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Determination and Evaluation of the Non-Additivity in Wetting of Molecularly Heterogeneous Surfaces

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1 **Abstract**

2
3 The interface between water and folded proteins is very complex. Proteins have ‘patchy’ solvent
4 accessible areas composed of domains of varying hydrophobicity. The textbook understanding is
5 that these domains contribute additively to interfacial properties (Cassie’s equation, CE). An ever-
6 growing number of modelling papers question the validity of CE at molecular length scales, but
7 there is no conclusive experiment to support this and no proposed new theoretical framework. Here,
8 we study the wetting of model compounds with patchy surfaces differing solely in patchiness but
9 not in composition. Were CE to be correct, these materials would have had the same work of
10 adhesion (W_{SL}) and time averaged structure of interfacial water. We find considerable differences
11 in W_{SL} and sum frequency generation measurements of the water structure show distinctively
12 different spectral features. Molecular dynamics simulations of water on patchy surfaces capture
13 the observed behaviors and point towards significant non-additivity in water density and average
14 orientation. They show that a description of the molecular arrangement on the surface is needed to
15 predict its wetting properties. We propose a predictive model that considers, for every molecule,
16 the contributions of its first nearest neighbors as a descriptor to determine the wetting properties
17 of the surface. The model is validated by measurements of W_{SL} in multiple solvents, where large
18 differences are observed for solvents whose effective diameter is smaller than $\sim 6\text{\AA}$. The
19 experiments and theoretical model proposed here should represent a departure point for the study
20 of complex biological interfaces as well as for the engineering of synthetic ones.

21
22 **Keywords:** hydration, hydrophobic, wetting, nanostructured

23 24 **Significance statement:**

25 Every folded protein presents an interface with water that is composed of domains of varying
26 hydro-philicity/-phobicity. Many simulations studies have highlighted the non-additivity in the
27 wetting of such nanostructured surfaces in contrast with the accepted theoretical formula that is
28 additive. We present here an experimental study on surfaces of identical composition but different
29 organization of hydrophobic and hydrophilic domains. We prove that the interfacial energy of such
30 surfaces differs by $\sim 20\%$ and that a significant difference in the interfacial water H-bonding
31 structure can be measured. As a result, in combination with molecular dynamics simulations, we

32 propose a model that captures the wetting of molecularly heterogeneous surface, showing the
33 importance of local structure (first nearest neighbors) in determining the wetting properties.

34 **Text**

35 It is well-established that a large number of protein properties derive from their solvent accessible
36 surface(1). It is also known that such surfaces are highly structured with patches of varying
37 composition and hydrophobicity. Such complexity affects a number of interfacial properties
38 ranging from the work of adhesion (W_{SL} , the main component in the interfacial energy(2)) to the
39 very complex time averaged structure of interfacial water (TASIW)(3). Whether these properties
40 (as well as many others such as hydrophobic forces) are additive or not is a matter of intense
41 debate(4–7). Classical thermodynamics for multicomponent interfaces treats W_{SL} additively. For
42 example, one rigorous formulation for Cassie’s equation (CE) in the case of a perfectly flat surface
43 with two components A and B, is the following

$$44 \quad \quad \quad 45 \quad \quad \quad 46 \quad \quad \quad W_{SL} = f_A W_A + f_B W_B \quad (1)$$

47 Several computational studies have appeared recently suggesting strong effects of patchiness on
48 the density of interfacial water (typically used in simulation as a proxy for W_{SL}) that cannot be
49 explained in the framework of Eq. 1(7–11). To the best of our knowledge, there is no direct
50 experimental evidence supporting these claims. Some of us have used indirect observations (i.e.
51 non-monotonic dependence of W_{SL} on surface composition) to substantiate the existence of a
52 geometrical effect in W_{SL} (12). Recently, experimental evidences of related physical phenomena
53 have been published; Abbott and co-workers showed structural and chemical effects on
54 hydrophobic forces(13), while Aida and co-workers showed local effects on ion pairing(14). No
55 direct experimental support for the rapidly growing computational work(7, 9–11, 15) has yet been
56 presented and no experimental or theoretical study has proposed a theoretical framework to capture
57 all of the results.

58
59 In the experimental cases discussed above, self-assembled monolayers (SAMs) composed of a
60 mixture of hydrophobic and hydrophilic molecules were used as model surfaces. None of these
61 studies could investigate one of the true key components of these interfaces, the time averaged
62 structure of interfacial water (TASIW). This is unfortunate, as it is the TASIW that is studied in

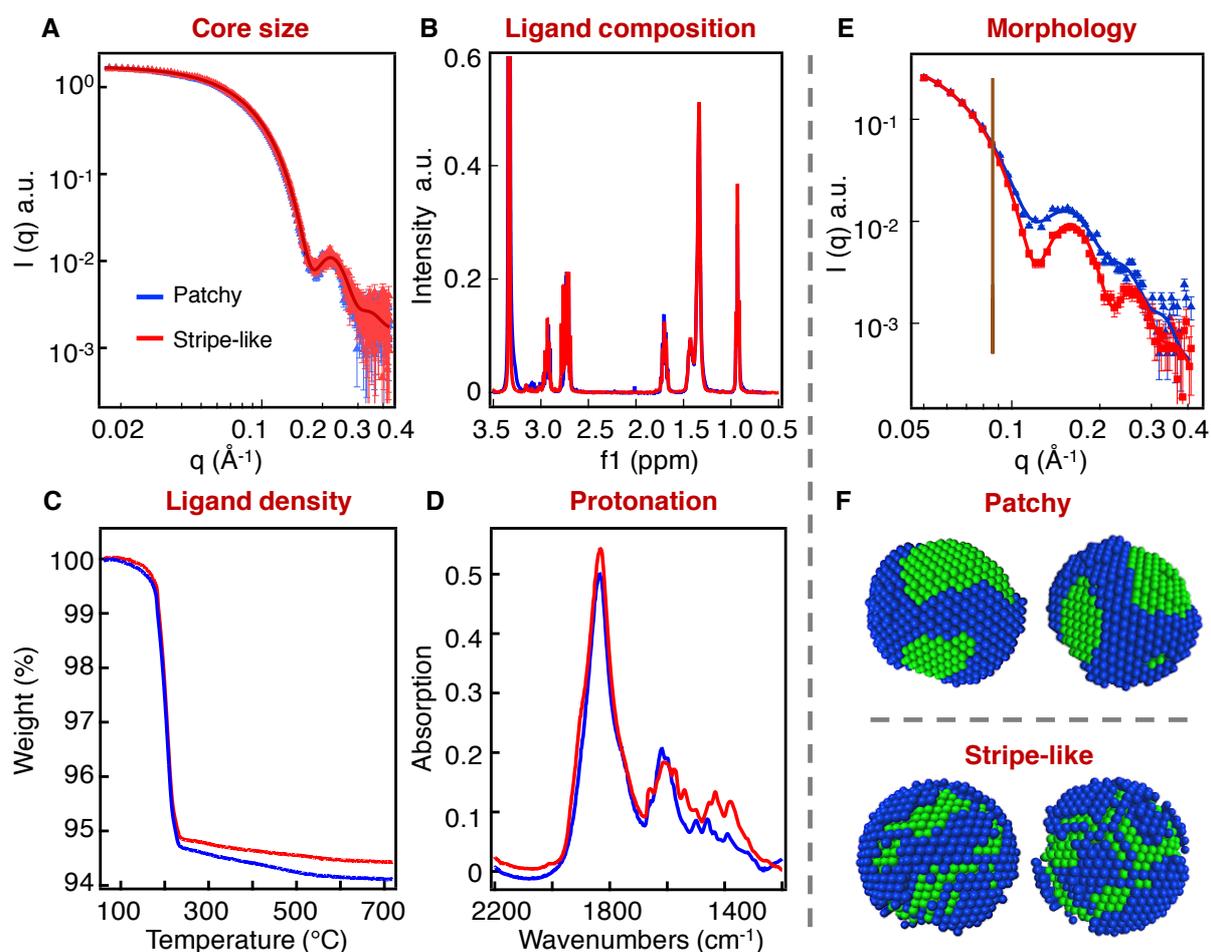
63 all simulations. Unfortunately, probing the effect of patchiness on TASIW is a significant
64 challenge when model systems (as well as proteins) differ both in composition and geometrical
65 parameters, as it is impossible to decouple effects due to one or the other. Hence, there is no
66 experimental evidence on the role of patchiness on TASIW. Here, to tackle this question, we have
67 developed model compounds, i.e. gold nanoparticles coated with SAMs composed of a binary
68 mixture of hydrophobic and hydrophilic ligands that separate into patches(16, 17). These model
69 nanoparticles were produced in two forms differing solely in the geometrical parameters of the
70 patches, but not in composition or any other structural parameters.

71
72 We used nanoparticles coated with a 1:1 binary mixture of perdeuterated 3-mercaptopropionic acid
73 (dMPA) and 1-octanethiol (OT). These nanoparticles were chosen as they form patchy ligand
74 shells, due to the fact that MPA is hydrophilic and OT hydrophobic, and that the longer OT gains
75 conformational entropy at the edges of the patches. Also, they were expected to have non-additive
76 W_{SL} as they have been shown to have non-monotonic solubility in various solvents(18). Similar
77 nanoparticles have shown patches in their ligand shell that at room temperature did not change for
78 days, but could be evolved into smaller patches by gentle heating(19). We started by exchanging,
79 at room temperature, MPA ligands onto the ligand shell of OT nanoparticles. The exchange was
80 tuned to lead to a 1:1 ligand shell composition(19). The ligand shell composition was determined
81 by nuclear magnetic resonance (NMR) studies after etching the gold core. The resulting
82 nanoparticles were then heated at 70°C for 4 h, in order to bring the ligand shell morphology to a
83 different state. All the detailed synthesis and characterization procedures are described in
84 Supplementary Discussion.

85
86 After thermal treatment, care was taken to prove that no changes had occurred to the nanoparticles
87 and that only the ligand shell morphology had changed. Small angle X-ray scattering (SAXS) was
88 performed on the nanoparticles. As shown in Figure 1A, the SAXS curves for the nanoparticles
89 before and after thermal treatment overlap to an impressive degree. SAXS probes almost
90 exclusively the nature (size and polydispersity) of the gold cores of the nanoparticles, as contrast
91 in X-ray scales with the atomic number. The overlap between the two curves indicates that the
92 gold cores were not affected by the thermal treatment either in size or in polydispersity. This is
93 particularly important to guarantee that the curvature of the surface is the same for the two sets of

94 nanoparticles. We then focused on characterizing the ligand shell before and after thermal
95 treatment. Some of the characterizations were performed on nanoparticles coated with MPA and
96 OT (as opposed to d-MPA and OT). This choice was imposed by the technique used, in the case
97 of ^1H NMR because of its incompatibility with deuterated molecules, while in the case of
98 thermogravimetric analysis (TGA) because of the large amount of sample required. We assume
99 that these particles are identical to the deuterated ones. They were all obtained by place exchange
100 reactions that started from the same OT nanoparticles and we have previously shown that
101 deuteration of ligands does not change the properties of the nanoparticles(20, 21). A complete
102 discussion on this topic can be found in the Supplementary Discussion. As is common in
103 nanoparticle characterization(22), the ligand shell composition was determined by etching the gold
104 cores after having made sure that no free ligand was in solution (i.e. no sharp peak in the NMR of
105 the whole nanoparticles, Figure S2). Figure 1B compares the two NMR spectra achieved in this
106 way. No measurable difference in the relative integration of the peaks was found, indicating no
107 change in the ligand shell composition (in both cases the ligand ratio was found to be
108 approximately MPA: OT = 55%: 45%). We performed TGA to determine ligand density on the
109 nanoparticles. Figure 1C shows that the two TGA curves are well within instrumental error of each
110 other (the difference in the plateau is $< 2\%$ in mass and the accepted instrumental error is $>5\%$).
111 This indicated that the ligand shell density did not change. Given that the relative ratio of the
112 ligands and the total density did not change, we can conclude that the average number of OT and
113 of MPA molecules on the nanoparticles before and after thermal treatment are the same. Finally,
114 infrared spectroscopy (Figure 1D) measurements show that the protonation state of the carboxylic
115 acid had not changed, as both spectra show only a peak at 1600 cm^{-1} corresponding to the
116 asymmetric stretching of deprotonated carboxylic group. Hence, we can conclude that the
117 chemical composition of the ligand shell did not change upon thermal treatment. In Table S1 we
118 report a summary of all the results of the characterization performed on these particles.

119



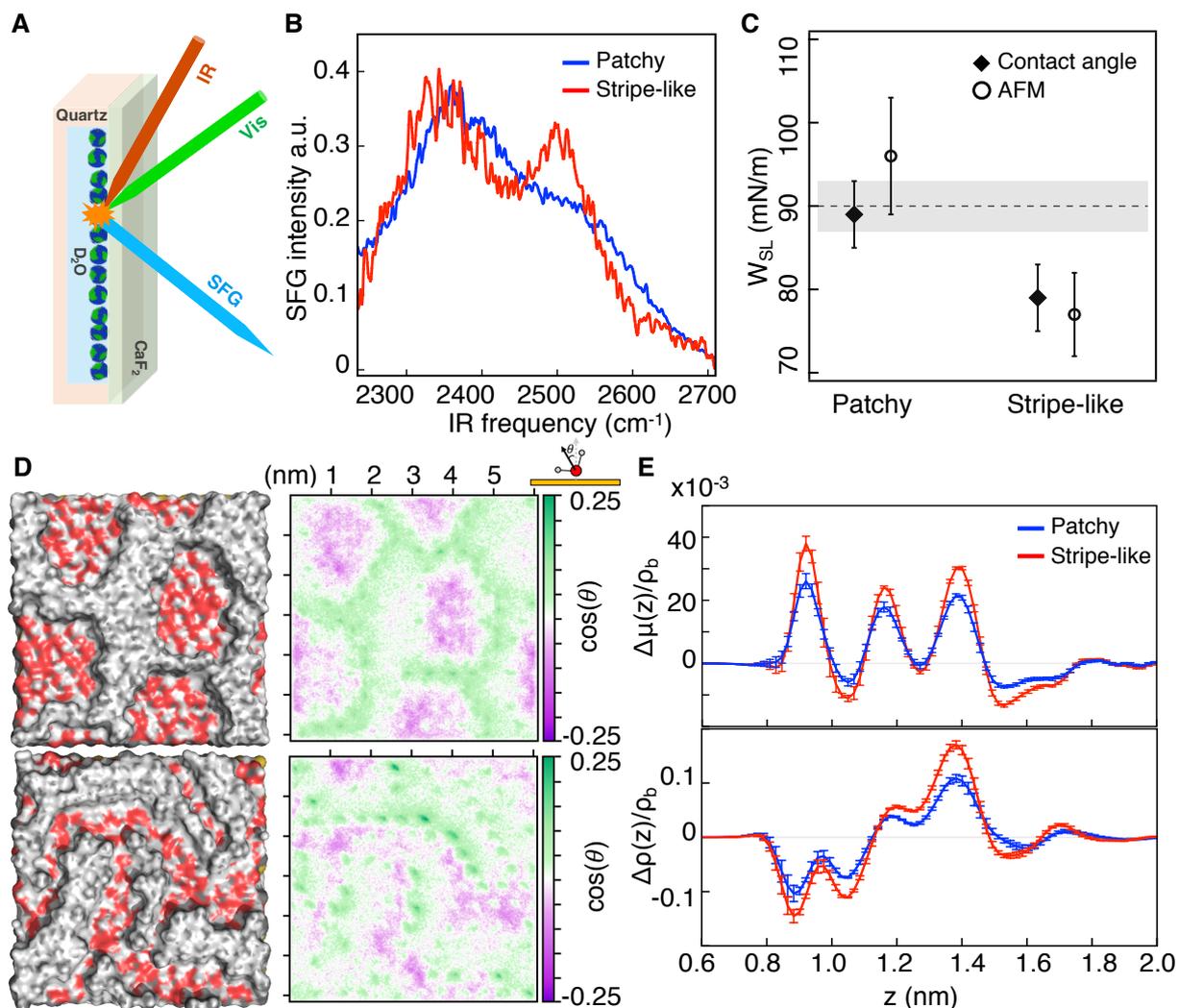
120
 121 Figure 1. Characterization of the nanoparticles with OT and per-deuterated MPA used in this paper.
 122 In all plots the blue and red lines refer to nanoparticles before and after thermal treatment
 123 respectively. Note for all measurements but SANS the curves practically overlap. (A) SAXS data
 124 on both nanoparticles were measured using ethanol as solvent. A fit with a Gaussian distribution
 125 gives a core size of 4.9 ± 0.6 nm, consistent with TEM data shown in Figure S1. (B) NMR spectra
 126 of the ligands detached from their core via an iodine decomposition(23). The measured ligand ratio
 127 is approximately MPA: OT = 55%: 45%. NMR spectra before decomposition are shown in Figure
 128 S2 (C) TGA plots for both particles showing that the ligand density is unaffected by the thermal
 129 treatment. Note that in TGA the experimental error is considered to be larger than 5%. (D) FTIR
 130 measurements taken from nanoparticle film in ATR mode. The spectra show that MPA ligands are
 131 mainly deprotonated on both nanoparticles. (E) SANS spectra of nanoparticles taken in
 132 tetrahydrofuran-d₈. The overlap in the low q region (below 0.083 \AA^{-1} corresponding to the overall
 133 size of the NP in real space, as indicated by the vertical line) shows that the two nanoparticles have

134 the same radius of gyration. The scattering curves at higher q range are the only characterization
135 that shows a significant difference for the two nanoparticles, indicating a difference in the shape
136 of nanoparticles (i.e. patchiness of the ligand shell). (F) Low-resolution models for the
137 nanoparticles obtained by fitting the curves shown in (D) and in chloroform-d (dots are the
138 experimental measures, and lines are the fits) using a method described recently(21). Detailed
139 fitting procedures are described in Supplementary Discussion. In the SANS model, the blue beads
140 stand for OT ligands while the green ones are MPA ligands. We should point out that the
141 Nanoparticles characterized in (B) and (C) are nanoparticles coated with OT and MPA instead of
142 dMPA. These nanoparticles are identical to the ones described in the other panels as discussed in
143 Supplementary Discussion.

144
145 In striking contrast to what is described above, small angle neutron scattering (SANS) led to
146 significantly different scattering curves for the two nanoparticles (Figure 1E), i.e. there are
147 substantial differences in the scattering form factors of the nanoparticles. Indeed, the SANS of the
148 thermally treated nanoparticles shows more pronounced oscillations, indicating a shape that is
149 more centrosymmetric when compared to the untreated nanoparticles. Such changes in form
150 factors, given all the other measurements described above, can be assigned solely to differences in
151 the overall shape of the nanoparticles. Given that the gold core had no change in form factor (as
152 derived from SAXS), this means that the form factor change in SANS has to be attributed to a
153 change in the shape of the ligand shell. The latter was proven not to change in chemical nature, so
154 that the only remaining possibility is a change in the patchiness. Such effects of thermal treatment
155 on the morphology of nanoparticles are reproduced at two different neutron scattering facilities, as
156 shown in Figure S3, which confirms that the differences in the scattering profile are not due to
157 instrumentation. Using a method recently reported(21), we were able to determine the morphology
158 of the patches using SANS curves recorded with different solvent contrast and *ab initio*
159 calculations. A detailed description can be found in the Supplementary Discussion and all the
160 SANS spectra utilized with their fitting are shown in Figure S4. The resulting models for the ligand
161 shells show a patchy type morphology for nanoparticles before thermal treatment and stripe-like
162 structure after thermal treatment, as presented in Figure 1F. By quantifying the characteristic
163 length-scales of the patches from the SANS modeling(21), we find that the average MPA domain

164 thickness is 2.1 ± 0.6 nm and 1.3 ± 0.3 nm for the patchy (untreated) and stripe-like (thermally
 165 treated) nanoparticles respectively.

166



167

168 Figure 2. Experimental characterization and molecular dynamics simulations of the water
 169 interfaces around the nanoparticles. (A) Schematic of the SFG setup. The SSP polarization is used
 170 to measure the interfacial hydrogen bond strength. (B) SFG spectra collected at the nanoparticle-
 171 water interface. The D-bond network has significantly higher fraction of weak bonds for stripe-
 172 like nanoparticles. (C) Measurements of the W_{SL} for films of nanoparticles, obtained
 173 independently using two techniques, contact angle (black diamonds) and AFM (white circles). The
 174 measurements show large differences. The dotted line represents the additive averages for the W_{SL}
 175 of the two homoligand nanoparticles measured using contact angle. The gray band is the error in

176 the measurements. (D) Left: morphology of the surfaces in the simulation, after equilibration.
177 Water molecules have been removed to show the geometry of the interface. Carbon, oxygen and
178 hydrogen atoms are represented with grey, red and white colors respectively. Right: corresponding
179 2D histogram of the average dipole orientation density, μ , above the surfaces (averaged over four
180 different realizations). Areas on top of the MPA patches look mostly purple (dipole pointing
181 towards the surface) and areas on top of the OT patches look mostly white (dipole parallel to the
182 surface). Green regions (dipole pointing out from the surface) are visible on top of the OT-MPA
183 interfaces, with darker green visible on the stripe-like morphology. (E) Deviation from the additive
184 assumption of the average dipole orientation density, $\Delta\mu$, (top) and density profile of water, $\Delta\rho$
185 (bottom), as a function of the distance from the gold surface (z).

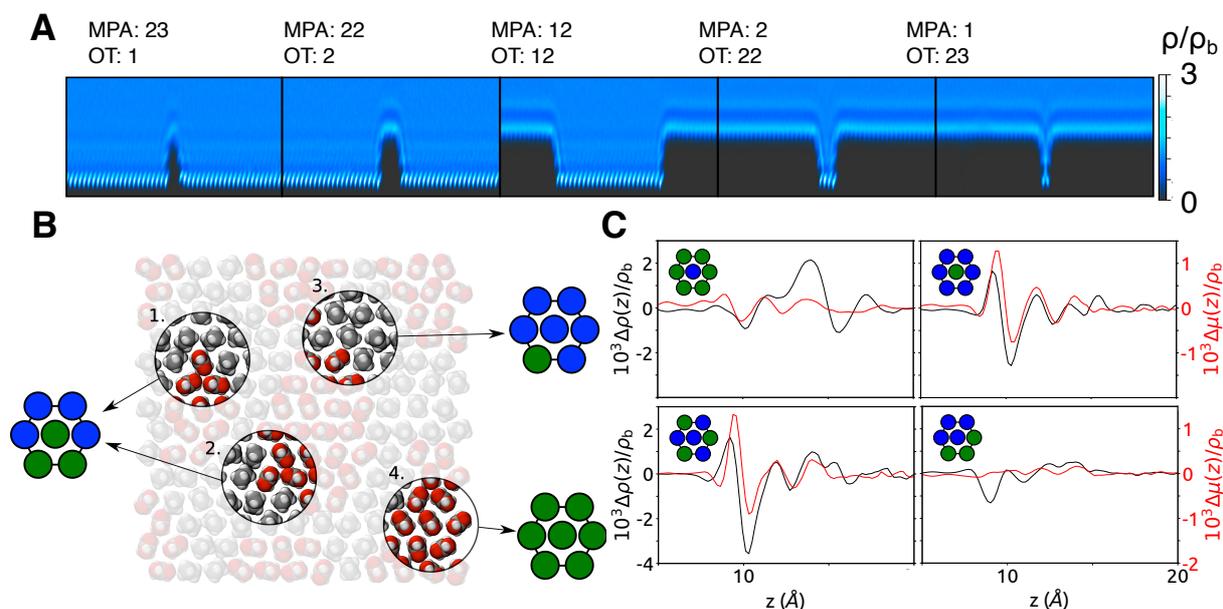
186
187 Given that the shape of the nanoparticles and the chemical nature and composition of their ligand
188 shell was the same, we were able to characterize the TASIW for both particles, as any difference
189 found would be due solely to the different geometrical structure of the ligand shell. We used
190 vibrational sum frequency generation (SFG) to characterize the interfacial water structure as it is
191 a surface sensitive technique that has been proven to effectively characterize the vibrational spectra
192 of interfacial water(24). Figure 2A presents an illustration of an SFG experiment. Films of
193 nanoparticles were produced on CaF_2 surfaces by drop casting ethanol nanoparticles solutions.
194 Detailed procedures and parameters are described in Supplementary Discussion. We first used
195 SFG to characterize the C-H stretching peaks of the OT ligands in the two nanoparticles. As
196 described in the Supplementary Discussion and Figure S5, the SFG spectra for these stretching
197 modes for the two nanoparticles agree with the SANS models. Figure 2B shows the interfacial
198 water structure as measured in the O-D stretch region of the SFG spectrum, the spectra were found
199 to differ considerably. The spectra have two main features, i.e. a peak at $\sim 2375 \text{ cm}^{-1}$ and a peak at
200 $\sim 2530 \text{ cm}^{-1}$, corresponding to interfacial water that have stronger (2375 cm^{-1}) and weaker hydrogen
201 bonds. It can be seen from Figure 2B that the TASIW is different for the two nanoparticles. Water
202 molecules at the interfaces with the two nanoparticles experience different intermolecular H-bond
203 environments. In the case of water at the interface with the patchy nanoparticle, the 2530 cm^{-1} band
204 is mostly a shoulder of the 2375 cm^{-1} band. For the case of the stripe-like nanoparticle, the 2530
205 cm^{-1} band has almost the same intensity as the 2375 cm^{-1} band. To make sure that these effects
206 were not due to film morphology but due to wetting at the single nanoparticle level, multiple

207 spectra were recorded on different films, the spectra are shown in Figure S6. The general
208 conclusion is that in the case of stripe-like structure the ratio of the 2530 cm^{-1} band to the 2375
209 cm^{-1} band is larger than that for the patchy nanoparticle. An over-simplified interpretation of these
210 data is that water molecules are less structured near the stripe-like nanoparticles than near the
211 patchy nanoparticles.

212
213 We then went on to establish whether such differences would lead to different W_{SL} . We first
214 measured contact angles for films of the two nanoparticles and derived the W_{SL} , as listed in Table
215 S2. In Figure 2C we show that the W_{SL} for the patchy nanoparticles is close to the average of the
216 W_{SL} of the two homoligand nanoparticles, while a deviation is found for the nanoparticles with
217 stripe-like morphology. To further confirm these data, we employed a recently developed
218 technique(25) based on small amplitude modulation atomic force microscopy (AFM) to measure
219 the W_{SL} (additional information can be found in Supplementary Discussion and Figure S7). Also
220 in this case we found a difference between the two samples (Figure 2C). It should be stressed that
221 this latter technique is based on different working principles than contact angle measurements, and
222 measures W_{SL} at the single nanoparticle level, removing completely the effect of roughness on the
223 measurement. The agreement between the two measurements strongly validates the conclusions.
224 Averaging the results from the two independent techniques we can conclude that the difference
225 between the W_{SL} on the two nanoparticles is 15 ± 7 mN/m ($\sim 17\%$ of the expected additive value),
226 the stripe-like nanoparticles being more hydrophobic. Additional results on a different set of
227 nanoparticles are reported in Table S3.

228
229 The experimental evidence we have provided thus far shows that the hydrophobicity of the
230 nanoparticles depends on the morphology of the SAM in a non-additive way, and that the effect is
231 connected to the TASIW. In order to capture the relationship between surface morphology and
232 TASIW structure, we performed large-scale molecular dynamics (MD) simulations of a forcefield
233 model of SAMs composed of mixtures of OT and MPA (in its protonated form) together with
234 water. We generated two configurations (Figure 2D) that are consistent with the ligand
235 distributions seen on the patchy and stripe-like surfaces. It is found that water on top of the patchy
236 and stripe-like configurations exhibits a complex behavior, i.e. realistic arrangements of ligands
237 do not lend themselves to a simple interpretation in terms of clear-cut molecular motifs. In Figure

238 2D we show the time averaged dipole orientation density of the water molecules at the interfaces.
 239 It is obvious that the two surfaces lead to different angular distributions. We notice that the water
 240 dipoles point towards the surface on top of the MPA patches and lie parallel to the surface on top
 241 of the OT patches. The dipoles point out from the surface at the interface between OT and MPA.
 242 We find a larger number of dipoles pointing out from the surface on the stripe-like morphology
 243 because of the MPA-OT interfaces are closer to each other. The integrated dipole orientation
 244 density μ together with the water density profile ρ for the two SAM geometries are then calculated
 245 to illustrate the SAM-induced water ordering. The theoretical μ and ρ profiles based on an additive
 246 assumption are also calculated by simulating pure OT and MPA SAM surfaces. The deviations of
 247 μ and ρ from the additive assumption are then plotted as a function of the position on the surface
 248 (Figure 2E). One can see that the dipole and density profiles above both SAMs do not follow a
 249 purely additive behavior and that there are significant differences between the two morphologies.
 250 Data resulting from the simulation of two additional surface are reported on Figure S8 and show
 251 the high reproducibility of the obtained results.



252
 253 Figure 3. Water density on heterogeneous surfaces. (A) Water density in a cut across trenches of
 254 varying size. Ligands occupy the black area of the pictures (shorter ligands are MPA, longer
 255 ligands are OT). (B) Schematics of the nearest-neighbor classification scheme showing four
 256 ligands with their surrounding environments: patterns 1 and 2 are equivalent by rotational
 257 symmetry, with an MPA ligand at the center, surrounded by two other MPA ligands in an "ortho"

258 configuration; pattern 3 has an OT ligand at the center with five other OT ligands surrounding it;
259 pattern 4 has an MPA ligand surrounded by five other MPA ligands, and does not contribute to the
260 excess term. (C) Example of surface excesses associated with some of the possible nearest
261 neighbor configurations.

262 In order to propose a quantitative model for these non-additive effects, we began by performing
263 molecular dynamics simulations of a series of “trench” configurations corresponding to
264 rectangular OT and MPA regions of varying width (Figure S9), where we expect that the boundary
265 between the two types of ligand is responsible for non-additive behavior as in Eq. 1. Figure 3A
266 shows the structuring of water in a cut across trenches of varying sizes, where it can clearly be
267 seen that the pattern of the water density at the boundaries of the trenches is very similar for all
268 trenches that are more than one molecule thick; for these narrower trenches clear differences are
269 observed (a detailed description of the results can be found in the Supplementary Discussion and
270 in Figures S10 and S11). Specifically, the water density on a single MPA molecule, surrounded
271 by OT, is smaller than the one on MPA thicker trenches. On the contrary, the water density on a
272 single OT molecule, surrounded by MPA, is higher than the one on OT thicker trenches. Overall
273 these observations suggest that the water density on a ligand is affected primarily by its first nearest
274 neighbors.

275
276 This led us to rethink Eq. 1. The non-additivity in the systems containing trenches is due to the
277 water structure at the boundary between two types of ligand. However, these systems contain only
278 straight boundaries between ligands of different types, and do not provide an exhaustive list of
279 possible nearest-neighbors configurations, limiting the power of a model based on trench systems
280 to predict the results of a general surface. For this reason, we then generated a set of simulation
281 boxes in which the ligands in each site on both the top and the bottom surfaces were chosen
282 randomly. Assuming that the contribution of a particular ligand to non-additivity depends only on
283 the identities of its first nearest neighbors, and treating the long-range structure as a mean field,
284 each ligand on a surface was classified according to the identities and dispositions of its first
285 nearest neighbors. Figure 3B illustrates the definition of a particular ligand’s environment, and the
286 supplementary discussion and Figure S12 describe the classification of these ligands. Using the
287 excess terms $\Delta\mu$ and $\Delta\rho$ for these randomly generated surfaces, we built a linear regression model,
288 in which an excess quantity for an arbitrary surface is predicted as,

289
$$\Delta f(z) = \sum n_i f_i(z) \quad (2)$$

290 where $f = \mu$ or ρ , n_i is the number of ligands of type i , and $f_i(z)$ is a function to be fitted. This is

291 analogous to the cluster expansion models that are used e.g. to describe the thermodynamic

292 properties of multi-component alloys (26, 27). Here, we use this approximation to model excess

293 terms associated with a particular distribution of ligands. Figure 3C shows the excess terms

294 associated with some of the possible nearest neighbors arrangements (the full set of possibilities

295 is shown in Figure S12). These examples have been chosen to show two effects. The first of these

296 is asymmetry between the two ligand types: the excess term associated with a single MPA

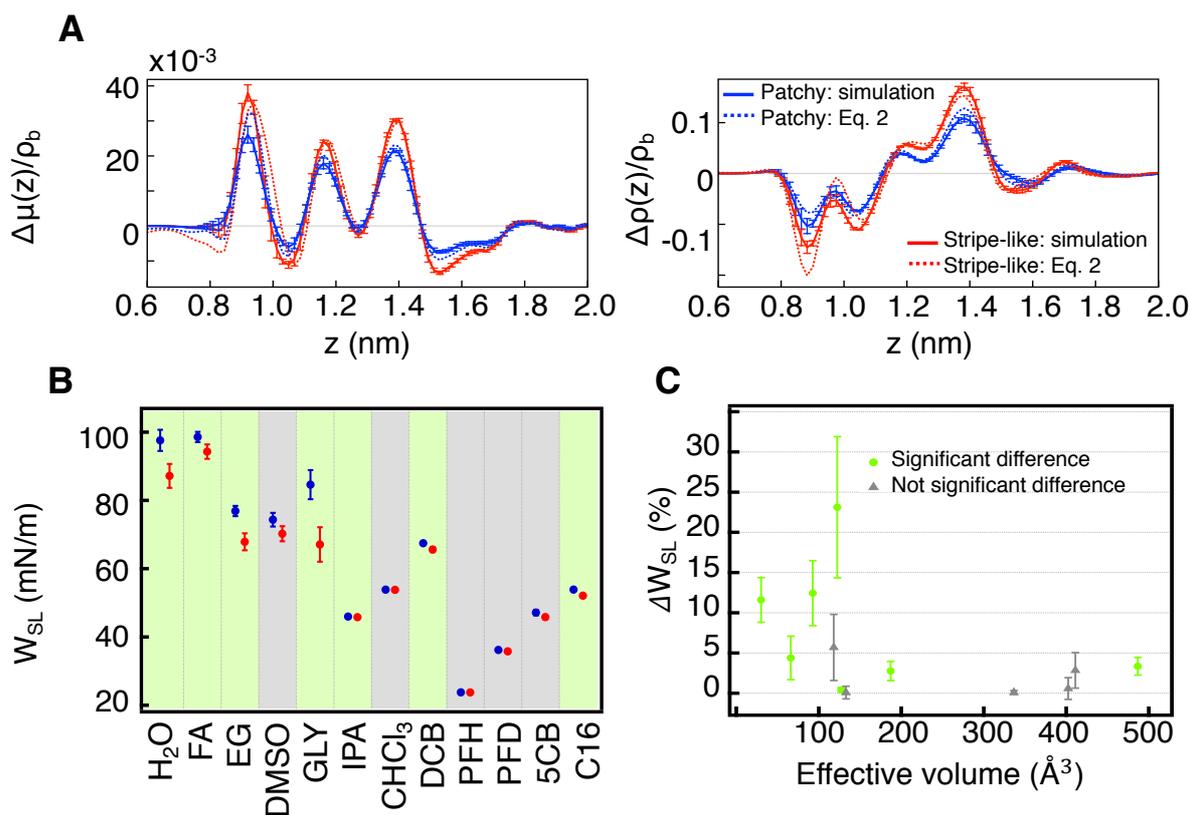
297 molecule surrounded by six OT molecules is significantly different from that associated with one

298 OT molecule surrounded by six MPA molecules. The second is that the excess terms are not

299 determined only by the number of nearest neighbors of a certain kind but also on their arrangement

300 (with "patchy" patterns usually being associated with smaller excesses).

301



302

303 Figure 4. Model capturing the non-additivity of interface-dependent properties. (A) Surface excess

304 $\Delta\rho$ and $\Delta\mu$ of the patchy and stripe-like surfaces as calculated from MD simulations and calculated

305 by the linear regression model. (B) W_{SL} values of the patchy (blue) and stripe-like (red)
306 nanoparticles in various solvents. The green shadings indicate solvents in which the W_{SL} shows
307 significant differences (Student's t-Test assuming equal variances, $p = 0.05$) for the two
308 nanoparticles. The grey shadings indicate that the null hypothesis ("the two nanoparticles have the
309 same work of adhesion") cannot be rejected. (The solvents used are the following: water (H_2O),
310 formamide (FA), ethylene glycol (EG), dimethyl sulfoxide (DMSO), glycerol (GLY), isopropanol
311 (IPA), chloroform ($CHCl_3$), dichlorobenzene (DCB), perfluorohexane (PFH), perfluorodecalin
312 (PFD), 4-Cyano-4'-n-pentylbiphenyl (5CB), hexadecane (C16). (C) Dependence of the
313 differences of W_{SL} (ΔW_{SL}) of the two films on the effective volume of the solvent molecules. The
314 color of the points is the same as the one of the shadings in (3) and relates to the significance of
315 the differences in W_{SL} .

316
317 Figure 4A shows the predictions of this model for the surface excesses of the patchy and striped
318 systems. The excellent match between the excess values resulting from the simulations (continuous
319 lines) with the ones resulting from the predictions derived from Eq. 2 (dotted lines) indicates that
320 the first nearest neighbors are sufficient to determine the excess term associated with a single
321 molecule in the SAM. Therefore, we expect the work of adhesion between the SAM and a solvent
322 not to be affected by the surface heterogeneity when the solvent molecules are larger than the
323 intermolecular distance in the SAM (because a single solvent molecule will interact with more
324 than one molecule on the surface at any time). To test this prediction, we measured W_{SL} in films of
325 the nanoparticles described above for a series of solvents. Every time a new film was produced,
326 its contact angle with water was measured, to make sure the roughness was homogeneous. All the
327 contact angle data as well as the solvent properties are listed in Table S4. As shown in Figure 4B,
328 some solvents have the same W_{SL} for the patchy and stripe-like nanoparticles, while others behave
329 as water, featuring different W_{SL} . To rationalize these results along the lines of Eq. 2, we calculated
330 the effective molecular volume (V_{eff}) of all the solvents by dividing their molecular weight by the
331 product of the solvent density and the Avogadro number. We plotted the differences in W_{SL} (ΔW_{SL})
332 against V_{eff} and the results were striking (Figure 4C). Solvents whose V_{eff} is above $\sim 125 \text{ \AA}^3$
333 (corresponding to an effective diameter of $\sim 6 \text{ \AA}$, comparable with the intermolecular distance on
334 the SAM: $\sim 5 \text{ \AA}$) show a ΔW_{SL} that is almost independent of V_{eff} and smaller than 5%. Solvents
335 with V_{eff} below $\sim 125 \text{ \AA}^3$ have larger ΔW_{SL} with large variations among them. These results

336 confirm the predictive power of our model. We have tried to correlate the large variations at low
337 V_{eff} to the properties of the solvents we used to no avail. The most likely explanation is that the
338 work of adhesion is affected by many properties of the solvent (such as its polarity, polarizability,
339 etc.) but thus far we could not find a single predictive property for its magnitude. To further
340 confirm our hypothesis on the size of the molecules of the solvents, we have reviewed previously
341 published data¹⁸, where the solubility of nanoparticles similar to the ones studied here was
342 evaluated in a large number of solvents. It was reported that a non-monotonic dependence of the
343 solubility on the ligand shell composition was observed only for a subset of solvents while another
344 subset provided solubility data that could be simply explained in terms of average hydrophobicity
345 of the ligand shell of the nanoparticles. The paper provided no explanation on whether a solvent
346 was part of one or the other subset. Re-evaluating those data, we find that the subset of solvent that
347 showed a non-monotonic dependence on ligand shell composition is composed of solvents whose
348 V_{eff} is smaller than $\sim 130 \text{ \AA}^3$, in agreement with our hypothesis (see Figure S13).

349
350 The theoretical construction, supported by the experiments and simulations, that we have reported
351 here, represents an important step forward towards a molecular understanding of wetting. It has to
352 be seen as an attempt to challenge the currently accepted paradigm that considers concepts like
353 hydrophobicity as absolute. Extending these findings to more complex scenarios, such as
354 biological systems and proteins, will require significant extensions to the experimental and
355 theoretical approach, e.g. to account for the dynamical nature of polypeptides. The concepts and
356 techniques we introduced here, however, lay the foundations for these studies, and for a deeper
357 understanding of the interplay between the chemical nature and the geometric arrangement of
358 molecular units at interfaces.

359

360 **Materials and Methods**

361

362 **Chemicals**

363 Chloro(triphenylphosphine)gold(I) ($\geq 99.9\%$ trace metals basis, Aldrich), 1-Octanethiol ($\geq 98.5\%$,
364 Aldrich), 3-Mercaptopropionic acid (HPLC, $\geq 99.0\%$, Aldrich), 3-Mercaptopropionic-2,2,3,3-d₄
365 Acid (98 atom % D, C/D/N Isotopes Inc.), borane t-butylamine complex (97%, Aldrich),
366 Acetone(HPLC, $\geq 99.8\%$, Aldrich), Methanol (HPLC, $\geq 99.9\%$, Aldrich), Ethanol (HPLC, $\geq 99.8\%$,

367 Aldrich), Chloroform (HPLC, $\geq 99.9\%$, Aldrich), Toluene (HPLC, 99.8%, Aldrich), Sulfuric acid
368 (98.0%, Aldrich), (3-Mercaptopropyl)trimethoxysilane (95%, Aldrich), Hexane (99%, Aldrich),
369 Iodine ($\geq 99.99\%$ trace metals basis, Aldrich), Tetrahydrofuran-d8 (≥ 99.5 atom % D, Aldrich),
370 Chloroform-d (99.8 atom % D, Aldrich), Methanol-d4 (99.96 atom % D, Aldrich). All chemicals
371 were used as received.

372

373 **Synthesis of 1-octanethiol protected gold nanoparticles**

374 The OT homo-ligand protected nanoparticles were synthesized following a modified protocol of
375 Stucky and coworkers. 123 mg chloro(triphenylphosphine)gold(I) was dissolved in 40 ml 1: 1
376 mixture of chloroform and toluene. 0.25 mmol OT ligand was added to the solution. The mixture
377 was heated to 70 °C for 15 minutes. Then, 217 mg borane t-butylamine complex was added quickly
378 into the solution under stirring. The color of the solution changed from brown to dark red. After 1
379 hour of reaction, 40 ml methanol was added to quench the reaction and the solution was cooled
380 down to room temperature. Nanoparticles were precipitated as black powder and purified by
381 repeated centrifugation using acetone and methanol. The final black precipitates (~40 mg) were
382 dried under vacuum overnight.

383

384 **Synthesis of MPA-OT mixed ligand gold nanoparticles by ligand exchange reaction**

385 40 mg OT homo-ligand protected nanoparticles were dissolved in 20 ml chloroform. 2.3 μ l MPA
386 was added to the solution under vigorous stirring. After 6 hours of reaction at room temperature,
387 20 ml toluene was added to precipitate the nanoparticles. The precipitate was washed multiple
388 times using chloroform and toluene, and then dried under vacuum overnight.

389

390 **Thermo-treatment of MPA-OT mixed ligand nanoparticles**

391 20 mg MPA-OT nanoparticles was dissolved in 5 ml ethanol (containing 0.01% v/v sulfuric acid).
392 The solution was heated at 70°C under stirring for 4 hours before cooled down to room temperature.
393 Then the nanoparticles were precipitated by adding 30 ml hexane and washed using chloroform
394 before being dried under vacuum overnight.

395

396 **Small angle neutron scattering**

397 SANS measurements were conducted on the SANS-I instrument at Paul Scherrer Institute and
398 further confirmed on KWS-2 instrument at Jülich Center for Neutron Science. For both
399 measurements, a nanoparticle solution at a concentration of 10 mg/ml were used corresponding to
400 a volume fraction of less than 0.1%. Measurements at SANS-1 were performed at 20 °C, using 1.5
401 m sample-to-detector distance, at 5 Å wavelength with a collimation setup of 6 m covering a q
402 range from 0.03 Å⁻¹ to 0.5 Å⁻¹. Similarly, measurements on KWS-2 were performed at 20 °C, using
403 1.7 m sample-to-detector distance, at 4.7 Å wavelength with a collimation setup of 8 m and a q
404 range from 0.03 Å⁻¹ to 0.5 Å⁻¹. The data acquisition time was 2 hours for each sample. The two-
405 dimensional scattering data were processed and reduced using BerSANS or QtiKWS software for
406 the radial averaging, background subtraction, transmission correction, and normalization to the
407 absolute scale.

408

409 **SAXS**

410 SAXS measurements were performed using Rigaku BioSAXS 2000. Both nanoparticles were
411 dissolved in ethanol (containing 0.1% H₂SO₄ to protonate the MPA ligands in order to gain better
412 colloidal stability) with a concentration of approximately 0.1mg/ml. Soda lime glass capillaries
413 with inner diameter 1.0 mm and wall thickness of 0.01 mm was used for the measurements. The
414 data acquisition time is 2 hours for each sample. The SAXS data were fitted using SasView
415 software by a core-shell sphere model assuming Gaussian distribution.

416

417 **TEM**

418 TEM images were taken using FEI Tecnai Osiris instrument at an accelerating voltage of 120 kV.
419 The nanoparticle samples were prepared by drop-casting 2 µl of the above mentioned ethanol
420 solution (0.1mg/ml) onto the carbon coated - copper 400 mesh grid following by drying under
421 ambient condition.

422

423 **NMR**

424 NMR spectra were recorded using Bruker 400MHz spectrometer. In order to determine the ligand
425 ratio on nanoparticle surfaces, 5 mg nanoparticles were first dissolved in 0.5 ml deuterated
426 methanol solvent and ¹H NMR spectra were then taken to make sure that no sharp peaks
427 corresponding to unbounded small organic molecules exist. Then 0.1 ml deuterated methanol

428 solution of iodine with a concentration of 50 mg/ml was added into the nanoparticle solution to
429 etch the core of nanoparticles. After the etching of the gold core, the solution is filtered and ^1H
430 NMR spectra were taken again to determine the ligand ratio on nanoparticle surfaces.

431

432 **TGA**

433 TGA measurements were done using TGA 4000 instrument from Perkin Elmer. Around 15 mg of
434 nanoparticle samples were used. The flow of nitrogen gas is at 20.0 ml/min. The samples were
435 heated from 50°C to 750°C, at 5.0 C/min.

436

437 **FTIR**

438 The 6700 Nicolet instrument from Thermo Fischer Scientific was used for measuring the IR
439 spectra. Nanoparticle ethanol solution of 10 mg/ml was drop-casted on the ATR crystal and dried
440 completely. 512 spectra were taken at 2 cm^{-1} resolution and averaged for each sample. Baseline
441 correction was performed using the OMNIC software.

442

443 **Contact angle**

444 Glass slides were first repeatedly cleaned using ethanol and acetone to remove surface
445 contaminants. Then they were immersed in freshly prepared base solution, sonicated for 3 minutes
446 and rinsed with deionized water and ethanol before being dried under vacuum. The film of
447 nanoparticles (formed at the water-air interface) was deposited on the glass slide. The procedure
448 was repeated three times, letting the film dry in between consecutive depositions. The slides were
449 then completely dried under vacuum before the contact angle measurements. Contact angle were
450 measured using DataPhysics OCA 35 Instruments. More than 10 drops of 5 μl were deposited on
451 different sites of the substrates.

452

453 For contact angle measurements of different organic solvents, the water contact angle of the
454 nanoparticle films was first measured to make sure that the same results were reproduced, i.e. the
455 films have the same roughness. For each solvent, at least 3 drops of 2 μl were deposited on different
456 sites of the substrates. All the measured contact angle data as well as the solvent properties are
457 listed in Table S4.

458

459 **SFG**

460 The sample preparation was performed as described below: the CaF₂ window was cleaned with
461 ethanol and ultrapure water. The nanoparticle ethanol solution (prepared as described above, 0.1
462 mg/ml) was drop casted on top of the CaF₂ window. After solvent evaporation the window was
463 finally flushed with argon, just before the measurement. 25 µl of D₂O were added on top of the
464 nanoparticle film in a sample cuvette with a path length of 0.2 mm.

465
466 Vibrational SFS spectra were recorded using the setup for SFG experiments described in (24). An
467 800 nm regeneratively amplified Ti: sapphire system (Spitfire Pro, Spectra physics) seeded with
468 an 80MHz 800 nm oscillator (Integral 50, Femtolasers) was operated at a 1 kHz repetition rate to
469 pump a commercial OPG/OPA/DPG system (HE-TOPAS-C, Light Conversion), which was used
470 to generate infrared pulses. The visible beam was split off directly from the amplifier, and
471 spectrally shaped with a home-built pulse shaper. The angle between the 10 mJ visible (VIS) beam
472 (800 nm, FWHM 15 nm) and the 6 mJ infrared beam (3–4.5 µm, FWHM 160 cm⁻¹) was 20° (as
473 measured in air). The focused laser beams were overlapped in the sample cuvette. The reflected
474 SF light was collimated using a plano-convex lens (f.15 mm, Thorlabs LA1540-B) and passed
475 through two short-wave pass filters (3rd Millennium, 3RD770SP). The SF light was spectrally
476 dispersed with a monochromator (Acton, SpectraPro 2300i) and detected with an intensified CCD
477 camera (Princeton Instruments, PI-Max3) using a gate width of 10 ns. The acquisition time for a
478 single spectrum was 150 s. A Glan-Taylor prism (Thorlabs, GT15-B), a half-wave plate (EKSMA,
479 460-4215) and a polarizing beam splitter cube (CVI, PBS-800-050) and two BaF₂ wire grid
480 polarizers (Thorlabs, WP25H-B) were used to control the polarization of the SFG, VIS and
481 infrared beams, respectively.

482
483 All measurements were performed in the SSP polarization combination. The optical path was
484 closed in a box filled with nitrogen, in order to reduce absorption from CO₂. The collection of the
485 full spectra was achieved by combining multiple spectra collected shifting the frequency of the IR
486 beam by 200 cm⁻¹ every time.

487

488 **AFM**

489 The sample preparation for AFM is similar to the one for contact angle described above except for
490 the fact that the glass slides were functionalized before the deposition of the nanoparticles: 50
491 mM (3-mercaptopropyl)trimethoxysilane acetone solution was used to immerse the slides for 4
492 hours in order to functionalize the surface. The glass surfaces were then rinsed multiple times with
493 ethanol and deionized water and the nanoparticle film was deposited as described above. The
494 samples were then completely dried under vacuum. Multiple glass slides were attached to the same
495 metal disc (TED PELLA) using the wax Apiezon 100. In this way, it was possible to move from
496 one sample to the other during the experiment without unmounting the sample cell in the AFM.

497
498 Atomic force microscopy images were collected in amplitude modulation mode on a commercial
499 Cypher ES system (Asylum Research/Oxford Instruments, Santa Barbara, CA). The temperature
500 was kept constant at 25 °C during all the measurements. The sensitivity of the cantilevers (RC800
501 PSA, lever number 1, Olympus, Tokyo, Japan) was evaluated from force curves and the spring
502 constant was measured from their thermal spectra. The cantilevers were driven acoustically.
503 Typical scan rates were in the range 5-13 Hz.

504
505 The values of the free amplitude and free phase of oscillation were extracted from dynamic force
506 curves collected immediately after high resolution imaging was achieved.

507
508 **Simulation Details**

509 All simulations were carried out using the GROMACS/2018.4 software package(28), with the
510 OPLS/AA forcefield(29) used to describe inter-ligand interactions, the SPC/E model(30) for water
511 and the GolP model for the gold surface(31). In all simulations, a gold slab with height 5 nm is
512 placed at the centre of the simulation box, ligands attached to the surface (with the positions of the
513 sulfur atom of each ligand fixed throughout each simulation, as were all gold atoms other than the
514 image-charge sites(31) and 5 nm slabs of water placed above and below the gold surface and
515 allowed to condense onto the ligands. Further details of the simulation setup and running are given
516 in the Supplementary Discussion.

517 The structure of the solvent around the nanoparticle surface was quantified using two properties:
518 the density ρ , obtained by taking a histogram of coordinates of the oxygen atoms in water

519 molecules, and the dipole orientation density $\mu = \langle \cos\theta \rangle \rho$, where $\langle \cos\theta \rangle$ is the average orientation
520 of the water dipole moment with the surface normal pointing away from the gold surface.

521
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532 **References**

- 533 1. M. L. Connolly, Solvent-accessible surfaces of proteins and nucleic acids. *Science* **221**, 709
534 LP – 713 (1983).
- 535 2. A. B. D. Cassie, Contact angles. *Discussions of the Faraday Society* **3**, 11–16 (1948).
- 536 3. M.-C. Bellissent-Funel, *et al.*, Water Determines the Structure and Dynamics of Proteins.
537 *Chemical Reviews* **116**, 7673–7697 (2016).
- 538 4. C. A. Silvera Batista, R. G. Larson, N. A. Kotov, Nonadditivity of nanoparticle interactions.
539 *Science* **350** (2015).
- 540 5. K. A. Dill, Additivity Principles in Biochemistry. *Journal of Biological Chemistry* **272**,
541 701–704 (1997).
- 542 6. S. Simm, J. Einloft, O. Mirus, E. Schleiff, 50 years of amino acid hydrophobicity scales:
543 revisiting the capacity for peptide classification. *Biological Research* **49**, 31 (2016).
- 544 7. E. Xi, *et al.*, Hydrophobicity of proteins and nanostructured solutes is governed by
545 topographical and chemical context. *Proceedings of the National Academy of Sciences of*
546 *the United States of America* **114**, 13345–13350 (2017).
- 547 8. N. Giovambattista, P. G. Debenedetti, P. J. Rossky, Hydration behavior under confinement
548 by nanoscale surfaces with patterned hydrophobicity and hydrophilicity. *Journal of*
549 *Physical Chemistry C* **111**, 1323–1332 (2007).
- 550 9. N. Giovambattista, C. F. Lopez, P. J. Rossky, P. G. Debenedetti, Hydrophobicity of protein
551 surfaces: Separating geometry from chemistry. *Proceedings of the National Academy of*
552 *Sciences of the United States of America* **105**, 2274–2279 (2008).
- 553 10. H. Acharya, S. Vembanur, S. N. Jamadagni, S. Garde, Mapping hydrophobicity at the
554 nanoscale: Applications to heterogeneous surfaces and proteins. *Faraday Discussions* **146**,
555 353–365 (2010).
- 556 11. C. T. Nguyen, M. Barisik, B. Kim, Wetting of chemically heterogeneous striped surfaces:
557 Molecular dynamics simulations. *AIP Advances* **8**, 065003 (2018).
- 558 12. J. J. Kuna, *et al.*, The effect of nanometre-scale structure on interfacial energy. *Nature*
559 *materials* **8**, 837–842 (2009).
- 560 13. C. D. Ma, C. Wang, C. Acevedo-Vélez, S. H. Gellman, N. L. Abbott, Modulation of
561 hydrophobic interactions by proximally immobilized ions. *Nature* **517**, 347–350 (2015).
- 562 14. S. Chen, *et al.*, Subnanoscale hydrophobic modulation of salt bridges in aqueous media.
563 *Science* **348**, 555–559 (2015).

- 564 15. N. Giovambattista, P. G. Debenedetti, P. J. Rossky, Hydration behavior under confinement
565 by nanoscale surfaces with patterned hydrophobicity and hydrophilicity. *Journal of*
566 *Physical Chemistry C* **111**, 1323–1332 (2007).
- 567 16. C. Singh, *et al.*, Entropy-mediated patterning of surfactant-coated nanoparticles and
568 surfaces. *Physical Review Letters* **99**, 226106 (2007).
- 569 17. Q. K. Ong, *et al.*, High-resolution scanning tunneling microscopy characterization of mixed
570 monolayer protected gold nanoparticles. *ACS Nano* **7**, 8529–8539 (2013).
- 571 18. A. Centrone, *et al.*, The role of nanostructure in the wetting behavior of mixed-monolayer-
572 protected metal nanoparticles. *Proceedings of the National Academy of Sciences* **105**,
573 9886–9891 (2008).
- 574 19. Z. Luo, J. Hou, L. Menin, Q. K. Ong, F. Stellacci, Evolution of the Ligand Shell
575 Morphology during Ligand Exchange Reactions on Gold Nanoparticles. *Angewandte*
576 *Chemie - International Edition* **56**, 13521–13525 (2017).
- 577 20. A. Centrone, Y. Hu, A. M. Jackson, G. Zerbi, F. Stellacci, Phase separation on mixed-
578 monolayer-protected metal nanoparticles: A study by infrared spectroscopy and scanning
579 tunneling microscopy. *Small* **3**, 814–817 (2007).
- 580 21. Z. Luo, *et al.*, Quantitative 3D determination of self-assembled structures on nanoparticles
581 using small angle neutron scattering. *Nature Communications* **9**, 1343 (2018).
- 582 22. Q. Ong, Z. Luo, F. Stellacci, Characterization of Ligand Shell for Mixed-Ligand Coated
583 Gold Nanoparticles. *Accounts of Chemical Research* **50**, 1911–1919 (2017).
- 584 23. L. E. Marbella, J. E. Millstone, NMR techniques for noble metal nanoparticles. *Chemistry*
585 *of Materials* **27**, 2721–2739 (2015).
- 586 24. N. Smolentsev, W. J. Smit, H. J. Bakker, S. Roke, The interfacial structure of water droplets
587 in a hydrophobic liquid. *Nature Communications* **8**, 15548 (2017).
- 588 25. K. Voitchovsky, J. J. Kuna, S. A. Contera, E. Tosatti, F. Stellacci, Direct mapping of the
589 solid–liquid adhesion energy with subnanometre resolution. *Nature Nanotechnology* **5**, 401
590 (2010).
- 591 26. J. Z. Liu, A. van de Walle, G. Ghosh, M. Asta, Structure, energetics, and mechanical
592 stability of Fe-Cu bcc alloys from first-principles calculations. *Phys. Rev. B* **72**, 144109
593 (2005).
- 594 27. A. Díaz-Ortiz, H. Dosch, R. Drautz, Cluster expansions in multicomponent systems: precise
595 expansions from noisy databases. *J. Phys.: Condens. Matter* **19**, 406206 (2007).
- 596 28. M. J. Abraham, *et al.*, GROMACS: High performance molecular simulations through
597 multi-level parallelism from laptops to supercomputers. *SoftwareX* **1–2**, 19–25 (2015).

- 598 29. M. J. Robertson, J. Tirado-Rives, W. L. Jorgensen, Improved Peptide and Protein Torsional
599 Energetics with the OPLS-AA Force Field. *J. Chem. Theory Comput.* **11**, 3499–3509
600 (2015).
- 601 30. H. J. C. Berendsen, J. R. Grigera, T. P. Straatsma, The missing term in effective pair
602 potentials. *J. Phys. Chem.* **91**, 6269–6271 (1987).
- 603 31. F. Iori, R. Di Felice, E. Molinari, S. Corni, GolP: an atomistic force-field to describe the
604 interaction of proteins with Au(111) surfaces in water. *J Comput Chem* **30**, 1465–1476
605 (2009).

606

607 **Author contributions:** Z.L. synthesized the nanoparticles; Z.L., J.K., A.R. and Q.K.O.
608 characterized the nanoparticles; A.M., Z.L., F.K. and H.I.O performed the SFG measurements
609 under the supervision of S.R.; A.M. and Z.L. measured AFM and contact angle on the
610 nanoparticles; D.M.W. performed the molecular dynamic studies under the supervision of M.C.;
611 Z.L., A.M., D.M.W., M.C., and F.S. designed research and prepared the manuscript.

Supplementary Information

Determination and Evaluation of the Non-Additivity in Wetting of Molecularly Heterogeneous Surfaces

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Supplementary Discussion

Effect of deuteration on the ligand shell nanoparticles

In the current work, most of the data i.e. SANS, SAXS, FTIR, TEM, SFG, AFM, and Contact angle, were measured on the same batches of nanoparticles, i.e. NPs coated with dMPA and OT. For the measurements of NMR and TGA, we used NPs coated with MPA and OT due to the requirements of the techniques. All the nanoparticles were synthesized using ligand exchange reaction from the same batch of OT homoligand NPs. Therefore, they should have the same core size and size distribution. For the ligand shell composition, we have previously shown that the deuteration does not affect the ligand shell composition for the same(1) and similar(2) type of ligand coated NPs. Furthermore, while for the SANS modelling, only 50% penalty was imposed on the volume fraction of the ligands, i.e. the ligand shell ratio was not fixed. The volume ratio of the outcome model is MPA: OT = 1: 2.12. While the ligand ratio from NMR measurements is MPA: OT= 55%: 45%, which corresponds to approximately MPA: OT= 1: 2.18, agreeing well with the resulted 3D model. The good quality of the fits also confirms that the ligand ratios are consistent with NMR data.

Ab initio model fitting of SANS data

As described in a recent report, the construction of 3D models from SANS data was performed using MONSA software(3). Briefly, a spherical search volume with a diameter of 7.2 nm was generated according to the pair distribution function calculated using GNOM(4) program. The search volume composed of closely packed beads with a radius of 2 Å. Each bead could be assigned either to the gold, MPA, OT or solvent phase. To facilitate the calculation, the beads within 2 nm radius are fixed to be gold, while beads between 2.7 nm 3.6 nm radius could be assigned to either the two types of ligands or solvent. The ratio of volume fraction of the two types of ligands, calculated from the NMR and TGA value (OT: MPA= 2.0: 1), was used as a fitting penalty during the simulated annealing process. Starting from random configurations, simulated annealing was conducted in order to minimize the discrepancy between the experimental data and the form factor of the bead model. The discrepancy is defined as:

$$\chi^2 = \sum_k \frac{1}{N_k - 1} \sum_{j=1}^{N_k} \left[\frac{I_{\text{exp}}^{(k)}(q_j) - c_k I_{\text{calc}}^{(k)}(q_j)}{\sigma^{(k)}(q_j)} \right]^2$$

Where, the k is the index of scattering curves; N_k is the number of points in the experimental scattering curves; $I_{exp}(q)$ and $I_{calc}(q)$ are the intensities from the experiments and the calculation of the bead model; c_k is the scale factor and $\sigma(q)$ is the experimental errors at each q .

The model fitting process was repeated multiple times always starting from random configurations and the resulting models all present similar ligand shell organization features.

Interpretation of the C-H region of SFG spectra

Since the morphological evolution during the annealing is driven by the gain in conformational entropy of the OT ligands, one would expect for the stripe-like NPs a higher gauche to trans ratio for the ligands compared to the patchy one. To measure such conformational changes, we performed SFG measurements also in the C-H stretch region (2800 – 3000 cm^{-1}) of the vibrational spectrum of NPs as shown in Figure S5. The ligand MPA was deuterated so that only the conformation of the OT was probed. Using SFG the alkyl chain conformations can be determined empirically using the amplitude ratio (referred to as d^+/r^+ ratio) of the symmetric methylene ($\sim 2850 \text{ cm}^{-1}$, d^+) and the symmetric methyl ($\sim 2880 \text{ cm}^{-1}$, r^+) stretch vibrational modes. A value of $d^+/r^+ \ll 1$ is associated with a stretched all-trans alkyl chain conformation, whereas a value of $d^+/r^+ > 1$ indicates that gauche defects dominate the measured vibrational spectrum(5–7). The SFG spectra of both NPs display a different relative amplitude of the d^+ and r^+ mode indicating that the average ligand conformation on the NPs is different. The stripe-like nanoparticle displays a larger d^+/r^+ indicating less stretched alkyl chains.

Work of adhesion measurement from AFM

Images were collected working in the small-amplitude regime in order to map the work(8). The formula proposed in literature to estimate the work of adhesion from the imaging parameters is the following:

$$W_{SL} = a + b \left[\frac{AA_0 \left(\sin \varphi - \frac{A}{A_0} \right)}{e^{-\frac{\alpha \sigma}{2}} - e^{-\frac{\alpha(A+\sigma)}{2}}} \right]^2,$$

where A is the working amplitude, A_0 is the free amplitude, φ is the phase shift, σ is the molecular diameter of the liquid and α is the exponential decay length of the density of work of adhesion at the solid-liquid interfaces.

The method does not provide an absolute measurement, but only a relative one that needs to be calibrated through the measurement of contact angle on reference samples. In fact, since the energy dissipation is calculated with respect to the oscillation of the cantilever in the bulk liquid, the intercept of the calibration line is always given by the surface tension of the imaging liquid, thereof only one reference sample is needed for the calibration. We used a film of MPA protected gold nanoparticles as a calibration system for the measurement of the W_{SL} for the patchy NPs. The value of the work of adhesion calculated for these particles was then used as a calibration system for the stripe-like NPs.

To get a reliable comparison of different samples (and hence a good calibration), the exact same A_0 was kept while scanning different samples (differences ≤ 0.05 nm where considered negligible), meanwhile A was kept as constant as possible. Furthermore, images were compared only if collected in the same day and with the same tip.

Each experiment was reproduced twice. A minimum of five nanoparticles per sample were analyzed. Analysis was performed on single particles, extracted from images similar to the ones shown in Figure S7. Data analysis was performed by calculating the average value (and the standard deviation) of $f(A, A_0, \varphi)$ over all the pixels of a single particle masked from an image. This value was then used to calculate the work of adhesion (after the calibration of the system was performed. In the calibration we used 72 mN/m for the surface tension of water).

For every experiment the average value of W_{SL} on different particles and its standard deviation σ was calculated. 5 mN/m were added to each standard deviation in order to take into account the error associated with the calibration ($\sigma^* = \sigma + 5 \text{ mN/m}$). The average value for different experiments has been calculated and the final standard deviation has been obtained by propagating the σ^* of the single experiments.

Simulation details

All simulations were carried out using the GROMACS/2018.4 software package(9). Inter-ligand interactions were treated using the OPLS/AA forcefield(10), the SPC/E model(11) was used for water, and the gold surface was described with the GolP model(12). For the patchy and stripe-like surfaces, we started with a box size of ~ 6 nm x 6 nm in the xy plane, with a height of 30 nm. A gold (111) surface with height 5 nm was placed at the center, and ligands

attached to the surface (the positions of the sulfur atom of each ligand were constrained throughout the simulation, as were all gold atoms other than the image-charge sites(12)). Slabs of water with height 5 nm were placed above and below the ligand surfaces and allowed to condense onto the surface. For the trench surfaces, a similar procedure was followed but with the dimensions of the box 12.1 nm x 2.6 nm in the xy plane. This gives 24 columns of ligands, from which we created trenches containing 0, 1, 2, 4, 8, 12, 16, 20, 22, 23 and 24 columns of MPA ligands (an example of the simulation setup for the trenches is shown in figure S9). Surfaces with random motifs were simulated in boxes with the same dimension as the patchy and striped surfaces, with 20 different sets of random ligands generated, making 40 surfaces. 24 surfaces with tailored motifs were also designed to add to the training set if required. Figure 3A shows an example of the simulation setup for a trench surface after allowing the water slabs to condense.

For every surface, four independent runs were carried out with the initial orientation of ligands about the z axis generated randomly. Simulations were run in the NVT ensemble at 300 K with a timestep of 1 fs and a velocity-rescaling thermostat used to control the temperature(13). After allowing the water slabs to condense onto the ligand surface, the system was equilibrated for 10 ns and statistics were collected over 50 ns. The water-vacuum boundaries produced by expanding the simulation box meant that the pressure was held constant at 0 bar. Long-ranged electrostatics were dealt with using the particle-mesh Ewald (PME) method(14).

The structure of the solvent around the nanoparticle surface was quantified using two properties: the density ρ , obtained by taking a histogram of coordinates of the oxygen atoms in water molecules, and the dipole orientation density $\mu = \langle \cos\theta \rangle \rho$, where $\langle \cos\theta \rangle$ is the average orientation of the water dipole moment with the surface normal pointing away from the gold surface. The surface excesses were obtained by subtracting the predicted histogram from the one observed from simulations, where the prediction was obtained by taking the profiles calculated using surfaces with either full-MPA or full-OT coverage and linearly combining them:

$$\Delta f(z) = f_{obs}(z) - [x_{OT}f_{OT}(z) + x_{MPA}f_{MPA}(z)],$$

where $f_{OT}(z)$ is the profile from the 0-MPA trench and $f_{MPA}(z)$ is the profile from the 24-MPA trench. x_{OT} and x_{MPA} are the fraction of OT and of MPA ligands respectively.

Results on trench configurations

Based on the expectation that the boundary between OT and MPA regions is responsible for the non-additive behavior observed, we ran simulations, as described in the previous section,

on a series of trench geometries, in which the length of the boundary between the two regions is kept constant, but the area of each region differs. If the boundary region alone is responsible for non-additivity, we would expect that the excess properties of interest are independent of the size of the trench, so long as it is large enough that the two boundaries do not “interact” with each other. Figure S11 shows that, indeed, while the surface excesses differ between small and large trench sizes, for large enough trenches the excesses are relatively independent of trench size. This is further borne out by Figure 3A in the main text, in which the local water density is shown in a cut across the trench, and is similarly independent of trench size for large trenches.

When investigating the local density of water, we found that the structure of water in contact with MPA ligands follows one of two regimes, where the two structures are related (in the case of a bare surface) by a 60° rotation, as shown in Figure S10. To obtain the results in Figure 3A, we separated each surface into one or the other type of surface-water structuring, in order to avoid spuriously averaging over two different types of structure and washing-out the local water density.

These trench configurations give a qualitative idea of how the water structure depends on the size of regions of ligand, but for a quantitative picture a wider variety of surface morphologies must be considered.

Nearest-Neighbor Model for Surface Excesses

In order to predict the surface excesses on arbitrary ligands, we developed a model in which an arbitrary excess quantity $\Delta f(z)$ (either $\Delta\rho(z)$ or $\Delta\mu(z)$) is given by the linear combination,

$$\Delta f(z) = \mathbf{n} \cdot \mathbf{f}(z)$$

$$\Delta f(z) = \sum n_i f_i(z),$$

where the index i represents a particular ligand environment, $\mathbf{n} = \{n_i, i=1, \dots, M\}$ is a vector containing the number of ligands n_i of type i , with M the total number of possible environments, and $\mathbf{f}(z) = \{f_i(z), i=1, \dots, M\}$, where the functions $f_i(z)$ are to be fitted. This expansion is inspired by the cluster expansion models used to model the thermodynamic properties of multicomponent alloys in terms of local environments(15, 16), with surface excess functions used in our case rather than, e.g., energetics.

We chose to classify ligands based on their nearest neighbors, with the remainder of their surroundings providing a mean-field background. This approach was motivated by the fact that

simulations containing trenches of ligands showed the structure of water to be quite independent on the trench size above the smallest trenches, so that long-ranged effects on the local structure were minimal. The nearest-neighbor environment of a ligand is described by the six ligands surrounding it, meaning that there are $2^7=128$ possible ligand plus environment combinations. Of these, many are related by rotational symmetry, and only 26 must be considered, of which the two cases where all six surrounding ligands are identical to the central one were assumed not to contribute to the excess. The remaining 24 possible motifs are shown in Figure S12, along with the fitting functions $\Delta\rho_i(z)$ and $\Delta\mu_i(z)$ corresponding to each.

These functions were obtained by taking a training set of slab systems with the ligand at each site randomly chosen, and for which the excess quantities were computed. In terms of the matrix \mathbf{n} , whose element n_{ji} gives the number of ligands of type i in the j^{th} training structure, and a vector $\Delta\mathbf{f}(z) = \{\Delta f_j(z), j=1, \dots, N\}$, where $\Delta f_j(z)$ is the surface excess for the j^{th} training structure and N the total number of such structures, the vector of fitting functions is given by,

$$\Delta\mathbf{f}(z) = (\mathbf{n}^T \mathbf{n} + \sigma^2 \mathbf{I})^{-1} \mathbf{n}^T \mathbf{f}(z)$$

with σ^2 a regularization parameter used to avoid overfitting.

Figure S12 shows that the contribution of each motif to a given surface excess is essentially of the same order of magnitude: no particular motif is *a priori* more important than the others in determining the excess. However, the striped surfaces contain both a larger number of environments that give an excess and a larger variety of environments (with several motifs appearing almost exclusively on striped surfaces). These factors lead to more pronounced surface excesses for the striped than for the patchy surfaces.

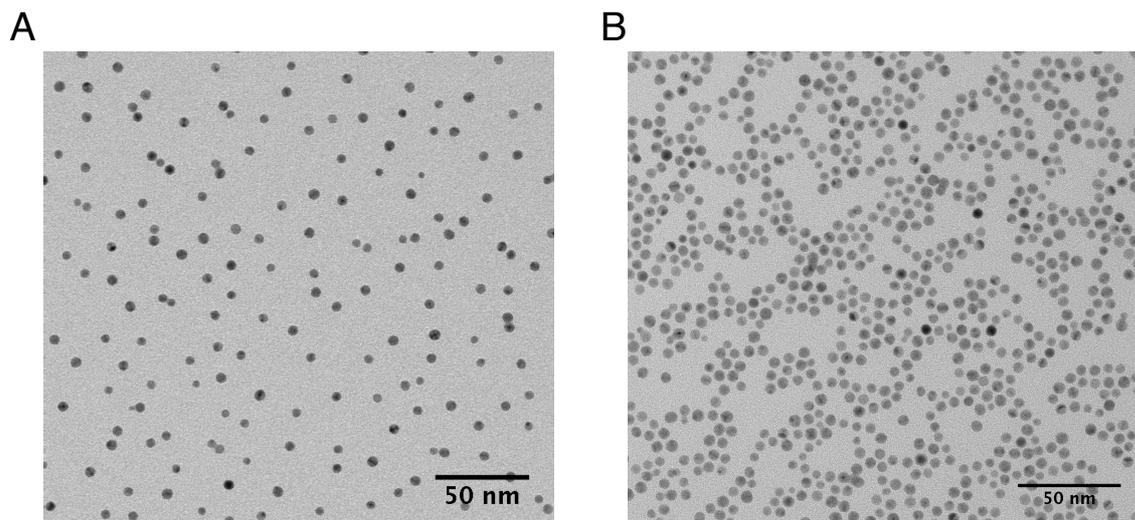


Figure S1 TEM data on the nanoparticles before (A) and after (B) thermal treatment. Based on the counting of more than 500 nanoparticles, the distributions of the core diameter are found to be 5.1 ± 0.6 nm and 5.2 ± 0.7 nm for nanoparticles before and after thermal treatment, respectively.

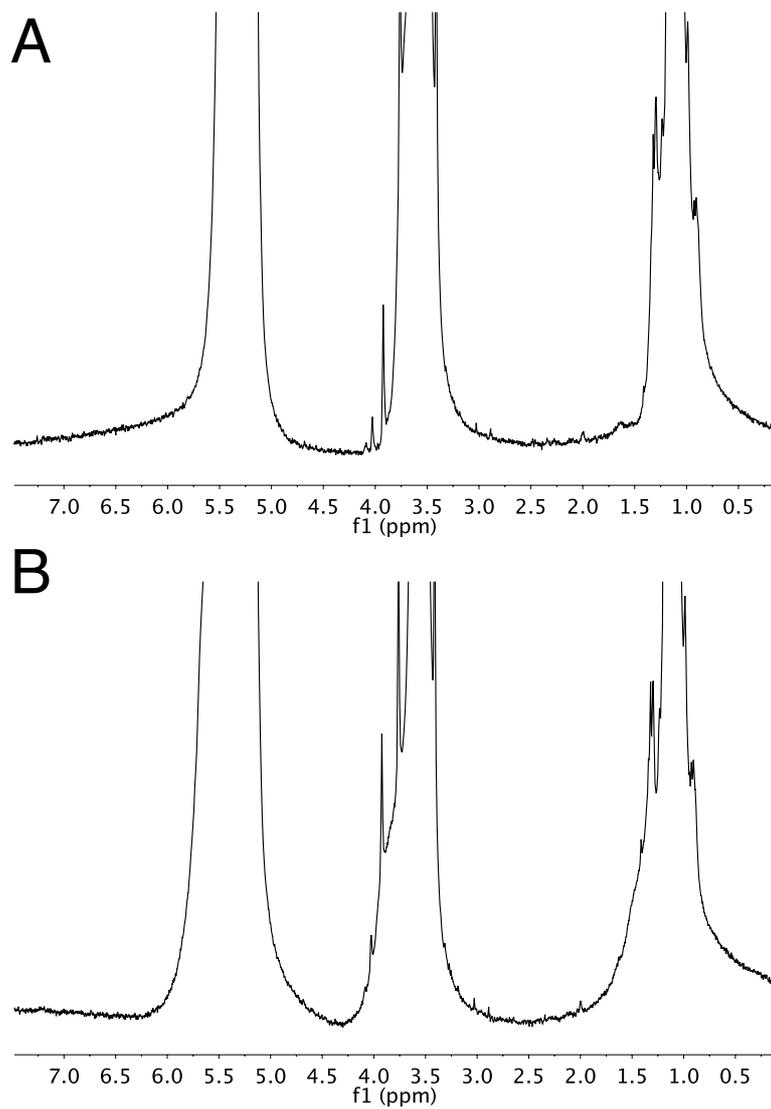


Figure S2 NMR data for nanoparticle before iodine etching. The absence of the sharp peaks between 2.5 and 3.0 ppm indicates that the nanoparticles are free from unbounded small molecules.

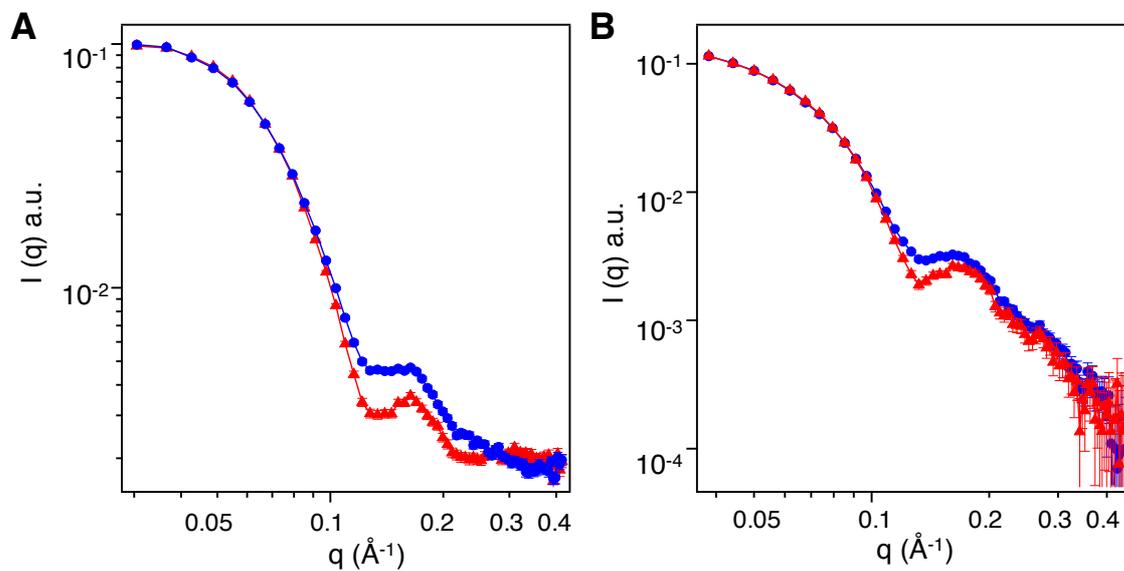


Figure S3 SANS data on the nanoparticles before and after thermal treatment measured at different synchrotron facilities. In both plots, the blue curves stand for nanoparticles before thermal treatment while the red curves stand for samples after thermal treatment. (A) Data collected at MLZ, Germany. (B) Data collected at PSI, Switzerland. The ligands for nanoparticles are the same as shown in the main text, i.e. deuterated MPA and OT.

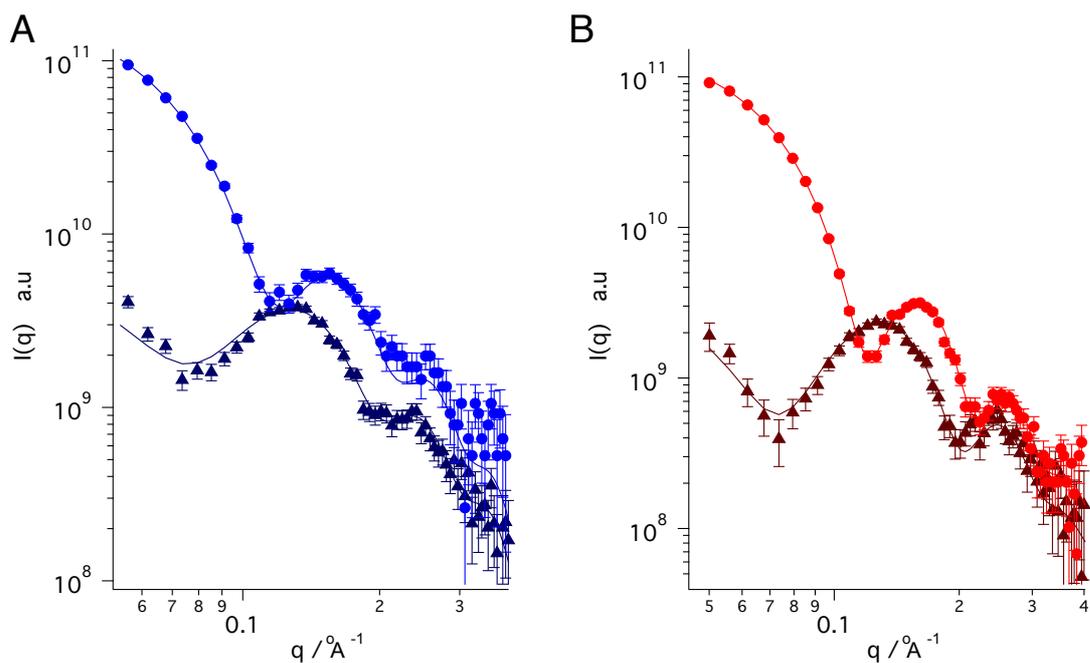


Figure S4 Fitting of the SANS data using MONSA package. In both plots, the full lines are the fits, i.e. form factor of the 3D model generated, while the dots are experimental data. (A) Nanoparticle before thermal treatment. Blue curves stand for SANS measurements in tetrahydrofuran-d₈ while dark blue curves stand for SANS measurements in chloroform-d. (B) Nanoparticle after thermal treatment. Red curves stand for SANS measurements in tetrahydrofuran-d₈ while dark red curves stand for SANS measurements in chloroform-d.

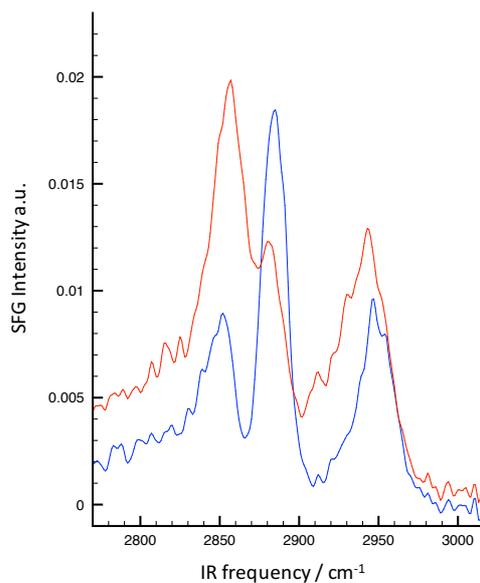


Figure S5 Representative SFG spectra in the C-H region collected in the SSP polarization. The amplitude ratio of the symmetric methylene (~ 2850 cm⁻¹) and the symmetric methyl (~ 2880 cm⁻¹) stretch vibrational modes are significantly different for the patchy and stripe-like particles (respectively shown with a blue and a red curves).

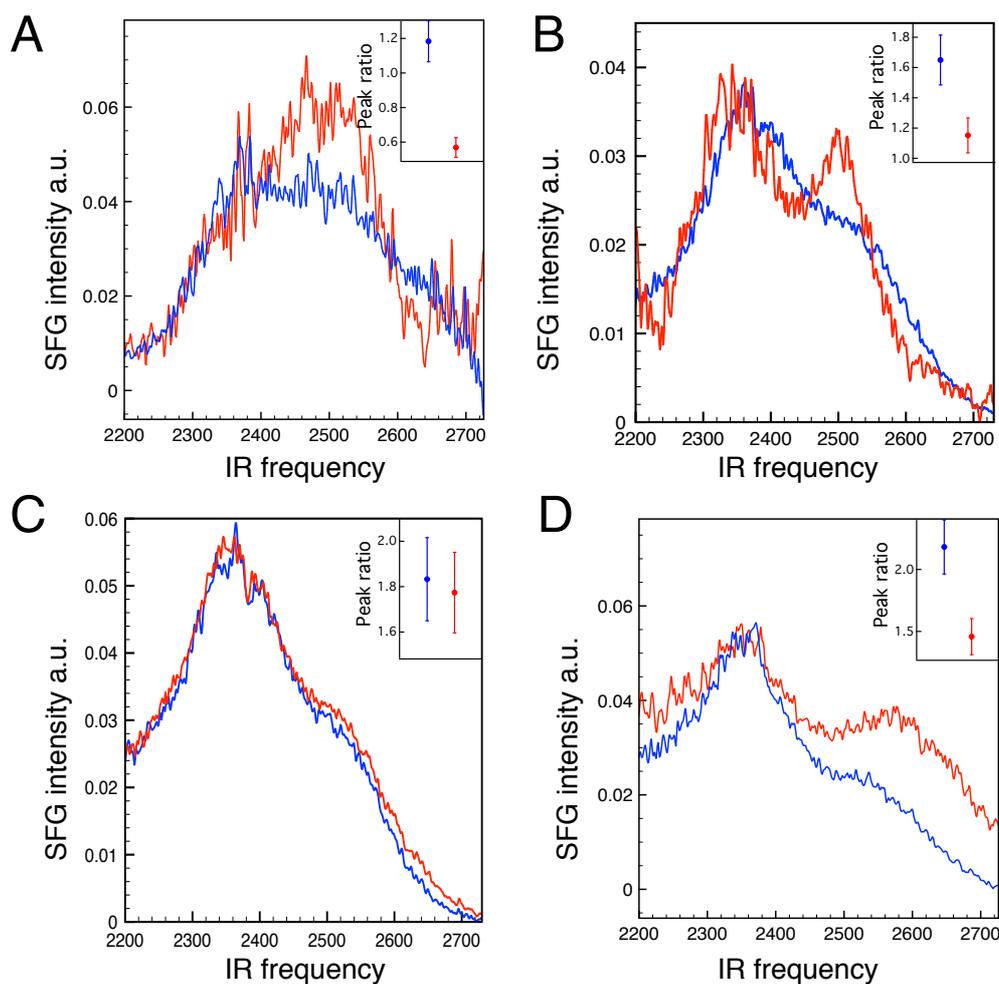


Figure S6 (A)-(D) SFG spectra in the water region, as recorded in four different measurements (Blue: patchy NPs, red: stripe-like NPs) and associated amplitude ratio of the peaks associated with the strong H bond and the weak H bond (insets). To avoid any error from laser fluctuations on different days, we choose to report our data separately. We calculated the peak to peak ratio error of the sum frequency scattering setup on 10 spectra of different samples of sodium dodecylsulfate stabilized hexadecane nanoemulsions. and the deviation from spectrum to spectrum is less than 10 %. This value is used as an error for the values reported on the above graph. We have never observed an increase in the ratio during an experiment. The fact that during one experiment (C) we did not observe any difference between the two sets of nanoparticles can be explained by the fact that annealing may not have worked perfectly on that occasion. Since in the formation of the film it is likely that similar nanoparticles will

assemble together, it is possible that in this case the laser was focused on an area composed of nanoparticles that were not affected by annealing.

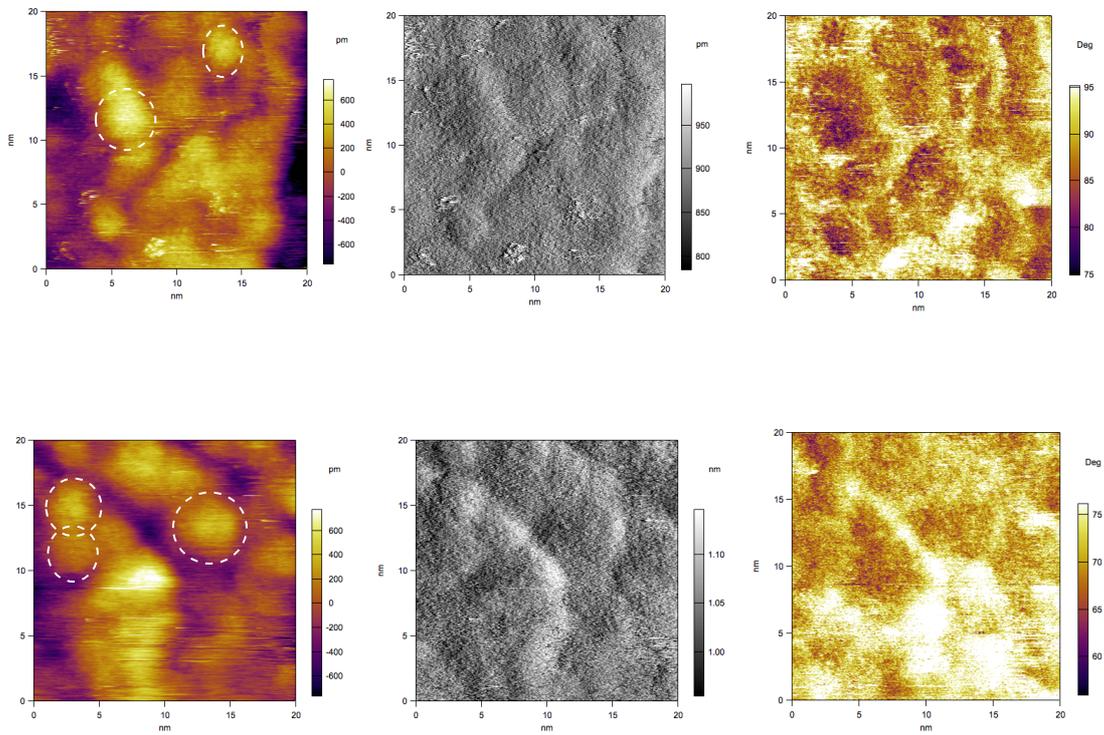


Figure S7 Representative images (in the order: height, amplitude and phase) collected on patchy NPs (top) and on stripe-like NPs (bottom). Circles indicate single particles that have been used for the calculation of W_{SL} . The value of the free phase of oscillation was 95° for the image on top and 76° for the one on the bottom.

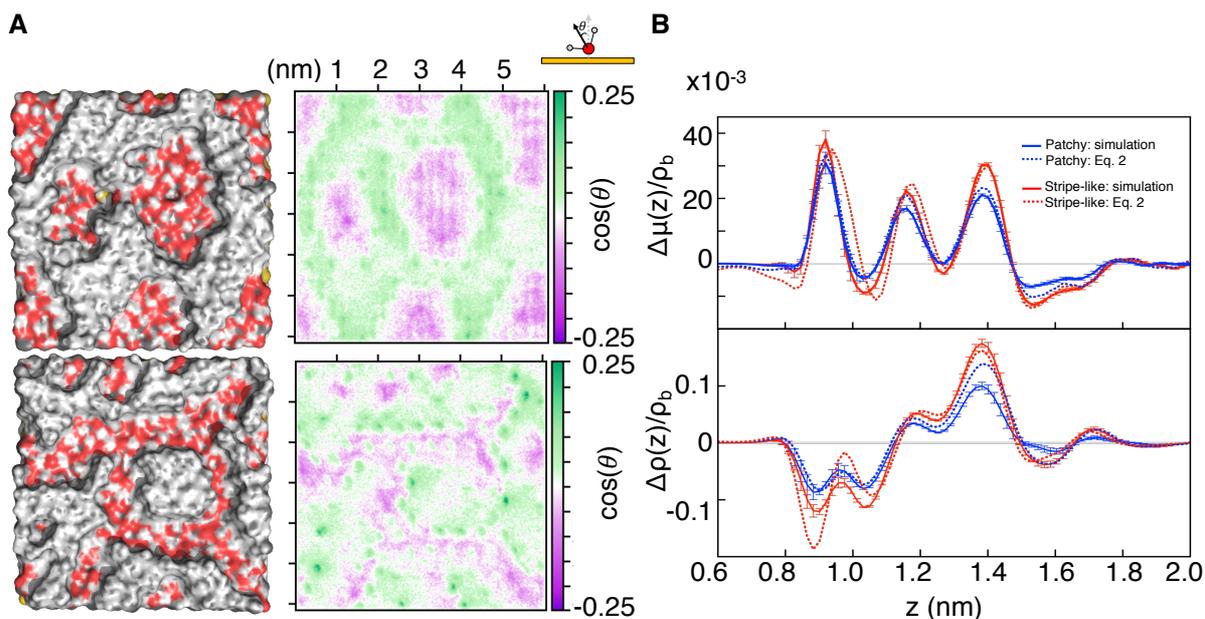


Figure S8 Reproducibility of the results of the simulations. (A) Left: morphology of two additional surfaces after equilibration (patchy on top and stripe-like on the bottom). Water molecules have been removed to show the geometry of the interface. Carbon, oxygen and hydrogen atoms are represented with grey, red and white colors respectively. Right: corresponding 2D histogram of the average dipole orientation density, μ , above the surfaces (averaged over four different realizations). Areas on top of the MPA patches look mostly purple (dipole pointing towards the surface) and areas on top of the OT patches look mostly white (dipole parallel to the surface). Green regions (dipole pointing out from the surface) are visible on top of the OT-MPA interfaces, with darker green visible on the stripe-like morphology. (B) Deviation from the additive assumption of the average dipole orientation density, $\Delta\mu$, (top) and density profile of water, $\Delta\rho$ (bottom), as a function of the distance from the gold surface (z). Both result of the molecular dynamics simulation and the prediction from equation 2 are shown: good agreement between them is visible.

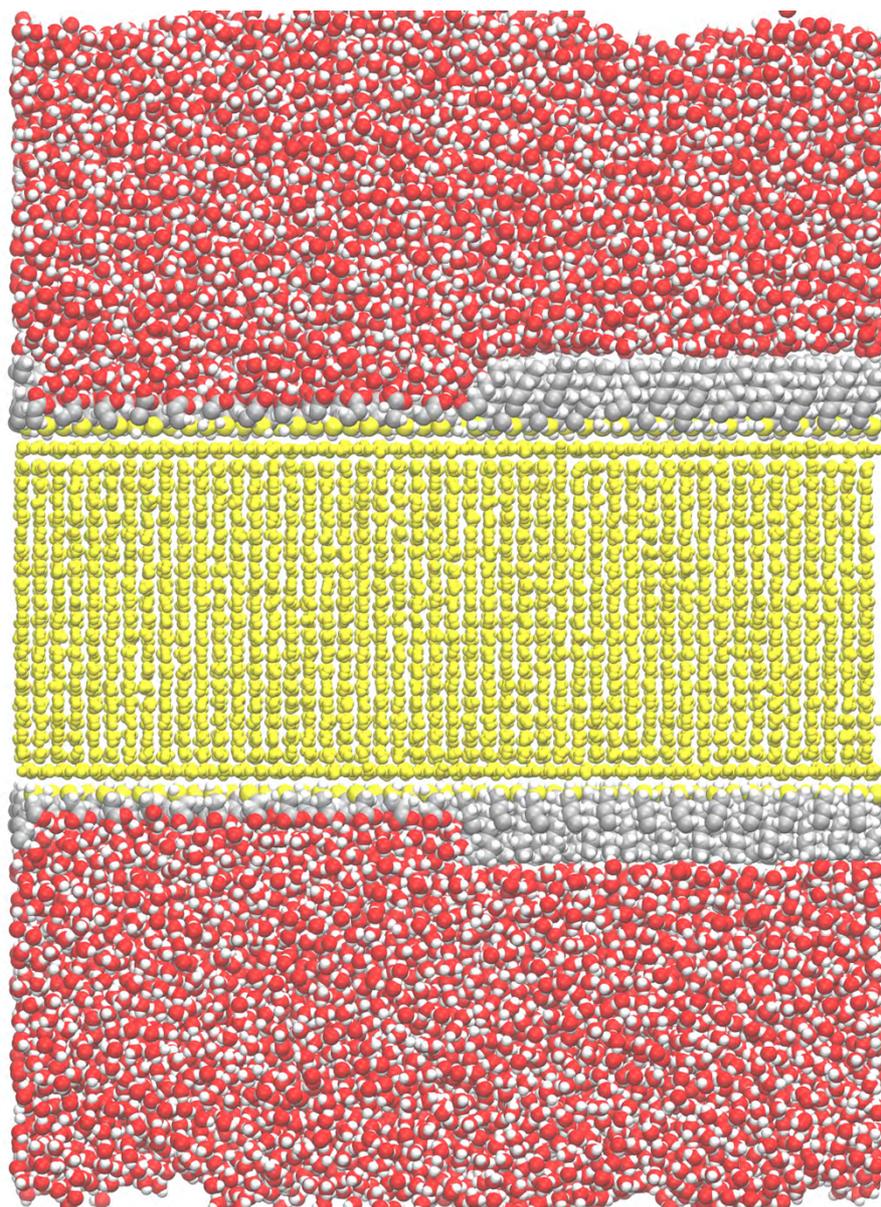


Figure S9 Illustration of the simulation setup for a trench configuration with 12 MPA and 12 OT ligands. Gold atoms are shown in yellow, carbon in grey, oxygen in red and nitrogen in white.

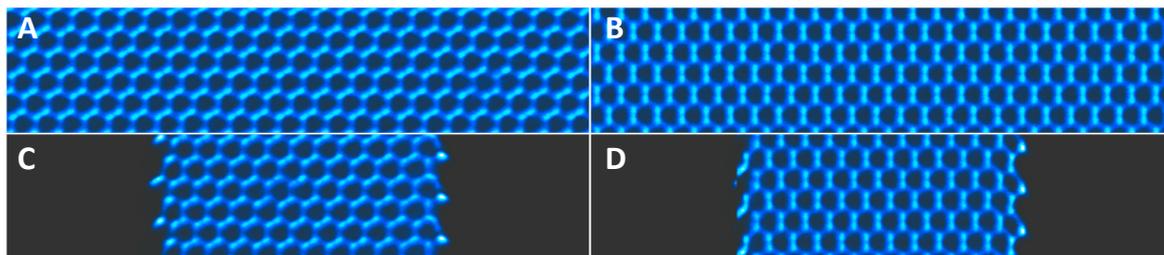


Figure S10 Water density on MPA trenches. Top row: two types of surface structure for a surface with 24 rows of MPA ligands; these are rotationally identical. Bottom row: (C) and (D) show the surface structure of water on top of the MPA ligands, equivalent to the structures in (A) and (B) respectively. Because of the presence of a region of OT ligands, these two are no longer equivalent.

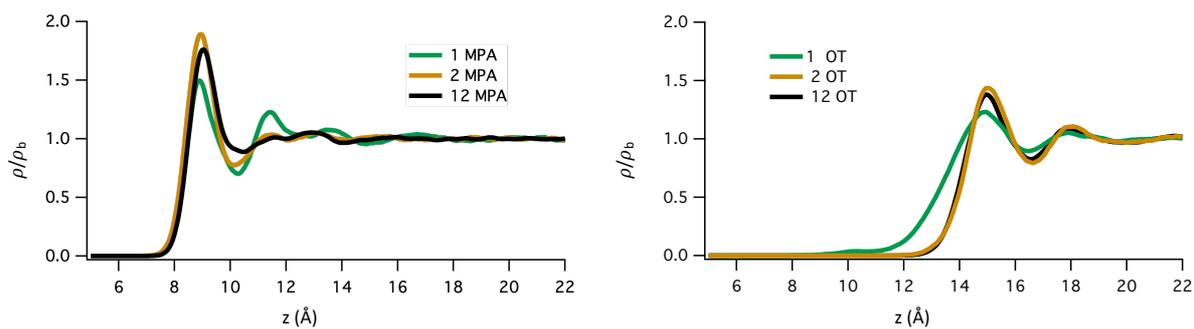
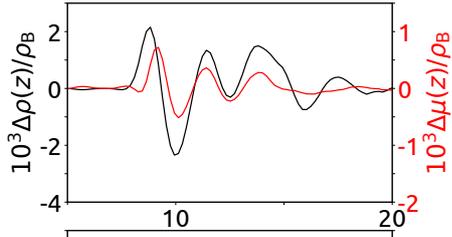


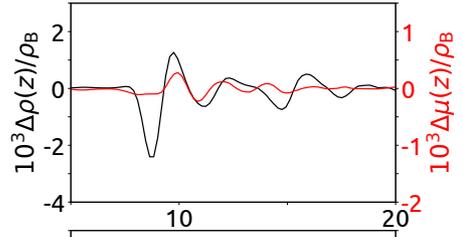
Figure S11 Density profile of water as a function of the distance from the gold surface at the center of a trench. Values measured at the center of the MPA and OT trenches are shown on the left-hand side and right-hand side respectively. In both cases the density of water on the 2 molecules thick trench (brown) is comparable with the one on the center of the 12 molecule thick trench (black). On the contrary the density of water on the single-molecule thick trench (green) looks significantly different from the trench that is 2 molecules thick.



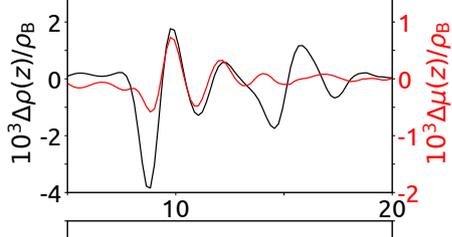
$\Omega = 6$
 $n_P = 37$
 $n_S = 23$



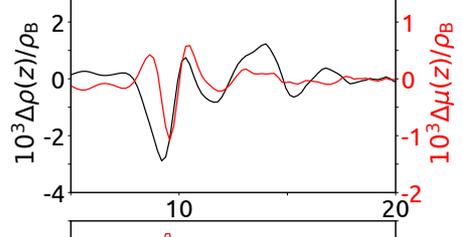

$\Omega = 6$
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 $n_S = 29$



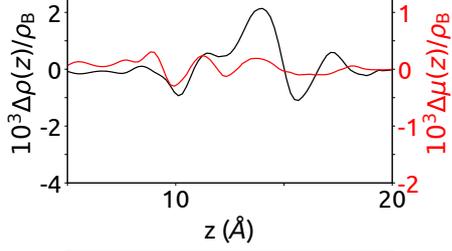

$\Omega = 6$
 $n_P = 0$
 $n_S = 8$



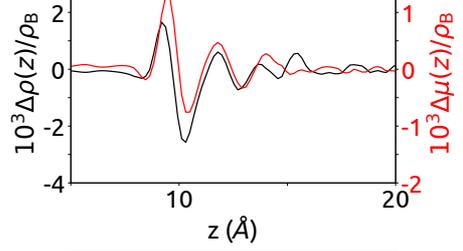

$\Omega = 6$
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 $n_S = 4$



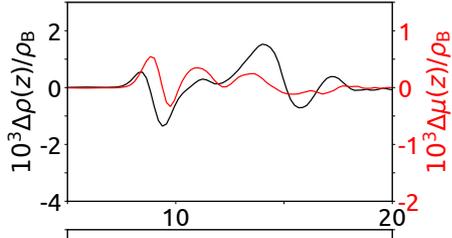

$\Omega = 1$
 $n_P = 0$
 $n_S = 0$



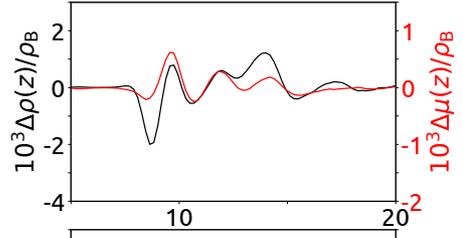

$\Omega = 1$
 $n_P = 0$
 $n_S = 0$



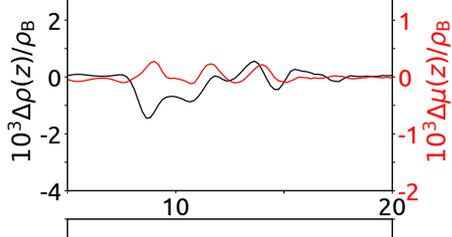

$\Omega = 6$
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 $n_S = 44$



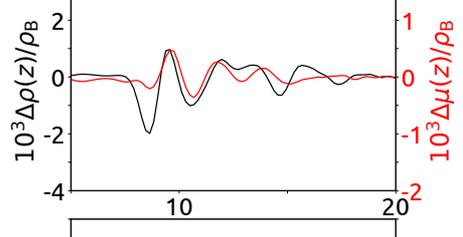

$\Omega = 6$
 $n_P = 42$
 $n_S = 49$



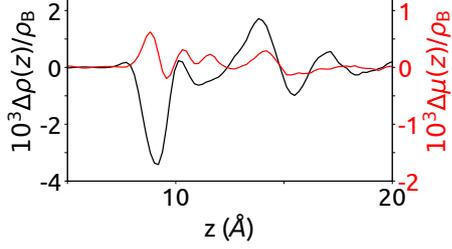

$\Omega = 6$
 $n_P = 1$
 $n_S = 9$



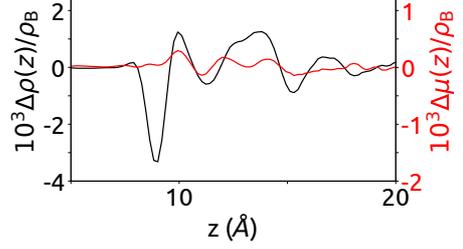

$\Omega = 6$
 $n_P = 0$
 $n_S = 5$




$\Omega = 3$
 $n_P = 1$
 $n_S = 4$




$\Omega = 3$
 $n_P = 0$
 $n_S = 7$



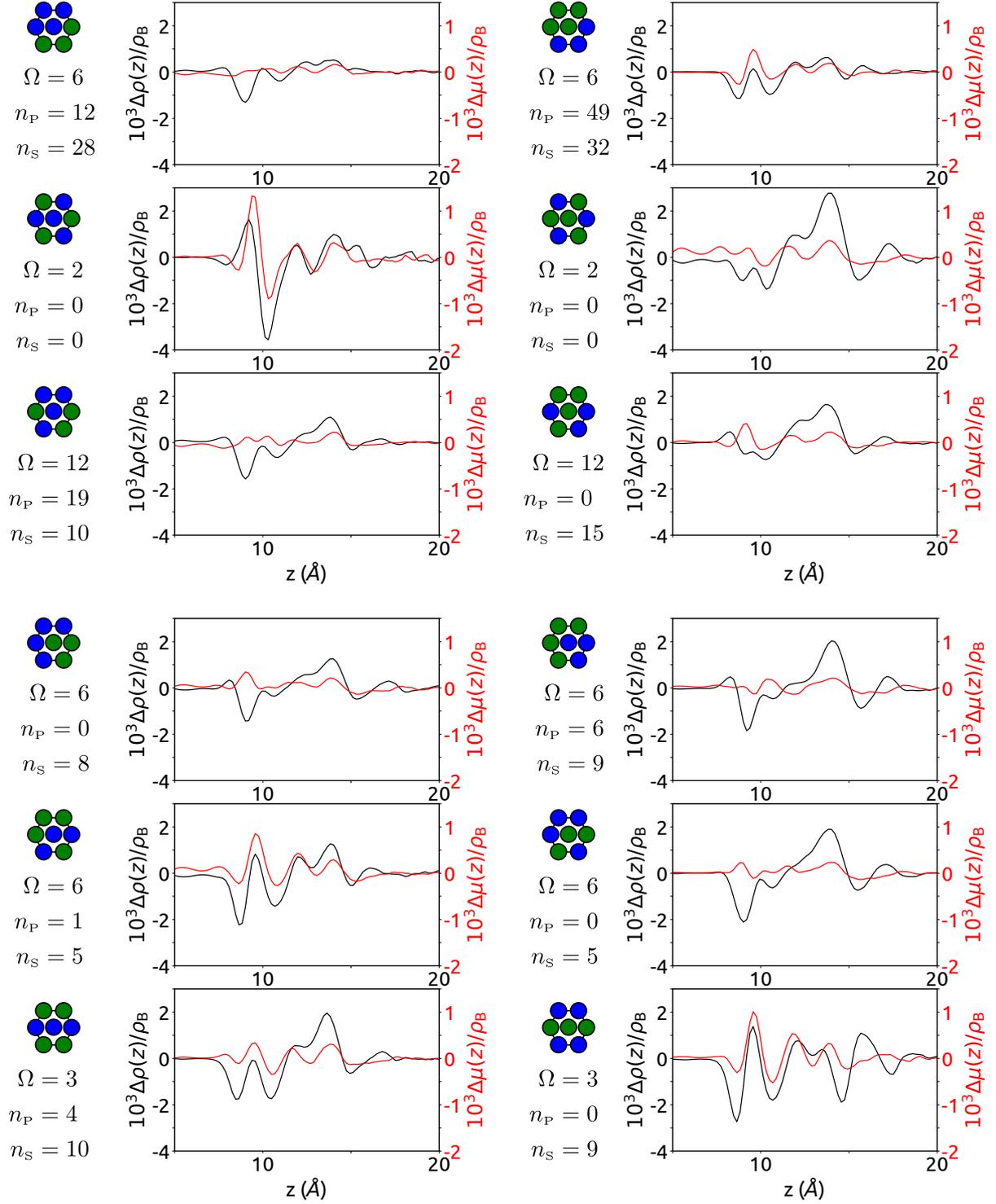


Figure S12 Excess terms associated to all the possible nearest neighbors patterns. OT and MPA ligands are shown in blue and green respectively. Ω stands for the degeneracy of the pattern. n_P and n_S are the number of times the pattern is observed in the patchy and stripe-like surfaces shown in figure 2D, respectively.

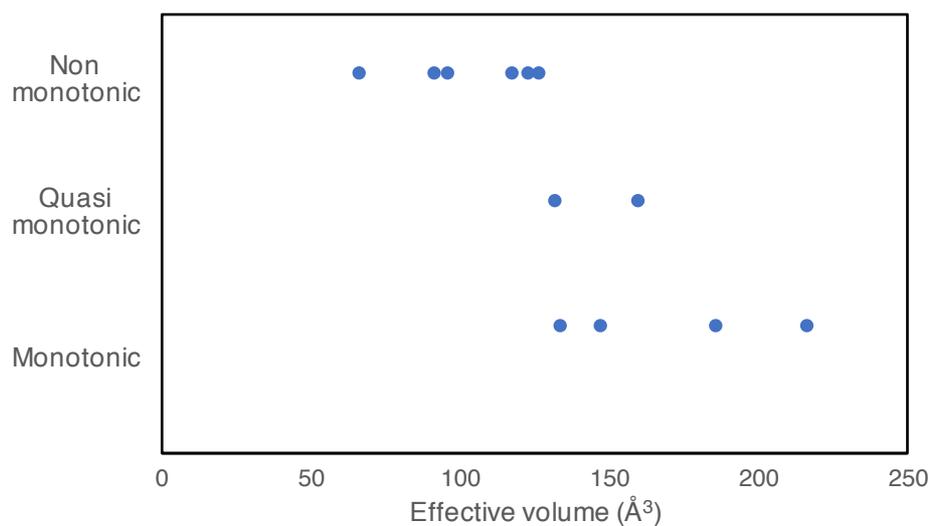


Figure S13 Re-analysis of the solubility profiles of similar MPA-OT nanoparticles as previously reported(17). The solvents are classified into three categories depending on whether the nanoparticles show monotonic dependence of solubility on ligand shell composition. The solvents are then arranged using their effective molecular volume. In general, solvents that give non-monotonic solubility behavior of the nanoparticles have smaller effective molecular volume, while solvents that give monotonic solubility behavior of the nanoparticles have larger effective molecular volume.

Table S1 Summary of the characterization on the nanoparticles.

	Patchy NP	Stripe-like NP
Core diameter	4.9 ± 0.6 nm	4.9 ± 0.6 nm
MPA: OT ratio	55%: 45%	54%: 46%
Ligand weight percentage	5.9%	5.5%
MPA domain thickness	2.1 ± 0.6 nm	1.3 ± 0.3 nm

Table S2. Values of water contact angle measured on films of NPs and corresponding work of adhesion (calculated by the Young-Dupré equation, using 72 mN/m for the surface tension of water). The error on the contact angle reported is the standard deviation of the measured values, while the error on W_{SL} is obtained by propagating the one on contact angle.

Sample	Contact Angle	Work of adhesion
Patchy Nanoparticle	$76 \pm 3^\circ$	89 ± 4 mN/m
Stripe-like Nanoparticle	$85 \pm 3^\circ$	79 ± 4 mN/m
MPA Nanoparticle	$38 \pm 1^\circ$	128 ± 1 mN/m
OT Nanoparticle	$106 \pm 5^\circ$	52 ± 6 mN/m

Table S3. Contact angle values obtained on an additional set of MPA-OT nanoparticles with ligand ratio 70:30 (as obtained by NMR) and core size 4.1 ± 0.5 nm (as obtained by TEM). These measurements confirm the fact that the wetting of the nanoparticles is affected by the shell morphology.

Sample	Contact Angle	Work of adhesion
Before annealing	$72 \pm 2^\circ$	94 ± 3 mN/m
After annealing	$83 \pm 1^\circ$	81 ± 1 mN/m
Difference	$11 \pm 1^\circ$	13 ± 1 mN/m

Table S4. Values of surface tension (γ), density (d), molar weight (M) and measured contact angle of various solvents on the two nanoparticle films.

Solvents	γ (mN/m)	d (g/ml)	M (g/mol)	$V_{\text{effective}}^{\ddagger}$ (\AA^3)	θ_{Patchy} ($^{\circ}$)	$\theta_{\text{Stripe-like}}$ ($^{\circ}$)
Water(18)	72.8	1.00	18.0	30.0	70.1 ± 2.7	78.6 ± 2.9
Dichlorobenzene(18)	33.6	1.31	147.0	187.0	30.8 ± 0.8	36.1 ± 2.0
Chloroform(18)	27.5	1.49	119.4	133.0	16.6 ± 1.7	16.8 ± 2.4
Ethylene glycol(18)	47.7	1.11	62.1	92.6	52.2 ± 2.3	64.9 ± 3.3
DMSO(18)	44.0	1.10	78.1	118.0	44.7 ± 3.8	52.0 ± 3.7
Perfluorodecalin(19)	19.0	1.91	462.1	402.3	25.0 ± 1.3	27.7 ± 3.0
5CB(20)	27.9	1.00	249.4	411.0	46.3 ± 2.2	50.0 ± 1.8
Glycerol(18)	63.4	1.25	92.1	122.4	71.2 ± 4.1	87.2 ± 4.5
Hexadecane(19)	27.5	0.77	226.4	486.6	14.7 ± 2.2	25.5 ± 2.6
Isopropanol(18)	23.0	0.79	60.1	127.2	0*	6.8 ± 3.3
Formamide(21)	58.9	1.13	45.0	66.0	46.1 ± 2.0	51.6 ± 2.7
Perfluorohexane(19)	11.7	1.67	338.0	336.4	4.8 ± 1.4	5.8 ± 2.6

* $\theta = 0^{\circ}$ is approximated for solvents that wet almost completely the nanoparticle film.

‡ The effective molecular volume is calculated by dividing the molar volume by Avogadro's number, i.e., $V_{effective} = \frac{M}{d \cdot N_A}$

References

1. A. Centrone, Y. Hu, A. M. Jackson, G. Zerbi, F. Stellacci, Phase separation on mixed-monolayer-protected metal nanoparticles: A study by infrared spectroscopy and scanning tunneling microscopy. *Small* **3**, 814–817 (2007).
2. Z. Luo, *et al.*, Quantitative 3D determination of self-assembled structures on nanoparticles using small angle neutron scattering. *Nature Communications* **9**, 1343 (2018).
3. D. I. Svergun, Restoring low resolution structure of biological macromolecules from solution scattering using simulated annealing. *Biophysical journal* **76**, 2879–86 (1999).
4. D. I. Svergun, Determination of the regularization parameter in indirect-transform methods using perceptual criteria. *Journal of Applied Crystallography* **25**, 495–503 (1992).
5. P. Guyot-Sionnest, J. H. Hunt, Y. R. Shen, Sum-frequency vibrational spectroscopy of a Langmuir film: Study of molecular orientation of a two-dimensional system. *Physical Review Letters* **59**, 1597–1600 (1987).
6. O. Esenturk, R. A. Walker, Surface vibrational structure at alkane liquid/vapor interfaces. *The Journal of Chemical Physics* **125**, 174701 (2006).
7. E. Tyrode, J. Hedberg, A Comparative Study of the CD and CH Stretching Spectral Regions of Typical Surfactants Systems Using VSFS: Orientation Analysis of the Terminal CH₃ and CD₃ Groups. *The Journal of Physical Chemistry C* **116**, 1080–1091 (2012).
8. K. Voïtchovsky, J. J. Kuna, S. A. Contera, E. Tosatti, F. Stellacci, Direct mapping of the solid–liquid adhesion energy with subnanometre resolution. *Nature Nanotechnology* **5**, 401 (2010).
9. M. J. Abraham, *et al.*, GROMACS: High performance molecular simulations through multi-level parallelism from laptops to supercomputers. *SoftwareX* **1–2**, 19–25 (2015).
10. M. J. Robertson, J. Tirado-Rives, W. L. Jorgensen, Improved Peptide and Protein Torsional Energetics with the OPLS-AA Force Field. *Journal of Chemical Theory and Computation* **11**, 3499–3509 (2015).
11. H. J. C. Berendsen, J. R. Grigera, T. P. Straatsma, The missing term in effective pair potentials. *The Journal of Physical Chemistry* **91**, 6269–6271 (1987).
12. I. F., D. F. R., M. E., C. S., GoIP: An atomistic force-field to describe the interaction of proteins with Au(111) surfaces in water. *Journal of Computational Chemistry* **30**, 1465–1476 (2008).
13. G. Bussi, D. Donadio, M. Parrinello, Canonical sampling through velocity rescaling. *J. Chem. Phys.* **126**, 014101 (2007).

14. T. Darden, D. York, L. Pedersen, Particle mesh Ewald: An $N \cdot \log(N)$ method for Ewald sums in large systems. *The Journal of Chemical Physics* **98**, 10089–10092 (1993).
15. J. Z. Liu, A. van de Walle, G. Ghosh, M. Asta, Structure, energetics, and mechanical stability of Fe-Cu bcc alloys from first-principles calculations. *Phys. Rev. B* **72**, 144109 (2005).
16. A. Díaz-Ortiz, H. Dosch, R. Drautz, Cluster expansions in multicomponent systems: precise expansions from noisy databases. *J. Phys.: Condens. Matter* **19**, 406206 (2007).
17. A. Centrone, *et al.*, The role of nanostructure in the wetting behavior of mixed-monolayer-protected metal nanoparticles. *Proceedings of the National Academy of Sciences* **105**, 9886–9891 (2008).
18. J. Shen, *et al.*, Liquid Phase Exfoliation of Two-Dimensional Materials by Directly Probing and Matching Surface Tension Components. *Nano Letters* **15**, 5449–5454 (2015).
19. A. Luís, *et al.*, Influence of Nanosegregation on the Surface Tension of Fluorinated Ionic Liquids. *Langmuir* **32**, 6130–6139 (2016).
20. M. G. J. Gannon, T. E. Faber, The surface tension of nematic liquid crystals. *Philosophical Magazine A* **37**, 117–135 (1978).
21. B. Jańczuk, W. Wójcik, A. Zdziennicka, Determination of the components of the surface tension of some liquids from interfacial liquid-liquid tension measurements. *Journal of Colloid And Interface Science* **157**, 384–393 (1993).