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## ARTICLE IN PRES

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## Computational analysis suggests a highly bendable, fragile structure for nucleosomal DNA

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### 1. Introduction

Eukaryotic chromosomal DNA is packaged into nucleosomes and then into chromatin, which has a repetitive, compact structure. A nucleosome comprises about 147 base pairs (bps) coiled around a histone octamer, which consists of two copies of four core histones (H2A, H2B, H3, and H4) (Luger et al., 1997; Davey and Richmond, 2002). Neighboring nucleosomes are separated by linker regions of DNA (approximately 50 bps) without histones (Van Holde, 1989).

Previous studies have shown that nucleosomes have various functions besides the packaging of chromosomal DNA. For example, many cellular processes that involve DNA respond dramatically to changes in the positions of and modifications of nucleosomes, and in the nucleus, the dynamics of the positioning of nucleosomes and their flanking regions play a key role in cellular processes (Strahl and Allis, 2000; Yuan et al., 2005; Segal et al., 2006; Barski et al., 2007; Schones et al., 2008; Lister et al., 2009; Tolstorukov et al., 2009). For instance, nucleosome positioning regulates eukaryotic transcription by affecting the accessibility of transcription factors to DNA or by affecting transcriptional elongation by polymerase (Yuan et al., 2005; Schones et al., 2008; Cairns, 2009).

The efficiency of the coiling of DNA around histones to form nucleosomes depends strongly on DNA sequence (Yuan et al., 2005; Ogawa et al., 2010). In vitro studies have shown that the range of

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ABSTRACT

Eukaryotic chromosomal DNA coils around histones to form nucleosomes. Although histone affinity for DNA 19 depends on DNA sequence patterns, how nucleosome positioning is determined by them remains unknown. 20 Here, we show relationships between nucleosome positioning and two structural characteristics of DNA 21 conferred by DNA sequence. Analysis of bendability and hydroxyl radical cleavage intensity of nucleosomal 22 DNA sequences indicated that nucleosomal DNA is bendable and fragile and that nucleosome positional 23 stability was correlated with characteristics of DNA. This result explains how histone positioning is partially 24 determined by nucleosomal DNA structure, illuminating the optimization of chromosomal DNA packaging 25 that controls cellular dynamics.

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affinities between histones and DNA is at least 1000-fold and that 54 DNA sequence pattern is an important factor for accurate nucleosome 55 positioning (Thastrom et al., 1999). Furthermore, the results of several 56 other studies suggest that the DNA coiled around the histones is 57 bendable, and these studies have shed light on the importance of DNA 58 structure for nucleosome positioning (Drew and Travers, 1985; 59 Balasubramanian et al., 1998; Johnson et al., 2006; Miele and Vaillant, 60 2008; Rohs et al., 2009). However, no detailed, systematic analysis of 61 the bendability of coiled DNA has been performed, and whether DNA 62 bendability is chromatin wide is not clear.

Along with the progress in computational methods for analyzing 64 nucleosome data (Zhang et al., 2008; Tolstorukov et al., 2009), recent 65 remarkable progress in chromatin immunoprecipitation (ChIP) 66 techniques, including ChIP-chip (ChIP combined with microarray 67 technology) and ChIP-Seq (ChIP combined with deep sequencing), 68 has permitted detection and prediction of nucleosome positioning at 69 the whole-genome level (Yuan et al., 2005; Barski et al., 2007; Park, 70 2009). The increase in the number of large-scale nucleosome data sets 71 has permitted systematic analysis of nucleosome data in conjunction 72 with other "omic" data (e.g., genome-wide relationships between 73 nucleosome positioning and transcription regulation (Schones et al., 74 2008; Lister et al., 2009)).

In this study, we used a computational analysis of a large-scale 76 nucleosomal data set to evaluate two overall characteristics of 77 chromosomal DNA structure: DNA bendability and DNA cleavage 78 intensity. DNA bendability is calculated from parameters for a set of 79 trinucleotide patterns (Brukner et al., 1995) or tetranucleotide 80 patterns (Packer et al., 2000) in a given sequence. The parameters 81 for each trinucleotide pattern were obtained by Brukner et al. (1995) 82

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using DNA binding proteins which generally bind to DNA that bends toward the major groove. The parameters were derived from 709 DNA binding regions. Bendability is frequently used to analyze DNA structure. For example, the location of transcription initiation promoters is associated with areas of bendable DNA (Abeel et al., 2008; Akan and Deloukas, 2008; Choi and Kim, 2009).

Cleavage intensity indicates the likelihood of DNA cleavage by hydroxyl radicals and provides a map of local variation in the shape of the DNA backbone. Cleavage intensity is calculated from parameters for a set of tetranucleotide patterns in a given sequence. The parameters were derived by Greenbaum et al. (2007) from experiments in which DNA sequences were exposed to hydroxyl radicals; they analyzed how cleavage of DNA sequences depends on their sequence patterns. Cleavage intensity also reflects the solvent-accessible surface area of DNA. This index of DNA fragility has also been used to characterize structural features of DNA (Tullius and Greenbaum, 2005; Greenbaum et al., 2007).

These two structural parameters cover all combinations of trinucleotide or tetranucleotide patterns and are sufficiently reliable to analyze DNA structure (Brukner et al., 1995; Greenbaum et al., 2007). We conducted genome-wide computational analysis of the DNA bendability and cleavage intensity of nucleosome and linker DNA regions and found that nucleosomal DNA was overall highly bendable and fragile. We also determined whether the positional stability of nucleosomes under various cellular conditions depended on these two structural properties of DNA, and we found that stable nucleosomal DNA was more bendable and cleavable than unstable nucleosomal DNA. We discuss which types of DNA structure confer the optimal DNA packaging in chromosomes and which types are optional for dynamic cellular processes.

### 2. Materials and methods

### 2.1. Genomic DNA and nucleosome positioning data

The reference genome sequence of Homo sapiens (hg18) was obtained from the University of California at Santa Cruz genome database (http://genome.ucsc.edu/). To determine genomic histone positions, we used the previously reported ChIP-Seq data set for histone H3 of human CD4+ T-cells obtained under two cellular conditions, with and without the T-cell receptor signal, which are designated as the activated and resting conditions, respectively (Schones et al., 2008). We modified a previously developed method (Tolstorukov et al., 2009) to define nucleosomal positions from the ChIP-Seq of both resting and activated cells (for details of the method, see Supplementary methods). We assessed the positional stability of nucleosomes under the two cellular conditions by computing the distance of the genomic position of a given nucleosome in the resting cell from its nearest nucleosomal position in the activated cell. For all the nucleosomes identified under the resting conditions, we defined stable nucleosomes as those for which the distance between the nucleosome under resting conditions and the nearest nucleosome under activated conditions was within 12 bps, and unstable nucleosomes as those for which that distance ranged from 13 to 73 bps (half the size of one nucleosomal DNA unit). Nucleosomes that did not fit either definition were not used for the positional stability analysis. The boundary between the two types of nucleosomes (i.e., the 12-13-bp boundary) was defined from the inflection point in the distance distribution (Supplementary methods).

### 2.2. DNA bendability calculation

To assess nucleosomal DNA bendability, we used the trinucleotide bendability parameter profile obtained by Brukner et al. (1995). For each of the nucleosomes identified under the resting conditions

(including both stable and unstable nucleosomes), DNA bendability 144 was calculated for every trinucleotide in the region from -400 to 145+400 bps from the center position of the nucleosomal DNA region. 146 For each position relative to the central position of the nucleosome, 147 the average DNA bendability was calculated.

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### 2.3. DNA cleavage intensity calculation

We used the OH radical cleavage intensity database (ORChID; 150 http://dna.bu.edu/orchid/) program, which is used to estimate the 151 hydroxyl radical cleavage strength and solvent-accessible surface area 152 using a tetranucleotide DNA cleavage intensity profile (Greenbaum 153 et al., 2007), to calculate the DNA cleavage intensity. (The source 154 code of ORChID was kindly provided by its authors; ORChID is a 155 web-based application.) For each of all the nucleosomes identified 156 under the resting conditions, we computed tetranucleotide DNA 157 cleavage intensities for all the DNA positions from -400 to 158 +400 bps from the center position by querying to ORChID. For 159 each position relative to the central position of the nucleosome, the 160 average DNA cleavage intensity was calculated.

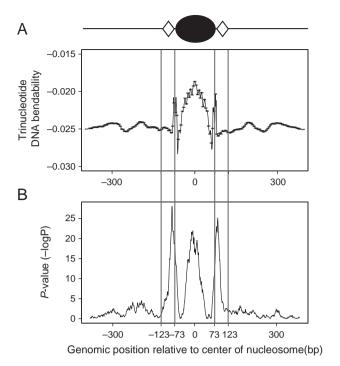
### 2.4. Guanine\_cytosine content and statistical analysis

For a control analysis with respect to guanine-cytosine (GC) 163 content, we randomly sampled 10000 out of the ~5000000 164 nucleosomes identified under the resting conditions as a positive 165 reference set (PRS) to reduce the calculation time. For each 166 nucleosome in the PRS, sliding window averages of DNA bend- 167 ability, cleavage intensity, and GC content for the region surround- 168 ing the nucleosome (from -400 to +400 bps) were calculated 169 using a 30-bp window with 1-bp displacement. To prepare a 170 random reference set (RRS), we randomly selected 1000000 171 genomic positions and used their surrounding sequences (from 172 +400 to +400 bps) to calculate DNA bendability, cleavage 173 intensity, and GC content using a 30-bp sliding window average. 174 Additionally, the DNA bendability and cleavage intensity expected 175 from each GC content value were calculated from the above data, 176 and we set them as RRS with GC content. Then, we randomly 177 correlated the sliding window for each of the 10000 nucleosomes in 178 the PRS with the sliding windows of the RRS having the same GC 179 content, so that the DNA bendabilities and cleavage intensities of 180 the same relative sliding window positions could be compared with 181 the DNA bendabilities and cleavage intensities expected from the 182 GC content and the genomic context. For each sliding window 183 position relative to the center of the nucleosomal region, differences 184 in DNA bendability and cleavage intensity between the PRS and the 185 RRS were evaluated by t-test.

### **3. Results** 187

### 3.1. Bendability of nucleosomal DNA

To investigate the structural properties of nucleosomal DNA, we 189 first analyzed the bendability of the DNA sequences surrounding the 190 nucleosomal region. Using all the nucleosomal positions of human 191 CD4+ T-cells identified under the resting conditions, we calculated 192 average DNA bendabilities of the genomic positions relative to the 193 central position of the nucleosome (from -400 to +400 bps) 194 (Fig. 1A). Bendability scores within the nucleosomal region were 195 significantly higher than those within the linker regions ( $P < 10^{-15}$ ; 196 t-test). Moreover, the bendabilities in the nucleosomal region 197 gradually increased toward the central position of the nucleosome, 198 which is consistent with the symmetric structure of the histone protein 199 (Luger et al., 1997). The bendability distribution showed a  $\sim 10$ -bp 200 periodic fluctuation within the nucleosomal DNA region. Even more 201 striking, DNA bendabilities at the boundaries between the nucleosomal 202



**Fig. 1.** Bendability of nucleosomal DNA and the surrounding regions. (A) Trinucleotide DNA bendability versus genomic position relative to the central position of the nucleosome. The black oval denotes the nucleosome region (from -73 to +73 bps), and the white diamonds denote linker regions (from -123 to -74 bps and from +74 to +123 bps). The polygonal line and the error bars represent average trinucleotide bendabilities and standard deviations (s.d.) (Note that s.d. values are shown only for every 5th bp, to improve viewability.) (B) Statistical significance (P-values) of differences in DNA bendability between PRS and RRS as determined by t-test (see Materials and methods). The polygonal line represents P-values for each genomic position.

regions and linker regions on both sides of the nucleosome were quite high, which implies that the unbending boundary regions also played an important structural role in nucleosome positioning.

Previous work has suggested that DNA bendability is affected by GC content (Peckham et al., 2007), and several machine learning approaches have shown that nucleosome positioning is associated with DNA sequence pattern (Peckham et al., 2007; Ogawa et al., 2010). Therefore, we performed a control analysis of GC content to determine whether the high bendability of the nucleosomal DNA was a consequence of high GC content that is possibly correlated with the nucleosomal DNA sequence context. For each position relative to the central position of the nucleosome, DNA bendabilities were compared with those expected from the RRS (see Materials and methods). P-value peaks ( $P < 10^{-20}$ ; t-test) were observed at three positions: the central position of the nucleosome and at both boundaries between the nucleosome and the linker regions (Fig. 1B). In contrast, the other regions did not show statistical significance for DNA bendability even within nucleosomal region, meaning that the DNA bendabilities of these regions could be expected from GC content alone. The central position of nucleosomal DNA and the nucleosome-linker junction were suggested to have high bendabilities that could not be explained by GC content alone.

### 3.2. Fragility of nucleosomal DNA

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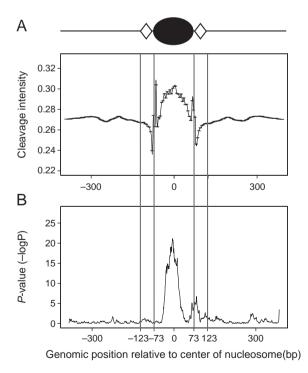
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We next computed DNA cleavage intensity, which is an estimate of hydroxyl radical cleavage strength and the solvent-accessible area, for the DNA sequence surrounding the nucleosome using ORChID. Like the DNA bendability pattern, the DNA cleavage intensity pattern for the nucleosomal DNA region was symmetrical. The cleavage intensity

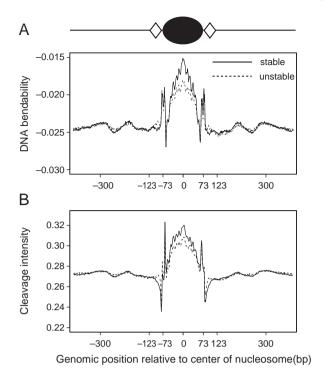
in the nucleosomal region was higher than that of the linker regions 232 on both sides  $(P<10_{\perp}^{-15};\ t$ -test), and a ~10-bp periodic fluctuation of 233 DNA cleavage intensity was also observed, especially in the nucleosomal 235 somal DNA region (Fig. 2A). The cleavage intensity of the nucleosomal 235 region was statistically higher than the intensities of the RRS expected 236 from the GC content, especially at the central position of the 237 nucleosome (Fig. 2B). Moreover, interestingly, the cleavage intensities 238 in the regions immediately inside the nucleosome\_linker junctions 239 were markedly higher than average, whereas the intensities in the 240 regions immediately outside the junctions were markedly lower than 241 average (that is, the distribution dropped sharply from the inside to 242 the outside of the nucleosome region). However, the difference from 243 the RRS was statistically significant only for the downstream junction 244  $(P<10_1^{-5})$ .

# 3.3. Structural features of nucleosomal DNA and positional stability of 246 the nucleosome

If nucleosomal DNA structure determines nucleosome position- 248 ing, the positional stability of the nucleosome should correlate with 249 structural characteristics of nucleosomal DNA. To determine 250 whether this correlation was in operation, we compared nucleo- 251 some positions obtained from the resting state of CD4+ T-cells with 252 the positions obtained from the activated state, and we then defined 253 stable and unstable nucleosomes (see Materials and methods). For 254 each group of stable and unstable nucleosomes, we analyzed DNA 255 bendability and cleavage intensities of the region surrounding the 256 nucleosome (from -400 to +400 bps) and found that the overall 257 nucleosomal DNA bendability and the overall cleavage intensity of 258 stable nucleosomes were markedly higher than those of unstable 259 nucleosomes (Fig. 3).



**Fig. 2.** Cleavage intensity of nucleosomal DNA and the surrounding regions. (A) DNA cleavage intensity. The black oval denotes the nucleosome region (from -73 to +73 bps), and the white diamonds denote linker regions (from -123 to -74 bps and from +74 to +123 bps). The polygonal line and the error bars represent average DNA cleavage intensity and s.d. (Note that s.d. values are shown only for every 5th bp, to improve viewability.) (B) Statistical significance (P-values) of differences in cleavage intensity between PRS and RRS as determined by t-test (see Materials and methods). The polygonal line represents P-values for each genomic position.



**Fig. 3.** Structural characteristics of DNA around stable and unstable nucleosomes. (A) DNA bendability and (B) DNA cleavage intensity. The black oval denotes the nucleosome region (from -73 to +73 bps), and the white diamonds denote linker regions (from -123 to -74 bps and from +74 to +123 bps).

#### 4. Discussion

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In this study, we computationally analyzed two structural features of the DNA sequences around nucleosomes and found several significant differences between nucleosomal and linker DNA regions. The sequence around the nucleosome overall had a higher DNA bendability score and a higher DNA cleavage intensity score than did the linker regions. These observations were true overall, but not every local region of DNA showed exactly the same tendencies. However, we found many local regions that did show such tendencies (an example is presented in Supplementary Figure 2). We note that our preliminary results indicated that these structural features of DNA sequences associated with nucleosomal and linker regions were also found in *Arabidopsis thaliana* (Supplementary Figure 3), which implies that these structural features may be conserved in other species.

Previous studies have reported the existence of specific DNA sequence patterns in the nucleosomal DNA region (Segal et al., 2006; Peckham et al., 2007; Ogawa et al., 2010). For instance, a previous support vector machine-based learning approach was used to derive short DNA fragments that frequently appear in the nucleosomal region (Ogawa et al., 2010). However, the correlation between these short DNA fragments and nucleosome formation and DNA bendability scores is far from perfect. Although the trinucleotides CCA/TGG and CAG/CTG have been reported to have the highest nucleosomeformation potentials (Peckham et al., 2007; Ogawa et al., 2010), the bendability scores of CCA/TGG and CAG/CTG, -0.246 and 0.175, respectively, are lower and higher, respectively, than the average bendability score of -0.019. ATA/TAT, TAA/TTA, and AAA/TTT have been suggested as having the potential to inhibit nucleosome formation (neither of the papers offered any reasons for this low frequency) (Peckham et al., 2007; Ogawa et al., 2010), but their bendability scores (0.182, 0.068, and -0.274, respectively) are higher, higher, and lower, respectively, than the average. Furthermore, although a previous study suggested that DNA bendability is strongly correlated with GC content (Peckham et al., 2007), we showed that bendable DNA structures around the center positions of 295 nucleosomes and in the regions around the nucleosome\_Llinker 296 junctions cannot be explained by GC content alone. Accordingly, the 297 high bendability score of the nucleosomal DNA region is not merely a 298 consequence of coincidence between DNA bendability parameters 299 and previously known sequence features of nucleosomal DNA, and 300 this fact supports the plausibility that nucleosomal DNA is bendable. 301

We also found that high DNA cleavage intensity scores, especially 302 at the central positions of the nucleosomes, were independent of GC 303 content. We also calculated average DNA cleavage intensities of 304 tetranucleotides containing CCA/TGG and CAG/CTG trinucleotides. 305 Although CCA/TGG and CAG/CTG were the two sequence fragments 306 with the highest potentials to form nucleosomes (Ogawa et al., 2010) 307 (as mentioned previously), the average DNA cleavage intensities of 308 tetranucleotides containing CCA/TGG and CAG/CTG were 0.37 and 309 0.55, respectively, that is, the same as and higher than the average 310 tetranucleotide cleavage intensity (0.37). This result implies that, like 311 DNA bendability, the high DNA cleavage intensity score of the 312 nucleosomal DNA region is not due completely to the known 313 sequence features enriched within the nucleosomal DNA region.

A recent study has suggested a relationship between the bend- 315 abilities and cleavage intensities of DNA sequences: these features 316 commonly exist within positions of the minor groove of the DNA 317 structure (Heddi et al., 2009). Our results indicate a similarity 318 between the distribution patterns of DNA bendability and cleavage 319 intensity with respect to genomic position relative to the central 320 position of the nucleosome, and both distributions have ~10-bp 321 periodic fluctuation, which is consistent with length of one pitch of 322 the double-stranded DNA structure (i.e., the periodicity of the minor 323 groove positions that face the histone). To determine whether the 324 similar distribution patterns were independent from or tightly 325 associated with each other, we compared trinucleotide bendability 326 scores and DNA cleavage intensity scores of tetranucleotides. For each 327 of the trinucleotides having DNA bendability scores, we calculated the 328 average DNA cleavage intensity of all tetranucleotides containing the 329 corresponding trinucleotide in the nucleosomal DNA region. We 330 found that the Pearson's correlation coefficient between the trinucle- 331 otide bendability scores and their corresponding average tetranucleo- 332 tide cleavage intensity scores was 0.26, which suggests no direct 333 relationship between bendability and cleavage intensity.

Taken together, our results suggest that the high bendability scores 335 of the nucleosomal DNA region computed in this study and the 336 symmetric bendability pattern around the nucleosomes reflect the fact 337 that, regularly repeated, bendable DNA regions have evolved so that 338 chromosomal DNA can sinuously coil around histones and form the 339 compact chromatin structure. Moreover, the high cleavage intensity of 340 the nucleosomal region suggests that histones confer durability to 341 nucleosomal DNA against hydroxyl radicals and that this DNA region 342 has not needed to gain the durability evolutionarily. Abrupt changes in 343 DNA bendability and cleavage intensity were found at the nucleo- 344 some-linker junctions. In particular, the DNA bendability of the 345 junction region significantly exceeded that expected from the GC 346 content, which suggests that the DNA at nucleosome-linker junctions 347 plays an important structural role in the stability of nucleosome 348 positioning. The overall trends in DNA bendability and cleavage 349 intensity for the stable nucleosomes were more remarkable than those 350 for the unstable nucleosomes; this result supports our speculations 351 about the biological functions of bendability and cleavage intensity. 352 Gene expression is thought to be controlled by nucleosomal 353 positioning and stability (Cairns, 2009). The relationship between 354 the positional stability of nucleosomes and DNA structural preferences 355 also suggests that nucleosomal DNA sequences are encoded to control 356 gene expression. Although known DNA sequence features that are 357 suggested to facilitate high-efficiency formation of nucleosomes and 358 DNA sequences conferring DNA bendability and cleavage intensity 359 must not be independent from each other, we believe that our results 360

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shed light on how nucleosome positioning's control of cellular dynamics (e.g., gene expression pattern (Schones et al., 2008; Cairns, 2009)) is regulated by DNA structural preferences.

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### Appendix A. Supplementary data

Supplementary data to this article can be found online at doi:10.1016/j.gene.2011.02.004.

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