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OPEN Controlling water-mediated interactions by designing self-assembled monolayer coatings

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Engineered nanoparticles have been broadly used in biological and geological systems. Hydrophilic molecules such as polyols have been used as coatings on nanoparticle surfaces due to their good biocompatibility and solubility in saline water. However, polyol coatings can cause huge retention of nanoparticles when encountering mineral surfaces. Here, molecular dynamics simulations enlightened that the strong adhesion of hydrophilic coatings to mineral surfaces stemming from the partitioning of the hydroxy groups on the hydrophilic molecules to the well-defined bound hydration layers on the mineral surfaces. To mitigate the nanoparticle adhesion, we investigated introducing small percentages of omniphobic fluoroalkanes to form a bicomponent system of hydrophilic and fluoroalkanes, which greatly perturbed the hydration layers on mineral surfaces and resulted in nonstick surface coatings. Our results provide important insight for the design of tunable "stickiness" nanoparticle coatings in different mineralogies, such as applications in subsurface environments or targeted delivery in mineralized tissues.

Nanoparticle-mineral interactions are relevant in many biological, technological, and geological applications. In biomedicine, nanoparticles have been used as drug and gene carriers for bone regeneration and cancer therapy¹⁻⁴, as well as MRI and CT contrast agents for musculoskeletal tissues^{5,6}. In addition, natural or manmade nanoparticulates can play a key role in regulating or causing pathogenic biomineralization through heterogeneous nucleation and adhesion on mineral surfaces⁷⁻⁹. On the other hand, in geological and environmental applications, nanoparticles have been proposed for improving oil and gas recovery, flow diagnostics, CO₂ sequestration, and environmental remediation, where the nanoparticles encounter extended mineral surfaces when traveling through subsurface formation matrices¹⁰⁻¹⁶.

Surface functionalization has been critical for the engineered nanoparticles to achieve the desired compatibility in the target environments. Hydrophilic coatings such as polyols and polysaccharides are attractive for their good biocompatibility and solubility in saline aqueous environments¹⁷⁻¹⁹. Nevertheless, polyols and polysaccharides may form extensive adsorption on mineral surfaces²⁰. This property can be beneficial when using the polyol-functionalized nanoparticles as mineral flocculants or bone regeneration scaffolds²¹⁻²³. However, the nonspecific adsorption can also be detrimental if the transport of nanoparticles through mineral interfaces without any retention is desired, such as using nanoparticles as subsurface interwell tracers²⁴⁻²⁶ or targeted drug delivery agents in specific bone locations^{3,4}.

Despite the immediate relevance in many biomedical and geological applications, the detailed hydrophilic coating-mineral interactions have not been fully understood. In this paper, atomistic molecular dynamics (MD) simulations of hydrophilic self-assembled monolayer (SAM) interactions on calcite surfaces (Fig. 1) revealed an important mechanism that polyol-mineral interactions were mainly through the partitioning of the hydroxy groups on the polyols to the distinct hydration structures on the mineral surfaces. More importantly, based on the above physical picture, we tested a bicomponent system consisting of a small percentage of omniphobic fluoroalkane in the alkanols, which drastically perturbed the hydration structures on the mineral surfaces and resulted in a purely repulsive nonstick coating.

Results

Molecular origin of water-mediated self-assembled monomer adhesions on calcite surfaces. Figure 2a shows the pressure-distance curves for C8OH-C2F6 SAM interactions on calcite surfaces with different percentages of fluoroalkanes (see Methods and Fig. 1c for simulation details and abbreviations for the SAM). As shown, the adhesion pressures decrease with increasing fluoroalkane percentages. Importantly,

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Figure 1. Simulation setup. (a) Side view of a bicomponent alkanol and fluoroalkane self-assembled monolayer (SAM) on a calcite (1 0 1 4) surface separated with distance *d*. (b) Top view of the SAM with the alkanols and fluoroalkanes grafted onto a hexagonal lattice. The atom colors were: C = cyan, H = white, O = red, Ca = green, and F = pink. (c) Chemical structures and abbreviations of all the SAM molecules used in this study.

there are two distinct SAM-calcite distances at d=2.34 and 2.24 nm that show strong adhesions. The molecular origins of these strong adhesions can be best understood in Figs. 3 and 4, which show representative simulation snapshots and density distributions of SAMs with 0%, 40%, and 100% fluoroalkanes at different SAM-calcite distances. For the SAMs relatively far away from the calcite surfaces (Figs. 3a-f and 4a-f; d=2.7 and 2.4 nm), we can see well-defined hydration structures on the calcite surfaces. At the first strong adhesion distance d=2.34 nm, for fluoroalkane-free SAM, the hydroxy groups on the hydrophilic alkanols are mingled comfortably in the second hydration layers on the calcite surfaces (Figs. 3g and 4g). In contrast, for 100% fluoroalkane-SAM, the fluoro-alkanes frustrate the hydration layers, instead of participating in them, on the calcite surface (Figs. 3i and 4i). Furthermore, at the second strong adhesion distance d=2.24 nm, for the fluoroalkane-free SAM, the hydroxy groups on the 100% fluoroalkane-free SAM, the hydroxy groups on the calcite surfaces (Figs. 3j and 4j). In contrast, for the fluoroalkane-free SAM, the hydroxy groups on the calcite surfaces (Figs. 3i and 4i). Furthermore, at the second strong adhesion distance d=2.24 nm, for the fluoroalkane-free SAM, the hydroxy groups on the hydrophilic alkanols are mingled comfortably in both the first and second hydration layers on the calcite surfaces (Figs. 3i and 4j). In contrast, for the 100% fluoroalkane-SAM, none of the fluoroalkanes can participate in the calcite hydration layers but only frustrate them (Figs. 3l and 4l). Finally, for the bicomponent SAM with 40% fluoroalkanes, the hydrophilic alkanols partially participate in the calcite hydration layers but the fluoroalkanes don't (Figs. 3h, k and 4h,k).

Designing self-assembled monolayers with tunable adhesions on calcite surfaces. Figure 2d shows the potential of mean forces (PMF) for the C8OH-C2F6 SAM interactions on calcite surfaces as integrated from Fig. 2a with different percentages of fluoroalkanes. As shown, the bicomponent SAM become purely repulsive at > 40% mole percentages of fluoroalkanes. As established in the previous section that the fluoroalkanes can perturb the hydration layers on the calcite surfaces and reduce the SAM adhesion, we envisioned that the more fluorinated alkanes should have more pronounced effects. This is clearly observed as in Fig. 2b,c,e,f, which show the pressure-distance curves and PMF for the C8OH-C2F8 and C8OH-C2F10 SAM interactions on calcite surfaces. As shown in Fig. 2e,f, the bicomponent C8OH-C2F8 and C8OH-C2F10 SAM become purely repulsive at > 20% and > 10% fluoroalkanes, respectively.

Finally, we investigated the interactions between calcite surfaces and the SAM consisting of either only a more hydrophilic C8OH3 or bicomponent C8OH3-C2F10 (Fig. 5). For the pure alkanol (C8OH3) SAM (0%



d (nm)

Figure 2. Pressure-distance curves and potential of mean forces (PMF) for the SAM-calcite interactions with different length and percentages of fluoroalkanes. (**a**–**c**) Pressure-distance curves and (**d**–**f**) PMF for the C8OH-C2F6 (**a** and **d**), C8OH-C2F8 (**b** and **e**), and C8OH-C2F10 SAM (**c** and **f**) interactions on calcite surfaces. The pressure-distance curves show two strong adhesion distances at d=2.34 and 2.24 nm that correspond to the partitioning of the C8OH hydroxy groups to the second hydration layer (d=2.34 nm) or second and first hydration layers (d=2.24 nm) on calcite surfaces. The PMF show nonstick SAM-calcite interactions for 40% C2F6, 20% C2F8, or 10% C2F10 fluoroalkanes.

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fluoroalkane C2F10), the pressure-distance curve in Fig. 5a shows a weak adhesion distance at d = 2.5 nm that corresponds to the partitioning of C8OH3 hydroxy groups to the third hydration layer on calcite (Fig. 6a), and a strong adhesion distance at d = 2.26 nm that corresponds to the partitioning of C8OH3 hydroxy groups to the first and second hydration layers on calcite (Fig. 6b). Note C8OH3 has multiple hydroxy groups on a single molecule (c.f. Figure 1c) that can concurrently participate in multiple hydration layers on calcites surfaces (Fig. 6b). In contrast, C8OH has only one hydroxy group on a single molecule that can only participate selectively in single hydration layer (Fig. 4g,j). As a result, we observed one continuous strong adhesion when the C8OH3 SAM participated in the first and second hydration layers on calcite (Fig. 5a; d = 2.3 to 2.2 nm) instead of the discontinuous two adhesions for C8OH SAM (Fig. 2a-c; d = 2.34 to 2.24 nm). Nevertheless, the C8OH3-C2F10 SAM containing 10% fluoroalkane C2F10 becomes purely repulsive (Fig. 5b), which demonstrate the good tunability of the adhesions of the bicomponent SAM on mineral surfaces.

Discussion

Water-mediated interactions have been intensively studied for many decades²⁷. Nevertheless, even though they are ubiquitous in all biological and technological systems, a unifying physical picture has yet to be achieved, and many hydration interactions were considered very surface specific²⁸⁻³⁰. In this work, we study the hydrophilic mineral surfaces, which are a class of very important yet less explored surfaces for hydration interaction. The hydrophilic SAM-mineral interactions could be viewed as nonsymmetric interactions between two hydrophilic surfaces³¹; however, caution should be taken that they may not be understood by merely considering the competition of surface-surface and surface-water interactions, but rather how the highly well-defined water structures on the mineral surfaces (as far as the third hydration layers, see Figs. 5 and 6) may be complied or perturbed, which, we believe, is a unique feature of the hydration forces on mineral surfaces. Finally, we want to stress that the water-mediated interaction is a cooperative process (i.e., nonadditive)^{32,33}, as demonstrated here that only 10% fluoroalkane could completely invert the SAM from adhesive to repulsive (c.f. Figs. 2f and 5b). This character has great implications in scaling-up SAM coatings for industrial applications since fluorinated molecules are usually much more expensive compared to the simple hydrophilic alkanols. Reducing the usages of expensive fluorinated molecules while maintaining the desired properties of the SAMs provide immense economic advantages^{34,35}.

In summary, in this work using atomistic MD simulations we have studied in detail the water-mediated bicomponent hydrophilic/fluoroalkane SAM interactions on calcite surfaces. We first established that the molecular origin of the strong adhesions of the hydrophilic alkanols on the calcite surfaces were due to the partitioning of the hydroxy groups on the alkanols to the well-defined hydration layers on the calcite surfaces. We then



Figure 3. Simulation snapshots for different C8OH-C2F6 SAM-calcite distances with different percentages of fluoroalkanes. (**a**-**c**) d=2.7 nm, (**d**-**f**) d=2.4 nm, (**g**-**i**) d=2.34 nm, and (**j**-**l**) d=2.24 nm with 0% (**a**,**d**,**g**, and **j**), 40% (**b**,**e**,**h**, and **k**), and 100% (**c**,**f**,**i**, and **l**) fluoroalkanes. The atom colors of SAM and calcite were the same as in Fig. 1. The well-defined bound water molecules on the first and second hydration layers on calcite are colored with purple and dark yellow (see circled in **a**), respectively, and the rest of the water molecules are colored with gray. At d=2.34 nm, the hydroxy groups on C8OH can participate in the second hydration layer (**g** and **h**). At d=2.24 nm, the hydroxy groups on C8OH can participate in both the first and second hydration layers (**j** and **k**). In contrast, the fluoroalkanes cannot participate in the hydration layers (**h**,**i**,**k**, and **l**).

investigated the effects from different types and compositions of fluoroalkanes and found that only 10% of the more fluorinated alkanes (C8OH–C2F10 and C8OH3–C2F10 SAMs) were enough to convert the SAMs to be purely nonstick on calcites. Even though the molecular details put forward in this work have been very helpful in designing the bicomponent surfaces as promising nanoparticle coatings with variable mineral adhesions, further experiments are needed to validate our predictions.

Methods

The model system consisted of SAMs made with mixtures of hydrophilic alkanols and fluoroalkanes on calcite (10 1 4) surfaces separated with distances d (Fig. 1a). Linear alkanols $CH_3(CH_2)_7OH$ and $CH_3(CH_2)_4(CHOH)_2CH_2OH$ (denoted C8OH and C8OH3; Fig. 1c) were used as hydrophilic molecules, and fluoroalkanes CH₃CH₂(CF₂)_{5.7.9}CF₃ (denoted C2F6, C2F8, and C2F10; Fig. 1c) were used to modulate the SAM adhesion on calcite surfaces. The last carbons (on the opposite sides of the hydroxy or fluoro groups) of the bicomponent system were grafted onto a hexagonal lattice with density = 3.8 molecules/nm² that resembled experiment values³⁶, and soft restraints were used on the x and y directions if the molecules exceeded the borders of the outermost grating lattices (Fig. 1b). This design (the position restraint and flat-bottomed position restraint algorithms as implemented in GROMACS software)³⁷ ensured the structural integrity of SAM while enabled the proper samplings of the water-mediated SAM-calcite interactions³⁸. The calcite, calcite-water, and calcite-SAM molecule interactions were described by the force field of Xiao et al.³⁹ in which the hydrophilic and fluoroalkanes were described by the OPLS-AA^{40,41} force field, and the water was treated with the TIP3P⁴² model. The geometric combination rule was used to deduce all pairwise 12-6 Lennard-Jones potentials from atom-wise CaCO₃, OPLS-AA, and water model parameters except for the H-F interactions, which were further optimized to reproduce experimental alkane and perfluoroalkane mixing properties⁴³. This force field combination has been used to study other organic molecule-calcite interactions in solution with good compatibility⁴⁴⁻⁴⁶.



Figure 4. Density distributions for different C8OH-C2F6 SAM-calcite distances with different percentages of fluoroalkane. (**a**–**c**) d=2.7 nm, (**d**–**f**) d=2.4 nm, (**g**–**i**) d=2.34 nm, and (**j**–**l**) d=2.24 nm with 0% (**a**,**d**,**g**, and **j**), 40% (**b**,**e**,**h**, and **k**), and 100% (**c**,**f**,**i**, and **l**) fluoroalkanes. At d=2.34 nm, the hydroxy groups on C8OH can participate in the second hydration layer (**g** and **h**). At d=2.24 nm, the fluoroalkanes cannot participate in both the first and second hydration layers (**j** and **k**). In contrast, the fluoroalkanes cannot participate in the hydration layers (**h**,**i**,**k**, and **l**).

Series of MD simulations with different SAM-calcite distances *d* were carried out to obtain the pressuredistance curves under *NPT* condition with T = 300 K and P = 1 bar. For each *d*, the SAM with area $\sim 3 \times \sim 3$ nm² was placed at the designed height above an extended calcite slab perpendicular to the *z* axis in a simulation box with initial box size $5 \times 5 \times 5$ nm³ and periodic boundary conditions in three dimensions (Fig. 1a). The simulation boxes with predefined SAM and calcite surfaces were then solvated by 2400 water molecules. For each pressure-distance curve, we performed simulations with d = 2.70 to 2.42 nm with 0.04 nm increments followed by d = 2.40 to 2.10 nm with 0.02 nm increments. The simulation times for the MD runs were 40 ns for d > 2.40 nm and 100 ns for $d \le 2.40$ nm, with data analysis performed for the last 20 ns. Statistical uncertainties for the force measurements at each *d* were acquired by performing 3 independent simulations with randomized initial configurations of the SAMs.

At each SAM-calcite distance *d*, the pressures on SAM were measured from MD trajectories. At each MD time step, we first summed the total forces exerted on all the atoms that construct the SAM, and then calculated by dividing the sum of total forces on SAM by the projected area of SAM on the x-y plane to give the pressures.

Finally, the potential of mean forces (PMF) were calculated by $PMF(d) = \int_{d} \prod(d')dd'$, where $\prod(d)$ were the pressures measured at each *d* as described above (i.e., pressure-distance curves) and we used the max distance

d = 2.7 nm as the reference state^{19,33}.

All simulations were carried out using GROMACS v2018.2³⁷. Electrostatic interactions were calculated using the particle-mesh Ewald summation, with a real-space cutoff of 1 nm, a grid spacing of 0.16 nm, and fourth-order interpolation. The van der Waals and neighbor-list cutoffs were both set to 1 nm. We used velocity rescaling temperature coupling with a time constant of 0.5 ps and Berendsen semi-isotropic pressure coupling with a



Figure 5. Pressure-distance curves (**a**) and PMF (**b**) for the C8OH3-C2F10 SAM-calcite interactions with different percentages of fluoroalkanes. The pressure-distance curves show a weaker adhesion distance at d=2.5 nm and a very strong adhesion distance at d=2.26 nm. The PMF show a nonstick surface with only 10% C2F10 in a bicomponent SAM.





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time constant of 5 ps. The simulation time step was set to 2 fs. The bottom 2 layers of the calcite molecules were restrained (using GROMACS position restraint algorithm)³⁷ in order to support the surface, while the top 2 layers of the calcite molecules facing the SAM could freely move^{45,46}. All bonds were constrained using the LINCS algorithm⁴⁷ except for water molecules, which were constrained using the SETTLE algorithm⁴⁸.

Data availability

The data sets generated and analyzed during the current study are available from the corresponding author on reasonable request.

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Author contributions

H.C. performed simulation studies. H.C. and S.S.Z. designed research and wrote the manuscript.

Competing interests

The authors declare no competing interests.

Additional information

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