

1 **A First-Principles Approach for Treating Dye Wastewater**

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1 **Abstract**

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3 Numerous materials are employed for treating wastewaters, e.g., for the removal of dyes from wastewater
4 in the textile industry. However, the regeneration/reuse of these materials is still seldom practiced.
5 Quantitative insights into intermolecular forces between the contaminants and the functional surfaces
6 might aid the rational design of reusable materials. Here, we compare the efficacies of aliphatic (C_8H_{18}),
7 aromatic (C_6H_6), and aromatic perfluorinated (C_6F_6) moieties at removing methylene blue (MB^+),
8 as a surrogate dye, from water. We employed DFT with an implicit polarizable continuum model (PCM)
9 for water to accurately determine the contributions of the solvent's electrostatics in the adsorption process.
10 Our calculations pinpointed the relative contributions of π - π stacking, van der Waals complexation,
11 hydrogen bonding, and cation- π interactions, predicting that MB^+ would bind the strongest with C_6F_6
12 due to hydrogen bonding and the weakest with C_8H_{18} . Complementary laboratory experiments
13 revealed that despite the similar hydrophobicity of silica beads functionalized with Si- C_8H_{17} ,
14 Si- C_6H_5 , and Si- C_6F_5 , as characterized by their water contact angles, the relative uptake of
15 aqueous MB^+ varied as Si- C_6F_5 (95%) > Si- C_6H_5 (35%) > Si- C_8H_{17} (3%). This first-principles-
16 led experimental approach can be easily extended to other classes of dyes, thereby advancing
17 the rational design of adsorbents.

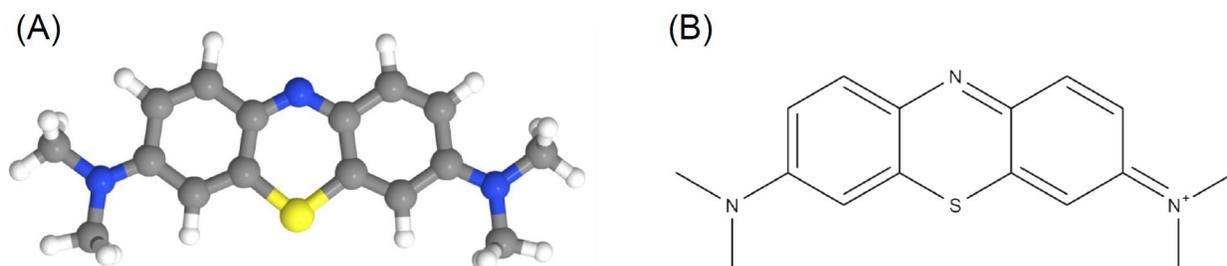
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19 1. INTRODUCTION

20 Domestic and industrial consumption of water has been increasing to meet the needs of growing
21 populations and industries around the world¹. Water resources are therefore under tremendous stress to
22 cope with the demand for irrigated and livestock agriculture, as well as the industrial needs and the impact
23 of climate change and widespread contamination of land and water bodies²⁻⁴. In this context, wastewater
24 treatment serves the crucial purpose of water reuse and sustainable discharge into the environment⁵. The
25 recovery of materials and resources during wastewater treatment is also emerging as a promising approach
26 towards a circular-economy⁶⁻⁹. Treatment methods for wastewaters depend on their source and
27 contaminants, such as the removal of oil from produced water¹⁰, the remediation of municipal waste with
28 microorganisms¹¹, or the treatment of textile effluents with macromolecular dyes¹². Of these, we are
29 interested in the removal of dyes from wastewaters generated in industries, such as textile, cosmetics,
30 pulp and paper, food and beverages, packaging, paints, and pharmaceuticals¹². Over 100,000
31 commercial dyes are known presently¹³, with an annual consumption of $> 7 \times 10^8$ kg/yr¹⁴. About 5-
32 10% of these dyes appear in the effluent streams of industrial wastewater and are discharged into
33 oceans, rivers, and soils^{12, 15}. Many of these dyes are potentially toxic and could pose a threat to the
34 environment^{12, 13}. In response, traditional methods to remove dyes from wastewater include
35 adsorption, ion-exchange, oxidation, and coagulation/flocculation¹⁶. Adsorption is the most
36 common strategy due to its low cost, efficiency, and ease of operation¹². Common “broad-spectrum”
37 adsorbents for dyes include activated carbon, silica gels, fly ash, bentonite, and perlite¹².
38 However, these adsorbents are not regenerated after usage and are subsequently disposed of as
39 waste¹³. The design of materials for adsorption has largely been empirical and without consideration
40 into intermolecular forces. Thus, there is a need for rationally designed reusable adsorbents for the
41 removal of macromolecular dyes from wastewaters.

42 The rational design of reusable adsorbent requires a quantitative understanding of the intermolecular
43 and surface forces between the target contaminants and the functional material used for removal of the
44 contaminants, such as ion- π interactions¹⁷, π - π stacking¹⁸, hydrogen bonding¹⁹, and van der Waals
45 interactions²⁰, etc.²¹ Reusable adsorbents should bind/physisorb to contaminants with energies in
46 the range of 5-10 $k_b T$ /mol (3-6 kcal-mol⁻¹), which is not only strong enough to bind but
47 also weak enough to facilitate regeneration²¹⁻²⁴. We chose methylene blue (MB) as a surrogate
48 dye in our model system because it is employed as a colorant in the paper and pulp industry²⁵ and
49 its low-cost and easy availability (Figure 1A). As an adsorbate, MB is quite “versatile”: it can form
50 hydrogen bonds (H-bond) with electronegative atoms such as O, N, and F, it can accept electrons in

51 π - π stacks, it can participate in cation- π interactions^{17, 26} due to its cationic nature (Figure 1B), and
52 it can also interact through van der Waals interactions²⁷. MB has been produced at mass-scale since
53 the late 19th century and it also serves a starting material for numerous azine dyes²⁵. Its molecular
54 versatility is further evidenced by its medical use to treat depression²⁸, breast cancer²⁹, malaria³⁰,
55 Alzheimer's³¹, and aging of the skin³². Yet, quantitative insights into the factors and mechanisms
56 governing the adsorption of MB even onto simple surfaces remain unclear. For example, it has been
57 suggested that dispersion interactions and hydrophobic interactions are important in the adsorption
58 of MB onto metals^{27, 33} and silver iodide (AgI) suspensions³³, respectively, but a direct comparison
59 of those interactions remains unavailable. Here, we take an alternative approach towards rational
60 materials design – we utilize quantum mechanical calculations to gain insights into the nature of
61 binding and binding energies of a hydrated methylene blue cation (MB⁺) with a broad range of
62 aliphatic, aromatic and perfluorinated aromatics as surrogates for adsorbents (Figure 2).
63 Subsequently, we test these predictions through laboratory experiments using silica microspheres
64 terminated with the same aliphatic, aromatic, and perfluorinated aromatic groups. If successful, this
65 approach can be applied in principle to other dyes – anionic, cationic, zwitterionic, etc.



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67 Figure 1: (A) A two-dimensional diagram of a methylene blue (MB) molecule. Color scheme:
68 Sulfur in yellow, nitrogen in dark blue, hydrogen in white, and carbon in grey. (B) The Lewis
69 structure of a methylene blue cation with the positive charge on a quaternary ammonium.

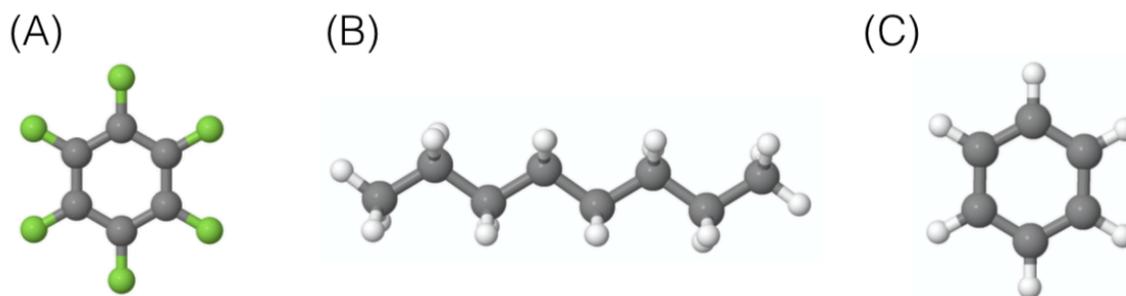
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71 MATERIALS AND METHODS

72 2.1. Quantum Mechanical Calculations

73 DFT is a first-principles approach for predicting the electron density of a molecular/ionic
74 system, which employs a self-consistent field approach (SCF) for solving the Schrödinger
75 equation^{34, 35}. It has been used extensively to perform electronic structure calculations in solid-state
76 physics and materials science^{24, 36-39}. The accuracy of DFT in studying the electronic and physical
77 properties of materials is largely dependent on the choice of the exchange-correlation function. For

78 example, the local density approximation (LDA) and the generalized gradient approximation (GGA)
79 exchange-correlation functionals overestimate the dissociation energies and the hydrogen bonds,
80 respectively³⁸, and they require a dispersion energy correction when modeling van der Waals
81 interactions or studying water clusters³⁹. Hybrid functionals such as B3LYP⁴⁰ provide a good
82 example of hydrogen bonding^{41, 42}, the structure of water clusters^{43, 44}, chemistries at the air-water
83 interface⁴⁵⁻⁴⁸, graphene-based systems⁴⁹, guest-host binding of p-xylylenediamine to CB7⁵⁰,
84 vibrational spectra of hexafluorobenzene⁵¹, and π - π interactions in dimers of benzene and
85 naphthalene¹⁸. Thus, we considered B3LYP-level DFT to be suitable to investigate the molecular
86 interactions of MB⁺ with hexafluorobenzene (C₆F₆), benzene (C₆H₆), and n-octane (C₈H₁₈) groups
87 (Figure 2). We account for the aqueous environment using the polarizable continuum model
88 (PCM)⁵². We chose these groups as surrogates for functional surfaces to gain insights into the vast
89 array of molecular interactions of MB⁺ in an aqueous environment. We optimized numerous dimer
90 conformations using DFT implemented in the Gaussian software⁵³ at the B3LYP/6-311+G* level⁴⁰.
91 For the most difficult convergence cases due to the encounter of a shallow minima around the
92 stationary point, we employed the option *MaxStep* = 1 that led to full convergence. We subsequently
93 confirmed the stability of the optimized structures through frequency calculations at each stationary
94 point.



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96 Figure 2: Ball and stick diagrams of (A) hexafluorobenzene (C₆F₆), (B) octane (C₈H₁₈), and (C)
97 benzene (C₆H₆). Color scheme: carbon atoms (grey), fluorine (green) and hydrogen (white).

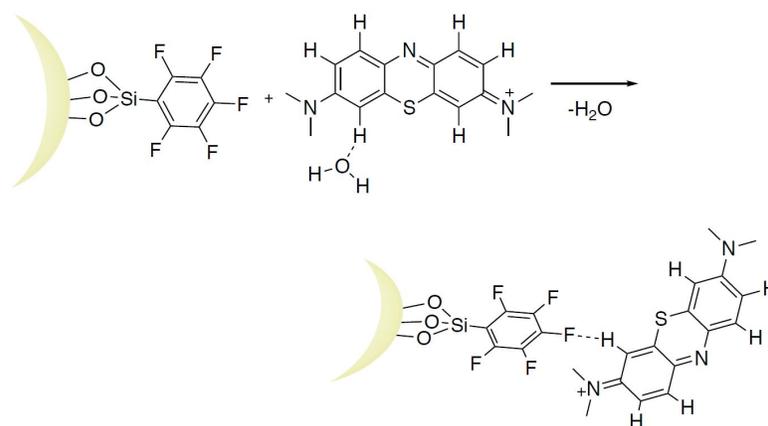
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99 2.2. Experimental: Synthesis of hollow silica microspheres.

100 To test our computational predictions in the laboratory, we chose commercial silica microspheres,
101 3MTM Glass Bubbles⁵⁴, composed of soda-lime borosilicate glass with an average diameter ranging
102 16-65 μ m (Figure S1A). We modified their surface chemistries through a two-step reaction of
103 hydroxylation, followed by silanation (Figure S1B).⁵⁵ To hydroxylate the silica surface, we

104 exposed the microspheres to an aqueous solution of hydrochloric acid (pH = 2) at 90 °C for one
105 hour (Section S1). Next, the surfaces were functionalized through silanation reactions with
106 triethoxy(octyl)silane, trimethoxyphenylsilane, and (pentafluorophenyl)triethoxysilane obtained
107 from Sigma-Aldrich (CAS: 2943-75-1, 2996-92-1, and 20083-34-5, respectively). Silanation
108 reactions were carried out in three batches, producing Si-C₈H₁₇, Si-C₆F₅, and Si-C₆H₅ (Section
109 S1)⁵⁶. Obviously, we chose those silanes in accordance with our DFT calculations. MB was
110 obtained from Sigma-Aldrich (CAS: 122965-43-9) in the quaternary ammonium salt form
111 (C₁₆H₁₈ClN₃S·xH₂O, molecular 319.85 g/mol (anhydrous basis)). We incubated different amounts
112 of functionalized SiO₂ microspheres (0-100 mg) in aqueous solutions containing 100 ppm MB⁺,
113 and repeated the experiment in quadruplicates (or higher). We mixed the solutions by gentle
114 tumbling for five minutes only, and a general scheme corresponding to the adsorption is
115 shown in Figure 3. Next, the SiO₂ microspheres floated up to the air-water interface due to their
116 lower density than water. We took aliquots of these solutions, diluted them with deionized
117 water, and characterized the concentrations of the remaining dye spectrophotometrically,
118 using its extinction coefficient at 663 nm (Section S2).

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121 Figure 3: A general scheme to show the adsorption of MB⁺ onto functionalized silica beads: The
122 functionalized silica bead interacts with methylene blue in solution with one coordination water
123 molecule. Upon adsorption, the coordination water is released into the bulk and methylene blue
124 molecule interacts with the adsorbent.

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129 3. Results and Discussion

130 3.1. Methylene blue in solution

131 Here we describe the state of the MB⁺ cation in water. To begin, we calculate the molecular
132 electrostatic potential (ESP) which is defined as the amount of work required to bring a positive unit
133 charge from infinity to a distance r from the molecule^{57, 58}. Thus, ESP comprises the contributions
134 of the nuclear and the electronic charges, the latter calculated by methods such as Mulliken
135 population analysis and Löwdin population analysis⁵⁹. We obtained the ESP of MB⁺ in water by
136 mapping the electron density (chosen with a value of $\rho = 0.02$) onto the electrostatic potential⁵⁹. The
137 electron density was obtained from a Mulliken population analysis⁵⁷ of the optimized DFT structure
138 of MB⁺ in an aqueous environment, using the GaussView software (v. 5.0)⁶⁰ (Figure 4A). We found
139 that hydrated MB⁺ has a positive ESP due to the overall electron charge deficiency of the ion, with
140 the hydrogen atoms being the most positive (blue color) due to their low electronegativity. Thus,
141 MB⁺ can potentially participate in hydrogen bonding through these H atoms by accepting electrons
142 in π - π stacking, such as from benzene. The N and S atoms in the central ring (yellow color) behave
143 neutrally towards electrophile/nucleophile molecules. The region between the C=C double bonds
144 and the two tertiary nitrogen atoms also shows low electron densities (light blue color), albeit more
145 than for the H atoms. We qualitatively infer from the ESP plot that MB⁺ potentially participates in
146 hydrogen bonding as well as π - π stacking and cation- π interactions.

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148 3.2. Prediction of adsorption of MB⁺

149 Here, we detail our semi-quantitative approach to predict the relative adsorption energies and rates
150 of adsorption between MB⁺ and our surrogate adsorbents. In order to make our model realistic, we
151 added a water molecule in the coordination shell of MB⁺ such that they had a binding energy of
152 $E_{\text{MB}^+\cdot\text{H}_2\text{O}}$. We chose that particular position of the water molecule, (Figure 3), because therein we
153 obtained the strongest binding energy between the functional groups and MB⁺. We assumed that
154 this hydrogen bonded water needs to be removed from the coordination shell of MB⁺, before it can
155 adsorb onto silica beads and be removed from water. Figure 3 depicts this scheme with silica beads
156 functionalized with C₆F₆. The released water molecule simply becomes a part of the bulk water,
157 releasing a fixed amount of energy, $E_{\text{H}_2\text{O}}$, which is the equivalent of half of a water dimer. Next, we
158 define the adsorption energy between MB⁺ and the adsorbent as,

$$159 E_b = E_{\text{dimer}} - (E_{\text{MB}^+} + E_{\text{adsb}}) \dots \dots \dots [1]$$

160 and

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$$E_{\text{ads}} = E_{\text{b}} + E_{\text{H}_2\text{O}} - E_{\text{MB}^+\cdot\text{H}_2\text{O}} \dots \dots \dots [2]$$

162 where E_{b} is the binding energy of MB^+ and the adsorbent (after removing the explicit water
163 molecule), E_{dimer} is the electronic energy of the molecular complex (MB^+ /adsorbent), E_{MB^+} is the
164 energy of a hydrated MB^+ cation, E_{adsb} is the energy of the adsorbent (one of the three stand-alone
165 surrogates), E_{ads} is the adsorption energy that we use to calculate binding constants, $E_{\text{MB}^+\cdot\text{H}_2\text{O}}$ is the
166 energy of an $\text{MB}^+\cdot\text{H}_2\text{O}$ dimer in water. It should be noted that E_{b} refers to the energy holding MB^+ -
167 adsorbent together whereas E_{ads} refers to the energy needed/released when displacing water from
168 the MB coordination shell to form the MB^+ -adsorbent complex. We obtained a DFT binding energy
169 for a water dimer using the PCM model at 0 K of $-5.4 \text{ kcal mol}^{-1}$. This is in good agreement with
170 the experimental value for the strength of the H-bond in a water dimer in a vacuum⁶¹ of -5.58
171 kcal mol^{-1} , and also with previous theoretical calculations with the PCM model on the electron
172 energy of the water dimer⁶² of $-5.0 \text{ kcal mol}^{-1}$. Therefore, from our DFT-PCM calculations a
173 good estimate for $E_{\text{H}_2\text{O}}$ is $-2.7 \text{ kcal mol}^{-1}$,⁶² and with the same method we obtained a binding
174 energy for $E_{\text{MB}^+\cdot\text{H}_2\text{O}} = -1.4 \text{ kcal mol}^{-1}$ (Figure S4, Section S3). With these predicted adsorption
175 energies and assuming that in our dilute solutions only a single layer of MB^+ adsorbs onto the
176 functionalized surface, we used the Arrhenius equation to calculate the relative reaction rate
177 constants (k) by taking as a reference the reaction rate constant for the C_8 aliphatic, k_{ref} . We
178 assume that the pre-exponential factor, A , in the Arrhenius equation is the same in all three cases
179 and that the transition state barrier(s) that MB^+ has to overcome to bind to the surface are similar
180 in magnitude in all the cases. This assumption is reasonable because the molecular interactions
181 during the physisorption processes do not involve proton or electron transfers that would require
182 covalent bond breaking/forming and significant electrostatic preorganization.⁶³ Further, we
183 assume that thermal fluctuations ($0.6 \text{ kcal mol}^{-1}$) facilitate MB^+ , the solvent, and the surface to
184 sample through the configurational space to find the global minima. Thus, we can estimate the
185 relative binding rates as follows,

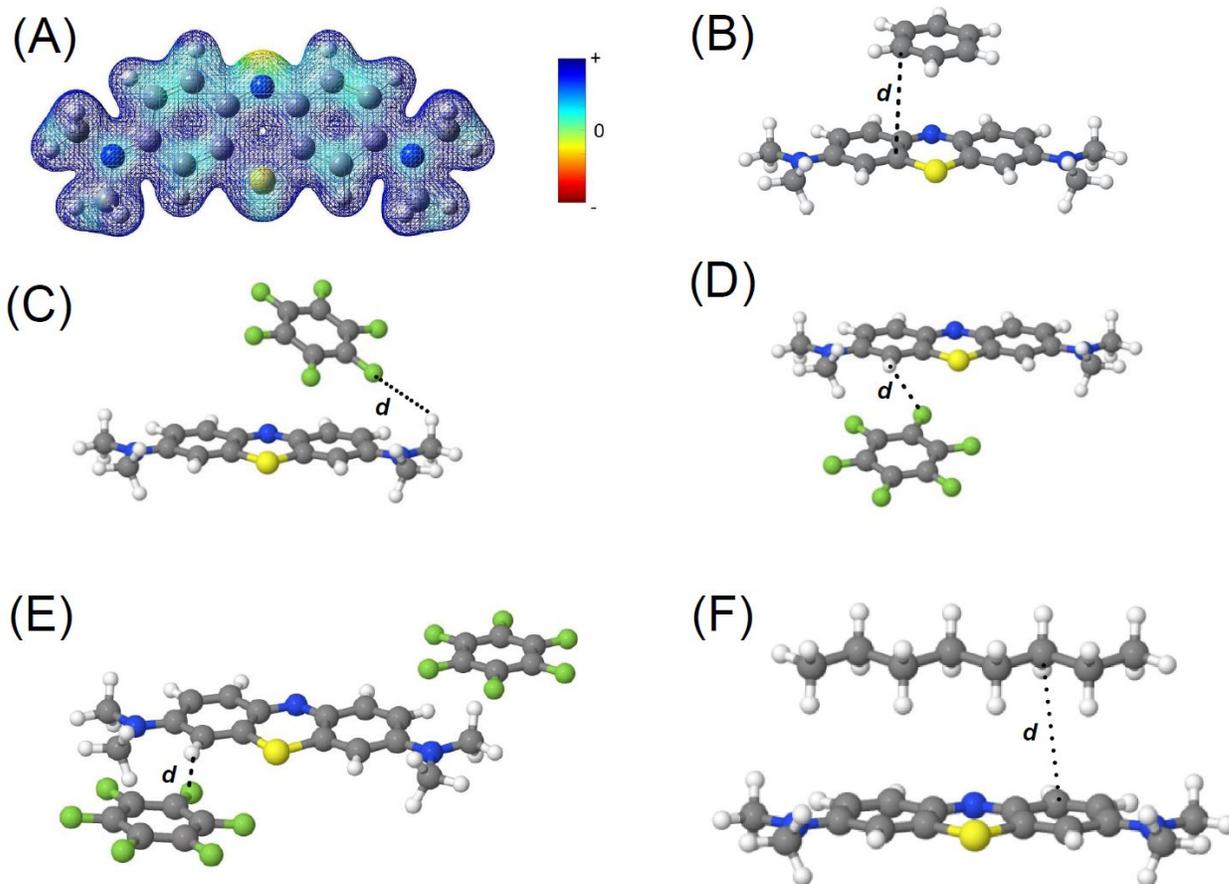
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$$\frac{k}{k_{\text{ref}}} = e^{-\frac{(\Delta E_{\text{ads}})}{k_{\text{b}}T}} \dots \dots \dots [3]$$

187 where ΔE_{ads} is the adsorption energy as defined in equation 1 and relative to the adsorption energy
188 of the C_8 aliphatic. A simple rearrangement of equation 3 gives us the percentages of the relative
189 rates of adsorption as,

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$$\frac{k-k_{\text{ref}}}{k_{\text{ref}}} \times 100 = (e^{-\frac{(\Delta E_{\text{ads}})}{k_{\text{b}}T}} - 1) \times 100 \dots \dots \dots [4].$$

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Next, we present the results of our DFT predictions for a variety of geometric confirmations between MB⁺ and C₆F₆, C₆H₆, and C₈H₁₈ groups, with the aim of identifying the relative contributions of π - π stacking, hydrogen bonding (H-bonding), cation- π interactions, and van der Waals forces to the adsorption process (Table 1).



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198 Figure 4: (A) The electron density mapped with the electrostatic potential for a hydrated MB⁺ cation.
199 For the plotted density, $\rho = 0.02$, the units range from (-0.27, 0.27) atomic units (a.u.). Regions with
200 positive ESP (blue) have lower electron density than the regions with negative ESP (red). The most
201 positive value in the ESP corresponds to the two hydrogen atoms next to the sulfur atom (yellow
202 color). The hydrated MB⁺ cation is electron deficient, with the hydrogen atoms and the aromatic
203 rings having the lowest electron density. Snapshots from DFT calculations of (B) a MB⁺-benzene
204 dimer in π - π stacking; (C), (D),(E) dimers between MB⁺ and C₆F₆ featuring H-bonds; (F) MB⁺-
205 C₈H₁₈ dimer held by van der Waals interactions. Color scheme: fluorine green, hydrogen white,
206 carbon dark grey, sulfur yellow, and nitrogen dark blue.

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3.3. π - π stacking between MB^+ and C_6H_6 and C_6F_6 groups

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Benzene can donate electrons through its p_z orbital to MB^+ in water. In fact, we found that the dimer $\text{MB}^+\text{-C}_6\text{H}_6$ has a stable configuration in the π - π stacking conformation (Figure 4B). The optimized structure has an average intermolecular distance, $d = 4.8 \text{ \AA}$, between (C--C) indicating a weakly bound dimer. This result is in overall agreement with higher-level electronic structure methods such as MP2 and CCSD(T) for π - π sandwich benzene dimer which show an average intermolecular distance, $d=3.8\text{-}4.1 \text{ \AA}$ ⁶⁴. We found that the adsorption energy was $E_{\text{ads}} = -2.9 \text{ kcal mol}^{-1}$ (Table 1). Next, we substituted hydrogen atoms of benzene with fluorine atoms to simulate interactions of MB^+ with C_6F_6 . Fluorine has a deactivating effect on cation- π interactions^{17, 65} because electrons in C-F bonds are polarized towards fluorine atoms due to the latter's higher electronegativity⁶⁶. Thus, C_6F_6 is unlikely to interact with MB^+ through its π orbitals²⁶. Thus, we expected π - π stacking for the $\text{MB}^+\text{-C}_6\text{F}_6$ complex to be weaker than for the $\text{MB}^+\text{-C}_6\text{H}_6$ complex. Indeed, we verified this to be true – while we arranged C_6F_6 to interact with MB^+ through π - π stacking, (Figure 4B) the C_6F_6 molecule tilted over the MB^+ during geometry optimization and underwent a significant displacement. The final structure comprised an $\text{MB}^+\text{-C}_6\text{F}_6$ complex with hydrogen bonding between a fluorine atom and a hydrogen atom of MB^+ (Figure 4C). The shortest distance between those atoms was, $d = 3.1 \text{ \AA}$ and the adsorption energy was $E_{\text{ads}} = -2.9 \text{ kcal mol}^{-1}$.

226 Table 1: Predictions of adsorption energies, E_{ads} , for π - π stacking, H-bonding, and van der Waals
 227 interactions between MB^+ and C_6F_6 , C_6H_6 , and C_8H_{18} groups and the relative uptakes of MB^+ with
 228 the performance of n-octane taken as the reference.

(Figure) Dimer	Key molecular interactions	Adsorption energy, E_{ads} (kcal-mol ⁻¹)	Predicted, relative uptake of MB^+ (%) using equation [4]
(Fig. 4B) MB^+ - C_6H_6	π - π stacking	-2.9	39%
(Fig. 4C) MB^+ - C_6F_6	H-bond: F-H(methyl), sided	-2.9	39%
(Fig. 4D) MB^+ - C_6F_6	H-bond: F-H(methyl)	-3.0	95%
(Fig. 4E) C_6F_6 - MB^+ - C_6F_6	H-bond: F-H(methyl)	-3.1	95%
(Fig. 4F) MB^+ - C_8H_{18}	van der Waals	-2.7	0 (reference)

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3.4. Hydrogen bonding

231 Since MB^+ and C_6F_6 interacted through H-bonding instead of π - π stacking, we investigated another
 232 configuration whereby MB^+ and C_6F_6 were orientated facing each other. The final optimized
 233 structure had two H-bonds – one between a fluorine atom and a hydrogen atom of a methyl group
 234 of MB^+ and another between a fluorine atom and a hydrogen atom bound to an sp^2 carbon (Figure
 235 4D). The shortest F-H distance was $d = 3.1 \text{ \AA}$ with the dimer adsorption energy, $E_{ads} = -3.0 \text{ kcal}$
 236 mol^{-1} . Surprisingly, although C_6F_6 can interact with MB^+ through π - π stacking, the overall low
 237 electron density of MB^+ and the presence of fluorine favored the formation of H-bonds. It is
 238 noteworthy that the adsorption energy also varied depending on the hybridization of the carbon
 239 atom; $C(sp^3)$ -F yielded a stronger hydrogen bond than $C(sp^2)$ -F⁶⁷. Interestingly, even a π -electron
 240 donor like benzene yielded a lower $E_{ads} = -2.9 \text{ kcal-mol}^{-1}$ in comparison to H-bonded C_6H_6 - MB^+
 241 dimer with $E_{ads} = -3.0 \text{ kcal mol}^{-1}$. To further confirm the importance of the H-bonding, we optimized
 242 two C_6F_6 molecules with an MB^+ monomer. We found that, similar to the previous case, C_6F_6 made
 243 H-bonds with MB^+ (Figure 4E). Fluorine atoms in C_6F_6 groups formed H-bonds with the methyl
 244 groups in MB^+ but the shortest H-bond distance was to the hydrogen next to the sulfur atom, $d = 2.8$
 245 \AA and $E_{ads} = -3.1 \text{ kcal mol}^{-1}$ (Figure 4E). The adsorption energy was slightly more than that of
 246 MB^+ - C_6F_6 , (Figure 4D), indicating that increasing the number of C_6F_6 species near MB^+ enhances
 247 stabilization. However, when we studied the E_{ads} of $MB^+.2(C_6H_6)$ in π - π stacking conformation

248 we did not find any increment in the adsorption energy. (Figure S5, Section S3). Thus, only in the
249 fluorinated case we found that the most stable configuration was that with ratio 2:1. The study of
250 3:1 or higher configurations were computationally unfeasible or unable to converge.

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252 **3.5. Cation- π interactions**

253 MB^+ is a large cation that could potentially interact with a π -system. In the gas-phase, fluoro-
254 aromatic compounds are known to exhibit high binding energy with cations, e.g., the ab-initio
255 binding energy fluorobenzene with a lithium ion is, $E_b = -31 \text{ kcal.mol}^{-1}$.⁶⁸ However, for MB^+
256 interacting with C_6F_6 in an aqueous environment, we did not find dimer configurations stabilized by
257 cation- π interactions (Figure S6, Section S3). The final optimized structures between MB^+ and C_6F_6
258 comprised H-bonds between F and H atoms similar to (Figure 4B), with similar binding energy and
259 H-bond distances. Thus, $\text{C}_6\text{F}_6\text{-MB}^+$ dimers optimized from the initial configurations of π - π stacking
260 or cation- π stacking were not stable, and the optimized structures always led to dimers interacting
261 by H-bonding. Furthermore, $\text{C}_6\text{H}_6\text{-MB}^+$ did not demonstrate configurations stabilized by cation- π
262 interactions or hydrogen bonding (only π - π stacking).

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264 **3.6. Van der Waals interactions**

265 Finally, we investigated the interactions between the aliphatic chain C_8H_{18} and MB^+ in an aqueous
266 solution. We found that $E_{ads} = -2.7 \text{ kcal mol}^{-1}$, and the interaction was driven by van der Waals
267 dispersion forces²⁷. The average intermolecular distance, $d = 3.2 \text{ \AA}$ (Figure 4F).

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269 **3.7. A comparison of various intermolecular forces**

270 Based on the predictions from QM, we listed the E_{ads} values due to different molecular
271 interactions in Table 1. We used equation [4] to predict the trend in the binding constants of the
272 three functional groups, C_6F_6 (H-bonding) > C_6H_6 (π - π stacking and H-bonding) > C_8H_{18} (vdW
273 dispersion). To gain quantitative insights, we benchmarked the binding constants against the
274 aliphatic group (C_8H_{18}) and found the relative adsorption to vary such that C_6F_6 (95%) > C_6H_6
275 (39%) > C_8H_{18} (0), which was an unexpected result. Next, we tested our predictions through
276 laboratory experiments.

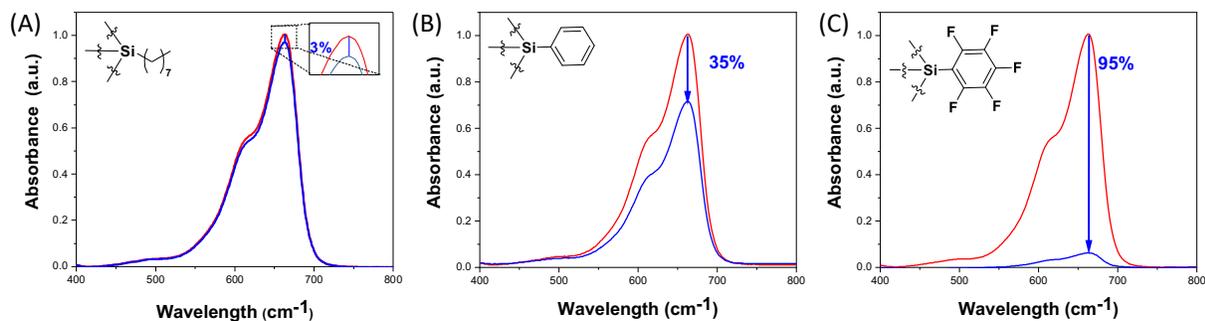
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3.8. Experimental adsorption of MB⁺ on an organic substrate

We tested our theoretical prediction that H-bonding between MB⁺ and C₆F₆ leads to a dramatically higher adsorption than MB⁺ and C₆H₆ due to π - π stacking or MB⁺ and C₈F₁₈ due to van der Waals dispersion. To this end, we measured the adsorption of MB⁺ onto hollow silica microspheres functionalized with -C₈H₁₇, -C₆H₅ and -C₆F₅ moieties (Methods Section 2.2). We employed Attenuated total reflectance-Fourier transform infrared (ATR-FTIR) spectroscopy to characterize the silica before and after functionalization (Figure S2). We found functional groups Si-C₈H₁₇: asymmetric and symmetric CH₂ vibrations around 2922 cm⁻¹ and 2852 cm⁻¹ respectively; Si-C₆F₅: C=C and C-F aromatic stretching bands at 1424 cm⁻¹; Si-C₆H₅: C-H stretch bands at 3074 cm⁻¹ and 3052 cm⁻¹ and C-C stretch (in-ring) at 1624 cm⁻¹ and 1434 cm⁻¹ (Section S1.2). We note that the contact angles of water drops on glass slides functionalized with -C₆F₅, -C₆H₅, and -C₈H₁₇ groups were similar after silanation, which led us to expect that their uptake of MB⁺ might be similar in magnitude (Section S1.3, Figure S3, and Table S1). This expectation was based on the extant literature on the adsorption of simple and complex organics onto hydrophobic surfaces in water - organic fouling - a leading cause for the failure of membrane-based separation technologies^{55, 69-72}. We also note that ξ -potentials of hydrocarbon and perfluorocarbon surfaces, which have been investigated extensively in the past and intensely debated on regarding their correlation with interfacial charges, could have a bearing on physisorption.^{44, 73-75} However, due to the hollowness of the beads, it was not possible to measure ξ -potentials of our specific samples because they would not stay inside a water-filled cuvette. To measure the uptakes of MB⁺ by silica beads with different surface functionalization, the UV-VIS absorbance spectra of 100 ppm aqueous solutions of MB⁺, which follows the Lambert-Beer law, was measured. We found that the uptake of MB⁺ by our functionalized silica microspheres varied as: Si-C₆F₅ (95% \pm 1.8%) > Si-C₆H₅ (35% \pm 1.9%) > Si-C₈H₁₇ (3% \pm 2.5%) (Figure 5). Thus, the alkyl derivative Si-C₈H₁₇ barely adsorbed any MB⁺, the perfluorinated benzene performed the best, and the benzene-terminated microspheres performed intermediately, according to the predictions.



307

308 Figure 5: Absorbance spectra obtained after treating 20 mL MB^+ solutions (initial concentration: 100
 309 ppm) with 100 mg of **A)** $\text{Si-C}_8\text{H}_{17}$, **B)** $\text{Si-C}_6\text{H}_5$, and **C)** $\text{Si-C}_6\text{F}_5$ adsorbent materials. MB^+ absorbance
 310 in the solution after mixing with functionalized silica beads decreased in the order $\text{Si-C}_6\text{H}_5$ ($95\% \pm 1.8\%$)
 311 $\pm 1.8\%$) > $\text{Si-C}_6\text{H}_5$ ($35\% \pm 1.9\%$) > $\text{Si-C}_8\text{H}_{17}$ ($3\% \pm 2.5\%$). In all three cases the operational pH
 312 was 6.8.

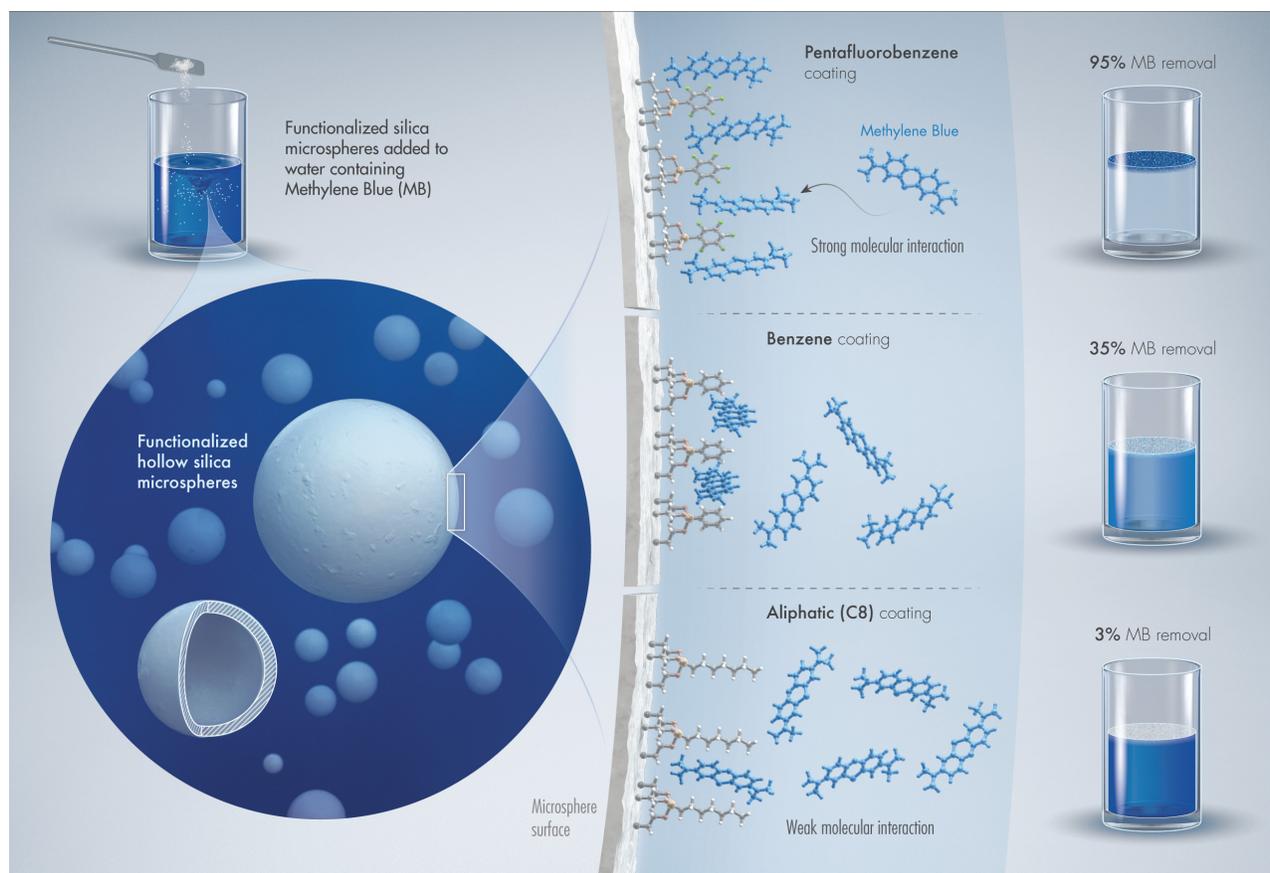
313

314 We also performed the elemental analysis of the relative carbon contents of the functionalized silica
 315 beads, from the functional groups on the surfaces, and found no correlation between the amount of
 316 carbon and the extent of adsorption (see Section S1.4, Table S2). Thus, the dramatically different
 317 adsorption levels of MB^+ onto the functional groups were due to different intermolecular forces at
 318 play. After these experiments, the beads could be easily removed from the air-water interface as
 319 they floated up. We are currently developing greener methodologies for regenerating them that
 320 will be reported soon. Figure 6 summarizes this work.

321

322 The advantage of this approach relies on the calculation of relative electronic energies to
 323 study adsorption at solid-liquid interfaces. We have simplified the complex molecular
 324 representation of the functionalized (solid) surfaces by individual (functional) molecules. Of
 325 course, this approach has limitations, for instance, the use of free energies (thermal correction)
 326 instead of electronic energies at 0 K might be more accurate. However, since the adsorption
 327 energy is relatively proportional to the total electronic energy, the addition of the free energy
 328 contribution should not alter the predicted trends. Furthermore, the incorporation of vibrational
 329 frequencies into our energy calculations would be misleading because the individual (functional)
 330 molecules would behave more like a liquid, which in comparison to the solid phase, possesses
 331 extra rotational degrees of freedom. Despite these limitations, the model predictions are in

332 excellent agreement with experimental observations and should be extensible towards the
333 development of rational treatment protocols for other wastewaters.
334



335
336 Figure 6: Schematics for our experimental work: (Left panel) hollow silica microspheres
337 functionalized with $-C_6F_5$, $-C_6H_5$, $-C_8H_{17}$ were added to water with 100 ppm MB^+ . (Middle panel)
338 Intermolecular interactions between the silanized silica surfaces and MB^+ ions in water. (Right panel)
339 The final outcome of our simulated water treatment experiments: pentafluorobenzene performed the
340 best, followed by benzene, and the aliphatic group as, C_6F_5 ($95\% \pm 1.8\%$) $>$ $Si-C_6H_5$ ($35\% \pm 1.9\%$)
341 $>$ $Si-C_8H_{17}$.

342

343 4. Conclusion

344 Towards rationally designing reusable adsorbents for chemically “versatile” dyes in
345 wastewater streams from textile, cosmetics, pulp and paper, food and beverages, packaging, paints,
346 and pharmaceutical industries, we investigated molecular interactions of MB^+ , as a surrogate
347 contaminant, with C_6F_6 , C_6H_6 , and C_8H_{18} groups as representative of functional surfaces. DFT was
348 employed with an implicit water model (PCM) to accurately determine the contributions of the

349 solvent's electrostatics in the adsorption process. Model calculations predicted that the primary
350 intermolecular interactions of MB⁺ with these functional groups are: hydrogen bonding between
351 MB⁺ and C₆F₆; π - π stacking between C₆H₆ and MB⁺ and van der Waals dispersion interactions
352 between C₈H₁₈-MB⁺, such that the relative magnitudes of the binding constants varied as: C₆F₆
353 (95%) > C₆H₆ (39%) > C₈H₁₈ (0). Thus, the model predicted that fluorinated aromatics are more
354 suitable for removing MB⁺ from water than ordinary aromatics and hydrocarbons. Gaining these
355 molecular insights from an exclusively experimental approach would be very difficult. For instance,
356 one cannot predict the observed behaviors based on water contact angles, which are often used to
357 assess surfaces' ability to aggregate organics in water by hydrophobic interactions⁷⁶. Thus, this report
358 illustrates that specific understanding of intermolecular forces is crucial in the case of complex dyes,
359 such as MB⁺. Our laboratory experiments attest to the predicted trends for the relative uptakes of
360 MB⁺ as: Si-C₆F₅ (95% \pm 1.8%) > Si-C₆H₅ (35% \pm 1.9%) > Si-C₈H₁₇ (3% \pm 2.5%). Here, we also
361 point out that the scope of this work is limited to presenting a first-principles computational approach
362 to the rational development of reusable adsorbents for treating dye wastewater. We chose methylene
363 blue – a cationic dye – simply to demonstrate the power of our quantum mechanical approach.
364 Obviously, the same approach can be extended to anionic, zwitterionic, or uncharged dyes to extend
365 the work to a broader and industrially relevant context, and also for finding greener and fouling-
366 resistant materials/approaches.^{72, 77-80} We are currently investigating the specificity during the
367 adsorption process in the presence of multiple contaminants, and scenarios where the contaminants
368 in wastewater streams are concentrated, leading to the adsorption of multilayers. Taken together,
369 our findings suggest that this first-principles approach, supported by laboratory experiments, for the
370 rational design of functional materials in the treatment of wastewater can contribute to the sustainable
371 use of water.

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563

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