

# Is Porosity at the MOF/Polymer Interface Necessarily an Obstacle to Optimal Gas-Separation Performances in Mixed Matrix Membranes?

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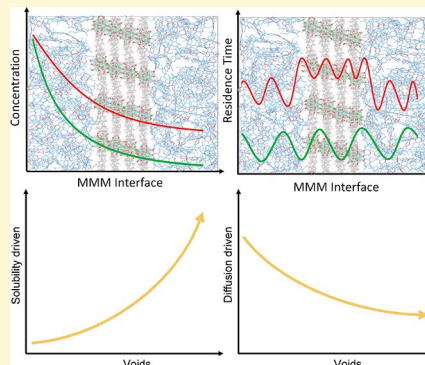


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**ABSTRACT:** Current MOF/polymer mixed matrix membranes (MMMs) design relies on the assumption that it is necessary to avoid interfacial porosity in order to achieve high-level gas-separation performances, but is this assumption valid in all cases, for all separation mechanisms? This communication proves that this is not always true by considering NUS-8/PIM-1, a prototypical MMM for CO<sub>2</sub> capture. Our molecular simulations approach integrating quantum calculations, force field-based Monte Carlo, and equilibrium/non-equilibrium molecular dynamics simulations, revealed that a porosity generated at the NUS-8/PIM-1 interface in the form of microvoids favors the interactions between CO<sub>2</sub> and the NUS-8 surface and therefore contributes to ensure a high CO<sub>2</sub>/N<sub>2</sub> and CO<sub>2</sub>/CH<sub>4</sub> selectivity for the corresponding MMM, preserving the pure NUS-8 membrane value and exhibiting a high flux for CO<sub>2</sub>. This high-level performance is achieved by means of a solubility-driven separation mechanism, as opposed to previously studied diffusion-driven separations where the interface porosity had been shown to deteriorate the MMM separation performance. We believe that these results will change the current paradigm in the field of MOF/polymer MMMs, paving the way toward new strategies for the development of highly efficient membranes for gas separation.



High flux and highly selective membranes have been largely sought after over the last decades for achieving industrially and environmentally relevant energy-efficient separations in gas and liquid phases.<sup>1–4</sup> Notably, mixed matrix membranes (MMMs) have emerged as next-generation gas-separation membranes by combining the benefits of solution processable polymer matrices with the unique tunable adsorptive and diffusive properties of diverse fillers.<sup>5–8</sup> In particular, metal–organic framework (MOF)/polymer MMMs have been shown to largely overcome the well-known trade-off between permeability and selectivity that prevails in current polymer-based membranes in the field of gas separation.<sup>9–13</sup>

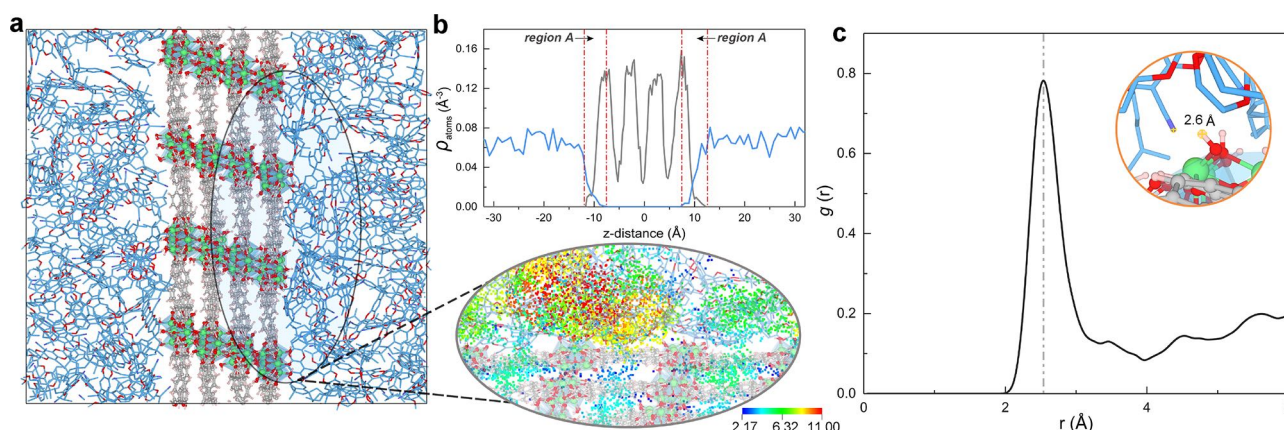
In this context, there is a wealth of work covering the fabrication of MOF/polymer-based continuous films, with high MOF loading and homogeneous dispersion into the polymer matrices.<sup>10,12,14–16</sup> Many other experimental studies have instead focused on testing MMMs' performances for a range of gas mixture separations of utmost importance in the fields of natural gas upgrading and hydrocarbon recovery, regardless of their MOF contents and the MOF/polymer affinity (also called compatibility).<sup>6,17–19</sup> Meanwhile, the key microscopic

parameters that control the onset of a good MOF/polymer compatibility have been identified thanks to the study of the interface structure of a series of MOF/polymer composites by computer simulations.<sup>20,21</sup> In contrast, the microscopic origin of the MMMs' performances has not yet been unveiled, and in particular, the role of the MOF/polymer interface structure has not yet been determined.

New porosities emerging at many MMMs' interfaces in the form of microvoids or gaps have been evoked to play a negative impact on their gas-separation performances because of a nonselective increase of permeability.<sup>22,23</sup> This has led to speculation that there is a link between MOF/polymer compatibility and the gas-separation performance of the resulting MMM. However, a good compatibility, i.e., the

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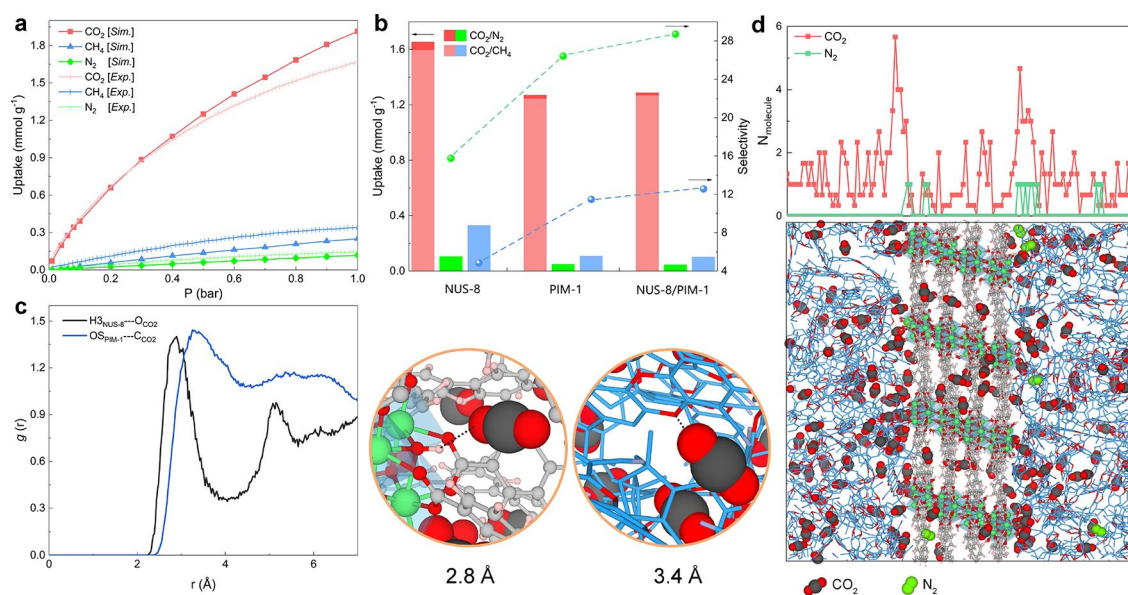
**Figure 1.** Structure of the NUS-8/PIM-1 composite. (a) Representative snapshot of the NUS-8/PIM-1 atomistic model. Color scheme: PIM-1, blue wireframe; Zr, green; O, red; H, pink; C, gray, with a zoom-in of the corresponding 3D pore size distribution for the flexible NUS-8/PIM-1 interface, with the pore diameter (in Å) colored according to the legend. (b) Atomic density plot of PIM-1 and NUS-8 as a function of the  $z$ -coordinate for a representative configuration of the NUS-8/PIM-1 composite (the region delimited by red dashed lines indicates *region A*). (c) Radial distribution function between  $H_{\text{NUS-8}} (-\text{OH})$  and  $N_{\text{PIM-1}}$  in the NUS-8/PIM-1 composite. The corresponding interaction is illustrated in the inset.

absence of surface porosities, does not necessarily translate into a high-level separation performance. For instance, polymer penetration into the MOF pores can result in thus pore blockage,<sup>20,24</sup> which was suggested as a possible explanation of the low permeability measured experimentally for highly compatible MOF/polymer MMMs. An open question still remains: is porosity at MOF/polymer interfaces necessarily an obstacle to optimal gas-separation performances in MMMs? This gap in knowledge comes from the fact that investigations on this topic at the atomistic level are still very scarce.<sup>25–27</sup> Indeed, computational studies in this field have focused to date on numerical simulations of MMMs' gas-separation performances via the use of mathematical models (such as Maxwell, Felseke, or Lewis–Nielsen models). To the best of our knowledge, the only attempt to explore the influence of the structure and dynamic modes of the MOF/polymer interface in gas transport through an MMM in real membrane operation conditions has been made very recently.<sup>28</sup> Non-equilibrium molecular dynamics (NEMD) simulations were applied to model the transport properties of guests in a ZIF-8/Polymer of Intrinsic Microporosity 1 (PIM-1) MMM based on a realistic atomistic description of the composite and its interface to study the  $\text{H}_2/\text{CH}_4$  mixture separation. In this latter work, microscopic voids were detected at the MOF/polymer interface and they were proposed as the origin of a reduction of the selectivity of the composite with respect to its pure component counterparts.

Herein, we explore adsorption/separation and transport properties of a MOF/polymer composite for some of the most challenging gas-separation processes by means of an integrated molecular simulation approach. As a proof-of-concept, we have selected the NUS-8/PIM-1 MMM system that has very recently been reported as an excellent candidate for  $\text{CO}_2$  capture with outstanding separation performances in pre- ( $\text{CO}_2/\text{CH}_4$ ) and post-combustion ( $\text{CO}_2/\text{N}_2$ ) conditions.<sup>29</sup> Density functional theory (DFT) calculations and flexible force field-based molecular dynamics (MD) simulations were first combined to build an atomistic model for the composite. The interfacial region formed between the two components was analyzed and new porosities in the form of microvoids were detected. Monte Carlo simulations were further conducted to

compute the thermodynamic single component and mixture adsorption properties of the resulting composite. A reasonable agreement between the simulated and experimentally measured adsorption isotherms was found, thus validating the atomistic structure model for the NUS-8/PIM-1 composite. The analysis of the microscopic adsorption mechanism further revealed that the presence of the interfacial microvoids does not alter the high thermodynamic separation performance of the MMM for  $\text{CO}_2$  over both  $\text{CH}_4$  and  $\text{N}_2$ . Finally, the gas permeability and selectivity of the composite were explored by means of non-equilibrium concentration-gradient-driven molecular dynamics (CGD-MD) simulations.<sup>30</sup> The conclusions drawn from this study are expected to enhance our understanding of the role played by the interfaces on the separation performances of MMMs driven either by solubility or diffusion. In particular, we demonstrate that the presence of voids at the MOF/polymer interface does not have a negative impact on the performance of MMMs for solubility-driven separations, and thus, the speculated compatibility/performance link need not be taken for granted.

The NUS-8/PIM-1 composite model was built by applying a computational approach integrating quantum- and force field-based simulations that we previously developed and applied to study MOF/polymer compatibility for several composites.<sup>20,31</sup> NUS-8(Zr) can be described by stacked monolayers containing 3-connected 1,3,5-benzenetribenzoate (BTB) linked by 6-coordinated  $\text{Zr}_6(\text{OH})_4\text{O}_4$  inorganic nodes.<sup>32</sup> This two-dimensional (2D) nanosheet MOF exhibits unidirectional diamond shaped channels of 6 Å diameter that ensure an efficient transport of  $\text{CO}_2$ .<sup>29</sup> Three surface slab models of this 2D nanosheet MOF exhibiting different stacking configurations were created and geometry optimized at the DFT level using the CP2K software.<sup>33,34</sup> The AA stacking configuration of the bulk MOF along the (001) plane was selected by taking into account both lowest energy and better agreement with the experimentally measured cell parameters. The surface was terminated considering the dissociative adsorption of water molecules, since the NUS-8 synthesis was carried out in aqueous solution. This results in  $-\text{OH}$  terminations at the external part of the surface: Zr atoms are capped by  $-\text{OH}$  functions, and  $-\text{H}$  is added to an oxygen atom at the organic



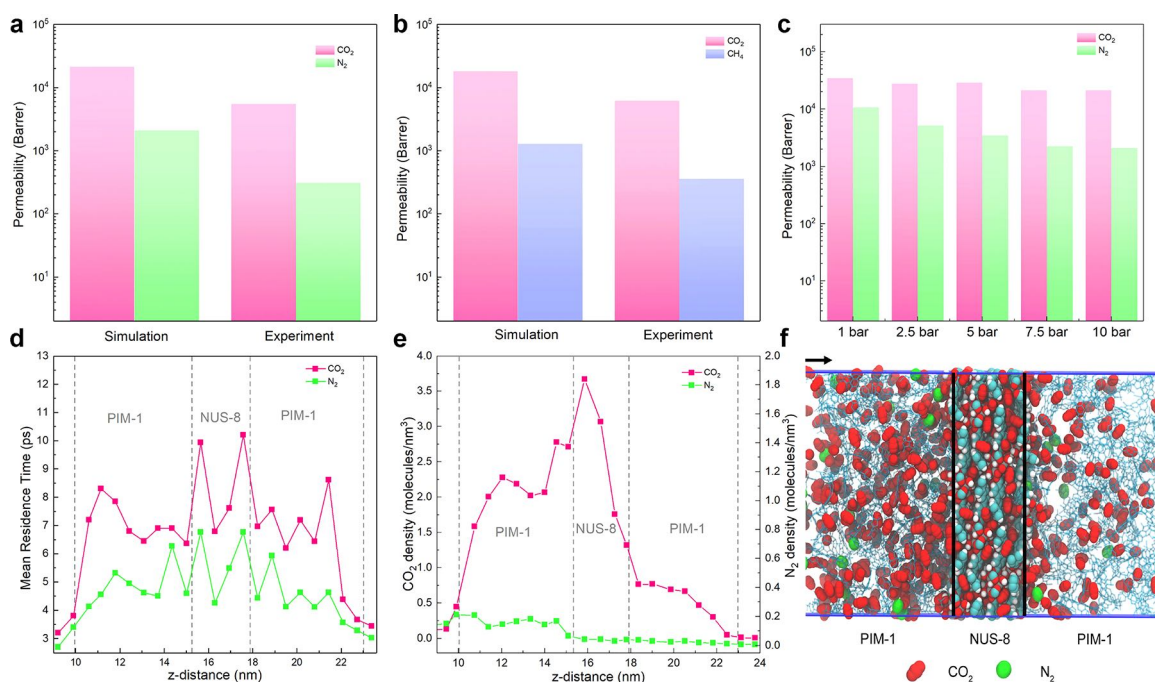
**Figure 2.** Gas adsorption properties of the NUS-8/PIM-1 composite. (a) Comparison of the GCMC-simulated and experimental  $\text{CO}_2$ ,  $\text{N}_2$ , and  $\text{CH}_4$  single-component adsorption isotherms for the NUS-8/PIM-1 composite at 298 K. (b)  $\text{CO}_2$ ,  $\text{N}_2$ , and  $\text{CH}_4$  uptake capacity and thermodynamic selectivity of pure NUS-8, pure PIM-1, and the NUS-8/PIM-1 composite for the equimolar  $\text{CO}_2/\text{N}_2$  and  $\text{CO}_2/\text{CH}_4$  mixtures adsorption isotherms at 298 K and a total pressure of 1 bar. (c) RDFs corresponding to the most prominent interactions between  $\text{CO}_2$  and the NUS-8/PIM-1 composite in the case of the  $\text{CO}_2/\text{N}_2$  mixture at 1 bar and illustration of the preferential site-to-site interactions between  $\text{CO}_2$  and each component of the NUS-8/PIM-1 composite. (d) Number of  $\text{N}_2$  and  $\text{CO}_2$  molecules along the direction perpendicular to the MMM for the coadsorption of  $\text{CO}_2/\text{N}_2$  in the NUS-8/PIM-1 composite at total pressure of 1 bar and 298 K and the corresponding GCMC snapshot. The color scheme for all snapshots is the same as in Figure 1.

linker at the surface as done previously for UiO-66.<sup>20</sup> An illustration of the MOF surface model is provided in Figure S1. This model was then combined with a PIM-1 model created in silico as implemented in the *Polymatic* package.<sup>35</sup> The resulting composite model was subsequently equilibrated by a series of MD simulations in the  $NVT$  and the  $NP_zT$  ensembles, where  $P_z$  corresponds to the pressure component in the  $z$  direction, that is, the direction perpendicular to the MOF surface slab. These MD simulations were performed using a modified version of the DL\_POLY Classic code (2.18).<sup>36</sup> The final dimensions of the equilibrated models are  $40.39 \times 70.10 \times 67.74 \text{ \AA}^3$ . The polymer component has a thickness of about 50  $\text{\AA}$ , thick enough in the  $z$  direction to avoid interactions between the periodic images of the NUS-8 surface. The two components were treated as fully flexible, based on the UFF,<sup>37</sup> GAFF,<sup>38</sup> and TraPPE<sup>39</sup> force fields. The MOF and polymer force field parameters were preliminarily validated by reproducing some structural features of the bulk pure components, while the MOF/polymer nonbonded interactions were described by the sum of a 12–6 Lennard-Jones potential term and a Coulombic contribution. Partial charges for the atoms were obtained from DFT calculations, and the Lennard-Jones crossed terms were computed using the Lorentz–Berthelot mixing rules. Further details on the construction and geometry optimization of the MOF surface model, polymer, and composite, as well as the validation of the flexible force field parameters for NUS-8, are provided in the Supporting Information (see Figures S1–S5 and Tables S1–S6).

Grand Canonical Monte Carlo (GCMC) simulations were performed on the resulting NUS-8/PIM-1 composite to assess its  $\text{CO}_2$ ,  $\text{CH}_4$ , and  $\text{N}_2$  single-component and binary mixtures ( $\text{CO}_2/\text{N}_2$  and  $\text{CO}_2/\text{CH}_4$ ) thermodynamic adsorption properties using the RASPA code.<sup>40</sup> Predictions of the gas transport through the composite for the two binary mixtures were

further carried out by CGD-MD simulations<sup>30</sup> using the GROMACS-2019.4 package<sup>41</sup> patched with a modified PLUMED-2 enhanced sampling plug-in.<sup>42</sup> All details and parameters for the GCMC and CGD-MD simulations are provided in the SI.

A representative snapshot of the NUS-8/PIM-1 composite model is illustrated in Figure 1a. The NUS-8 nanosheet is located at the middle of the simulation box, surrounded by the PIM-1 polymer on both sides. Figure 1b shows the atomic density profile of the NUS-8/PIM-1 composite as a function of the  $z$  direction. The atomic density of PIM-1 oscillates around a constant value while far from the NUS-8 surface (*region B*) and decays to zero at the close proximity of it (*region A*, the onset of the interface). There is no evidence of polymer penetration into the porosity of the NUS-8 structure. However, there is MOF/polymer overlap over a  $z$ -length of  $3.8 \pm 0.4 \text{ \AA}$  at the onset of the interfacial region (value obtained from an average of five independent MD simulations, with an error bar given by the standard deviation). For comparison, the composite constructed with a rigid MOF model led to a similar density plot (Figure S6) and comparable MOF/polymer overlap dimensions ( $3.4 \pm 0.4 \text{ \AA}$ ). The average length of *region A* in the  $z$ -axis was found to be  $6 \pm 2 \text{ \AA}$  and  $5 \pm 1 \text{ \AA}$  for the flexible- and rigid- MOF/Polymer composite models, respectively. This shows that PIM-1's packing efficiency does not depend on the NUS-8 surface flexibility, suggesting that it is instead controlled by its intrinsically rigid molecular ladder configuration. Relevant site-to-site radial distribution functions (RDFs) between the two components were further computed from the MD simulations (Figure S7). The most prominent MOF/Polymer interaction at the interface involves the cyano groups of PIM-1 and the hydroxyl groups of NUS-8 with a characteristic  $N_{\text{PIM-1}} \cdots H_{\text{NUS-8}}$  distance of 2.6  $\text{\AA}$  as shown in Figure 1c. Analyses of the pore size distribution (PSD) of the



**Figure 3.** Gas mixture transport properties of the NUS-8/PIM-1 composite. (a, b) Simulated (at 10 bar feed) and experimental<sup>29</sup> gas permeabilities for equimolar CO<sub>2</sub>/N<sub>2</sub> and CO<sub>2</sub>/CH<sub>4</sub> mixtures, respectively. (c) Evolution of the simulated gas permeabilities as a function of the total feed pressure for the CO<sub>2</sub>/N<sub>2</sub> mixture. (d) Mean residence time profiles for CO<sub>2</sub> and N<sub>2</sub> along the NUS-8/PIM-1 composite for an equimolar CO<sub>2</sub>/N<sub>2</sub> mixture at 10 bar feed. Dashed lines indicate the average position of the NUS-8 and PIM-1 components. (e) Density profiles for CO<sub>2</sub> and N<sub>2</sub> along the NUS-8/PIM-1 composite for an equimolar CO<sub>2</sub>/N<sub>2</sub> mixture at 10 bar feed. (f) Illustration of the typical distribution of CO<sub>2</sub> and N<sub>2</sub> molecules along the composite for an equimolar CO<sub>2</sub>/N<sub>2</sub> mixture at 10 bar feed. Color scheme: PIM-1, blue wireframe; O, red; C (NUS-8), cyan. The arrow on the top left margin points to the direction of the gas flux.

whole composite revealed that the NUS-8 nanosheet and polymer regions exhibit pores of about 5.4 Å and up to 8.5 Å respectively (see Figures S5 and S8) reminiscent of what was previously obtained for the pure bulk NUS-8<sup>32</sup> and PIM-1.<sup>31</sup> Interestingly, as illustrated in the zoomed-in image of Figure 1a, relatively large voids, with diameters up to 11 Å, are created at the interface. These newly generated interfacial microvoids are expected to control the thermodynamics and dynamics of the gas adsorption/separation properties of the composite.

GCMC simulations were further performed to explore the gas adsorption properties of the NUS-8/PIM-1 composite model at 298 K. As a preliminary step, the atomistic models for both NUS-8, PIM-1, and the three guests CO<sub>2</sub>, N<sub>2</sub>, and CH<sub>4</sub> were validated by a good agreement between the simulated single-component adsorption isotherms for both individual MOF and polymer and the corresponding experimental data (see Figures S9–S14). Figure 2a shows the excellent agreement between the GCMC-simulated and experimentally obtained single-component N<sub>2</sub>, CO<sub>2</sub>, and CH<sub>4</sub> adsorption isotherms for the composite. This demonstrates that our atomistic model faithfully represents the NUS-8/PIM-1 composite. We further explored the thermodynamic separation performances of the composite with respect to the equimolar CO<sub>2</sub>/CH<sub>4</sub> and CO<sub>2</sub>/N<sub>2</sub> mixtures. The simulated coadsorption isotherms reported in Figure S15 highlight that the composite preferentially adsorbs CO<sub>2</sub> over both CH<sub>4</sub> and N<sub>2</sub>, which is consistent with the higher CO<sub>2</sub> adsorption enthalpy calculated for the single components (CO<sub>2</sub>: 39.3 kJ mol<sup>-1</sup>, CH<sub>4</sub>: 14.6 kJ mol<sup>-1</sup>, and N<sub>2</sub>: 10.9 kJ mol<sup>-1</sup>). Figure 2b shows the simulated CO<sub>2</sub>/CH<sub>4</sub> and CO<sub>2</sub>/N<sub>2</sub> selectivities along with the gas uptakes at 1 bar for the composite as well as for the pure NUS-8 and PIM-1 models. These calculations reveal a slight increase of

both CO<sub>2</sub>/N<sub>2</sub> and CO<sub>2</sub>/CH<sub>4</sub> thermodynamic selectivity for the NUS-8/PIM-1 composite at 1 bar as compared with the pure PIM-1 from 26 to 29 and from 12 to 13, respectively. This is consistent with previous experimental findings for these systems.<sup>29</sup> The microscopic origin of this high thermodynamic selectivity for CO<sub>2</sub> was further elucidated by a careful analysis of the coadsorption mechanism in the composite. CO<sub>2</sub> was shown to interact more strongly with the hydroxyl group present at the NUS-8 surface and the oxygen atom of PIM-1, with characteristic O<sub>CO<sub>2</sub></sub>–H<sub>NUS-8(OH)</sub> and C<sub>CO<sub>2</sub></sub>–O<sub>PIM-1</sub> distances of 2.8 and 3.4 Å, respectively, as revealed by the corresponding RDFs plots and illustrative snapshots (Figure 2c). Figure 2d shows the number of gas molecules as a function of the *z* coordinate, along with an illustration for the CO<sub>2</sub>/N<sub>2</sub> case at 1 bar. It can be deduced that both molecules can occupy all the different regions within the composite, with a more predominant CO<sub>2</sub> population compared to N<sub>2</sub>. Note that CO<sub>2</sub> preferentially concentrates at *region A* of the NUS-8/PIM-1 composite as illustrated in Figure 2d. This scenario is explained by the interactions between CO<sub>2</sub> and the hydroxyl groups at the NUS-8 surface as discussed above, since these groups are exposed to the microvoids present in *region A*. A similar profile was also found for the CO<sub>2</sub>/CH<sub>4</sub> mixture (Figure S17).

As a further step, CGD-MD simulations<sup>30</sup> were conducted at 298 K in order to gain insight into the transport properties of CO<sub>2</sub>, N<sub>2</sub>, and CH<sub>4</sub> through the MOF/polymer composite. For these simulations, we considered a larger and unwrapped composite model with dimensions of 40.39 × 70.10 × 129.80 Å<sup>3</sup>, generated by placing a NUS-8 surface between two unwrapped PIM-1 slabs taken from our previously detailed

interface model. A typical snapshot of the simulation box is illustrated in Figure S18. Initially, the gas permeabilities were simulated for the equimolar CO<sub>2</sub>/N<sub>2</sub> and CO<sub>2</sub>/CH<sub>4</sub> mixtures at a total feed pressure of 10 bar and compared with the corresponding experimental data as reported in panels a and b, respectively, of Figure 3. We verified that the total pressure was maintained fixed at the target values over the simulation time (see Figure S19) and that 100 ns is enough to reach the steady state in our model system (see Figure S20a). A good agreement between the predicted permeabilities and the averaged available experimental values was obtained for the three gases in this composite. Note that similar NEMD studies usually lead to calculated permeabilities within an order of magnitude of the experimental ones.<sup>43–45</sup> The relative overprediction of the permeability is in line with the high permeation for the ultrathin membrane limit reported in the literature,<sup>46–48</sup> since our calculations were performed using an ultrathin NUS-8/PIM-1 composite model (~13 nm along *z*-direction). The gas permeabilities for the CO<sub>2</sub>/N<sub>2</sub> mixture were equally explored as a function of the feed gas pressure, with the permeate side of the composite set to vacuum. The drop in permeability with respect to increasing pressure in glassy polymeric membranes as well as in microporous carbon membranes<sup>49</sup> is a well-known phenomenon.<sup>6,50,51</sup> Interestingly, our NEMD calculations performed on the NUS-8/PIM-1 composite model capture this experimentally observed permeation trend.

Moreover, our predicted permeation selectivities for CO<sub>2</sub>/CH<sub>4</sub> (16) and CO<sub>2</sub>/N<sub>2</sub> (11) mixtures reproduce the experimental trend, with values in the range of 18–30 and 15–25 respectively. Altogether, this shows the reliability of the GCD-MD approach applied to a realistic atomistic model of the MOF/polymer composite to provide a fair prediction of its transport properties. As a further step, we explored the microscopic gas transport mechanism at the origin of the CO<sub>2</sub>/N<sub>2</sub> and CO<sub>2</sub>/CH<sub>4</sub> permeation selectivity in this MMM. Figure 3d,e report the mean residence time and steady-state concentration profiles, respectively, for CO<sub>2</sub> and N<sub>2</sub> in the binary mixture along the *z*-direction of the composite at 10 bar. Dashed lines are given to indicate the average position of the polymer and MOF components to guide the reader's eye, note that these positions fluctuate along the simulation. The residence time and steady-state concentration profiles can be considered respectively as the microscopic counterparts of the diffusion and solubility contributions of each penetrant's permeability in the scheme of solution-diffusion theory.<sup>50,51</sup> It turns out that while CO<sub>2</sub> and N<sub>2</sub> show rather similar residence time distributions in the whole composite (Figure 3d), a much more pronounced difference is observed between the two gases in the steady-state concentration profiles (Figure 3e). Indeed, the solubility contribution to selectivity is on average 23 times higher for CO<sub>2</sub> than for N<sub>2</sub>, while the diffusion contribution for CO<sub>2</sub> is on average 0.7 of that for N<sub>2</sub>. The corresponding solubility and diffusion selectivity values ratios are given in Figure S20b,c. This demonstrates that the solubility contribution dominates over the diffusion counterpart for the separation of the two gases in this composite and that this phenomenon is at the origin of the high CO<sub>2</sub>/N<sub>2</sub> selectivity observed both experimentally and in our GCMC simulations. Similarly, solubility dominates the gas-separation process for the CO<sub>2</sub>/CH<sub>4</sub> mixture as well, as shown by the corresponding residence times and steady-state concentration profiles given in the SI (Figure S21). Figure 3f reports a

representative snapshot taken from our GCD-MD simulations to visually track the adsorbed CO<sub>2</sub> molecules through the composite model. This distribution of gas molecules is maintained along the simulation time, as the voids present in the interfacial region remain of similar size (11 Å) along the whole CGD-MD trajectories for the CO<sub>2</sub>/N<sub>2</sub> mixture permeation (see Figure S22). Additional calculations were performed for the CO<sub>2</sub>/N<sub>2</sub> gas mixture on pure NUS-8 and PIM-1 membrane models (see Figure S18 and Table S7). Interestingly, we demonstrated that the CO<sub>2</sub>/N<sub>2</sub> selectivity of the MMM is not adversely affected by the presence of voids at the MOF/polymer interface since the selectivity of the NUS-8/PIM-1 composite is predicted to match that for the NUS-8 pure membrane (Table S7).

In a nutshell, our simulations suggest that the high CO<sub>2</sub> separation ability of the NUS-8/PIM-1 MMM can be explained via a solubility dominated separation mechanism and a favorable CO<sub>2</sub> adsorption through the emergent interfacial porosity. This predicted trend is in line with what has been previously evoked by an experimental study<sup>52</sup> on a silica-polyimide MMM system. In that study, the authors assumed that the presence of voids is the main reason behind the increase in the gas permeability of their MMM, as compared with its individual components. In a previous computational study, we reported that ZIF-8/PIM-1 MMMs show a reduced CH<sub>4</sub>/H<sub>2</sub> separation ability as compared with its individual components because of the existence of voids at the interface which were at the origin of a loss of selectivity performance.<sup>28</sup> In this later case, the diffusion dominated the separation process because of the considerable effective size difference between CH<sub>4</sub> and H<sub>2</sub> molecules. The simultaneous consideration of these two different cases demonstrates that the presence of interfacial void regions can have either a positive or a negative impact into the separation performance of the MMM, depending on whether the separation mechanism is governed by solubility or by diffusion, respectively. It could be speculated that both a rigid polymer, that promotes the formation of microvoids at the MOF/polymer interface, together with a MOF surface decorated by chemical functions with high CO<sub>2</sub> affinity, might contribute to a solubility driven mechanism for CO<sub>2</sub> pre- and post-combustion separations. In the future, we plan to scan several MOF/polymer composites in order to explore the validity of this hypothesis.

In summary, the impact of the MOF/polymer interface into the thermodynamics and dynamics of CO<sub>2</sub>/N<sub>2</sub> and CO<sub>2</sub>/CH<sub>4</sub> separation properties of a model NUS-8/PIM-1 MMM was explored by means of molecular simulations. Our approach integrated DFT calculations with GCMC, MD, and CGD-MD simulations, thus enabling us to go all the way from building a realistic composite model at the atomistic level, to exploring the adsorption and the transport mechanism of the gas mixtures. We have found that there are microvoids at the NUS-8/PIM-1 interface and that the CO<sub>2</sub> molecules are preferentially adsorbed at these microvoids thanks to its strong interactions with the hydroxyl groups at the NUS-8 surface. The presence of this interfacial porosity does not adversely affect the MMM separation performance thanks to a solubility-driven separation mechanism. Previous studies have considered the CH<sub>4</sub>/H<sub>2</sub> separation in ZIF-8/PIM-1 composites and found that the interfacial porosity was detrimental to the separation performances of the composite with respect to pure PIM-1, which can be ascribed to a diffusion-driven separation

mechanism. By considering both the previous and our current results, it can be concluded that the separation mechanism needs to be taken into account in order to determine whether the separation abilities of the MMM will deteriorate or not in the presence of interfacial porosities, contrary to the regular belief that porosity is always detrimental to separation performance. We believe that these results will help gas-separation membranes development by shifting the focus to new strategies that rely on solubility-driven separations.

## ■ ASSOCIATED CONTENT

### SI Supporting Information

The Supporting Information is available free of charge at <https://pubs.acs.org/doi/10.1021/acsmaterialslett.0c00560>.

Force fields, models derivation, calculation setup details, and additional validation/results plots (PDF)

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### Notes

The authors declare no competing financial interest.

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