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Short-Range Imbalances in the AMBER Lennard-Jones Potential for (Deoxy)Ribose...Nucleobase Lone-pair...π Contacts in Nucleic Acids.

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Abstract

The lone-pair... π (lp... π) (deoxy)ribose...nucleobase stacking is a recurring interaction in Z-DNA and RNAs that is characterized by sub-van der Waals lp...π contacts (<3.0 Å). It is part of the structural signature of CpG Z-step motifs in Z-DNA and r(UNCG) tetraloops that are known to behave poorly in molecular dynamics (MD) simulations. Although the exact origin of the MD simulation issues remains unclear, a significant part of the problem might be due to an imbalanced description of non-bonded interactions including the characteristic lp... π stacking. To gain insights into the links between $lp...\pi$ stacking and MD, we present an in-depth comparison between accurate large-basis-set double-hybrid Kohn-Sham density functional theory calculations DSD-BLYP-D3/ma-def2-QZVPP (DHDF-D3) and data obtained with the nonbonded potential of the AMBER force field (AFF) for NpN Z-steps (N = G, A, C, U). Among other differences, we found that the AFF overestimates the DHDF-D3 lp... π distances by ~0.1-0.2 Å while the deviation between the DHDF-D3 and AFF descriptions sharply increases in the shortrange region of the interaction. Based on atom-in-molecule (AIM) polarizabilities and SAPT analysis, we inferred that the DHDF-D3 vs. AFF differences partly originate in identical nucleobase carbon atom Lennard-Jones (LJ) parameters despite the presence/absence of connected electron withdrawing groups that lead to different effective volumes or vdW radii. Thus, to precisely model the very short CpG lp... π contact distances, we recommend revision of the nucleobase atom LI parameters. Additionally, we suggest that the large discrepancy between DHDF-D3 and AFF short-range repulsive part of the interaction energy potential may significantly contribute to the poor performances of MD simulations of nucleic acid systems containing Z-steps. Understanding where, and if possible why, the point-charge-type effective potentials reach their limits is vital for developing next-generation FFs and for addressing specific issues in contemporary MD simulations.

Introduction

DNA and RNA are key biological molecules whose shapes are primarily defined by nucleobase...nucleobase,¹ nucleobase...phosphate² and (deoxy)ribose...nucleobase³ interactions. A sub-category of the latter involves a T-shaped (deoxy)ribose...nucleobase stacking. 4,5 This interaction has been first identified in Z-DNA CpG steps and was subsequently named lone-pair...π or lp...π interaction while the associated CpG steps were called Z-steps.4 A typical CpG Z-step involves a T-shaped stacking arrangement of the cytidine (deoxy)ribose with the guanine base⁴ (Figure 1). Recent DNA and RNA PDB surveys^{4,5} revealed the occurrence of 'Z-like' steps that correspond to dinucleotide sequences involving any combination of the four nucleobases and possessing structural characteristics similar to those of a CpG Z-step, i.e. a 3'-nucleotide in a syn conformation, a 5'-nucleotide (deoxy)ribose with a C2'-endo pucker and a sub-van der Waals (sub-vdW) lp...π contact below 3.2 Å. The recurrence of short T-shaped (deoxy)ribose...nucleobase contacts that occur in Z-like steps or between nonconsecutive nucleotides stresses the structural relevance of lp... π motifs in nucleic acids.^{4,5,8}

Detailed PDB surveys of Z-like steps have shown that the O4' atom points frequently towards the nucleobase with contact distances \leq 3.0 Å and sometimes close to 2.8 Å.^{4,8} These salient stacking distances, which are among the shortest observed between an oxygen atom and a planar ring, raised questions regarding the strength and nature of the (deoxy)ribose...nucleobase stacking and in general of lp... π contacts.^{4,5,7,9,10} Do orbital interactions contribute to their stabilization or is a common non-covalent interaction framework sufficient to describe them?^{9–17}

Recently, energy decomposition analysis via high-level symmetry-adapted perturbation theory (SAPT)¹⁷ on a deoxyribose...guanine system showed that the lp... π contact is mainly stabilized by London dispersion and to a lesser extent by electrostatic interactions. Thus, the origins of the observed sub-vdW contacts cannot be explained by orbital effects as the "lp... π interaction" terminology would imply.¹⁷ Instead, the sub-vdW lp... π contacts could be rationalized through atom-in-molecule (AIM) α (0) polarizabilities, a measure that provides an estimate of effective atomic volumes.^{18,19} The calculated α (0) polarizabilities revealed that atomic volumes of the sp^2 carbon atoms of a guanine nucleobase do vary as a function of their chemical environment and that the carbon atoms connected to electron withdrawing groups are among the smallest of the nucleobase. Indeed, a small effective vdW radius for a sp^2 carbon may explain a lp... π contact distance in the 2.8–3.0 Å range that is much shorter than the 3.3–3.4 Å vertical distance between stacked base pairs in canonical double helical systems, ²⁰ the latter distance being twice the 1.70 Å vdW radius of an sp^3 carbon mentioned in the Bondi tabulation dated from 1964 and still in use.^{17,21–23}

Understanding vdW radii variations has far reaching consequences, one of them being related to the calibration of biomolecular force fields (FF) used for molecular dynamics (MD) simulations. The AMBER FF (AFF in the following), that is based on the 1995 Cornell et al. parametrization,²⁴ is currently one of the most popular nucleic acid force fields.^{25–27} Most of the recent AFF modifications focused on adapting the backbone dihedral terms, which is one of the most straightforward tuning methods.²⁵ Additional modifications of non-bonded terms have been suggested, including direct modifications of vdW parameters of phosphate group

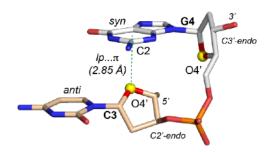


Figure 1. Typical CpG dinucleotide Z-step with a T-shaped deoxyribose...nucleobase stacking arrangement as occurring in Z-DNA and $r(UN\underline{CG})$ tetraloops.^{4,8} The represented C3pG4 step is extracted from the ultra-high resolution (0.54 Å) Z-DNA structure (PDB 3P4J).^{17,61} In this arrangement, the lp... π stacking contact distance (or O4' atom to guanine plane distance) is 2.85 Å and is represented by a dashed line.

oxygen atoms, adjustments of Lorentz-Berthelot combination rules for Lennard-Jones (LI) solute-solute and solute-solvent interactions as well as the addition of simple H-bond interaction tuning terms. $^{28-33}$ However, none of these modifications have been widely tested and no attempts have been made to address lp... π parametrizations in nucleic acids.

Among nucleic acid systems, the Z-steps containing Z-DNA helices and r(UNCG) tetraloops are especially challenging for MD simulations. Previous studies exploring the behavior of Z-DNA in MD simulations focused mainly on the dynamics of backbone dihedrals and helical parameters. A recent study that analyzed the disruption of the r(UUCG) tetraloop canonical structure occurring in μ s long MD simulations focused more precisely on intramolecular interactions within the loop region and traced several potential FF issues, the ribose...guanine lp... π stacking being one of those. To this point, it is not known to what extent a potentially imbalanced description of lp... π contacts causes MD simulations of Z-step-containing systems to ill-behave.

The non-covalent nature of (deoxy)ribose...nucleobase $lp...\pi$ contacts suggests that they could be reasonably modelled by the AFF, as previously proposed for base...base stacking. 43,44 However, the (deoxy)ribose...nucleobase stacking includes short lp... π contacts (\leq 3.0 Å) where the simple LJ potential starts to deviate from more rigorous descriptions. 45,46 Thus, the approximate nature of the empirical potential might lead to errors affecting the outcome of the simulations as observed for some specific base...base stacking motifs. 39,44,47 A few well-known issues arising from the oversimplified non-bonded potential of the pairwiseadditive FFs are: i) the use of a r-12 term for the repulsive part of LJ potential that lead to an overrepulsive short-range region^{45,46} instead of a more accurate exponential distancedependence as found in a Buckingham potential;⁴⁸ ii) missing atomic anisotropicity; iii) missing multi-body effects for the London dispersion component of the LJ term; and iv) missing (explicit) polarization and charge-penetration terms as a consequence of using fixed atomic point charges. 49-53 Regarding deficiencies of the fixed point-charge based FFs for short-range electrostatics, various correction schemes were proposed. 54,55 Notable advances for polarizable FFs have been made.⁵⁶ Recent QM derived FF approximations provided excellent results for the treatment of short-range electrostatics. 57,58 However, these rather

computationally demanding FFs are not suited for explicit-solvent MD simulations of large biomolecules.

Herein, we extend our previous QM characterization of the (deoxy)ribose...nucleobase stacking in CpG Z-steps¹⁷ to all NpN (N = G, A, C, U) Z-like steps by varying the 5' nucleobase (the 3' nucleotide can be of any type since it establishes a non-specific contact to the 5' nucleobase through its O4' (deoxy)ribose atom). We use highly-accurate dispersion-corrected double-hybrid density functional (DHDF-D3) calculations to evaluate the performance of the non-bonded potential of the AFF by constructing minimum interaction energy distance (minIEd) surfaces. For that purpose, and as described earlier, 17 we approximated the full (deoxy)ribose by a dimethylether (DME) molecular probe. Rationalization of the DHDF-D3 surface topologies is made by using atom-in-molecule (AIM) polarizabilities.^{59,60} To further assess the performance of the AFF, these data are compared against symmetry-adapted perturbation theory (SAPT) computations. Lastly, we analyze the behavior of Z-steps in MD simulations of Z-DNA and r(UUCG) tetraloop systems by employing the latest AFF versions. We found that the massively sampled short O4'...guanine plane distances are likely to cause imbalances in the simulations because of the overestimated short-range repulsion originating from the LI potential of the AFF. This led us to suggest that the usage of unified LI parameters for all nucleic acids carbon atoms contribute to a yet unrecognized degree to the AFF errors.

Computational Details

Structural models: As described earlier, 17 a CpG Z-step (see **Figure 1**) was extracted from a 0.54 Å ultra-high resolution Z-DNA crystallographic structure (PDBid: 61 only the deoxyribose of residue 3 and the guanine of residue 4 were kept). Then, the deoxyribose was changed into dimethylether (DME) while keeping the C-O4'-C atoms fixed in space to preserve the X-ray deoxyribose...guanine orientation (in the following, the DME oxygen atom will be named O4'). The DME orientation was maintained for all nucleobases (note that the DME orientation may differ for lp... π contacts involving non-consecutive nucleotides). To study all (deoxy)ribose...nucleobase stacking types, G was substituted by each of the three A, C or U nucleobases (**Figure 2**). Most of the computational protocol followed procedures described in earlier work. Or the computational protocol followed procedures described in earlier work.

QM structure optimization: Prior to making rigid-monomer interaction energy scans, the DME-nucleobase systems were gradient-optimized by the hybrid density functional approximation B3LYP⁶² with DFT-D3(BJ)^{63,64} dispersion correction and the def2-QZVP⁶⁵ atomic orbital basis set (B3LYP-D3/def2-QZVP). Harmonic penalty restraints as implemented in our inhouse optimizer^{66,67} were used to keep the initial DME...nucleobase fragment orientation (restraints are listed in Table S1 of the Supporting Information). Turbomole^{68,69} energy and gradient calculations employed an energy change threshold of 10⁻⁷ E_h for the SCF and the total energy convergence. The RI-JK integral approximation (density-fitting) was used with the m4 DFT quadrature grid.^{70,71} The XYZ coordinates for the optimized structures are provided in the Supporting Information.

Reference *ab initio* CCSD(T) and SAPT calculations: $PSI4^{72}$ was employed for density fitted $FNO-CCSD(T)^{73}$ and density fitted $SAPT2+(3)\delta MP2^{74-76}$ computations using the frozen core

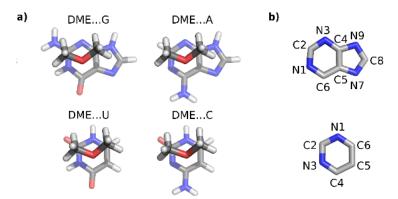


Figure 2. a) Top-down view on model systems showing DME...G, ¹⁷ DME...A, DME...U and DME...C with DME located above the pyrimidine ring centroid. b) Purine (top) and pyrimidine (bottom) ring atom numberings.

approximation. Extrapolation to complete basis set (CBS) FNO-CCSD(T) computations was automated with PSI4 using the formula:

$$E_{CCSD(T)/CBS} = E_{HF/aQ} + E_{MP2/CBS(aT,aQ)} + E_{FNO-CCSD(T)/junTZ} - E_{MP2/junTZ}$$
 (1)

where aT, aQ and junTZ represent the aug-cc-pVTZ, aug-cc-pVQZ and jun-cc-pVTZ basis sets, respectively. The standard 2-point extrapolation following Halkier et al. APT SAPT2+(3) MP2 calculations also employed the jun-cc-pVTZ basis set. Both, CCSD(T) and the mentioned SAPT theory level are highly accurate QM methods if appropriate basis sets are used and are labelled as 'gold standard' for the evaluation of non-covalent interactions. The CCSD(T) data were used to validate the DHDF-D3 approach (see below). SAPT calculations were used to decompose the interaction energy into various components.

QM DHDF-D3 single point energy computations: Energies were computed using the double-hybrid density functional approximation DSD-BLYP-D3⁸² with D3(BJ)⁸³ correction, the minimally-augmented ma-def2-QZVPP^{65,84} basis set (we use the abbreviation DHDF-D3 for DSD-BLYP-D3/ma-def2-QZVPP in following sections) and the ORCA program.⁸⁵ The "GRID5" quadrature grid was used for DFT calculations as well as the RI approximation for Coulomb integrals (RI-J) and the COSX (chain-of-spheres exchange) approximation for exchange integrals with "GRIDX6" grid.⁸⁶ Auxiliary basis sets were automatically constructed (AutoAux keyword).⁸⁷ A tight energy change threshold for SCF convergence was used (*TightSCF* keyword; 10⁻⁸ E_h). The double-hybrid calculations used the frozen core approximation for the RI-MP2 contribution.

AMBER FF single point energy computations: The in-house program *bff*⁸⁸ was used for calculating AFF interaction energies on QM-optimized geometries of DME...nucleobase and deoxyribose...nucleobase models. Note that for interaction energies, only the non-bonded potential of the AFF is needed. The AFF interaction energy was calculated as

$$E_{int(AFF)} = 332 \sum_{ij} \frac{q_i q_j}{r_{ij}} + \sum_{ij} \left[\left(\frac{R_{\min(ij)}}{r_{ij}} \right)^{12} - 2 \left(\frac{R_{\min(ij)}}{r_{ij}} \right)^6 \right]$$
(2)

where the first term is the electrostatic potential describing the pairwise Coulomb interactions between all intermolecular atomic pairs i and j by using q_i and q_j partial atomic charges and r_{ij} interatomic distance. The 332 factor takes care of the conversion to kcal.mol⁻¹ from charges in atomic units and distances in Ångström. The second term is the Lennard-Jones (\square) potential composed of a repulsive (r_{ij}^{-12}) and an attractive $(-r_{ij}^{-6})$ part. The \square parameters are represented by the $R_{\min(ij)}$ optimal interatomic distance and by the ε_{ij} potential well depth.

Partial charges were calculated by using the Antechamber⁸⁹ automated RESP⁹⁰ procedure at the recommended HF/6-31G* level of theory. LJ parameters for the "parm99bsc0⁹¹ AMBER variant" were taken from the AmberTool library files of AMBER16.⁹² These LJ parameters are identical to those of the original Cornell et al. AMBER parametrization²⁴ and to those used in MD simulations of Z-DNA and r(UUCG) (see *AMBER MD simulations* and Table S5). The atom types and partial charges used for the AFF calculations are available as text files with '.resp' ending in the Supporting Information.

Minimum Interaction Energy distance (minIEd) and Interaction Energy (IE) surfaces: To compute these surfaces, we have performed vertical interaction-energy scans for series of positions of the DME probe covering the entire purine and pyrimidine nucleobase rings. We define the "minimum interaction energy distance" (minIEd) as the O4'...nucleobase distance at which the Ip...π DME...nucleobase interaction energy is at its minimum. The complementary interaction energy (IE) surface shows the corresponding interaction energy minima to the minIEd surface. Thus, both surfaces use the same geometry for a given xyz coordinate; the IE surface displays the value of the interaction energy minimum and the minIEd surface displays the corresponding Ip...π distance. Note that the minIEd distance is not systematically associated with the interaction energy strength as the balance of interactions differs depending on the local environment of the probed point. We found that it is useful to construct both minIEd and IE surfaces for the DHDF-D3 vs. AMBER comparison. The minIEd surface allows to compare the vertical distances while the IE surface shows the energetics of the interaction. A schematic that explains how the minIEd and IE values are derived from vertical scans is provided in Figure S1 of the Supporting Information.

Note that we changed the previous term *closest-contact* surface¹⁷ to the *minIEd* surface, since the former term could be perceived as ambiguous outside the structural biology community.

The four-dimensional data sets (xyz coordinates and interaction energy) used for the construction of the surfaces were collected as follows: first, the O4' atom of the optimized DME...nucleobase system was placed above the centroid of the pyrimidine ring at a 2.5 Å vertical distance. Then, DME was moved as a molecular probe in horizontal and vertical directions with respect to the nucleobase to sample 29 (horizontal scan) x 20 (vertical scan) = 580 points for purines and 20 (horizontal scan) x 20 (vertical scan) = 400 points for pyrimidines to cover the whole rings (see Figure S1 and Parameters for the vertical scans of the nucleobase surfaces in the Supporting Information).

One additional horizontal point was added for the DHDF-D3 surfaces of the C and U pyrimidine nucleobases outside the ring next to the C2 atom (along the centroid-C2 vector) to localize more precisely the *minIEd* surface minima (Figure S1). Gnuplot was used to create the

surfaces using its internal algorithm for data interpolation.⁹³ Limitations to this modelling approach are described in the *Surface scan limitations* section of the **Supporting Information**.

Atomic Polarizabilities. Atom-in-molecule (AIM) $\alpha(0)$ polarizabilities calculated with DFT-D4 dispersion theory using Grimme's *dftd4* code were used to rationalize DHDF-D3 surface shapes. ^{17,59,60,94} Note that while these AIM polarizabilities are interpolated from pre-calculated *ab initio* data and change depending on the atomic charge and chemical environment, they are not related to any topological analysis of the density.

AMBER MD simulations: Molecular dynamics (MD) simulations of a Z-DNA [(CpG)₃]₂ hexamer duplex (PDBid: 3P4J X-ray structure)⁶¹ were performed in AMBER18⁹⁵ by employing the AMBER OL15 force field³⁴ in an NPT ensemble using the Langevin thermostat with a collision frequency of 2 ps⁻¹ and the Berendsen (weak-coupling) barostat.^{96,97} A total simulation time of 3 μ s (3x1 μ s trajectories with randomized initial velocities) was achieved at both 100 K and 300 K temperatures. The CUDA-driven *pmemd* module (SPFP-implementation) of Amber was used,⁹⁸ along with a 2 fs time step and standard SHAKE restraints.⁹⁹ A SPC/E¹⁰⁰ water box with a 10 Å buffer region and with an octahedral periodicity was used. Simulations were done in Na⁺ excess salt conditions of 0.2 M NaCl resulting from the addition of 15 Na⁺ and 5 Cl⁻.¹⁰¹ lons were placed using AmberTool's *leap* module that uses basic electrostatic mapping.

MD trajectories of the r(ggcacUUCGgugcc) tetraloop hairpin were taken from our previous work. Simulations were initiated from the NMR structure (PDBid: $2KOC^{102}$) and the AMBER OL3 (i.e., ff99bsc0 χ_{OL3}) RNA force field with modified \Box parameters for phosphate oxygens, associated dihedral adjustments, and the external gHBfix potential was used. Trajectory snapshots were saved every 10 ps for both Z-DNA and r(UUCG) tetraloop. Equilibration protocols and further details are provided in the Supporting Information.

For Z-DNA, the whole 6 μ s trajectories were analyzed. For r(UUCG), we used only the initial 4.5 μ s (MD1), 2.4 μ s (MD2) and 2.8 μ s (MD3) segments extracted from the tetraloop trajectories. In these segments the majority of the signature interactions of the r(UNCG) tetraloop is preserved. The remaining MD segments were not analyzed since the r(UUCG) tetraloop denatures and deviates significantly from the canonical structure. Further, the ribose...guanine lp... π contact is totally lost when the guanine nucleobase flips out of the loop.

Additional software: Structures were visualized by Molden¹⁰⁵ and VMD¹⁰⁶; figures were prepared with PyMOL¹⁰⁷, Jmol¹⁰⁸ and VMD; graphs were prepared by Gnuplot⁹³ and Xmgrace; MD analyses were performed using CPPTRAJ¹⁰⁹ obtained from AmberTools18⁹⁵.

Results and Discussion

Vertical energy scans reveal substantial differences between DHDF-D3 and AFF lp... π descriptions.

First, we discuss two representative DME...nucleobase vertical energy scans (Figure 3). For DME...G, the O4' atom is located above the pyrimidine ring centroid; for DME...C, the O4' atom is positioned above the C2 atom. Both positions are near the global minimum on the respective minIEd surfaces, i.e., the DME positions leading to the closest optimal contact distance (see below). Additionally, Figure 3 displays FNO-CCSD(T)/CBS (abbreviated as "CCSD(T)") reference

data to validate the DHDF-D3 results. The excellent agreement between the less computationally demanding DHDF-D3 (in red) and the more accurate CCSD(T) 'gold standard' calculations (in black; Figure 3) supports the use of the DHDF-D3 approximation.

For DME...G, the DHDF-D3 interaction energy minimum at 2.97 Å versus 3.10 Å for the AFF interaction energy curve displays a clear +0.13 Å shift of the AFF minimum towards longer distances. For DME...C, the DHDF-D3 and AFF curves show a greater distance shift (+0.24 Å) with interaction energy minima at 2.91 Å and 3.15 Å, respectively.

We also computed vertical interaction energy scans for larger deoxyribose...nucleobase models (Figure S2 and DME...G/C versus deoxyribose...G/C calculations in the Supporting Information). The AFF data shows qualitatively a similar shift to longer distances as for the DME probe. However, interpretation of the results is more complicated for the larger deoxyribose model with its hydroxy and methoxy groups than for the simpler and symmetric DME model. Thus, we suggest that for the purpose of scanning vdW surfaces of nucleobases, the smaller DME model helps to grasp the essential features of these systems.

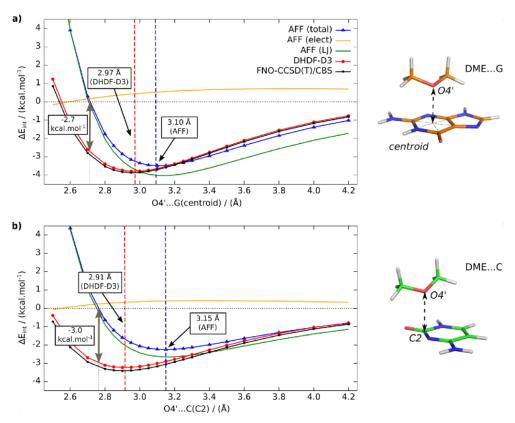


Figure 3. Comparison of AFF (AMBER FF; blue) and DHDF-D3 (DSD-BLYP-D3/ma-def2-QZVPP; red) vertical scans of the interaction energy along the O4'...nucleobase distance for a) DME...G and b) DME...C. The 'gold-standard' FNO-CCSD(T)/CBS calculations (black) are shown for reference. The decomposition of the non-bonded AFF potential in electrostatic (orange) and Lennard-Jones (green) components is also shown. AFF and DHDF-D3 minima distances are indicated. The grey double arrows mark the distances where the AFF becomes positive; the associated box displays the interaction energy difference between AFF and DHDF-D3.

AFF overestimates short-range repulsion for lp... π contacts compared to the DHDF-D3 reference.

To assess the importance of the AFF limitations and their implications for MD simulations, it is crucial to consider not only the position of the minima, but also the gradients of the energy curves in the regions commonly sampled in MD simulations. Figure 3 highlights large AFF energy gradients at distances below the energy minima and a sharp increase in the DHDF-D3 vs. AFF difference for intermonomer distances below 2.9 Å, where the LJ approximation for the short-range repulsion starts to break down (see AFF electrostatic and LJ energies show substantial deviations from SAPT especially for compressed structures). For instance, the AFF energies become positive below 2.7 Å, while the QM energies are still around –3.0 kcal.mol⁻¹ at this distance.

AFF minIEd surfaces are too repulsive and shallow compared to the DHDF-D3 reference.

DME...purines. The global minimum of the DHDF-D3 *minIEd* surface for both purine nucleobases is located in the middle of the pyrimidine rings at 2.97 Å (G) and 2.95 Å (A) (Figure 4 and Table S2). The surface remains shallow towards the C2 and C6 atoms. A secondary minimum is located above the imidazole rings at 3.04 Å (G) and 3.01 Å (A). For G, the location of the global *minIEd* minimum is in agreement with PDB database analysis of NpG Z-like steps that show that the O4' atom is mainly distributed above a region located between the C2 and C6 atoms and the pyrimidine ring centroid.^{4,17} The data is also consistent with a PDB database analysis taking into account (deoxy)ribose...nucleobase stacking contacts between nonconsecutive nucleotides.⁵

The AFF minIEd surfaces recover some features of the DHDF-D3 surfaces, i.e., the surface minima are located close to the centroid of the pyrimidine ring (Figure 4). However, the minima lie at ≈ 3.10 Å, a notable deviation of 0.13 Å (A) and 0.15 Å (G) from the DHDF-D3 surface minima (Figure 4 and Table S2). Overall, the AFF minIEd surfaces are too repulsive over the whole surface area and are shallower than the DHDF-D3 minIEd surfaces. This is likely a consequence of the simple form of the AFF non-bonded potential that is unable to capture short-range electronic-structure effects like polarization, charge-penetration, and exchange-repulsion. AFF also fails to correctly describe the area between the two rings and the second minimum within the imidazole ring. The latter point should be of limited practical importance for MD simulations of systems with Z-step-like lp... π stacking since the O4' atom does not occur in positions above the imidazole ring in these structures, in contrast to what is observed for some ribose...nucleobase stacks occurring between non-neighboring residues in RNAs.^{4,5}

DME...pyrimidines. Z-like steps with pyrimidine instead of purine nucleobases are less frequent. Few cases were reported for RNA and only one for DNA.⁴ However, in RNA different, non-Z-step-like ribose...nucleobase stacking types were observed in crystallographic structures with uracil or cytosine as a nucleobase.⁵

The DHDF-D3 minIEd surfaces of both pyrimidine nucleobases are similar to each other (Figure 5 left). The minima are located close to the C2 atom and not close to the ring centroid as one would expect from the purine nucleobases data (Figure 4). This dissimilarity may result from the absence of the pyrimidine/imidazole junction that allows for smaller

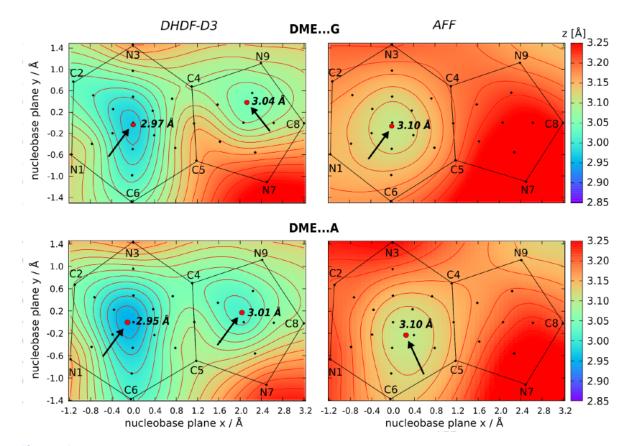


Figure 4. DME...G and DME...A *minIEd* surfaces for DHDF-D3 and AFF. Guanine and adenine nucleobases lie in the xy plane. Color represents the 'z' coordinate of the O4' DME atom, the contours represent isoline stepping of 0.02 Å. The color scale is the same for all plots to ease visual comparison. This causes a region of the AMBER surface around the N7 atom to be imprecisely represented as it slightly exceeds the scale. Black arrows and distance values point to minima of the *minIEd* surfaces marked by red dots; small black dots mark nucleobase points where the vertical scans were calculated (see also **Figure S1**). The AFF vs. DHDF-D3 difference range is 0.03–0.18 Å and 0.05–0.19 Å for G and A, respectively. DHDF-D3 data for G are taken from Kruse et al.¹⁷

atomic volumes of the purine C4/C5 carbon atoms when compared to the "equivalent" pyrimidine C6/C5 atoms due to the presence of the electron-withdrawing nitrogen atoms of the imidazole ring. For instance, the minimum distance of approach to the C5 atom in pyrimidines is ≈ 3.22 Å while it is close to 3.15 Å (G) and 3.09 Å (A) in purines (see AIM polarizabilities $\alpha(0)$ explain shapes of minIEd surfaces and Figure 6). Interestingly, our DHDF-D3 results are in agreement with a PDB database study of (deoxy)ribose...nucleobase stacking that shows that the O4' atom is mostly positioned above the C2 atom of a pyrimidine nucleobase.⁵

Overall, the agreement between DHDF-D3 and AFF for the pyrimidine systems is poor. The AFF minIEd surfaces of the pyrimidine systems (Figure 5) are barely capturing any of the essential features of their DHDF-D3 counterparts. For DME...C, the AFF surface shows a spread-out minimum covering a large part of the left side of the surface plot and the lowest value is by ~0.21 Å larger compared to the DHDF-D3 minimum (Figure 5 and Table S2). As a reminder, Figure 3b shows the vertical scan for the position above the C2 atom and a 0.23 Å difference between DHDF-D3 and AFF for the minimum. The lowest point of the DME...U surface lies outside the ring near the N3 atom. Adding another nucleobase point outside of N3 was not sufficient to determine an unambiguous minimum. In lieu of a proper minimum the shortest distance of the AMBER minIEd surface is used as a pseudo-minimum for DME...U in Figure 5 and Table S2.

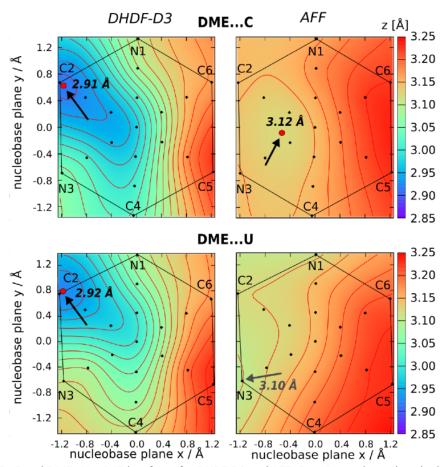


Figure 5. DME...C and DME...U minIEd surfaces for DHDF-D3 and AFF. Cytosine and uracil nucleobases lie in the xy plane. Color represents the 'z' coordinate of the O4' DME atom, the contours represent isoline stepping of 0.02 Å. The color scale is the same for all plots to ease visual comparison. Black arrows and distance values point to minima of the minIEd surfaces marked by red dots; small black dots mark points where the vertical scans were calculated (see also Figure S1). Note that for DME...U no AFF minIEd minimum is defined as it is outside the ring beyond the N3 atom. In this case, a grey arrow points to the N3 atom and the minIEd distance from vertical scan above the N3 atom is written in the graph. The AFF vs. DHDF-D3 difference range is 0.01–0.23 Å and 0.00–0.20 Å for C and U, respectively.

AIM polarizabilities $\alpha(0)$ from DFT-D4 dispersion theory correspond to the *minIEd* surfaces shapes.

Figure 6 pictures atom-in-molecules (AIM) polarizabilities $\alpha(0)$ of the four nucleobases that we calculated to rationalize the shapes of DHDF-D3 *minIEd* surfaces (see below). The AIM polarizabilities obtained from DFT-D4 dispersion theory^{59,60} approximate atomic volumes^{18,19} and thus can serve as a qualitative surrogate measure for the elusive 'real' vdW surface, although no information about the atomic anisotropy or shape of the volume is available.¹⁷ Here we assume near-spherical shape as an approximation.

The shape of the guanine *minIEd* surface appears to fit well with the relative magnitudes of the AIM $\alpha(0)$ polarizabilities (Figure 6 and Kruse et al.¹⁷), especially for the pyrimidine ring. The C2 and C6 atoms, being the two smallest atoms of the guanine rings, allow for the closest O4'...ring atom contacts. For DME...A, the *minIEd* surface minimum spreads to the C4 and C6 atoms which are the smallest adenine rings atoms.

AIM polarizabilities seem also to explain the minIEd surfaces of pyrimidine nucleobases

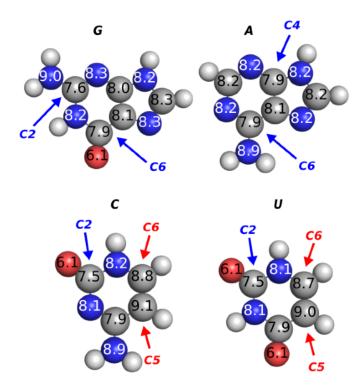


Figure 6. DFT-D4 based Atom-In-Molecule (AIM) polarizabilities $\alpha(0)$ representing the volume of atoms in atomic units of cubic bohr (a_0^3) for the four nucleobases guanine (G), adenine (A), cytosine (C) and uracil (U). The carbons discussed in the text are marked by blue (smaller carbon atoms) or red (larger carbon atoms) arrows.

where the smallest C2 and the biggest C5 atom show the shortest and the largest O4'...ring atom contact distances, respectively. Moreover, the significant shift of the *minIEd* minimum from the center of the six-atom rings for purines to the C2 atom for pyrimidines can be explained by the AIM $\alpha(0)$ polarizability values of C5 and C6 atoms (right side of the ring) that are significantly larger compared to the corresponding C4 and C5 atoms of purine nucleobases (Figure 6).

LI parameters for nucleobase carbon atoms should not be identical in force fields.

The large range of DHDF-D3 vs. AFF differences shows that some minima locations on the nucleobase surfaces are better described by AFF than others. The largest range is observed for DME...C where the difference between the DHDF-D3 and AFF *minIEd* distance is negligible for O4'...C(C5), while the deviation is large for O4'...C(C2) (0.23 Å). This appears to be correlated with the differences in AIM polarizabilities between the carbons (small C2, large C5; Figure 6). It suggests that the vdW radii for the nucleobase carbon atoms — currently represented by an identical set of LJ parameters in the AFF (Table S5) — might be too large for the atoms connected to electron withdrawing groups like the guanine C2 atom. Note that the AFF LJ parameters for the nucleobase sp^2 carbons are derived from Monte Carlo simulations on liquid benzene and are thus identical to those of benzene rings devoid of electro-attractive-groups (Table S5). Thus, it can be assumed that the pyrimidine C5 and C6 atoms that display the largest AIM volumes are similar to the benzene sp^2 carbon atoms and that the same AFF LJ parameters can be used. But it is clearly not the case for the carbon atoms connected to electron withdrawing groups and it is timely to add some diversity to the set of nucleobase LJ parameters.

To support our rationalizations based on AIM polarizabilities, we also calculated SAPT vertical scans with (DME)O4' located above the smallest (C2) and largest (C5) cytosine atom. Results show that exchange-repulsion (essentially Pauli repulsion) as well as the London dispersion (related to atomic polarizabilities) are notably smaller when O4' is located above the C2 atom (Figure S3 in Supporting Information). This agrees with a carbon atom with a smaller effective vdW radius and a smaller $\alpha(0)$ polarizability value.

The DHDF-D3 and AFF *minIEd* surface comparison and the different AIM polarizability volumes of the ring carbon atoms indicate that (deoxy)ribose...nucleobase stacking cannot be precisely described at a quantitative level by the current uniform carbon atom AMBER LJ parameters. On one side, FFs should be parametrized with limited number of atom types to avoid over-fitting, as discussed in Schauperl et al. 110 On the other side, describing all nucleobase ring carbons by the same LJ parameters is a very rough approximation as becomes apparent from our data. Thus, we tentatively propose that LJ radii for nucleobase carbon atoms should adhere to the following size-relation: C2<C6<C4^C5 for G, C4^C6<C2^C5 for A, and C2<C4<C6<C5 for C and U and be smaller or equal to those of benzene rings. In earlier work we calculated $\alpha(0)$ polarizabilities for the indole rings. The values for the two junction carbons are large and close to those calculated for pyrimidine C5 and C6 nucleobase atoms. Further evaluation using either a larger dataset or following a different approach, like obtaining AIM electron density-based LJ parameters unique for each atom prior to MD simulation as proposed by Kantonen et al. 111, is needed to precisely parametrize LJ radii values for sp^2 carbon atoms.

There have been other observations and attempts to modify the too large vdW radii for nucleobase atoms in AFF. Namely, Banáš et al. 112 identified a steric clash between the adenine N1 and thymine N3 atoms leading to overestimation of the AT pair stretch. Another two groups attempted to re-parameterize AFF by modifying the LJ parameters of nucleobase atoms to improve folding of r(UUCG) tetraloop. Chen and Garcia developed force field 29 , where the LJ σ parameters for nucleobase atoms were uniformly re-scaled by a factor of 0.95. Tan et al. 31 used

fitting to the QM data and published parameters, where the \Box radii of carbon, nitrogen and polar hydrogen atoms were reduced, enlarged, and set to zero, respectively. All these strategies are in accordance with the need to update the \Box parameters of nucleobase atoms but none of these modifications is in line with the rules suggested by us. Furthermore, the attempts by Chen-Garcia and Tan et al. revealed that while they achieved partial improvements for specific models, they also introduced undesired side effects and even disruptions (including secondary structure rearrangements) of some other important RNA systems. 32,35,113–115 All those attempts highlight that general modification of \Box parameters in AFF is demanding work, which requires extensive testing on large variety of RNA motifs.

Interaction energies for the lp... π DME...nucleobase stacking are equally weak for all nucleobases.

Interaction energy (IE) surfaces, defined as the strongest (minimum) interaction energies of the vertical scans, are discussed in detail in the Supporting Information. Table S2 shows that DME...G is the system with the weakest DHDF-D3 interaction energy (-3.9 kcal.mol⁻¹) and DME...C the strongest (-4.4 kcal.mol⁻¹). A cautious interpretation of the data is that all our systems are very close in energy, i.e., no nucleobase stands out as particularly suitable or unsuitable for (deoxy)ribose...nucleobase interactions and all the interaction energies are weaker than typical nucleobase...nucleobase interactions (-6.0 kcal.mol⁻¹).⁴⁷ The AFF reproduces the DHDF-D3 energy range around the surface minima relatively well although it fails to reproduce important structural features and short-range energies (Figure 3). We also note that interaction energies cannot be straightforwardly related to free energies in nucleic acids.¹¹⁶

AFF electrostatic and LI energies show substantial deviations from SAPT especially for compressed structures.

It has been suggested that short (deoxy)ribose...nucleobase contacts may be subtly vertically compressed by the surrounding structural context, because lp...π contacts in nucleic acids often occur in locally strained molecular topologies as in Z-DNA and in r(UNCG) tetraloops. ^{17,117,118} To evaluate the range of potential compression effects, we performed SAPT computations that decompose the interaction energy into electrostatics, London dispersion, induction, and exchange-repulsion at three vertical separations: (i) the minimum of the corresponding minIEd surface (ii) extended by 0.3 Å and (iii) compressed by 0.2 Å. For all three separations SAPT shows dominating London dispersion followed by strong electrostatics (Table 1), in agreement with previous work. ¹⁷ Although extending or compressing the stacking distance does not change the interaction energy substantially, as typical for non-covalent interactions with naturally flat potentials near their minimum, it does change the relative composition of the interaction energy (Table 1 and Figure 4 of Kruse et al. ¹⁷). At longer distances the electrostatic interactions contribute less and dispersion becomes more

important, while at shorter distances, where the electron clouds overlap more, the electrostatic contribution increases as charge penetration effects come to play.⁵³

The AFF decomposition shows that the \Box potential dominates the interaction energy curve as the Coulomb FF electrostatics remains flat in the equilibrium region and almost without a contribution to the AFF curve (Table 1 and Figure 3). It is known that the AMBER electrostatics is fairly insensitive for nucleobase...nucleobase stacking vertical separation. We show that this is also the case for the $lp...\pi$ (deoxy)ribose...nucleobase stacking. Point-charge schemes are known to be deficient at short-range due to the lack of explicit charge-cloud penetration effects that become important once the electron densities of both molecules start to overlap ('interpenetrate') and are usually attractive for charge-neutral molecular densities. However, most classical non-bonded FF potentials should be understood as *effective potentials*, where the accuracy of the individual parts is less important

Table 1. SAPT2+(3)δMP2/jun-cc-pVTZ (*SAPT*) interaction energy decomposition into electrostatics (ΔE_{elect}), London dispersion (ΔE_{disp}), induction (ΔE_{ind}), exchange-repulsion ($\Delta E_{exch-rep}$) as well as AFF electrostatic (ΔE_{elect}) and Lennard-Jones (ΔE_{\sqcup}) terms. The percentages indicate the contributions of the attractive components.

Interaction component type	DMEG	DMEA	DMEC	DMEU
SAPT at miniEd minimum (kcal.mol ⁻¹)				
ΔE_{elect}	-2.3 (21 %)	-2.7 (24 %)	-2.8 (30 %)	-3.4 (35 %)
ΔE_{disp}	-8.0 (74 %)	-7.7 (71 %)	-5.8 (62 %)	-5.8 (59 %)
ΔE _{ind}	-0.5 (5 %)	-0.5 (5 %)	-0.8 (8 %)	-0.6 (6 %)
ΔE _{exch-rep}	7.3	7.2	6.3	6.3
ΔE_{total_SAPT}	-3.6	-3.7	-3.2	-3.6
AFF (kcal.mol ⁻¹)				
ΔE_{elect}	0.4	0.4	0.2	-0.7
ΔΕ⊔	-3.7	-3.3	-2.1	-2.0
ΔE_{total_AFF}	-3.3	-2.9	-1.8	-2.7
SAPT at minIEd minimum +0.3 Å (extension; kcal.mol ⁻¹)				
ΔE _{elect}	-0.5 (8 %)	-0.8 (14 %)	-1.0 (20 %)	-1.5 (28 %)
ΔE _{disp}	-5.1 (87 %)	-4.9 (82 %)	-3.7 (72 %)	-3.7 (67 %)
ΔE _{ind}	-0.3 (5 %)	-0.3 (4 %)	-0.4 (9 %)	-0.3 (6 %)
ΔE _{exch-rep}	2.7	2.7	2.3	2.3
ΔE _{total_SAPT}	-3.2	-3.3	-2.9	-3.3
AFF (kcal.mol ⁻¹)				
ΔE_{elect}	0.6	0.5	0.3	-0.4
ΔΕ⊔	-3.9	-3.6	-2.7	-2.7
ΔE_{total_AFF}	-3.3	-3.2	-2.3	-3.1
SAPT at minIEd minimum -0.2 Å (compression; kcal.mol-1)				
ΔE_{elect}	-4.9 (29 %)	-5.3 (32 %)	-5.4 (37 %)	-6.1 (40 %)
ΔE_{disp}	-10.9 (66 %)	-10.4 (63 %)	-8.0 (54 %)	-8.0 (53 %)
ΔE _{ind}	-0.9 (5 %)	-0.9 (5 %)	-1.3 (9 %)	-1.1 (7 %)
ΔE _{exch-rep}	13.9	13.7	12.3	12.4
ΔE _{total_SAPT}	-2.8	-2.8	-2.4	-2.8
AFF (kcal.mol ⁻¹)				
ΔE _{elect}	0.2	0.3	0.1	-0.9
ΔΕ _Π	-1.5	-1.1	0.7	0.8
ΔE _{total_AFF}	-1.3	-0.8	0.8	-0.1

than their sum.⁵¹ For example, the exponential distance-dependence of the charge penetration and the short-range exchange-repulsion allow for the systematic cancelling of errors between the missing charge penetration effects and the approximate r⁻¹² distance-dependence of the repulsive part of the LJ potential in AFF.⁵¹ Thus, the short-range charge-penetration part of QM electrostatics is effectively included in the vdW term of AFF.

While these schemes work relatively well at typical vdW distances, the erroneous behavior of the too steep r^{-12} term of the \Box potential dominates the short-range region entirely, as also shown by a significant weakening of AFF interaction energy in the compressed lp... π structures (Table 1). For instance, while the difference for the DME...G model between the SAPT and AFF energy at the *minIEd* minimum is -0.3 kcal.mol⁻¹, it is -1.5 kcal.mol⁻¹ when compressed by only 0.2 Å. For DME...C, the AFF interaction energy is even repulsive (+0.8 kcal.mol⁻¹) for the compressed structure. Similar observations of a systematically too repulsive AFF potential in the short-range region of interatomic contacts have been reported before. The awareness about the too steep repulsion of the \Box potential goes all the way back to Buckingham. However, the r^{-12} form (equation (2) in *Computational details*) has been favored in all major biomolecular FFs over the Buckingham exponential form for computational efficiency reasons.

MD simulations of Z-DNA and r(UUCG) tetraloop sample lp... π distances in the too repulsive short-range region.

Above, we have shown that AFF overestimates the *minIEds* in lp... π (deoxy)ribose...nucleobase stacking compared to the reference DHDF-D3 method (Figure 4 and 5). In addition, for the short-range repulsion part, the agreement between AFF and DHDF-D3 worsens due to the steepness of the r^{-12} \Box repulsive term at small contact distance (Figure 3). To evaluate the extent to which the short-range regions are sampled by MD simulations, we analyzed the (deoxy)ribose...G contacts in MD simulations of Z-DNA and r(UUCG) tetraloops systems.

Z-DNA. We analyzed Z-DNA MD simulations conducted with OL15 at 100 K and 300 K. The 100K simulations were done to mimic experimental crystallization conditions. The 300 K simulations sampled various backbone substates similar to those described by Zgarbová et al.³⁴ including flipping of the native α_{g+}/γ_t to the non-native α_t/γ_{g+} conformation in CpG steps. This α/γ flipping has been recently improved.³⁸ The 100 K simulations are mirroring the situation of the crystal structure more closely and retain well the crystal structure conformation.

The average O4'...G-plane distance (Figure 7) analyzed for the middle CpG dinucleotides of Z-DNA strands is 3.03 Å (300 K). If selecting only the snapshots with a preserved canonical CpG Z-step (around 18 % of all the snapshots), the average distance is reduced to 2.96 Å (see Table S6). While the average O4'...G distance over C_3pG_4 and C_9pG_{10} in the 3P4J X-ray structure (2.87 Å)¹⁷ is exceeded by the 300 K MD, it is well reproduced by the 100 K simulation (2.91 Å; this distance is reduced to 2.88 Å if only the C_3pG_4 and C_9pG_{10} satisfying the Z-step criteria – 36 % of all the snapshots – are considered; see Table S6), likely due to the reduced temperature preventing crossing of conformational energy barriers. At the same time, the average MD distances are smaller than the AFF *minIEd* values for the model system indicating that the repulsive region of the non-bonded potential for the deoxyribose...G stacking is sampled in

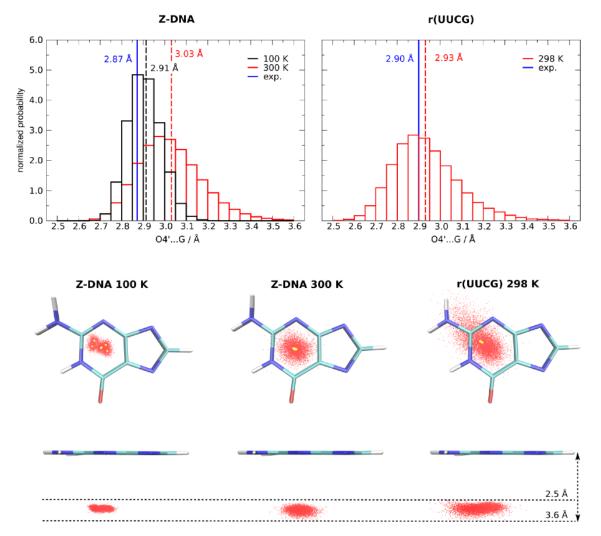


Figure 7. Histograms of O4'...G (Ip- π) distances and top-down/side views on the O4'...G nucleobase from AFF MD simulations of Z-DNA and r(UUCG) tetraloop models. In the histograms the time-averaged O4'...G distances are marked by vertical dashed lines (black/100 K, red/300 K) while experimental values for Z-DNA (for 3P4J C₃pG₄ and C₉pG₁₀ steps) and r(UUCG) (2KOC, average from 20 models) are marked by blue solid lines. Projection points of the O4' atom on the G nucleobase are displayed as red points and averages for each combination of one CpG dinucleotide (for Z-DNA either 3-4 or 9-10) with one MD simulation are marked as yellow dots. In the top-down/side views on the O4'...G nucleobase every 100th snapshot is visualized.

both the 100 K and 300 K simulations. We noticed that the cytidine deoxyribose changes its pucker from C2'-endo to C1'-exo at both temperatures and even shifts to O4'-endo in the 300 K simulation. The deoxyribose deformation appears to ease the atom-atom steric conflict and leads to extension of the O4'...G distances.

Figure 7 shows that while in the 300 K simulations the O4' projection points form a single cloud spreading from the center of the pyrimidine ring to the ring-atoms, there is a group of six clouds in the 100 K simulations (one for each CpG step) as the O4' occupies a smaller region of space above the nucleobase in the locked Z-DNA geometry. Additionally, there is no

preference for any of the ring atoms by the O4' atom in 300 K simulation, which agrees with the spuriously flat AFF *minIEd* surface (Figure 4). However, in X-ray data⁶¹ and to some extent in the 100 K simulations, the C2 atom contact is preferred.¹⁷

The r(UUCG) tetraloop. Here, we used three 10 μs-long MD simulations of the r(ggcacUUCGgugcc) tetraloop NMR structure¹⁰² taken from Mráziková et al.³⁵ to analyze O4'...G distances in three simulations segments where the tetraloop structure is preserved (see "Computational details").³⁵ We observe again a high sampling of short O4'...G distances (Figure 7 right). The average from all analyzed segments is 2.93 Å, which is shorter by 0.10 Å compared to Z-DNA MD data but close to the ≈2.90 Å experimental O4'...G distances derived from both the NMR (PDBid: 2KOC¹0²) and an ensemble of X-ray structures.⁴ In contrast to Z-DNA, the O4' is frequently located directly over the ring and close to the C2 atom, as displayed by the O4' projections on the G nucleobase (Figure 7). It indicates that the r(UUCG) tetraloop is too stiff to ease the steric repulsion between the O4' and the ring-atoms, which eventually leads to disruption of its native conformation.

Thus, distances below the *minIEd* surface minima are sampled in both Z-DNA and r(UUCG) tetraloop trajectories. It indicates that the overall Z-DNA and UNCG tetraloop structures tend to compact the (deoxy)ribose...G stacking. Due to thermal fluctuations, the simulations face an exaggerated short-range LJ potential repulsion that inevitably biases the statistical MD sampling and has the potential to destabilize the native state. This may be one of the reasons leading to a problematic description of Z-step containing nucleic acid structures in current MD simulations.

Conclusion

Herein, we evaluated the ability of the AMBER FF (AFF) non-bonded potential to describe the (deoxy)ribose...nucleobase lp... π stacking through comparisons with the highly accurate double-hybrid DFT (DHDF-D3) method. Vertical interaction energy scans calculated using DME...nucleobase (G, A, C, U) models reveal a clear over-repulsiveness of the AFF especially at the short-range region. Moreover, the effect is non-systematic and varies for different positions of the O4' atom above the nucleobase. For instance, while the difference in DHDF-D3 and AFF minimum interaction energy distances (minIEds) is significant for the C2 atom for all the nucleobases, the AFF behaves correctly for the C5 atoms of pyrimidine nucleobases. This is a consequence of differences in atomic volumes of the nucleobase carbon ring-atoms, as indicated by DFT-D4 based AIM $\alpha(0)$ polarizability calculations. This implies that using the same vdW radius for all ring-carbon atoms is not the best choice for nucleobase systems. Based on our results we tentatively suggest that nucleobase carbon atom LJ parameters, which are all identical in the AFF, should follow the size-relationships: C2<C6<C4^C5 (for G), C4^C6<C2^C5 (for A), and C2<C4<C6<C5 (for C/U) and recommend that the LJ parameters of N and O atoms in aromatic rings should also be reevaluated.

MD distance sampling for both, a Z-DNA helix and a r(UUCG) tetraloop system, strongly suggests that simulations of nucleic acid structures with Z-steps are affected by the exaggerated short-range repulsion of O4'...G contacts. This prevents compaction of the O4'...G interaction that the real system would use to achieve an overall balance of the intricate Z-step conformation. Therefore, the too 'large' AFF nucleobase carbon atoms distort any structural

sampling of Z-steps due to an increased strain in these highly specific and apparently stiff (and thus also brittle) conformations. The mere modification of the AFF atomic radii would not necessarily eliminate the problem. It is necessary to work on two issues: improving the vdW description of nucleobase atoms and finding a way to flatten the AFF lp... π interaction potential which is currently using the oversimplified 6-12 form of the LJ term. Current computational means would allow the use of Buckingham like potentials, although this would imply significant reparameterization efforts.

Associated content

Supporting Information

Additional computational details, surface scan limitations, deoxyribose...G and deoxyribose...C calculations, SAPT for DME...guanine with rotated DME, discussion to *IE* surfaces, MD equilibration and simulations protocols, AMBER atom types and LJ parameters for nucleobase atoms, additional MD analyses, SAPT comparison between O4'...C(C2) and O4'...C(C5) (PDF)

Optimized geometries of DME...nucleobase and deoxyribose...nucleobase models; input files for *bff* calculations containing XYZ coordinates of the optimized geometries of DME...nucleobase and deoxyribose...nucleobase models, RESP charges and atom types; surface data containing XYZ files used for single-point energy calculations and files containing O4'...nucleobase distance and the associated interaction energy for both AFF and DHDF-D3 methods and for each nucleobase (ZIP)

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Data and Software Availability

The datasets generated during the current study are contained within the manuscript or Supporting Information. Raw trajectory data are available from the authors on request.

The in-house program used for restrained geometry optimizations can be downloaded from https://github.com/hokru/xopt (Xopt) and the QM software coupled to Xopt used for energy and gradient calculations can be purchased from https://www.turbomole.org/ (Turbomole version 7.3). The software used for DHDF-D3 single-point calculations for surface scans is freely available after registration at https://orcaforum.kofo.mpg.de/app.php/portal (ORCA version 4.0.1), the software used for CCSD(T) calculations and SAPT analysis is freely available at https://psicode.org/installs/v14/ (PSI4 version 1.4). The software used for the electrostatic potential maps calculations further used for generating RESP charges by Antechamber can be

purchased from http://gaussian.com/ (Gaussian 09). Antechamber itself, as well as CPPTRAJ used for analysis of MD trajectories, is a part of freely available AmberTools found at https://ambermd.org/GetAmber.php. The MD software AMBER can be purchased from the same website. The in-house program used for single-point AFF calculations for surface scans can be downloaded from https://github.com/hokru/BrnoFF (bff). The program used for AIM polarizability calculations is freely available at https://www.chemie.uni-bonn.de/pctc/mulliken-center/software/dftd4 (dftd4).

The used visualization programs are freely available at https://www3.cmbi.umcn.nl/molden/ (Molden), https://www.ks.uiuc.edu/Research/vmd/ (VMD version 1.9.3), http://pymol.org/ (PyMOL version 2.5.0) and http://jmol.sourceforge.net/download/ (JMOL version 14.6.4). The software used for preparing graphs is freely available at http://www.gnuplot.info/ (Gnuplot version 4.6) and http://plasma-gate.weizmann.ac.il/Grace/ (Xmgrace version 5.1.22).

Acknowledgement

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