The Amber ff99 Force Field Predicts Relative Free Energy Changes for RNA Helix Formation

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S *Supporting Information*

ABSTRACT: The ability of the Amber ff99 force field to predict relative free energies of RNA helix formation was investigated. The test systems were three hexaloop RNA hairpins with identical loops and varying stems. The potential of mean force of stretching the hairpins from the native state to an extended conformation was calculated with umbrella sampling. Because the hairpins have identical loop sequence, the differences in free energy changes are only from the stem composition. The Amber ff99 force field was able to correctly predict the order of stabilities of the hairpins, although the magnitude of the free energy change is larger than that determined by optical melting experiments. The two measurements cannot be compared directly because the unfolded state in the optical melting experiments is a random coil, while the end state in the umbrella sampling simulations was an elongated chain. The calculations can be compared to reference data by using a thermodynamic cycle. By applying the thermodynamic cycle to the transitions between the hairpins using simulations and nearest-neighbor data, agreement was found to be within the sampling error of simulations, thus demonstrating that ff99 force field is able to accurately predict relative free energies of RNA helix formation.

INTRODUCTION

RNA plays many important roles in the organism beyond simply carrying genetic information. It catalyzes reactions,[1−3] participates in post-translational gene regulation,[4] controls protein localization,[5] and guides post-transcriptional modification.[6,7] In addition many RNA sequences are transcribed in genomes, but their functions are not yet known.[8]

Molecular dynamics (MD) simulations provide insights in RNA structure and dynamics. Beginning with the introduction of Ewald methods for calculation of long-range electrostatic interactions, it has been possible to run precise simulations on RNA structures.[9] Subsequently, MD has been used to gain insight into roles of ions, water, and modified nucleotides on the RNA structure.[10−18] Other, specialized calculations have been used to understand conformational changes, including targeted MD for modeling HIV dimerization,[19] nudged elastic band (NEB) for modeling loop conformational changes,[20−22] and umbrella sampling for calculating free energy of folding.[23,24]

An important factor in estimating the accuracy of MD simulations is the accuracy of the set of parameters used to describe the potential energy of the system, the force field. There are several force fields commonly used for simulations of RNA, belonging broadly to groups derived for use with CHARMM[25] and Amber[26] molecular modeling packages. The several commonly used Amber force fields are all derivatives of the original Cornell et al. force field ff94,[27] derived using a combination of experimental data and quantum mechanical calculations. Force fields ff98[28] and ff99[29] improved the sugar pucker and glycosidic torsions of nucleic acids in ff94. Later, in 2007, the ff99bsc0[30] correction introduced an improved description of the α/γ backbone torsions. Finally, two separate sets of parameters have been derived using quantum mechanics

(QM) to describe glycosidic torsions of all four bases.[31,32] Recent CHARMM force fields are derivatives of the CHARMM27[33] force field. CHARMM36[24,34] improves on CHARMM27 by reparameterizing the torsions of 2′-hydroxyl group of RNAs and several backbone and sugar pucker torsions to better describe the BI/BII conformation equilibrium of DNAs. On a basic level, the accuracy of force field parameters can be estimated by comparing it with QM calculations. Because of the high computational cost of QM calculations, these computations are confined to calculating the energies of stacking and hydrogen bonding in vacuum and involving only bases.[35−40] Comparing these results with the equivalent calculations performed using Amber force fields shows that Amber force fields are able to predict hydrogen bonding and stacking interactions with reasonable accuracy.[41] The downside of these comparisons is that they only consider the bases, the calculations are performed in vacuum, and the ions are not present.

Ultimately, the accuracy of a force field can best be judged by how well it performs in simulations of nucleic acids systems in solution. In this work, the ability of Amber ff99 force field to accurately predict free energy changes of helix formation was examined. Experimental data, in the form of the free energy changes of folding calculated from optical melting experiments, and nearest-neighbor parameters were used to determine the reference free energy changes.[42,43] Nearest-neighbor parameters are a set of empirical parameters derived from optical melting experiments that can predict free energy change of RNA secondary structure formation by adding pairwise contributions. For duplex formation, the nearest-neighbor

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dx.doi.org/10.1021/ct300240k | *J. Chem. Theory Comput.* XXXX, XXX, XXX–XXX

parameters have statistical errors of less than 0.1 kcal/mol each.[44,45]

Specifically, experimental and nearest-neighbor free energies of folding were compared with the free energies calculated using MD simulations. To determine the free energy change of unfolding, potential of mean force (PMF), also called umbrella sampling, calculations were performed.[46−48] The PMF method uses a set of equilibrium MD calculations, called windows, along a reaction coordinate to determine a free energy change along that coordinate. Individual simulations are forced to sample different regions along the reaction coordinate with harmonic restraints, also called umbrella potentials. Finally, the windows are combined, the effect of the biasing potential is removed, and the free energy change along the reaction coordinate is obtained. In this work, the umbrella sampling simulations follow the unfolding coordinate measured by the distance between O5′ atom of the 5′-end nucleotide and the O3′ atom of the 3′-end nucleotide in RNA hairpin loops. This reaction coordinate was chosen to mimic the procedure performed in single molecule stretching experiments. In this study the end points are distances of 15 Å (native conformation) and 75 Å, a denatured state that corresponds roughly to the contour length of a 12-mer of a single-stranded RNA, which has a 5.9 Å distance between successive nucleotides.[49]

The RNA systems used were three hairpin stem-loop structures that have the same loop (hexaloop GUAAUA)[42] but differ in the stem region. Therefore, the differences in folding free energies between the hairpin stem loops were caused by the differences in the double-helical region. The hairpins were chosen instead of simple double helices because of their larger stability compared to double helices with the same number of nucleotides[50] and because the end point of a pulling simulation is a well-defined structure that can be sampled on the time scales of MD simulations. The GUAAUA sequence is highly conserved in the L11 region of the large subunit rRNA.[51,52] Although tetraloops have been studied extensively using MD simulations,[23,53−56] simulation studies done on hexaloops are fewer,[57,58] despite the large amount of experimental data available.[42,59,60] In addition, the choice of hexaloop hairpins as a test system enabled examination of their folding pathway, results of which can be compared to the similar tests performed recently on the tetraloop systems.[23,24]

The report is organized as follows. In the Materials and Methods Section, the properties of the hairpins used in the simulations and the details of the umbrella sampling simulations are described. In the Results and Discussion Section, the results of the MD simulation are analyzed, the free energy changes are calculated using the results from the simulations, and experiments/nearest-neighbor data and the difference between the two are discussed. Finally, the Conclusion Section summarizes the results of simulations and comparisons with the experimental data.

■ MATERIALS AND METHODS

Starting Structures. The calculations were done starting with the hexaloop hairpin sequence: 5′-GGCGUAAUAGCC-3′, where unpaired hairpin nucleotides are underlined. The atomic coordinates were taken from an NMR structure.[42] The coordinates of the hairpin GCGUAAUAGC were also determined in the *Escherichia coli* ribosome crystal structure solved to 3.5 Å resolution.[43] The mass-weighted conformational root-mean-square deviation (rmsd) for the 10 nucleo-

tides common to the NMR and X-ray structure is 0.28 Å. The stability of this hairpin is -2.7 ± 0.15 kcal/mol in 0.1 M NaCl at 37 °C, as measured by optical melting experiments.[59] Figure 1 illustrates the solution structure of the hairpin. The important
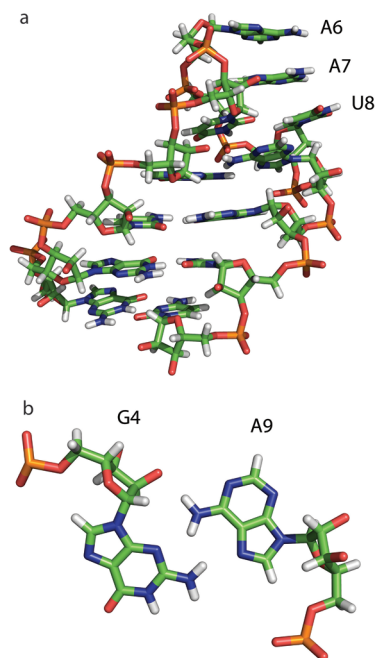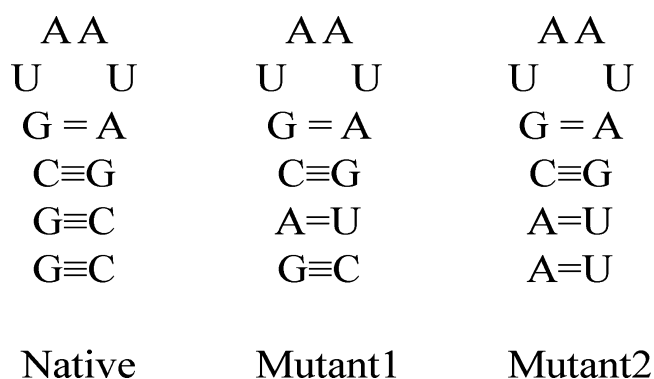

Figure 1. Solution structure of native hairpin GGCGUAAUAGCC.[42] Figures show (a) the structure, illustrating the continuous stack of A6, A7, and U8 and (b) the sheared base pair between G4 and A9. G4 and A9 are bonded via trans Hoogsteen/sugar edge hydrogen bond.[87]

structural features include the G4-A9 sheared base pair and the continuous stacking of A6, A7, and U8. NMR data, however, show that there is a large flexibility of the loop region at 35 °C, well below the melting temperature of 63 °C, and that the structure of G4-A9 mismatch is fluxional.[42]

Two additional, mutant hairpins were created by manually modifying the atoms in the stem region of the native hairpin. In mutant1, basepair G2-C11 was replaced with A2-U11. In mutant2, G1-C12 has been replaced with A1-U12, and G2-C11 was replaced with A2-U11. This preserves the loop region and changes the stem region. The secondary structures of the three hairpins are given in Figure 2.

Free Simulations MD Protocol. Stability of the hairpins was tested by running three independent simulations for each hairpin. Hairpins were first neutralized by adding Na$^+$ ions, and then they were immersed in a truncated octahedron box of TIP3P[61] water such that the edges of the box were at least 8 Å from the solute molecules. The systems were then equilibrated to temperature of 300 K and pressure of 1 atm using the following procedure: First, a 1000 step minimization of only water molecules was run to relieve the potentially bad contacts between solute and solvent molecules, and then the whole system was minimized during another 1000 steps of minimization. Then the system was gradually warmed to 300 K during 20 ps using a Langevin thermostat[62] with a frequency of collision of 1 ps^{-1}. Next, pressure was set to 1 atm using the Berendsen method[63] with isotropic position scaling, and a 1 ns MD simulation was run. After that, three independent 100 ns simulations were run for each hairpin, with the difference between runs being the random number seeds for the

```
   A A              A A              A A
  U   U            U   U            U   U
   G = A            G = A            G = A
   C≡G              C≡G              C≡G
   G≡C              A=U              A=U
   G≡C              G≡C              A=U

  Native          Mutant1          Mutant2
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Figure 2. Secondary structures of native, mutant1, and mutant2 hairpins. They differ only in the stem region. Mutant1 has the G2-C11 base pair replaced with the A2-U11, and the mutant2 has G1-C12 replaced with A1-U12 and G2-C11 with A2-U11. This diagram shows the number of hydrogen bonds in each pair.

pseudorandom number generator. In all simulations, the particle mesh Ewald (PME) method[64,65] was used to calculate the electrostatic interactions. The SHAKE algorithm[66] was applied to fix all bonds containing hydrogens, which permits a 2 fs time step. Lennard-Jones interactions were truncated at 8 Å. Simulations were run using the pmemd program of Amber.[26]

Umbrella Sampling Protocol. PMF calculations were done using the Amber software package[26] and the ff99 force field[28,29] using an explicit solvent and the TIP3P[61] water model. Umbrella sampling windows were separated by 1 Å. The ends of the RNA hairpin were held at the appropriate distance in each window using a harmonic restraint with a force constant of 5 kcal/(mol Å^2). Each window simulation was at least 10 ns (and in some cases longer to ensure convergence). Because of the large size of the system, especially in unfolded states, separate starting structures were created for each window. They were obtained by running a series of restrained simulations in implicit solvent using the generalized Born solvation model[67−69] with a 1 ns simulation time per window. One simulation was performed for each umbrella sampling window, by restraining the distance between the O5′ atom at the 5′-end and the O3′ atom at the 3′-end of the hairpin. The end points of implicit solvent simulation simulations were used to make the starting points for the explicit solvent simulations. Each molecule was first neutralized with Na$^+$ ions,[70] and then, to reproduce the conditions of the optical melting experiments,[42] enough Na$^+$ and Cl$^-$ ions[71] were added to make the concentration 0.1 M in each window. Each of the structures was then solvated in a cube of TIP3P[61] water with water molecules at least 8 Å from the edges of the RNA hairpin. The system was then energy minimized in two stages: First, the RNA molecule was kept frozen, and water and ions were minimized, and then in the second stage, the whole system was allowed to move. The window restraints were then turned on, and the system was slowly heated to 300 K and to pressure of 1 atm during the 100 ps using the Langevin thermostat.[62] After that, an NTP production simulation was run for 10 ns or more per window. The PME method[64,65] was used to calculate the electrostatic interactions. The SHAKE algorithm[66] was used to fix all bonds containing hydrogen atoms. Simulations were run using the pmemd module of Amber. The first 1 ns of each window simulation was used for equilibration, and the data were collected from the remaining time. To obtain an estimate for errors, three independent simulations were run for native

and four simulations for mutant hairpins. For all hairpins, first, an "exploratory" simulation was run on windows from 15 to 75 Å end-to-end distance, to establish an exact point of unfolding. This point was set to where all hydrogen bonds in the hairpin were broken (more details in the Results and Discussion Section), which occurs by the 55 Å window in all simulations. Then an additional two (or three for mutant hairpins) umbrella sampling simulations were run on windows from 15 to 55 Å. The individual runs differ in the random seed for the Langevin thermostat. Distributions of end-to-end distances from all windows were then combined, the biasing potential was removed, and the free energy change along the reaction coordinate was calculated using the weighted histogram analysis method (WHAM)[46−48] as implemented in a program by Alan Grossfield.[72] In the WHAM calculations the data points were sorted in bins separated by 0.1 Å, and the convergence criterion was set to 1×10^{-6} kcal/mol. The convergence of simulations was tested by comparing the free energy change calculated using the full sampling to that calculated using shorter sampling, the reasoning being that if the simulations have sampled the conformational space properly, the results should be similar. The tests for convergence for native, mutant1 and mutant2 hairpins are shown in Figures S3, S4 and S5, respectively, Supporting Information. The total simulation time, which includes free and umbrella sampling simulations, was 7.2 μs.

RESULTS AND DISCUSSION

Free Simulations of Hairpins. The stability of the three hairpins (Figure 2) was tested by running three independent, 100 ns explicit solvent simulations using the Amber software package[26] and the ff99 force field.[29] The rmsd plots of heavy atoms to the NMR structure as a function of time are given in Figure S1, Supporting Information. The native hairpin stabilized at around 3.5 Å mass-weighted rmsd from the NMR structure. The rmsd of the stem region is on average 1.04 Å for all three simulations (data not shown), so most of the flexibility is in the loop. Mutant1 shows a somewhat larger rmsd because, in addition to the flexible loop, it has one of the GC basepairs in the stem replaced with the weaker AU pair. In two of the trajectories the stem remained stable, while the third shows a formation of a "ladder-like" structure in the double helical region, a phenomenon related to the inability of ff99 to properly model the glycosidic torsion potential.[53] Finally mutant2 shows a relatively high rmsd relative to the NMR structure in all three trajectories. Mutant2 is predicted by nearest-neighbor model to be weakly unstable at 300 K, with a folding free energy change of 0.8 kcal/mol (Table 2). There is again the formation of a "ladder-like" conformation and also a fraying of the A1-U12 basepair in all three trajectories. To test whether umbrella sampling can be run on a weakly unstable system, a 30 ns MD simulation of mutant2 was run with a 17 Å end-to-end restraint. The 30 ns simulation time is longer than any window time used in the umbrella sampling simulations. Figure S2, Supporting Information, shows rmsd as a function of time for both the whole mutant2 hairpin and for its stem region. The average RMSDs to the starting structure for the complete hairpin and the stem region were 2.6 and 1.2 Å, respectively. Therefore, the stem region remains stable for the time scales required to run a single window simulation of umbrella sampling measurements because the end-to-end restraints keep the base pairs in the stem at the appropriate positions for pairing. Because of these factors, the flexibility of

the mutant hairpins should not have a significant influence on the accuracy of calculations.

It has been reported that the ff99 force field performs poorly in describing the structure of the hairpins. This is apparent in this study, as evidenced by the relatively high rmsd of the loop region and the partial distortion of the stem regions of the mutant hairpins. The recently published[31,32] improvements to the Amber ff99 force field description of the glycosidic torsion prevent the formation of "ladder-like" structures; their inclusion could be used to improve the stability of hairpins in free simulations.

Free Energy Change from Umbrella Sampling Simulations. Figure 3 shows free energy change (solid lines,
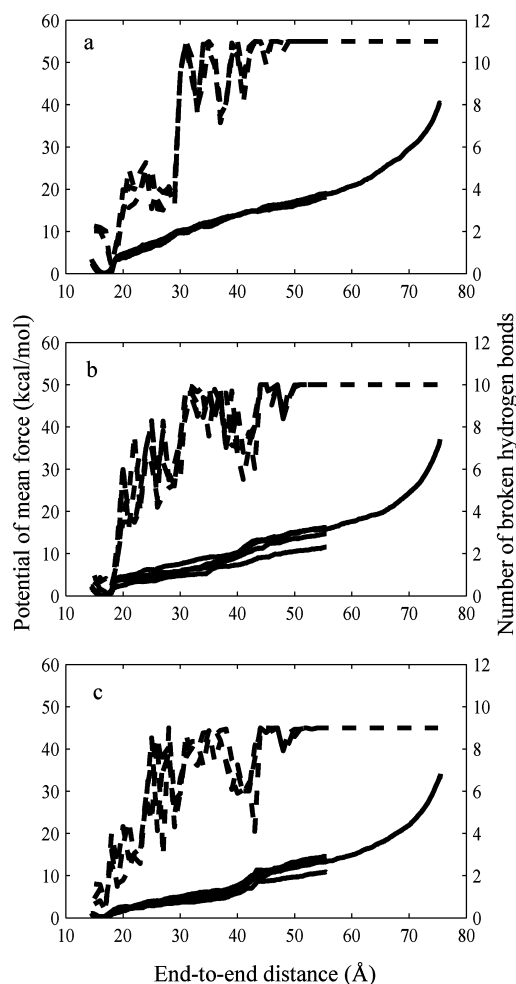
Figure 3. PMF and number of broken hydrogen bonds plotted against the end-to-end distance for (a) native, (b) mutant1, and (c) mutant2 sequences. The PMF calculation has been run three times for the native hairpin and four times for mutant1 and mutant2 hairpins. Solid lines and the left-hand side *y*-axis are the PMF plots, and dashed lines and the right-hand side *y*-axis denote data for the number of hydrogen bonds broken.

left side *y*-axis) and the average number of broken hydrogen bonds (dashed lines, right side *y*-axis) along the reaction coordinate for native and both mutant hairpins. The free energy change was calculated by applying the WHAM procedure on the end-to-end distances distributions from the individual umbrella sampling simulations. The average number of broken hydrogen bonds was calculated by averaging the number of

broken hydrogen bonds in each umbrella simulation window over the course of the simulation. A hydrogen bond was defined as being broken if the distance between the donor and acceptor atoms was larger than 4 Å. The native hairpin has four basepairs, three GC and one GA (sheared) pair for a total of 11 hydrogen bonds; mutant1 has three GC pairs and one each of AU and GA pairs for a total of 10 hydrogen bonds. Finally, mutant2 has two GC pairs, two AU pairs and one GA pair for a total of 9 hydrogen bonds.

All PMF calculations showed five distinct regions:

(1) A well-shaped region, spanning from 15 to 19 Å with a minimum at 17 Å, corresponding to the native state. The minima of all three molecules were within several tenths of an angstrom of each other and to the distance between 5′-end O5′ and 3′-end O3′ atoms in the solution structure.[42]

(2) In the second region, from approximately 19 Å when first hydrogen bond breaks to approximately 42 Å, there was monotonic increase in free energy change that corresponded to an equilibrium between conformations with partially broken hydrogen bonds in the stem region. All hydrogen bonds in the first base pair (1G-12C in native and mutant1 and 1A-12U in the mutant2) are broken by 20 Å. Hydrogen bonds in the second basepair (2G-11C in native and 2A-11U in both mutants) break by around 30 Å. The last basepair in the stem region (3C-10G in all three hairpins) breaks by around 42 Å.

(3) In the third distinct region, starting around 42 Å end-to-end distance, there was a steep increase in the slope of free energy change curve as the last hydrogen bond in the stem was broken. These first three regions correspond approximately to the three regions described in work by Deng et al.[23] with tetraloop sequences.

(4) The fourth region, spanning from 50 Å to approximately 55 Å, was the region where the sheared hydrogen bond in the loop (4G-9A) was gradually broken in all hairpins, and the hairpin stretched to an almost linear form after that.

(5) The region after 55 Å end-to-end distance was characterized by a steeper slope of the free energy curve. At this point all hydrogen bonds were broken, and the faster increase in free energy was a consequence of stretching the angles and bonds that requires more potential energy than the breaking of hydrogen bonds.

Optical melting experiments, which were used as a reference, interpret the melting data using a two-state model.[73,74] The two-state model assumes that the molecule exists in either completely paired or completely unpaired states and is a reasonably good approximation for small hairpins and duplexes, such as the ones used in this study. This assumption is supported by isothermal titration calorimetry experiments.[75] The free energy change of unfolding for the two state model can be estimated from the probabilities of finding the molecule in the two states, folded or unfolded. The native state was defined as the area between 15 and 19 Å end-to-end distances and the unfolded state as the area beyond 55 Å, which is the point at which all hydrogen bonds are broken. Then the free energy of unfolding[23] is

$$\Delta G_{\text{fold}} = -RT \ln \left(\frac{\sum P_{\text{folded}}}{\sum P_{\text{unfolded}}} \right)$$

$$(1)$$

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dx.doi.org/10.1021/ct300240k | *J. Chem. Theory Comput.* XXXX, XXX, XXX–XXX

where R is the gas constant, T = 300 K is the absolute temperature, the numerator is the sum of probabilities of folded states, and the denominator is the sum of probabilities of the unfolded states. Probabilities for folded and unfolded states were obtained from the WHAM procedure.

The exact positions of folded and unfolded regions do not have a large effect on the relative free energies of folding. For the native region, the areas where end-to-end distances were smaller than 15 Å and larger than 19 Å had small probabilities so their contribution to the folded probability was negligible. Similarly, the area beyond 55 Å contributed little to the total probability of the unfolded state because the probabilities decrease rapidly in this region. The end point was determined by following the breaking of hydrogen bonds during the umbrella sampling simulations (Figure 3). There were three basepairs in the stem region and one (sheared) basepair in the loop. At the 55 Å window, all hydrogen bonds of the four basepairs had broken in all three hairpins and in all simulations. This point was chosen as the transition to unfolded state.

The free energy changes of folding are given in Table 1. The errors are calculated as the standard deviation of the three (or

Table 1. Free Energy Change between Native and Stretched RNA Hairpins Calculated Using the Umbrella Sampling Simulations in Units of kcal/mol[a]

	native	mutant1	mutant2
run 1	−20.5	−17.7	−15.0
run 2	−19.7	−17.8	−15.4
run 3	−20.6	−13.2	−16.3
run 4		−16.3	−12.5
average	−20.2 ± 0.5	−16.2 ± 2.1	−14.8 ± 1.6

[a]Three independent calculations were performed for native hairpin and four for mutant1 and mutant2. The reported error of the average values is the standard deviation over the independent calculations.

four for mutant hairpins) independent calculations. As can be seen from Table 1, ff99 was able to predict the correct order of stabilities of the three hairpins. The native hairpin has three GC basepairs: In mutant1 one of the GC pair is replaced by a weaker AU, and mutant2 has two of the GCs replaced by weaker AU pairs, therefore the native hairpin is more stable than mutant1 which in turn is more stable than mutant2.

Calculating the Free Energy of Unfolding Using the Nearest-Neighbor Parameters. The nearest-neighbor methodology was developed to predict the folding stability of nucleic acid secondary structure.[45,76,77] It is based on sets of empirical rules derived from optical melting experiments. Stability of the secondary structure elements depends on the sequence of the motif and the sequence of adjacent basepairs. The overall folding free energy change of a motif is a sum of contributions of all individual basepair increments. All the parameters have been gathered in a web-based resource for easy access.[50]

Nearest-neighbor parameters are accurate for predicting the stabilities of Watson−Crick helices, with the errors in the individual increments on the order of 0.1 kcal/mol.[45] The error in other structural elements, such as loops, is generally larger, at about 0.5 kcal/mol.[77] The loop region is common to all three hairpins so to avoid including the larger error terms in the calculation, the free energy change of melting of native hairpin,[59] and the nearest-neighbor rules for the free energy change of helices were used to calculate the free energy changes of melting the mutant hairpins stem loops. From the definition

of the nearest-neighbor model, free energy change of forming a hairpin at a temperature T is

$$
\Delta G_T^0(\text{stem} - \text{loop}) \\
= \Delta G_T^0(\text{Watson} - \text{Crick pairs}) + \Delta G_T^0(\text{loop}) \quad (2)
$$

so the free energy change of the loop region is independent of the nearest-neighbor free energy change of the stem region. The free energy changes of the mutant hairpins were calculated by subtracting the stem free energy change of the native hairpin from the experimentally determined free energy change and then adding the appropriate free energy changes for stem formations for mutant1 or mutant2.

The nearest-neighbor parameters were derived using 1 M NaCl, while the folding free energy change of the umbrella sampling calculations and the optical melting of the native hairpin were measured in 0.1 M NaCl. The salt correction for the free energy changes calculated using the nearest-neighbor parameters, however, is sequence independent.[77,78] Therefore, the salt correction cancels when using the thermodynamic cycle, and the nearest-neighbor parameters can be used directly.

Table 2 lists the free energy changes of folding for the three hairpins calculated using the nearest-neighbor rules. The errors were calculated using the errors values provided with the parameters in the nearest-neighbor database[50] and taking into account that the errors of enthalpy, entropy, and free energy are correlated (see Supporting Information).[44]

Comparison between Simulations and Nearest-Neighbor Model Free Energies. The denatured state of optical melting experiments is a random coil conformation, while the umbrella sampling simulations produce an extended conformation similar to the final product of single molecule pulling experiments. Therefore, the free energy changes calculated using the two methods cannot be directly compared without accounting for the different end states. The free energy changes determined by optical melting are an order of magnitude smaller than the free energy changes from umbrella sampling simulations. One reason for this difference comes from the work that would be required to stretch a random coil (melted RNA in the optical melting experiments) with its many different conformations into a linear form (final state of RNA in the umbrella sampling simulations, and single molecule pulling experiments), thus reducing the molecule's entropy. Replica exchange MD[79] would sample the same end states as the optical melting experiments but was not used here because of the difficulties of adequately sampling the random coil state. An approximation for the free energy of stretching can be obtained from the polymer theory of flexible chains, specifically from the worm-like chain (WLC) model.[80] This model is commonly used for comparing single molecule pulling experiments using optical tweezers to optical melting experiments.[49,81] According to the WLC model free energy of stretching can be approximated as[81,82]

$$
\Delta G_{\text{stretch}}(X) = RT\left(\frac{L}{P}\right)\left[\frac{3(X/L)^2 - 2(X/L)^3}{4(1 - (X/L))}\right] \quad (3)
$$

where R is the gas constant, T is temperature, L is the contour length of the polymer, X is the end-to-end distance, and P is the persistence length. Free energy of stretching is directly proportional to the contour length and inversely proportional to the persistence length.[49,81] Using 5.9 Å as a contour length per nucleotide, and P = 10 Å, values commonly used for single

stranded RNA molecules,[49,81] the predicted free energy change to stretch a 12 nucleotide hairpin to the end-to-end distance of 55 Å is 4.1 kcal/mol. This value is clearly much smaller than the difference between simulation and melting experiments, which are on the order of 10 kcal/mol (see Tables 1 and 2). So while the polymer theory can give a quantitative explanation of the processes involved, the predictive values are poor.

Table 2. Free Energy of Melting Native, Mutant1, And Mutant2 Hairpins Calculated Using the Combination of Free Energy Changes from Optical Melting Experiments and Nearest-Neighbor Parameters (from the NNDB)[a]

	native	mutant1	mutant2
ΔG_{NN} (kcal/mol)	-3.5 ± 0.2	-1.3 ± 0.3	0.8 ± 0.3

[a]Errors are calculated from the errors given with the parameters in NNDB and by taking into account that the changes in enthalpy and entropy are correlated.[45].

In order to make a meaningful comparison between the simulations and the optical melting, a thermodynamic cycle can be used. Figure 4 shows a thermodynamic cycle between two
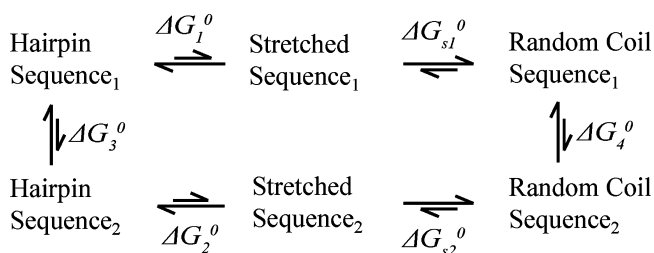
Figure 4. Thermodynamic cycle for transition between two hairpins. The difference in ΔG_1^0 and ΔG_2^0, determined by umbrella sampling, is equal to the difference between ΔG_3^0 and ΔG_4^0, which can be accurately predicted using nearest-neighbor parameters if the free energy changes required to stretch the hairpins from the random coil to an extended conformation (ΔG_{s1}^0 and ΔG_{s2}^0) are sequence independent, an approximation which is routinely made in single molecule stretching experiments.

hairpins. Separate umbrella sampling calculations were performed for each sequence yielding ΔG_1^0 and ΔG_2^0 . Then, by the nature of the thermodynamic cycle:

$$\Delta\Delta G^0 = \Delta G_3^0 - \Delta G_4^0 = \Delta G_1^0 + \Delta G_{s1}^0 - \Delta G_2^0 - \Delta G_{s2}^0 \tag{4}$$

where $\Delta\Delta G^0$ is the free energy difference in stability for a change in sequence. If the stretching free energy change between the stretched state and the random coil are identical, then the $\Delta\Delta G^0$ for the chemical transformation calculated by nearest-neighbor rules is the same as the differences calculated by MD:

$$\Delta\Delta G^0 = \Delta G_3^0 - \Delta G_4^0 = \Delta G_1^0 - \Delta G_2^0 \tag{5}$$

The approximation that stretching entropies are sequence independent is commonly used in single molecule stretching experiments.[49,81]

Similar thermodynamic cycle calculations were performed for all possible combinations, i.e., between native and mutant1, native and mutant2 hairpins, and mutant1 and mutant2 hairpins. In addition to removing the influence of stretching entropy, the thermodynamic cycle also reduces the effect of

approximations in the MD force field. For example, inaccuracies in the backbone torsional parameters, that may be prominent in the loop regions,[31,32] might cancel by taking the difference between two PMF calculations.

Table 3 shows the comparison of free energy changes when going from native to mutant1, native to mutant2, and mutant1

Table 3. Free Energy Change in kcal/mol for Transition from Mutant1 to Native, Mutant2 to Native, and Mutant2 to Mutant1 Hairpins Calculated Using a Thermodynamic Cycle

	mutant1 → native	mutant2 → native	mutant2 → mutant1
simulation	-4.0 ± 2.2	-5.5 ± 1.7	-1.5 ± 2.7
nearest-neighbor	-2.2 ± 0.2	-4.3 ± 0.2	-2.1 ± 0.2
difference	1.8	1.2	-0.6

to mutant2 hairpin obtained by applying the thermodynamic cycle on the free energies of folding of all three hairpins calculated using either umbrella sampling simulations or nearest-neighbor data. The differences between the simulation and the reference data were 1.8, 1.2, and −0.6 kcal/mol for the mutant1 to native, mutant2 to native, and mutant2 to mutant1 transitions, respectively. All three values were within error bounds of umbrella sampling results.

■ CONCLUSION

RNA was discovered to play many important roles in the biology, far beyond simply being the carrier of genetic information. Molecular dynamics can play an important role in examining its structure and dynamics, so it is important to assess the accuracy of various MD force fields that are commonly used. In this work, the ability of the Amber ff99 force field to predict relative free energies of RNA helix formation was examined. Three hexaloop hairpins, with differing closing helices, were used as our test systems. The native hairpin was a solution structure,[42] and two mutants were made by replacing the GC basepairs of the stem region of native hairpin with AU pairs. Multiple umbrella sampling simulations on all hairpins were performed to determine the change in free energy change as the hairpins were stretched from a native form to an elongated conformation. Stretching the hexaloop hairpin produces several distinct areas along the free energy change curve. First, there was a native conformation basin, and then a region where the hydrogen bonds in the stem are gradually broken. The third region was characterized by a sudden increase as the last hydrogen bonds in the stem were broken. In the fourth region the hydrogen bonds in the loop region were gradually broken. Finally, the fifth region is characterized by a steep increase of free energy slope due to the stretching of bonds and angles. These areas generally correspond to the areas observed in stretching the tetraloop hairpins,[23] although the transitions are not as pronounced due to the larger stiffness of the tetraloops.[50] In this work, the unfolded state was considered to be only those structures that do not have any of the hydrogen bonds found in the native structure. This facilitates the comparison of the folding free energy changes to optical melting experiments, where only the native and random coil states are considered.[83]

The Amber ff99 force field was able to predict the correct order of helix formation stabilities as shown in Tables 1 and 2. Absolute values were, however, different from the values determined from optical melting experiments and nearest-

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neighbor rules. This was a consequence of different end states in the two approaches. The end state in optical melting is a random coil, while umbrella sampling produces extended conformations. There was a large entropic cost to extend a random coil to a linear form. Polymer theory was used to try to estimate this effect, but the predictions are only qualitative, in part because the polymer model probably only works well once the strands are relatively long, such as those used as adapters in optical tweezer experiments.[49,81] The stretching entropy was not considered in prior unfolding studies of tetraloops.[23,24] Another reason for the discrepancy between the free energy calculated from umbrella sampling simulations and the sum of nearest-neighbor and stretching free energy could be the inaccuracy of the ff99 force field. Free simulations of the hairpins show a relatively large rmsd of the loop region. This can affect the accuracy of absolute free energies of folding calculated from umbrella sampling. All three hairpins, however, have the same loop region, and the inaccuracies in free energy coming from this region should cancel when relative free energies are calculated. This is indeed the case as can be seen from Table 3. There is also an advantage to performing molecular pulling computations; the required sampling time is significantly less than other methods, such as replica exchange, that require sampling of a random coil conformation.

The calculations were compared to experiments via a thermodynamic cycle (Table 3). With this approach, Amber's ff99 was able to predict relative free energies of RNA helix formation with accuracy within the error bounds of the simulations. This is the first demonstration that molecular mechanics can reproduce nearest-neighbor parameters. QM calculations[84,85] have been used to predict the stacking energies of different dinucleotide steps. Parameters for stacking interactions have also been extracted from the PDB database and shown to be of comparable accuracy to the thermodynamic derived parameters.[86]

The agreement with experiment is a testament to the Amber ff99 force field's[28,29] ability to accurately predict free energy difference of RNA helix formation. A few comments are in order regarding these results. The magnitude of errors of the free energy changes from the simulations for the mutant hairpins is much larger than the native hairpin error (see Table 1). This is a consequence of the larger flexibility of the mutant hairpins. The native hairpin has three GC basepairs in the stem region, mutant1 replaces the middle GC with the AU pair and mutant2 replaces both middle and first GC with an AU pairs. More flexible molecules can explore larger areas of conformational space during the sampling and therefore take longer to converge. This was addressed by running an additional umbrella sampling run for mutant1 and mutant2 hairpins, but it appears that to get higher precision, even more simulations were needed.

Recently the improvements to α/γ backbone torsions derived for DNAs[30] were shown to work for RNAs as well,[32,53] and also two new sets of glycosidic torsion[31,32] parameters have been derived. These new parameters, when replacing the respective ff99 parameters, showed an improved agreement with the experimental structures in long simulations.[31,32,53] This work was started before the publication of these findings, so the revised force fields were not included in these calculations. The total change to the force field ff99 was not large, however, and their apparent effect would be further reduced in our results due to the fact that relative free energy changes are determined. Still, based on the already published

tests of the new parameters, a better agreement might be expected in predicting the relative free energies of helix formation.

Despite these recent improvements, the Amber RNA force fields still have documented deficiencies, such as the inability to properly describe the structural characteristics of loop regions of hairpins[53] or to properly predict the free energy changes of conformational changes.[21] Therefore, it is important that this work shows agreement in free energy changes for helices. As shown here, Amber's ff99 can accurately predict the relative free energies of helix formation. This suggests that, by comparing the relative free energies, inaccuracies can cancel out and still produce accurate final results. This also suggests that the modeling of A-form helices by the Amber force field may be more accurate than the modeling of loop structures.

■ ASSOCIATED CONTENT

Ⓢ Supporting Information

The procedure describing calculation of the errors in the nearest-neighbor free energy calculations, figures of rmsd vs time for the free simulations of native and mutant hairpins, figures of rmsd vs time that show the stability of mutant conformations in individual windows of umbrella sampling simulations, and figures showing the convergence of umbrella sampling simulations. This information is available free of charge via the Internet at http://pubs.acs.org.

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Notes
The authors declare no competing financial interest.

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