

Inter-chromosomal interaction analysis based on population 3D genome modeling

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Genome architectures revealed by tethered chromosome conformation capture and population-based modeling

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Population-based 3D genome structure analysis reveals driving forces in spatial genome organization

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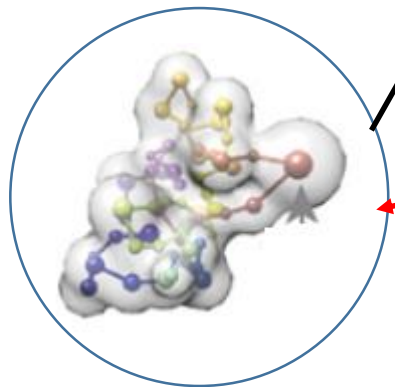
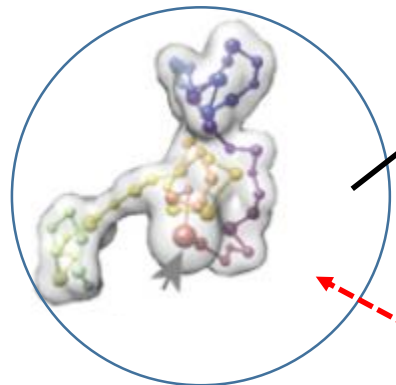
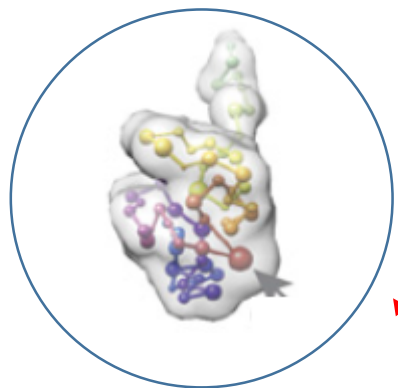
OPEN

Mining 3D genome structure populations identifies major factors governing the stability of regulatory communities

Chao Dai^{1,*}, Wenyuan Li^{1,*}, Harianto Tjong^{1,*}, Shengli Hao¹, Yonggang Zhou¹, Qingjiao Li¹, Lin Chen¹, Bing Zhu², Frank Alber¹ & Xianghong Jasmine Zhou¹



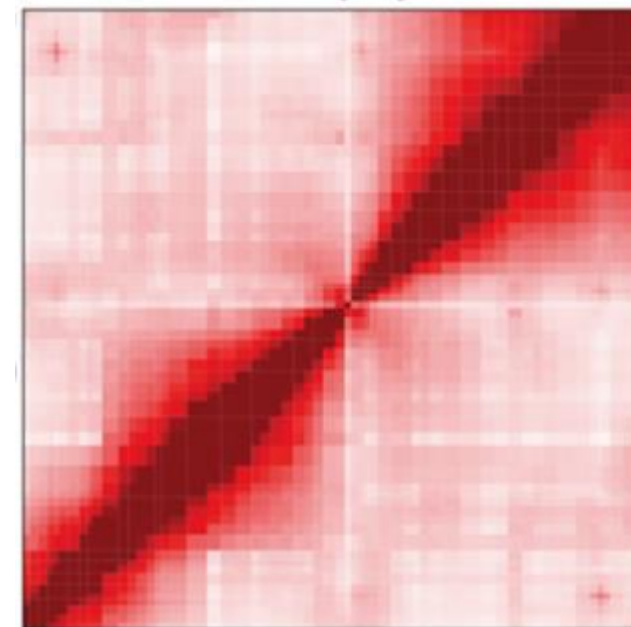
cell populations



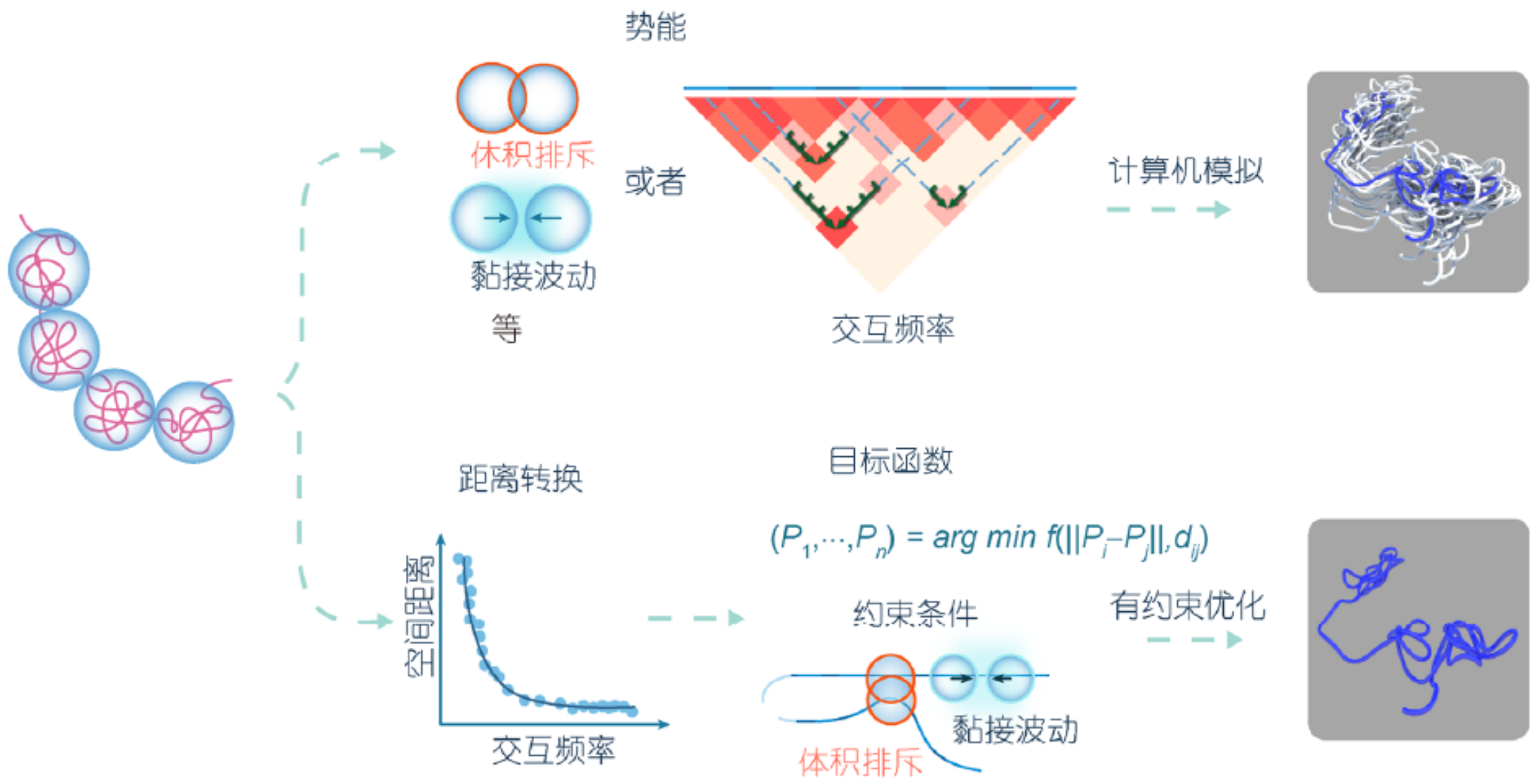
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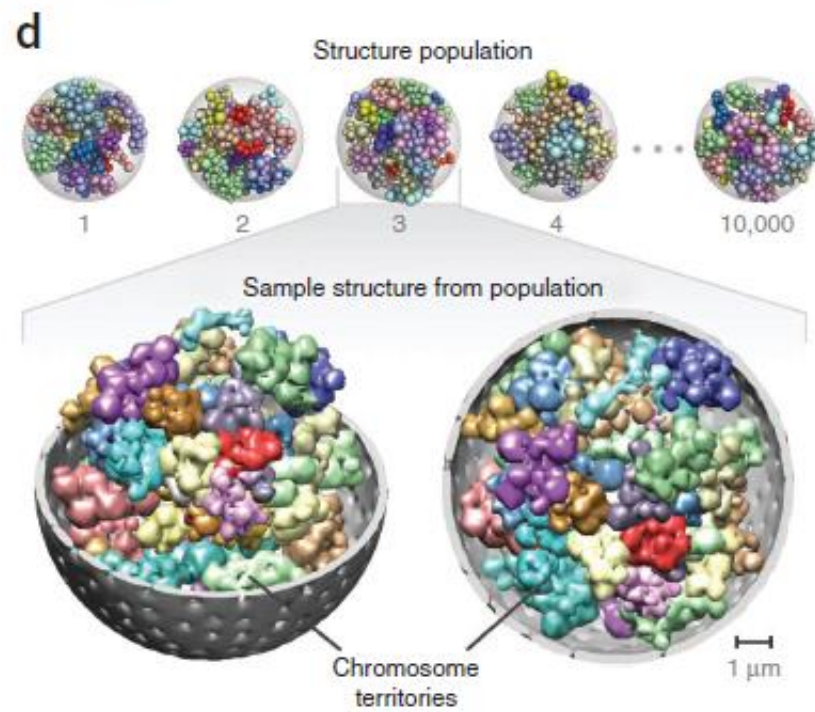
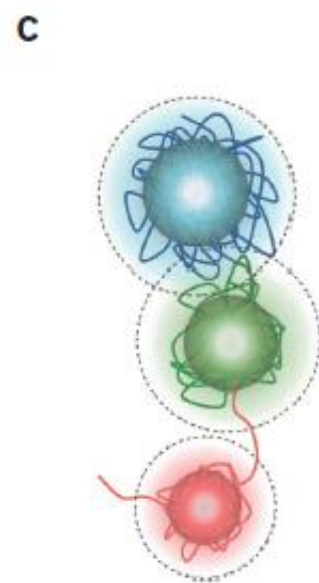
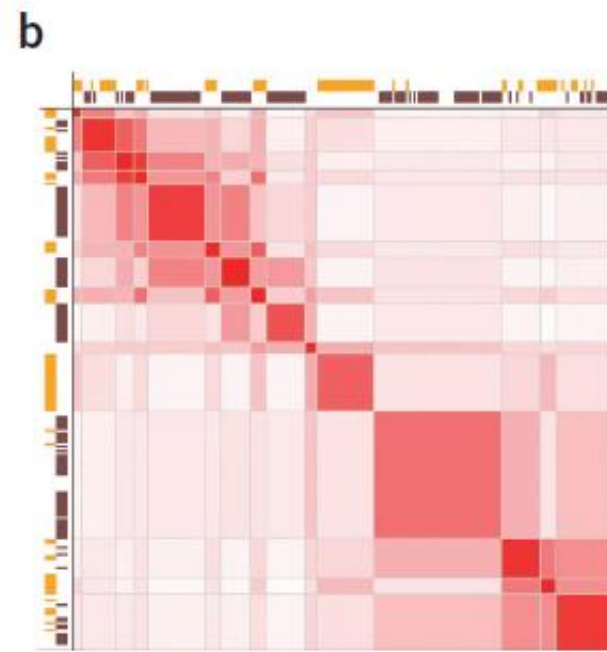
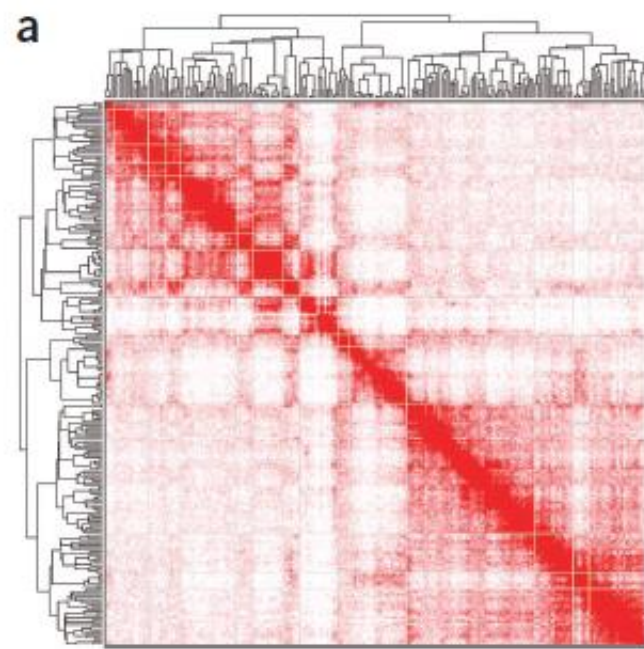
Conformation capture technologies

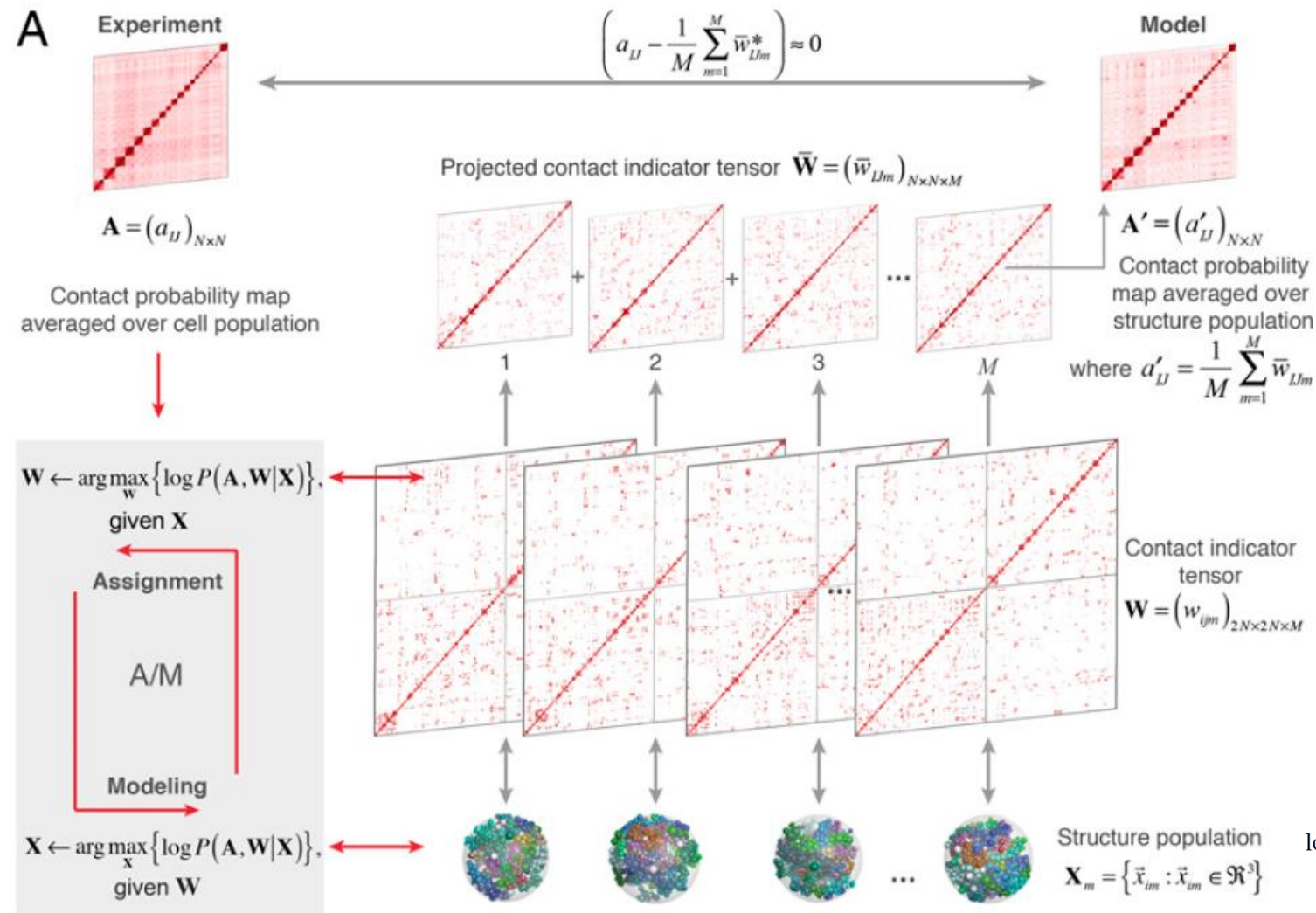
Average structure



How to compute specified structure from average structure ?







$\mathbf{A} = (a_{IJ})_{N \times N}$ N domains in the genome, where $0 \leq a_{IJ} \leq 1$ is the contact probability of two chromosome domains I and J

$\mathbf{X} = \{\mathbf{X}_1, \mathbf{X}_2, \dots, \mathbf{X}_M\}$ a set of M diploid genome structures

$\mathbf{X}_m = \{\bar{x}_{im} : \bar{x}_{im} \in \mathfrak{R}^3, i = 1, 2, \dots, 2N\}$ a set of 3-dimensional vectors representing the center coordinates of $2N$ spheres

$\mathbf{W} = (w_{ijm})_{2N \times 2N \times M}$ $w_{ijm} = 1$ indicates that the contact between domains i and j in structure m ; $w_{ijm} = 0$ otherwise

$$\hat{\mathbf{X}} = \arg \max_{\mathbf{X}} \max_{\mathbf{W}} \{\log P(\mathbf{A}, \mathbf{W} | \mathbf{X})\}$$

subject to

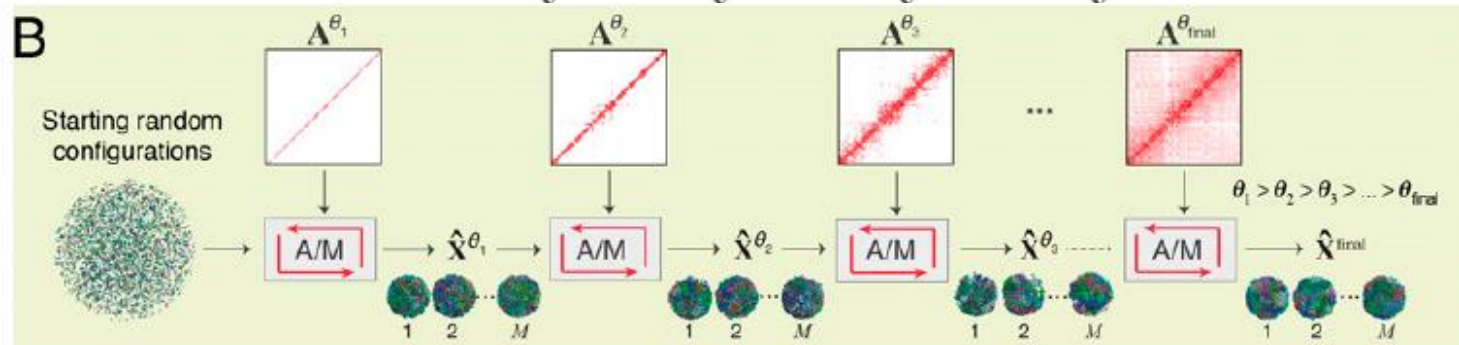
- spatial constraint I: nuclear volume
- spatial constraint II: excluded volume
- spatial constraint III: 4qtel-NE proximity

$$\log P(\mathbf{A}, \mathbf{W} | \mathbf{X}) = \log P(\mathbf{A} | \mathbf{W}) + \log P(\mathbf{W} | \mathbf{X}) = \sum_{\substack{I, J=1 \\ I \neq J}}^N \log P(a_{IJ} | a'_{IJ}) + \sum_{m=1}^M \sum_{\substack{i, j=1 \\ i \neq j}}^{2N} \log P(w_{ijm} | \bar{x}_{im}, \bar{x}_{jm})$$

$$\sum_{m=1}^M \left[\sum_{\substack{i, j=1 \\ i \neq j}}^{2N} \left[w_{ijm} \log P(w_{ijm} = 1 | d_{ijm}) + (1 - w_{ijm}) \log P(w_{ijm} = 0 | d_{ijm}) \right] \right]$$

when d_{ijm} is larger than a distance threshold value (termed as d_{IJ}^{act}), let $w_{ijm} = 0$

d_{ijm} is smaller than a distance threshold d_{IJ}^{act} , let $w_{ijm} = 1$



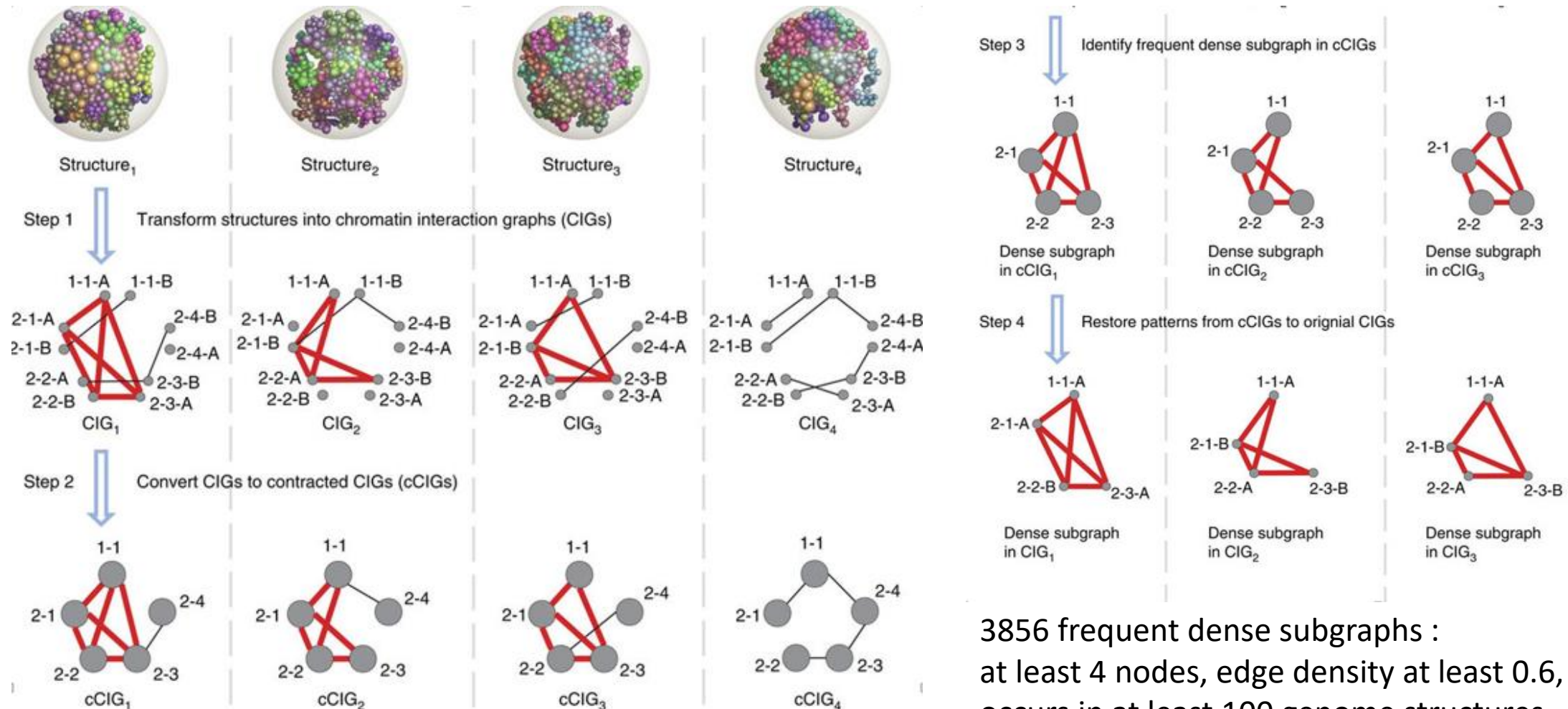
Mining 3D genome structure populations identifies major factors governing the stability of regulatory communities

Chao Dai^{1,*}, Wenyuan Li^{1,*}, Harianto Tjong^{1,*}, Shengli Hao¹, Yonggang Zhou¹, Qingjiao Li¹, Lin Chen¹, Bing Zhu², Frank Alber¹ & Xianghong Jasmine Zhou¹

outline

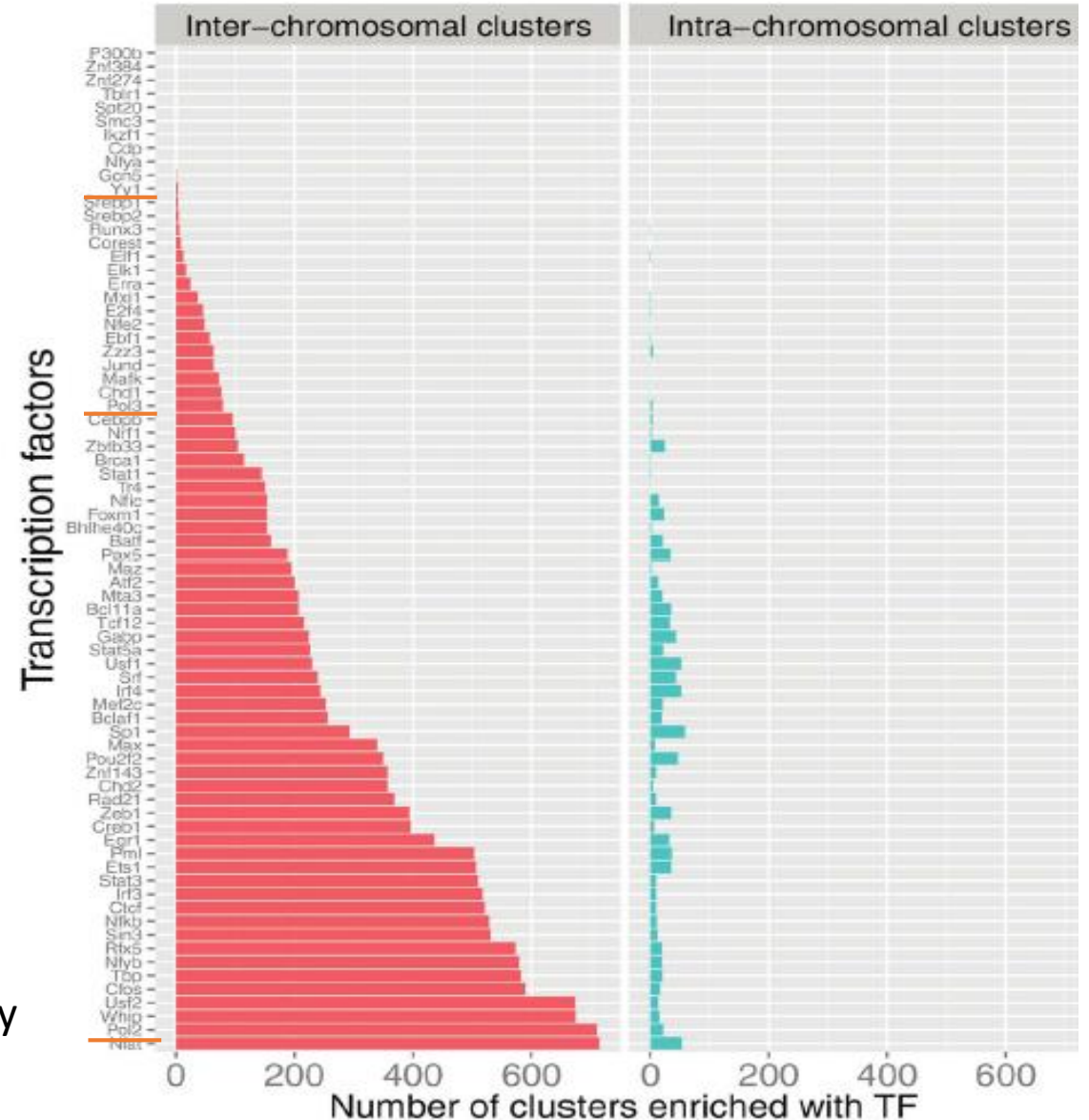
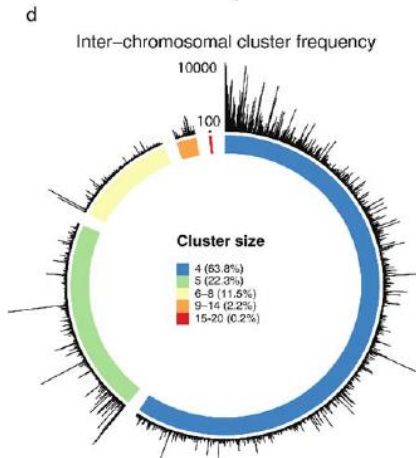
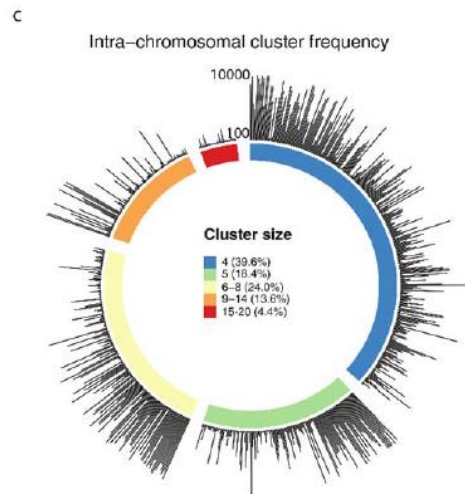
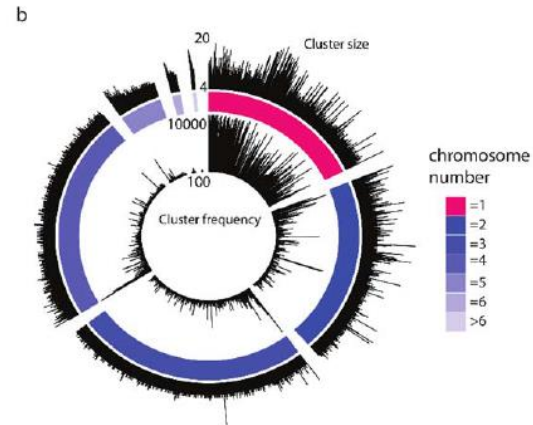
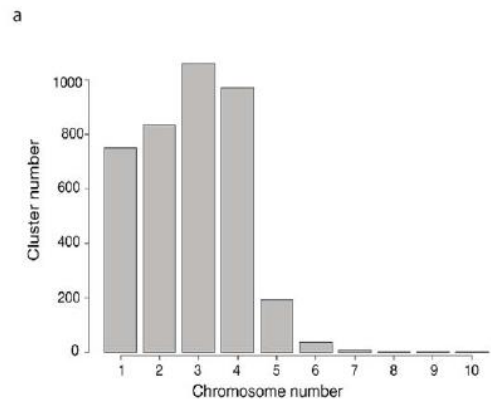
1. A graph-based computational framework for the analysis of 3D genome structure populations
2. frequently occurring chromatin clusters are enriched in binding of specific regulatory factors
3. Two major factors, centromere clustering and transcription factor binding, significantly stabilize such regulatory communities
4. The regulatory communities differ substantially from cell to cell

1. Discover frequent spatial clusters in a 3D genome population



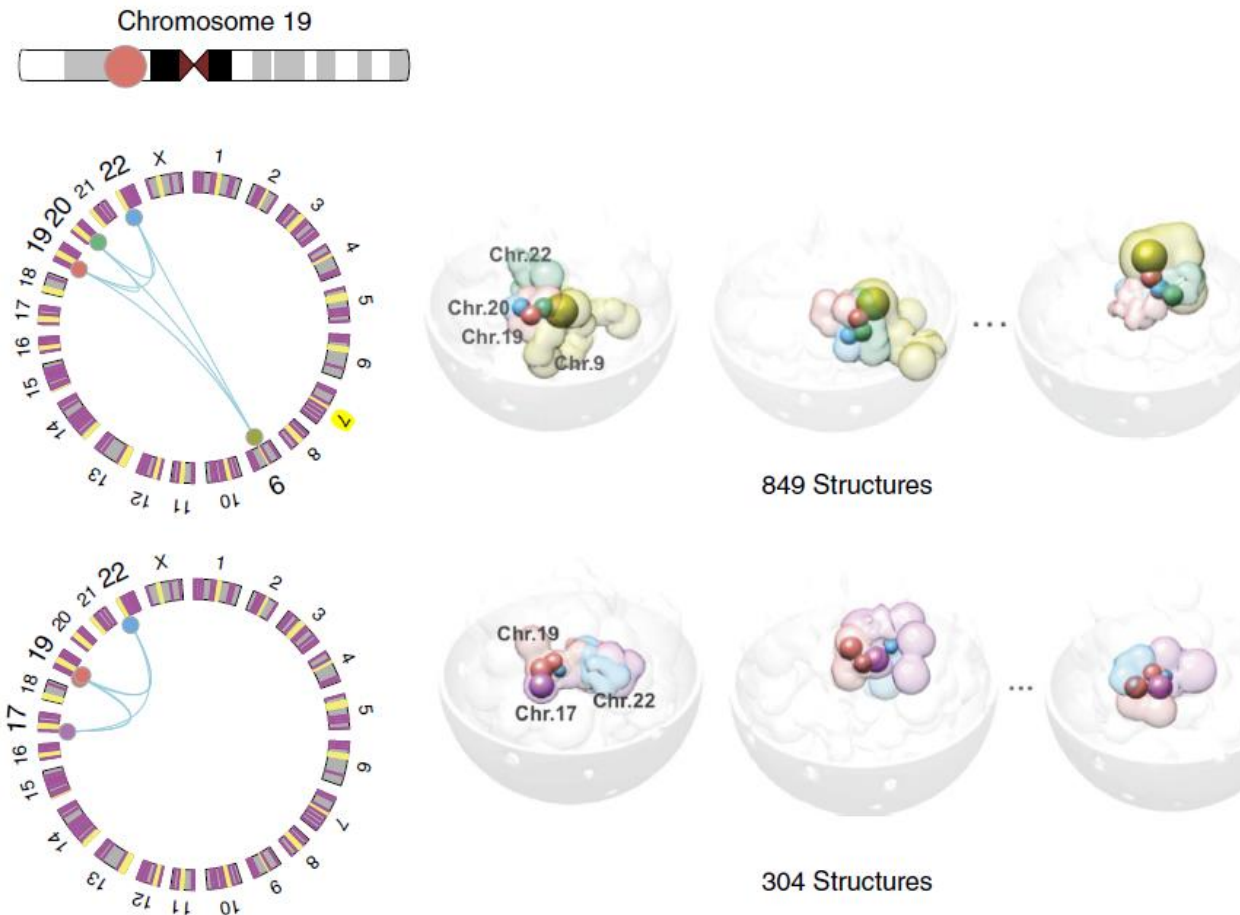
3856 frequent dense subgraphs :
 at least 4 nodes, edge density at least 0.6,
 occurs in at least 100 genome structures.

2. Spatial clusters constitute various regulatory communities.



regulatory community :
a frequent spatial cluster whose member domains are significantly co-enriched in binding to the same regulatory factor(s)

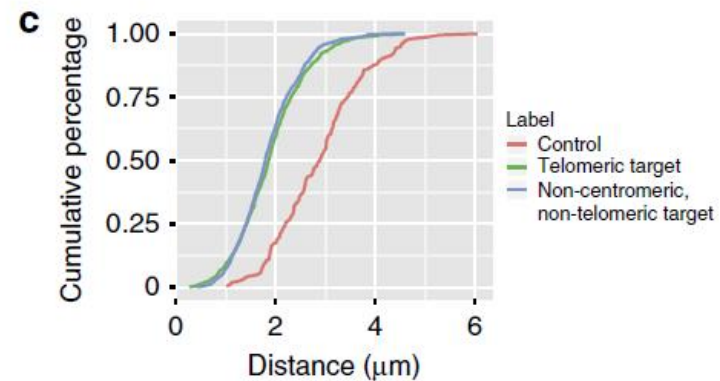
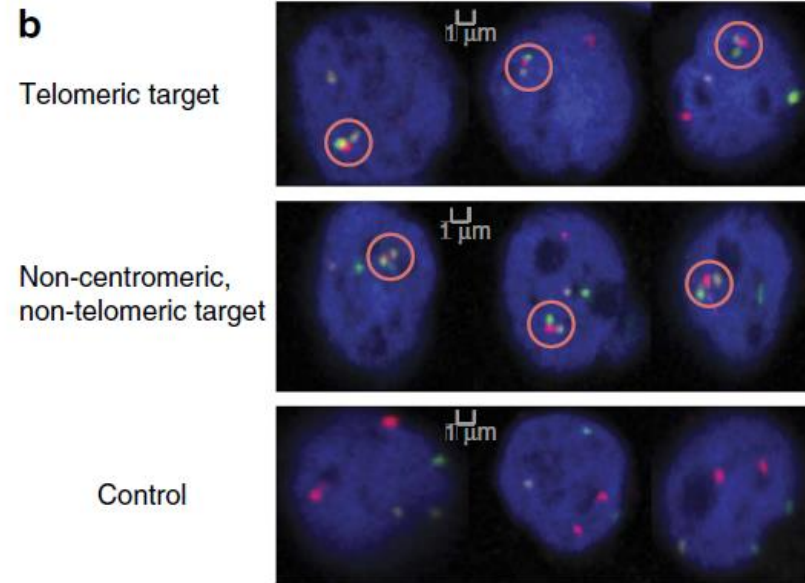
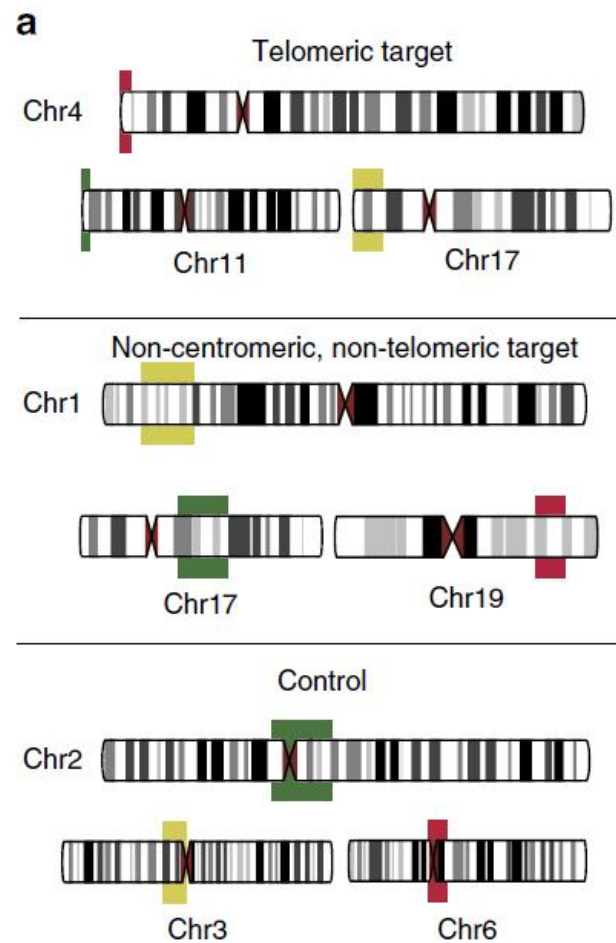
2.Spatial clusters constitute various regulatory communities.



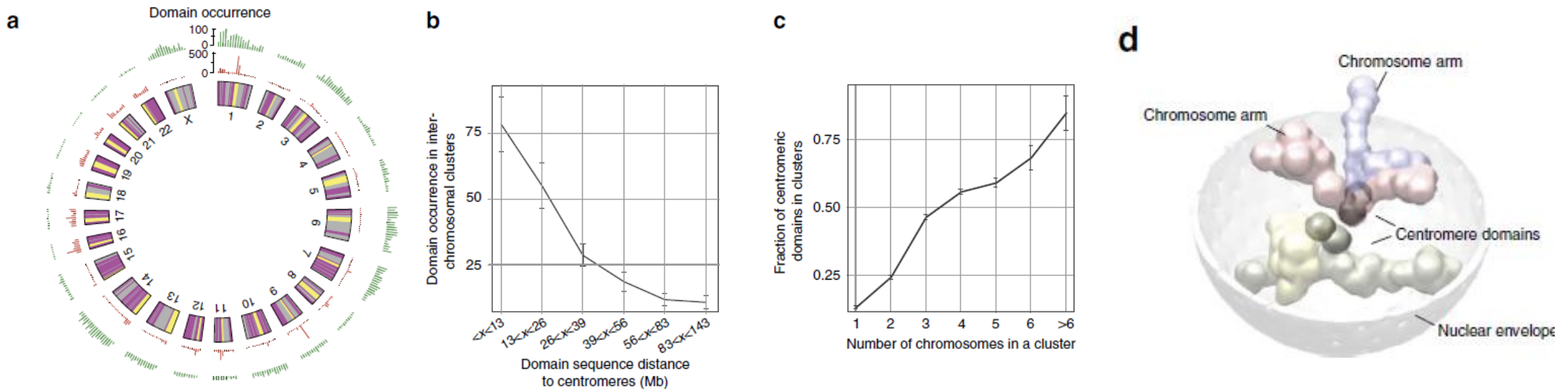
Functional plasticity of chromatin domain.

An active domain in chromosome 19 can participate in two different clusters that are enriched with binding of the same transcription factors, including RNAPII, CTCF, NFYB and CREB1.

Validation of co-localization with 3D FISH

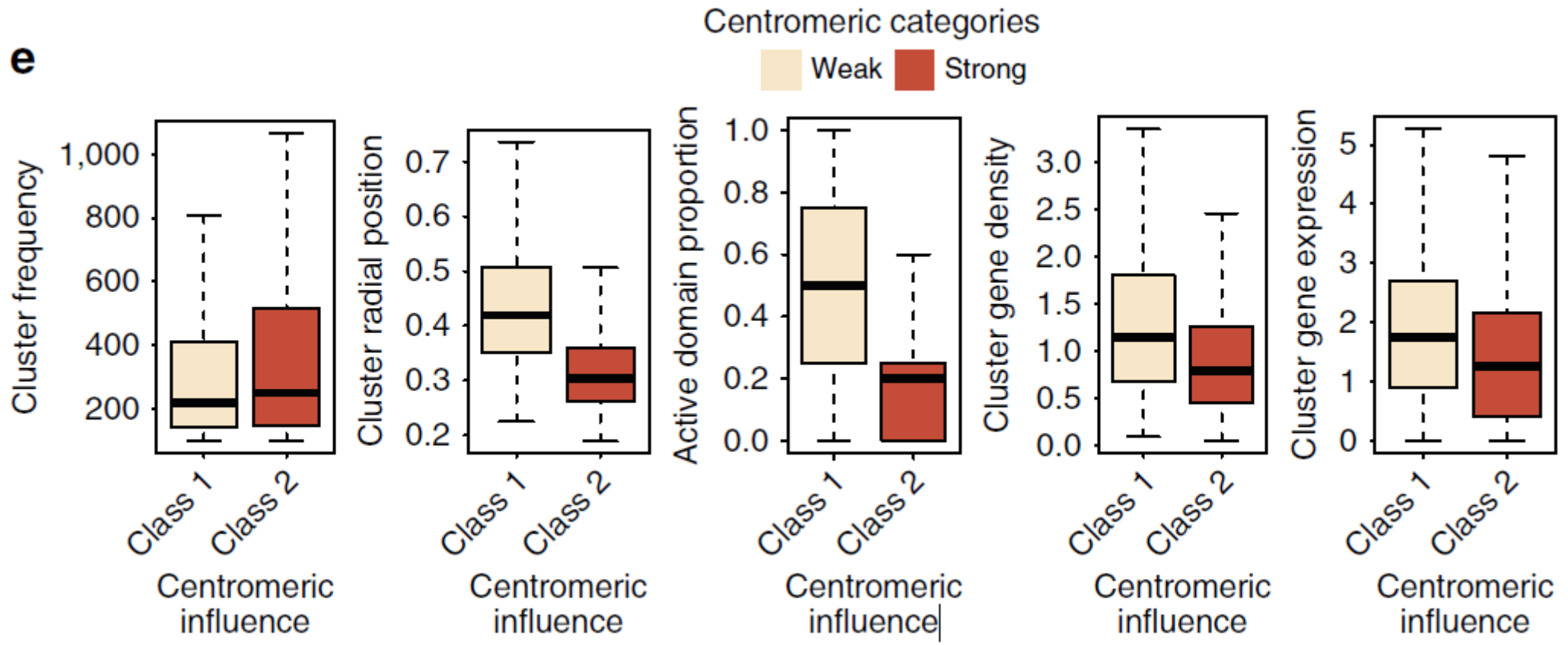


3. Centromeric domains are hubs for inter-chromosomal clusters.

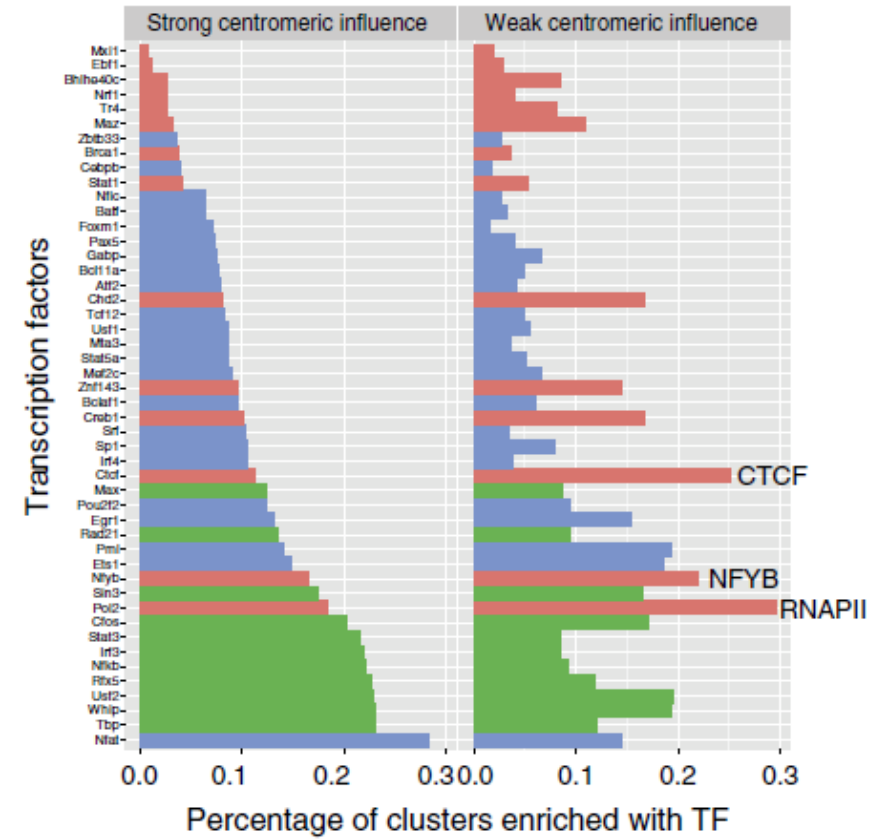
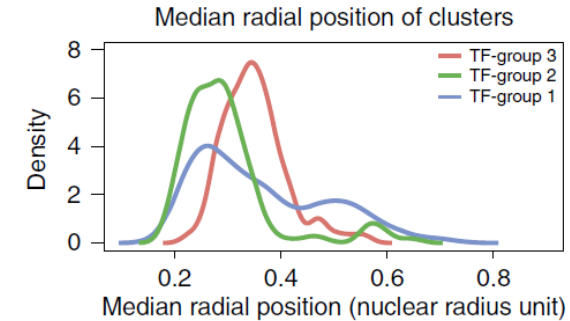
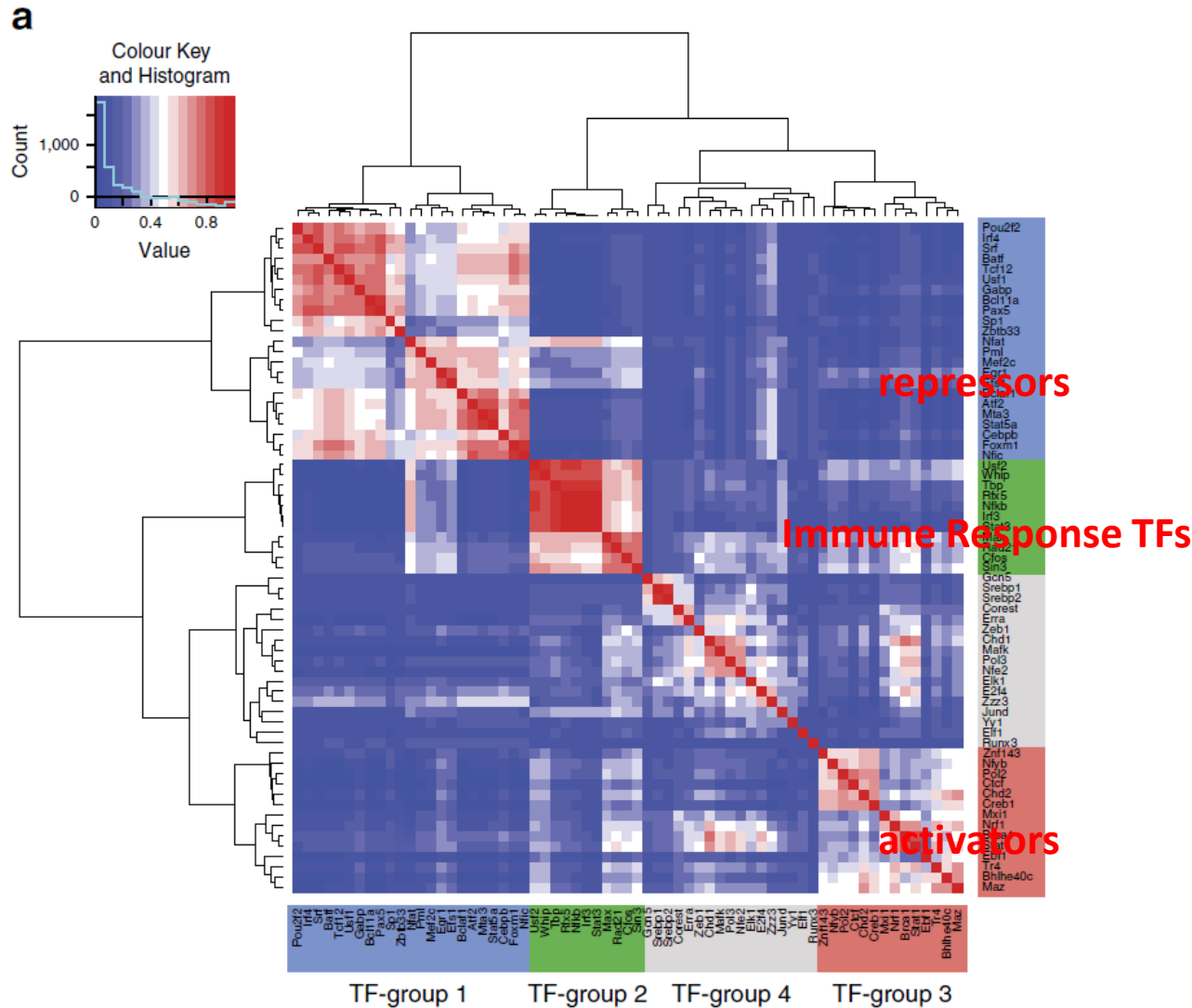


- a. the vast majority (87%) of 3,107 inter-chromosomal clusters contain at least 1 centromeric domain.
- b. the closer a domain is to the centromere of its chromosome, the more frequently it participates in stable inter-chromosomal clusters
- c. clusters involving more chromosomes generally have a higher proportion of centromeric domains

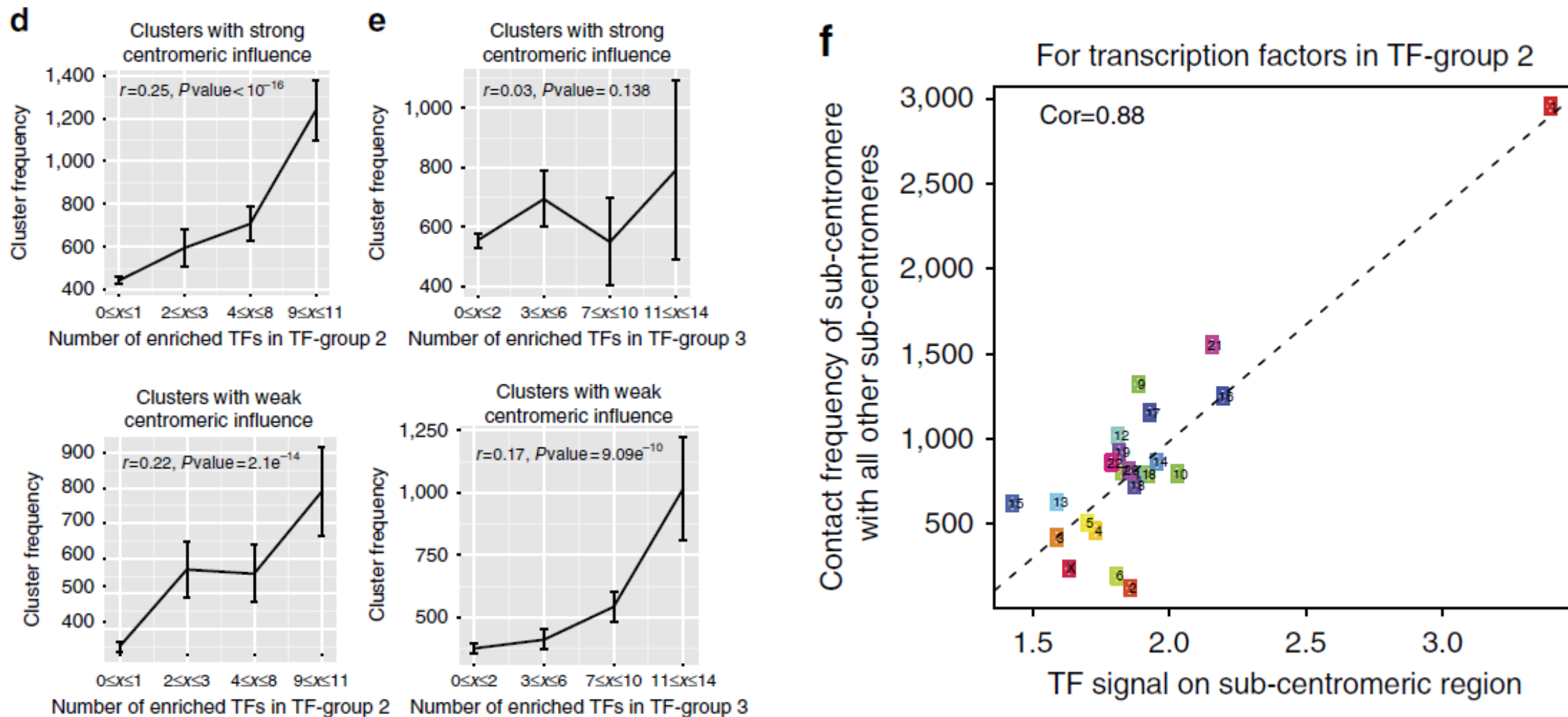
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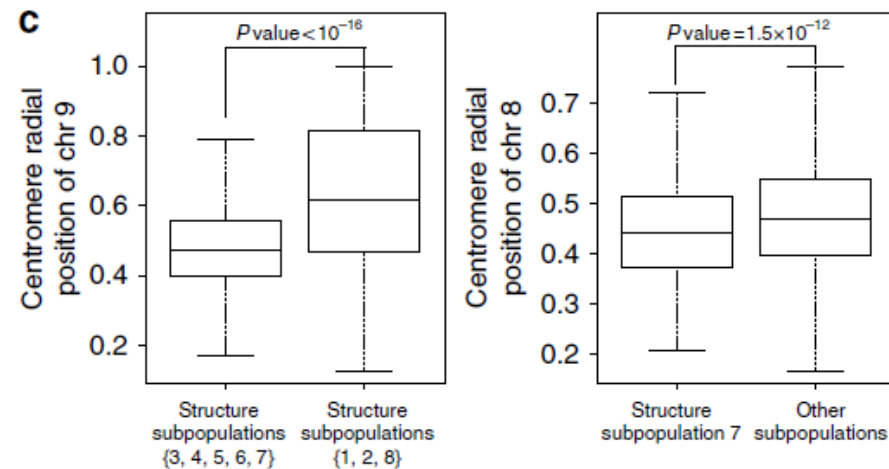
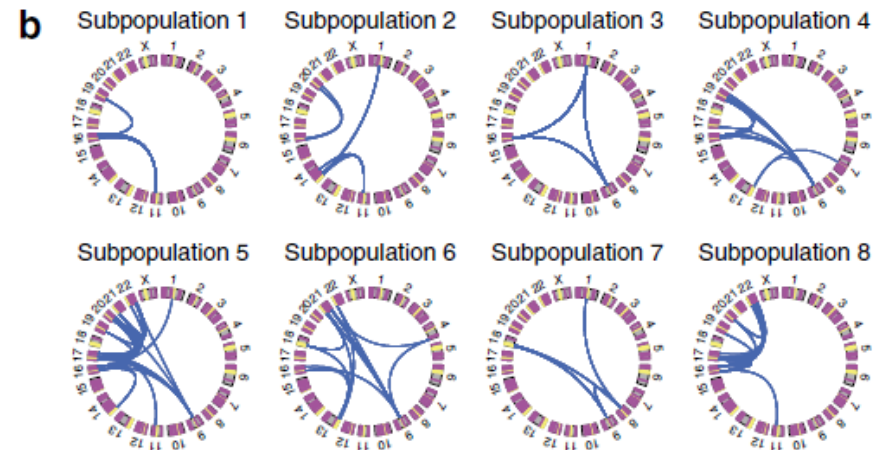
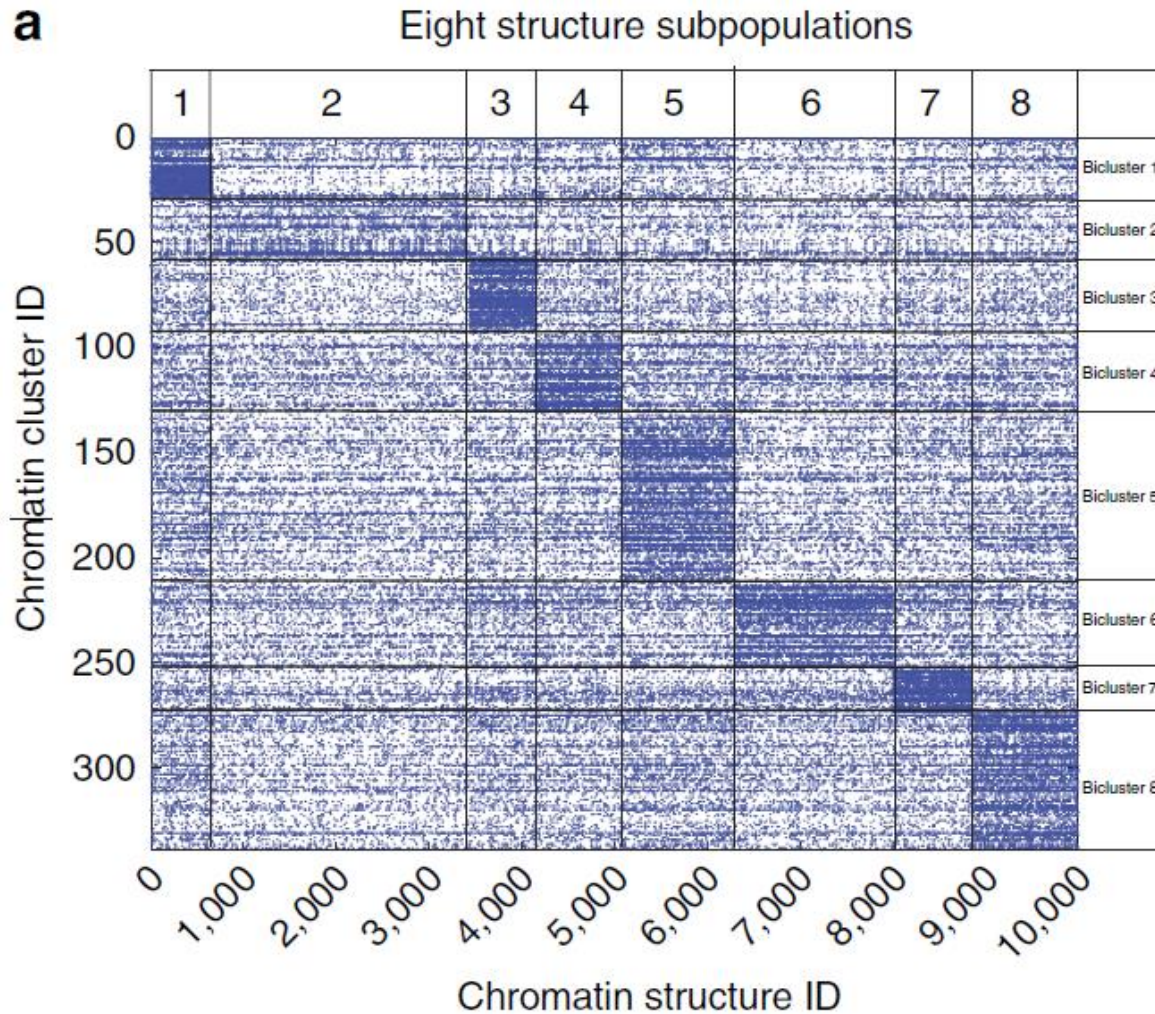
4. Transcription factors may stabilize regulatory communities.



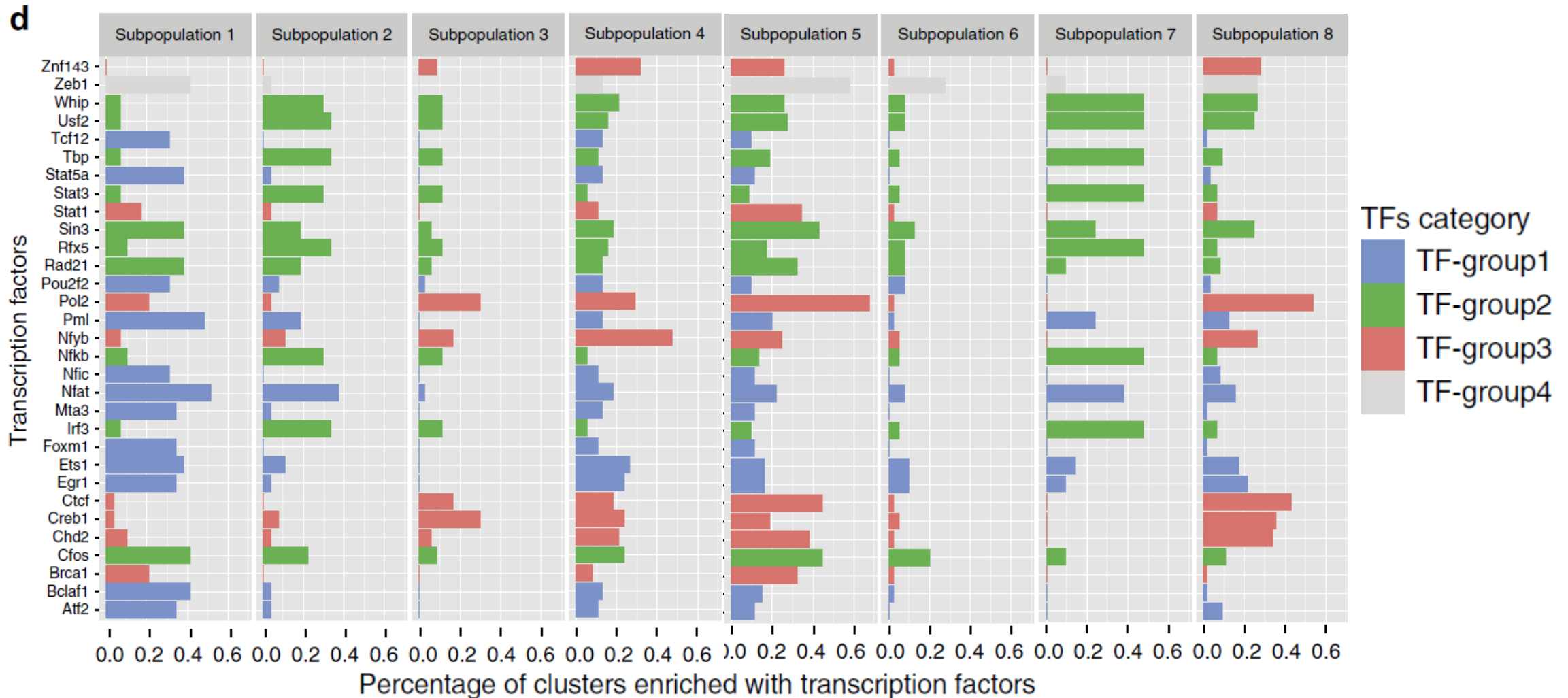
4. Transcription factors may stabilize regulatory communities.



5. The genome structure population contains multiple substates



5. The genome structure population contains multiple substates



Summary

1. A graph-based computational framework for the analysis of 3D genome structure populations
2. frequently occurring chromatin clusters are enriched in binding of specific regulatory factors
3. Two major factors, centromere clustering and transcription factor binding, significantly stabilize such regulatory communities
4. The regulatory communities differ substantially from cell to cell

3D genome modeling opportunity and challenge

- a. single cell level (limited capture efficiency)
- b. diploid genome
- c. Integration: ChIA-PET, Lamin, FISH

at which scale ?(inter chromosome; inter domain; intra domain)

what biological question can we solve?

How much we approach the real structure?

How to verify?

Is it necessary?

Single-cell Hi-C reveals cell-to-cell variability in chromosome structure

Takashi Nagano^{1*}, Yaniv Lubling^{2*}, Tim J. Stevens^{3*}, Stefan Schoenfelder¹, Eitan Yaffe², Wendy Dean⁴, Ernest D. Laue³, Amos Tanay² & Peter Fraser¹

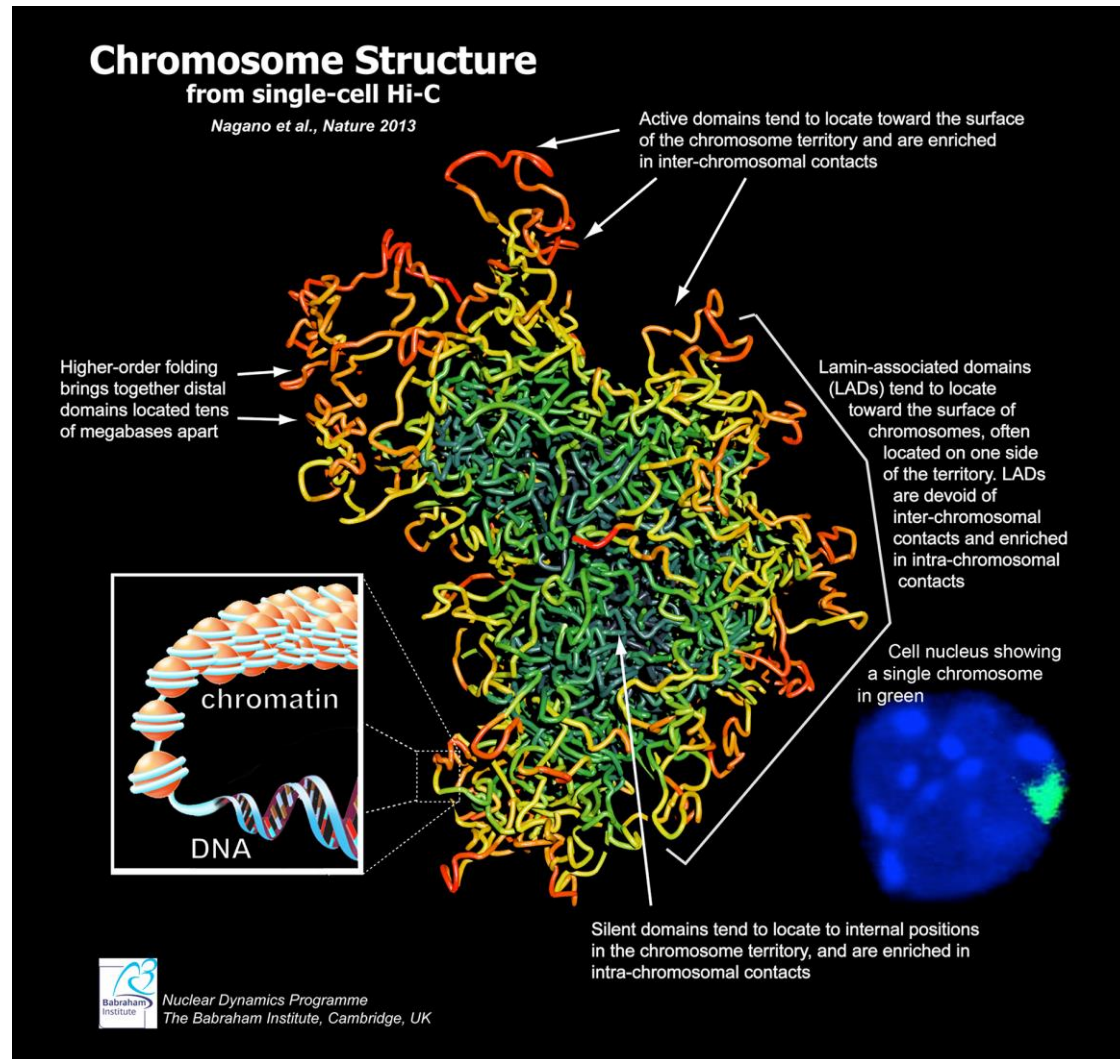
Cell cycle dynamics of chromosomal organisation at single-cell resolution

Massively multiplex single-cell Hi-C

Vijay Ramani¹, Xinxian Deng², Ruolan Qiu¹, Kevin L Gunderson³, Frank J Steemers³, Christine M Disteche^{2,4}, William S Noble¹, Zhijun Duan^{5,6} & Jay Shendure^{1,7}

Single-cell Hi-C reveals cell-to-cell variability in chromosome structure

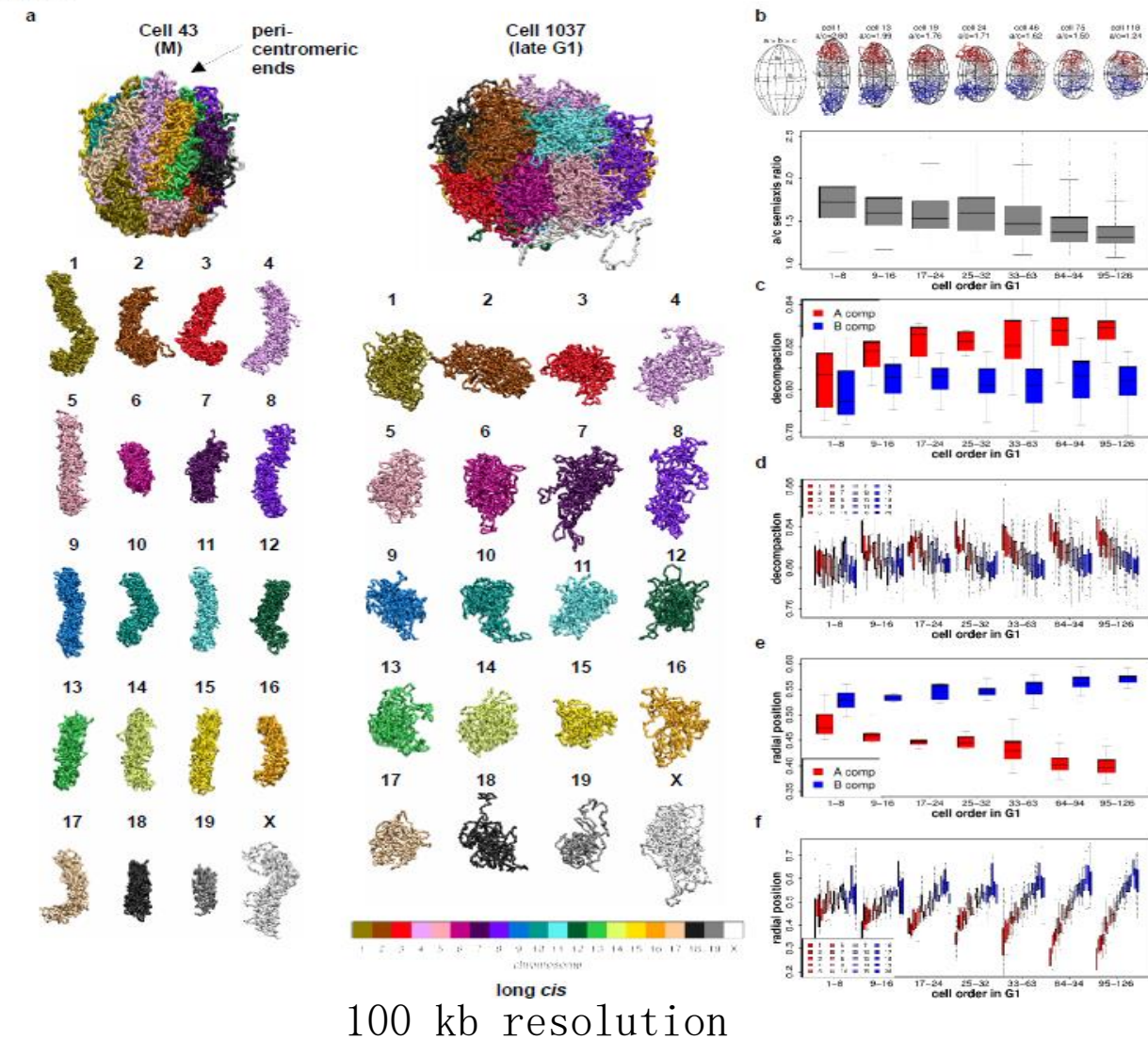
Takashi Nagano^{1*}, Yaniv Lubling^{2*}, Tim J. Stevens^{3*}, Stefan Schoenfelder¹, Eitan Yaffe², Wendy Dean⁴, Ernest D. Laue³, Amos Tanay² & Peter Fraser¹



10 Mb resolution

Cell cycle dynamics of chromosomal organisation at single-cell resolution

Figure 5



100 kb resolution

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THANK YOU