A simple model for solute–solvent separation through nanopores based on core-softened potentials

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ABSTRACT

We propose an effective model for solute separation from fluids through reverse osmosis based on core-softened potentials. Such potentials have been used to investigate anomalous fluids in several situations under a great variety of approaches. Due to their simplicity, computational simulations become faster and mathematical treatments are possible. Our model aims to mimic water desalination through nano-membranes through reverse osmosis, for which we have found reasonable qualitative results when confronted against all-atoms simulations found in the literature. The purpose of this work is not to replace any fully atomistic simulation at this stage, but instead to pave the first steps towards coarse-grained models for water desalination processes. This may help to approach problems in larger scales, in size and time, and perhaps make analytical theories more viable.

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1. Introduction

The separation of dissolved solute from a solution is an important subject from both technological and scientific perspectives. The canonical example is the purification of water, in which water must be separated from solutes, as ions or heavy metals, for example, in order to be suitable for consumption. Processes for obtaining clean water are generally inefficient and in most cases tend to be prohibitively expensive. The seawater desalination seems to be a promising alternative: despite approximately 97% of the water is concentrated in the oceans and seas the percentage of potable water obtained through salt–water separation is still very small [1]. Examples of water–salt separation processes are distillation, reverse osmosis (RO), thermal desalination and freezing [1–6]. Reverse osmosis is particularly important and it consists

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Fig. 1. System model we used for separating solute from solvent through nanopores. The mixture of solvent and ions, initially localised in the Region 1, is pushed by a piston against a middle membrane. The circular pore in its center prioritises the passage of solvent once ions are effectively bigger than solvent particles.

of forcing water to pass through a semipermeable membrane by applying an external pressure bigger than the osmotic pressure of the fluid, while the membrane is responsible to retain most of the particles dissolved in the water. Conventional RO membranes used for this purpose are expensive and not very efficient: water transport is slow and there are issues in controlling the membrane selectivity [7]. Researches in this area generally aim to reduce the specific energy consumption, increasing water recovery and lowering the pressure difference between feed and permeate sides [8–11].

RO mechanisms for water desalination based on nanostructures as semipermeable membranes have obtained encouraging results [7,12–21]. The size exclusion promoted by nanopores seems to be an important ingredient when such structures are used as filters.

In this context, the water–ions separation through nanostructures subject gained attention from scientific community, who have intensified the efforts in order to understand the main mechanisms responsible for water desalination in such a nanometric level [7,13,14,17,18,22–37].

For example, Qi Chen and Xiaoning Yang have recently reported a molecular simulation study of pyridinic nitrogen doped nanoporous graphene as desalination membrane [20]. Their results indicate that these membranes are capable of rejecting salt ions and increase the water flow and permeability in several orders of magnitude if compared with existing processes of water–salt separation. The authors have established that the desalination performance is sensitive to pore size and membrane’s hole chemical functionalisation [20].

Despite the cited encouraging results, the water desalination problem is typically macro. Considering the modern computational power available, it is literally impossible to study this problem using an all-atoms approach in a macro size scale. In this sense, it is important to seek for cheaper, alternative procedures to tackle this problem. An alternative to computationally model water-like fluids in an effective manner relies on core-softened potentials. Systems modelled through these potentials generally present several features present in water. For example, they possess density, diffusion, and structural anomalies. Many core-softened potential based systems show a liquid–liquid critical point separating a high density liquid phase from a low density liquid one, as hypothesised for liquid water [38–58]. Core-softened potentials treat anomalous fluids (water being the most famous case) in an effective way, in a manner that there is no directionality (interactions between particles are pairwise only) neither the presence of charges. No major arguments seem necessary in order to convince the reader that the absence of these ingredients turn core-softened models extremely cheap to simulate.

Those kinds of models were explored in depth not only by computer but also by means of theoretical tools due to their simplicity [57–68]. Successive good results gave support to the use of core-softened potentials in more complicated environments, such as mimicking a salty solution [69], water in nanotubes [70,71], confined between plates [72–74] and in contact with nanopores [75]. Following this spirit, we propose in this work the use of core-softened potentials as a building block for a simple system able to reproduce the main features of water–salt separation all-atoms simulations. We show that it is possible to build a system which qualitatively reproduces the results of more sophisticated systems in a fraction of time. Even though some work are still necessary to fine tuning the core-softened based model presented in this work, we believe this study is a first step to extrapolate the water desalination through nanostructures process to a more realistic number of particles scale.

This paper is organised as follows. Computational details are given in Section 2 while the results and discussion are made in Section 3. Section 4 ends the text with the conclusions of the work.

2. Computational details

Our system model is shown in Fig. 1. We used a simulation box with dimensions of $25 \times 25 \times 75$ (in units of solvent particles size σ) in the x , y and z , directions, respectively, and two pistons, one initially located at $z = 0$ (Piston 1) and another one at $z = 75\sigma$ (Piston 2). In all simulations we apply external pressures in the Piston 1. The Piston 2 may either be static or mobile, subject to external pressures as will be discussed later. Finally, there is a middle wall whose position is fixed at $z = 25\sigma$, and which separates the Region 1 (feed side) from Region 2 (permeate side). The middle wall has a circular pore

in its center which allows particles to diffuse from feed to permeate side. Periodic boundary conditions were used in the x and y directions. The pistons and middle wall were constituted by 25×25 atoms in a simple square lattice. In the specific case of the middle wall, some of its particles are deleted in a certain stage of the simulations (this is discussed later in the text) for making a circular hole, and this number will depend on the open area under study. For “frozen” particles we mean that the resultant force acting on those particles are set zero.

Initially 3060 particles were randomly placed in the Region 1 where 3000 are solvent, 30 are $+$ ions, and 30 are $-$ ions, while in Region 2 were distributed 1500 solvent particles. As a result of external pressures applied in the Piston 1, particles may eventually permeate the middle wall through the circular pore. In order to avoid excessive pressure fluctuations in the fluid, mass of particles which compose pistons was set to be 1000 times the mass of solvent particles. Besides, a viscous force proportional to the pistons velocity was used with constant of proportionality as 100 in reduced units. Solute and solvent particles have the same mass m .

Energies and lengths are given in terms of well-known Lennard-Jones parameters ϵ (energy) and σ (length), respectively. All the other quantities investigated here can be reduced to dimensionless forms if written in terms of ϵ , σ , m and Boltzmann constant k_B . For example, pressure P is given in terms of ϵ/σ^3 , time τ is written in terms of $\sqrt{m\sigma^2/\epsilon}$, and temperature in terms of ϵ/k_B .

Molecular dynamics simulations were performed with the LAMMPS package [76] in the canonical ensemble using the Nosé–Hoover thermostat [77]. We have investigated two cases as follows. (i) Case 1, in which the Piston 2 is kept immobile while Piston 1 compresses the fluid. (ii) Case 2, where we have applied external pressures in both Piston 1 and Piston 2. The simulations were divided into equilibration and production stages. In both Case 1 and Case 2, the equilibration stage was subdivided into two substages as follows. First, the solute–solvent system was evolved during 150,000 steps with initial temperature $T = 2$ and final temperature $T = 1$ (the pore was kept blocked during the whole equilibration stage in order to prevent particle permeation). Secondly, the system was simulated for further 150,000 steps at $T = 1$, when configurational energy and pressure showed to be stable, i.e., fluctuate around average values. Additionally, in the Case 2 the system was simulated for further 200,000 steps at $T = 1$ with an external pressure applied in the Piston 2. This pressure was chosen so that it equals the osmotic pressure of the fluid. For determining such a pressure, we allowed the Piston 2 to fluctuate and investigated pressures applied upon it (P_2) from 0.1 up to 3 in reduced units, at intervals of 0.1, when 1500 solvent particles are confined in Region 2 at $T = 1$. We found that for $P_2 = 2.3\epsilon/\sigma^3$ the Piston 2 fluctuates around its initial position, demonstrating that the pressure exerted by the fluid equals the external applied pressure.

Following the equilibration stage, the production stage consisted in (i) deleting atoms responsible for blocking the pore located in the middle wall, (ii) applying an external pressure in the Piston 1, and (iii) simulating the whole system for up to 5×10^6 steps, depending on the quantity of interest under investigation. The timestep used in all runs was 0.001 in reduced units. All quantities of interest were averaged over five independent simulations and error bars are smaller than symbols in all figures.

For the interaction between solvent particles we used the core-softened potential proposed by de Oliveira and collaborators [43,78], which reads

$$\frac{U_{ss}}{\epsilon} = 4 \left[\left(\frac{\sigma}{r_{ss}} \right)^{12} - \left(\frac{\sigma}{r_{ss}} \right)^6 \right] + \alpha \exp \left[-\frac{1}{\gamma^2} \left(\frac{r_{ss} - r_0}{\sigma} \right)^2 \right] \quad (1)$$

σ and ϵ are Lennard-Jones parameters while $\alpha = 5$, $\gamma = 0.7$, and $r_0 = \sigma$ are related to the shape of the gaussian term. r_{ss} is the distance between pairs of solvent particles.

The ion–ion potential was described by the repulsive part of the Lennard-Jones potential plus a Coulombic interaction as

$$\frac{U_{ii}}{\epsilon'} = C \frac{z_1 z_2}{r_{ii}} + \Theta(\sigma' - r_{ii}) u_{LJ}(r_{ii}), \quad (2)$$

where $\Theta(R)$ is the Heaviside step function, in which $\Theta(R < 0) = 0$ and $\Theta(R \geq 0) = 1$, and

$$u_{LJ}(r_{ii}) = 4 \left[\left(\frac{\sigma'}{r_{ii}} \right)^{12} - \left(\frac{\sigma'}{r_{ii}} \right)^6 \right].$$

z_1 and z_2 can take values $+1$ or -1 , corresponding to the valence of ions. Here, $\sigma' = 3\sigma$ and $\epsilon' = \epsilon/C$ with $C/\sigma' = 1/4$ is a constant associated to the strength of the Coulombic term. The cutoff distance for the Coulomb potential was $7.5\sigma'$ [79]. Interactions were directly computed between pairs of particles for distances less than the cutoff. For distances greater than the cutoff, Particle Particle–Particle Mesh scheme was adopted [80].

The interaction between the solvent and ion particles was described by a Lennard-Jones potential,

$$\frac{U_{si}}{\epsilon''} = 4 \left[\left(\frac{\sigma''}{r_{si}} \right)^{12} - \left(\frac{\sigma''}{r_{si}} \right)^6 \right]$$

with $\sigma'' = (\sigma + \sigma')/2 = 2\sigma$. For ϵ'' we have followed Lukšič and coworkers approach [69], in which they defined the solvent–ion interaction as $\epsilon''/k_B T = (T_s^* T_{el}^*)^{-1/2}$. $T_s^* = k_B T / \epsilon$ is the reduced solvent temperature, $T_{el}^* = \sigma' / \lambda_B$ is the reduced temperature of the restricted primitive model for electrolyte solutions and $\lambda_B = C\epsilon / k_B T$ is the Bjerrum length. After little calculation, one finds $\epsilon'' = \epsilon \sqrt{C/\sigma'} = \epsilon/2$.

This entire solvent–solute model was conceived based on the work of Lukšič and coworkers [69], where structural and thermodynamic properties of a very similar solvent–solute model were investigated. In their work it was investigated by means of Monte Carlo and Integral Equations, how the presence of ions interferes in the appearance of density, diffusion, and structural anomalies. Following Lukšič and colleagues considerations, we are aware that the knowledge of properties of this ion–solvent simple model is far from complete. It is necessary to explore the solubility of ions, isothermal compressibility, heat capacity at constant pressure, and the effects of solvent/solute size ratios in order to compare our results to more complex approaches. Such an investigation goes beyond the purposes of our work. For now, we believe our results give reasonable evidences that we are on the right track for building a simple, effective ion–solvent model which can capture the salty water main dynamic and thermodynamic features in a RO process.

Particles composing pistons and wall interact with solvent and solute ones through the repulsive part of the Lennard-Jones potential with energy strength ϵ . Size of pistons and wall particles was set to 2σ .

In order to compare our results with the ones from all-atoms simulations, we focused on three quantities of interest as follows. (i) Solute rejection against external applied pressure for different pore areas, (ii) number of filtered ions as a function time, and (iii) the dependence of solvent volume flow rate with external applied pressure. This quantity is the volume of filtered fluid per time and gives an estimate of the efficiency of the system setup.

The solute rejection R is calculated using the following equation

$$R = \left(1 - \frac{N_{1/2}}{N_0}\right), \quad (3)$$

where N_0 is the initial number of solute particles in the Region 1 and $N_{1/2}$ is the number of solute particles in Region 2 at the time in which half of solvent particles have passed from Region 1 to Region 2. This definition for R coincides with the one used by Chen and collaborators [20] and Zhu and colleagues [21]. Both have used molecular dynamics simulations to study a solution of water and ions passing through nano-membranes. According to Eq. (3), if $N_{1/2} = 0$ (which means zero permeate ion) a membrane shows 100% solute rejection or $R = 1$. On the other hand, for a zero rejection membrane the number of solute particles in the Region 2 must be identical to N_0 and $R = 0$.

3. Results

3.1. Case 1: Piston 2 fixed

Our results for this case are shown in Figs. 2–4. The number of solvent particles in the Region 2 as a function of time for two different pore areas is summarised in Fig. 2. Each curve corresponds to a different value of external pressure applied to the Piston 1 and from bottom to top they are 2.0, 3.0, ..., 9.0, 11.0 and 13.0 in units of ϵ/σ^3 . For determining the initial time in this figure, i.e. $t = 0$, we wait until half of solvent particles have passed to Region 2 in order to assure an steady state flow regime. The dependence between the number of solvent particles filtered and time assumes a consistent linear regime, having bigger slopes for bigger external pressures, as expected. After a certain time, the flow of solvent through the pore stops due to the finitude of system and this effect is represented by the saturation seen in the curves. Naturally, this point is reached sooner for bigger holes. Our results are very similar to those reported in the literature for simulation of water desalination processes through nano-membranes [13,20,37].

Regarding the volume flow rate ϕ as a function of applied pressure, we see from Fig. 3 that the dependence between these two quantities is also well described by a linear function. We present this figure for different pore areas and the symbols were obtained by calculating the number of filtered solvent particles over time, dN/dt , (the slope of curves shown in Fig. 2) times $1/\rho_1$, where ρ_1 is the solvent number density in the Region 1. Lines in this figure are linear regressions through simulated data. This result is expected since it will pass more solvent with increasing hole sizes. The linear dependence for such a parameter with pore area is not straightforward at first sight and the physics behind this result can be developed by Hagen–Poiseuille's model as follows. The quantity of fluid per time Φ which flows in a tube of internal radius R and length ℓ is proportional to the pressure differences between the two sides, $\Delta\mathcal{P}$, as $\Phi = D\Delta\mathcal{P}$, where the constant D depends on R , ℓ and fluid's viscosity η . This model may hold for a case of an effective tube of very small ℓ around the pore.

Fig. 4 shows solute rejection percentages as a function of applied pressure for different pore areas. As we see, for pore areas below a critical value ($8.0\sigma^2$) 100% of solute is retained at the cost of a low rate of solvent permeation. This is clearly due to a size exclusion effect solely. Bigger pores than such a critical value dramatically affect the efficiency of ion blockage. For bigger holes, the solute rejection suffers a drastic drop, to less than 60%. Ions rejection efficiency is better for smaller holes and lower pressure values. Pressure variations seem to not interfere in salt rejection, at least when observing the system for a wide range of pressure values. These results are in good accordance with results presented by Zhu et al., when investigating desalination through a Graphyne-4 membrane [21].

Fig. 2. Number of solvent particles in the Region 2 as a function of the time difference (see the text for details regarding the definition for time difference). Each curve corresponds to a different value of external pressure applied to the Piston 1 and from bottom to top they are 2.0, 3.0, ..., 9.0, 11.0 and 13.0 in units of ϵ/σ^3 . The results are shown for two different pore areas: (a) $46.3\sigma^2$ and (b) $17.7\sigma^2$.

Fig. 3. Solvent flow rate ϕ as a function of applied pressure for different pore areas. Symbols are simulated data and lines are linear fittings through the data.

3.2. Case 2: Piston 2 under external pressure

Despite the Case 1 was used in order to compare our results with the literature, we believe this is not a good representation of a typical desalination process as it involves water flowing from liquid phase (on the feed side of the membrane) to possibly a gas phase (on the downstream side), depending on the initial number of water molecules in the permeate side and permeate side size. Using a liquid to gas system like this will introduce a number of energy barriers [14]

Fig. 4. Solute rejection percentage as a function of applied pressure for different areas. Symbols are simulated data and lines are linear fittings through the data.

Fig. 5. Number of solvent particles in the Region 2 as a function of time difference for pore areas (a) $46.3\sigma^2$ and (b) $17.7\sigma^2$. Each curve corresponds to a pressure differences $\Delta P = P_1 - P_2 = -1.0, 0, 1.0, \dots, 9.0$, and 11.0 in units of ϵ/σ^3 (from bottom to top).

not present in a liquid-to-liquid system and will likely overestimate salt rejection and underestimate water permeation. In this sense, we believe the Case 2 presented here is more realistic.

For this case, our results are shown in Figs. 5, 6, 7, and 8. Fig. 5 shows the dependence of the number of permeate solvent particles N over time with both pore area and external applied pressure. For each pore area we investigated the pressure differences $\Delta P = P_1 - P_2 = -1.0, 0, 1.0, \dots, 9.0$, and 11.0 in units of ϵ/σ^3 (from bottom to top). We see from this figure that for intermediate times there is a clear linear dependence between N and time for all pressure differences and pore areas investigated. For higher ΔP values, the number of permeate particles rapidly saturates while for intermediate and lower pressure differences longer times are necessary for reaching such a regime. For negative ΔP values the solvent particles

Fig. 6. Same curve shown in Fig. 5(a) ($\Delta P = 8\epsilon/\sigma^3$) stressing the different regimes seen for solvent filtered over time. This result agrees with the findings of Nicolai, Sumpter, and Meunier for studying water desalination across graphene oxide framework membranes [18].

Fig. 7. Solvent flow rate as a function of applied pressure for different pore areas for the case with two pistons under external pressures. When pressures in the feed side (P_1) and permeate side (P_2) become the same ($\Delta P = P_1 - P_2 = 0$) the solvent flow tends to vanish. Symbols are simulated data and lines are linear fittings through simulated data.

flow is negative, i.e., particles go from Region 2 to Region 1, as expected. The overall picture seen in this figure resembles the results of Hu et al. who have used imidazolate framework-8 as a reverse osmosis membrane for water desalination [16].

Borrowing Nicolai, Sumpter, and Meunier terminology for studying water desalination across graphene oxide framework membranes [18], we define short times behaviour as equilibration regime, in which the flow in solvent particles is not yet constant in time. For longer times, the curves saturate due to the already mentioned finitude of the system. The three regimes are evident in Fig. 6, in which we show the curve for $\Delta P = 8\epsilon/\sigma^2$ (same curve shown in Fig. 5(a)).

Fig. 7 shows the solvent flow rate as a function of applied pressure for different pore areas. The behaviour is similar to that presented in Fig. 3. Here curves must cross the origin since it is expected that $\phi = 0$ at $\Delta P = 0$.

Finally the results shown in Fig. 8 refer to the rejection parameter. Not surprisingly, for very small pore areas the rejection is 100% independently the external pressure due to size exclusion, while for wider pores it diminishes. Interestingly, for bigger pore areas the rejection increases with pressure exactly as observed by Zhu et al. for desalination investigation through Graphyne-4 [21]. They argue that the slightly increasing efficiency for salt rejection with the applied external pressure can be explained by energy barrier for passing ion, which is much higher than that for water passing through nanopores. This is an important difference between graphyne and graphene nanopores: for the graphene case, salt rejection dramatically decreases with pressures. This difference may come from the fact that flat edges of graphene nanopores induce ion dehydration under high pressures. This result may indicate that our core-softened solvent–solute–membrane system is more graphyne-like than graphene-like in terms of salt rejection. A further investigation is still necessary in order to isolate the parameters in our potentials that tune graphene or graphyne behaviours. Moreover, graphene membrane pores

Fig. 8. Solute rejection percentage of a porous membrane as a function of the applied pressure for different areas. Symbols are simulated data and lines are linear fittings through data.

are generally passivated with hydrogen, hydroxyl groups, nitrogen and other substances, which we did not take under consideration. We may further explore this point by changing the interactions between fluid and pore border in order to mimic pore functionalisation with different elements.

4. Conclusion

In this work we propose a simple computational model for solvent–solute separation through reverse osmosis using a membrane with a circular pore. This system aims to mimic the water desalination reverse osmosis through semi-permeable nano-membranes. Despite we still must investigate thermodynamic and dynamic details of our solvent–solution model, as for example solubility of ions, isothermal compressibility, heat capacity at constant pressure, and the effects of solvent/solute size ratios, we have reasonable qualitative results which agree with fully atomistic simulations found in the literature. The quantities we have investigated are number of solvent particles filtered over time as a function of pressure and pore area, solute rejection against pressure for different pore areas, and solvent flow rate, a quantity which is proportional to the volume of solvent filtered over time, as a function of applied pressure and pore area. We do not aim at this stage to replace any fully atomistic simulation neither we are able to give *quantitative* results based on our model. Our purpose is to pave the first steps towards coarse-grained models so that the nanoscale barrier, in size and time, can comfortably be crossed when simulating the separation of solute from fluids. For doing that, we have used core-softened potentials which have been successfully used to describe anomalous fluids (like water) for at least a decade in a wide variety of situations, from bulk to highly confined environments as into nanotubes.

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