montmorillonite systems (DONUT)

Bulk compositions of simplified UO<sub>2</sub>-clay systems used in DONUT ML benchmarking and training project (moles of independent components), 1 g/L clay, 1 bar 25 °C

Element	MontU-mini-c	MontU-mini	MontU-prim-c	MontU-prim			
С	0.00044	0	3.3E-07	0			
Са	0.001	0.001	0	0			
CI	0.102	0.102	0.1	0.1			
Clay	0.00087	0.00087	0.00087	0.00087			
Ess	2E-06	2E-06	2E-06	2E-06			
Esv	4E-05	4E-05	4E-05	4E-05			
Esw	4E-05	4E-05	4E-05	4E-05			
н	110.5111	110.5105	110.512	110.3677			
N	0	0	0	0			
Na	0.10142	0.100871	0.100871	0.100871			
Nit	0.00001	0.00001	0.00001	0.00001			
0	55.25689	55.25546	55.25618	55.18407			
U	1E-09	1E-09	1E-09	9E-08			
Zz	0	0	0	0			
See "ClauSert Lausterne velv" files for resince and other							



Nit atmospheric (nonreactive) nitrogen reactive nitrogen

Montmorillonite sorption: Clay ion-exchange site

strong edge site

See "ClaySorU-systems.xslx" files for recipes and other settings, hands-on sessions, use project "ML-B-MontU"

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### 4.2 Code 2 – ORCHESTRA

In this presentation I will give an overview of the motivation for developing ORCHESTRA, in what ways it is similar and different from other codes, and what implications this has for chemical and reactive transport modelling.

The ORCHESTRA code has a similar application area as e.g. PHREEQC and GEMS, but was specifically developed to allow users to create their own model extensions.

To make this possible, the internal structure of ORCHESTRA is quite different from that of other chemical solver codes. (Although its use is very similar)

In case of ORCHESTRA chemical (and physical) models (expressions, equations) are not defined in its source code but in a separate text file that is read as input. So all chemical models can be inspected, adapted or extended by users.

So whereas standard codes allow users to compose chemical models systems from a fixed set of predefined building blocks, (such as chemical elements, aqueous species, solid phases and a set of adsorption models etc.) ORCHESTRA makes it possible to extend this set and is therefore often used e.g. for adsorption model development, or other non-standard chemical applications.

However, for the "standard" chemical processes that are the subject of this course the existing set of models will be sufficient.

ORCHESTRA comes with a large set of predefined chemical (adsorption) models, and a graphical user interface that enables users to set up chemical systems by selecting substances and reactions from thermodynamic databases.

This graphical user interface also allows to generate stability/predominance diagrams.

ORCHESTRA is written in Java, but within the DONUT project a C++ version of the chemical solver was developed to facilitate integration with other (transport or PYTHON) codes.

#### Lecturer

Hans Meeussen, NRG, The Netherlands

#### **Reading Materials**

www.meeussen.nl/orchestra

ORCHESTRA: An Object-Oriented Framework for Implementing Chemical Equilibrium Models | Environmental Science & Technology (acs.org)

Slides















- Coupled Thermo, Hydro, Mechanical Chemical (THMC) models are used in evaluating waste disposal facilities/scenarios
- **Predict evolution** of waste packages, repository and behavior of nuclides
- (e.g. PREDIS, ACED, CORI projects, etc.)
- Geo-chemistry plays central role
- Takes up most of the calculation time (90%)
- Is relatively complex
- Existing modules (e.g. PHREEQC, GEMS, ORCHESTRA) are used





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# What is a (geo) chemical solver

- Calculates equilibrium composition of set of chemical substances (species) and set of chemical reactions,
  - by iteratively solving set of non-linear equations,
  - or by minimizing set of functions (Gibbs free energy of system)

#### ▶ Input:

- Set of chemical reactions thermodynamic constants (from database)
- total amounts of elements (or components, master species)
- Output: concentrations of individual chemical species
  - Including: distribution over species with different mobility (e.g. dissolved, precipitated, gaseous, colloidal etc.

























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## 1. Demonstration

- 1) Ca-CO2 system
- 2) Cement hydration (solid solution)
- 3) Uranium system (adsorption models)
- 4) 1d U Transport





### 4.3 Code 3 – PHREEQC

The geochemical solver PHREEQC is a powerful geochemical code for aqueous speciation, mineral equilibria, multi-site cation exchange, complex surface complexation modelling, exchange with a gasphase, solid solutions and kinetic reactions. It gives a large flexibility for modelling different geochemical systems and experimental set-ups including titration, speciation plots, etc. Moreover, PHREEQC has the possibility to perform one-dimensional advective-dispersive transport under steady-state flow conditions and multi-dimensional diffusive transport. The current version is 3.7.3. The wrappers iPHREEQC and PHREEQCRM provides libraries to work with PHREEQC from Excel, python, R, fortran, C++, ... In one or another form, PHREEQC has been coupled with different transport solvers which can be used for different areas and research questions for several engineering and environmental application

In this presentation, we focus further on the PHREEQC version embedded in the HPx software. Originally, it referred to coupling of PHREEQC-3 to the HYDRUS family of flow and transport codes. The framework developed for that coupling has been extended to different geochemical solvers and transport solvers. Now, HPx refers to the core that handles geochemical calculations and the exchange of the relevant state variables to transport solvers. Beside a fresh GUI for smooth project-oriented implementations of geochemical problems (HPGeoChemistry), the PHREEQC version in HPx is extended with additional scripting languages, using of inline variables, and an alternative plotting definition. HPx also couples HYDRUS 1D and 2D for unsaturated transient-variable water flow, multicomponent transport and heat transfer with different geochemical solvers (PHREEQC and ORCHESTRA) and can uses python libraries for surrogate modelling. The framework is also used to couple the geochemical solvers with MS3D-USGS.

#### Lecturer

Diederik Jacques, SCK CEN, Belgium

#### **Reading Materials**

PHREEQC website: https://www.usgs.gov/software/phreeqc-version-3

HYDRUS 5.0 website: https://www.pc-progress.com/en/Default.aspx?hydrus

Jacques, D., et al., *Modeling Coupled Hydrologic and Chemical Processes: Long-Term Uranium Transport following Phosphorus Fertilization.* Vadose Zone Journal, 2008. **7**(2): p. 698-711.

Jacques, D., et al., *Modelling coupled water flow, solute transport and geochemical reactions affecting heavy metal migration in a podzol soil.* Geoderma, 2008. **145**(3-4): p. 449-461.

Jacques, D., et al., *The HPx software for multicomponent reactive transport during variably-saturated flow: Recent developments and applications.* JOURNAL OF HYDROLOGY AND HYDROMECHANICS, 2018. **66**(2): p. 211-226.

Parkhurst, D.L. and L. Wissmeier, *PhreeqcRM: A reaction module for transport simulators based on the geochemical model PHREEQC.* Advances in Water Resources, 2015. **83**(0): p. 176-189.

Charlton, S.R. and D.L. Parkhurst, *Modules based on the geochemical model PHREEQC for use in scripting and programming languages.* Computers & Geosciences, 2011. **37**(10): p. 1653-1663.

Slides























### Some "hardcoded" processes



### Some "hardcoded" processes





















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#### 4.4 Code 4 – iCP

The interface Comsol PhreeqC, or iCP, is a reactive transport simulator that couples two standalone simulation softwares: <u>Comsol Multiphysics®</u> and the geochemical simulator PhreeqC. iCP maximizes the synergies between these codes, providing a numerical platform that can efficiently simulate a wide number of multiphysics problems coupled with geochemistry. iCP is a powerful tool for those consultants or researchers who need to tackle coupled geochemical problems. The flexibility and wide applicability of iCP make it suitable for a large number of modelling challenges, which cover most of the needs of both industry and academia.

In this introduction to iCP we will give a brief overview of the implementation of the tool and its capabilities. We will also demonstrate these capabilities with several examples of iCP applications to reactive transport modelling in the nuclear waste management sector including coupled thermo-hydrochemical processes, fracture flow, multiphase flow and mechanics



Lecturer

Emilie Coenen, Amphos21, Spain

#### **Reading Material**

Nardi, A., Idiart, A., Trinchero, P., de Vries, L. M., and J. Molinero. Interface COMSOL-PHREEQC (iCP), an efficient numerical framework for the solution of coupled multiphysics and geochemistry. Computers & Geosciences 69 (2014): 10-21.

More information on iCP can be found on the Techlabs webpage of Amphos 21: https://techlabs.amphos21.com/technology/interface-comsol-phreeqc/

#### Slides











#### OUR MISSION

Our driving force is reducing the environmental impact associated with industrial and economic activities needed for the development of our society.



























































































### 4.5 Code 5 – CRUNCH

For abstract, see section 3.4.

#### Lecturer

C.I. Steefel, Lawrence Berkeley National Laboratory, United States

#### **Reading Material**

For abstract, see section 3.4

#### Slides





## Introduction to Reactive Transport Modeling with CrunchTope/CrunchClay

### Carl Steefel Christophe Tournassat

February 7, 2023 Eurad Training Bern, Switzerland





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- Additional support was provided by the Center for Nanoscale Control of Geologic CO<sub>2</sub>, an Energy Frontier Research Center funded by the U.S. Department of Energy, Office of Science, Basic Energy Sciences.
- This work was supported as part of the Watershed Function Science Focus Area at Lawrence Berkeley National Laboratory funded by the U.S. Department of Energy, Office of Science, Biological and Environmental Research.





### Latest CrunchTope/CrunchClay Executables

#### CrunchTope Release v2.10 (Feb.6, 2023)

https://github.com/CISteefel/CrunchTope/releases/tag/v2.10

Intel® oneAPI DPC++/C++ Compiler Runtime for Windows Intel® Fortran Compiler Runtime for Windows

### Latest Install Package for Windows/Linux/Mac

git clone -b release https://gitlab.com/petsc/petsc

CrunchTope Source https://github.com/CISteefel/CrunchTope

### **Intel oneAPI Compilers**

https://www.intel.com/content/www/us/en/d eveloper/tools/oneapi/toolkits.html#gs.paa9c0

# Transport and Reaction Processes





## **Closed versus Open Systems**



### **Characteristic Reaction and Transport Times**

#### **Conservation Equation**

$$\frac{dM}{dt} = J_{in} - J_{out} - R = C_{in}Q_{in} - C_{out}Q_{out} - R$$

#### **Steady State**

$$R = kC_{out}V = C_{in}Q_{in} - C_{out}Q_{out}$$

**Residence Time** 

$$\tau_{res} = V / Q$$

### **Ratio of Characteristic Times**

$$\frac{k}{\tau_{res}} = \frac{kV}{Q} = \frac{\left(C_{in} - C_{out}\right)}{C_{out}}$$



t = time M = mass of solute Q = volumetric flow rate V = volume of reactor C = concentration of solute R = reaction rate





## **Advective Transport**



$$J_{adv} = \phi v C_i$$

## **Diffusive Transport**

Fick's 1st Law 0.14 0.12  $J_i = -D_i \frac{\partial C_i}{\partial x}$ Concentration 0.1 0.08 0.06 Diffusive flux is proportional 0.04 to the concentration gradient 0.02 0 0 0.2 Fick's 2<sup>nd</sup> Law  $\frac{\partial C_i}{\partial t} = \frac{\partial}{\partial r} \left[ J_i \right] = -D_i \frac{\partial^2 C_i}{\partial r^2}$ 









## **Hydrodynamic Dispersion**

Treatment of dispersive flux as a Fickian process

$$J_i^{disp} = -D_h \frac{\partial C_i}{\partial x}$$

**Dispersion coefficient** 

 $D_L = \alpha_L V_i; D_T = \alpha_T V_i$ 

Does not capture the time dependence of the dispersion coefficient, which grows as the plume advances

Overestimates mixing and its effect on reactions

## **Taylor-Aris Dispersion**









## Macrodispersion







### Non-Dimensional Numbers Péclet and Damköhler

Advection-dispersion-reaction equation

$$\frac{\partial C_i}{\partial t} = -v \frac{\partial C_i}{\partial x} + D^* \frac{\partial^2 C_i}{\partial x^2} - Ak(C - C_{eq})$$

Non-dimensional form of advection-dispersion-reaction equation

$$\frac{\partial C_i}{\partial t'} = \frac{1}{Pe} \frac{\partial^2 C_i}{\partial x'^2} - \frac{\partial C_i}{\partial x'} - Da_I(C - C_{eq})$$

Péclet number

Damköhler I number

Damköhler II number

$$Pe = \frac{t'_A}{t'_D} = \frac{vl}{D^*}$$

$$Da_I = \frac{t'_R}{t'_A} = \frac{Akl}{v}$$

$$Da_{II} = \frac{t_R'}{t_D'} = \frac{Akl^2}{D^*}$$

## **Effect of Peclet Number**









## **Effect of Damköhler Number**

## **Analytical Solutions to ADR Equation**

Solutions in one dimension for linear kinetics take the form

$$C' = e^{-\alpha' x'}$$

### Pure advective transport

$$\alpha' = Da_I = \frac{Akl}{v}$$

Pure diffusive transport

$$\alpha' = Da_{II} = \frac{Akl^2}{D^*}$$

### Mixed advective and diffusive transport

$$\alpha' = \frac{1}{2} \left( \sqrt{Pe^2 + 4Da_I \cdot Pe} - Pe \right) = \frac{1}{2} \left( \sqrt{Pe^2 + 4Da_{II}} - Pe \right) = \frac{1}{2} \left[ \sqrt{\left(\frac{vl}{D}\right)^2 + 4\frac{Akl^2}{D}} - \frac{vl}{D} \right]$$







## **Equilibration Length Scales**

# **Multicomponent Geochemistry**





## **Aqueous Speciation**

**Canonical Form** 

$$HCO_3^- \rightleftharpoons CO_3^{2-} + H^+$$

$$A_{i} \rightleftharpoons \sum_{j=1}^{N_{c}} V_{ij} A_{j} \quad (i = 1, ..., N_{x}),$$

Secondary Species

$$K_{eq} = \frac{\left[CO_3^{2-}\right]\left[H^+\right]}{\left[HCO_3^-\right]}$$
$$\left[HCO_3^-\right] = \frac{\left[CO_3^{2-}\right]\left[H^+\right]}{\left[HCO_3^-\right]}$$

$$K_{eq}$$

$$X_{i} = K_{i}^{-1} \gamma_{i}^{-1} \prod_{j=1}^{n} (\gamma_{j} C_{j})^{\nu_{ij}} \quad (i = 1, ..., N_{x}),$$

### **Total Concentration**







## Michaelis-Menten (Monod) Kinetics

Dual Monod

$$R_m = k_{\max} \left[ \frac{[C_E]}{[C_E] + K_{S_E}} \frac{[C_D]}{[C_D] + K_{S_D}} \right]$$

E = electron acceptor D = electron donor

Inhibition Term

$$I_m = \left(\frac{[C_{in}] + K_{in}}{K_{in}}\right)$$

## Mineral Dissolution/Precipitation Rate Laws







## **Cation Exchange**

Exchange reaction involving Cs<sup>+</sup> and a competing cation

$$Cs^+ + \frac{1}{m}MX(i)_m \leftrightarrow CsX(i) + \frac{1}{m}M^{m+1}$$

Gaines-Thomas convention for activity of an exchange species

Cation charge 
$$\beta(i)_{M} = \frac{z_{M}q(i)_{M}}{\sum_{M} z_{M}q(i)_{M}}$$
 Moles/g

Selectivity Coefficient

$$K_{M/Cs} = \frac{\beta(i)_{M}^{-1/m} [Cs^{+}]}{\beta(i)_{Cs} [M^{m+}]^{1/m}}$$

Cation Exchange Capacity

Single exchange site

Multiple exchange sites

$$CEC = \sum_{M} z_{M} q_{M}$$

 $CEC = \sum_{i} \sum_{M} z_{M} q(i)_{M}$ 

## Surface Complexation







#### **Electrical Double Layer** inner Helmholtz plane outer Helmholtz plane slip plane Double Layers between water molecule Θ **Charged Surfaces** Э nonspecifically adsorbed cation, hydrated $\Psi = \zeta$ specifically adsorbed ation, partially hydrated e specifically adsorbed anion, nonhydrated surface charge



Solid line: Overlapping double layers Dashed line: No opposite wall present

z = h

After Schoch et al, 2008

### **Nernst-Planck Equation**

$$\mu_{j} = \mu_{j}^{0} + RT \ln a_{j} + z_{j}F\psi = \mu_{j}^{0} + RT \ln (\gamma_{j}C_{j}) + z_{j}F\psi$$
Chemical Electrostatic
Potential Potential

$$J_{j} = -u_{j}C_{j}\frac{\partial\mu_{j}}{\partial x} = -\frac{D_{j}C_{j}}{RT}\frac{\partial\mu_{j}}{\partial x}$$

Mobility

 $\Psi_{s}$ 

ζ

 $\psi_d$ 

Ψi ų

$$J_{j} = -D_{j}\nabla C_{j} - \frac{z_{i}F}{RT}D_{i}C_{i}\nabla\psi - D_{j}C_{j}\nabla\ln\gamma_{j}$$

Fickian Electrochemical Diffusion Migration

**Activity Coefficient** Gradient

$$J_j = -D_j \nabla C_j - \frac{z_i F}{RT} D_i C_i \nabla \psi$$







### **Poisson-Nernst-Planck (PNP) Equation**



$$\nabla \bullet \left[ \varepsilon_0 \varepsilon_r \nabla \psi \right] = -F \sum_i^N z_i C_i$$

$$J_i = -D_i \nabla C_i - \frac{z_i F}{RT} D_i C_i \nabla \psi$$

Leads to (unmodified) Poisson-Nernst-Planck system of equations

Tournassat & Steefel, 2015

 $\psi$ : electrical potential

- $\boldsymbol{\varepsilon}_0$ : free space permittivity
- $\varepsilon_r$ : relative permittivity
- F: Faraday's constant







### **Mean Electrostatic Potential Approach**

$$\mu_i^{EDL} = \mu_i^B \qquad C_i^{EDL} = C_i^B \exp\left(\frac{-z_i e \psi_m}{k_B T}\right)$$

Concentration in diffuse layer (EDL) related to concentrations in bulk water (B) through the mean electrical potential,

of the diffuse layer  $\varphi_m$ 

$$\phi^{EDL} \sum_{i} z_{i} C_{i}^{EDL} = Q^{SL} = \sum_{k}^{NS} z_{k} \Gamma_{k}$$

Solve for mean electrical potential of diffuse layer from charge balance of mineral surface charge,  $Q^{SL}$ , and the diffuse layer

# Why use a reactive transport model?

- ✓ Describes open systems where fluxes drive reactions
- Describes time dependent processes (e.g. kinetics, transport)
- ✓ Quantitative test of hypotheses

# Why use a multicomponent RTM?

- ✓ Effects of multiple species and minerals on thermodynamics of (bio)reactive system (pH effects on rates, inhibition)
- ✓ Competitive effect of other ions on contaminant sorption
- ✓ Effects of dissolved, sorbed and solid phase bioavailabiltiy

### Why use a coupled RTM?

- ✓ Diffusive, dispersive and advective transport rather than ad hoc mixing schemes
- ✓ Spatially distributed basis includes heterogeneity
- Relatively easy to couple to other timedependent processes (e.g. sediment transport, salinity)

# Why model contaminants with RTM?

- ✓ Considers multiple aqueous and surface complexation pathways and effects on contaminant mobility
- Degradation via multiple biogenic and abiotic pathways





# **SHORT COURSE EXERCISES**

### **Short Course Exercises**

#### Introduction to speciation

- Example using the carbonate system featuring various constraints
- Stable isotopes of carbon (<sup>12</sup>C and <sup>13</sup>C) implemented to demonstrate equilibrium fractionation

#### **Advective transport**

- Introduce a non-reactive tracer into an advective flow field
- Investigate numerical dispersion

#### **Diffusive transport**

- Introduce a non-reactive tracer into a purely diffusive transport problem
- No-flux versus Dirichlet boundary conditions

#### **Multicomponent diffusion**

- Concept of charged species diffusing at different rates and electrochemical migration
- Stable isotopes of Cl are implemented to consider the influence of diffusive fractionation

#### **Transverse dispersion**

 Example based on a recent 2D dispersion experiment, including multi-ion diffusion in an advective flow field

#### lon exchange

 Introduce ion exchange of cesium in a 1D sediment column with competing Na<sup>+</sup>

#### Surface complexation

 Surface complexation of zinc on iron-hydroxide (PHREEQc example 8)

#### CO<sub>2</sub> attack on reservoir rocks

• Diffusion of gas and flow of water, with variable liquid saturations and multi-mineral nucleation, precipitation, and dissolution

#### Calcite precipitation with isotopes

 Simulation of stable isotope kinetic fractionation of calcium during carbonate precipitation

#### Two-dimensional flow fields

• Xie et al (2015) benchmark on porosity and permeability change due to mineral reaction

#### Diffusion in clay

Tournassat & Steefel, 2016

#### Inverse modeling with PEST-CrunchFlow

• Steefel et al, 2003







### **CrunchTope Files**

OUTPUT			
time_units	hours		
spatial_profile	16.0 32.0		
time_series	Rolle.out	11 20	1
time_series_print    K+  Mg++  Cl-			
time_series_interval 1			
END/			

*spatial\_profile* generated automatically at times specified (16, 32 hours)

time\_series saved every
time\_series\_interval in file Rolle.out

time\_series\_print writes species
specified in file Rolle.out

Spatial profile files include:

- 1. totcon#.tec total concentrations in solution
- 2. pH#.tec solution pH
- 3. conc#.tec log concentrations of individual species
- 4. rate#.tec mineral reaction rates (mol/L(bulk)/s)
- 5. aq\_rate#.tec aqueous reaction rates (mol/L/s)
- 6. volume#.tec mineral volume fraction (dimensionless)
- 7. porosity#.tec (dimensionless)
- 8. velocity#.tec Darcy flux (m<sup>3</sup>/m<sup>2</sup>/yr)
- 9. toperatio\_aq#.out per mil
- 10. toperatio\_min#.out per mil








#### 4.6 Code 6 – MIN3P – Assessing far-field and near-field geochemical stability in the context of deep geologic repositories for spent nuclear fuel – Reactive transport modeling with MIN3P-THCm

MIN3P-THCm is a general-purpose reactive transport code for simulation of flow and reactive transport processes in the subsurface. In Canada, the Nuclear Waste Management Organization (NWMO) is responsible for designing and implementing the country's plan for the safe, long-term management of used nuclear fuel and is currently evaluating potential sites for a deep geologic repository (DGR) in either sedimentary or crystalline rock. MIN3P-THCm has been used to assess various aspects of longterm geochemical stability in the context of DGRs in support of site characterization in both the far-field and the near-field. The goal of the far-field simulations was to assess the geochemical stability of pore water at repository depth over long time periods (on the order of 100,000 years). Due to the geographic location of Canada, it is necessary to consider the impact of the advance and retreat of a continental ice sheet on flow and reactive transport processes. In the case of sedimentary rocks, simulations were conducted on the scale of a sedimentary basin, taking into consideration the various stratigraphic units, including shales, limestones, sandstones and evaporite units. In the case of crystalline rock, simulations were designed to evaluate the interplay between flow and reactive transport processes in fractured granitic media accounting for exchange of solute between fractures and the matrix. In both cases, the emphasis was on assessing the ingress and attenuation of dissolved oxygen in the rock. In addition, near-field simulations were conducted with MIN3P-THCm to evaluate the performance of engineered barrier systems composed of concrete and bentonite, in contact with host rock. In this presentation, we will provide an overview on the approach, challenges and outcomes of these modeling studies.

#### Lecturer

K. Ulrich Mayer, University of British Columbia, Department of Earth, Ocean and Atmospheric Sciences, Vancouver, BC, Canada

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#### **Reading Material**

Bea, S.A., U.K. Mayer, and T.B. Macquarrie, 2016. Reactive transport and thermo-hydro-mechanical coupling in deep sedimentary basins affected by glaciation cycles: model development, verification, and illustrative example. **Geofluids** 16:279-300.

Bea, S.A., D.Y. Su, K.U. Mayer, and K.T.B. MacQuarrie, 2018. Evaluation of the Potential for Dissolved Oxygen Ingress into Deep Sedimentary Basins during a Glaciation Event. **Geofluids** DOI Unsp 9475741, 10.1155/2018/9475741..

Spiessl, S.M., K.T.B. MacQuarrie, and K.U. Mayer, 2008. Identification of key parameters controlling dissolved oxygen migration and attenuation in fractured crystalline rocks. **Journal of Contaminant Hydrology** 95:141-153.

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Xie, M.L., D.Y. Su, K.U. Mayer, and K.T.B. MacQuarrie, 2022. Reactive transport investigations of the longterm geochemical evolution of a multibarrier system including bentonite, low-alkali concrete and host rock. **Applied Geochemistry** 143.

#### Slides







# Main Simulation Capabilities

- Variably saturated flow (Richards equation)
- Multicomponent reactive transport in aqueous and gas phase
- Energy balance
- High ionic strength solutions and density effects
- Geochemical reactions
  - Homogeneous: intra-aqueous
  - Heterogeneous: gas exchange, minerals, surface reactions
  - Equilibrium and kinetic
  - Database-driven

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MIN3P-THCm Numerical Methods							
<ul> <li>Modified Newton-Raphson methods for flow and reactive transport solutions</li> </ul>							
	<ul> <li>Global Implicit Approach (GIA) for reactive transport equations</li> </ul>						
	<ul> <li>Picard iteration for density coupling</li> </ul>						
	<ul> <li>Globally and locally mass-conservative</li> </ul>						
	<ul> <li>Adaptive time stepping</li> </ul>						
	<ul> <li>Efficient iterative sparse matrix solvers</li> </ul>						
<ul> <li>Parallelization for shared and distributed memory</li> </ul>							
<ul> <li>Structured and unstructured grids</li> </ul>							
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# Benchmarking and Model Verification

- Verification by comparison to other numerical models or analytical solutions for specific code capabilities
- Participation in international benchmarking and code intercomparison exercises
  - Documented in two special issues of *Computational Geosciences* 
    - 2010: MoMaS intercomparison
    - 2015: SSBench Workshop Series (2011-2014)







# Far field Geochemical Stability of Deep Sedimentary Basins



Location and main geology features for the intracratonic sedimentary basins in North America (Illinois Michigan and Appalachian basins, taken from McIntosh and Walter, 2005)

Primary goals: conduct full coupled reactive transport simulations in a sedimentary basin affected by a glaciation/deglaciation event.









# Model Setup and Boundary Conditions



Illustration of boundary conditions during different stages

- (a) pre- and post-glaciation stage (< 4000 or > 28000 yrs); hydraulic head and temperature are linearly distributed along the top boundary;
- (b) ice sheet advance (4000-20000 yrs); zero-flux flow boundary and zero temperature beneath the ice sheet;
  - ) ice sheet retreat (20000-28000 yrs); hydraulic head beneath the ice sheet is specified as 90% of the ice sheet thickness; zero basal temperature.

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# Initial Distribution of Porosity and Hydraulic Conductivity













## Rates of Mineral Dissolution-Precipitation During Period of Deglaciation





✓ Simulated porosity changes are very small over the time period of 32,500 years

✓ Limitation of spatial discretization: cell dimensions are probably inadequate to capture local-scale processes





















- Materials include bentonite, low-alkali concrete and host rock
- Limestone and granite
- Diffusion dominated
- Evolution of porosity at interfaces?
- Effects on solute migration?



Xie et al., Appl. Geochem., 2022



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- MIN3P-THCm has been developed and maintained for nearly 30 years
- The code has proven useful for simulating near-field and far-field scenarios related to the safe geologic storage of spent nuclear fuel
- Applied to both sedimentary and crystalline rock environments
- Simulations indicate limited O<sub>2</sub> ingress in far-field simulations under glaciation deglaciation conditions due to hydraulic constraints and redox buffering
- Near-field simulations of Engineered Barrier Systems indicate that secondary mineral formation is beneficial in case of canister failure
- Current efforts focus on the generation and fate of elevated dissolved sulphide in sedimentary basins and further development of simulation capabilities for fractured systems with non-orthogonal fractures







# Acknowledgements



# Thank you!

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Additional Information on code on-line (with download options):									
• MIN3	MIN3P webpage: <u>https://www.min3p.com/</u>								
• MIN	MIN3Pro webpage (GUI version): <u>https://mypage.science.carleton.ca/~richardamos/min3pro/</u>								



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### 4.7 Code 7 – CORE

CORE is a series of **C**omputer **C**odes for transient saturated or unsaturated water flow, heat transport and multicomponent **RE**active solute transport under both local chemical equilibrium and kinetic conditions in heterogeneous and anisotropic porous and fractured media. The codes use the finite element method. The series of codes includes: 1) VISUAL-CORE, a user-friendly version; 2) INVERSE-CORE<sup>2D</sup>, a version for automatic estimation of reactive transport parameters; 3) BIOCORE<sup>2D</sup>, a version which accounts for microbial processes in addition to geochemical reactions; 4) CORE<sup>3D</sup>, a fully 3D version of the code; 5) INVERSE-FADES-CORE V2, a finite element code for modelling non-isothermal multiphase flow, heat transport and multicomponent reactive solute transport in deformable media; and 6) CORE<sup>2D</sup>V5, the most updated version which considers the porosity feedback effect caused by mineral dissolution/precipitation reactions and the update of flow and transport parameters (Águila et al, 2020). CORE codes have been extensively verified against analytical solutions and other reactive transport codes and widely used to model groundwater flow and solute transport in aquifers, laboratory and in situ experiments and the long-term geochemical evolution of radioactive waste repositories.

The presentation of CORE codes will include: 1) A brief description of the main capabilities, features, and numerical methods; and 2) Some selected applications of the codes related to HLW radioactive waste disposal, which were performed within the context of the ACED and DONUT Work Packages of the EURAD Joint Project.

#### Lecturer

Javier Samper, Luis Montenegro & Alba Mon, Centro de Investigaciones Científicas Avanzadas (CICA), E.T.S. Ingenieros de Caminos, Canales y Puertos, Campus de Elviña, University of A Coruña, 15071-A Coruña, Spain

#### **Reading Materials**

- Águila, J.F., Samper, J., Mon, A., Montenegro, L. (2020). Dynamic update of flow and transport parameters in reactive transport simulations of radioactive waste repositories. *Appl Geochem* 2020, *117*, 104585. <u>https://doi.org/10.1016/j.apgeochem.2020.104585</u>
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Slides







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CORE presentation





### General features of the CORE codes

- CORE: Series of computer **CO**des for saturated/unsaturated water flow, heat transfer and multicomponent **RE**active solute transport in porous and fractured media
- Saturated/Unsaturated flow through porous media
- Solute transport with geochemical reactions
- Heat transfer
- Homogeneous & heterogeneous media
- Isotropic & anisotropic media
- Dimensions: 1D, 2D & 3D axisymmetric

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### General features of the CORE codes

- · Galerkin finite elements with linear weigting and basis functions
- Finite differences for time integration (Euler scheme)
- Newton-Raphson method for unconfined aquifers and unsaturated flow
- Direct and inverse problems
- Iterative sequential approach for reactive transport
  - Transport equations are decoupled from geochemical reactions
- Language: FORTRAN

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### General features of the CORE codes











- - Several options for time units, but one must be consistent
- The simulation time is subdivided into time periods
- Each time period is subdivided into N time increments
- · For each time period
  - Duration
  - Number of time increments











- Total porosity
- Molecular diffusion coefficient
- Longitudinal & transverse dispersivities
- Dry density (for retardation)
- Accesible porosity (for anion exclusion)

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• Flow and solute transport parameters of the medium are defined by material zones







### **Specific features: types of chemical reactions**

- Homogeneous reactions (single phase)
  - Aqueous complexation
  - Redox
- Heterogeneous (several phases)
  - Mineral dissolution/precipitation
  - Gas solution/exsolution
  - Sorption
    - Cation exchange
    - Surface complexation
- · The user selects the species needed for a given problem
  - List the names of species:

'calcite' -1.000 'h+' +1.000 'ca+2' +1.000 'hco3-'

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### Specific features: thermodynamic databases

- Selection and format of the CORE TDB
  - CORE series codes rely on several TDB such as ThermoChimie v10a or the com TDB of EQ3/6
    - The user can select the TDB
    - The selected TDB have to be used in the CORE TDB format
  - CORE TDB format: CORE codes use 2 TDB to calculate the logK for each chemical reaction
    - TDB at 25°C: "master25.dat" with a value of logK at 25°C
    - TDB at T variable: "masterte.dat" with 8 values of logK at 0, 25, 60, 100, 150, 200, 250 and 300 °C

$$\log K (0-300 \circ C) = \frac{b_1}{T^2} + \frac{b_2}{T} + b_3 \cdot \ln T + b_4 + b_5 \cdot T$$

 $b_1, b_2, b_3, b_4$  y  $b_5$  are coefficients calculated wiht this function for each chemical reaction by using the 8 logK values of "masterte.dat"

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### **Specific features: thermodynamic databases**

- "masterte.dat" example
  - The 2 CORE TDB contains 5 blocks of information: primary species, aqueous complexes, minerals, gases and complexation complexes
    - · Components and stochiometry of the chemical reaction
    - 8 values of logK at 0, 25, 60, 100, 150, 200, 250 and 300 °C
    - · Charge and size of the ions
    - · Molar volume of the minerals
  - The user can modify the CORE TDB (change a log K, add a new reaction, ...)

```
Aqueous complex TDB format example

'nh4+'(4)-2.000 'o2(aq)' +1.000 'h2o' +1.000 'no3-' +2.000 'h+' +58.1088 +52.8591

+46.5407 +40.4988 +34.2478 +29.0289 +24.5194 +20.4271 +3.00 +1.00
```

Mineral TDB format example

```
'calcite' 36.934(3)-1.000 'h+' +1.000 'ca+2' +1.000 'hco3-' +2.2257 +1.8487 +1.3330 +0.7743 +0.0999 -0.5838 -1.3262 -2.2154
```

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### Specific features: kinetic database

- Selection and format of the CORE kinetic database
  - CORE series codes use a kinetic database with data at 25 °C
    - "kinetics.dat"
  - The user can select between thermodynamic or kinetic control













### **Selected applications**

 2D & 3D numerical models for the Spanish site of interim surface storage of high-level radioactive waste (HLW)



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# **Selected applications**

• Water flow & multicomponent solute transport with chemical and biological reactions for geological high-level radioactive waste disposal



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### **Selected applications**

- Numerical models of flow and transport of laboratory and in situ experiments
- Natural clays and compacted bentonites
- · Reactive transport models
  - Coupled thermal (T), Hydrodynamic (H), chemical (C), mechanical (M) and microbial (B) processes
  - Interactions of carbon-steal corrosion products with bentonites and clay host rocks
  - Interactions of concrete degradation products with bentonites and clay rocks
- CORE codes have been used within the context of many research projects of the European EURATOM Program
  - Mol: CERBERUS
  - Bure: DIR
  - Grimsel: FEBEX I, II FEBEX-DP
  - Aspo: Redox, REX, Task Force 5
  - Mont Terri: DR

### **Selected applications**

- ACED (Assessment of Chemical Evolution in ILW & HLW repositories)
- Task 2: reactive transport models of the interactions of steel corrosion products and bentonite
- Task 4: reactive transport models for the long-term of a disposal cell in a HLW repository in granite
  - To be presented next Friday in Lecture 8

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CORE presentation





#### reactive transport models of the interactions of steel corrosión products and bentonite

**Overall objective:** Reactive transport modelling of <u>laboratory and in</u> <u>situ heating and hydration tests</u> dealing with steel/bentonite interfaces

#### Laboratory corrosion tests performed by CIEMAT

- FB tests: column tests containing bentonite blocks in contact with Fe powder. Sequence of tests: FB1 to FB6 with increasing durations: 0.5 (FB1) years up to 15 years (FB6)
- FeMo test: steel sinters emplaced in holes drilled in a bentonite block. 15 years of duration

#### FEBEX in situ test

February 9th, 2023

- FEBEX-DP provided multiple evidences of interactions of corrosion products and bentonite (NAGRA NAB 16-16)
- 18 years of duration



FB corrosion tests

Hydration

#### FB corrosion tests model

- Non-isothermal anoxic conditions with initially unsaturated bentonite in contact with Fe powder
- Coupled THCM models are needed considering hydration of the bentonite on the top of the column and heating at the bottom; water evaporation near the heater; and multicomponent geochemical reactive transport for the interactions of the Fe powder with the bentonite
- 2 materials: bentonite (86.8 mm lenght) and Fe powder (13 mm)
- 1-D finite element mesh: 86 nodes in the bentonite and 13 in the Fe powder

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- Geochemical reactions: aqueous complexation, acid-base, redox, cation exchange (Na, K, Ca, Mg and Fe), surface complexation (H<sup>+</sup> and Fe) on strong and weak sites and mineral dissolution/precipitation
- 12 primary species: H<sub>2</sub>O, O<sub>2</sub>(aq), H<sup>+</sup>, Na<sup>+</sup>, K<sup>+</sup>, Ca<sup>2+</sup>, Mg<sup>2+</sup>, Fe<sup>2+</sup>, HCO<sub>3</sub><sup>-</sup>, Cl<sup>-</sup>, SO<sub>4</sub><sup>2-</sup> and SiO<sub>2</sub>(aq)
- 39 secondary aqueous species, 5 exchanged cations and 13 surface complexes
- 9 minerals: all assumed at chemical equilibrium except Fe corrosion
- Magnetite is assumed to be the most important corrosion product. Goethite and siderite are also considered

February 9th, 2023

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February 9th, 2023

CORE presentation











# 4.8 Code 8 - porousMedia4Foam: an hybrid-scale solver to model coupled processes in porous media

porousMedia4Foam is a package for solving flow and transport in porous media using OpenFOAM® a popular open-source numerical toolbox. We introduce and highlight the features of a new generation open-source hydro-geochemical module implemented within porousMedia4Foam, which relies on micro-continuum concept and which makes it possible to investigate hydro-geochemical processes occurring at multiple scales i.e. at the pore-scale, reservoir-scale and at the hybrid-scale. Geochemistry is handled by a third party package (e.g. PHREEQC) that is coupled to the flow and transport solver of OpenFOAM®. We conducted benchmarks across different scales to validate the accuracy of our the simulator. We further looked at evolution of mineral dissolution/ precipitation in a fractured porous system. Application fields of this new package include the investigation of hydro-bio-geochemical processes in the critical zone, the modelling of contaminant transport in aquifers, as well as and the assessment of confinement performance for geological barriers.

#### Lecturer

Cyprien Soulaine, Centre National de la Recherche Scientifique (CNRS), Institut des Sciences de la Terre d'Orléans, Université d'Orléans, CNRS, BRGM, 45100 Orléans, France

#### **Reading Material**

S. Pavuluri, C. Tournassat, F. Claret, C. Soulaine "Reactive transport modelling with a coupled OpenFOAM®-PHREEQC platform" Transport in Porous Media 145, 475–504 (2022) <u>link</u>

C. Soulaine, S. Pavuluri, F. Claret, C. Tournassat "porousMedia4Foam: Multi-scale open-source platform for hydro-geochemical simulations with OpenFOAM®" Environmental Modelling and Software 145, 105199 (2021) <u>link</u>, <u>pdf</u>

Slides




## **porousMedia4Foam**: AN HYBRID-SCALE SOLVER TO MODEL COUPLED PROCESSES IN POROUS MEDIA

CYPRIEN SOULAINE\* CNRS – Earth Sciences Institute of Orleans, France

www.cypriensoulaine.com





### INSTITUT DES SCIENCES DE LA TERRE D'ORLEANS



120 people (faculty, PhD students, postdocs, engineers, technicians, administrative staff)







### porousMedia4Foam

- OpenFOAM-based platform,
- Design to model couple processes in porous media,
- Coupled with geochemical packages such as PHREEQC,
- Multi-scale formulation,
- Open-source: https://github.com/csoulain/porousMedia4Foam

Open	√FOAM®			
	= Open Field Operation And Manipulation			
	Solve the Partial Differential Equations using the finite volumes method			
	Multiphysics simulation platform mainly devoted to fluid flow			
	Handle 3D geometries by default			
	<ul> <li>Open-source software developed in C++ (object-oriented programming)</li> </ul>			
	Can be freely downloaded at www.openfoam.org or www.openfoam.com			
	Designed as a toolbox easily customizable			
	Parallel computation implemented at the lowest level			
l	• Cross-platform installation (Linux preferred)			
ſ	1989 : First development at Imperial College London			
	1996 : First release of FOAM			
	<ul> <li>2004 : OpenFOAM® released under GPL licence by OpenCFD Ltd.</li> </ul>			
l	2023 : OpenFOAM 10.0 ; OpenFOAM v2212 ; foam-extend5.0			

### WHAT IS OPENFOAM?





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### porousMedia4Foam: CODE ARCHITECTURE



Soulaine et al "porousMedia4Foam: Multi-scale open-source platform for hydro-geochemical simulations with OpenFOAM®" Env Modelling and Soft 145, 105199 (2021) 7

### POROUS MEDIA MODELS

### Absolute permeability

Name	Expression	
none	k = 0	
constant	$k = k_0$	
Power-law	$k = k_0 \left(rac{arphi}{arphi_0} ight)^n$	
Kozeny- Carman	k =	
	$k_0 igg( rac{arphi}{arphi_0} igg)^n igg( rac{1-arphi_0}{1-arphi} igg)^m$	
Verma- Pruess	$k = k_0 \left(rac{arphi - arphi_c}{arphi_0 - arphi_c} ight)^n$	
Hele-Shaw	$k = \frac{h^2}{12}$	

### **Dispersion tensor**

Name	Expression
none	$D_i^*  = 0$
diffusionOnly	$D_i^* = D_iI$
archiesLaw	$D_i^* = arphi^n D_i I$
linearDispersion	$D_i^* = arphi^n igg( (D_i + lpha_T  m{v} ) I +$
	$\frac{(\alpha_L - \alpha_T)}{ \mathbf{v} } \mathbf{v} \mathbf{v} \bigg)$

### Other models

- · Surface area,
- · Relative permeability
- · Capillary pressure
- ....

### https://github.com/csoulain/porousMedia4Foam

Soulaine et al "porousMedia4Foam: Multi-scale open-source platform for hydro-geochemical simulations with OpenFOAM®" Env Modelling and Soft 145, 105199 (2021)





### GEOCHEMICAL MODELS

Name	Model	Comments
phreeqcRM	PHREEQC	Parkhurst and Wissmeier (2015)
simpleFirstOrderKineticMole	first order kinetic, $C_i$ in mol/m <sup>3</sup>	Molins et al. (2020), Soulaine et al. (2017b)
transportOnly	no geochemistry	-
flowOnly	no transport, no geochemistry	

### https://github.com/csoulain/porousMedia4Foam

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### FLOW MODELS

Name	Model	Comments
dbsFoam	Micro-continuum	pore-scale, hybrid-scale, continuum-scale,
	(Darcy-Brinkman-Stokes)	Soulaine and Tchelepi (2016).
darcyFoam	Darcy's law	continuum-scale only.
impesFoam	Two-phase Darcy	continuum-scale only, Horgue et al. $\left(2015\right)$
hybridPorousInterFoam	Two-phase micro-continuum	pore-scale, hybrid-scale, continuum-scale,
	(Darcy-Brinkman-Stokes)	Soulaine et al. (2019, 2018),
		Carrillo et al. (2020).
constantVelocityFoam	constant velocity profile	uniform or non-uniform velocity profiles.

### https://github.com/csoulain/porousMedia4Foam

Soulaine et al "porousMedia4Foam: Multi-scale open-source platform for hydro-geochemical simulations with OpenFOAM®" Env Modelling and Soft 145, 105199 (2021)







### DARCY-SCALE SIMULATIONS OF CALCITE DISSOLUTION

Fig. 2. Calcite dissolution under kinetic conditions considering feedback of porous media properties. Evolution of (a) porosity, (b) calcite volume fraction, (c) hydraulic head along the channel and (d) evolution of outflux. MIN3P data is from Xie et al. (2015) for comparison.

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### REACTIVE ZONE INCLUDING CELESTITE HAVING DIFFERENT GRAIN SIZES



In this case, we investigated reactive transport occurring in a 2D flow cell containing celestite  $(SrSO_4)$ having a bimodal grain size distribution. The setup was discussed in detail in Poonoosamy et al. (2018) and is illustrated in Fig. 2a. The flow cell comprised of three compartments - Q1, Q2 and Q3. Q1 and Q3 were composed of inert mineral (quartz). Q2 comprised of a reactive mineral, celestite. An acidic solution comprising of barium  $(Ba^{2+})$  and chloride  $(Cl^{-})$ , was injected continuously from the inlet at a constant rate. Once the barium ions reached the reactive zone  $\mathbf{Q2}$  in the flow cell, celestite dissociated into strontium  $(Sr^{2+})$  and sulphate  $(SO_4^{2-})$  ions. The barium ions reacted with sulphate ions resulting in the precipitation of barite  $(BaSO_4)$  according to the following reaction:

> $\mathrm{Ba}^{2+} + \mathrm{SrSO}_4 \rightarrow \mathrm{BaSO}_4 + \mathrm{Sr}^{2+}.$ (18)

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### REACTIVE ZONE INCLUDING CELESTITE HAVING DIFFERENT GRAIN SIZES

Figure 13: Case 8 – Concentration of celestite - small, large grains, total and barite in the flow cell after 300 hours. Results of *porousMedia4Foam* (with structured, unstructured mesh) was compared with the data obtained by TOUGHREACT and MIN3P from Poonoosamy et al. (2018).

S. Pavuluri, C. Tournassat, F. Claret, C. Soulaine "Reactive transport modelling with a coupled OpenFOAM®-PHREEQC platform"

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### REACTIVE ZONE INCLUDING CELESTITE HAVING DIFFERENT GRAIN SIZES



Figure 14: Case 8 – Change in porous media properties (a) porosity, (b) permeability at 300 hours due to dissolution of celestite and precipitation of barite in Q2 zone of the flow cell. The results of *porousMedia4Foam* were compared with TOUGHREACT and MIN3P which were taken from Poonoosamy et al. (2018).

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### MAIN FEATURES OF THE MICRO-CONTINUUM APPROACH

Two-scale

(large permeability contrast, fractured media...)







### MAIN FEATURES OF THE MICRO-CONTINUUM APPROACH





Pore-scale simulations (penalized approach: solve complex flow on Cartesian grid)



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### MAIN FEATURES OF THE MICRO-CONTINUUM APPROACH

### Two-scale

(large permeability contrast, fractured media...)



Pore-scale simulations

(penalized approach: solve complex flow on Cartesian grid)



### Surface reaction

(adsorption, dissolution, precipitation...)



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### MAIN FEATURES OF THE MICRO-CONTINUUM APPROACH







# Soulaine (2015)

### EXAMPLE: ACCESSIBLE REACTIVE SURFACE AREA

- Darcy scale = averaged equations with averaged properties (permeability, surface area...)
- How does the permeability evolves when the pore-structure changes due to the dissolution/precipitation?
- What is the surface area accessible to the acid component?
- What about multiphase reactive flows?

Soulaine (2015). On the origin of Darcy's law, Stanford University

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Soulaine (2015). On the origin of Darcy's law, Stanford University

### MINERAL DISSOLUTION AT THE PORE-SCALE

Development of hydrogeochemical **simulation tools** at the pore-scale<sup>1</sup>



Soulaine and Tchelepi, Micro-continuum approach for pore-scale simulation of subsurface processes, Transport in Porous Media (2016)

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### MINERAL DISSOLUTION AT THE PORE-SCALE



Soulaine and Tchelepi, Micro-continuum approach for pore-scale simulation of subsurface processes, Transport in Porous Media (2016) <sup>3</sup>Soulaine et al., Mineral dissolution and wormholing from a pore-scale perspective, Journal of Fluid Mechanics 827 (2017)

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Soulaine and Tchelepi, Micro-continuum approach for pore-scale simulation of subsurface processes, Transport in Porous Media (2016) 'Soulaine et al., Mineral dissolution and wormholing from a pore-scale perspective, Journal of Fluid Mechanics 827 (2017) 29

### PORE-SCALE CALCITE DISSOLUTION WITH OPENFOAM-PHREEQC



Soulaine et al "porous Media4Foam: Multi-scale open-source platform for hydro-geochemical simulations with OpenFOAM®" Env Modelling and Soft 145, 105199 (2021) 30







### DISSOLUTION OF A FRACTURED POROUS MEDIA

Noiriel, Madé, Gouxe: Impact of coating development on the hydraulic and transport properties in argillaceous limestone fracture. Water Resour. Res. 43(9), 1–16 (2007) Noiriel and Soulaine, Pore-Scale Imaging and Modelling of Reactive Flow in Evolving Porous Media: Tracking the Dynamics of the Fluid–Rock Interface, Transport in Porous Media (2021)

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Noiriel, Madé, Gouze.: Impact of coating development on the hydraulic and transport properties in argillaceous limestone fracture. Water Resour. Res. 43(9), 1–16 (2007) Noiriel and Soulaine, Pore-Scale Imaging and Modelling of Reactive Flow in Evolving Porous Media: Tracking the Dynamics of the Fluid–Rock Interface, Transport in Porous Media (2021)









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### CONCLUSION AND PERSPECTIVES

- The porousMedia4Foam package:
  - Coupling with geochemical packages (e.g. Phreeqc) for more comprehensive geochemical reactions,
  - Multi-scale formulation using micro-continuum solvers,
  - Standard Darcy-scale solvers.
  - https://github.com/csoulain/porousMedia4Foam

### · Development are still pending:

- Reactive two-phase flow,
- Hybrid-scale two-phase flow,
- Simulation in geothermal wells,
- Poromechanics with Darcy-Brinkman-Biot?

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### ACKNOWLEDGEMENTS



- F. Carrillo and I. C. Bourg (Princeton University),
- H. Tchelepi and A. Kovscek (Stanford University),
- Experimentalists who provided the high-resolution dataset (Sophie Roman, Charlotte Garing, Catherine Noiriel)
- People involved in the code development: Saideep Pavuluri, Emmanuel LeTronc, Julien Maes, Christophe Tournassat, Laurent André, Florian Osselin

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# Thank you for your attention



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### Appendix A. Short career summary of lectures

### Barbara Lothenbach, EMPA, Switzerland

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Barbara Lothenbach is group leader of the Cement Chemistry and Thermodynamics Group of the Concrete & Asphalt Laboratory at Empa, the Swiss Federal Institute for Materials Science & Technology. She has graduated for ETH Zürich and now is associate professor at University Berne, Switzerland, and adjunct professor at NTNU, Norway. She plays an active role in the promotion of the use of thermodynamic modelling to predict and understand the composition of hydrated cement, fundamental to develop durable and low CO<sub>2</sub>-cements.

### Carl I. Steefel , LBNL, US

### CISteefel@lbl.Gov

Dr. Carl I. Steefel is a Senior Scientist and Head of the Geochemistry Department at Lawrence Berkeley National Laboratory. He has over 30 years of experience in developing models for multicomponent reactive transport in porous media and applying them to topics in reactive contaminant transport and water-rock interaction. He developed the first routine for multicomponent nucleation and crystal growth in the Earth Sciences and the first multicomponent, multi-dimensional code for simulating water-rock interaction in non-isothermal environments. He has also worked extensively in applying reactive transport modeling to natural systems, including hydrothermal, contaminant, and chemical weathering environments. More recent work has focused on pore scale studies of reactive systems, especially faults, and modeling of Critical Zone processes in terrestrial environments. He has been involved in experimental and modeling studies of cation exchange and mineral dissolution and precipitation, as well as modeling studies of field systems focused on contaminant transport, microbially-mediated biogeochemical reactions, chemical weathering, and isotope systematics. In addition to his focus on continuum reactive transport, he has investigated pore scale reactive transport using high performance computing. He is the principal developer of the reactive transport software CrunchFlow, a widely used package in many countries around the world and a 2017 R&D100 award winner. He also has contributed significantly to CrunchClay, an offshoot of Crunch for simulating reactive transport in clayey materials where electrostatic effects are important for transport and sorption.

### Diederik Jacques, SCK CEN, Belgium

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Diederik Jacques is Head of Unit Engineered and Geosystem Analysis at SCK CEN. He obtained his PhD in Agricultural and Applied Biological Sciences at the Catholique University of Leuven (Belgium). He worked as a post-doctoral researcher at SCK CEN in 2002 and became a group leader in 2011. His long-term experience covers such areas as flow and transport phenomena in porous media, coupled reactive transport modelling, parameter estimation, geostatistical characterization and pore-scale/continuum-scale model development. The most recent research is focused on soil-aquifer interactions, long-term evolution of cement-based materials, contaminant and colloid transport in porous media, and performance assessments of surface and deep radioactive waste disposal systems or NORM sites. A major achievement is the development of the coupled reactive transport code HPx for variable saturated porous media. Diederik Jacques is the leader of the EURAD WP2 ACED

### Dmitrii Kulik, PSI, Switzerland

### dmitrii.kulik@psi.ch

Dmitrii Kulik is Senior Scientist at LES PSI. His research interests include thermodynamics of (multisite) solid solutions, adsorption and ion exchange in the context of geochemical modelling by Gibbs energy minimization (GEM); geochemical modelling of cement systems and compilation of related





thermodynamic datasets; mineral surface reactivity and kinetics in relation to reactive transport; development,maintenance and promotion of GEM software (<u>https://gems.web.psi.ch</u>; <u>https://cemgems.org</u>; <u>https://thermohub.org</u>; <u>https://reaktoro.org</u>). He has graduated from Taras Shevchenko Kyiv State University (1980) and Institute of Geochemistry and Mineral Physics ASU, Kyiv, Ukraine (1986). Since 2000, he conducts research at PSI (Switzerland). In 1980 – 2000, he worked from research assistant up to leading research associate positions in Ukraine, with multiple research stays abroad (in Germany, USA, Switzerland) in 1992 - 1999.

Emilie Coene, Amphos 21 Consulting S.L., Spain

emilie.coene@amphos21.com



Emilie Coene will be the course instructor. Emilie is a Senior Consultant of the Materials Engineering team at Amphos 21 Consulting S.L. She is a Chemical Engineer and holds a Masters in Numerical Modelling for Science and Engineering. She is an expert in numerical model development and application by using, for example, Matlab, Comsol Multiphysics and iCP. As a consultant at Amphos 21, Emilie has been involved in projects related with nuclear waste management programs in Sweden, Finland, France and Japan. These projects involved numerical models of radionuclide transport, reactive transport and multiphase flow in different media such as concrete, clay materials and host rock. She has also carried out management and development tasks of the interface iCP.

### Eric C. Gaucher, University of Bern, Switzerland

### eric.gaucher@geo.unibe.ch

Eric C. Gaucher is an expert geochemist working at the University of Bern. His work focuses on waterrock-gas interactions at the laboratory scale up to basin scale using experimental, field and numerical modeling methods. Geological storages (nuclear waste, CO<sub>2</sub>, H<sub>2</sub>) are his main domain. Although one of his main research objectives is to understand the behaviour of CO<sub>2</sub>(g) in sediments (e.g., diagenesis, CO<sub>2</sub> storage), he is now researching abiotic gases (H<sub>2</sub>, CH<sub>4</sub>) in natural systems mainly linked to serpentinization. He has made interesting discoveries of natural H<sub>2</sub> in the Pyrénées and in the Alps. Prior to coming to TOTAL in 2012, he was the head of a research unit at the French geological survey (BRGM) investigating the stability of clay formations for the management of nuclear waste. In 1993 he gained his MSc in Earth sciences from the École normale supérieure in Lyon (France) and in 1998 his PhD in geochemistry from the University of Paris VII.

### Erik Laloy, SCK CEN, Belgium

### Eric.laloy@sckcen.be

Eric Laloy works with the Engineered and Geosystem Analysis unit at SCK CEN. He obtained his PhD in environmental engineering at the Université catholique de Louvain (UCL). After a postdoc at the University of California, Irvine (UCI), he joined SCK CEN in 2011. Currently, his main areas of research are uncertainty quantification of geoscientific simulation models, machine learning applied to the geosciences and probabilistic modelling for radiological characterization of radioactive waste.

Hans Meeussen, NRG, The Netherlands

meeussen@nrg.eu







Hans Meeussen is a Senior research scientist, Nuclear Research and consultancy Group (NRG), Petten, The Netherlands and an Associate Professor, Department of Civil Engineering University of Technology Delft, The Netherlands.

He received his MSc in Environmental Science and Software Engineering and his Ph.D. in Soil Chemistry both from Wageningen Agricultural University, The Netherlands.

His area of expertise is the chemical- and migration behavior of contaminants in reactive porous media such as soils, cementitious materials and (nuclear) waste forms, with a focus on theoretical processes and numerical modeling. He has (co-)authored over 50 scientific papers in this area and is developer of the ORCHESTRA reactive transport modeling software (www.meeussen.nl/orchestra).

The structure of this software, in which all models are user definable, makes it ideal for development of e.g. new types of adsorption models. Within the EURAD DONUT project a  $C^{++}$  version of the chemical solver was developed, from the original Java version, that facilitates integration with Python, or transport codes.

### Javier Samper, University of A Coruña, Spain

j.samper@udc.es: Scopus Author ID 7004089866. <u>http://orcid.org/0000-0002-9532-8433</u>. <u>https://www.scopus.com/authid/detail.uri?authorId=7004089866</u>; Researcher ID: F-7311-2016; Google \_\_\_\_\_\_\_scholar = nB0YEpwAAAAJ. Web page: http://pdi.udc.es/en/File/Pdi/KF39E.



B.S. and a M.S. in Civil Engineering (Madrid Polyt Univ, 1981). Ph. D. Hydrology & Water Resources (Univ of Arizona, Tucson, 1986). Teaching in UPM (Madrid, 1986-87), UPC (Barcelona (1987-1993) and UDC (Coruña, since 1993). He chaired the Spanish Chapter of the International Association of Hydrogeologists (1997-2000). He holds the following honors: 1) Gómez Navarro Award (1981) from Polytechnic University of Madrid for best Civil Engineering undergraduate student on Hydraulics. Spain; 2) Horton Research Award (1984) from American Geophysical Union, USA.; 3) Student Departmental Honor (1985) from the Department of Hydrology and Water Resources of the University of Arizona. USA; 4) Appearance as Expert in the Senate of Spain (1997) at the Commission on Nuclear Waste Disposal; and 5) Guest Professor from Jilin University in Changchun, China (2006).

He has developed extensive research in hydrology and hydrologic engineering with special emphasis in hydrogeology, water resources evaluation, geostatistics, numerical models of groundwater flow, heat transport and contaminant transport with applications to groundwater management and protection. He has developed computational codes for surface and surface hydrology for the following topics: Water balance modeling (VISUAL-BALAN and GIS-BALAN), water flow, solute and reactive transport in aquifers (CORE<sup>2D</sup>), non-isothermal multiphase water flow, multicomponent reactive transport in clay barriers for waste disposal (INVERSE-FADES-CORE), water flow, and reactive transport and microbial processes in porous and fractured media (BIOCORE<sup>2D</sup>). Participation un EURATOM Research Projects since 1991. Advisor of 11 Master 20 PhD students. 110 publications; 1968 cites; h index = 28; Member of editorial board of J Contaminant Hydrology (2006-2023).

### Laurent De Windt, Mines Paris, France

### laurent.de\_windt@minesparis.psl.eu

Dr. Laurent De Windt is a senior researcher in applied geochemistry in the Geosciences Department at Mines Paris (France), one of the French higher education institutions in engineering. Before that he spent five years in the French institute for radiological protection and nuclear safety (IRSN). His research activities focus on reactive transport modelling applied to environmental chemistry, water decontamination, material durability and radionuclide migration. He has been currently involved in the DISCO and ACED/EURAD European programs on radioactive waste disposals.





Nikolaos Prasianakis, PSI, Switzerland

### Nikolaos.prasianakis@psi.ch , https://www.psi.ch/en/les/people/nikolaos-prasianakis

Nikolaos Prasianakis is the head of the transport mechanisms group at the laboratory for Waste Management at the Paul Scherrer Institut (PSI) in Switzerland. He has obtained his PhD degree in multiphysics modelling at the Mechanical and Process Engineering department of ETH-Zürich in 2008. The group activities focus on interdisciplinary approaches to merge experimental knowledge at the field and laboratory scale, geochemical and molecular modelling in order to assess geochemical and transport phenomena in geological repositories for radioactive waste. His research is relevant to multiscale multiphysics modelling, digital twins and machine learning.

### Sergey Churakov, PSI, Switzerland

### sergey.churakov@psi.ch

Sergey V. Churakov is Head of Laboratory of Waste Management in the Department of Nuclear Energy and Safety at the Paul Scherrer Institute and Full Professor in the Institute of Geological Sciences at the University of Bern. His research covers multidisciplinary topics of environmental geochemistry and mineralogy with specific focus on mechanistic understanding of transport and retention of hazardous contaminants and radionuclides in natural environment and geotechnical systems.

### Ulrich Mayer, UBC, Canada

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Ulrich Mayer completed his PhD-studies at the University of Waterloo with a focus on reactive transport modeling. Since 2000, he is a professor of hydrogeology at the University of British Columbia (UBC) in the Department of Earth, Ocean and Atmospheric Sciences. His research revolves around reactive transport processes in the subsurface with applications in the oil and gas industry, mine waste management, and deep geologic repositories for used nuclear fuel. At UBC, he is teaching courses on groundwater hydrology, groundwater geochemistry and reactive transport modeling. Over the past three decades, he has led the development of the reactive transport code MIN3P-THCm, a computer model designed for the process-oriented simulation of multicomponent reactive transport. Together with his research group, he has published more than 100 articles in peer-reviewed international journals.

### Vanessa Montoya, SCK CEN, Belgium

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Vanessa Montoya is Research Project leader at the Engineered and Geosystem Analysis Unit as part of the Expert Group Waste & Disposal of SCK CEN. Her background is chemistry with 16 years of experience in interdisciplinary and transdisciplinary scientific projects dealing with Radioactive Waste Management and disposal applications. She obtained her PhD in Chemistry at the Universitat Autònoma de Barcelona -UAB (Spain) in 2006. After her PhD, in 2006, she started to work in the Waste Management department of the Environmental consulting company Amphos 21, in Barcelona, as a scientific consultant and project manager. After 6 years in the private sector, and from October 2012 to April 2022, she worked as a Group leader / scientist at the Karlsruhe Institute of Technology – Institute of Nuclear Waste Disposal (KIT-INE) in Karlsruhe and at the department of Environmental informatics, as part of the Smart Models and Monitoring Unit at the Helmholtz-Centre for Environmental Research (UFZ) in Leipzig, Germany. Along her professional career, her work has been mainly focused on providing numerical simulations of geochemical, reactive transport and coupled geochemical and multiphysical processes in natural and engineered barrier systems. She has mainly applied her research to Radioactive Waste Management and Disposal at laboratory, field (i.e. URL: Mont Terri and Grimsel) and long-term repository scales by using and expanding different geochemical and multiphysics finite





element codes. In addition, development of international thermodynamic databases (i.e. ThermoChimie, Thereda) in the same field of application has been part of her activities.



