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# Probing helical transitions in a DNA duplex<sup>†</sup>

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The complex conformational change from B-DNA to Z-DNA requires inversion of helix-handedness. Multiple degrees of freedom are intricately coupled during this transition, and formulating an appropriate reaction coordinate that captures the underlying complexity would be problematic. In this contribution, we adopt an alternative approach, based on the potential energy landscape perspective, to construct a kinetic transition network. Microscopic insight into the  $\mathbf{B} \to \mathbf{Z}$  transition is provided in terms of geometrically defined discrete paths consisting of local minima and the transition states that connect them. We find that the inversion of handedness can occur via two competing mechanisms, either involving stretched intermediates, or a B-Z junction, in agreement with previous predictions. The organisation of the free energy landscape further suggests that this process is likely to be slow under physiological conditions. Our results represent a key step towards decoding the more intriguing features of the  $B \rightarrow Z$  transition, such as the role of ionic strength and negative supercoiling in reshaping the landscape.

#### Introduction

Despite improvements in computer hardware over the last few decades, simulations of complex systems characterised by 'rare event' dynamics remain challenging. Examples include biomolecular folding, chemical reactions, isomerisation of clusters, and

phase transitions. <sup>1–5</sup> The specific challenges involved in studying

these pathways are intricately linked to the complexity of the un-

derlying potential energy surface. 6 Such processes are usually not

amenable to brute-force simulations. Hence, significant effort in

the chemical physics community has been directed towards the

development of enhanced sampling methods. To accelerate the

exploration of phase space, techniques such as parallel temper-

ing/replica exchange  $^{7-10}$  and Wang-Landau sampling  $^{11}$  exploit

multiple simulations at different temperatures or energies, respec-

tively. Umbrella sampling, 12,13 metadynamics 14,15 and steered

molecular dynamics, 16 among others, 17-20 rely on predefined

reaction coordinates or collective variables to sample regions as-

sociated with low probability, while schemes based on hyperdy-

namics <sup>21,22</sup> and accelerated molecular dynamics <sup>23,24</sup> deform the

In the present contribution, we treat 'rare event' dynamics using kinetic transition networks. <sup>36–38</sup> Research in this area has progressed along two complementary fronts. While several groups exploit explicit dynamics to build transition networks in the context of Markov State Models (MSM), <sup>37–39</sup> we have actively developed tools based on the potential energy landscape framework. <sup>6,36</sup> Our approach is based on a coarse-grained description of the un-

pling, 34,35 which generate reactive trajectories 27 between two

regions of phase space, do not require a reaction coordinate.

underlying potential energy surface to accelerate barrier crossing. The simulation techniques described above generally do not preserve kinetic information, and often invoke low-dimensional projections to describe a free energy surface. Kinetically separate regions can merge together in such projections, concealing the true dynamics. <sup>25,26</sup> Detailed analysis of an atomic cluster illustrates how even a relatively successful structural order parameter is unable to separate two alternative surface packings. <sup>26</sup> Alternative techniques, such as transition path sampling, <sup>27,28</sup> transition interface sampling, <sup>29,30</sup> milestoning <sup>31–33</sup> and forward flux sam-

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 $<sup>\</sup>dagger$  Electronic Supplementary Information (ESI) available: [Figure showing the diverse range of base-pairing interactions at the helix termini for the B-DNA ensemble, free energy disconnectivity graph coloured according to the number of native contacts, Plot of slide vs Zp for distinguishing between the B-DNA and A-DNA structures]. See DOI: 10.1039/b000000x/

derlying potential energy landscape in terms of stationary points (minima and transition states). The stationary points are located using geometry optimisation in a time-independent fashion, making the approach particularly attractive for landscapes featuring broken ergodicity. The connections between different regions of configuration space are defined geometrically in terms of discrete paths consisting of interconnected min-TS-min triples. <sup>40,41</sup> This key feature allows us to probe complex conformational transitions where multiple degrees of freedom are coupled, and defining a useful low-dimensional reaction coordinate may be problematic.

In the present application, we investigate the  $B\to Z$  transition in a DNA duplex, which involves an inversion of helix handedness. This conformational switch is one of the slowest transformations of contemporary interest in biology,  $^{42-44}$  involving large-scale correlated motions of the DNA helix. Formulating convenient reaction coordinates that would correctly capture the complexity of this helical transition is a formidable task. Characterising the corresponding pathways therefore provides an ideal testing ground for our computational energy landscape framework.

The possibility of a switch in helix-handedness in DNA was first raised when Pohl and Jovin 45 reported an inversion of the CD spectrum for a poly(GC) DNA construct at high salt concentration. Subsequently, Rich and coworkers characterised the crystal structure of Z-DNA. 46,47 This structure was quite unlike the canonical B-DNA form, exhibiting a zig-zag phosphate backbone with an alternating pattern of syn and anti glycosidic torsions. 43,46,47 In particular, sequences having an alternating purine-pyrimidine repeat were found to have a higher propensity to form the Z-DNA structure, 43,48,49 although exceptions to this pattern were later reported. 50-52 These initial results were considered rather perplexing, and were met with a mix of excitement and apprehension. 53,54 However, the revelation that Z-DNA can exist in vivo, 55,56 and is associated with key cellular functions, 43,53-58 has led to renewed interest in investigating the  $B \rightarrow Z$  transition. Recent studies also indicate that Z-DNA formation may be linked to certain types of cancer <sup>59</sup> and Alzheimer's disease. <sup>60–62</sup>

Although B-DNA is the favoured conformation at physiological conditions, transition to the Z-DNA form can be triggered by increasing the salt concentration,  $^{42,43,45,63}$  methylation,  $^{64-66}$  negative supercoiling,  $^{67-69}$  or binding to specific proteins.  $^{70,71}$  Certain polyamines,  $^{72-74}$  small molecules,  $^{75-77}$  and polynuclear complexes  $^{78,79}$  are also known to stabilise the Z-DNA conformation. Experiments have traditionally employed CD  $^{45,80-83}$  and NMR spectroscopy  $^{84-88}$  to study the B  $\rightarrow$  Z transition. Recent work employing FRET techniques  $^{89-91}$  has complemented these studies and provided new insight into the kinetics of the conformational transformation.

In addition to the wealth of experimental information, several models have been proposed for the  $B\to Z$  transition. The Harvey model  $^{92}$  suggested that the process is cooperative, and facili-

tated by rotation of the nucleobases, without the disruption of the Watson-Crick base-pairs and unwinding of the helix. In contrast, the Wang model 46 suggested that base-pair opening was necessary before the rotation of the nucleobases could take place. However, as there was no provision for helix unwinding during the reversal of handedness, these models posed a steric dilemma known as the 'chain sense paradox'. 44 The Saenger-Heinemann model 93 attempted to address this shortcoming by suggesting the presence of A-DNA type intermediates along the transition path. More recently, Lim and Feng 94,95 proposed a stretched intermediate model as a plausible solution to the 'chain sense paradox'. Another hypothesis known as the zipper model 96,97 was suggested to explain the reversal of handedness. This model is based on thermodynamic considerations  $^{44,96,97}$  and proposes that the B  $\rightarrow$  Z transition takes place via the systematic propagation of a B-Z junction. The recent discovery of a crystal structure 98 for the B-Z junction lends additional support to this viewpoint. Alternative ideas for the  $B \rightarrow Z$ transition exist, and some of them are variations of the models described above. For a detailed comparison of the different models, including their strengths and their shortcomings we refer readers to the review by Pérez and coworkers. 44

Following early work 99–101 on the energetics of the helical transformation, various computational studies have aimed to capture the essential features of the different transition models, and rationalise various aspects of the experimental data. The salt dependent thermodynamics of the  $B \rightarrow Z$  transformation was explained by Hirata and Levy 102 using 3DRISM theory, and in later years by Montoro and Abascal 103-105 employing different models of DNA. In addition, a recent study exploited thermodynamic integration to provide an accurate estimate of the salt concentration at which B-DNA and Z-DNA can coexist. 106 The inversion of the CD spectrum at high salt concentrations, which is a key signature of handedness switching, was investigated using quantum mechanical calculations by Miyahara and coworkers. 107,108 Interestingly, the authors suggest that the reversal of sign is caused by the stacking interactions in the Z-DNA conformation, rather than the syn orientations of the purine nucleobases. Detailed comparison of the contrasting viewpoints for handedness switching have generally come from statistical mechanical models, <sup>109,110</sup> and studies employing stochastic difference equations. 94,111

The complex nature of the B  $\rightarrow$  Z transition, <sup>42–44</sup> coupled with the slow kinetics, <sup>82,90,91</sup> makes it very difficult to obtain microscopic insight using unbiased simulations. Hence, several studies have employed reaction coordinate based approaches to map out putative transition pathways. <sup>95,112–114</sup> While initial studies <sup>95,112</sup> employing targeted molecular dynamics simulations argue in favour of a stretched intermediate model, subsequent work <sup>113</sup> suggests that a pathway involving B-Z junctions may be more favourable. In recent work, Sagui and coworkers <sup>114</sup> also indicate the possibility of two competing mechanisms based on adaptively

biased simulations. These studies reveal key details regarding the likely mechanisms for the conformational transition, however, the use of predefined reaction coordinates imposes fundamental limitations. In the present work we provide atomistic insight into the  $B\to Z$  transition from an energy landscape perspective. Our study illustrates how a large-scale conformational change in DNA can be treated without using any predefined reaction coordinate.

We find that the underlying energy landscape consists of two principal funnels leading to the B-DNA and Z-DNA conformations. The inversion of handedness takes place via two competing pathways, either involving stretched intermediates or a B-Z junction, in agreement with some of the previous studies. <sup>94,95,113,114</sup> However, our results reveal some additional complexity, which is unlikely to be captured by projection-based approaches.

# **Computational Methodology**

### Preparation of starting structures

Here we consider a DNA hexamer duplex with the sequence  $(CGCGCG)_2$ . The initial coordinates for Z-DNA were taken from a previously published high resolution crystal structure (PDB code: 3P4J). <sup>115</sup> The initial structure of B-DNA was constructed using the nucleic acid builder (NAB) module available within the AMBER code. <sup>116</sup> The DNA duplex was modelled using a properly symmetrised version of the AMBER99bsc0 force-field, <sup>117</sup> employing the latest  $\varepsilon$  and  $\zeta$  torsional corrections. <sup>118</sup> Symmetrisation is essential to ensure that accessible permutational isomers have the same energy. <sup>119</sup> For exploration of the energy landscape, solvent effects were treated implicitly using a generalised Born model. <sup>120,121</sup> An effective salt concentration of 1.0 M was maintained using the Debye-Hückel approximation. <sup>122</sup>

#### **Molecular Dynamics simulations**

The initial structures of B-DNA and Z-DNA were solvated in a truncated octahedral box of TIP3P water molecules, with a solvent buffer of at least 10 Å on each side. The net charge in the simulation box was neutralised by adding an appropriate number of Na<sup>+</sup> counterions. Extra Na<sup>+</sup> and Cl<sup>-</sup> ions were added to maintain a salt concentration of approximately 1M. The ion parameters appropriate for the TIP3P water model, as proposed by Joung and Cheatham, <sup>123</sup> were used. The electrostatic energy was computed using the particle mesh Ewald summation technique, <sup>124</sup> using the standard settings in the AMBER code. <sup>116</sup> In all the simulations, a 10 Å cutoff for the non-bonded interactions was employed. An integration time-step of 2 fs was used in conjunction with SHAKE constraints <sup>125</sup> for all the bonds involving hydrogen atoms. The simulations were carried out using the GPU enabled version of the AMBER12 code. <sup>116</sup>

The solvated systems were first minimised to remove steric clashes. After minimisation, the temperature of the system was raised from 0 to 298 K with 25 ps of NVT dynamics. During this

time, 50 kcal/mol positional restraints were applied on the DNA molecule. The restraints were relaxed through five subsequent cycles of NVT simulations, each of length 25 ps. During this phase, temperature control was maintained via a Langevin thermostat <sup>126</sup> employing a collision frequency of  $0.2 \, \mathrm{ps}^{-1}$ . After heating dynamics and progressive relaxation, the density of the system was equilibrated using 2 ns of NPT simulations, at a constant pressure of 1 bar and temperature of 298 K. Following equilibration, production runs of duration 200 ns were carried out in the NPT ensemble.

The various structural parameters for DNA were calculated using the 3DNA  $^{127}$  software.

# Construction of kinetic transition networks using discrete path sampling

The energy landscape of the DNA duplex was explored using the discrete path sampling (DPS) technique. <sup>40,41</sup> DPS exploits geometry optimisation to provide a coarse-grained description of the thermodynamics and kinetics in terms of databases of stationary points (minima and transition states). It has previously been used to study a diverse range of atomic and molecular systems, <sup>128–131</sup> and has proved to be particularly efficient for landscapes featuring broken ergodicity. <sup>36,40,41,132</sup> In contrast to conventional Monte Carlo and molecular dynamics simulations, DPS is largely unaffected by kinetic bottlenecks and can probe 'rare events' over a hierarchy of time scales. As the formalism has been discussed in earlier work, <sup>40,41</sup> only the key steps are presented in this section.

The connectivity between stationary points on the potential energy surface (PES) is described in terms of discrete paths. <sup>6,40,41</sup> A discrete path between two endpoints of interest consists of a sequence of minima connected by intervening transition states. The endpoints are denoted as reactant and product, respectively. Here, we use a geometric criterion to identify minima and transition states. <sup>133</sup> For each stationary point, the normal mode frequencies are obtained from the eigenvalues of the mass-weighted Hessian matrix. <sup>6</sup> A local minimum on the PES is defined as a stationary point for which all the nonzero normal mode frequencies are positive, whereas a transition state has a single imaginary frequency. <sup>6,133</sup> Displacements parallel and antiparallel to the corresponding eigenvector are used to define steepest-descent paths that lead to the adjoining minima. <sup>6</sup>

The OPTIM code <sup>134</sup> interfaced with the AMBER9 package <sup>135</sup> was used for all the geometry optimisations, transition state searches, and normal mode analysis. Local minimisations were carried out using a modified version of the LBFGS algorithm described by Liu and Nocedal. <sup>136</sup> The doubly-nudged <sup>137</sup> elastic band <sup>138–140</sup> (DNEB) method was used to locate candidate structures for intervening transition states between pairs of local minima. The transition state candidates were further refined using hybrid eigenvector-following. <sup>141</sup> Geometry optimisations were

deemed to have converged when the root-mean-square-gradient fell below  $10^{-6}\,\mathrm{kcal/mol}\,\mathring{\mathrm{A}}^{-1}$ . A large number of intervening minima and transition states can be located after each cycle, especially if the reactant and product states are far apart in configuration space. As a result, the number of possible connections between local minima that might be tried to generate a fully connected discrete path increases with each connection cycle. To circumvent a combinatorial problem, the missing connection algorithm  $^{142,143}$  was used to construct a priority list of connection attempts based on appropriate edge weights.

After an initial discrete path was identified between different endpoints of interest, the databases were further expanded using various refinement schemes available within the PATHSAM-PLE <sup>144</sup> program to locate pathways characterised by lower energy barriers <sup>145</sup> (SHORTCUT BARRIER) and shorter path lengths <sup>145</sup> (SHORTCUT). During the refinement step we exploited some recently introduced interpolation techniques based on natural internal coordinates <sup>146</sup> and quasi-continuous schemes, <sup>147</sup> which exploit the connectivity of the covalently bonded network. Our previous experience <sup>146,147</sup> suggests that these methods are very effective in circumventing common problems associated with linear interpolations, such as unphysical chain crossings and steric clashes in the intervening images.

Extensive sampling of specific discrete paths can introduce artificial frustration (kinetic traps) into the stationary point databases. This frustration is caused by undersampling, and needs to be removed to make the stationary point databases more faithful representatives of the global kinetics. Here, we used the UNTRAP scheme <sup>145</sup> available within the PATHSAMPLE code to remove artificial traps from the databases. Candidate minima for 'untrapping' are chosen based on the ratio of the potential energy barrier to the potential energy difference from the product region. Connections were attempted between the selected minima and the product minimum to find lower barriers and better paths. The final stationary point databases were obtained after sequential refinements using the SHORTCUT BARRIER, SHORTCUT and UNTRAP schemes.

The stationary point databases constitute a kinetic transition network, which can be used to analyse the global thermodynamics and kinetics. The rate constant  $k_{\rm BA}^{\rm SS}$  for the  $A\to B$  conformational transition can be expressed as an infinite sum over all discrete paths, when the intervening minima are treated in steady-state and the dynamics between adjacent minima are assumed to be Markovian. ^40,41 The sum over discrete paths is weighted by the occupation probability of the reactant minimum, as well as the relevant branching probabilities. ^40,41 The transitions between the DNA conformational states were visualised in terms of pathways ('fastest paths') that make the largest contribution to the steady-state rate constants. These pathways were extracted from the stationary point databases using Dijkstra's shortest path algorithm <sup>142</sup> with appropriate edge weights. <sup>128</sup> In addition, the possibility of

competing pathways was considered, and we used the recursive enumeration algorithm <sup>148,149</sup> to obtain the set of discrete paths that contribute significantly to the overall rate constant.

#### **Estimation of Free Energies**

Free energies at 298 K were estimated from the stationary point databases using the harmonic superposition approximation (HSA). <sup>150</sup> Within the HSA framework, the canonical partition function is written as a sum of contributions from the catchment basin of each local minimum. <sup>151,152</sup> The vibrational density of states is estimated from the normal mode frequencies, assuming that the potential well around each minimum is harmonic. <sup>128,129,150</sup> A self-consistent regrouping scheme <sup>129,153</sup> was used to lump together minima which are separated by free energy barriers below a specified threshold into one macrostate. As a result, the reactant and product states are expanded into ensembles of structures in local equilibrium, and any bias arising due to the original choice of endpoints is alleviated.

#### **Visualisation of Energy Landscapes**

Disconnectivity graphs were used to provide a visual representation of the free energy landscape.  $^{25,154-157}$  A disconnectivity graph segregates the energy landscapes into disjoint sets of minima, known as superbasins.  $^{154}$  Minima within each superbasin are mutually accessible via transition states lying below a chosen energy threshold, whereas interbasin transitions must overcome higher potential or free energy barriers. Unlike low-dimensional projections of the energy landscape, which may merge basins separated by high barriers and lead to artificially smooth surfaces,  $^{26}$  disconnectivity graphs capture the underlying complexity and retain the kinetic information.  $^{25,157}$ 

# **Results and Discussion**

## The B-DNA and Z-DNA ensembles

Molecular dynamics simulations were first carried out at 298 K to assess the thermodynamic stability of the B-DNA and Z-DNA structures. The key results are summarised in Figure 1. Overall, the trajectories were stable and no major structural distortions were observed. For B-DNA, occasional fraying of the terminal base-pairs was noticeable. This dynamical feature is consistent with previous MD simulations  $^{158-161}$  and experiments.  $^{162,163}$  The terminal cytosines (C1 and C7) have a greater propensity to undergo fraying compared to their guanine partners (G12 and G6). Occasionally, the C1 and C7 nucleobases undergo  $anti \rightarrow syn$  flips about the glycosidic torsion angle ( $\chi$ ) after fraying out of the helix. In contrast, no  $\chi$  torsional flips were observed for the terminal guanines, G12 and G6. At around 97 ns, the C1 nucleobase undergoes a  $\chi$  torsional flip after fraying, and subsequently enters the helix to establish a trans Watson-Crick/sugar edge (tWS) base-pair with the

G12 nucleobase. The base-pair remains stable for the rest of the trajectory, and does not revert back to the canonical Watson-Crick (WC) orientation. The G6-C7 base-pair adopts a tWS geometry after approximately 170 ns, following the anti  $\rightarrow$  syn flip of C7. Similar base-pairing geometries have also been characterised for RNA structures by Westhof and coworkers. <sup>164</sup> In addition to the two internucleotide hydrogen-bonds, an intranucleotide hydrogen bond formed between the O5' and O2 atoms of the cytosines lends stability to the tWS base-pair. The strength of the tWS base-pairing interaction and the corresponding lifetimes may be overestimated due to imbalances in the current force-field. <sup>158,159</sup> Using a reparametrised version, <sup>161,165</sup> Orozco and coworkers have recently shown that the tWS base-pairs are usually short-lived and undergo reversible transitions to the canonical WC orientation. In contrast to B-DNA, no base-pair fraying was observed for Z-DNA within the time scale of our MD simulations.

The distribution of  $\chi$  torsions in Figure 1(a) indicates that the guanine nucleobases in B-DNA exclusively sample *anti* orientations along the trajectory. In contrast, a minor peak appears in the *syn* region for cytosines owing to the occasional  $anti \rightarrow syn$  flips of the terminal bases (C1 and C7). Unlike B-DNA, the  $\chi$  torsions in Z-DNA exhibit an alternating pattern, with the guanines adopting *syn* orientations and cytosines adopting *anti* orientations along the length of the DNA chain. <sup>43,46,47</sup> This structural feature is correctly reproduced in our simulations, and is reflected in the distribution shown in Figure 1(b).

The higher B factors indicate that B-DNA is intrinsically more flexible than Z-DNA, in agreement with previous studies. 166-168 The enhanced mobility of terminal base-pairs in B-DNA results in prominent peaks in the B factor plot. The global structural parameters that are useful in distinguishing the prominent DNA conformations are well documented in the literature. 169,170 For brevity, we will only discuss the observed trends for a few key parameters, namely helical twist  $(\Omega)$ , slide  $(D_v)$  and twist  $(\omega)$ . Among the base-pair step parameters, slide describes the translational motion of a base-pair relative to its neighbour along the direction of the DNA strand, while twist describes the rotation of base-pairs relative to one another. 127,169 As expected, B-DNA is associated with a positive helical twist, and along the trajectory the corresponding values range from  $27^{\circ}$  to  $43^{\circ}$ . The average helical twist (35°) is in good agreement with values previously reported by the Ascona B-DNA Consortium. 171,172 For Z-DNA, the helical twist is estimated to be  $-36^{\circ}$ , and the corresponding distribution spans the range from  $-45^{\circ}$  to  $-26^{\circ}$ . The distributions of slide and twist are unimodal for B-DNA. In contrast, due to the zigzag nature of the Z-DNA backbone, the CG and GC base-pair steps exhibit different values of slide and twist respectively, resulting in bimodal distributions.

To generate initial samples of minima from the B-DNA and Z-DNA ensembles, configurations from the MD trajectories were

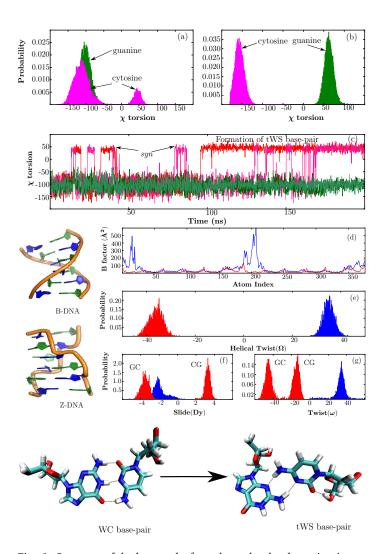


Fig. 1: Summary of the key results from the molecular dynamics simulations. (a) and (b) show the distributions of  $\chi$  torsions in B-DNA and Z-DNA, respectively. Evolution of the  $\chi$  torsions along the MD trajectory for B-DNA is shown in (c). The red and magenta lines correspond to the C1 and C7 nucleobases, respectively, while the green lines correspond to the G12 and G6 nucleobases. The estimated B factors for B-DNA (blue) and Z-DNA (red) are shown in (d). (e),(f) and (g) show the distributions of helical twist, slide and twist, respectively. The colouring scheme is the same as in (d).

saved every 10 ps and subsequently locally minimised using an implicit solvent model, after removing the ions and the water molecules. A 10 ps interval seems to be a reasonable choice: shorter values ( $\sim$  1 ps) result in many snapshots that quench to the same minimum, and if the window is too long ( $\sim$  100 ps) then some of the low-lying minima are skipped.

For B-DNA, the lowest potential energy minimum exhibits tWS base-pairing interactions at both the helix terminals. Several low-lying conformations were also located in which the terminal base-pairs adopt the canonical WC orientation. The lowest energy structure from this ensemble is destabilised by approximately 6 kcal/mol with respect to the putative B-DNA global minimum. In contrast to the B-DNA ensemble, the lowest potential energy minimum for Z-DNA exhibits WC base-pairing throughout the length of the helix.

Construction of stationary point databases (kinetic transition networks) using the discrete path sampling framework requires an appropriate choice of endpoints, which are assigned as reactant and product states. The lowest energy minimum identified for Z-DNA was selected as the sole initial representative of the product state. For the initial reactant state, we included the lowest energy B-DNA structure as well as the lowest energy duplex having all the base-pairs in the WC orientation.

After initial discrete paths were characterised between the different endpoints, the rest of the minima from the B-DNA and Z-DNA ensembles identified from the MD simulations were added to the kinetic transition network. This process involved connection making attempts between the lowest energy B-DNA/Z-DNA minimum and the rest of the minima in the corresponding ensembles in a pairwise fashion. The network was further expanded using the schemes outlined in the Computational Methodology section. The refinement process was continued until the 'fastest paths' between the different endpoints and the corresponding phenomenological rate constants converged with respect to the addition of new stationary points. At this point the transition network contained 43934 minima and 48309 transition states.

In subsequent sections, we discuss the organisation of the underlying free energy landscape and provide mechanistic insight into the pathways between the various DNA conformations.

## Free Energy Landscape

The free energy landscape computed at 298 K is depicted in the form of a disconnectivity graph in Figure 2. The graph was generated by recursively regrouping minima separated by free energy barriers less than 5 kcal/mol in a self-consistent fashion.  $^{129,153}$  This regrouping threshold seems appropriate as qualitatively similar graphs were produced for a range of values around this selection. , and from the

The B-DNA and Z-DNA conformations are separated by high free energy barriers, and are located at the bottom of the two principal funnels. In addition, a diverse range of DNA conformations appear in different regions of the landscape. Some representative snapshots from the key structural ensembles are shown superimposed on the disconnectivity graph (Figure 2). The branches of the graph are coloured according to a geometrical order parameter recently introduced by Sagui and coworkers to describe the 'handedness' (H) of DNA helices 114 and polyproline peptides. 173 For right-handed helical turns H > 0, whereas H < 0 for left-handed turns. The overall helix handedness is expressed as a sum over all the helical turns along the DNA sequence. 114,173 This particular order parameter leads to a segregation of the different regions of the free energy landscape, especially the two major funnels leading to the B-DNA and Z-DNA conformations. However, some minor intermixing of colours is observed in the higher energy regions of the graph, indicating that geometrically defined parameters alone are not sufficient to capture the full complexity of the underlying landscape. 174

The free energy global minimum corresponds to an ensemble of B-DNA conformations. The constituent duplexes are similar in terms of helicity, but exhibit a diverse range of orientations for the terminal base-pairs (supplementary information, Figure 1). Structures having either one or both the terminal base-pairs hydrogen-bonded in a tWS fashion are the most prominent members of the ensemble. In addition, we also identified structures in which one of the terminal bases (primarily the cytosines) were frayed out, or stacked on top of the base-pairing partner. The emergence of these non-canonical configurations for the current force-field is consistent with our initial MD simulations and previous work. 158,159 In some of the structures one of the terminal base-pairs adopted a WC orientation, but there were no duplexes in the ensemble that retained WC interactions at both the termini. Canonical B-DNA structures in which all the base-pairs have WC hydrogen-bonds constitute the second-lowest free energy group. Only one structure from this group has the C1 nucleobase frayed out of the helix. Interestingly, at a regrouping threshold of 6 kcal/mol the two conformational ensembles described above merge into a single free energy minimum, implying that the different B-DNA structures would interconvert on a time scale 153 of about  $3.8 \times 10^{-9}$  s.

In contrast to B-DNA, the lowest free energy Z-DNA ensemble is structurally homogeneous and exhibits only minor variations in some of the internal degrees of freedom. To quantify the contrasting flexibilities of the B-DNA and Z-DNA conformations, the log product of the normal-mode frequencies ( $\Lambda$ ) for minima comprising the corresponding free energy ensembles was computed. Flexible structures would be associated with lower  $\Lambda$  values, as vibrational entropy is proportional to  $-\Lambda$  within the harmonic approximation. As shown in Figure 3, the  $\Lambda$  values corresponding to Z-DNA conformations are distributed over a narrow range and are higher than most B-DNA structures, suggesting that B-DNA is

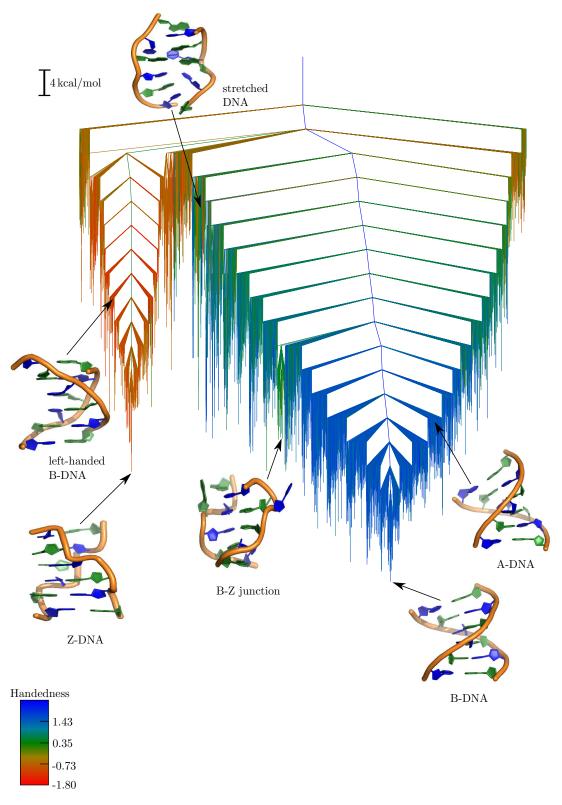


Fig. 2: Free energy landscape computed at 298 K using a regrouping threshold  $^{129,153}$  of 5 kcal/mol. The branches are coloured according to the handedness (H) of the DNA structure, with positive values representing right-handed conformations and negative values representing left-handed conformations. Some representative structures from the different conformational ensembles are also shown.

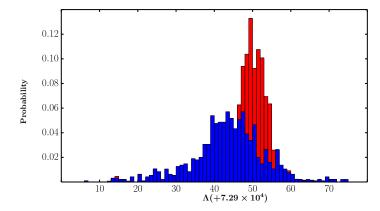


Fig. 3: Distribution of  $\Lambda$  values for minima constituting the free energy groups corresponding to the B-DNA (blue) and Z-DNA (red) conformations.

indeed more flexible than Z-DNA. The harmonic approximation does not account for well anharmonicity. <sup>6,150</sup> Nonetheless, the trend in flexibilities is correctly captured, in line with the B factors estimated from the MD simulations.

We were also able to identify A-DNA type structures in the lowlying regions of the disconnectivity graph, close to the B-DNA funnel, and separated by relatively low energy barriers. Although these two duplex conformations have similar values of handedness (H), it was possible to distinguish them in terms of the base-pair step parameters, slide and Z<sub>p</sub> (supplementary information, Figure 2). <sup>175–177</sup> As noted in earlier work, <sup>176,177</sup> A-DNA conformations typically have slide less than  $-0.8\,\text{Å}$  and  $Z_p$  greater than 1.5. The ribose sugars in A-DNA adopt a C3'- endo conformation, in contrast to B-DNA, where the sugars typically adopt a C2'- endo conformation. 169,176 Interestingly, there are no deep subfunnels corresponding to A-DNA conformations. The organisation of the landscape further suggests that the  $A \rightarrow B$  transformation is likely to be a downhill process. Our observation is consistent with previous simulations and experiments, 177-182 which predict that isolated A-DNA structures are relatively destabilised under physiological conditions, and undergo spontaneous conversion to the B-DNA form. In fact, experiments show that A-DNA is likely to be favoured over B-DNA in solutions having high salt concentration or low water content, <sup>183–185</sup> upon incorporation of specific nucleotides into the DNA sequence, 186,187 or binding to specific proteins. 188,189

In the intermediate energy section of the disconnectivity graph, there is a prominent subfunnel corresponding to ensembles of B-Z junctions. In these structures, the first two base-pairs adopt a Z-DNA like conformation, and the last three base-pairs adopt a B-DNA like conformation, resulting in a net handedness (H) of around 0.35. The G3 and C10 nucleobases, positioned at the boundary between the B and Z regions, are flipped out of the helix, while the rest of the nucleobases engage in WC base-pairing

interactions. These structural features are consistent with the X-ray structure of a B-Z junction reported by Ha  $\it et.al.$   $^{98}$  Interestingly, recent work  $^{190}$  suggests that base extrusion may not be limited to B-Z junctions alone, but may be a generic feature of any junction involving Z-DNA. Several studies  $^{98,113,114}$  postulate that B-Z junctions are likely to be key intermediates along the  $B \to Z$  transformation pathway.

Ensembles corresponding to stretched DNA structures are located in the high energy regions of the landscape, and have relatively low equilibrium occupation probabilities at 298 K. In these structures, the DNA helix strands are unwound significantly, resulting in large end-to-end distances between the strand terminals and a handedness (H) value close to zero. It is worth noting that despite some similarities, the stretched DNA structures that we observe are different from the putative S-DNA state that forms during overstretching. The general consensus is that S-DNA exhibits a ladder-like structure, and has WC base pairs throughout the length of the duplex. 191,192 In contrast, the nucleobases in the stretched DNA structures do not retain any of the canonical base pairs, although a variable number of stacking interactions are present. This structural feature is clearly evident when the disconnectivity graph is coloured according to the number of native contacts (supplementary information, Figure 3). Several existing models 94,95 suggest that the emergence of such stretched DNA structures is a natural requirement for resolving the 'chain sense' paradox associated with the B  $\rightarrow$  Z transition. <sup>44</sup>

Within the Z-DNA funnel, there are ensembles of left-handed structures that do not exhibit the characteristic zig-zag pattern in the phosphate backbone. The chain topology resembles that of a canonical B-DNA duplex, with a narrower minor groove and a wider major groove. Unlike Z-DNA, both the guanine and cytosine nucleobases adopt *anti* orientations about the  $\chi$  torsion angle. In addition, the GC and CG steps in these left-handed structures are associated with similar values of helical twist, in contrast to Z-DNA, where the corresponding distribution is bimodal. Although the possibility of left-handed B-DNA structures was discussed in the context of the RL model by Sasisekharan and coworkers in the late 1970s,  $^{193-195}$  to the best of our knowledge, no computational study has investigated their structural and dynamical properties at the all-atom level.

# **Mechanisms for Conformational Transformations**

Mechanistic insight into the conformational transformations between various DNA structures is obtained in terms of the pathways that make the largest contributions to the phenomenological rate constant. As outlined in the Methods section, these pathways were extracted from the stationary point databases (kinetic transition network) using Dijkstra's shortest path algorithm <sup>128,142</sup> and recursive enumeration, <sup>148,149</sup> with appropriate edge weights. <sup>40,41</sup>

#### Transformation from B-DNA to Z-DNA

There are two distinct mechanisms for the  $B \rightarrow Z$  conformational transformation (Figure 4), involving either the formation of stretched DNA structures (pathway P1) or a BZ-junction (pathway P2). The mechanisms are easily distinguished in terms of key structural order parameters (Figure 5). The evolution of the radius of gyration (Rg) indicates that the helix unwinds significantly along pathway P1, with concomitant loss of nearly all the WC base-pairing interactions. The helix strands subsequently rewind to form the Z-DNA structure. The change in  $R_{\rm g}$  is smaller for pathway P2, with most of the intermediates being relatively compact, compared to the structures observed along pathway P1, and retaining some of the WC base-pairing interactions. The order in which the different guanine bases undergo ant  $i \rightarrow syn$  flips about the  $\chi$  torsion angle also reveals some contrasting features. Along pathway P1, the central guanines flip from the anti to the syn conformation before the guanines near the helix termini. In contrast, for pathway P2, the flipping of the terminal guanines precedes that of the central guanines. The cytosines largely maintain their anti conformation along pathway P2, but often undergo anti  $\rightarrow$  syn transitions along pathway P1.

Some of the generic features associated with pathways P1 and P2 are similar to the stretch-collapse and zipper mechanisms, respectively, recently predicted by Sagui and coworkers. 114 However, there are key differences. The stretched DNA structures observed along pathway P1 are structurally distinct from the S-DNA type intermediates (discussed in the preceding section) predicted for the stretch-collapse mechanism. In this respect, the mechanism corresponding to pathway P1 seems to be in better agreement with some of the earlier models for  $B \rightarrow Z$  transition. 94,95 Moreover, the order in which the guanines undergo  $anti \rightarrow syn$  torsional flips along pathway P2 is more complex than the trend predicted for the zipper mechanism. The observed discrepancy may be attributed to the inherent differences in the interpretation of the free energy surface and the pathways. In our framework, the transformation mechanisms are defined geometrically in terms of interconnected steepest-descent paths in the kinetic transition network. In contrast, Sagui and coworkers 114 employ adaptively biased sampling to construct a two-dimensional free energy surface. It is possible that some of the additional complexities associated with the  $B \rightarrow Z$  pathways are not fully retained in the low-dimensional representation.

Although pathways P1 and P2 have nearly identical path lengths, P2 is associated with a lower enthalpic cost. Hence, at low temperatures, pathway P2 is likely to be the favoured route for the B  $\rightarrow$  Z transformation. However, at high temperatures, stretched DNA structures would also have substantial thermal population, and therefore, pathway P1 is likely to compete with P2.

The organisation of the different conformational ensembles on the underlying landscape suggests that the  $B \to Z$  transformation

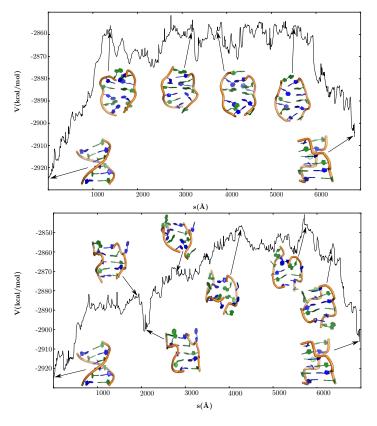


Fig. 4: Total potential energy (V) as a function of the integrated path length (s) for the  $B \to Z$  pathways that make the largest contributions to the rate constant. Some representative structures encountered at different stages of the transformation are also shown. Top panel: Pathway P1, via stretched DNA structures. Bottom panel: Pathway P2, involving a B-Z junction intermediate.

may also take place via the left-handed B-DNA state. However, in our network, these pathways do not make significant contributions to the global kinetics.

#### Transformation from A-DNA to B-DNA

As shown in Figure 6, the transformation from A-DNA to B-DNA proceeds in a downhill fashion, in agreement with previous studies of the  $A \rightarrow B$  conformational change using unrestrained molecular dynamics simulations. <sup>178,182</sup> Along the pathway, there is a gradual change in the minor groove width (mGW) and the Zp parameter (Figure 7). These global changes in the DNA helix are coupled to the repuckering of the ribose sugars, which correspond to the small barriers encountered along the pathway. The mechanistic features seem compatible with the Calladine-Drew model for the  $A \rightarrow B$  transition. <sup>196</sup>

The different puckering states can be distinguished in terms of the pseudorotation angle (P) and amplitude. For the C3'endo conformation, the pseudorotation angle falls in the range  $0^{\circ}$ -36°, whereas it is around 144°-180° for the C2′- endo conformation. 127,197,198 As evident from Figure 7(c), not all the ribose sugars undergo the complete transition from C3'- endo to the C2'endo puckering state. At the end of the structural transformation, the ribose sugars in the terminal guanines adopt a C1'– exo conformation, whereas in the terminal cytosines the sugars adopt the O4'- endo puckering state. Although previous work 177,179 indicates that the sugars in purines and pyrimidines repucker in a specific order, we do not find any clear pattern along the pathway. Instead, we identify four different stages during which several

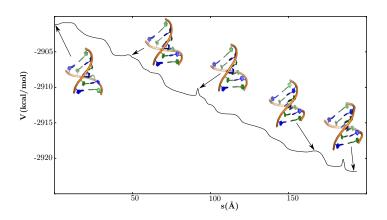


Fig. 6: Total potential energy (V) as a function of the integrated path length (s) for the A  $\rightarrow$  B pathway. Some representative structures encountered at different stages of the transformation are also shown.

purine and pyrimidine sugars repucker at the same time (Figure 7(c)). Interestingly, all the nucleobases (except those at the termini) in a particular strand undergo the C3'- endo  $\rightarrow$  C2'- endo transition before the repuckering process starts in the complementary strand. After each stage, approximately half of the nucleotides in a strand switch to the C2′-endo puckering state. The emergence of such composite structures during the  $A \rightarrow B$  transformation is consistent with a crystallographic map predicted by Ho and coworkers. 199

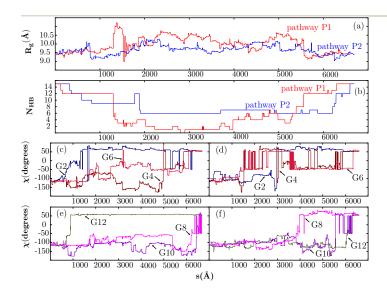


Fig. 5: (a) Evolution of the radius of gyration (R<sub>g</sub>) along the different pathways (P1 and P2) for the  $B \rightarrow Z$  transformation. (b) Evolution of the number of native contacts  $N_{HB}$ . (c),(e) Variation of the  $\chi$  torsion angles for the different nucleobases along pathway P2. (d),(f) Variation of the  $\chi$ torsion angles along pathway P1.

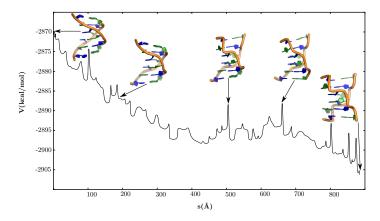


Fig. 8: Total potential energy (V) as a function of the integrated path length (s) for the transformation from left-handed B-DNA to Z-DNA. Some representative structures encountered at different stages of the transformation are also shown.

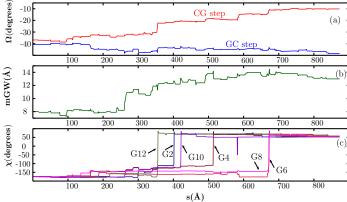


Fig. 9: (a) and (b) illustrate the evolution of helical twists ( $\Omega$ ) for the GC and CG steps, and the minor groove width (mGW) respectively, for the pathway from left-handed B-DNA to Z-DNA. (c) shows the variations in the  $\chi$  torsions of the different guanine nucleobases.

#### Transformation from left-handed B-DNA to Z-DNA

The transition from left-handed B-DNA to Z-DNA involves a switch in the chain topology of the duplex (Figure 8). The conformational change is essentially driven by synchronised local motions in the DNA duplex, and does not require large global deformations. During the transformation, the guanine nucleobases undergo  $anti \rightarrow syn$  flips about the  $\chi$  torsion angle in a precise order (Figure 9). The base-flipping transition is initiated at the G12 nucleobase, and propagates through the rest of the helix in a zigzag fashion. These  $anti \rightarrow syn$  flips are associated with barriers in the range of 6-7 kcal/mol, and introduce kinetic bottlenecks in an otherwise downhill pathway. The magnitude of the average helical twist for the CG base-pair steps decreases gradually (Figure

9), and by the end of the transition it fluctuates around values typical of the Z-DNA conformation. Although the variations are less perceptible in the case of GC steps, there is a net increase in the magnitude of the helical twist during the conformational transition. Besides changes in helical twist and  $\chi$  torsional flips, there is also a concurrent increase in the minor groove width of the duplex.

# Conclusion

In the present work, we have provided atomistic insight into the inversion of helix-handedness in transitions from B-DNA to Z-DNA conformations. This particular conformational switch is a particularly large-scale transformation, <sup>42–44</sup> and has been a dif-

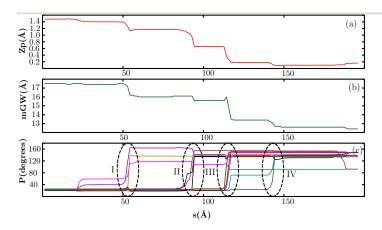


Fig. 7: (a) and (b) denote the evolution of the Zp, and minor groove width (mGW), respectively, along the  $A \rightarrow B$  pathway. (c) Profile of pseudorotation angles (P) along the pathway denoting the repuckering of the ribose sugars. The four different stages of repuckering are also marked. Stage I: G4,C5 and G6; Stage II: C1,G2 and C3; Stage III: C7,G8,C9,and G10; Stage IV: C11 and G12.

ficult target for conventional simulation techniques. In contrast to previous efforts, we probe the  $B \to Z$  transition from an energy landscape perspective, without using predefined reaction coordinates. The free energy landscape exhibits two distinct funnels leading to the B-DNA and Z-DNA conformations. In addition, we have identified A-DNA structures close to the B-DNA funnel, and left-handed B-DNA structures within the Z-DNA funnel.

The inversion of handedness can occur via two competing pathways, involving either stretched DNA structures, or a B-Z junction. The generic features of the competing mechanisms are in good agreement with previous models of the  $B \rightarrow Z$  transition. The topography of the landscape also indicates a clear separation of time scales. The B  $\rightarrow$  Z transition is rather slow under physiological conditions. In contrast, the relaxation within the two major funnels is predicted to be orders of magnitude faster. As a result, the A-DNA and left-handed B-DNA conformations spontaneously convert to the B-DNA and Z-DNA forms, respectively, in a largely downhill and cooperative fashion. This emergent property of the landscape is consistent with previous experiments and computational studies.

We have mapped out the free energy landscape at a modest salt concentration, where B-DNA is still the dominant conformation at equilibrium. We anticipate that the landscape will be substantially different at high salt concentrations, or in the presence of multivalent ions, although the key mechanistic features of the transition pathways are likely to be preserved. Recent work 200 suggests that the Hofmeister effect is likely play an important role in stabilising the Z-DNA form under such in vitro conditions.

Besides ionic strength, an external force or torque could provide the means to exercise dynamic control over helix handedness. 91,201-204 In the future, it would be interesting to investigate these intriguing aspects of the  $B \rightarrow Z$  transition in terms of how the energy landscapes evolve as a function of tunable parameters. 174

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