Molecular Modeling (2019 – 2024)

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Molecular Modeling at EMN (IMTA) / SUBATECH

- Molecular Modeling has been created in 2010 as a new research team within the Radiochemistry Group of SUBATECH in the context of the industrial chair «Storage and Disposal of Radioactive Waste» at the Ecole des Mines de Nantes with the focus on the computational molecular modeling for radioactive waste disposal applications
- Funded by





In the general context of *improving molecular-scale understanding* of the interactions between radionuclides, clay and cement materials, and organic molecules, the specific problems include:

- Adsorption and mobility of cations and anions in clay environment
- Effects of clay composition, site substitutions, and edge sites on the adsorption and mobility of radionuclides
- Effects of organics on the adsorption and mobility of radionuclides in clays
- Effects of hydrogen bonding and proton transfer on the hydration structure, energetics, dynamics, and chemical reactivity of aqueous cations and anions at clay edges
- Addressing the same range of problems for cement phases, calcite, quartz, and other materials relevant to radioactive waste disposal









Molecular Modeling - Research Competences and Objectives

Classical and ab-initio atomistic computer simulations of materials for quantitative understanding of the properties and processes of **clay-related and cement-related systems and their interfaces with fluids** on the fundamental molecular scale: adsorption and transport of ions (radionuclides); effects of organic molecules; effects of fluid composition; effects of temperature, etc.

Principal Research Directions in the last 5 years (2019-2024):

- ✓ Continuation of the ClayFF force field development and parametrization
- Development of more realistic models for clayey and cementitious materials taking into account their natural compositional and structural disorder
- Quantification of the *effects of specific surface sites* on the adsorption and transport of molecular species in clays and other disordered materials
- Role of nano-particle edges in the clay and cement modeling
- ✓ Quantification of the *effects of molecular gases* (H₂, CO₂, CH₄,..) on the adsorption and transport of radionuclides clay and cement materials
- *Effects of organic matter* on the complexation and aggregation of ions in clay and cement materials
- *Effects of temperature and other thermodynamic conditions* on the above processes













Classical Molecular Dynamics (MD) Simulations

- Classical simulations calculate energy and forces between atoms based on a force field that is a set of parameters describing atomic interactions
- > The length- and time- scales of classical MD can reach ~1 μ m and ~1 μ s

Numerically solve Newtonian equation of motion for *N* interacting particles:

 $\mathbf{r}_{i}(t+\Delta t) = \mathbf{r}_{i}(t) + \mathbf{v}_{i}(t) \Delta t + \frac{1}{2} \mathbf{a}_{i}(t) \Delta t^{2}$; $\Delta t \sim 1 \text{ fs} = 10^{-15} \text{ s}$

 $\mathbf{a}_i = \mathbf{F}_i / m = [-\partial U(\mathbf{r}_{1,i} \mathbf{r}_{2,...} \mathbf{r}_N) / \partial \mathbf{r}_i] / m$; i = 1, 2, ..., N ($N \sim 10^3 - 10^6$ atoms)

 $U = \Sigma \Sigma U_{ij} = \Sigma \Sigma (A_{ij}/r_{ij}^{12} - B_{ij}/r_{ij}^{6} + q_i q_j / e_0 r_{ij}) + \Sigma \frac{1}{2} k_b (r_{ij} - r_0)^2 + \Sigma \frac{1}{2} k_\theta (\theta_{ij} - \theta_0)^2$ Short-range repulsion v-d-Waals Coulombic bond stretching bond bending



Molecular-Scale Understanding of the Adsorption and Transport of Radionuclides in Cox Clay Formations



Simulating clay and cement is non-trivial

- Variable composition, low symmetry, complex crystal structures
- Incompletely and poorly characterized, occur as very fine-grained material
- > Availability of empirical force-fields for realistic molecular modeling









ClayFF Construction and Parametrization



- Accurate determinations of partial charges are required to represent charge distributions of interlayer and external surfaces where electrostatic forces control sorption and transport processes
- Atomic charges derived from DFT calculations for cluster and periodic models of simple oxide and hydroxide phases: Mg(OH)₂, Al(OH)₃, SiO₂, kaolinite...
- > Allows for *charge delocalization* among coordinating oxygens for substitutions

ClayFF: Cygan, Liang, Kalinichev, *J. Phys. Chem. B*, **108** 1255-1266 (2004) Cygan, Greathouse, Kalinichev, *J. Phys. Chem. C*, **125** 17573-17589 (2021)









MD Modeling of Clay-Solution Interfaces



Classical Newtonian dynamics

- $N_{\rm tot} \sim 3,000 10,000$ atoms
- $N_{\rm H2O} \sim 0 1,000$ molecules
- *ClayFF* force field (Cygan et al., 2004)
- $a \times b \times c$ ~ $3 \times 3 \times 10$ nm³
- Periodic boundary conditions
- NVT- or NPT-ensemble T=300K; P =1 bar
- *t* ~ 200 1,000 ps
 - $\Delta t = 0.5 1.0 \text{ fs}$

Solution structure:

- Atomic density profiles (\perp)
- \checkmark Atomic density surface distributions ($|\,|$)
- Topology of the interfacial H-bond network

<u>Dynamics:</u>

- Diffusion coefficients (longer time scale)
- Spectra of vibrational and rotational dynamics (shorter time scale)





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Uranyl / Gluconate Solutions on the C-S-H surfaces



Competition of UO₂²⁺ and Ca²⁺ for Adsorption Sites



- Adsorption free energy (PMF) as a function of distance between UO₂²⁺, Ca²⁺ and deprotonated silanol group of the bridging Si tetrahedra on the C-S-H surface at C/S = 0.83
 - High energy barrier between the inner-sphere (IS) and outer-sphere (OS) surface complexes
 - Approximately the same depth of the potential wells for both IS and OS
 - Ion exchange and competition for the same surface sites are very likely

I.Androniuk, C.Landesman, P.Henocq, A.G.Kalinichev (2017) *Phys. Chem. Earth A/B/C*, **99**, 194-203 I.Androniuk, A.G.Kalinichev (2020) *Appl. Geochem.*, **113**, 104496 P.Henocq, C.Landesman, I.Androniuk, A.G.Kalinichev (2024) *Cement and Concrete Research*, in prep.









Effect of Gluconate on Ion Binding to C-S-H Surface



- The binding of Ca²⁺ to the C-S-H surface becomes much weaker and potentially may result in a higher probability of substitution for a competing solution cation (e.g., Na⁺ or UO₂(OH)₃⁻)
- Effect of gluconate is the same for all the sorption sites studied.
- Even though the adsorption energy decreases, complexation between Ca-gluconate and C-S-H surface remains stable.

I.Androniuk, A.G.Kalinichev (2020) *Appl. Geochem.*, **113**, 104496 P.Henocq, C.Landesman, I.Androniuk, A.G.Kalinichev (2024) *Cement and Concrete Research*, in prep.









Gas Formation under Waste Storage Conditions

PhD thesis of Pinar CITLI (February 2024)



GCMC simulations of H₂ Adsorption in Clay

PhD thesis of Pinar CITLI (February 2024)

Bretagne-Pays de la Loire École Mines-Télécom

- ✓ Grand Canonical Monte Carlo (GCMC) simulations of H_2/H_2O binary mixtures
- ✓ T = 298, 323 and 363 K ; P = up to 120 bar, 1000 bar and 10,000 bar



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& PARTICULES

Oversolubility of H₂ in the interlayers



Oversolubility of H₂ in the interlayers



P.Citli, A.G.Kalinichev (2024) Grand Canonical Monte Carlo simulations of hydrogen adsorption in the interlayers of hydrated montmorillonite. *Applied Clay Science*, (submitted).









Reactivity of CO₂ with Portlandite Surfaces – Ab Initio MD



ClayFF Development - Modeling of Particle Edges

Aggregate of clay particles



- Basal (001) surfaces and interlayers are extensively studied; their properties are reasonably well known
- > Clay edges have received much less attention yet
- Ab initio (quantum) MD is a direct answer, but it is very expensive computationally
- \rightarrow AIMD $\Rightarrow \sim n \times 100$ atoms; $\sim 15 \times 15 \times 15 \text{Å}^3$; t $\sim 10-50$ ps

S.V.Churakov, *Geochim. Cosmochim. Acta*, **71**, 1130-1144 (2007)
X. Liu et al., *Geochim. Cosmochim. Acta* (2012, 2013, 2014, 2015)
S. Tazi et al., *Geochim. Cosmochim. Acta*, **94** 1-11 (2012)

ClayFF Parametrization for Clay Edges

New special ClayFF bending terms for Mg-O-H, Al-O-H, and Si-O-H

$$U_{\text{ClayFF-MOH}} = U_{\text{ClayFF-orig}} + U_{\text{M-O-H}} = U_{\text{ClayFF-orig}} + k (\theta - \theta_0)^2$$

k and θ_0 have to minimize the differences between DFT and ClayFF-MOH results



Pouvreau, Greathouse, Cygan, Kalinichev, J.Phys.Chem.C, **121**, 14757-14771; 2019, **123**, 11628–11638









ClayFF: O-H Librational (M-O-H Bending) Spectra



- ✓ Spectra shifted of 250 to 600 cm⁻¹ and narrowed
- ✓ Kaolinite: as expected not much difference between θ_0 =100° and θ_0 =110°

M.Pouvreau, J.A.Greathouse, R.T.Cygan, A.G.Kalinichev, *J.Phys.Chem.C*, 2019, **123**, 11628–11638





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ClayFF Development - Modeling of Particle Edges



Montmorillonite Clay Nanoparticle Edge Surfaces



B.F.Ngouana-Wakou et al., *J.Phys.Chem.C*, 2024, in prep.





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Interlayer vs Edge Adsorption of NORM in Clay



- The energy gain when Na⁺ enters the interlayer region is almost doubled for Sr²⁺ and Ba²⁺: 1 Sr²⁺/Ba²⁺ for 2 Na⁺ ions
- This is consistent with our statistical analyses showing that ~70% of Sr²⁺/Ba²⁺ initially present in the interfacial region migrate in the interlayers during the simulations
- There are noticeable energy barriers at the (010) edge for Sr²⁺/Ba²⁺ to enter the MMT interlayers

- All cations are more stable in the interlayer compared to the interface
- The associated average free energy gain are as follows :
 - ~10 kJ/mol for Na+
 - ~25 kJ/mol for Sr²⁺

~19 kJ/mol for Ba²⁺



B.F.Ngouana-Wakou et al., *J.Phys.Chem.C*, 2024, in prep.





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CO₂ and CH₄ Gases in Clay Nanoparticles



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H₂ Gas Adsoption on Different Clay Surfaces



S. Mutisya, A.G. Kalinichev (2024) J. Phys. Chem. C, in preparation









H₂ Gas Adsoption on Different Clay Surfaces



Molecular Modeling – External Collaborations (1)

CEA Marcoule – molecular mechanisms controlling the rate of alteration and chemical durability of nuclear waste glass. PhD thesis co-advised by AGK:

Kamalesh DAMODARAN, 09/2020 - 12/2022; Sumit TIWARI, 10/2022 - 10/2025





K. Damodaran, J.-M. Delaye, A.G. Kalinichev, S. Gin (2022) Deciphering the non-linear impact of Al on chemical durability of silicate glass. *Acta Materialia*, **225**, 117478.









Molecular Modeling – External Collaborations (2)

Turkey (*Department of Chemistry*, *Hacettepe University*) – layered double hydroxides (LDHs) – anionic clays for environmental and medical applications



Synthesis, characterization, and MD simulations of Mg-Al-LDH intercalated with tetraborate anions for application for boron neutron capture therapy (BNCT) – potential brain cancer treatment using ¹⁰B isotope delivered close to tumor cells

A.N.Ay, B.Zumreoglu-Karan, A.G.Kalinichev, V.Rives, R.Trujillano, A.Temel (2020) *Journal of Porous Materials*, **27**, 735–743





Poland (*Institute of Geological Sciences, Polish Academy of Sciences* – development of I/S COx models; hydrophobicity of smectites; clay-organic interactions



M.Szczerba, A.G.Kalinichev, M.Kowalik (2020) Appl. Clay Sci., **188**, 105497

Z.Chen, N.Loganathan, M.Szczerba, G.Montavon, A.G.Kalinichev (2024) *Env. Sci. Technol*, in revision





Molecular Modeling – External Collaborations (3)

Russia (International Laboratory for Supercomputer Atomistic Modelling and Multiscale Analysis, National Research University Higher School of Economics, Moscow) – atomistic simulations of clay-related and cement-related systems

Calcium aluminates (*AFm cement phase*) as potential *adsorbents for anionic radionuclides* ($^{36}Cl^{-}$, $^{129}I^{-}$): [Ca₂Al(OH)₆] X·2H₂O, X = Cl⁻, I⁻

Terminated in March 2022 due to the war in Ukraine



Molecular Modeling – External Collaborations (4)

Russia (International Laboratory for Supercomputer Atomistic Modelling and Multiscale Analysis, National Research University Higher School of Economics, Moscow) – atomistic simulations of clay-related and cement-related systems

Uranyl adsorption at the hydrated clay surfaces

Terminated in March 2022 due to the war in Ukraine

Illite $K_{1.3}(AI_{3.5}Mg_{0.5})[Si_{7.2}AI_{0.8}]O_{20}(OH)_4$



A.D.Krot, I.E.Vlasova, E.V.Tararushkin, A.G.Kalinichev (2024) Minerals, 14, 109.









Molecular Modeling – Links to Experiment

Molecular-level understanding of metal ion retention in clay-rich materials

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NATURE REVIEWS | EARTH & ENVIRONMENT



X.Liu et al. (2022) Nature Reviews Earth & Environment 3, 461-476.









Molecular Modeling - Methods Development

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3 Computational modeling in clay mineralogy

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Molecular Modeling – Research Output

International dissemination activities (2019-2024)

- ✓ 25 publications in high quality peer-reviewed journals
- \checkmark 3 publications were featured on the journals' covers
- 11 invited lectures and talks at major international conferences (Goldschmidt, ACS, CMS, ICC, Migration)
- ✓ 43 other oral and poster presentations at major international conferences
- ✓ 7 publications in preparation
- A.Kalinichev co-organized 4 special sessions/symposia at major international conferences
- In 2019-2020 A.Kalinichev was elected and served as the President of the Clay Minerals Society
- ✓ A.Kalinichev is also currently:
 - Editor-in-Chief of the section Clays and Engineered Mineral Materials of the journal Minerals
 - Assoc. Editor of the journal *Clays and Clay Minerals*
 - Assoc. Editor of the journal *Frontiers in Nuclear Engineering*
 - Assoc. Editor of the journal Discover Minerals









ACS Publication



Molecular Modeling – Perspectives for 2024-2029

- ✓ PhD project of Jakub Licko simulating the effects of small organic molecules on the adsorption and mobility of actinyls in clay will continue through 2024-2025.
- ✓ H₂ gas in different (un)saturated clay and cement systems for the problems of geological nuclear waste disposal. This is thematically strongly linked with the new EURAD-GAS project and collaboration with colleagues at University of Grenoble. This work will be also extended to other technological applications, such as underground H₂ gas storage.
- Collaboration with US colleagues (Sandia National Labs, Michigan State University) on the development of the ClayFF force field will continue by potentially including the effects of chemical reactivity at the clay and cement particle edges. With the arrival of Sébastien
 Le Crom an expert in the polarizable force field development and application (PIM) we may venture into adding the effects of polarizability to the current version of ClayFF.
- ✓ A new MD-simulation project to quantify the *effects of soil organic matter on the mobility* of Ra²⁺ in the environment is currently being developed in collaboration with *Gilles Montavon* at Subatech.
- The collaboration with CEA Marcoule on the atomistic simulation of nuclear waste glass corrosion and durability will continue at least through the end of 2025.
- ✓ New PhD project on *molecular modeling of CO₂ mineralization* is beginning in the fall of 2024 in collaboration with *Sébastien Le Crom* and *Jean-François Boily* (Umeå University, Sweden) in the framework of the SEED program at IMT Atlantique.

A new collaborative project "High fidelity multiscale solute transport modelling in nanoporous media under fluctuating thermodynamic and saturation conditions" is currently being developed in collaboration with colleagues from the Geological Survey of Finland and the University of Helsinki.









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R.T.Cygan, J.-J.Liang, J.A.Greathouse – Sandia National Labs, USA
 R.J.Kirkpatrick, J.Wang, P.Kumar, G.M Bowers, N.Loganathan, – UIUC, MSU, USA
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