## NMRlipids IV: Polarizable Lipid Force Fields

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## Abstract

This work is part of the NMRlipids open collaboration (nmrlipids.blogspot.fi).

## Introduction

So far, the NMRlipids community has focused on the performance of non-polarizable lipid force fields. As the inclusion of polarizability, both implicitly and explicitly, is getting more popular, I think a systematic review and benchmark study of the polarizable force fields would be useful for the entire lipid simulation community.

In a recent NMRlipids-based publication<sup>1</sup> electronic polarizability was included *implicitly*. The results showed a great improvement on the calculated C–H bond order parameters' response to added CaCl<sub>2</sub>. This suggests that including polarizability, even implicitly, can significantly improve performance.

In the present project, the idea is to focus on *explicit* polarization. At the moment, there are three main polarizable lipid force fields with explicit electronic polarization: CHARMM-Drude, <sup>2</sup> AMOEBA, <sup>3,4</sup> and CHARMM-Fluctuating Charge (FQ). <sup>5</sup> It is possible to obtain force field parameters and run them on GROMACS, AMBER, and CHARMM, respectively. Therefore, we need to have access to GROMACS, CHARMM, and AMBER MD engines unless someone ports all of these force fields to GROMACS.

In the following, I aim to give a glimpse of what is available and how is the performance of the aforementioned polarizable models. Please note that in all figures presented below, the full captions from the original publications are reproduced for convenience.

In the CHARMM-Drude force field, which is based on the classical Drude oscillator, a maximum-entropy method has been employed to match the experimental NMR order parameters. As of today, cholesterol, DPPC, DMPC, DLPC, POPC, DOPC, DPPE, POPE, and DOPE lipids have been parametrized. Furthermore, within the same force field there are force field parameters for ions which we can further test. Fig. 1 shows the NMR deuterium order parameters for the DPPC bilayer simulated by Li et al.<sup>2</sup> Note that they do not report the signs of the order parameters. Second observation is that in the Drude force field the order parameters have, in most carbons, larger absolute values than in the original CHARMM36 force field.

Figures 2 and 3 show the order parameters for POPC and POPE bilayers in the Drude polarizable force field.

The Atomic Multipole Optimized Energetics for Biomolecular Applications (AMOEBA) force field is based on representing the charge distribution of each atom by atomic monopole, dipole, and quadrupole moments. The literature in this case a bit scattered, but so far I managed to dig out force field parameters for DMPG,<sup>3</sup> POPS,<sup>3</sup> DOPC,<sup>4</sup> and POPE.<sup>4</sup> In the original paper the deuterium order parameters have been reported without the signs and the reported experimental values are sparse (Fig. 4).

CHARMM-Fluctuating Charge/Charge equilibration (FQ/CHEQ, the name has changed

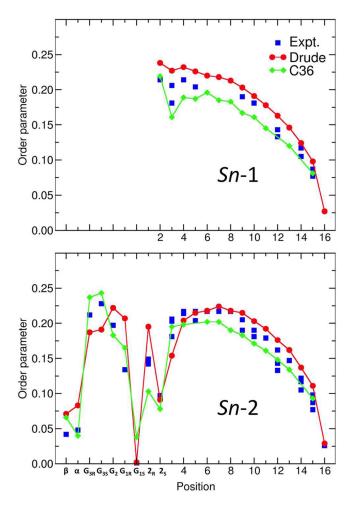


Figure 1: NMR deuterium order parameter  $(S_{\rm CD})$  values for a hydrated DPPC bilayer from Ref. 2. Shown are the  $S_{\rm CD}$  calculated using the new Drude polarizable force field (red), C36 additive force field (blue), and measured from experiments (black). The results for the C36 force field were taken from Klauda et al. Experimental data were taken from Seelig and coworkers 7-10 and Strenk et al.; 11 the data for the Sn-2 chain is taken from Douliez and et al. 12

a few times over the course of development) force field allows the magnitude of the individual atomic partial charges to change over the course of a simulation by assigning a fictitious mass to each of the charges and treating them as additional degrees of freedom in the equations of motion. So far, I managed to find the force field parameters for DMPC<sup>16</sup> and DPPC. <sup>17</sup> However, further work on this force field, especially for the lipids, seems have ceased. The order parameters reported in these papers are given in Figs. 6-7.

Currently, I continue reviewing the polariz-

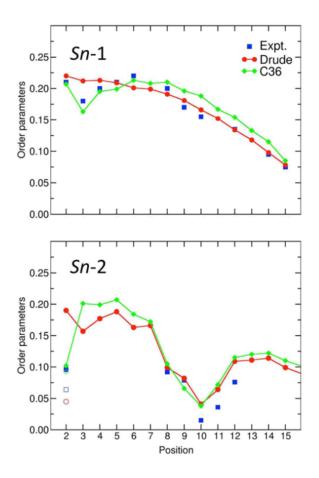


Figure 2: NMR deuterium order parameters  $(S_{\rm CD})$  for a hydrated POPC bilayer from Drude polarizable force field.<sup>2</sup> Shown are the  $S_{\rm CD}$  calculated using the new Drude polarizable force field (red), C36 additive force field (blue), and measured from experiments (black). The results for the C36 force field were taken from Klauda  $et.al.^6$  The MD values were calculated at 303 K. The experimental data collected at 300 K is from Seelig and Seelig.<sup>8</sup> The open symbols at position 2 of the Sn-2 chain represent the split values of the order parameters for HR and HS.

able force field literature. This could reveal additional force fields to those mentioned above. Please feel free to contribute with your knowledge and comments.

# Workflow and Data Contributions

Due to the limited number of force fields and available lipids, I suggest doing something simi-

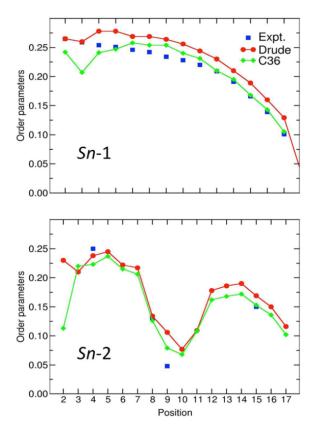


Figure 3: NMR deuterium order parameters  $(S_{\rm CD})$  for a hydrated POPE bilayer. Shown are the  $S_{\rm CD}$  calculated using the new Drude polarizable force field at 303 K (red), C36 additive force field at 310 K (blue), and measured from experiments at 310 K (black). The results for the C36 force field were taken from Klauda et  $al.^6$  The experimental data are taken from.  $^{13,14}$ 

lar to the NMRLipids II and IV projects combined: Checking the performance of all force fields for available zwitterionic and charged head groups employing the NMR C–H bond order parameters, X-ray form factors, and ion binding.

The overall workflow of this project will be based on the NMRlipids principles. All contributors, regardless of their level of contribution, will be offered a coauthorship when we start writing the manuscript. I will be a corresponding author, i.e. assume the role Samuli had in previous NMRLipids projects.

#### Data contributions

In order to automatize the analysis and reduce the human effort, we have compiled a

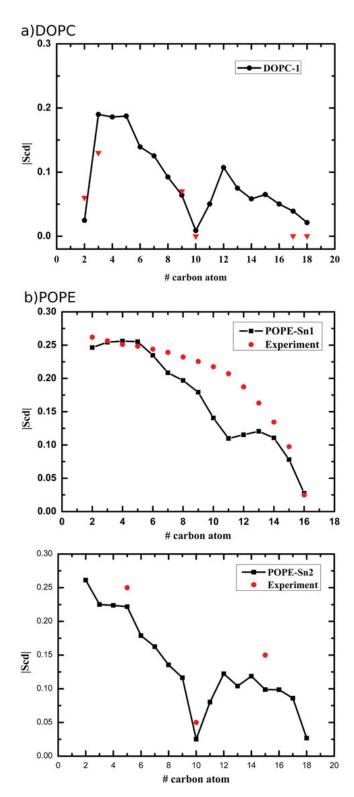


Figure 4: NMR deuterium order parameters for DOPC and POPE lipids from AMOEBA force field. The order parameters for the DOPC and POPE bilayer system averaged over the last 20 ns simulations (a) Sn-1, (b) Sn-2, are compared with the experimental values that are shown in red. 13-15

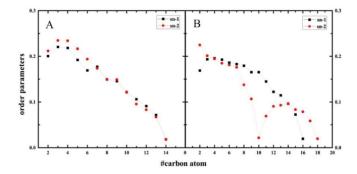


Figure 5: The order parameters for bilayer system averaged over the last 20 ns simulations from the AMOEBA force field.<sup>3</sup> (A) The order parameters for DMPG bilayer system; (B) The order parameters for POPS bilayer system; (B) The order parameters for POPS bilayer system.

Python script, AddData.ipynb, available at the scripts folder of the NMRlipids IV GitHub repository. The script reads trajectories from any public repository using the unique Digital Object Identifier (DOI), does the necessary preprocessing, calls other scripts (Order-Parameter.py) to calculate the C-H bond order parameters, and writes the output to a directory with a unique name derived from the data set DOI.

AddData.ipynb requires the simulation description to be supplied by the user. This part is located in the beginning of the script, where the user needs to define 1) the data set DOI, 2) the file that contains the atom indexing for calculating the order parameters, 3) the employed software, 4) the employed force field, 5) the force field source, 6) the names of the trajectory files, and finally 7) the working directory where the output will be written. Output of AddData.ipynb then is a uniquely (based on the DOI) named directory that contains a README file plus files that contain the order parameters. No changes/alterations to the files or the file names will be necessary.

Currently, AddData.ipynb is capable of processing and analyzing the trajectories in xtc (Gromacs) and dcd (NAMD) formats. In case your trajectories are in a different file format, please either make the necessary changes to the AddData.ipynb and push it back to the GitHub

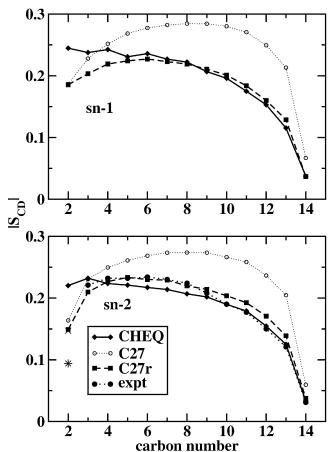


Figure 6: Deuterium order parameters for the tail groups of DMPC as a function of position on the sn-1 (upper) and sn-2 (lower) hydrocarbon chain from CHEQ force field. <sup>16</sup> Values are shown for the polarizable (CHEQ) and nonpolarizable (C27) models, as well as for the revised CHARMM force field for alkanes (C27r). <sup>18</sup> Experimental data <sup>12</sup> for the asymmetric sn-2 chain (lower) are also shown, with the star and X symbols marking the values for the 2R and 2S hydrogens, respectively.

repository, or email me so that we can handle your request and update the script according to your data format.

For AddData.ipynb to work, it needs two additional Python libraries, MDTraj and MDAnalysis, to be installed on your computer. MD-Analysis is required by the OrderParameter.py. MDTraj is required to convert trajectories, in case they differ from the xtc format.

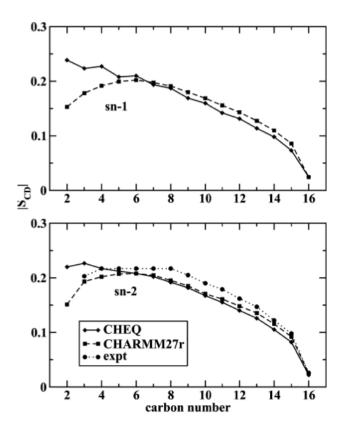


Figure 7: Magnitude of the deuterium order parameters for the tail groups as a function of position along the hydrocarbon chain for the DPPC from CHEQ force field. <sup>17</sup> Values are shown for the polarizable CHEQ and nonpolarizable CHARMM27r models. Experimental data is also shown. <sup>12</sup>

## Authorship and Data Ownership

Any contribution—a comment on the blog, adding a few lines to the analysis scripts, or supplying raw data—is invaluable! The NMR-lipids rules on authorship will be followed, that is, all contributors to the project will be offered coauthorship on the final publication.

As a data contributor, you maintain rights on your data set according to the licensing option you choose on the public server where you upload your data. We encourage using the Creative Commons licensing scheme (whichever version suits you) and making your data set publicly available to whomever needs it. In particular, by submitting your data set to the NMRlipids community on Zenodo, you agree your data to be used in the NMRlipids projects. Important: Please make sure that the data server you use

for uploading your data set generates a DOI.

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