Lipopolysaccharide Simulations are Sensitive to Phosphate Charge and Ion Parameterization

Amy Rice,[†,§] Mary Rooney,[‡] Alexander I. Greenwood,[‡,¶] Myriam L. Cotten,[‡] and Jeff Wereszczynski[*,†]

†*Department of Physics and Center for Molecular Study of Condensed Soft Matter, Illinois Institute of Technology, Chicago, IL 60616, United States*

‡*Department of Applied Science, College of William and Mary, Williamsburg, VA 23185, United States*

¶*Department of Physics, College of William and Mary, Williamsburg, VA 23185, United States*

§*Current address: Laboratory of Computational Biology, National Heart, Lung, and Blood Institute, National Institutes of Health, Bethesda, Maryland 20892, United States*

E-mail: jwereszc@iit.edu

Abstract

The high proportion of lipopolysaccharide (LPS) molecules in the outer membrane of Gram-negative bacteria make it a highly effective barrier to small molecules, antibiotic drugs, and other antimicrobial agents. Given this vital role in protecting bacteria from potentially hostile environments, simulations of LPS bilayers and outer membrane systems represent a critical tool for understanding the mechanisms of bacterial resistance and the development of new antibiotic compounds that circumvent these defenses. The basis of these simulations are parameterizations of LPS, which have been developed for all major molecular dynamics force fields. However, these parameterizations differ in both the protonation state of LPS as well as how LPS membranes behave

in the presence of various ion species. To address these discrepancies and understand the effects of phosphate charge on bilayer properties, simulations were performed for multiple distinct LPS chemotypes with different ion parameterizations in both protonated or deprotonated lipid A states. These simulations show that bilayer properties, such as the area per lipid and inter-lipid hydrogen bonding, are highly influenced by the choice of phosphate group charges, cation type, and ion parameterization, with protonated LPS and monovalent cations with modified nonbonded parameters providing the best match to experiments. Additionally, alchemical free energy simulations were performed to determine theoretical pK_a values for LPS, and subsequently validated by ^{31}P solid-state NMR experiments. Results from these complementary computational and experimental studies demonstrate that the protonated state dominates at physiological pH, contrary to the deprotonated form modeled by many LPS force fields. In all, these results highlight the sensitivity of LPS simulations to phosphate charge and ion parameters, while offering recommendations for how existing models should be updated for consistency between force fields as well as to best match experiments.

Introduction

Gram-negative bacterial infections are a significant public health threat,[1] and are typically more difficult to treat than Gram-positive infections[2–4] due to the presence of a second, outer membrane surrounding their peptidoglycan cell wall and plasma membrane. This outer membrane is highly asymmetric, containing predominately phospholipids in the inner leaflet, while the outer leaflet is rich in lipopolysaccharides (LPS).[5,6] LPS are structurally dissimilar from glycerophospholipids, and are composed of three regions: lipid A, which contains multiple saturated hydrocarbon chains and acts as the hydrophobic anchor; the core region, a collection of branched oligosaccharides that are often phosphorylated; and the O-antigen, a polymer of repeating saccharide units. The large number of anionic groups present in LPS imparts a net negative charge to the molecule, and leaflets are stabilized by

a network of divalent cations bridging these moieties.[7,8]

LPS modification processes, such as the PhoPQ system depicted in Figure 1, reduce this charge through adornment of the lipid A phosphate groups.[9–11] In *S. enterica*, these modifications are activated by a variety of environmental stimuli, such as a low concentration of divalent cations,[12,13] acidic conditions,[14,15] hyperosmotic stress,[16] or antimicrobial peptide presence,[17,18] indicating that modifications may confer a survival advantage in such conditions. Additionally, previous simulations have shown that the presence of aminoarabinose disrupts the cation network, allowing direct inter-lipid hydrogen bonding to instead stabilize the leaflet and potentially reducing the reliance on divalent cations for stability.[19]

Figure 1: Structure of LPS used in this study. (A) Structure of unmodified lipid A. (B) Modification by the *PhoPQ* regulatory system results in three key additions to the lipid A structure, shown in red.

Experimentally, LPS monolayers and bilayers display significant structural changes upon monovalent or divalent cation inclusion. X-ray reflectivity experiments on *Salmonella* LPS exhibited a clear trend of larger lamellar repeat periods with Ca^{2+} and Mg^{2+} compared to Na^+, regardless of chemotype.[20] X-ray diffraction on monolayers of similar LPS species showed a much lower compressibility for monolayers with Ca^{2+} than those with Na^+.[21] Furthermore, monolayers of *E. coli* LPS revealed significantly smaller lipid areas in the presence of 20 mM Ca^{2+} with 100 mM NaCl, compared to 100 mM NaCl alone or no ions,[22] indicating that the type of ion species has a larger influence on the monolayer structure than the ionic strength alone. The neutron scattering density profiles of Kucerka *et al.*

revealed decreased water penetration into the LPS core in Ca^{2+}-containing LPS bilayers only, compared to those containing either Na^+ or Mg^{2+}, despite the similar increased tail ordering observed with either divalent cation.[7] This intriguing difference between Ca^{2+} and Mg^{2+} may be attributable to calcium's lower hydration energy than magnesium, meaning that less energy is required to remove its hydration shell. In all, these results demonstrate a clear condensing effect of divalent cations, such as Ca^{2+} and Mg^{2+}, compared to Na^+. This condensing effect is manifested through smaller lipid areas, decreased tail mobility, and increased molecular packing.

LPS models have been parameterized for all major families of molecular dynamics (MD) force fields,[23–28] and outer membrane simulations with LPS are increasingly more common.[29–33] However, the performance of common ion force fields with these LPS models has rarely been evaluated, and inconsistencies exist between different parameterizations. The GROMOS-based force field of Pontes *et al.*, when simulated with Ca^{2+} or Na^+, was found to only form a stable lamellar phase in the presence of Ca^{2+};[24] simulations with Na^+ resulted in a clear transition from lamellar to nonlamellar structures. Kim *et al.*, utilizing the CHARMM LPS force field,[25] reported a compaction upon inclusion of K^+ or Na^+ compared to Ca^{2+} for all five LPS chemotypes simulated,[34] contrary to experiment. The closest match to experiment comes from the GLYCAM LPS[23] force field– simulations of asymmetric LPS bilayers displayed a decreased lipid area with divalent cations compared to monovalent cations;[8] however, the bilayer was not stable in the presence of K^+, breaking down within the first 50 ns of the simulation.

The troubling inconsistencies between these force fields may arise in part from the different ion and water models used. However, additional discrepancies exist between LPS parameterizations– there is no consensus on the charge state of phosphate groups within LPS and different force fields assign different net charges. The atomistic GLYCAM,[23] GROMOS-based,[24] and AMBER[27] force fields, as well as MARTINI-compatible coarse grained (CG) models built off them,[35,36] assign a charge state of -1 to the lipid A phosphate groups. In

contrast to this, the CHARMM LPS force field[25,34] and corresponding CG models[26] treat the lipid A phosphate groups as fully deprotonated, with a charge of -2 per phosphate. While no titration data exist for lamellar LPS, solubility experiments on the Re chemotyle of *E. coli* LPS determined the pK_a values in solution as 8.6 for the first lipid A deprotonation and 10.8 for the second deprotonation,[37] indicating that the fully protonated state (charge of -1 per phosphate group and -4 per LPS) should dominate in solution at physiological pH.

In this study, we investigate the effects of both ion type and phosphate charge on four distinct chemotypes of *S. enterica* LPS (Figure 2) to better characterize these force field discrepancies as well as to study the protective effects that LPS modifications confer. We report that simulation results, such as the area per lipid, core hydration, and inter-lipid hydrogen bonding are highly influenced by the choice of protonation state, cation type, and ion parameterization. Complimentary alchemical free energy simulations and ^{31}P-NMR spectroscopy experiments determine that the protonated state (-1 per phosphate group) dominates at or near physiological pH. As hypothesized, simulations with modified LPS show a decreased sensitivity to ion substitutions when compared to unmodified LPS forms. Overall, these results demonstrate the sensitivity of LPS simulations to parameterization differences and offer guidelines for how existing LPS parameterizations should be modified for better agreement with one another and experiment.

Methods

System preparation

4x4 Rc LPS bilayers were constructed by removing 20 lipids per leaflet from a pre-equilibrated 6x6 Rc LPS bilayer; this 4x4 system was then solvated and equilibrated for 2.0 μs. A 4x4 Rc modified LPS (mLPS) system was constructed and equilibrated in a similar manner. These equilibrated 4x4 Rc systems were stripped of all water and ions, then resolvated with neutralizing counterions added to the bulk solvent. In all cases, enough water was added to

Figure 2: Schematic of the *S. enterica* LPS Rc core. The Re chemotype contains only the two KDO sugars. Abbreviations: KDO, 2-keto-3-deoxyoctulosonic acid; Hep, heptose; Glc, glucose; EtN, ethanolamine; P, phosphate.

ensure a ~1.5 M monovalent cation concentration, and the same solvent box was used for the simulations with divalent ions.

Simulations utilized either the default CHARMM ion parameters of Beglov and Roux,[38] the NBFIX calcium parameters of Roux and Rong as reported by Kim *et al.*,[34] or the CUFIX parameters of Yoo and Aksimentiev[39] for all neutralizing counterions. All systems utilized the LPS parameter set of Wu *et al.*[25] with modifications treated as described previously,[19] the C36 force fields for lipids,[40,41] modified Lennard-Jones parameters for sodium ion interactions with certain lipid oxygens,[42] and TIP3P water.[43] Lipid A phosphate groups with a charge of -1 were parameterized by analogy to the C36 general force field,[44] using methylphosphate as a template; the parameters used are given in Table S1. Systems were converted to AMBER-compatible format using chamber[45] in ParmEd, then minimized, heated, and equilibrated for 5 ns with LPS sugars restrained to allow the water density to equilibrate.

Conventional molecular dynamics simulations

Initially, 56 different systems were simulated, accounting for all possible combinations of four LPS chemotypes, seven ion models, and two different phosphate net charges (Table 1). Four additional simulations were performed of Re LPS with -1 phosphate charges interacting with an excess of Ca^{2+}, K^+, Mg^{2+}, or Na^+ to verify the results of these lower charge simulations were not a consequence of having fewer cations present (Section S1). All conventional MD (cMD) production simulations were performed with the GPU-accelerated version of *pmemd* in AMBER 18,[46] and were carried out for 3.0 µs per system. System temperatures were controlled at 310 K using Langevin dynamics, with a collision frequency of 1.0 ps^{-1}. The pressure was maintained at 1.0 bar by means of semi-isotropic coordinate scaling, with z decoupled from the xy dimensions, and utilized the Berendsen barostat[47] with a relaxation time of 1.0 ps. All hydrogen bonds were constrained using SHAKE.[48] A 12.0 Å cutoff was used, with interactions smoothly switched to zero over 10–12 Å. Long-range electrostatics were treated using the particle mesh Ewald (PME) method[49] with a grid spacing of 1.0 Å.

Table 1: Enumeration of the different system options used for cMD simulations. * Refer to Figures 1 and 2 for chemotype depictions. † Default CHARMM parameters of Beglov and Roux.[38] ‡ NBFIX calcium parameters of Roux and Rong as reported by Kim *et al.*[34] ∘ CUFIX parameters of Yoo and Aksimentiev.[39]

System Feature	Number	Specification
LPS chemotype*	4	Rc LPS, Rc mLPS, Re LPS, Re mLPS
Ion model	7	Ca^{2+}, K^+, Mg^{2+}, Na^+ † NBFIX Ca^{2+} ‡ CUFIX K^+, CUFIX Na^+ ∘
Lipid A phosphate charge	2	-2, -1

Alchemical free energy simulations

Alchemical free energy simulations were performed in NAMD 2.13,[50] utilizing interleaved double-wide sampling to allow sampling in both the forward and reverse direction at each lambda window. Simulations were performed at fifteen windows with λ= 0.0, 0.01, 0.05, 0.1,

0.2, ..., 0.9, 0.95, 0.99, 1.0. Here, $\lambda = 0.0$ corresponds to the singly-protonated phosphate state while $\lambda = 1.0$ corresponds to the deprotonated phosphate state. Four distinct alchemical transformations were performed: from the -4 to -5 charge state by deprotonation of either the P_A or P_B phosphate of Re LPS, and from the -5 to -6 charge state by deprotonation of the second phosphate group (Figure 3). Each of these four alchemical transformations were performed in three different environments: solvent, a fully deprotonated (-6 state) Re LPS bilayer, and a doubly protonated (-4 state) Re LPS bilayer.

Figure 3: Depiction of the four alchemical transformation pathways explored using free energy simulations. These correspond to deprotonation of either the P_A or P_B phosphate, with the other phosphate group either protonated or deprotonated.

Each lambda window was equilibrated for 1 ns, followed by 10 ns of production MD. Soft-core vdW potentials and a delayed introduction of electrostatics (lambda > 0.1) were performed to avoid infinite electrostatic or vdW interactions at end points. The bilayer simulations were performed five times each for robust error analysis, while the solvent simulations were repeated three times.

Simulation analysis

Trajectory analysis was performed over the final 1.0 μs of each cMD simulation, to allow ample time for bilayer equilibration. Lipid area, hydrogen bonds, carbon-deuterium order parameters, and electron density profiles along the bilayer normal were calculated using

$CPPTRAJ$[51] from AmberTools 17.[52] Carbon-deuterium order parameters are reported as $|S_{CD}|$. All hydrogen bond calculations utilized a distance cutoff of 3.0 Å and an angle cutoff of 135°. Cation coordinating groups were determined using a distance-based cutoff, calculated in VMD[53] and updated every 20 frames (200 ps). The cutoff used varied depending on the ion type and corresponded to the distance of the first minima in the ions' radial distribution function (RDF) – 3.0 Å for calcium and sodium, 3.5 Å for potassium, and 2.5 Å for magnesium. Cation radial distribution functions (RDFs) were calculated using LOOS,[54] and coordination numbers were determined by integration of the resultant RDF through the first peak. All errors are reported as standard error of the mean.

The Bennett acceptance ratio (BAR)[55] free energy estimator in the ParseFEP module of VMD[56] was used to analyze all alchemical simulations. The full thermodynamic cycle utilized for these calculations is depicted in Figure 4. Here, the ΔG of each transformation, either in water (ΔG_{wat}) or in the bilayer (ΔG_{bil}), is calculated from the free energy simulations. The change in energy between deprotonation in the bilayer environment and deprotonation in water is given by $\Delta\Delta G = \Delta G_{bil} - \Delta G_{wat}$. From this, the p$K_a$ shift that arises as a result of this change to the phosphate group's environment can be directly calculated:

$$\Delta pK_a = pK_{a,bil} - pK_{a,wat} = \frac{\Delta\Delta G}{2.303kT} \tag{1}$$

where k is the Boltzmann constant and T is the system temperature. Since the pK_a for Re LPS phosphate groups in water is known, this method allows estimation of the pK_a in the bilayer.

Experimental pH studies of LPS using solid-state NMR

LPS *E. coli* strain R515, corresponding to the Re chemotype, was purchased from AdipoGen Life Sciences (Liestal, Switzerland) in 1 mL vials of sterile aqueous solution (1 mg/mL). These solutions were lyophilized, rehydrated with nanopure water, and consolidated to get

Figure 4: Thermodynamic cycle utilized in the alchemical simulations.

5 samples with LPS mass of 2 mg each. The samples were then lyophilized again before resuspending to a LPS concentration of 20 mM in 57 mM Michaelis barbital sodium-acetate buffer[57] at pH 1.99, 5.02, 6.99, 8.98, and 10.46. Solid $CaCl_2 \cdot 2H_2O$ was added to reach a Ca^{2+} concentration of 50 mM. Each solution was incubated at 40°C for 30 minutes before packing the samples into 2.5 mm rotors (Bruker, Billirica, MA) or 5 mm glass tubes (New Era, Vineland, NJ) for NMR analysis.

All NMR experiments were performed on a 17.6 T (750 MHz) wide bore (Bruker, Billerica, MA) spectrometer with a variable temperature set to 32°C with a Bruker BVT-3000 temperature controller. ^{31}P experiments employed SPINAL-64 ^1H decoupling[58] during acquisition, with a nutation frequency of 36 kHz (MAS experiments) or 78 kHz (static experiments). Static experiments were performed using a low-electrical field probe (Black Fox, Inc., Tallahassee, FL) and MAS experiments were carried out using a Bruker BL2.5 HX 2.5 mm MAS probe. In MAS experiments, spinning was regulated at $15,000 \pm 10$ Hz using a Bruker MAS II pneumatic MAS controller. The recycle delay was 2 s (MAS experiments) or 3 s (static experiments) and the 90°-pulse was 2.5 µs (MAS experiments) or 6 µs (static experiments). MAS spectra were referenced to adamantane externally, assuming the downfield peak of 38.48 ppm.[59] NMR spectra were processed with 500 Hz (MAS experiments) or

1000 Hz (static experiments) exponential apodization and zero filled and left shifted prior to Fourier transformation. Spectra were then subjected to polynomial baseline subtraction. All samples exhibited signals consistent with stable lamellar structures (Figure S3).

Results

Average bilayer properties for all systems are given in Tables S2 and S3 in the Supporting Information. In all the measures studied, the bilayer structure and organization was greatly affected by the cation type included and the charge on the lipid A phosphate groups.

Lower phosphate charges lead to bilayer compaction

Protonation of the lipid A phosphate groups resulted in a markedly more compact, ordered bilayer, regardless of the LPS chemotype or cation type included. Simulations with $-PO_4^-$ led to a lower area per lipid and a thicker hydrophobic region when compared to equivalent simulations with $-PO_4^{2-}$ (Figure 5). For example, in the case of Re LPS the average area per lipid decreased from 164 ± 0.4 Å^2 to 148 ± 0.2 Å^2 with a concomitant thickening of the leaflet hydrophobic thickness from 12.8 ± 0.1 to 13.6 ± 0.1 Å. Additionally, tail order parameters demonstrated a distinct ordering in LPS simulations when $-PO_4^-$ was implemented in place of the standard CHARMM $-PO_4^{2-}$ (Figure S4); this difference was less pronounced in mLPS systems, likely due to the already increased ordering that palmitoylation confers.[19] Finally, increased inter-lipid hydrogen bonding was observed in LPS systems with the reduced phosphate charge, while the change in mLPS systems was not statistically significant for this metric.

Furthermore, simulations with reduced lipid A phosphate charges resulted in a less hydrated LPS core, especially in the region of those phosphate groups (Figure S5 and Table S4); it is unclear whether this is an effect from the decreased lipid area or a result of fewer hydrated cations present in the core. However, regardless of the phosphate charge or core hy-

dration, counterions remained strongly associated with the LPS core and were rarely present in the bulk solvent (Figure S6). Overall, these results demonstrate that differing lipid A phosphate protonation states lead to clear structural variations in the simulation outcome.

Figure 5: Effect of lipid A phosphate charge on LPS area (top), per-leaflet hydrophobic thickness (middle), and inter-lipid A hydrogen bonding (bottom). Data are shown from the simulations with Ca^{2+}.

Cation type greatly affects LPS bilayer properties

Lipid packing was surprisingly highly affected by the cation type included in the simulations. The standard CHARMM ion parameters, which include Na^+ NBFIX terms, resulted in simulations with Mg^{2+} counterions typically having the largest area per lipid, while simulations with Na^+ tended to form the most compact bilayer (Figure 6). This trend was roughly the

same regardless of LPS type or phosphate charge. Coupled with these area per lipid changes were concomitant changes to the leaflet hydrophobic thickness and inter-lipid A hydrogen bonding, with lower lipid areas corresponding to more ordered lipid tails.

Utilization of the Ca^{2+} NBFIX[34] and Na^+/K^+ CUFIX[39] parameter sets led to significantly better agreement with experimental lipid area trends. Simulations with these parameter sets, which refine cation interactions with phosphate and carboxyl oxygen atoms, correctly recover the experimentally-observed increased lipid area upon monovalent cation inclusion (Figure 7). This lipid area trend reversal is less striking in mLPS simulations; however, no experimental data exist for these LPS types, and the presence of aminoarabinose may likely alter the expected area trend. These results indicate that the Na^+/K^+ CUFIX ion parameter sets may be the most appropriate for use with LPS simulations. Additionally, the observed changes unequivocally demonstrate that small modifications to specific non-bonded parameter pairs is sufficient to profoundly affect bilayer structural properties, indicating that further refinement to experiments may be possible.

Modification confers resilience to ion-induced membrane changes

Regardless of the chemotype or phosphate charge parameterization, simulations with PhoPQ-mediated modifications present exhibit more stable per lipid areas than those without modifications present (Figure 8). For example, in Re LPS with $-PO_4^-$, the percent change to the lipid area is 5.4% upon inclusion of different cations compared to Ca^{2+}, while the percent change is only 0.9% in Re mLPS. This trend holds for both Rc and Re chemotypes with either phosphate charge. Interestingly, the percent area change is roughly the same for each chemotype when the $-PO_4^-$ and $-PO_4^{2-}$ cases are compared. Overall, these results indicate that, as hypothesized previously,[19] lipid A modifications help stabilize the bilayer structure in the absence of divalent cations and may reduce reliance on these cations for stability.

Figure 6: Effect of cation inclusion on LPS area (top), per-leaflet hydrophobic thickness (middle), and inter-lipid A hydrogen bonding (bottom). Systems with $-PO_4^-$ are shown on the left, while systems with $-PO_4^{2-}$ are on the right.

Figure 7: Effect of NBFIX/CUFIX cation inclusion on LPS area (top), per-leaflet hydrophobic thickness (middle), and inter-lipid A hydrogen bonding (bottom). Systems with $-PO_4^-$ are shown on the left, while systems with $-PO_4^{2-}$ are on the right.

Figure 8: Percent change in area per lipid different ion species for all four chemotypes studied, compared to simulations with Ca^{2+} present. Systems with PO_4^{-1} are shown in the top panel, while systems with PO_4^{-2} are on the bottom.

Bilayer presence shifts lipid A phosphate pK_a values

Free energy differences for each of the four possible deprotonation steps studied (Figure 3) are given in Table S5. For each step, there was good agreement between all three or five calculation replicates performed, as indicated by the small standard errors of the mean. Additionally, energy estimates for each lambda window were well converged on the simulation timescales used here, and there were no deviations between forward and backward free energy estimates. From these ΔG results, the $\Delta\Delta G$ between deprotonation in the bilayer and deprotonation in solution can be calculated. These $\Delta\Delta G$ values for the first (-4 to -5 charge state) and second (-5 to -6) deprotonations are given in Table 2, along with the corresponding pK_a shifts, calculated from equation 1 and the experimental data of Din *et al.*[37]

In all cases, the pK_a shifts were positive, indicating an upward shift compared to the pK_a in solution. The resultant theoretical pK_a values were calculated as 10.5 and 11.5 for the first and second deprotonations when simulated in the deprotonated bilayer, and 13.4 and 15.9 when in the protonated bilayer. It should be noted that even a conservative reference

Table 2: Lipid A phosphate pK_a shifts and theoretical values in the bilayer, as determined by free energy simulations.

Bilayer	Charge state	$\Delta\Delta G$	ΔpK_a	pK_a, theoretical
Protonated	-4 → -5	6.8 ± 0.3	4.8 ± 0.2	13.4 ± 0.2
	-5 → -6	7.3 ± 0.3	5.2 ± 0.2	15.9 ± 0.2
Deprotonated	-4 → -5	2.7 ± 0.6	1.9 ± 0.4	10.5 ± 0.4
	-5 → -6	1.0 ± 0.4	0.7 ± 0.3	11.5 ± 0.3

pK_a of 6.0, corresponding roughly to the pK_a of glucose phosphate in water,[60,61] would still result in lipid A pK_a values for the first deprotonation well above physiological pH – 10.8 in the protonated bilayer and 7.9 in the deprotonated bilayer.

NMR validates protonated LPS charge state

Given the large differences in simulated membrane properties between different LPS protonation states, experimental validation of the predicted pK_a values is critical for informing force field paramaterizations. ^{31}P NMR spectroscopy is sensitive to phosphate protonation state and the pH-dependence of chemical shifts can be used to determine pK_a values.[62] Magic angle spinning (MAS) ^{31}P-NMR spectra for Re LPS show similar chemical shifts at pH 5.0, 7.0, and 9.0 (Figure 9) with peak positions around 1.3–1.4 ppm, demonstrating that no significant protonation state changes occur in this pH range. The spectra at pH 2.0 and 10.5, however, are shifted relative to the spectra at these intermediate pH values, with peak locations at -0.2 and 2.7 ppm, respectively. These chemical shift perturbations indicate changes in chemical environment for the phosphate groups at these extreme pHs, with pK_1 between 2.0 and 5.0, and pK_2 between 9.0 and 10.5 (highlighted regions in Figure 9B).

We propose pK_1 represents the first ionization of the phosphate groups, from neutral to anionic, while pK_2 represents the second ionization. The alternative, that the lipid A phosphate groups are deprotonated and have pK_a values significantly lower than 5.0, is unlikely given that pK_1 and pK_2 of glucose phosphate are 1.0 and 6.1.[60,61] Furthermore, our interpretation of pK_1 and pK_2 is consistent with the known protonation state of Re

LPS in solution as physiological pH,[37] and in good agreement with the predicted pK_a $\sim$10.5 from free energy simulations, while conventional simulations with singly-deprotonated LPS provide the best match to experimental structural data.

Figure 9: ^{31}P NMR pH titration of LPS. (A) ^{31}P MAS spectra of LPS as a function of pH. Spectra of samples at five pH values are overlaid. (B) ^{31}P peak position (in ppm) plotted as a function of sample pH. The two shaded regions indicate the putative approximate values for pK_1 and pK_2.

Discussion

Discrepancies exist between the commonly-used LPS force fields, both in the lipid A phosphate group charges and in the bilayer response to the inclusion of different ions. The CHARMM LPS force field assigns a -2 net charge to each phosphate group[25] and displays significant compaction upon monovalent cation inclusion compared to divalent cations.[34] The GLYCAM LPS[23] force field, on the other hand, models the phosphate groups as protonated (-1 charge) and correctly recovers the experimentally-observed condensing effect of divalent cations. In addition to the charge discrepancy, these force fields utilize different ion and water models as well.

In this work, we sought to understand the effects that altering the lipid A phosphate

charges and including different ion parameterizations have on the structural characteristics of LPS simulations. Regardless of the phosphate charge utilized, use of the default CHARMM ion parameters[38] with the standard sodium NBFIX terms[42] resulted in smaller lipid areas with Na^+ than Ca^{2+}, in agreement with the simulation results of Kim *et al.*[34] This indicates that the differences in LPS response to ions between force fields cannot be attributed to the differing charge state alone, and that the ion or water parameters themselves are responsible. Indeed, implementation of the sodium/potassium CUFIX[39] was sufficient in most systems to recover the expected trend of increased area and fluidity with monovalent cations.

Distinct differences were also observed between simulations with charges of -1 and -2 per lipid A phosphate group. Inter-lipid A hydrogen bonding was greatly increased for unmodified LPS systems when the protonated lipid A phosphates were utilized; this effect is likely a result of the additional hydrogen bond donors present in these systems. Furthermore, protonation of the phosphate groups had a condensing effect (Figures 5 and S4), especially striking in the LPS chemotypes. This decreased area per lipid resulted in more ordered, tightly packed lipid tails; the area per tail observed was 24.5–26.5 $Å^2$ for Re LPS with protonated phosphate groups, compared to 26.5–30.5 $Å^2$ for fully deprotonated Re LPS. These smaller lipid tail areas are in better agreement with measurements by Snyder *et al.*, which places the upper limit for the area per lipid tail at 26 $Å^2$ for liquid-crystalline LPS.[20] Additionally, the per lipid areas of 169 $Å^2$ and 184 $Å^2$ for protonated Rc LPS with Ca^{2+} and CUFIX Na^+ are more consistent with the experimentally determined areas of 169 $Å^2$ for the Ra chemotype with Ca^{2+} and 208 $Å^2$ with Na^+,[63] compared to 179 and 175 $Å^2$ in the corresponding deprotonated simulations. Overall, simulations demonstrate that models with protonated lipid A form more compact bilayers, which may represent a better match to the liquid-crystalline phase the outer membrane is believed to adopt physiologically.[5,64]

Determination of the physiologically-relevant lipid A phosphate charge representation is a crucial problem that simulations need to address, especially in light of these differences observed between simulations with protonated or deprotonated lipid A phosphate groups.

Here, free energy simulations were utilized to alchemically predict the pK_a shift in the bilayer compared to solution, while ^{31}P-NMR verified protonation state predictions. These results indicate that many LPS models, such as those utilized by the CHARMM-GUI and CG models based off it, incorrectly assign a charge of -2 to both lipid A phosphate groups which leads to significantly different bilayer properties. Furthermore, this charge assignment, especially when coupled with the strong nonbonded interactions of the CHARMM ions with oxygen, likely overestimates the affinity of cation binding. Since many AMPs are believed to competitively displace cations from the LPS core,[65–67] overly-stabilized cation interactions could have a significant effect on the outcome of such simulations.

Based on these results, we recommend that current LPS force field parameterizations be updated to correct for these charge inaccuracies, and offer the following phosphate charge guidelines: (1) At or near physiological pH, each LPS lipid A phosphate group should carry a charge of -1. (2) Phosphate groups adorned with positively-charged chemical modifications (AAB, PEtN, etc) should also carry a charge of -1. (3) Phosphate groups in the core, such as heptose-5 phosphate in the Re chemotype, are likely best represented by a charge of -2, though future work is warranted to determine whether close lipid packing affects the protonation states of these groups. Furthermore, based on simulations with different ion parameterizations, we recommend use of the Na^+/K^+ CUFIX[39] ion parameter sets when utilizing the CHARMM LPS force field for best agreement with experimental data. Altogether, these results highlight inconsistencies in the current LPS models, while offering guidelines for choosing appropriate models to better reproduce experimental LPS results.

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Supporting Information Available

Supplementary data analysis, tables, figures, and atomic partial charges for protonated lipid A phosphate groups.

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