



# Demultiplexing information written along DNA molecules

Helmut Schiessel

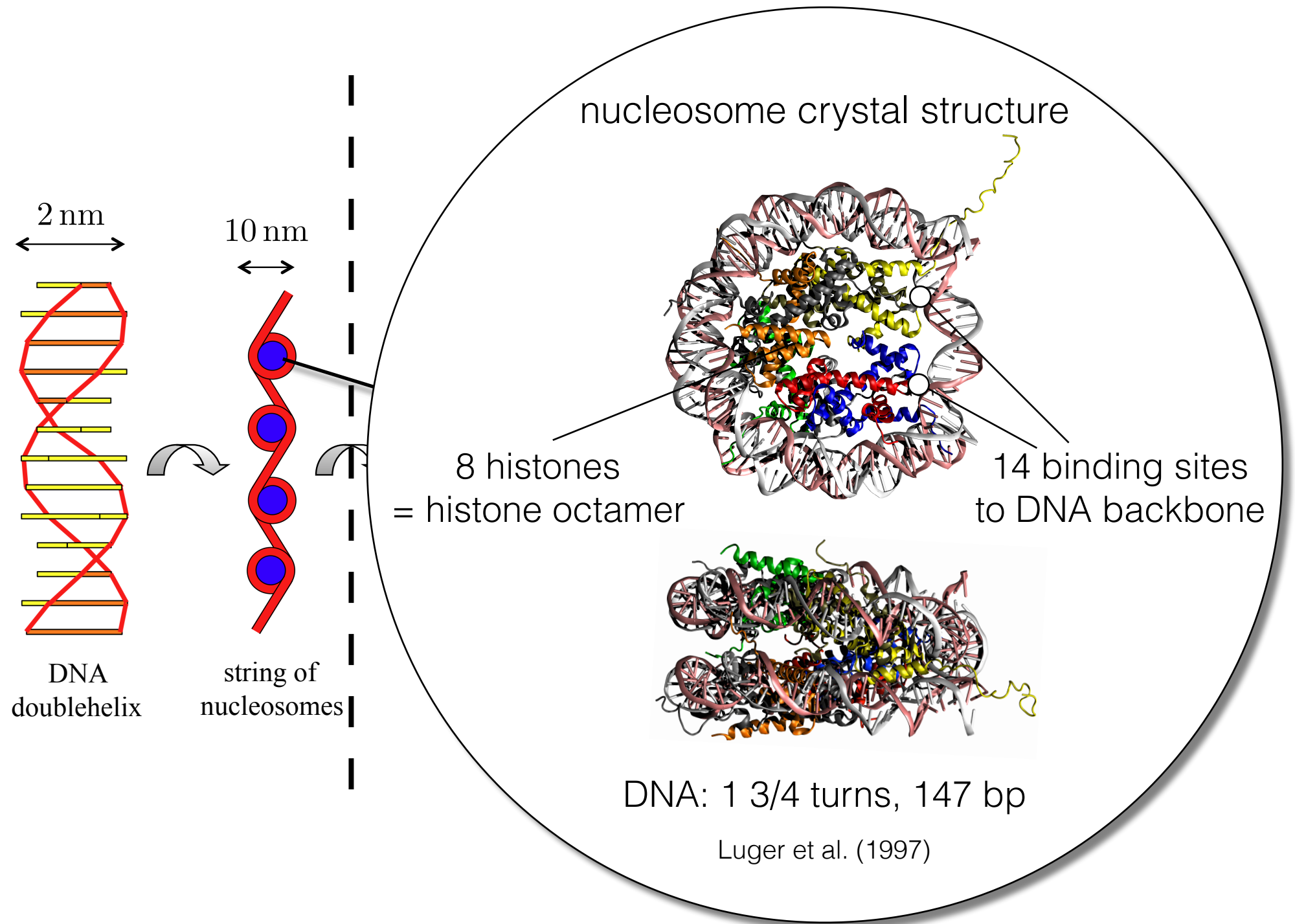
Lorentz Institute  
Leiden University  
The Netherlands







# Chromatin



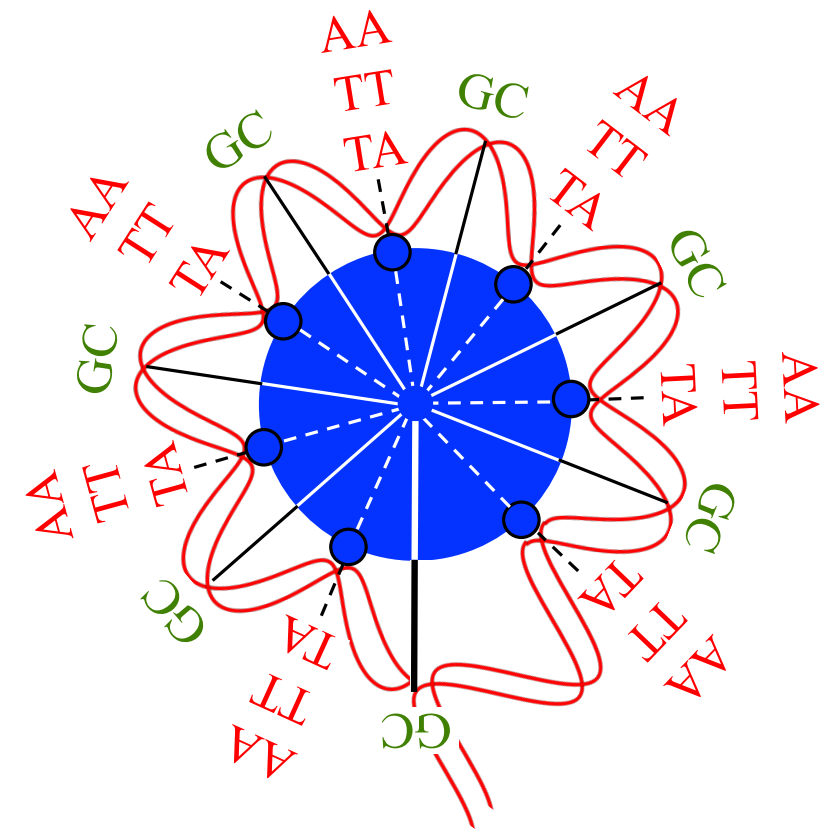
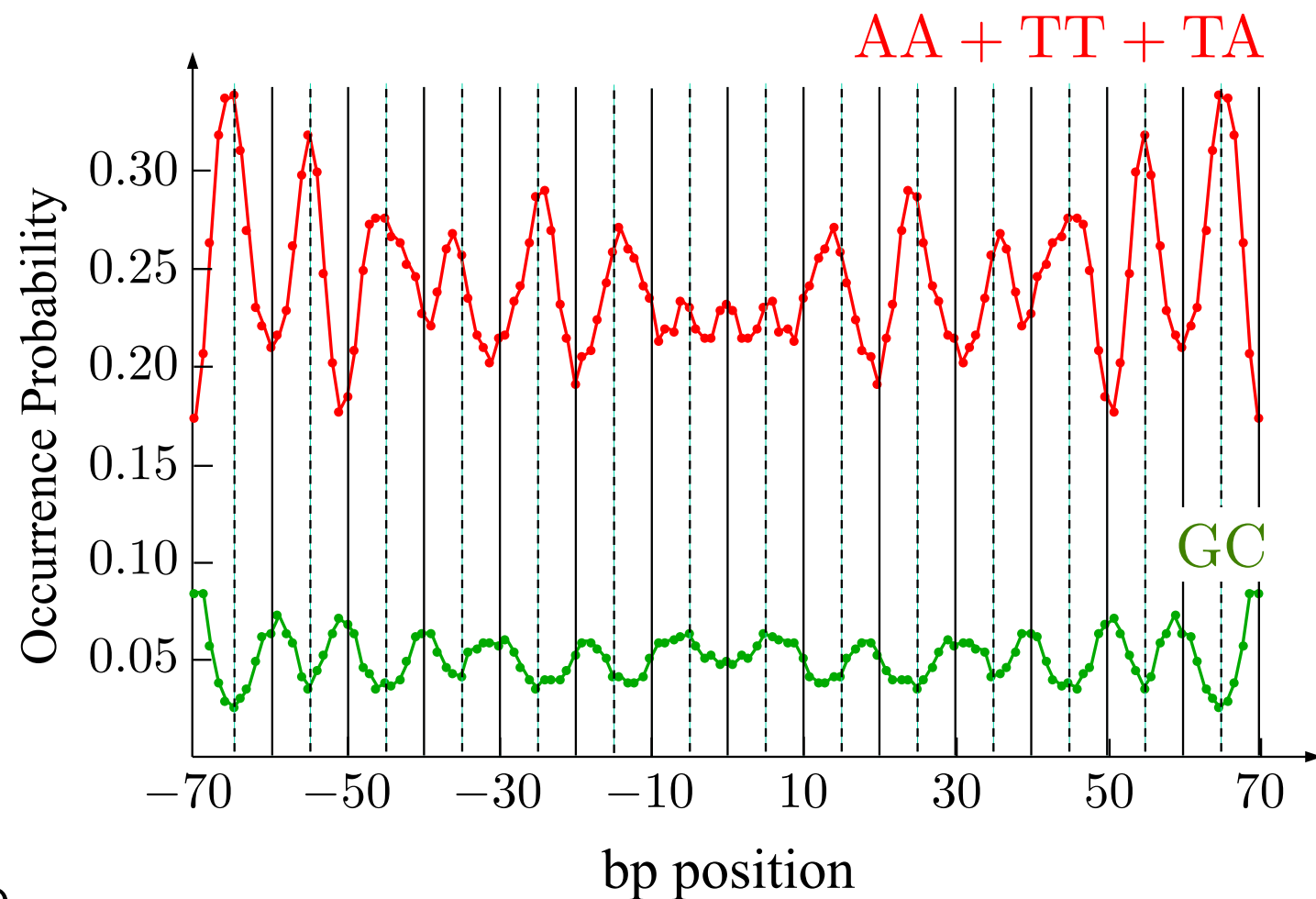
## ARTICLES

# A genomic code for nucleosome positioning

Eran Segal<sup>1</sup>, Yvonne Fondufe-Mittendorf<sup>2</sup>, Lingyi Chen<sup>2</sup>, AnnChristine Thåström<sup>2</sup>, Yair Field<sup>1</sup>, Irene K. Moore<sup>2</sup>, Ji-Ping Z. Wang<sup>3</sup> & Jonathan Widom<sup>2</sup>



Jonathan Widom  
1955-2011





# The nucleosomal sequence space

4<sup>147</sup>

sequences can be wrapped around a nucleosome

How to explore that space?

1. Produce nucleosome maps on **genomic DNA**

disadvantage: only small fraction of sequence space (e.g. yeast:  $10^{-80}$ )

2. Find high affinity sequences in **random pool** (Lowary & Widom 1998)

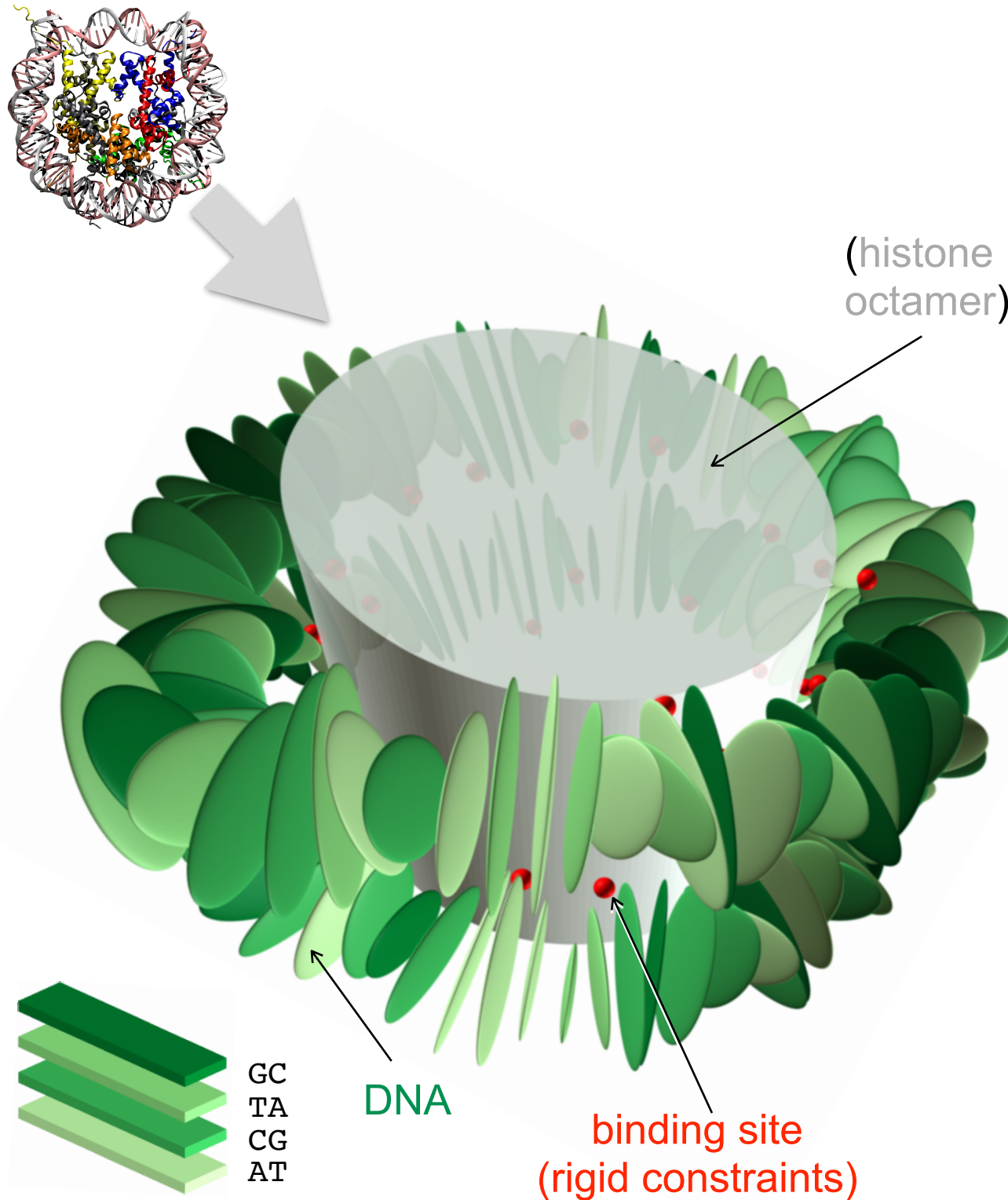
disadvantage: experimentalists work mostly with one sequence only ('601')

3. **Mutation Monte Carlo simulation** (Eslami-Mossallam et al., 2016)

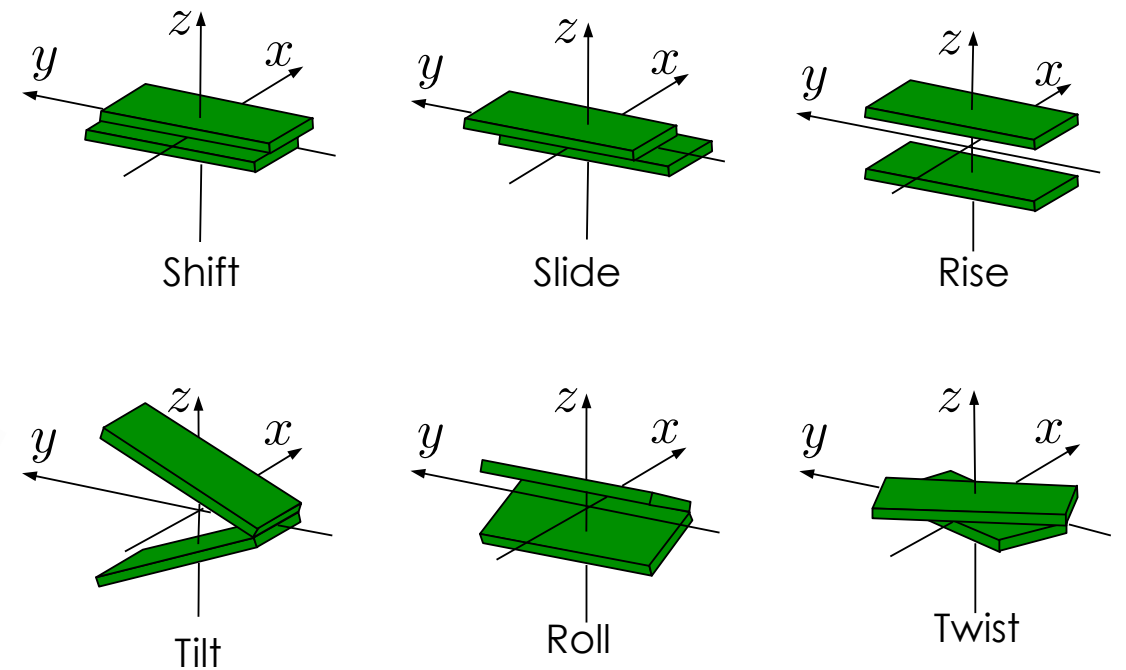
disadvantage: *in silico*, only as good as nucleosome computer model

# Our nucleosome model

Eslami-Mossallam, Schram, Tompitak, van Noort, Schiessel, PLoS ONE 11, e0156905 (2016)



rigid basepair model:



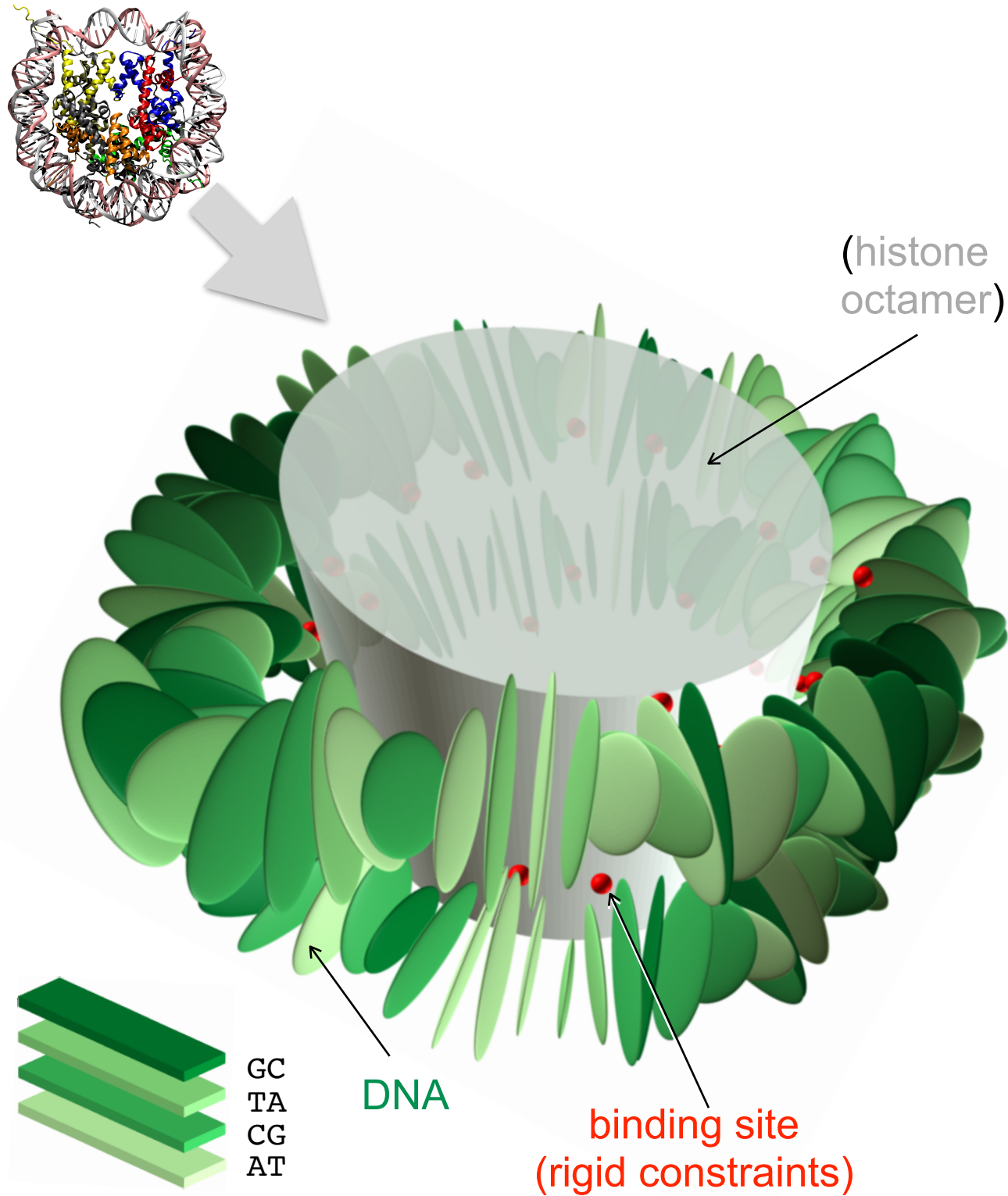
$$\vec{x} = [\text{Tilt}, \text{Roll}, \text{Twist}, \text{Shift}, \text{Slide}, \text{Rise}]$$

$$E_{\text{step}} = \frac{1}{2} (\vec{x} - \vec{x}^0)^T \mathbf{Q} (\vec{x} - \vec{x}^0)$$

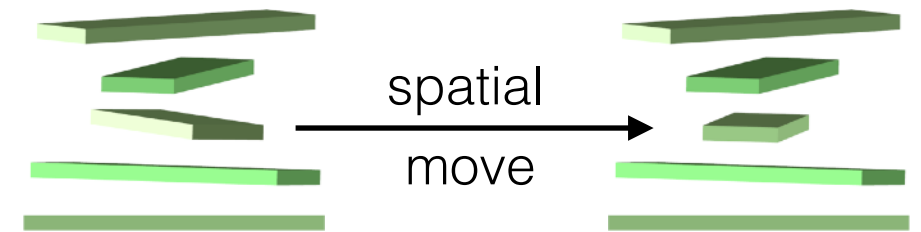
protein-DNA cocrystals Olson et al. (1998)      all atom MD simulations Lavery et al. (2010)



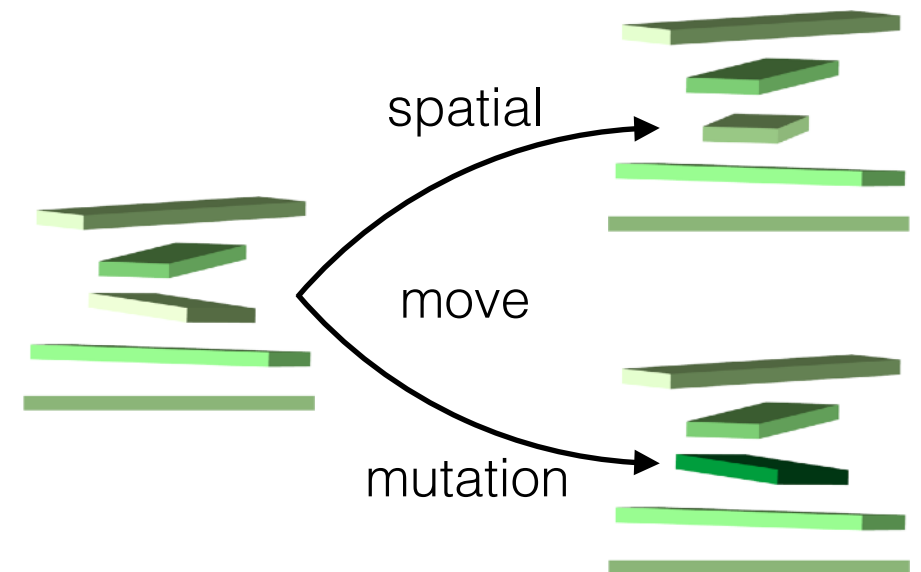
# Two types of simulations



1. study fixed bp sequence:  
ordinary MC simulation



2. explore sequence space:  
mutation MC simulation

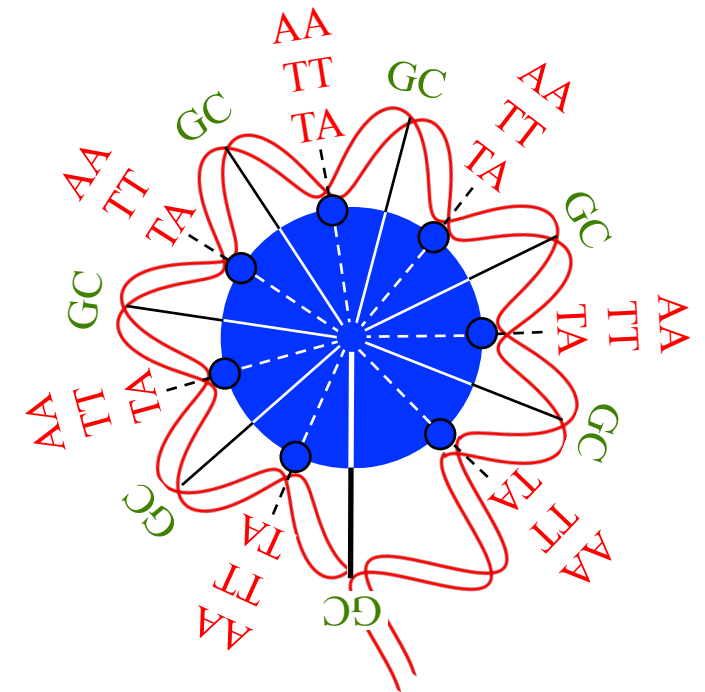
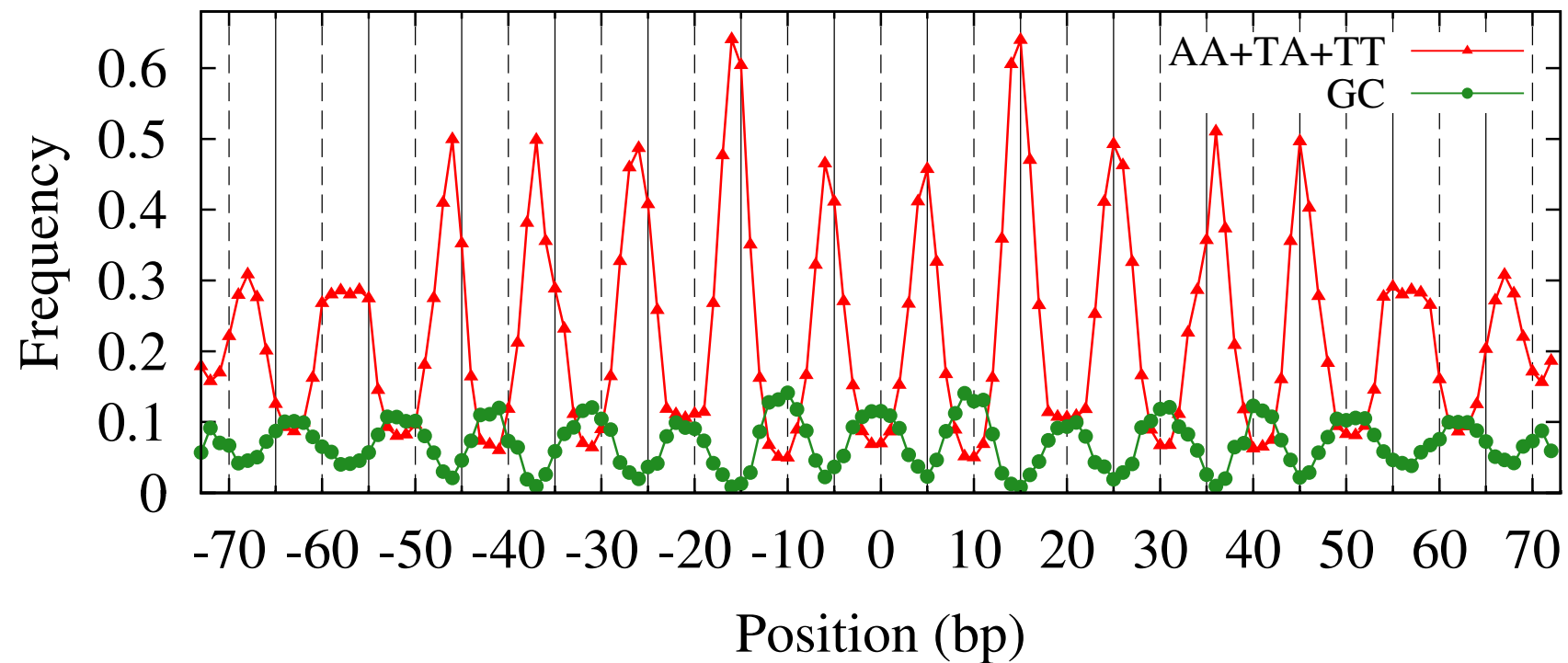


# Recovering the positioning rules

Eslami-Mossallam, Schram, Tompitak, van Noort, Schiessel, PLoS ONE 11, e0156905 (2016)

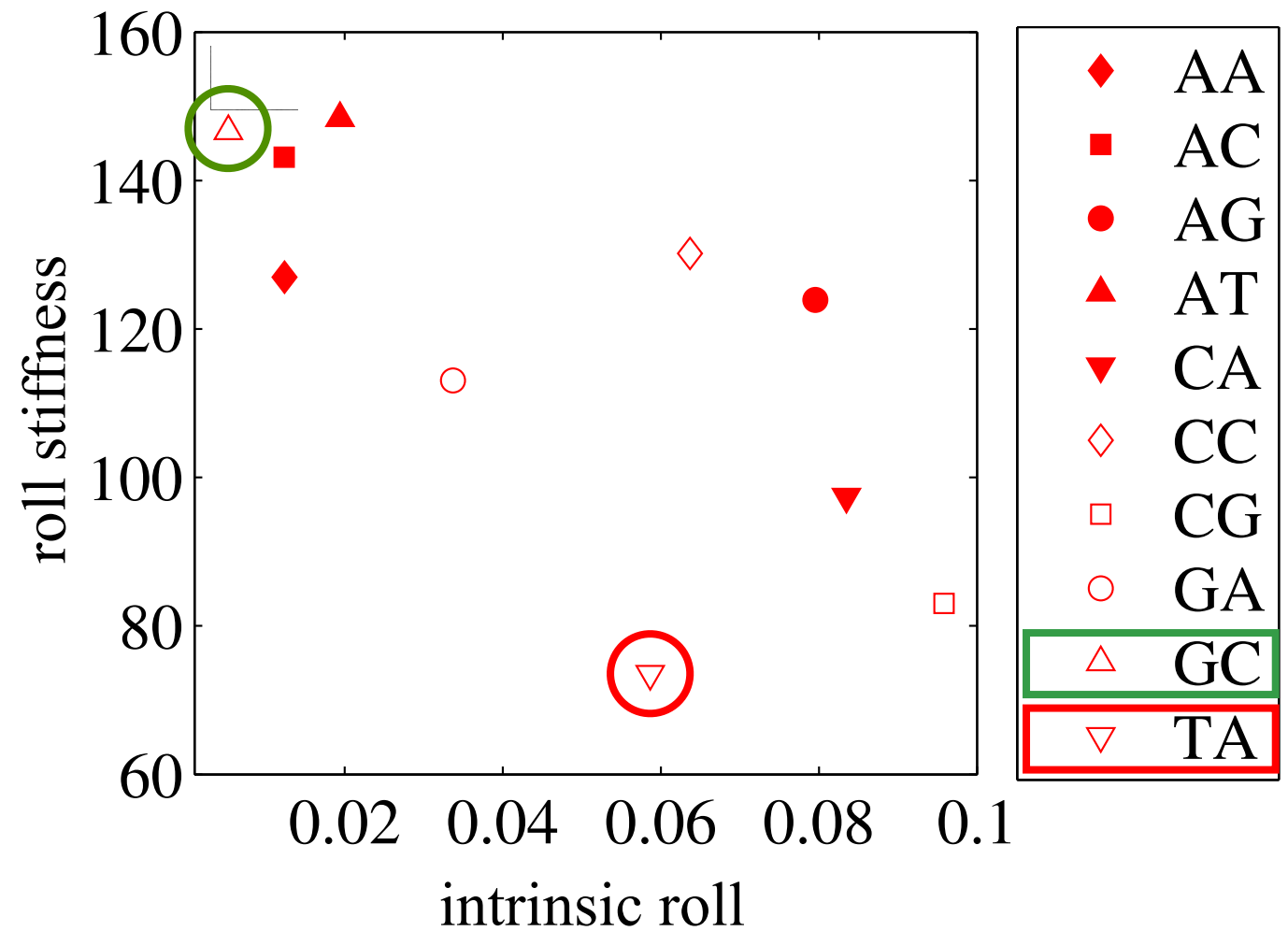
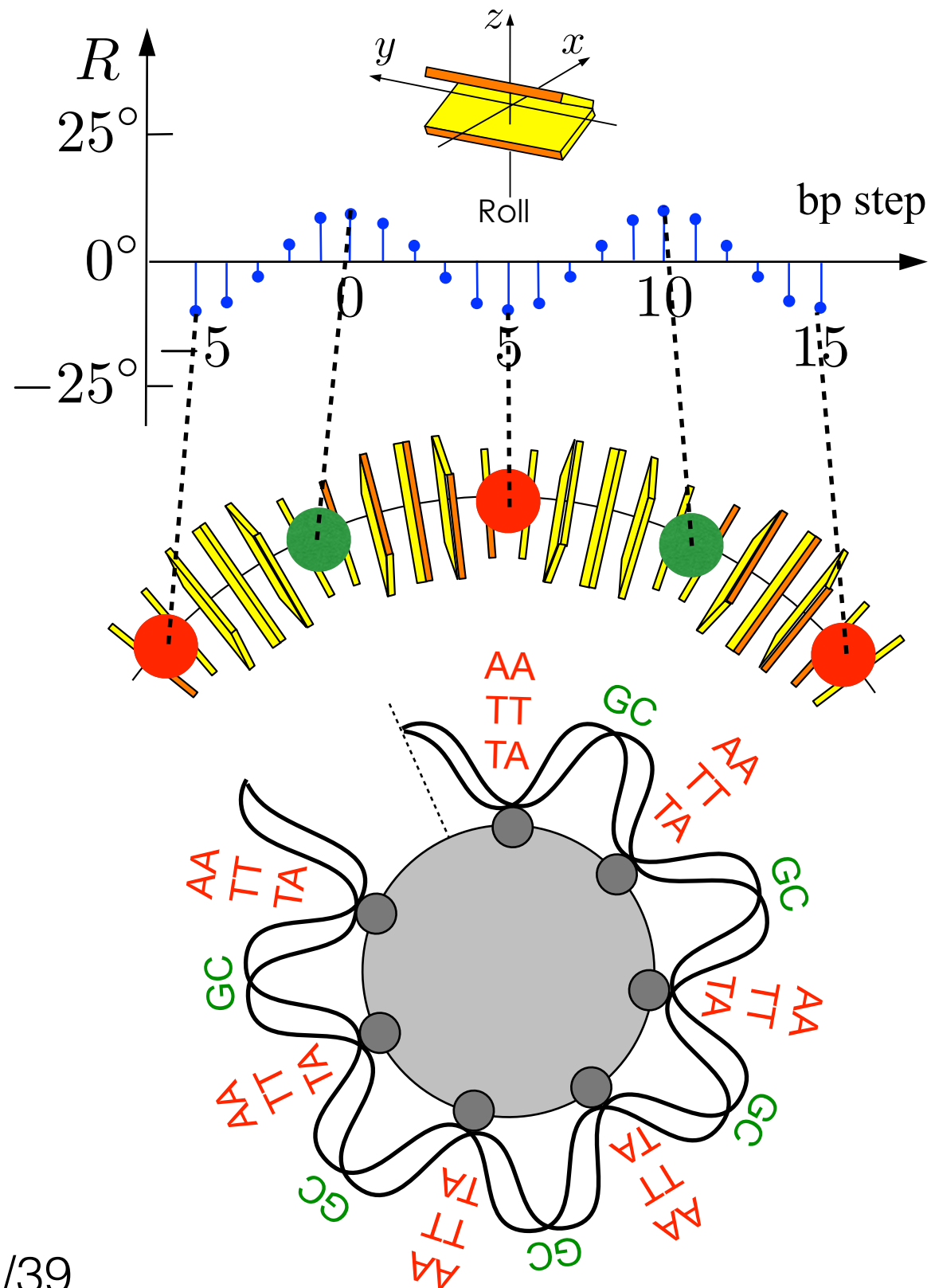


10 million sequences at 100 K



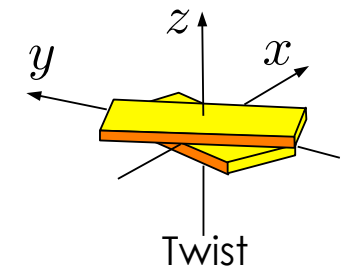
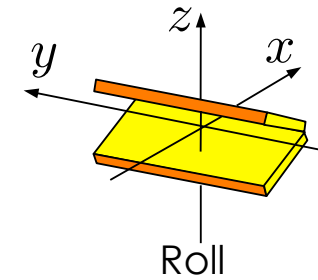
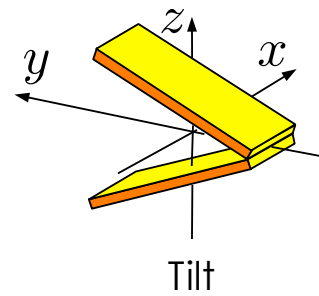
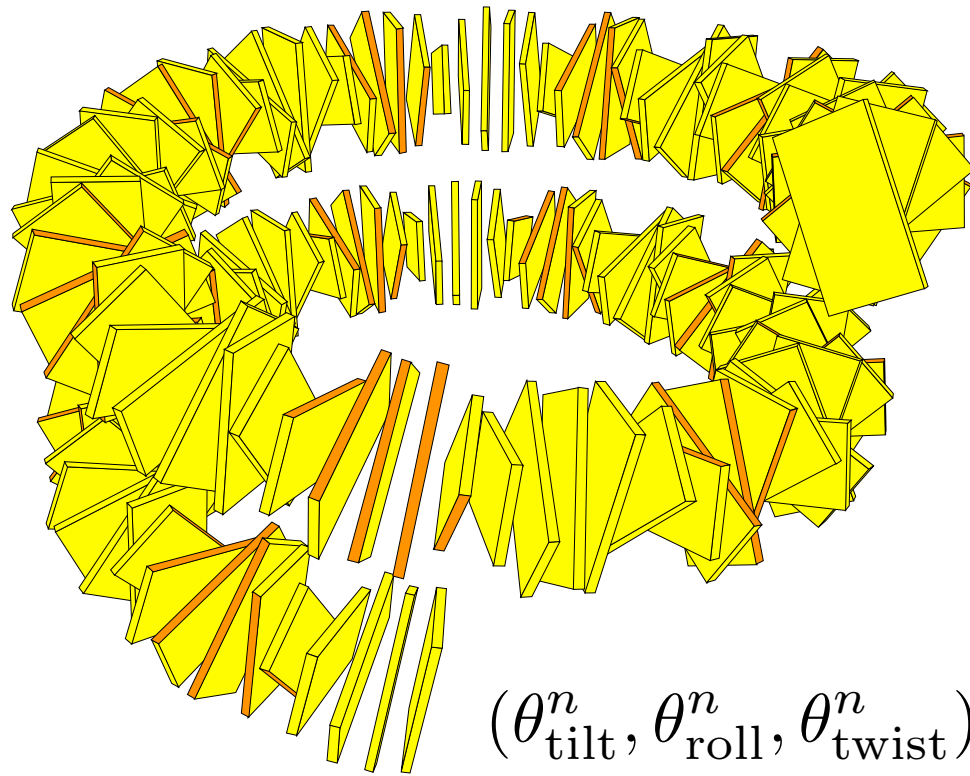


But do we now understand the positioning rules?



# An exactly solvable model

Zuiddam, Everaers, Schiessel, Phys. Rev. E 96, 052412 (2017)



$$(\theta_{\text{tilt}}^n, \theta_{\text{roll}}^n, \theta_{\text{twist}}^n) = (\Gamma \sin(2\pi n/10 - \phi), \Gamma \cos(2\pi n/10 - \phi), \theta_{\text{twist}})$$

dinucleotide probability distribution:

$$P_s(\text{GC}) = \frac{1}{Z} \sum_{\substack{N^1, \dots, N^{147} \\ N^s = \text{G}, N^{s+1} = \text{C}}} \exp \left[ -\beta \sum_{n=1}^{146} E^n (N^n N^{n+1}) \right]$$

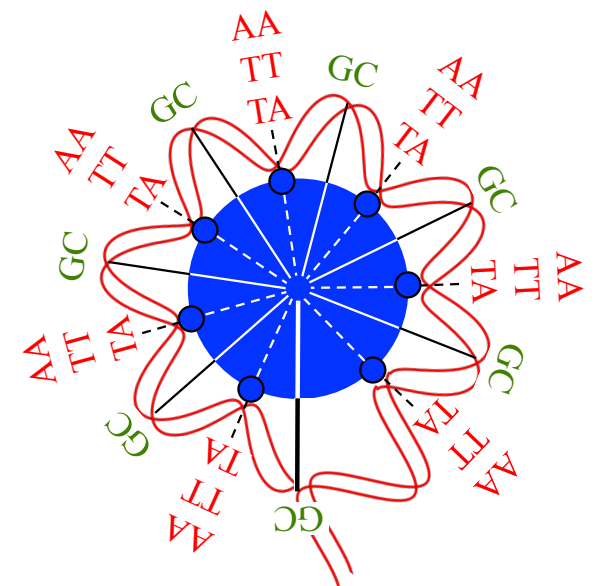
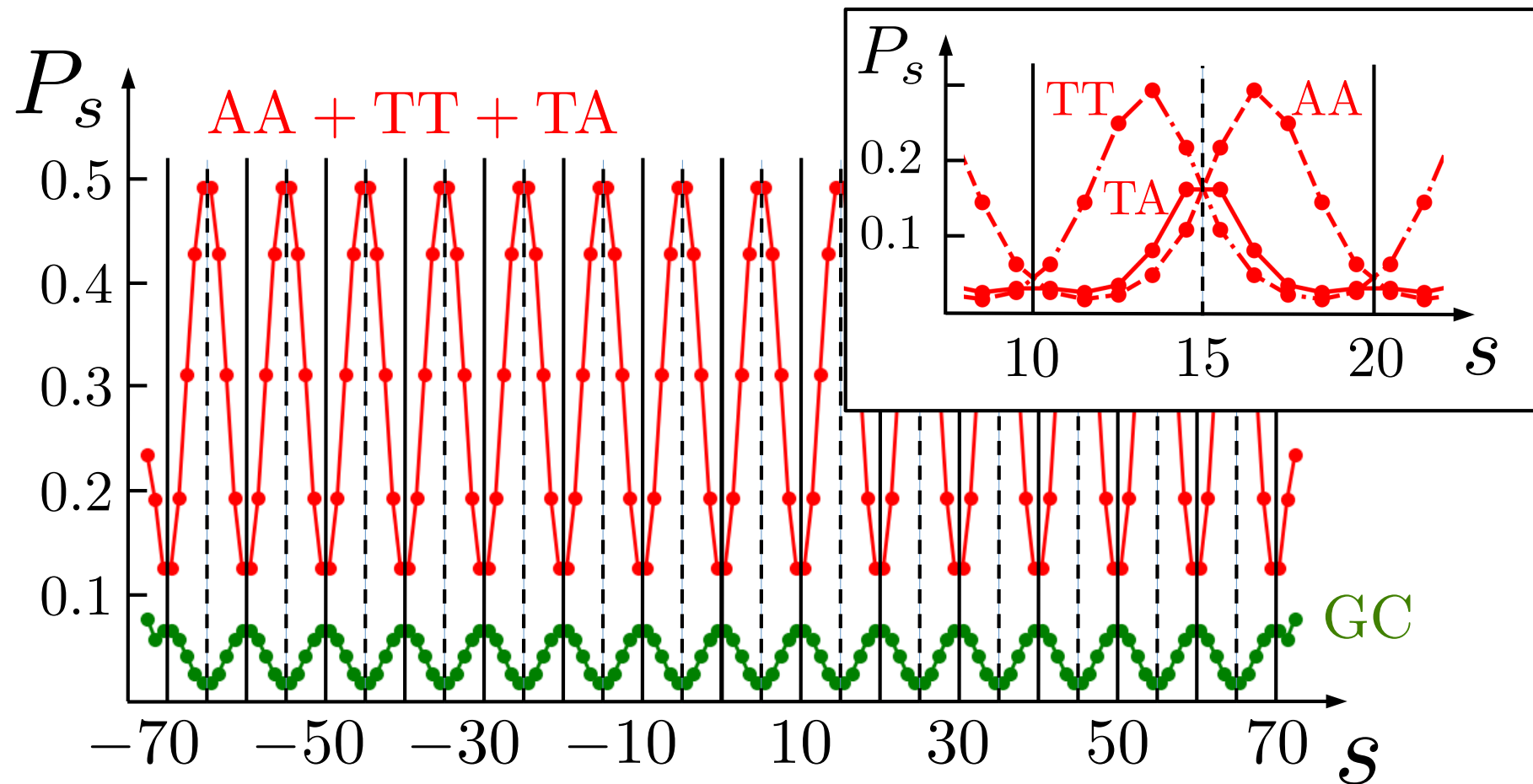


4D vectorspace with basis:  $B = \{A, T, C, G\}$

transfer matrix:  $T_{GC}^n = \exp[-\beta E^n(GC)]$

dinucleotide probability distribution:

$$P_s(GC) = \frac{\sum_{N^1, N^{147}} (T^1 \dots T^{s-1})_{N^1 G} T_{GC}^s (T^{s+1} \dots T^{146})_{C N^{147}}}{\sum_{N^1, N^{147}} (T^1 T^2 \dots T^{146})_{N^1 N^{147}}}$$



But do we now understand the positioning rules?

average neighbor energy approximation:

$$P_p^{(e)}(a,b) = \frac{1}{Z} \exp[-\beta \langle E_{p-1}(n_{p-1}, a) \rangle_{n_{p-1}}] \exp[-\beta E_p(a,b)] \exp[-\beta \langle E_{p+1}(b, n_{p+2}) \rangle_{n_{p+2}}]$$

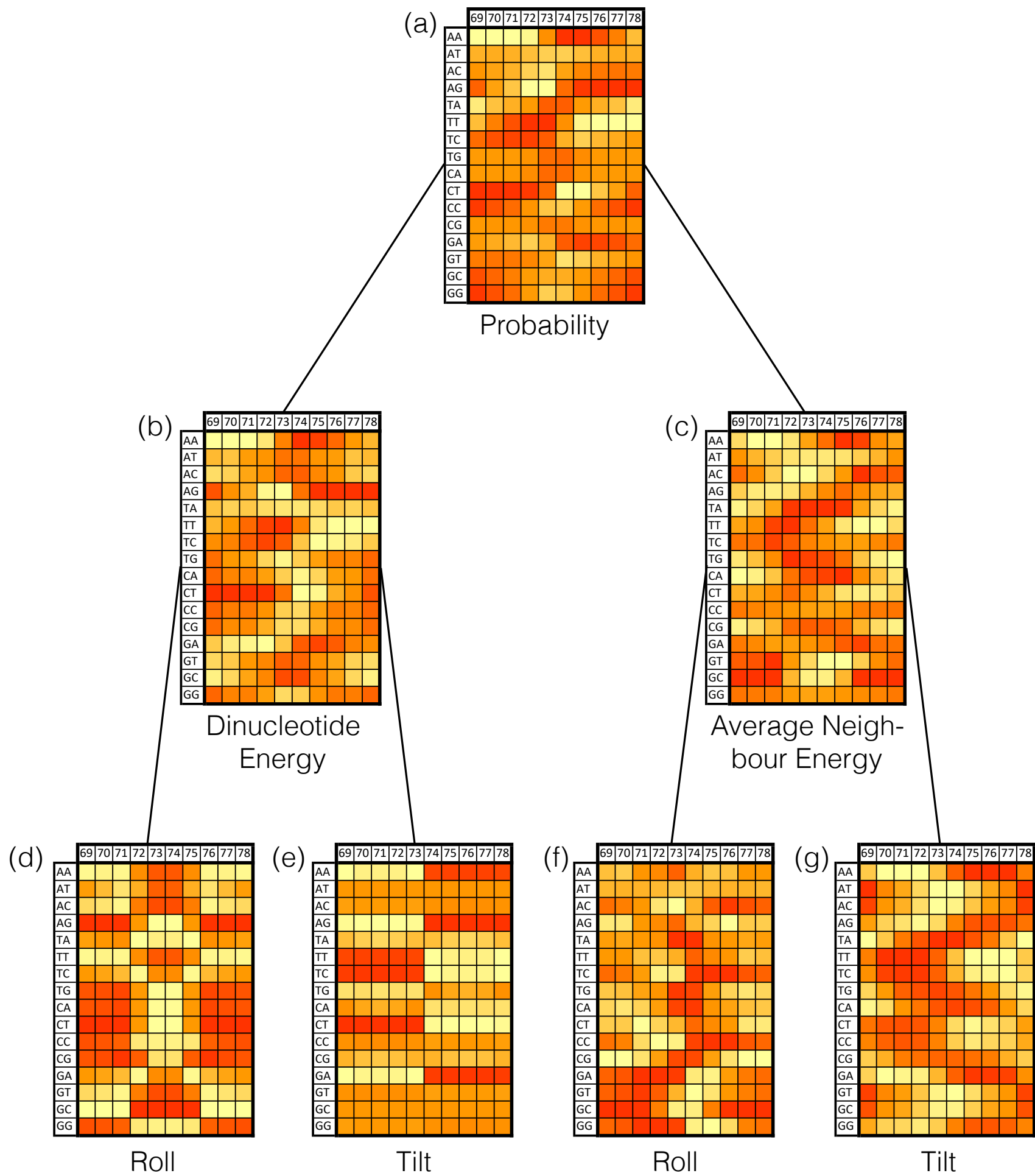
The probability of a basepair step depends on:

— the energy of this step

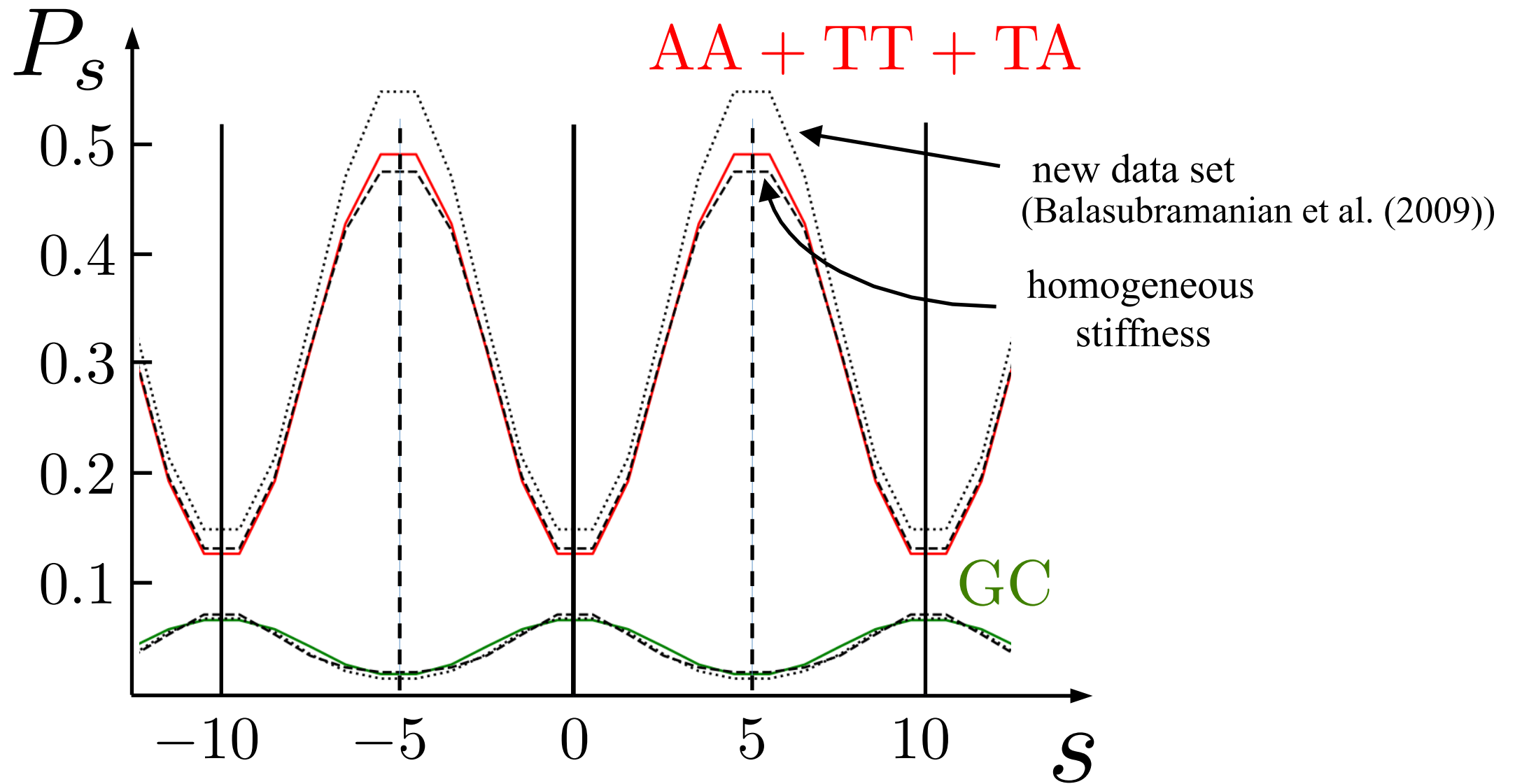
and

— the average energies of all possible steps before and after that step





What is more important: shape or stiffness?





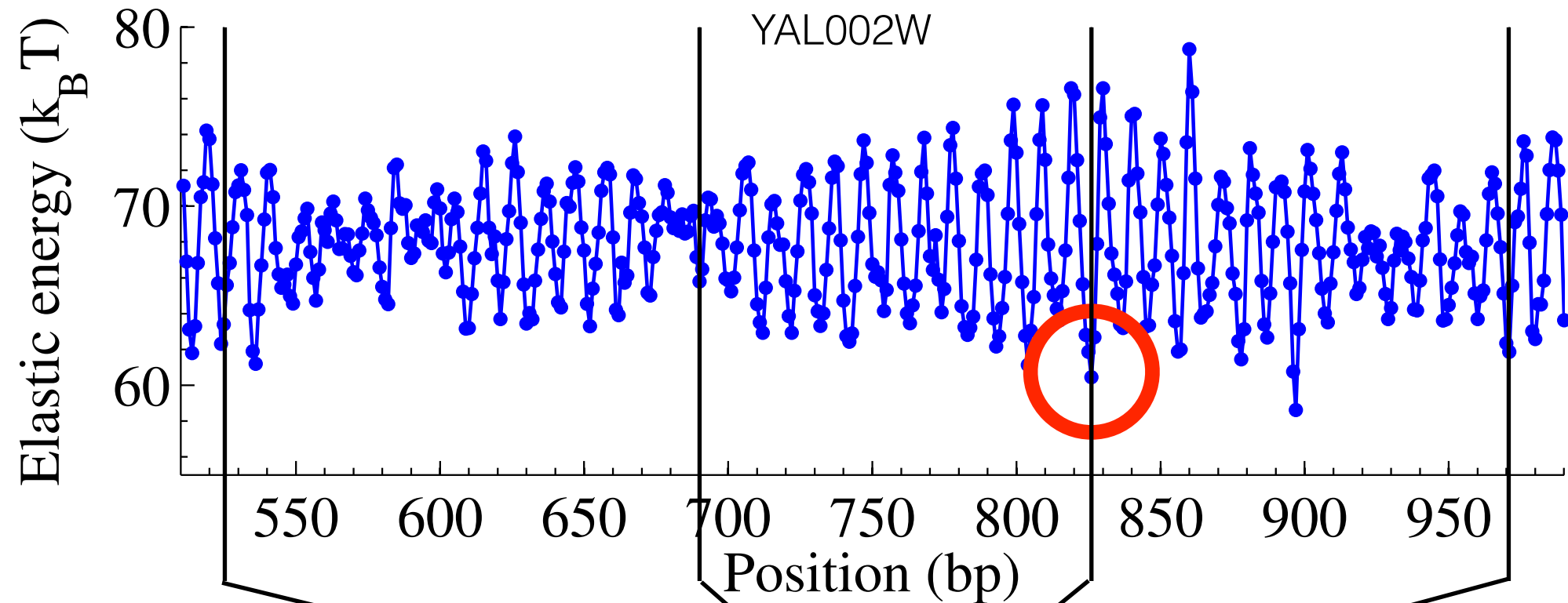
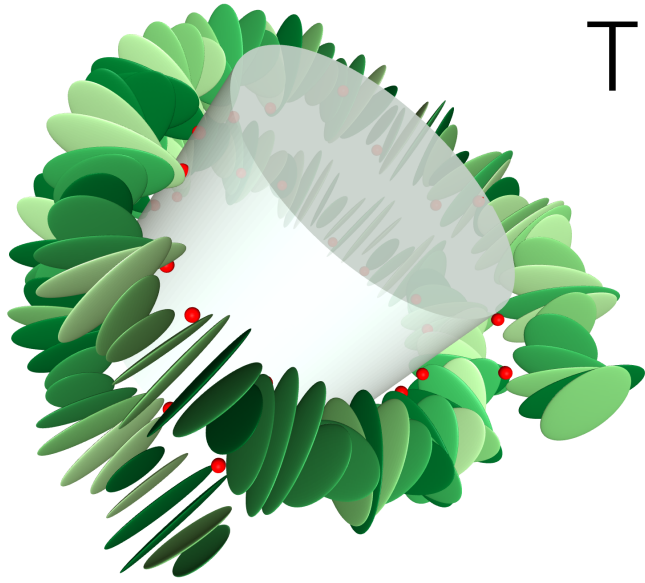


# THE MECHANICAL GENOME

1. Positioning rules are mechanical
2. Multiplexing of the 2 (and even 3) layers
3. Mechanical cues on real genomes



# The energy landscape of a gene

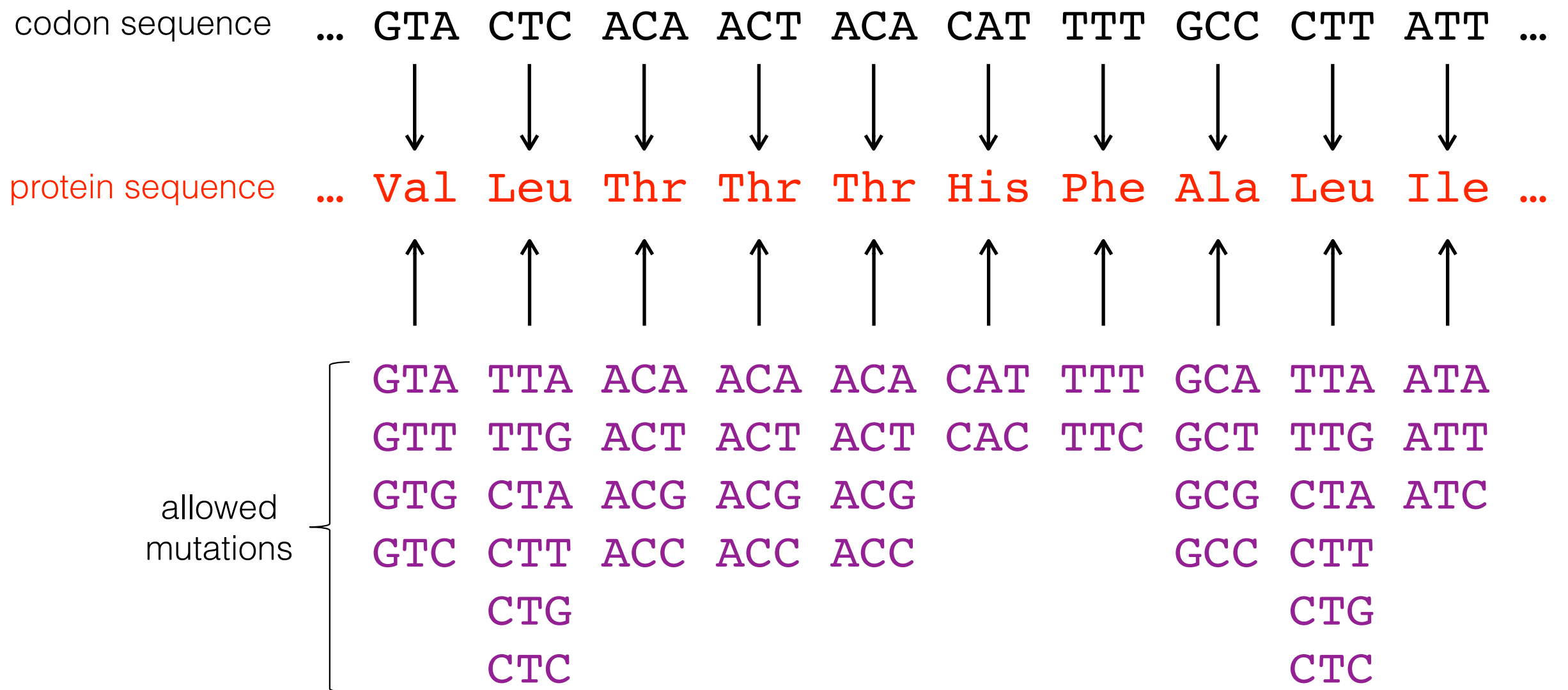


Nucleosome mapping at basepair resolution in *S. cerevisiae*

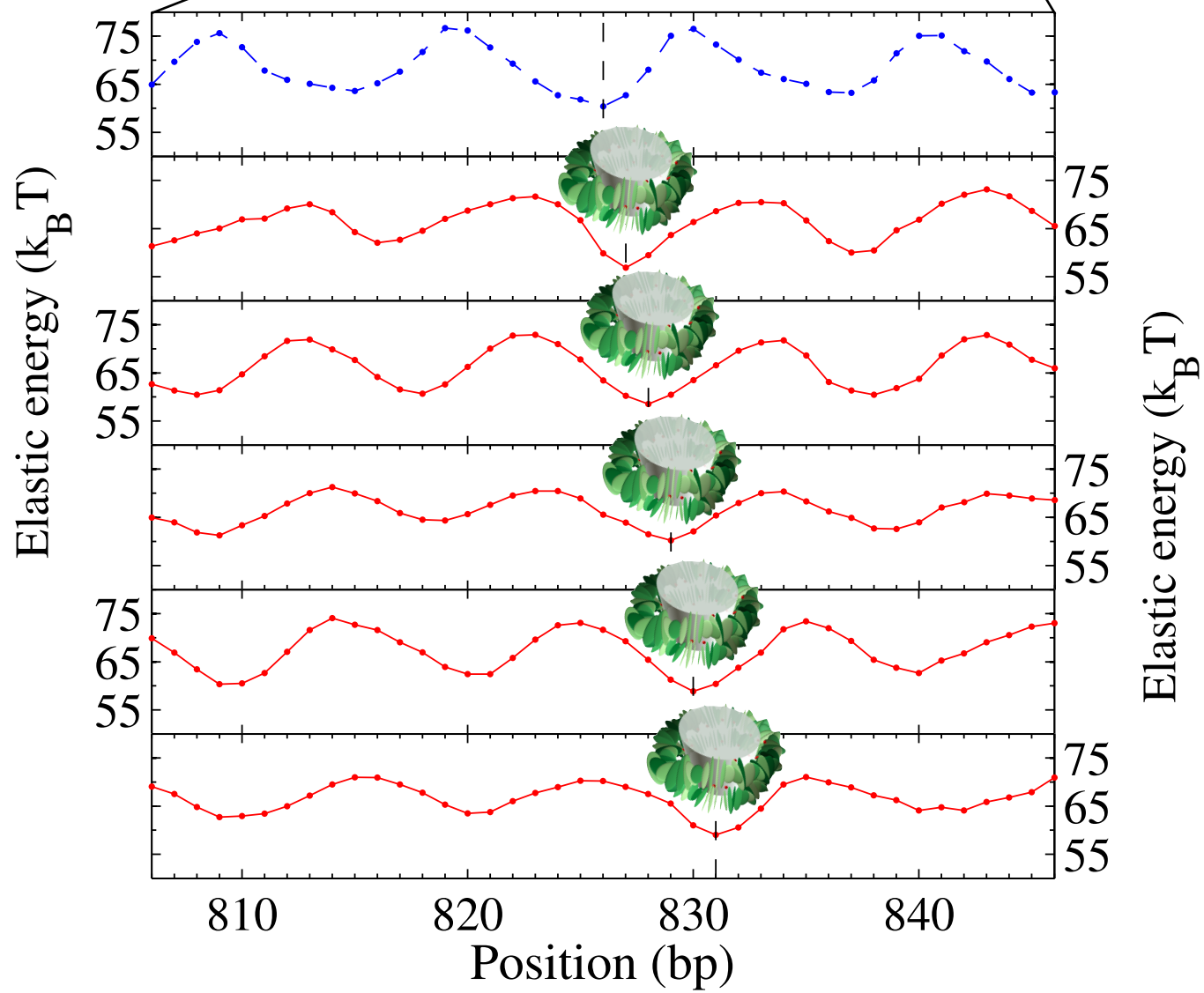
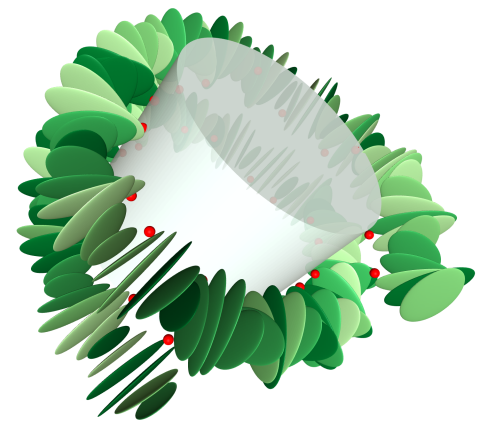
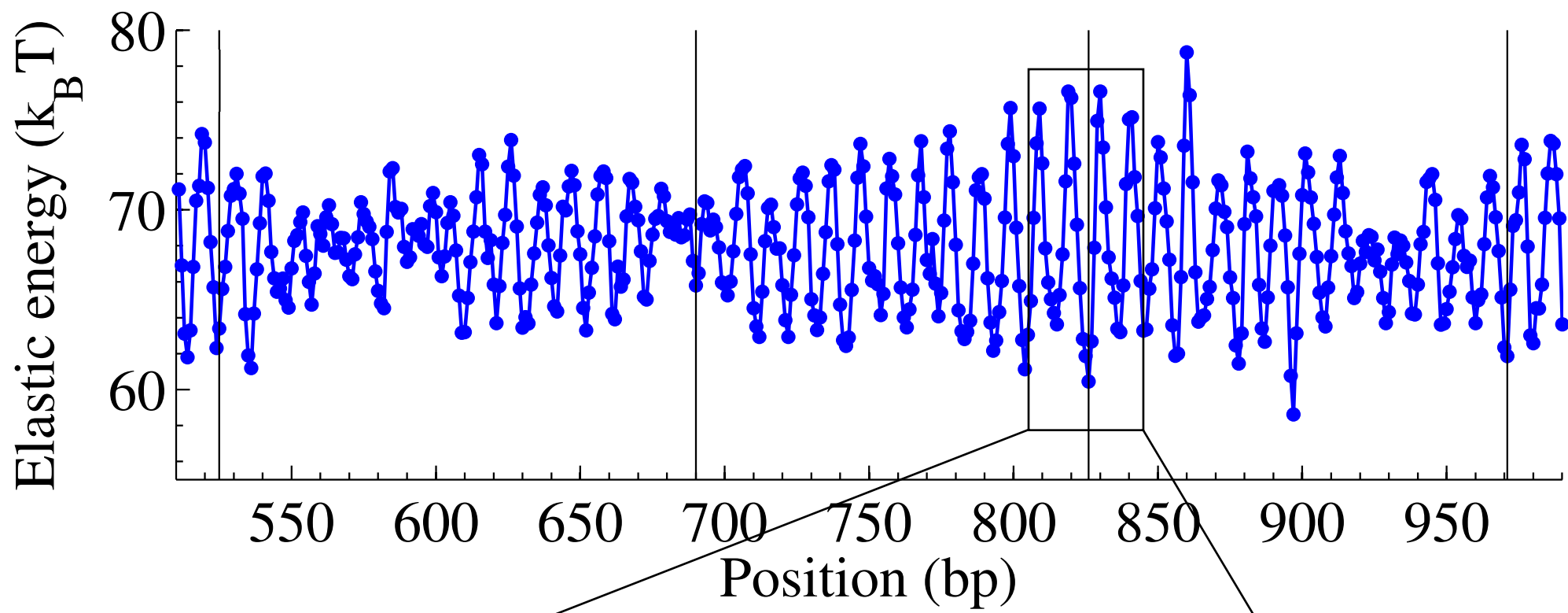
Brogaard, Xi, Wang & Widom

Nature **486** (2012) 496

# Synonymous Mutation Monte Carlo

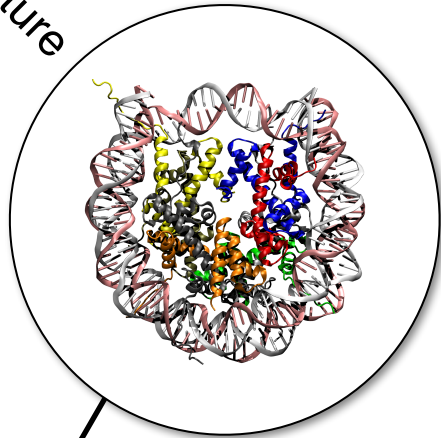






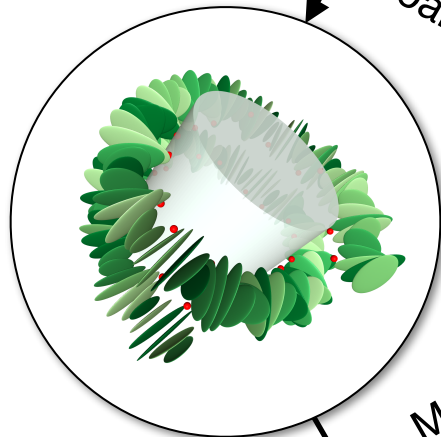
10<sup>7</sup> speed-up

crystal structure



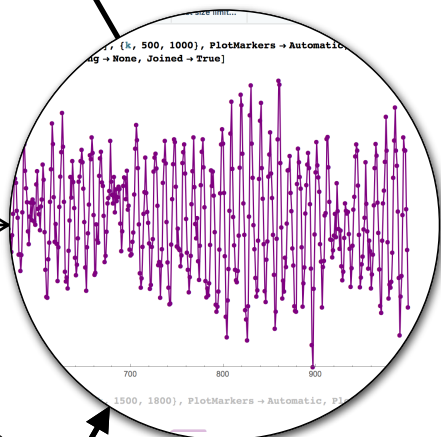
genome-wide calculations

coarse graining



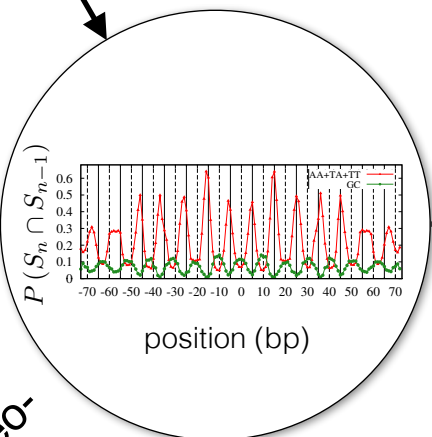
coarse grained model

$$\sqrt{(\Delta E)^2} = 0.8 k_B T$$



(free) energy landscape

Mutation Monte Carlo



mono-, di-, trinucleotide probabilities

$$\frac{P(S_n | S_{n-1} \cap S_{n-2})}{\frac{P(S_n \cap S_{n-1} \cap S_{n-2})}{P(S_n \cap S_{n-1})}} =$$

$$P(S) = \prod_{n=1}^{147} P(S_n | S_{n-1} \cap S_{n-2})$$

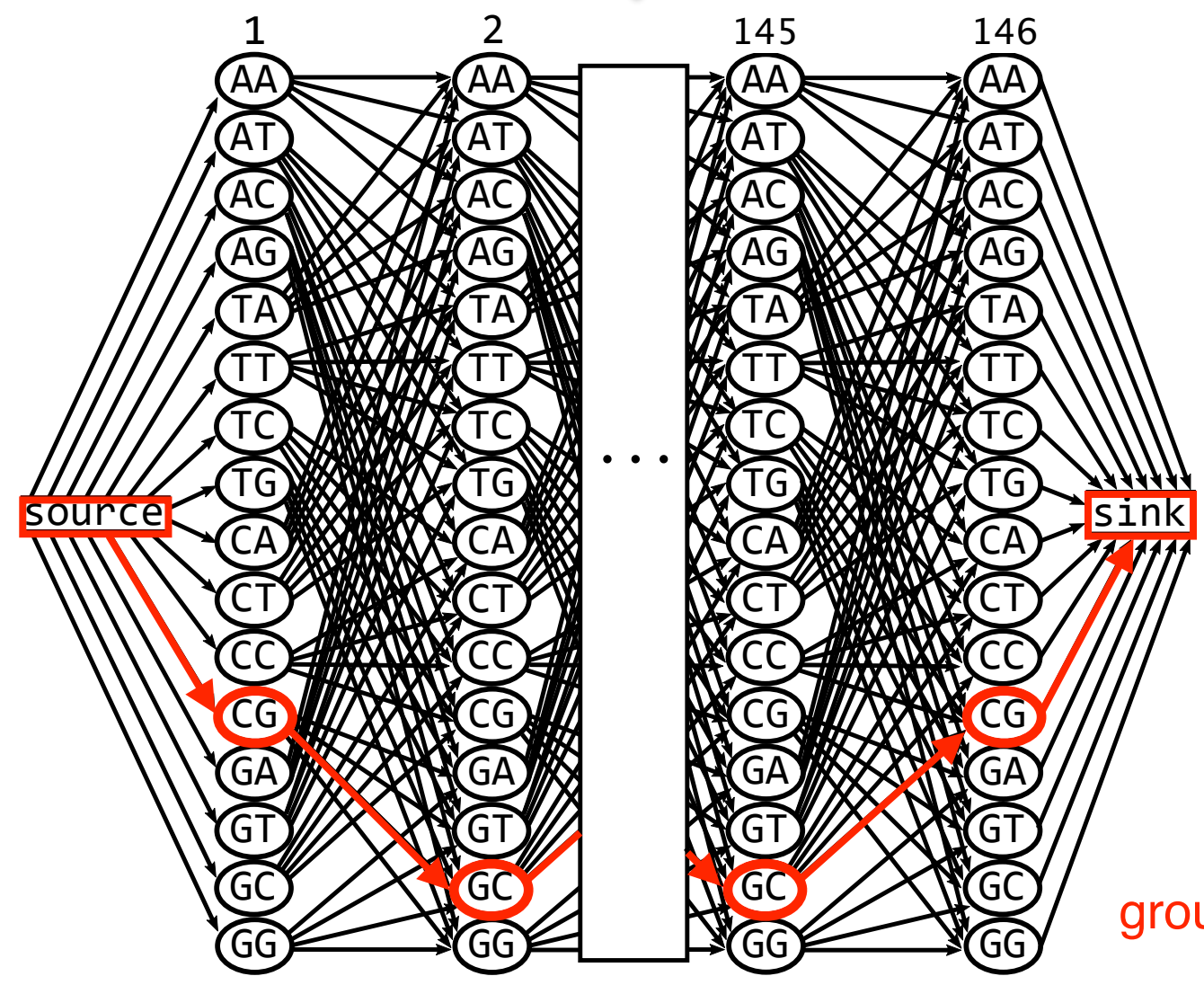
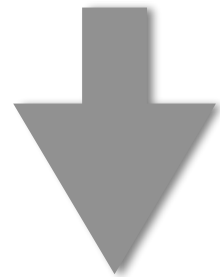
probabilistic model (2-step Markov)

$$-k_B T \ln(P(S))$$

# Mapping of sequences on weighted graphs

Zuiddam, Schiessel, PRE 99, 012422 (2019)

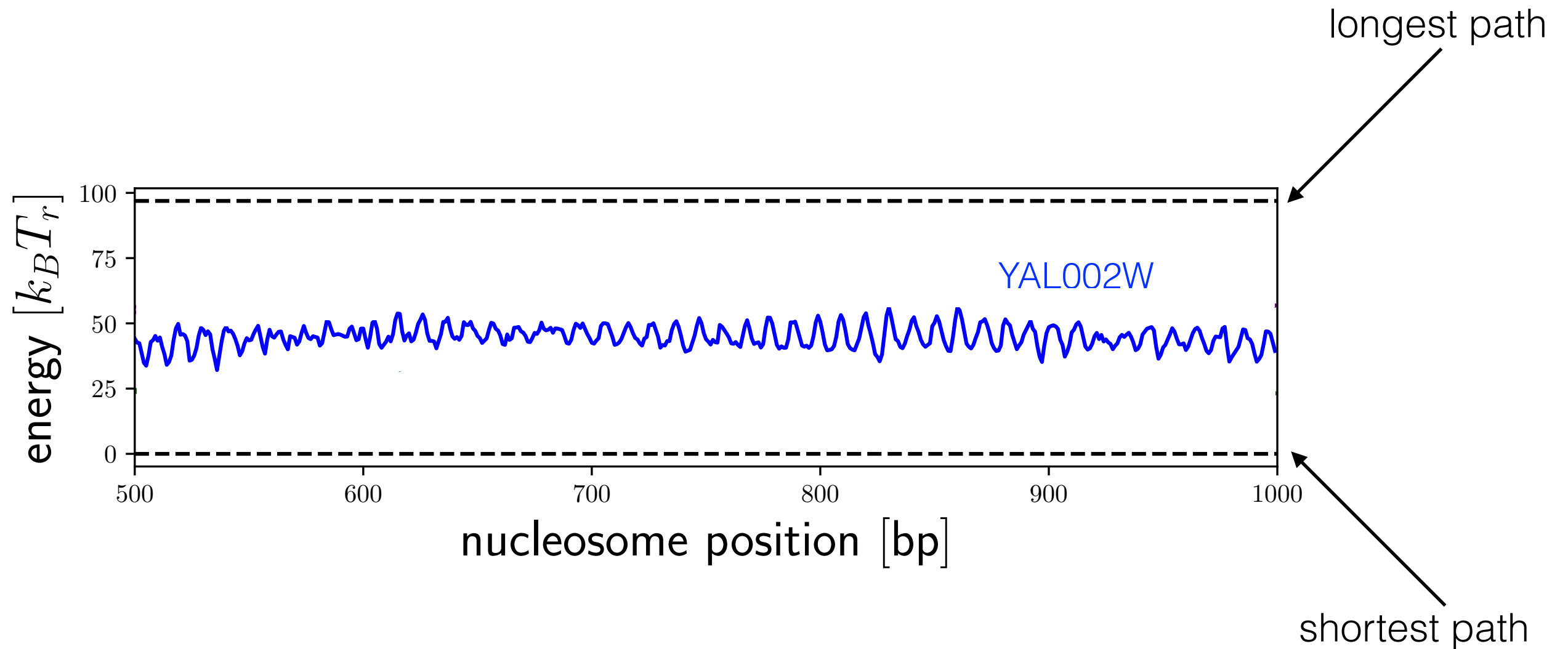
$4^{147}$  sequences



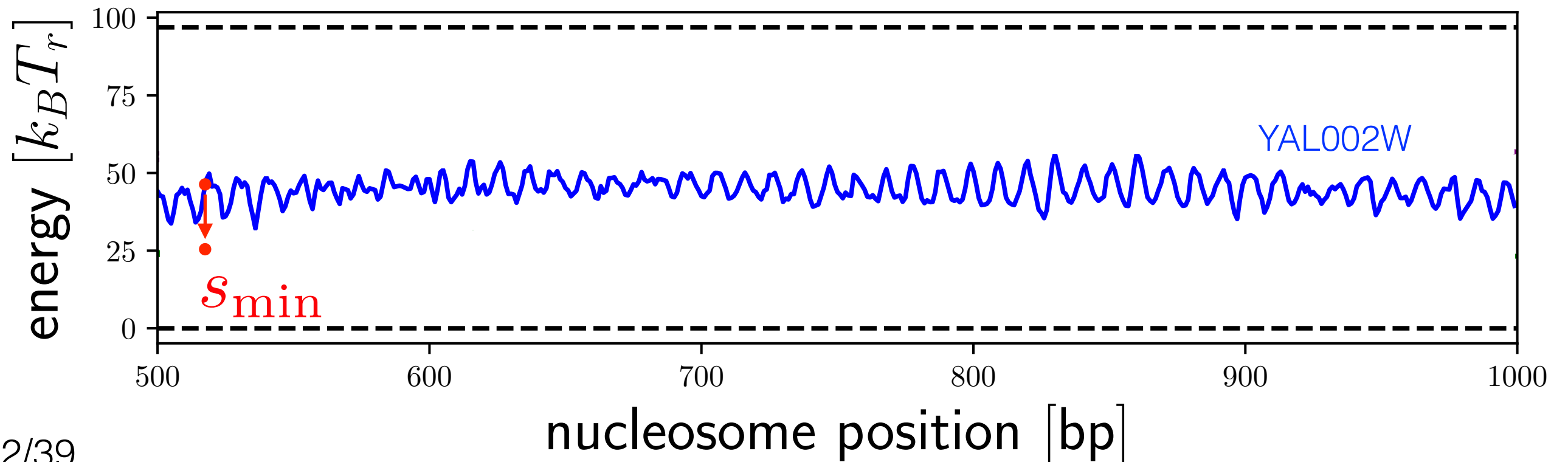
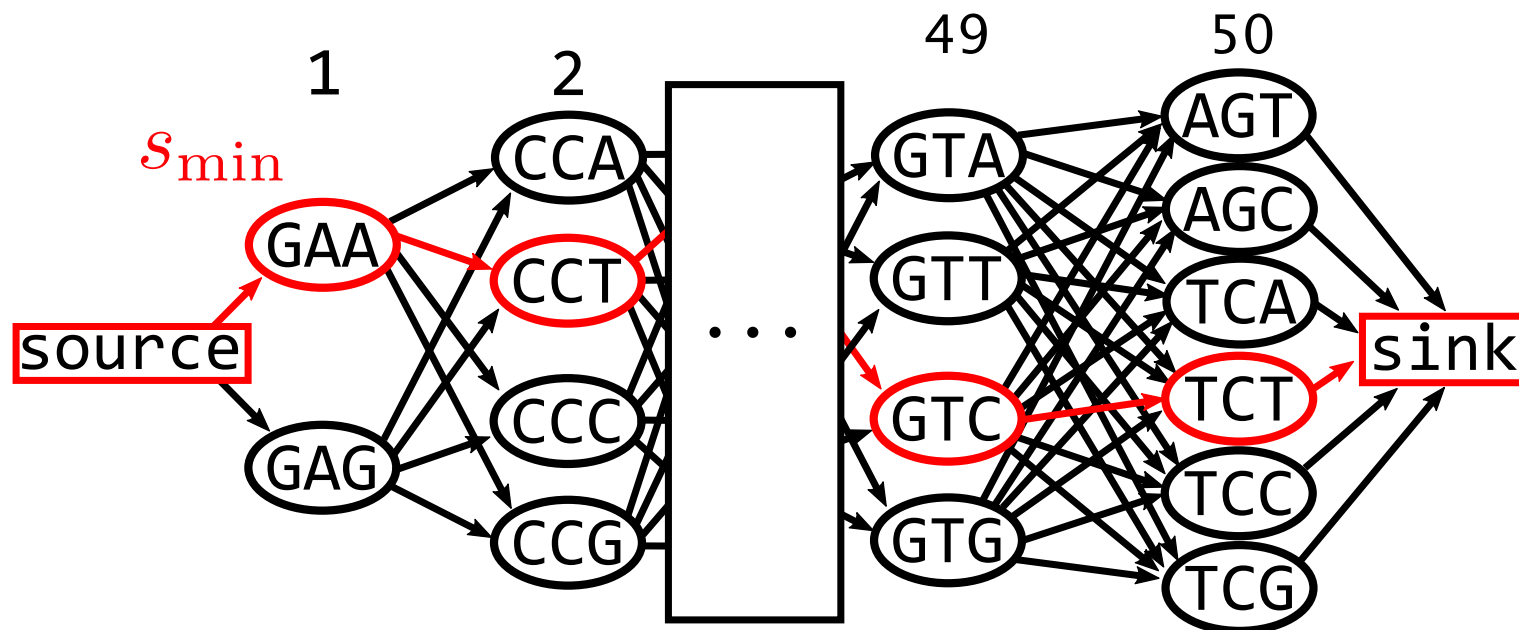
ground state sequence



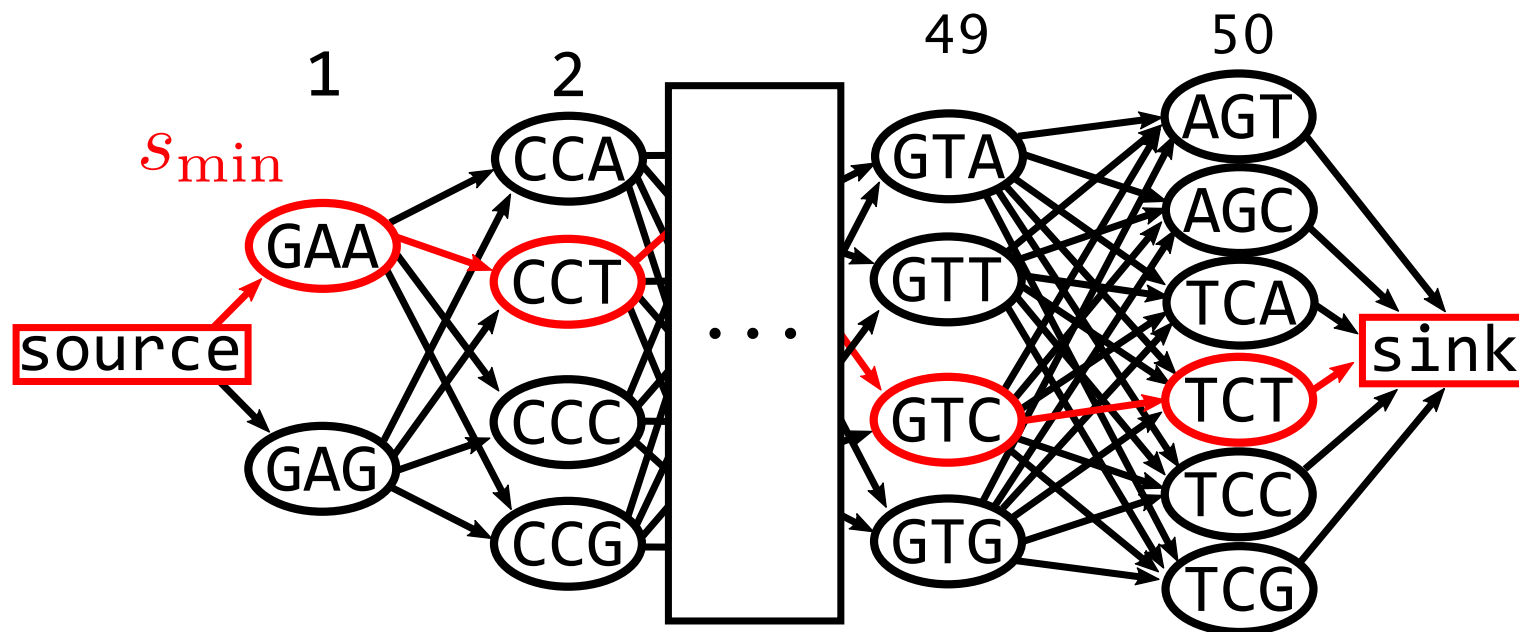
# The energy landscape of a gene: comparision to extreme sequences



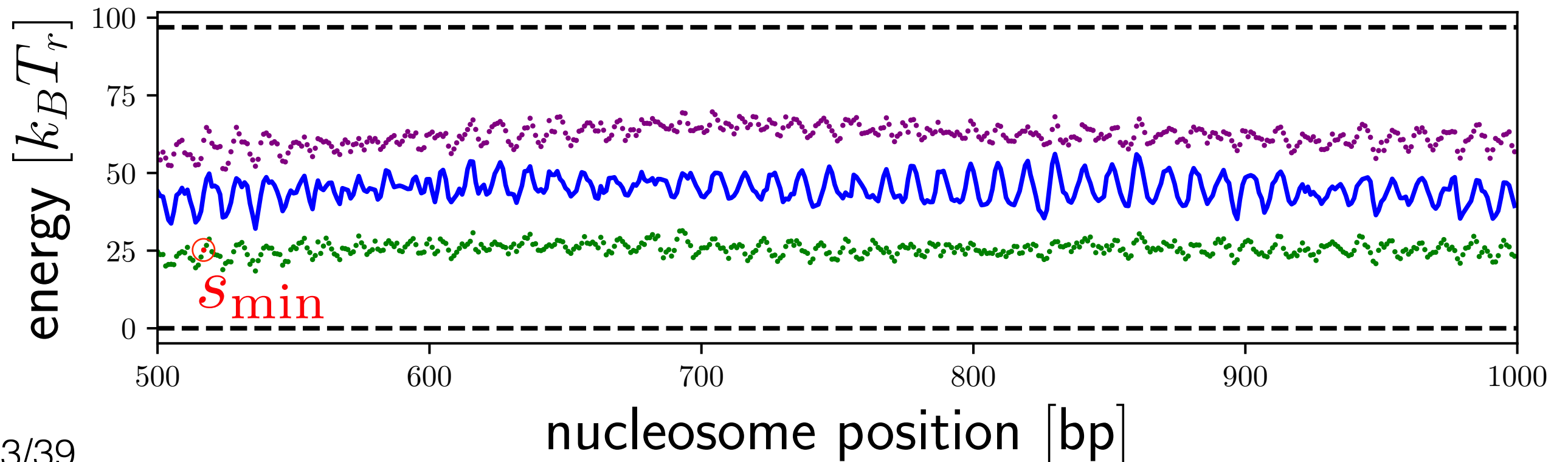
# Graph on coding sequence



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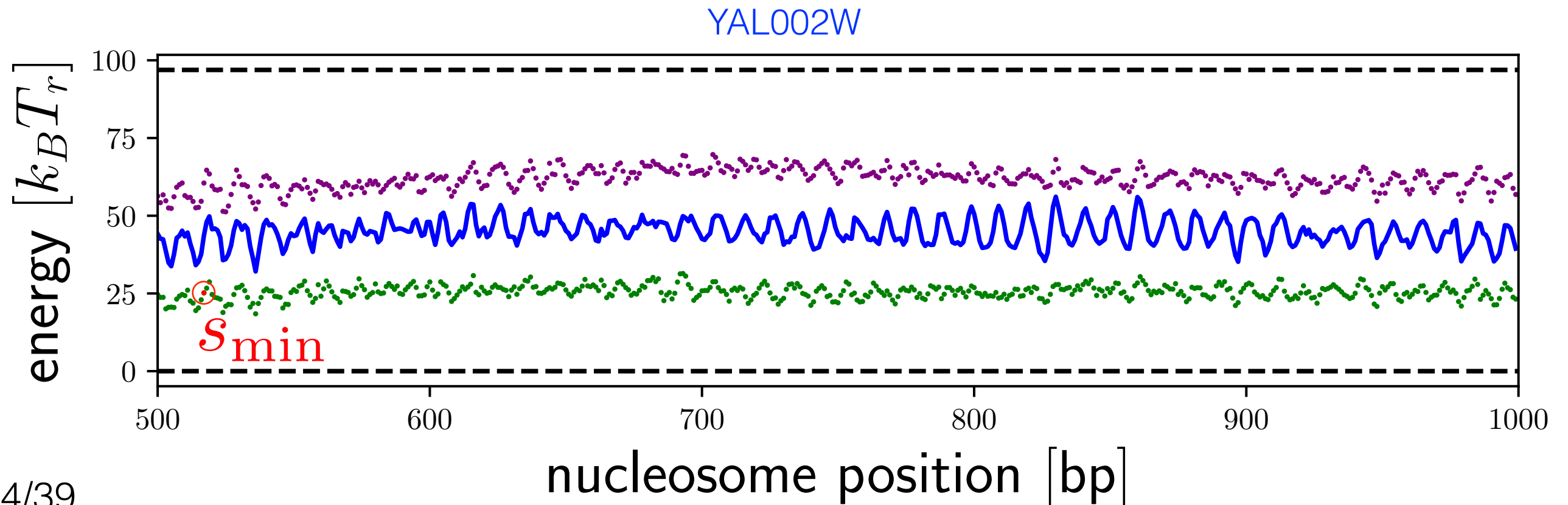
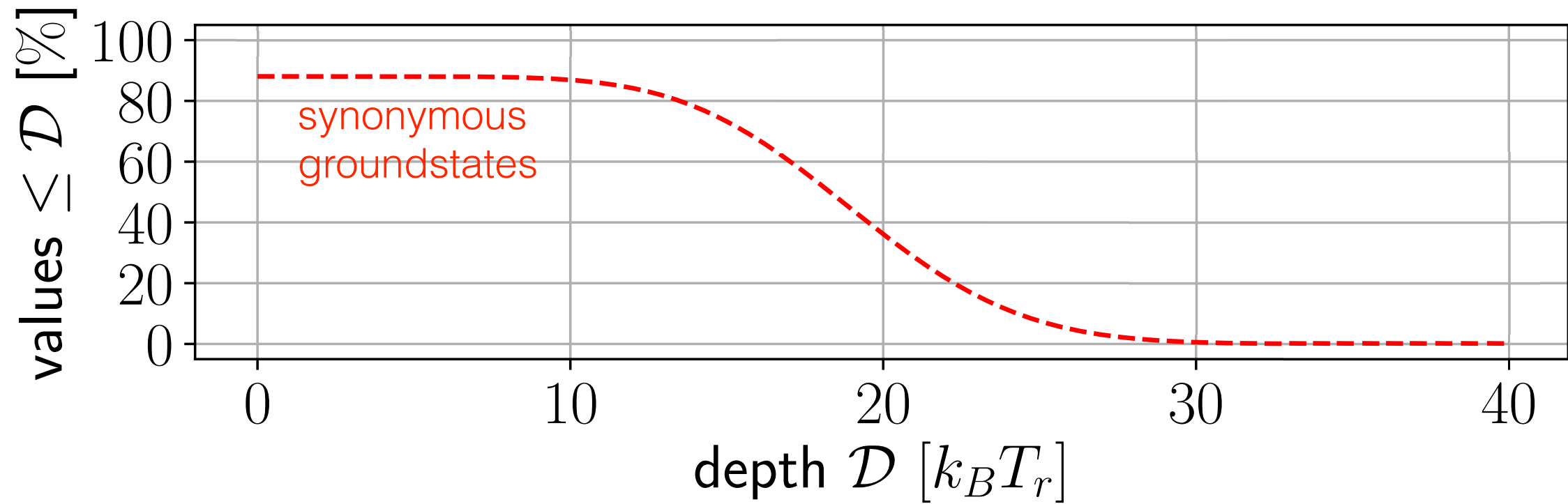


YAL002W

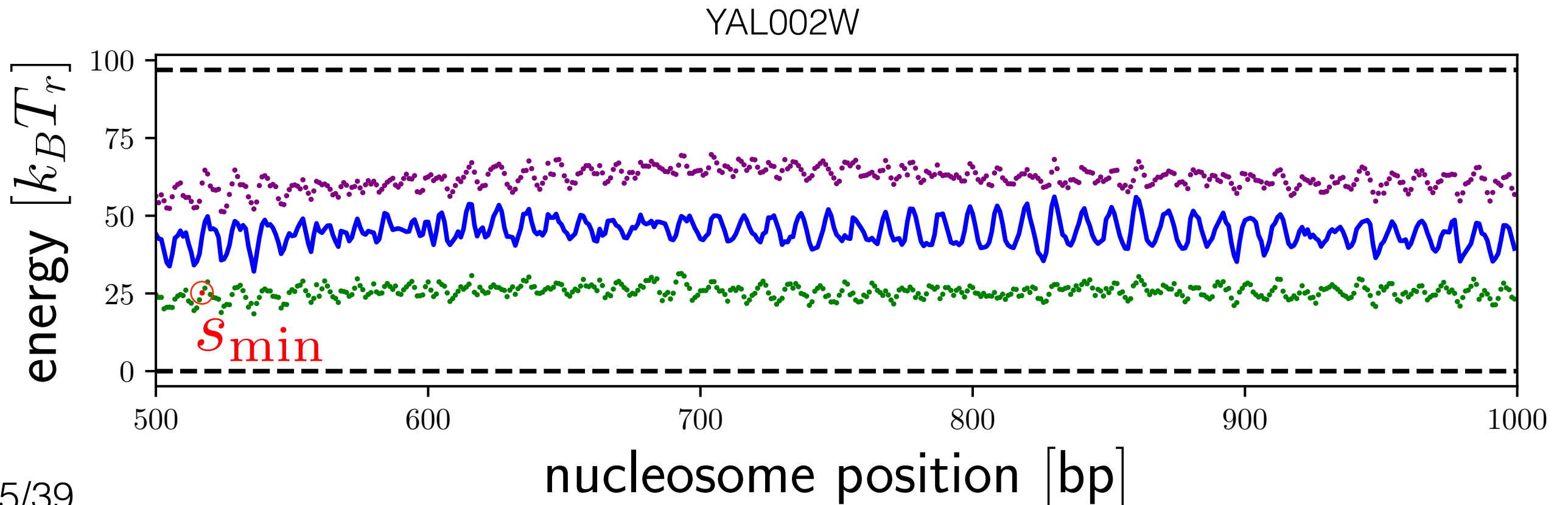
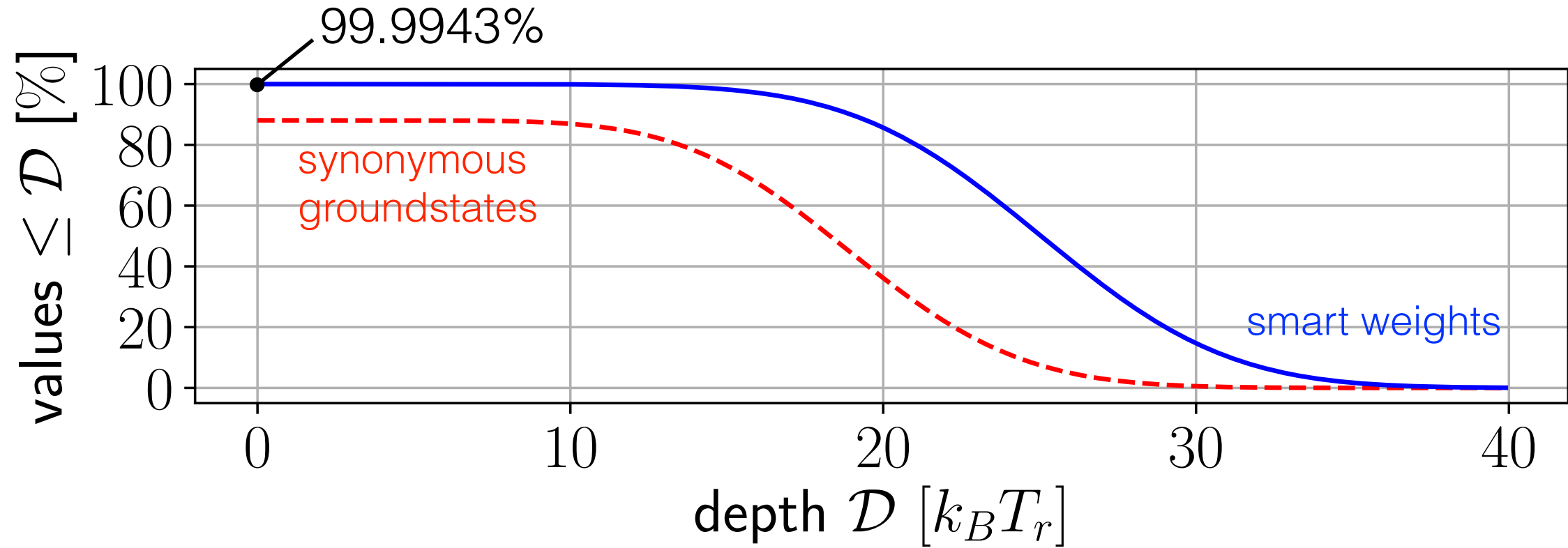




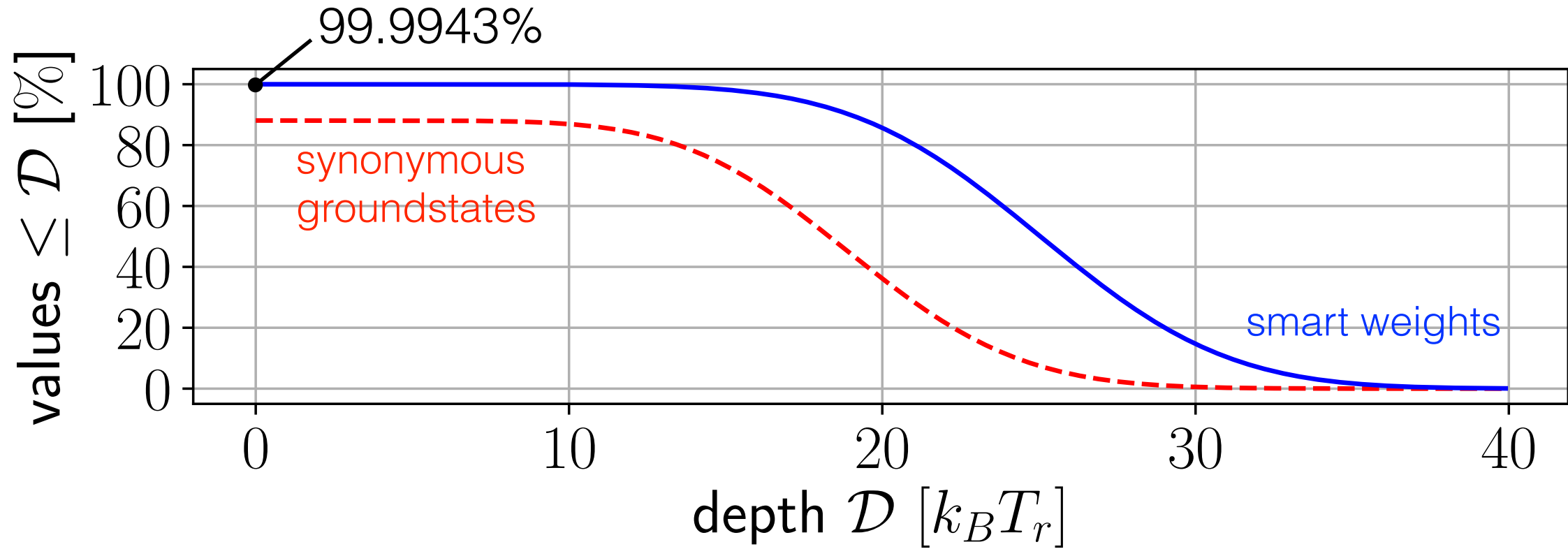
# Success in minima creation on 7640994 positions



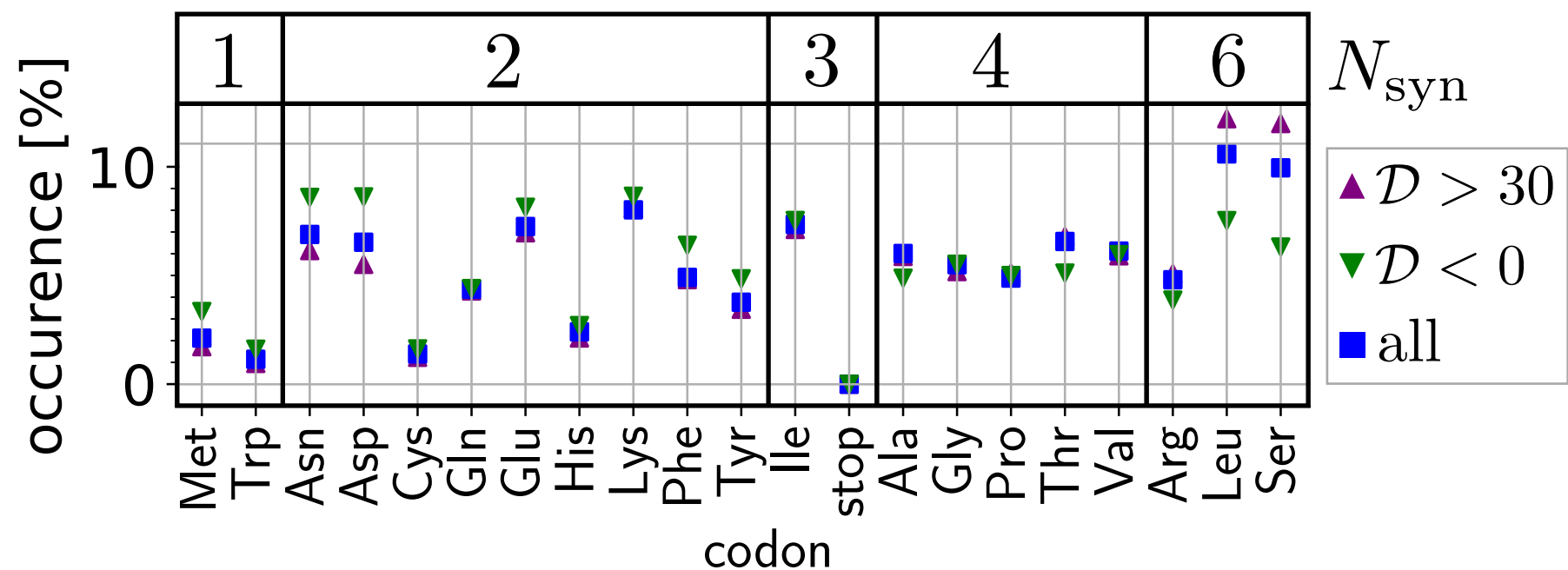
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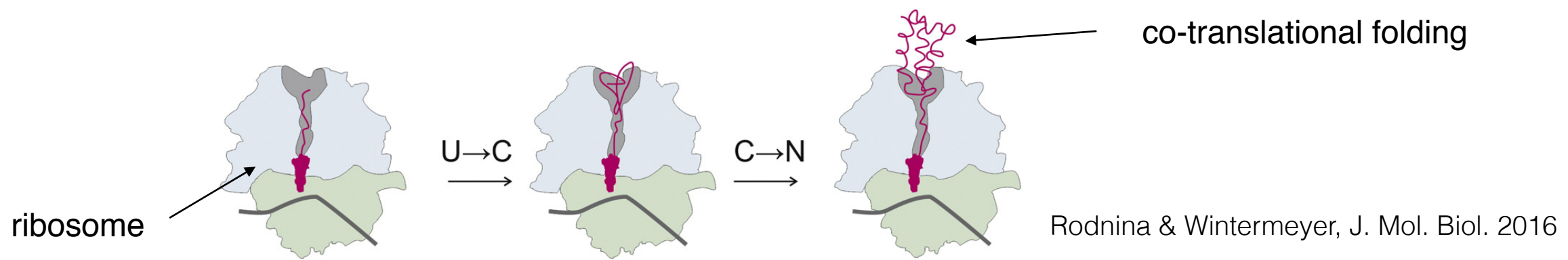


occurrence frequencies of amino acids in yeast genome:



# So is there space for a third layer?

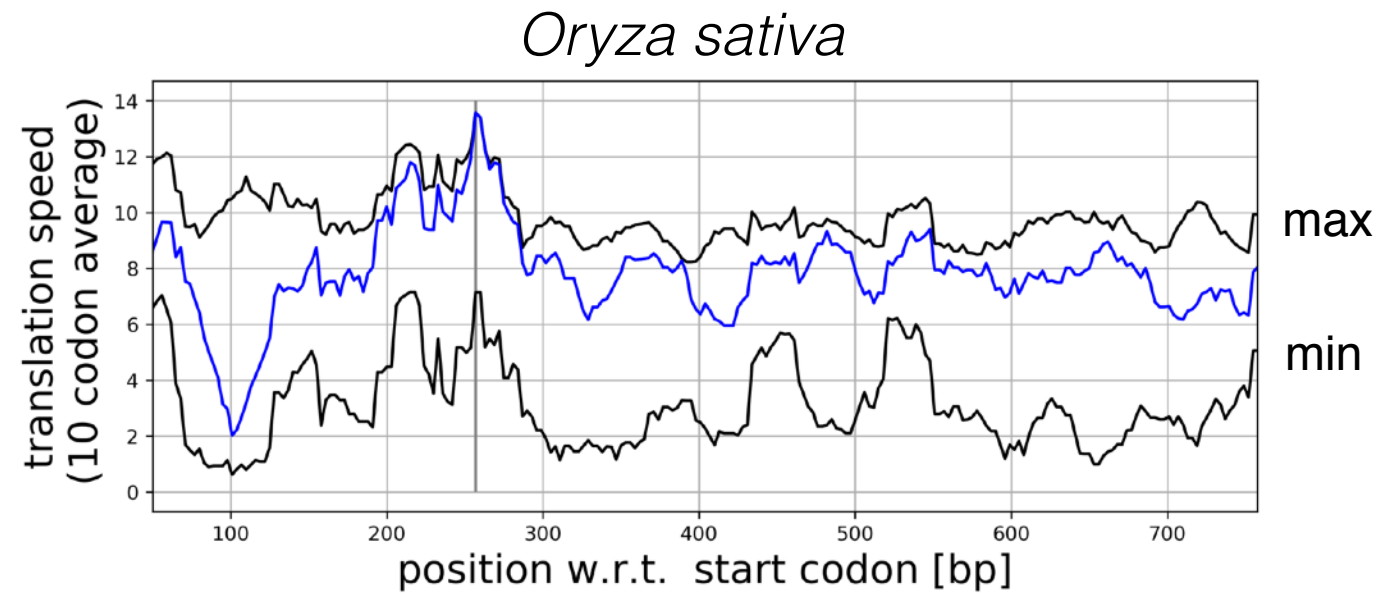
translation speed in ribosomes:



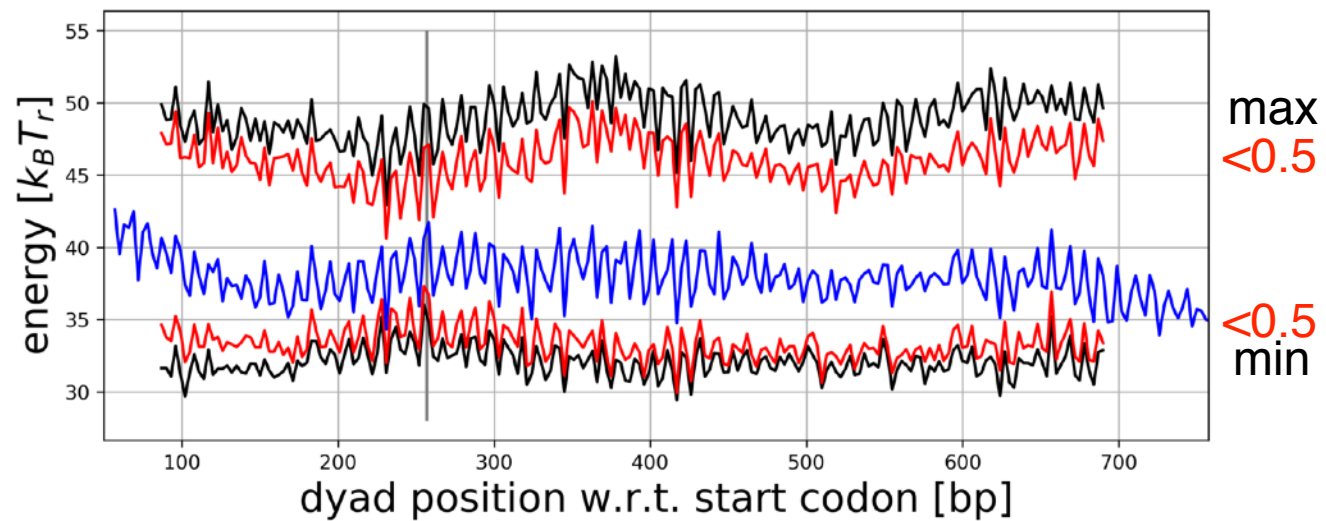


# A third layer: translational speed

Zuiddam, Shakiba, Schiessel, in preparation



codon specific Markov model  
Rudorf, ..., Lipowski, PLoS Comp. Biol. 2014





# THE MECHANICAL GENOME

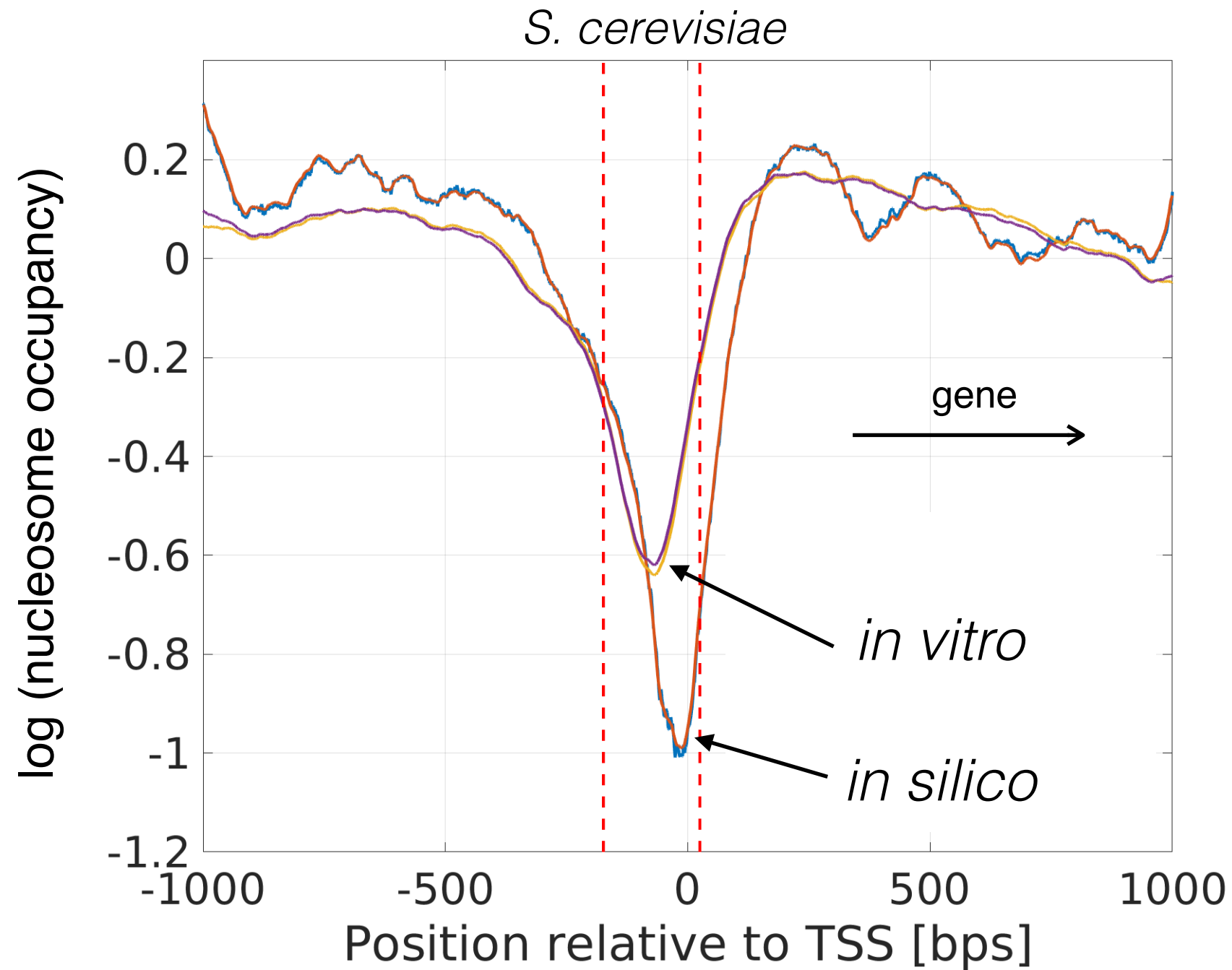


1. Positioning rules are mechanical
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# Nucleosome occupancy around transcription start sites

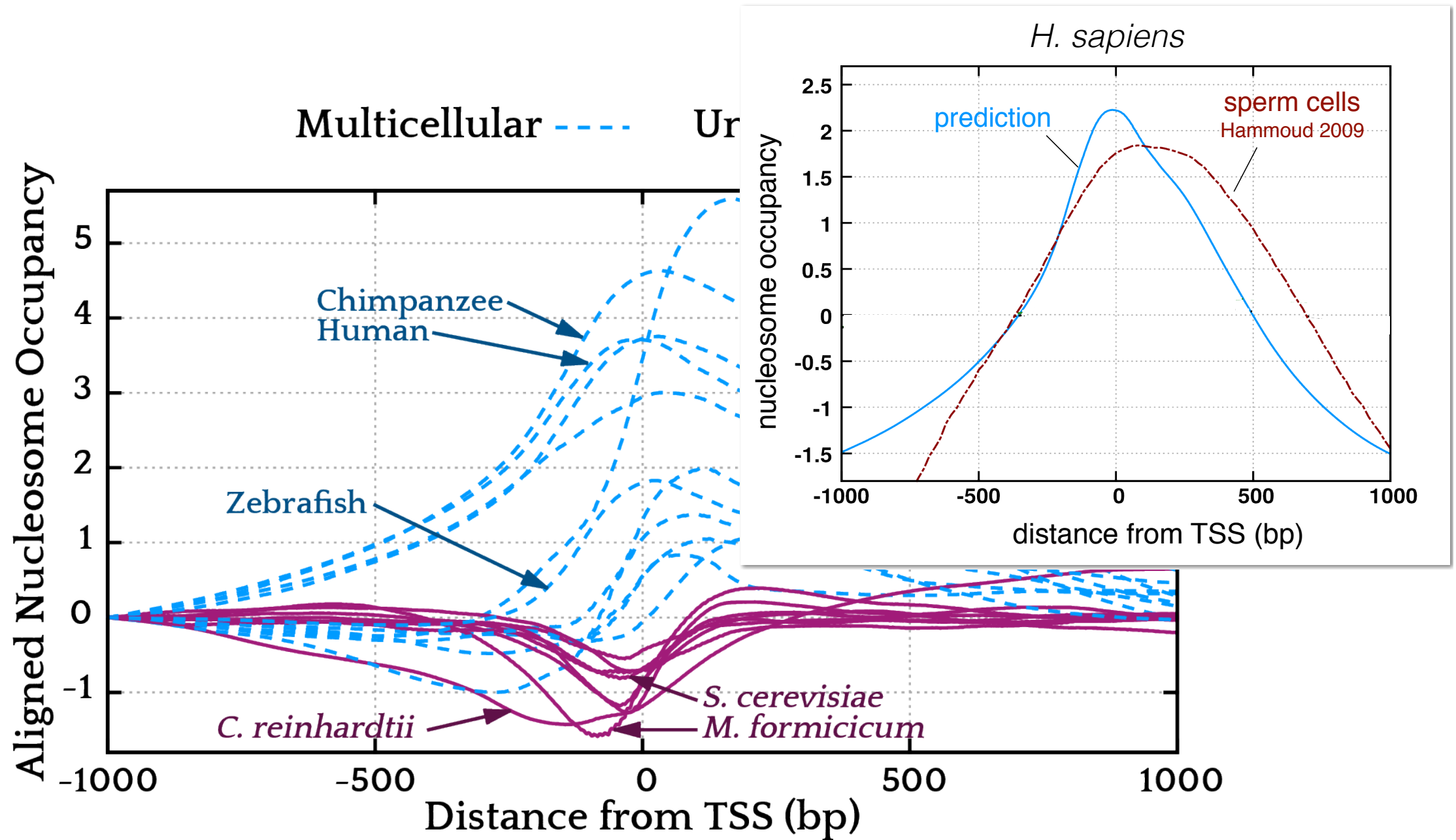
Neipel, Brandani, Schiessel, Phys. Rev. E 101, 022405 (2020)



DNA mechanics keeps promoter regions free of nucleosomes

# A general rule for DNA elasticity

Tompitak, Vaillant, Schiessel, Biophys. J. 112, 505 (2017)

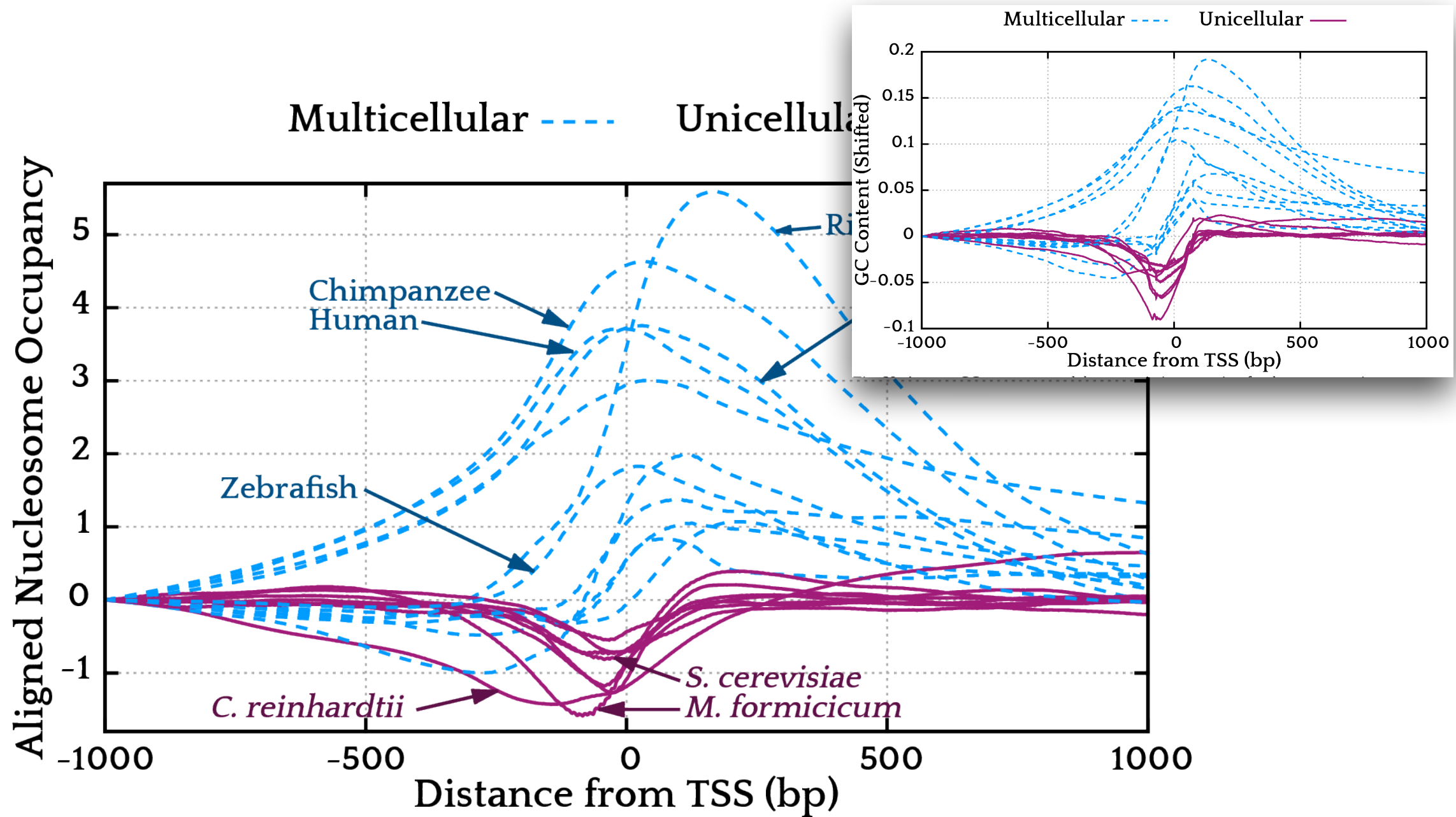


What is the function of the broad peaks in multicellular life forms?  
Transfer of epigenetic information via retention of nucleosomes in sperm cells.

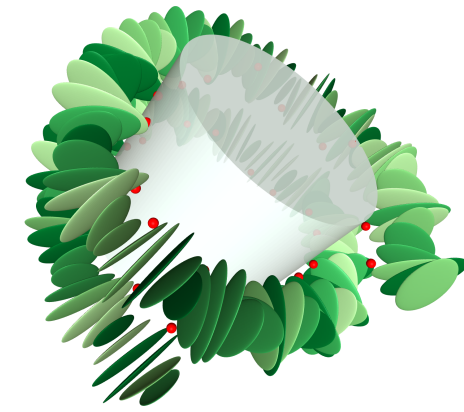
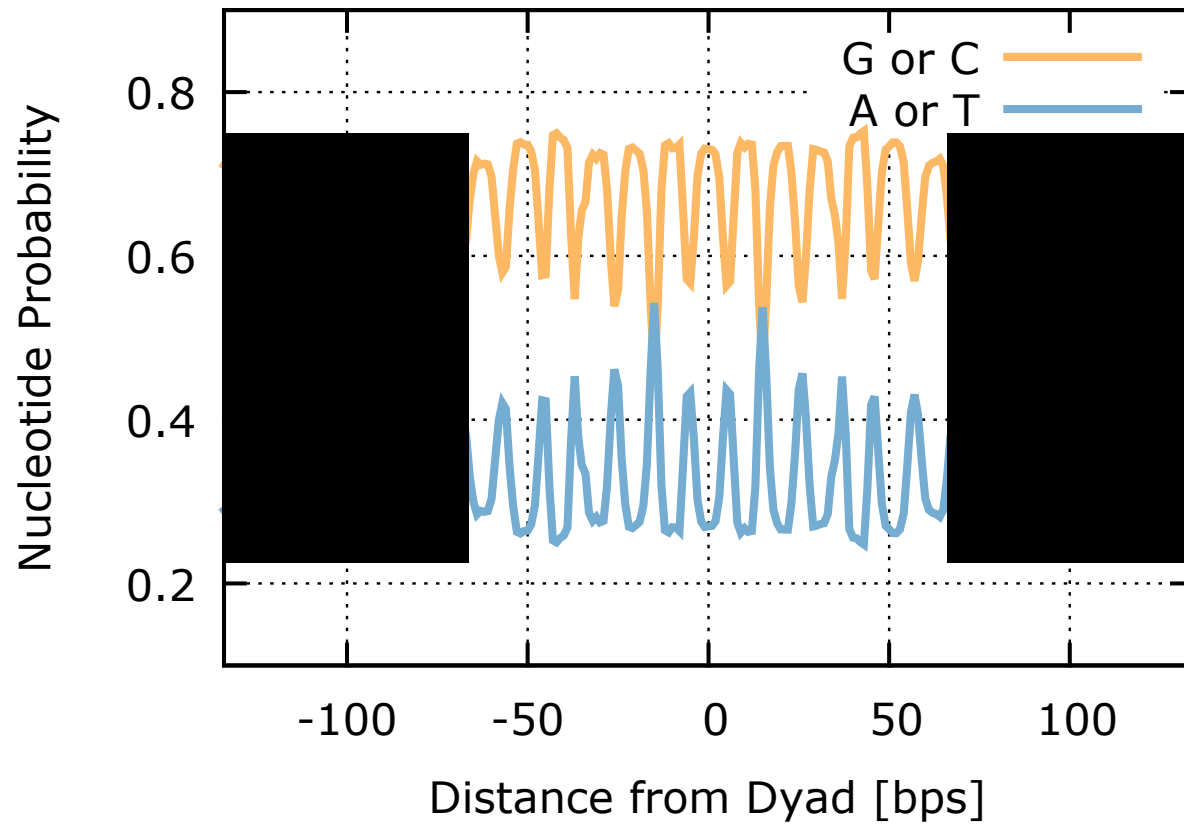


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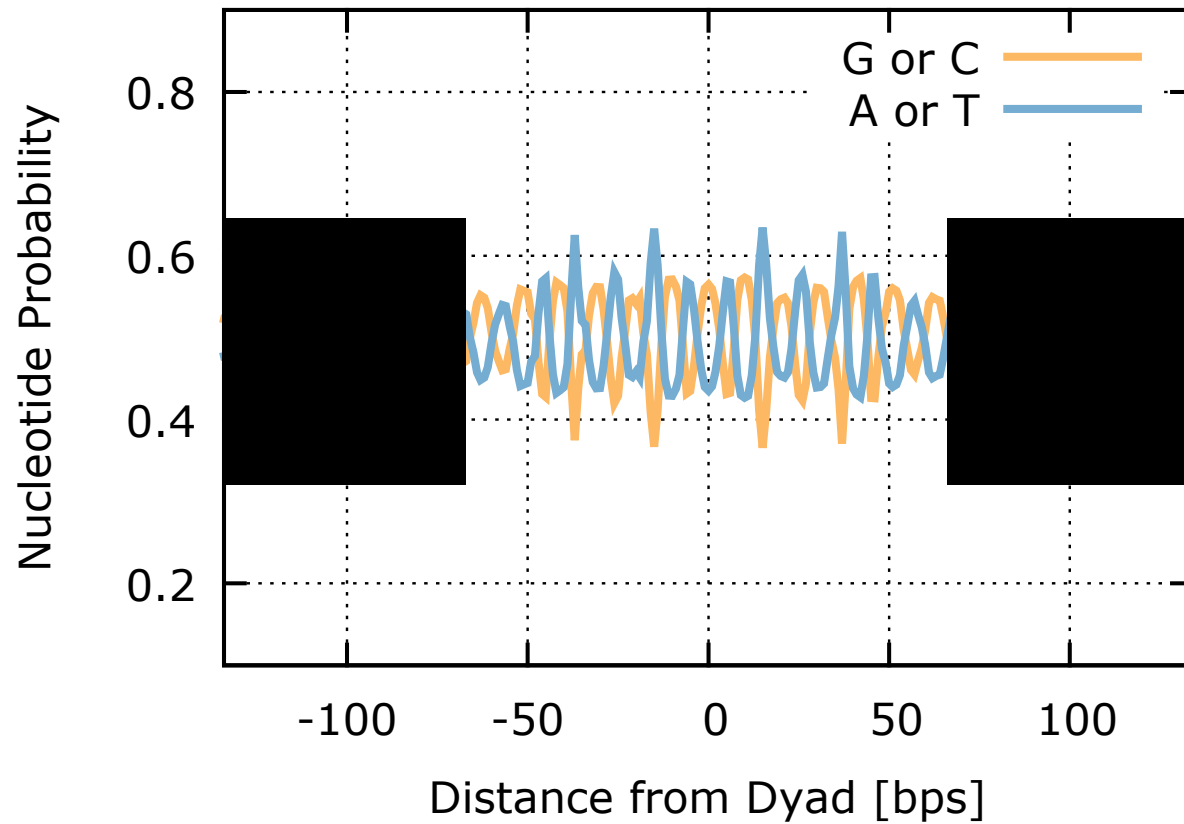


Nucleosome with Linker, Crystal, T=300K



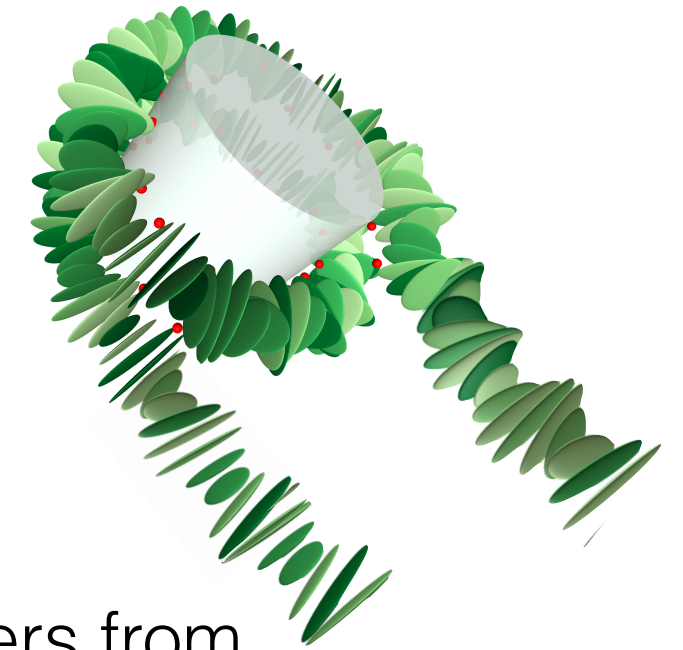
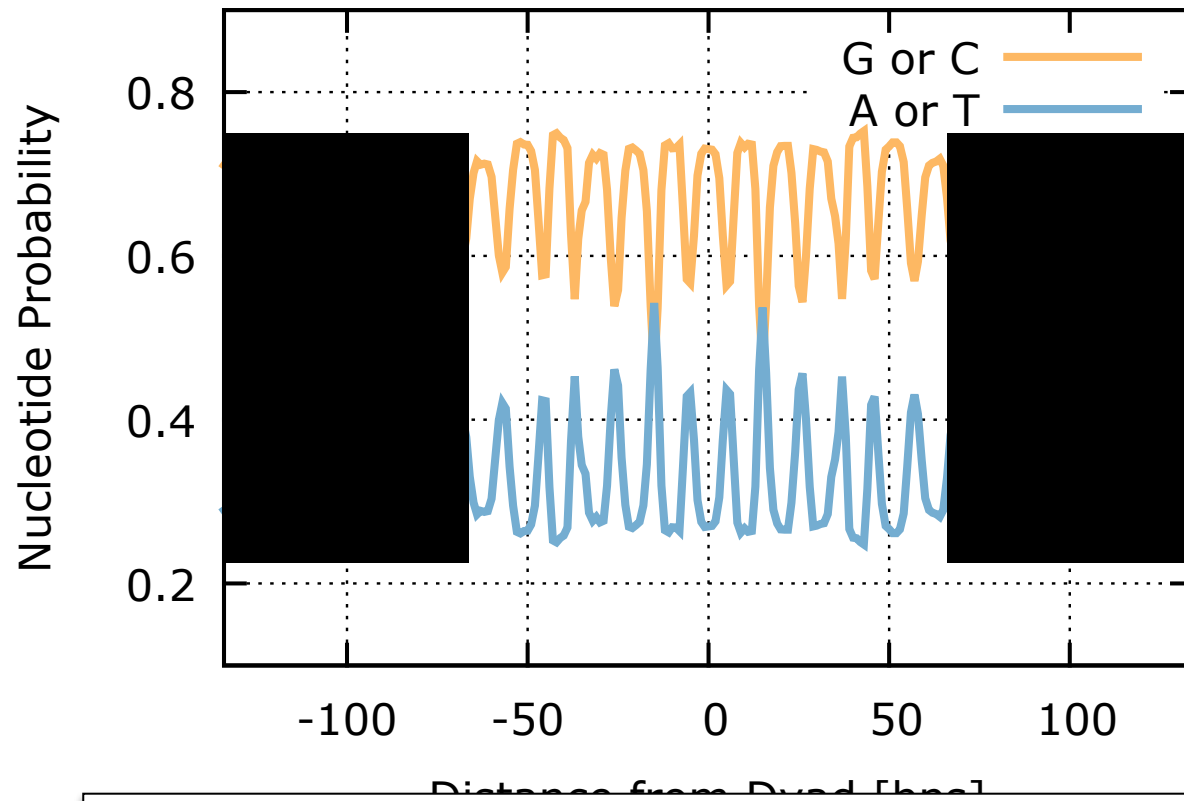
parameters from  
DNA-protein cocrystals

Nucleosome with Linker, Hybrid, T=300K

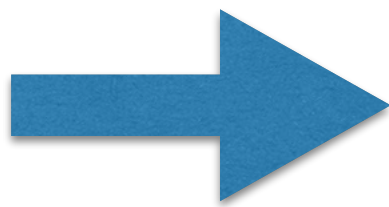


as above but MD stiffnesses  
of oligonucleotides

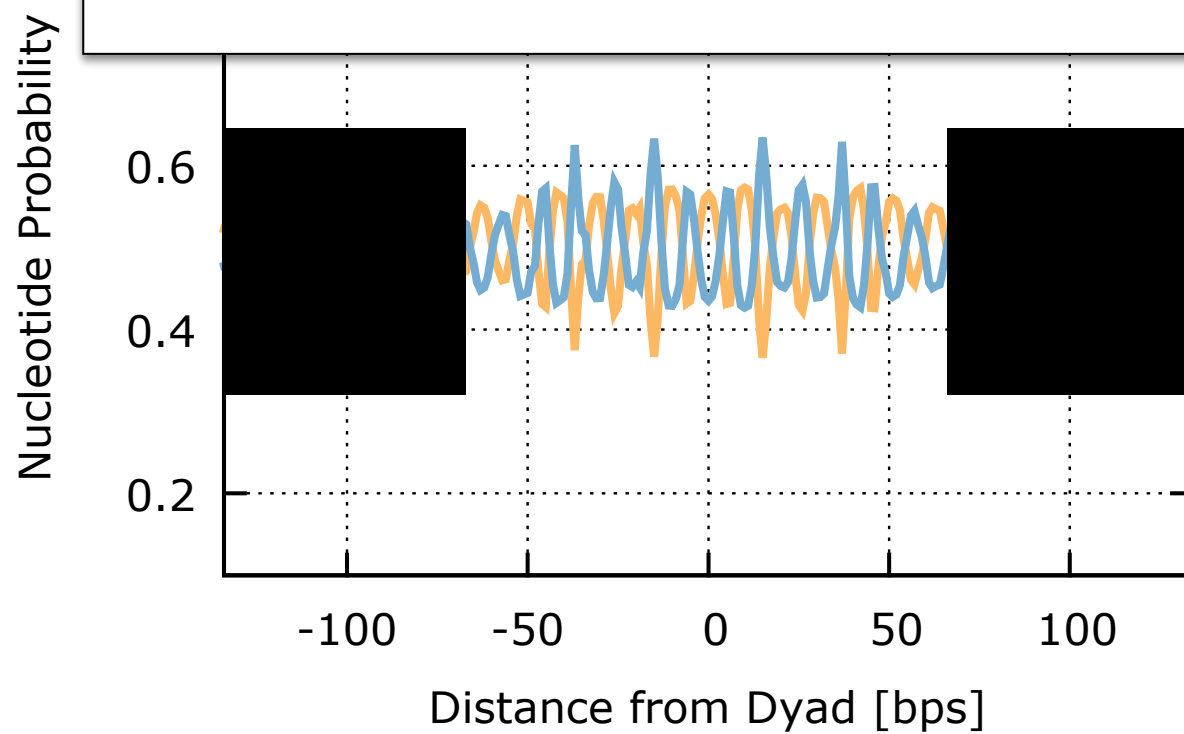
Nucleosome with Linker, Crystal, T=300K



parameters from  
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Rigid basepair model cannot predict  
translational nucleosome positioning

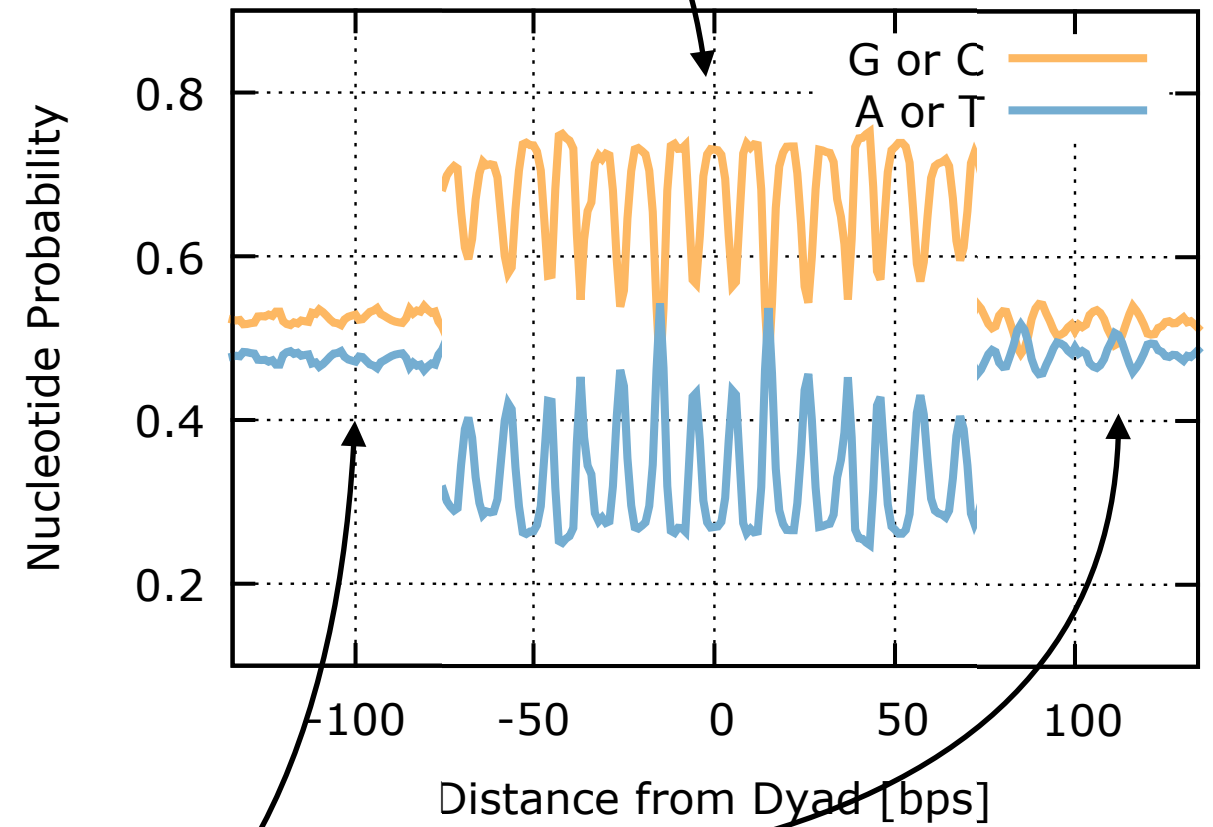
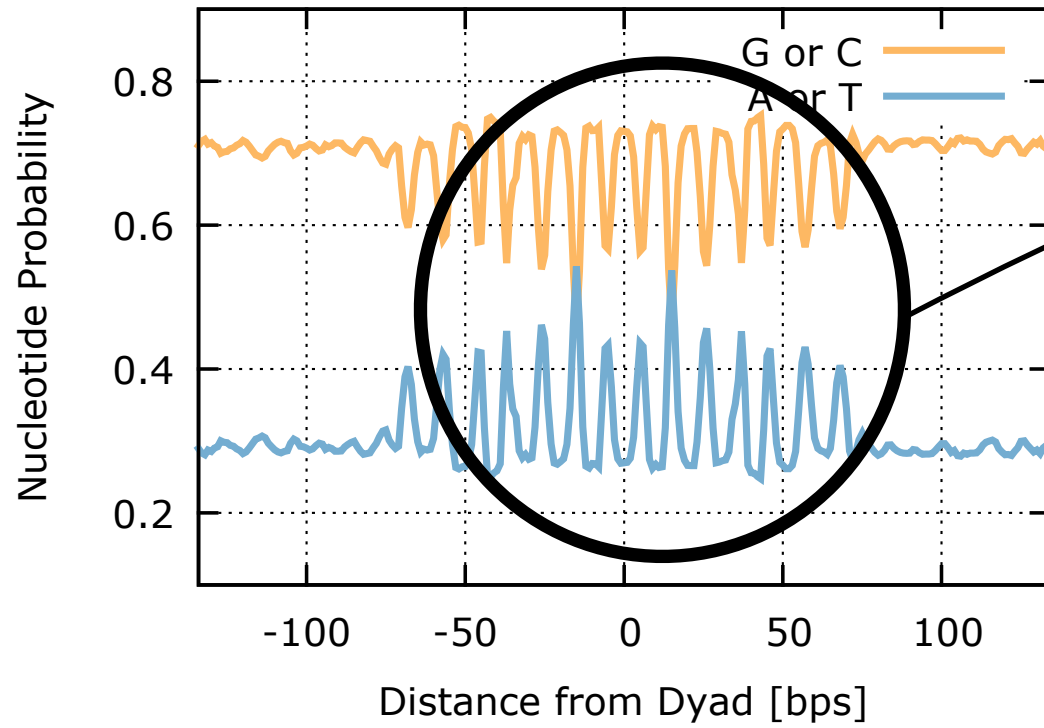


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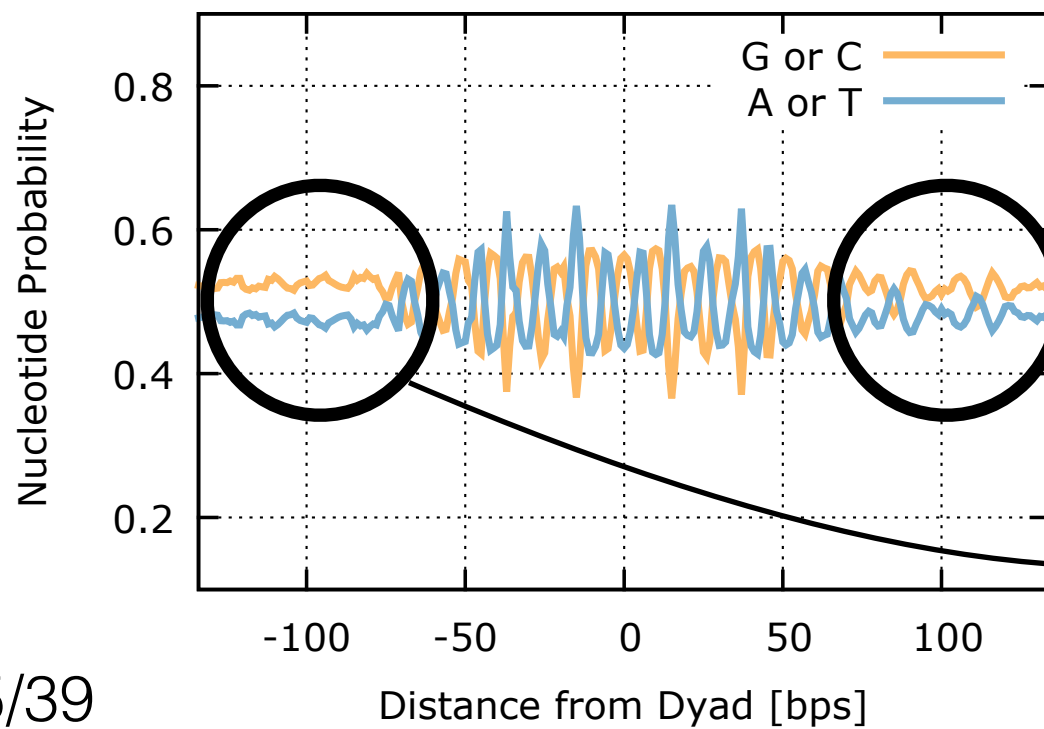
# Multiharmonic model

Neipel, Brandani, Schiessel, Phys. Rev. E 101, 022405 (2020)

Nucleosome with Linker, Crystal, T=300K



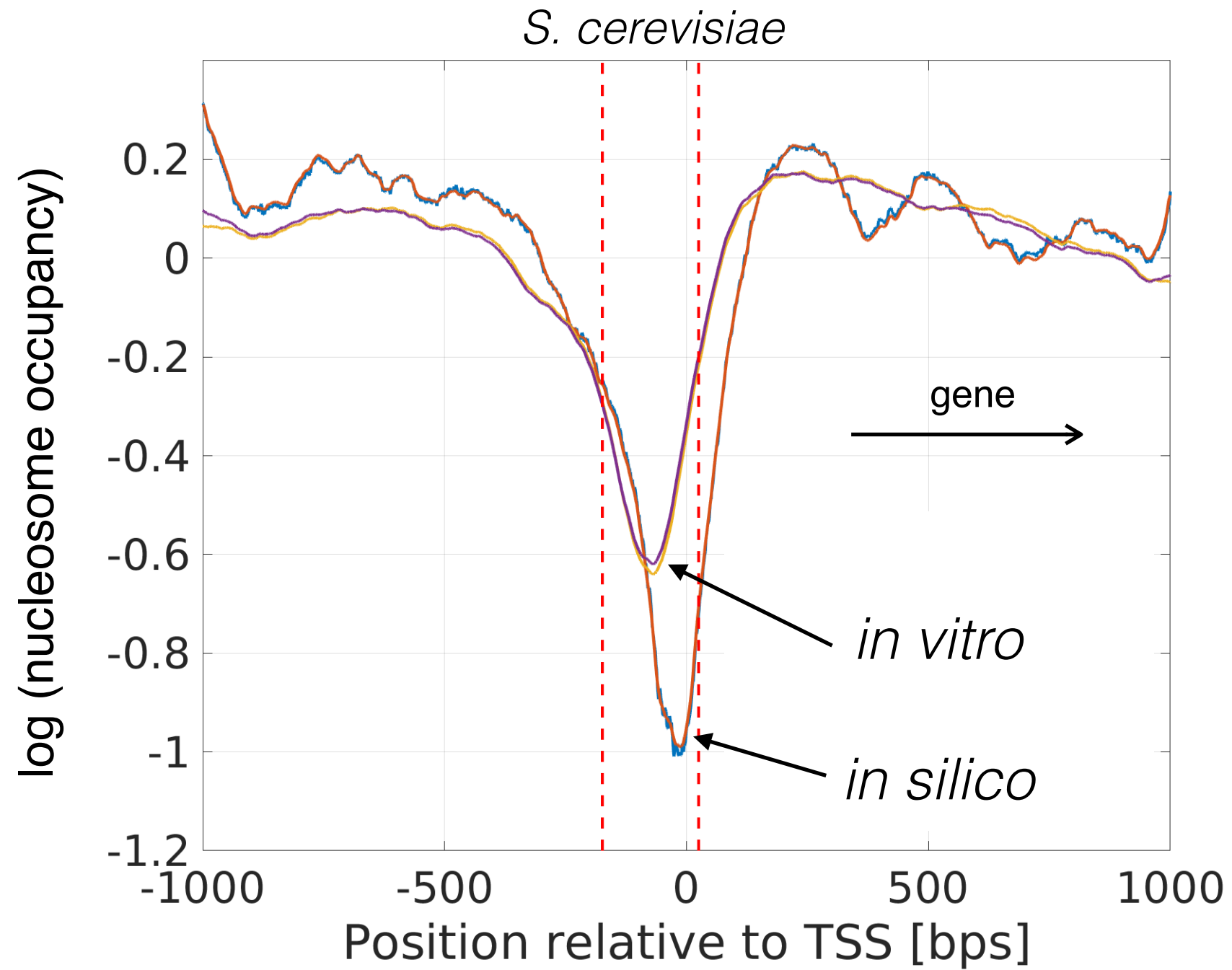
Nucleosome with Linker, Hybrid, T=300K





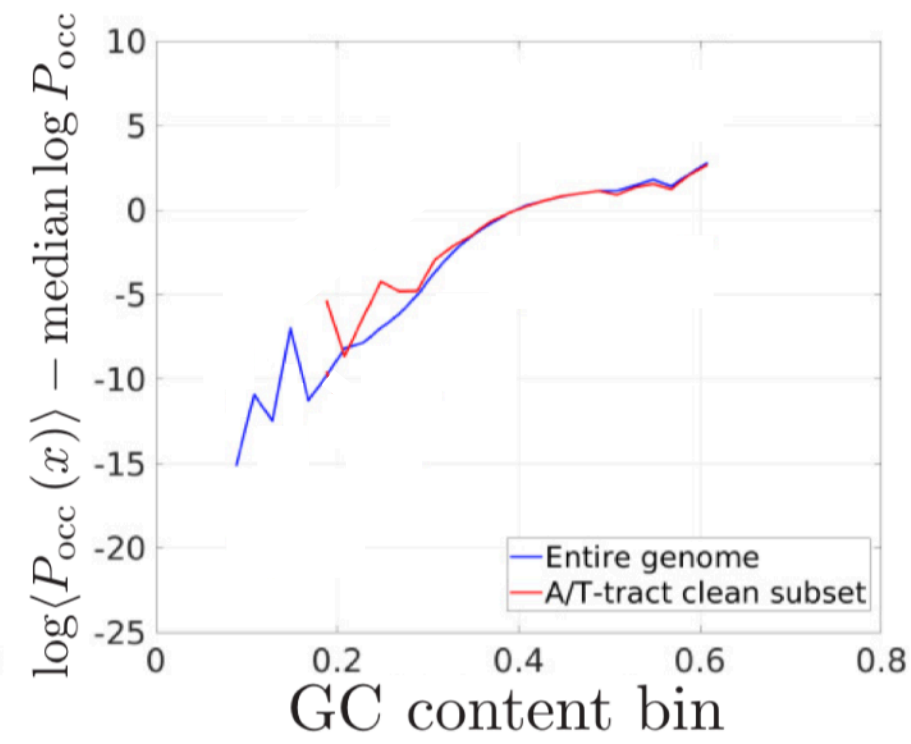
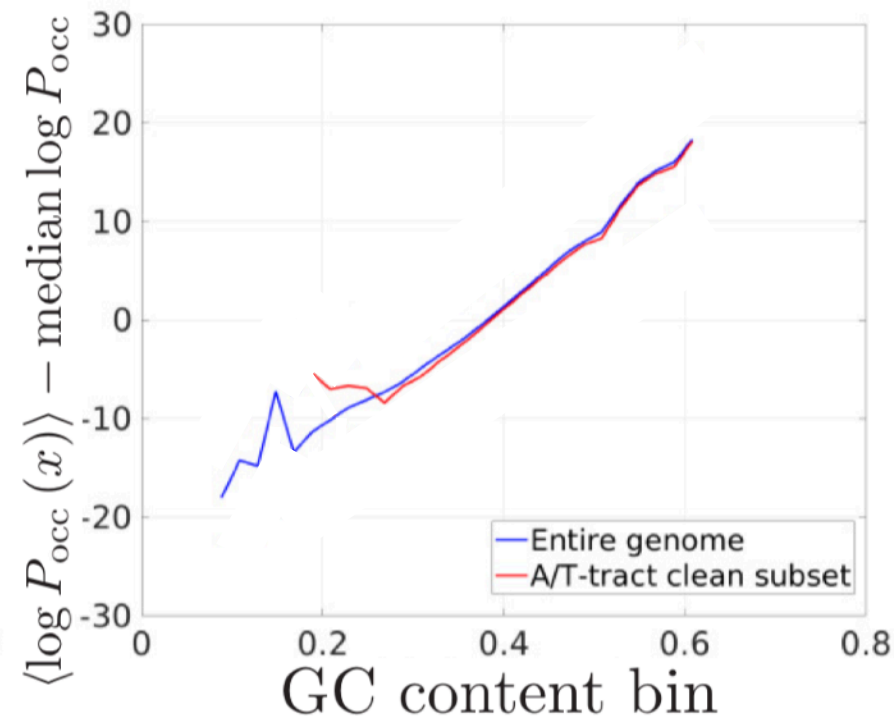
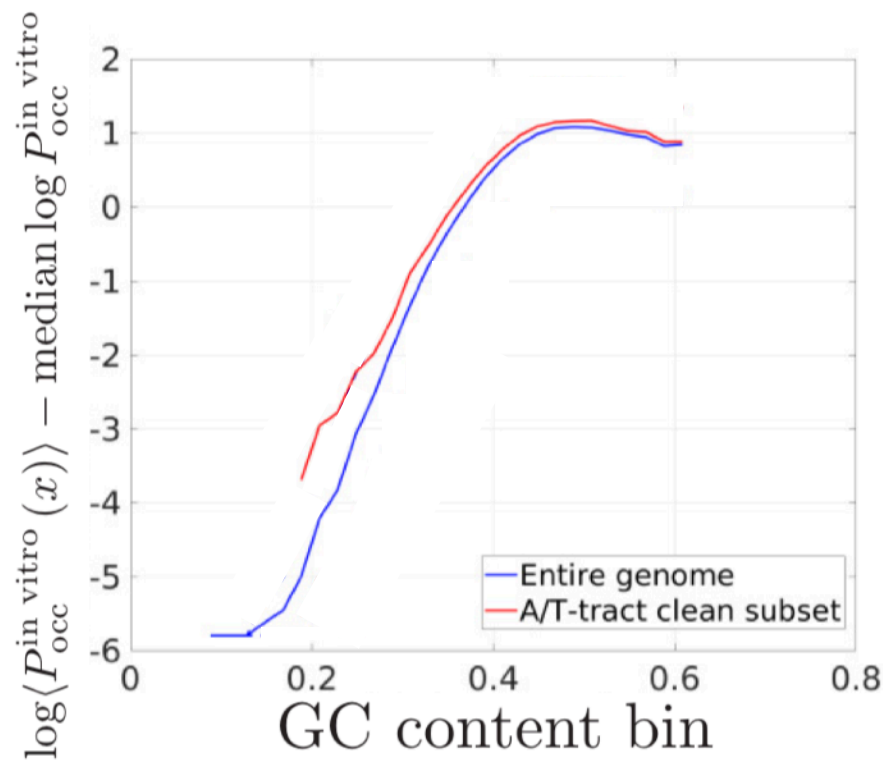
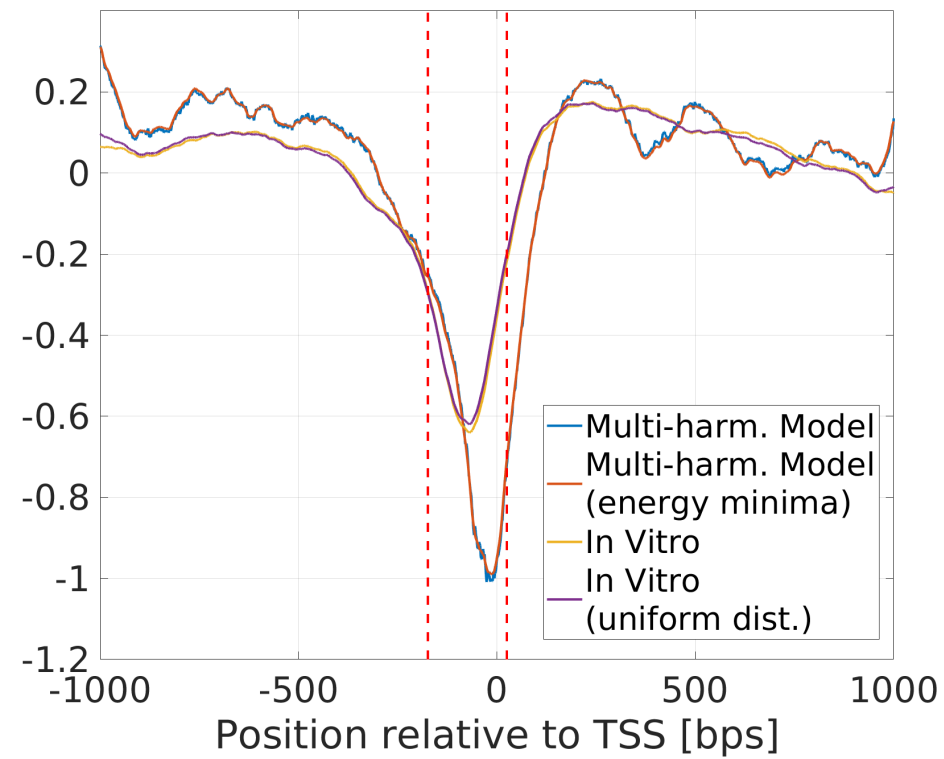
# Nucleosome occupancy around transcription start sites

Neipel, Brandani, Schiessel, Phys. Rev. E 101, 022405 (2020)



# Reconstituted chromatin is not equilibrated

Neipel, Brandani, Schiessel, Phys. Rev. E 101, 022405 (2020)







# THE MECHANICAL GENOME

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# Acknowledgements

Theoretical Physics of Life Processes

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Gerard Barkema  
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**Cédric Vaillant**

**Ralf Everaers**

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Lille Univ

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Tetsuya Yamamoto  
Hokkaido University

Takahira Sakaue  
Aoyama Gakuin Univ.

Shelley Sazer  
Baylor College Houston

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Caltech, Pasadena