cgDNA+ model for DNA minicircles

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- The scientific goal of the thesis is to compute discrete shapes for DNA minicircles.
- This has been done in the past with cgDNAmin and Non-continuous closure of the loop [Manning, 2017].¹
- We adapt cgDNAmin
 - to the more accurate cgDNA+ model [Patelli, 2019] ¹
 - to add periodic closure assumption

¹All references are detailed in the last slide

Plan for today

I will present:

- Basics of cgDNA [Gonzalez, 2013][Petkevičiūtė, 2014]
- Original cgDNAmin [Manning, 2017]
- cgDNA+ [Patelli, 2019]
- Periodic cgDNA+ [Glowacki, 2017]
- cgDNA+min adaptation
- Example of results
- MATLAB scripts & Demo

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cgDNA

[Gonzalez, 2013] [Petkevičiūtė, 2014]

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cgDNA basics

- Rigid base model: each base is represented by a frame in SE(3).
- Gaussian pdf:

$$\rho(w; S, \mathcal{P}) = \frac{1}{Z} e^{-\beta U(w; S, \mathcal{P})},$$

$$U(w; S, \mathcal{P}) = \frac{1}{2} (w - \mu(S, \mathcal{P}))^T K(S, \mathcal{P}) (w - \mu(S, \mathcal{P})).$$

Coordinates:

$$w = (x_1, y_1, x_2, y_2, \dots, x_{n-1}, y_{n-1}, x_n),$$

 $x_i \in \mathbb{R}^6$: *intras*, relative displacement between base frames, $y_i \in \mathbb{R}^6$: *inters*, relative displacement between base pair frames.

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cgDNA coordinates



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cgDNA coordinates





(a) Chain structure of cgDNA coordinates.

(b) Construction of cgDNA stiffness matrix.

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cgDNAmin: Pipeline

cgDNAmin

[Manning, 2017]

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cgDNAmin: Pipeline

Two steps pipeline:

- Continuum equilibria
 - MATLAB pre-processing to obtain continuum coefficients from cgDNA parameters
 - bBDNA software to compute continuum equilibria [Glowacki, 2017]
- cgDNA energy minimization
 - Uses quaternions
 - New coordinates vector

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cgDNAmin: Continuum equilibria

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- MATLAB pre-processing scripts
 - Parameters: Sequence, cgDNA parameter set
 - Output: continuum coefficients for birod model
- bBDNA [Glowacki, 2017]
 - Input: Continuum coefficients for birod model
 - Output: Bifurcation diagram of families equilibrium configurations, including closed loops of different length.

cgDNAmin: Continuum equilibria



Figure: Example of bifurcation diagram outputed by bBDNA. Plot of the Energy versus the applied torque.

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cgDNAmin: Discrete energy minimization

- Uses quaternions
 - 1 quaternion & 1 vector in \mathbb{R}^3 for each base pair
 - Benefits: simple expression for the closure assumption
 - Cost: extra transformation to recover inters
- New coordinate vector

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$$z = (x_1, o_1, q_1, x_2, o_2, q_2, \dots, x_{n-1}, o_{n-1}, q_{n-1}, x_n)$$

• Locally recover original cgDNA inter coordinates:

$$y_{i} := f(o_{i}, q_{i}, o_{i+1}, q_{i+1}) = (\theta_{i}^{1}, \theta_{i}^{2}, \theta_{i}^{3}, \zeta_{i}^{1}, \zeta_{i}^{2}, \zeta_{i}^{3}),$$

$$\theta_{i}^{a} = \frac{10q_{i+1}^{T}B_{a}q_{i}}{q_{i+1}^{T}q_{i}}, a = 1, 2, 3, \qquad \zeta_{i}^{T} = (o_{i+1} - o_{i})R(q_{i+1} + q_{i}).$$

R(q) is the rotation matrix induced by q and B_a are matrices used to form an orthonormal base for the quaternions.

• global transformation w = F(z), Energy $U(z) = \frac{1}{2}(F(z) - \mu)^T K(F(z) - \mu)$

cgDNAmin routines

- Compute cgDNA stiffness & groundstate,
- Read discretized continuum solution,
- Call the fminunc MATLAB routine to minimize the energy U(z),
- Provide explicit gradient and Hessian of U(z),
- Recover original cgDNA coordinates, visualize and save the solution.

cgDNAmin example



(a) 3D view of a solution

(b) 2D coordinates plots

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cgDNA+ model

[Patelli, 2019]

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Add rigid phosphate groups

- Each phosphate is associated to a base
- Phosphate coordinates: relative displacement between the base and the phosphate frames
- New base pair level coordinates

$$\tilde{x}_i = [p^+, x_i, p^-] \in \mathbb{R}^{18}.$$

Exeption for first and last base pair: no external phosphates

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Figure: cgDNA+ structure

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(a) Chain structure of cgDNA+ coordinates.



(b) Construction of cgDNA+ stiffness matrix.

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Periodic cgDNA+

- Introduced to model repeats of a DNA base sequence [Glowacki, 2017].
- Periodic cgDNA coordinates
 ⇒ closed loop !
- Extra set of inter coordinates: inter between base pairs n and 1
- Extra block split in four corners: interactions between bases n and 1



Figure: Periodic cgDNA+ stiffness matrix, the cgDNA case is analogous.

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cgDNA+min

Base algorithm from cgDNAmin

- Change in coordinates
 - cgDNA+ base pair level coordinates
 - New discrete energy
 - Adapt gradient & Hessian
- Initial guess for cgDNA+ coordinates
 - cgDNA coordinates: from birod model obtained with cgDNA parameters (same as in cgDNAmin)
 - Phosphate coordinates: use ground-state coordinates.

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Non-Continuous vs Periodic closures

Two different types of closure:

- Non-continuous closure (NCC): Original closure from R. Manning
 - Models formation of DNA minicircles
 - Use standard stiffness & ground-state
 - Periodic closure (PC)
 - Models fully formed DNA minicircles
 - Use periodic stiffness & ground-state from Glowacki
 - Adapt gradient & Hessian
- Both closure assumptions **do not** model the same physical configuration!

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Model flowchart



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Many examples can be found on the webpage: 5 sequences coming from the experimental literature with length ranging form 94 to 399 base pairs.

- Here: Kahn & Crothers sequence, also studied by Manning, Maddocks and Kahn (1996).
- Containing phased A-tracts \implies strong intrinsic bend

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Example of results



Figure: Bifurcation diagram for the Kahn & Crothers sequence. On the next slides, we show 3D configurations of results for guesses a) and c).

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Results: Kahn & Crothers, guess a)





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(a) NCC cgDNAmin Link: 15, Energy: 35 (b) NCC cgDNA+min Link: 15, Energy: 45

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Results: Kahn & Crothers, guess a)





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(a) PC cgDNAmin Link: 15, Energy: 35 (b) PC cgDNA+min Link: 15, Energy: 47

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Comparison NCC-PC, Kahn & Crothers, guess a)



Figure: cgDNA coordinate difference, NCC - PC. Guess a)

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Comparison NCC-PC, Kahn & Crothers, guess a)



Figure: cgDNA+ coordinate difference, NCC - PC. Guess a) We do not show the difference in Phosphate coordinates as it is very close to zero in all dimensions.

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comparison cgDNA-cgDNA+



Figure: Comparison of Non-continuous (NCC) cgDNA and cgDNA+ models. Difference in the original cgDNA coordinates, Kahn & Crothers c11t15 sequence, guess a).

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Results: Kahn & Crothers, guess c)





(a) NCC cgDNAmin Link: 14, Energy: 84 (b) NCC cgDNA+min Link: 16, Energy: 110

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Results: Kahn & Crothers, guess c)





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(a) PC cgDNAmin Link: 14, Energy: 84 (b) PC cgDNA+min Link: 16, Energy: 117

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Comparison NCC-PC, Kahn & Crothers, guess c)



Figure: cgDNA coordinate difference, NCC - PC. Guess c)

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Comparison NCC-PC, Kahn & Crothers, guess c)



Figure: cgDNA+ coordinate difference, NCC - PC. Guess c).

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Comparison NCC-PC, Kahn & Crothers, guess c)



Figure: cgDNA+ phosphate coordinate difference, NCC - PC. Guess c).

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comparison cgDNA-cgDNA+



Figure: Comparison of Non-continuous (NCC) cgDNA and cgDNA+ models. Difference in the original cgDNA coordinates, Kahn & Crothers c11t15 sequence, guess c).

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Observations

- NCC vs PC
 - Similar in most cases
 - relative difference of the norms of the coordinates vector in the 5% range
 - relative difference in energy in the 1-2% range.
 - cgDNA vs cgDNA+
 - Some cases have very different solutions
 - We suppose it is due to difference in stability: Unstable equilibrium from bBDNA may not converge to the same stable discrete configurations.
 - General observations
 - Link is not conserved between initial guess and final solution.
 - Some cases show negative smallest eigenvalue of the Hessian \rightarrow this need investigation.

MATLAB scripts

Energy_min.m

- Choose sequence
- Choose model (cgDNA or cgDNA+, NCC or PC)
- Input initial guess
- Outputs Discrete energy minimization results

Visualize_solution.m

- Choose sequence
- Choose model (cgDNA or cgDNA+, NCC or PC)
- Input solution from Energy_min.m
- Outputs figures shown in the webpage

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Conclusion

- We have a model for discrete DNA minicircles.
- Input: Sequence, cgDNA+ parameter set, cgDNA parameter set.
- Output: minicircle configurations.

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Point of improvement



Sub-optimal guesses but good enough

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Point of improvement

Replace to compute cgDNA+ configurations



Sub-optimal guesses but good enough

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We tried to improve the initial guesses:

- Continuum coefficient obtained from cgDNA parameters
- Try to use cgDNA+ parameters
- Issue: need to recover separate 18 × 18 positive definite blocks from the stiffness.
 After marginalizing, unable to get consistent positive definite blocks



Thanks for listening!

Any questions?

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Main Resources

- Manning, R. "Notes on cgDNAmin, Discrete-birod DNA Cyclization". unpublished. 2017.
- Patelli, A. S. "A sequence-dependent coarse-grain model of B-DNA with explicit description of bases and phosphate groups parametrised from large scale Molecular Dynamics simulations". PhD thesis. EPFL, 2019.
- Glowacki, J. "Computation and Visualization in Multiscale Modelling of DNA Mechanics". PhD thesis. EPFL, 2016.
- Gonzalez, O. et al. "A sequence-dependent rigid-base model of DNA". Journal of Chemical Physics 138, no. 5 (2013), p. 055122 1-28.
- Petkevičiūtė, D. et al. "cgDNA: a software package for the prediction of sequence-dependent coarse-grain free energies of B-form DNA". Nucleic Acids Research 42, no. 20 (2014), p. e153

The details of all other resources can be found on the thesis provided on the webpage:

https://lcvmwww.epfl.ch/research/cgDNA/beaud/index.html

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