

# Chromatin reconstruction and dynamics using random Loops accounting for Chromosome Capture data

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September 30, 2014

## Abstract

**Keywords:** Modeling, Inverse problem, First passage times,

## 1 Introduction

[Unfinished]

The spatio-temporal organization of the chromatin plays an essential role in the regulation of sub-cellular activity such as gene expression[1].

3d structure of the Igh locus was suggested by [5] after tagging several position along the loci.

## 2 Experimental data and Methods

### 2.1 The experimental data

We used the experimental 5C data generated by Nora et al.[6] for the chromosome contact frequencies of the X chromosome in a 4.5 Gb region encompassing the X inactivation center. In our work we focused on a subset of

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the data, including a 94,082 bp region, termed TAD D and E (see [6]). Two replicates of the experiments were conducted. In our analysis we use the average of these two experimental replicates.

The encounter histograms generated by the 5C experiments describes the contact between genomic loci of variable sizes over millions of nuclei. To map these contact into uniform sized segments, we followed data coarse-graining as described in [4], to map segment encounter frequencies to that of evenly spaced, equal size beads. A bead size of 3000 bp was chosen according to the mean size of restriction segments resulted by HindIII enzyme digestion, used in the process of the 5C experiments [6] [4] (Supplementary Materials). This choice of bead size resulted in coarse-grained polymer of 307 beads.

The coarse-grained pair-wise bead encounter frequencies includes 14,509 data points and was used to calculate the bead encounter probability as a function of the distance in beads units. For each bead, equidistant encounter frequencies were averaged, and the resulting encounter frequency signal was divided by the total number of encounters, to get the encounter probability as a function of bead distance.

For each bead  $n = 1..N$  we fit the experimental encounter probability signal with a function of the form

$$p_n(d) = \alpha_n d^{-\beta_n} \quad (1)$$

with  $p_n$  the encounter probability of bead  $n$ ,  $\alpha_n = \frac{1}{\sum_{j=1}^k j^{-\beta_n}}$ ,  $d$  is the distance in bead units, and  $\beta_n$  is a parameter to be determined by the fitting procedure.

## 2.2 The polymer model

To explore the different polymer conformations that can explain the appearance of the TADs, we chose to use the Rouse chain. The Rouse chain describes the dynamics of a linear polymer as a collection of massless beads connected by harmonic springs and driven by the thermal forces of diffusion. The system of stochastic differential equations describing the time progression of a chain of  $N$  beads is given in the 3-dimensional case by

$$\frac{dR}{dt} = -\frac{3D}{b^2}KR + \sqrt{2D}\frac{dW}{dt} \quad (2)$$

where,  $R(t) = [R_1(t), R_2(t), \dots, R_N(t)]^T$  describes the 3D coordinates of  $N$  beads at time  $t$ ,  $D$  is the diffusion constant,  $b$  is the standard-deviation

of the distance between adjacent beads of the chain,  $W$  is an independent  $N \times 3$  Brownian motion with mean 0 and variance 1 in each component, and  $K$  is the Kirchhoff bead connectivity matrix, which reflects different chain connectivities.

We have constructed our polymer model to have  $L$  loops of random sizes. To form each loops, we have randomly chosen 2 non-neighboring beads and altered the connectivity in the Kirchhoff matrix, with the condition that no bead can participate in the formation of more than one loop.

## 2.3 Simulations

Throughout simulations, for each fixed number of loops, the chosen beads to connect varied randomly. Such a choice was made to refer to the heterogeneity if the spatial organization inside TAD between cells, even in the same cell phase [6].

Simulations were always carried out until the chain's relaxation time, in which point any two beads were determined to have encountered if their distance at the end of the simulation satisfied  $|R_j - R_k| < \epsilon < b$ , ( $j \neq k$ ). The chain's relaxation time is given by the slowest mode of the linear chain

$$\tau = \frac{b^2}{12D \sin(\frac{\pi}{2N})}$$

for which the number of simulation steps performed is  $\frac{\tau}{\Delta t}$ . The time step,  $\Delta t$  was set so to prevent simulation 'blow-ups' by demanding that the quotient of the norms of beads position at two subsequent time steps would be smaller than unity, which resulted in  $\Delta t < \frac{b^2}{12D}$ .

For each tested polymer connectivity we constructed the bead encounter frequencies histogram and derived the bead encounter probability from it. The bead encounter probability was then fitted similarly to the fitting in eq. 1.

For a linear Rouse chain with nearest neighbor interactions, the expected value of  $\beta$  is 1.5 [3]. We interpret  $\beta < 1.5$  as long range interaction resulting from non nearest-neighbor bead interactions. Because the addition of non-neighboring connections to the linear chain can only increase the long range encounter probability, we have focused on interpreting the fitted values in the range  $\beta < 1.5$ .

## 3 Results

### 3.1 Analysis of the experimental data

To evaluate the mean encounter probability in the experimental data, we have calculated the  $\beta$  value for the 3 cases of TAD D, TAD E and TAD D+E for each of the beads in those genomic region. This provides us with a basis for comparison of the results of simulations with the experimental data and to the inference on the spatial organization of the chromosome.

The calculation of  $\beta$  for each bead in the case of TAD D+E resulted in a pattern which was correlated with the significant long range interactions (Figure ?? lower panel), represented by the peaks the encounter probability graph (Figure ??, upper panel). Indeed, the mean  $\beta$  value was 0.729, which is well below the expected value for the linear Rouse chain (Figure ?? upper panel).

We then turned to examine whether long range interactions stem from inter or intra-TAD polymer looping. As can be seen in Figure ?? upper panel, TAD D has almost no significant long range interactions, although the mean fitted  $\beta$  value was 0.71, which indicates either packed organization of TAD D or heterogeneity of the location of loops within the cell population examined in the HiC experiments. Intra-TAD long range interaction within TAD E contribute about half of the significant long range encounter peaks in the encounter probability graph (Figure ?? upper panel), whereas the other half stem from inter-TAD long range interactions.

Given the calculation of the  $\beta$  values from the experimental data we now turn to explore which polymer architecture give rise to the observations.

### 3.2 Random fixed loops simulations

To examine if fixed loops in the polymer can recreate the TADs, we have placed connection between beads corresponding to the peaks of the encounter probability and simulated our model to relaxation time. In a 307 beads polymer, these fixed loops were insufficient to recreate a TAD-like structure. Only localized nearest neighbors interactions emerged by this model (Figure 2) which cannot account for the observed long range interaction map.

Although these fixed loops are insufficient by themselves to create the encounter maps expected, we noticed that on the boundaries of TADs there is a tendency to find high peaks. We have postulated that these peaks, which

connects the two boundaries of a TAD, are of significance to the spatial organization and the functionality of regulatory elements within the TAD. We therefore examined the encounter probability of a polymer having a large fixed loop between two predefined ends.

Furthermore, to reflect the heterogeneity in the spatial organization of the chromatin of cells in the HiC experiment [2] [6], we have added loops between randomly chosen beads on the linear chain between the two boundaries we have determined for the big loop (see Figure 3).

Increasing the number of internal random loops from 1 to 10, we see an encounter pattern which resembles that of a TAD (Figure 3).

Next, we added a second, adjacent region, to form a loop, and sequentially added 1 to 10 internal random fixed loops in each. (Figure 4 )

## 4 Discussion

## 5 Figure

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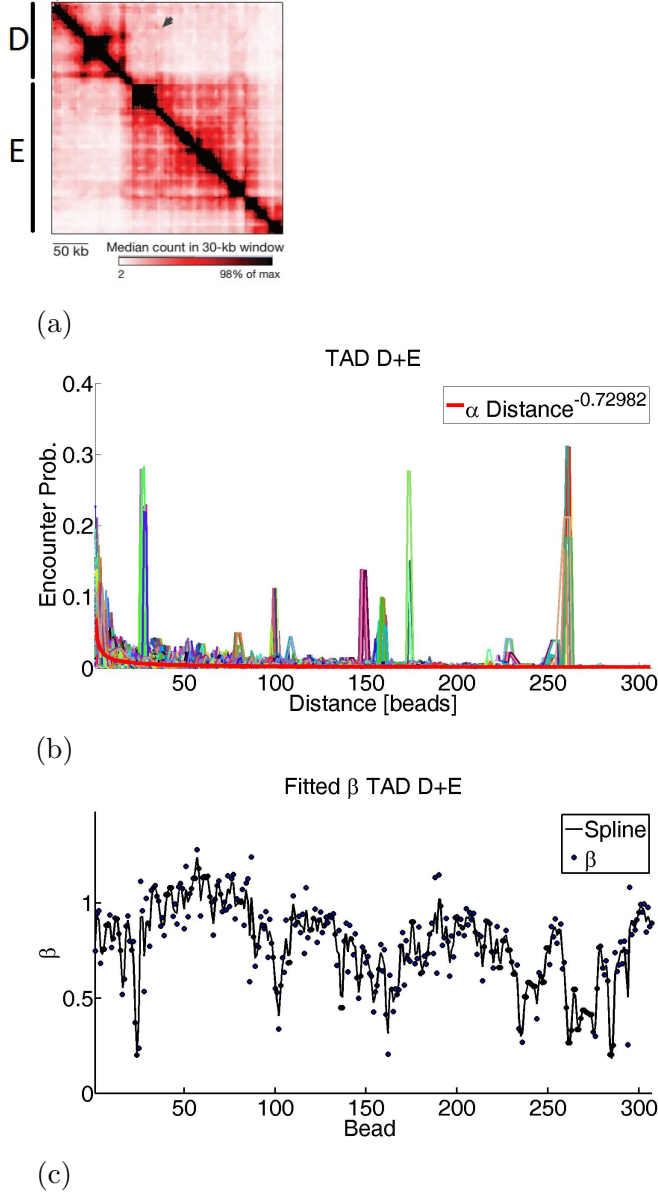


Figure 1: **Analysis of the experimental data** (a) Result of 5C experiments in regions termed TAD D and E (Nora et al [6]) shows an increased intra-TAD encounters (b) Calculation of the encounter probability after coarse graining of the data into equal size beads, shows irregular long range interactions corresponding to beads in TAD E and between TAD D and E, the mean model fit of the form  $\alpha \text{Distance}^{-\beta}$  (red line) was found to  $\beta = 0.729$ , well below the expected  $\beta = 1.5$  for a linear Rouse polymer with nearest neighbor interactions (c) the calculated  $\beta$  value for each of the 307 beads shows a pattern aligned with the peaks of the encounter data

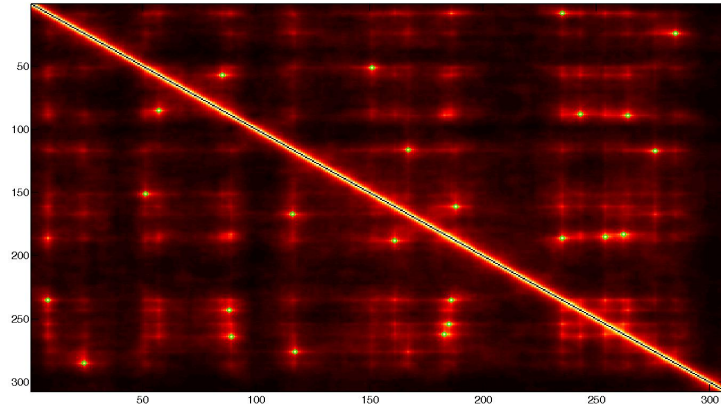


Figure 2: **Simulation of a chain with loops at positions corresponding to the peaks of the encounter data** is insufficient to create an encounter histogram resembling the appearance of two TADs as in the results of the 5C experiment (Figure 1 a)



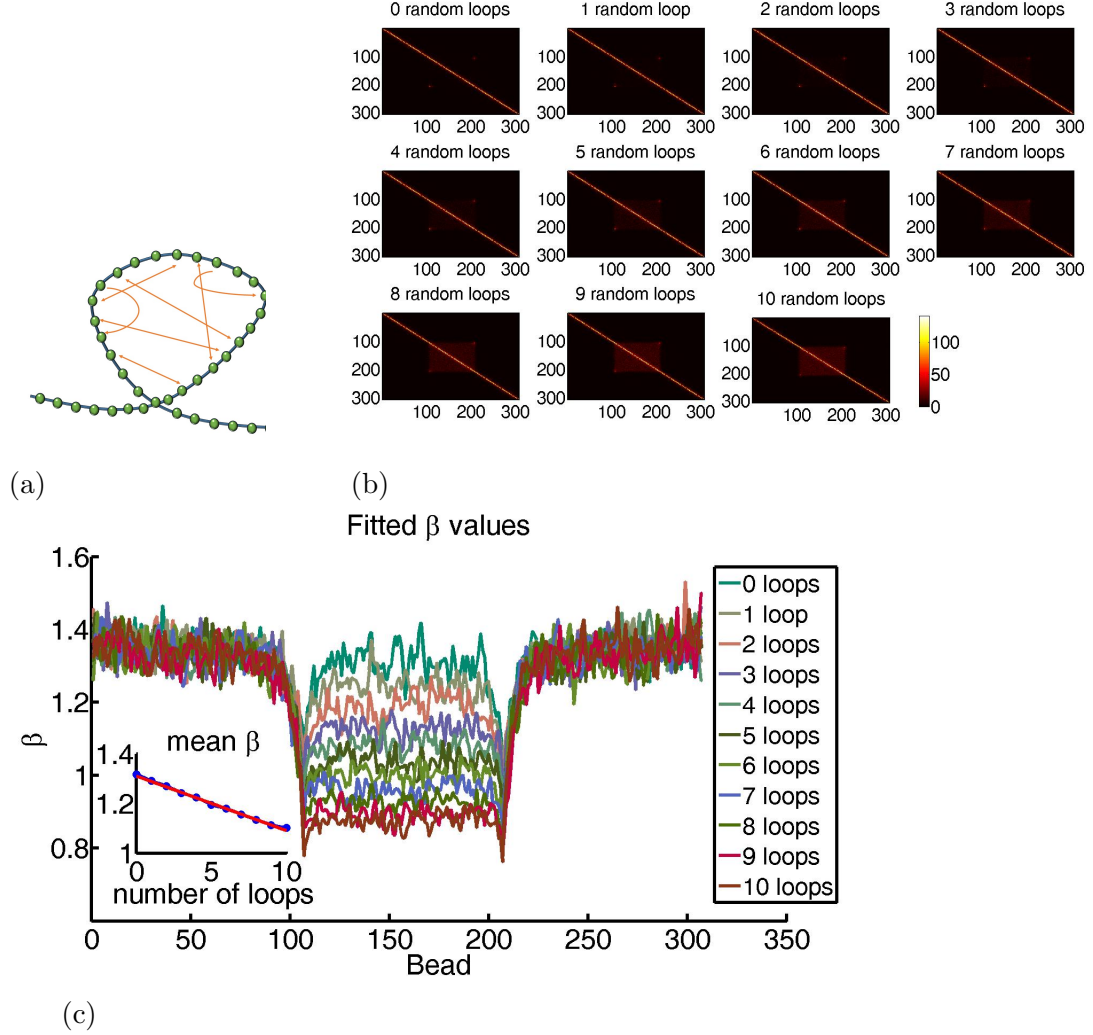


Figure 3: Encounter profile for a polymer model with one TAD and 0-10 random internal loops. (a) a sketch of the polymer model used in simulations, bead 107 and 207 were connected to form a 100 beads loop, 0 to 10 internal loops were sequentially added in positions chosen by randomly picking two beads in the loop, as an example shown by the orange arrows (b) beads' encounter histograms for the case of 0 to 10 internal loops show the appearance of a TAD in the central region of the polymer corresponding to the position of the fixed big loop (c) the encounter probability of the form  $\alpha d^{-\beta}$  was fitted for each of the 11 cases, the  $\beta$  values, the mean  $\beta$  value shows a linear decrease with the number of random loops (inner axes).

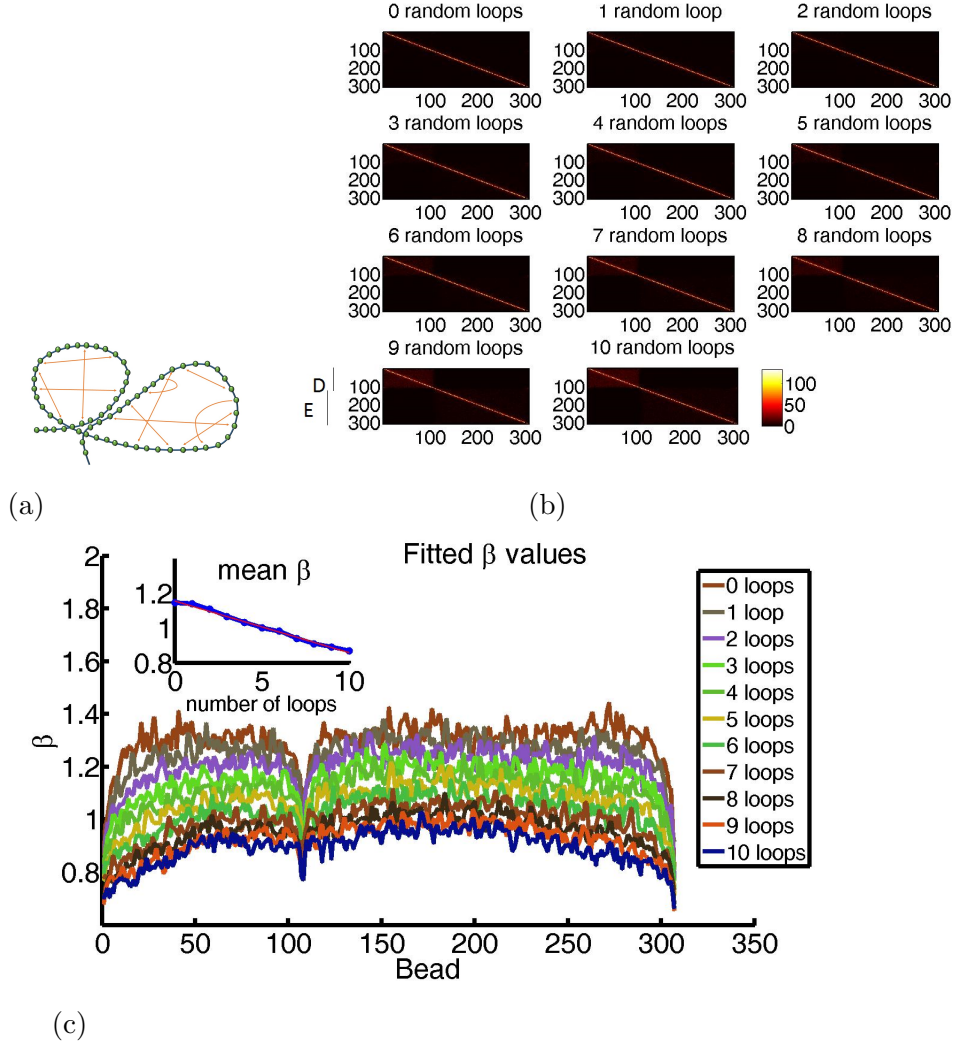


Figure 4: **Encounter profile for a polymer model with two TADs and 1-10 random internal loops in each** (a) a sketch of the polymer model used in simulations, beads 1, 107 and 108, 307 were connected to form two large loops corresponding to the positions of TAD D and E in the experimental data. One to 10 internal loops were sequentially added in each large loops, loop positions were chosen by randomly picking two beads in each large loop, as an example shown by the orange arrows (b) beads' encounter histograms for the case of 0 to 10 internal loops show the appearance of two TADs (c) encounter probability function of the form  $\alpha d^{-\beta}$  was fitted for each of the 11 cases, beads in the edge between the two big loops show sharp decrease in  $\beta$  due to the high long range encounter frequency with beads in both TADs. The mean  $\beta$  value shows a linear decrease with the number of random loops (inner axes)