

LE STUDIUM

CONFERENCES

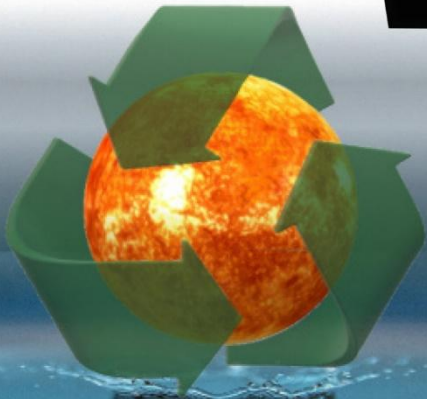
Challenges and opportunities in materials for green energy production and conversion

THURSDAY 17th June 2021 – 15:10

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“Reactive molecular dynamics simulations of H₂ production and conversion”





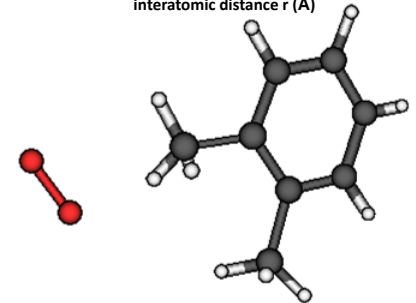
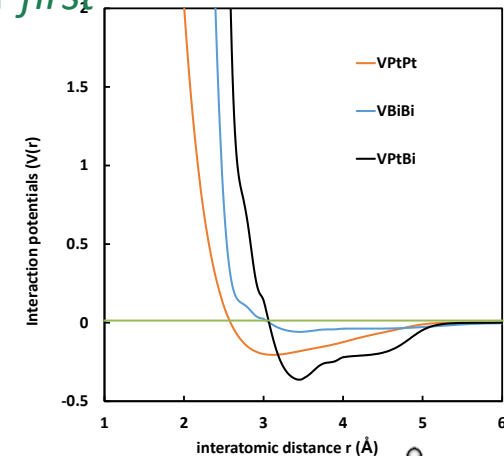
Outline

- Practical MD simulations
- Green hydrogen production
 - H₂O reactivity with Aluminum
 - Biomass in Supercritical water and pyrolysis (not so green)
- H₂ conversion in low temperature fuel cells
 - Supported and free nanocatalyst growth
 - Oxygen Reduction Reaction
- Conclusions



Practical Molecular Dynamics simulation

- ✓ Calculate all trajectories of a set of atoms, molecules, ...
via the Newton equation of motion
→ Suitable for processes at nanoscale (up to 10^9 atoms)
- ✓ A rigorous approach requires the use of robust interaction potentials
If necessary running DFT, i.e. electronic calculations → *ab-initio* or *first-principles* MD and/or Machine Learning methods
- ✓ and initial conditions (positions, velocities) preferably matching experimental conditions
→ appropriate velocity distribution functions can be derived from experimental conditions.
- ✓ Proper energy dissipation:
 - Energy release during deposition, bond formation/breaking
 - Annealing→ via friction term(s), thermostat(s)





Practical Molecular Dynamics simulation

Relevance/significance of MD Simulations

Flux :

Exp. $1 \cdot 10^{15} \text{cm}^{-2} \text{s}^{-1} = 10 \text{ species} / \text{nm}^2 / \text{s}$ - MD 1 specie / $10 \times 10 \text{ nm}^2 / 2 \text{ ps}$

Prohibit long time diffusion, except if including specific strategies (fbMC, CVHD, hyperdynamics, ...)

Pressure/simulation box size

Solid density : Pt 65 nm^{-3}

Liquid density: water 33 nm^{-3}

If box size is in the range $10 \times 10 \times 10 \text{ nm}^3 \rightarrow 65 \text{ 000 Pt atoms}$ or $33 \text{ 000 water molecules}$

\rightarrow Statistical quantities (diffusion coeff, reaction rates, etc) can be directly calculated

Gas density : 1 atm = $2.4 \cdot 10^{-2} \text{ nm}^{-3}$

\rightarrow Not enough species in box of size d at pressure P

\rightarrow Chemistry and reactivity in the gas phase require scaling law between simulation box and reactor sizes

Solution: relevant parameter = Collision number $\propto P \cdot d \rightarrow \uparrow P \downarrow d$ should work.



Practical Molecular Dynamics simulation

1/ recovering/scaling experimental conditions

Hypothesis : Collision number are the same in experiments and simulations so, $P_{exp} d_{exp} = P_{sim} d_{sim}$ thus $N_{sim} = \frac{P_{exp}}{k_B T_g} \cdot S_{sim} \cdot d_{exp}$ and if r_{cut} is the largest cutoff radius : $d_{sim} > \frac{N_{sim}}{S_{sim}} \cdot r_{cut}^3$

Or equivalently $\rho_{sim} = \frac{N_{sim}}{V_{sim}} < \frac{1}{r_{cut}^3}$

(S_{sim} , V_{sim} are the chosen smallest area, volume of the simulation box)

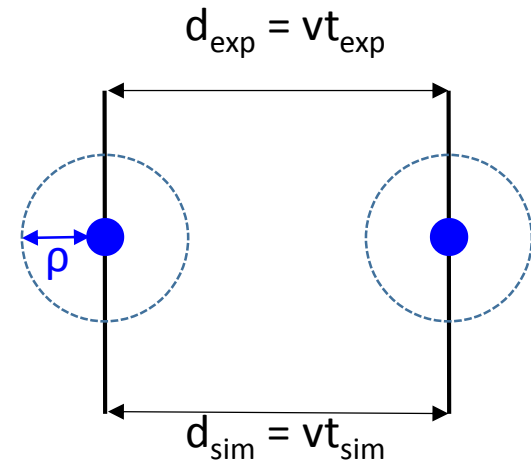
2/ Experimental time recovery

→ Velocities are same in experiments and simulations

$$v = \frac{d_{exp}}{t_{exp}} = \frac{d_{sim}}{t_{sim}}, \text{ when } d_{exp}, d_{sim} > 2\rho$$

$$\text{then, } t_{exp} = \frac{d_{exp}}{d_{sim}} \cdot t_{sim}, \text{ when } d_{exp}, d_{sim} > 2\rho$$

$$\text{or, } t_{exp} = t_{sim}, \text{ when } d_{exp}, d_{sim} \leq 2\rho$$





Practical Molecular Dynamics simulation

Thermal relaxation

- Choose a relevant specie release time: i.e. greater than thermalisation time
- Choose a relevant thermostat (region i.e. which should be thermostated) within this relevant time
- For interactions with surface, one can guess that only the substrate should be thermostated



Practical Molecular Dynamics simulation

Interaction potentials

New reactive and including electron interaction potentials (force fields) allow targeting multiscale MD simulations

2/ combine improved force fields

Plasma factor	Possible?	Example
electric field	yes	CNT growth
atoms and hyperthermal species	yes	Si-NW oxidation
radicals	yes	a-C:H growth
ions	yes	sputtering
electronically excited states	yes	etching
vibrationally excited states	yes / no (reaxFF)	/
photons	implicit	(polymer degradation)
electrons	Yes (eFF, e-reaxFF)	/

E. Neyts, P. Brault (Review article), *Molecular dynamics simulations for plasma surface interactions*, *Plasma Processes and Polymers* 14 (2017) 1600145



Practical Molecular Dynamics simulation: Interactions potentials

Metals : Embedded Atom Method (EAM) (well suited for metal catalysts)

- ⇒ energy of a solid is a unique functional of the electron density.
 - ⇒ uses the concept of electron (charge) density to describe metallic bonding:
 - ⇒ each atom contributes through a spherical, exponentially-decaying field of electron charge, centered at its nucleus, to the overall charge density of the system.
 - ⇒ Binding of atoms is modelled as embedding these atoms in this “pool” of charge, where the energy gained by embedding an atom at location r is some function of the local density.
- ⇒ The total energy thus writes:

With pairwise function:

and mixing rule:

S.M. Foiles, M.I. Baskes Contributions of the embedded-atom method to materials science and engineering, MRS Bulletin, 37 (2012) 485-491.

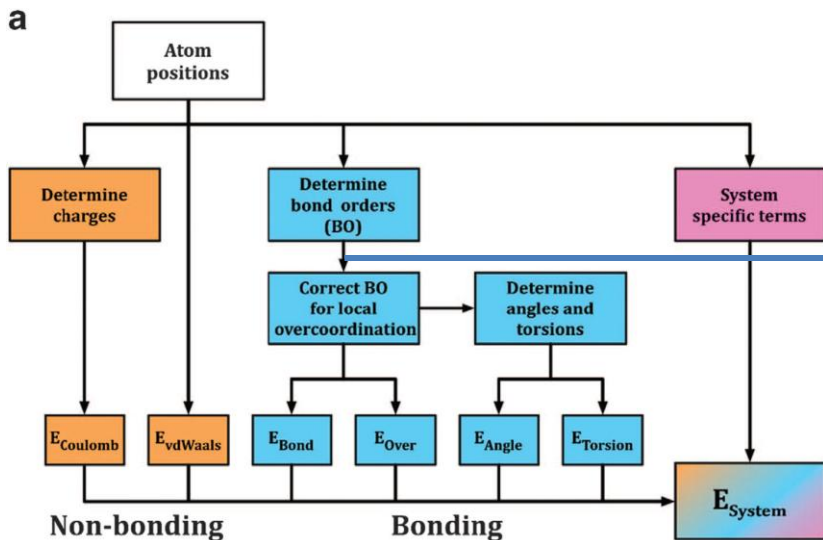
X. W. Zhou et al, Misfit energy-increasing dislocations in vapor-deposited CoFe/NiFe multilayers, Phys. Rev. B 69 (2004) 144113



Practical Molecular Dynamics simulation: Interactions potentials

ReaxFF allows for computationally efficient simulation of materials under realistic conditions, *i.e.* bond breaking and formation with accurate chemical energies. It also includes variable partial charges.

Due to the chemistry, ReaxFF has a complicated potential energy function: $E_{\text{system}} = E_{\text{bond}} + E_{\text{over}} + E_{\text{angle}} + E_{\text{tors}} + E_{\text{vdWaaals}} + E_{\text{Coulomb}} + E_{\text{Specific}}$



$$\begin{aligned}
 BO_{ij} &= BO_{ij}^{\sigma} + BO_{ij}^{\pi} + BO_{ij}^{\pi\pi} \\
 &= \exp \left[p_{bo1} \left(\frac{r_{ij}}{r_o^{\sigma}} \right)^{p_{bo2}} \right] + \exp \left[p_{bo3} \left(\frac{r_{ij}}{r_o^{\pi}} \right)^{p_{bo4}} \right] \\
 &\quad + \exp \left[p_{bo5} \left(\frac{r_{ij}}{r_o^{\pi\pi}} \right)^{p_{bo6}} \right]
 \end{aligned}$$

Correct Bond Order \Rightarrow Correct description of reaction energy barriers

Overview of the ReaxFF total energy components

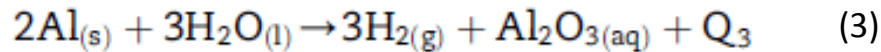
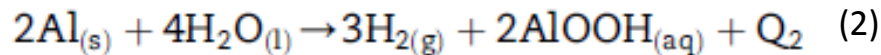
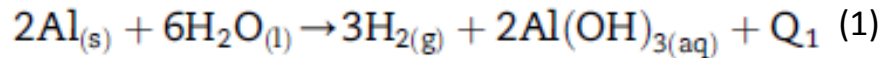
Parametrization using experimental known data and DFT calculations

TP Senftle et al, *The ReaxFF reactive force-field: development, applications and future directions*, npj Computational Materials 2, (2016) 15011



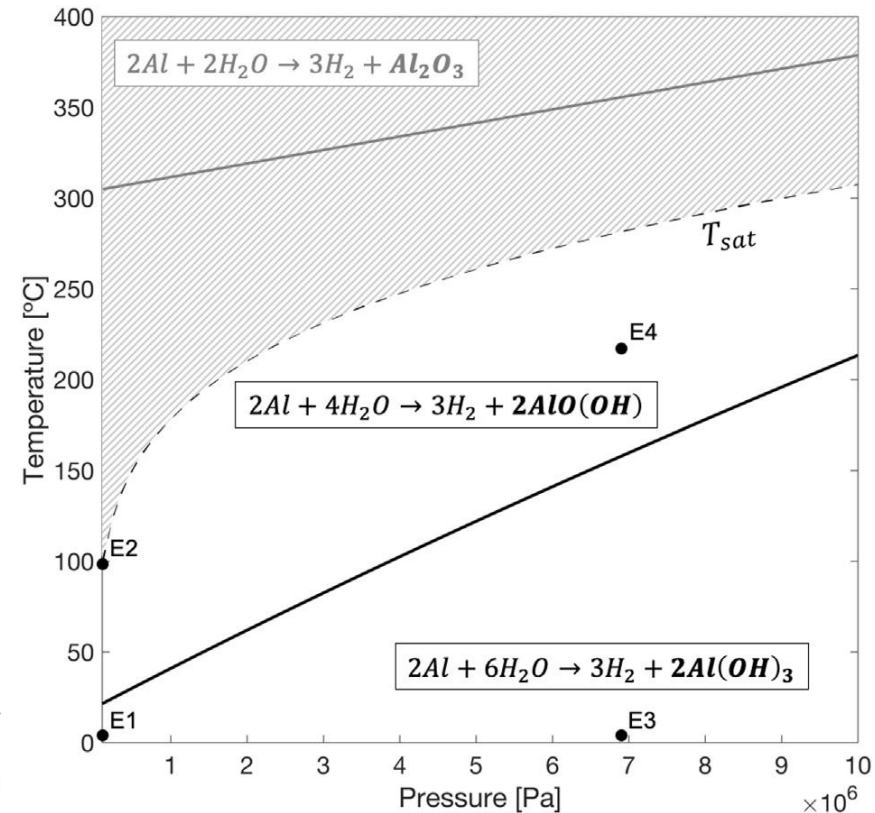
H₂ production: Al-H₂O

■ Basically:



P. Godart et al, Hydrogen production from aluminum-water reactions subject to varied pressures and temperatures, *Int. J. Hydrogen Energy* 44 (2019) 11448-11458

H.Z. Wang et al, A review on hydrogen production using aluminum and aluminum alloys, *Renewable and Sustainable Energy Reviews* 13 (2009) 845-853





H₂ production: Al-H₂O

- A reaxFF forcefield has been specially designed for H₂O interactions with Al

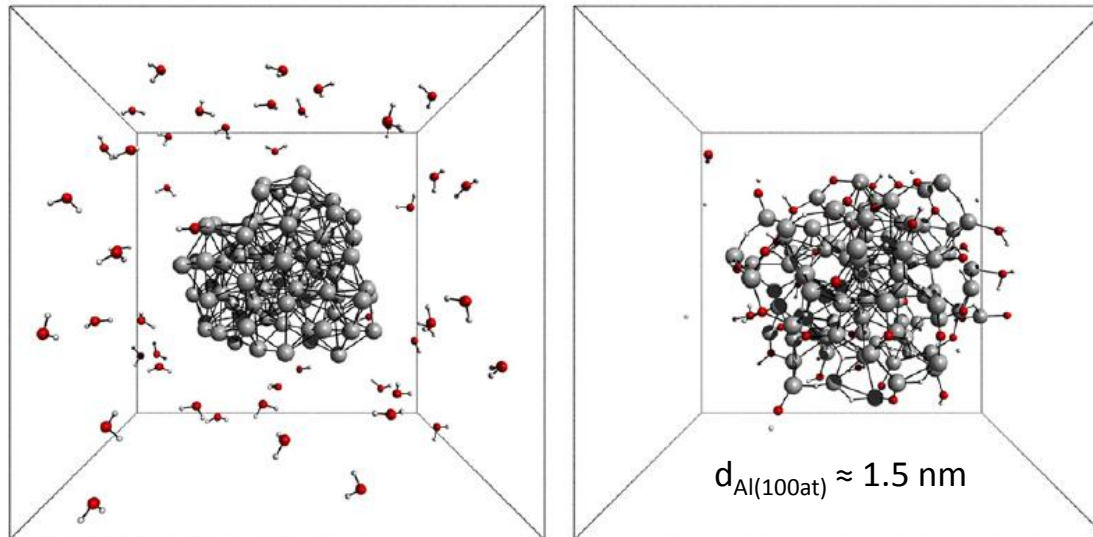
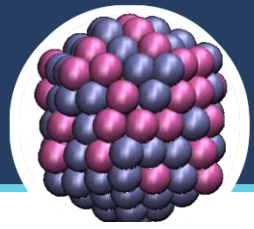


Fig. 1 – Images of the initial (left, 0 ps) and final (right, 66 ps) configuration of the Al₁₀₀ cluster with 50H₂O molecules.

Table 4 – Summary of the simulation cases involving oxygen molecules.

Simulation case	H ₂ O (g)	H ₂ O (ads)	H ₂ O (dis)	H ₂ (g)	H (ads)	OH (ads)	O (ads)
Al ₁₀₀ ·50(H ₂ O)	1	7	42	1	52	30	0
Al ₁₀₀ ·25(O ₂)·50(H ₂ O)	11	13	26	1	17	26	40
Al ₁₀₀ ·50(O ₂)·50(H ₂ O)	25	7	36	3	2	17	62
Al ₁₀₀ ·79(O ₂)·50(H ₂ O)	41	0	9	0	0	2	72

M. F. Russo et al, Molecular dynamic simulation of aluminum-water reactions using the ReaxFF reactive force field, *Int. J. Hydrogen Energy* 44 (2019) 11448 -11458



H₂ production: Al-H₂O

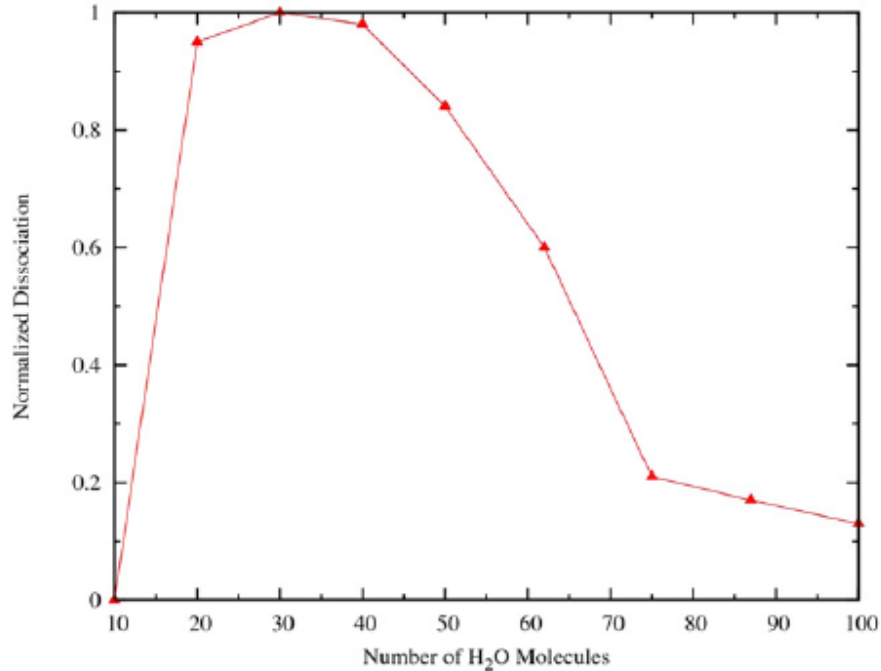


Fig. 6 – The water dissociation completion percentage as a function of initial amount of water used on an Al₁₀₀ cluster. We observe a maximum dissociation at 30 water molecules, providing an optimal balance between catalytic waters and surface site availability.

■ Water self-poisoning

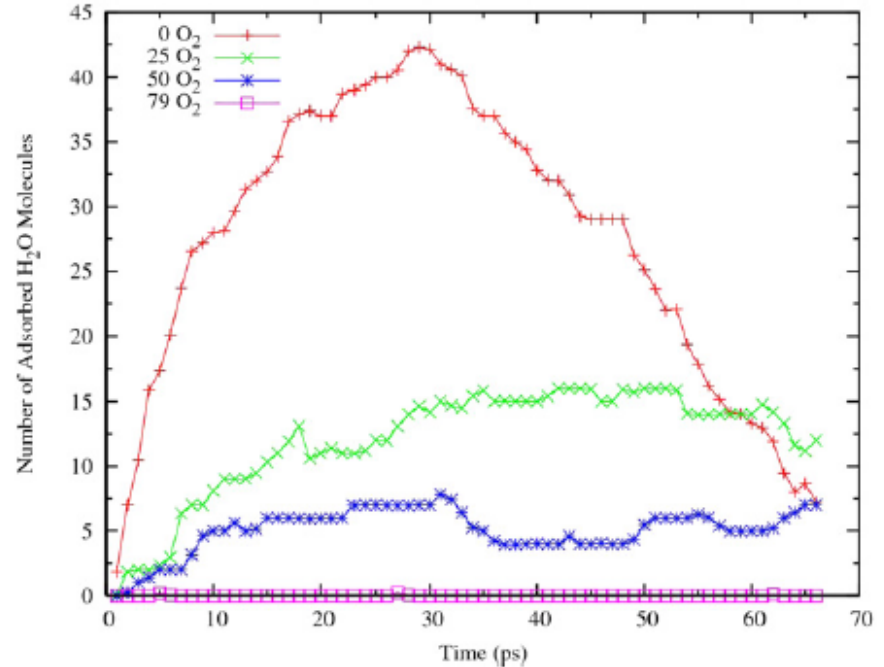


Fig. 8 – The number of adsorbed water molecules on the Al₁₀₀ surface as a function of time in the presence of 25, 50, or 79 O₂ molecules.

■ Adding O₂



H₂ production: Al-H₂O

■ Ab-initio Molecular Dynamics

PWA approximation, GGA exchange – correlation electronic calculation (-> forcefield) at each time step + dynamics using MD

But 400h calculation on 64 processors for 6 ps duration at 1000K

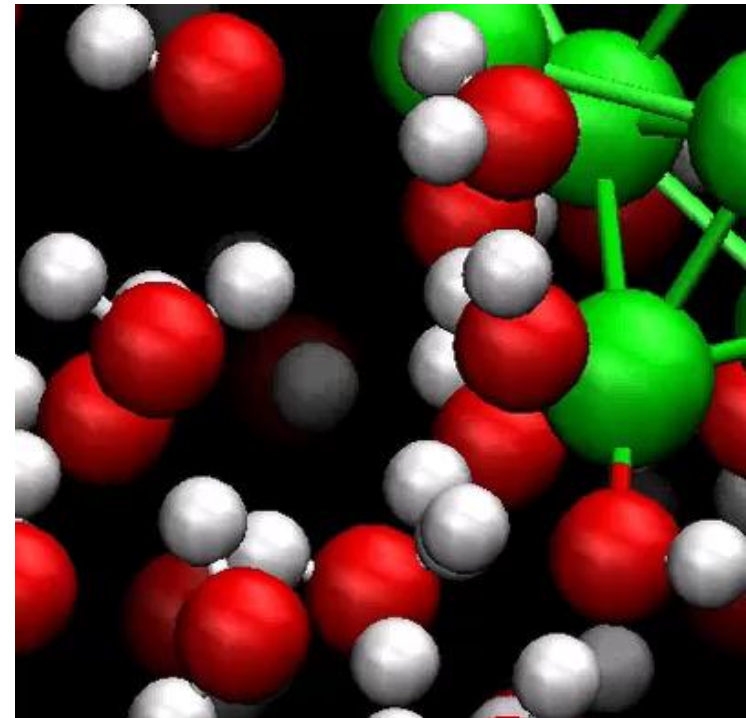
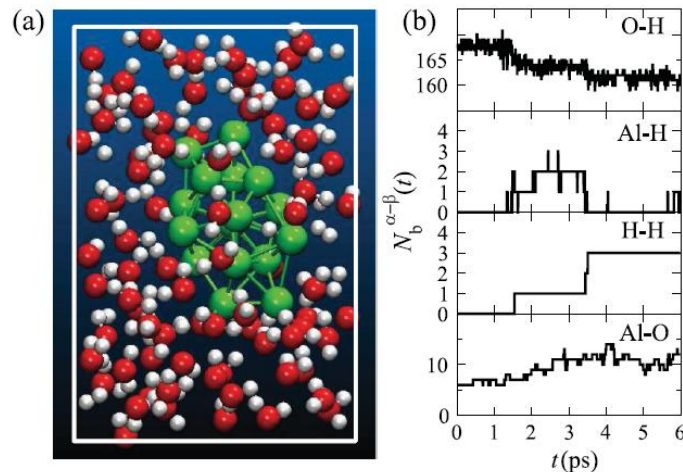


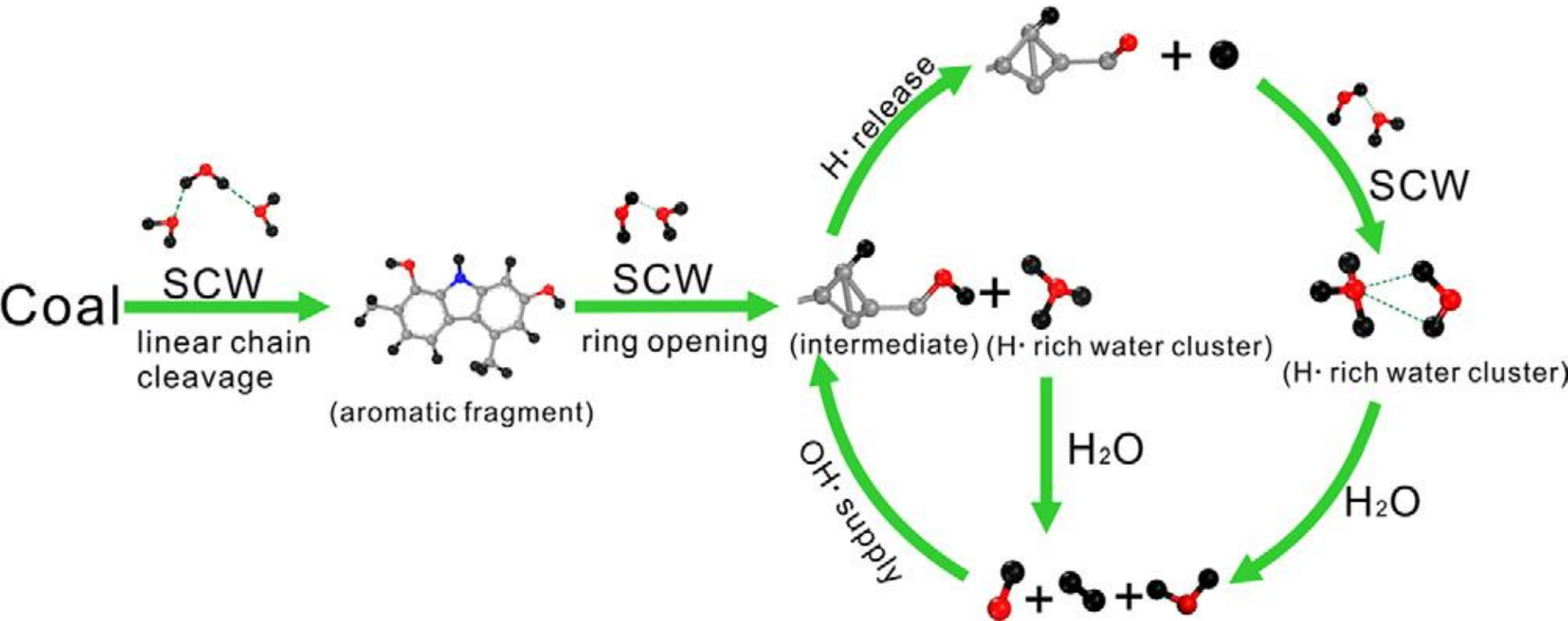
FIG. 1 (color). (a) Snapshot of the Al₁₇ + water system, where green, red, and white spheres represent aluminum, oxygen, and hydrogen atoms, respectively. (b) Time evolution of the number of chemical bonds $N_b^{\alpha-\beta}(t)$. Two atoms are considered bonded when their distance is less than a cutoff distance R_c during a prescribed bond lifetime 12 fs [16], where R_c is 1.3, 2.0, 1.0, and 2.4 Å for O-H, Al-H, H-H, and Al-O pairs, respectively.

F. Shimoro et al, Molecular Dynamics Simulations of Rapid Hydrogen Production from Water Using Aluminum Clusters as Catalysts, *Phys. Rev. Lett.* 104 (2010) 126102



H₂ Production: Biomass in SCW

- Combining DFT and ReaxFF MD for coal (not biomass) conversion in SCW



J. Zhang et al , The effect of supercritical water on coal pyrolysis and hydrogen production: A combined ReaxFF and DFT study, Fuel 108 (2013) 682–690



H₂ Production: Biomass in SCW

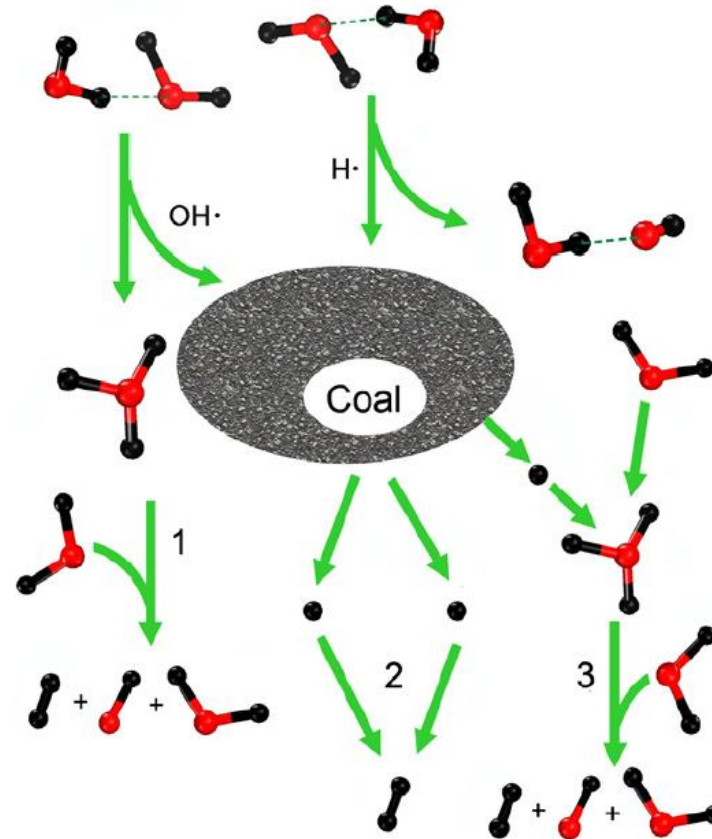


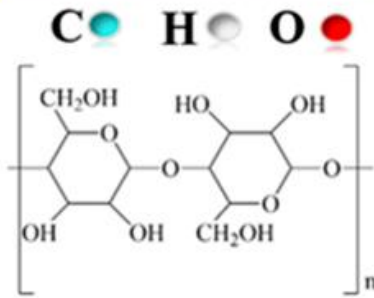
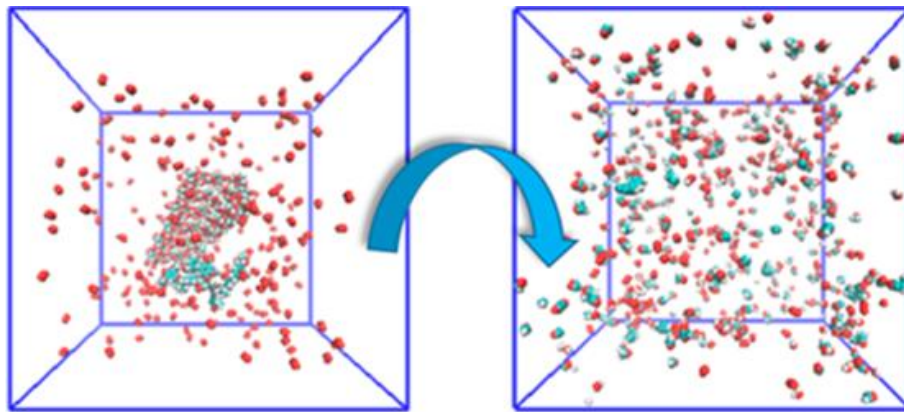
Fig. 7. Three reaction paths for H₂ production in the SCW-coal system.



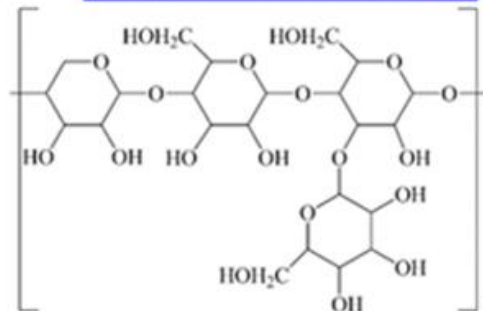
H₂ Production: Biomass pyrolysis

■ ReaxFF MD simulations

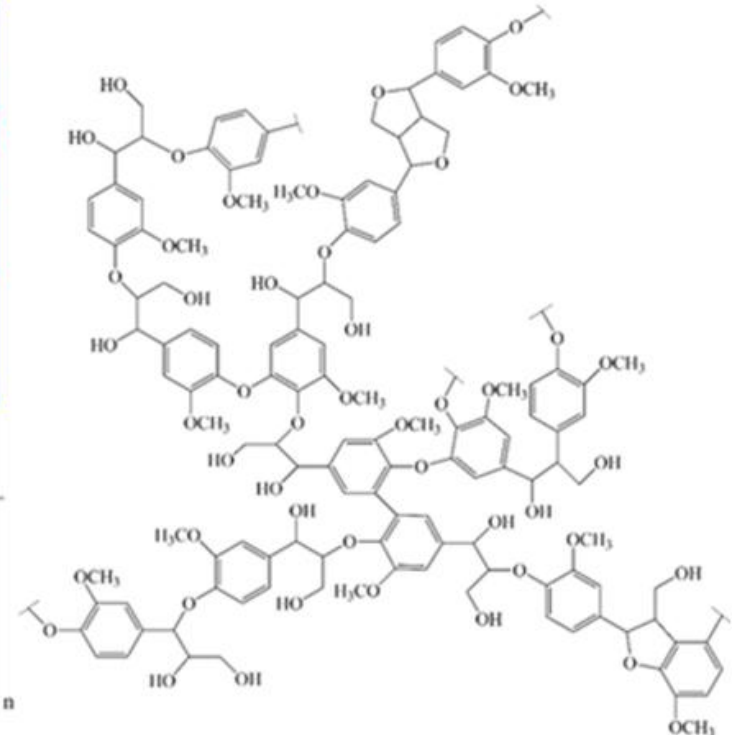
- 1 biomass molecule and 1000H₂O + 200 O₂) in a (100Å)³ box
- T = 1000, 1500, 1800, and 2000 K



Cellulose



Hemicellulose



Lignin

C. Chen et al, Reactive Molecular Dynamics Simulations of Biomass Pyrolysis and Combustion under Various Oxidative and Humidity Environments, *Ind. Eng. Chem. Res.* 56 (2017) 12276-12288



H₂ Production: Biomass pyrolysis

- Lignin pyrolysis is providing the highest H₂ ratio

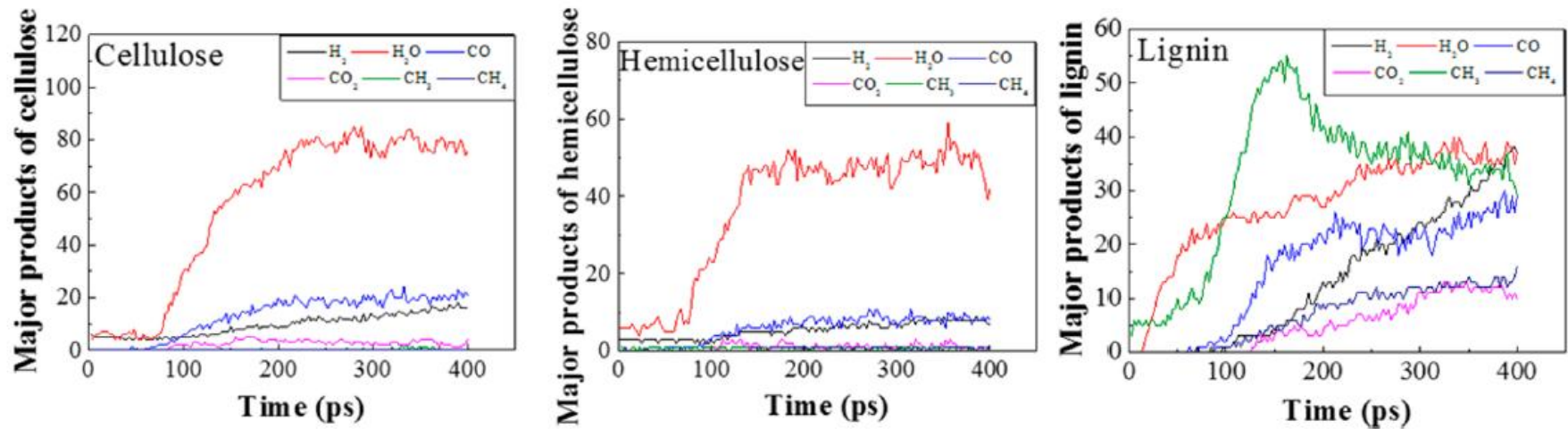


Figure 3. Time evolution (in number of molecules) of major pyrolysis products of cellulose, hemicellulose, and lignin at 2000 K.



H₂ conversion in low temperature fuel cells : Supported and free nanocatalyst growth

- Supported Pt₂PdAu nanocatalyst growth on porous carbon: Sequential PdAu deposition followed by Pt deposition

Potentials used in the system:

Pt-Pd-Au: EAM potentials

C – C: Tersoff potential -> thermostat

Metal – C: LJ potential (Steele)

Model porous carbon from TEM measurements

→ AuPd@Pt₂ core@shell

But always Au segregation towards surface!

● Pt; ● Pd; ● Au

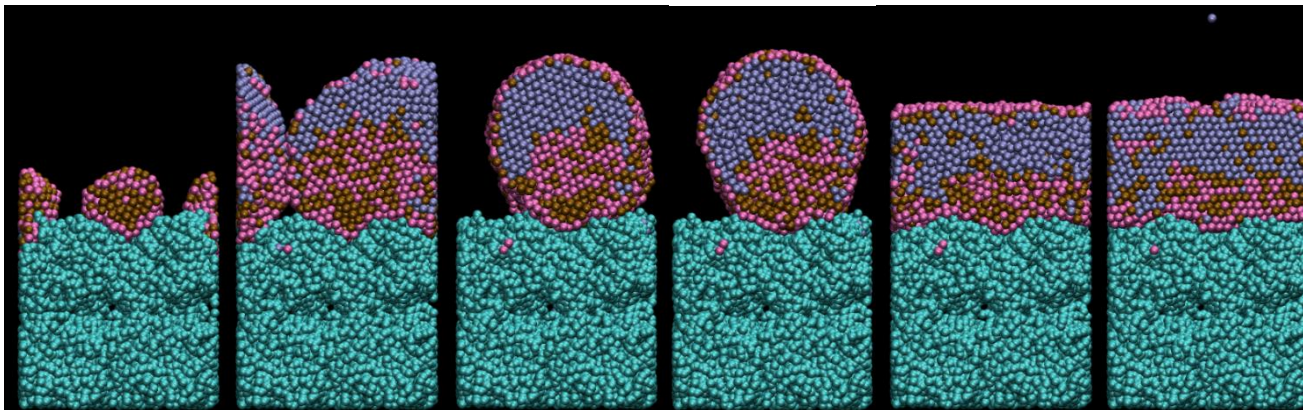
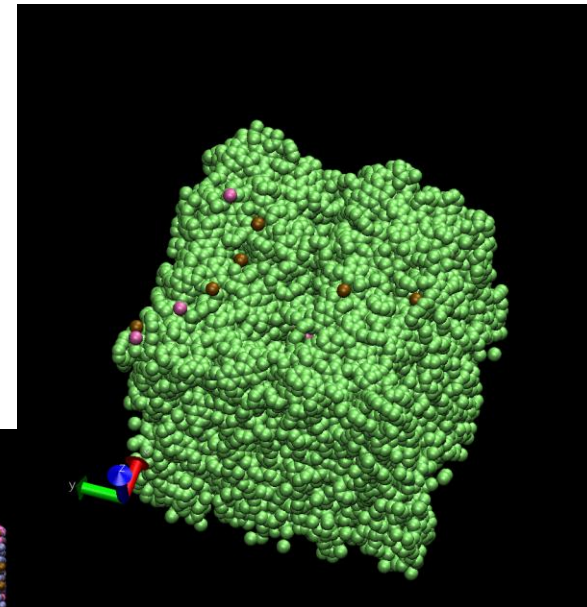


Table 1 – EAM and average experimental surface energies of the low index faces of Pt, Pd, Au in Jm⁻² [40].

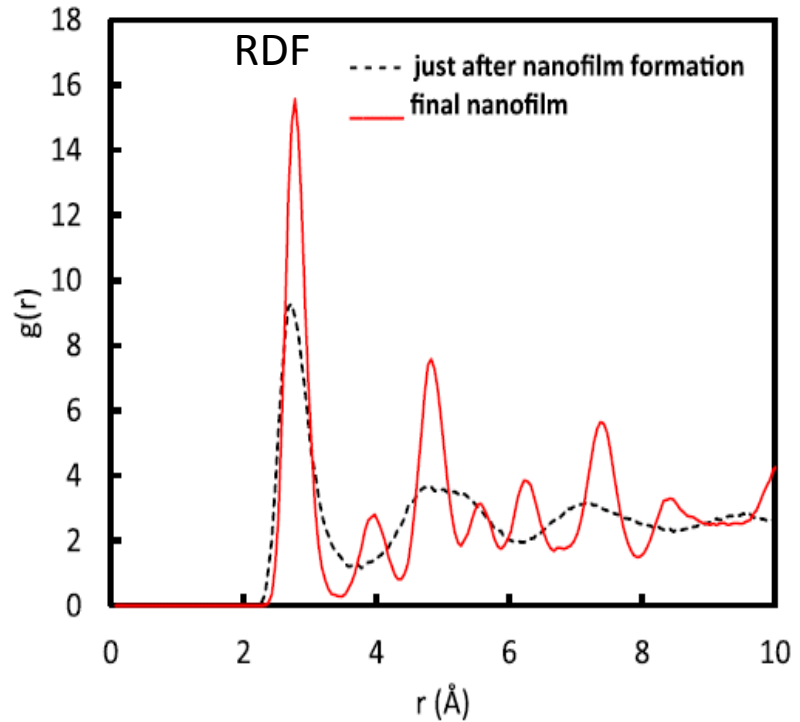
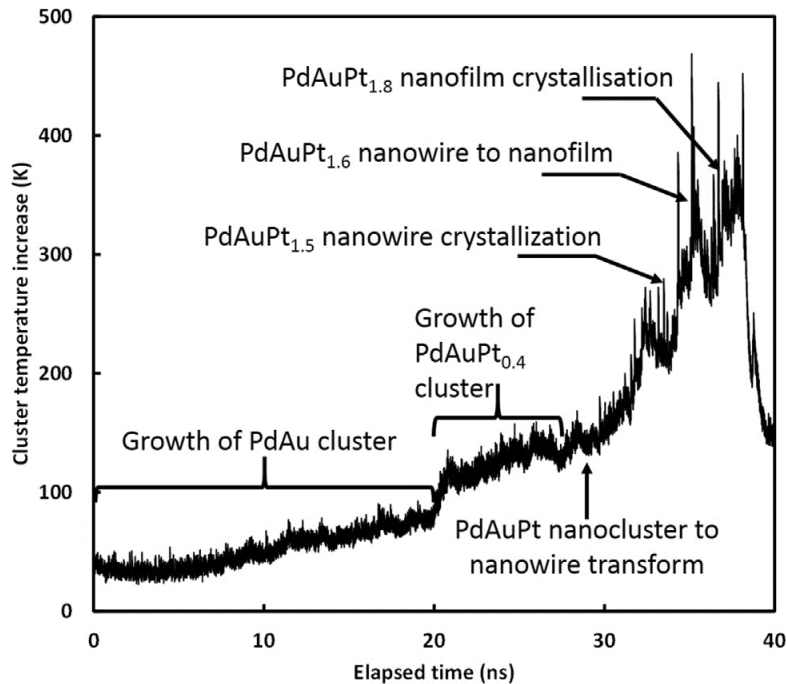
	Pt	Pd	Au
(111)	1.44	1.22	0.79
(100)	1.65	1.37	0.92
(110)	1.75	1.49	0.98
Experimental, face averaged	2.49	2.00	1.5

P. Brault, Molecular dynamics simulations of ternary Pt_xPd_yAu_z fuel cell nanocatalyst growth, International Journal of Hydrogen Energy 41 (2016) 22589-22597



H₂ conversion in low temperature fuel cells : Supported and free nanocatalyst growth

Correlations between cluster temperature evolution and morphology transform in the course of deposition of core-shell PdAu@Pt₂ nanocatalyst

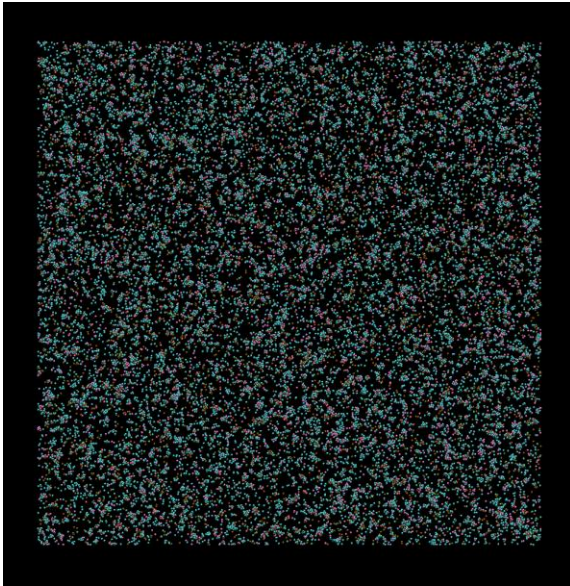


- L. Xie, P. Brault, C. Coutanceau, A. Caillard, J. Berndt, E. Neyts Appl. Cat. B, 62 (2015) 21 – 26
- P. Brault, et al, International Journal of Hydrogen Energy 41 (2016) 22589-22597
- E. Neyts, P. Brault, Plasma Processes and Polymers 14 (2017) 1600145 - FP7 FCH-JU SMARTCat project #325327



H₂ conversion in low temperature fuel cells : Supported and free nanocatalyst growth

■ Free Pt₃Me(Au) (Me = Ni, Cu) nanocatalyst growth



Temperature evolution of the
vapor and of the metal vapor
and then of clusters the
→ cluster growth and
coalescence : breaks in the
plot (green vertical sticks)

Tricks :

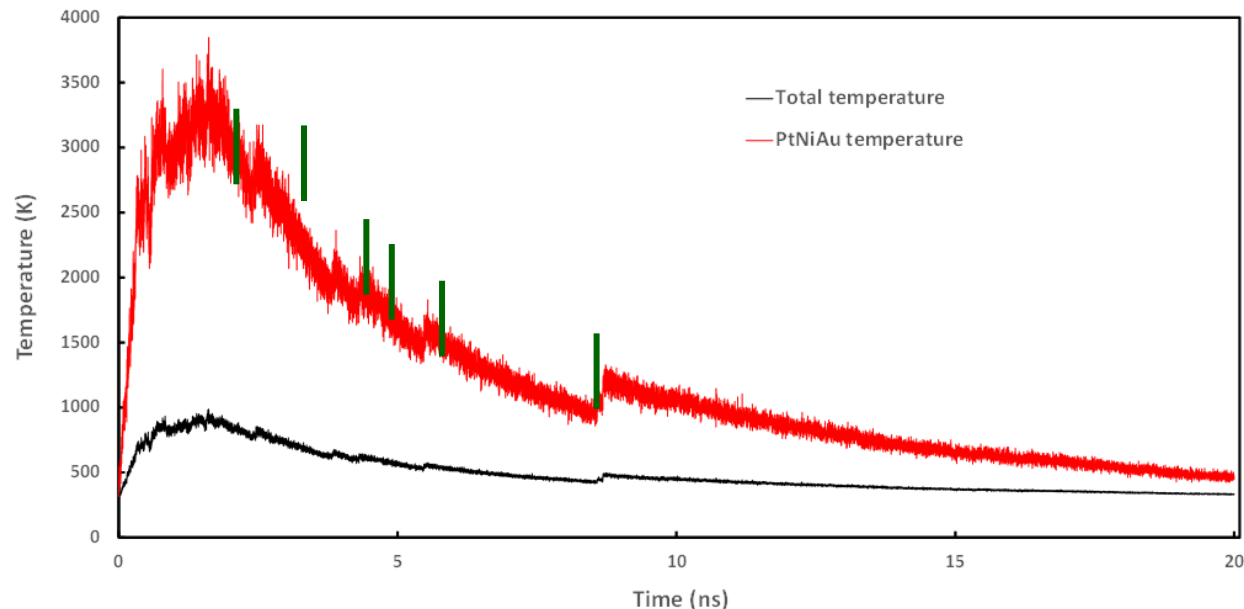
NVE ensemble for Pt, Ni and Au

NVT ensemble for Ar : surrounding gas is the thermostat

Ratio of N_{Ar} to N_{metal} estimated from experiments:
depends on discharge current, Ar pressure, ...

here: $N_{Ar}=128000$; $N_{Pt}=19200$; $N_{Ni}=6400$; $N_{Au}=6400$

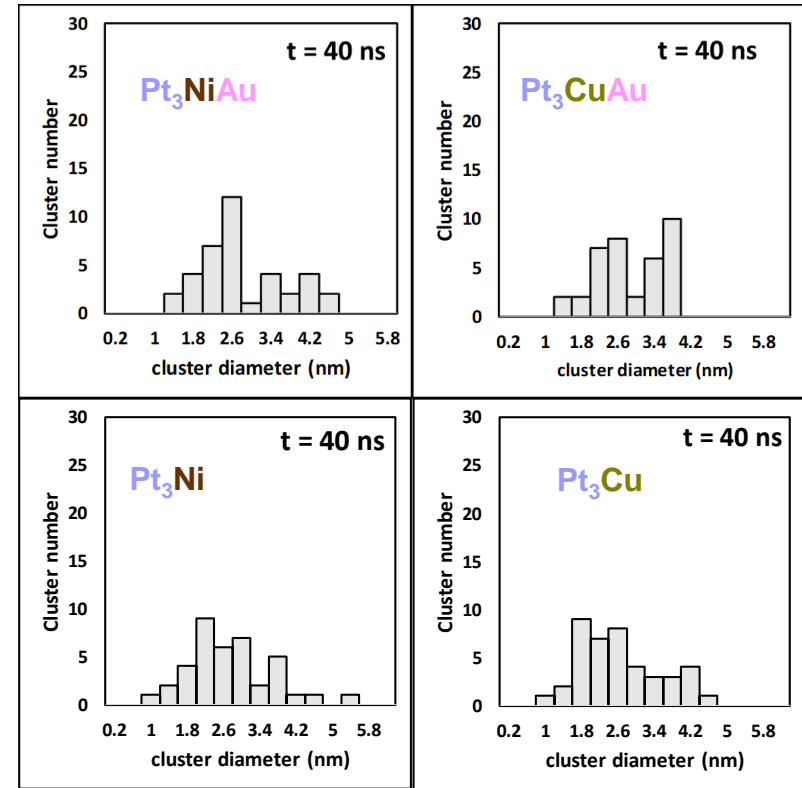
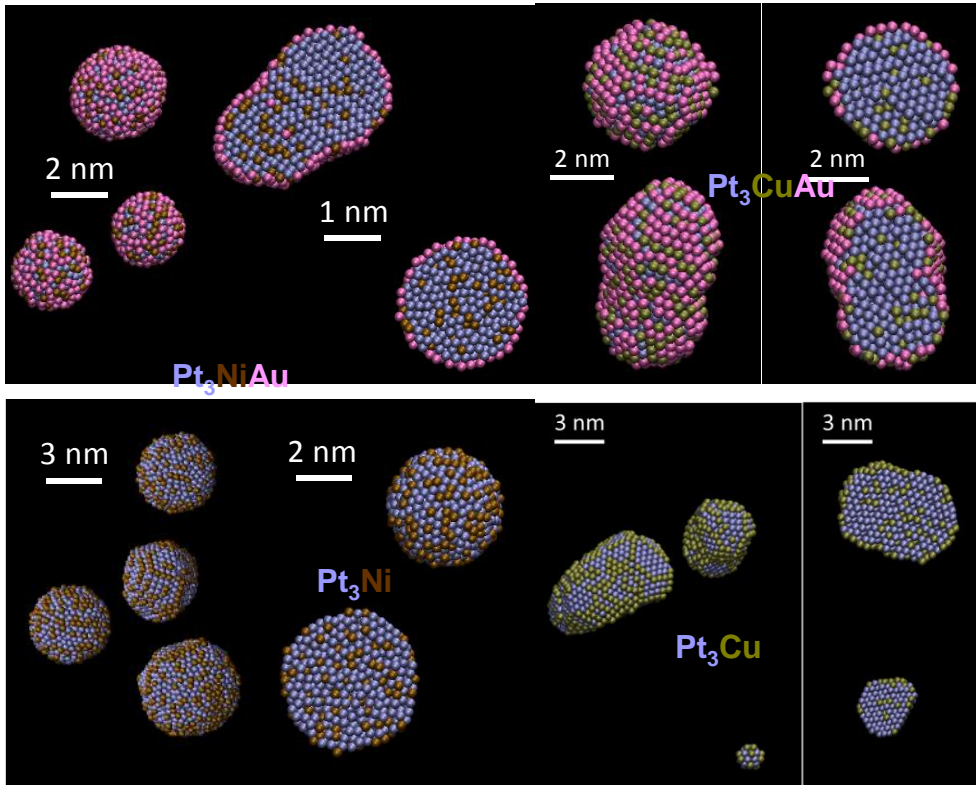
Box size $64 \times 64 \times 64$ nm³; $dt = 1$ fs, $4 \cdot 10^7$ timesteps





H₂ conversion in low temperature fuel cells : Supported and free nanocatalyst growth

Free Pt₃Me(Au) (Me = Ni, Cu) nanocatalyst growth



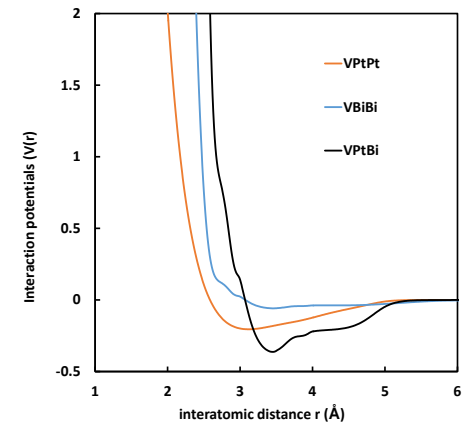
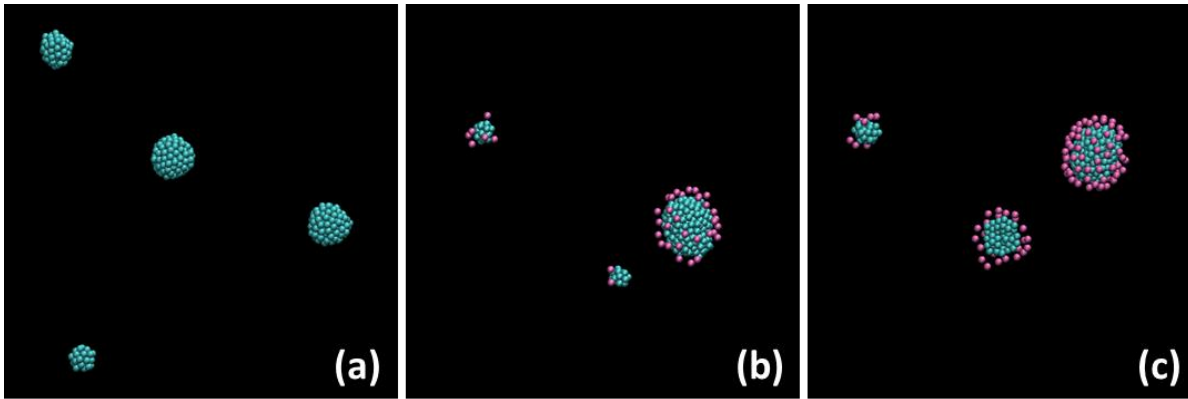
- Au segregation towards cluster surface
- CuAu surface alloy for Pt₃CuAu → better efficiency for Oxygen Reduction Reaction as observed
- Pt₃Cu(Au) more well crystallized

P. Brault et al, Pt₃MeAu (Me = Ni, Cu) fuel cell nanocatalyst growth, shapes and efficiency: A molecular dynamics simulation approach, J. Phys. Chem. C 123 (2019) 29656



H₂ conversion in low temperature fuel cells : Supported and free nanocatalyst growth

■ Pt_xBi_y nanocatalyst growth



Snapshot of the final clusters at 20 ns. Argon atoms (4000) are not represented for clarity. $n_{Pt} + n_{Bi} = 500$. (a) Pt alone (b) Pt₉Bi₁ (c) Pt₈Bi₂. Box size 16x16x16 nm³

Plots of the pair part of the EAM interaction potentials:

$$V_{PtPt}(r), V_{BiBi}(r), V_{PtBi}(r).$$

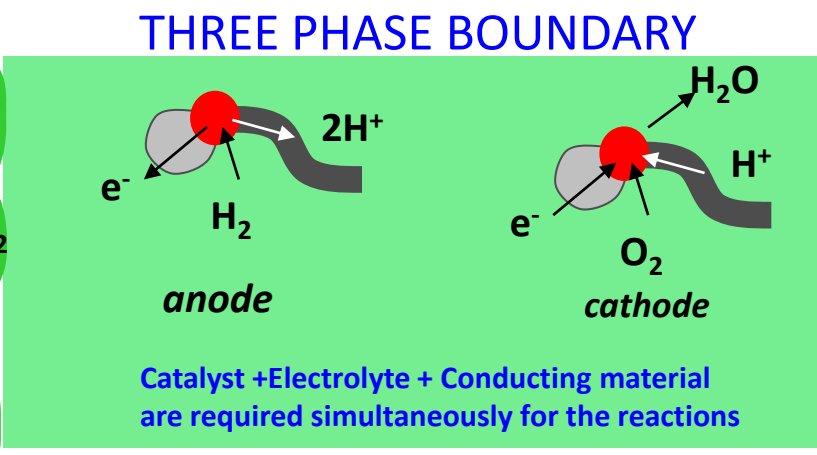
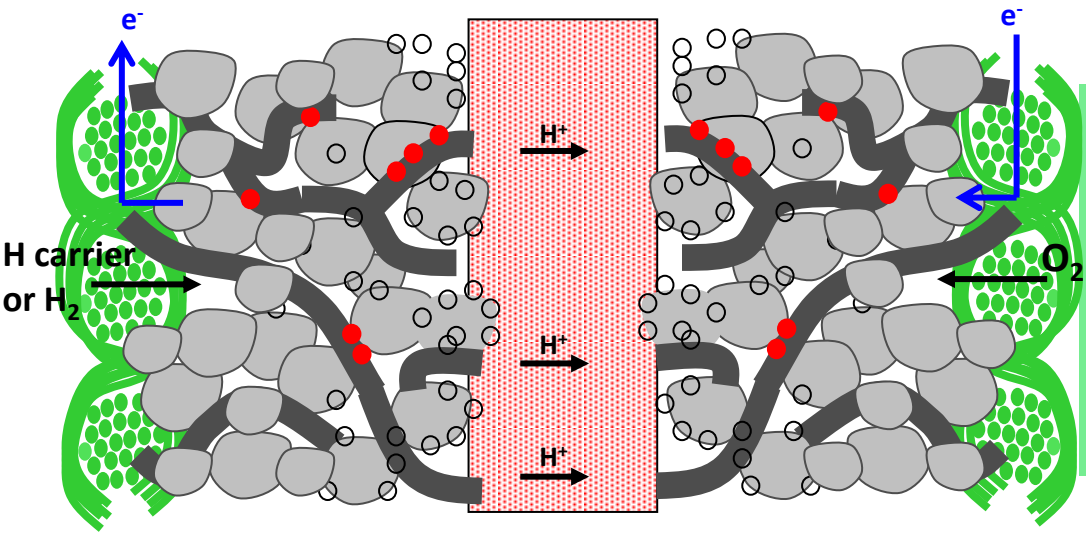
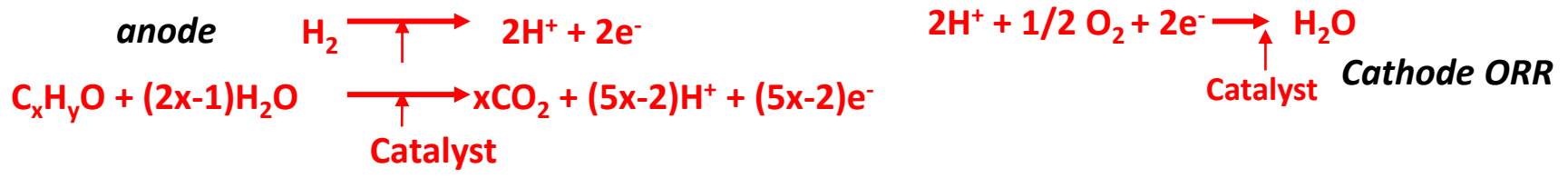
- Cluster atomic arrangements are typical of a crystalline structure of the Pt cores, with numbers of 1st nearest neighbors between 10 and 12 (i.e. consistent with fcc arrangement)
- Bi composition < 20% leads to cluster surfaces with both Pt and Bi, allowing catalytic activity enhancement.
- Pt/Bi atomic composition is not only globally preserved, but is also verified for each cluster

B.S.R. Kouamé et al, Insights on the unique electro-catalytic behavior of PtBi/C materials, *Electrochimica Acta* 329 (2020) 135161



H₂ conversion in low temperature fuel cells: Oxygen Reduction Reaction

■ PEM Fuel Cell



- Nafion solution
- Active catalyst
- Inactive catalyst
- Nafion electrolyte
- Carbon nano-particle
- Carbon cloth (backing)



H₂ conversion in low temperature fuel cells: Oxygen Reduction Reaction

- A « realistic » three phase boundary:
water + Nafion electrolyte + Pt nanocatalyst supported on graphite

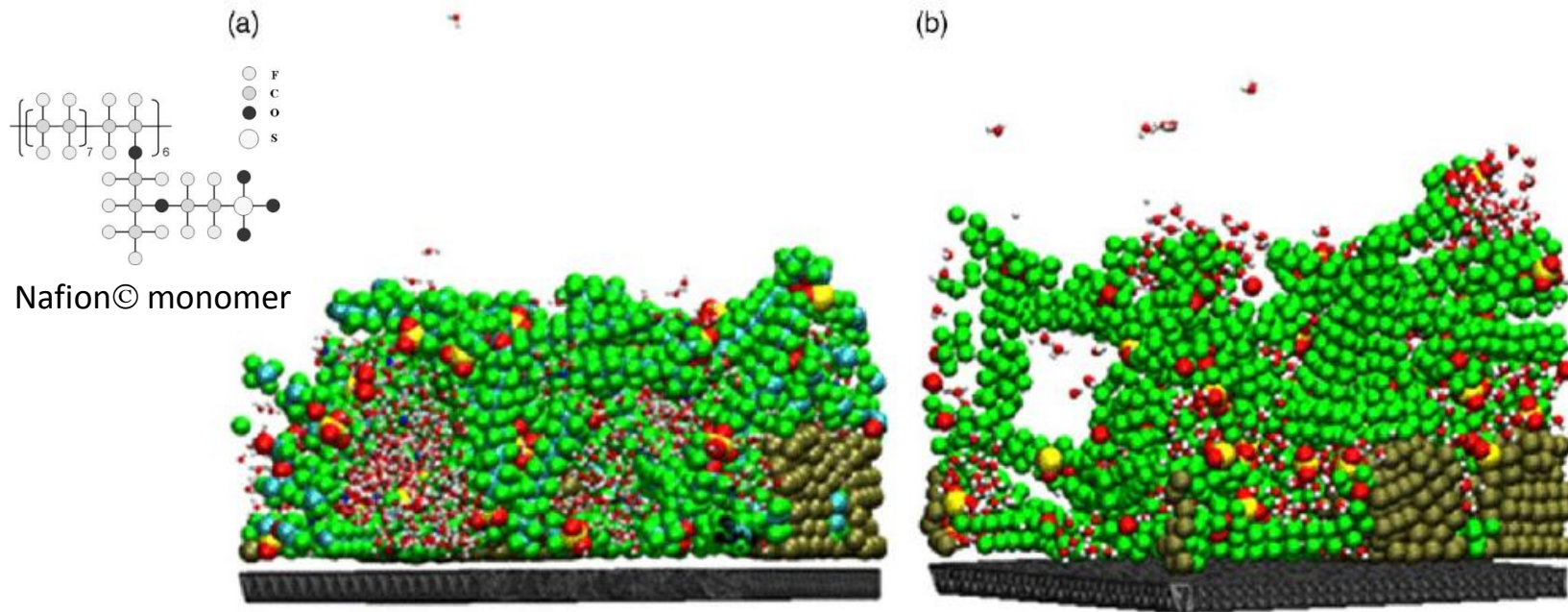


Fig. 1. Side view of the system at the simulated maximum NAFION content (14 NAFION-4, and $\lambda = 24$). Water clustering is observed near the sulfonic groups and the model NAFION layer totally covering the catalyst particles. (a) Well-packed NAFION structure obtained from deposition without annealing procedure. (b) Alternative model where NAFION has been partially detached after an annealing procedure. Color coding for the figure is as follows: F, green; O, red; H, white; S, yellow; Pt, tan; C, cyan (not visible in the pictures since it is covered by the F atoms) and the graphite layer is represented by the two parallel planes shown at the bottom. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of the article.)

E. J. Lamas et al, Molecular dynamics studies of a model polymer–catalyst–carbon interface, *Electrochimica Acta* 51 (2006) 5904–5911



H₂ conversion in low temperature fuel cells: Oxygen Reduction Reaction

- Oxygen transport through the electrolyte

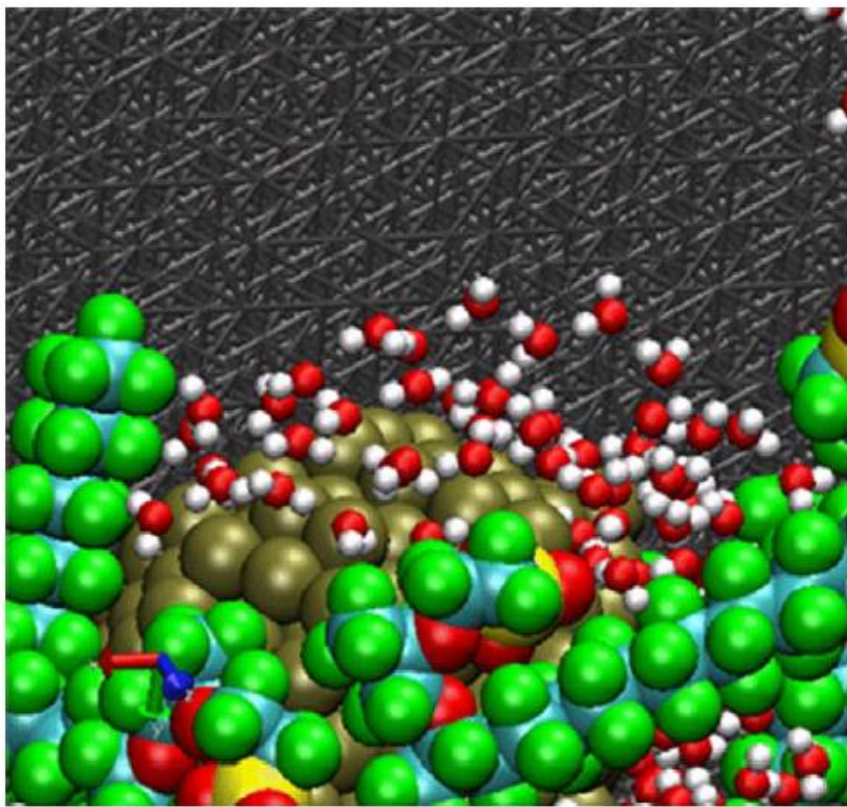


Fig. 5. Details of the interface catalyst surface/water/model NAFION (for a polymer content of 7 NAFION-4/cell, $\lambda = 24$). Notice water organization over the catalyst surface.

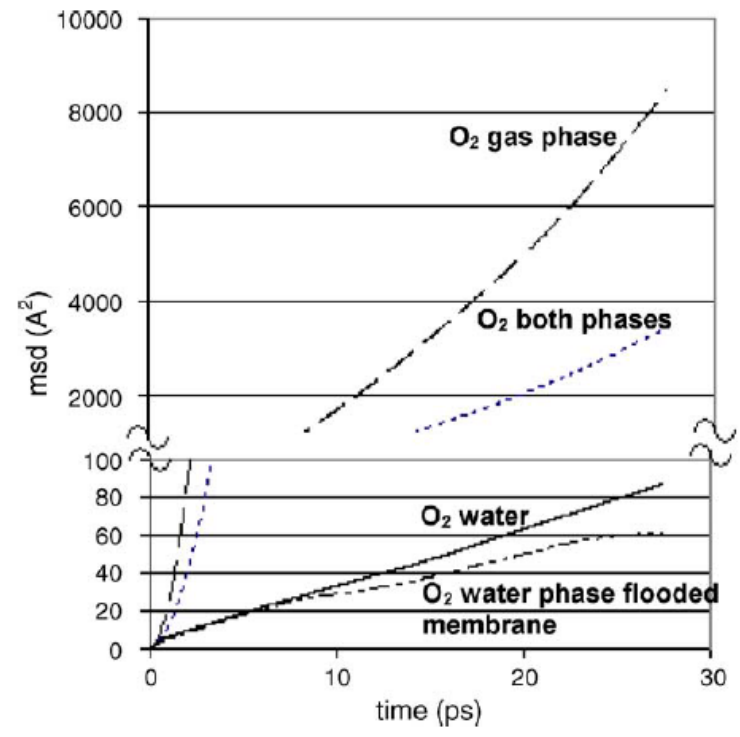
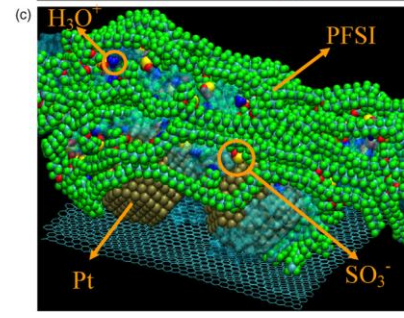
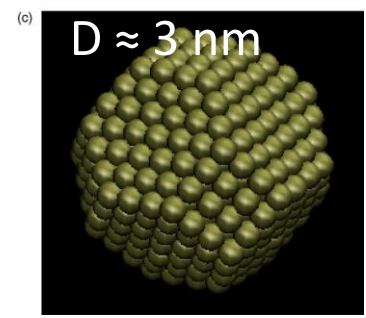
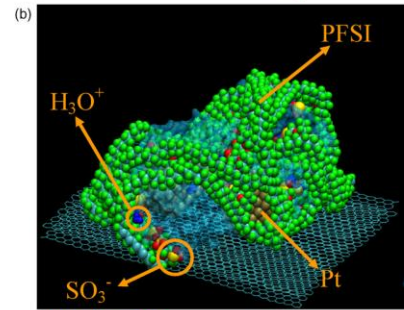
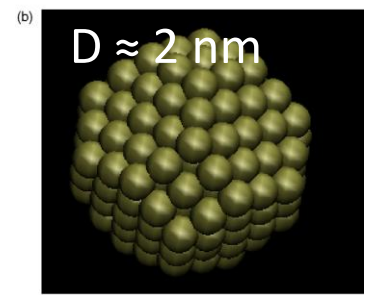
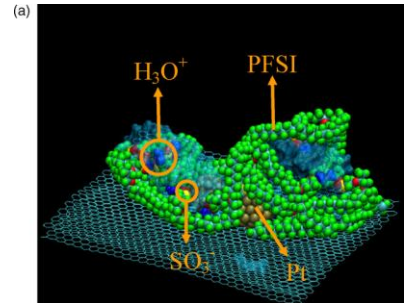
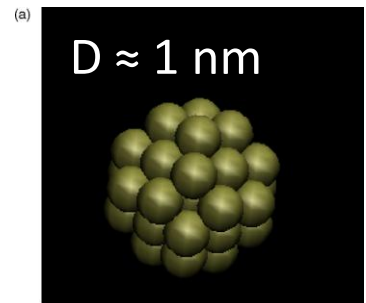


Fig. 7. Time evolution of the O₂ mean square displacement, providing estimates of O₂ diffusion in water at the conditions of flooded NAFION ($\lambda = 64$). O₂ diffusion in pure water is provided as a reference. Notice that oxygen diffusion in the flooded MEA gives values close to the ones calculated for bulk water but deviating at long times because of the absence of an Einstein type diffusion mechanism in the MEA.

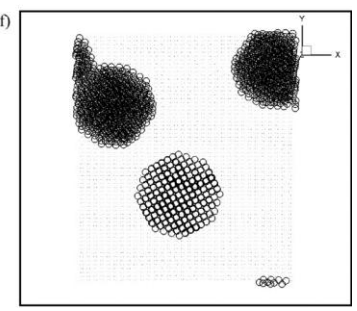
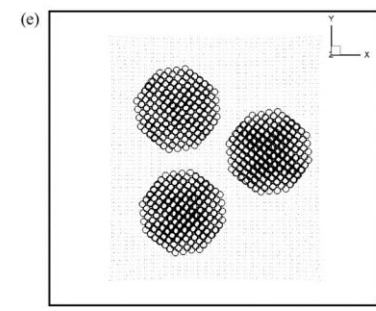
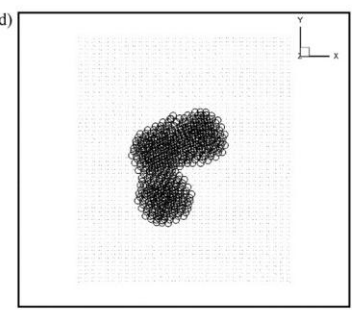
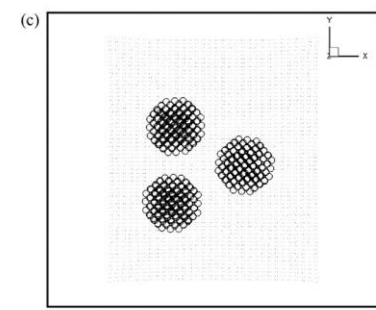
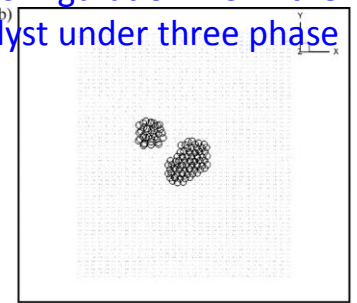
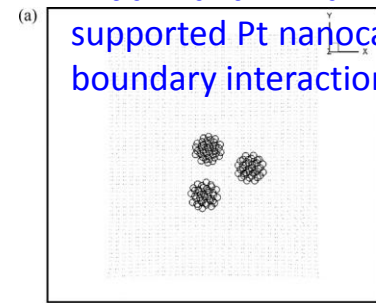


H₂ conversion in low temperature fuel cells: Oxygen Reduction Reaction

■ Effects of Pt nanocatalyst size



Initial and final configuration of the supported Pt nanocatalyst under three phase boundary interaction



C.H. Cheng et al, Effect of Pt nano-particle size on the microstructure of PEM fuel cell catalyst layers: Insights from molecular dynamics simulations, *Electrochimica Acta* 55 (2010) 1588–1597





H₂ conversion in low temperature fuel cells: Oxygen Reduction Reaction

■ Ab-initio molecular dynamics of the ORR

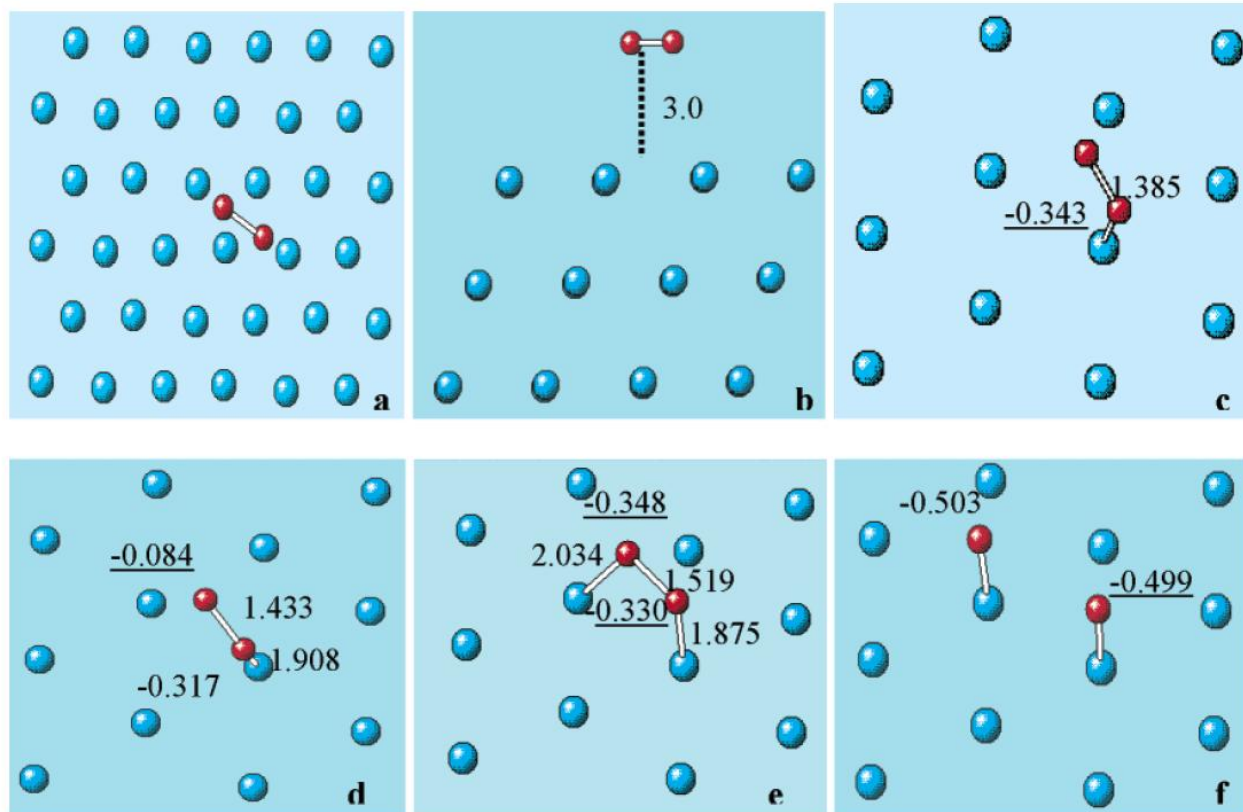


Figure 1. Snapshots of the O₂ + Pt(111) trajectory at 350 K. Only the surface layer is included in Figures (c)–(f) for clarity. The underlined data refers to the charge carried by adjacent oxygen atoms. (a) Top view of the initial configuration wherein O₂ is located parallel (3.0 Å above) to the Pt(111) surface, over the 2-fold bridge site. (b) Side view of the initial configuration. (c) One-end chemisorbed precursor at 0.24 ps, in which one oxygen is chemisorbed atop the Pt atom (at 1.85 Å) while the other oxygen is still far (2.80 Å) from the surface, and $R_{O-O} = 1.38$ Å. (d) One-end chemisorbed precursor at 0.36 ps, with distances oxygen-surface $R_{O-S} = 2.47$ and 1.91 Å, and $R_{O-O} = 1.43$ Å. (e) Top-bridge-top intermediate at 0.41 ps, with $R_{O-S} = 1.87$ and 2.03 Å and $R_{O-O} = 1.52$ Å. (f) Atop atomic adsorption at 1.16 ps.

Y. Wang and P. B. Balbuena, Roles of Proton and Electric Field in the Electroreduction of O₂ on Pt(111) Surfaces: Results of an Ab-Initio Molecular Dynamics Study, *J. Phys. Chem. B* **108** (2004) 4376-4384



H₂ conversion in low temperature fuel cells: Oxygen Reduction Reaction

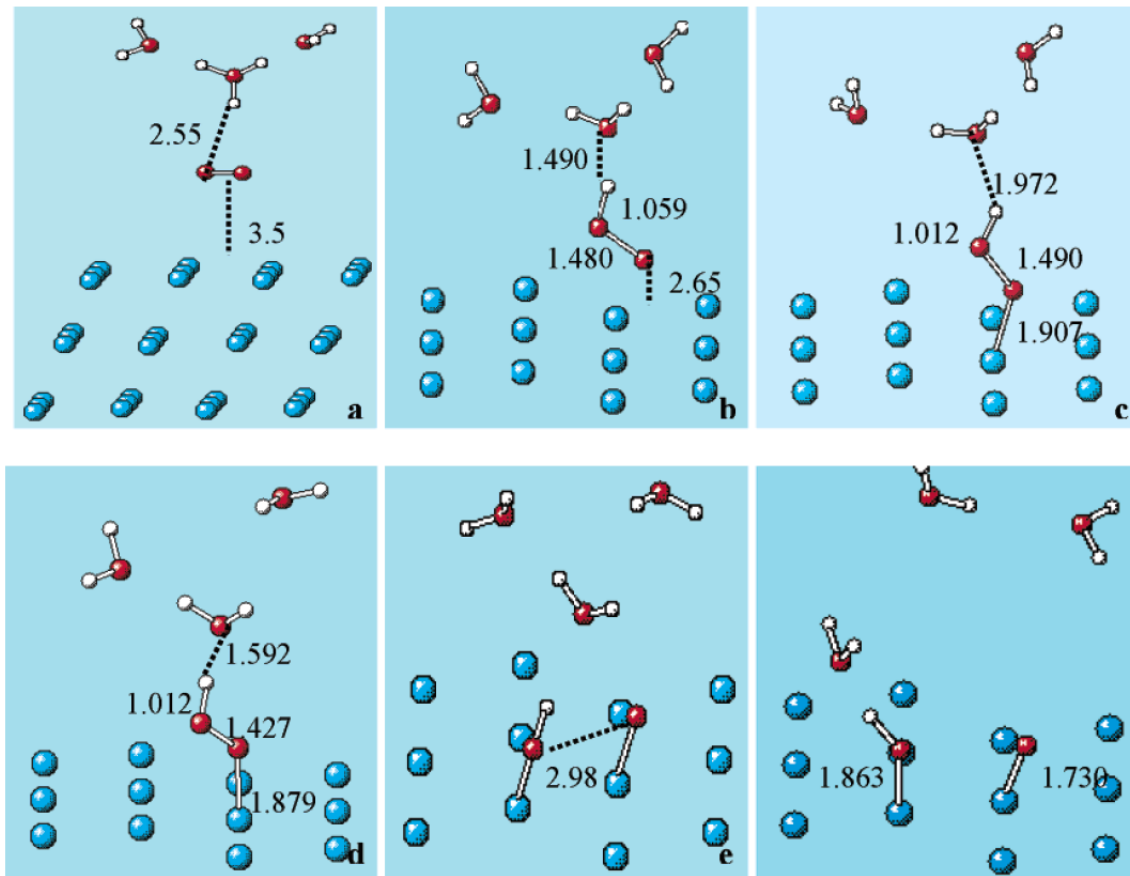


Figure 3. Snapshots of the $\text{O}_2 + \text{H}^+(\text{H}_2\text{O})_3/\text{Pt}(111)$ trajectory at 350 K. For clarity, only the surface layer is included in 3(b)–(f). (a) Side view of the initial configuration wherein O_2 is located parallel (3.5 Å above) to the Pt(111) surface, over the 2-fold bridge site, and the proton is separated from O_2 by 2.55 Å. (b) Formation of the proton-transfer intermediate $\text{H}^+-\text{O}-\text{O}\cdots\text{Pt}$ at 0.25 ps. (c) One-end chemisorbed precursor $\text{H}^+-\text{O}-\text{O}-\text{Pt}$ at 0.30 ps, wherein a strong interaction exists between the oxygen end and the Pt(111) surface, evidenced by the short distance $R_{\text{O}-\text{S}} = 1.91$ Å. (d) Another view of the one-end chemisorbed precursor at 0.42 ps. (e) Dissociation of the one-end chemisorbed precursor and consequent chemisorption of OH at 0.50 ps. (f) The chemisorbed hydroxyl in atop site at 0.85 ps.



H₂ conversion in low temperature fuel cells: Oxygen Reduction Reaction

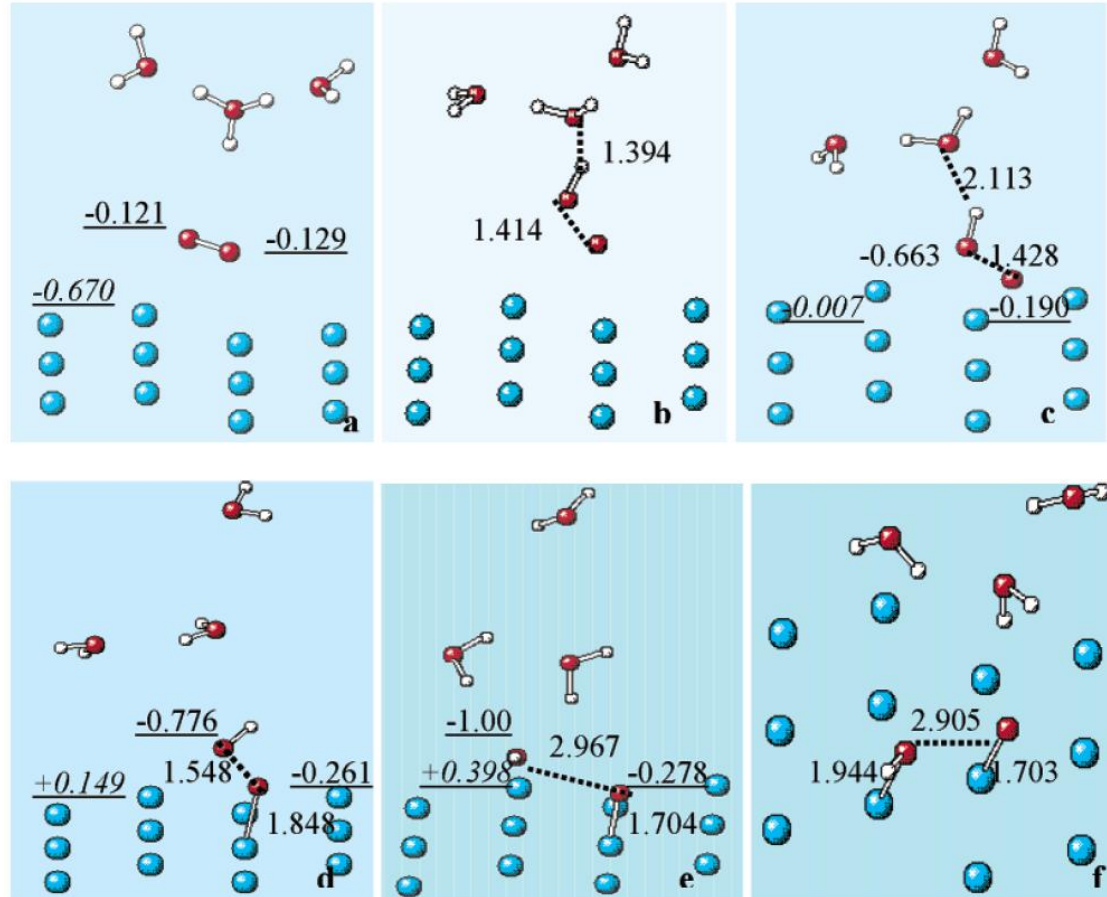


Figure 6. Snapshots of the $O_2 + H^+(H_2O)_3 + e^-/Pt(111)$ system at 350 K. For clarity, only the surface layer is included. The underlined data refers to the charge carried by oxygen atoms, but the values (in italics) shown on the surface are cumulative charges borne by the Pt slab. (a) Side view of the initial configuration. (b) Proton-transfer intermediate $H-O-O$ generated at 0.15 ps. (c) Proton-transfer intermediate $H-O-O$ at 0.44 ps. (d) One-end chemisorbed precursor $H-O-O-Pt_n$ (adsorbed) at 0.53 ps. (e) $H-O-O-Pt_n$ dissociation into $H-O$ and O (adsorbed) at 0.73 ps. (f) Atop atomic adsorption at 0.89 ps.



Conclusions

- MD simulations are a very relevant and powerful « analysis » and « predicting » tool for providing insights into H₂ production and conversion mechanisms
- Reactive MD is very powerful since availability of reactive and variable charge reaxFF potential family
- Matching experimental conditions is a condition for successful comparisons.

Thanks a lot for your attention