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Maxwell–Stefan modeling of slowing-down effects in mixed gas permeation across porous membranes

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A B S T R A C T

Micro- and meso-porous materials such as zeolites, metal-organic frameworks (MOFs), covalent-organic frameworks (COFs), zeolitic imidazolate frameworks (ZIFs), Vycor glass, MCM-41, and SBA-15 are used in membrane separation in a wide variety of applications such as $CO₂$ capture. For process development and design purposes the Maxwell–Stefan (M–S) equations are widely used for modeling mixed gas permeation. In the M–S formulation we have basically two types of diffusivities: (a) *Ð*i, that characterize species i –wall interactions in the broadest sense and (b) exchange coefficients D_{ii} that reflect how the facility for transport of species i correlates with that of species j. Such correlations have the effect of slowing-down the more mobile partner species in the mixtures. In many cases the B_i corresponds to the value of the pure componenti; consequently these can be estimated from unary permeation data. The *Ð*ij, on the other hand are not directly accessible from experimental data. The major objective of this communication is to stress the importance of proper estimation of the exchange coefficients *Ð*ij. To achieve this objective, and to illustrate the variety of issues involved, we consider permeation of $CO₂/H₂, CO₂/CN₂, CO₂/CH₄,$ and $CH₄/H₂$ mixtures across membranes with crystalline layers of four different materials: MFI(intersecting channels of 5.5 Å size), BTP-COF (one-dimensional hexagonal-shaped channels of 34 Å), LTA-Si zeolite (11.2 Å cages separated by 4.11 Å \times 4.47 Å sized windows), and MgMOF-74 (1D hexagonal-shaped channels of 10.4 Å size). The required data on pure component adsorption isotherms are obtained from configurational-bias Monte Carlo (CBMC) simulations. The M–S diffusivities are determined from molecular dynamics (MD) simulations.

Our studies show that the permeation selectivities are crucially dependent on the proper modeling of the correlation effects. Increased upstream feed pressures lead to significant enhancement in permeation selectivities; this enhancement is directly traceable to the increase of the correlation effects with increased loadings. Use of some commonly used approaches, suggested in the published literature, lead to severe underestimation of permeation selectivities.

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1. Introduction

A wide variety of micro- and meso-porous materials are of potential use in separation applications, such as $CO₂$ capture [\[1–11\].](#page-10-0) Examples of micro-porous materials include zeolites (crystalline aluminosilicates), metal-organic frameworks (MOFs), covalentorganic frameworks (COFs), zeolitic imidazolate frameworks (ZIFs), carbon nanotubes (CNTs), carbon molecular sieves (CMS), and titanosilicates (such as ETS-4, and ETS-10). Examples of mesoporous materials include SBA-16, MCM-41, and Vycor glass. In the case of mixed matrix membranes, zeolites, MOFs, ZIFs, or CNTs are embedded within a polymer or silica matrix [\[12–15\].](#page-10-0)

For the development of membrane separation technologies, there is a need for proper modeling of mixture permeation across the chosen membrane material. The appropriate models to describe mixture permeation must take proper account of the influence each of the diffusing species exerts on its partner molecules. Generally speaking, the tardier species has a retarding influence on the more mobile species. For illustration purposes consider the experimental data of Sandström et al. [16] for permeances of $CO₂$ and $H₂$ across an MFI zeolite membrane of 0.7 μ m thickness. MFI zeolite consists of a set of intersecting channels of approximately 5.5 Å in size. [Fig.](#page-1-0) 1a presents a comparison of the permeances of $CO₂$ and $H₂$ for $CO₂/H₂$ mixture permeation with the corresponding data on unary permeances. We note that the permeance of the tardier $CO₂$ in the mixture is practically the same as that for unary diffusion for the entire range of upstream (feed) partial pressures. For $H₂$, the permeance in the mixture is about an order of magnitude lower than for unary diffusion. Furthermore, we note that the H_2 permeance in

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Upstream partial pressure, p_{in} / MPa

Upstream partial pressure, p_{in} / MPa

Fig. 1. Comparison of the permeances of $CO₂$ and $H₂$ for $CO₂/H₂$ mixture permeation with data on unary permeances for (a) MFI and (b) SAPO-34 membranes. The MFI permeation data are from Sandström et al. [\[16\].](#page-10-0) The SAPO-34 permeation data are from Li et al. [\[17–19\].](#page-10-0)

the mixture is progressively reduced as the upstream (feed) pressure is increased. Sandström et al. [\[16\]](#page-10-0) consider the reduction in the H_2 permeance to be a result of "blocking" by the partner $CO₂$ molecules.

An exactly analogous situation occurs for $CO₂/H₂$ mixture permeation across a SAPO-34 membrane; SAPO-34 consists of 8.5 Å size cages separated by 3.8 Å \times 4.2 Å size windows. Fig. 1b presents the data from experiments data of Li et al. [\[17–19\].](#page-10-0) We note that the permeance of $CO₂$ in the mixture is practically identical to that for unary diffusion. In sharp contrast, the permeance of H_2 in the mixture is about an order of magnitude lower than for pure H_2 diffusion. As in the case of MFI membrane, the permeance of H_2 in the mixture falls progressively below that for unary diffusion as the upstream feed pressure is increased.

Slowing-down effects are the root cause of the decrease in the $H₂/CO₂$ selectivity of Matrimid membrane with increasing proportion of $CO₂$ in the $CO₂/H₂$ mixture in the upstream (feed) compartment [\[20\].](#page-10-0) Blocking, slowing-down, or "hindering" effects also manifest for mixtures other than $CO₂/H₂$, and appear to be a generic characteristic of mixture permeation across a variety of porous membrane materials [\[19–27\].](#page-10-0) For water–alcohol and alcohol–acetone mixtures, there is mutual slowing-down of each of the components due to hydrogen bonding effects [\[28–33\].](#page-10-0)

For modeling n-component mixture permeation inside either micro- or meso-porous membranes, it is commonly accepted that the fundamentally correct approach is to relate the fluxes N_i , defined in terms of the cross-sectional area of the membrane, to the chemical potential gradients $\nabla \mu_i$ by use of the Maxwell–Stefan (M–S) equations [\[17,26,34–37\]:](#page-10-0)

$$
-\phi \frac{c_i}{RT} \frac{d\mu_i}{dz} = \sum_{\substack{j=1 \ j \neq i}}^n \frac{x_j N_i - x_i N_j}{b_{ij}} + \frac{N_i}{b_i}; \quad i = 1, 2, \dots n \tag{1}
$$

where ϕ represents the fractional pore volume of the porous material, and the concentrations c_i are defined in terms of moles per m³ of accessible pore volume. The x_i in Eq. (1) is the component mole fractions of the adsorbed phase within the micropores:

$$
x_i = \frac{c_i}{c_t}; \quad i = 1, 2, \dots n
$$
\n⁽²⁾

The *Ð*ⁱ characterize species i–wall interactions in the broadest sense. In many cases the D_i corresponds to the value of the pure component i; consequently this can be estimated from unary permeation data. In some cases where molecular clustering occurs, the D_i in the mixture can be lower than that of pure components [\[30,31\].](#page-10-0) The D_{ij} are exchange coefficients representing interaction between components *i* with component *j*. At the molecular level, the D_{ii} reflect how the facility for transport of species *i* correlates with that of species j. Conformity with the Onsager reciprocal relations prescribes:

$$
D_{ij} = D_{ji} \tag{3}
$$

In the M-S formulation (1), the exchange coefficients D_{ii} account for slowing-down effects. In order to illustrate this, [Fig.](#page-2-0) 2 presents MD simulation data for the M–S diffusivities, B_1 , B_2 , and B_{12} for diffusion of equimolar $(c_1 = c_2)$ CO₂ (1)/H₂ (2) mixtures at 300 K in four different materials: (a) MFI zeolite, (b) all-silica LTA-Si (11.2A˚ cages separated by 4.11 Å \times 4.47 Å sized windows), (c) MgMOF-74 (1D hexagonal-shaped channels of 10.4 Å size $[8,9,37,38]$), and (d) BTP-COF (1D hexagonal-shaped channels of 34 Å size [\[39\]\).](#page-11-0) The MD simulation methodology is described in [Supplementary](#page-9-0) [Material](#page-9-0) accompanying this publication. In the limit of low concentrations, say c_t < 1 kmol m⁻³, we have $D_{12} \gg D_2 > D_1$. Consequently, the contribution of the first right member of Eq. (1) can be considered to be negligible, and the permeation fluxes at very low loadings will correspond to that for unary permeation. For all topologies the exchange coefficient D_{12} shows a significant reduction in magnitude with increasing pore concentration; consequently correlation effects increase with increasing pore concentrations. For all four pore topologies, the M-S diffusivity of $CO₂, D₁$, is significantly lower than the binary exchange coefficient B_{12} . Consequently, the influence of the first right member of Eq. (1) on the flux of CO₂ is relatively small, i.e. coupling effects are not expected to have a significant effect on $CO₂$ permeation flux in the mixture. This is the reason that the permeance of $CO₂$ in the mixture is practically the same as for pure components (cf. Fig. 1).

The situation with regard to H_2 is completely different. With increased pore concentrations c_t , the binary exchange coefficient D_{12} is lowered to values below that of the M-S diffusivity of H_2 , *Ð*2. Consequently, the influence of the first right member of Eq. (1) on the flux of H_2 is non-negligible. This is the reason that the permeance of H_2 in the mixture is progressively lower than that for the pure component (cf. Fig. 1).

Fig. 2. The Maxwell–Stefan diffusivities, B_1 , B_2 , and B_{12} for diffusion of equimolar ($c_1 = c_2$) CO₂(1)/H₂(2) mixtures at 300K in (a) MFI, (b) LTA-Si, (c) MgMOF-74, and (d) BTP-COF as a function of the total concentration, c_t . The M–S diffusivities D_1 , and D_2 are from unary MD simulations. The concentration dependence of the M–S diffusivities are described using the Reed and Ehrlich model [\[23,36,53\],](#page-10-0) using the parameters specified in [Supplementary](#page-9-0) [material.](#page-9-0) The binary exchange coefficient B_{12} is determined from mixture MD simulations, using the methodology described in [Supplementary](#page-9-0) [material,](#page-9-0) which also contains analogous data comparisons for B_1 , D_2 , and D_{12} for a much wider variety of guest/host combinations.

The key to the accurate modeling of mixture permeation lies in the proper estimation of the exchange coefficients B_{12} , especially its concentration dependence. This is a challenging task because there is no direct experimental procedure for its estimation from membrane permeation data. PFG NMR experimental studies on the self-diffusivities in mixtures [\[40\]](#page-11-0) give an indication of the mutual influence of one adsorbed species on its partner molecules; these experiments do not yield information on the exchange coefficients *Đ*₁₂. The major objectives of the present communication are: (1) to use MD simulations for providing insights into the magnitude of *Ð*¹² in a variety of porous materials of practical importance, (2) to suggest practical procedures for estimation of *Ð*12, and (3) to point out pitfalls in some procedures suggested in the published literature for estimation of *Ð*12.

[Supplementary](#page-9-0) [material](#page-9-0) accompanying this publication gives information on the specific force fields used, unit cell dimensions, accessible pore volume, characteristic pore dimensions, molecular simulation methodologies, pore landscapes and snapshots, along with the entire database of simulation data on isotherms, heats of adsorption, and diffusivities. Besides BTP-COF, MgMOF-74, LTA-Si, and MFI, adsorption and diffusion data for a variety of other host

materials (CHA, FAU-Si, NaY, NaX, IRMOF-1, and MOF-177) are also presented in [Supplementary](#page-9-0) [material](#page-9-0) in order to stress the generic nature of the conclusions drawn in this work.

2. Estimation of the Maxwell–Stefan exchange coefficients \mathbf{p}_{12}

An important advantage of formulating the M–S equations [\(1\)](#page-1-0) in terms of concentration c_i within the pores is that the exchange coefficient *Ð*¹² are relatable to the corresponding M–S diffusivity in the binary fluid mixture, with species 1 and 2. This is illustrated in [Fig.](#page-3-0) 3 which presents data on D_{12} , as a function of the total concentration, c_t , for six different binary mixtures in a variety of other host materials. In mesoporous BTP-COF, the values of the exchange coefficient B_{12} are the nearly the same as the binary fluid phase M–S diffusivity, $B_{12,\text{fl}}$, over the entire range of pore concentrations. A similar result holds for mesopores in the 20–100 Å size range [\[35\].](#page-10-0)

For micro-porous materials, the D_{12} are lower than the corresponding fluid phase diffusivity $D_{12,\text{fl}}$ by a factor, *F*, that depends on the degree of confinement within the micropores. The stronger the degree of confinement, the smaller is the value of $F[35,36]$. Within

Fig. 3. The Maxwell–Stefan exchange coefficients D_{12} , for diffusion of equimolar (c₁ = c₂) (a) CO₂/H₂, (b) CO₂/CH₄, (c) CO₂/N₂, (d) CH₄/H₂, (e) CH₄/C₂H₆, and (f) CH₄/C₂H₈ mixtures at 300K in a variety of host materials, as a function of the total concentration, c_t. The $\theta_{12,\text{fl}}$ for binary *fluid phase* mixture diffusion, obtained from independent MD simulations, are also presented in square symbols. The data presented included MD simulations of binary mixture diffusion in FAU-Si, NaY, NaX, IRMOF-1, and MOF-177, and details of these structures are available in [Supplementary](#page-9-0) [material](#page-9-0) accompanying this publication.

Fig. 4. The degree of correlations, D_i/D_{li} , for diffusion of (a) CH₄, CO₂, N₂, and H₂ in MFI zeolite, (b) H₂, and (c) CH₄ in a variety of porous host materials. Similar data on the degree of correlations for other guest/host combinations are available in [Supplementary](#page-9-0) [material.](#page-9-0) The exchange coefficients, D_{ii} , for diffusion of (d) CH₄, (e) H₂, and (f) CO₂ in a variety of host materials.

the 5.5 Å channels of MFI zeolite, the D_{12} is about a tenth of the value for the corresponding fluid mixture, when compared at the total molar concentration c_t within the pores, i.e. $F \approx 0.1$. Within the 1D, 10.4A˚ sized hexagonal-shaped channels of MgMOF-74, the degree of confinement of the guest molecules is lower, and the value of $F \approx 0.7$. For FAU-Si, NaY, and NaX that has 7.4 Å sized windows separating 11 Å sized cages, the values of F are in the range 0.4–0.7. Procedures for estimation of the $D_{12,fl}$ are available in Poling et al. [\[41\],](#page-11-0) and therefore this provides a convenient starting point for the estimation of the *Ð*12.

The link between the exchange coefficient D_{12} with the corresponding fluid phase diffusivity $D_{12,fl}$ is of vital importance because it paves the way for developing an interpolation formula using unary diffusion data, using the Vignes interpolation formula for liquid mixtures as a guide [\[42\].](#page-11-0) This approach results in the following formula [\[35,36\]:](#page-10-0)

$$
b_{12} = (b_{11})^{x_1} (b_{22})^{x_2} \tag{4}
$$

For diffusion within porous materials, the D_{ii} are the self-exchange coefficients, that are determinable from MD simulations of unary diffusion of both D_i , and the self-diffusivity, $D_{i,\text{self}}$, by use of the following relationship:

$$
\frac{1}{D_{i,\text{self}}} = \frac{1}{D_i} + \frac{1}{D_{ii}}\tag{5}
$$

The interpolation formula (4) has been verified on the basis of MD simulations for a wide variety of guest-host combinations [\[35,36\];](#page-10-0) evidence of the validation for selected guest-host combinations are available in [Supplementary](#page-9-0) [material](#page-9-0) accompanying this publication. The ratio D_i/D_{ii} can be viewed as a measure of the degree of correlations for unary diffusion of species i. For any given material, *Ð*i/*Ð*ii increases with increasing pore concentration. As illustration, [Fig.](#page-4-0) 4a shows MD simulated data on the degree of correlations, D_i/D_{ii} , for diffusion of CH₄, CO₂, N₂, and H₂ in MFI zeolite. As the concentration within the pores increases, the jumps of individual molecules become increasingly correlated because the number of vacant sites will decrease, and the probability of unsuccessful jumps will increase.

The degree of correlations also depends onthe pore size, connectivity and topology. [Fig.](#page-4-0) 4b and c presents a comparison of *Ð*i/*Ð*ii for H2 and CH4 diffusion in a variety of host materials. Broadly speaking, the highest degree of correlations is for 1D channel structures, such as MgMOF-74 and BTP-COF, because of the difficulty of bypassing of molecules. The smallest degree of correlations is realized in structures such as LTA-Si, CHA, SAPO-34, DDR, ITQ-29, and ZIF-8 that have cages separated by windows that are in the $3.4-4.1\text{ Å}$ size range. In such structures, the inter-cage hops across the window occur one-molecule-at-a-time and correlations are practically negligible at pore concentrations c_t < 10 kmol m⁻³ [6,23,43-47]. A qualitative appreciation of the molecular hops across the windows of LTA-Si, and CHA is obtained by examination of video animations available as [Supplementary](#page-9-0) [material](#page-9-0) accompanying this publication. For concentrations c_t > 10 kmol m⁻³, intra-cage motion becomes limiting leading to sizable correlation effects.

The self-exchange coefficients D_{ii} are relatable to the selfdiffusivities in the corresponding fluid mixture, $D_{ii,fl}$ [\[35,36\]](#page-10-0) (see [Fig.](#page-4-0) 4d–f). For mesoporous materials such as BTP-COF, $D_{ii} \approx D_{ii,fl}$. For MFI zeolite, the D_{ii} are about an order of magnitude lower than the $D_{ii,fl}$. Engineering estimation procedures for the fluid phase selfdiffusivity $D_{ii,fl}$ are available [\[41\],](#page-11-0) and therefore it is possible to make reasonable estimates of D_{ii} in a given host material on the basis of the information provided in [Fig.](#page-4-0) 4.

Fig. 5. (a) CBMC simulation data on the pure component adsorption isotherms of H_2 , N₂, CH₄, and CO₂ in MFI at 300 K. The continuous solid lines are the dual-Langmuir–Freundlich fits of the isotherms; the fit parameters are provided in [Supplementary](#page-9-0) [material](#page-9-0) accompanying this publication. (b and c) CBMC simulations for component loadings in $CO₂/H₂$ ($p₁/p₂ = 15/85$), $CO₂/CH₄$ ($p₁ = p₂$), and mixtures at 300K. The continuous solid lines are the IAST calculations using the dual-Langmuir–Freundlich fits of the CBMC simulated pure component isotherms. Similar comparisons of the IAST calculations with CBMC mixture simulations are available in [Supplementary](#page-9-0) [material](#page-9-0) for several other guest/host combinations.

Fig. 6. The influence of different calculation procedures for the degree of correlations, D_i/D_{ii} , on the permeation selectivity, S_{perm} , for (a) CO₂/H₂, (b) CH₄/H₂, (c) CO₂/N₂, and (d) CO₂/CH₄ mixture permeation across an MFI membrane at 300 K, plotted as a function of the total upstream pressure, $p_{t0} = p_{10} + p_{20}$. For (a), (b) and (c) the partial pressures in the gas phase in the upstream compartment satisfy $p_{10}/p_{20} = 15/85$ along with the adsorption selectivity, S_{ads}. In (d), $p_{10} = p_{20}$. The downstream partial pressures were maintained at 10 Pa for each species in all cases. The thickness of MFI crystalline layer, ℓ = 50 μ m. The data on diffusivities, correlations, and dual-site Langmuir–Freundlich parameters for fitting of the pure component isotherms are specified in [Supplementary](#page-9-0) [material](#page-9-0) accompanying this publication. Video animations of the motion of mixtures of molecules across MgMOF-74, LTA-Si, and BTP-COF membranes are available as [Supplementary](#page-9-0) [material.](#page-9-0)

Since experimental data on the exchange coefficients are rarely available, the assumption that $D_i/D_{ii} = 1$ is often invoked [\[26,34,48\],](#page-10-0) leading to the interpolation formula:

$$
b_{12} = (b_1)^{\chi_1} (b_2)^{\chi_2} \tag{6}
$$

We shall demonstrate later that use of Eq. (6) leads to severe underestimation of correlation effects in mixture permeation.

3. Binary mixture permeation

In order to underscore the importance of proper modeling of correlation effects we first consider permeation of (a) $CO₂(1)/H₂(2)$, (b) $CH_4(1)/H_2(2)$, (c) $CO_2(1)/CH_4(2)$, and (d) $CO_2(1)/N_2(2)$ mixtures across a MFI zeolite membrane with microporous crystalline layer of thickness ℓ = 50 μ m. For all four mixtures the species 1 has the higher adsorption strength, while the species 2 has higher mobility. Aqualitative appreciation ofthe motion ofthe molecules within the intersecting channels of MFI zeolite is obtained by examination of video animations of MD simulations, available as [Supplementary](#page-9-0) [material](#page-9-0) accompanying this publication.

The first step is to rewrite the chemical potential gradients in Eq. [\(1\)](#page-1-0) in a more practically usable form. The chemical potential gradients can be related to the more conventional gradients of concentrations withinthepores bydefining thermodynamic correction factors Γ_{ii} :

$$
\frac{c_i}{RT}\frac{d\mu_i}{dz} = \sum_{j=1}^{2} \Gamma_{ij} \frac{dc_j}{dz}; \quad \Gamma_{ij} = \frac{c_i}{p_i} \frac{\partial p_i}{\partial c_j}; \quad i, j = 1, 2
$$
\n(7)

For determination of the adsorbed phase pore concentrations c_i and the elements Γ_{ij} , in the binary mixtures, the Ideal Adsorbed Solution Theory (IAST) of Myers and Prausnitz [\[49\]](#page-11-0) was used. For application of the IAST, pure component isotherm fits are required. For this purpose the dual-site Langmuir–Freundlich fits of the CBMC

simulated pure component isotherms were employed (see [Fig.](#page-5-0) 5a). In order to verify the accuracy of IAST calculations, we carried out CBMC simulations for the binary mixtures. [Fig.](#page-5-0) 5b and c presents comparisons ofthe IAST predictions with the CBMC simulation data for component loadings. We see excellent agreement of the IAST with CBMC data; this confirms the applicability of IAST for practical purposes. Similar good agreement was earlier established for adsorption of a wide variety of mixtures in different zeolites [\[50,51\].](#page-11-0)

At steady-state, the fluxes N_i obey:

$$
\frac{\partial N_i}{\partial z} = 0 \tag{8}
$$

The steady state permeation fluxes N_i were determined by solving the set of Eqs. (1) , (7) [and](#page-1-0) (8) subject to the boundary conditions:

$$
z = 0;
$$
 $p_i = p_{i0};$ $c_i = c_{i0}$
\n $z = \ell;$ $p_i = p_{i\ell};$ $c_i = c_{i\ell}$ (9)

using the numerical procedures described in earlier works [\[52–54\].](#page-11-0)

The M–S diffusivities D_i were obtained from MD simulations; the concentration dependence of the *Ð*ⁱ follows the Reed and Ehrlich model, is described in detail in the published literature [\[23,36,53\].](#page-10-0) The binary exchange coefficient D_{12} , in the mixtures was estimated on the basis of the pure component self-exchange coefficients, D_{ii} , using Eq. [\(4\)](#page-5-0) [\[35,45\].](#page-10-0) The data on D_{ii} were obtained by fitting the D_i/D_{ii} data plotted in [Fig.](#page-4-0) 4a. All the data inputs are specified in [Supplementary](#page-9-0) [material](#page-9-0) accompanying this publication. For comparison purposes, we also carried out permeation calculations assuming $D_i/D_{ii} = 1$, with Eq. [\(6\),](#page-6-0) and neglecting coupling effects, $D_i/D_{ii} \rightarrow 0.$

[Fig.](#page-6-0) 6 shows the calculations of the permeation selectivity, S_{perm} defined by:

$$
S_{\text{perm}} = \frac{N_1/N_2}{p_{10}/p_{20}}\tag{10}
$$

where p_{i0} are the partial pressures in the upstream (feed) compartment. Also shown in [Fig.](#page-6-0) 6 are IAST calculations of the adsorption selectivity, S_{ads} :

$$
S_{\rm ads} = \frac{c_{10}/c_{20}}{p_{10}/p_{20}}\tag{11}
$$

where c_{i0} are the adsorption phase concentrations at the upstream face.

For CO_2/H_2 , and CH_4/H_2 mixtures, S_{ads} decreases with increasing upstream feed pressure; this is due to the significantly higher saturation capacity of H_2 and the important role of entropy effects at high pressures [\[55\].](#page-11-0) For $CO₂/N₂$, and $CO₂/CH₄$ mixtures, S_{ads} , increases with increasing p_{t0} . It is remarkable, therefore, to note that S_{perm} is significantly increased with p_{t0} for all mixtures. This increase is directly attributable to the increase in the degree of correlations with increased loadings within the membrane. Put another way, with increased upstream feed pressure, the slowing-down effect is enhanced, resulting in a higher permeation selectivity. Correlation effects are beneficial and contribute significantly to increased values of S_{perm} . This conclusion is further underscored in the calculations of S_{perm} using the two simplified assumptions (1) D_i/D_{ii} = 1, and (2) D_i/D_{ii} = 0 (i.e. no coupling effects). The latter two simplified approaches lead to severe underestimations of S_{perm} when p_{t0} exceeds 0.5 MPa.

For $CO₂/H₂$ mixture permeation the component permeances, calculated from:

$$
\Pi_i \equiv \frac{N_i}{p_{i0} - p_{i\ell}}\tag{12}
$$

are compared in Fig. 7a with the corresponding data determination for unary permeation. For the mixture permeation calculations presented in Fig. 7a, the ratio of the partial pressures in the upstream

Fig. 7. (a) Influence of increase in the upstream partial pressures, p_{i0} , on the permeances of $CO₂$ and H₂. The data shows permeance data for unary permeation, along with permeation for $CO_2(1)/H_2(2)$ mixtures for which p_{10}/p_{20} = 15/85. (b) Influence of increase in the upstream partial pressure of $CO₂$, $p₁₀$, on the permeances of $CO₂$ and H_2 for $CO_2(1)/H_2(2)$ mixtures with a total upstream pressure held constant at $p_{t0} = p_{10} + p_{20} = 1$ MPa.

(feed) compartment were held constant p_{10}/p_{20} = 15/85. The trends in Fig. 7a are in close correspondence with the corresponding experimental data of Sandström et al. [\[16\];](#page-10-0) cf. [Fig.](#page-1-0) 1a. The permeance of the tardier $CO₂$ in the mixture is practically the same as that for unary diffusion for the entire range of upstream (feed) partial pressures. For the more mobile H_2 , the permeance in the mixture decreases by an order of magnitude below that for unary diffusion when the upstream feed pressure is increased to 5 MPa. The good agreement in the trends in [Figs.](#page-1-0) 1a and 7 can be taken as an indication of the validity of the M–S formulation, and the model used for correlations. The absolute values of the permeances in Fig. 7a are about a factor 50 lower than the corresponding ones in [Fig.](#page-1-0) 1a because of the significantly higher thickness of the crystalline layer assumed in our permeation calculations, 50 μ m instead of the value of 0.7 μ m in the Sandström experiments.

Fig. 8. The influence of different calculation procedures for the degree of correlations, D_i/D_{ii} , on the permeation selectivity, S_{perm} , for CO₂/H₂ mixture permeation across (a) MgMOF-74, (b) BTP-COF, (c) LTA-Si and (d) CHA membranes plotted as a function of the total upstream pressure, $p_{10} = p_{10} + p_{20}$. The data on diffusivities, correlations, and dual-site Langmuir–Freundlich parameters for fitting of the pure component isotherms are specified in [Supplementary](#page-9-0) [material.](#page-9-0)

Slowing down effects on H_2 become increasingly significant when the proportion of $CO₂$ in the upstream (feed) compartment is increased. To demonstrate this, [Fig.](#page-7-0) 7b presents calculations of the permeances of CO₂ and H₂ for CO₂(1)/H₂(2) mixtures with a total upstream feed pressure held constant, $p_{10} + p_{20} = 1$ MPa. We note that the H_2 permeance decreases by more than an order of magnitude with increasing proportion of $CO₂$. The data presented in [Fig.](#page-7-0) 7b provide a rationalization of the experimental data of David et al. [\[20\]](#page-10-0) that show a decrease in the H_2/CO_2 selectivity with increasing proportion of $CO₂$ in the upstream (feed) compartment of Matrimid membranes.

For $CO₂/H₂$ mixture permeation across MgMOF-74, and BTP-COF membranes, the data presented in Fig. 8a and b demonstrate the importance of proper modeling of correlation effects in these materials as well. For MgMOF-74, correlation effects result in permeation selectivities that are about one order of magnitude higher than those predicted by a model that neglects coupling. The results are also dramatic for mesoporous BTP-COF; here we note that both the scenarios (1) *Đ*_i $/D$ _{ii} = 1 and (2) *Đ*_i $/D$ _{ii} = 0 (i.e. no coupling effects) are seen to anticipate S_{perm} values lower than unity, i.e. H₂-selective operation. In sharp contrast, the rigorous approach taking into account the increase of the degree of correlations with pore con-

centrations, predicts S_{perm} values greater than unity for upstream feed pressures exceeding 0.3 MPa, i.e. $CO₂$ -selective operation.

Correlation effects in materials such as CHA, LTA, SAPO-34, DDR, and ZIF-8 are often considered to be negligible [\[6,17,19,22–24,46,47,56–58\].](#page-10-0) To test this assumption, we carried out $CO₂/H₂$ mixture permeation calculations for LTA-Si, and CHA (see Fig. 8c and d). We note the differences between the rigorous model and the scenario in which coupling is neglected are significant only when the upstream feed pressures exceed 0.5 MPa. This also rationalizes the results in [Fig.](#page-1-0) 1b for permeances in SAPO-34 membrane where we note that for upstream feed partial pressures above 0.5 MPa, the $H₂$ permeance in the mixture is significantly lower than for the pure component.

For comparison of the $CO₂/H₂$ separation performance of six different materials, [Fig.](#page-9-0) 9a

presents Robeson plot [\[59\]](#page-11-0) of S_{perm} versus the CO₂ permeability defined by $\Pi_i \ell$ with total upstream feed pressure p_{t0} = 2 MPa. MgMOF-74 is the best of the four structures, offering both high selectivity and permeability. The high permeability of MgMOF-74 is of particular relevance to the economics of $CO₂$ capture, as has been emphasized by Merkel et al. [\[3\].](#page-10-0) A part of the success of MgMOF-74 can be traced to the high degree of correlations (cf. [Fig.](#page-4-0) 4) that

enhances S_{perm} . Analogous Robeson plots for CO_2/CH_4 , and CO_2/N_2 mixtures are presented in Fig. 9b and c. For these separations too, MgMOF-74 emerges as the best material with performance significantly higher than the Robeson "upper bound" [\[59\].](#page-11-0)

4. Conclusions

Using molecular simulations of adsorption and diffusion, we have investigated the influence of correlation effects on mixture permeation across four different porous materials: MFI, LTA-Si, MgMOF-74, and BTP-COF. The following major conclusions can be drawn from this study.

- (1) Coupling, or correlation, effects in binary mixture permeation are embodied in the Maxwell–Stefan formulation (1) by the exchange coefficient *Ð*12.
- (2) Correlation effects are strong functions of the pore concentrations, and the exchange coefficients B_{12} decrease by about an order of magnitude with increasing pore concentrations; see [Fig.](#page-2-0) 2.
- (3) For mesoporous structures such as BTP-COF, the exchange coefficient *Ð*¹² can be identified with the corresponding fluid phase diffusivity, $D_{12,fl}$. For microporous structure, the exchange coefficient B_{12} can be an order of magnitude lower than $D_{12,fl}$.
- (4) The interpolation formula (4) provides a convenient approach for estimation of the *Ð*¹² for binary mixture using data on the self-exchange coefficients D_{ii} that can be derived from unary diffusion.
- (5) The degree of correlations in molecular motions, D_i/D_{ii} , increases as the pore concentration increases; see [Fig.](#page-4-0) 4.
- (6) The IAST is sufficiently accurate for estimation of binary adsorption equilibrium for mixtures, using pure component isotherm fits; see [Fig.](#page-5-0) 5.
- (7) The proper modeling of correlation effects, taking the concentration dependence of the D_i/D_{ii} into account, is essential in the calculation of permeation fluxes and selectivities; see [Figs.](#page-6-0) 6 and 8.
- (8) Use of the simplified interpolation formula (6) is not recommended. This formula often under-estimates the importance of correlation effects, see [Figs.](#page-6-0) 6 and 8a,b. For LTA-Si, the use of Eq. [\(6\)](#page-6-0) over-estimates correlation effects; see [Fig.](#page-8-0) 8c.
- (9) The commonly made assumption that correlation effects in cage-type-structures with narrow windows (such as CHA, LTA, SAPO-34, DDR, and ZIF-8) can be considered to be negligible is likely to fail for operation at pressures exceeding about 1 MPa.
- (10) The results of our study also indicate the desirability of choosing materials for $CO₂$ capture applications that have a high degree of correlations. In this regard, 1D channel structure of MgMOF-74 is particularly effective. The membrane performance of MgMOF-74 is anticipated to significantly exceed the Robeson "upper bound" [\[59\].](#page-11-0)

Fig. 9. Robeson plots for separation of (a) $CO₂/H₂$, (b) $CO₂/CH₄$, and (c) $CO₂/N₂$ mixtures, with total upstream pressure p_{t0} = 2 MPa, and T = 300 K. The permeation selectivities, S_{perm} , for different materials are plotted against the $CO₂$ permeability, $\Pi_i \ell$. The SI units for the permeability is mol m m⁻² s⁻¹ Pa⁻¹. The more commonly used engineering unit for permeability is the Barrer expressed in cm³ (STP) cm cm⁻² s⁻¹ (cm Hg)⁻¹. To convert to the commonly used engineering units of Barrers we divide the value in mol m m⁻² s⁻¹ Pa⁻¹ by 3.348 × 10⁻¹⁶. Also plotted in (b and c) is the "upper bound" calculated using the parameters specified in Table 12 of Robeson [\[59\].](#page-11-0)

Appendix A. Supplementary data

Supplementary data associated with this article can be found, in the online version, at [doi:10.1016/j.memsci.2011.08.067](http://dx.doi.org/10.1016/j.memsci.2011.08.067).

Nomenclature

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