

Supporting Information for

Recent Developments in First-principles Force Fields for Molecules in Nanoporous Materials

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Table S1: A summary of first-principles derived force fields for molecules in porous materials

Guest molecule	Porous material	Adsorbent model	QM method	configuration	FF potential form	FF validation		Ref.
						theory	experiment	
H ₂	pure, Li-doped IRMOF-1	benzene, metal-based clusters, Li-C ₃₂ cluster	RI-MP2/TZVPP; X3LYP/6-31G(d,p)	along certain orientations	Morse	compare with MP2 PES for H ₂ with benzene, and MP2 interaction energies at different binding sites	compare with isotherms in undoped IRMOF-1 (Zn, C ₆)	1, 2
H ₂	pure, Li-doped IRMOF-2	benzene, metal-based clusters, Li-C ₃₂ cluster	RI-MP2/TZVPP; X3LYP/6-31G(d,p)	along certain orientations	Morse	compare with MP2 PES for H ₂ with benzene, and MP2 interaction energies at different binding sites	compare with isotherms in undoped IRMOF-2 (Zn, C ₂₄)	3
H ₂	IRMOFs	Zn-based clusters, BDC-Li ₂	RI-MP2/TZVPP	along certain orientations	LJ + Coulomb	compare with MP2 interaction energies at different binding sites	compare with isotherms and Q _s in IRMOF-1	4
H ₂	MOF UCMC-1	benzene, Zn-based cluster	MP2/cc-PVTZ	along certain orientations	Morse	compare with MP2 PES for H ₂ with benzene	compare with isotherms in UMCM-1	5
H ₂	metal alkoxide functionalized MOFs _s	metal alkoxide benzene	MP2/6-311+G(d,p); M06/6-311++G(d,p)	along certain orientations	modified-Morse/LJ + Coulomb	compare with MP2 PES and interaction energies for H ₂ with metal alkoxide benzene	compare with isotherms in DO-MOF	6
H ₂	CuBTC, other Cu-based MOFs	Cu ₂ (bmc) ₄ cluster	PBE/DNP	along certain orientations	Morse	compare with PBE PES for H ₂ with the Cu ₂ (bmc) ₄ cluster	compare with isotherms in CuBTC, CuBTT, PCN-12	7
H ₂	COFs _S	B ₃ O ₃ H ₃ , SiH ₄	RI-MP2/QZVPP	along certain orientations	Morse	compare with MP2 PES for H ₂ with boroxine and silane	compare with isotherms in COF-5	8
H ₂ , Ar	pure, Li-doped COFs _S	benzene, H ₃ B ₃ O ₃ , C(CH ₃) ₄ , Si(CH ₃) ₄ , Li-HHTP cluster	MP2/cc-PVTZ; PW91/6-311g(d,p)	along certain orientations	Morse	compare with MP2 PES for H ₂ and Ar with benzene and H ₃ B ₃ O ₃ , and MP2 binding energies with clusters	compare with isotherms of Ar in COF-102,103	9
H ₂	ZIFs	C ₃ N ₃ H ₃ , C ₃ N ₃ Cl ₃ , C ₃ N ₃ (NO ₂) ₃ , ZnN ₄ H ₈	RI-MP2/aug-cc-pVQZ, QZVPP	along certain orientations	Morse	compare with MP2 PES for H ₂ with clusters	compare with isotherms in ZIF-8	10
H ₂	PAFs	benzene, C ₅ H ₁₂	MP2/cc-PVTZ	along certain orientations	Morse	compare with MP2 PES for H ₂ with benzene	compare with isotherms in PAF-302	11
H ₂	Silicon nanotube (SiNT)	(5,5)SiNT, (7,7)SiNT, (9,9)SiNT, (14,14)SiNT	PW91/6-311++G(d,p)	along certain orientations	Morse	not presented	not presented	12
H ₂	Li-conjugated microporous polymers	Li-C ₆ H ₃ (C ₂ H ₅) ₃ cluster	UM06-L/6-311G(d,p)	along certain orientations	Morse	compare with UM06-L PES for H ₂ with Li-C ₆ H ₃ (C ₂ H ₅) ₃ pure and Li-doped CMP	13	

Table S1 (contd.)

Guest molecule	Porous material	Adsorbent model	QM method	configuration	FF potential form		Ref.
						theory	
H ₂	Li pillared graphene sheet, Li-doped pillared carbon nanotubes	C ₂ molecule; Li-C ₃₂ cluster	CCSD(T)/aug-cc-pVQZ; MP4/aug-cc-pVTZ; X3LYP/6-311G(d,p)	along certain orientations	Morse	not presented	compare with H ₂ storage capacity in SWNT and Li-P-SWNT 14
CO ₂	NaX and NaY	Na-zeolite cluster	B3LYP/TZVP	along certain orientations	Buckingham + Coulomb	not presented	compare with isotherms and Q _{st} in NaX and NaY 15
CO ₂	LiY	Li-zeolite cluster	B3LYP/TZVP	along certain orientations	Buckingham + Coulomb	not presented	compare with isotherms in LiY 16
CO ₂	siliceous zeolites	primitive unit cell of Si-CHA	periodic PBE-D2	randomly sampled	LJ + Coulomb	compare with PBE-D2 interaction energies for CO ₂ with Si-CHA, K _{hs} , and Q _{st} in Si-CHA, Si-MFI and Si-DDR 17	
CO ₂	Na-exchanged zeolites	primitive unit cell of LTA-4A	periodic DFT/CC	randomly sampled and from GCMC	LJ + Coulomb	compare with DFT/CC interaction energies for CO ₂ with LTA-4A and Q _{st} in LTA-4A, NaX, and NaY 18	
CO ₂	pure and Li-doped COFs	benzene, H ₃ B ₁₀ O ₃ , C ₆ H ₃ (SiH ₃) ₃ , C ₆ H ₃ (CH ₃) ₃ , Li-based cluster	MP2/cc-pVTZ	along certain orientations	LJ + Coulomb	compare with MP2 PES for CO ₂ with the Li-cluster in COF-102	compare with isotherms in COF-102 19
CO ₂	functionalized MOFs	C ₈ H ₆ O ₄ , C ₆ H ₃ (CH ₃) ₃ , C ₆ H ₃ (NH ₂) ₃ , C ₆ H ₃ (NO ₂) ₃ , C ₆ H ₃ Cl ₃	RI-MP2/cc-pVQZ	along certain orientations	Morse + Coulomb	compare with MP2 PES for CO ₂ with these clusters in MOF-5 and MOF-177	compare with isotherms in MOF-5 and MOF-177 20
CO ₂	Mg-MOF-74, Zn-MOF-74, MOF-5	metal-based clusters	RI-MP2, NEMO method for energy decomposition	along certain orientations	Buckingham + 5,6-power term + Coulomb	compare with MP2 energy components for CO ₂ with clusters in MOF-74, and isotherms in MOF-5 21	
CO ₂	ZIF-8, ZIF-71	methyl-Li ₂ -imidazolate, dichloro-Li ₂ -imidazolate, imidazolate	DFT-SAPT, energy decomposition	from NVT MD at 3000 K	Buckingham + damped 6-power term + damped Coulomb	compare with SAPT energy components for CO ₂ with Li-fragments in ZIF-8 and ZIF-71 22	
CO ₂ , N ₂	functionalized ZIFs	Li ₂ -imidazolate, methyl-Li ₂ -imidazolate, dichloro-Li ₂ -imidazolate, benzene, nitromethane, methyl bromide	DFT-SAPT, energy decomposition	from NVT MD at 3000 K	Buckingham + damped 6,8,10-power term + damped Coulomb	compare with SAPT energy components for CO ₂ and N ₂ with Li-imidazolate rings, and configurations from GCMC in the ZIFs 23	

Table S1 (contd.)

Guest molecule	Porous material	Adsorbent model	QM method	configuration	FF potential form	theory	FF validation	Ref.
CO ₂ , CH ₄	Mg-MOF-74, CuBTC, PCN-14	CO ₂ : a Mg-based MOF cluster; CH ₄ : a unit cell of CuBTC	CO ₂ : B2PLYP- D2/Det2-TZVPP; CH ₄ : periodic DFT/CC	CO ₂ : along certain orientations; CH ₄ : 2000 grid points within the unit cell	MMSV + Buck-CK	compare with B2PLYP interaction energies in the training set and from NVT MD, and periodic PBE- D2 interaction energies	compare with CO ₂ in Mg-MOF-74, and CH ₄ in CuBTC and PCN-14	24
CO ₂ , CH ₄ , N ₂ , Xe	MOMC	TPP cluster	B2PLYP-D3/det2- TZVPP	along certain orientations	vW3	compare with B2PLYP PES for gas-TPP	compare with isotherms and Q _a in the MOMIC	25
CO ₂ , C ₂ H ₂	CuBTC	Cu ₂ (formate) ₄	PBE/DNP	along certain orientations	LJ + Coul	compare with PBE PES for CO ₂ , and C ₂ H ₂ with the Cl ₂ (formate) ₄ cluster	compare with isotherms and Q _a in CuBTC	26
CH ₄	COFs	benzene, B ₃ O ₃ H ₃ , Si(CH ₃) ₄	RI-MP2/QZVPP	along certain orientations	Morse	compare with MP2 PES for CH ₄ with clusters	compare with isotherms in COF-5 and COF-8	27
CH ₄	Pure, Li-doped COFs	benzene, B ₃ O ₃ H ₃ , C ₆ H ₃ (CH ₃) ₃ , C ₆ H ₃ (SiH ₃) ₃ , Li-HHTP	RI-MP2/cc-PVTZ, PW91/6-311g(d,p)	along certain orientations	Morse	compare with MP2 and PW91PES for CH ₄ with clusters	compare with isotherms and Q _a in COF-102	28
CH ₄	PAFs	benzene, toluene	MP2/6- 311+G(d,p)	along certain orientations	LJ	compare with MP2 PES for CH ₄ with benzene and toluene	not presented	29
N ₂	PAFs	benzene, C ₃ H ₁₂	MP2/cc-PVTZ	along certain orientations	Morse	compare with MP2 PES for CH ₄ with benzene	compare with isotherms in PAF-1	30
NH ₃	MIL-47, IRMOFs	C ₁₀ H ₇ COOH, C ₁₀ H ₇ Cl, C ₁₀ H ₇ -C=O	MP2/6-31+G(d,p)	along certain orientations	Morse/LJ + Coul	compare with MP2 EPS for NH ₃ with functional groups	not presented	31
NH ₃	H-ZSM5,	5T cluster based	RI-MP2/TZVPP	randomly sampled	LJ + Coulomb	compare with PBE-D2 interaction	compare with adsorption	32
H ₂ O	CuBTC, other Cu-based MOFs	CuBTC unit cell	periodic PBE-D2	randomly sampled	LJ + Coulomb + energy correction	compare with PBE-D2 interaction energies for H ₂ O with CuBTC and CuEBTC	compare with isotherms in CuBTC, CuMBTC, and CuEBTC	33
propene	CuBTC	Cu ₂ (btc) ₄ cluster	PBE/DNP	along certain orientations	Morse + power term	compare with PBE PES for C ₂ H ₄ with the Cu ₂ (btc) ₄ cluster	compare with isotherms in CuBTC	34

Force field potential function forms:

The MMSV stands for a piecewise combination of Morse-Morse-spline-van der Waals,³⁵

$$E(r_{ij}) = \begin{cases} D \left\{ \exp \left[\alpha_1 \left(1 - \frac{r_{ij}}{r_0} \right) \right] - 2 \exp \left[\frac{\alpha_1}{2} \left(1 - \frac{r_{ij}}{r_0} \right) \right] \right\} & \text{for } 0 \leq r_{ij} \leq r_0 \\ D \left\{ \exp \left[\alpha_2 \left(1 - \frac{r_{ij}}{r_0} \right) \right] - 2 \exp \left[\frac{\alpha_2}{2} \left(1 - \frac{r_{ij}}{r_0} \right) \right] \right\} & \text{for } r_0 \leq r_{ij} \leq r_1 \\ b_1 + (r_{ij} - r_1) \{ b_2 + (r_{ij} - r_2) [b_3 + (r_{ij} - r_1) b_4] \} & \text{for } r_1 \leq r_{ij} \leq r_2 \\ -C r_{ij}^{-6} & \text{for } r_2 \leq r_{ij} < \infty \end{cases} \quad (\text{S1})$$

where D is the well depth parameter, r_0 is the equilibrium energy distance, while α_1 and α_2 determines the shape of the potential; the joining points r_1 and r_2 , and the spline-function parameters b_1-b_4 are obtained algebraically by the continuity requirements; C is the dispersion coefficient.

Each term in the DFT-SAPT energy decomposition is described by a corresponding force field potential function,^{22,23}

$$\begin{cases} E_{exch}^{(1)}(r_{ij}) = \sum_{ij} A_{ij}^{exch} \exp(-B_{ij} r_{ij}) \\ E_{pol}^{(1)}(r_{ij}) \equiv \sum_{ij} f_1(B_{ij}, r_{ij}) \frac{q_i q_j}{r_{ij}} + \sum_{ij} A_{ij}^{elec} \exp(-B_{ij} r_{ij}) \\ E_{ind}^{(2)} + E_{ind-exch}^{(2)} \equiv U_{shell} + \sum_{ij} A_{ij}^{ind} \exp(-B_{ij} r_{ij}) \\ E_{disp}^{(2)} + E_{disp-exch}^{(2)} \equiv \sum_{i,j} A_{ij}^{disp} \exp(-B_{ij} r_{ij}) - \sum_{n=6,8,10} \sum_{i,j} f_n(\beta_{ij}, r_{ij}) \frac{C_n^{ij}}{r_{ij}^n} \\ E_{\delta hf}(r_{ij}) = \sum_{ij} A_{ij}^{\delta hf} \exp(-B_{ij} r_{ij}) \end{cases} \quad (\text{S2})$$

where A_{ij}^{exch} , A_{ij}^{elec} , A_{ij}^{ind} , A_{ij}^{disp} , and $A_{ij}^{\delta hf}$ are the prefactors for each term, and B_{ij} are the exponents and utilized in all the Buckingham-type terms. These Buckingham-type terms were used to account for short-range charge penetration effect, which is proportional to the overlap of electron densities. $f_n(\beta_{ij}, r_{ij})$ is the Tang-Toennies damping function and used to damp both Coulomb and dispersion interactions; U_{shell} is the total Drude oscillator polarization energy and considered only for adsorbate-adsorbate interactions; C_6^{ij} , C_8^{ij} , C_{10}^{ij} are dispersion coefficients.

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