

# Structure determination of genomes and genomic domains by satisfaction of spatial restraints

Marc A. Marti-Renom

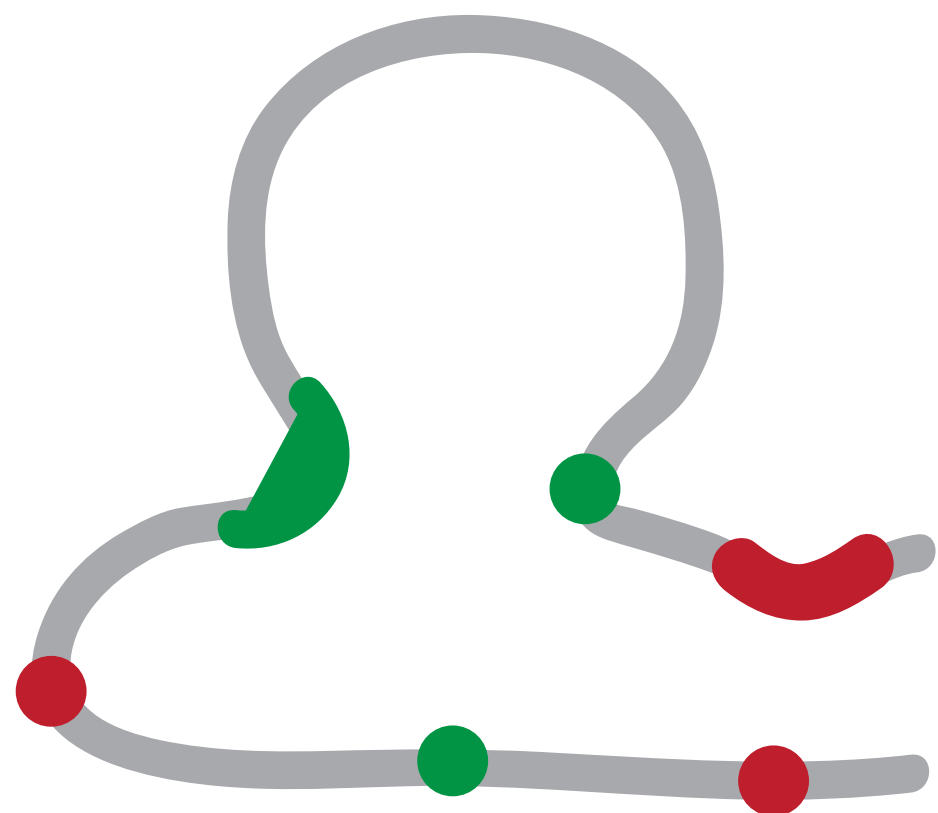
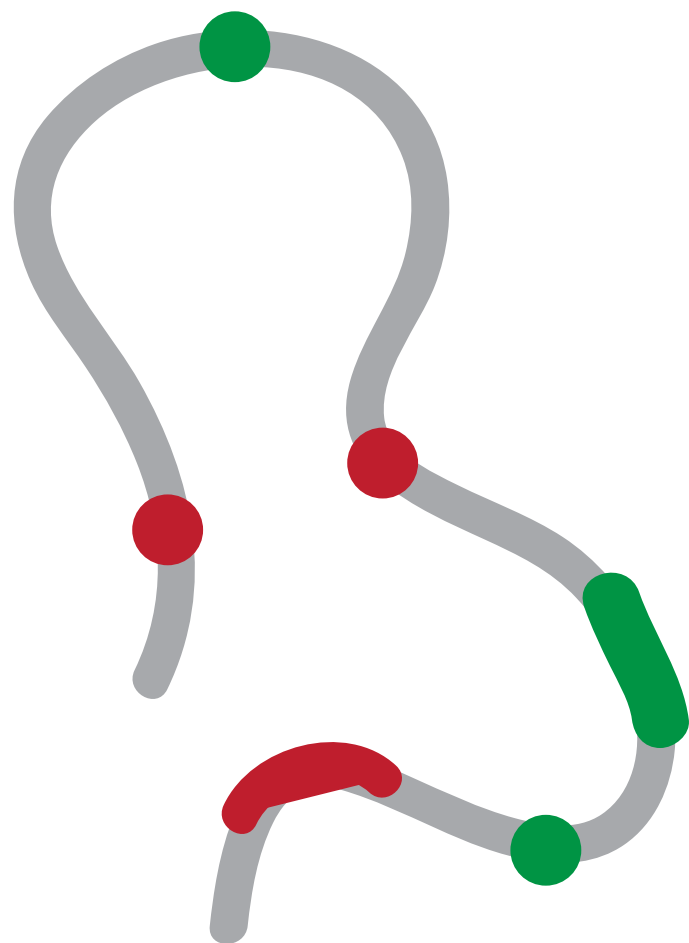
Structural Genomics Group (ICREA, CNAG-CRG)

<http://marciuslab.org>  
<http://3DGenomes.org>  
<http://cnag.crg.eu>

**cnag** **CRG**   **ICREA**

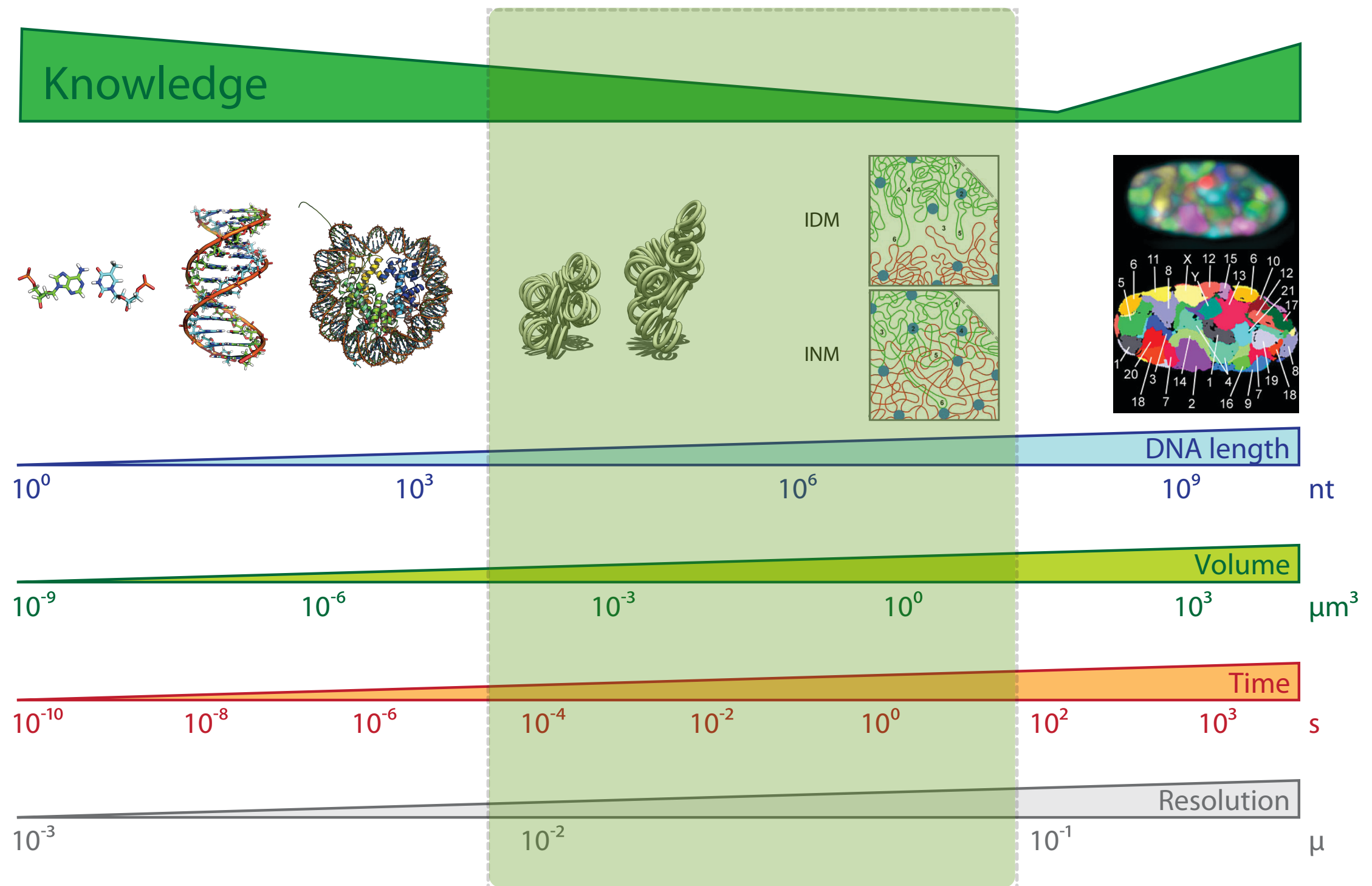






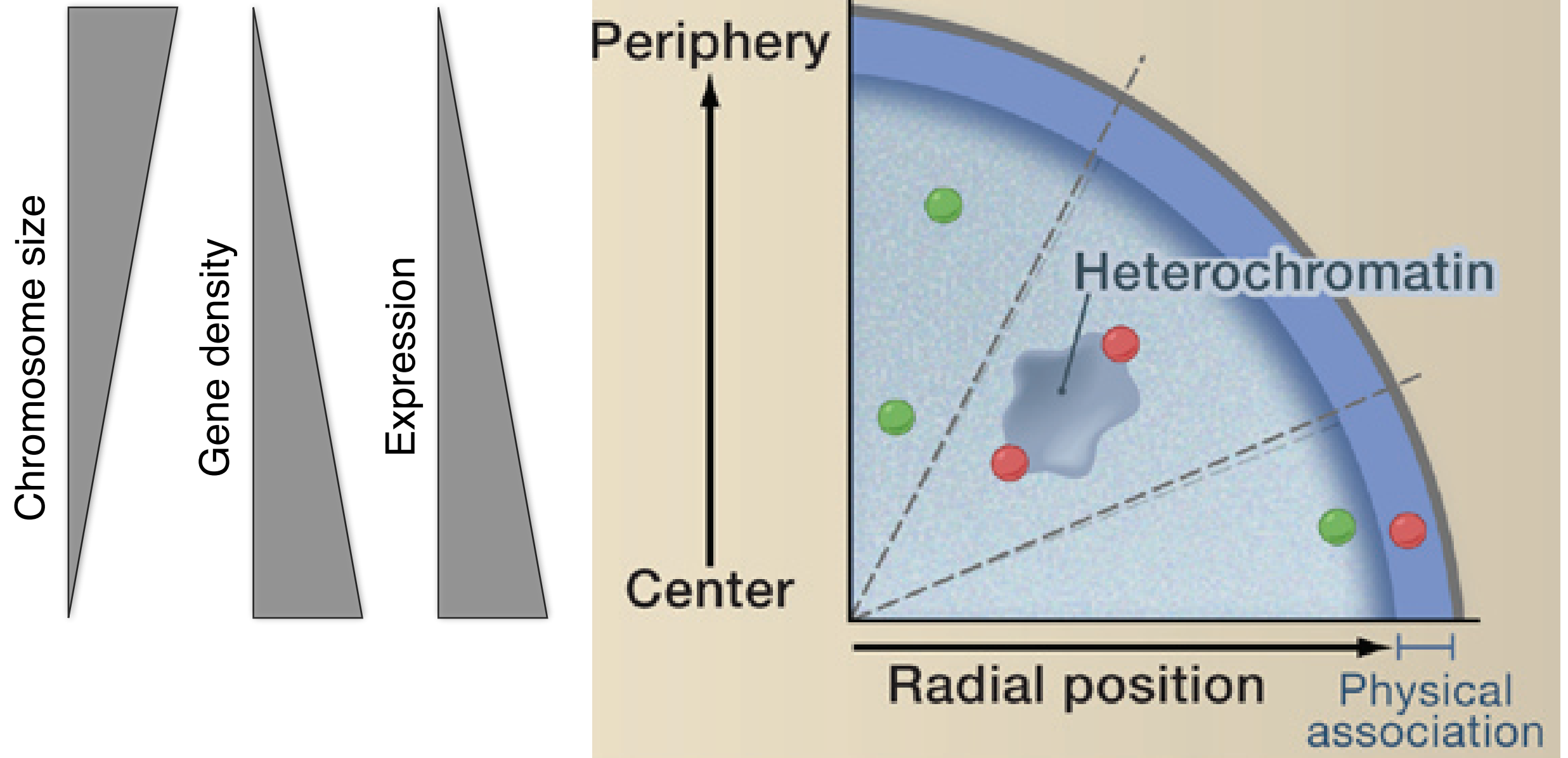
# Resolution Gap

Marti-Renom, M. A. & Mirny, L. A. PLoS Comput Biol 7, e1002125 (2011)



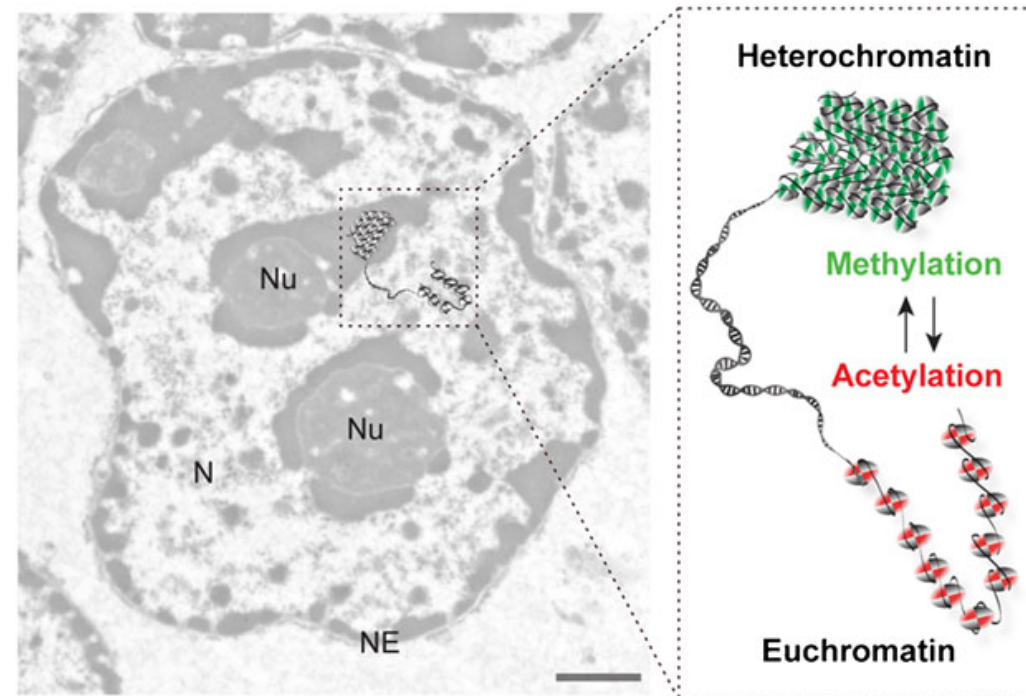
# Level I: Radial genome organization

Takizawa, T., Meaburn, K. J. & Misteli, T. The meaning of gene positioning. Cell 135, 9–13 (2008).



# Level II: Euchromatin vs heterochromatin

## Electron microscopy



### **Euchromatin:**

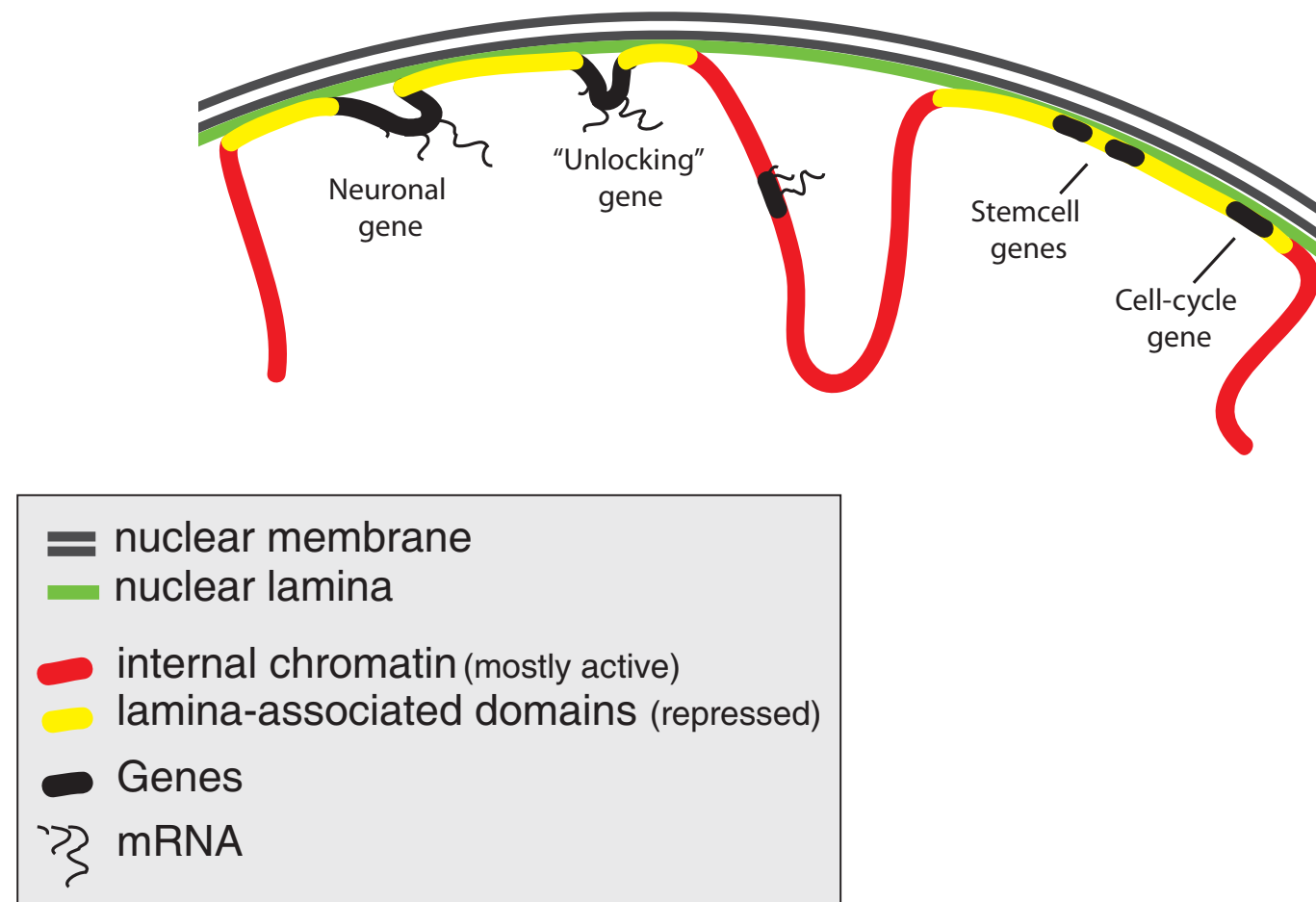
chromatin that is located away from the nuclear lamina, is generally less densely packed, and contains actively transcribed genes

### **Heterochromatin:**

chromatin that is near the nuclear lamina, tightly condensed, and transcriptionally silent



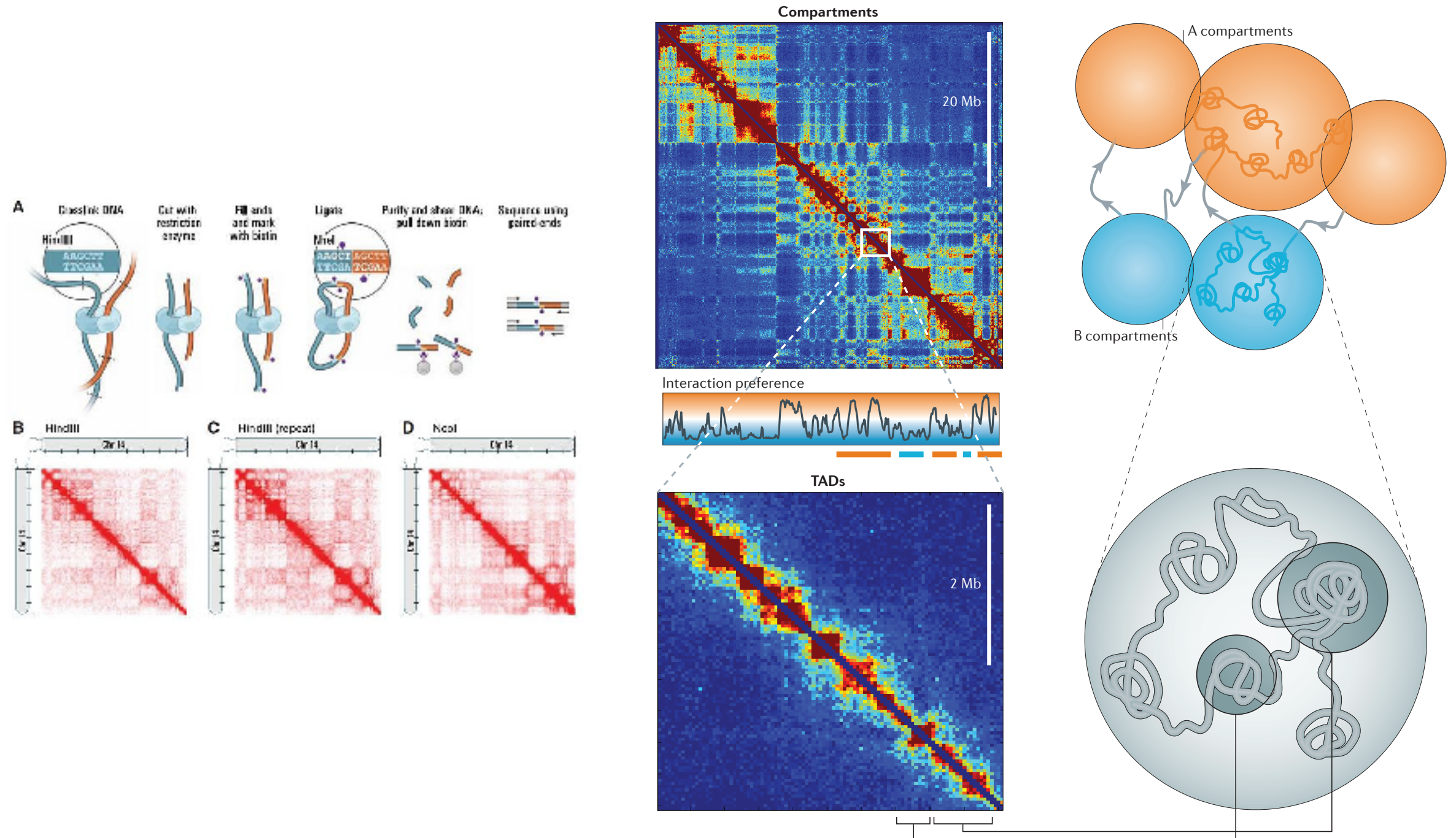
# Level III: Lamina-genome interactions



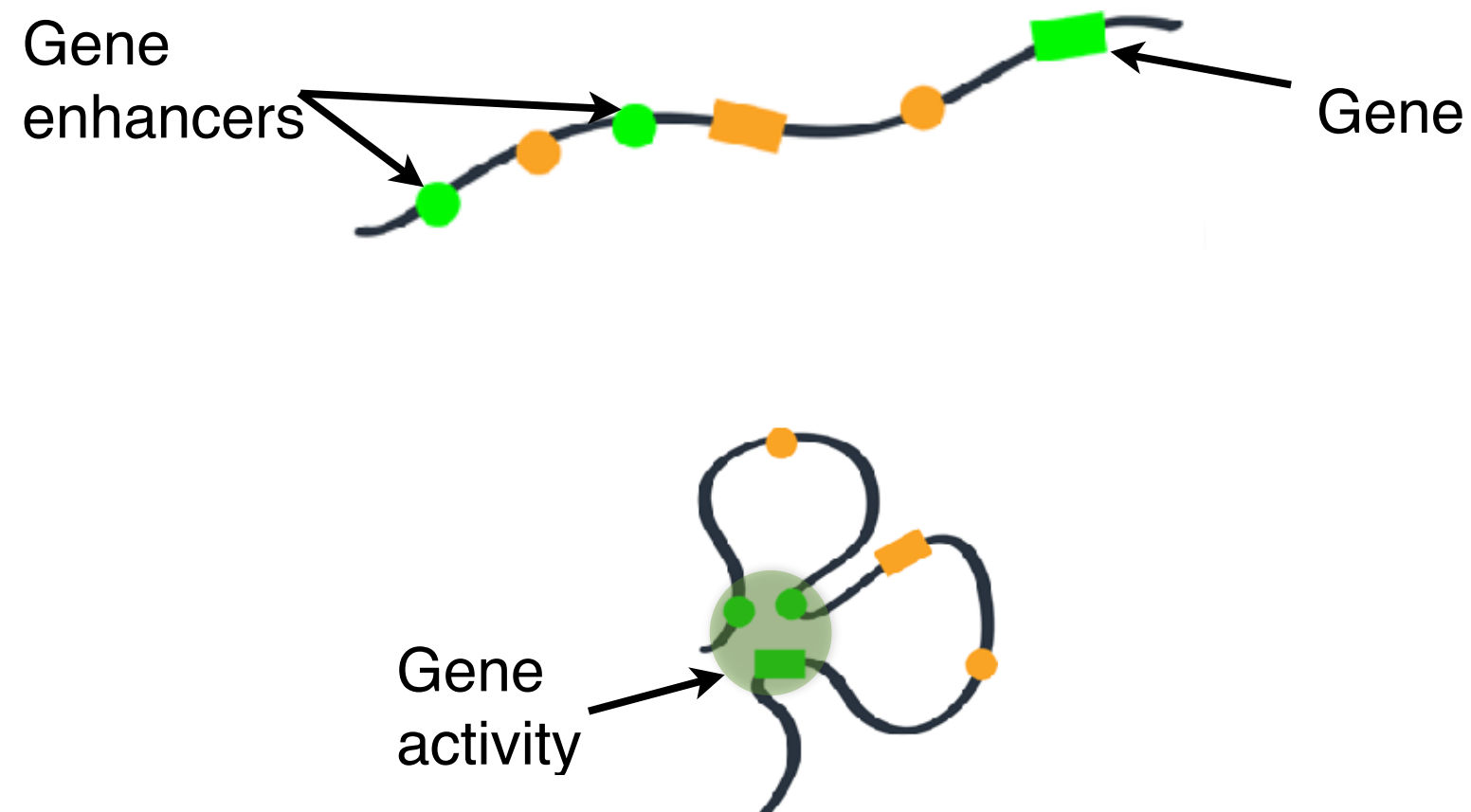
Most genes in Lamina Associated Domains are transcriptionally silent, suggesting that **lamina-genome interactions** are widely involved in the control of **gene expression**

# Level IV: Higher-order organization

Dekker, J., Marti-Renom, M. A. & Mirny, L. A. Nat Rev Genet 14, 390–403 (2013).



# Level V: Chromatin loops



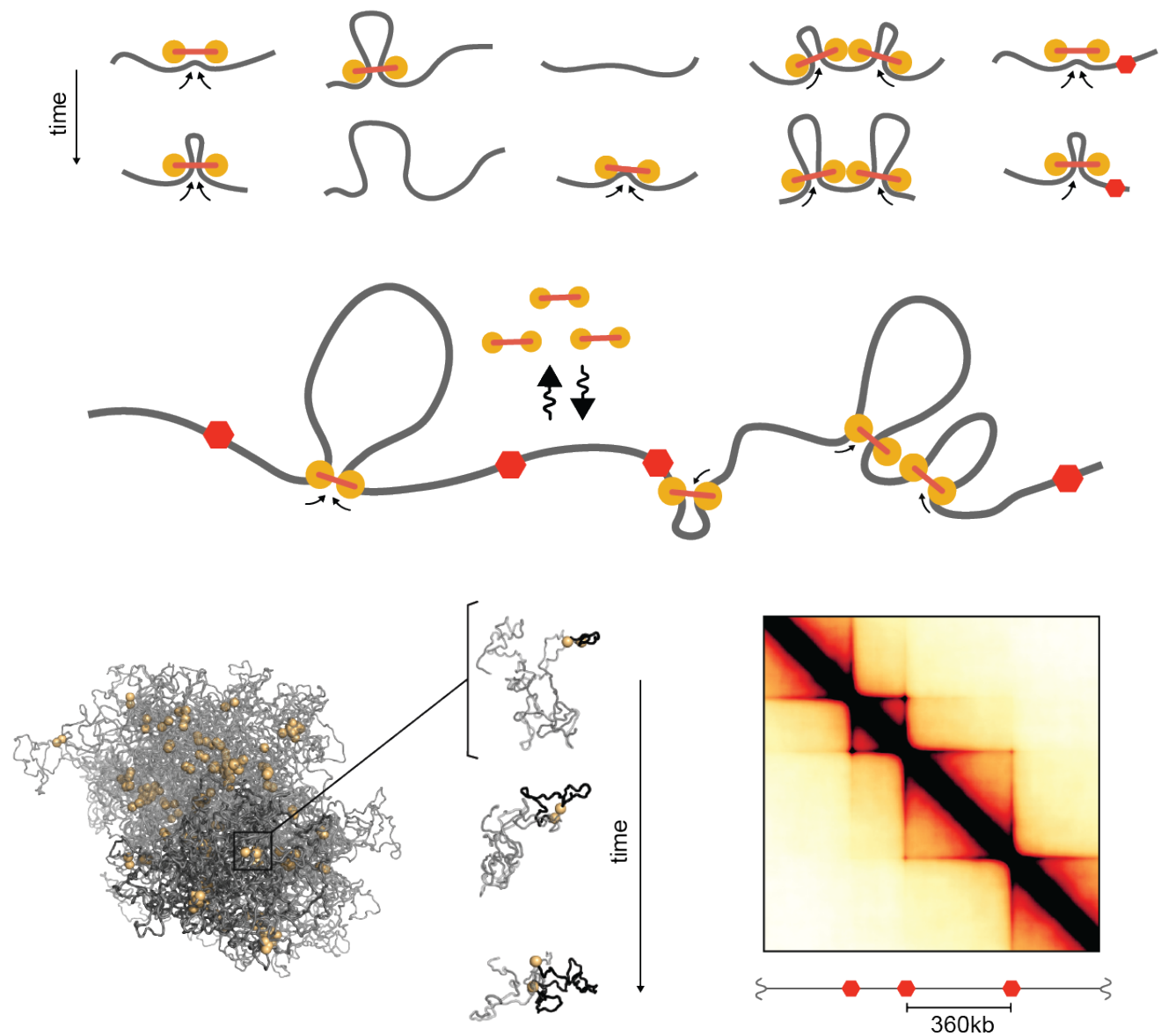
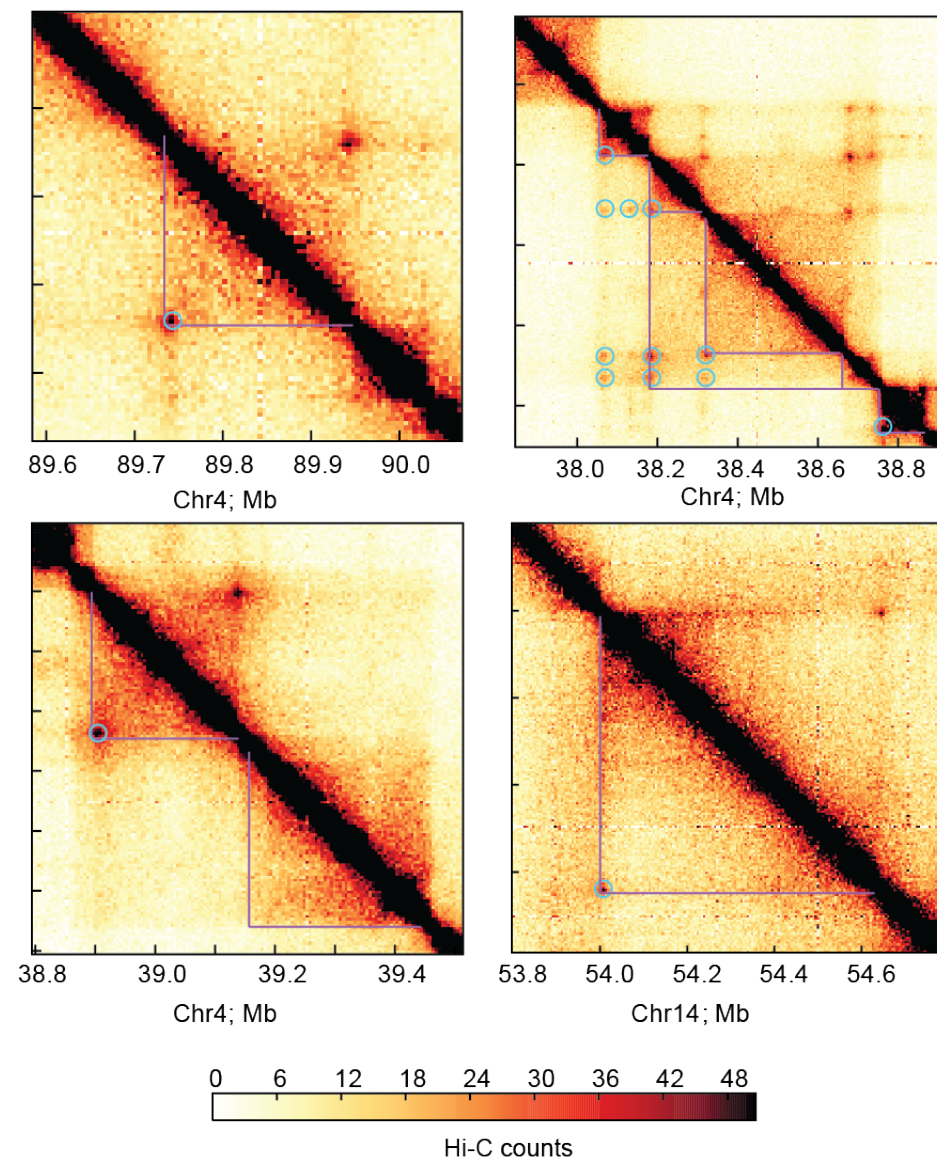
**Loops bring distal genomic regions in close proximity to one another**

**This in turn can have profound effects on gene transcription**

**Enhancers can be thousands of kilobases away from their target genes in any direction (or even on a separate chromosome)**

# Level V: Loop-extrusion as a driving force

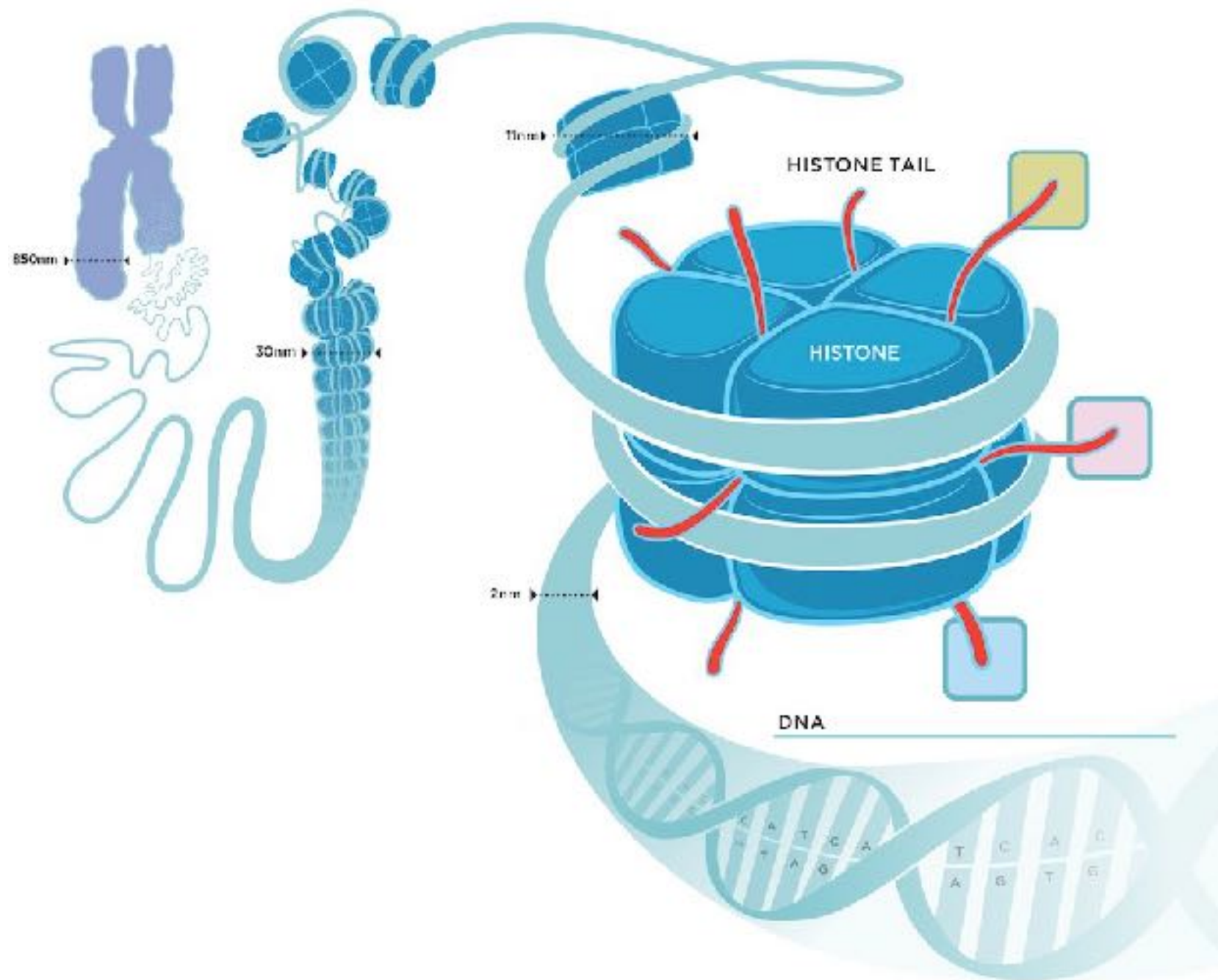
Fudenberg, G., Imakaev, M., Lu, C., Goloborodko, A., Abdennur, N., & Mirny, L. A. (2015).  
Formation of Chromosomal Domains by Loop Extrusion. bioRxiv.





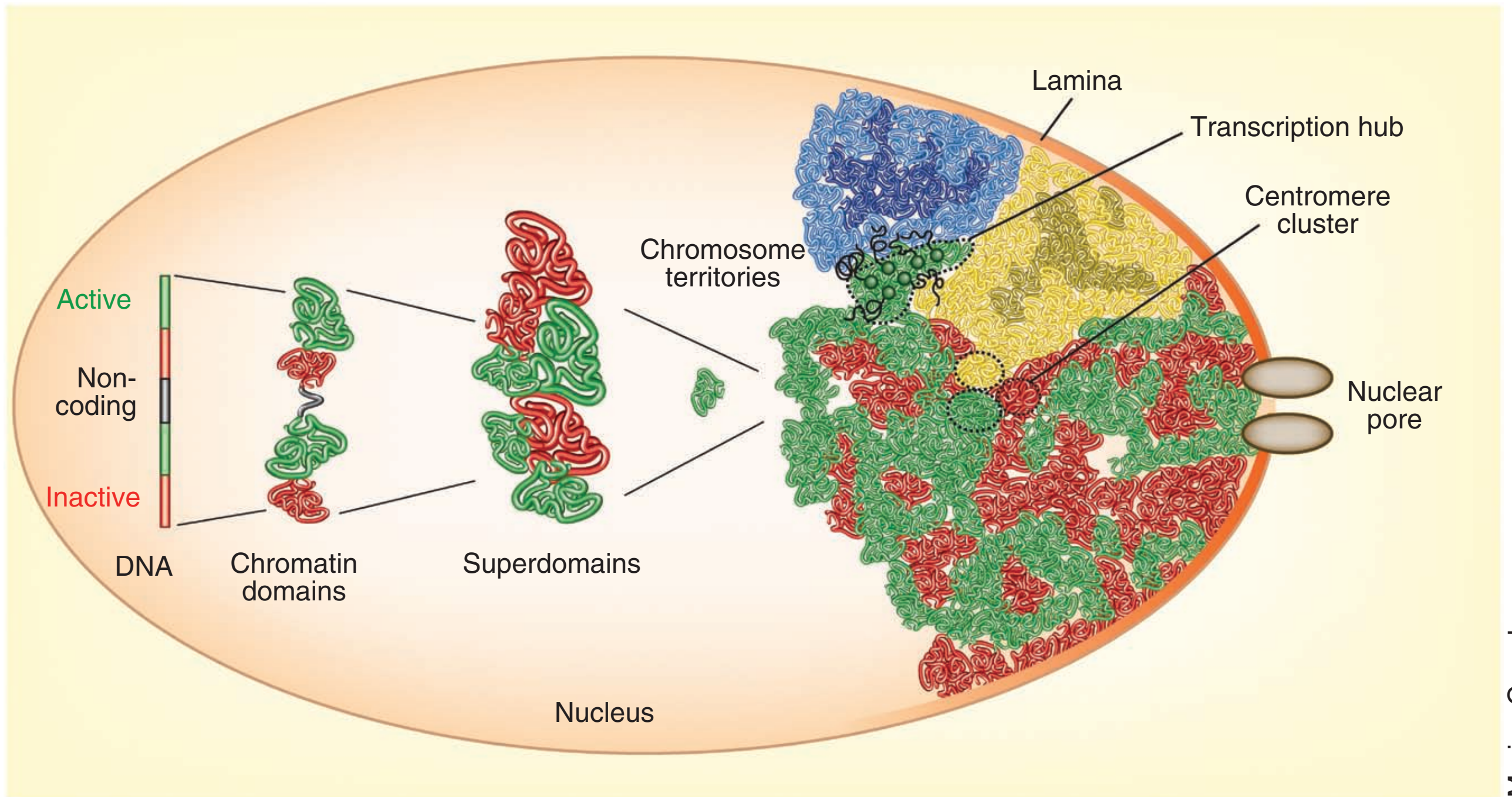
# Level VI: Nucleosome

**Chromosome    Chromatin fibre    Nucleosome**



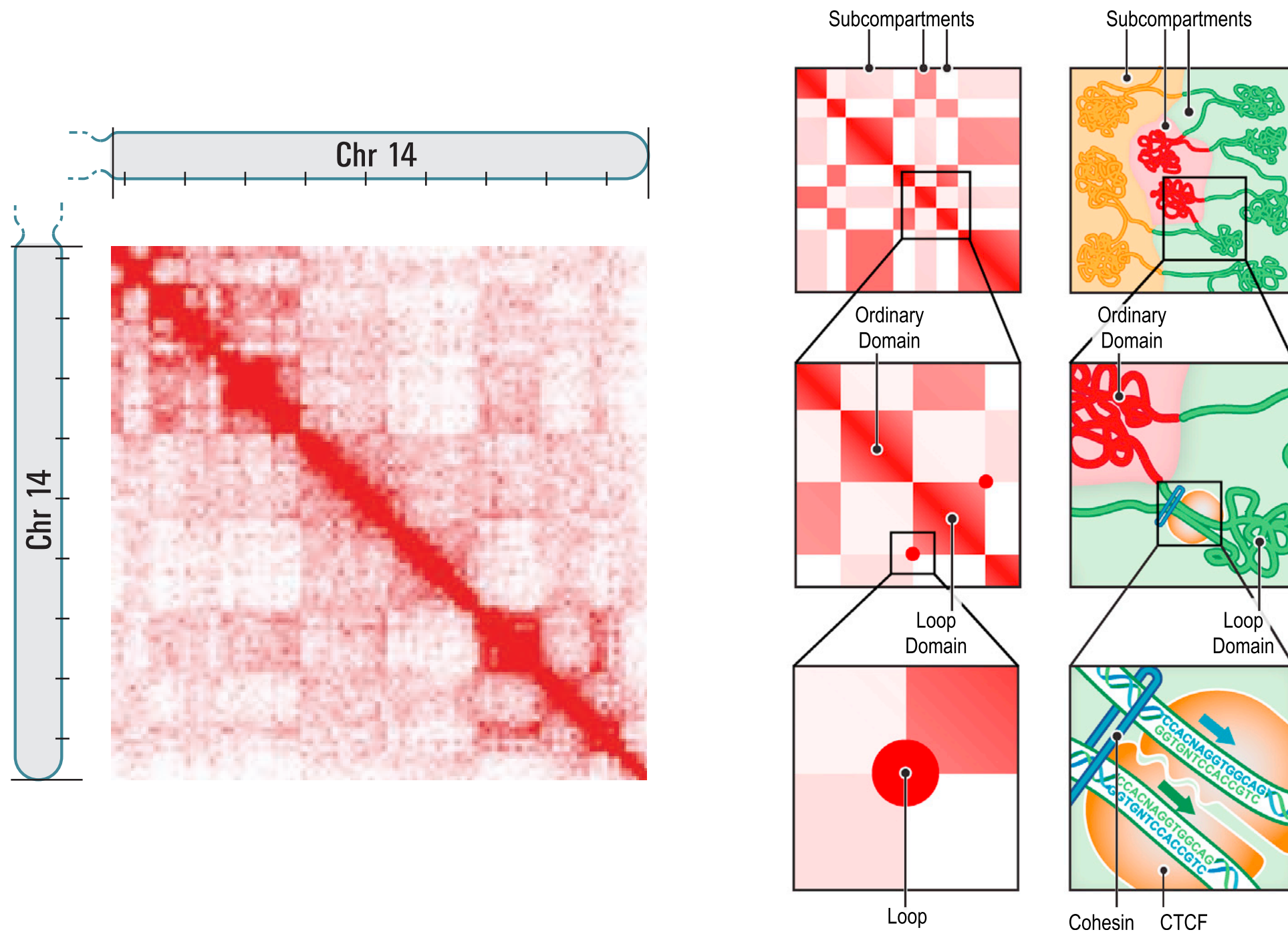
# Complex genome organization

Cavalli, G. & Misteli, T. Functional implications of genome topology. *Nat Struct Mol Biol* 20, 290–299 (2013).





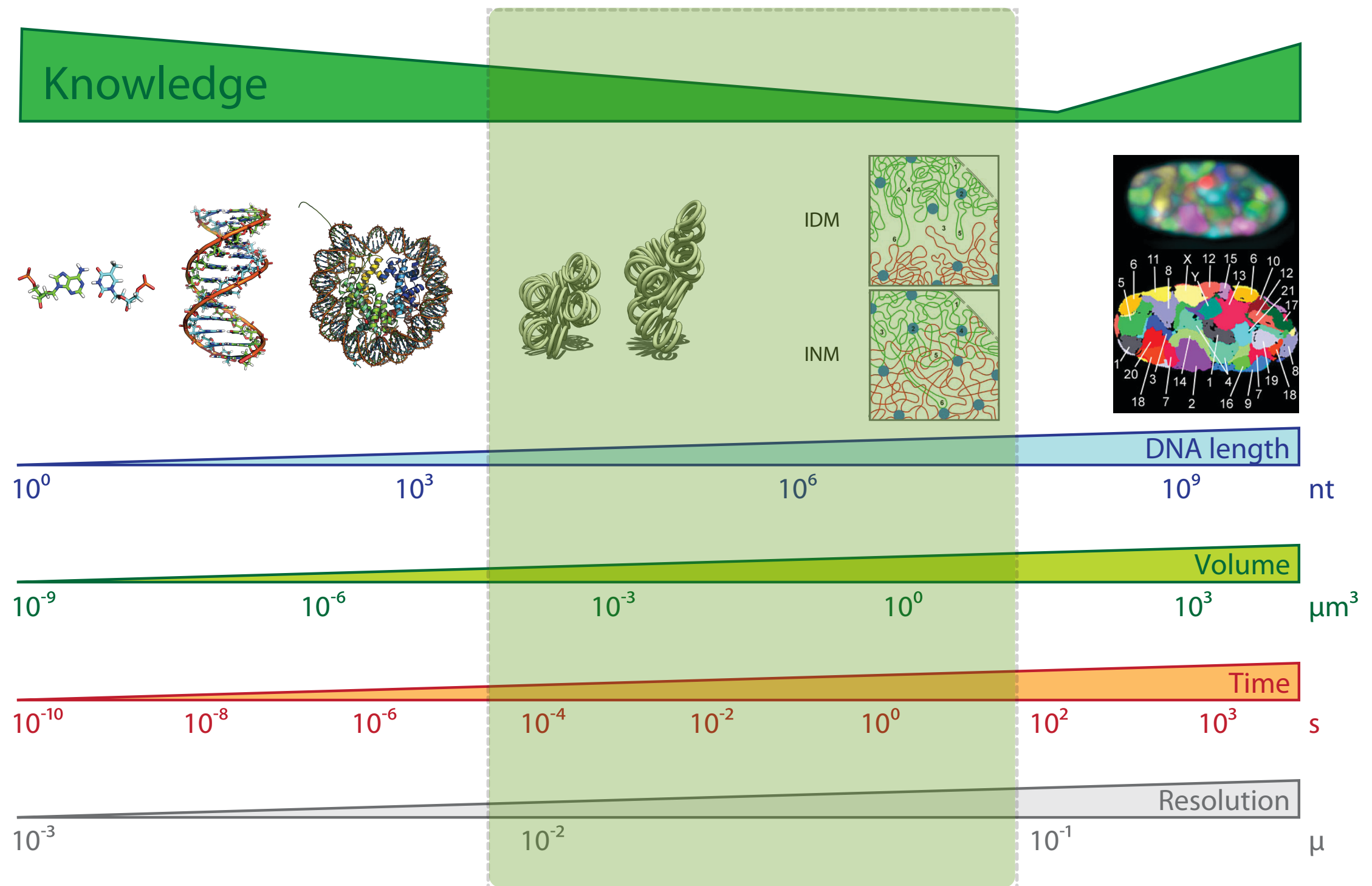
# Hierarchical genome organisation



Lieberman-Aiden, E., et al. (2009). *Science*, 326(5950), 289–293.  
 Rao, S. S. P., et al. (2014). *Cell*, 1–29.

# Resolution Gap

Marti-Renom, M. A. & Mirny, L. A. PLoS Comput Biol 7, e1002125 (2011)

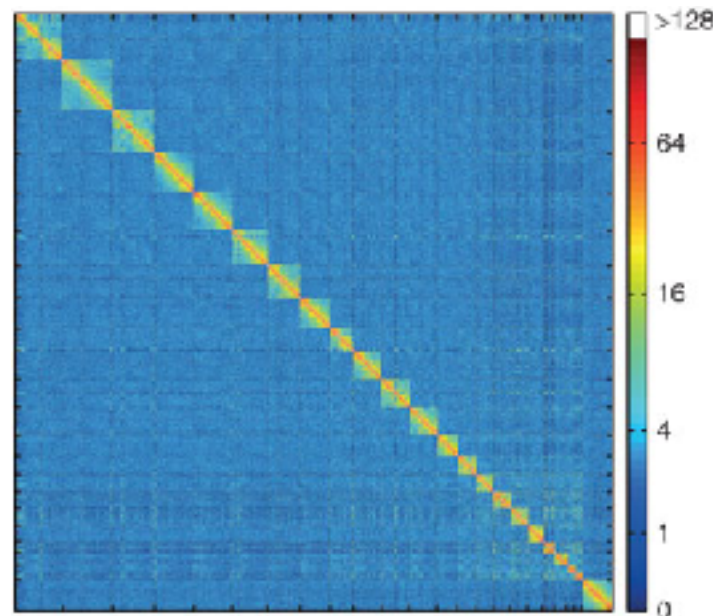
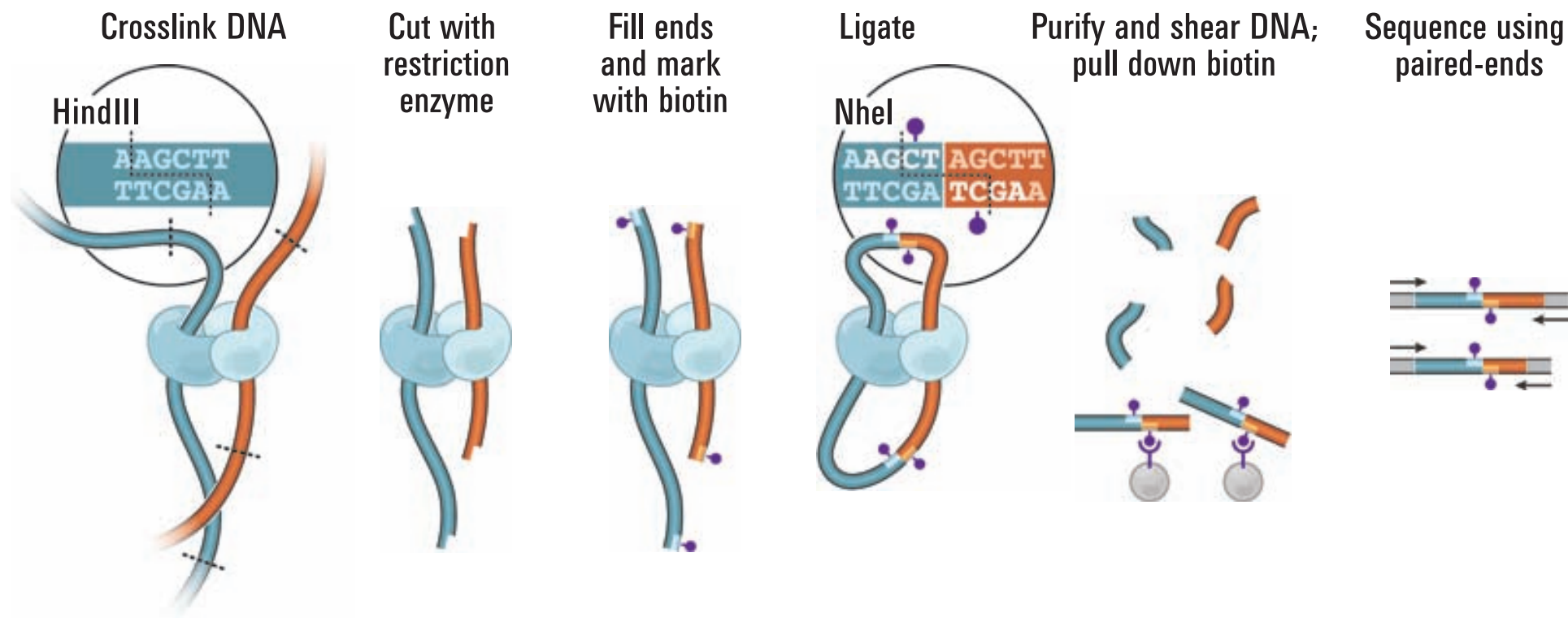




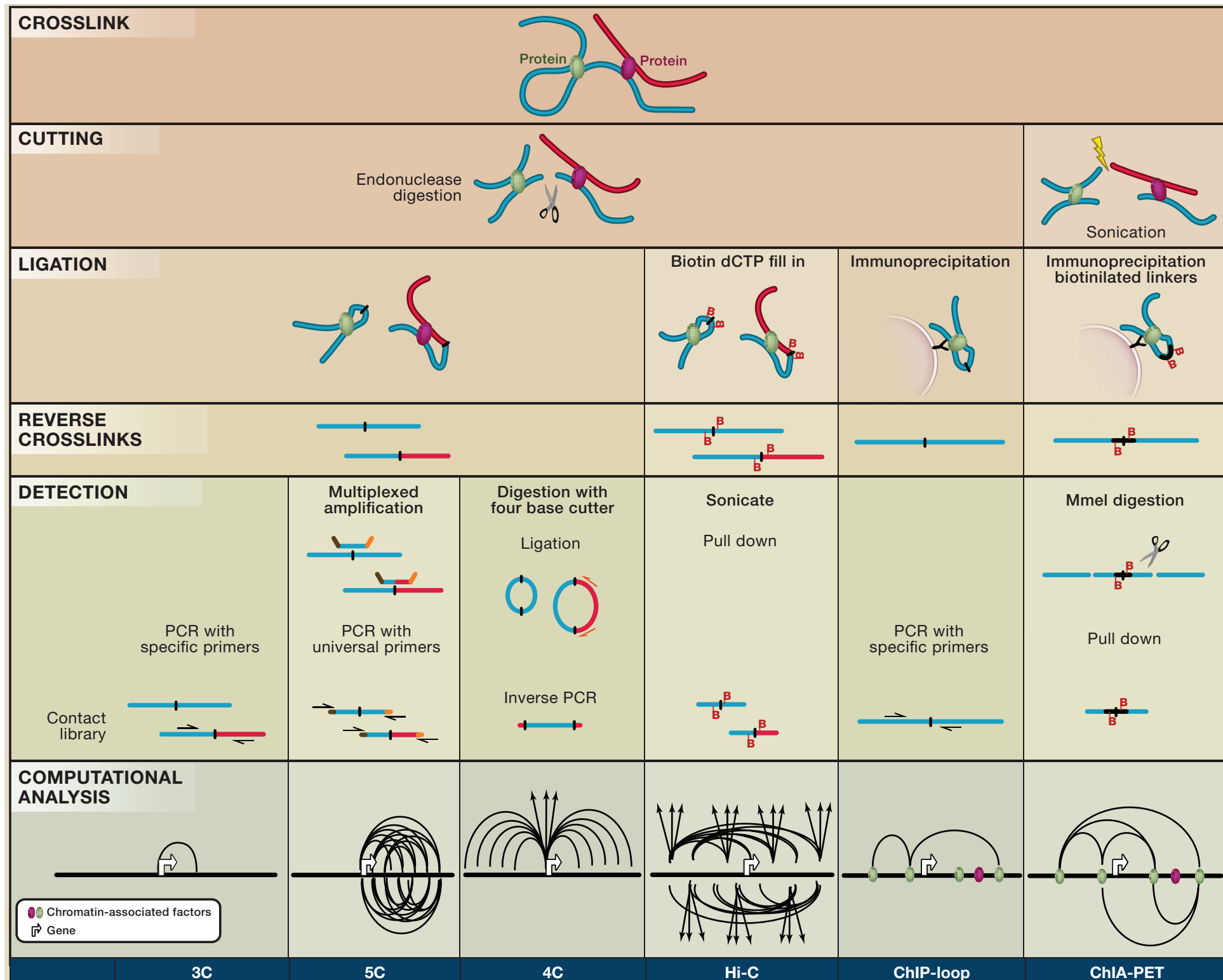
# Chromosome Conformation Capture

Dekker, J., Rippe, K., Dekker, M., & Kleckner, N. (2002). *Science*, 295(5558), 1306–1311.

Lieberman-Aiden, E., et al. (2009). *Science*, 326(5950), 289–293.

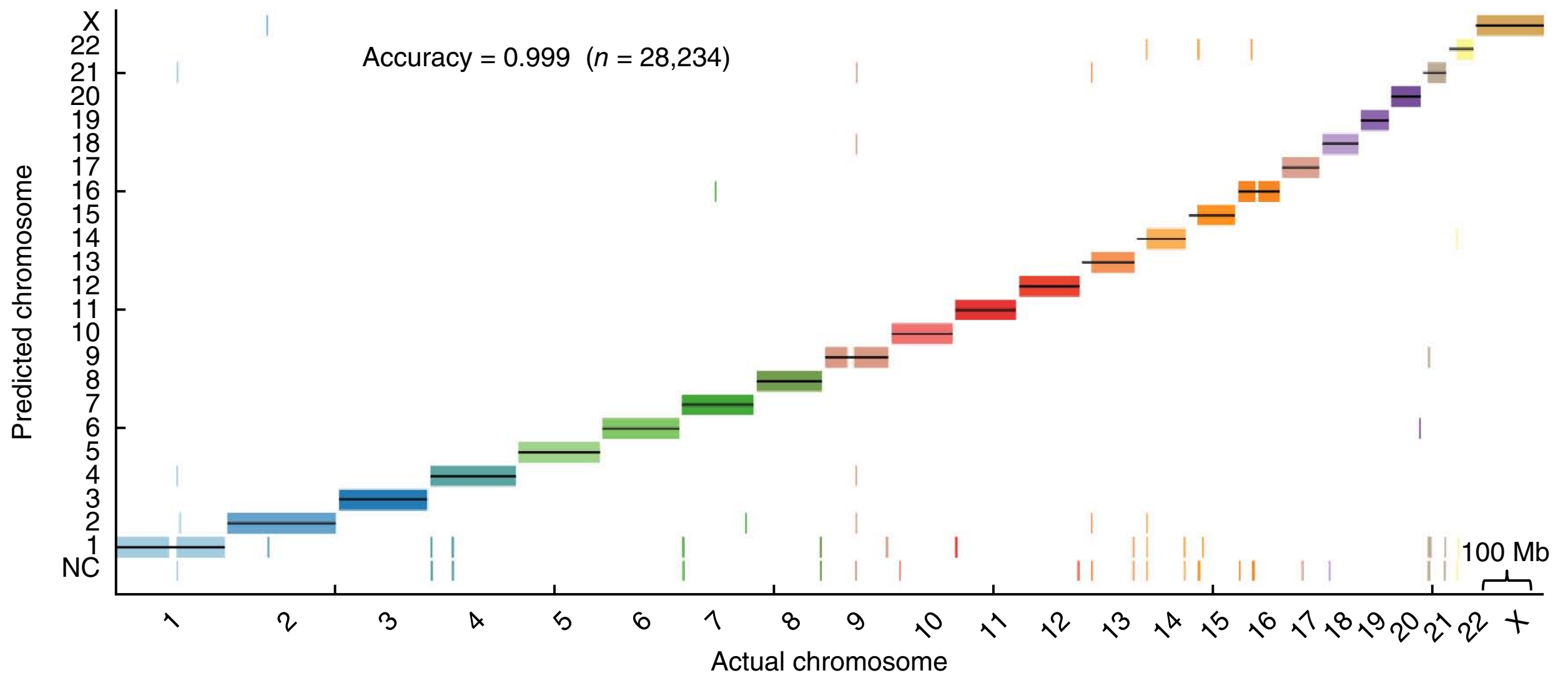


# Chromosome Conformation Capture



Hakim, O., & Misteli, T. (2012). SnapShot: Chromosome Confirmation Capture. *Cell*, 148(5), 1068–1068.e2.

# Chromosome Conformation Capture for de-novo assembly

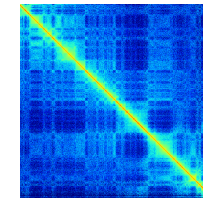
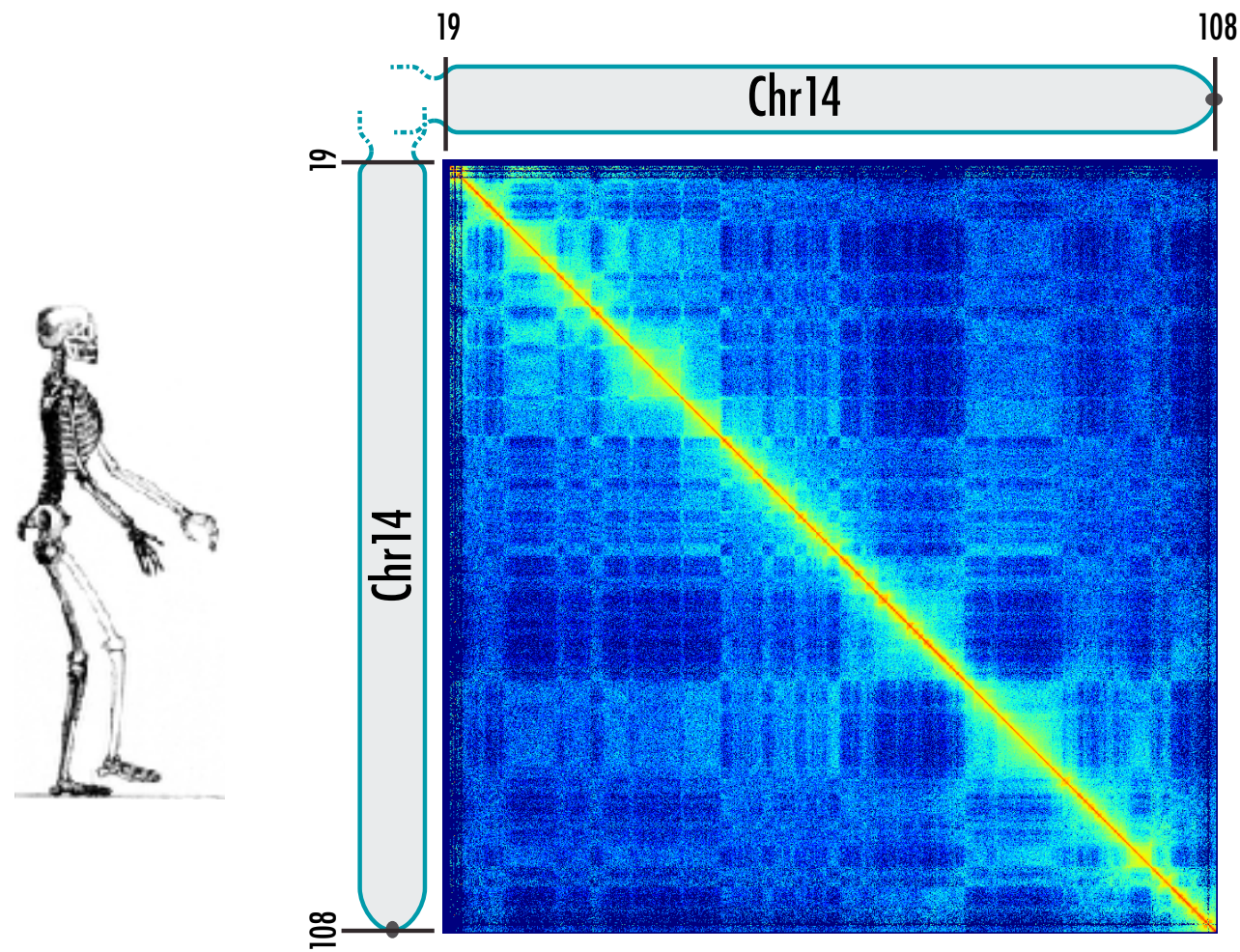


Kaplan, N., & Dekker, J. (2013). High-throughput genome scaffolding from in vivo DNA interaction frequency. *Nature Biotechnology*, 31(12), 1143–1147.

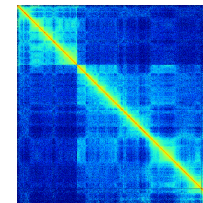


# Great apes lymphoblast maps

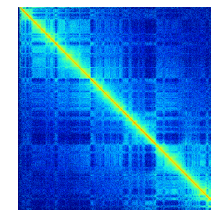
## Chromosome 14



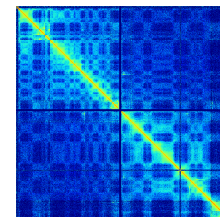
Chimpanzee



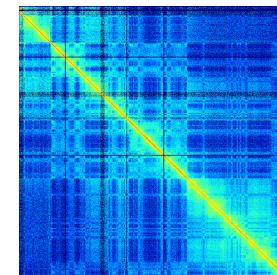
Gorilla



Orangutan



Gibbon

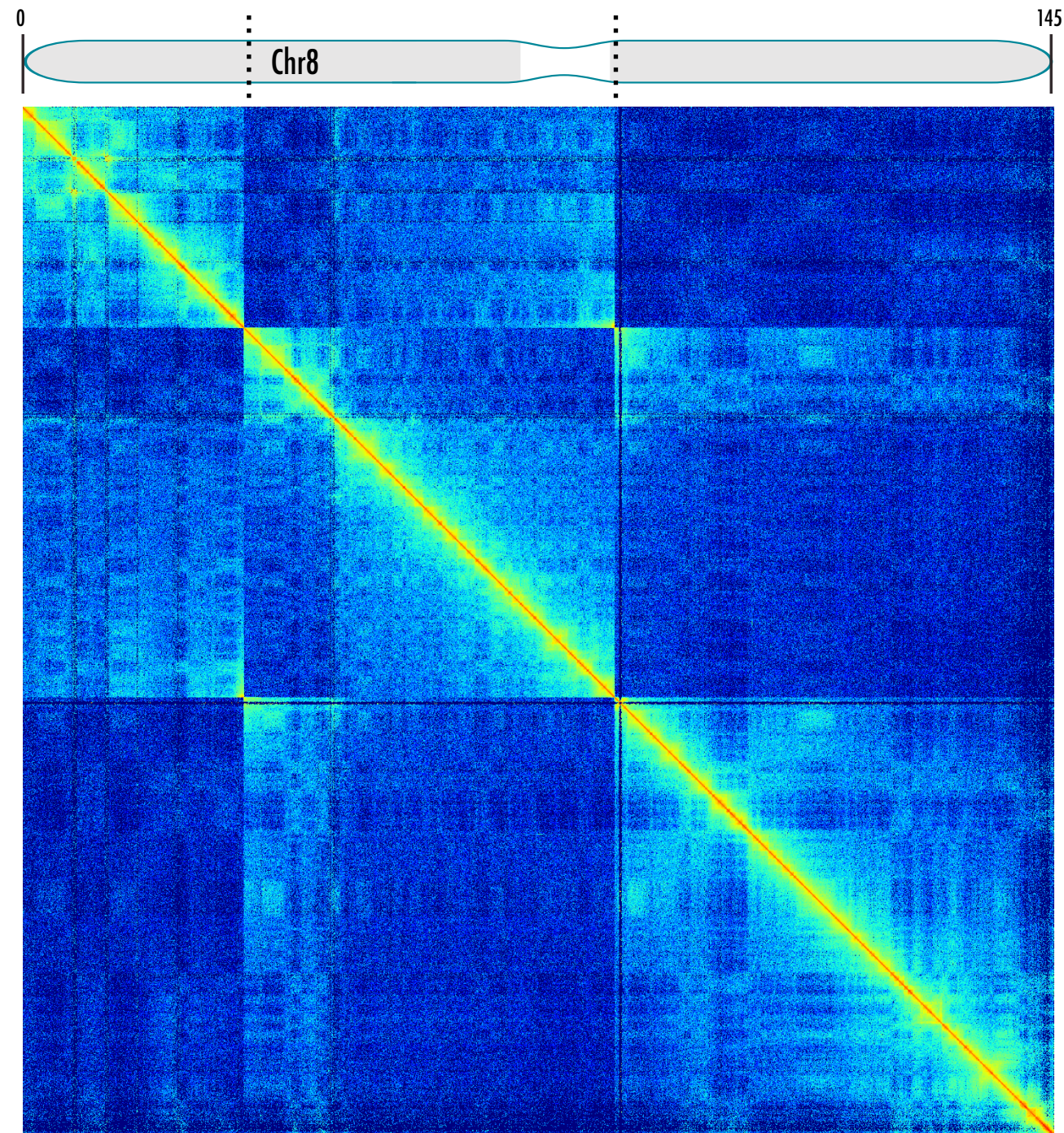


Mouse



# Assembly error detection

Chromosome 8 Gorilla

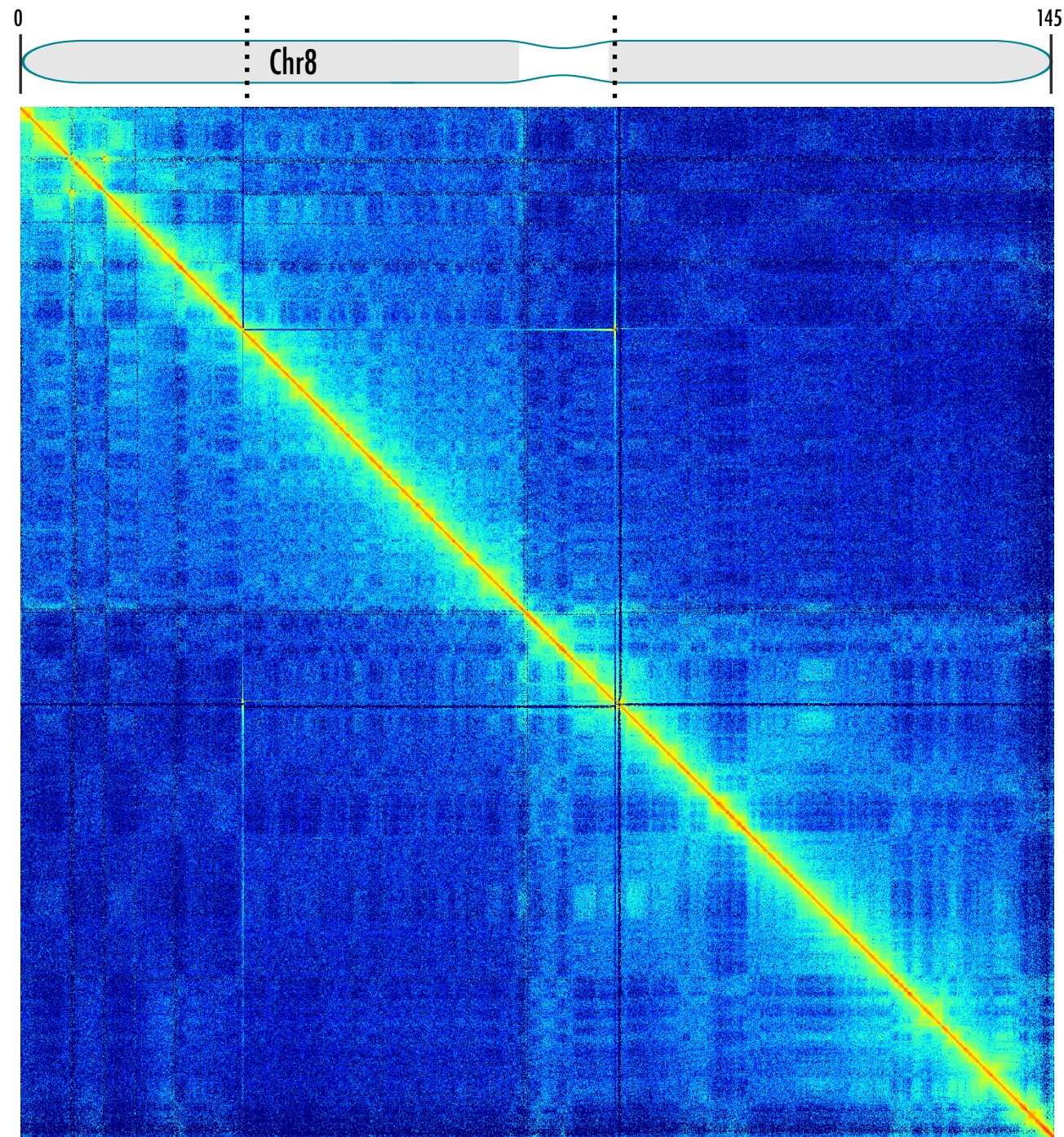


GGO8 has an inversion of the region corresponding to HSA8:30.0-86.9Mb  
Aylwyn Scally (Department of Genetics, University of Cambridge)



# Assembly error detection

Chromosome 8 Gorilla

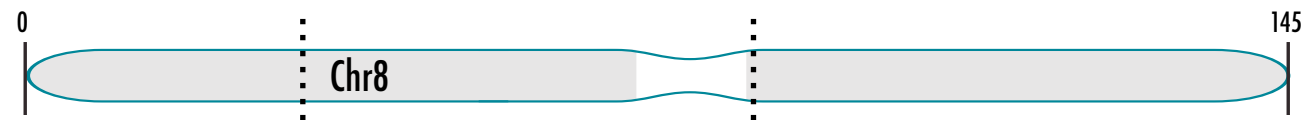


GGO8 has an inversion of the region corresponding to HSA8:30.0-86.9Mb  
Aylwyn Scally (Department of Genetics, University of Cambridge)

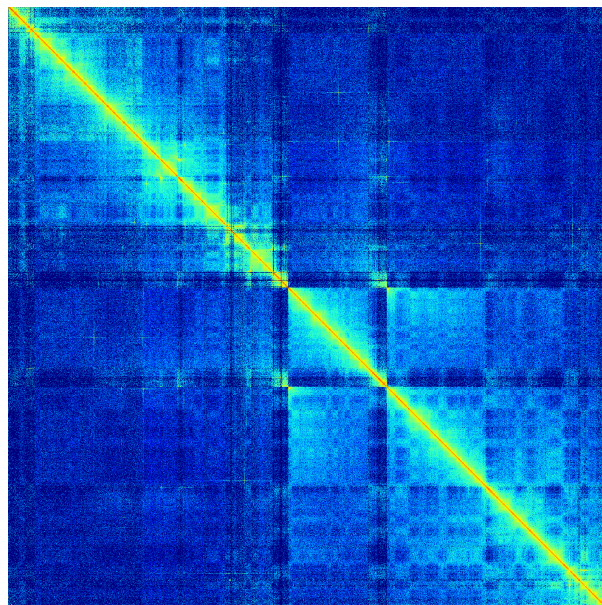


# Assembly error detection

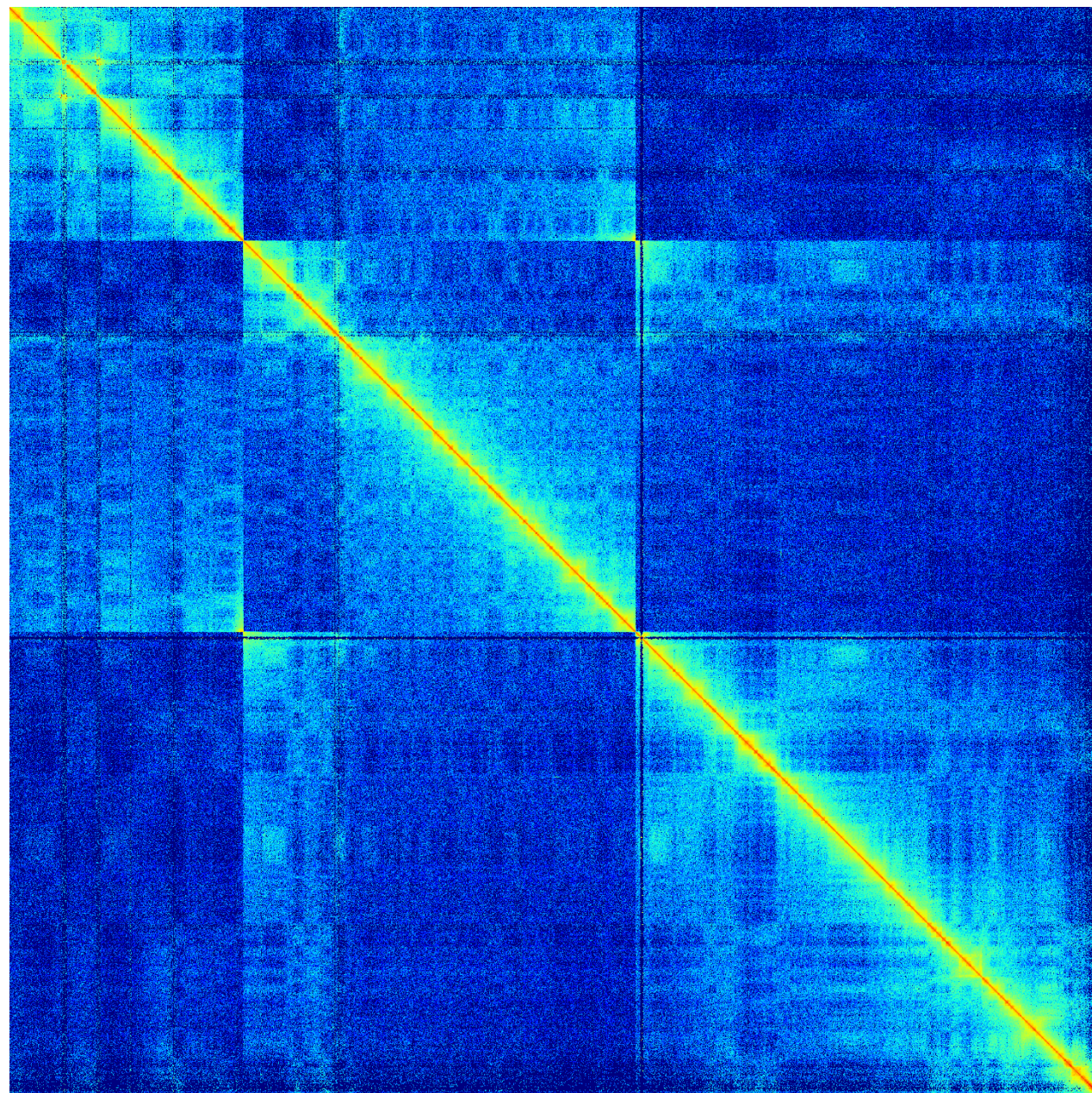
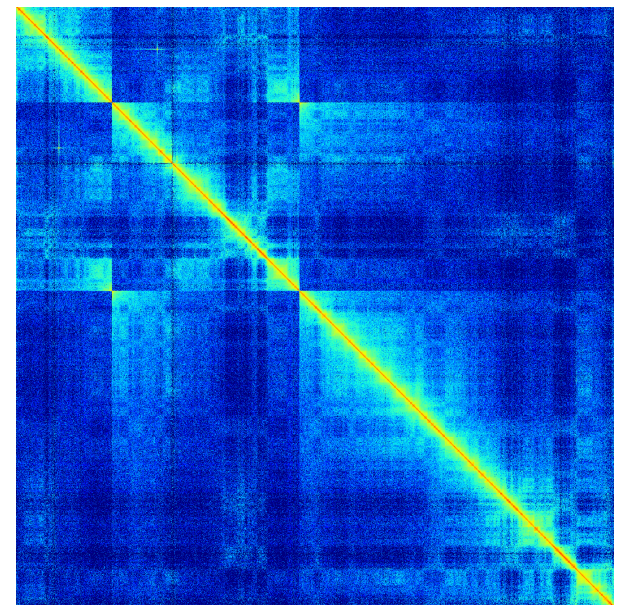
Chromosome 8 Gorilla



Chr 7



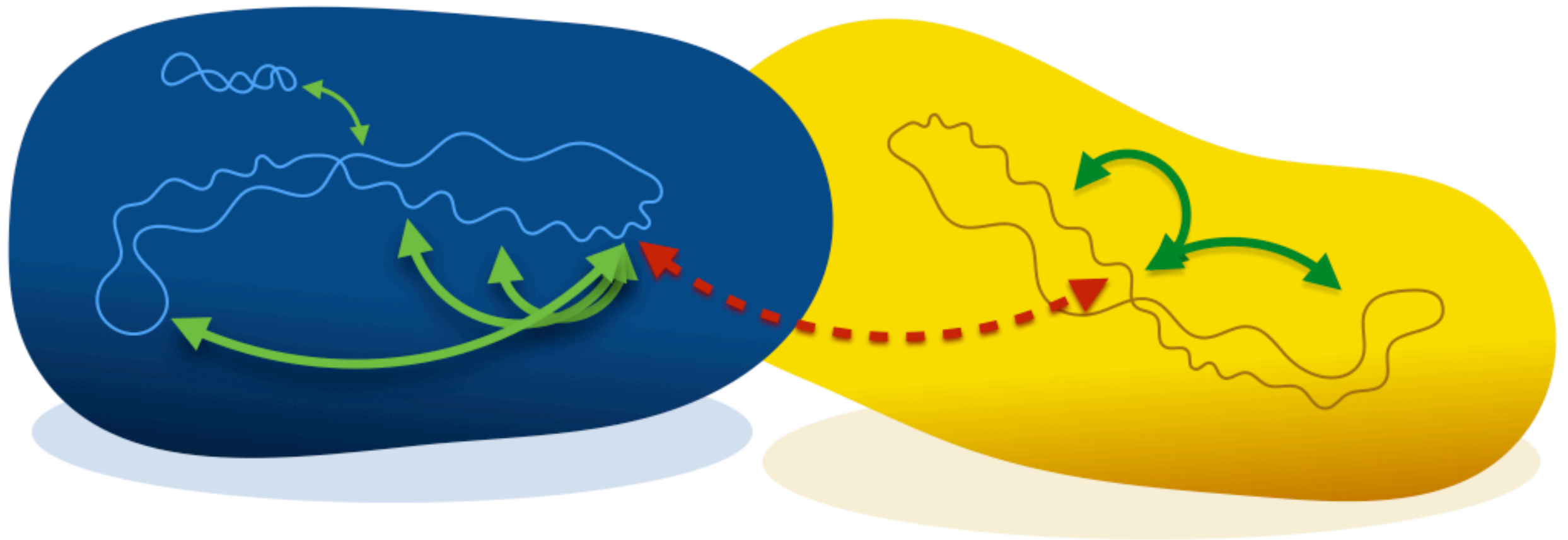
Chr 12



GGO8 has an inversion of the region corresponding to HSA8:30.0-86.9Mb  
Aylwyn Scally (Department of Genetics, University of Cambridge)



# Chromosome Conformation Capture for meta genomics



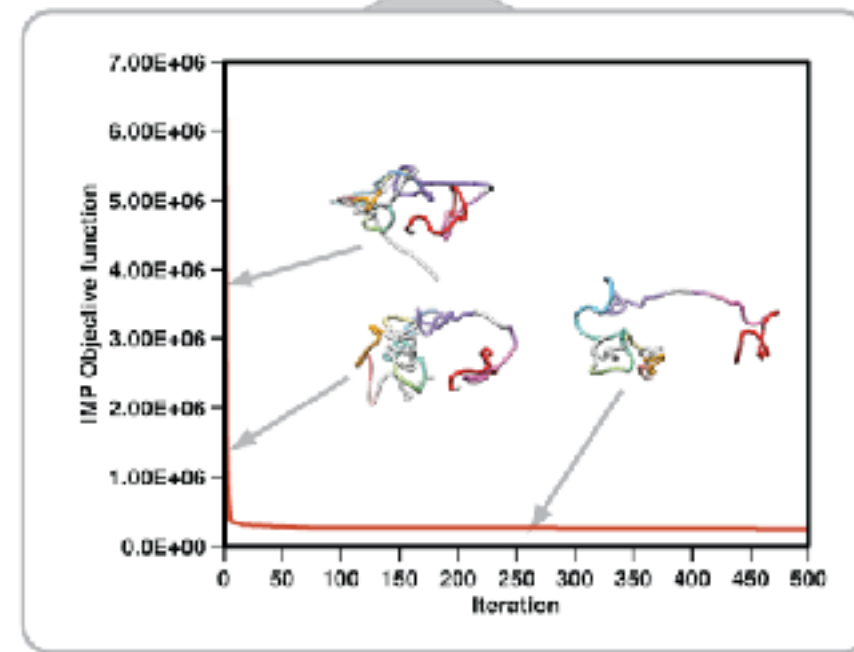
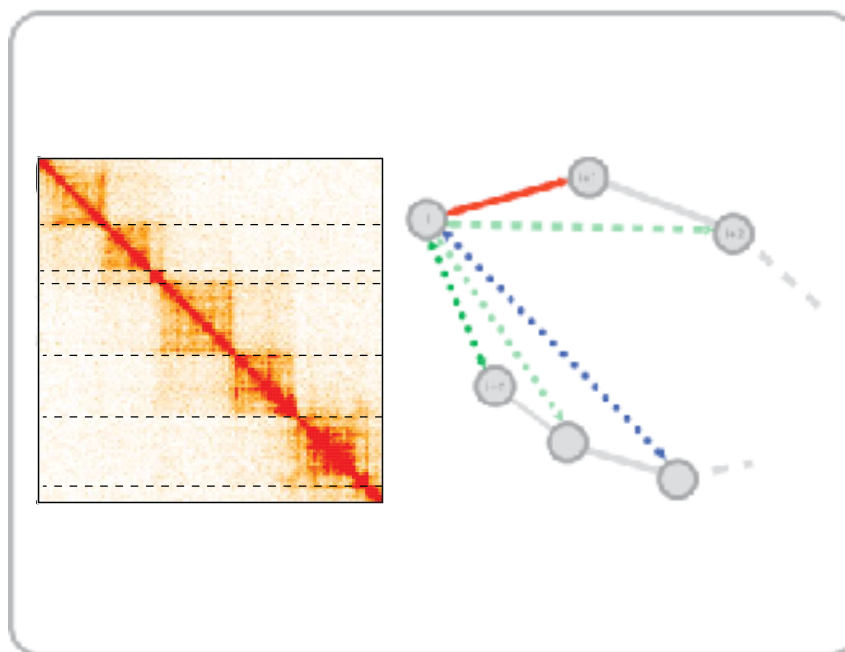
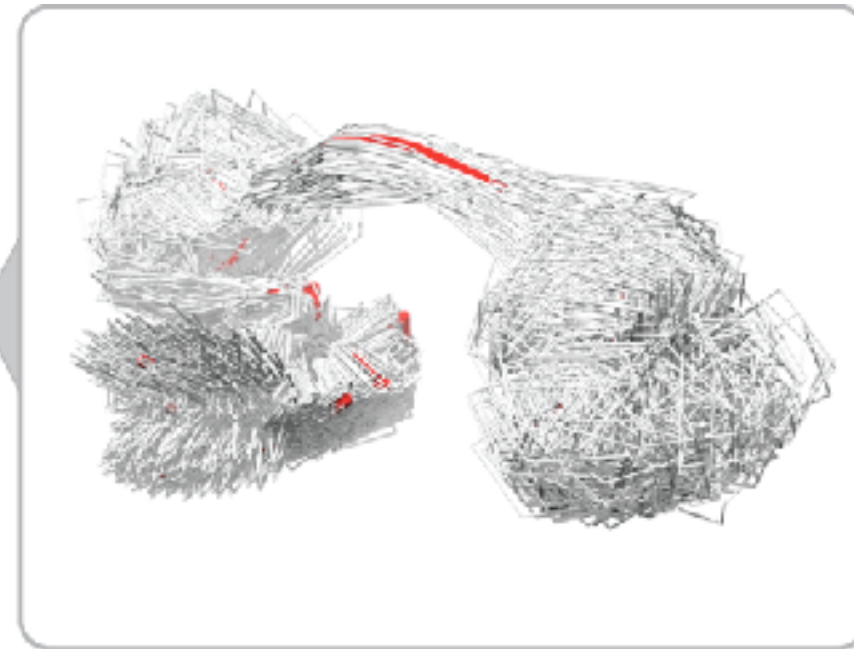
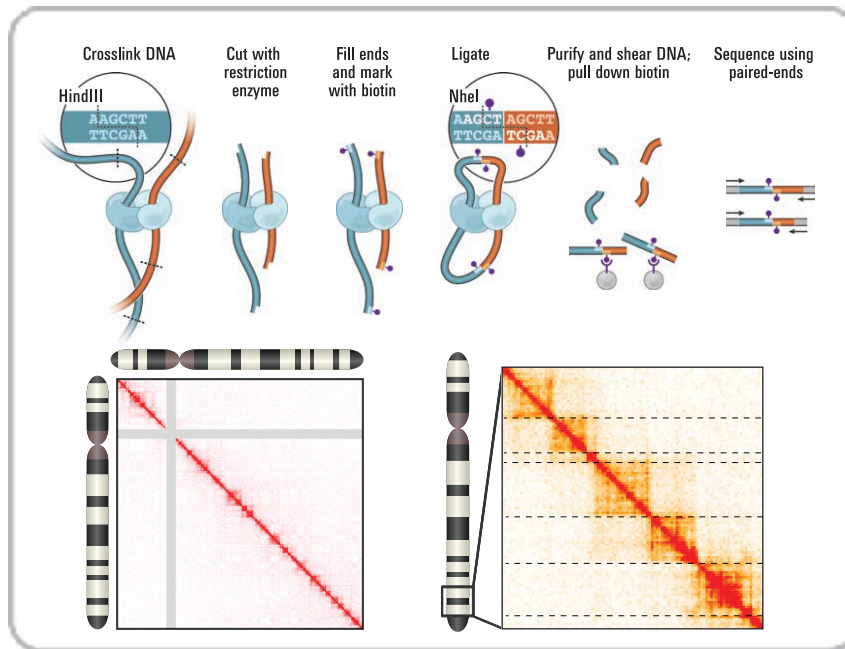
Beitel, C. W., Froenicke, L., Lang, J. M., Korf, I. F., Micheltore, R. W., Eisen, J. A., & Darling, A. E. (2014). Strain- and plasmid-level deconvolution of a synthetic metagenome by sequencing proximity ligation products. doi:10.7287/peerj.preprints.260v1



# Hybrid Method

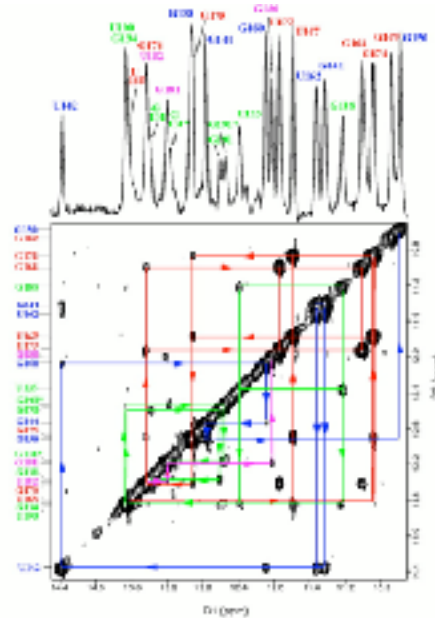
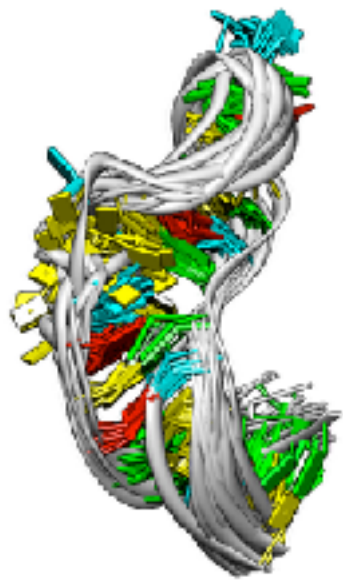
Baù, D. & Marti-Renom, M. A. Methods 58, 300–306 (2012).

## Experiments

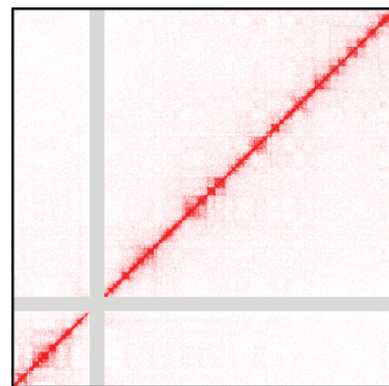
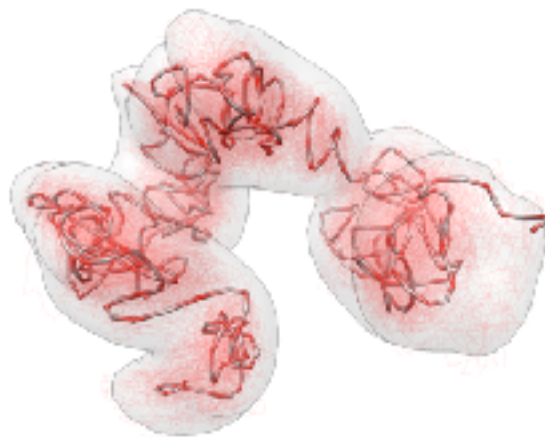


## Computation

# Structure determination using Hi-C data



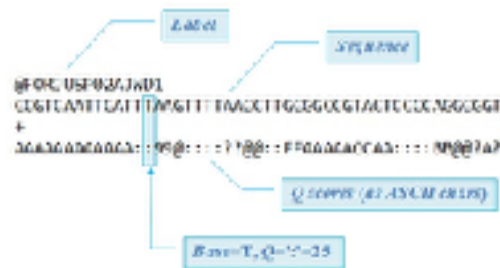
Biomolecular structure determination  
2D-NOESY data



Chromosome structure determination  
3C-based data



<http://3DGenomes.org>

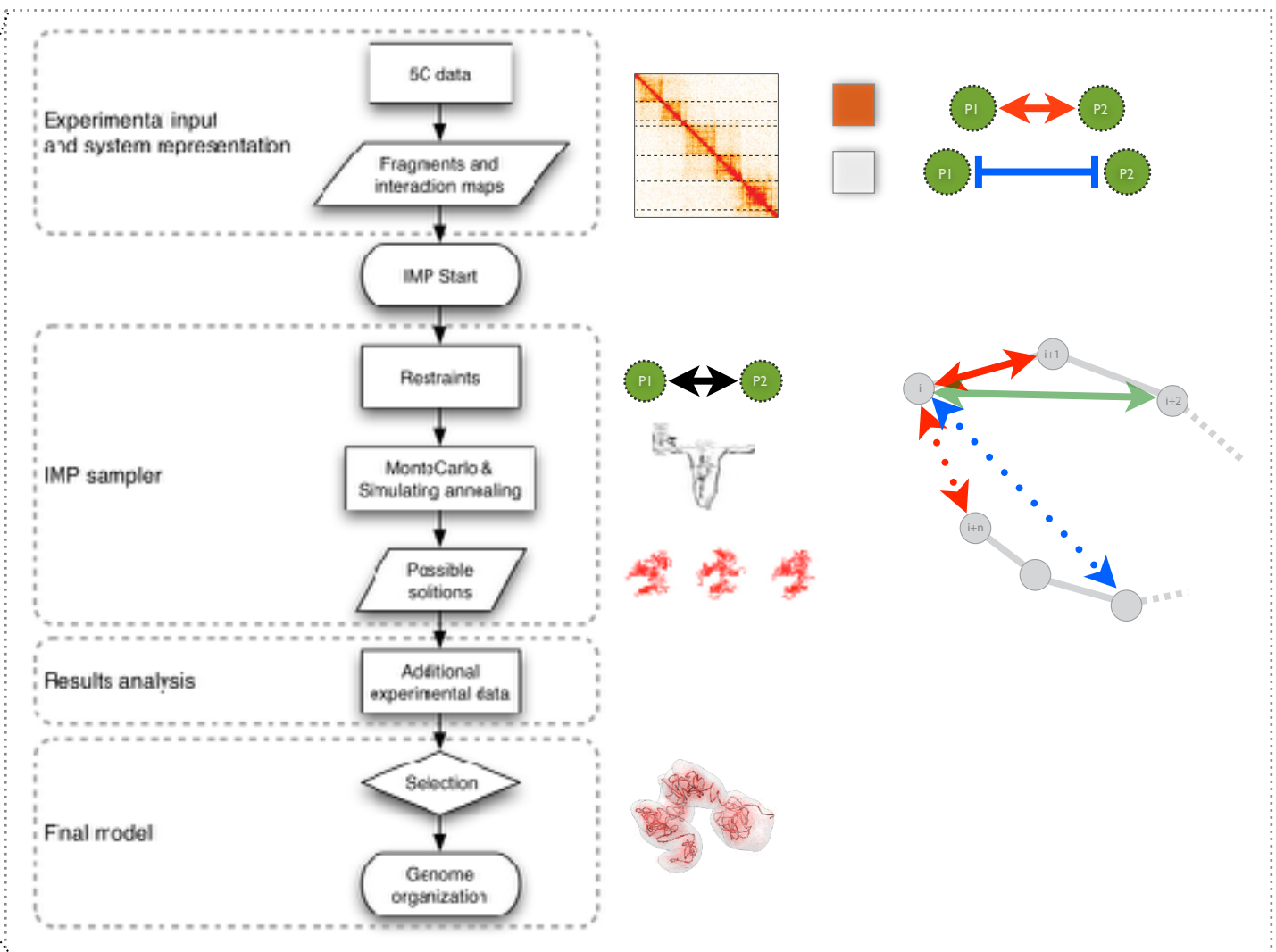


FastQ files to Maps

Map analysis

Model building

Model analysis





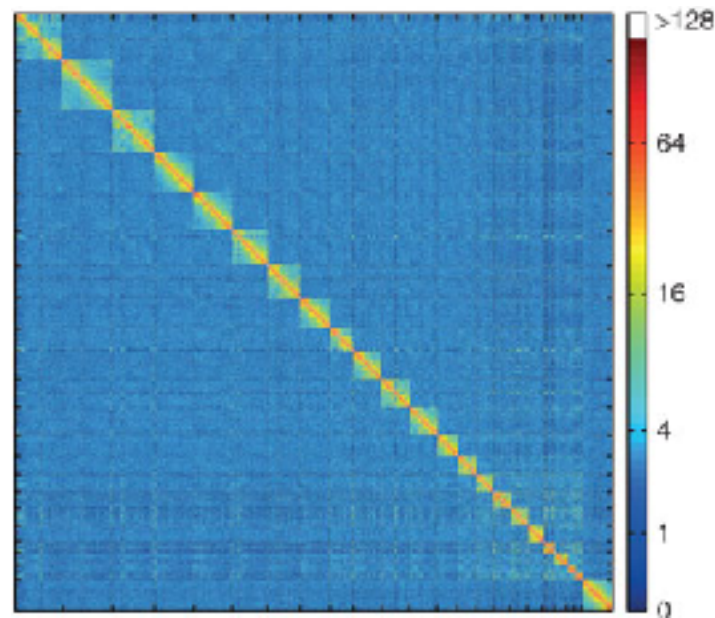
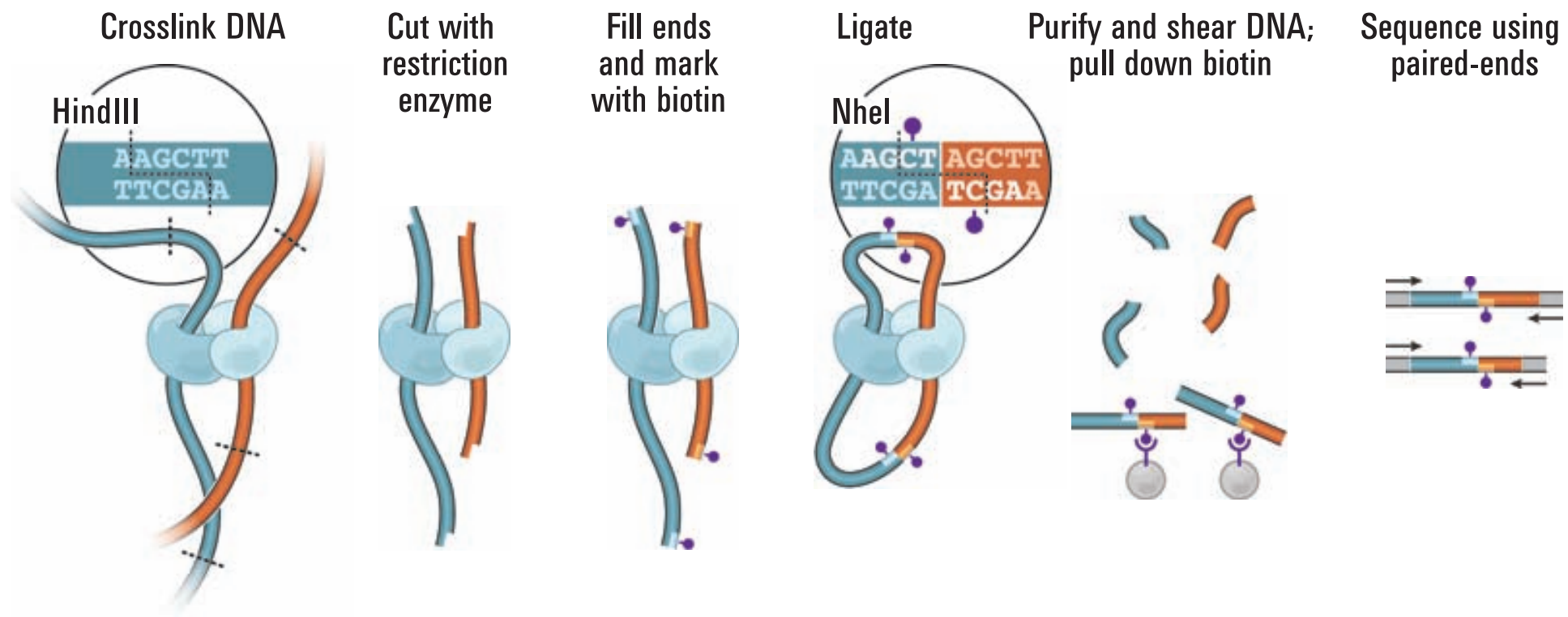


Got FASTQ?



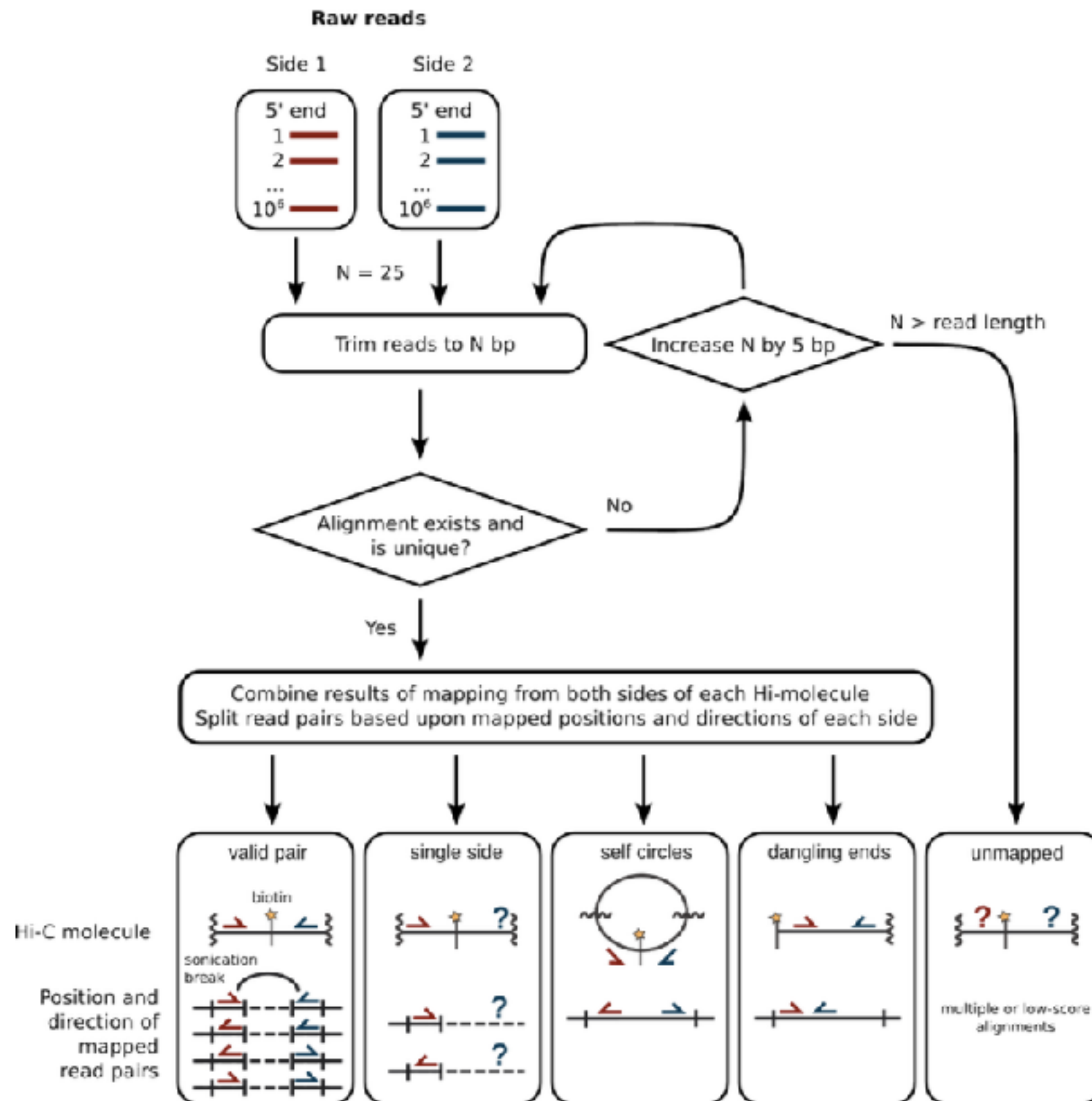
# Hi-C experiment

Lieberman-Aiden, E., et al. (2009). *Science*, 326(5950), 289–293.



# Mapping & Filtering

Imakaev, M. V et al. (2012). Nature Methods, 9(10), 999–1003.



# How much you normally map?

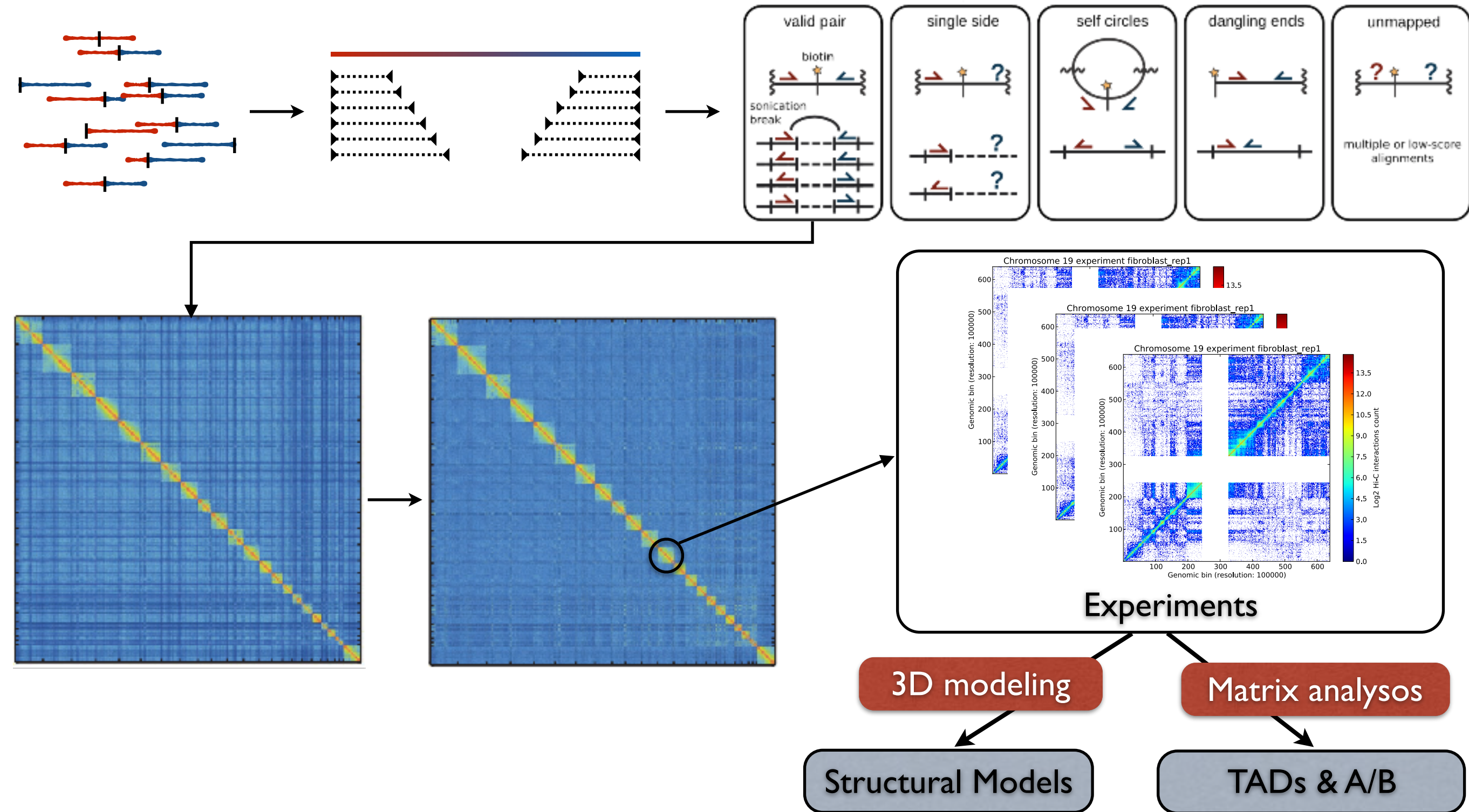
- 80-90% each end => 60-80% intersection
- ~1% multiple contacts
- Many of intersecting pairs will be lost in filtering...
- Final 40-60% of valid pairs
- One measure of quality is the CIS/TRANS ration (70-80% good)



Got mapped  
reads?



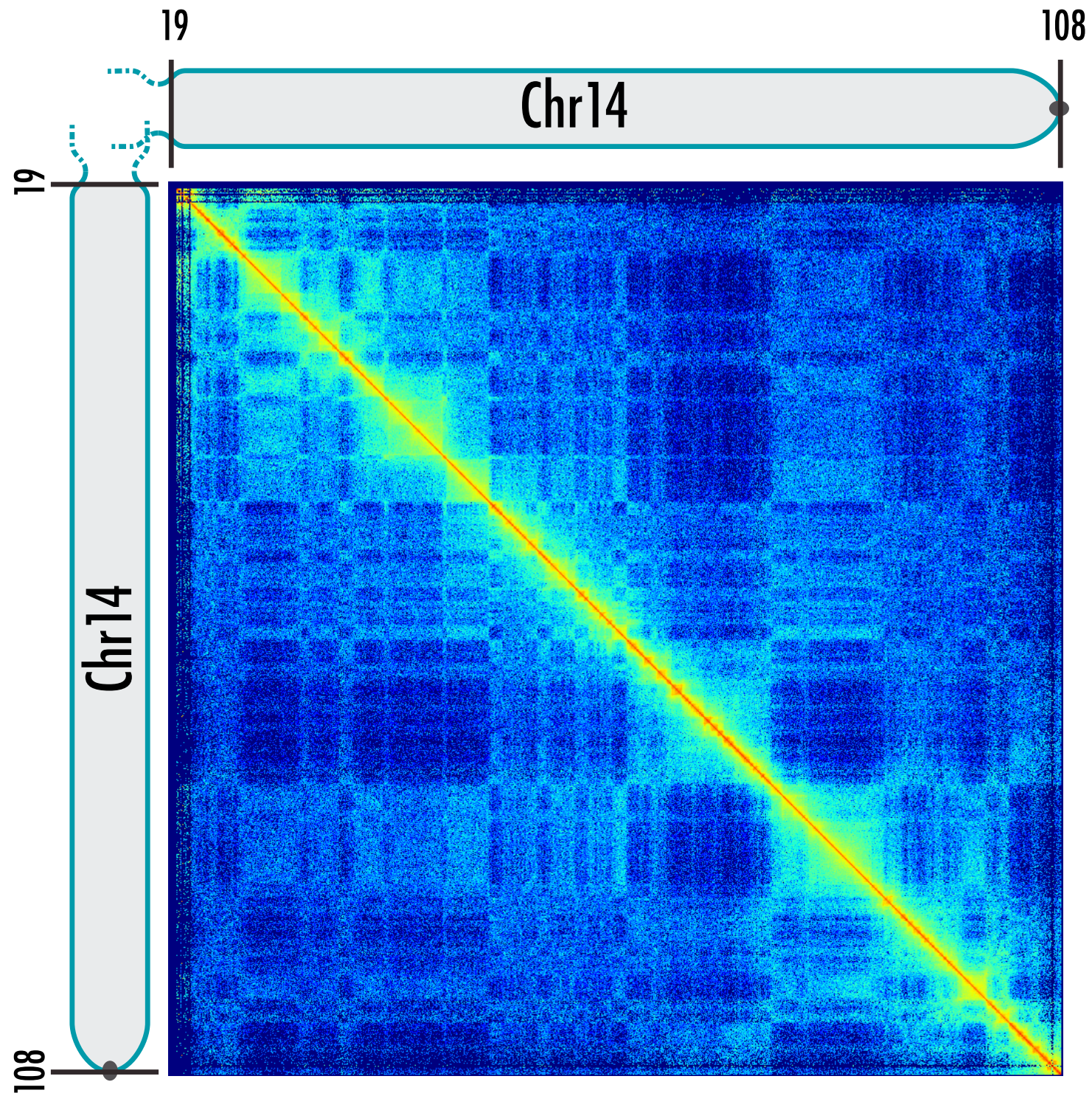
# Interaction matrices





# A/B Compartment

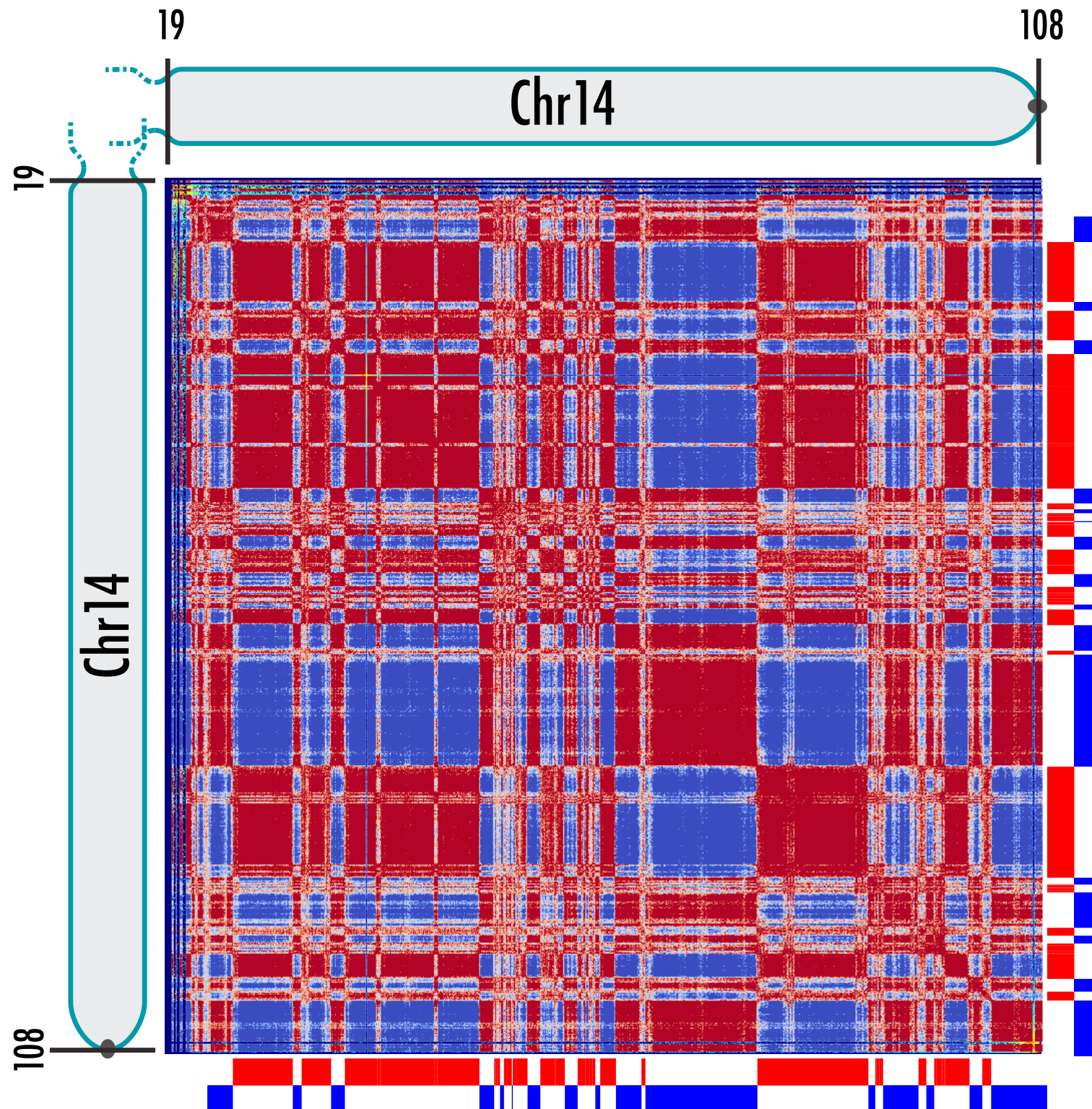
Chromosome 14





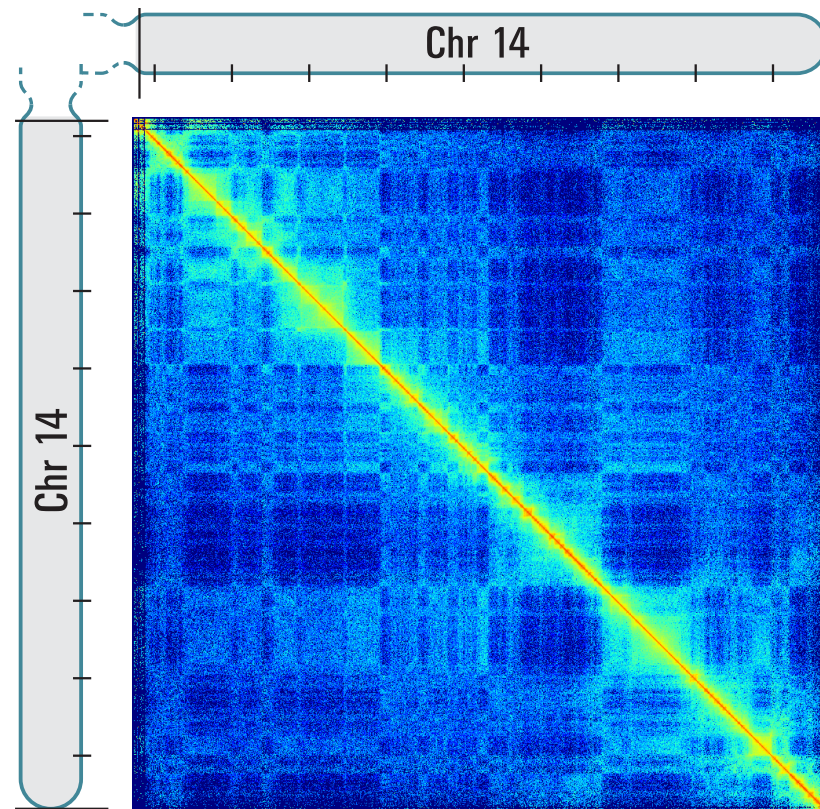
# A/B Compartment

Chromosome 14



# TADs

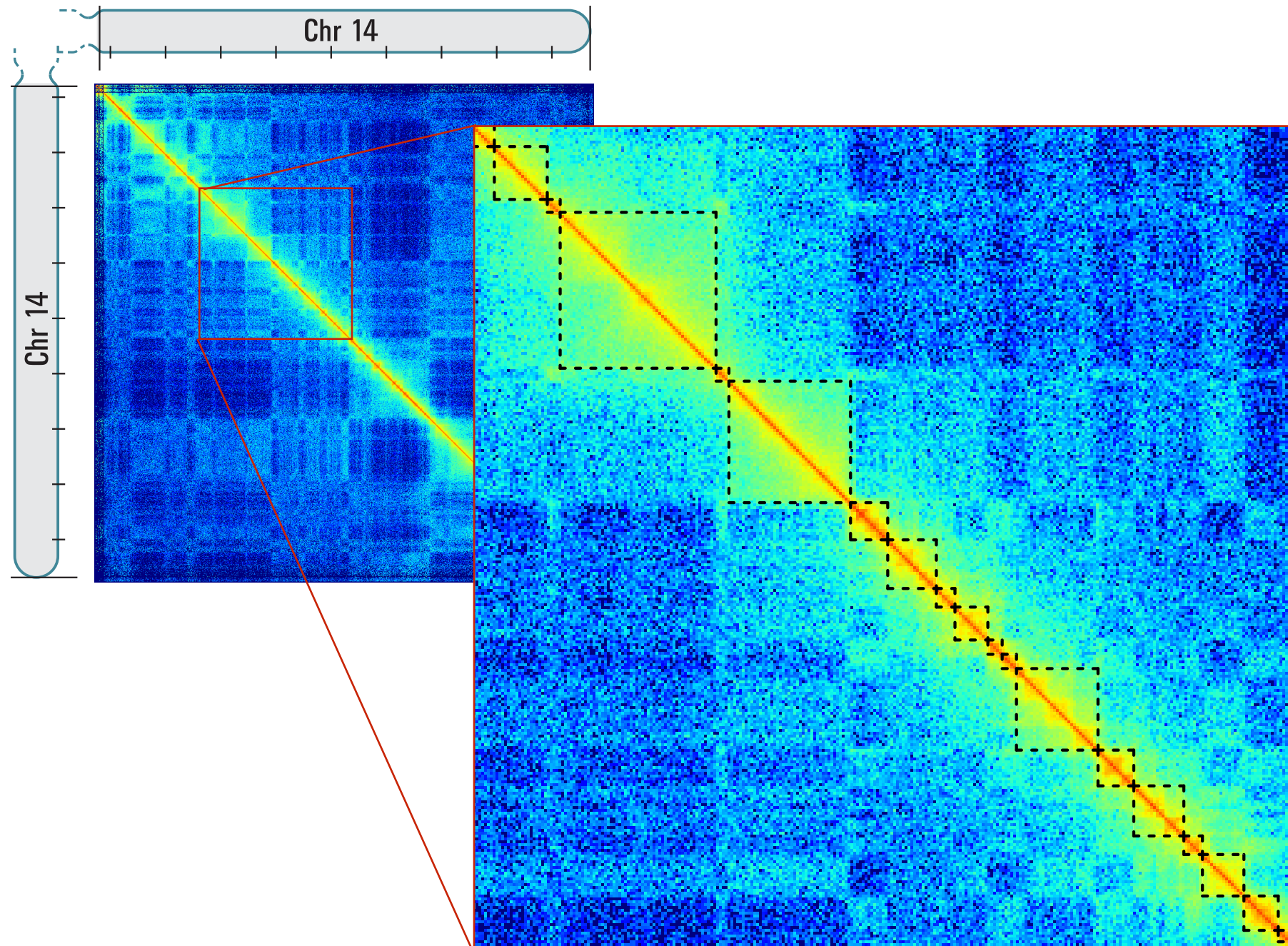
## Chromosome 14





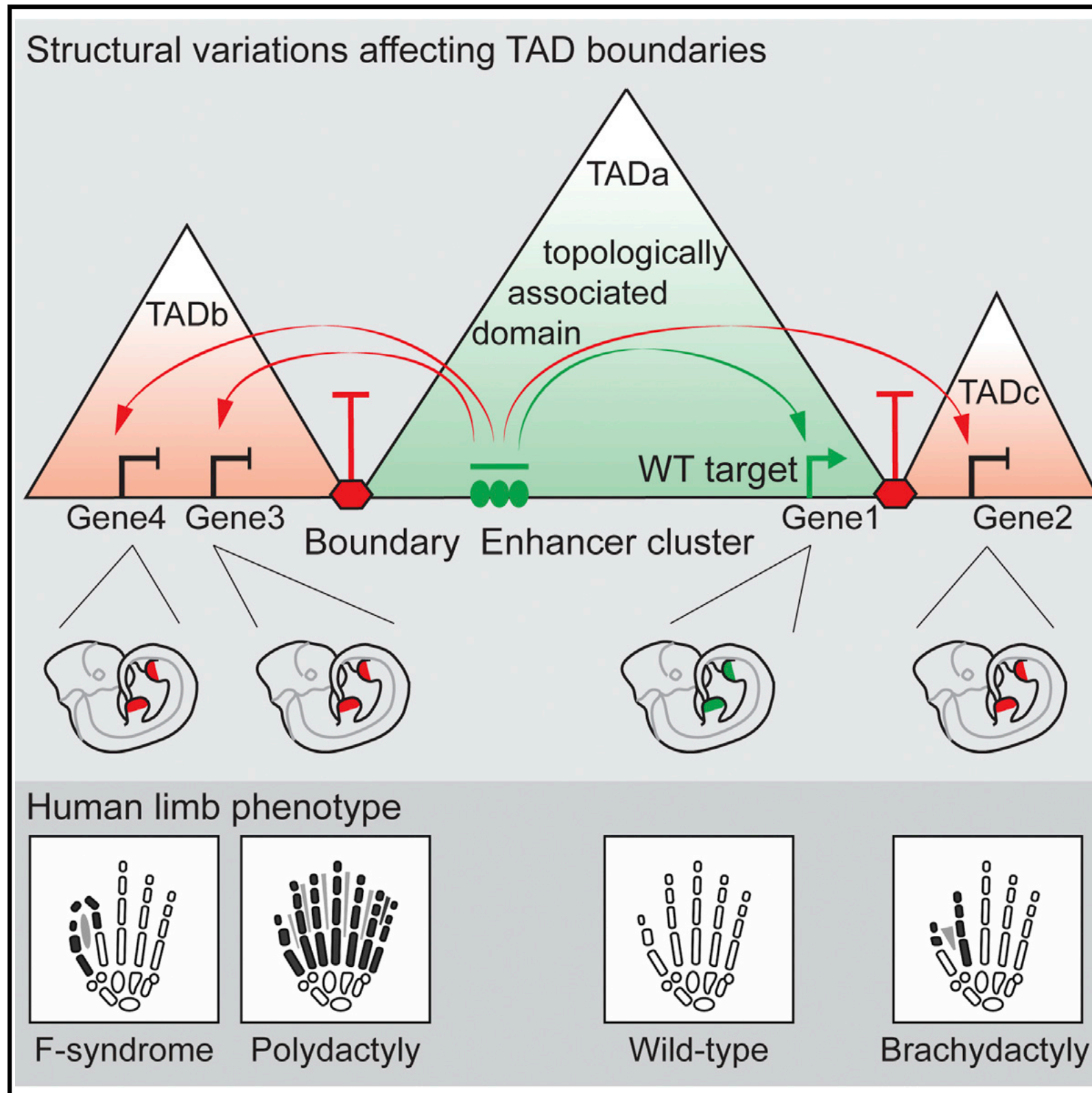
# TADs

## Chromosome 14



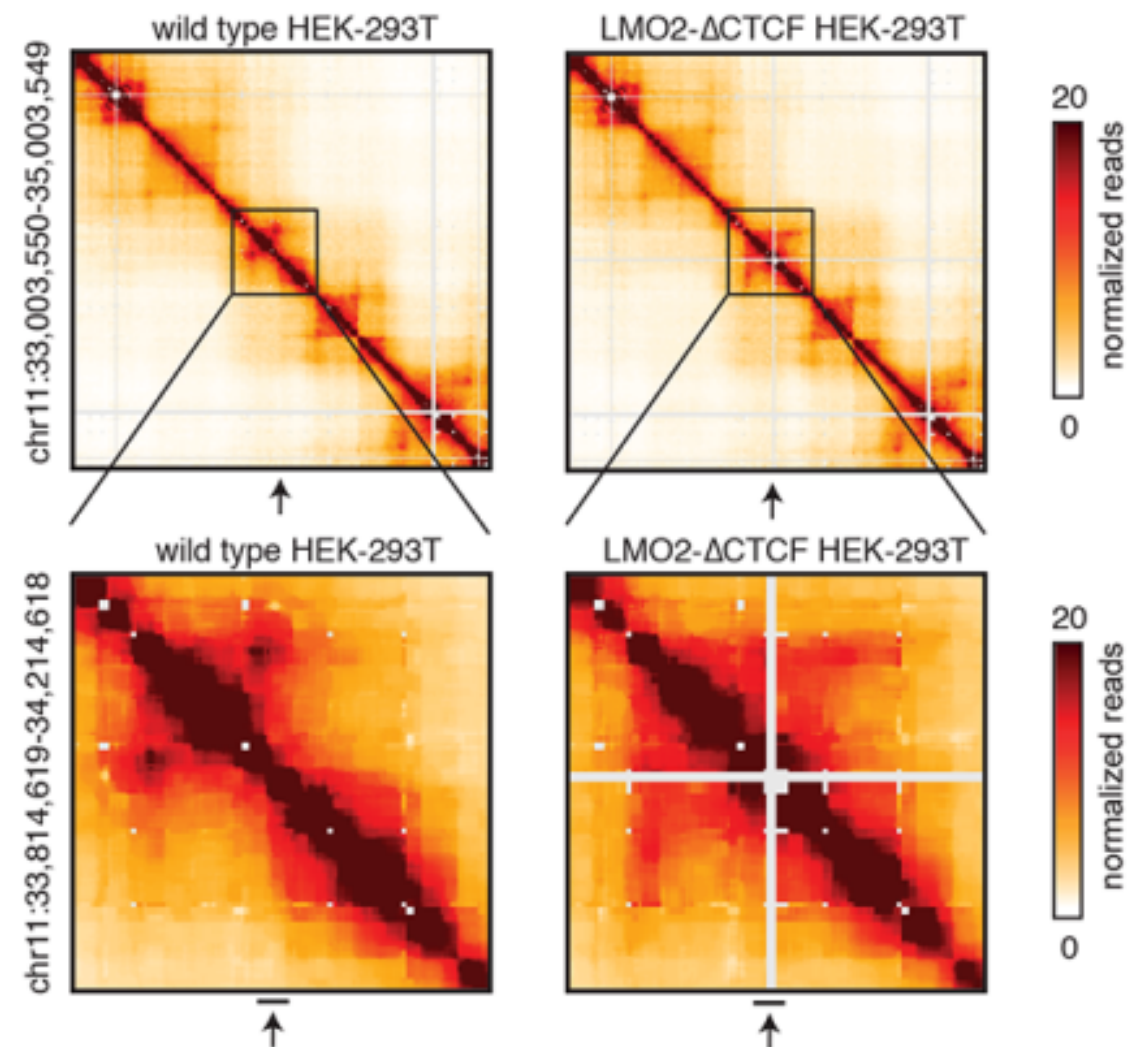
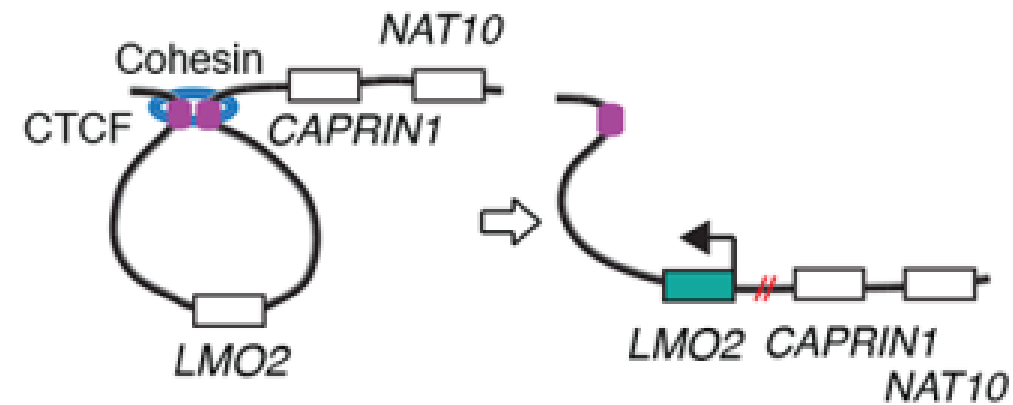
# TADs are functional units

Lupiáñez, et al. (2015). Cell, 1–15.



# TADs are functional units

Hnisz, D., et al. (2016). Science, on line





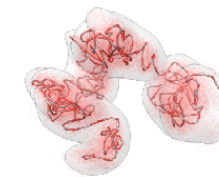
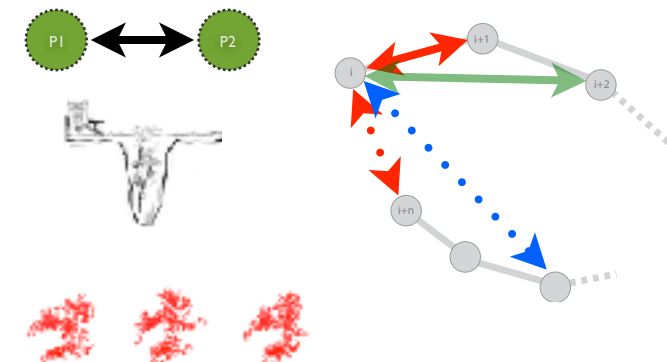
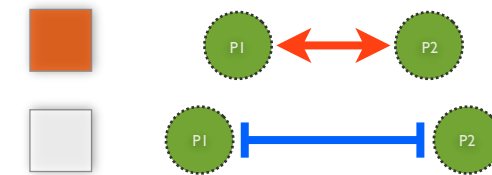
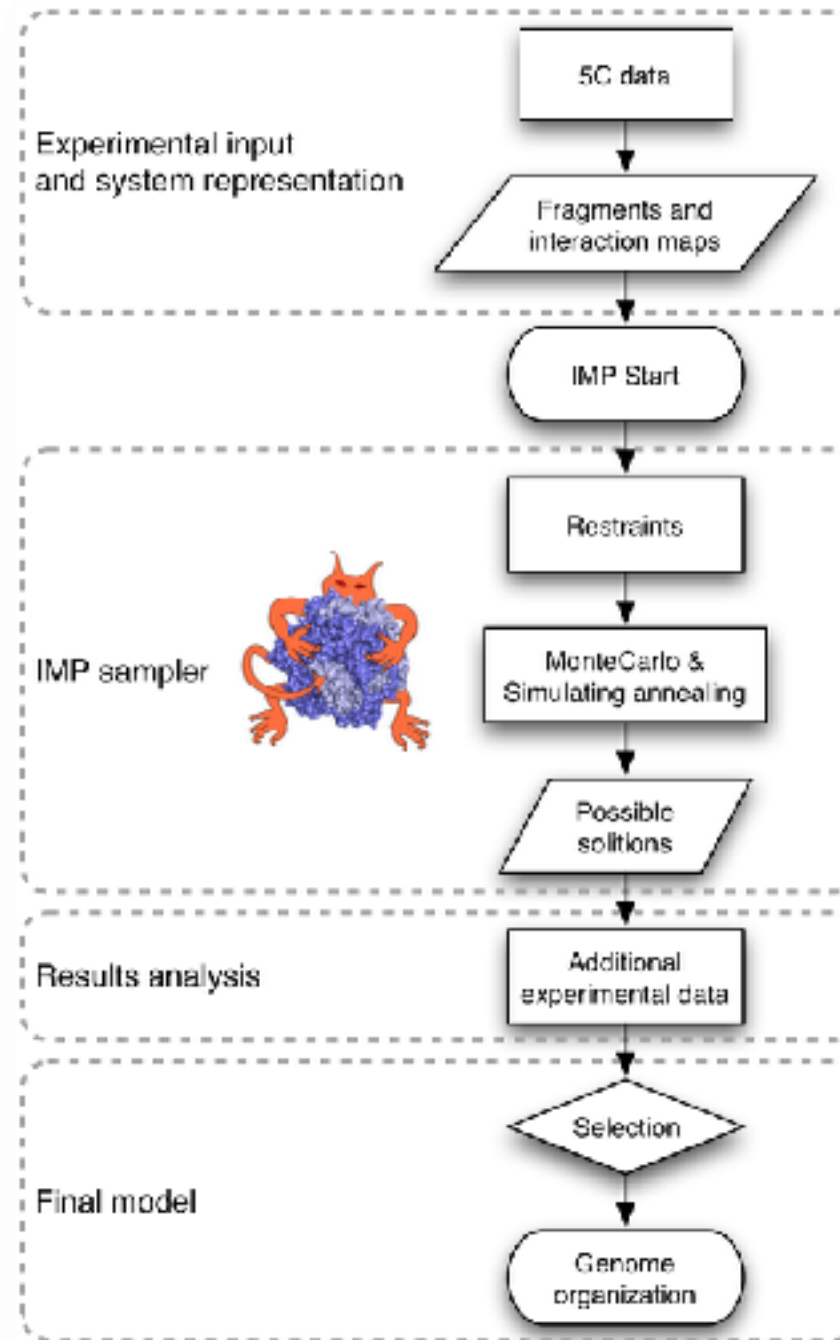
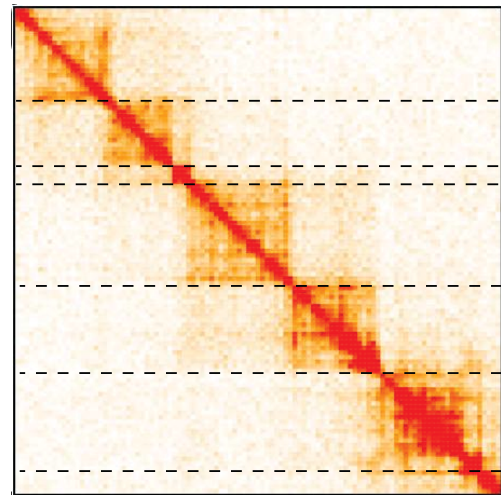


Got normalized  
Hi-C maps?

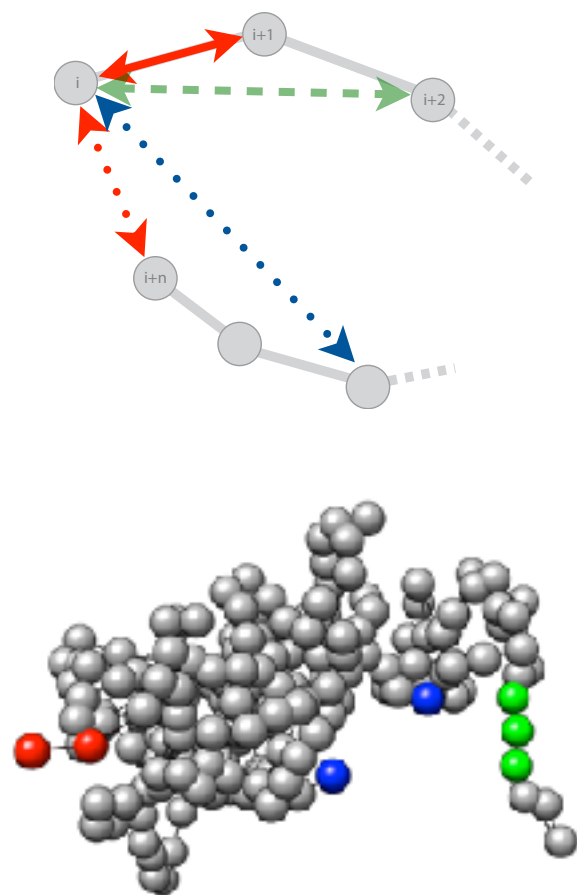




<http://3DGenomes.org>  
<http://www.integrativemodeling.org>



# Model representation and scoring



$d = d_0$



$d < d_0$

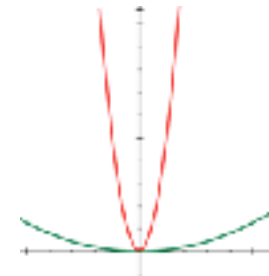


$d > d_0$



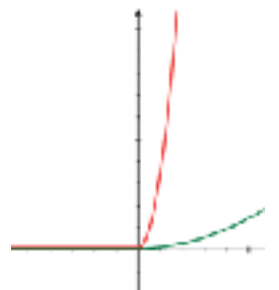
Harmonic

$$H_{i,j} = k(d_{i,j} - d_{i,j}^0)^2$$



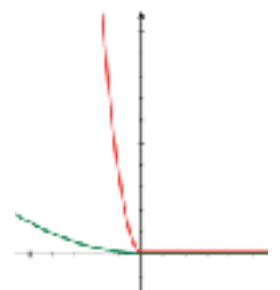
Harmonic Upper Bound

$$\begin{cases} \text{if } d_{i,j} \geq d_{i,j}^0; & ubH_{i,j} = k(d_{i,j} - d_{i,j}^0)^2 \\ \text{if } d_{i,j} < d_{i,j}^0; & ubH_{i,j} = 0 \end{cases}$$

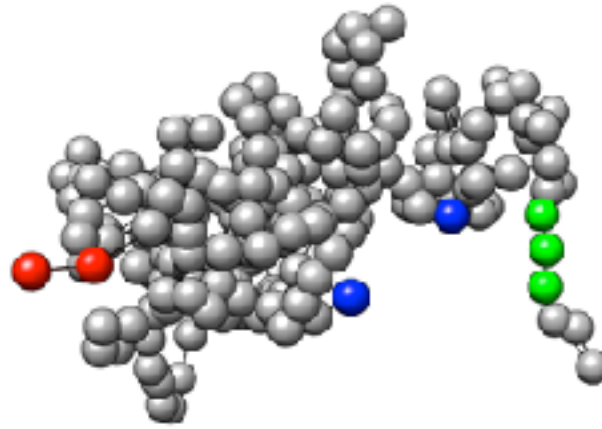


Harmonic Lower Bound

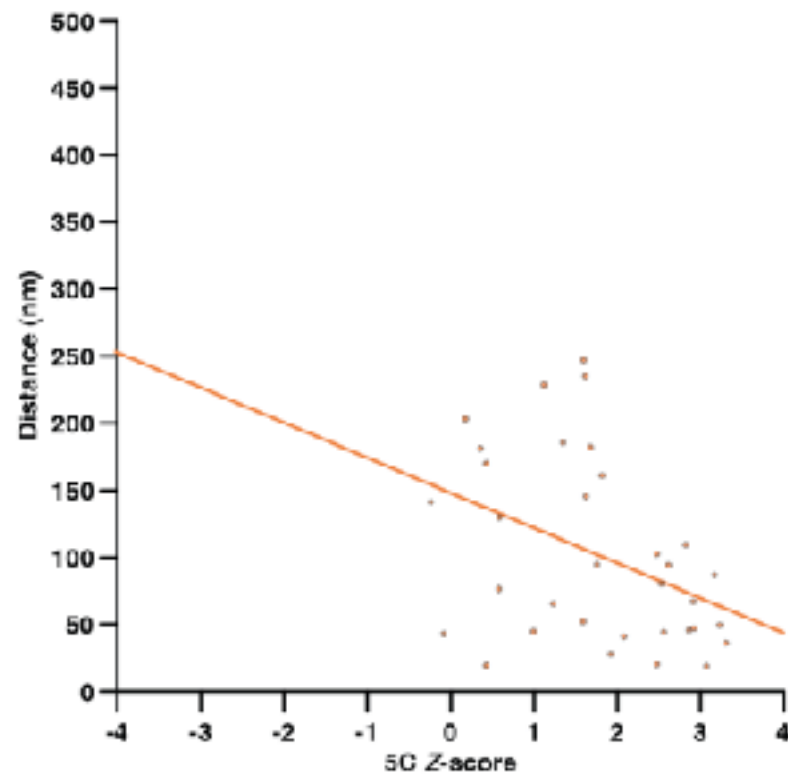
$$\begin{cases} \text{if } d_{i,j} \leq d_{i,j}^0; & lbH_{i,j} = k(d_{i,j} - d_{i,j}^0)^2 \\ \text{if } d_{i,j} > d_{i,j}^0; & lbH_{i,j} = 0 \end{cases}$$



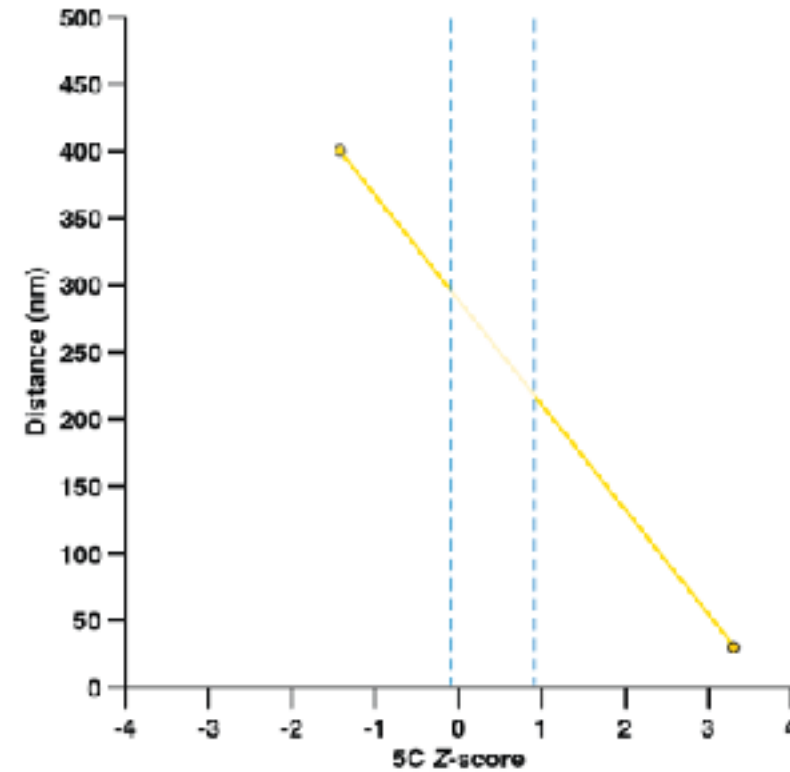
# From 3C data to spatial distances



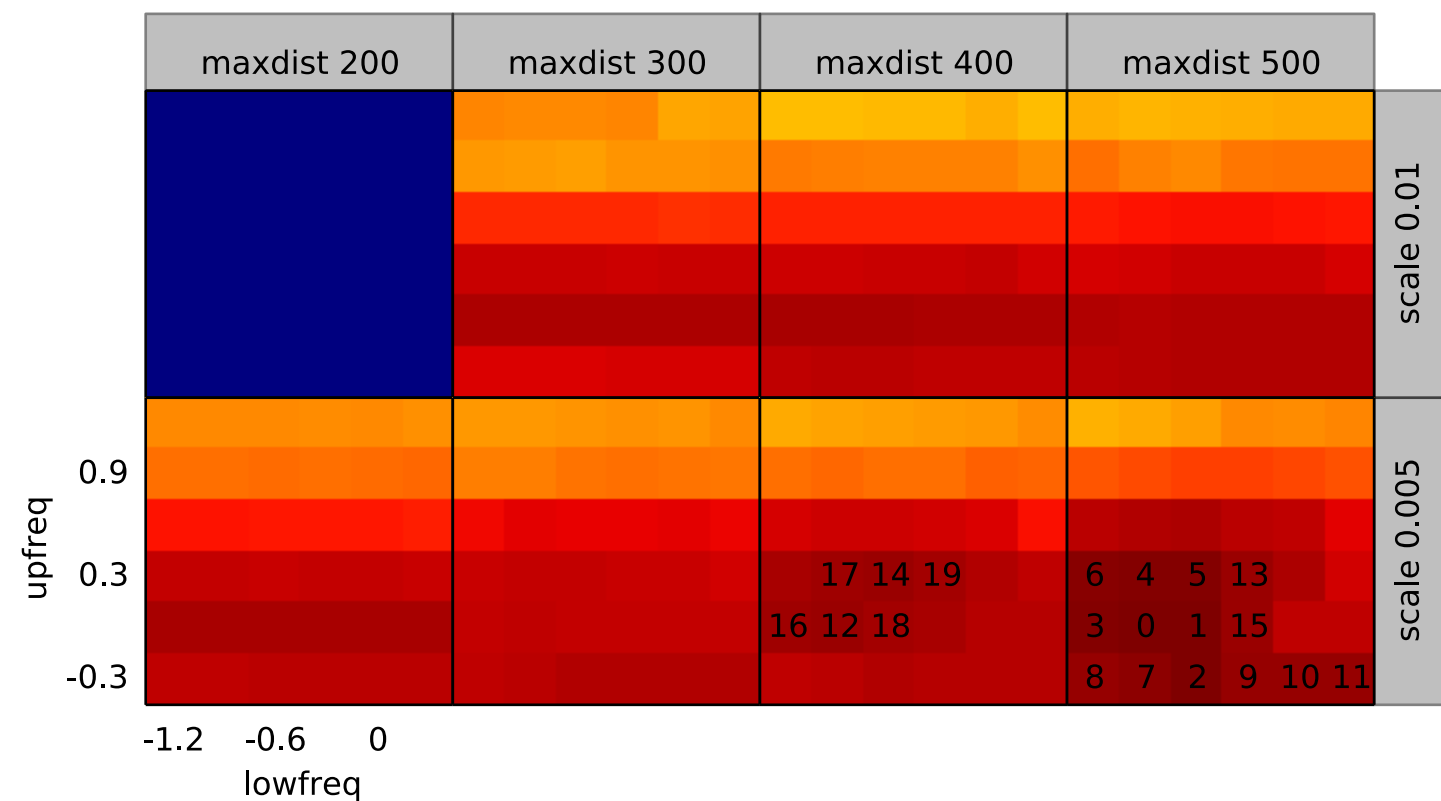
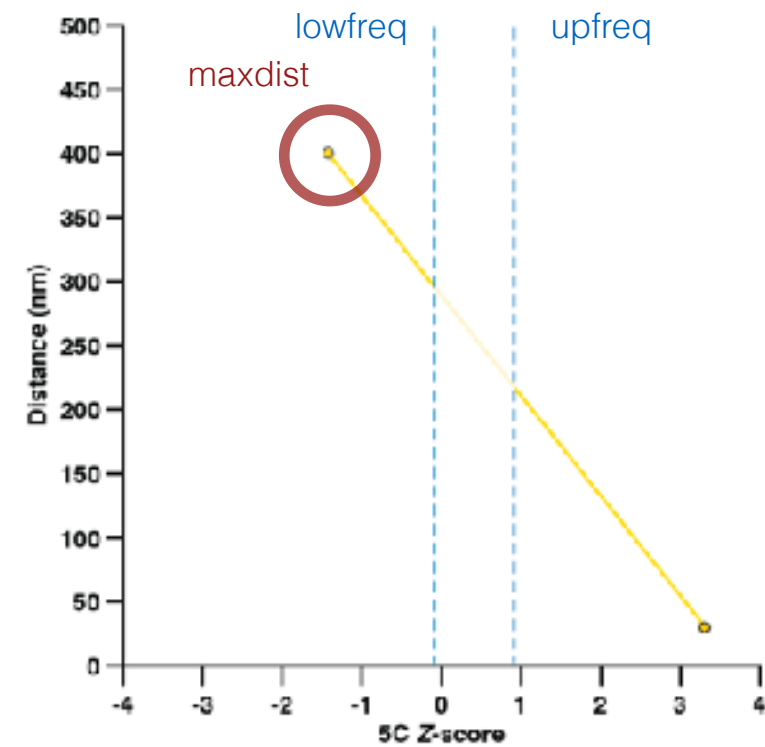
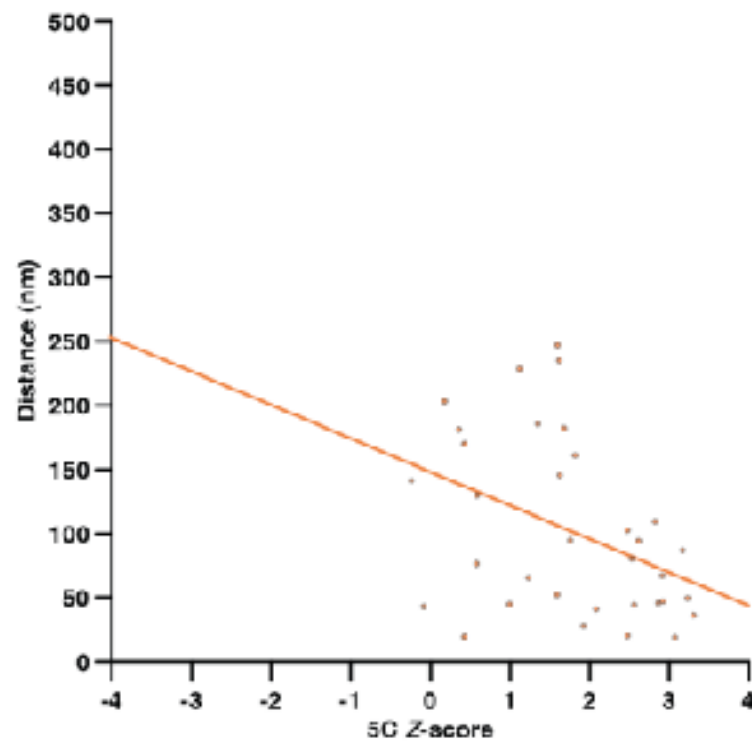
Neighbor fragments



Non-Neighbor fragments

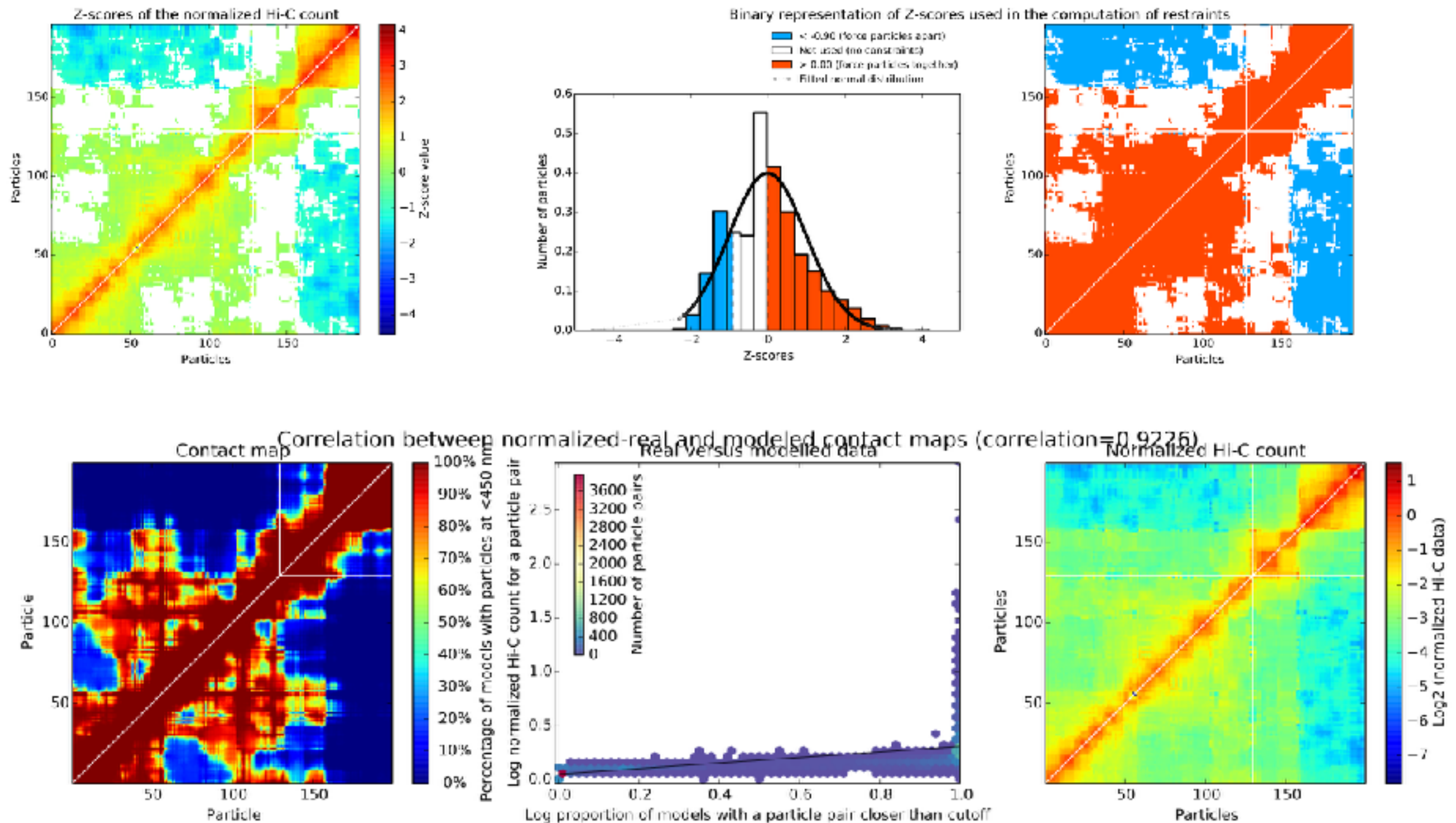


# Parameter optimization

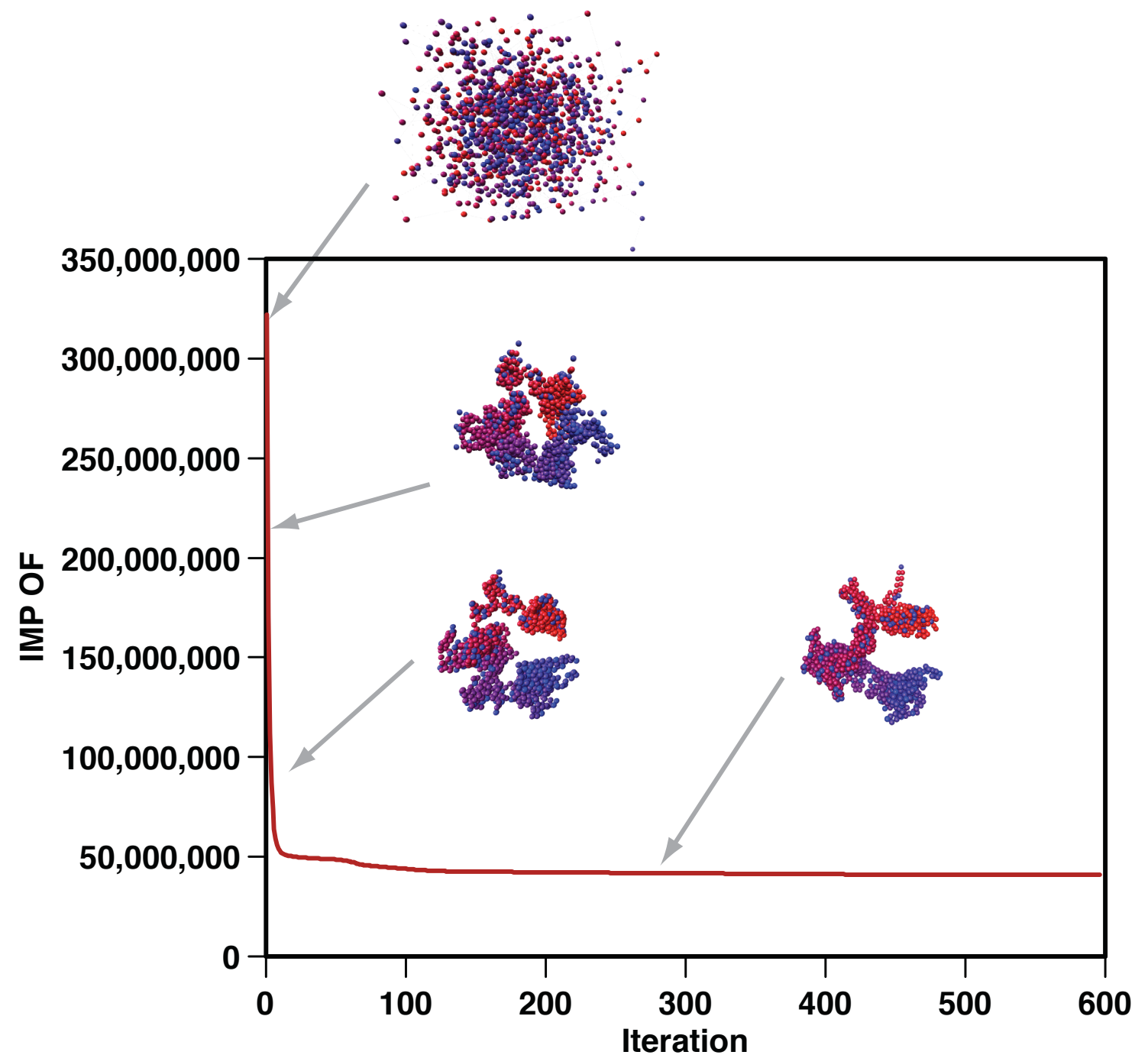
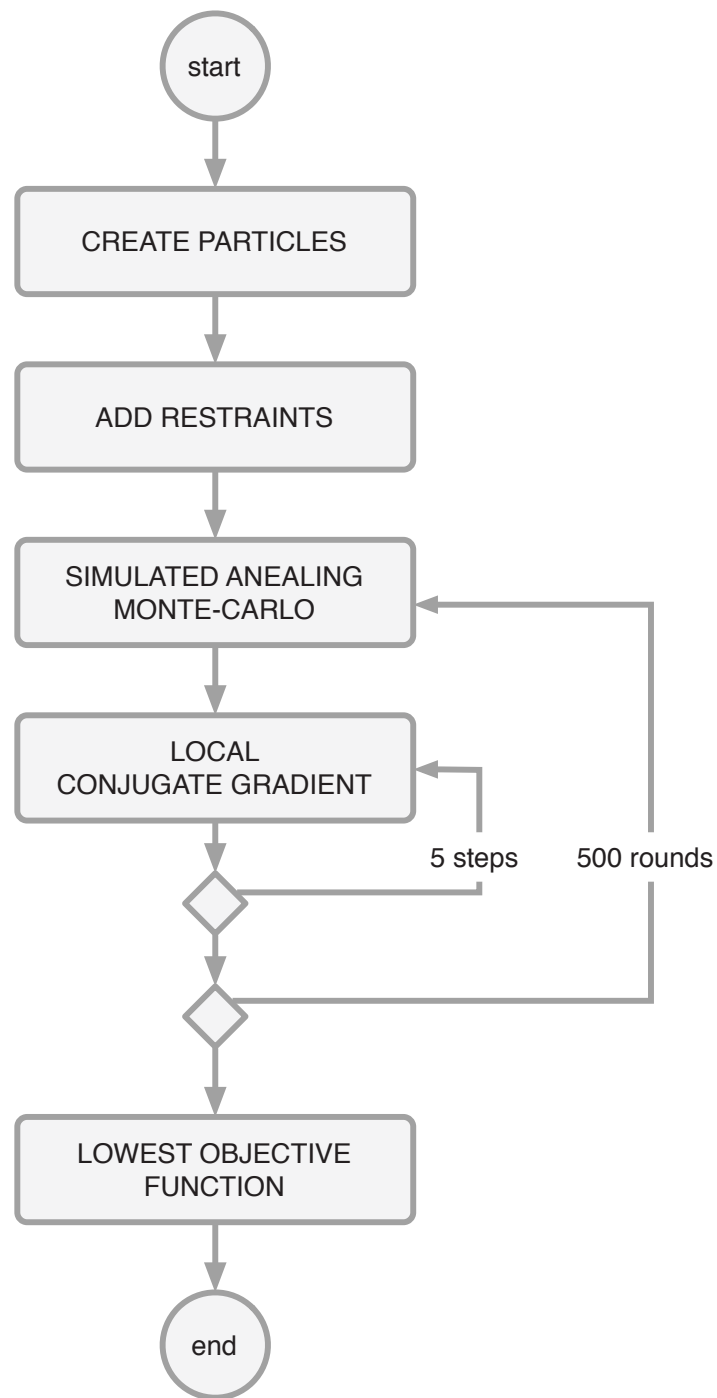




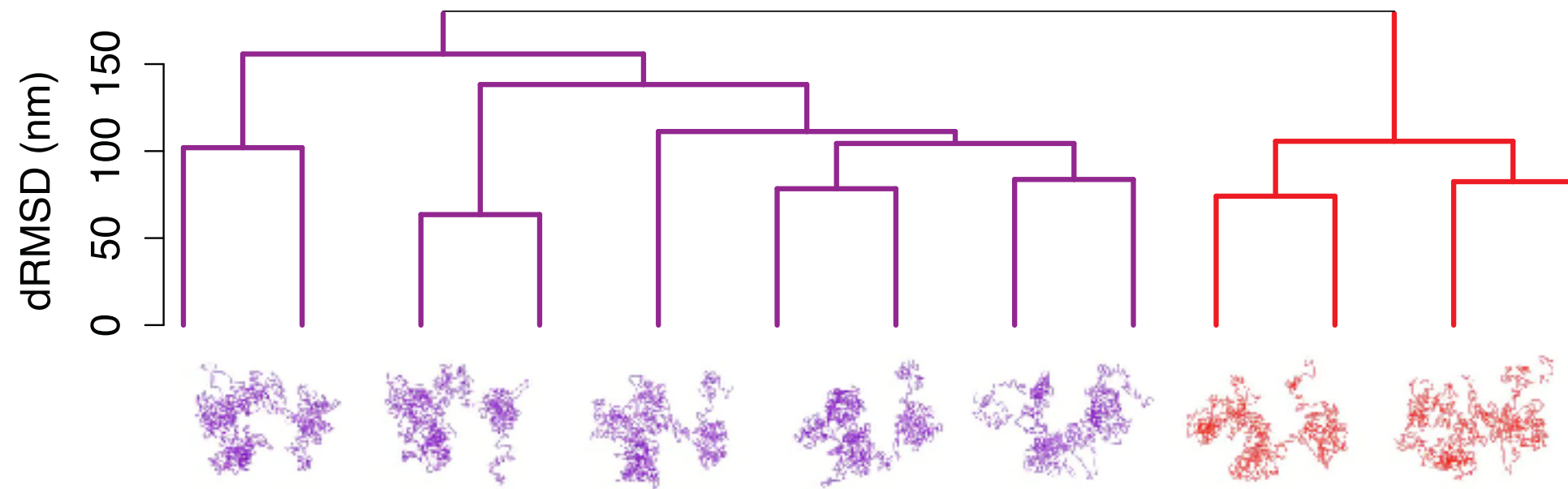
# Parameter optimization



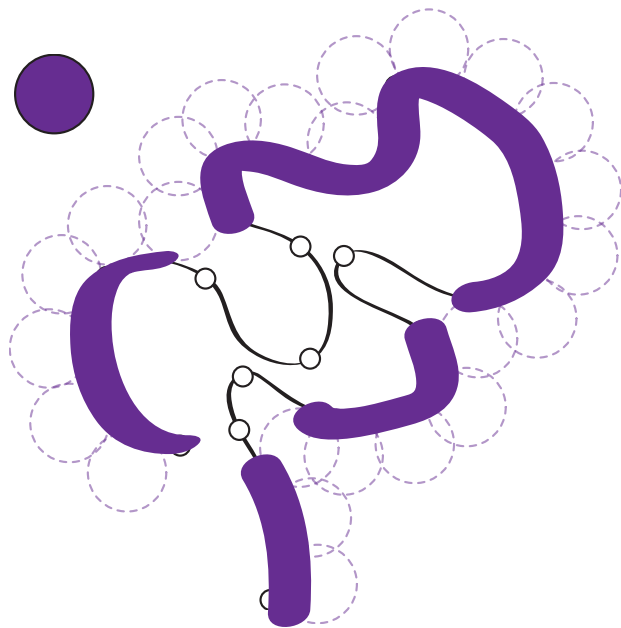
# Optimization of the scoring function



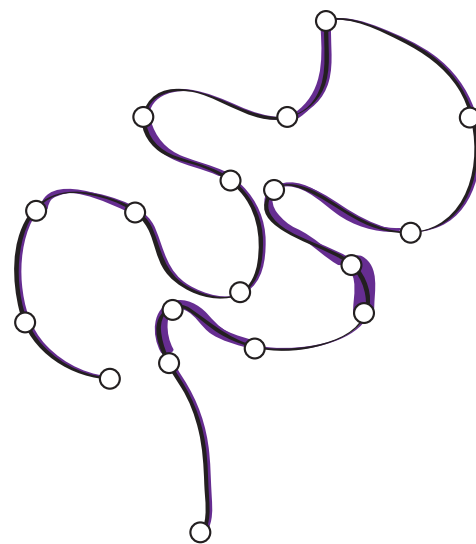
# Model analysis: clustering and structural features



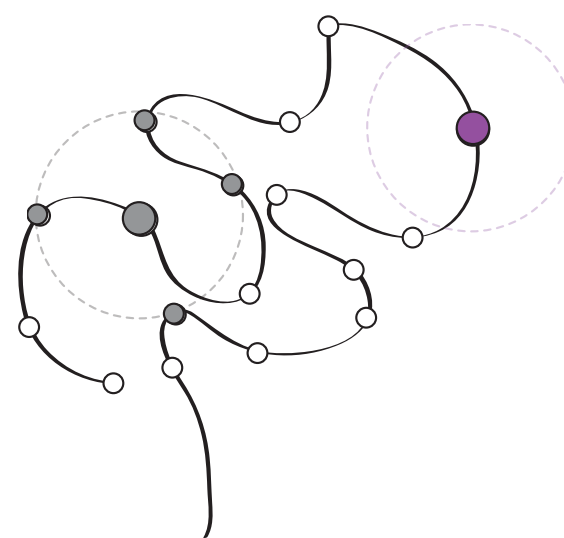
Accessibility (%)



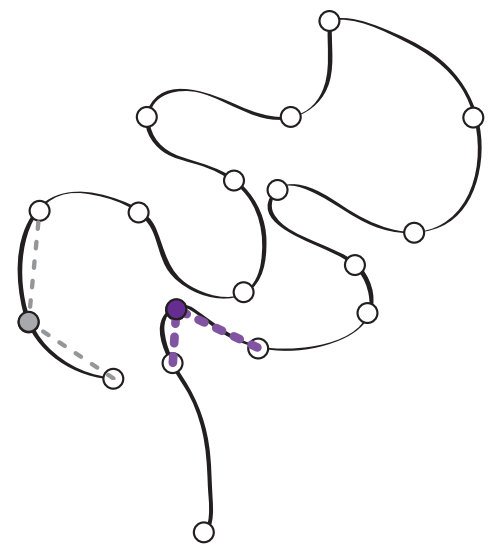
Density (bp/nm)



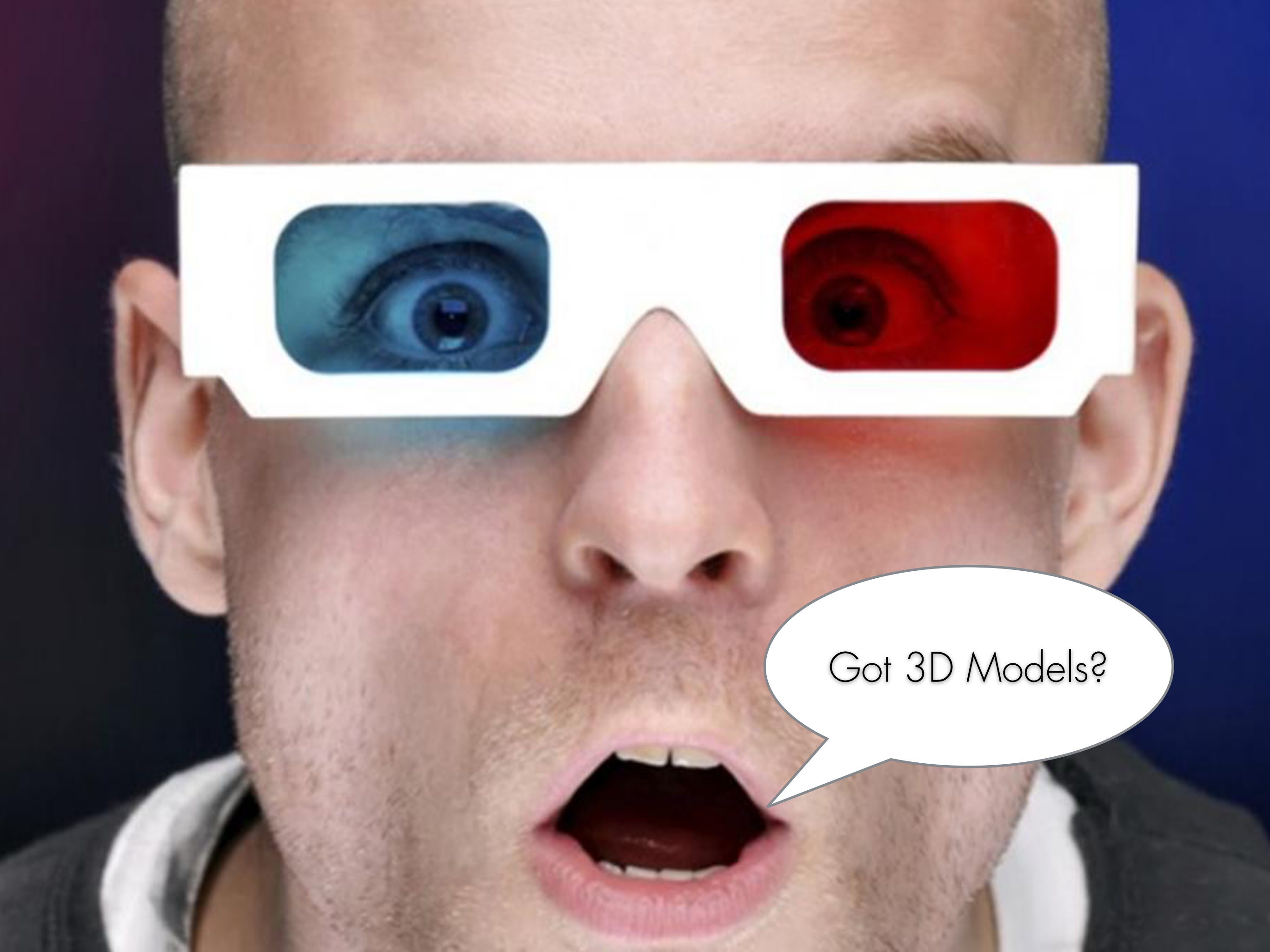
Interactions



Angle

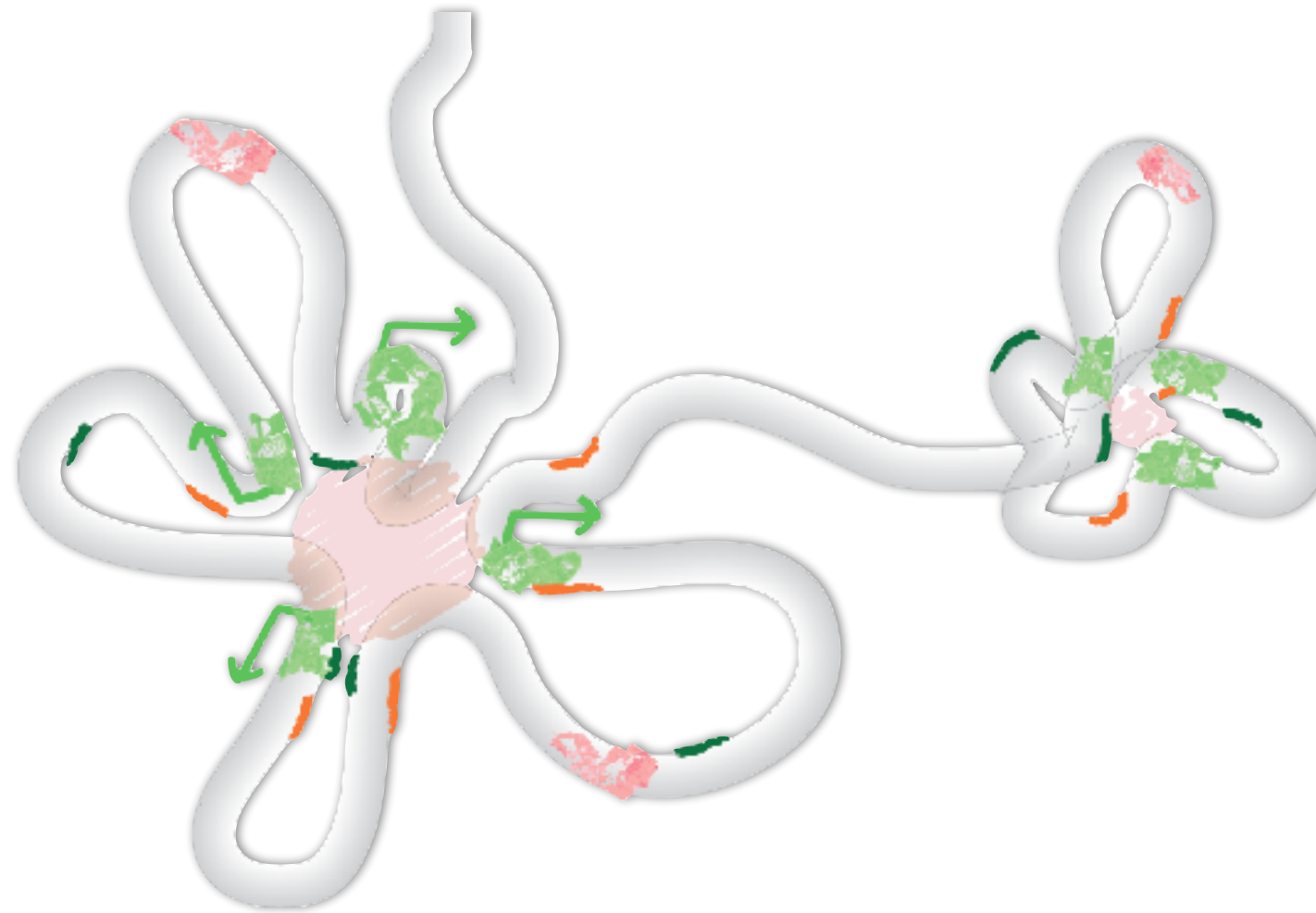






Got 3D Models?

# Human $\alpha$ -globin domain



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# Human $\alpha$ -globin domain

## ENm008 genomic structure and environment



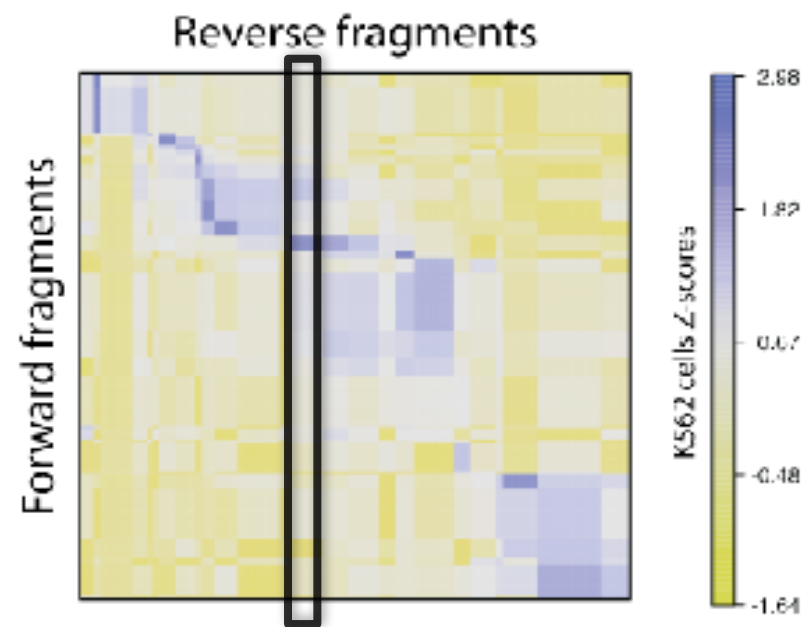
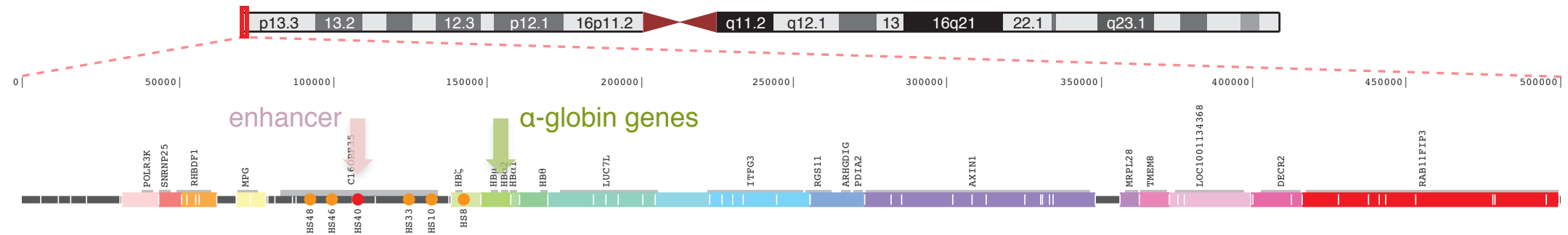
The ENCODE data for ENm008 region was obtained from the UCSC Genome Browser tracks for: RefSeq annotated genes, Affymetrix/CSHL expression data (Gingeras Group at Cold Spring Harbor), Duke/NHGRI DNaseI Hypersensitivity data (Crawford Group at Duke University), and Histone Modifications by Broad Institute ChIP-seq (Bernstein Group at Broad Institute of Harvard and MIT).

ENCODE Consortium. Nature (2007) vol. 447 (7146) pp. 799-816

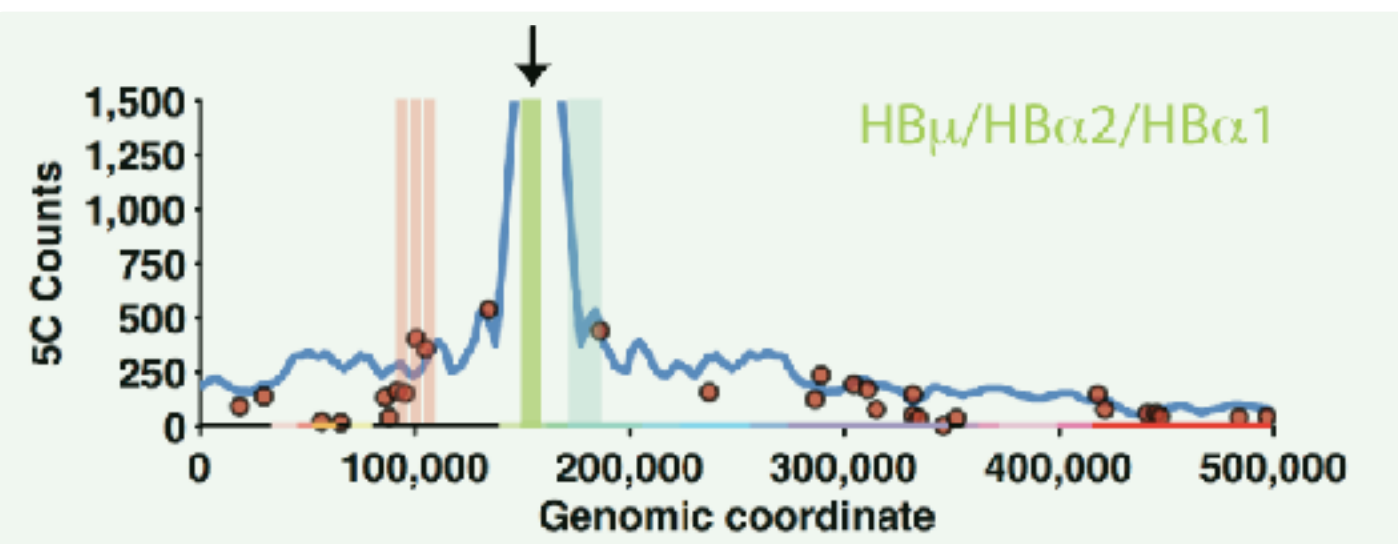
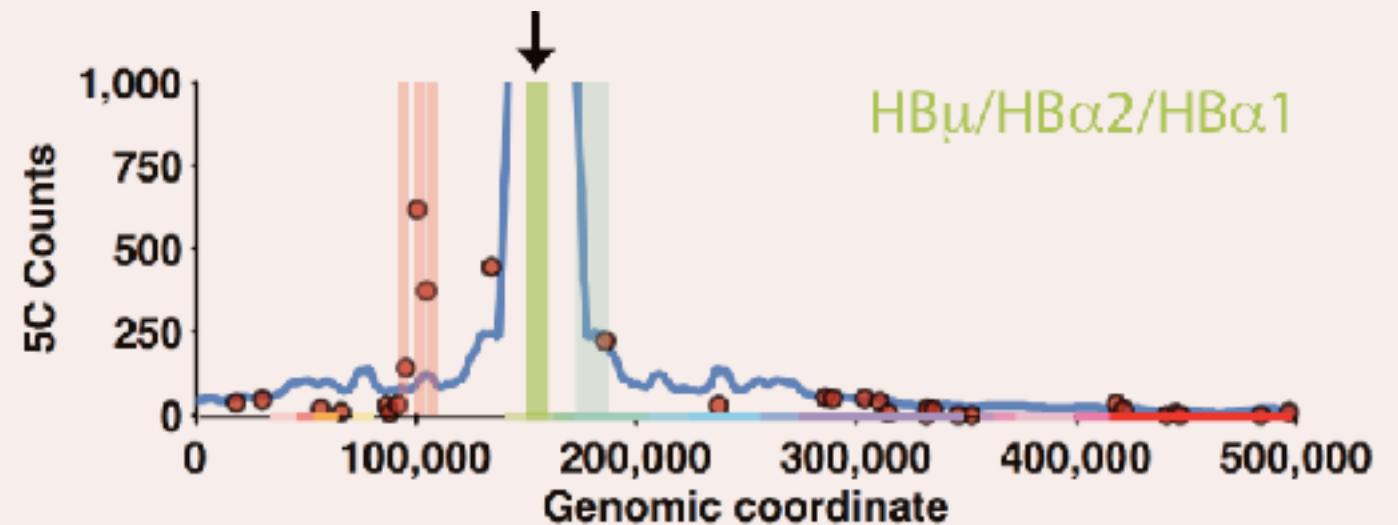


# Human $\alpha$ -globin domain

ENm008 genomic structure and environment



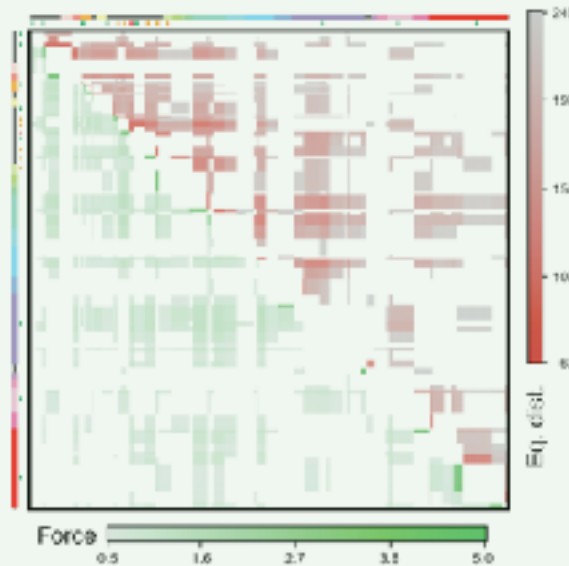
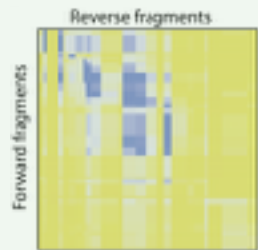
K562 cells:  
 $\alpha$ -globin genes active



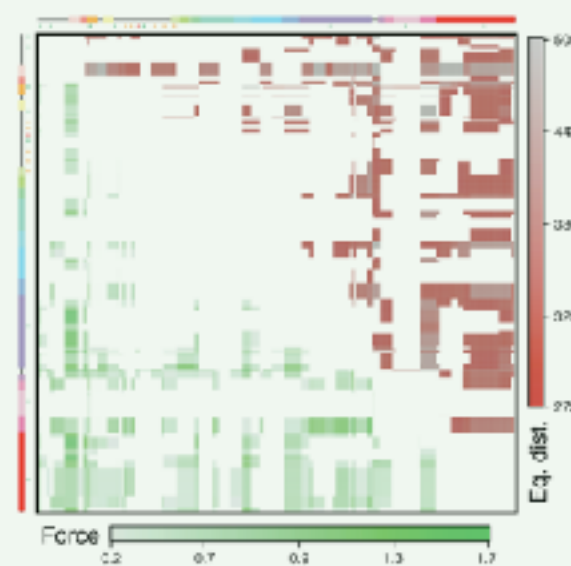
# Scoring

## GM12878

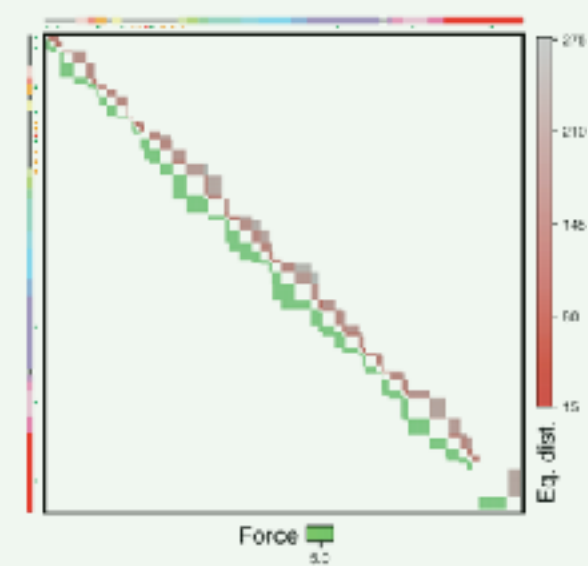
70 fragments  
1,520 restraints



Harmonic



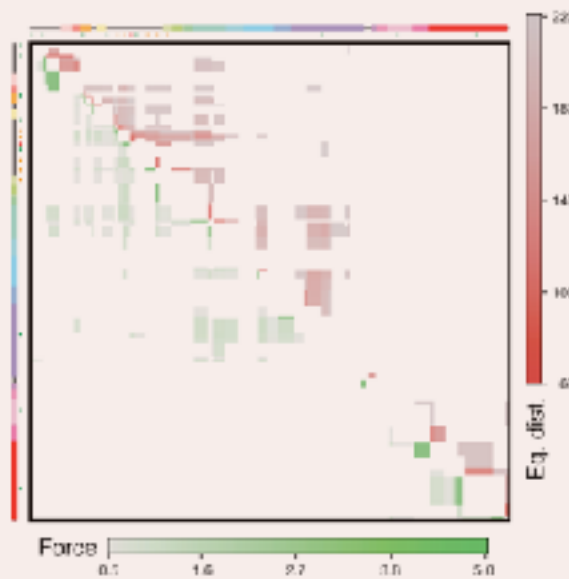
Harmonic Lower Bound



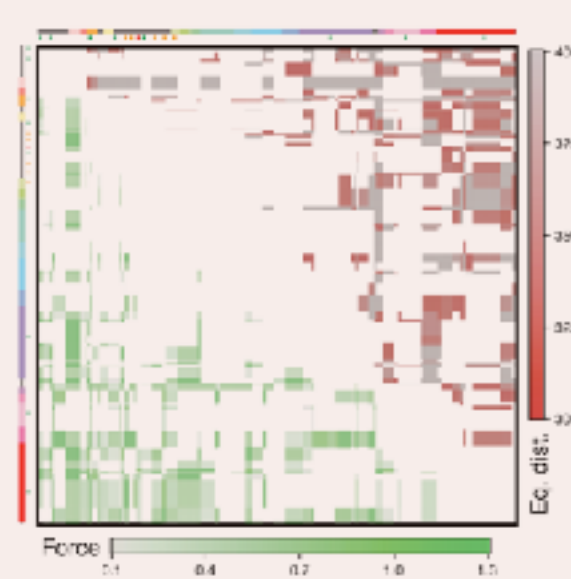
Harmonic Upper Bound

## K562

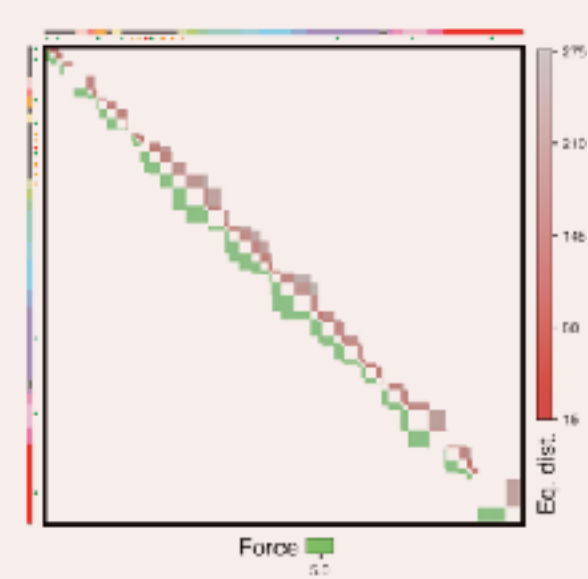
70 fragments  
1,049 restraints



Harmonic

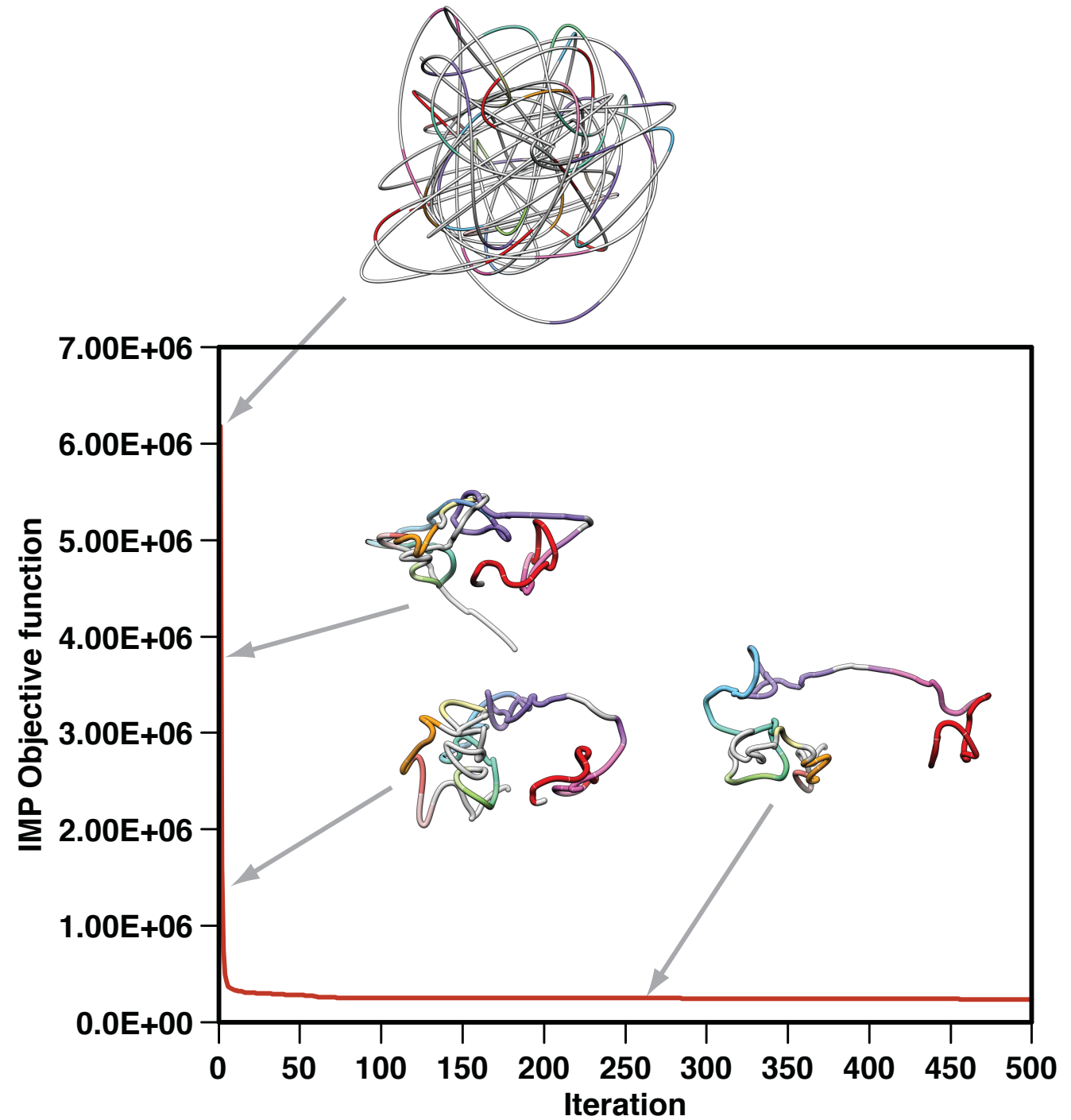
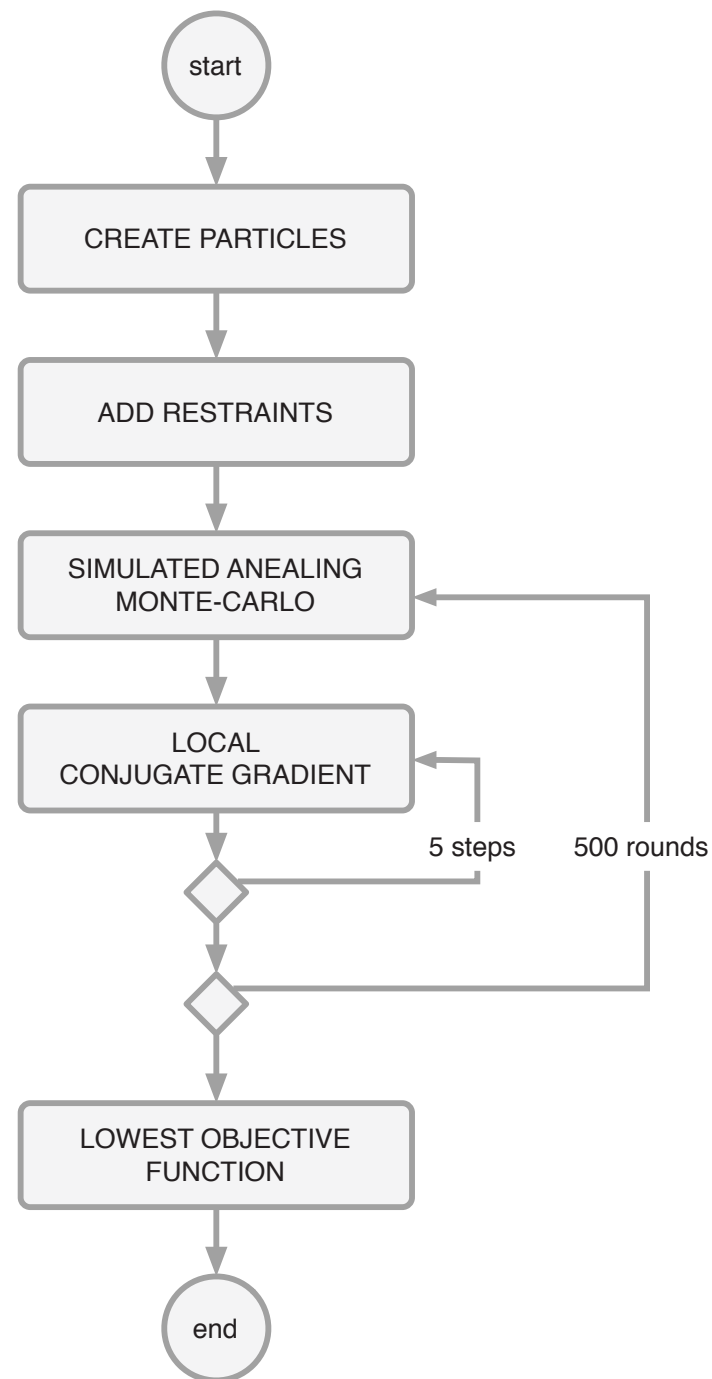


Harmonic Lower Bound



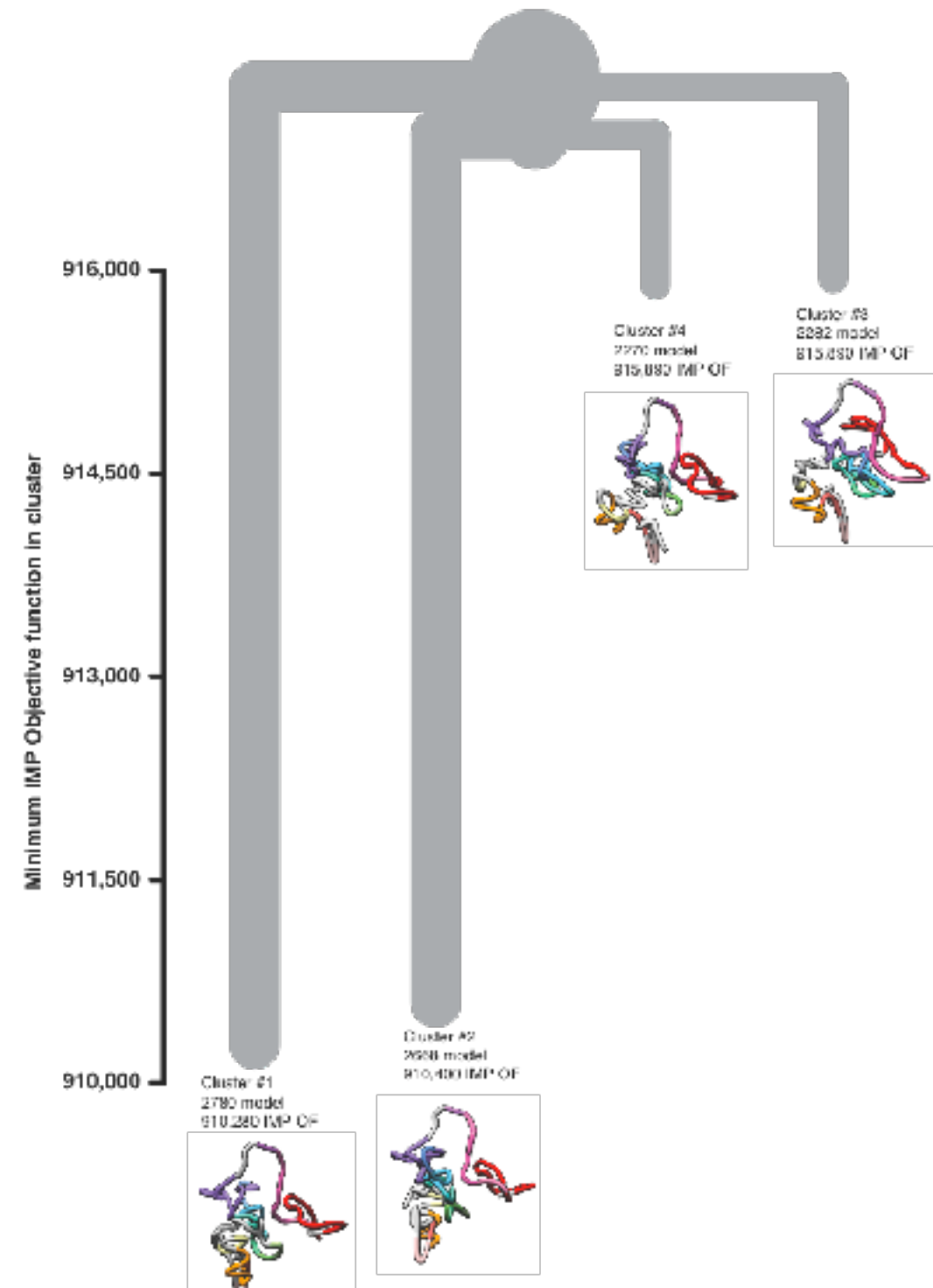
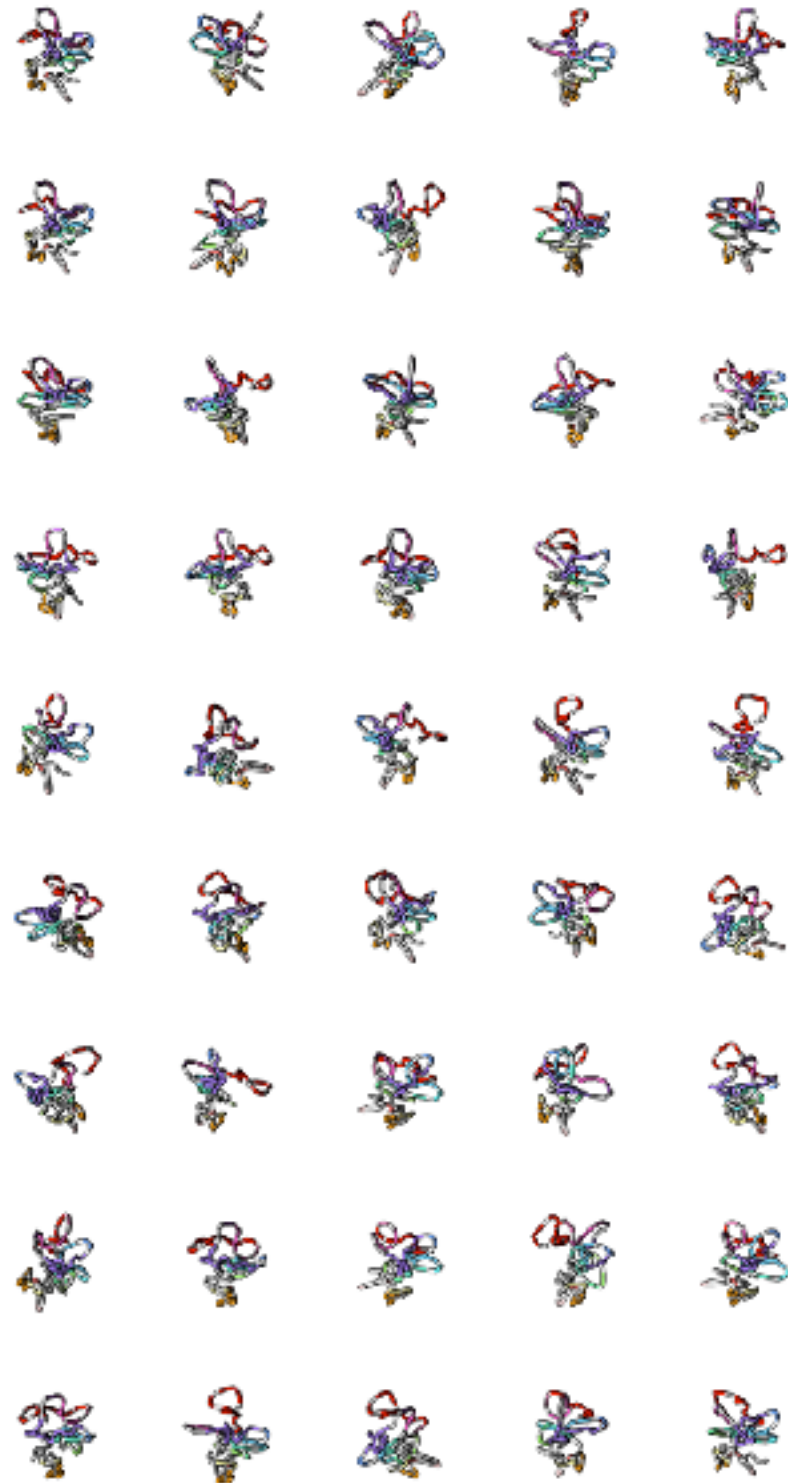
Harmonic Upper Bound

# Optimization



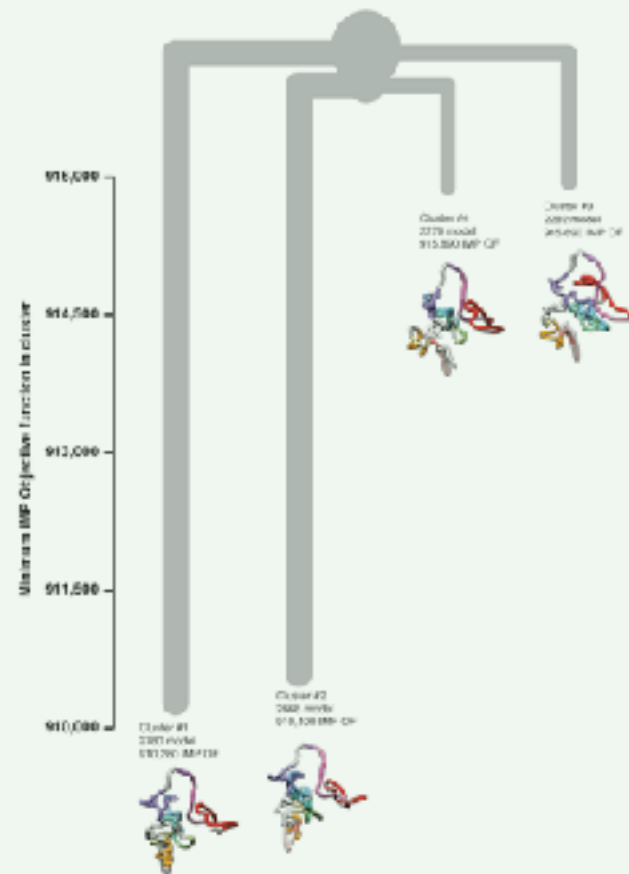
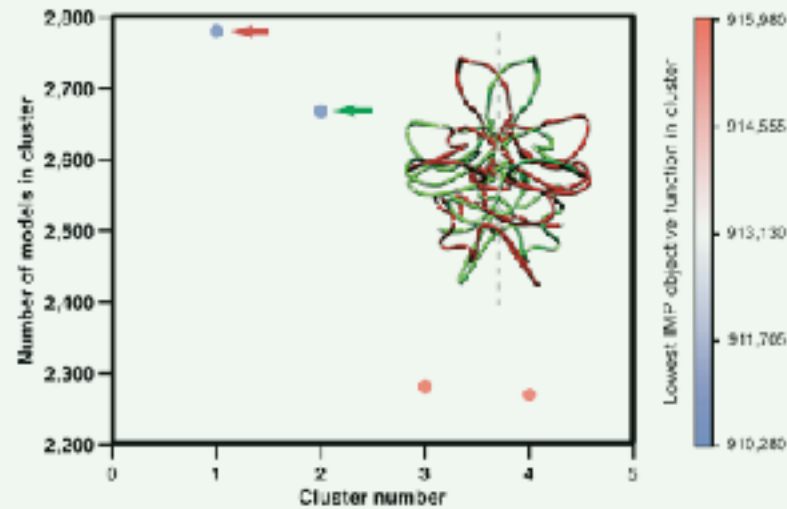


# Clustering

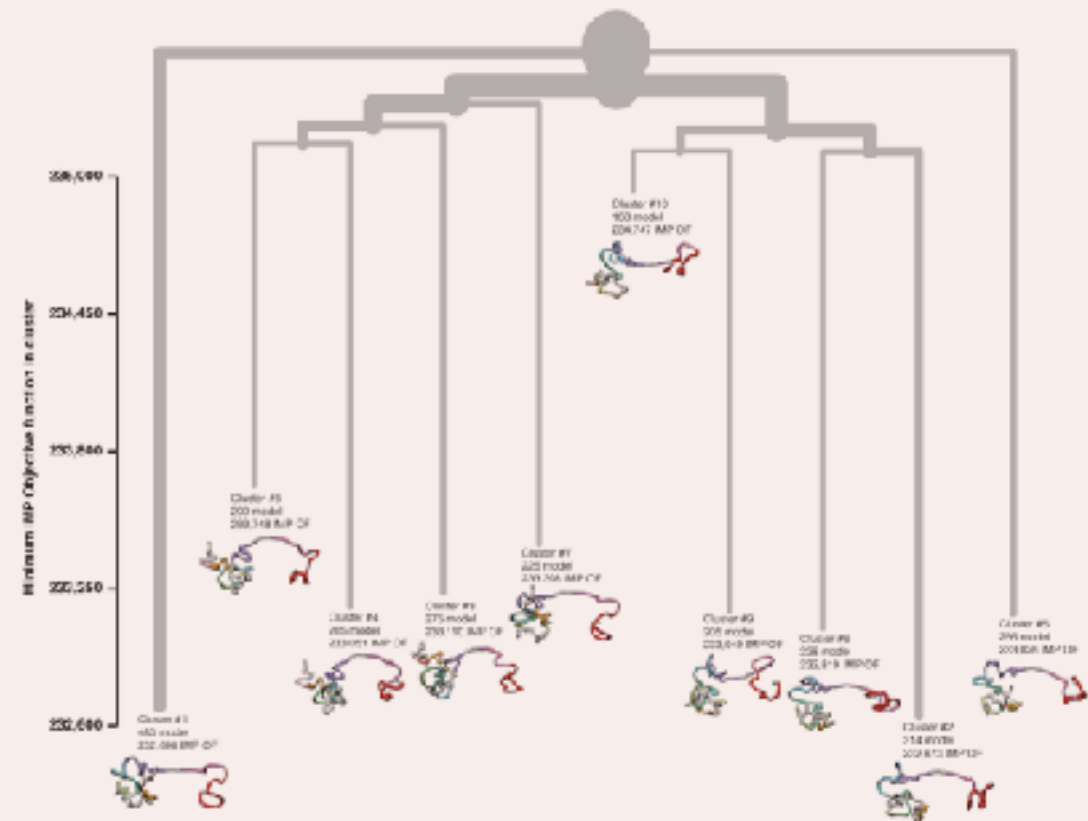
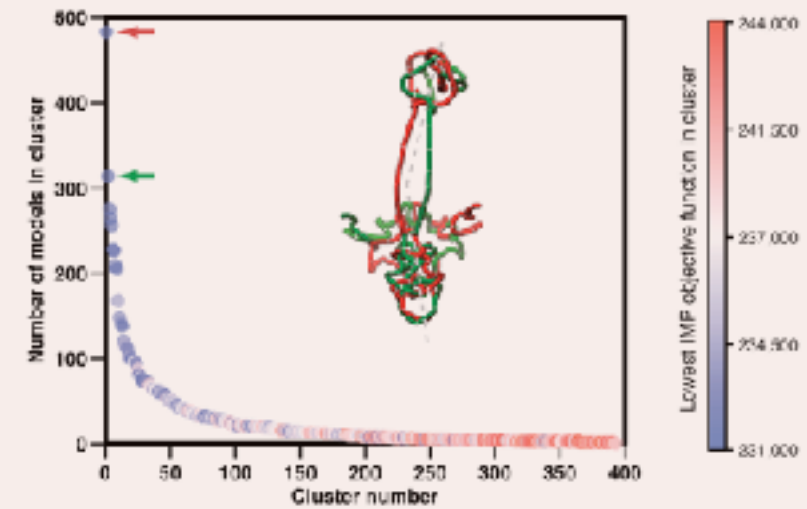


# Not just one solution

GM12878



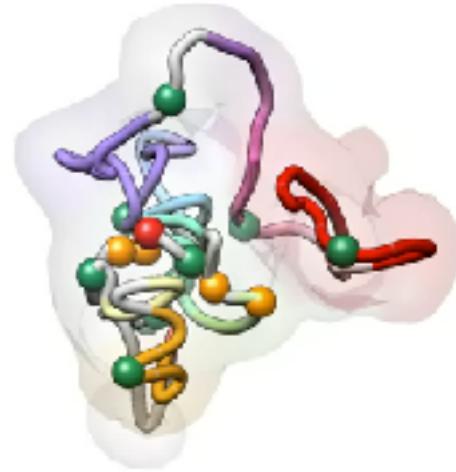
K562



# Consistency

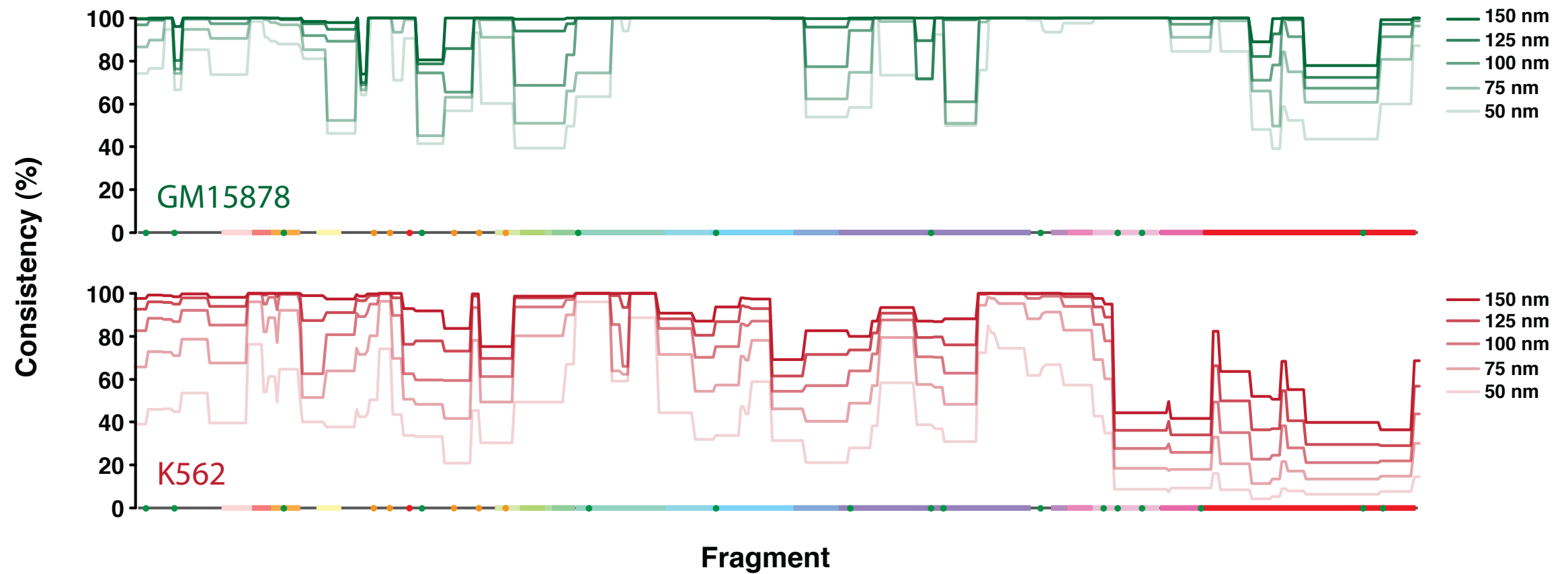
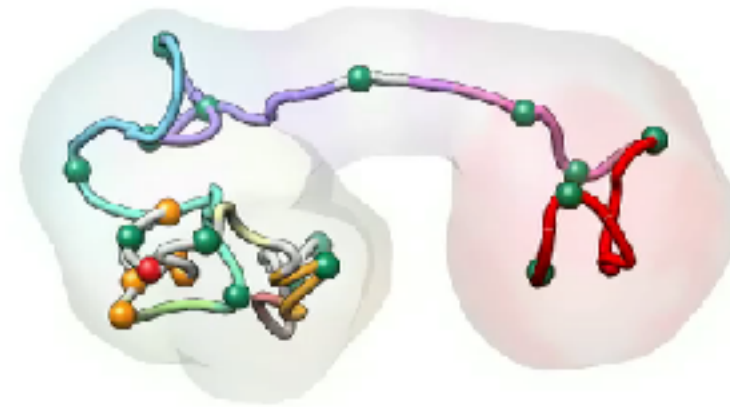
**GM12878**

Cluster #1  
2780 model



**K562**

Cluster #2  
314 model

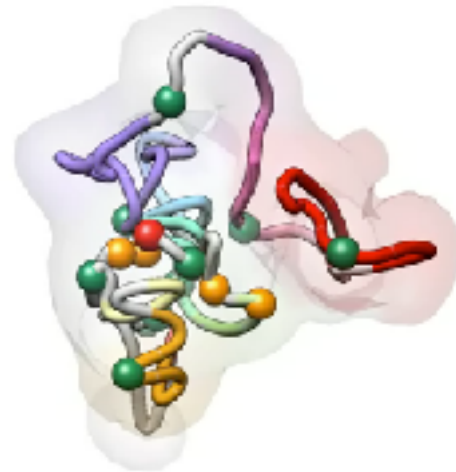




# Consistency

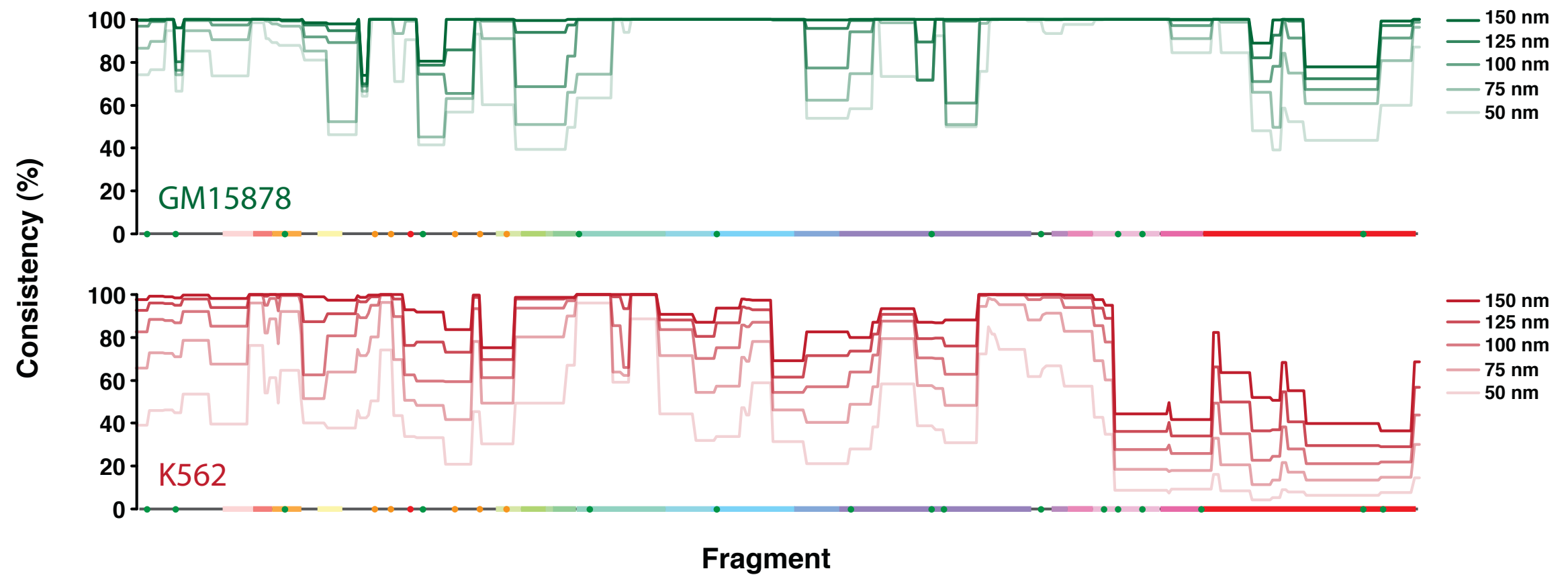
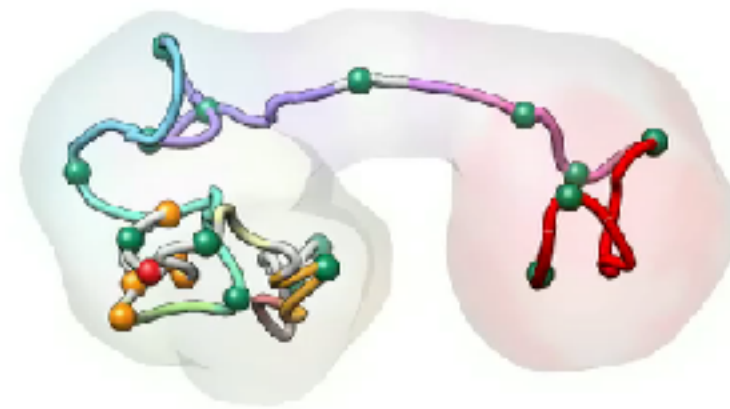
**GM12878**

Cluster #1  
2780 model



**K562**

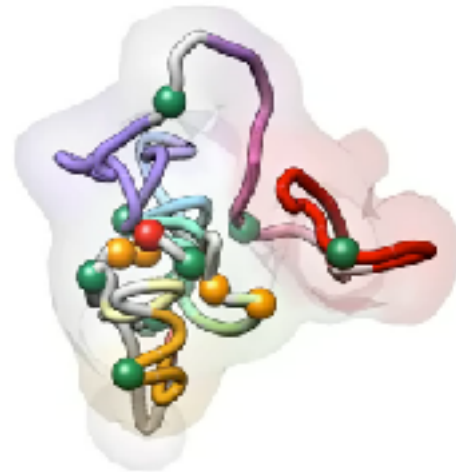
Cluster #2  
314 model



# Regulatory elements

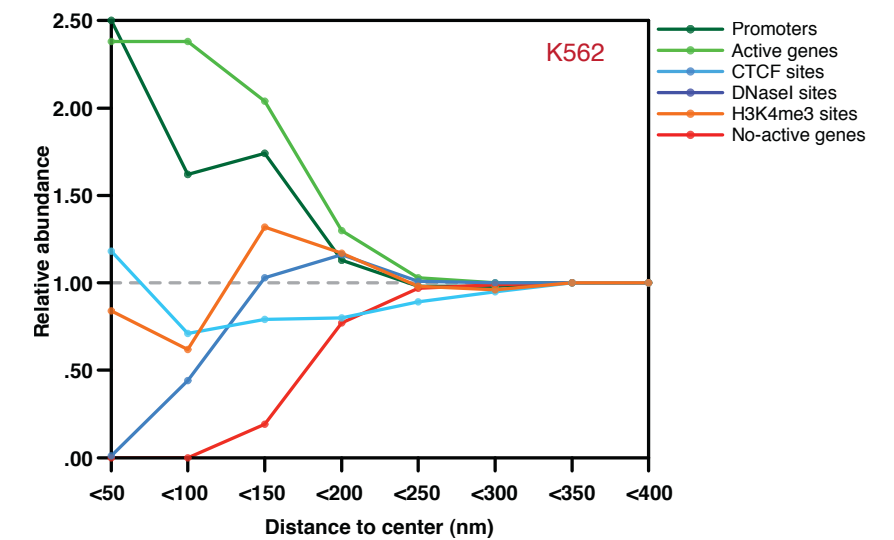
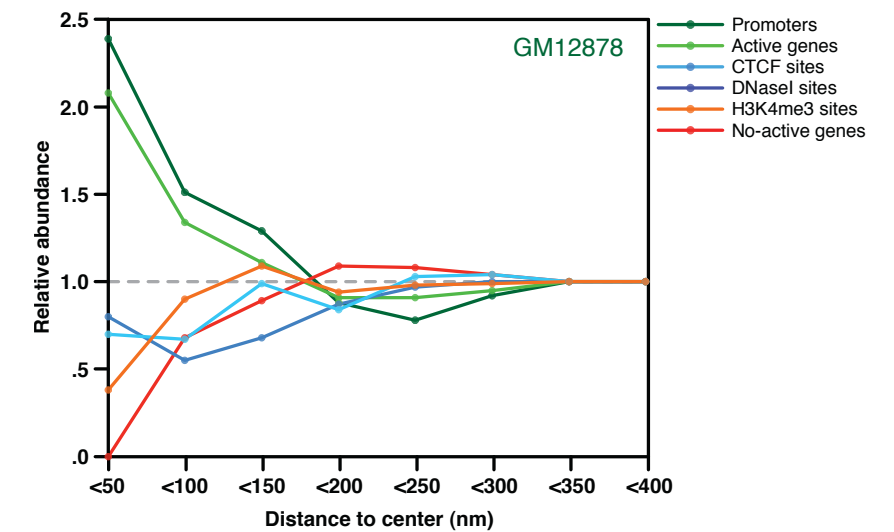
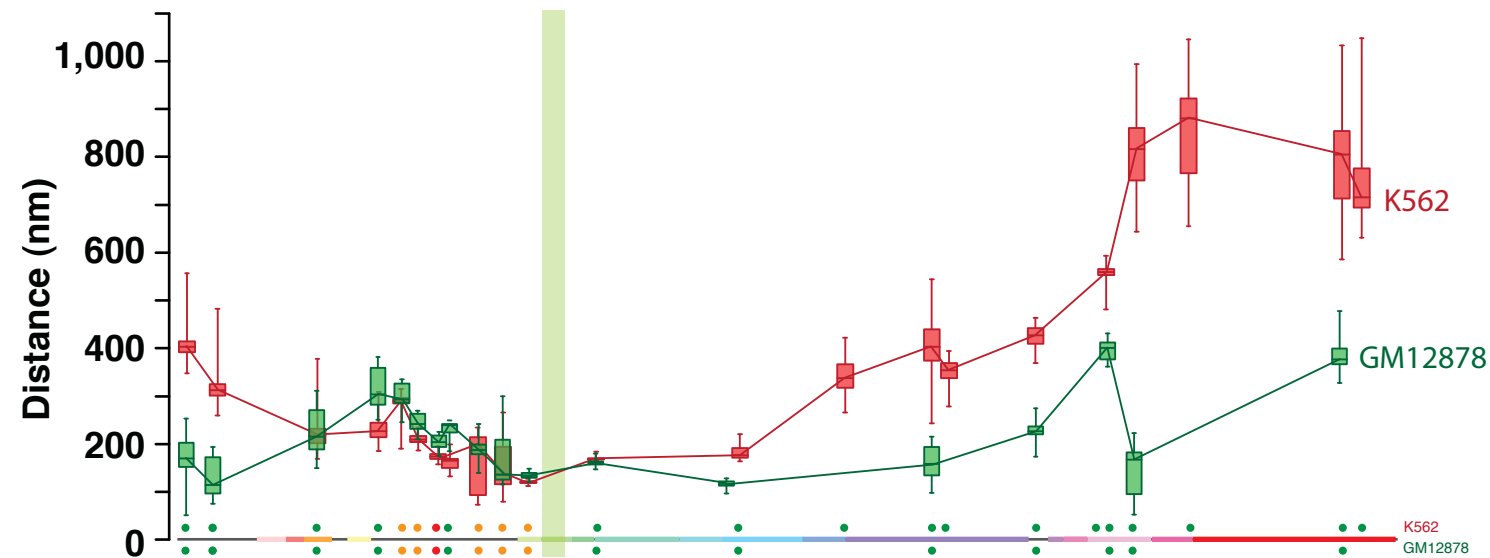
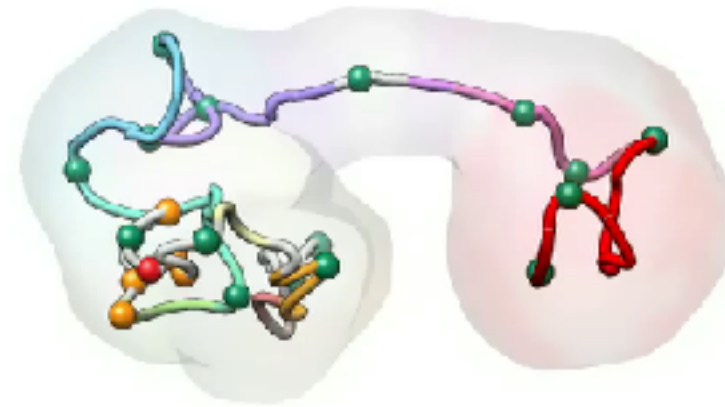
**GM12878**

Cluster #1  
2780 model



**K562**

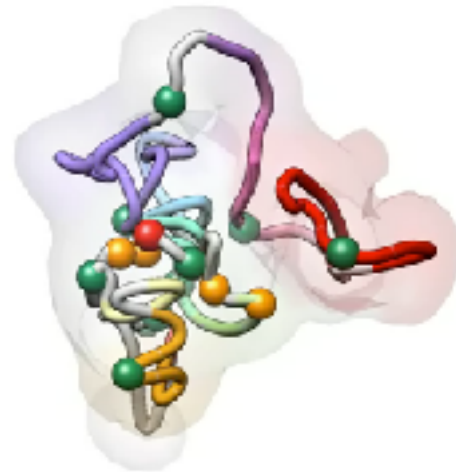
Cluster #2  
314 model



# Compactness

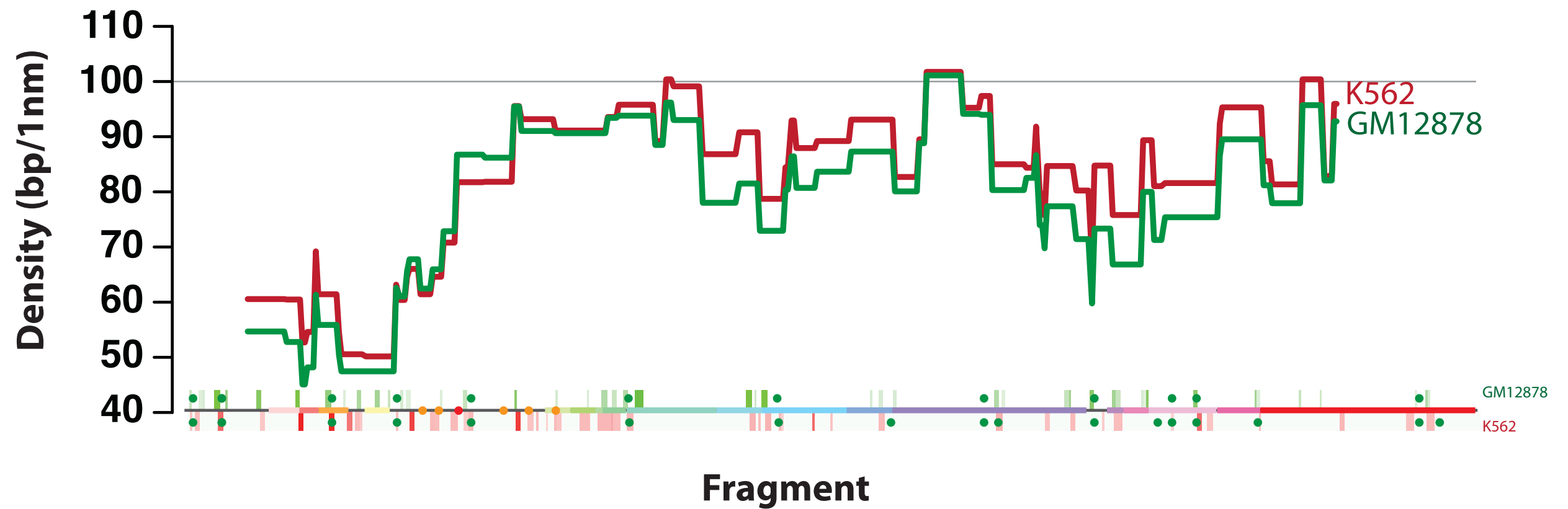
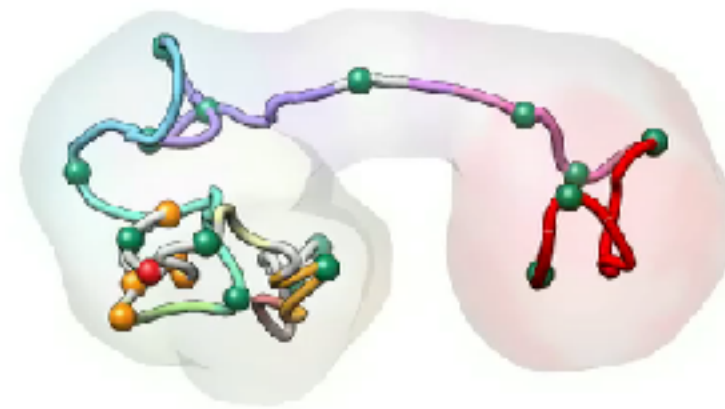
**GM12878**

Cluster #1  
2780 model



**K562**

Cluster #2  
314 model

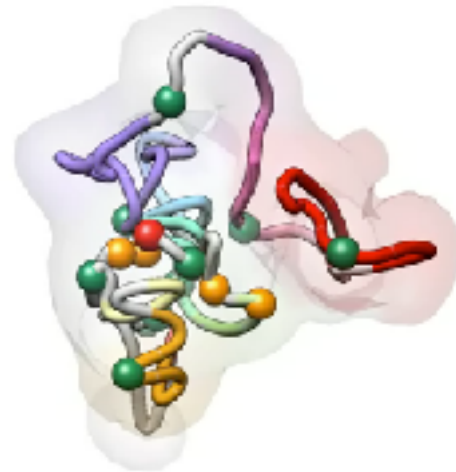




# Multi-loops

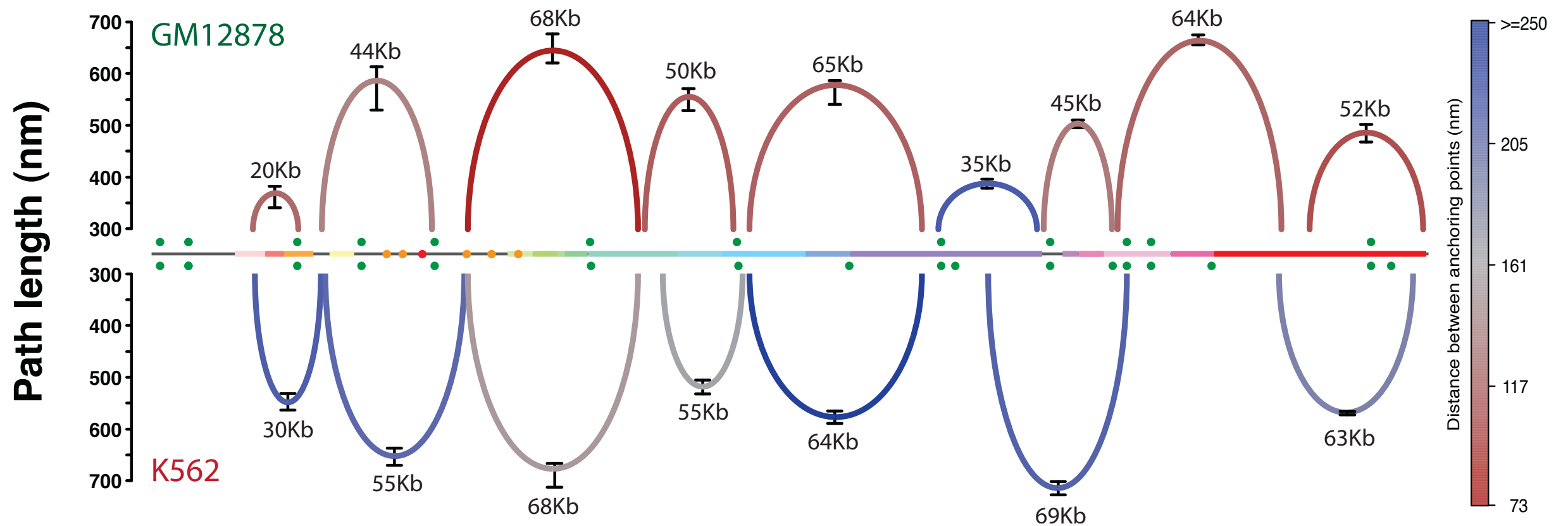
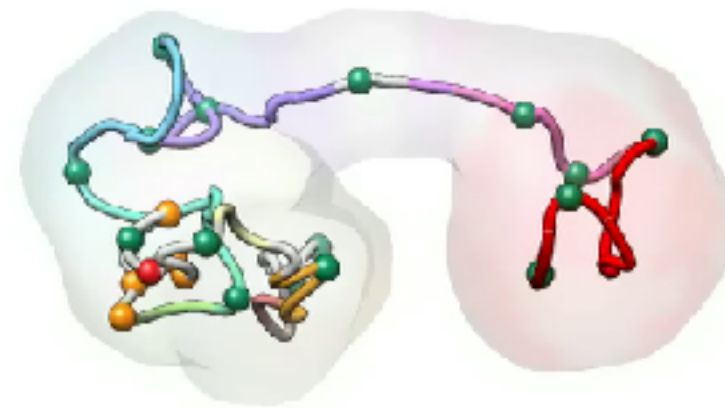
**GM12878**

Cluster #1  
2780 model



**K562**

Cluster #2  
314 model



# Expression

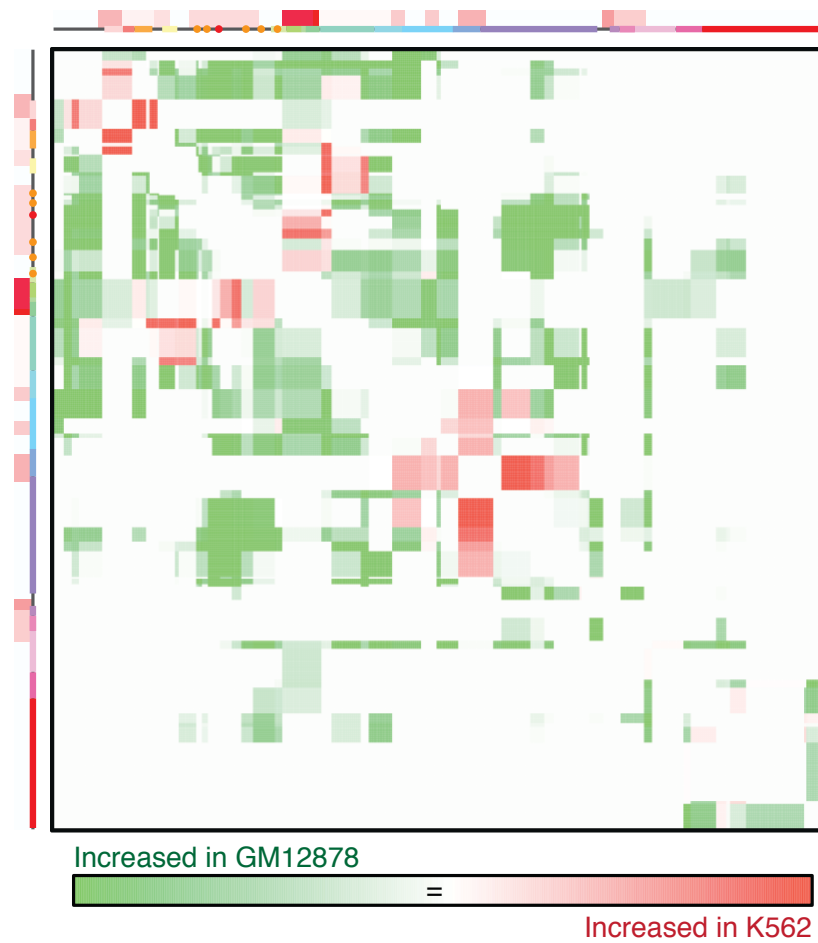
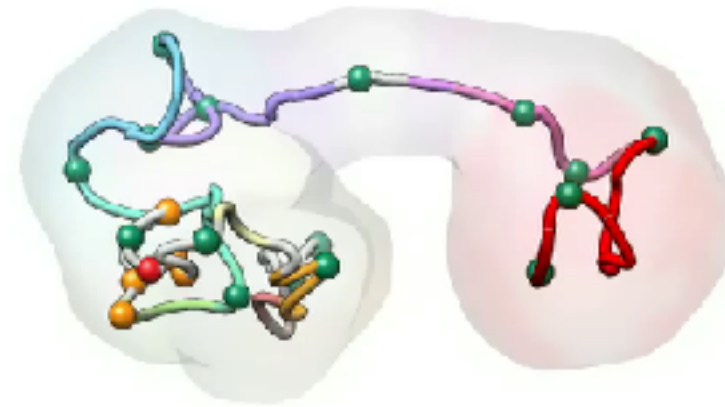
**GM12878**

Cluster #1  
2780 model



**K562**

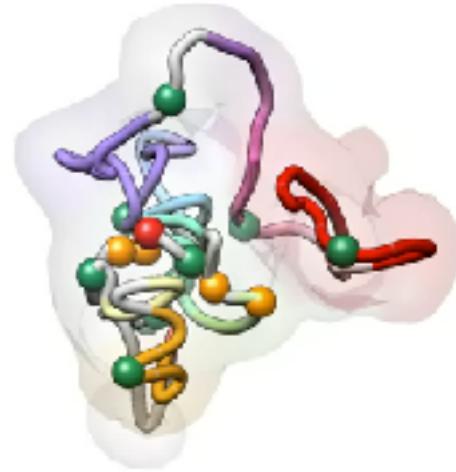
Cluster #2  
314 model



# FISH validation

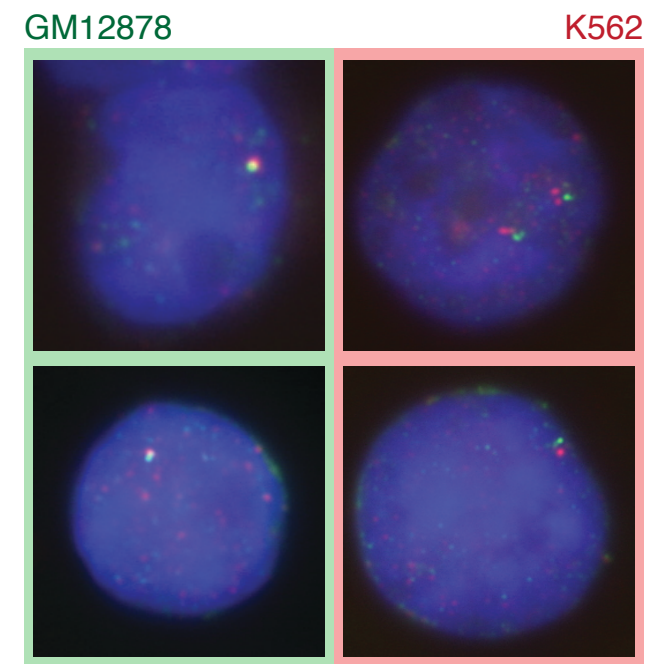
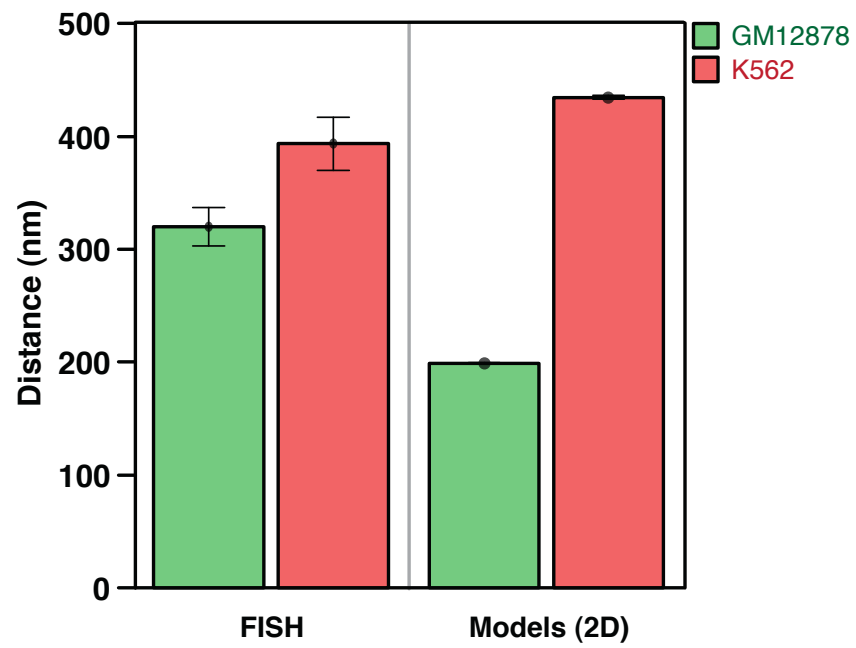
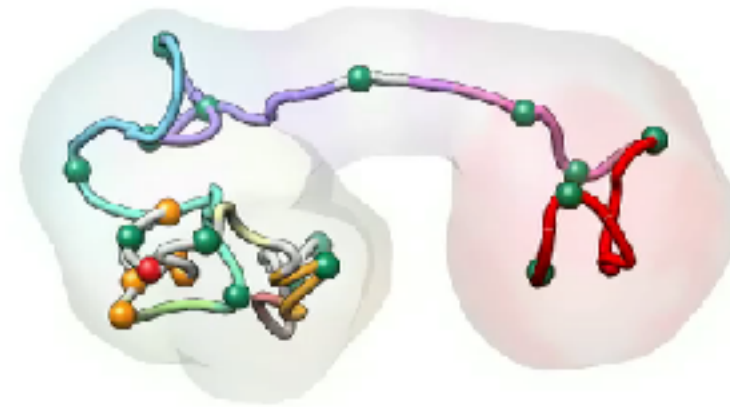
# GM12878

Cluster #1  
2780 model



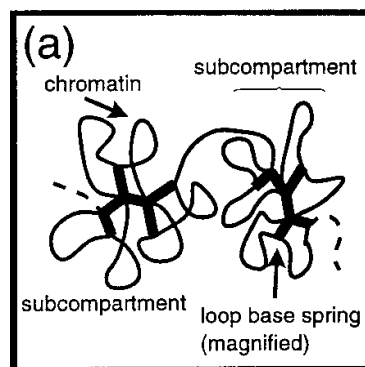
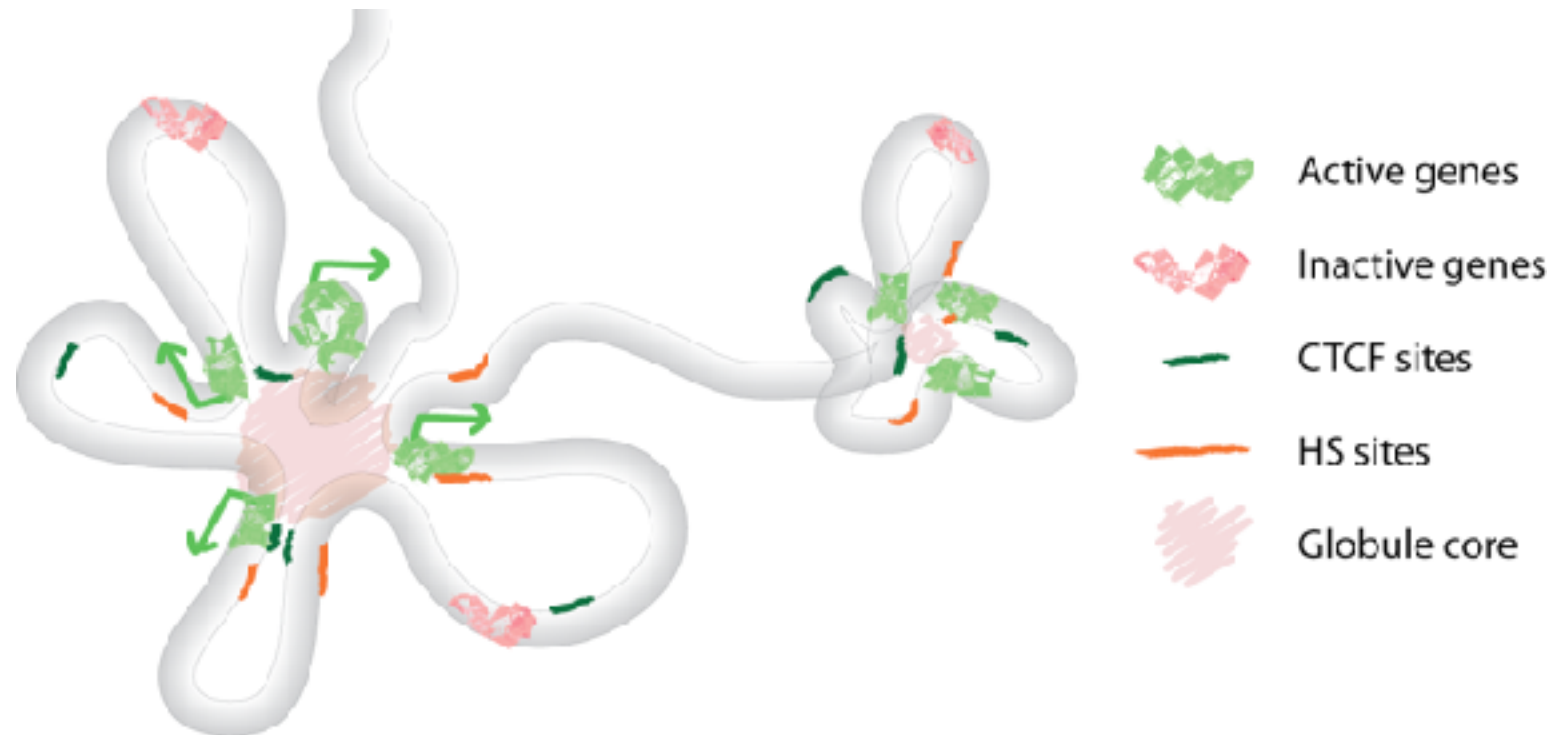
# K562

Cluster #2  
314 model

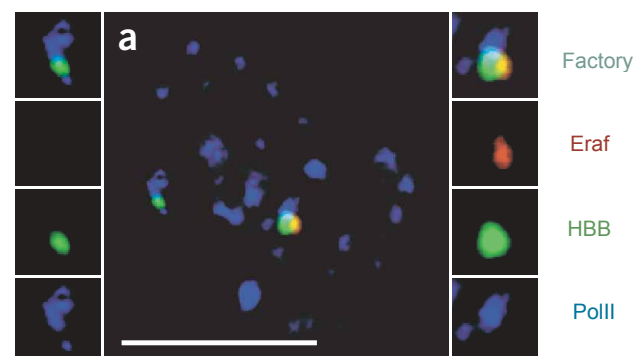




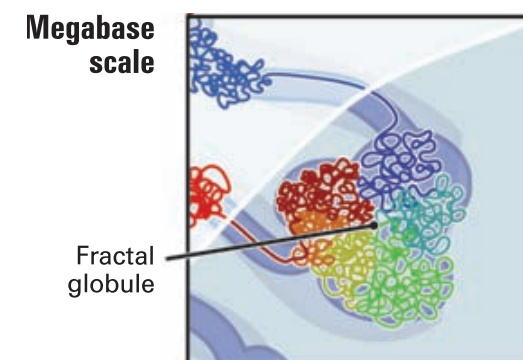
# The “Chromatin Globule” model



Münkel et al. JMB (1999)



Osborne et al. Nat Genet (2004)

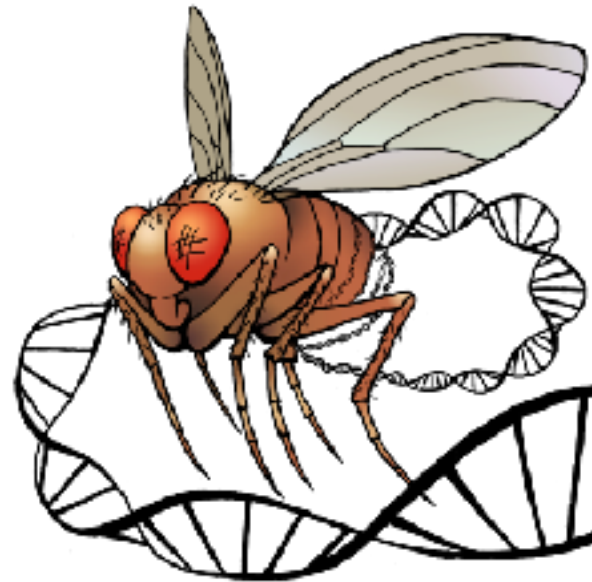


Lieberman-Aiden et al. Science (2009)

D. Baù et al. **Nat Struct Mol Biol** (2011) 18:107-14  
 A. Sanyal et al. **Current Opinion in Cell Biology** (2011) 23:325–33.

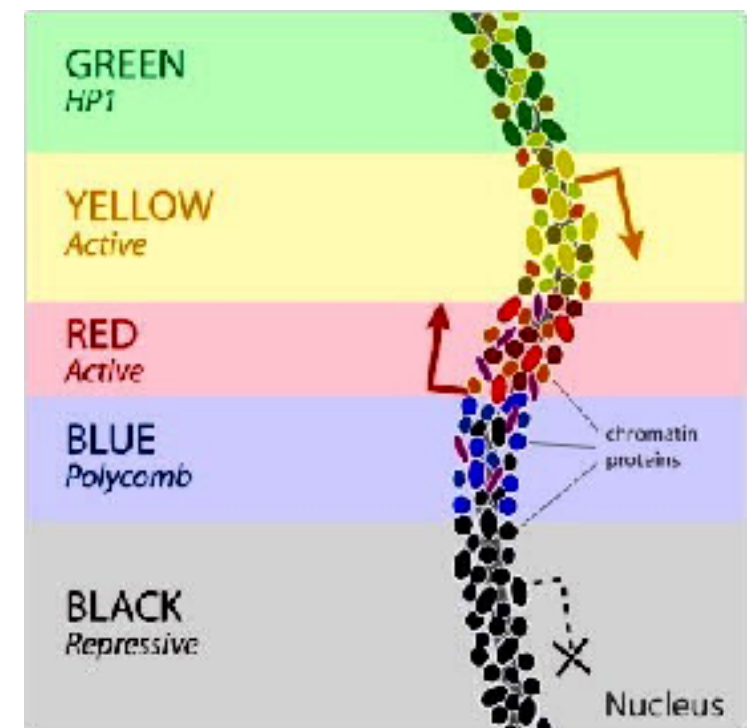
# Structuring the **COLORs** of chromatin

Serra, Baù et al. (2017) PLOS CompBio.



Filion et al. (2010). *Cell*, 143(2), 212–224.

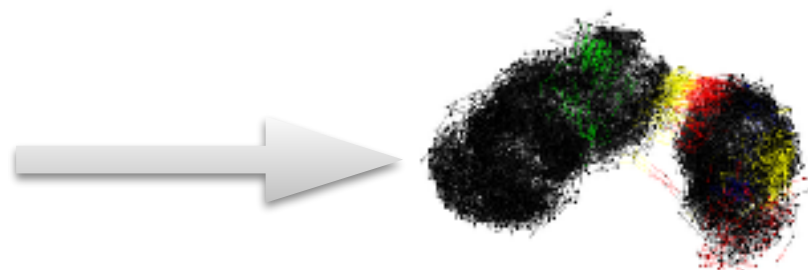
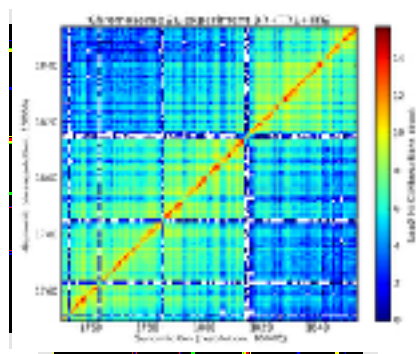
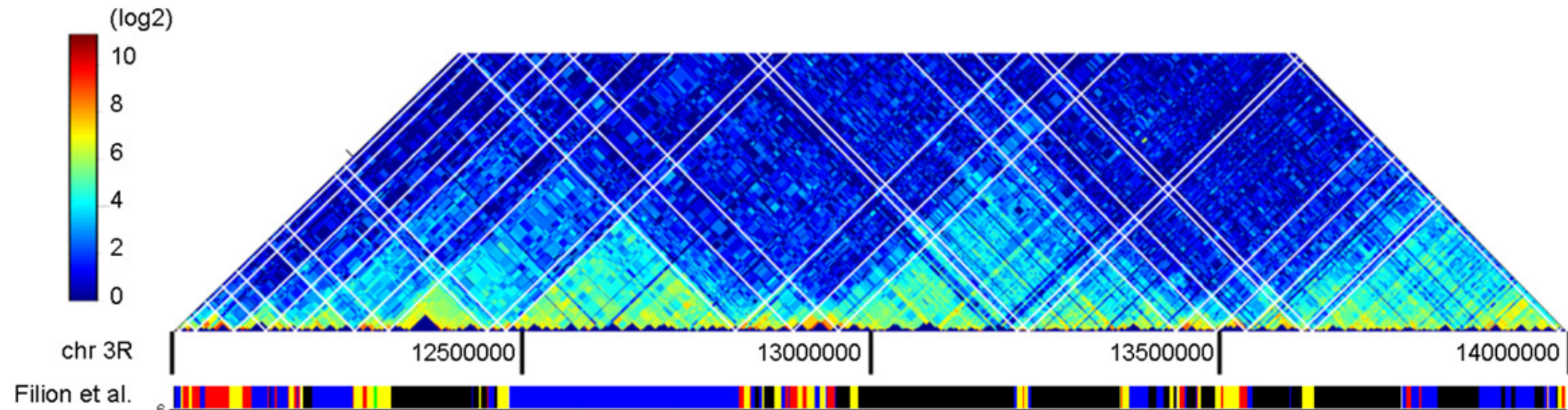
Filion et al. (2010). *Cell*, 143(2), 212–224.





# Fly Chromatin **COLORs**

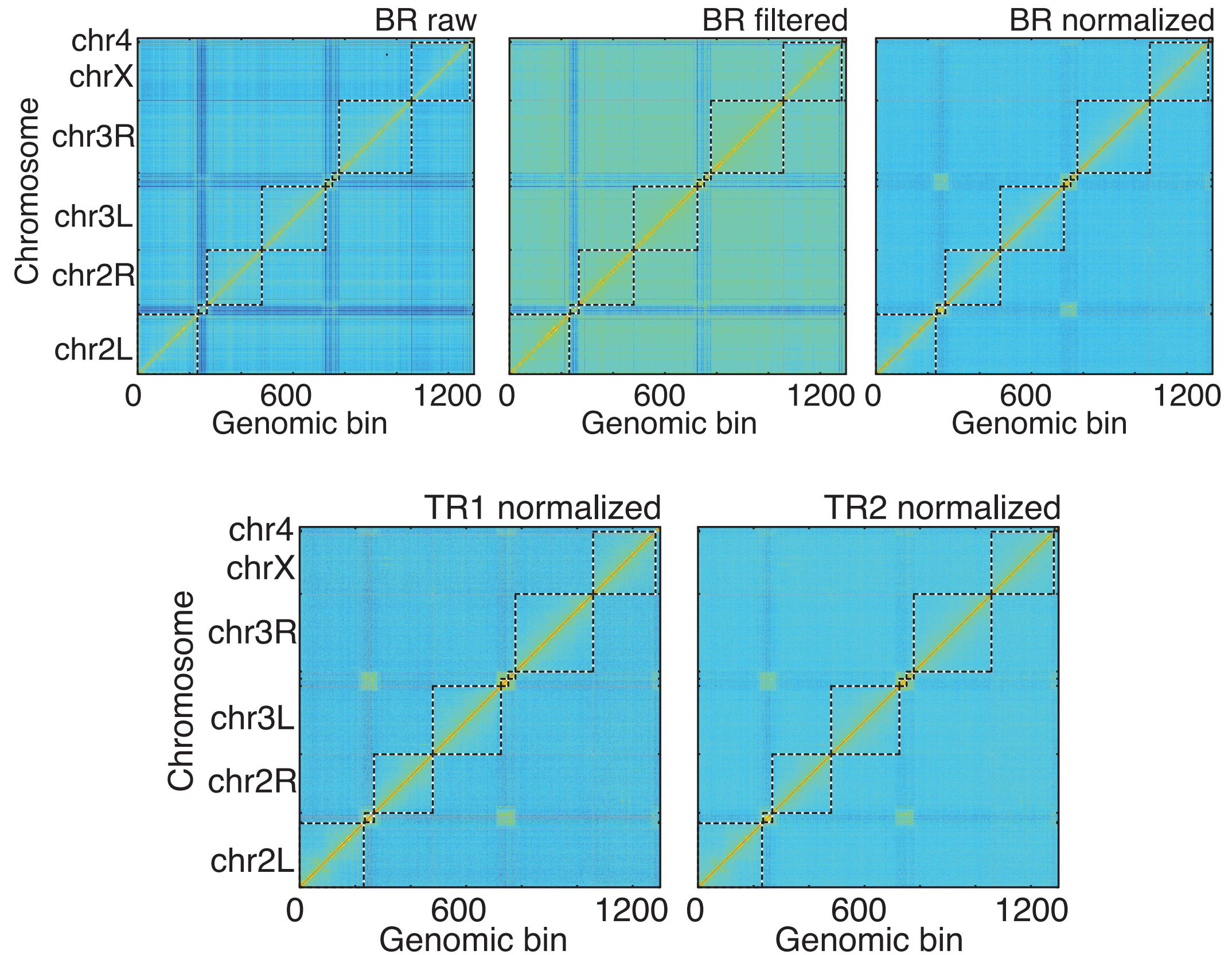
Hou et al. (2012). Molecular Cell, 48(3), 471–484.



~200 regions of ~5Mb each  
2Kb resolution

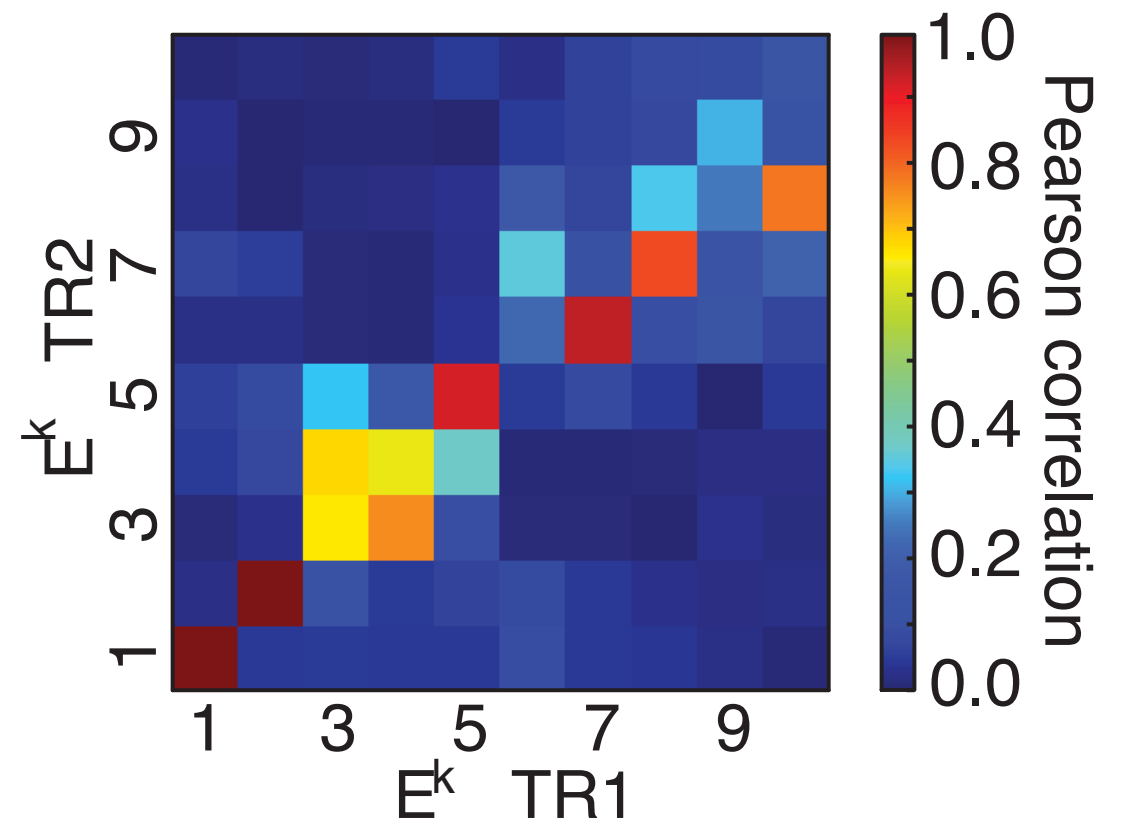
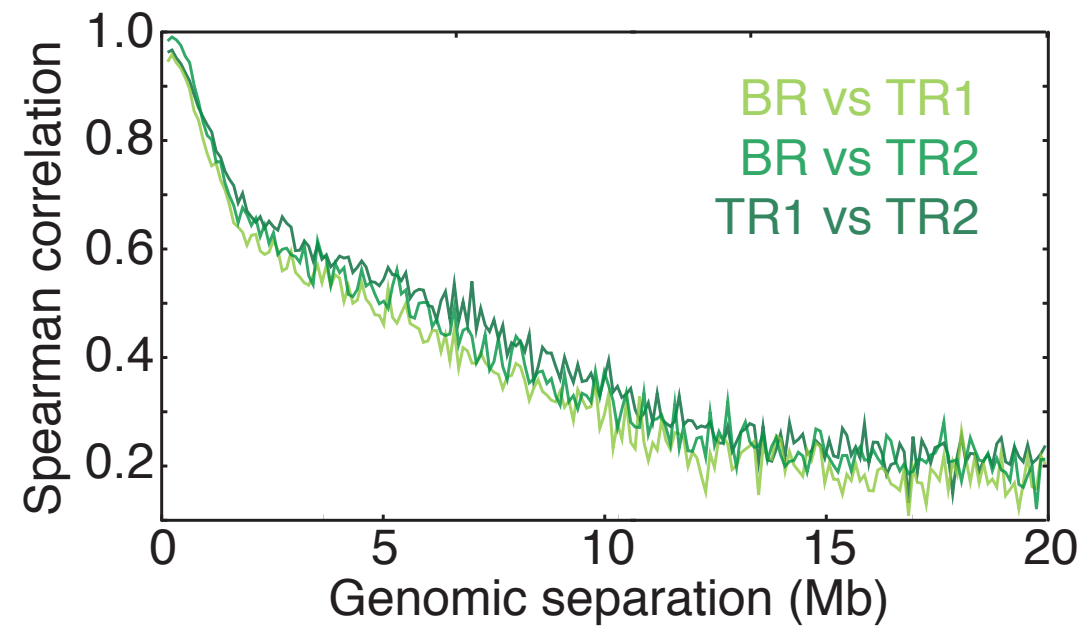
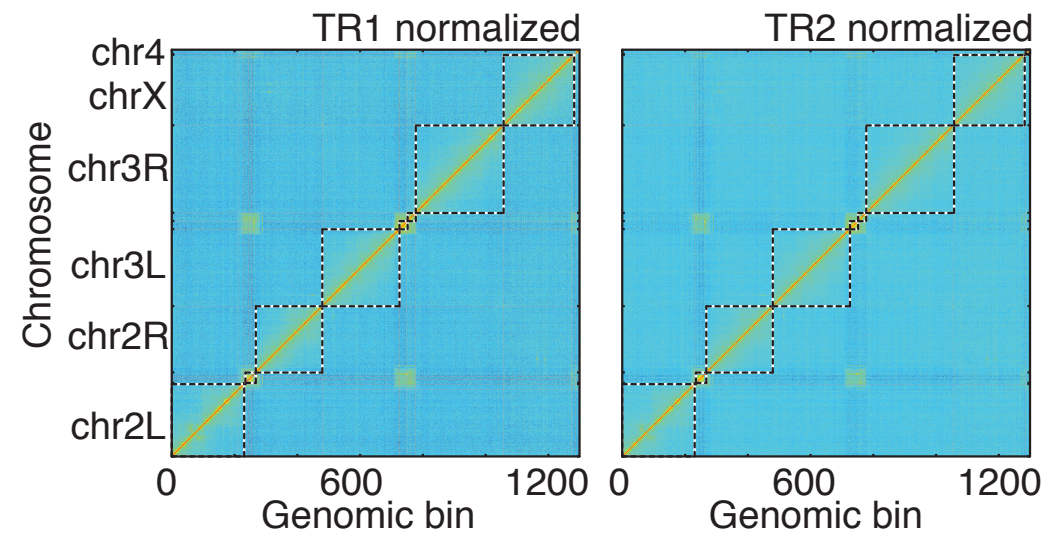


# Mapping · Filtering · Normalizing



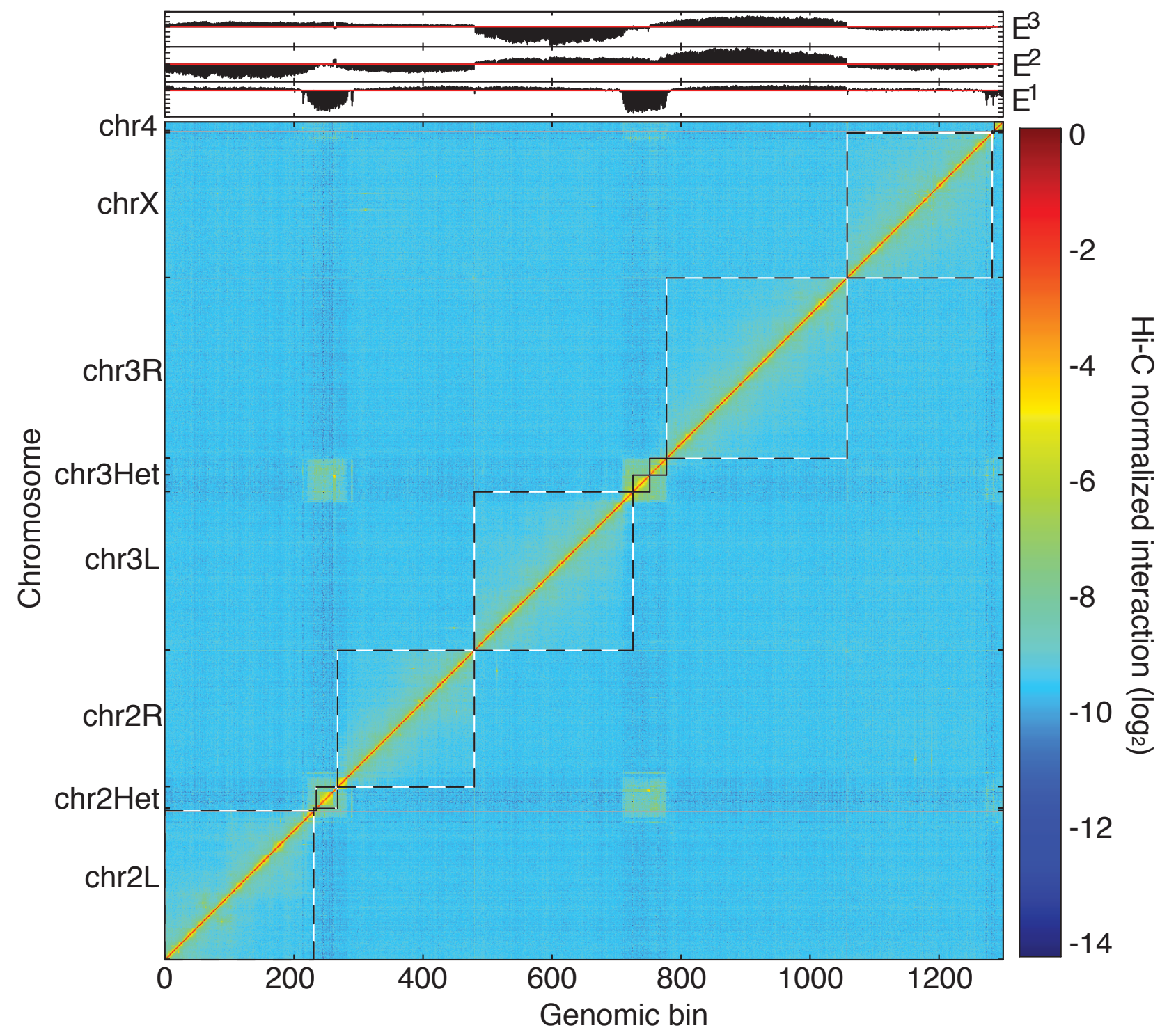
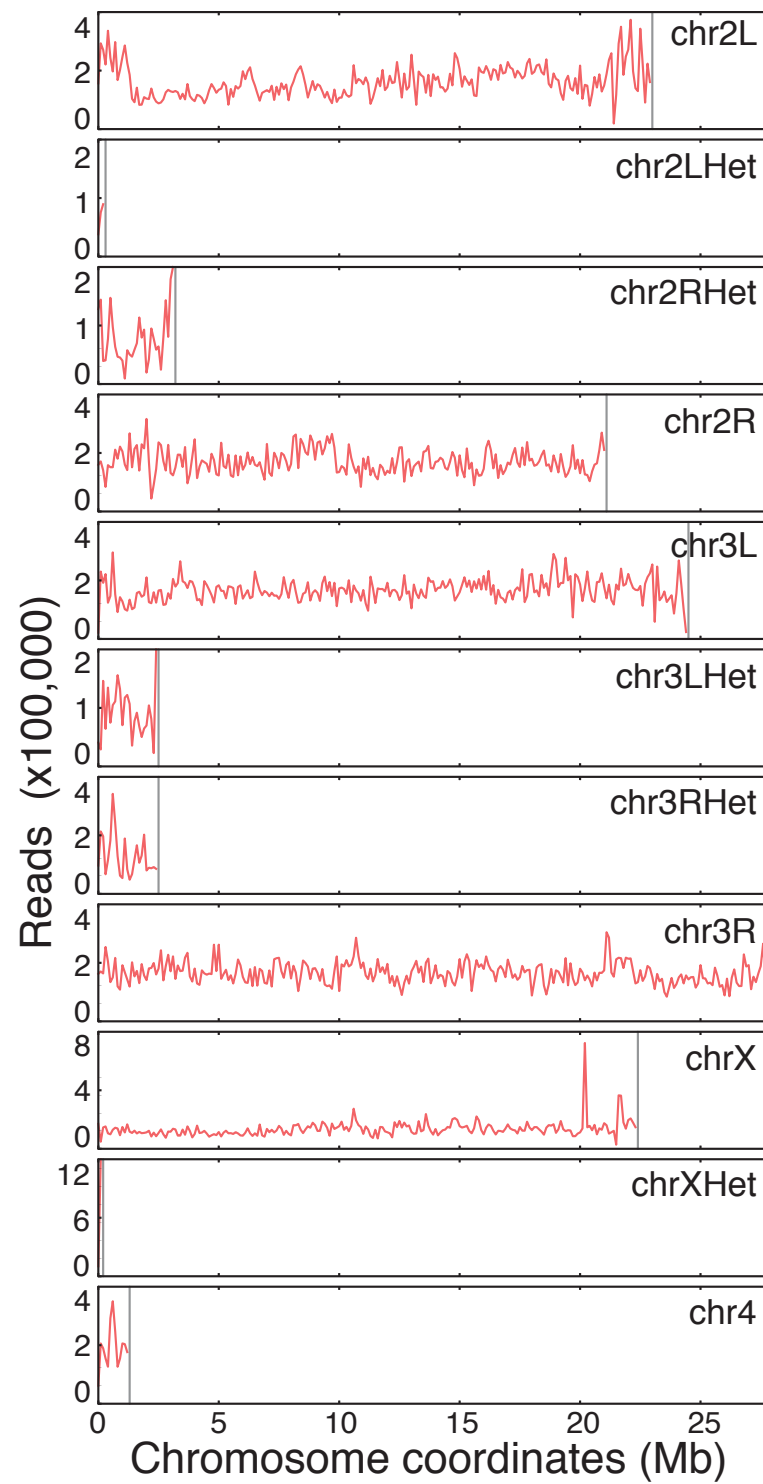


# Matrix comparison



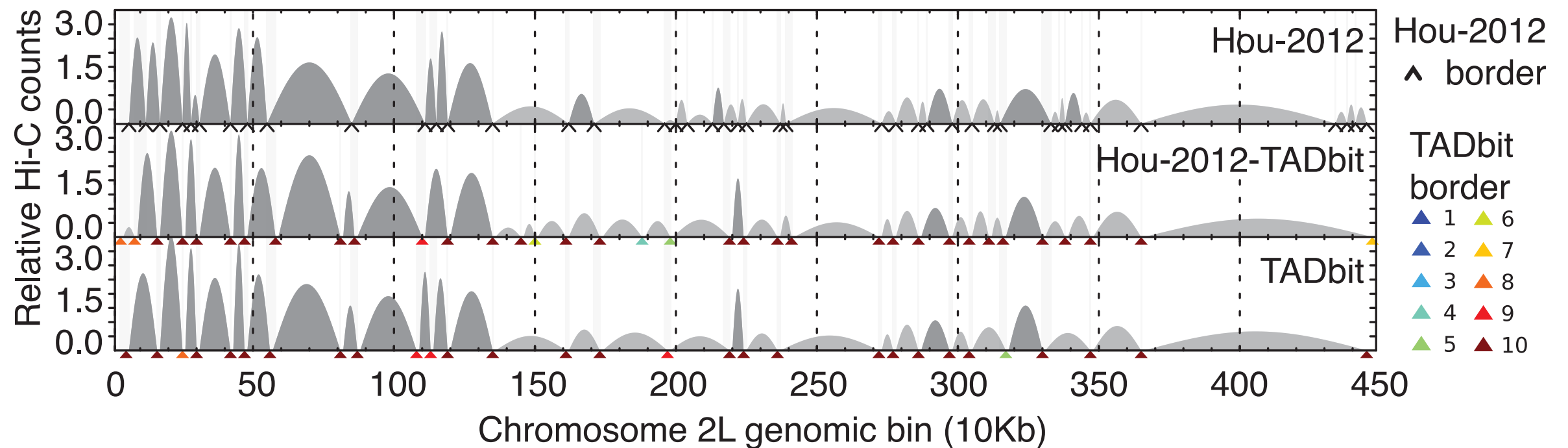
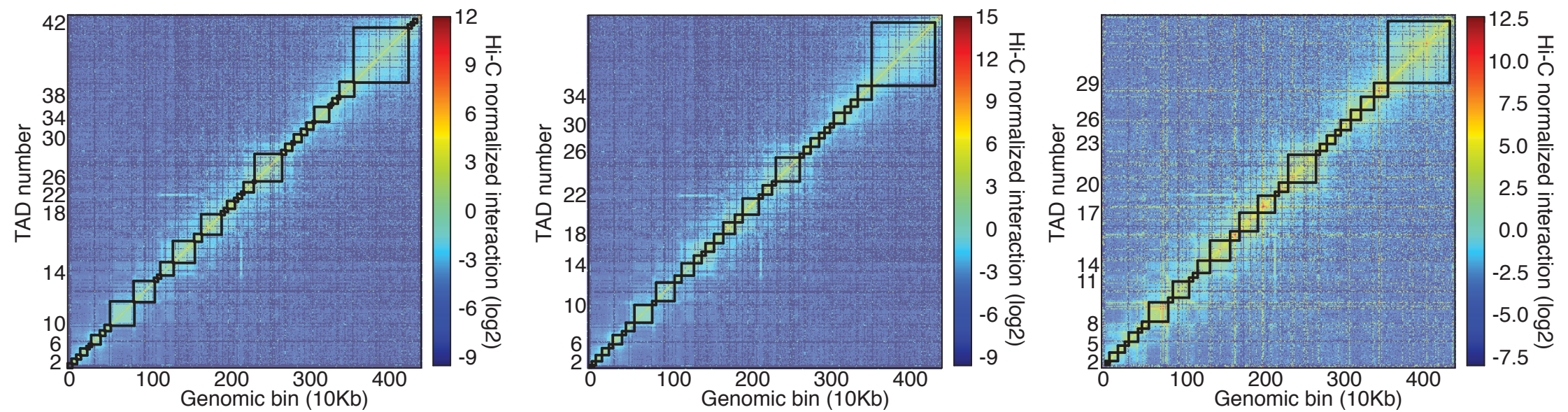


# Matrix merging





# TAD detection · comparison



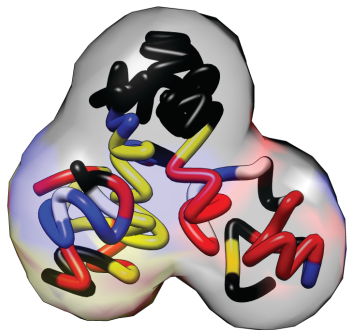
# Structural properties

50 1Mb regions. 10 enriched for each color.

RED dense region  
3R:18920000-19920000



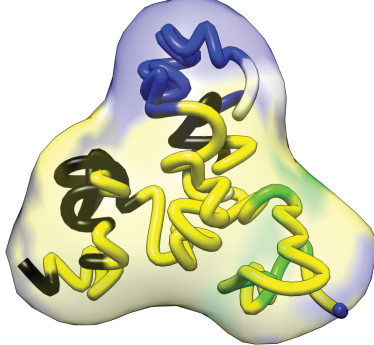
22% 17% 0% 11% 45% 6%



YELLOW dense region  
X:15590000-16600000



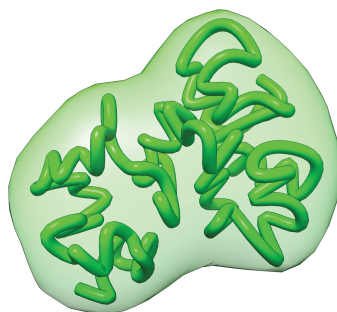
0% 48% 4% 20% 26% 3%



GREEN dense region  
2R:510000-1530000



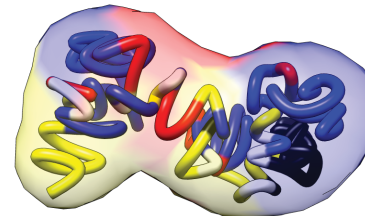
0% 0% 100% 0% 0% 0%



BLUE dense region  
3L:210000-1230000



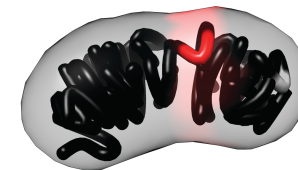
11% 17% 0% 52% 13% 0%



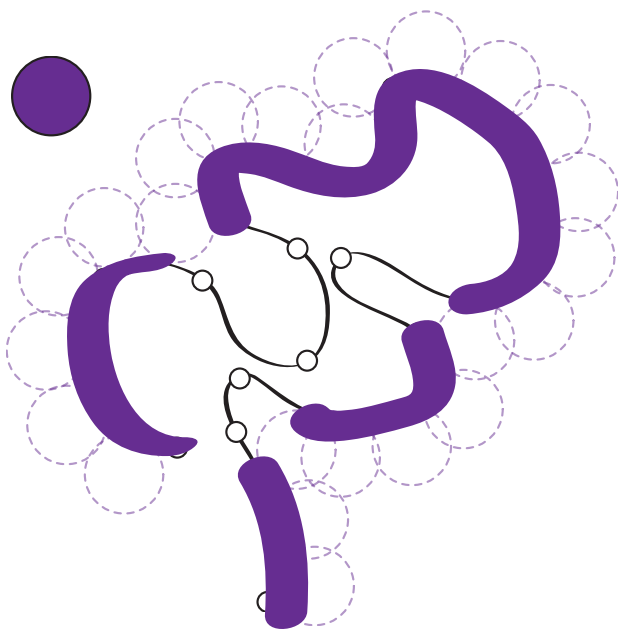
BLACK dense region  
2L:17500000-18530000



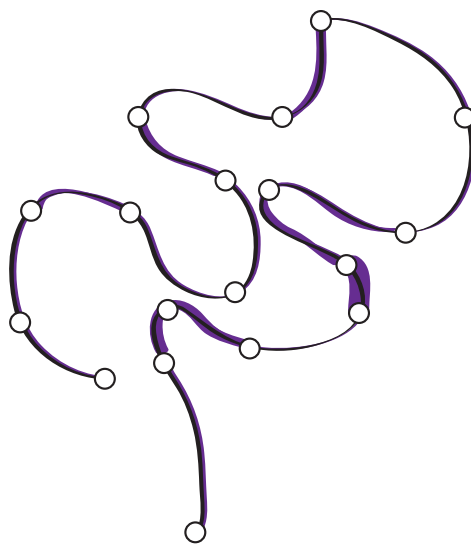
1% 0% 0% 0% 98% 1%



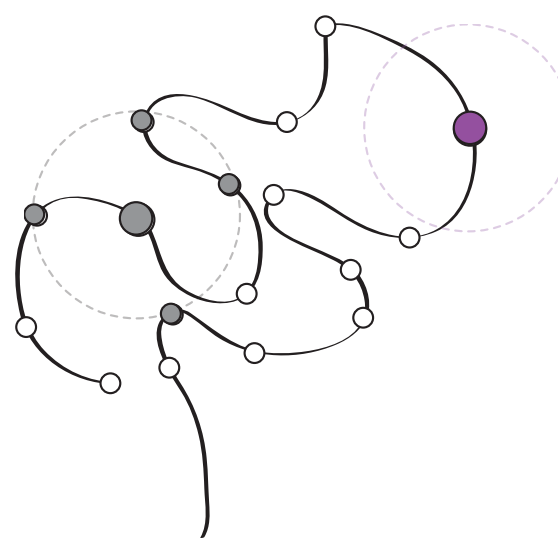
Accessibility (%)



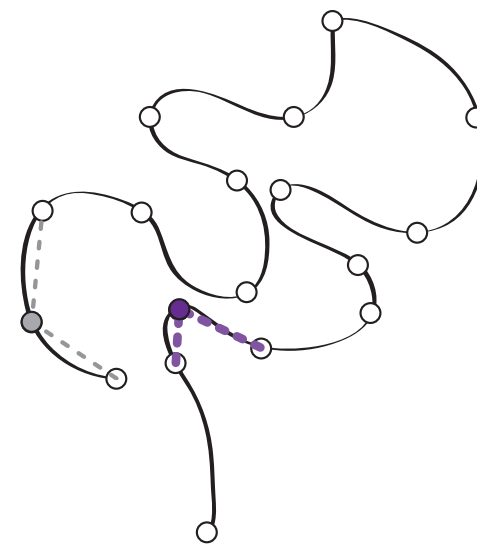
Density (bp/nm)



Interactions



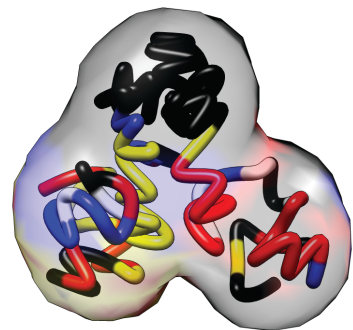
Angle



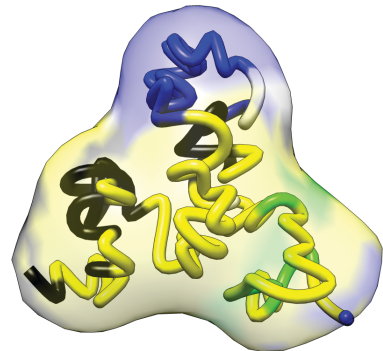


# Structural **COLORs**

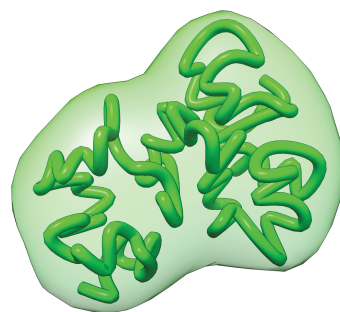
**RED dense region**  
3R:18920000-19920000  
22% 17% 0% 11% 45% 6%



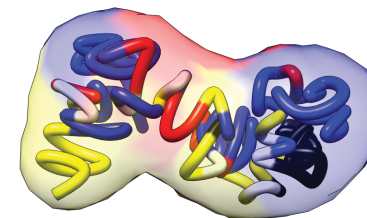
**YELLOW dense region**  
X:15590000-16600000  
0% 48% 4% 20% 26% 3%



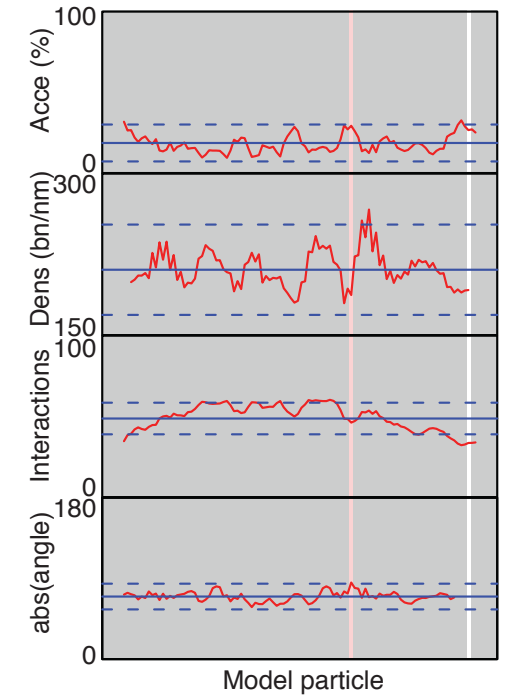
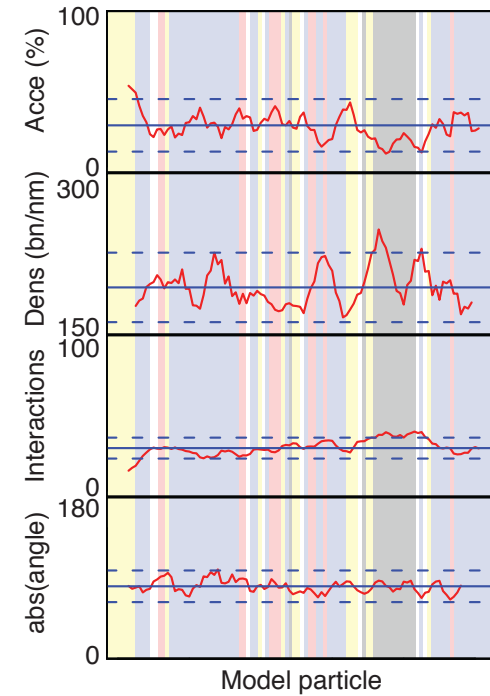
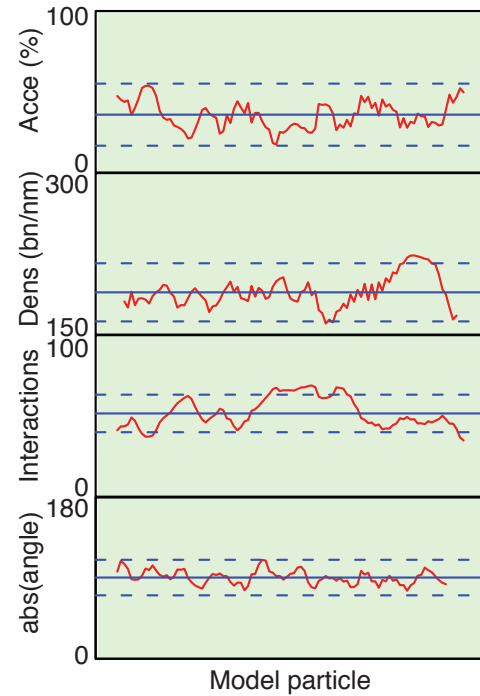
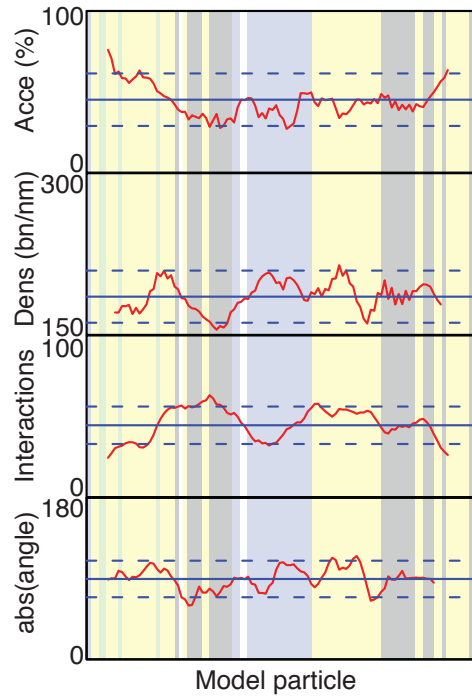
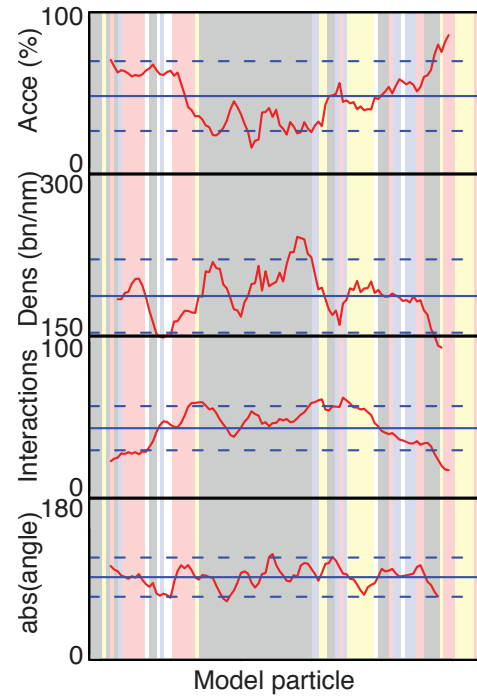
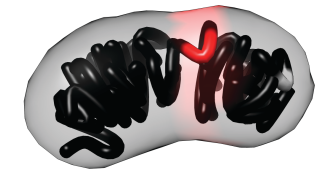
**GREEN dense region**  
2R:510000-1530000  
0% 0% 100% 0% 0% 0%



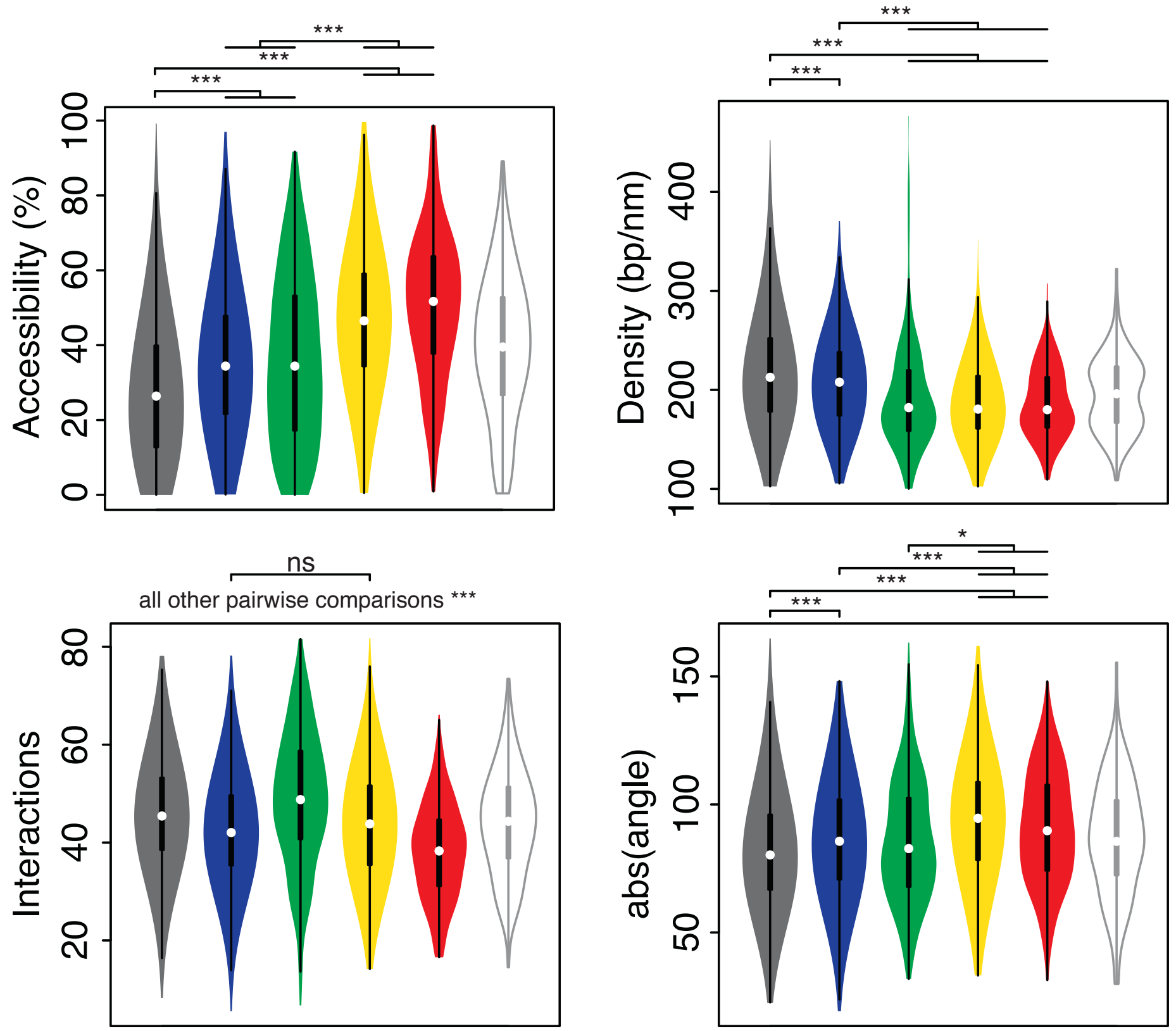
**BLUE dense region**  
3L:210000-1230000  
11% 17% 0% 52% 13% 0%



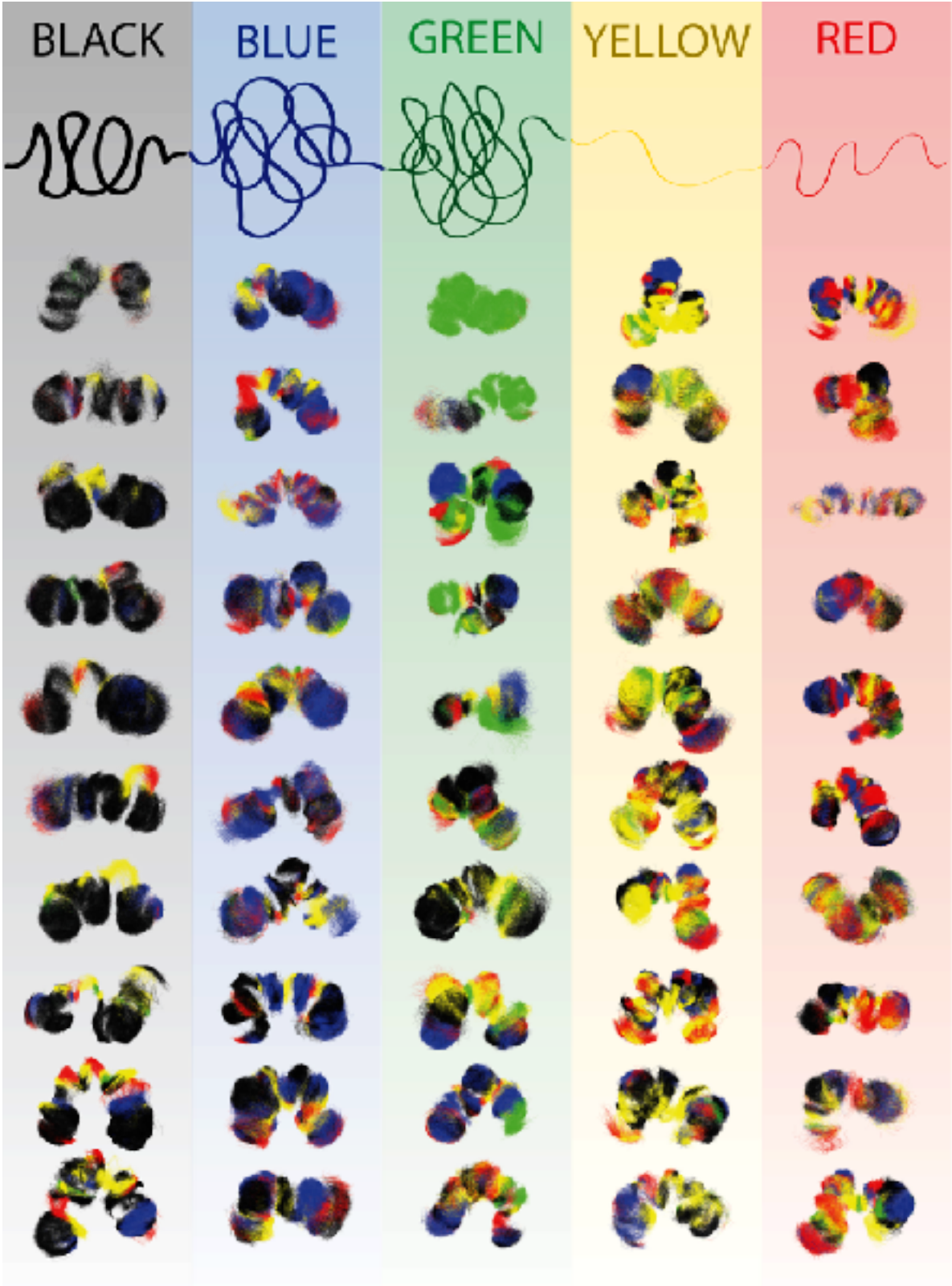
**BLACK dense region**  
2L:17500000-18530000  
1% 0% 0% 0% 98% 1%



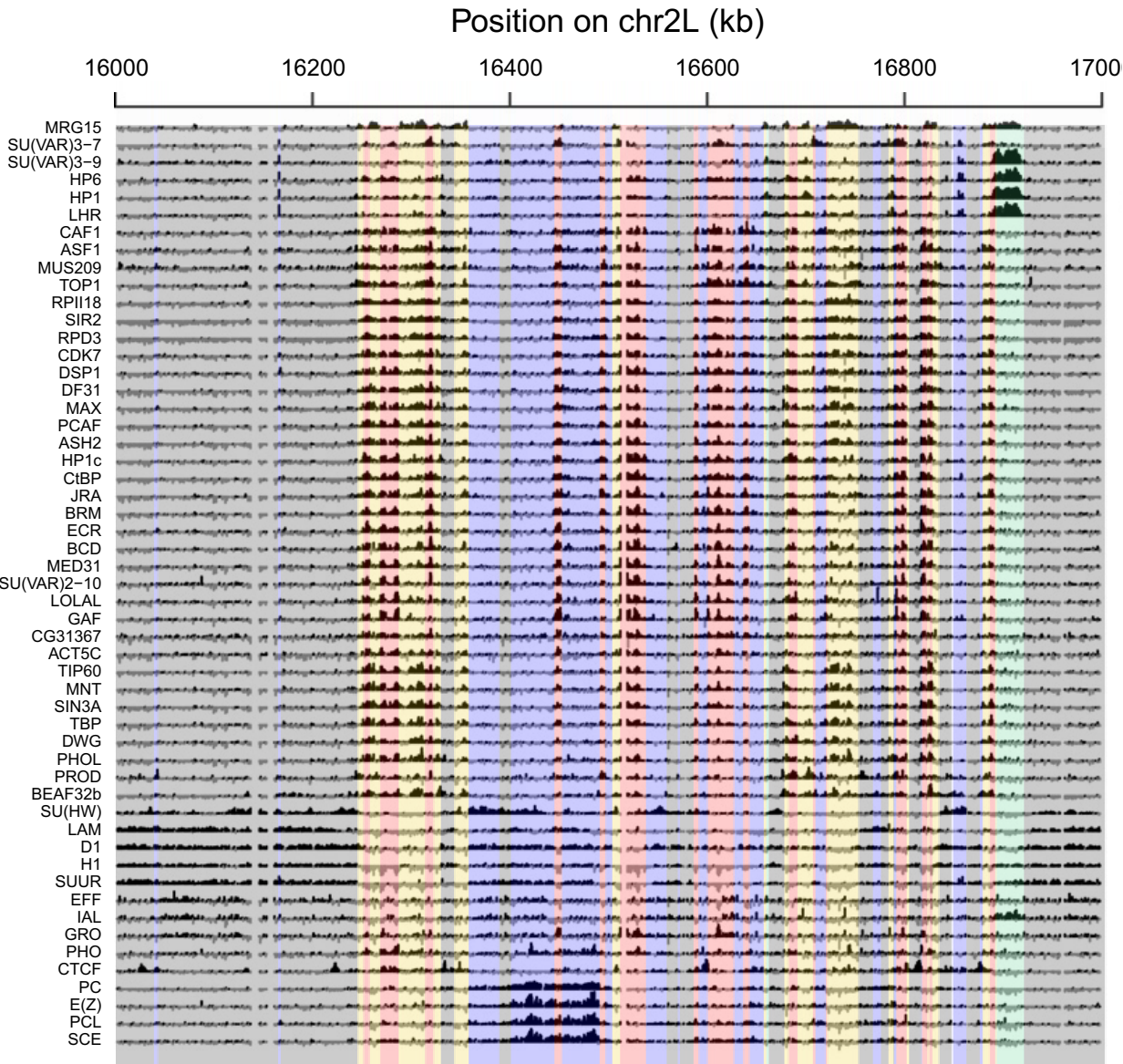
# Structural **COLORs**



# Structural COLOrS



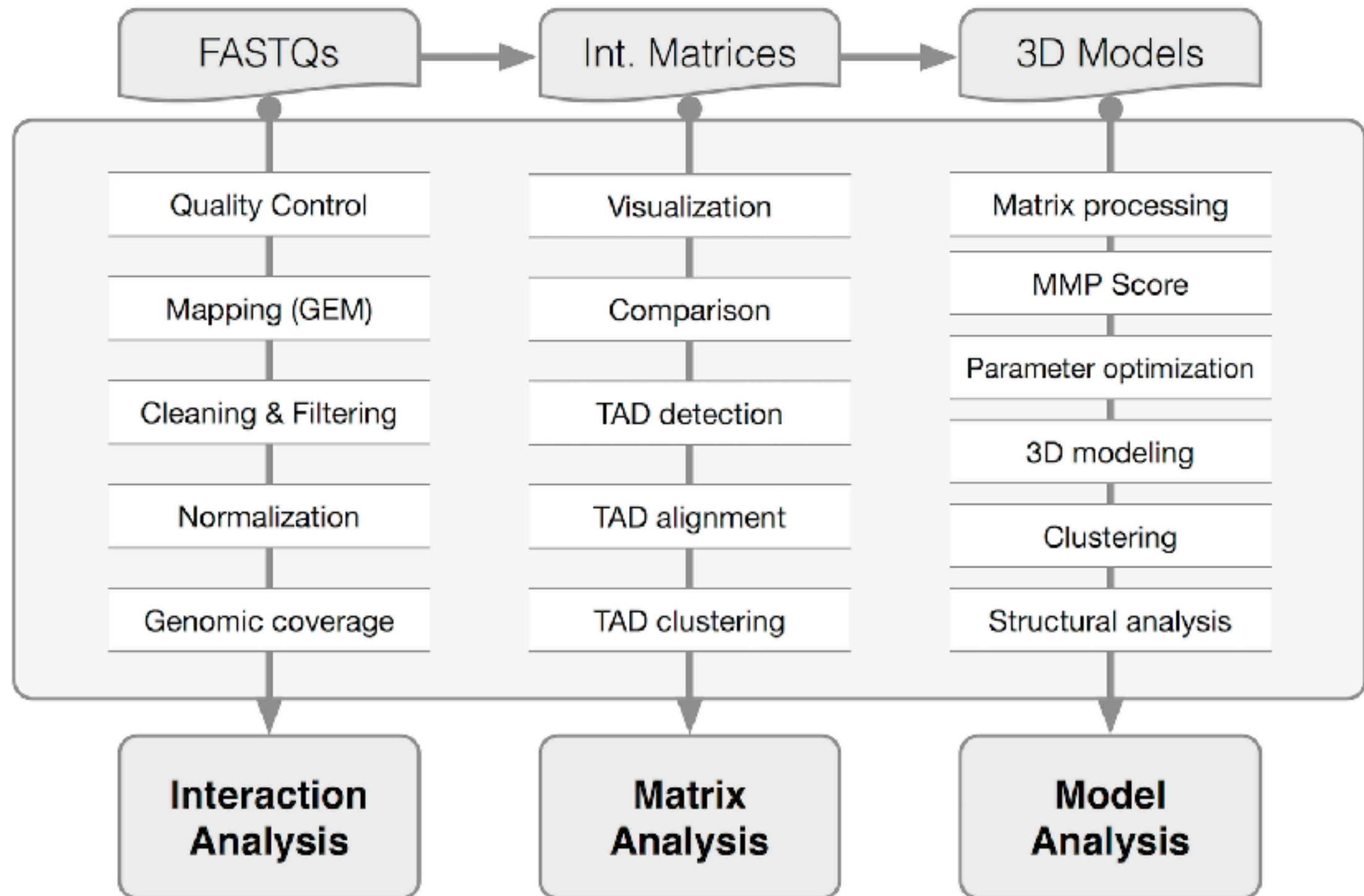
53 chromatin proteins







Serra, Baù, et al. (2017). PLOS CompBio



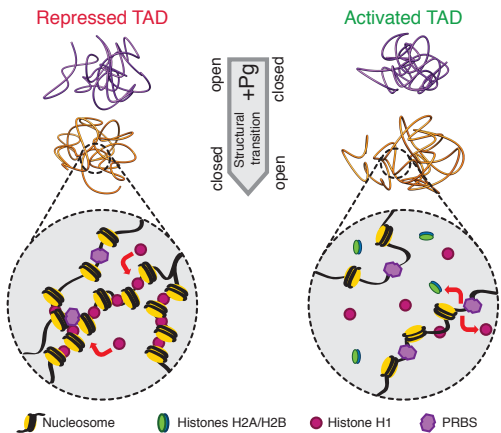
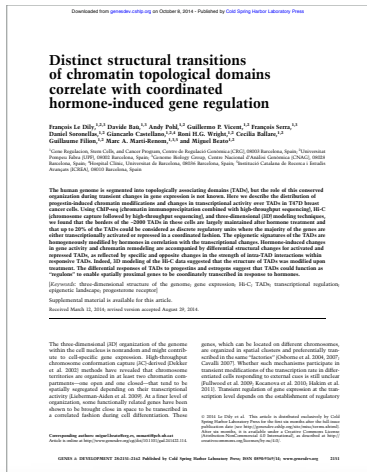
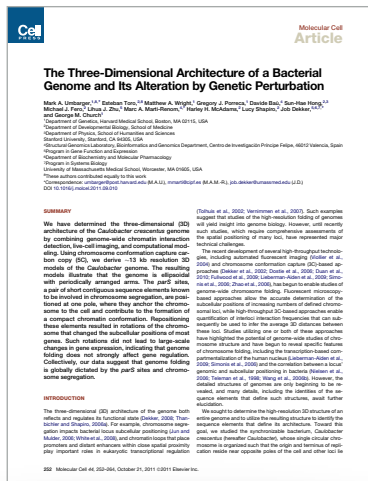
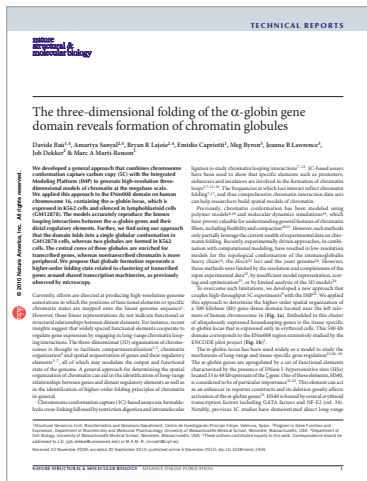
# TADbit other applications...

Baù, D. et al. Nat Struct Mol Biol (2011)

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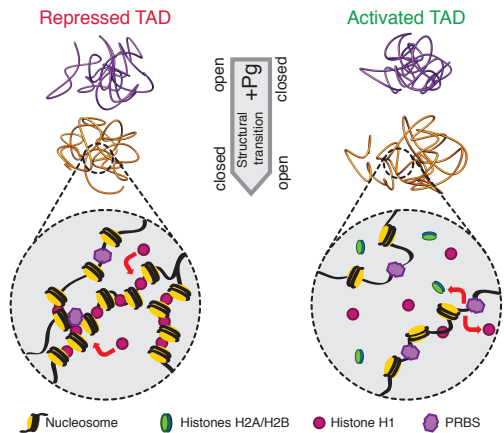
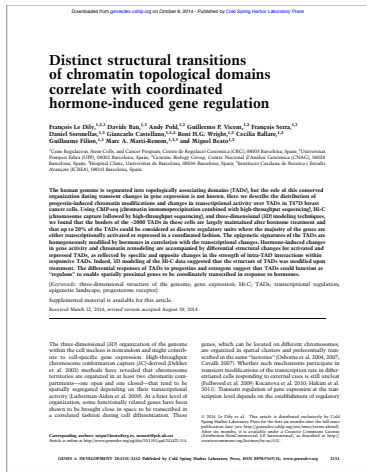
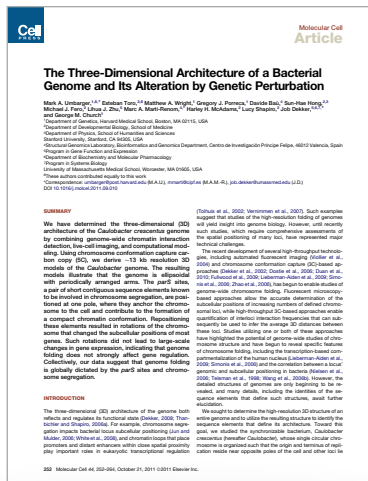
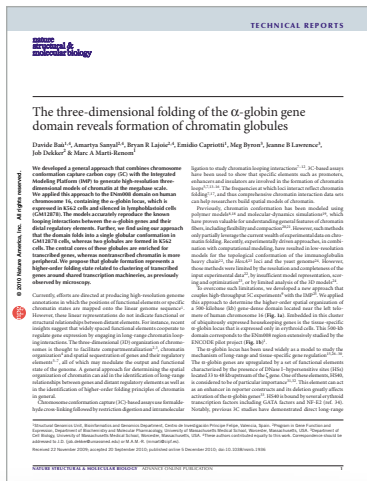
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<http://cnag.crg.eu>

