

# 3DGenomics

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Structural Genomics Group (CRG)

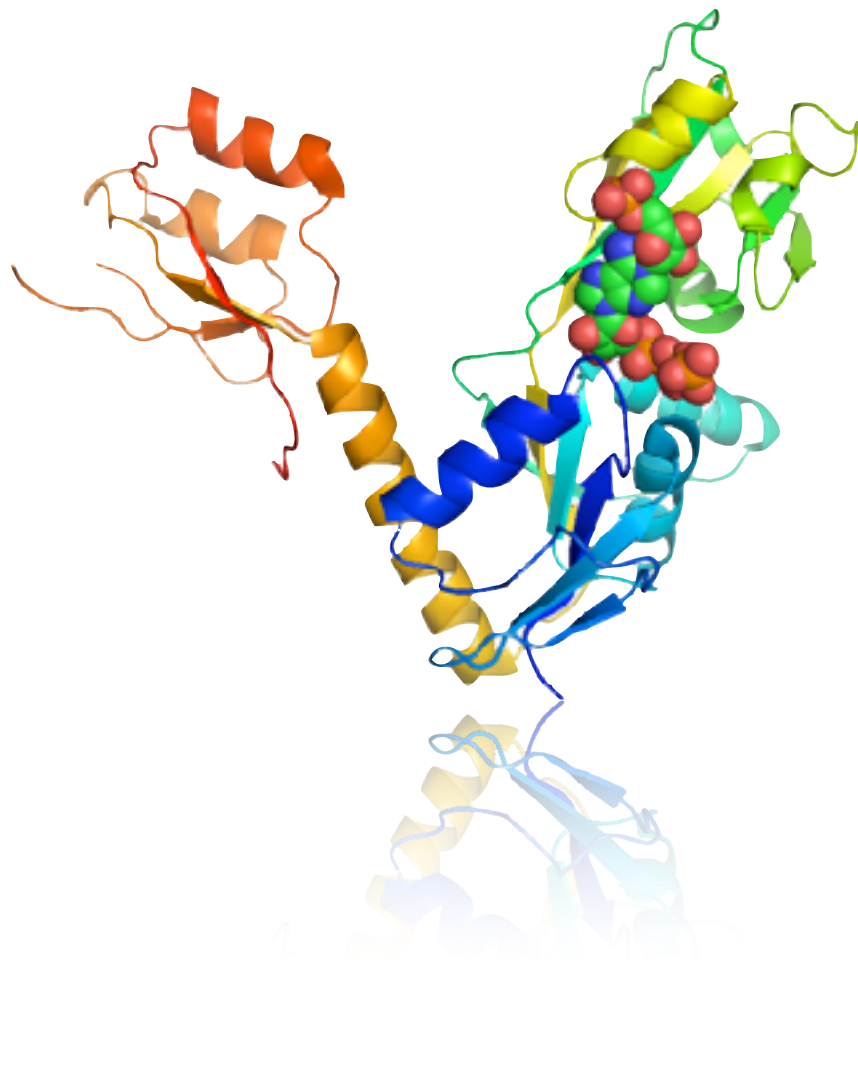




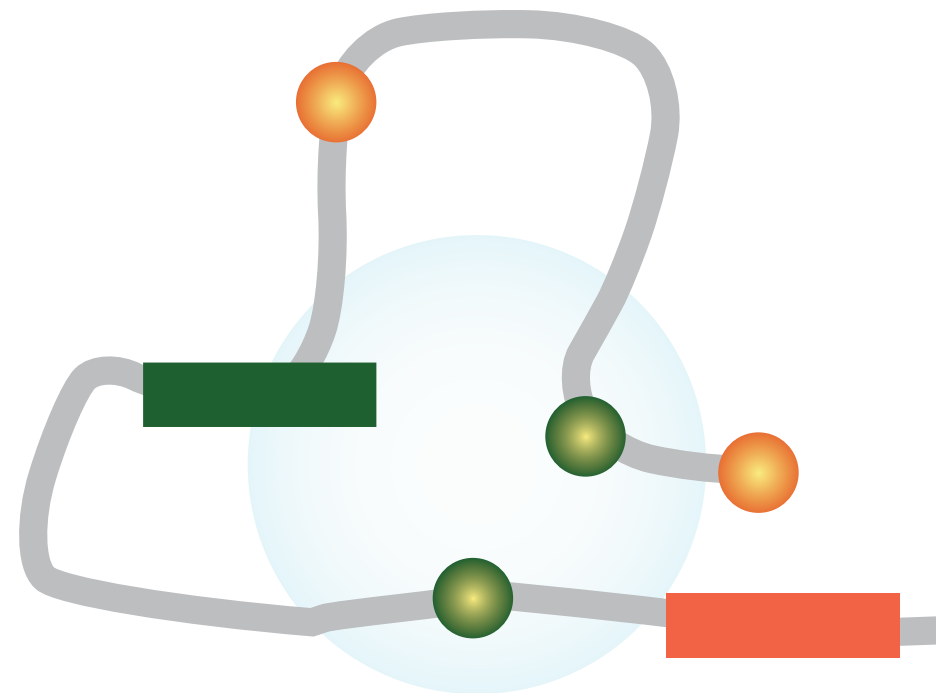
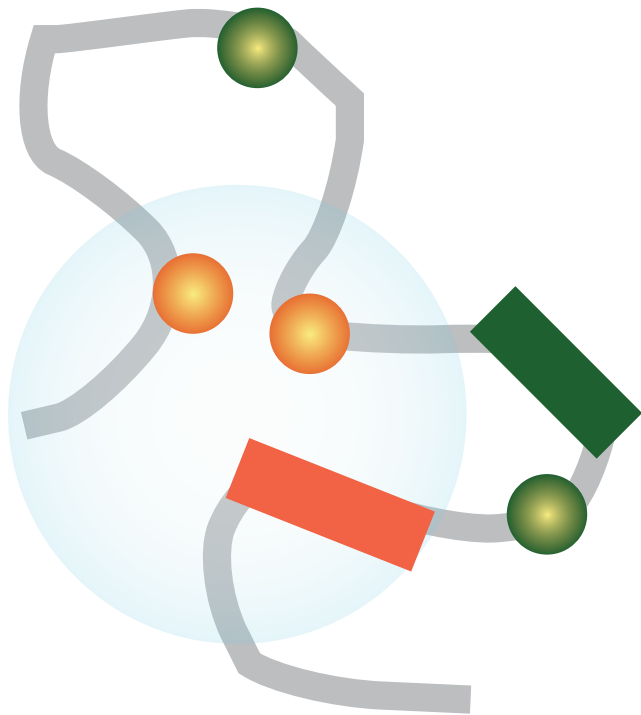


# Structural Genomics Group

<http://www.marciuslab.org>



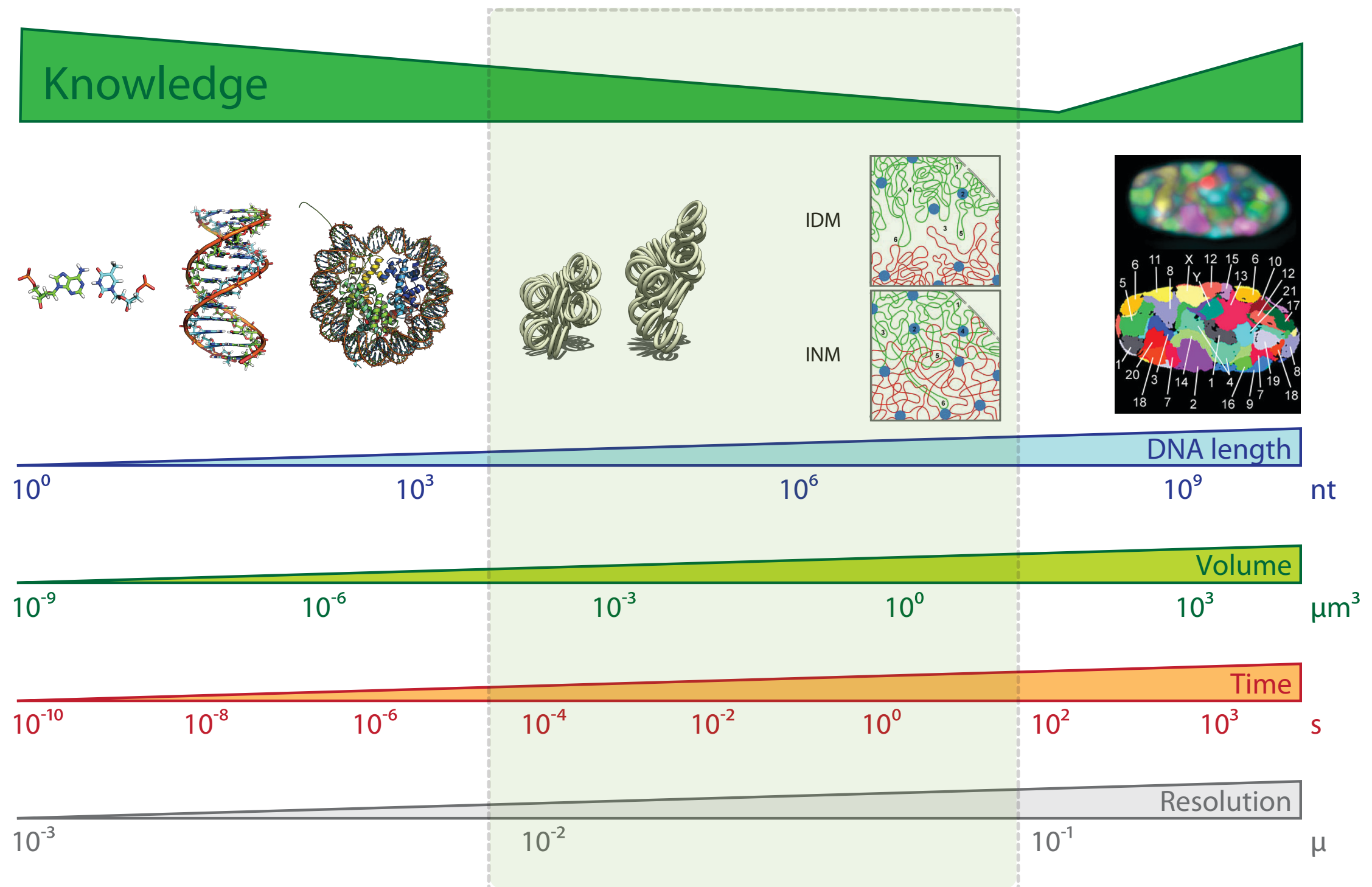
# Complex genome organization





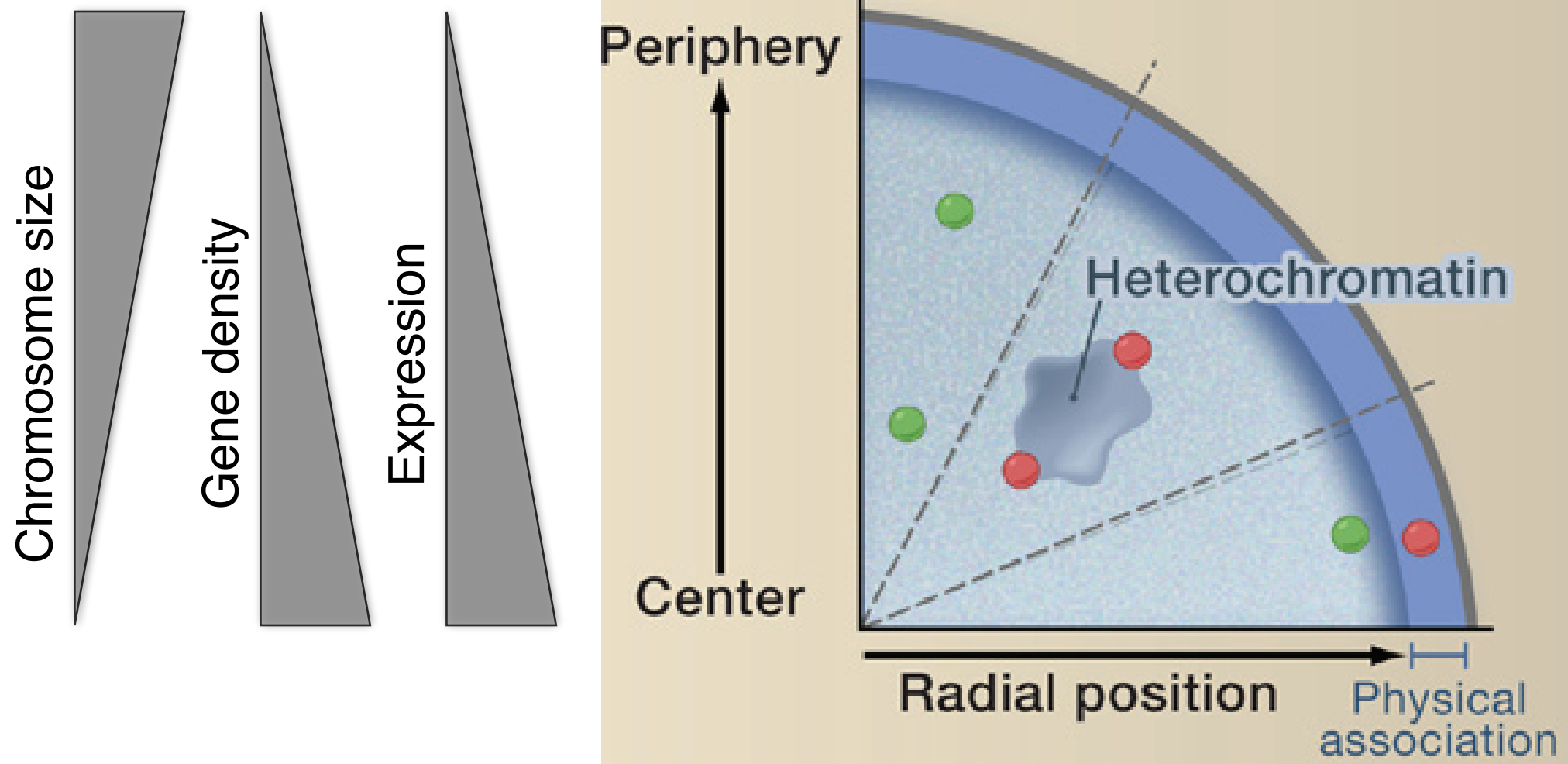
# Resolution Gap

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



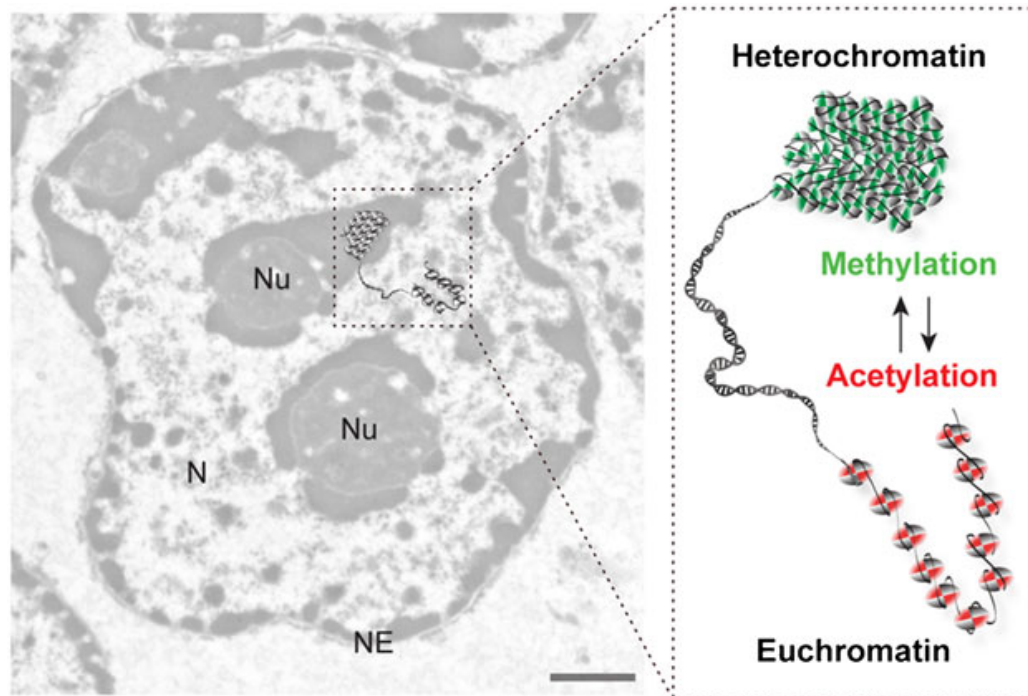
# Level I: Radial genome organization

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

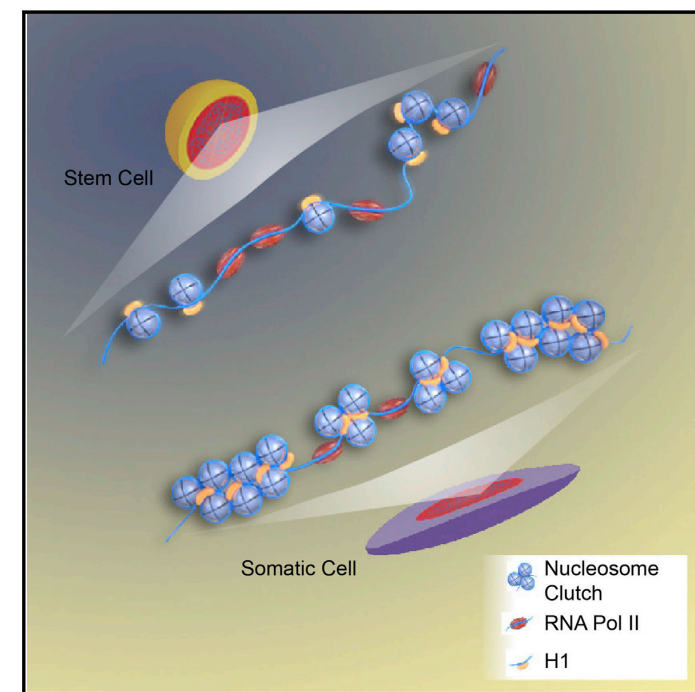


# Level II: Euchromatin vs heterochromatin

Electron microscopy



Nanoscopy



## Euchromatin:

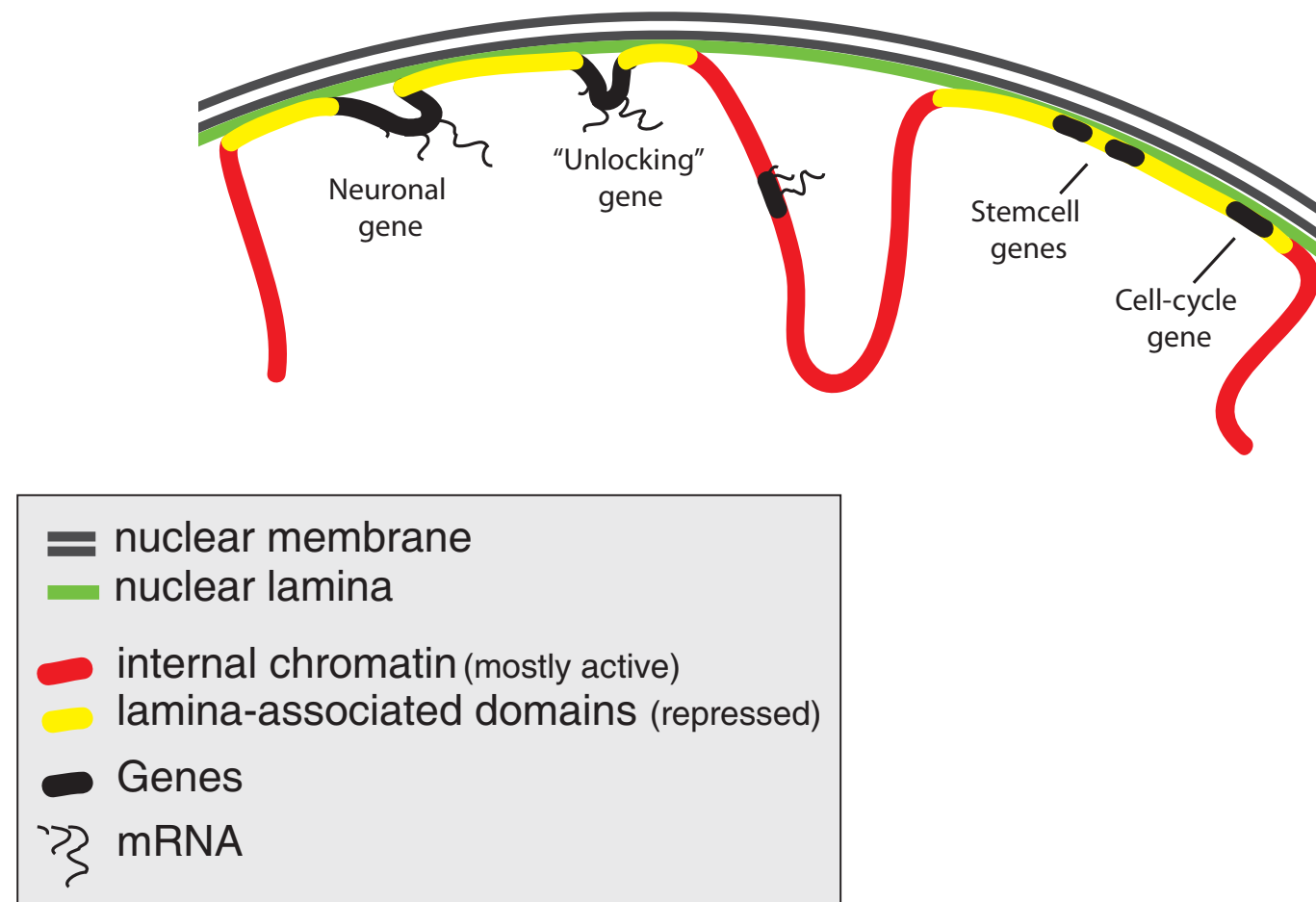
chromatin that is located away from the nuclear lamina, is generally less densely packed, and contains actively transcribed genes

## Heterochromatin:

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



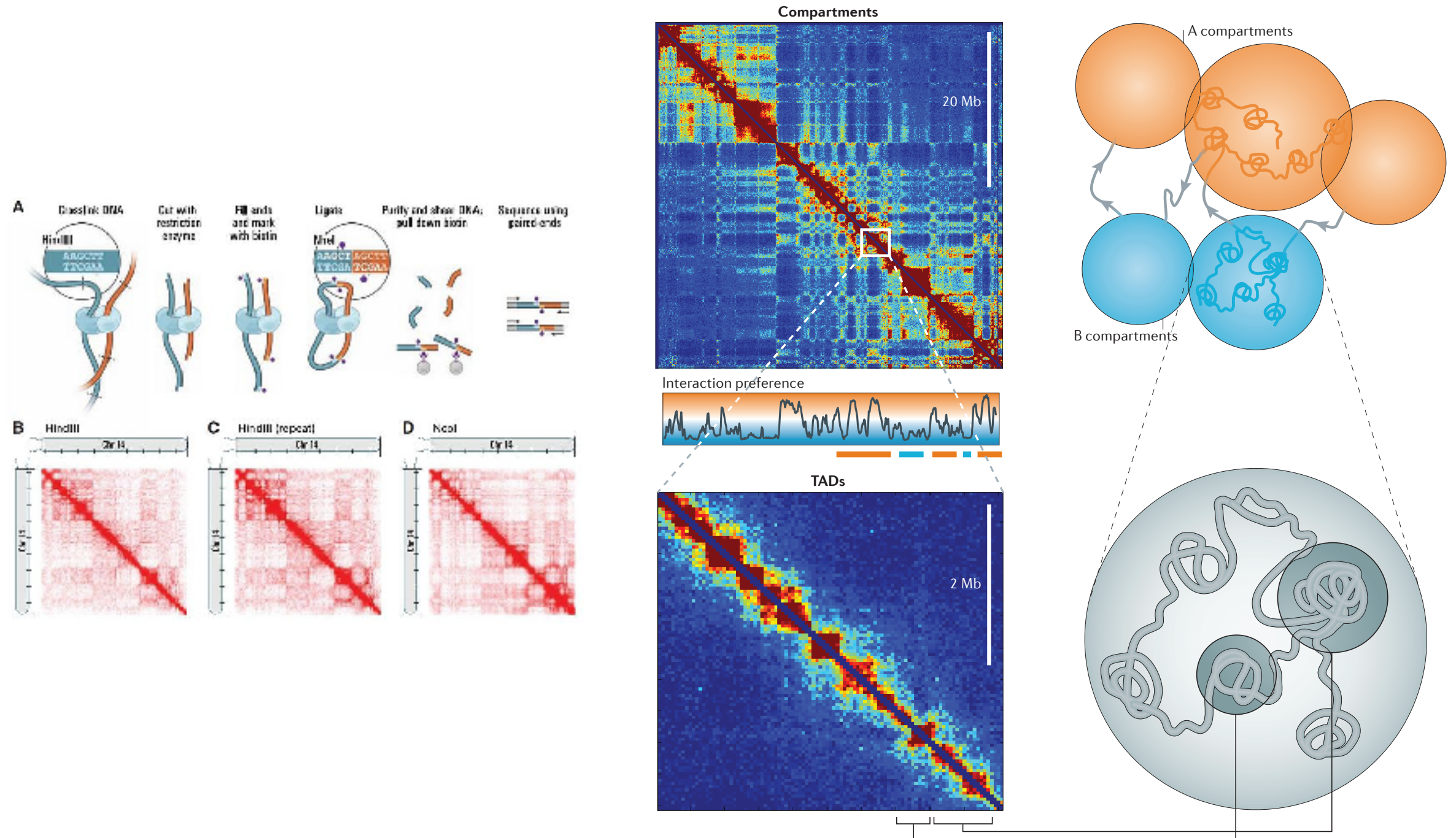
# Level III: Lamina-genome interactions



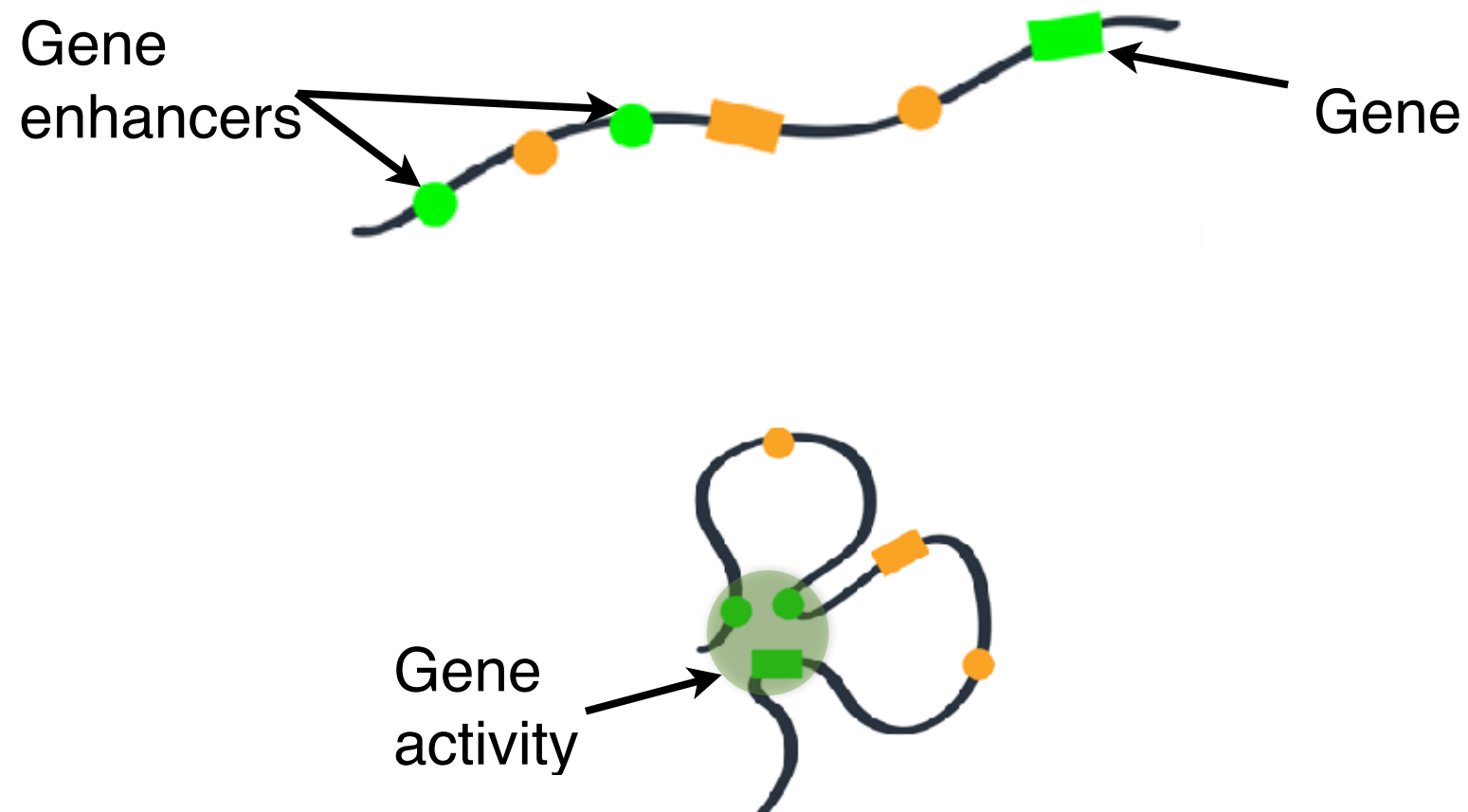
Most genes in Lamina Associated Domains are transcriptionally silent, suggesting that **lamina-genome interactions** are widely involved in the control of **gene expression**

# Level IV: Higher-order organization

Dekker, J., Marti-Renom, M. A. & Mirny, L. A. Exploring the three-dimensional organization of genomes: interpreting chromatin interaction data. Nat Rev Genet 14, 390–403 (2013).



# Level V: Chromatin loops



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

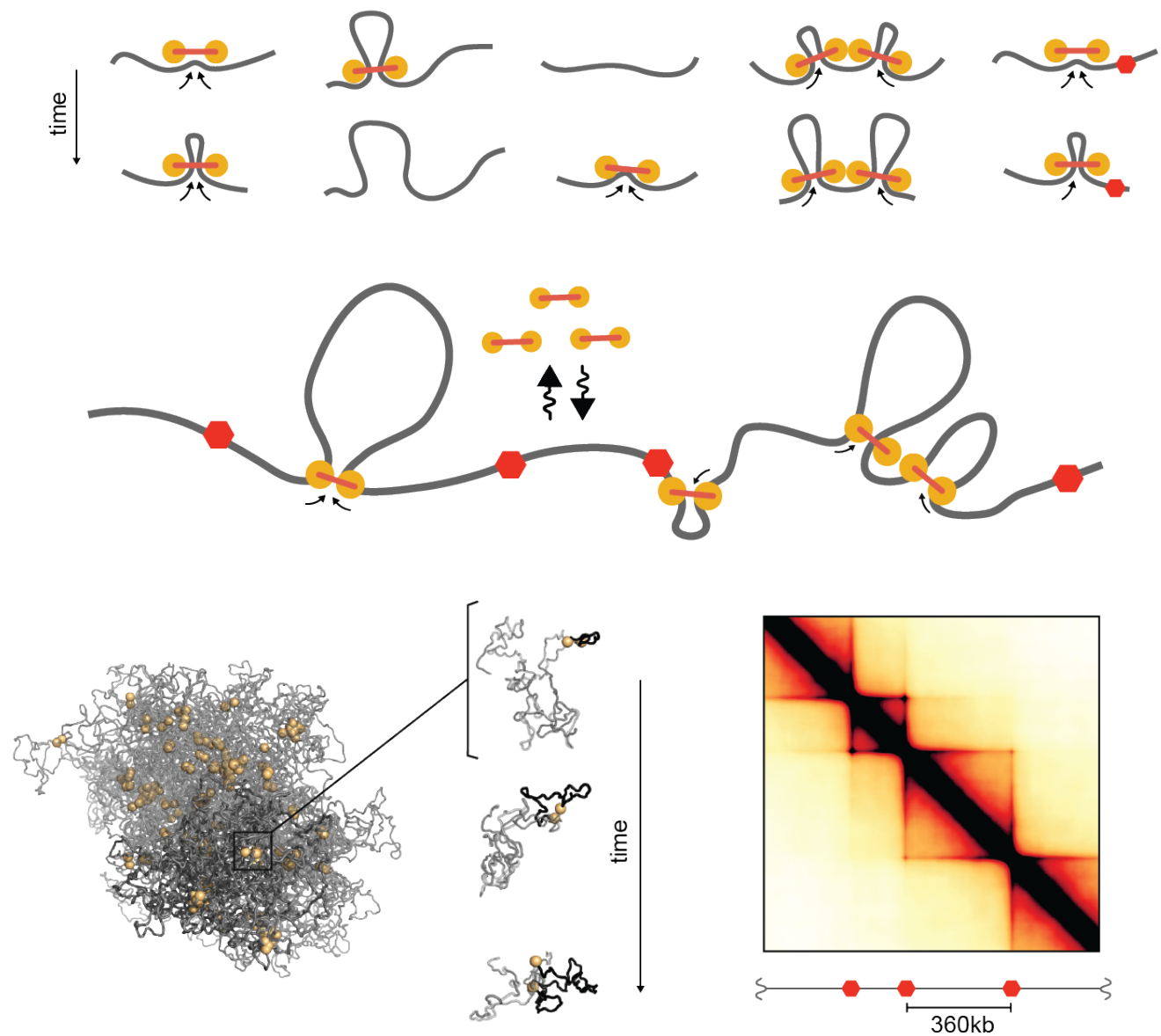
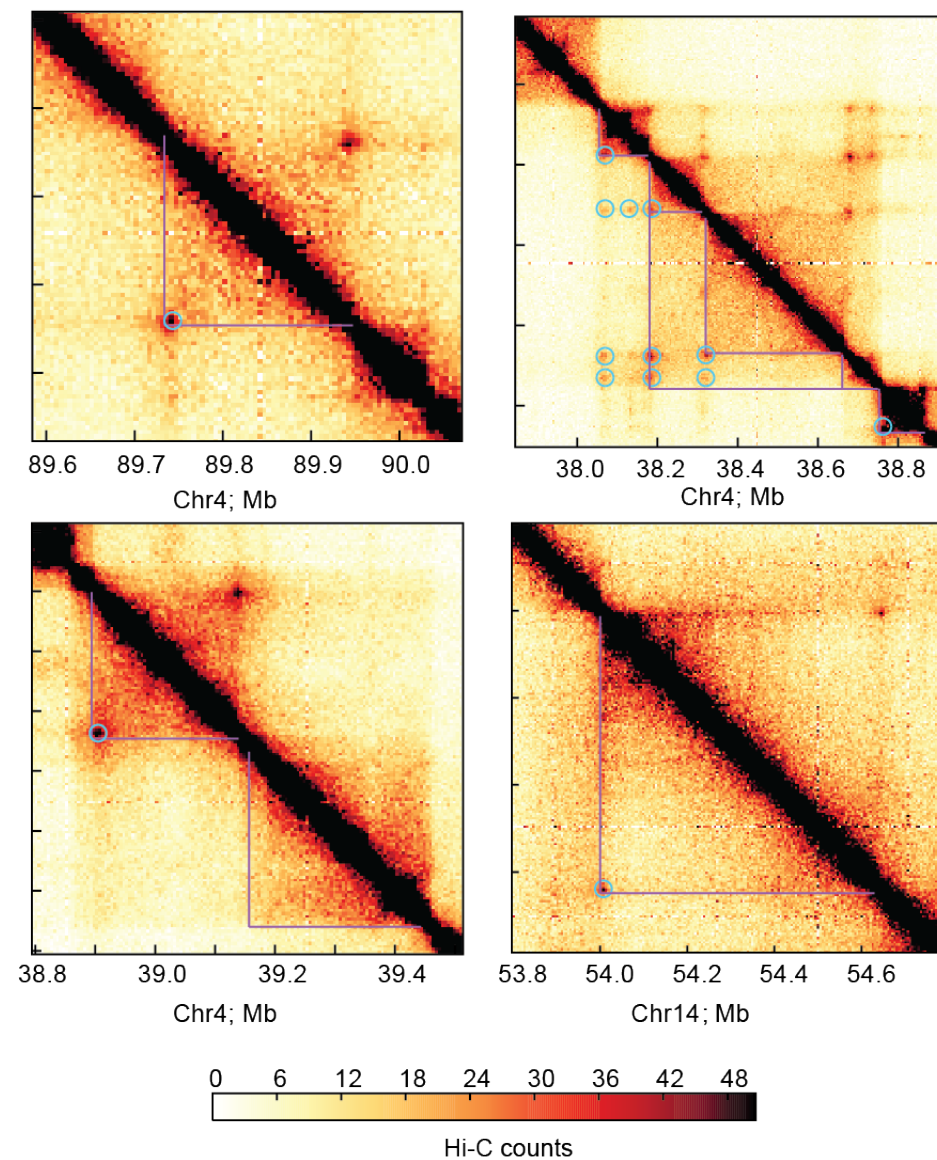
**This in turn can have profound effects on gene transcription**

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



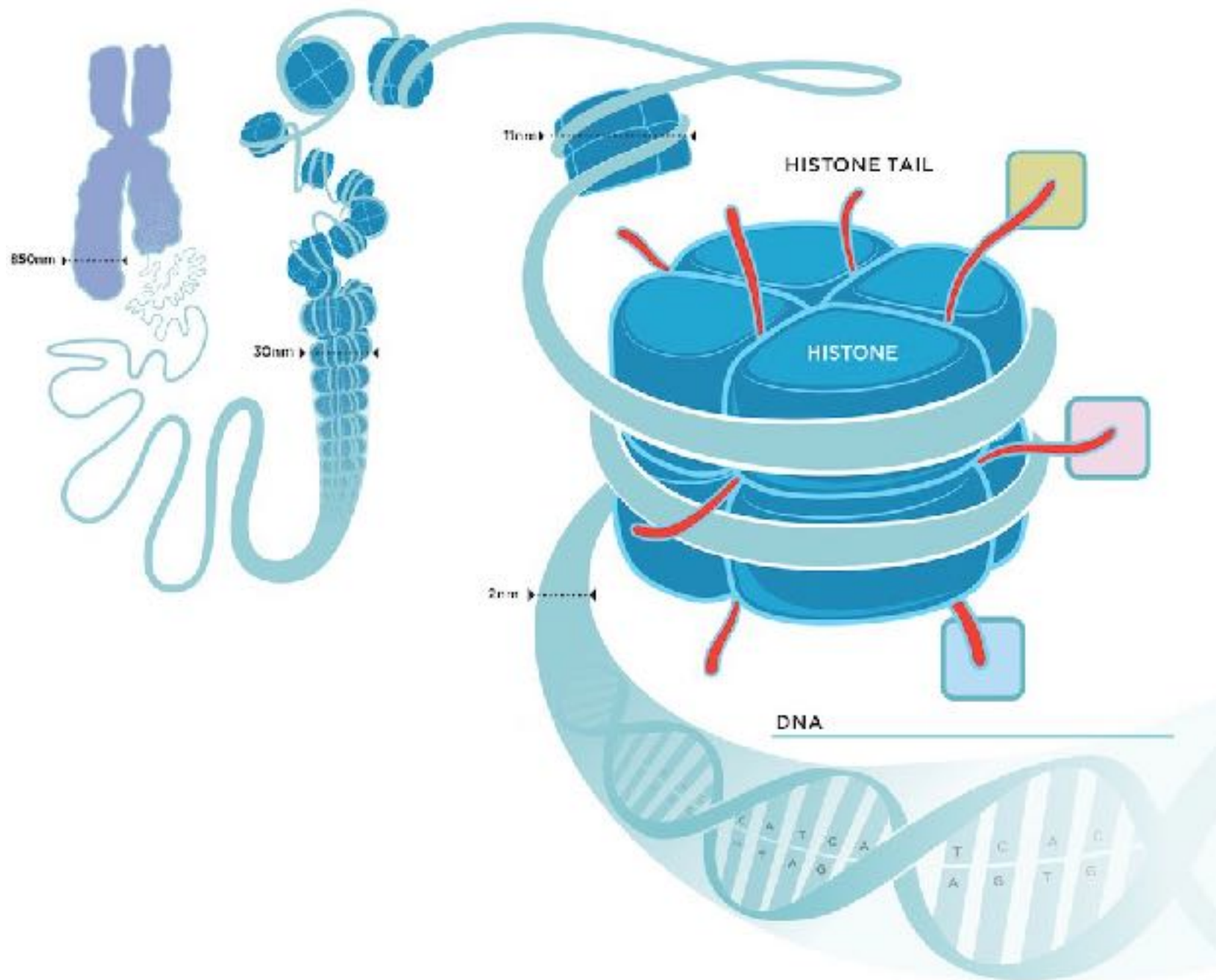
# Level V: Loop-extrusion as a driving force

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

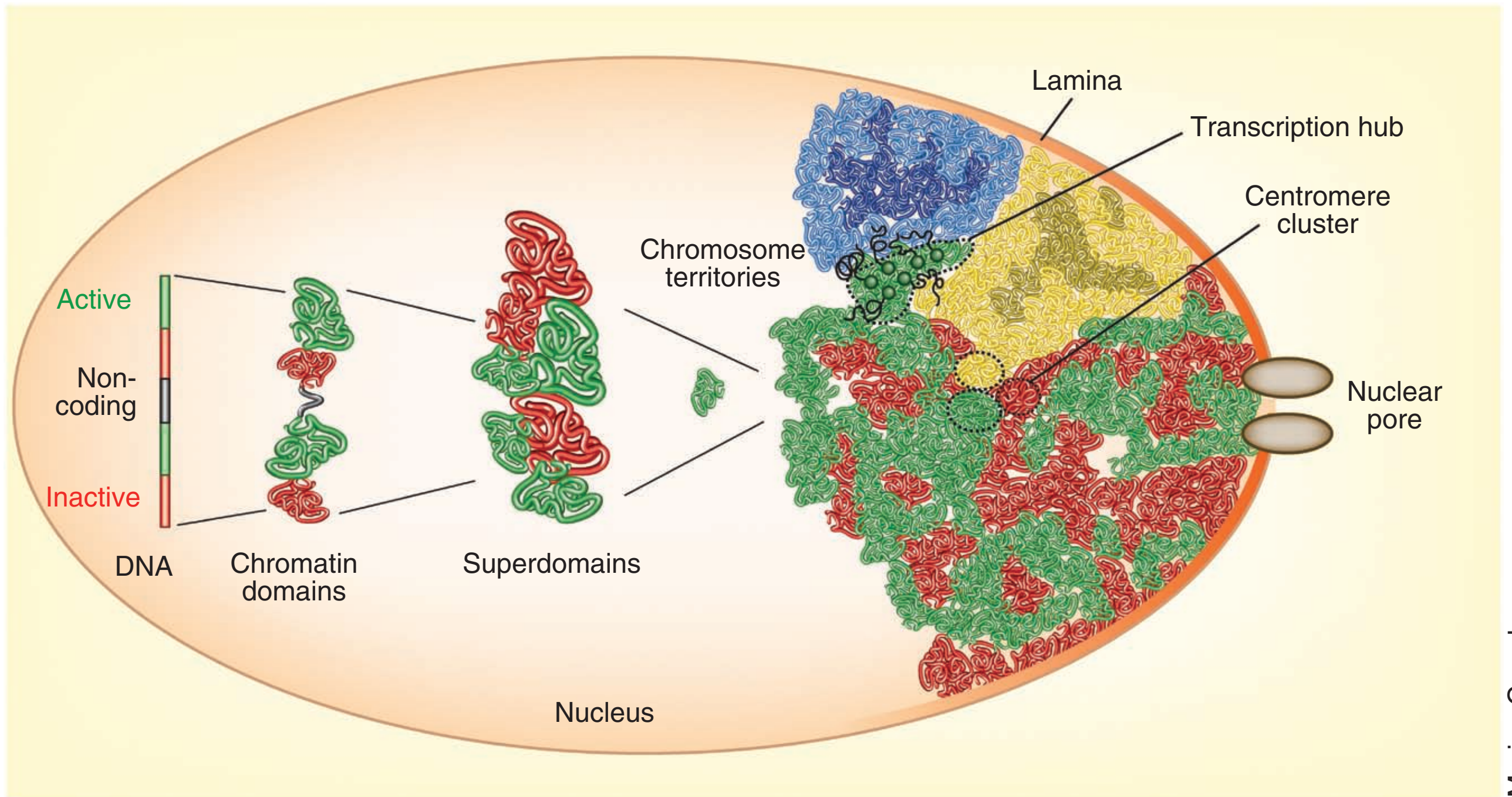


Adapted from Richard E. Ballermann, 2012



# Complex genome organization

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

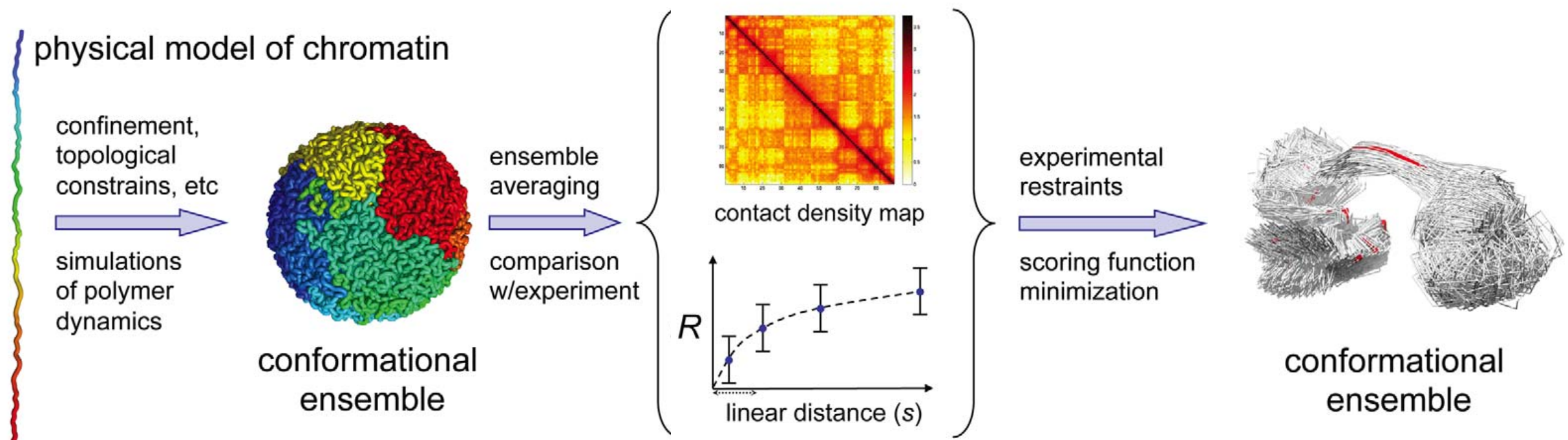


Marina Corral

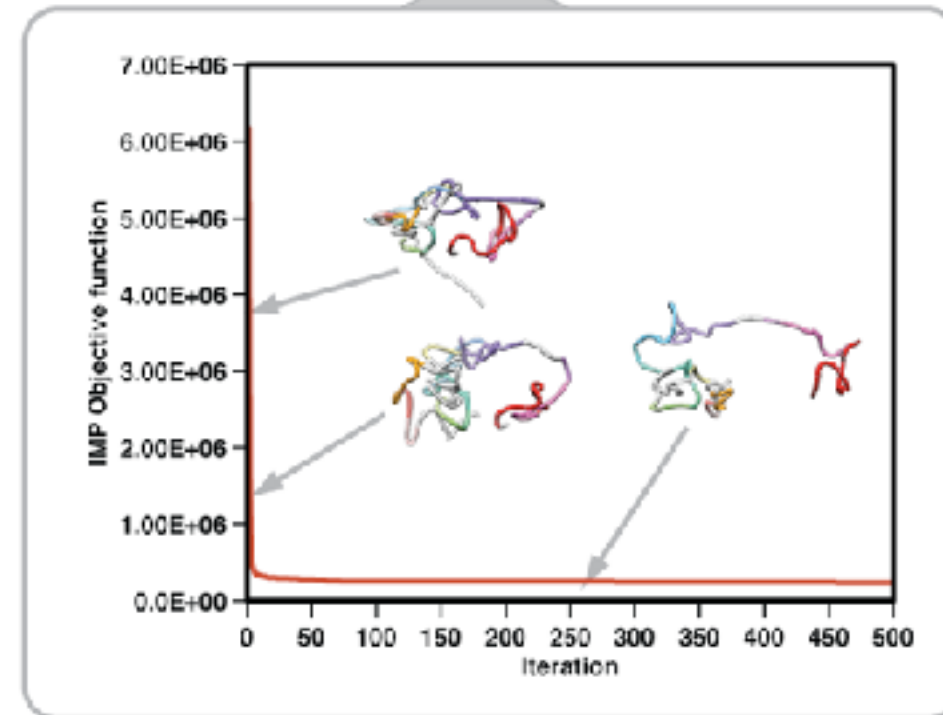
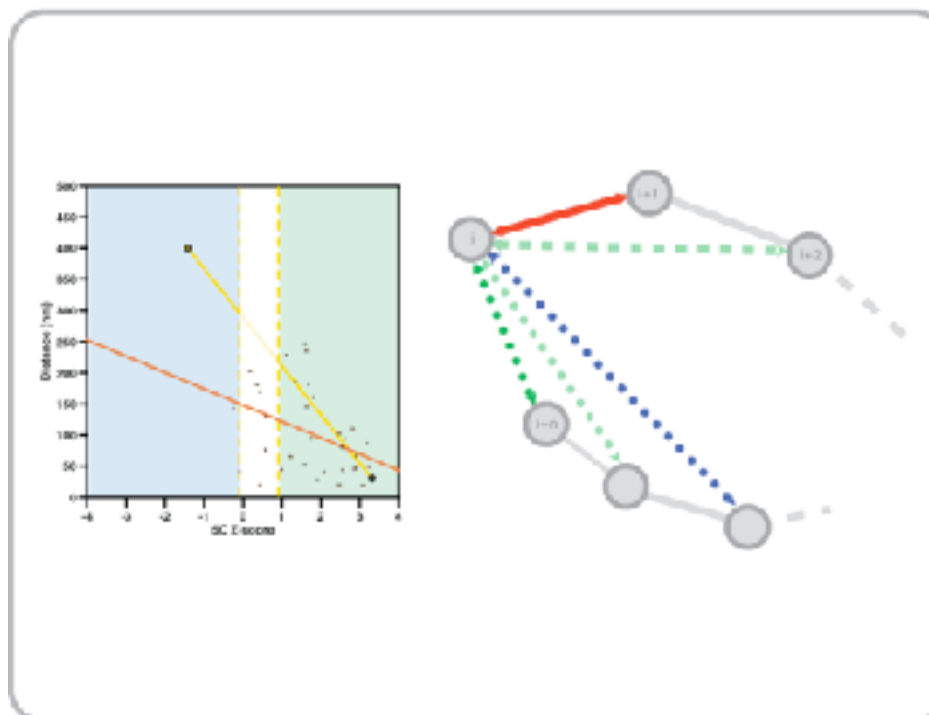
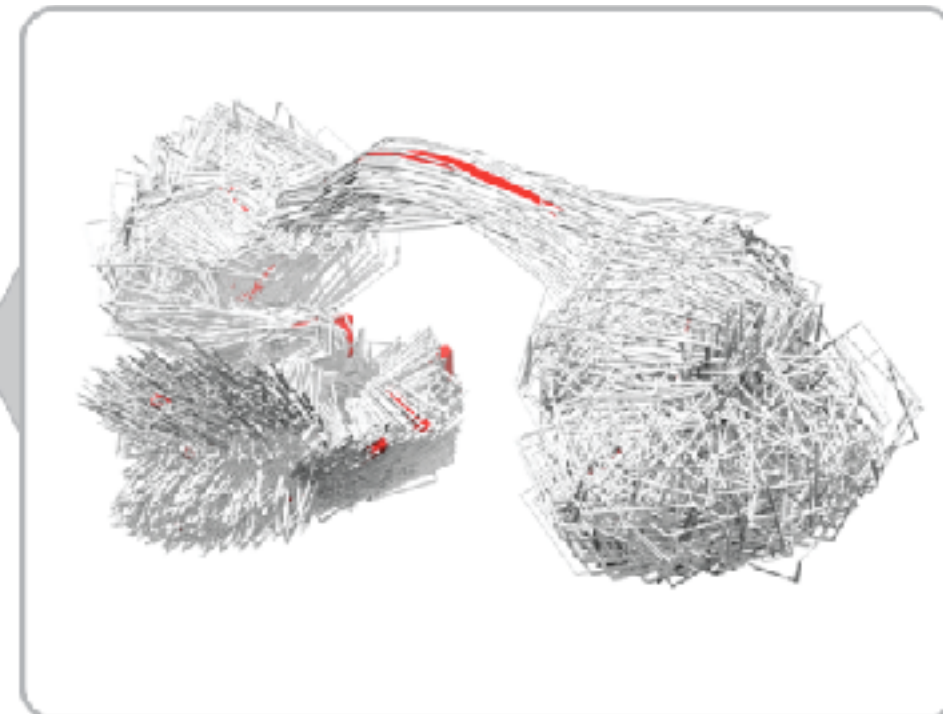
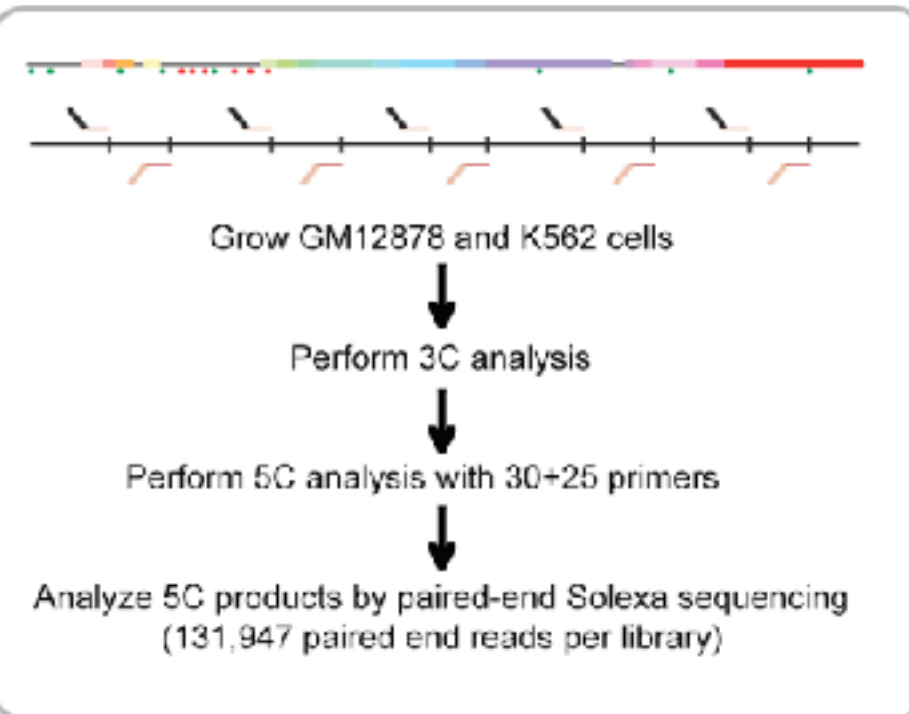


# Modeling Genomes

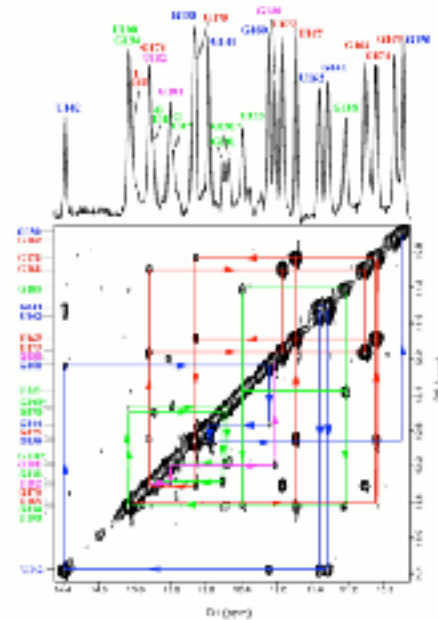
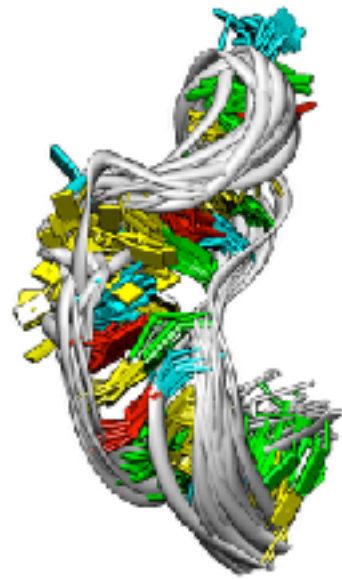
Marti-Renom, M. A. & Mirny, L. A. PLoS Comput Biol 7, e1002125 (2011)



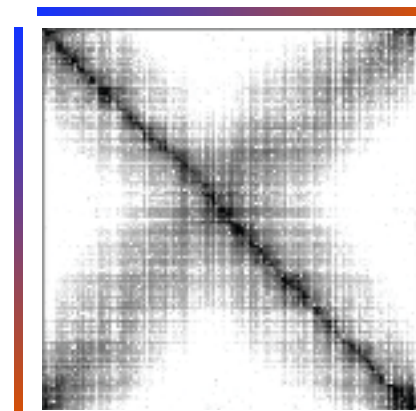
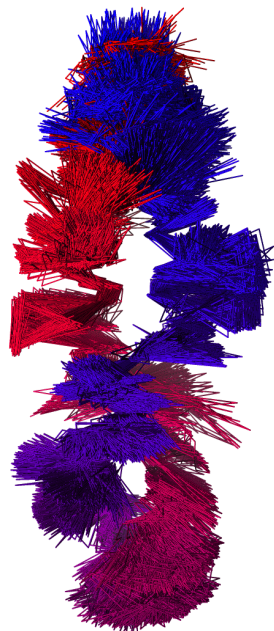
# Experiments



Computation



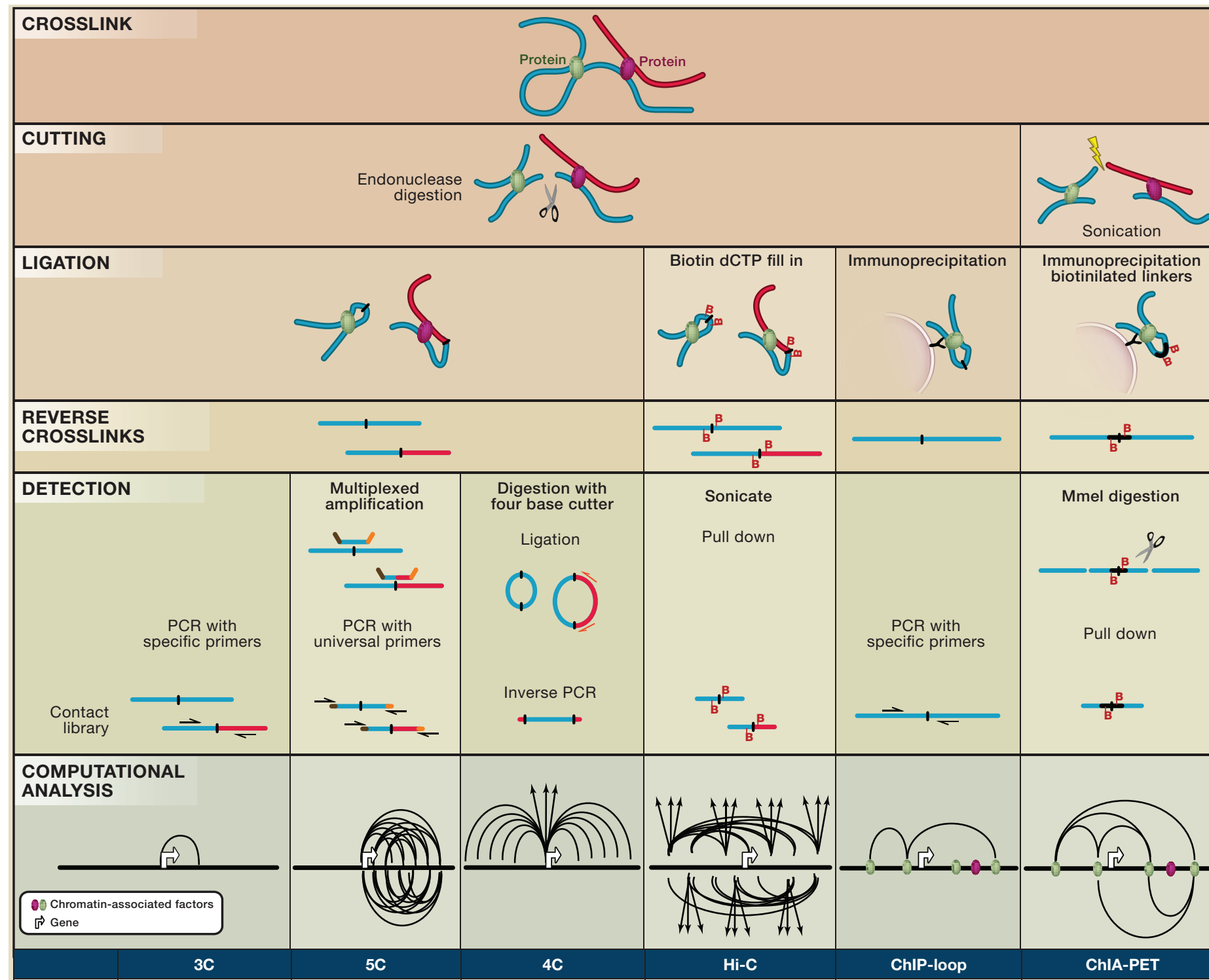
## Biomolecular structure determination 2D-NOESY data



## Chromosome structure determination 5C data



# Chromosome Conformation Capture



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

# Chromosome Conformation Capture

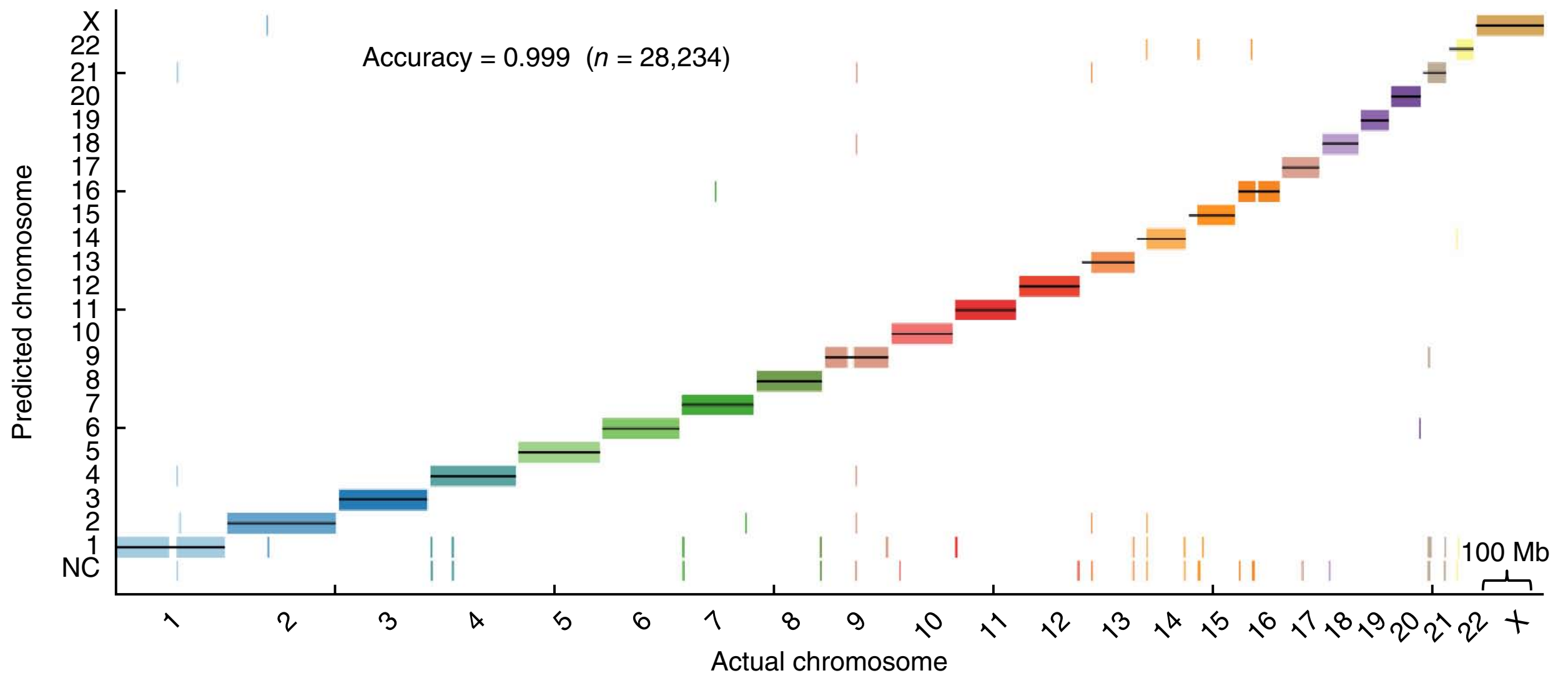
	3C	5C	4C	Hi-C	ChIP-loop	ChIA-PET
<b>Principle</b>	Contacts between two defined regions <sup>3,17</sup>	All against all <sup>4,18</sup>	All contacts with a point of interest <sup>14</sup>	All against all <sup>10</sup>	Contacts between two defined regions associated with a given protein <sup>8</sup>	All contacts associated with a given protein <sup>6</sup>
<b>Coverage</b>	Commonly < 1Mb	Commonly < 1Mb	Genome-wide	Genome-wide	Commonly < 1Mb	Genome-wide
<b>Detection</b>	Locus-specific PCR	HT-sequencing	HT-sequencing	HT-sequencing	Locus-specific qPCR	HT-sequencing
<b>Limitations</b>	Low throughput and coverage	Limited coverage	Limited to one viewpoint		Rely on one chromatin-associated factor, disregarding other contacts	
<b>Examples</b>	Determine interaction between a known promoter and enhancer	Determine comprehensively higher-order chromosome structure in a defined region	All genes and genomic elements associated with a known LCR	All intra- and interchromosomal associations	Determine the role of specific transcription factors in the interaction between a known promoter and enhancer	Map chromatin interaction network of a known transcription factor
<b>Derivatives</b>	PCR with TaqMan probes <sup>7</sup> or melting curve analysis <sup>1</sup>		Circular chromosome conformation capture <sup>20</sup> , open-ended chromosome conformation capture <sup>19</sup> , inverse 3C <sup>12</sup> , associated chromosome trap (ACT) <sup>11</sup> , affinity enrichment of bait-ligated junctions <sup>2</sup>	Yeast <sup>5,15</sup> , tethered conformation capture <sup>9</sup>		ChIA-PET combined 3C-ChIP-cloning (6C) <sup>16</sup> , enhanced 4C (e4C) <sup>13</sup>

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

... and one more thing

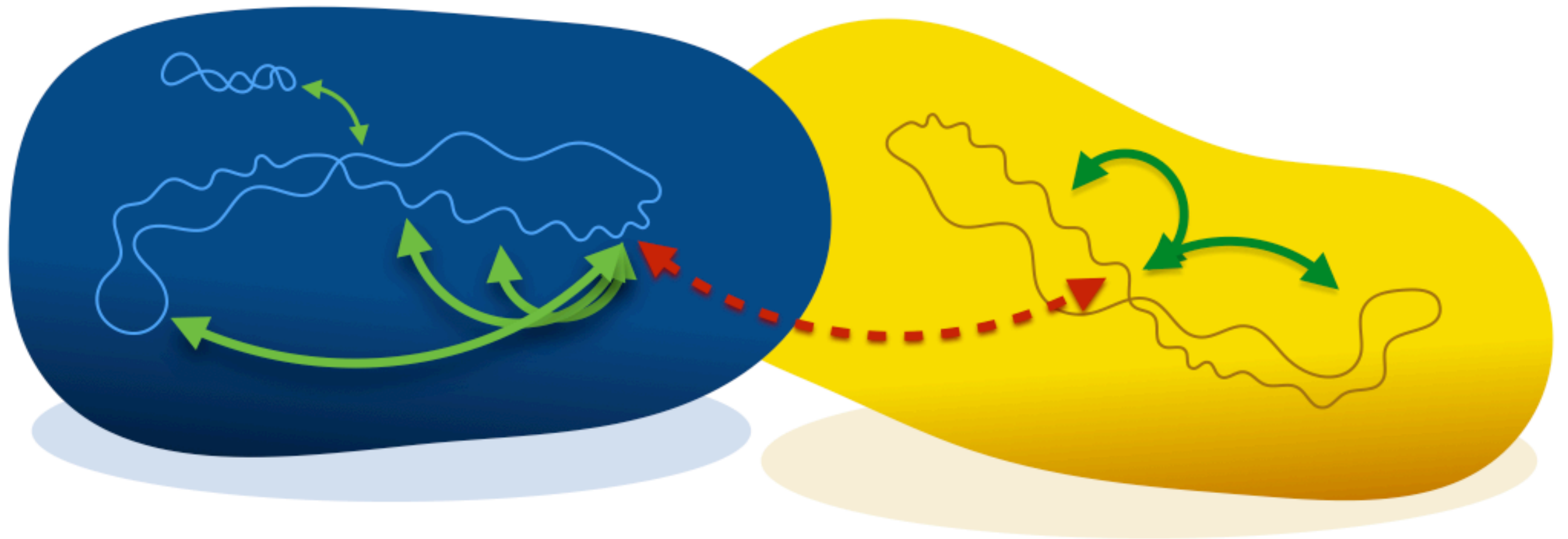


# Chromosome Conformation Capture for de-novo assembly



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

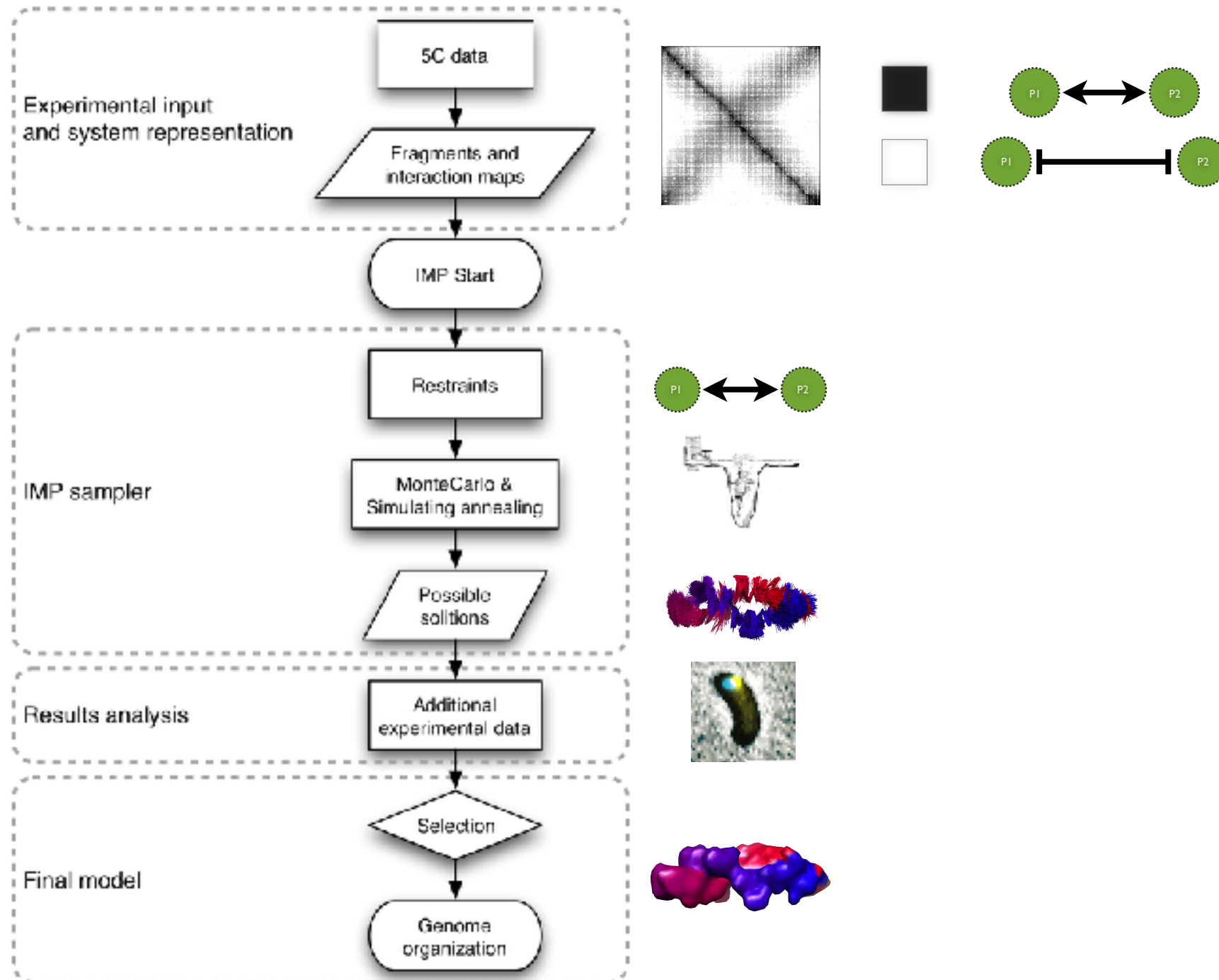
# Chromosome Conformation Capture for meta genomics



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

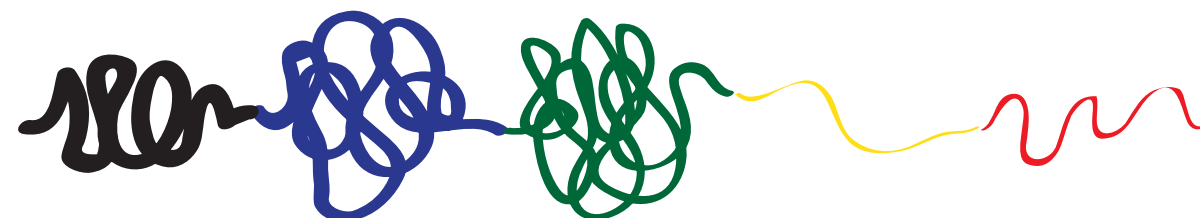
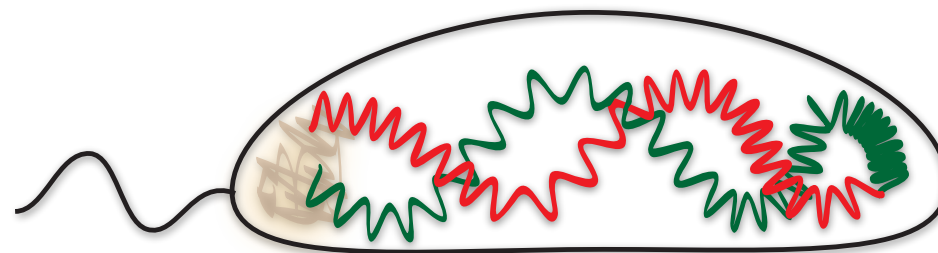
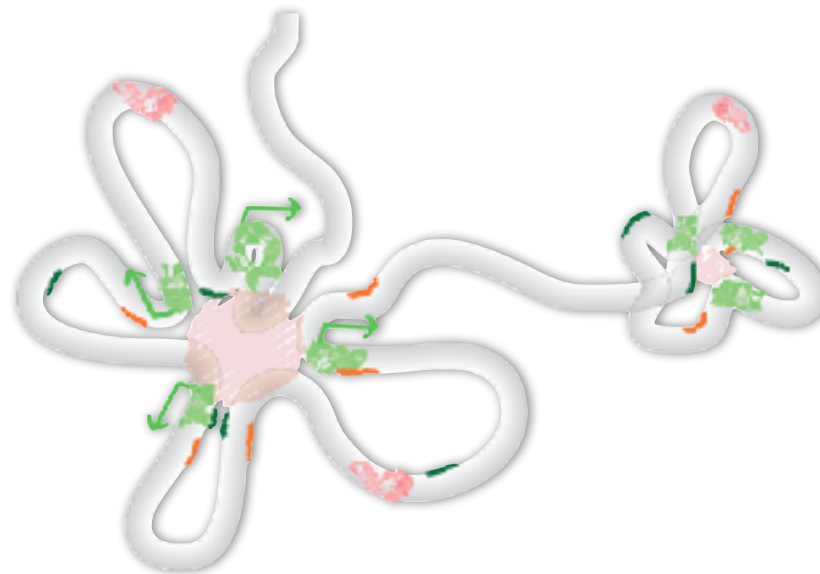
# Modeling 3D Genomes

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

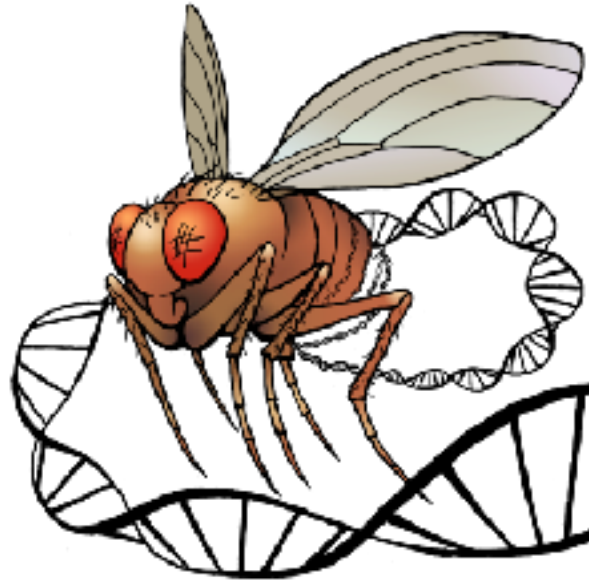




# Examples...

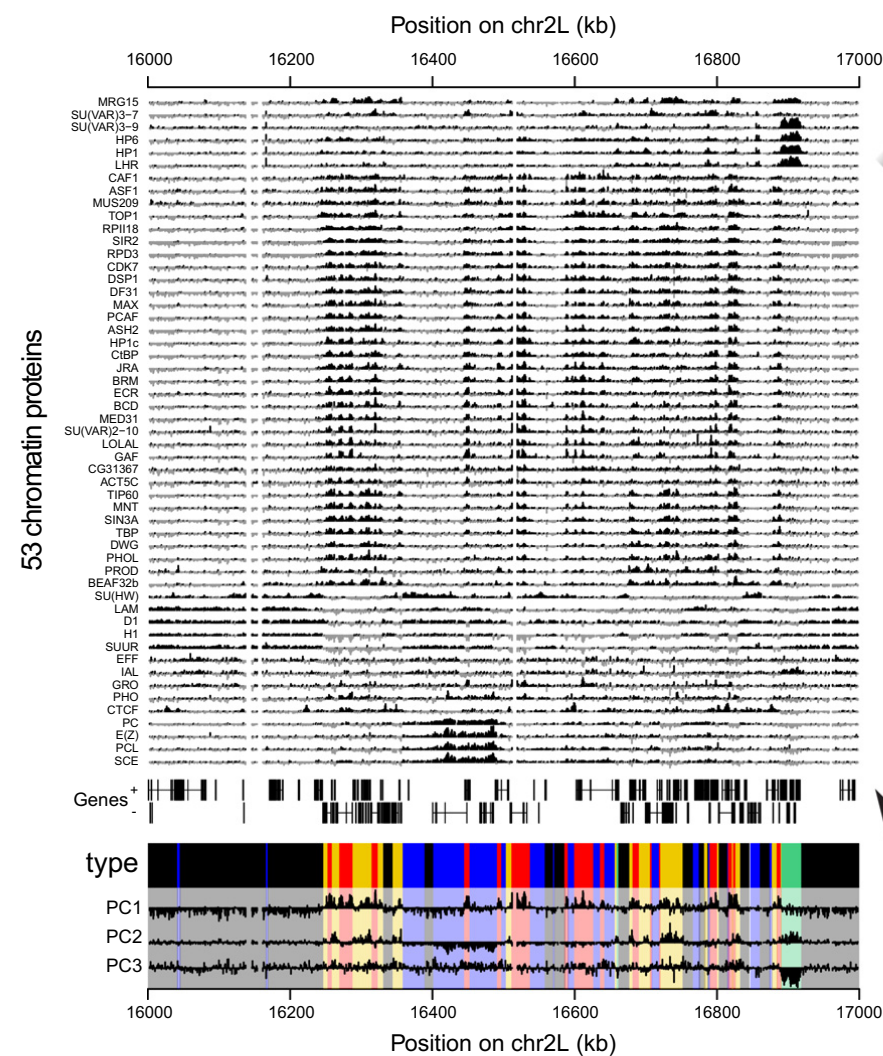
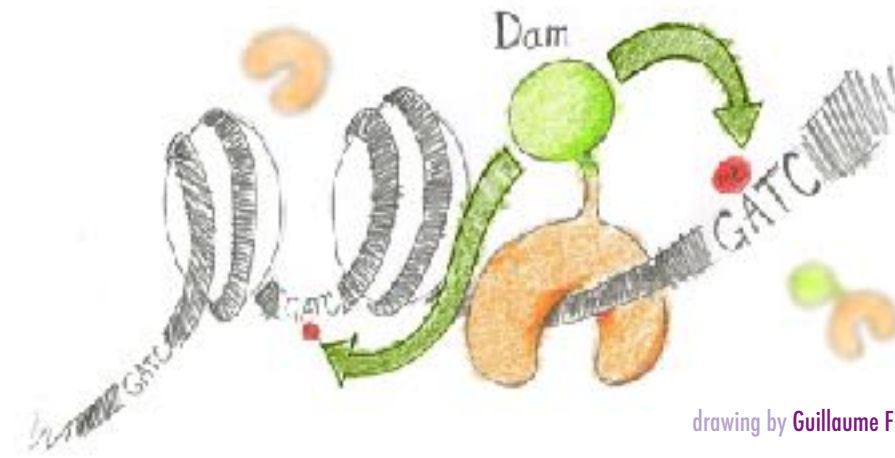


# Structuring the **COLORs** of chromatin

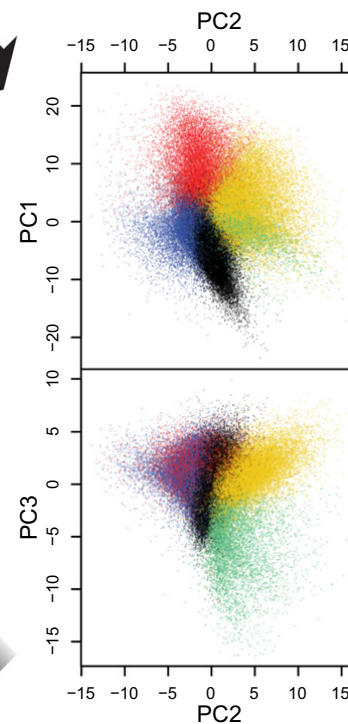


# Fly Chromatin **COLORs**

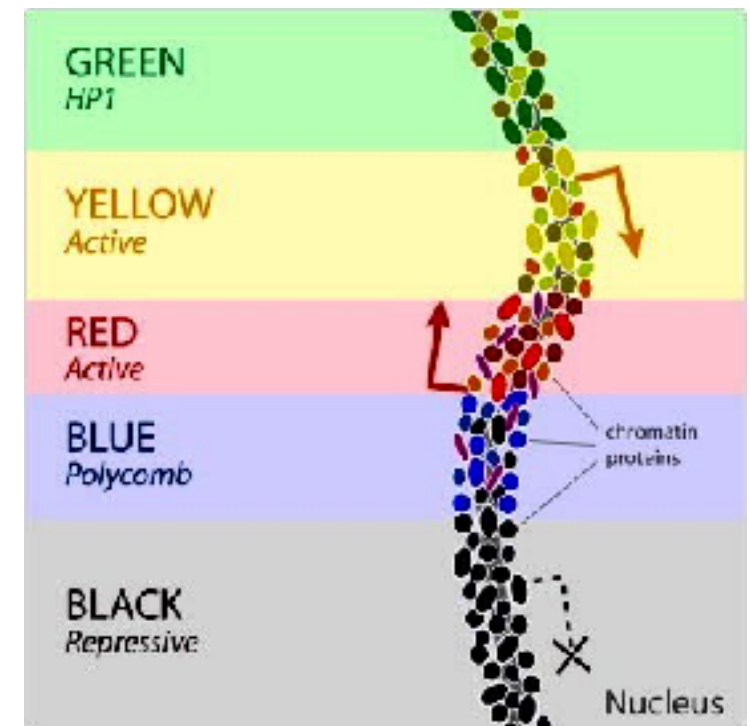
Filion et al. (2010). Cell, 143(2), 212–224.



Principal component analysis



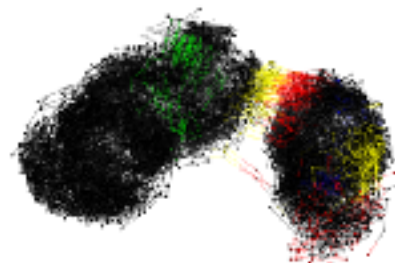
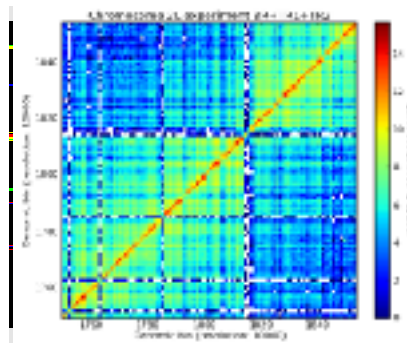
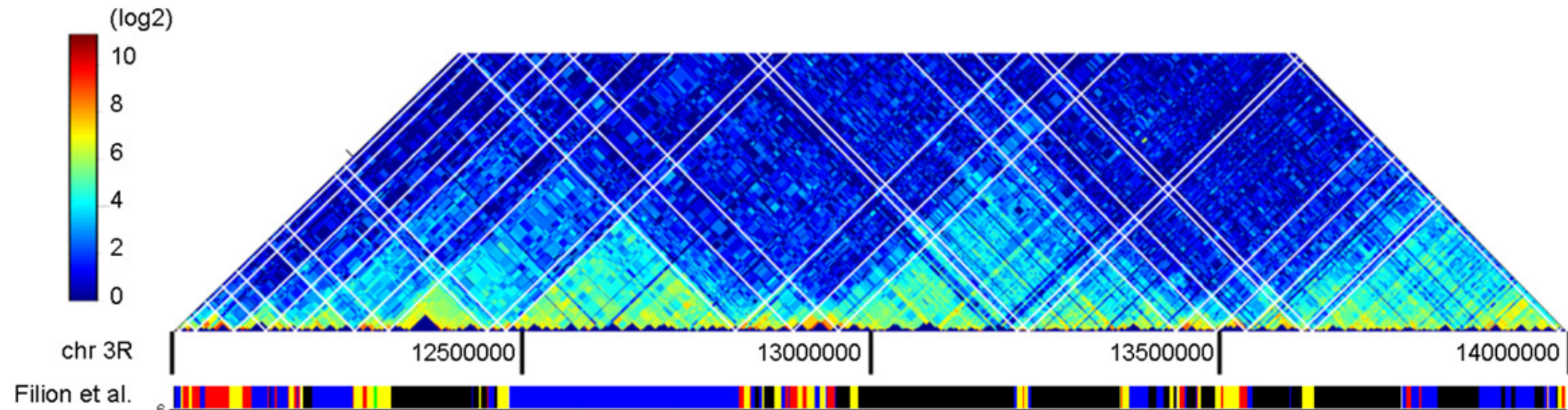
Hidden Markov model





# Fly Chromatin **COLORs**

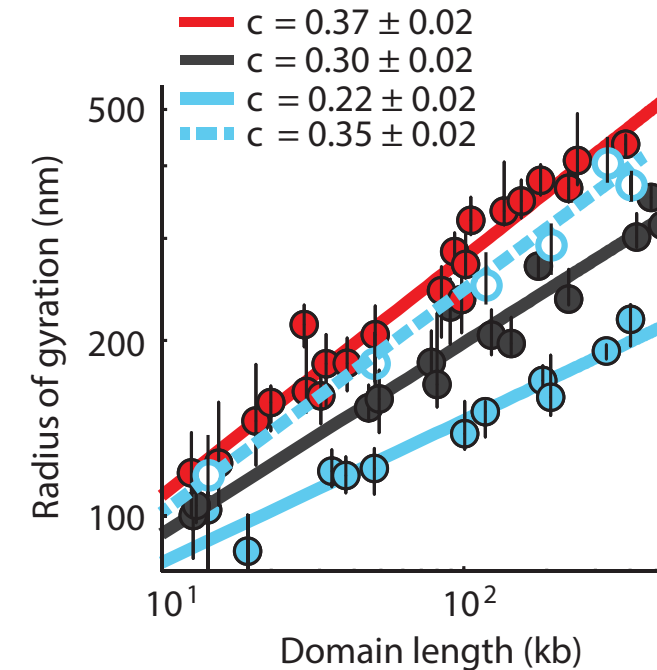
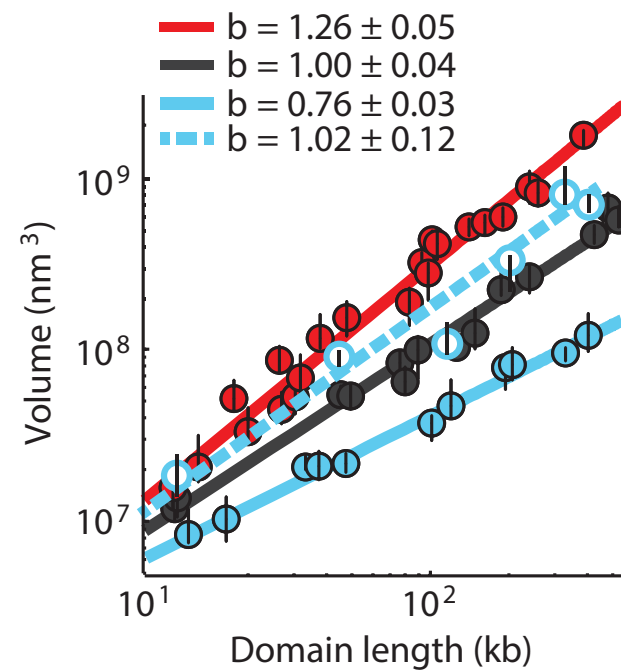
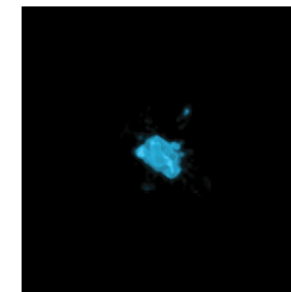
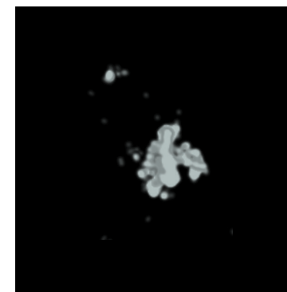
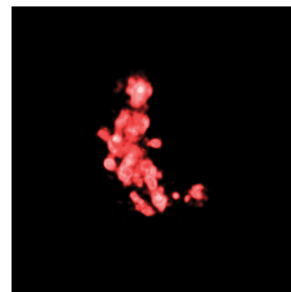
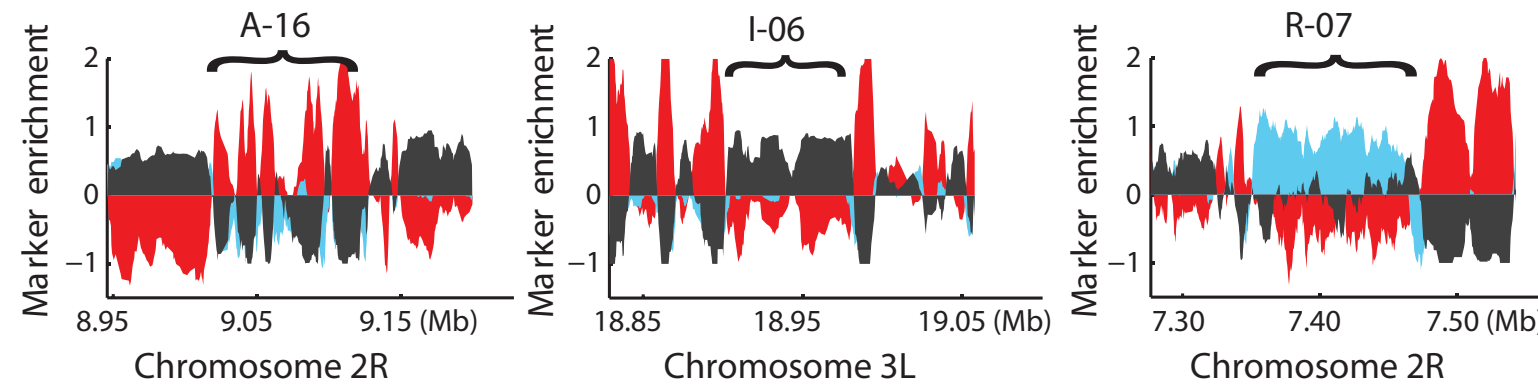
Hou et al. (2012). Molecular Cell, 48(3), 471–484.



50 ~1Mb regions  
10 for each color

# Model accuracy

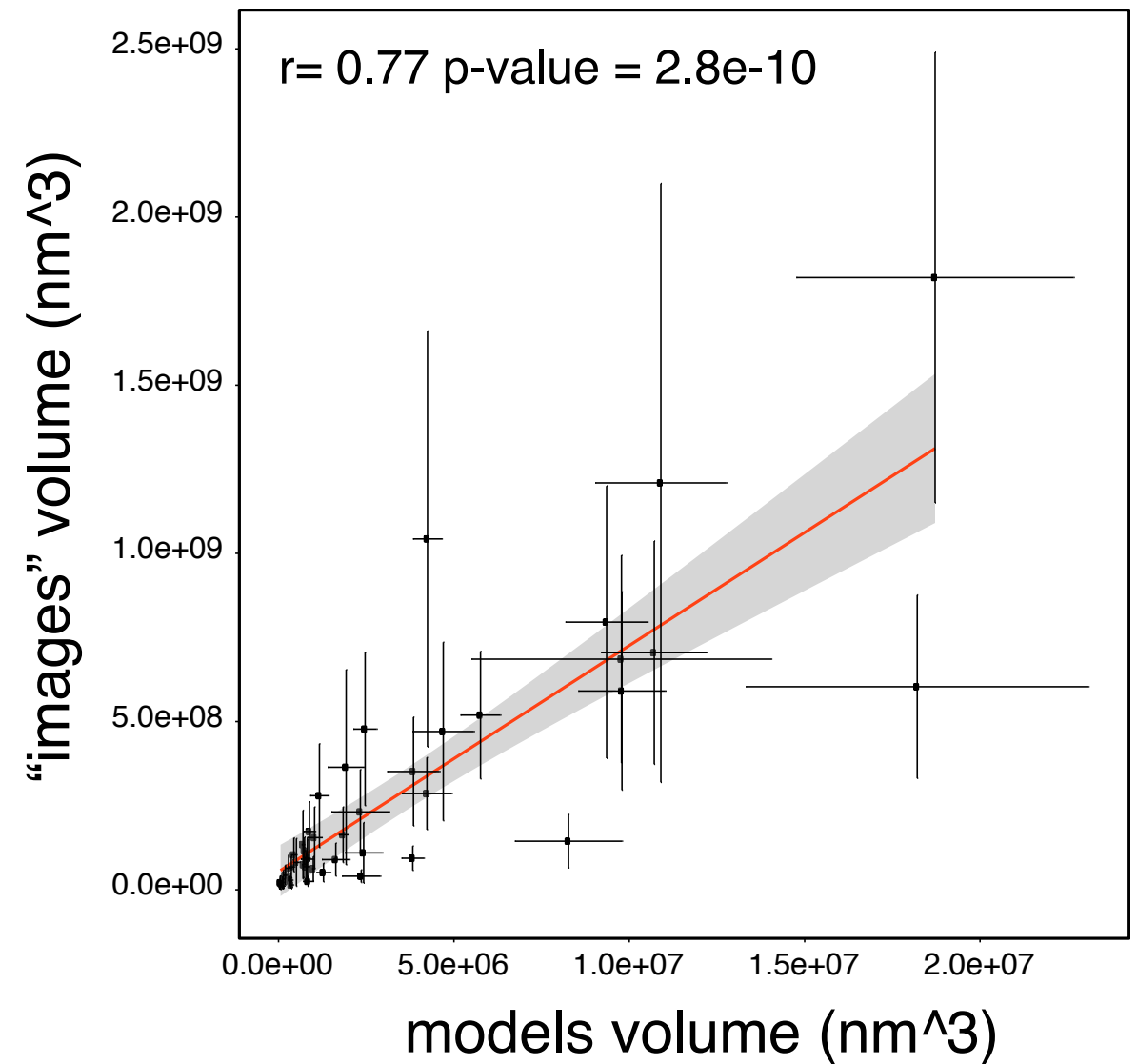
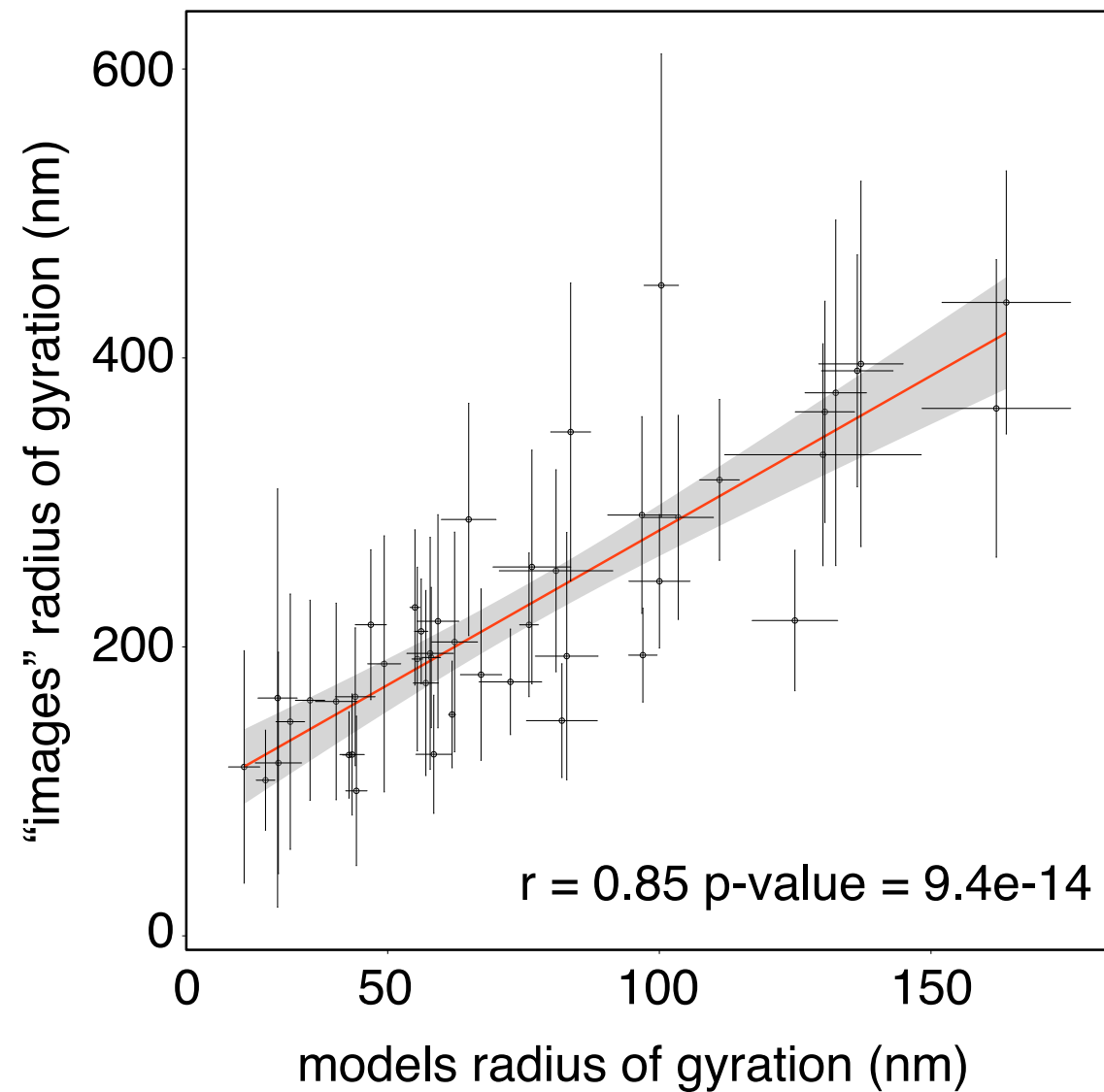
Boettiger, A. N., et al. (2016). Nature, 1–15.



● Active    ● Inactive    ● Repressed    ● Repressed (Ph KD)

# Model accuracy

Boettiger, A. N., et al. (2016). Nature, 1–15.





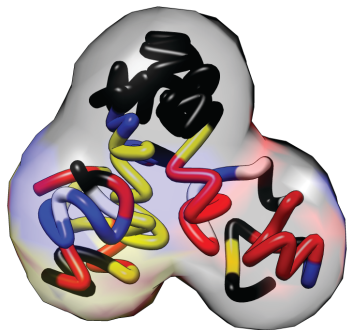
# Structural properties

50 1Mb regions. 10 enriched for each color.

RED dense region  
3R:18920000-19920000



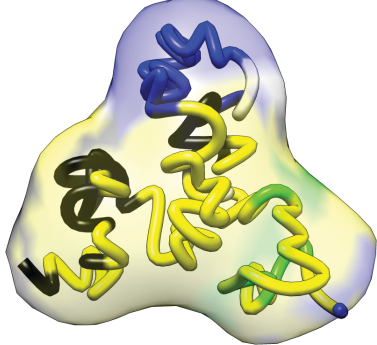
22% 17% 0% 11% 45% 6%



YELLOW dense region  
X:15590000-16600000



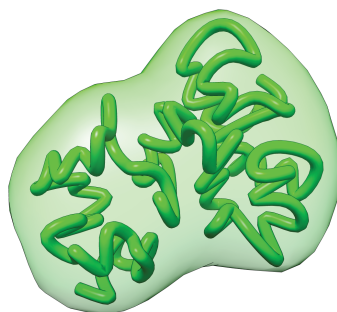
0% 48% 4% 20% 26% 3%



GREEN dense region  
2R:510000-1530000



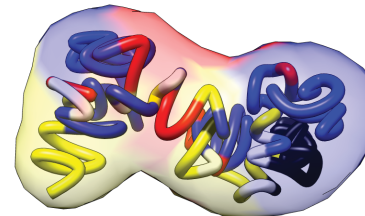
0% 0% 100% 0% 0% 0%



BLUE dense region  
3L:210000-1230000



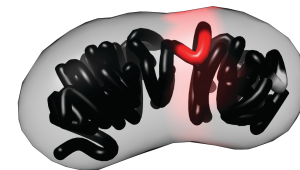
11% 17% 0% 52% 13% 0%



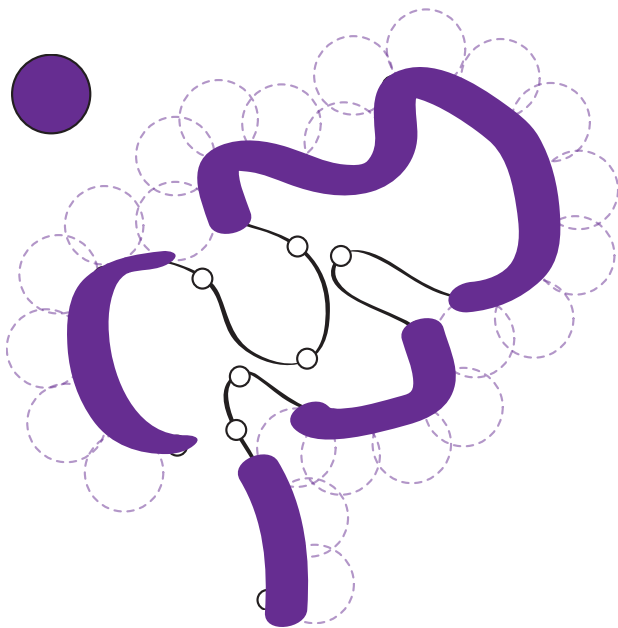
BLACK dense region  
2L:17500000-18530000



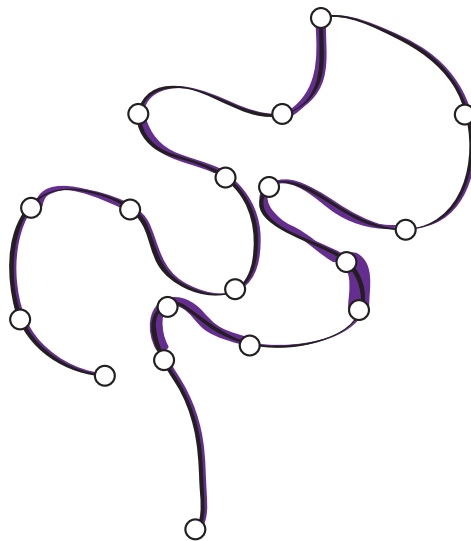
1% 0% 0% 0% 98% 1%



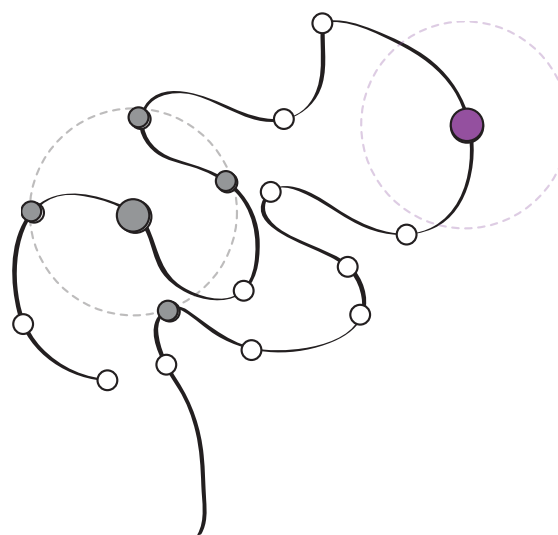
Accessibility (%)



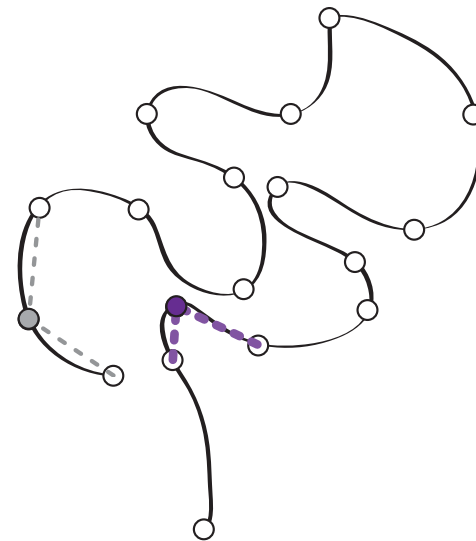
Density (bp/nm)



Interactions



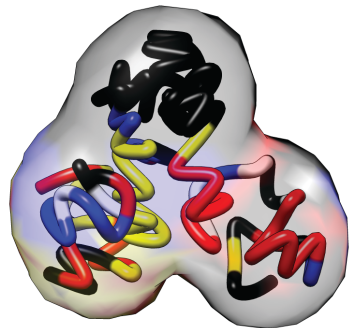
Angle



# Structural **COLORs**

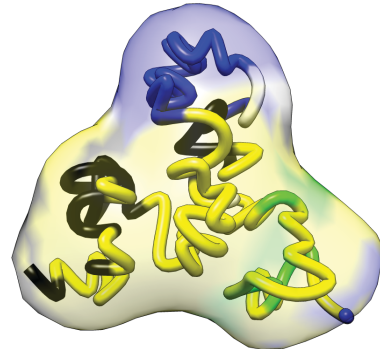
**RED dense region**  
3R:18920000-19920000

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



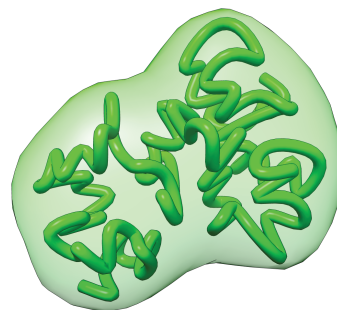
**YELLOW dense region**  
X:15590000-16600000

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



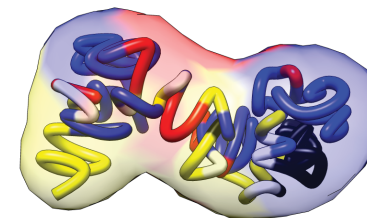
**GREEN dense region**  
2R:510000-1530000

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



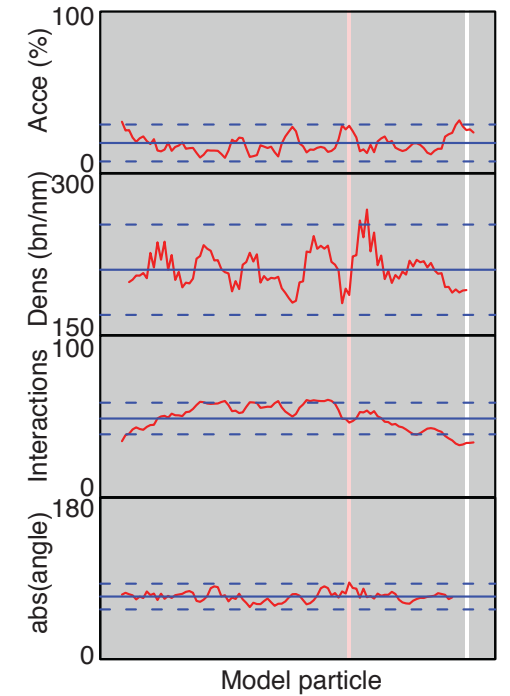
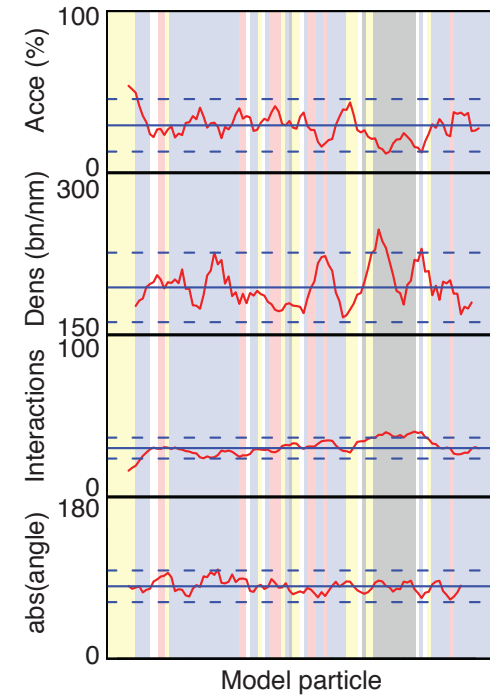
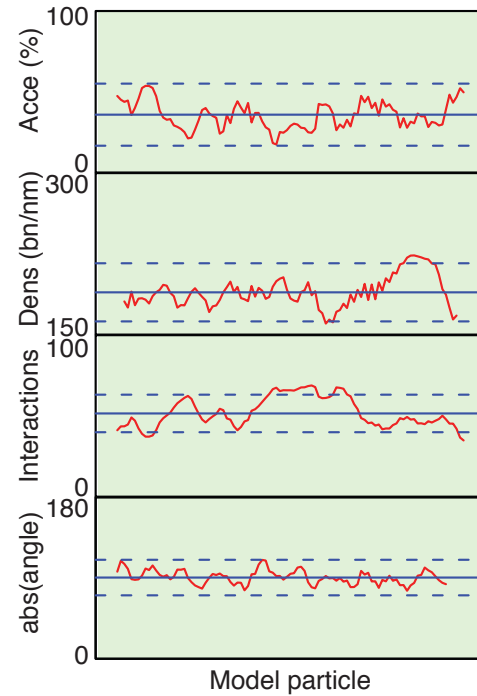
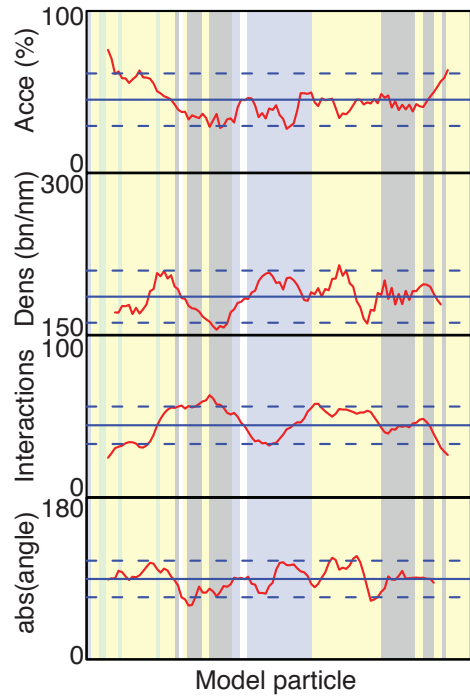
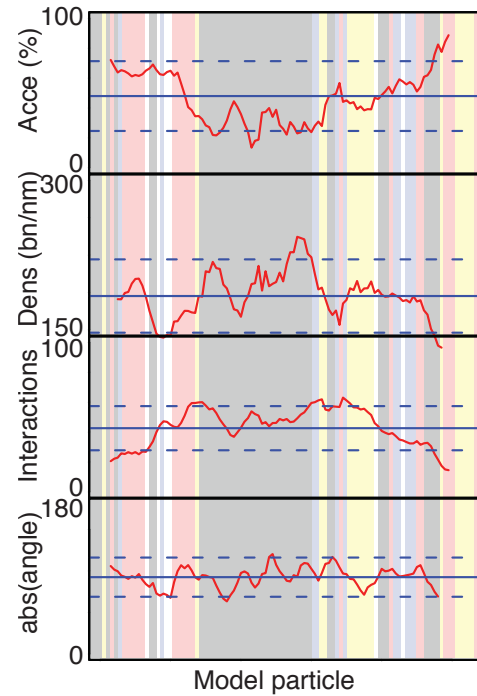
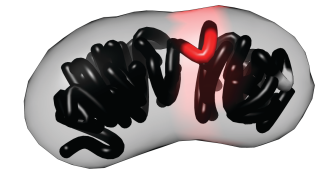
**BLUE dense region**  
3L:210000-1230000

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

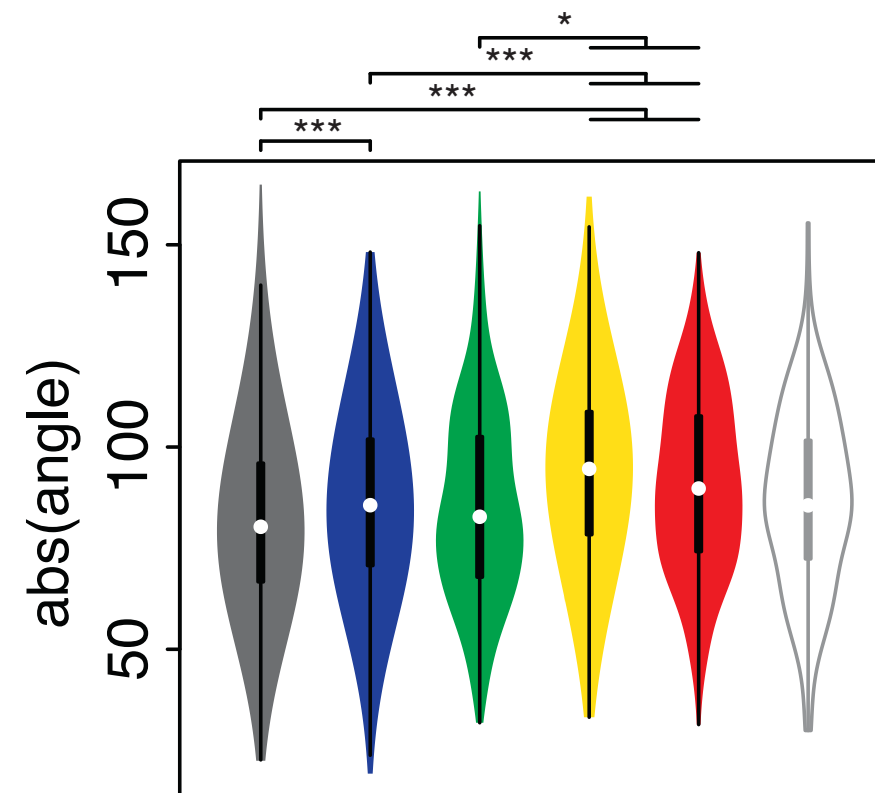
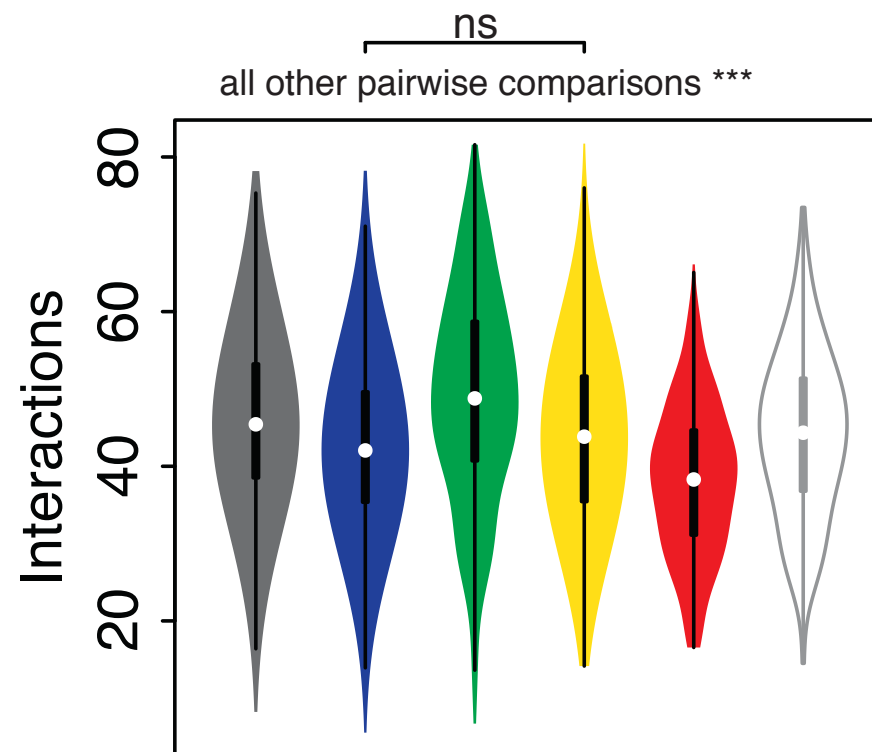
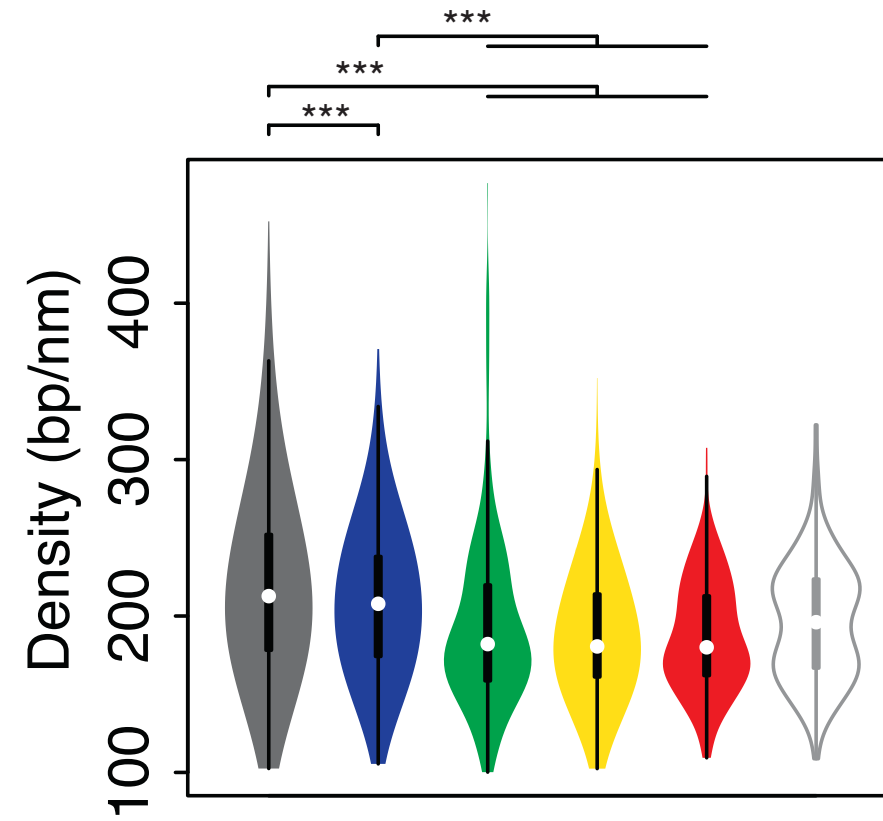
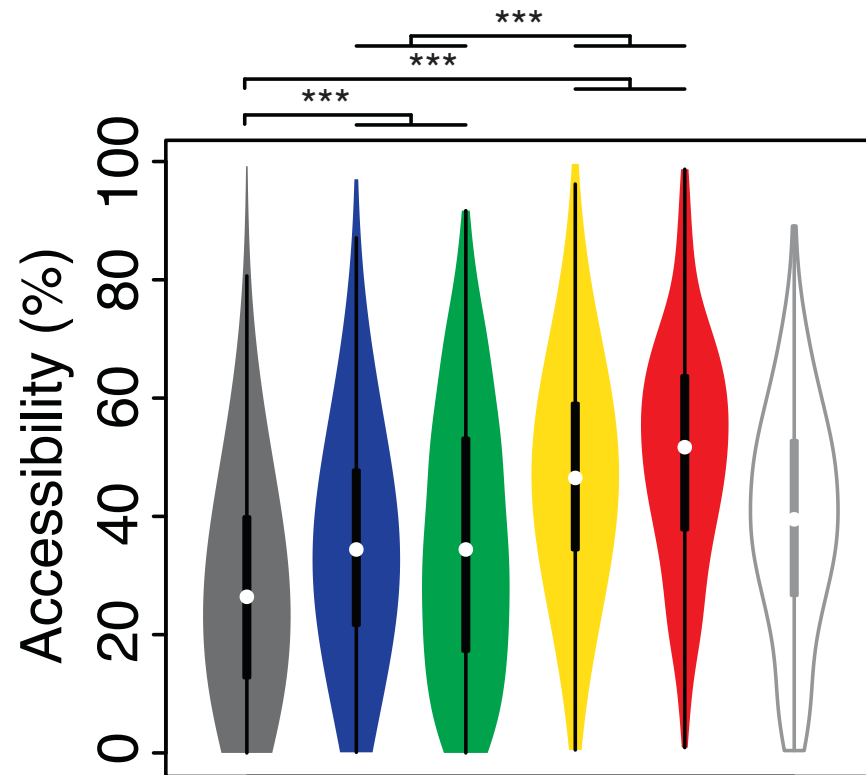


**BLACK dense region**  
2L:17500000-18530000

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



# Structural **COLORs**



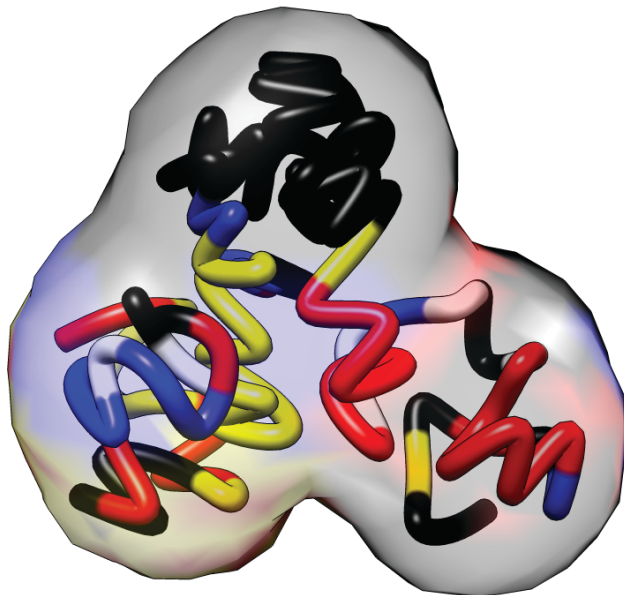
# Color prediction by Self Organizing Maps

RED dense region

3R:18920000-19920000



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

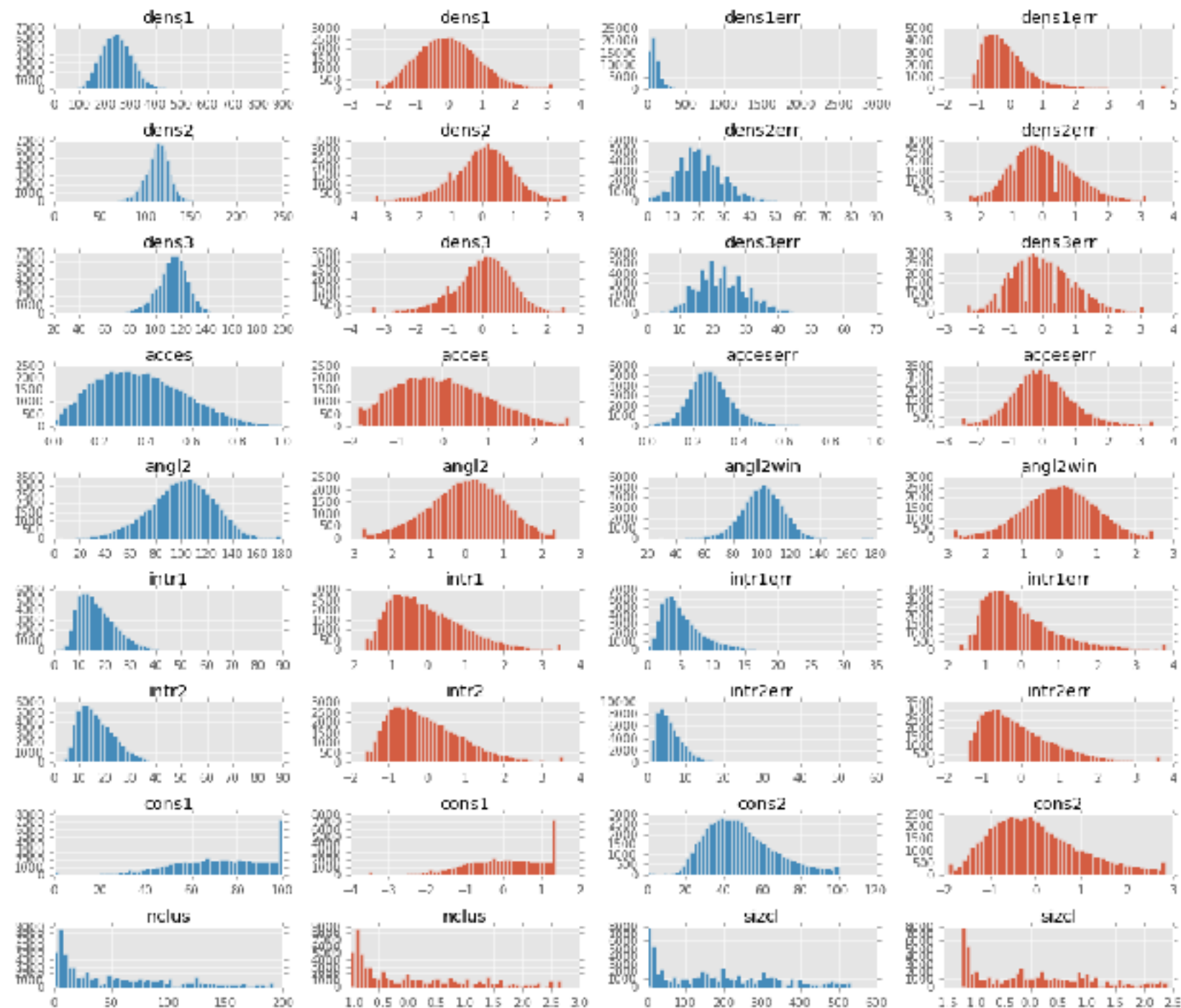


	GainRatio	PCA
interactions all 40 nm	0.25	-0.40
interactions cluster1 40 nm	0.24	-0.40
accessibility radius 20 nm superradius 75 nm	0.18	0.35
stderr of intr2	0.19	-0.34
number of models in cluster 1	0.35	-0.00
stderr of intr1	0.16	-0.34
number of clusters	0.26	-0.02
stderr of dens3	0.13	-0.33
stderr of dens1	0.11	-0.27
unsigned angle with -3 and +3 smoothed over 5 bins	0.10	0.13
density 3 particles (center of mass) cluster 1	0.07	-0.11
stderr of dens2	0.09	-0.31
density 3 particles cluster 1	0.05	0.00
density 3 particles all clusters	0.06	0.00
consistency all 50 nm	0.03	-0.02
unsigned angle with -3 and +3	0.03	0.09
consistency cluster1 50 nm	0.03	0.05
stderr of acces	0.02	0.04

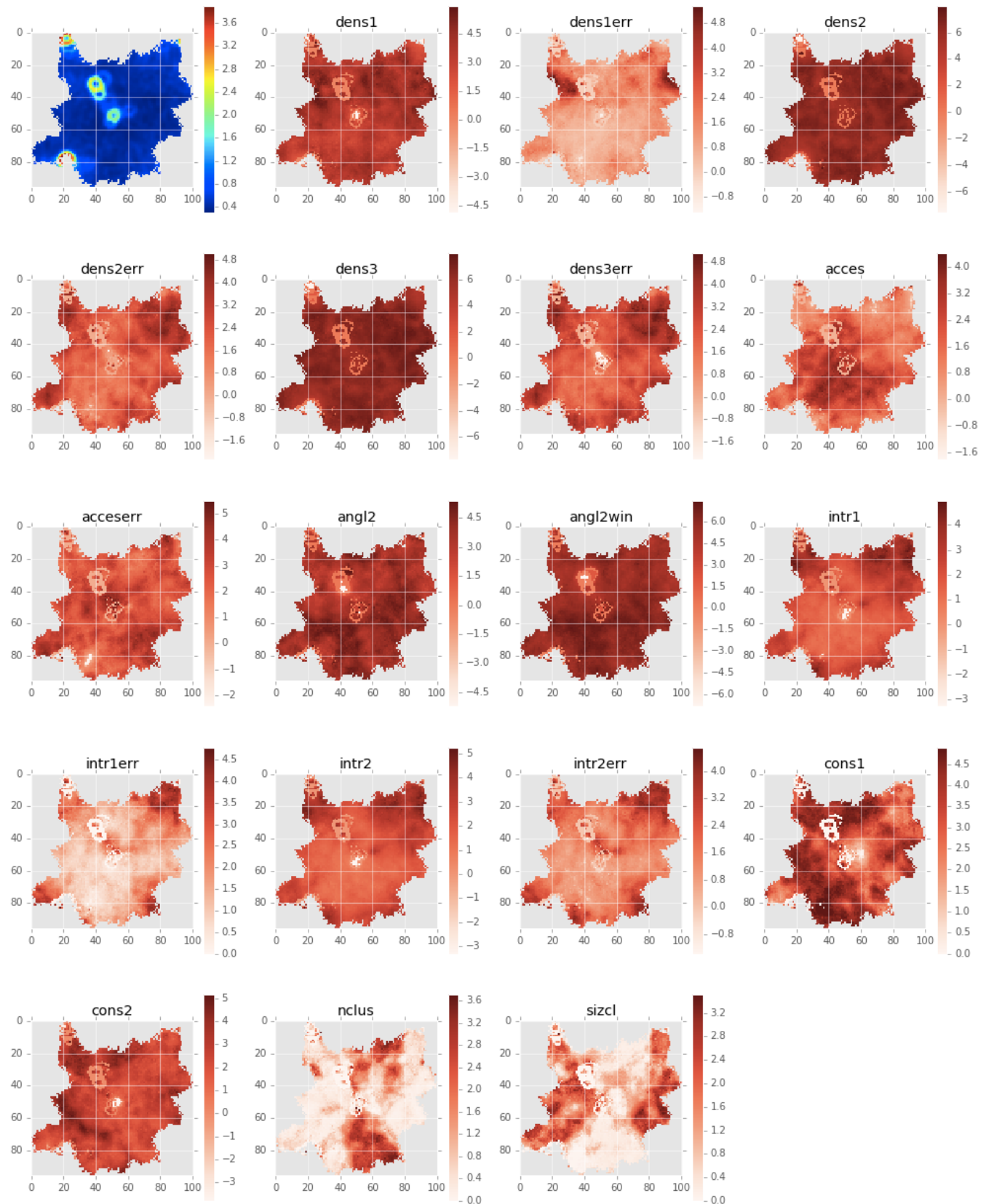
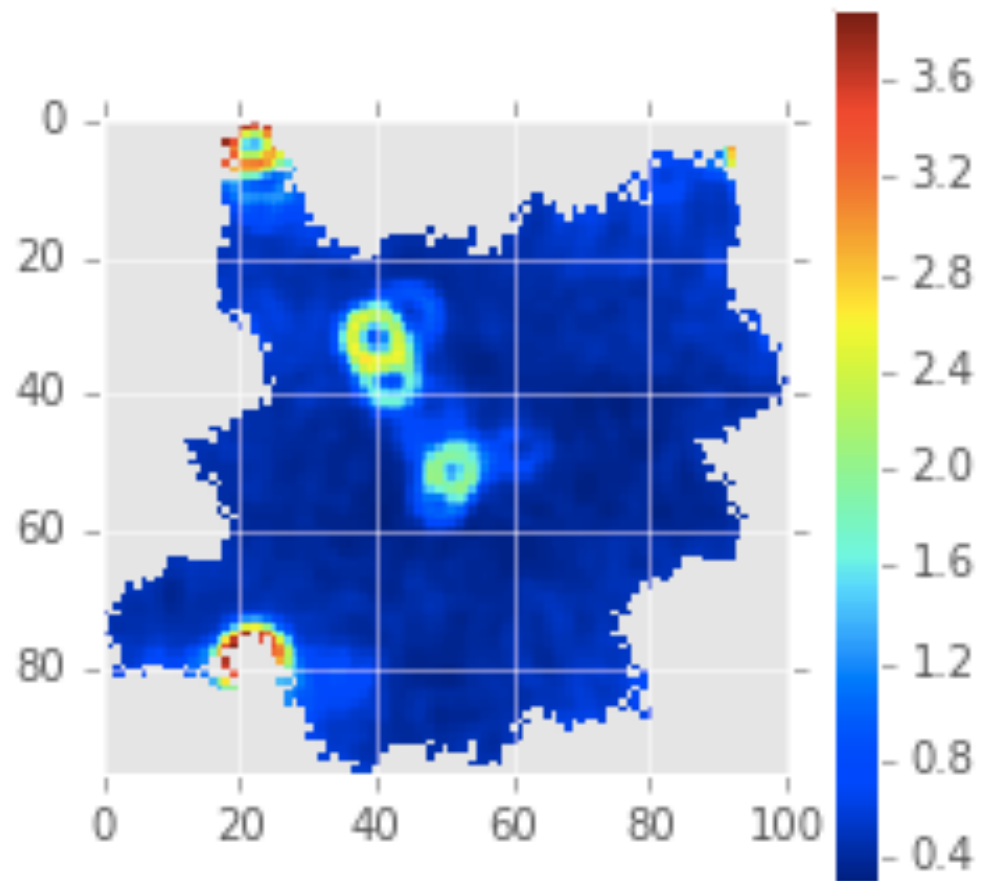


# Selected metrics per particle

- extract the **18 metrics for each particle** (if particle is present in several models, an average is calculated)
- the **metrics are normalized** (mean=0, std=1), and **outliers removed** (percentile 0.5 and 99.5)
- each of the particles are going to be arranged in the SOM according to their relative **euclidian distance**
- SOM is run with 100.000 iterations

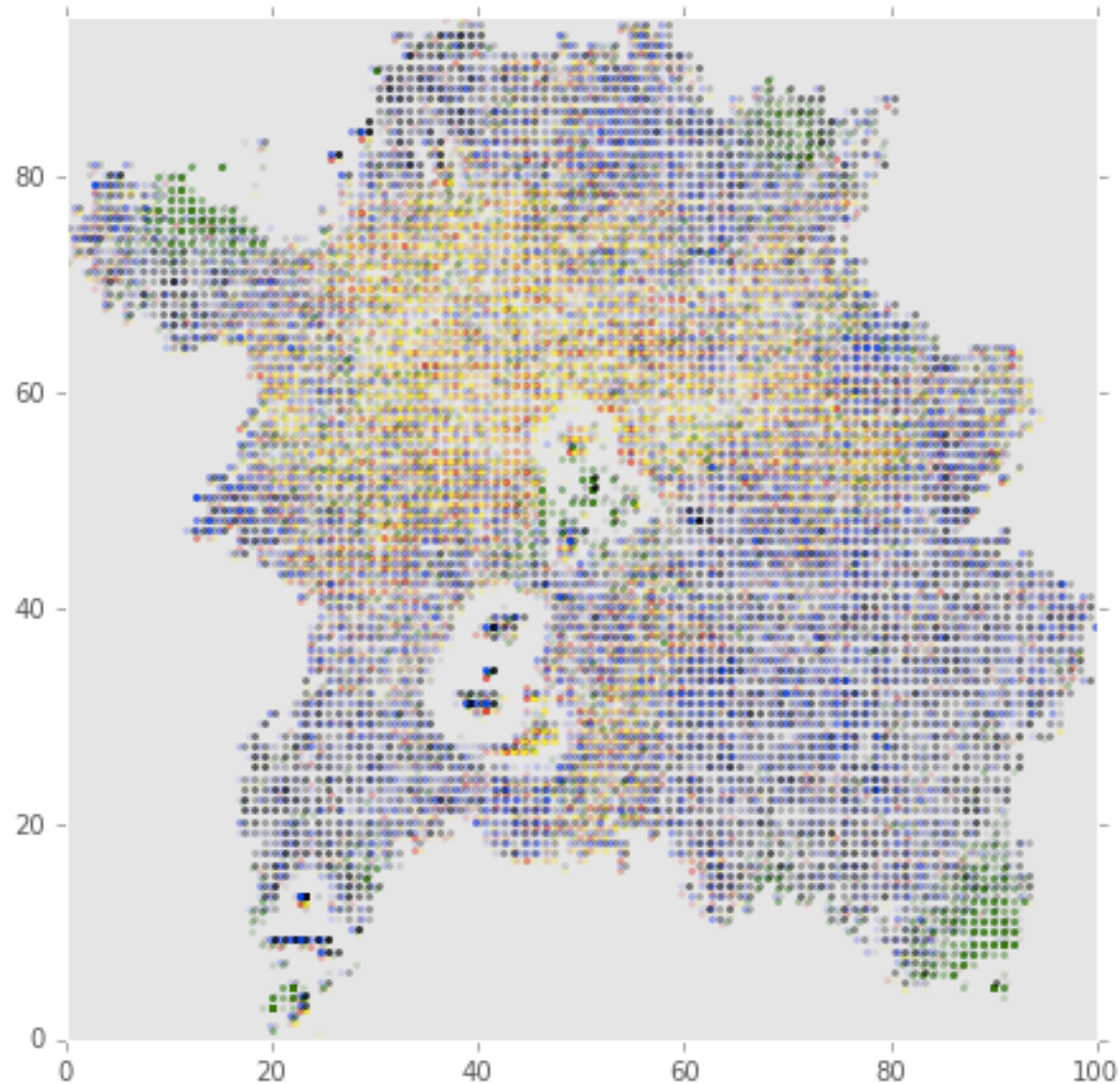


# Self Organizing Maps (SOM)

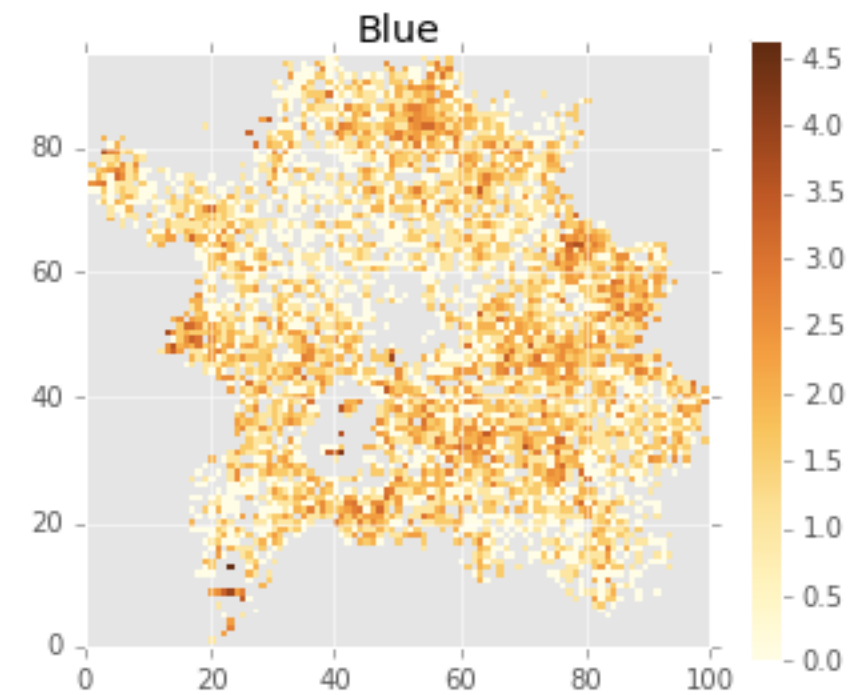
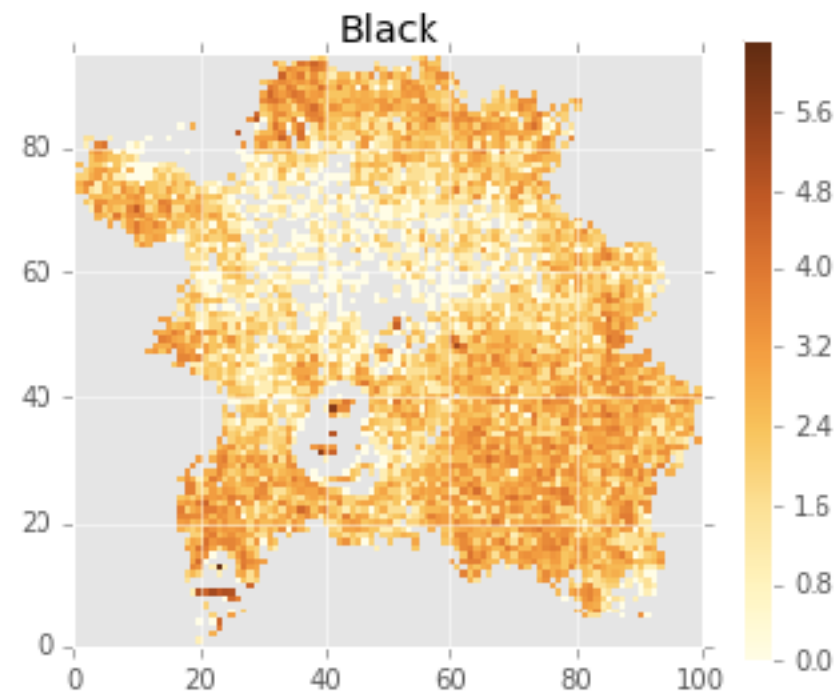
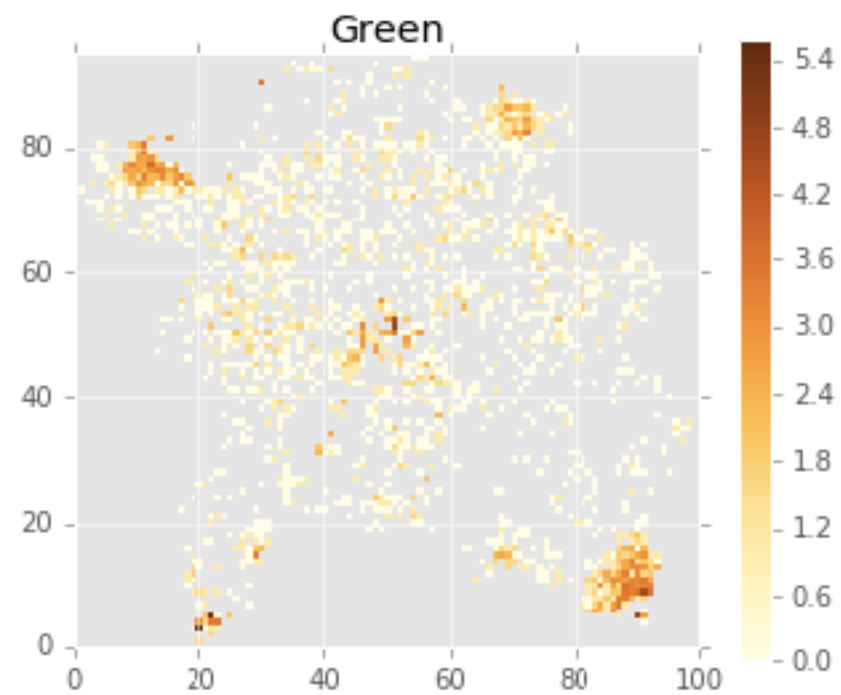
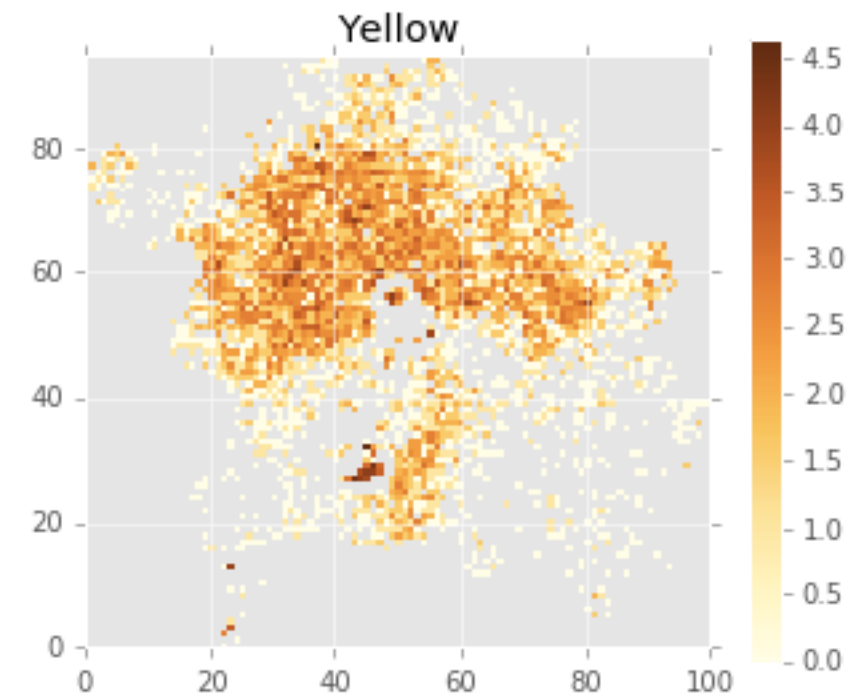
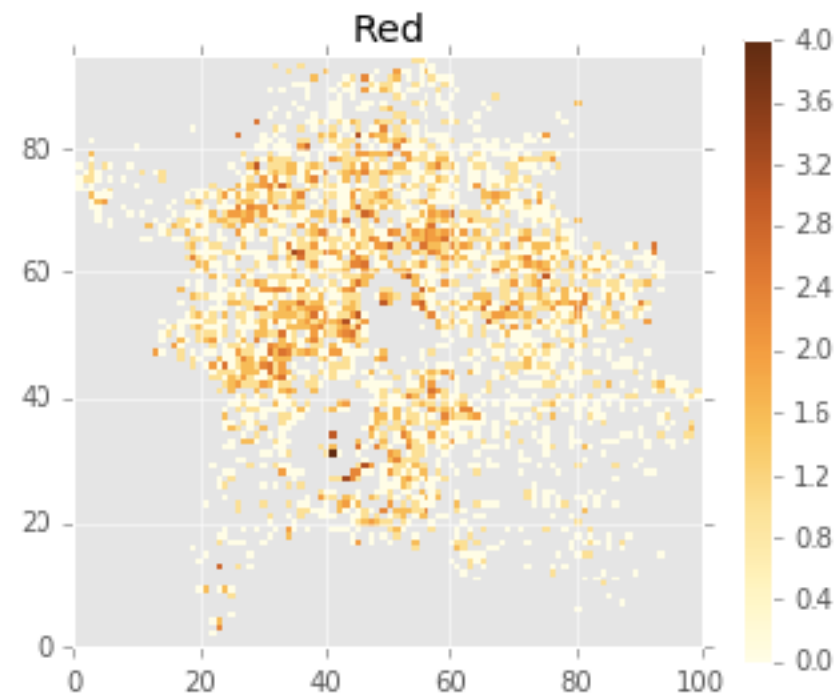
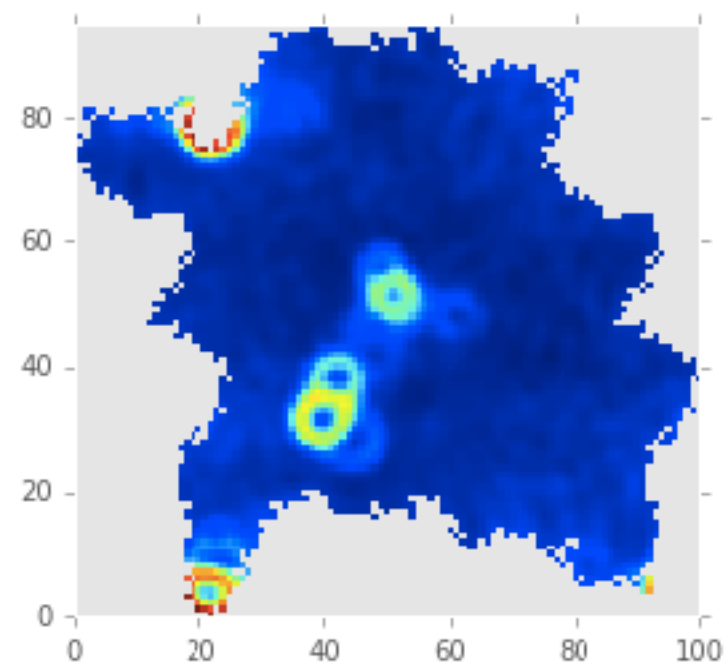




# SOM Models

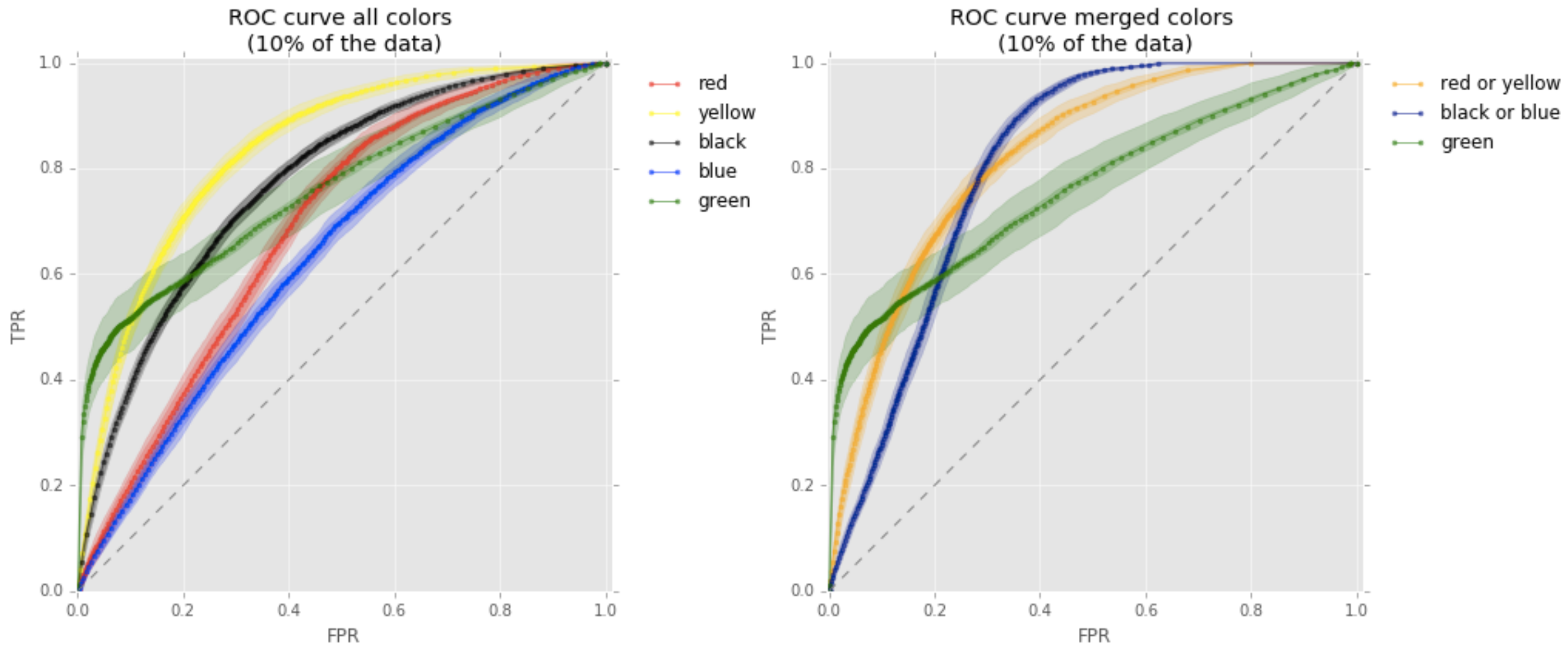


# SOM Models



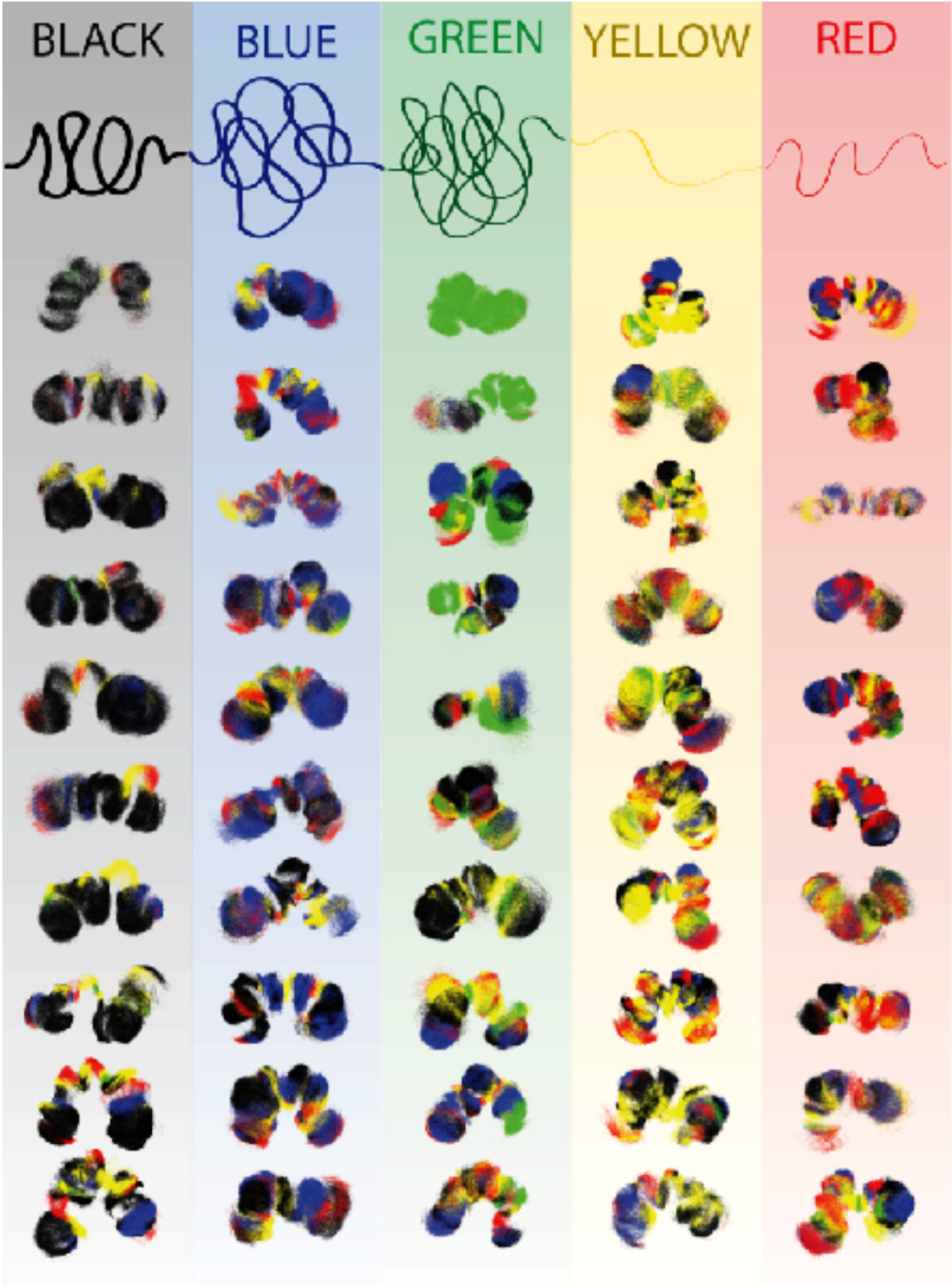


# Can we predict the color?

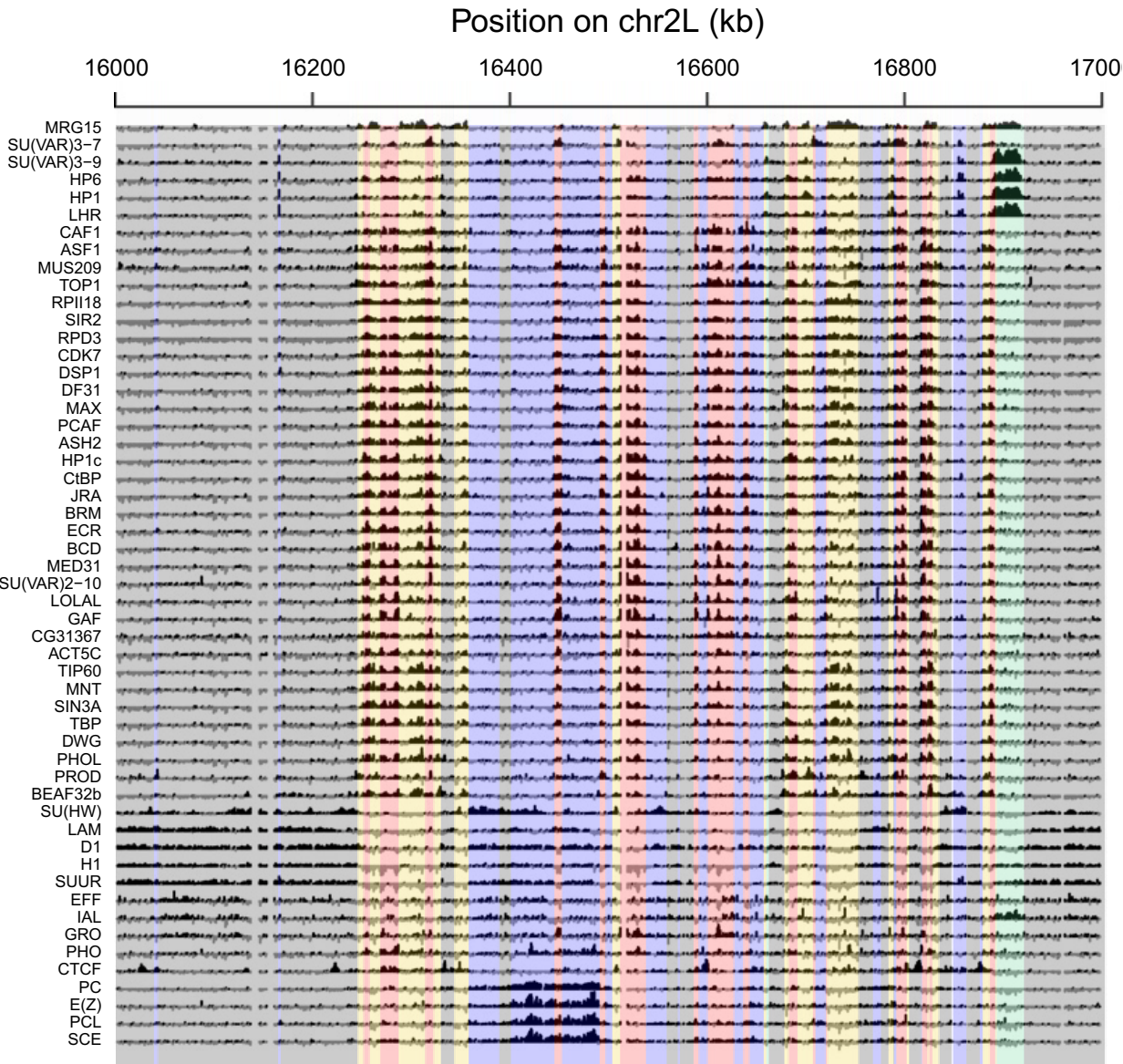


black :0.77  
blue :0.64  
green :0.80  
red :0.69  
yellow :0.83

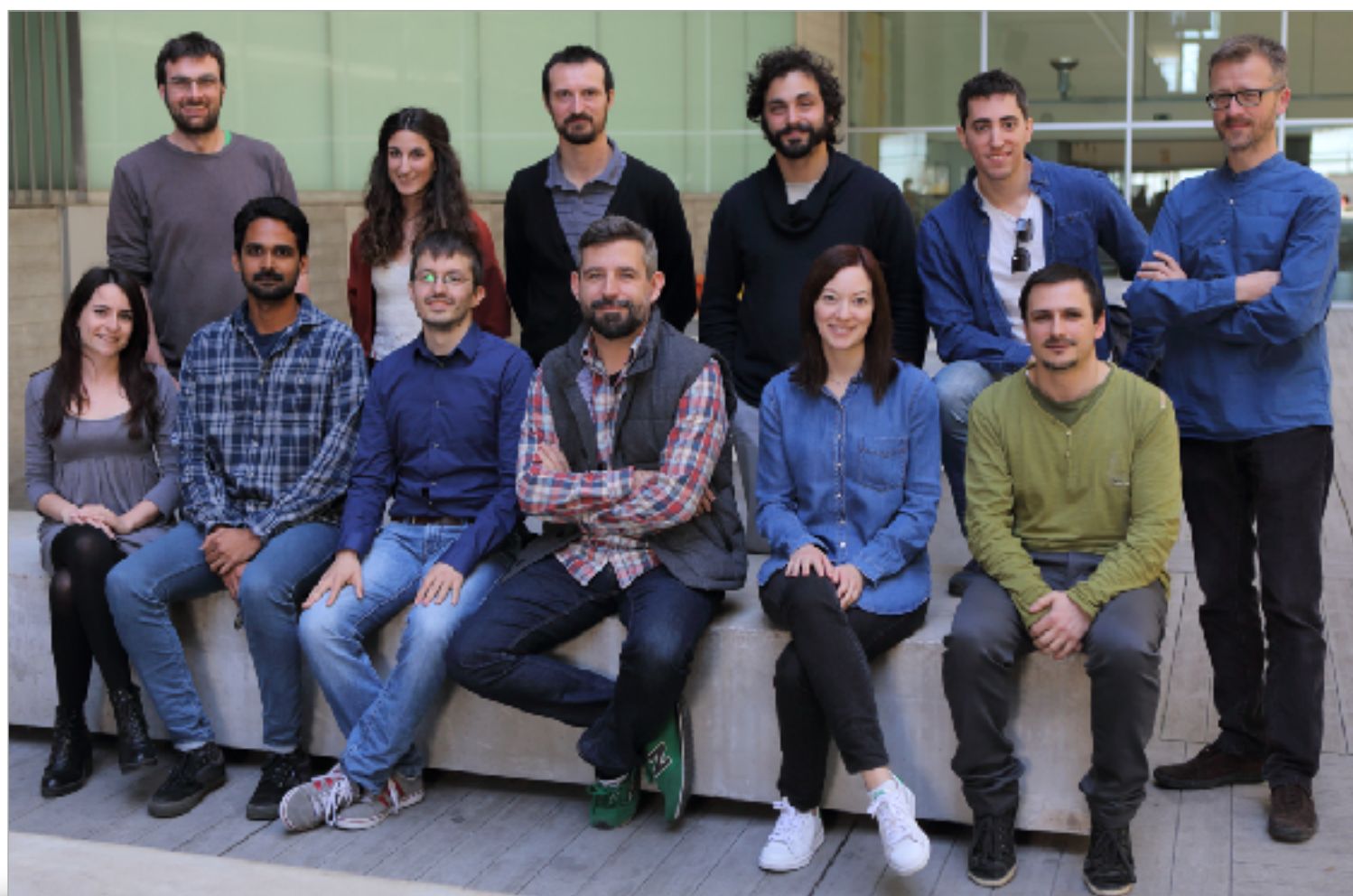
# Structural COLOrS



53 chromatin proteins







Davide Baù  
 Gireesh K. Bogu  
 Yasmina Cuartero  
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<http://marciuslab.org>  
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