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Molecular characterization of polyOAPSimide isomer hyper-cross-linked membranes: free-volume morphologies and sorption isotherms for CH₄ and CO₂

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GRAPHICAL ABSTRACT



ABSTRACT

PolyPOSS-imides are hybrid hyper-cross-linked networks based on inorganic octa(aminopropyl)silsesquioxane (POSS) cages covalently bonded via organic imide bridges. They were initially developed for separations under harsh conditions, but they cannot be used above 300°C due to the decomposition of their -(CH₂)₃- propyl linkers. Replacing the aliphatic-arm POSS with its phenyl-arm derivative, octa(aminophenyl)silsesquioxane (OAPS), should thus increase their resistance. However, OAPS has three possible isomers depending on the *meta*, *para* or *ortho* position of the -NH₂ group on the phenyl ring. To pre-screen the most interesting structures before

attempting synthesis, molecular dynamics (MD) simulations were recently used to compare twentytwo model networks based on the OAPS isomers, the initial POSS and several imide precursors at high temperatures. Six phenyl-arm polyOAPS-PMDA and polyOAPS-6FDA and two aliphatic-arm polyPOSS-PMDA and polyPOSS-6FDA were selected for further analyses of their CH_4 and CO_2 sorption isotherms at 35°C. All of them have an average number of ~5 links *per* cage and crosslinking densities of ~3.8. In terms of connectivities and free-volume morphologies, both the *meta*OAPS and *para*OAPS networks are found to be open structures with many low-energy sites and high penetrant solubilities. On the other hand, the *ortho* functionalization leads to denser morphologies associated to lower solubilities, which makes it closer to the POSS networks. Differences are enhanced when the inorganic precursor is associated to a rigid organic linker such as PMDA.

The iterative GCMC (Grand Canonical Monte Carlo)-MD sorption-relaxation technique was used to predict the single-gas uptakes of CH₄ and CO₂ in the networks over an extended 0-60 bar pressure range at 35°C. The sorption capacities varied in the order *para*OAPS > *meta*OAPS > *ortho*OAPS > POSS for the inorganic precursor, and PMDA > 6FDA for the organic precursor (except for the *ortho*OAPS). All correlate directly to the accessible free-volume, but the CO₂/CH₄ ideal sorption selectivities remained essentially the same over the whole pressure range. Compared to POSS, OAPS showed less swelling at equivalent penetrant concentrations in the matrix. It is also more resistant to other mechanical deformations such as isotropic dilation or uniaxial tension. This confirms that the polyOAPS-imides can indeed be used under harsher conditions than the current polyPOSS-imides, without loss of the CO₂/CH₄ sorption selectivities.

Keywords: Hyper-cross-linked hybrid networks, PolyOAPS/POSS-imides, Molecular dynamics (MD) simulations, Grand Canonical Monte Carlo(GCMC)-MD simulations, Free-volume morphology, CH₄ and CO₂ sorption

§ **Supporting Information**: force-field, experimental procedure, limit criterion for cross-linking, relaxation and production runs at 35°C, pure gas simulations, energies, sorption as a function of fugacity, DMS fits

1. Introduction

The separations of mixtures account for over 50% of the energy costs in chemical industries [1]. They are particularly difficult to carry out when they involve molecules of a similar size such as small gases and vapours. Dense polymer membranes have long been considered as a viable alternative to the traditional cryogenic distillation or selective adsorption processes because of their ability to separate small penetrants based on their differences in solubilities and/or diffusivities [2, 3]. Their energy cost is estimated to be 90% less than distillation and the membrane devices are easy to scale-up. However, in practice, their use is still under-developed because of the need to find more resistant materials [1, 4]. While many polymers have been considered for their transport properties, these are usually assessed under moderate temperatures and pressures [5]. On the other hand, when exposed to harsher conditions, conventional polymers tend to lose their structural integrity and, as a result, their permselectivities. This is problematic since many industrial treatments of natural gas, syngas or power plant flue gas involve high-pressure feeds and/or high temperatures [6, 7].

Hybrid organic-inorganic materials have emerged as promising candidates for improving the thermomechanical resistance of separation membranes while maintaining their gas-sieving properties [8]. Hybrids based on the cubic inorganic polyhedral oligomeric silsesquioxanes (POSS), *i.e.* Si₈O₁₂ siloxane cages with 8 organic arms *R* attached to the silicium atoms [9-11], are particularly interesting because of their high versatility. Depending on the nature of *R*, they can either be physically mixed or chemically cross-linked to a large number of polymers [12-16]. A recent review reports the many opportunities for POSS in the field of advanced separation membranes [17].

The focus here is on hyper-cross-linked polyPOSS-imide networks [18-21], in which aminofunctionalized inorganic POSS are covalently bonded with organic imides originating from dianhydride precursors. It should be noted that dianhydrides can also act as precursors for organic polyimides, which usually show good gas selectivities [22, 23]. In the case of the hybrid networks, solutions of both types of precursors are prepared at room temperature in non-miscible solvents. When contacted, interfacial polycondensation occurs between the -NH₂ on the POSS and the anhydride moieties. Since both sides of the dianhydrides are able to react, this results in a defectfree hyper-cross-linked polyPOSS-(amic acid) film, which is further converted into its final polyPOSS-imide form via thermal imidization at 300°C. This procedure can be directly carried out on high-surface-to-volume ratio hollow fibre supports for upscaling [24], and as such, it is well adapted to membrane modules [25].

The first polyPOSS-imides developed by interfacial polycondensation were based on octa(aminopropyl)silsesquioxane, *i.e.* a POSS precursor functionalized with aliphatic -(CH₂)₃-NH₂ arms (Fig. 1a) [18-21]. They were indeed found to perform under tougher operating conditions (up to 60 bar and 300°C) than conventional polymer membranes [18-20, 25]. However, the flexible aliphatic arms of the POSS resulted in excessive dilations and thermal degradation above ~300°C, thus limiting the gas separation efficiencies of the imide constituents. This was confirmed by molecular simulations [26-28]. It was then proposed to replace the initial POSS precursor by octa(aminophenyl)silsesquioxane, commonly referred to as OAPS [10, 29], which is functionalized by phenyl -C₆H₄-NH₂ arms [30]. There are three isomers, since the -NH₂ group can be attached at different positions on the phenyl ring, and we refer to them as *meta*OAPS, *para*OAPS and *ortho*OAPS. The three OAPS isomers can co-exist in various proportions depending on the synthesis route [29, 31, 32], but they can also be obtained separately from the appropriate aminophenyltrialkoxysilanes [33]. Our model networks were based on each of the different isomers to assess unambiguously the effects of the substitution position. Their chemical structures are given in Fig. 1a along with those of the initial POSS precursor.

Fig. 1b shows the organic precursors under study, *i.e.* the pyromellitic dianhydride (PMDA) and the 4,4'-(hexafluoroisopropylidene) diphthalic dianhydride (6FDA). Hyper-cross-linked networks based on the OAPS inorganic precursor are referred to as "polyOAPS-imides" to differentiate them from the "polyPOSS-imides" based on the initial aliphatic POSS precursor, and two of their chemical structures are provided in Figs. 1c-d.

(a) inorganic precursors





Fig. 1 (a) Inorganic and (b) organic precursors for the hyper-cross-linked polyPOSS-imides and polyOAPS-imides under study. (c) and (d) show two polyOAPS-imide networks with an average connectivity of four links *per* OAPS cage.

When attempting to develop new materials, molecular modelling techniques such as molecular dynamics (MD) and Monte Carlo (MC) simulations, can be used to pre-screen a large series of candidate structures [34]. This allows for the subsequent synthesis efforts to only concentrate on the most promising ones. Furthermore, experiments under harsh conditions are difficult to implement and to interpret [35], whereas both MD and MC simulations can be carried out under a large variety of operating pressures and temperatures [36]. The present work represents the third stage in the detailed molecular characterization of polyPOSS/OAPS-imides. In a first stage [26-28], the generation procedure for such hyper-cross-linked model networks was optimized on several polyPOSS-PMDA and polyPOSS-6FDA at the experimentally-determined initial average value of 4 links per POSS cage [19]. This allowed for the first detailed characterization of their structures, thermomechanical properties, and CO₂ and CH₄ permeabilities at the molecular level [26-28]. Following the identification of the POSS aliphatic arms as a weak link, eighteen new molecular models were generated based on the three isomers of OAPS as the inorganic precursors and on the PMDA, 6FDA and 4,4'-oxydiphthalic (ODPA) dianhydrides as the organic precursors [30]. The cross-linking procedure was stopped at the same average value of 4 links *per* OAPS cage for nine of them, but the remaining nine polyOAPS-imides were allowed to cross-link until there

were no more possible reactions. Their characteristics and thermomechanical resistances were then directly compared to those of the corresponding polyPOSS-imides at 300°C, *i.e.* at the experimental temperature for the imidization. While the onset of decomposition for polyPOSS-imides is known to be at ~350°C [21], that of polyOAPS-imides is expected to be well over 400°C [37, 38]. Carrying out the cross-linking reactions to completion significantly improved the resistance. Indeed, following the initial characterization of 4 links *per* cage on average [19], it was later shown experimentally that increasing the concentration of the POSS solution could lead to connectivities of up to 4.9 links *per* cage for polyPOSS-6FDA [20]. This is very similar to the value found when carrying out the cross-linking to completion for our model polyPOSS-6FDA. Furthermore, the polyOAPS-imides with the maximum degree of connectivity were found to maintain their structural integrities at 400°C. In all cases, the optimal networks were those either based on the *ortho*OAPS inorganic precursor and/or on the rigid PMDA organic precursor with the maximum possible connectivity. Those based on the *meta*OAPS and *para*OAPS (with the same organic precursor) behaved in a fairly close way, as did those based on the two flexible organic linkers, 6FDA and ODPA (with the same inorganic precursor) [30].

The present work investigates the behaviour and the ideal CO₂/CH₄ sorption selectivities at 35°C, *i.e.* just above the critical temperature for CO₂, for the most promising polyOAPS-imide networks selected over the aforementioned screening stage [30]. Since bulk periodic molecular models do not have any explicit external reservoirs, specific techniques are required to estimate the number of penetrant molecules in the networks in equilibrium with a preset external gas pressure [36]. The most commonly-used approach is the efficient Grand Canonical Monte Carlo (GCMC) method [34, 39-44], but the calculations have to be carried out on a set of pre-prepared matrix configurations. It can result in artefacts upon loading of either the midly-plasticizing CH₄ or, even worse, the highly-plasticizing CO₂ which leads to significant matrix dilations [45]. This problem can be addressed by coupling GCMC with controlled-pressure MD, which naturally allows for the matrix and its volume to relax upon penetrant sorption [34, 42, 45-50]. However, the decreasing density during the MD phase results in the penetrant solubility rising. The model thus drifts from the preset external gas pressure and it is necessary to reapply GCMC to adjust the sorbed number of molecules corresponding to the newly-relaxed volume. Several alternating cycles of sorption and

relaxation are usually required to reach convergence and, as such, we refer to this sorptionrelaxation procedure as the "iterative GCMC-MD method" [36]. Due to the slow molecular relaxations [28], a recent work has shown that 30-40 GCMC cycles coupled with controlledpressure MD simulations of 1000 ps were required to attain convergence for CO₂ in the 6FDA-6FpDA polyimide [36]. It is clear that these are very time-consuming simulations and consequently, the number of networks under study was limited to eight. GCMC on its own is more appropriate for rapid screening of the sorption capacities [34, 51], but it has to be restricted either to lowplasticizing penetrants or to low uptakes for plasticizing penetrants. In the present case, we assess CH₄ and CO₂ sorption over an extended 0-60 bar range at 35°C, and as such, we need to make extensive use of the iterative GCMC-MD method.

The selected networks were the three polyOAPS-PMDA and the three polyOAPS-6FDA, each of them with a different OAPS isomer, with the cross-linking reactions carried out to completion, along with a polyPOSS-PMDA and a polyPOSS-6FDA generated under exactly the same conditions [30]. The inclusion of these latter samples was the reason for the choice of the polyOAPS-6FDA over the polyOAPS-ODPA (which behaved quite similarly), the main points being that i) the OAPS-based networks can be compared to the corresponding POSS-based and ii) the networks with the rigid PMDA organic linker can be compared to those with a flexible linker. The details of the models and the specific methodologies associated to gas solubility and sorption are summarized in Section 2 and Section 3, respectively. Section 4 analyses the bulk properties and the free-volume morphologies of the pure networks at 35°C. Section 5 compares their uptake curves for both CH₄ and CO₂, their amount of swelling, their interactions with the gases as well as their ideal CO₂/CH₄ selectivities. Their resistance to isotropic dilation and uniaxial tension is discussed in Section 6.

2. Network molecular models

As mentioned above, the polyPOSS-imide and polyOAPS-imide model networks have been presented in detail before [26-28, 30], but for clarity, we hereby summarize their main features.

2.1. Force-fields and simulation parameters

Both MD and GCMC simulations were carried out using the gmq parallel package [52]. The total molecular potential energy U_{pot} is obtained from the sum of the angle-bending, torsional, out-of-plane, van der Waals and electrostatic interactions (Eq. 1):

$$U_{pot} = \sum_{\theta} U_{bend}(\theta) + \sum_{\tau} U_{tors}(\tau) + \sum_{i-planar} U_{oop}(i) + \sum_{(i,j)nb} U_{vdw}(r) + \sum_{(i,j)nb} U_{coul}(r)$$
(1)

Each term in Eq. (1) is detailed in the Supporting Information, along with the force-field parameters for all OAPS-based molecules (Tables S1-S2-S3 and Fig. S1) and the cutoffs for non-bonded interactions [30]. Those for the aliphatic POSS-based molecules are available in Refs [26, 27]. The gas molecules were represented by optimized all-atom models for CH₄ [53] and CO₂ [54]. Highfrequency motions, *i.e.* the bond stretching modes, the hydrogen vibrational modes and the O=C=O bending mode for CO₂, were kept rigid using constraints [55, 56], in order to ensure a correct equipartition of the kinetic energy with a time step of $\Delta t = 10^{-15}$ s in the MD integration algorithm [57].

The temperature T and pressure tensor P were maintained close to their required values by loose-coupling [58, 59]. The MD simulations were run under either constant-volume *NVT* or controlled-pressure-tensor *NPT* conditions. The latter allows for the system to relax towards its equilibrium size and shape. The resistances to mechanical stresses were obtained by changing linearly the components of the required pressure tensors and recording the changes in box sizes and shapes. The average thermodynamic data were stored every 1 ps while the molecular configurations were stored every 5 ps for post-analysis. They were visualized with the VMD software [60].

2.2. Generation and relaxation of the hyper-cross-linked networks

The fully-atomistic networks were built using a similar procedure to other molecular models of cross-linked materials [61-72]. It basically starts with mixtures of the precursors, in which cross-links are formed using a heuristic distance criteria and are subsequently relaxed [70]. The composition of the mixtures, the distance criterion, the target cross-linked densities and the relaxation protocol are usually chosen to mimick experiment. The synthesis route for the hyper-

cross-linked networks under study here [18-21] is provided in Fig. S2 of the Supporting Information.

A detailed description of the optimized generation procedure for our polyOAPS-imides and polyPOSS-imides is available in Ref. [30]. To summarize, separate bulk models of the different inorganic and organic precursors (Fig. 1) were first built and validated at room temperature. 3:1 dianhydride:OAPS and dianhydride:POSS mixtures were then prepared by superimposing an inorganic bulk with an organic bulk and selecting the molecules that overlapped the least. Using 216 OAPS (or POSS) precursors led to model networks of ~30000-40000 atoms, i.e. they were large enough to give statistically-significant results [66, 68]. The mixtures were relaxed at 300°C, cooled back to room temperature, and carefully checked for any signs of phase separations. This did not occur and the cross-linking started with recording all the distances between the dianhydride ketone carbons Cket and the OAPS (or POSS) amine nitrogens N. Based on these Cket N radial distribution functions (Fig. S3 in the Supp. Information), the maximum distance criteria for the sum of the shortest C_{ket} N distances at either end of a dianhydride, R_{min} , was set to 7 Å. Earlier investigations have shown that setting R_{\min} to either 6 or to 7 Å gave similar connectivities for the polyPOSS-imides [26, 27], but that 6 Å is too short for dianhydrides to be able to cross-link with the *ortho*OAPS precursor [30]. As such, all dianhydrides having $R_{min} \leq 7$ Å were selected, both their covalent bonds between Cket and the anhydride oxygen Oanhy were broken and replaced by two new Cket-N bonds. Oanhy and the amine hydrogens were removed, thus mimicking the experimental loss of one water molecule per imidization reaction [18-21]. The newly created OAPS-diimide (or POSS-diimide) links were relaxed back to their equilibrium bond lengths by energy minimization, and the network was gradually re-thermalized with MD under NVT conditions up to 10 ps. At that point, R_{min} was re-calculated for all unreacted dianhydrides, and those within the $R_{min} \leq 7$ Å criterion were selected to form more bonds. The cross-linking-relaxation process continued in an iterative manner until it was terminated and the remaining unreacted dianhydrides were then removed from the system. The cross-linking reactions can either be stopped once a specific degree of connectivity is reached or continued until there are no more possible reactions.

Our screening of 22 different structures [30] showed that the networks with the reactions carried out to completion exhibit significantly higher resistances to mechanical deformation than

those with slightly lower cross-linking densities. The former required much longer cross-linking simulation times, as it became less and less frequent to find unreacted dianhydrides with $R_{min} \leq 7$ Å. The increased degree of cross-linking, however, resulted in over 99% of the atoms forming a single continuous network with the few remaining molecules belonging either to unreacted cages or to small cage-dianhydride-cage blocks. All the networks considered here will thus be those obtained by carrying out the reactions to completion, *i.e.* those with the higher degrees of connectivity.

Once cross-linked, the networks were relaxed for 20000 ps under *NPT* conditions at 300°C to mimick the experimental imidization conditions. The initial screening stage [30] was directly carried out at 300°C, since these networks are aimed at being resistant under harsh conditions. The structures were then cooled down at -0.1 K/ps and further run at 35°C for 4000 ps. The densities and energies relaxed fast (see Fig. S4 in the Supp. Info) and the properties at 35°C could be averaged over the last 2000 ps. It should be noted that there is always a dependence of the density on the cooling rate [73], but this usually remains minor with -0.1 K/ps, which is a fairly slow cooling rate for MD simulations [36].

3. Gas solubility and sorption methodologies

3.1. The TPI method for gas solubility

In molecular simulations, the free energy for the solvation process is usually estimated using the test-particle insertion (TPI) approach [74, 75]. This means repeatedly inserting a virtual penetrant molecule at random sites into a matrix, here the hyper-cross-linked networks, and calculating the average change in the potential energy $\Delta \Phi$ associated with million of trials insertion. The (dimensionless) solubility *S* can be obtained in the *NPT* ensemble from the following equation [76]:

$$S = \frac{\left\langle V \exp\left(-\frac{\Delta\Phi}{k_B T}\right) \right\rangle}{\left\langle V \right\rangle} \approx \left\langle \exp\left(-\frac{\Delta\Phi}{k_B T}\right) \right\rangle$$
(2)

with $k_{\rm B}$ being the Boltzmann constant. In the case of limited volume fluctuations, the approximation given in Eq. (2) holds quite well. To improve its efficiency [36], the TPI method can be parallelized and combined with an excluded-volume map sampling (EVMS) approach, which screens out

regions of very low insertion probabilities [77-79]. For dense matrices, this allows for up to 85-95% of the space to be pre-excluded, thus speeding-up TPI by factors of 10-20 compared to purely random insertions [28, 80, 81].

The probability density distributions of the insertion energies $\rho(\Delta \Phi)$ can be weighted by their Boltzmann factor to represent the likely energies for any probe molecule actually inserted into the matrix, *i.e.* the preferential sites for penetrant adsorption [28]:

$$\rho_{w}(\Delta\Phi) = \rho(\Delta\Phi) \exp\left(-\frac{\Delta\Phi}{k_{B}T}\right)$$
(3)

The $\rho_w(\Delta \Phi)$ can also be used to check the reliability of TPI as poorly-converged unweighted $\rho(\Delta \Phi)$ give rise to ragged Boltzmann-factor weighted distributions [28].

In the present work, the parallel TPI-EVMS was used to characterize the solubility of CH₄ and CO₂ in the pure networks and the morphology of their respective void-spaces. It was also used prior to the uptake curve predictions, as the latter require for each gas the determination of its concentration C_{gas} and its solubility S_{gas} in its own gas phase over the full range of pressures p considered. For the models of CH₄ and CO₂ [53, 54], the $C_{gas}(p)$ and the $S_{gas}(p)$ were previously obtained from a series of MD simulations of the pure gas under *NVT* conditions at 35°C [36]. The average pressures were directly extracted from the MD simulations carried out at different number densities and the solubilities $S_{gas}(p)$ were obtained from TPI analyses. Both $C_{gas}(p)$ and $S_{gas}(p)$ were then fitted to analytical functions, which are provided in the Supporting Information along with the fit parameters (Table S4).

3.2. The iterative GCMC-MD method for penetrant sorption

Due to their periodicity in three dimensions, molecular bulk models lack explicit reservoirs, which is problematic when the uptake from a gas reservoir held at a fixed pressure p has to be modelled [42]. It is possible to prepare fully-atomistic films with reservoirs on either side, but these are very expensive calculations in terms of simulation times and, furthermore, they require intricate preparation procedures to properly represent the transitions from the surface-like to the bulk-like membrane core regions [82]. As such, they are still quite rare [83-86]. On the other hand, it is possible to adjust the penetrant loading within a dense matrix using the Grand Canonical Monte

Carlo (GCMC) technique [76, 87]. It ensures that the number of penetrant molecules inserted into the matrix phase is in equilibrium with an external gas of pressure *p*, based on the equality of the chemical potential for the penetrant in the gas phase, μ_{gas} , and that for the penetrant in the matrix phase, μ_{matrix} [80, 88].

GCMC calculations are carried out under μVT conditions, *i.e.* at constant chemical potential, volume and temperature. Here a virtual gas reservoir of pressure *p* exchanges penetrant molecules with the static matrix of fixed volume *V* using Monte Carlo moves to establish an equilibrium between both phases. There are two types of trial moves: the transfer from the gas phase to the matrix phase, which is referred to as "insertions into the matrix" and the opposite, which is referred to as "deletions from the matrix". The characteristics of the gas phase, $C_{gas}(p)$ and $S_{gas}(p)$, are directly taken from the pure gas data (Section 3.1).

As for TPI, the efficiency of GCMC can be significantly improved [36] by using the EVMS formalism, which again screens out the dense regions of the matrix with very low insertion probabilities. In practice, the matrix phase is first scanned to identify the volume V_{in} where insertions will be attempted. This defines the EVMS unbiasing factor u_b as:

$$u_b = \frac{V_{in}}{V} \tag{4}$$

GCMC then selects a penetrant molecule from either the gas phase at pressure p or from the matrix phase. Its probability of being moved into the other phase is related to its Boltzmann factor for the energy change upon insertion, $\exp\left(\frac{-\Delta\Phi}{k_BT}\right)$. For the gas phase, the Boltzmann factor simply corresponds to $S_{gas}(p)$ (Eq. (2)), but for the matrix phase, it has to be explicitly calculated. Since there are no insertions into the screened-out part (which would have essentially been associated to negligible Boltzmann factors), the probability of insertion into the matrix phase p_{im} can then be

written as:

$$p_{im} = \frac{\exp\left(-\frac{\Delta\Phi}{kT}\right)}{S_{gas}(p) + \exp\left(-\frac{\Delta\Phi}{kT}\right)} \approx \frac{u_b \exp\left(-\frac{\Delta\Phi}{kT}\right)_{in}}{S_{gas}(p) + u_b \exp\left(-\frac{\Delta\Phi}{kT}\right)_{in}}$$
(5)

Similarly, the probability of insertion into the gas phase p_{ig} takes into account the bias of the EVMS formalism:

$$p_{ig} = \frac{S_{gas}(p)}{S_{gas}(p) + \exp\left(-\frac{\Delta\Phi}{kT}\right)} \approx \frac{S_{gas}(p)}{S_{gas}(p) + u_b \exp\left(-\frac{\Delta\Phi}{kT}\right)_{in}}$$
(6)

The proposed move is then accepted or refused depending on p_{ig} and p_{ip} and this process is repeated many millions of times until detailed balance is obtained, *i.e.* the flux of molecules from the gas phase to the matrix phase is the same as that from the matrix phase to the gas phase. For rigid penetrant molecules, convergence translates into a fairly simple relationship between C_{gas} , S_{gas} and the concentration and the solubility of the penetrant in the matrix phase, C_{matrix} and S_{matrix} at pressure p [28, 36, 80, 81, 89]:

$$\frac{C_{matrix}(p)}{C_{gas}(p)} = \frac{S_{matrix}(p)}{S_{gas}(p)}$$
(7)

Convergence is deemed to be attained once the number of sorbed penetrant molecules in the matrix phase stabilizes and Eq. (7) is obeyed. However, it is important to average over several different configurations of the matrix phase since the penetrant solubilities can significantly vary from one to another. For both CH₄ and CO₂, the typical numbers of GCMC trial moves used here amounted to 20 million *per* configuration and averages were made over 20 separate configurations of the matrix phase.

GCMC is a powerful technique to predict sorption, but since the trials are done on static prestored matrix phase configurations, it is unable to take into account the possible volume changes and relaxation of the matrix following the change in the number of penetrants. It is thus combined with *NPT* MD, which allows for the system to relax following a change in the number of penetrants [45-48]. However, this relaxation perturbs the equality in Eq. (7) and GCMC has to be re-used in order to adapt the number of sorbed penetrant molecules to the newly-relaxed system. A new MD relaxation phase follows and so forth. These iterative GCMC-MD cycles have to be repeated until convergence is obtained. The number of iterative cycles is typically ~5-10 for CH₄ but in general, more iterations, *i.e.* ~5-40 depending on *p*, are required for the highly-plasticizing CO₂ where the extensive volume dilation leads to slow convergence [28, 36]. In the polyOAPS-imide and polyPOSS-imide networks, a CH₄ or CO₂ sorption curve starts with a GCMC phase on 20 representative configurations of the matrix where the target pressure of the virtual gas phase is set to 1 bar. An optimum final configuration is then chosen amongst the 20 and, if necessary, its number of penetrants is adjusted to the average obtained from all the GCMC runs. This configuration is then simulated for 200 ps with *NVT* MD in order to establish thermal equilibrium, before being allowed to relax under *NPT* conditions for 1800 ps with a target pressure of 1 bar. The last 20 MD configurations are then used in a second campaign of GCMC sampling. This is again followed by a second MD simulation of 200 ps under *NVT* conditions and 800 ps under *NPT* conditions. The latter phase is shortened since the number of penetrant molecules added is much less than at the first iteration. This iterative GCMC-MD process then continues until the number of sorbed penetrant molecules in the relaxed matrix phase stabilizes and the concentration ratio equals the solubility ratio (Eq. (7)). Subsequent iterative GCMC-MD simulations are performed in a similar way at different pressures over the whole range considered, *i.e.* in the present case at 2, 5, 10, 20, 40 and 60 bar.

4. Molecular characterization of the polyOAPS/POSS-imide hyper-cross-linked networks

The analyses of the pure networks were all performed at 35°C, *i.e.* at the same temperature than the sorption curves.

4.1. Connectivities

Compounds based on POSS and their phenyl derivative OAPS have a lot of potential in the field of separation membranes [17], but their multi-arm nature gives rise to very complex molecular connectivities. Three main types of organic-inorganic links can be identified [26, 27, 30]. These are by decreasing order of occurrence: i) the intercage single-links, which are imides linked to two different cages, ii) the intracage links, which are imides attached to two arms of the same cage and iii) the intercage double-links, which are two imides linked to two different arms of the same two cages. The number of arms linked *per* cage varies from 0 to 8 and as such the average number of arms linked *per* cage is not sufficient to fully characterize the connectivities. In addition, the actual cross-linking densities, *i.e.* the number of different cages linked to a cage, are lower than the

average number of linked arms *per* cage due to the intracage links and double intercage links. The connectivities were analysed in our screening work at high temperatures [30] and the main features for the eight networks under study are summarized in Table 1. Fig. 2a gives the probability density distributions of the number of arms linked *per* OAPS in all three polyOAPS-6FDA networks and Fig. 2b displays a snapshot of one of them, the poly*para*OAPS-6FDA.

| Connectivities | meta OAPS + PMDA | para OAPS + PMDA | ortho OAPS + PMDA | POSS + PMDA | meta OAPS + 6FDA | para OAPS + 6FDA | ortho OAPS + 6FDA | POSS + 6FDA |
|--|---------------------------|---------------------------|----------------------------|-------------------|---------------------------|---------------------------|----------------------------|-------------------|
| Total no. of atoms | 33672 | 33828 | 33492 | 31644 | 43183 | 43245 | 41974 | 41362 |
| <no. <i="" links="" of="">per cage></no.> | 5.3 | 5.4 | 5.2 | 5.1 | 4.9 | 4.9 | 4.5 | 4.9 |
| <no. <i="" intercage="" links="" of="">per cage ></no.> | 4.6 | 5.1 | 3.3 | 4.3 | 3.7 | 3.7 | 3.9 | 4.1 |
| <no. <i="" intracage="" links="" of="">per cage ></no.> | 0.7 | 0.3 | 1.9 | 0.8 | 1.2 | 1.2 | 0.6 | 0.8 |
| <no. a="" cage="" cages="" different="" linked="" of="" to=""> (= cross-linking density)</no.> | 4.2 | 4.7 | 3.0 | 4.0 | 3.4 | 3.5 | 3.6 | 3.7 |
| <% of cages having only intercage single-links > | 36.6 | 54.6 | 19.9 | 42.6 | 31.0 | 37.0 | 49.1 | 42.1 |
| <% of cages having one intracage link + all others intercage single- links > | 31.5 | 13.9 | 49.5 | 30.1 | 39.8 | 38.9 | 27.3 | 28.7 |
| <% of cages having one intercage double-link + all others intercage single-links > | 26.8 | 24.5 | 7.9 | 19.4 | 15.7 | 13.4 | 16.7 | 19.4 |

 Table 1.
 Detailed connectivities of the polyOAPSimide and polyPOSSimide network models



Fig. 2 (a) Percentages of OAPS cages as a function of their number of arms linked in the three polyOAPS-6FDA networks. (b) Schematic representation of a (50 Å)² subset of the poly*para*OAPS-6FDA network (colour code: yellow = Si, red = O, cyan = C, blue = N, green = F, white = H).

All these networks have an average number of links *per* cage of ~5, although the distributions are quite broad (Fig. 2a). In addition, the proportions of intercage and intracage links vary significantly depending on the nature of their precursors. A higher average number of intercage links is clearly an asset for the mechanical resistance, and in this respect, the PMDA networks appear better than the 6FDA networks. However, there is one exception, the poly*ortho*OAPS-PMDA, where the combination of the *ortho* geometry and the short PMDA linker makes it harder to form intercage links but leads to a higher proportion of intracage links. This is confirmed by the average characteristic distances and angles for intercage links reported in Table 2, *i.e.* the intercage Si^{\cong}Si distances (which represent the total length of the linkers) and the imide N^{\cong}centre^{\cong}N angles (with the centres being the two middle aromatic carbons for PMDA and the (CF₃)₂-carrying carbon for 6FDA). The *ortho*OAPS behave significantly differently from the *para* and *meta* isomers with a tendency for its organic linker to be stretched in the case of the flexible 6FDA, whereas this is hardly possible with the rigid PMDA (Table 2).

| Intercage links | meta OAPS + PMDA | para OAPS + PMDA | ortho OAPS + PMDA | POSS + PMDA | meta OAPS + 6FDA | para OAPS + 6FDA | ortho OAPS + 6FDA | POSS + 6FDA |
|---|---------------------------|---------------------------|----------------------------|-------------------|---------------------------|---------------------------|----------------------------|-------------------|
| < SiSi distances> / Å (±0.01) | 15.49 | 16.90 | 11.09 | 13.31 | 15.08 | 15.75 | 13.67 | 14.44 |
| < N centreN angles> / deg. (±0.1) | 132.9 | 132.4 | 133.1 | 133.4 | 98.0 | 94.2 | 106.9 | 102.8 |

 Table 2.
 Average intercage Si^{...}Si distances and imide N^{...}centre^{...}N angles

The cross-linking density, *i.e.* the number of different cages linked to a cage, is ~3.8 on average and actually correlates very well with the number of intercage links. There is a rather large proportion of cages having either one intralink (which does not reinforce the network), or one intercage double-link (which reinforces the structure but counts as one for the cross-linking density). However, it is usually either one or the other, and as such their effects of one unaccounted link compensate in terms of the cross-linking density. It is also possible to get more complicated connectivities with either two intracage links or one intracage and one intercage double-link, but their occurrence is very limited because of the large steric constraints imparted on such structures.

4.2. Densities

The relaxed densities at 35°C, $\rho_{network}$, are shown in Fig 3. The energies, which are given in Table S4 (Supp. Info) show no indications of specific molecular strains.



Fig. 3 Compared average densities ρ_{network} for the polyOAPS-imides and polyPOSS-imides. The maximum standard error is 0.001 g cm⁻³.

The density clearly depends on both types of precursors. While there are no experimental densities available yet on such thin-films, the model densities for all the precursors were tested

earlier and found to be very close to their respective experimental values [26, 27, 30]. This provides confidence that cohesion is properly represented in the models. As far as the organic precursors are concerned, the flexible 6FDA leads to denser systems because of its better ability to pack. When compared to PMDA, the initial 6FDA-based model mixtures are denser, their polyPOSS-(amicacid) intermediates are denser and there is a larger volume loss per H₂O upon imidization [26, 27, 30], which is consistent with the experimental refractive indices [21]. On the other hand, the stiffer PMDA does not adapt well to the steric constraints introduced by cross-linking and this leads to more free volume in the corresponding networks. As far as the inorganic precursors are concerned, the ρ_{network} vary in the order paraOAPS < metaOAPS < orthoOAPS. This can be related to their molecular dimensions in the pure state, *i.e.* an average length (defined as twice the average distance between the centre of a siloxane cage and its eight primary amine N) of ~17.4 Å for the para, ~15.5 Å for the *meta* and ~10.2 Å for the *ortho* isomers, respectively. Interestingly, the differences are very much enhanced when associated to the stiff PMDA precursor. This results in polyorthoOAPS-PMDA being a much denser structure than its other isomers as it combines the constraints of both its inorganic and organic precursors. It is also denser than the polyPOSS-PMDA as its average Si^{...}Si distance is shorter (see Table 2).

4.3. Free-volume morphology

In molecular simulations of dense matrices, the free-volume or void-space can be characterized using different techniques [23, 43, 90, 91]. A simple geometric approach is the percentage of probe-accessible volume, % PAV, which is obtained by repeated random trial insertions of a virtual spherical probe of predefined radius [92]. The insertions are only successful when the probe does not overlap with the matrix atoms, represented in this particular analysis as hard spheres with standard van der Waals radii [93]. In the present case, up to 20 insertions of a probe of radius 1.784 Å (half the N₂ kinetic diameter [94]) were attempted for each Å³ of the 400 configurations stored in the production runs. The average % PAV thus characterizes the fraction of void-space that can accommodate such a spherical probe without any assumptions on the forms of the holes and without any energetic considerations. Smaller probe sizes such as He can be used too, but they can insert into very small holes, where there are hardly any chances of getting any other penetrants. As such, half the N₂ kinetic diameter is a good compromise between avoiding those

holes that are too small and still being able to sample the more significant ones. The $\langle PAV_0 \rangle$ (with the subscript "0" referring to the pure matrices) are displayed in Fig 4, and as for the other properties, they vary depending on both types of precursors. They generally correlate negatively with the densities (Fig. 3) and confirm that the phenyl-arm OAPS isomers result in much more open structures than the aliphatic-arm POSS. The maximum amount of accessible void-space is reached for poly*para*OAPS-PMDA, which combines the linear arms of the *para* isomer with the linear geometry of the stiff PMDA linker. However, both the other two OAPS isomers also create more space than the flexible -(CH₃)-NH₂ POSS linkers because of the intrinsic planarity and rigidity of their phenyl rings. Once again, the differences are enhanced when associated to the PMDA organic linker, as it only allows limited relaxation of the network upon imidization [27]. On the other hand, the ability to stretch of the 6FDA angle, which is especially noticeable in the case of the poly*ortho*OAPS-6FDA (Table 2), somewhat relaxes the constraints of the inorganic precursor.



Fig. 4 Average percentage of probe-accessible volume, $\langle \% PAV_0 \rangle$, for trial insertions of a spherical probe of radius 1.784 Å in the pure polyOAPS-imide and polyPOSS-imide networks. The maximum standard error is 0.02%.

A more elaborate assessment is provided by the TPI method (Section 3.1.), which accounts for both the geometric and energetic dependence of the penetrant solubility in the pure matrices. The Boltzmann-weighted probability density distributions $\rho_w(\Delta\Phi)$ (Eq. (3)) upon insertion of realistic CH₄ or CO₂ model probes [53, 54] support the Gaussian site-distribution model [95, 96] and provide the range of site energies for penetrant adsorption [27, 83, 90]. The lower $\Delta\Phi$ are associated to the most favourable and the higher $\Delta\Phi$ to the least favourable sites for insertion. A comparison of the $\rho_w(\Delta\Phi)$ for both CH₄ and CO₂ in the polymetaOAPS-PMDA network (Fig. 5a) shows their large difference in infinite-dilution solubility $S_{matrix0}$, which is obtained from the area under these curves [28]. Figs. 5b-c compare the $\rho_w(\Delta\Phi)$ for CH₄ and CO₂ in all PMDA networks. The $\rho_w(\Delta\Phi)$ for the 6FDA networks are rather similar on the same scales (Figs. 5d-e), which suggests that the free-volume morphology is mostly governed by the nature of the inorganic precursor, although the influence of the organic linker is more noticeable in certain cases, *e.g.* the *para*OAPS with CO₂.



Fig. 5 Boltzmann-weighted probability density distributions $\rho_w(\Delta \Phi)$ for the insertion energy $\Delta \Phi$ of a CH₄ or a CO₂ molecule in the networks. (a) compares the $\rho_w(\Delta \Phi)$ for both penetrants in the poly*meta*OAPS-PMDA matrix. (b) and (c) show the $\rho_w(\Delta \Phi)$ for CH₄ and CO₂, respectively, in the PMDA networks. (d) and (e) show the corresponding data for the 6FDA networks.

All the networks exhibit fairly homogeneous Gaussian-like distributions over a range of highenergy to low-energy sites, which are displaced towards the lower $\Delta\Phi$ for CO₂. The largest standard deviations are found for the *para*OAPS isomer, where the low density is associated to a large variety of hole morphologies. However, the integrals under the $\rho_w(\Delta\Phi)$ curves, *i.e.* the *S_{matrix0}*, are almost as high in the *meta*OAPS networks, as opposed to the *ortho*OAPS and POSS networks. The most energetically-favourable sites for the insertion of CO₂ (corresponding to $\Delta \Phi/k_BT < -15$) are superimposed with the siloxane cages and the inorganic arms in Fig. 6 (low energy sites in yellow, cages in red, inorganic arms in green, primary amine or imide N in blue). The rest of the organic imides and the hydrogens are omitted from Fig. 6 and the images are clipped on thicknesses of a few Å to better visualize the positions of the lowest energy sites with respect to the inorganic phase.

(a) polymetaOAPS-PMDA

(c) poly*ortho*OAPS-PMDA



(b) polyparaOAPS-PMDA



(d) polyPOSS-PMDA



Fig. 6 Schematic representations of the most favourable sites for the insertion of CO₂ (corresponding to $\Delta \Phi/k_BT < -15$) in the four PMDA networks. The low-energy sites are displayed in yellow, the siloxanes cages in red, the inorganic arms (cross-linked and uncross-linked) in green and the N (either from -NH₂ or from imides) in blue.

The lowest-energy sites are well-spread in both the *para*OAPS and the *meta*OAPS networks. In these matrices, most of them are close to the siloxane cage oxygens, *i.e.* they are found in the spaces between the cross-linked and/or un-cross-linked OAPS arms (Figs. 6a-b). There are even extended clusters of very low energy sites (Fig. 6b). On the other hand, the *ortho*OAPS geometry prevents

access to the cages, its low-energy sites are less numerous and tend to be closer to the arms of the inorganic precursor but further away from the cages (Fig. 6c). For POSS, the lowest-energy sites are mostly spread in the organic phase (Fig. 6d). The various $\rho_w(\Delta\Phi)$ result in significantly-different infinite-dilution solubilities $S_{matrix0}$. Their relative values with respect to those of the highest-solubility networks $S_{matrix0-max}$, *i.e.* the poly*meta*OAPS-PMDA for CH₄ and the poly*para*OAPS-PMDA for CO₂, are provided in Table 3. The *ortho*OAPS and POSS $S_{matrix0}$ are indeed roughly half of those in the *para*OAPS and *meta*OAPS networks. As noted from Fig. 5, the organic PMDA or 6FDA linker has much less of an influence on the $S_{matrix0}$.

Table 3. Relative infinite-dilution solubilities $S_{matrix0} / S_{matrix0-max}$ with a maximum error of ~1% and average fractions of significant volume $\langle\%FSV_0\rangle$ for the insertion of CH₄ and CO₂ in the pure matrices.

| | meta OAPS + PMDA | para OAPS + PMDA | ortho OAPS + PMDA | POSS + PMDA | meta OAPS + 6FDA | para OAPS + 6FDA | ortho OAPS + 6FDA | POSS + 6FDA |
|---|---------------------------|---------------------------|----------------------------|-------------------|---------------------------|---------------------------|----------------------------|-------------------|
| $\frac{S_{matrix0}}{S_{matrix0-max}}$ for CH ₄ | 100% | 94% | 45% | 50% | 95% | 86% | 43% | 40% |
| $\frac{S_{matrix0}}{S_{matrix0-max}} \text{ for CO}_2$ | 93% | 100% | 51% | 42% | 89% | 82% | 34% | 33% |
| <% <i>FSV</i> ₀ > for CH ₄ | 7.5 | 16.4 | 2.8 | 1.2 | 3.3 | 5.8 | 5.5 | 1.0 |
| <% <i>FSV</i> ₀ > for CO ₂ | 4.4 | 8.5 | 1.6 | 0.8 | 2.0 | 3.5 | 3.4 | 0.6 |

A related property is the fraction of significant volume (*FSV*), which is the part of the matrix actually responsible for the penetrant solubility, and can be estimated from the unweighted $\rho(\Delta\Phi)$ and weighted $\rho_w(\Delta\Phi)$ distributions [52]. To account for 100% of the solubility would mean considering all energies from $-\infty$ to $+\infty$. However, Fig. 5 shows clearly that the integrals of the weighted functions will reach a plateau relatively quickly as the insertion energy increases. As such, it is possible to define a critical upper limit of the integral over $\rho_w(\Delta\Phi)$ that accounts for 99.9% of the solubility, and which we refer to as $\Delta\Phi_c$. The *FSV* is the fraction of random insertions that lead to energies in the range from $-\infty$ to $\Delta\Phi_c$ and thus contribute in practice to 99.9% of the solubility. It is given by the integral of the normalized unweighted probability density $\rho(\Delta\Phi)$ up to the critical upper limit $\Delta\Phi_c$ (Eq. (8)):

$$FSV = \int_{-\infty}^{\Delta\Phi_c} \rho(\Delta\Phi) d\Delta\Phi \tag{8}$$

The $\langle \%FSV_0 \rangle$ for both penetrants in the pure matrices are reported in Table 3 along with the relative infinite-dilution solubilities. For methane, the $\langle \%FSV_0 \rangle$ are close to the $\langle \%PAV_0 \rangle$ obtained from the geometric insertion of a spherical probe (Fig. 4). This suggests that the solubility of CH₄ mostly comes from the available void-space in the matrix. For the more soluble CO₂, the insertion energy distributions are displaced towards much lower energies (Fig. 5a). Only those sites that provide favourable interactions give a significant contribution to the solubility, thus the fraction of useful volume for insertion in the matrix, $\langle \%FSV_0 \rangle$ for CO₂, decreases. However, the relative order remains the same as that of the $\langle \%PAV_0 \rangle$ and the methane $\langle \%FSV_0 \rangle$, which confirms the importance of the amount of available void-space in the pure matrix in addition to the interactions.

5. Single-gas sorption isotherms for CH₄ and CO₂ in the polyOAPS/POSS-imide networks

The CH₄ and CO₂ sorption isotherms in the networks under study were obtained at 35°C and over the full 0-60 bar range by using the iterative GCMC-MD technique. As mentioned in Section 3.2., it is important to average the GCMC sorption phase over enough configurations and to allow the MD relaxation phase to properly sample the slow changes in the matrices [36]. As for other glassy materials [83, 84, 86, 97], the network mean-square displacements at 35°C are typically of the order of 1-2 Å² over time-intervals of 1 ns. Relaxations thus only occur on a local scale, and furthermore, they are very slow on the timescale of MD simulations [28, 85].

Fig. 7a illustrates the variations in the number of sorbed CO₂ predicted by GCMC for a gas reservoir pressure of 1 bar over just one million trials for 20 successive stored configurations (separated by 5 ps intervals) of the pure poly*para*OAPS-6FDA network. Although this only represents the start of a full 20-million-trial GCMC phase, the number of sorbed CO₂ molecules between specific configurations can already differ from the average by ~ ± 50 , *i.e.* ~ $\pm 10\%$ of the average number sorbed. Averaging over a sufficient number of configurations thus strongly reduces this source of error.



Fig. 7. (a) Variations in the number of sorbed CO₂ at 1 bar predicted by GCMC for 20 successive configurations of a pure network (thin lines with different colours). Only the first million trials of the GCMC phase are shown and the average number of sorbed CO₂ is indicated by the thick blue line with squares (b) The slow volume relaxation associated with the uptake of CO₂ from 40 to 60 bar in the poly*ortho*OAPS-PMDA network as a function of the number of GCMC-MD iterations.

Fig. 7b shows the number of successive GCMC-MD iterations needed for the volume to stabilize when the poly*ortho*OAPS-PMDA network at 40 bar of CO₂ is further loaded up to 60 bar. The gradual volume swelling upon CO₂ sorption leads to a rise in the solubility and consequently, the number of sorbed CO₂ has to be regularly re-adjusted with GCMC, re-relaxed with MD and so on. Several combinations for the number of iterations and the length of the MD phase have been proposed [36, 45-48, 50]. In all cases, the most critical point is to take into account as much as possible the slow matrix relaxation of the system under study, especially when strongly-plasticizing penetrants such as CO₂ are considered.

The actual uptake curves showing the penetrant concentration in the matrix $C_{matrix}(p)$ as a function of the gas pressure p are provided in Figs. 8a-b for CH₄ and in Figs. 8c-d for CO₂. The same data are presented as a function of the gas fugacity in Fig. S5 of the Supp. Info. Both pressure or fugacity representations can be used [98, 99], the curves are similar and the relative order remains the same. The matrices, which all contain between 30000 and 45000 atoms (Table 1), are large enough to provide significant statistics on the uptakes [36]. Indeed, the maximum standard errors on the $C_{matrix}(p)$, which were estimated using the method given in Ref. [87], are only 0.3

 $cm^{3}(STP)/cm^{3}$ for CH₄ and 0.7 $cm^{3}(STP)/cm^{3}$ for CO₂. As such, they are smaller than the symbols on the scale of Fig. 8.



Fig. 8. Single-gas sorption isotherms: the concentrations $C_{matrix}(p)$ of penetrants in the networks plotted as a function of pressure p as obtained using the iterative GCMC-MD method for (a-b) CH₄ and (c-d) CO₂. In all cases, the standard errors are less than the size of the symbols.

The $C_{matrix}(p)$ vs p curves are Type I adsorption isotherms [100], and can be fitted over the entire pressure range to the dual-mode sorption (DMS) model [101]. The DMS formalism and the fit parameters corresponding to Fig. 8 are provided in the Supp. Information (Table S6). As expected from their critical temperatures [102], CO₂ sorbs more than CH₄, but the concentrations in the polyOAPS-imides also depend on both their inorganic and organic precursors. Interestingly, the $C_{matrix}(p)$ for the polyPOSS-PMDA and polyPOSS-6FDA are almost superimposable for a specific penetrant. This has already been investigated for a lower cross-link density [28]. When compared to polyPOSS-PMDA, the polyPOSS-6FDA matrix sorbs more penetrant molecules because of its

greater proportion of organic phase, but it is compensated for in the $C_{matrix}(p)$ by the difference in the volumes. This is not the case for the polyOAPS-imide networks, where the sorption varies in the order *para*OAPS > *meta*OAPS > *ortho*OAPS and PMDA > 6FDA (except when associated to the *ortho*OAPS isomer). All of them have a higher sorption capacity than the aliphatic-arm POSS as suggested by the free-volume analyses (Section 4.3.). There again, the differences are enhanced for the PMDA networks, with a clear distinction between the high-solubility *para*OAPS/*meta*OAPS on one side and the lower-solubility *ortho*OAPS/POSS on the other side. The trends in sorption thus directly reflect the morphology of the pure networks (Figs. 5-6 and Table 3). In the case of the 6FDA networks, the $\langle \% PAV_0 \rangle$ and $\langle \% FSV_0 \rangle$ for the *ortho*OAPS are much higher than for the POSS (Fig. 4 and Table 3), and this brings the *ortho*OAPS uptake curves closer to the other two isomers.

Although it is difficult to measure small volume changes in experimental samples [103-106], the dilations of the matrices upon sorption can be easily monitored in molecular models. Fig. 9 displays the volume swelling of each network as a function of $C_{matrix}(p)$ for both its CH₄ and CO₂ uptake curves.



Fig. 9. Percentage of volume swelling in the eight networks as a function of the sorbed penetrant concentration in the matrix $C_{matrix}(p)$ for (**a-b**) CH₄ and (**c-d**) CO₂. Please note that, unlike Fig. 8, the scales used for CO₂ are different from those for CH₄.

The volume swelling curves in Fig. 9a-b are consistent with the mildly-plasticizing nature of CH₄, which usually leads to maximum dilations of 2-3% in glassy polymers on that pressure range [81]. On the other hand, CO₂ is a highly-plasticizing penetrant and as shown by Fig. 9c-d, it is able to lead to dilations of up to 10-20% at the highest pressures under study [36, 97]. The average partial molar volumes (*pmv*) estimated from the limiting slopes of the volume *vs* number of sorbed molecules are ~26 cm³ mol⁻¹ for CO₂ and ~14 cm³ mol⁻¹ for CH₄, in agreement with the experimental *pmv* in polyimides [103, 105, 107]. However, Fig. 9 clearly shows that the networks display different resistances to plasticization when compared at equivalent *C_{matrix}(p)*. The *meta*OAPS and *para*OAPS isomers with PMDA swell less as a function of penetrant concentration due to their lower densities (Fig. 3) and associated higher free volumes (Fig. 4 and Table 3). There is even some evidence of a slight contraction at moderate *p* due to the amount of unrelaxed free-volume in these systems [27] and the extra cohesion energy provided by the sorption of penetrants.

In the case of 6FDA, a similar, albeit less pronounced, retarded swelling behaviour can be seen for OAPS, which again correlates well with their densities and free volumes. As for the uptake curves (Fig. 8), the *ortho*OAPS behaves similarly to POSS when associated to PMDA, and closer to *meta*OAPS when associated to 6FDA. However, in general, the swelling at the same $C_{matrix}(p)$ varies in the order *para*OAPS < *meta*OAPS < *ortho*OAPS < POSS. This reduced amount of swelling is an asset for the OAPS precursor as it offsets its larger sorption capacities, thus limiting the decrease in selectivities [108, 109].

To relate the total swelling (Fig. 9) to that of the actual free-volume, the average probeaccessible volume $\langle PAV \rangle$ was analysed for all pressures *p* as for the $\langle PAV_0 \rangle$ of the pure matrices (Fig 4), but under two conditions: (i) by including or (ii) by excluding all the other penetrant molecules in the system. Condition (i) follows the filling-up of the accessible freevolume, while condition (ii) probes its relative swelling. The decrease (upon filling-up) and increase (upon swelling) of the $\langle PAV(p) \rangle$ with respect to the $\langle PAV_0 \rangle$ of the pure matrices are reported in Fig. 10 as a function of the sorbed CO₂ concentrations. The trends were similar for methane.



Fig. 10. Relative average percentage of probe-accessible volume $\langle \% PAV(p) \rangle$ with respect to that of the pure matrix $\langle \% PAV_0 \rangle$ as a function of the sorbed CO₂ concentration in the matrix $C_{matrix}(p)$ while (**a-b**) including and (**c-d**) excluding the other CO₂ present in the matrix

Figs. 10a-b show the decrease in $\langle \% PAV(p) \rangle$ as $C_{matrix}(p)$ increases and confirm the retarded swelling of the OAPS networks due to part of their free-volume still being accessible. As noted above, the $\langle \% PAV_0 \rangle$ and $\langle \% FSV_0 \rangle$ for the three isomers are closer when associated to 6FDA than to PMDA, which explains the similarity of the OAPS curves in Fig. 10b. The swelling of the free-volumes (Figs. 10c-d) also correlates with the $\langle \% PAV_0 \rangle$. In the PMDA networks, both the *ortho*OAPS and POSS are filled up rapidly and have to start swelling at low $C_{matrix}(p)$ to accommodate more penetrants. On the other hand, the *meta*OAPS and *para*OAPS still have free-volume available, and as such, the volume swelling only appears at much higher $C_{matrix}(p)$. In the 6FDA networks, the situation is similar for POSS, but not for the three OAPS isomers. The lowest $\langle \% PAV_0 \rangle$ is found in *meta*OAPS follows the *meta*OAPS but it is not able to swell as much, thus limiting the uptake. The *para*OAPS is always the least dense structure and can thus sorb a lot

of penetrants before it has to swell. However, its swelling ability is almost as good as the *meta*OAPS, which in turn further increases its sorption capacity. There is thus an added effect of the organic-inorganic connectivity in their swelling behavior.

Radial distribution functions g(r) for the C in CH₄ and the O in CO₂ were used to characterize the actual interaction sites of the penetrants in the networks. A g(r) between atom-types *i* and *j* gives the average probability of finding n_j atoms of type *j* around an atom of type *i* within a spherical shell of volume $4\pi r^2 \delta r$ relative to that expected from a random distribution at the same number density for type *j*, ρ_i (Eq. (9)):

$$g(r) = \frac{n_j}{4\pi r^2 \delta r \rho_j} \tag{9}$$

The histograms are collected using bins of equal radial width and the g(r) are normalized accordingly taking into account the increase of the volume as r increases. The closest interactions are the same as those in polyimides [36, 83, 84, 86, 97], *i.e.* the penetrants easily approach the imide ketone oxygens and the fluorine groups on the 6FDA moiety. However, as seen in Fig. 6, there are also preferential sites in the vicinity of the siloxane cages and the OAPS phenyl rings. Representative g(r) are compared at the same pressure (20 bar) in Fig. 11.



Fig. 11. Radial distribution functions g(r) for specific interactions between the penetrants (C atom for CH₄ and O atom for CO₂) and different atom-types in the networks. The legend is the same for all plots.

The g(r) confirm that the penetrants occupy easily-accessible sites, which include those close to the protruding groups of the organic imide moieties and the pendant NH₂ groups on the unreacted OAPS or POSS arms (Figs. 10c-e). There are also less-accessible sites in the immediate vicinity of the siloxane cages, *i.e.* close to the O in between the arm-bearing Si atoms, except for the *ortho*OAPS (Fig. 10a) where the reacted and unreacted -NH₂ groups in the *ortho* position naturally

occlude the space close to the cage. In general, the penetrants favour the organic phase in the POSS networks, which contains their lowest-energy sites (Fig. 6). On the other hand, the lowest-energy sites of the OAPS networks are closer to the cages and in the vicinity of their phenyl arm linkers (Fig. 11b). As expected, the behaviour of the penetrants in the *para*OAPS and *meta*OAPS networks is quite similar, while the *ortho*OAPS differs because of its specific features. At higher pressures, the preferential interactions do not change as the general increase in the free-volume is affine with the amount of volume swelling (Figs. 9-10) [36, 84]. There are no signs of permanent clusters forming, even if some penetrant molecules tend to find themselves close to others, especially at high pressures. Snapshots of CH₄ sorbed in the poly*meta*OAPS-6FDA matrix and CO₂ sorbed in the poly*para*OAPS-PMDA matrix at different pressures are provided in Fig. 12. In addition, 3D animations of the poly*para*OAPS-PMDA and poly*ortho*OAPS-PMDA simulation boxes loaded with 20 bar of CO₂ can be found in the Supporting Information.



Fig. 12. $\sim (20 \text{ Å})^2$ close-ups of the poly*meta*OAPS-6FDA network loaded with CH₄ (top pictures) and the poly*para*OAPS-6FDA network loaded with CO₂ (bottom pictures). The colour code is the same as in Fig. 2.

The ideal CO₂/CH₄ sorption selectivities can be obtained from the sixteen uptake curves (Fig. 8) as:

$$\alpha_{CO_2/CH_4}^S(p) = \frac{C_{matrix-CO_2}(p)}{C_{matrix-CH_4}(p)}$$
(10)

and they are given in Fig. 13.



Fig. 13. Ideal CO₂/CH₄ sorption selectivities (Eq. (8)) at 35°C for the eight networks under study

Although it could have been expected that the lower densities and higher fractions of void-space in the polyOAPS-imides would lead to a significant decrease in the sorption selectivities, this is not the case. The selectivities are only slightly smaller than those in the denser polyPOSS-imides and are still consistent with experimental CO_2/CH_4 sorption selectivities found in polyimides [110, 111]. The sorption selectivity in these hyper-cross-linked networks thus does not seem to be affected by the set of inorganic and organic precursors studied here. There could be larger differences in the diffusion selectivities and that will be the subject of future work.

6. Mechanical resistances of the polyOAPS/POSS-imide networks

In addition to the sorption-induced swelling, separation membranes need to be able to resist other mechanical stresses when subjected to harsh conditions. The network resistance to isotropic dilation and uniaxial tension has already been evaluated at high temperatures (300° C and 400° C) during our initial screening stage [30], but we briefly present here the corresponding results at 35° C, which were obtained from additional MD simulations. The isotropic volume dilation was tested by simultaneously reducing the *xx*, *yy* and *zz* on-diagonal components of the pressure tensor and the uniaxial extension by only changing the *yy* component. In both cases, the rate of deformations was -1 bar/ps. In spite of the rates of deformation accessible to the MD timescale being very fast, such simulations are still able to provide a reasonable comparison of the intrinsic mechanical properties [26, 27, 112, 113]. The resistances to isotropic dilation and uniaxial tension at 35° C for the eight networks under study are given in Fig. 14.



Fig. 14 (a-b) Isotropic dilation curves at 35°C for the polyOAPS-imide and polyPOSS-imide networks under study, (c) uniaxial stress-strain curves for the PMDA networks and (d) average Young's moduli *E* for the 6FDA networks. The maximum standard error on E is 0.05 GPa.

Both tests show the same trends (Fig. 14). At the very start, the polyPOSS-imides resist better against the deformations as they are dense and have the smallest $\langle PAV \rangle$ (Figs. 3-4). As such, they have the highest yield stresses in the dilation tests (Figs. 14a-b) and the highest elastic moduli in the tension tests (Fig. 14c-d). The model *E* agree well with the experimental moduli reported for closely-related structures [27, 114, 115]. The initial deformation of the polyPOSS-imides is then followed by a ductile behaviour typical of cold-drawing and a subsequent strain hardening stage. On the other hand, the polyOAPS-imides strain harden at much lower values of the dilation/extension because of their phenyl linkers, thus strongly limiting the ductile stage. The *ortho*OAPS tends to bring added resistance, as does the stiffer PMDA. For the flexible 6FDA, the organic linker is already extended when associated to *ortho*OAPS, unlike for the *para* and *meta* isomers where it has more scope for deformation (Table 2). However, in all cases, the polyOAPS-

imides consistently outperform the polyPOSS-imides in terms of strain hardening, which confirms their better overall mechanical resistance.

5. Conclusions

In this work, the molecular characteristics and sorption capacities at 35° C were compared for a series of hybrid hyper-cross-linked model networks based on cubic Si₈O₁₂ cages covalently bonded with imides, in which the inorganic linkers originate either from POSS (with aliphatic -(CH₂)₃-NH₂ arms) or from OAPS (with phenyl -C₆H₄-NH₂ arms). PolyPOSS-imide membranes have already been synthesized using interfacial polycondensation on ceramic porous supports [18-21] and upgraded to tubular modules [25]. However, they cannot be used above 300°C due to the decomposition of their aliphatic -(CH₂)₃- linkers [21, 26, 27]. Using the phenyl-arm OAPS as the inorganic precursor should increase their thermoresistance, but it has three possible isomers depending on the *meta*, *para* or *ortho* position of the -NH₂ group on the phenyl ring.

To avoid a long programme of synthesis, a large number of molecular networks based on the three isomers of OAPS and on the PMDA, 6FDA and ODPA imides were recently modelled at different cross-link densities [30]. Their thermoresistance was screened at 300°C and 400°C and six promising networks, *i.e.* the three polyOAPS-PMDA and the three polyOAPS-6FDA with the maximum cross-link densities, were selected for further examination of their sorption properties at 35°C. These are compared here to those of the corresponding polyPOSS-imides generated under exactly the same conditions.

The network connectivities and morphologies are highly dependent on their precursors. All of them have an average number of ~5 links per cage, but these include intercage single-links and double-links as well as intracage links, thus reducing the actual cross-linking densities to an average of ~3.8. The *meta*OAPS and *para*OAPS networks have rather similar Si^{...}Si bridging distances and imide N^{...}centre^{...}N angles, unlike the *ortho* functionalization, which leads to connectivities closer to those of the POSS. Densities vary quite a lot, and differences are enhanced when the inorganic precursor is associated to the stiffer PMDA imide.

The TPI method, combined to the EVMS formalism for added efficiency, was used to obtain the infinite-dilution solubilities of CH₄ and CO₂ penetrant molecules as well as the underlying distributions of insertion energies. The free-volume morphology analyses showed that the phenylarm OAPS all result in more open structures than the POSS, although the *ortho*OAPS Boltzmannweighted probability density distributions for the insertion energies of the penetrants are closer to POSS than to *meta*OAPS and *para*OAPS. Both the latter have high solubilities because of very favourable sites in the spaces between the OAPS arms. On the other hand, *ortho*OAPS inherently prevents access to the cages and its low-energy sites tend to be close to the phenyl rings but further away from the cages. This is more similar to POSS, where the lowest-energy sites are spread in the organic phase.

The iterative GCMC-MD approach was used to predict both the CH₄ and CO₂ sorption isotherms at 35°C over the 0-60 bar pressure range in the eight networks under study. The sorption capacities varied in the order *para*OAPS > *meta*OAPS > *ortho*OAPS > POSS, in agreement with their larger amounts of accessible volume. Once again, the behaviour of *ortho*OAPS was closer to that of POSS, except that it had a significantly higher fraction of its volume available for penetrant insertion in the 6FDA networks. In all cases, systems with the OAPS precursor showed less swelling when compared at equivalent penetrant concentrations in the matrix. However, their CO₂/CH₄ ideal sorption selectivity remained essentially the same at equivalent gas pressures.

Further mechanical isotropic dilation and uniaxial tension tests confirmed the better strain hardening response of the polyOAPS-imides due to the phenyl arms. The polyOAPS-imides are thus interesting because of their better sorption capacities and their added resistance to mechanical deformation whilst still keeping a similar sorption selectivity to the polyPOSS-imides. Diffusion and transport properties at higher temperatures will be analysed in a future work.

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Nomenclature

| C_{gas} | concentration of the penetrant in the gas phase |
|-------------------------|---|
| C _{matrix} | concentration of the penetrant in the matrix phase |
| FSV | fraction of significant volume |
| k_B | Boltzmann's constant |
| Р | pressure tensor |
| р | pressure |
| PAV | probe-accessible volume |
| p_{ig} | probability of an insertion in the gas phase |
| p_{im} | probability of an insertion in the matrix phase |
| S_{gas} | solubility of the penetrant in the gas phase |
| Smatrix | solubility of the penetrant in the matrix phase |
| Т | temperature |
| Иb | unbiaising factor in the EVMS method |
| V | volume |
| Vin | volume where insertions will be attempted in the EVMS method |
| $\alpha^{\rm S}$ | ideal sorption selectivity |
| $\mu_{_{gas}}$ | chemical potential of the penetrant molecule in the gas phase |
| $\mu_{\textit{matrix}}$ | excess chemical potential of the penetrant molecule in the matrix phase |
| $\Delta \Phi$ | change in potential energy for the (virtual) insertion of a test particle |
| $\Delta \Phi_{\rm c}$ | critical upper limit in the insertion energy used to define the FSV |
| $ ho(\Delta\Phi)$ | normalized probability density of $\Delta\Phi$ |
| $ ho_w(\Delta\Phi)$ | Boltzmann-weighted normalized probability density of $\Delta\Phi$ |

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