



Cite this: *Phys. Chem. Chem. Phys.*,
2023, 25, 18310

Effect of oxidation on POPC lipid bilayers: anionic carboxyl group plays a major role[†]

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Phospholipids with unsaturated acyl chains are major targets of reactive oxygen species leading to formation of oxidized lipids. Oxidized phospholipids have a pronounced role in cell membrane damage. We investigated the effect of oxidation on physiological properties of phospholipid bilayers using atomistic molecular dynamics simulations. We studied phospholipid bilayer systems of 1-palmitoyl-2-oleoyl-*sn*-glycero-3-phosphocholine (POPC) and its two stable oxidized products, 1-palmitoyl-2-(9'-oxo-nonanoyl)-*sn*-glycero-3-phosphocholine (PoxnoPC) and 1-palmitoyl-2-azelaoyl-*sn*-glycero-3-phosphocholine (PazePC). Structural properties of the POPC lipid bilayer upon the addition of PoxnoPC or PazePC with concentration ranging from 10% to 30% were described. The key finding is that PazePC lipids bend their polar tails toward the bilayer-water interface whereas PoxnoPC lipids orient their tail toward the bilayer interior. The bilayer thickness decreases such that the thickness reduction in bilayers containing PazePC is stronger than in bilayers containing PoxnoPC. The average area per lipid decreases with a stronger effect in bilayers containing PoxnoPC. The addition of PoxnoPC makes both POPC acyl chains slightly more ordered whereas the addition of PazePC reduces the order in the two POPC acyl chains. These structural changes lead to an enhancement in the permeabilities of the bilayers containing these two oxidized products depending on the type, and the amount of oxidation. This enhancement can be achieved with a lower concentration of PazePC (10% or 15%), whereas a higher concentration of PoxnoPC (20%) is required to achieve an apparent enhancement in permeability. While the permeability of bilayers containing PazePC is higher than bilayers containing PoxnoPC in the 10–20% concentration range, by increasing the concentration of the oxidized products to higher than 20%, permeability of the bilayers containing PazePC is reduced such that it is slightly smaller than those containing PoxnoPC.

Received 13th April 2023,
Accepted 26th June 2023

DOI: 10.1039/d3cp01692g

rsc.li/pccp

1 Introduction

Biological membranes play a central role in the control and execution of various cellular processes. Phospholipid bilayers are the building blocks of the majority of cellular membranes. Their main roles include forming a semipermeable barrier which separates the interior of a cell from its environment, protecting cells, and selectively controlling permeation of nutrients and

waste in and out of cells.¹ Thus, understanding structure and permeation properties of phospholipid bilayers such as thickness, membrane fluidity, and permeability upon addition of different substances is very important.

The lipid composition of cellular membranes is extremely diverse. Phospholipids differ in their chain length and saturation, charge, and size of their headgroups. Phospholipids with unsaturated acyl chains are among the most important and biologically

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[†] Electronic supplementary information (ESI) available: Fig. S1 shows bilayer thickness (left) and area per lipid (right) as a function of time for the pure POPC bilayer; Fig. S2 shows bilayer thickness as a function of time for the POPC bilayers containing 10%, 15%, 20%, 25%, and 30% PoxnoPC (left) and PazePC (right); Fig. S3 shows area per lipid as a function of time for the POPC bilayers containing 10%, 15%, 20%, 25%, and 30% PoxnoPC (left) and PazePC (right); Fig. S4 shows density distributions of the lipid head groups and oxidized functional groups along the z-axis with respect to the distance from the bilayer center for the POPC bilayer containing 10%, 15%, 20%, and 25% PazePC (left) and PoxnoPC (right). Movies of systems with 30% PazePC and 30% PoxnoPC are provided at DOI: <https://doi.org/10.5281/zenodo.7810559>. See DOI: <https://doi.org/10.1039/d3cp01692g>



relevant lipids in eukaryotic cell membranes.¹ The double bonds in the unsaturated acyl chains are prone to oxidative processes caused by reactive oxygen species (ROS, e.g., $\cdot\text{OH}$, $^1\text{O}_2$, H_2O_2 , $\cdot\text{O}$, O_3 , etc.).²⁻⁴ These reactions usually cause the cleavage of unsaturated acyl chains and introduce polar moieties at their terminals.^{5,6} This change in chemical structure of phospholipids perturbs the bilayer structure and modifies their physiological properties, the effects of which can trigger mitochondrial damage⁷ or mediate various disease such as Parkinson's, Alzheimer's,⁸⁻¹² schizophrenia,¹³ atherosclerosis,^{13,14} inflammatory diseases,¹⁵ etc. Nonetheless, inducing apoptotic cell death by delivering ROS to cells in a controlled and selective fashion is the basis of cold (room temperature) plasma therapy.^{16,17} Cold plasma is an emerging technology which is being investigated for wound healing,^{18,19} treatment of skin related disorders^{20,21} and a variety of cancer types.²²⁻²⁴ The main phospholipid in all mammalian cells (40–50%) and lipoprotein particles is phosphatidylcholine (PC). Therefore, most oxidized phospholipids detected in mammalian tissues contain the choline moiety.²⁵⁻²⁷ 1-palmitoyl-2-oleoyl-sn-glycero-3-phosphocholine (POPC) is an example of monosaturated lipid with one saturated 16:0 fatty acid chain (*sn*-1) and one unsaturated 18:1 fatty acid chain (*sn*-2) with two ester carbonyls,^{1,28,29} see Fig. 1 for its chemical structure. POPC can be oxidized at the double bond of its unsaturated (*sn*-2) fatty acid chain leading to two stable products: PoxnoPC (1-palmitoyl-2-(9'-oxo-nonanoyl)-sn-glycero-3-phosphocholine) and PazePC (1-palmitoyl-2-azelaoyl-sn-glycero-3-phosphocholine) bearing aldehyde and carboxyl groups at the end of their truncated *sn*-2 chains, respectively. At neutral pH, the aldehyde group of PoxnoPC and the carboxyl

group of PazePC are neutral and negative (anionic), respectively.^{26,30} Chemical structure of PoxnoPC and PazePC are shown in Fig. 1. PoxnoPC can be produced by the reaction of ozone with lung surfactant extract as a product of the ozonolysis of the unsaturated chain at carbon-9.³¹ PazePC is involved in the genesis of atherosclerosis and has been identified in oxidized LDL particles.³² These two oxidation products are also found in POPC bilayers after treating by cold plasma where the plasma-treated POPC bilayer shows full permeability.³³

The effect of PazePC and PoxnoPC on the monolayer properties of 1,2-dipalmitoyl-sn-glycero-3-phosphocholine (DPPC) were investigated using Langmuir balance by Sabatini *et al.*³⁴ where the possibility of *sn*-2 chain reversal of these two oxidized products toward the aqueous interface was suggested. This was further studied in association with permeability of cationic protein cytochrome *c* in micelles composed of these oxidized lipids.³⁵ As such, functional role of PoxnoPC and PazePC in serving as potential drug targets for antimicrobial peptides and antipsychotic compounds in cells under oxidative stress has proposed.^{36,37} To get microscopic insight into their structural properties, molecular dynamics (MD) simulations of POPC bilayer systems containing these oxidized lipids have also been performed.^{38,39} These studies differ in the system sizes, force field parameters, simulation times, and the concentration of oxidized products present in the bilayer.

In this work, we employ MD simulations to study the effect of lipid oxidation on the properties of POPC bilayer in a systematic manner. We describe structural modifications of the POPC bilayer upon the addition of PoxnoPC or PazePC at five concentrations ranging from 10% to 30% with the aim of characterizing the relation between membrane permeability and structural modifications. Our main finding is that the carboxyl group of PazePC lipids is located at the aqueous interface for all five concentrations, confirming the so-called *extended conformation* of PazePC *sn*-2 chains postulated by experiments.³⁴⁻³⁷ This is accompanied by a reduction in the bilayer thickness, and the POPC chain order. Area per lipid decreases upon addition of 10% PazePC, however it remains almost constant by further increase in concentration up to 30%. On the contrary, the aldehyde group of PoxnoPC lipids is located in the inner part of the bilayer. Upon the addition of PoxnoPC to the POPC bilayer, the thickness of bilayers decreases, but not as strongly as upon the addition of PazePC; the POPC chain order increases slightly, and the area per lipid decreases. These structural modifications lead to an increase in permeability of water molecules through the bilayers containing these two oxidized products depending on the type, and the amount of oxidation (PazePC or PoxnoPC). A lower concentration of PazePC (10% to 15%) leads to an enhancement in permeability, whereas a concentration of 20% PoxnoPC is required to achieve a noticeable enhancement. While bilayers containing PazePC have a larger permeability than bilayers containing PoxnoPC in the 10–20% concentration range, increasing the concentration to more than 20% results in a reduction in permeability of bilayers containing PazePC to slightly smaller than those containing PoxnoPC.

The rest of this article is organized as follows: the simulation parameters and methods are described in Section 2. It is

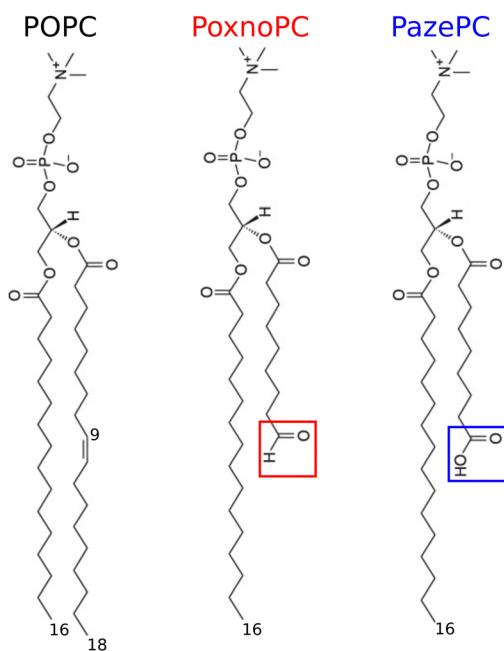


Fig. 1 Chemical structures of POPC and its two main oxidative products, PoxnoPC and PazePC lipids. The red and blue boxes indicate the zwitterionic aldehyde group of PoxnoPC and the anionic carboxyl group of PazePC, respectively.



followed by the analysis of structural properties of the pure POPC bilayer, and bilayers with various concentrations of PoxnoPC or PazePC in Section 3. Section 5 provides a discussion and comparison of the results to those reported in literature. Finally, concluding remarks are presented in Section 6.

2 Methods

A series of MD simulations of bilayers containing pure POPC and binary mixtures of POPC with 10%, 15%, 20%, 25%, and 30% oxidized POPC (PazePC or PoxnoPC) was performed. Each of the bilayers was composed of a total of 512 lipid molecules. In each bilayer with a non-zero concentration of oxidized lipids, a number of POPC lipids were replaced by oxidized ones such that each of the two leaflets contained the same number of oxidized lipids. Details of the systems are shown in Table 1.

The simulations were performed using the Groningen Machine for Chemical Simulation (GROMACS) version 2021.3⁴⁰ and Gromos54a7⁴¹ force field with parameters and protocol described in ref. 42–48. The GROMOS united atom force field has been tested and successfully applied in different biomolecular applications, such as protein folding, biomolecular association, membrane formation, transport over membranes, and protein-lipid nanodisks.⁴⁹ One of the advantages of a united atom force field is that the total number of atoms is significantly smaller than in all-atom simulations. United atom force fields can be considered to be of atomic resolution since, typically, only essential hydrogens are kept while others are integrated in the descriptions of carbons they are covalently bound. It should also be noted that in a typical all-atom simulation in which all the hydrogens are included, one typically constrains the hydrogens. This, given the success of this united atom force field, and that it allows for simulations of significantly larger systems and time scales were the main drivers for our choice of force field. The atomic coordinates and united atom parameters of the POPC lipids were taken from Poger and Mark.^{50,51} The atomic coordinates and the united atom parameters of the PazePC and PoxnoPC lipids were determined using the Automated Topology Builder.^{52,53}

After energy minimization using the steepest descents algorithm, the MD simulations were run for 1 μ s with a time step of 2 fs.

Table 1 List of simulated systems showing the total number of phospholipids (PLs), oxidized PLs, the total number of solvent (SOL) molecules, and sodium counterions (Na^+)

System	Total No. PLs	No. POPC	No. oxidized PLs	No. SOL	No. Na^+
100% POPC	512	512	0	25 600	—
10% PoxnoPC	512	460	52	25 600	—
15% PoxnoPC	512	435	77	25 600	—
20% PoxnoPC	512	408	104	25 600	—
25% PoxnoPC	512	384	128	25 600	—
30% PoxnoPC	512	358	154	25 600	—
10% PazePC	512	460	52	25 548	52
15% PazePC	512	435	77	25 523	77
20% PazePC	512	408	104	25 496	104
25% PazePC	512	384	128	25 472	128
30% PazePC	512	358	154	25 446	154

All simulations were performed in the constant number of atoms, pressure, and temperature (*NPT*) ensemble. The temperature was set to 300 K by the velocity-rescale algorithm⁵⁴ which was applied separately to the lipids and water (ions were grouped with water) with a time constant of 0.1 ps. The pressure was kept constant at 1 bar by applying a semi-isotropic pressure using the Parrinello-Rahman algorithm⁵⁵ with a time constant of 3 ps and compressibility of 4.5×10^{-5} bar⁻¹. Periodic boundary conditions were applied in all dimensions. All bond lengths were constrained using the parallel linear constraint solver (P-LINCS) algorithm.⁵⁶ A cutoff of 1.0 nm was used for the Lennard-Jones and the real space part of the electrostatic interactions. The particle-mesh Ewald method^{57,58} was used to compute the long-range part of the electrostatic interactions with a 0.12 nm grid in the reciprocal-space and cubic interpolation of 4. Water molecules were modelled using the simple point charge (SPC)⁵⁹ model. Sodium counterions Na^+ were added to the systems containing PazePC to retain overall charge neutrality. Visual Molecular Dynamic (VMD) software⁶⁰ was used for snapshots.

3 Analysis & results

Fig. 2 and 3 show snapshots of the bilayers and representative orientations of the lipids, respectively. In the analysis below, the final 500 ns of simulations (500–1000 ns), allowing the first 500 ns of each independent simulation to be an equilibrium period, was used. Approach to equilibrium was monitored by measuring the leveling-off of the bilayer thickness and the area per lipid (see Fig. S1–S3, ESI†).

3.1 Bilayer thickness

Bilayer thickness was measured based on the positions of the phosphorous (P) atoms in the lipid headgroups. Fig. 4 shows the average bilayer thickness of the POPC bilayer upon the addition of PoxnoPC or PazePC at various concentrations in the top part. The bilayer containing pure POPC had a thickness of about 37.5 Å in good agreement with previous studies.⁶¹ The thickness became reduced upon the addition of oxidized products (PazePC or PoxnoPC) such that bilayers with PazePC lipids had a smaller thickness than bilayers containing PoxnoPC lipids. In the case of 30% oxidation, the thickness was reduced to about 34.6 Å and 36.6 Å for PazePC and PoxnoPC, respectively.

In the bottom part of Fig. 4, the average P–P distance of each lipid type (POPC and PazePC/PoxnoPC) is plotted for the POPC bilayers containing various concentrations of PazePC or PoxnoPC. In the bilayers containing PazePC, the positions of the PazePC headgroups were higher than the positions of the POPC headgroups as P–P distance of PazePC lipids was larger than P–P distance of POPC lipids. By increasing the concentration of PazePC, P–P distance of both the PazePC and POPC lipids were reduced. However, in bilayers containing PoxnoPC lipids, the positions of the POPC headgroups were higher than the positions of PoxnoPC lipids. Increasing the concentration of the PoxnoPC did not have any major influence on the P–P distance of either of the lipid types.

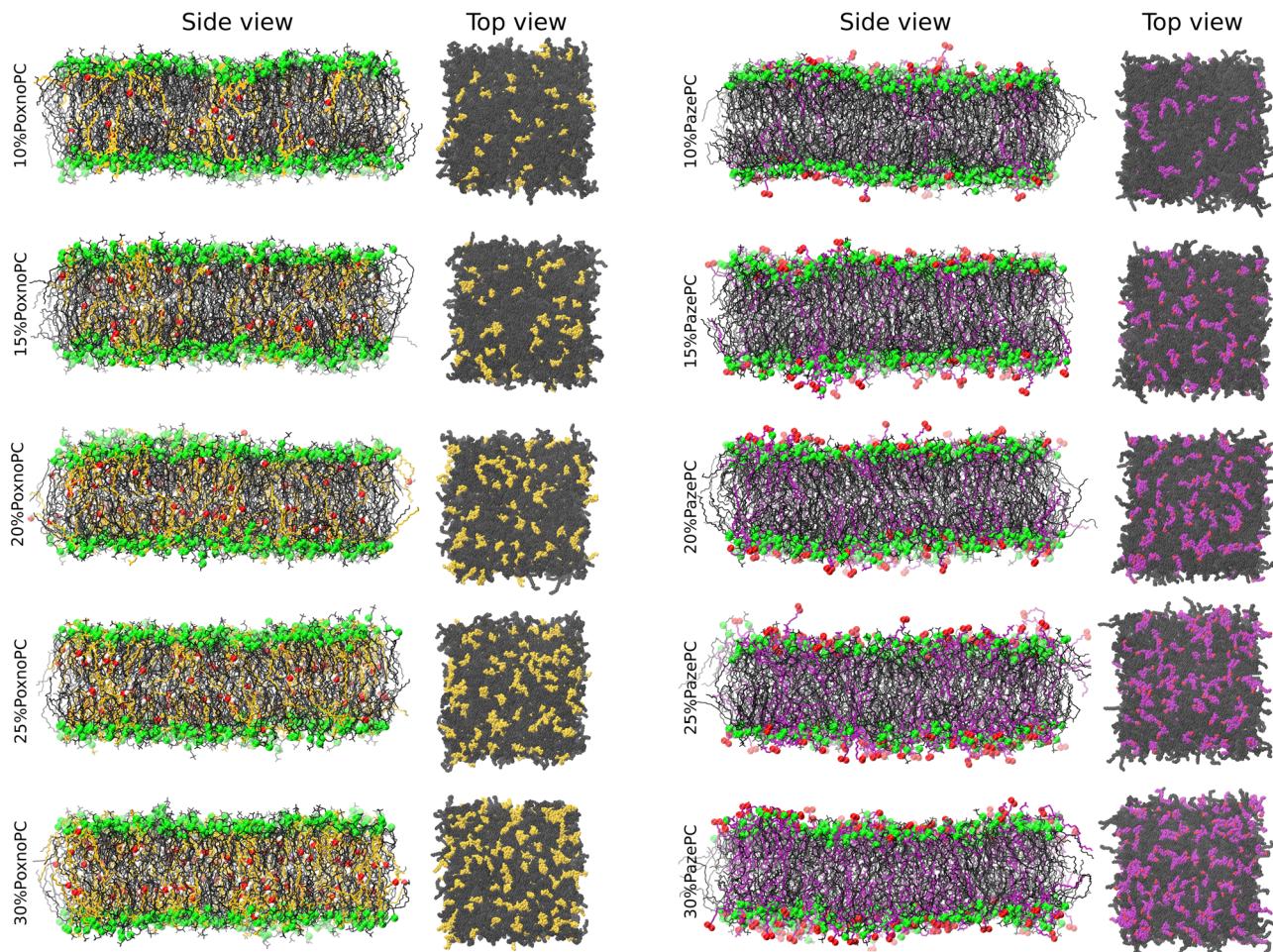


Fig. 2 Top and side views of the lipid bilayers containing POPC with 10%, 15%, 20%, 25%, and 30% PoxnoPC (left) and PazePC (right) after 1 μ s. Phosphorous atoms in lipid headgroups are shown as green spheres, the lipid chains of POPC, PoxnoPC, and PazePC are shown as black, yellow, and magenta lines, respectively. The oxidized functional groups are displayed as red and white spheres representing the oxygen and hydrogen atoms. The PoxnoPC hydroxyl groups orient towards the bilayer in the interior region, whereas the PazePC lipids undergo chain reversal with the carboxyl groups pointing towards the bilayer-water interface. Water molecules are removed from the visualization for clarity.

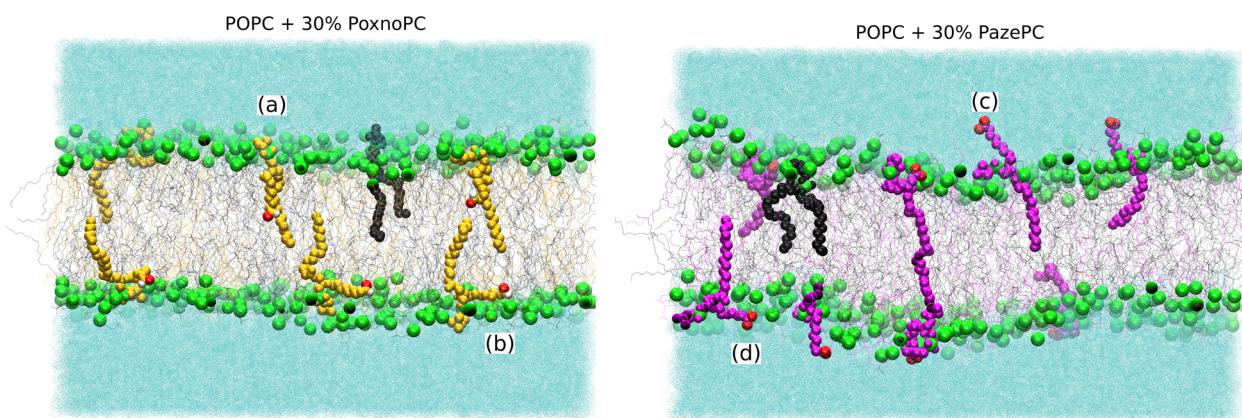


Fig. 3 Snapshots showing typical orientations of the POPC and PoxnoPC/PazePC lipids in bilayers containing 30% PoxnoPC (left) or PazePC (right). The POPC, PoxnoPC, and PazePC lipids are shown in black, yellow, and magenta, respectively. The phosphorous atoms in the lipid headgroups are shown in green. The oxidized functional groups are displayed as red and white spheres representing the oxygen and hydrogen atoms. Water is represented in light blue. (a), (c), and (b, d) indicate an orientation with the polar group in the bilayer interior, inside water, and at the bilayer-water surface (or at the position of the headgroups), respectively.

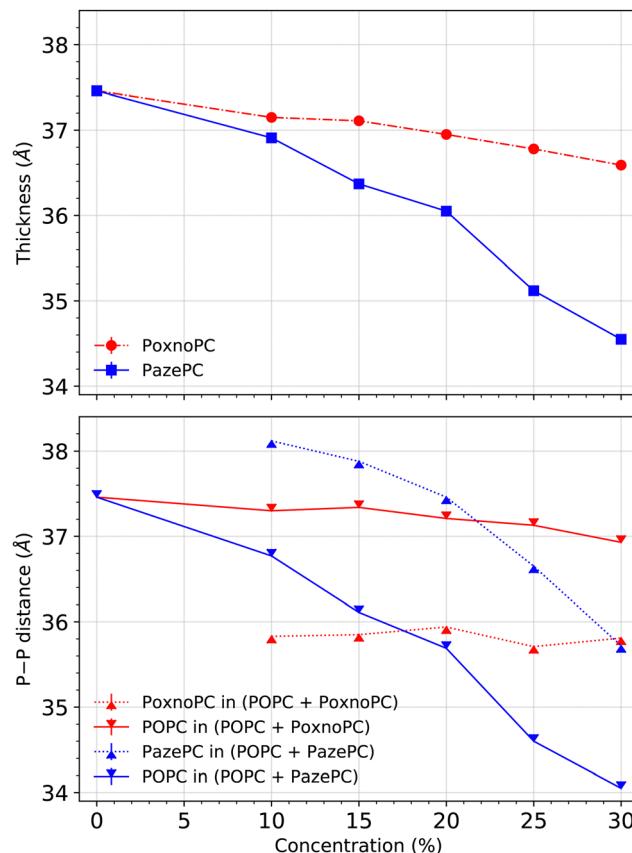


Fig. 4 Top: Average bilayer thickness at various concentrations of oxidized lipids. Bottom: The average P–P distance of each lipid type. Error bars were calculated based on standard error and are smaller ($<10^{-3}$) than the size of markers.

3.2 Area per lipid

We calculated the area per lipid using the LiPyphilic⁶² analysis tool which utilizes 2D Voronoi tessellation⁶³ and the locality module of the Freud software package.⁶⁴ Each of the lipids was assigned to one of the two leaflets, and then the areas were calculated for each lipid type. The phosphorous atoms were used as lipid headgroup identifiers.

Fig. 5 (top) shows the average area per lipid. When the concentration of PoxnoPC was increased, the average area per lipid decreased. The average area per lipid for pure POPC bilayer was about 64.3 \AA^2 , while it was reduced to about 61.0 \AA^2 in the 30% PoxnoPC bilayer. Upon addition of 10% PazePC to the POPC bilayer, the average area per lipid decreased to about 63.1 \AA^2 . Further increase in the concentration of PazePC up to 30% did not have any major influence. The bottom of Fig. 5 shows the average area per each lipid type. The average area per POPC was decreased upon the addition of oxidized lipids such that the decrease was almost independent of the type of oxidation, and, rather, dependent on the level of oxidation. In the POPC bilayers containing PoxnoPC, the average area per PoxnoPC was smaller than the average area per POPC such that it was about 59.4 \AA^2 at 10% PoxnoPC concentration. Further increase in the PoxnoPC concentration up to 30% did not affect it. On the contrary, in the

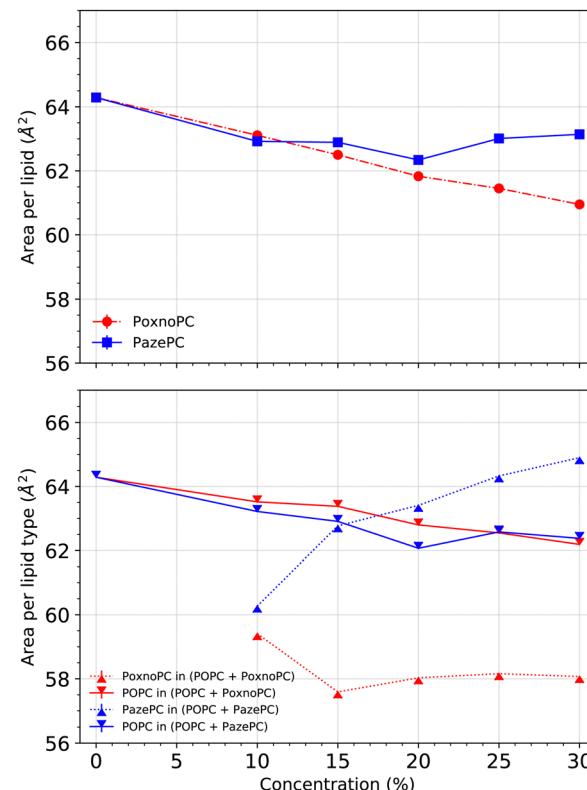


Fig. 5 Top: Average area per lipid at various concentrations of the oxidized lipids. Bottom: Average area per lipid type. Error bars were calculated based on standard error and are much smaller than the size of the markers.

POPC bilayers containing PazePC the average area per PazePC was increased upon concentration such that it was about 60.3 \AA^2 for the 10% PazePC bilayer and 65.0 \AA^2 in the 30% PazePC bilayer.

3.3 Deuterium order parameter

The order parameter per carbon for each acyl chain was computed using

$$S_{CD} = \frac{1}{2} |\langle 3 \cos^2(\theta) - 1 \rangle|, \quad (1)$$

where θ is the angle between the carbon–deuterium (CD) bond vector and the bilayer normal. The brackets indicate averaging over the two bonds in a given CD group, over all the lipids and over time. The *gmx* order tool is known to mistreat the unsaturated double bonds unless particular care is taken^{61,65,66} and hence we used *gmx* order with the correction for the double bonds.⁶⁶ In addition, we calculated the average order parameter for all the carbons within each chain.

Fig. 6 shows S_{CD} for the POPC *sn*-1 (top) and *sn*-2 (bottom) chains in the pure POPC bilayer and the bilayers containing PoxnoPC and PazePC oxidized products. The addition of PoxnoPC leads to slight increases of order in both of the POPC chains. However, the addition of PazePC decreases order in both the POPC chains. Fig. 7 shows the averaged order parameter as a function of oxidized lipid concentration. Overall, the addition of PoxnoPC increases order in both of the chains, whereas the



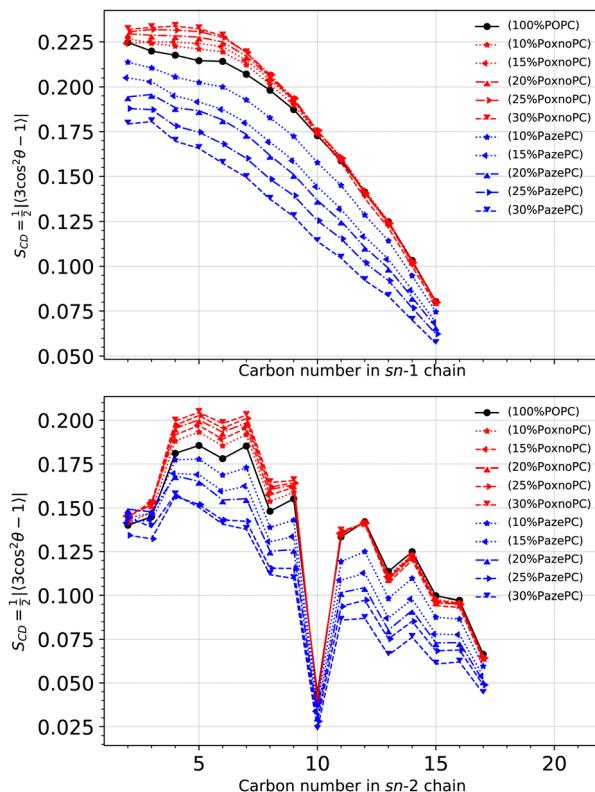


Fig. 6 Deuterium order parameter for each carbon atom in the *sn*-1 (top) and *sn*-2 (bottom) POPC chains at different concentrations of oxidized lipids. The deuterium order parameter is calculated according to eqn (1).

addition of PazePC decreases POPC chain order. Moreover, the POPC *sn*-1 chain is more ordered than the POPC *sn*-2 chain.

S_{CD} for the PoxnoPC and PazePC *sn*-1 and *sn*-2 chains are plotted in Fig. 8. The PazePC *sn*-1 chain is less ordered than the PoxnoPC *sn*-1 chain. The PazePC *sn*-1 chain order becomes reduced as the concentration of PazePC increases. Increasing the concentration of PoxnoPC, however, does not influence its *sn*-1 chain order. For the PoxnoPC *sn*-2, the chain order increases by increasing the concentration which in turn induces slightly more order in the POPC acyl chains (see Fig. 6). On the contrary, by increasing the PazePC concentration, the order parameter of the carbon atoms 2–5 in the *sn*-2 chain increases with almost no effect on carbons 6–8. The ordering of the end carbon atoms (6–8) of the PazePC *sn*-2 chain supports the strong affinity of the anionic carboxyl group toward aqueous phase.

3.4 Density distribution of lipid components and water

Partial densities of the lipid headgroups and the oxidized groups across the simulation box were calculated using the *gmx density* tool. The phosphorous (P) atoms were used as lipid head identifiers. The hydrogen (H) and oxygen (O) atoms were used as identifiers for PoxnoPC aldehyde group. The two oxygen atoms (O1 and O2) were used as identifiers for the PazePC carboxylic group.

Fig. 9 shows the partial densities of the lipid headgroups and the components of the oxidized groups across the simulation box for bilayers containing 30% PoxnoPC (top) and PazePC (bottom), respectively. Fig. S4 (ESI[†]) also shows the density

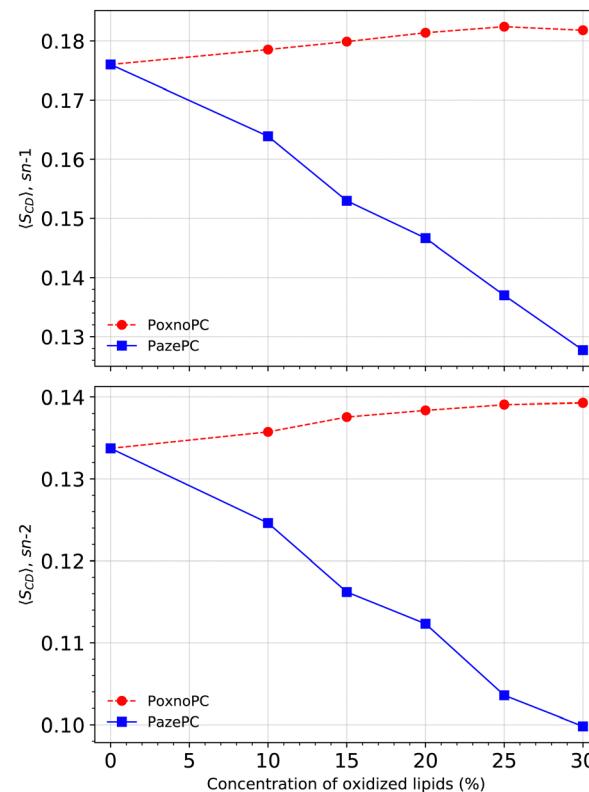


Fig. 7 Averaged deuterium order parameter along the *sn*-1 (top) and the *sn*-2 (bottom) lipid chains at different concentrations.

profiles of the POPC bilayers at 10%, 15%, 20%, and 25% PazePC and PoxnoPC. The aldehyde group of PoxnoPC is typically located in the interior part of the bilayer. The PazePC carboxylic group, however, prefers the bilayer–water surface. This is also evident from the snapshots in Fig. 2 and 3 where typical orientations of POPC and PoxnoPC and PazePC are presented. The *sn*-2 chain of PoxnoPC typically points toward the bilayer interior ((a) orientation in Fig. 3) and occasionally locates at the bilayer–water surface ((b) orientation in Fig. 3). The PazePC *sn*-2 chain, however, adapts the so-called *extended conformation*^{34,67} with the carboxylic group in the water phase or at the bilayer–water surface ((c) and (d) orientations in Fig. 3). In systems containing PazePC, the carboxylic groups are highly polar and able to form strong hydrogen bonds with the water molecules, and they prefer to stay at the interface. On the other hand, the aldehyde lipid tails are significantly more mobile than the carboxylic ones. The locations of the functional groups in the oxidized tails are in agreement with previous studies of oxidized PLPC bilayers.^{46,47}

Fig. 10 shows the densities of the aldehyde and carboxylic functional groups across the simulation box for the POPC bilayer with various concentrations of PoxnoPC (top) or PazePC (bottom). By increasing the PoxnoPC concentration from 10% to 30% in the POPC bilayer, the location of the aldehyde functional group was shifted toward the bilayer center. A similar trend was appeared when the concentration of PazePC was increased from 10% to 30% in the POPC bilayer: the location of the carboxylic functional group was shifted slightly toward the bilayer interior.

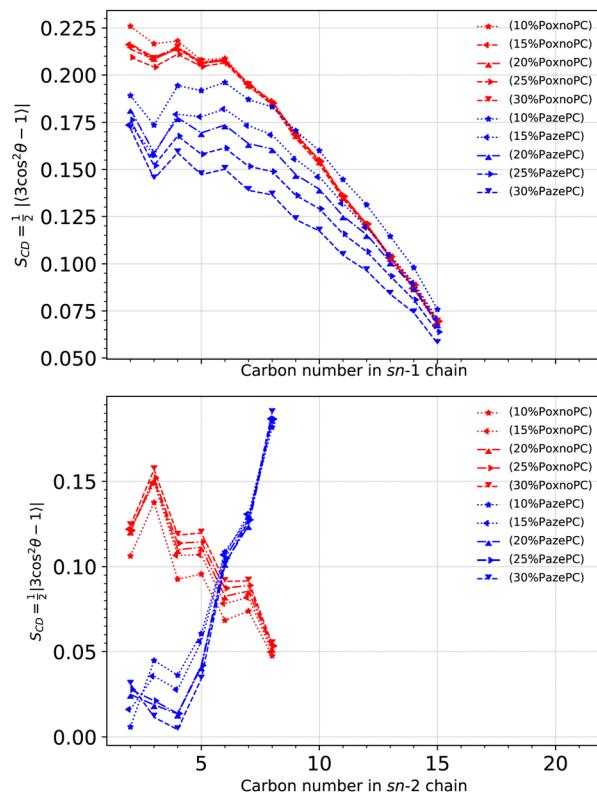


Fig. 8 Deuterium order parameter for each carbon atom in the *sn*-1 (top) and *sn*-2 (bottom) chains of PoxnoPC and PazePC at different concentrations. The deuterium order parameter is calculated according to eqn (1).

The density of the phosphorous atoms of the bilayers containing various concentrations of PoxnoPC or PazePC is plotted in Fig. 11. While the position of the lipid headgroups for the bilayers containing PoxnoPC lipids remain almost unaffected (for all the concentrations), it is moved slightly toward the center of the bilayer for the bilayers containing 25% and 30% PazePC lipids. This can be seen in Fig. 4 as well, where the average P-P distance is plotted in the bottom.

The average P-P distance of the PoxnoPC and POPC lipids did not vary as the concentration of PoxnoPC was increased. For the bilayers containing PazePC, however, the distance was reduced as the concentration of PazePC were increased. This, in turn, can be attributed to the position of the oxidized functional groups depending on whether they are located in the bilayer interior (Fig. 3(a)), in the water (Fig. 3(c)), or the headgroup region (Fig. 3(b and d)). As the PazePC concentration were increased to higher than 25%, the positions of the PazePC carboxylic groups were shifted from the water phase to the headgroup region. The latter distorts the positions of all the other headgroups which resulted in a reduction in bilayer thickness. On the contrary, with the PoxnoPC aldehyde group locating in the bilayer interior, the locations of lipid headgroups remain almost unaffected.

Fig. 12 shows the density distribution of the water molecules across the simulation box. The penetration depth depends on the type of oxidation. Upon the addition of 25% or 30% PazePC to the POPC bilayer, there is a visible enhancement in the

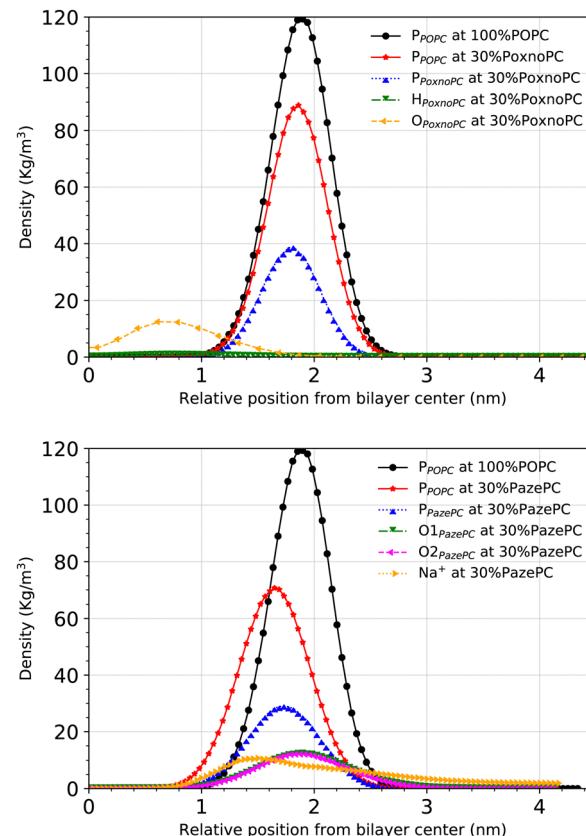


Fig. 9 Density distributions of the lipid headgroups and components of the oxidized functional groups along the *z*-axis with respect to the distance from the bilayer center at 100% POPC, and at 30% concentrations of PoxnoPC (top) and PazePC (bottom).

penetration depth of the water molecules. The addition of PoxnoPC up to 30%, however, has no influence on the density distribution of water molecules across the simulation box.

4 Water permeability

We calculated the permeability of water molecules through the membrane bilayer by direct counting as in ref. 68 and 69. For each system, the last 500 ns trajectory is divided into 20 ns intervals. The number of water molecules which diffuse across the bilayer is counted during each of these intervals, providing a rate (R_t). Permeability is calculated by $R_t V_w / N_A$ in which V_w is the average volume of a single water molecule (equals to $18 \text{ cm}^3 \text{ mol}^{-1}$), and N_A is the Avogadro's number. Then we take the average over all the intervals. The result is plotted in Fig. 13 in which the standard error is used to estimate the error bars.

Overall, the permeability of the POPC bilayer is increased upon the addition of oxidized products to the bilayer, the magnitude depending on the type and amount of oxidation. While the bilayer permeability is enhanced upon the addition of 10% or 15% PazePC to the POPC bilayer, a concentration of 20% of PoxnoPC is required to achieve an enhancement in the bilayer permeability. Although by increasing the concentration of PoxnoPC to higher than 20% the permeability is increased monotonically, there is a



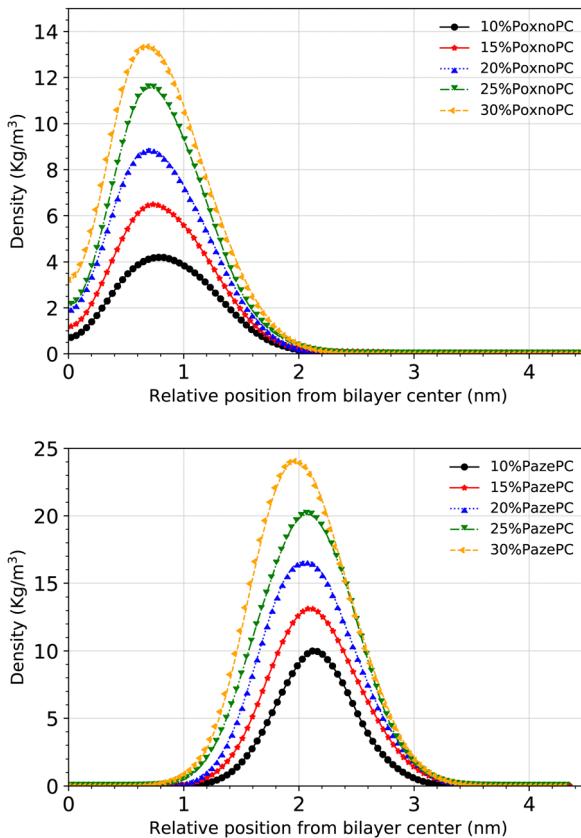


Fig. 10 Density distributions of the aldehyde and carboxylic functional groups along the z-axis with respect to the distance from the bilayer center for POPC at different concentrations of PoxnoPC (top) and PazePC (bottom).

reduction when the concentration of PazePC is increased from 20% to 25%. At 25%, and 30% concentrations, the permeability of the bilayer containing PazePC is slightly smaller than the bilayer containing PoxnoPC. This is correlated with the position of the PazePC carboxylic groups and the PoxnoPC aldehyde groups (see Fig. 10), and the position of lipid headgroups (see Fig. 11) as their concentration in the bilayer is increased. While the position of PoxnoPC aldehyde groups monotonically shifts more toward the bilayer center, at 25% concentration the position of PazePC carboxylic group at the membrane-water interface shifts slightly more toward the water phase (slight increase in the area per lipid, see Fig. 5). At 30% concentration it again shifts slightly back toward the headgroup position. This, as well, can be seen from Fig. 11 where density distributions of all the phosphorous atoms along the z-axis with respect to the distance from the bilayer center is plotted. At 25% and 30% concentration of PazePC, the position of phosphorous atoms shifts slightly toward the center compared to systems with 10%, 15%, and 20% PazePC concentration.

5 Discussion

Kinnunen⁶⁷ introduced extended conformation of lipids while describing qualitative models for the molecular mechanism of

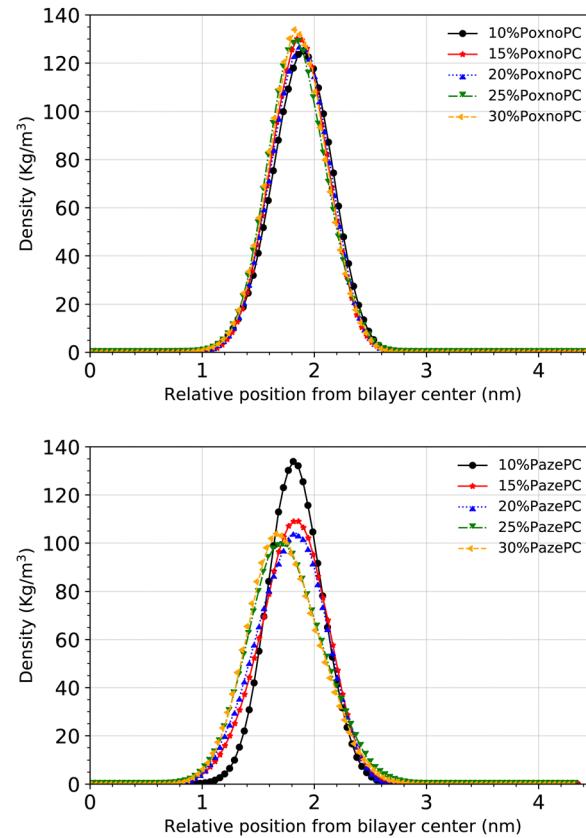


Fig. 11 Density distributions of all the phosphorous atoms along the z-axis with respect to the distance from the bilayer center for POPC at different concentration of PoxnoPC (top) and PazePC (bottom).

the fusion of lipid bilayers and for the lamellar-hexagonal ($L_\alpha \rightarrow H_\alpha$) phase transition. The main feature connecting these models was a hypothetical lipid conformation referred to as the extended conformation which could manifest itself at the contact site between two vesicles such that involves the extension of acyl chains of a phospholipid molecule in opposite directions while maintaining the headgroup in the interface. The importance of the extended conformation of lipids is that it allows for the fusion of two bilayer membranes to proceed with minimal exposure of the lipid hydrocarbon acyl chains to water. The energetic basis of this conformation was explained to arise from mitigating packing constraints due to geometric imbalance of the relative sizes of the hydrophobic and hydrophilic parts of the molecule. Later Sabatini *et al.*³⁴ postulated the possibility of *sn*-2 chain reversal of PazePC and PoxnoPC toward the aqueous interface when the effect of these two lipids on the monolayer properties of DPPC were investigated using Langmuir balance, and it was concluded that both oxidized lipids expand the monolayers with a stronger expansion in monolayers containing PazePC. This was further studied in association with permeability of cationic protein cytochrome *c* in micelles composed of these lipids.³⁵ As such, functional roles for PoxnoPC and PazePC in serving as potential drug targets for antimicrobial peptides and antipsychotic compounds in cells under oxidative stress was suggested.^{36,37} In another experiment,⁷⁰ effect of PazePC

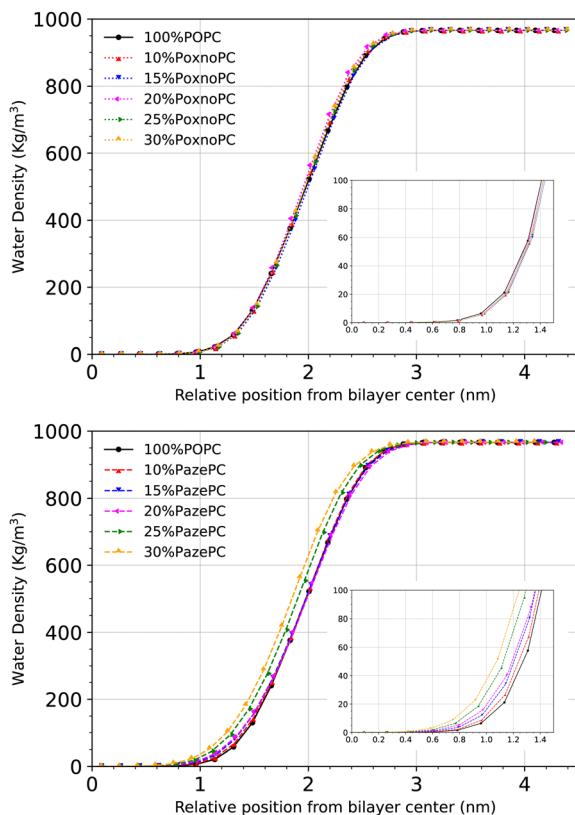


Fig. 12 Density distribution of water along the z -axis with respect to the distance from the bilayer center at different concentrations of PoxnoPC (top) PazePC (bottom) oxidized lipids. The insets show water density around the bilayer central region.

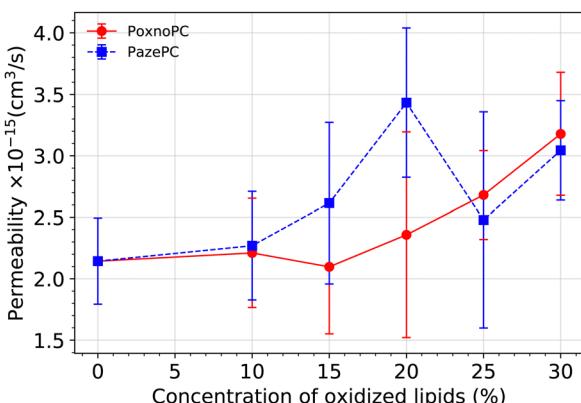


Fig. 13 Permeability of water molecules through the bilayer at various concentration of oxidized lipids. The error bars are calculated based on standard error.

on the model lipid rafts monolayer systems of ternary lipid mixtures of POPC, sphingomyelin (SM), and cholesterol were investigated where larger (more than 35%) molecular area of PazePC monolayer compared to POPC monolayer was attributed to the possible reversal of the PazePC *sn-2* chain. Furthermore, it was concluded that the PazePC lipids efficiently opposes the miscibility transition and stabilizes micron-sized domain separation.⁷⁰

Khandelia and Mouritsen³⁸ performed MD simulations to explore the possibility of chain reversal in oxidized phospholipids in bilayer containing binary mixtures of POPC with various concentrations (up to 25%) of PazePC or PoxnoPC during 100 ns simulation time (compared to 1 μ s in our simulations) with Berger *et al.*⁷¹ force fields. The total number of lipids (POPC + oxidized) in their simulations was 128 (compared to 512 in our simulations). They concluded that the anionic chain of PazePC undergoes chain reversal, and its carboxyl group points into water which is in agreement with our results. However, they reported that PoxnoPC *sn-2* tail adapts parallel conformation to the bilayer-water interface. This is contrary to our results. As discussed in Section 3.4 *sn-2* tails of the PoxnoPC lipids are located in the interior part of the bilayer for all concentrations (10%, 15%, 20%, 25% and 30%).

The results of Khandelia and Mouritsen³⁸ revealed an overall decrease in the average bilayer thickness with increasing the concentration of oxidized lipids. This is in agreement with our results. However, contrary to our results, bilayers containing PazePC lipids have a larger thickness than bilayers containing PoxnoPC: 36.2 \AA (PazePC) compared to 34.60 \AA (PoxnoPC) for the system with 25% oxidation. Thickness of about 38.2 \AA was measured for the pure POPC bilayer. Our simulations predict a thickness of 35.1 \AA for PazePC and 36.8 \AA for PoxnoPC for the bilayer with 25% oxidation.

The discrepancy between our results and the results of Khandelia and Mouritsen³⁸ is more reflected in the average area per lipids. According to Khandelia and Mouritsen,³⁸ presence of PoxnoPC lipids in bilayers increases average area per lipids. However, presence of PazePC up to 6% decreases the average area per lipid while it remains unaffected by further increasing the concentration of PazePC to 12.5% or 25%. For the bilayer containing 25% PoxnoPC, the area per lipid is about 69.11 \AA^2 whereas for the bilayer containing PazePC, it is about 64.57 \AA^2 . The average area per lipid for the pure POPC bilayer is about 65.5 \AA^2 . Our simulations predict an area per lipid of about 64.3 \AA^2 for pure POPC, 63.0 \AA^2 for POPC – 25% PazePC, and 61.5 \AA^2 for POPC – 25% PoxnoPC bilayers.

Although the simulation results of Khandelia and Mouritsen,³⁸ in particular the *sn-2* chain reversal of both PoxnoPC and PazePC and the area per lipids of PoxnPC, seem to be in agreement with the postulated model of Sabatini *et al.*,³⁴ their results of area per lipids for PazePC are in conflict with this model as areas are reduced upon the addition of PazePC to the bilayer. While computational bilayer models are not directly comparable to monolayer experiments, the authors in ref. 38 attributed this conflict to the presence of sodium counterions in the simulations.

In another study, Schumann-Gillett and O'Mara³⁹ simulated POPC bilayers containing 10% PoxnoPC or PazePC (in total 140 lipids) for 0.5 μ s using a modified force field by Poger and Mark^{50,51} with the focus of investigating the effect of 10% oxidation or 20% cholesterol concentration on structural properties of POPC bilayers. Their simulations predict extended conformation of the PazePC *sn-2* tail pointing into the water phase, and orientation of the PoxnoPC *sn-2* tail towards the bilayer center; in agreement with our results. According to Schumann-

Gillett and O'Mara,³⁹ incorporating 10% PazePC or PoxnoPC does not have a strong effect on the average bilayer thickness of systems with total 140 lipids. According to our results, bilayer thickness is reduced by about 1.5% and 0.8% upon the addition of 10% PazePC or PoxnoPC to POPC bilayer, respectively. Schumann-Gillett and O'Mara³⁹ report a slight decrease in the area per lipid due to presence of oxidized products. Accordingly, the area per POPC for a pure bilayer is $60.4 \text{ \AA}^2 \pm 0.9 \text{ \AA}^2$. Upon the addition of 10% PoxnoPC or PazePC to the bilayer, the area per POPC is reduced to values $59.0 \text{ \AA}^2 \pm 1.0 \text{ \AA}^2$ and $58.1 \text{ \AA}^2 \pm 0.8 \text{ \AA}^2$, respectively. According to our results, the average area per lipid in the pure POPC bilayer is about 64.3 \AA^2 where it is reduced to about 63.5 \AA^2 for the POPC – 10% PoxnoPC bilayer and 63.2 \AA^2 for the POPC – 10% PazePC bilayer. These discrepancies between our results and those of Schumann-Gillett and O'Mara³⁹ might be due to the low number of total lipids (140) which was used in their simulations. The system size is an important and understudied matter. The importance of size and the emergence of finite size effects have been recently demonstrated in the context of the bilayer ripple phase by Walter *et al.*⁷² and Davis *et al.*⁷³

Bernova *et al.*⁷⁴ studied properties of phospholipid bilayers containing mixtures of POPC and 10% PGPC or 10% POVPC using fluorescence spectroscopy and molecular dynamics simulations with Berger *et al.*⁷¹ force field. PGPC and POVPC are anionic and zwitterionic oxidized products of POPC in which the carbon 5 atom of the *sn*-2 acyl chain is truncated by carboxyl or aldehyde groups, respectively. Their bilayer systems contained 128 lipids which were equilibrated for 100 ns. In agreement with our results, they reported chain reversal of the negatively charged PGPC *sn*-2 chain into water. The *sn*-2 acyl chain with neutral but polar aldehyde terminal group reorients in all directions with a strong reduction in the 180° tilt angle region (180° tilt angle corresponds to a chain oriented completely parallel to the membrane normal and toward bilayer interior, 0° tilt angle characterises a chain pointing toward the water phase). In bilayers containing POPC and 10% PGPC studied by Bernova *et al.*,⁷⁴ the membrane becomes more compact due to the removal of the *sn*-2 chains from the bilayer interior resulting in a decrease in the area per lipid to a value of 61 \AA^2 , whereas the area per lipid calculated for pure POPC is about 66 \AA^2 . In the case of POVPC enriched bilayers, no reduction in the area per lipid was observed. According to their simulations, POVPC adapts a combination of fully reversed *sn*-2 chains or *sn*-2 chains parallel to the membrane surface. While fully reversed chains cause membrane compactness, the parallel orientation of chains to the membrane surface leads to area expansion. In the case of POVPC, these two competing factors seem to cancel each other out. In agreement with our results, in bilayers containing POPC and 10% POVPC studied by Bernova *et al.*,⁷⁴ a distinctive deeper water penetration into the bilayers was observed.

Our results of deuterium order parameter for pure POPC are in excellent agreement with those of Piggot and coworkers⁶⁶ and Schumann-Gillett and O'Mara.³⁹ Larger order parameter indicate straighter lipid chains, and are associated with the biophysical *liquid ordered* phase. Upon the addition of PoxnoPC to bilayers, the lipid chains tend to become slightly more

ordered, whereas the addition of PazePC induces more disorder to the chains. While the latter agrees with Khandelia and Mouritsen,³⁸ they predict more disorder upon the addition of PoxnoPC. Schumann-Gillett and O'Mara's results³⁹ predict a lesser effect on the order parameter by the addition of 10% PazePC or PoxnoPC. In addition, the results of deuterium order parameter for PazePC and PoxnoPC chains are in good agreement with Schumann-Gillett and O'Mara³⁹ and Ferreira *et al.*⁷⁵

6 Conclusions

We have presented results of atomic scale MD simulations of bilayers containing pure POPC and its binary mixtures with 10%, 15%, 20%, 25%, and 30% PazePC or PoxnoPC. Our results show that even a modest addition (10%) of PazePC or PoxnoPC to the POPC bilayer has major influence on its structural properties:

- The POPC bilayer thickness decreases upon the addition of oxidized lipids (PazePC/PoxnoPC) such that bilayers containing PazePC have a smaller thickness than bilayers containing PoxnoPC. In bilayers containing PoxnoPC, the POPC headgroups are located higher than the PoxnoPC headgroups. On the contrary, the PazePC headgroups are located higher than the POPC headgroups in the bilayers containing PazePC.
- The average area per lipid decreases upon the addition of PoxnoPC to bilayers. By adding 10% PazePC to the POPC bilayer, the average area per lipid decreases. However, it remained almost unchanged by further increase in the concentration up to 30%. The average area per POPC decreases upon the addition of oxidized lipids such that is almost independent of the type of oxidation. While increasing the concentration of PazePC increases its average area, increasing concentration of PoxnoPC has little effect on it.
- The addition of PoxnoPC to POPC bilayer induces slightly more order to both POPC chains, whereas the addition of PazePC decreases POPC chain order.
- The PazePC carboxylic group is located at the water–bilayer interface; indicating an extended conformation of PazePC *sn*-2 chain pointing towards aqueous phase, whereas the PoxnoPC aldehyde group is located in the interior part of bilayer.

The above structural changes in bilayers containing PazePC or PoxnoPC lead to a distinctive increase in permeability of water molecules across the bilayer which depends on the type, and the level of oxidation. While a concentration of 10% or 15% PazePC increases the permeability, a concentration of at least 20% PoxnoPC is required to induce a visible enhancement in the bilayer permeability. In the 10–20% range concentration, the permeability of bilayers containing PazePC is larger than bilayers containing PoxnoPC. At 25% concentration, however, the permeability of bilayer containing PazePC drops to slightly lower than the bilayer containing PoxnoPC. By increasing the concentration of oxidized products to more than 25%, the permeability of bilayers containing PazePC is slightly smaller than bilayers containing PoxnoPC. The possibility of chain reversal in PazePC is important for recognition of oxidation by various receptors. This may also suggest a mechanism for



the selectivity of therapies such as cold plasma therapy toward cancerous cells compared to normal cells.^{76,77}

Author contributions

All authors conceived the work and BB carried out the simulations. Data analysis was done by BB and PB, and all authors provided critical feedback on the interpretation of data, analysis and manuscript.

Conflicts of interest

There are no conflicts to declare.

Acknowledgements

The authors thank Antoinette Killian, Joseph Lorent, and Min Xie from the University of Utrecht for many fruitful discussions. BB thanks Björn Baumeier at the Technical University of Eindhoven (TU/e) for providing computational resources and the strategic alliance between TU/e, Utrecht University, and University Medical Center Utrecht for financial support. MK thanks the Natural Sciences and Engineering Research Council of Canada (NSERC) and the Canada Research Chairs Program for financial support. J. W. was financially supported by National Research Council of Thailand (NRCT) through the Research Grants for Talented Mid-Career Researchers with grant no. N41A640080.

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