Supporting Information:

Accurate Binding of Sodium and Calcium to a POPC Bilayer by Effective Inclusion of Electronic Polarization

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S1 Simulation details

Table S1: Simulation parameters

simulation property	parameter
time-step	2 fs
equilibration time	100 ns
total simulation time	300 ns
temperature	313 K
thermostat	v-rescale[1]
barostat	Parrinello-Rahman, semi-isotropic[2]
long-range electrostatics	PME[3]
cut-off scheme	Verlet[4]
Coulomb and VdW cut-off	1.0 nm
constraints	LINCS, only hydrogen atoms[5]
constraints for water	SETTLE[6]

OpenMM simulations were run with 4 fs time step using 4 times heavier hydrogen atoms (mass subtracted from neighbouring atoms).

S2 Area per molecule and calcium binding with different water models

Table S2: Area per lipid (APL) from different models of POPC with no ions

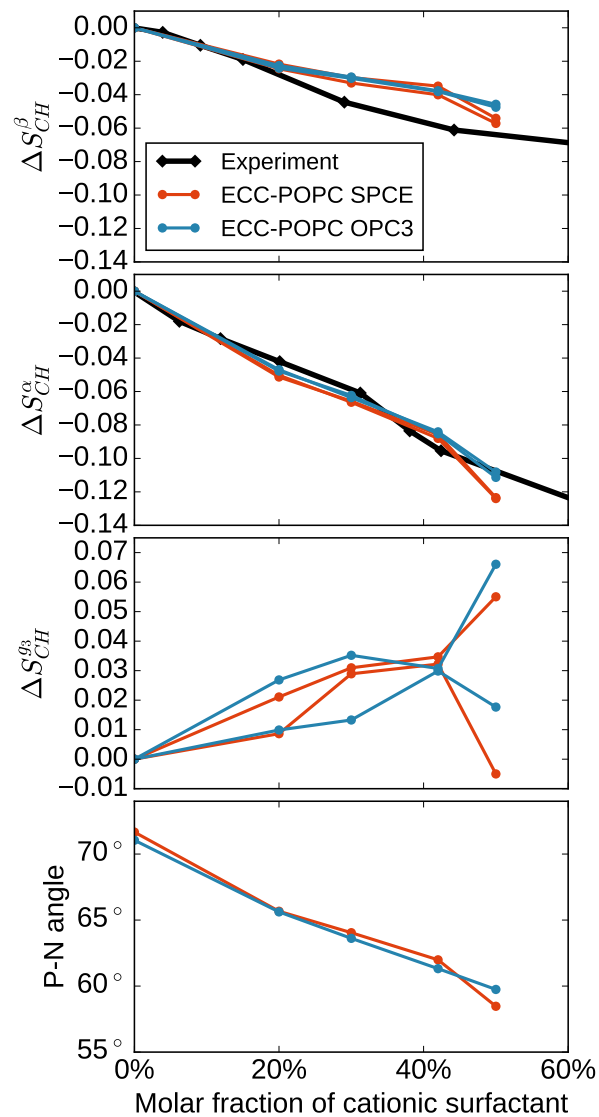| model	APL (Å^2)	Temperature [K]
Lipid14	65.1± 0.6	300
Lipid14[7]	65.6± 0.5	303
ECC-POPC		
SPC/E	63.2± 0.6	300
SPC/E	65.1± 0.6	313
OPC3	62.2± 0.6	300
OPC3	64.2± 0.6	313
OPC	64.4± 0.6	313
TIP4p/2005	66.8± 0.6	313
TIP3p	66.2± 0.6	313
TIP3p-FB	64.8± 0.6	313
TIP4p-FB	65.6± 0.6	313
experiment[8]	62.7± 1.3	293
	64.3± 1.3	303
	67.3± 1.3	323
	68.1± 1.4	333

Figure S1: Changes of head group and glycerol carbon g_3 order parameters, and P-N vector orientation of POPC bilayer as a function of a molar fraction of the cationic surfactant dihexadecyldimethylammonium in a POPC bilayer from simulations with different water models (OPC3,[9] SPC/E[10]) and experiments[11] at 313 K.
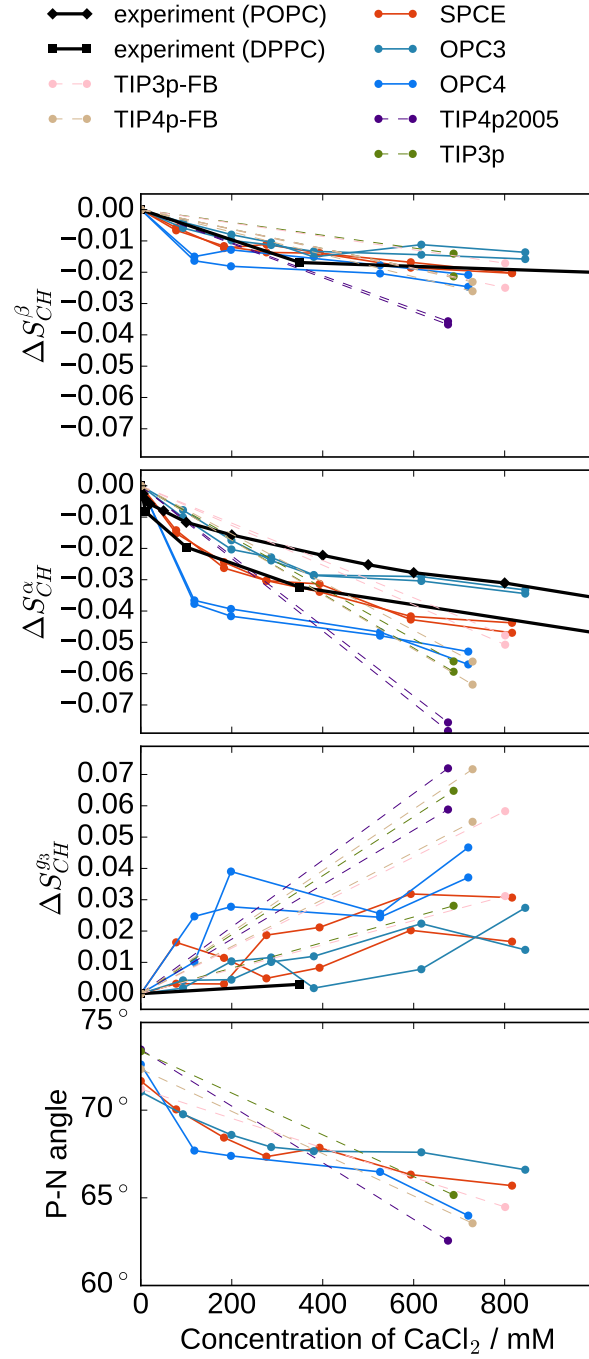
Figure S2: Changes of head group and glycerol carbon g_3 order parameters, and P-N vector orientation of POPC bilayer as a function of $CaCl_2$ concentrations in bulk (C_{ion}) from ECC-POPC simulations at 313K with different water models (SPC/E,[10] OPC,[12] OPC3,[9] TIP3P,[13] TIP3p-FB and TIP4p-FB,[14] and TIP4p/2005[15]) together with experimental data (DPPC (323 K)[16] and POPC (313 K)[17]). Ion concentrations (C_{ion}) are calculated from the cation number density C_{np} at the farthest point from the lipid bilayer in the aqueous phase as [ion]=$C_{np}/0.602$.

S3 Electronic continuum correction applied to CHARMM36 model

In order to demonstrate that the ECC method can be applied also to other models than Lipid14, we scaled the charges and Lennard-Jones radii of headgroup, glycerol backbone and carbonyl atoms of the CHARMM36 model of POPC.[18] We used the scaling factors optimized for Lipid14 in the main text, i.e., 0.8 for charges and 0.89 for Lennard-Jones radii. Changes of the headgroup order parameters as functions of added ions and number density profiles along membrane normal from the ECC-CHARMM model are shown in Figs. S3 and S4, respectively, together with the results from CHARMM36 simulations[19,20] and experiments.[16,17] As shown previously,[19] the binding of Ca^{2+} is significantly overestimated in CHARMM36 simulations. In ECC-CHARMM simulations, the Ca^{2+} binding affinity is significantly reduced (Fig. S4) and the headgroup order parameter response to the added $CaCl_2$ is in a better agreement with experiments than for the original CHARMM model (Fig. S3). In line with the results in main text, Fig. S5 also shows faster equilibration times for Ca^{2+} binding in the ECC-CHARMM model than in the original CHARMM36.

In conclusion, applying ECC to CHARMM36 simulation improved the ion binding affinity to a lipid bilayer, even thought the scaling factors optimized for Lipid14 were used. Also the area per molecule in the ECC-CHARMM simulation without ions (61 $Å^2$) is only slightly lower than the experimental value (64.3 $Å^2$).[8] The optimal scaling factors for CHARMM36 are expected to be somewhat different than for Lipid14 because the initial partial charges are not the same in different models. Our results indicate that the performance of ion binding in ECC-CHARMM36, and probably in other lipid models as well, could be further improved by finding the optimal scaling factors for the partial charges and Lennard-Jones radii.

It should be noted that the calcium binding to POPC bilayer within the ECC-CHARMM model is compared here to the CHARMM36 simulation, which was originally done in a previous study.[19,20] After the latter simulation has been performed, specific interaction

parameters between calcium and oxygen[21] have been introduced in CHARMM-gui to reduce the binding of calcium to lipid bilayers. These parameters reduce the calcium binding to a POPC bilayer to the same level as that of sodium (data not shown). Further analyses of ion binding with different parameters (including the newly modified CHARMM) are in progress within the NMRlipids IV project (`nmrlipids.blogspot.fi`), being beyond the scope of this work.
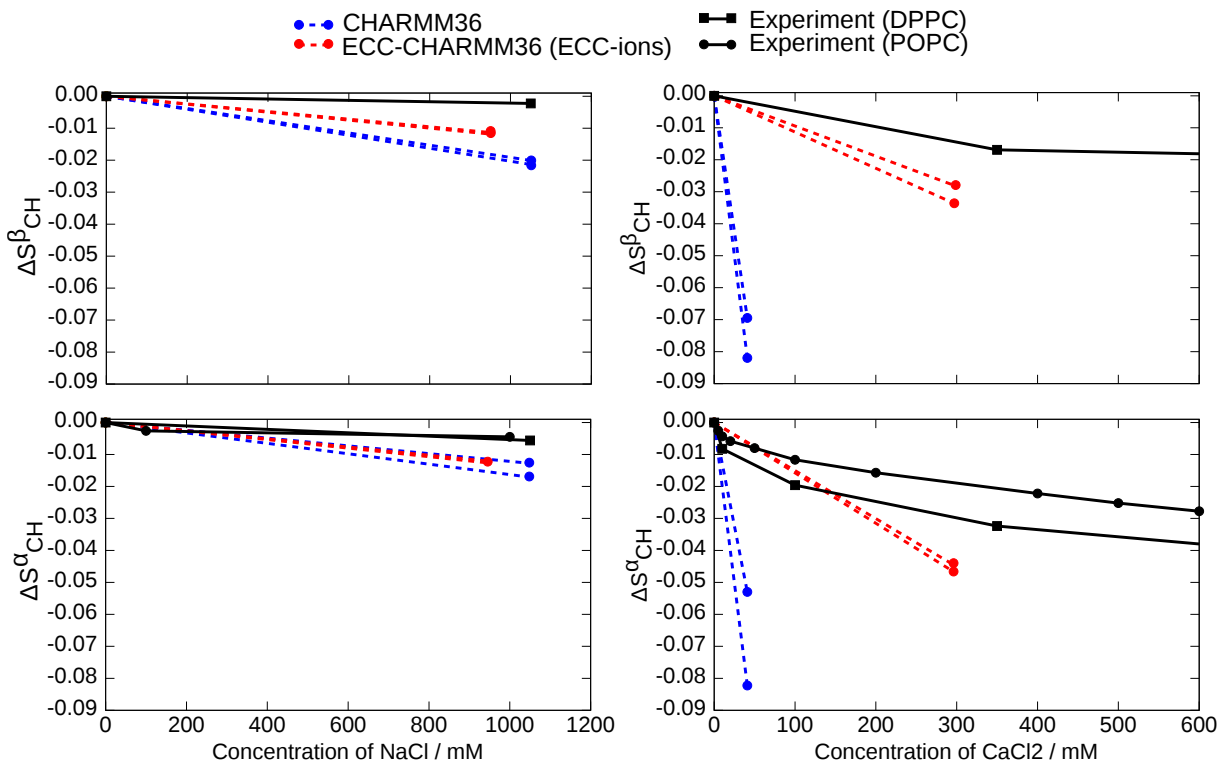

Figure S3: Changes of the headgroup order parameters as a function of NaCl (left) and CaCl$_2$ (right) from simulations with CHARMM36,[18] simulations with ECC-CHARMM parameters and experiments.[16,17] CHARMM36 force field parameters for simulations with and without NaCl were taken from CHARMM-gui.[22] These were ran 320 ns and 280 ns, respectively, and the first 100 ns was omitted from the analysis. Results for CHARMM36 with CaCl$_2$ were calculated from the last 100 ns from the data available at Ref. 20. ECC-CHARMM simulations with NaCl and CaCl$_2$ were ran 260 ns and 600 ns, respectively, and the first 100 ns were omitted from the analysis. Sodium, calcium, and chloride ions were modeled as ECC-ions in these simulations with parameters from Refs. 23,24. All the other simulation parameters in simulations in this figure were equal to the available dataset at Ref. 20. The temperature in all simulations was set to 310 K. The simulation data is available at Refs. 25–29.
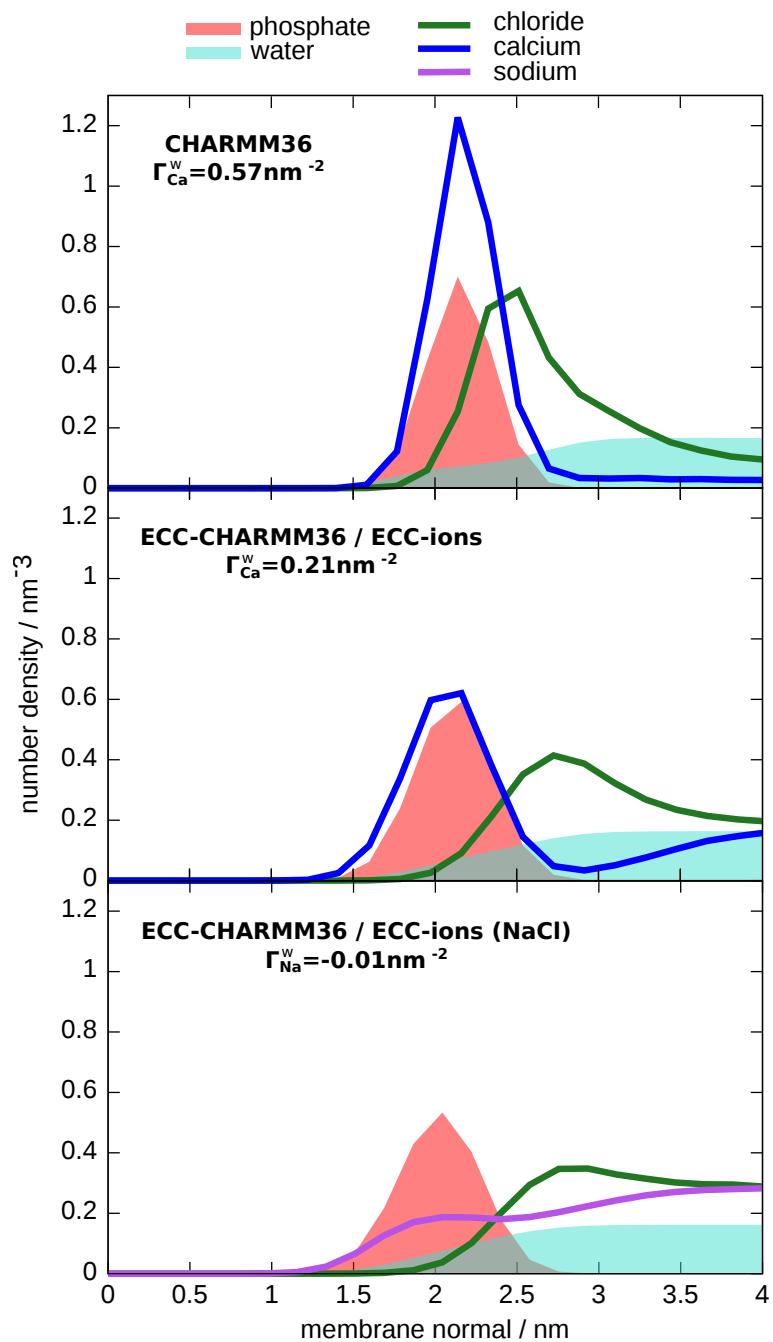
Figure S4: Number density profiles along membrane normal from CHARMM36[18] and ECC-CHARMM models with NaCl and CaCl$_2$. The values for the relative surface excess are also shown.
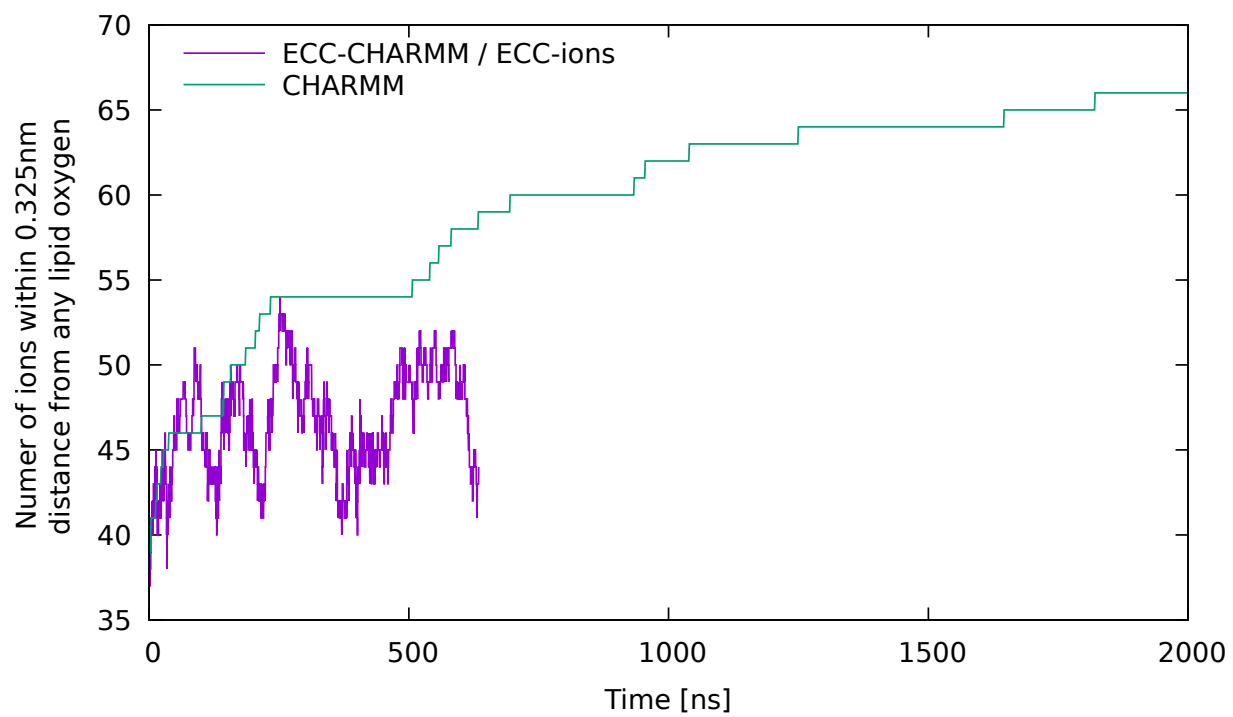
Figure S5: Number of bound Ca^{2+} during simulations.

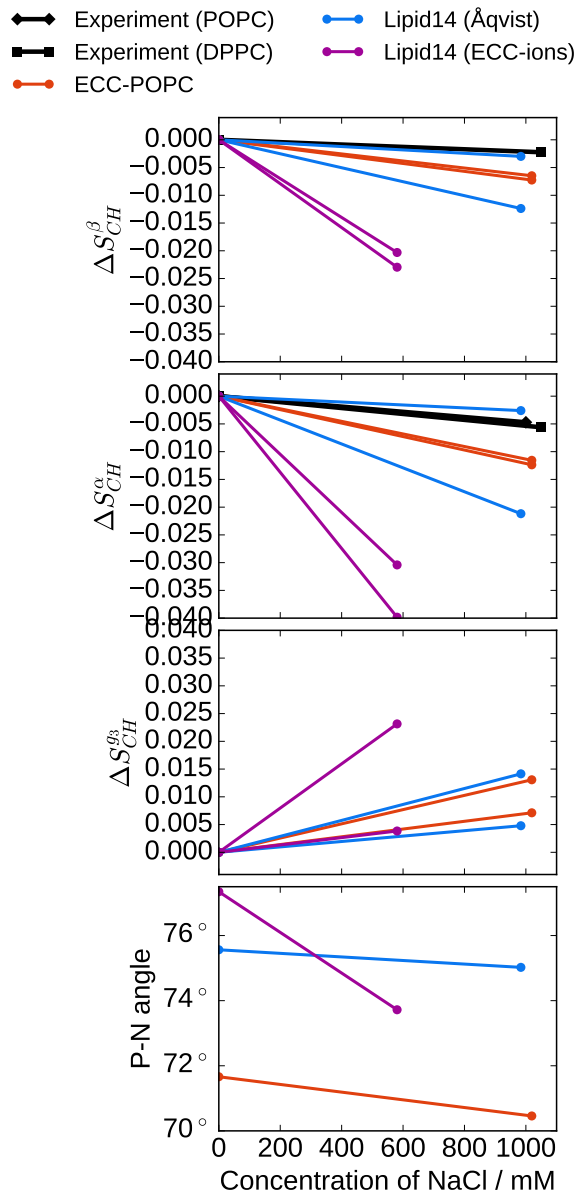# S4 Sodium binding to POPC with the glycerol carbon g_3 order parameters and the head group orientation

Figure S6: Changes of head group and glycerol carbon g_3 order parameters, and the P-N vector orientation of POPC bilayer as a function of NaCl concentrations in bulk (C_{ion}) from simulations with different force fields at 313 K together with experimental data (DPPC (323 K)[16] and POPC (313 K)[17]). Simulation data with Lipid14 and Åqvist ion parameters at 293 K is taken directly from Refs. 19,30,31.

S5 Ternary complex model in simulations

The NMR data about PC headgroup order parameters and atomic absorption spectroscopy data were previously best explained using a ternary complex binding model.[17] In this model, one calcium is assumed to form complexes with two lipids, i.e. with the binding stoichiometry of 1 Ca^{2+}:2 POPC. The model predicts a linear relationship between quantities C_b and $\sqrt{C_b/C_I}$, where C_b is the mole fraction of bound Ca^{2+} per POPC and C_I is the concentration of free cations at the plane of ion binding.[17] Experimentally detemined C_b from NMR measurements and atomic absorption spectroscopy together with C_I calculated from the Poisson-Boltzmann equation gave a good agreement with the predictions of the ternary complex model.[17]

To compare ECC-POPC simulations to the ternary complex model, we calculated C_b from simulations (as defined in the main text), and C_I from the minimum $CaCl_2$ concentration at membrane-water interface, locating around 2.6 nm from the membrane center in the density profiles in Fig. 5 in the main text.

The results from simulations are shown in Fig. S7 together with the line fitted to experimental data by Altenbach and Seelig.[17] Both results are in agreement with the prediction of the ternary complex model. The small discrepancy between the results from experiments and simulations probably arise from difference in the evaluation of the concentrations and inaccuracy of Poisson-Boltzmann theory for divalent cations like Ca^{2+}.[32] In conclusion, the results suggest that the almost equal probabilities for Ca^{2+} to form complexes with one to three lipids detailed in the main text is in line with an averaged interpretation of the experimental observations which supported the ternary complex model.
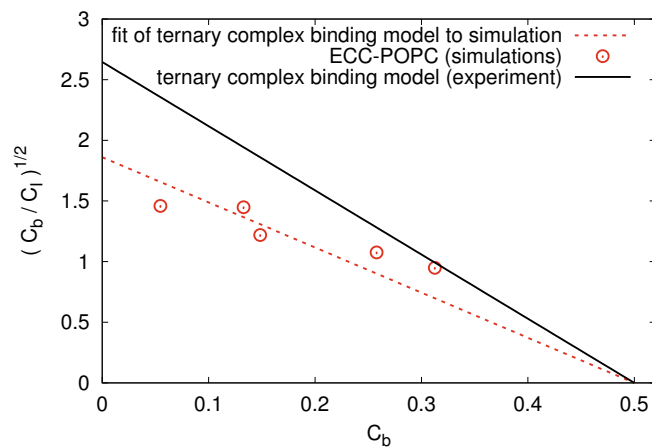
Figure S7: Fits of experimental[17] and ECC-POPC simulation data to the prediction of the ternary complex model.
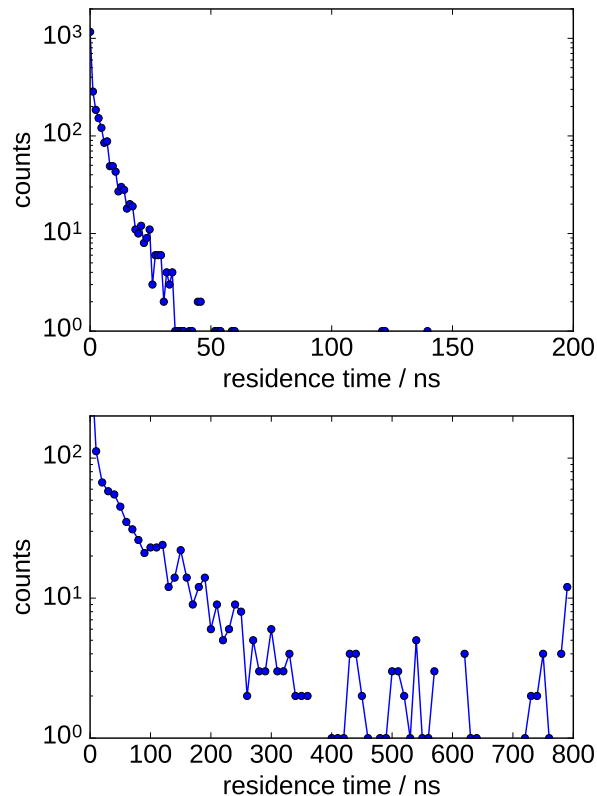
S6   Histograms of residence times

Figure S8:   Histograms of residence times of Ca^{2+} in a POPC bilayer from ECC-POPC (top) and CHARMM36 (bottom) simulations with ECC-ions. Both simulations had the same concentration of $CaCl_2$ respect to water (C'_{ion}= 450 mM). CHARMM36 simulation was directly taken from Refs. 33,34. Scales of x-axes represent the lengths of the simulations used for analysis. In ECC-POPC simulation, 90% of the residence times are shorter than 60 ns, with the longest observed residence time being 141 ns, which is well below the total length of the simulation (200 ns). This is, however not the case in CHARMM36 simulation, where residence times of several calcium cations are apparently limited by the length of the simulation. Less than 60% of the residence times are shorter than the half of the simulation length (400 ns) in CHARMM36 simulation.
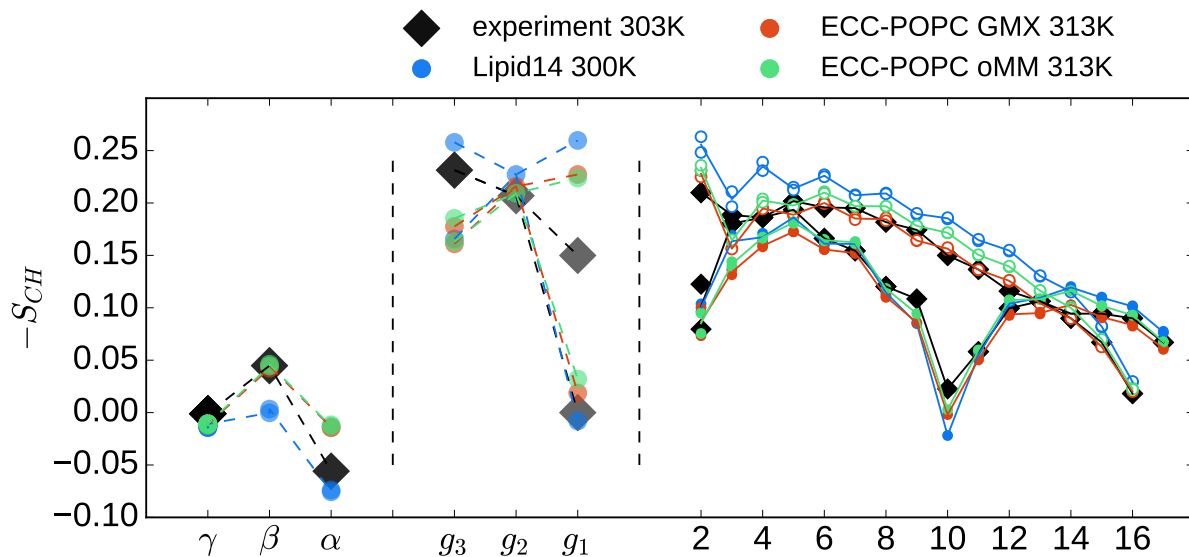
S7 Comparison between Gromacs and openMM

Figure S9: Order parameters of POPC head group, glycerol backbone and acyl chains from Lipid14[7] and ECC-POPC simulations ran with GROMACS 5.1.4[35] and openMM 7[36] together with experiments.[37] The size of the markers for the head group order parameters correspond to the error estimate ± 0.02 for experiments,[38,39] while the error estimate for simulations is ± 0.005. The size of the points for acyl chains are decreased by a factor of 3 to improve the clarity of the plot.
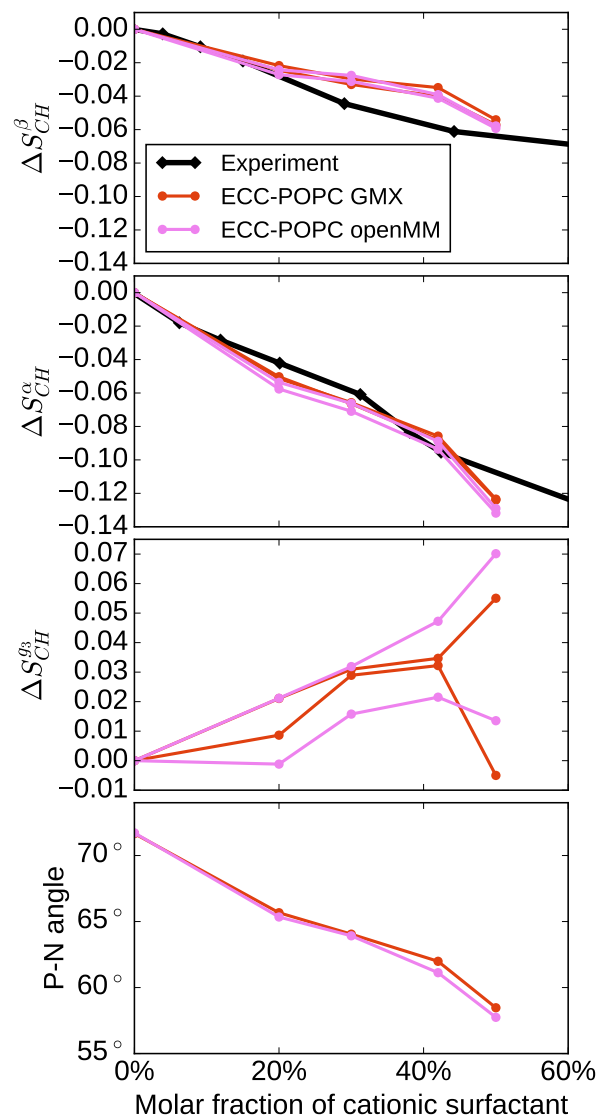
Figure S10: Changes of headgroup and glycerol carbon g_3 order parameters, and P-N vector orientation as a function of a molar fraction of the cationic surfactant dihexadecyldimethy-lammonium in a POPC bilayer from simulations with the ECC-POPC model simulated with GROMACS 5.1.4[35] and openMM 7[36] compared with the experimental values from.[11] The size of the markers for the head group order parameters correspond to the error estimate ± 0.02 for experiments,[38,39] while the error estimate for simulations is ± 0.005.
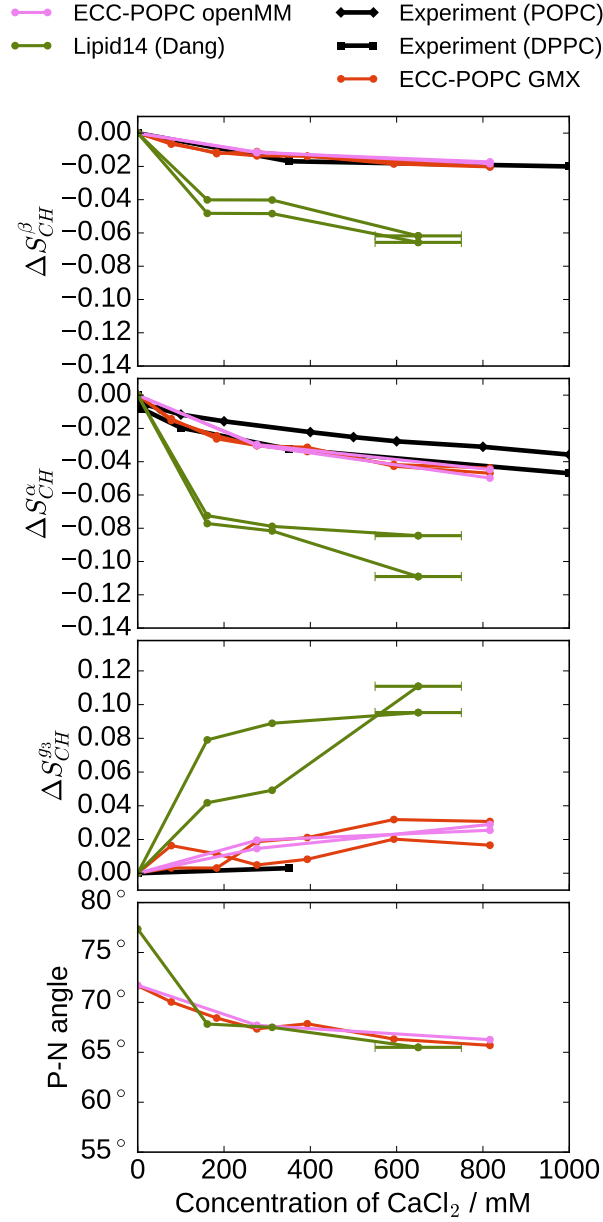
Figure S11: Changes of the head group and glycerol carbon g_3 order parameters, and P-N vector orientation of a POPC bilayer as a function of the CaCl$_2$ concentration in bulk (C_{ion}) from Lipid14[7] and ECC-POPC simulations ran with GROMACS 5.1.4[35] and openMM 7[36] at 313 K together with experiments (DPPC (323 K)[16] and POPC (313 K)[17]). Bulk concentrations from simulations are calculated from the farthest point from the lipid bilayer in the aqueous phase with an error estimate of 10 mM.

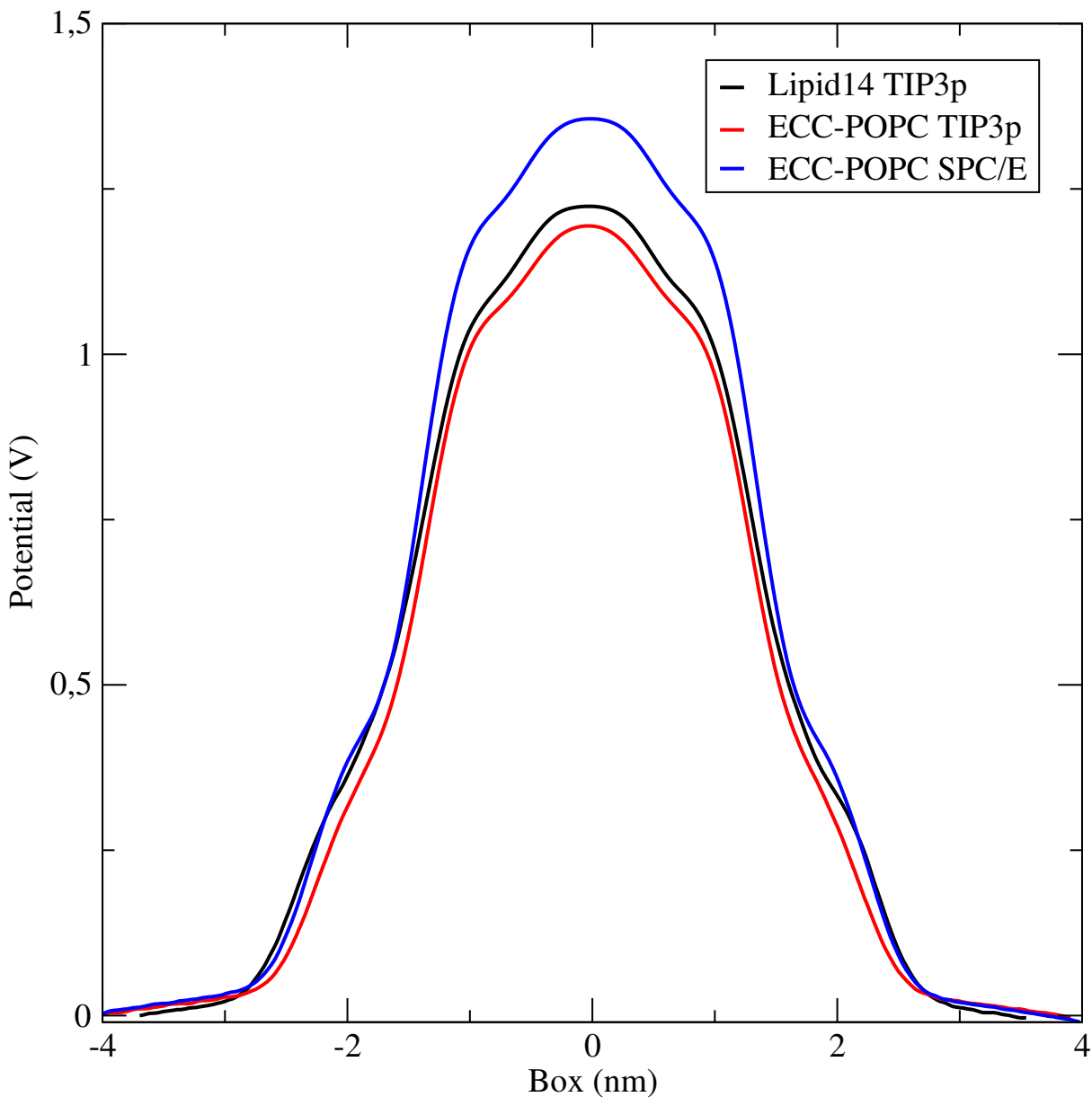# S8   Electrostatic potential of lipid bilayer

Figure S12:   Electrostatic potential calculated by evaluating the double integral of the charge density using *gmx potential* tool from Gromacs package.[40] Comparing the Lipid14 and ECC-POPC simulations with TIP3P water model reveals that applying ECC to the headgroup and glycerol backbone charges slightly decreases the dipole potential inside the bilayer. On the other hand, ECC-POPC simulation with SPC/E water model has larger dipole pontential than with TIP3P. The stronger dependence of water model is expected as the dipole potential mainly originates from orientation of water molecules.[41]
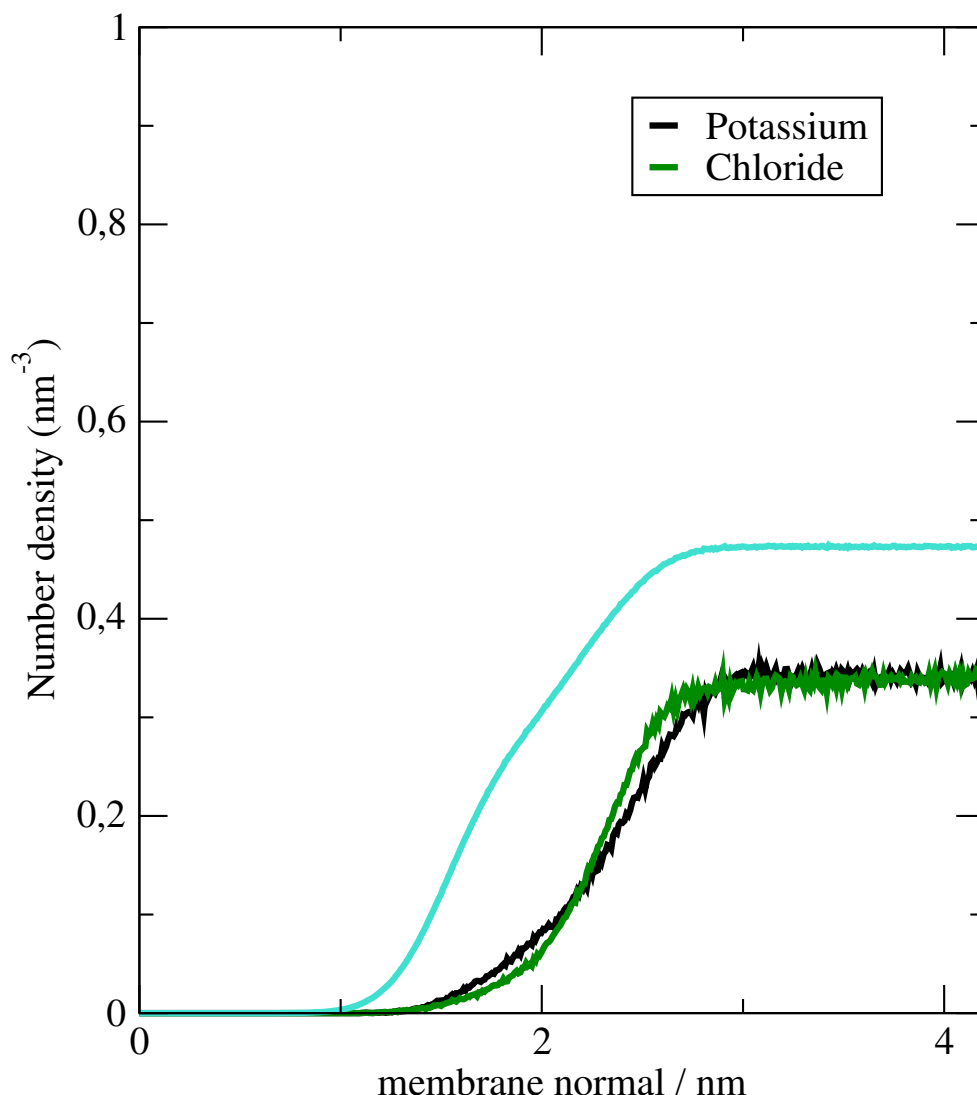
S9   Binding of potassium to ECC-POPC lipid bilayer

Figure S13: Number density profiles of K$^+$, Cl$^-$ and water along membrane normal axis from ECC-POPC simulation with KCl (C'_{ion}=1000mM, simulation parameters as in Table S1). Parameters for ions are taken from Ref. 42. In consistent with figure 5 in the main text, the density profiles of ions and water are divided with 2 and 200, respectively. Similarity of potassium and chloride curves together with the bulk concentrations indicate lower binding affinity for potassium than for sodium (Fig. 5 in the main text). Since this is in line with wide range of experimental data,[43–45] we conclude that the ECC-POPC model reproduces the correct binding affinity also for potassium. In line with the low binding affinity, the headgroup order parameters were not affected by the presense of KCl in simulations. The order parameter data is not shown because we are not aware of experimental data for PC headgroup order parameters as a function of KCl concentration.

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