# Stochastic Simulation of Topologically Associating Domains

# Exploring polymer models to explain the appearance of TADs

Ofir Shukron

Ecole Normale Superieure

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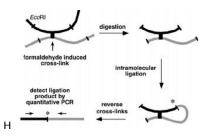
# Chromosome Conformation Capture (3C) and its relatives

A method to simultaneously record millions of looping events occurring within the genome.

The 4C/5C/HiC are all derived from the 3C method and uses a 3C segment library for subsequent steps.

#### The general 3C steps are:

- intact nuclei are extracted from millions of cells
- Formaldehyde induces protein-DNA and protein-protein cross-links
- restriction enzymes digest the cross-linked DNA
- DNA is diluted and ligated
- cross-links are reversed
- OPER to amplify ligation junctions
- histogram of segment encounter is produced



#### The data

- 5C experiments were conducted by Nora et. al 2012.
- A subset of the data, showing X-chromosome self interactions in mouse embryonic stem cells, will be analyzed here.
- The focus is on regions harboring the Xist enhancer and Tisx promoter, related to X inactivation mechanism.
- A total length of 920,432 bp.
- Two replicates of the experiment were made.
- we have the encounter matrix of different segments.

## Topologically Associating Domains (TADs)

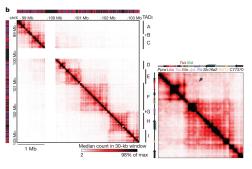
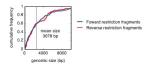


Figure: The 4.5 Mb region analyzed by Nora et al, and TAD D and E regions. Displayed median count in a 30kb window every 6kb

### From restriction segments to beads

• To coarse-grain the data, Luca et. al. chose a bead-length of 3000 bp, corresponding to the mean restriction segment length of EcoRIII enzyme.



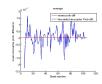
- the genomic section was evenly partitioned by 3000 bp beads. Each segment receives a start and end index according to the beads it covers.
- for example,

bp range	start ind	end ind
500-3500	1	2
4000-4500	2	2
5000-12001	. 2	4

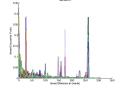
#### Analysis of the data

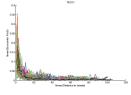
#### TAD D and E

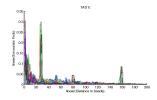
- A total length of 920,432 bp resulting in 307 beads
- We calculate the 'one-sided' encounter probability vs distance (bead units) for each bead
- the mean encounter probability difference, shows that the data is left-right symmetric



the encounter data showed







- TAD E has several strong specific interactions.
- TAD D has almost no specific interactions.

#### Peaks of the encounter data

- About half of the peaks in the encounter data result from specific interactions between TADs
- The other half comes from specific internal interactions of TAD E.
- To get an impression, a manual marking of the peaks shows

Bead numbers	Encountered beads	TAD
23-26	280-290	$D \leftrightarrow E$
49-53	148-155	$D \leftrightarrow E$
56-59	80-90	$D \leftrightarrow D$
115-117	165-170	$E \leftrightarrow E$
161-162	187 190	$E \leftrightarrow E$
182-184	260-264	$E \leftrightarrow E$
185-186	253-255	$E \leftrightarrow E$
234-236	184-189	$E \leftrightarrow E$
234-236	4-11	$E \leftrightarrow D$
243	88	$E \leftrightarrow D$
264	89-90	$E \leftrightarrow D$
274-277	113-120	$E \leftrightarrow E$

We start with the classical and most simple model, the Rouse chain.

- A Rouse chain describes polymer dynamics as a stochastic motion of a collection of microscopic "beads" connected by harmonic springs
- the 3D motion of bead n in the chain of N beads

$$\frac{dR_n}{dt} = -\frac{3D}{b^2}(2R_n(t) - R_{n+1}(t) - R_{n-1}(t)) + f_n(t)$$

- $R_{n}$  the position of bead n
  - b- the standard deviation of the distance between adjacent beads
  - D- the diffusion constant
  - $f_{n-}$  white Gaussian noise
- ullet From the theory,  $Pr(\|R_n-R_m\|<\epsilon)\sim |n-m|^{-1.5}$

### Simulation with simple rouse chain

- we first check whether a simple model can produce the TADs.
- we examine the results of simulating chain of 64 beads

Loops corresponding to the peaks of the encounter data

### Dynamic Loop Model

- some beads in the same TAD have affinity toward one another
- ullet affine beads located within a distance less than  $\epsilon$  (the encounter distance) are connected
- ullet the rate of disconnection between beads is  $k_{off}$

Dynamic loops model with beads affinity

Enlarging the encounter distance

### 3C experiment with stiff connectors

Next, we simulate 64 bead chains with stiff connectors. Stiff connectors are Rouse spring that stay fixed.

### Future perspective

• A model with variable encounter distance

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