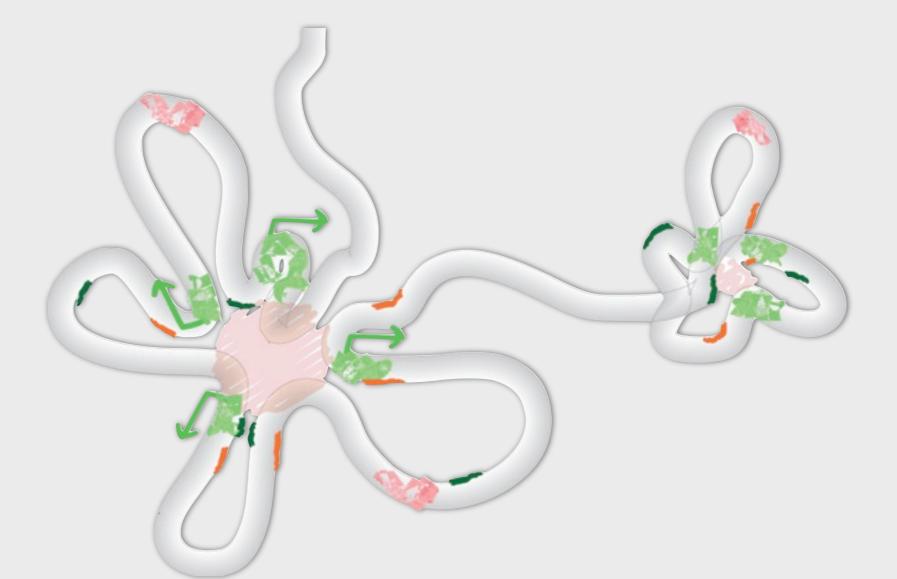
# 3D folding of chromosomal domains in relation to gene expression



#### Marc A. Marti-Renom

http://sgu.bioinfo.cipf.es

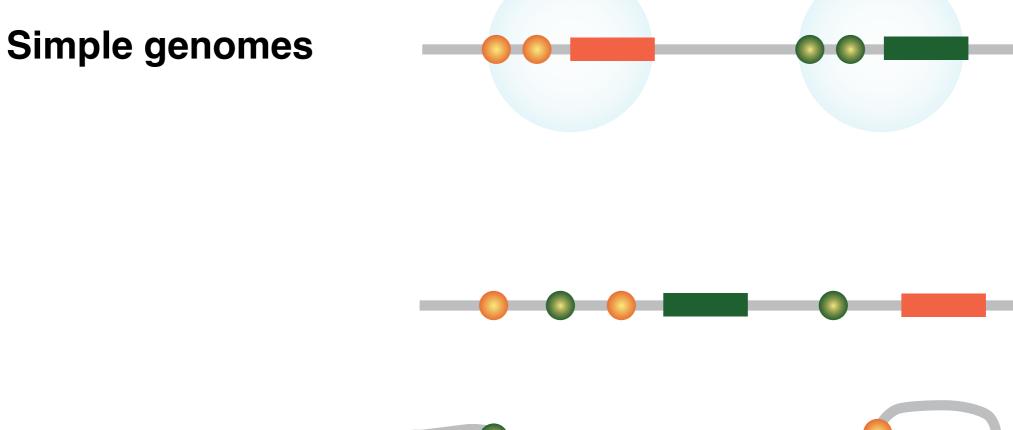


Structural Genomics Unit Bioinformatics & Genomics Department Prince Felipe Research Center (CIPF), Valencia, Spain





Can we relate structure and expression?



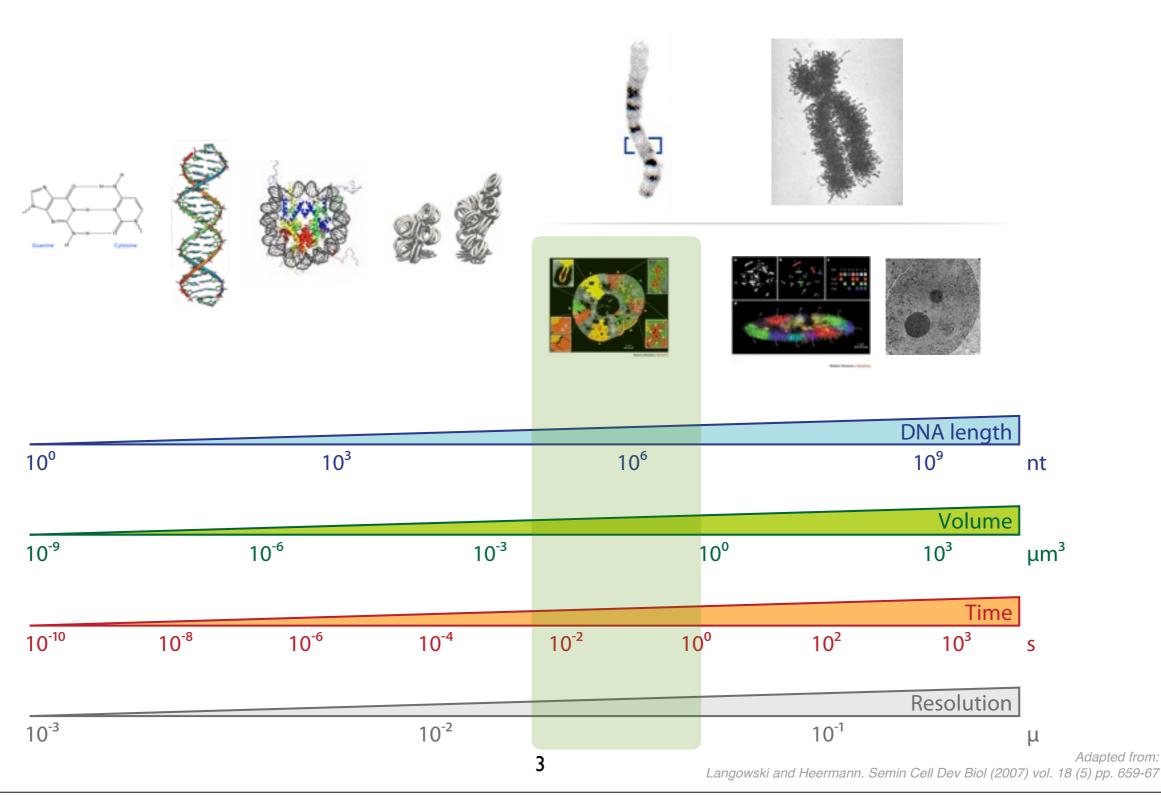
#### **Complex genomes**



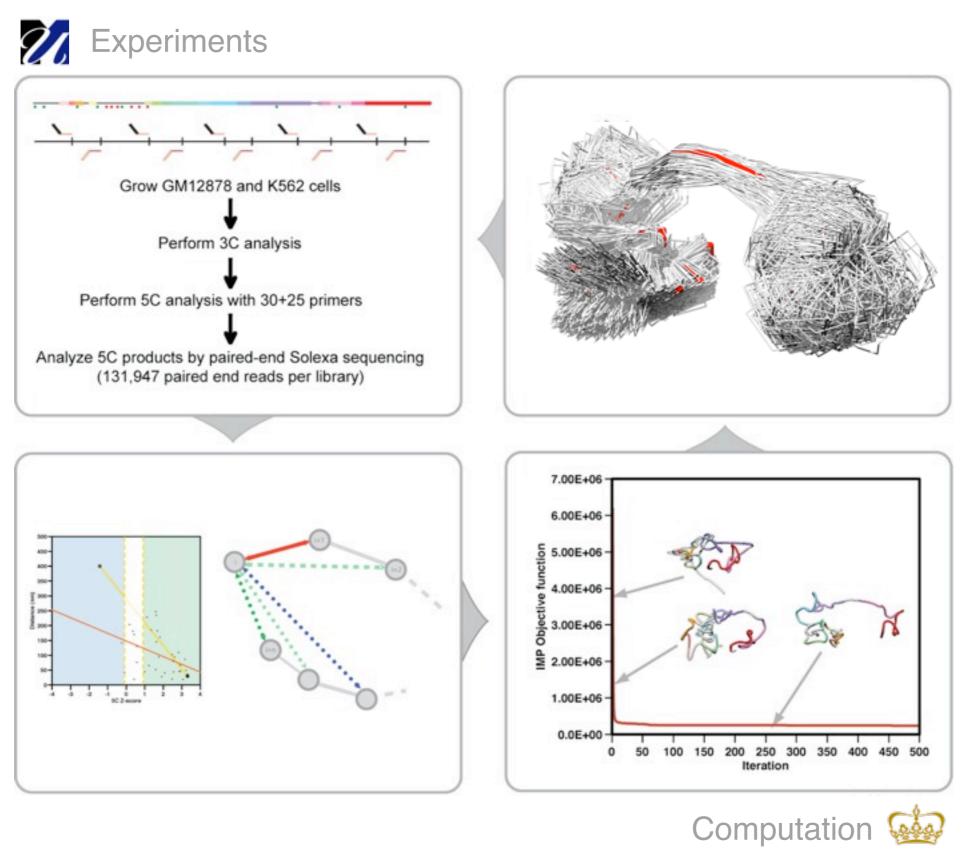
### Resolution

Limited knowledge...

#### Knowledge



## Integrative and iterative approach

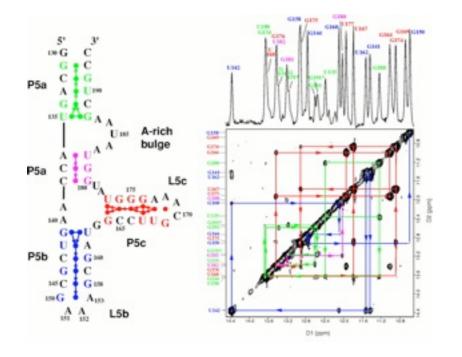


### **Structure determination**

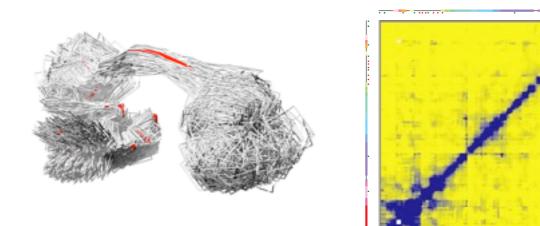
Integrative Modeling Platform

http://www.integrativemodeling.org

Alber et al. Nature (2007) vol. 450 (7170) pp. 683-94



#### Biomolecular structure determination 2D-NOESY data



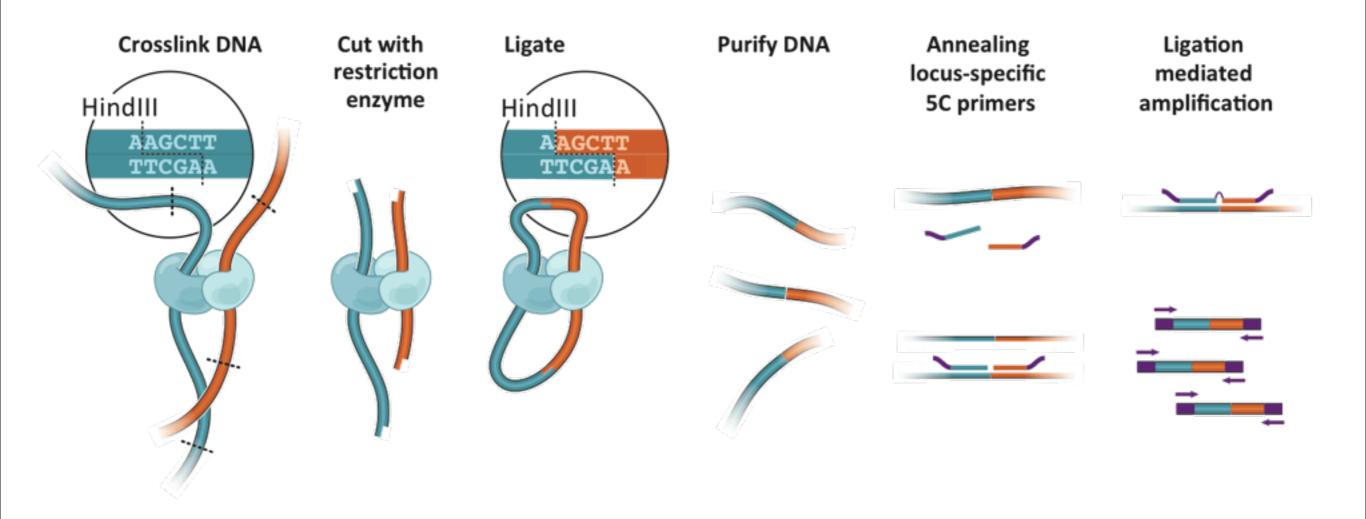


## **5C technology**

#### Detecting up to millions of interactions in parallel

http://my5C.umassmed.edu

Dostie et al. Genome Res (2006) vol. 16 (10) pp. 1299-309



5C "copies" the 3C library into a 5C library containing only ligation junctions

Performed at high levels of multiplexing:

2,000 primers detect 1,000,000 unique interactions in 1 reaction

### Human $\alpha$ -globin domain

#### ENm008 genomic structure and environment

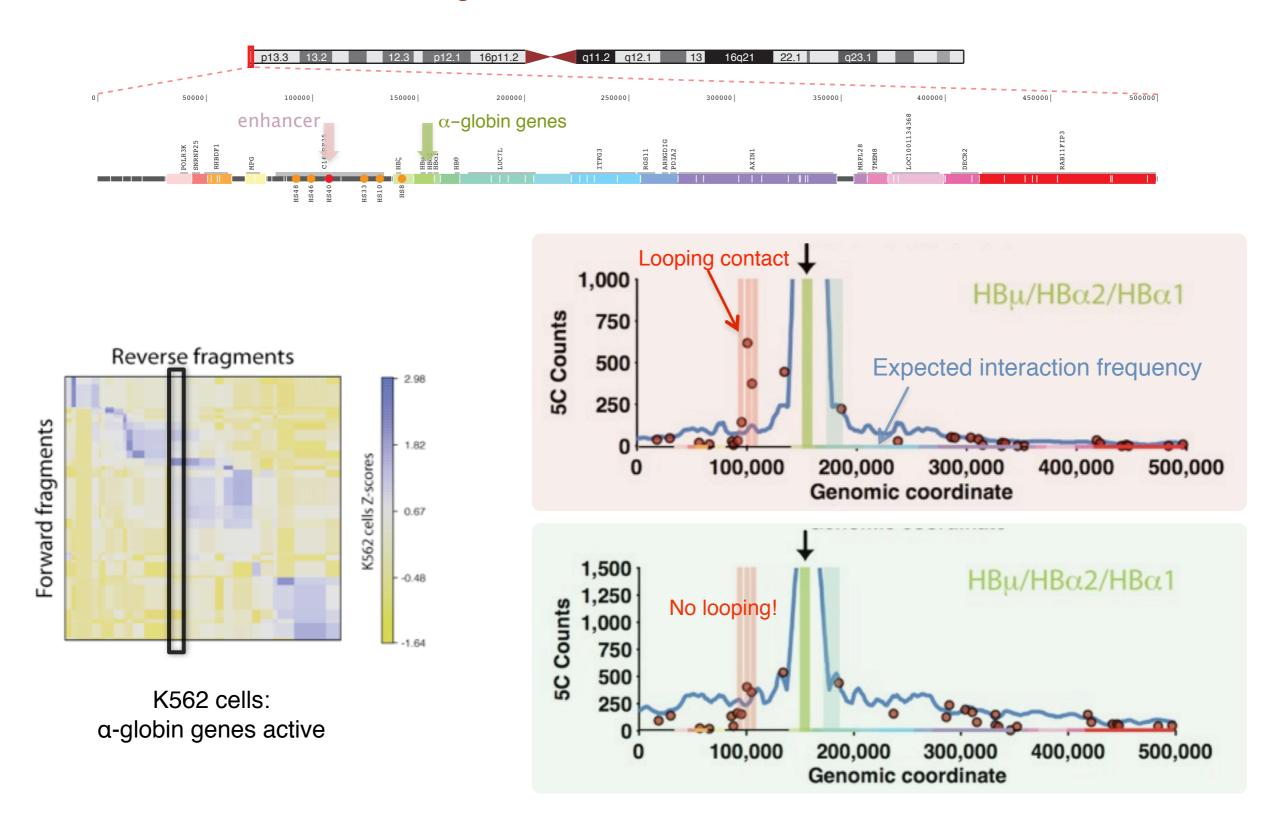
ENCODE Consortium. Nature (2007) vol. 447 (7146) pp. 799-816



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 DNasel Hypersensitivity data (Crawford Group at Duke University), and Histone Modifications by Broad Institute ChIP-seq (Bernstein Group at Broad Institute of Harvard and MIT).

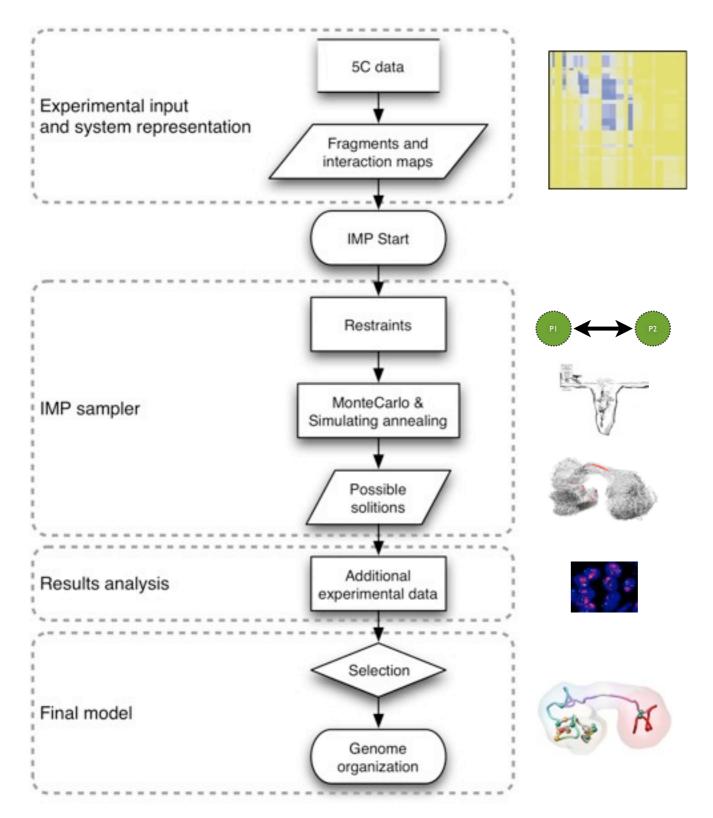
### 5C on the human $\alpha\text{-globin}$ domain

**ENm008 genomic structure and environment** 



## **Integrative Modeling**

http://www.integrativemodeling.org



## Representation

\*\*\*\*\*

#### Harmonic

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

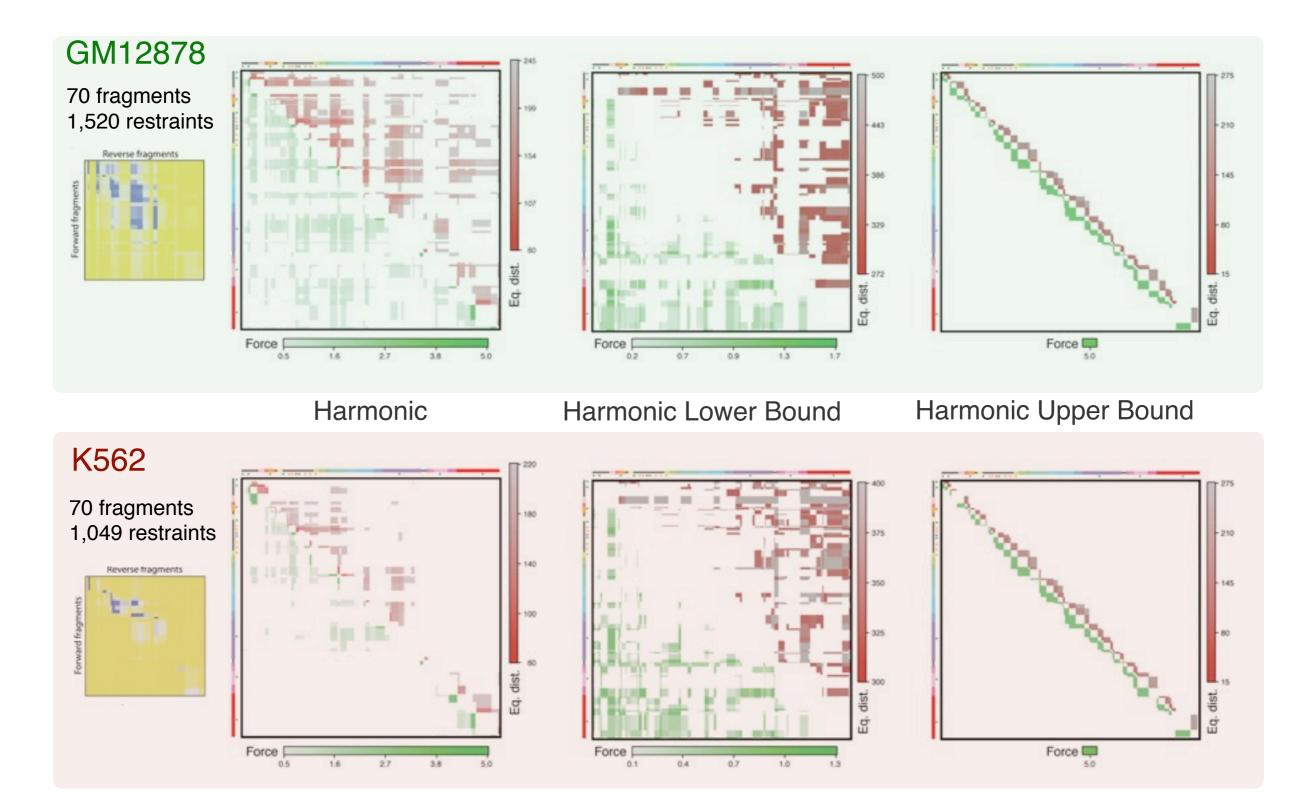
Harmonic Lower Bound

$$\begin{cases} if \ d_{i,j} \le d_{i,j}^{0}; & lbH_{i,j} = k \left( d_{i,j} - d_{i,j}^{0} \right) \\ if \ d_{i,j} > d_{i,j}^{0}; & lbH_{i,j} = 0 \end{cases}$$

#### Harmonic Upper Bound

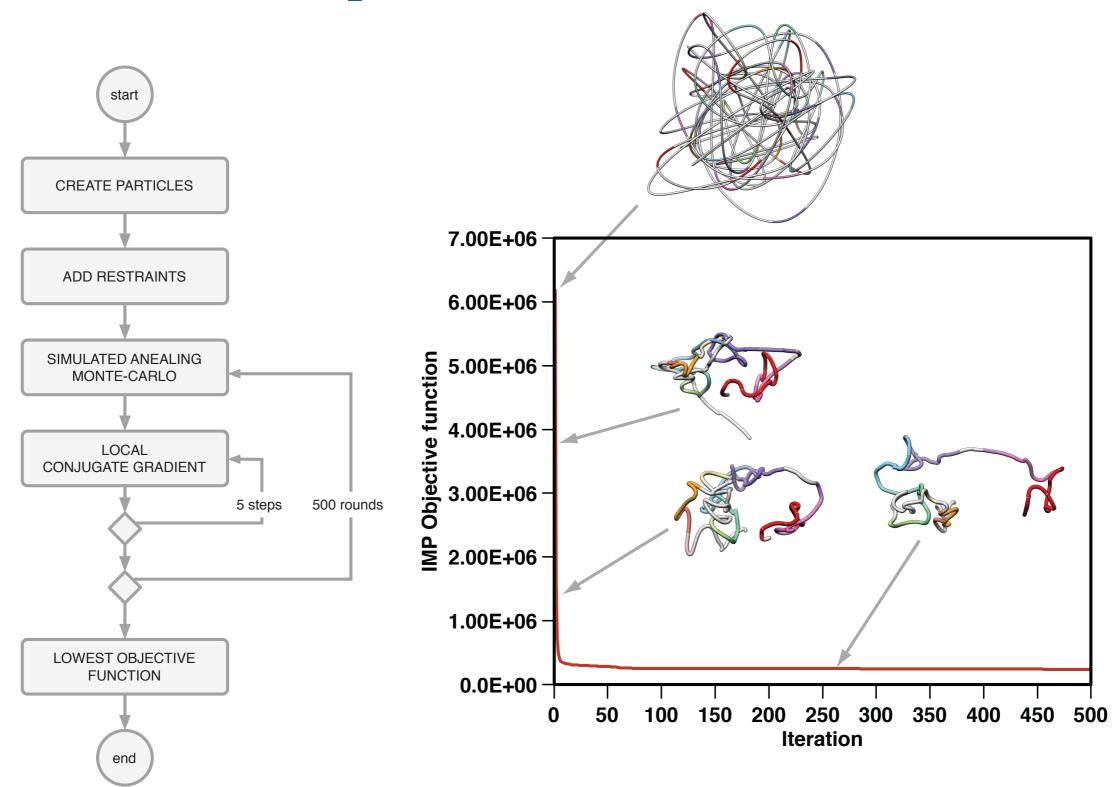
$$\begin{cases} if \ d_{i,j} \ge d_{i,j}^{0}; & ubH_{i,j} = k \left( d_{i,j} - d_{i,j}^{0} \right)^{2} \\ if \ d_{i,j} < d_{i,j}^{0}; & ubH_{i,j} = 0 \end{cases}$$

# Scoring

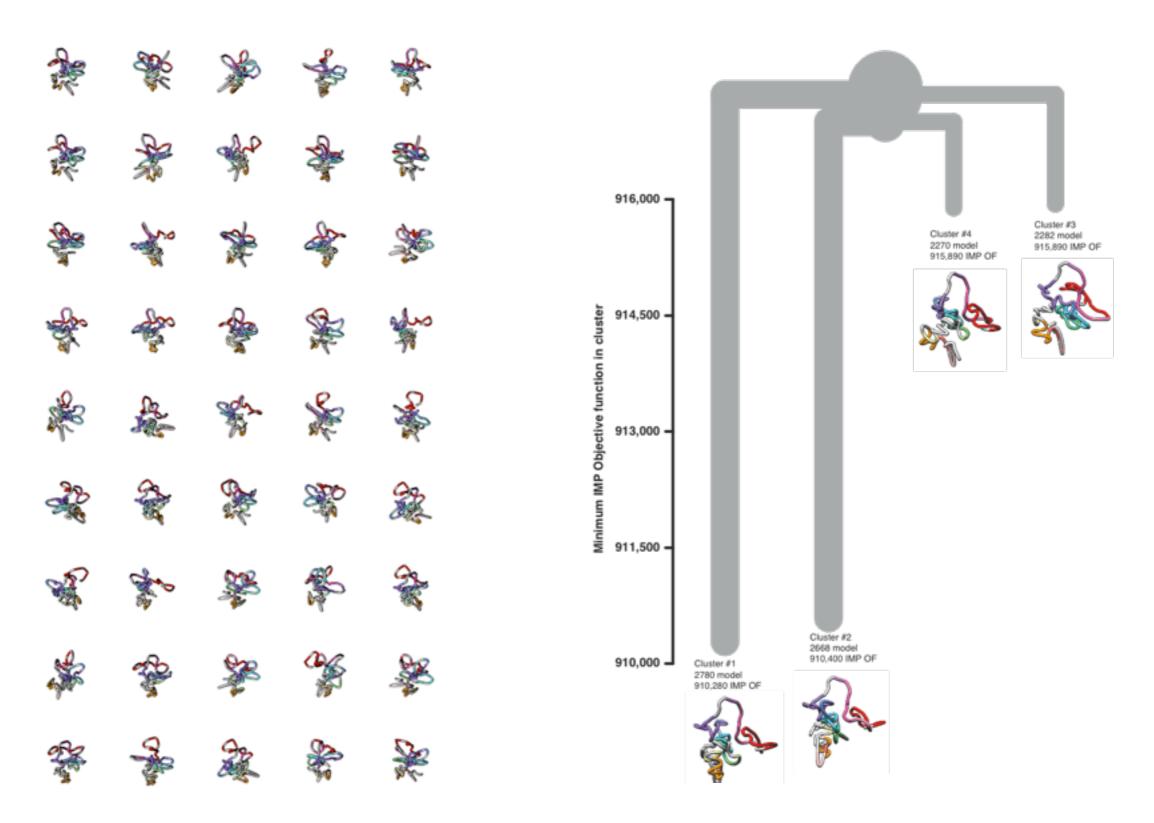


11

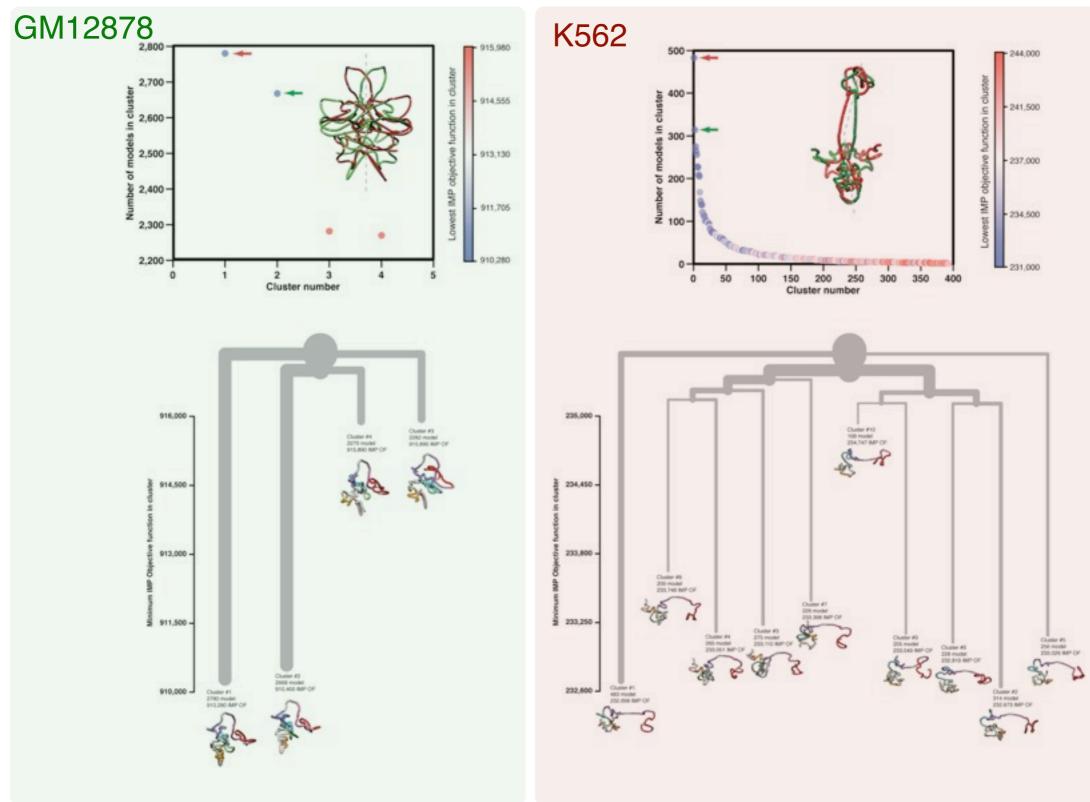
# Optimization



# Clustering

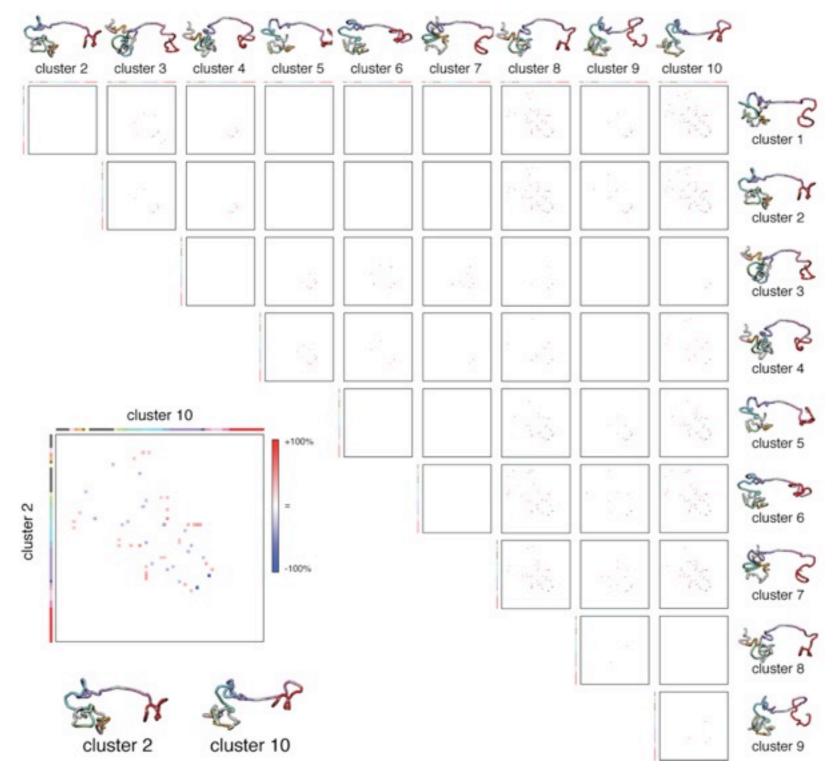


# Not just one solution



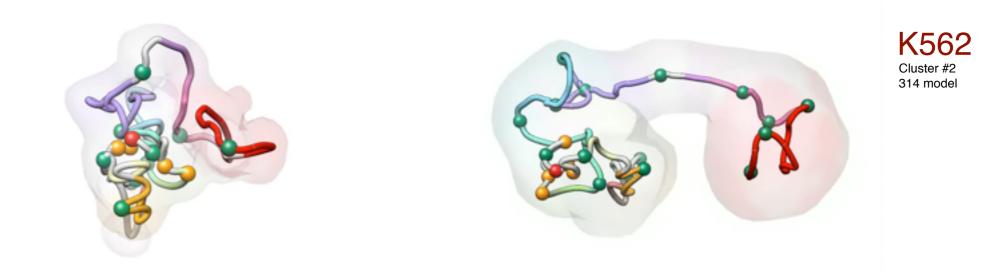
# Not just one solution

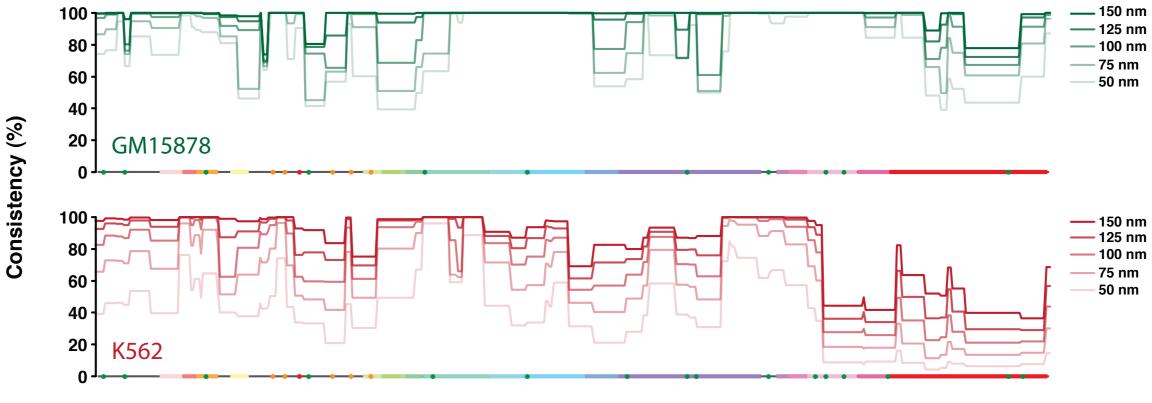
#### and we can de-convolute them!



## Consistency

GM12878 Cluster #1 2780 model

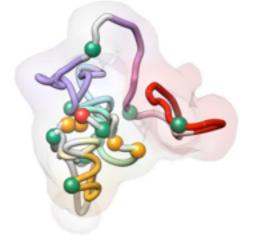


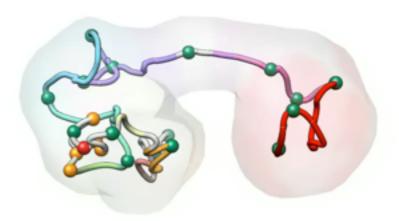


Fragment

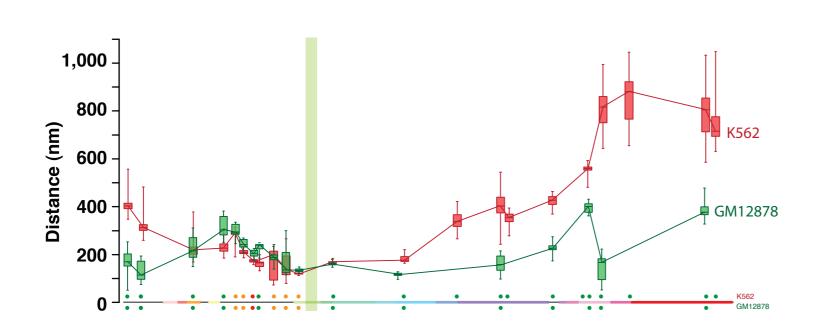
# **Regulatory elements**

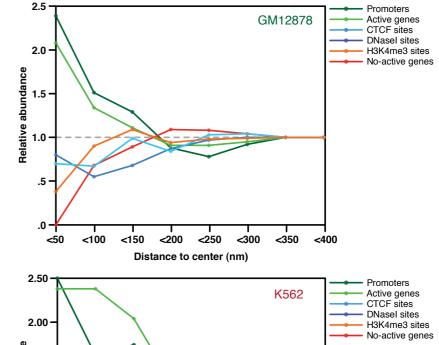
GM12878 Cluster #1 2780 model

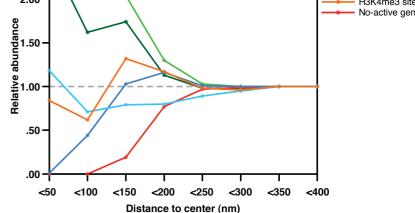




K562 Cluster #2 314 model



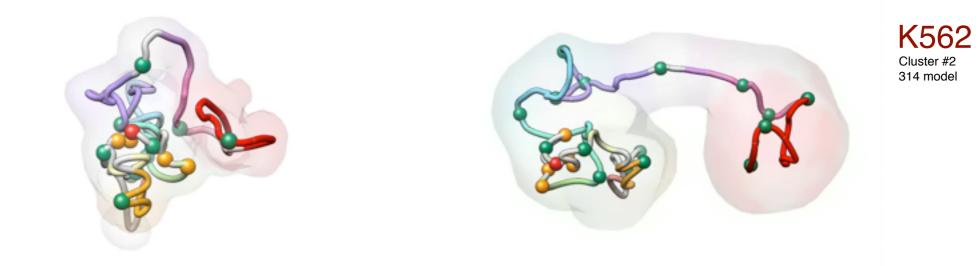


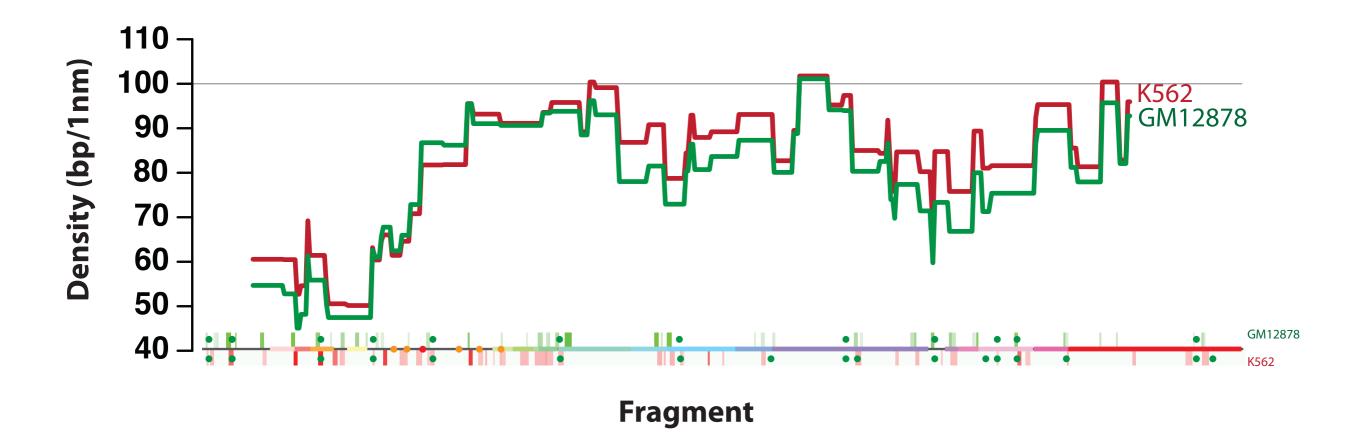


Thursday, July 8, 2010

## Compactness

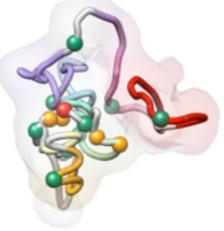
GM12878 Cluster #1 2780 model

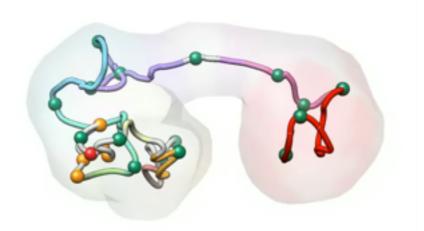




# Multi-loops

GM12878 Cluster #1 2780 model



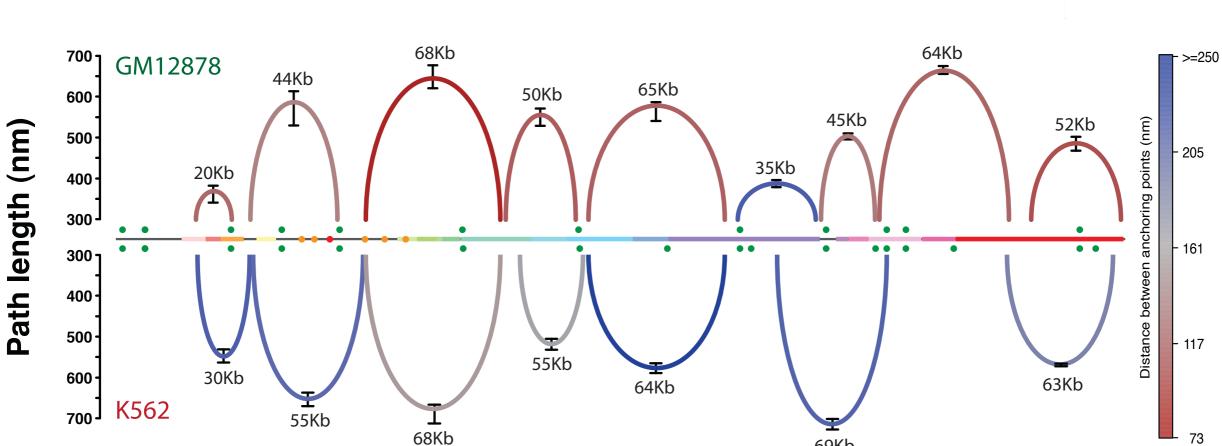


69Kb

K562 Cluster #2

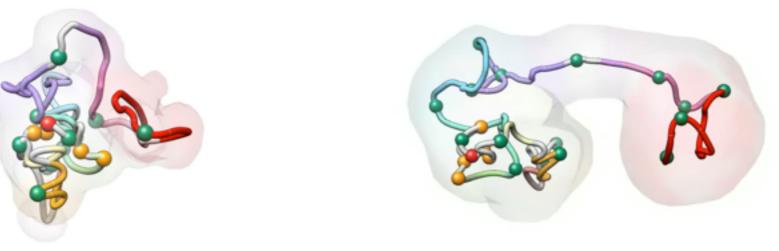
73

314 model

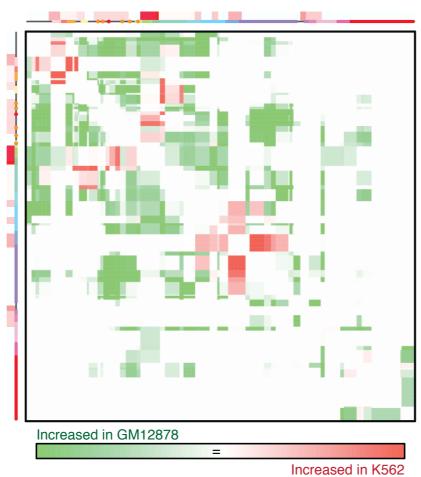


## Expression

GM12878 Cluster #1 2780 model

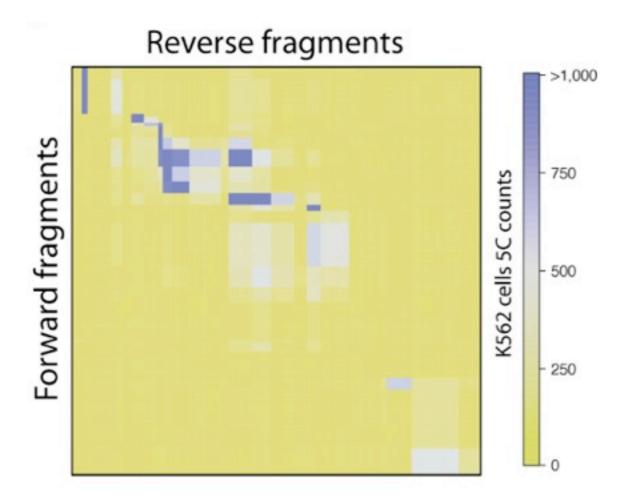


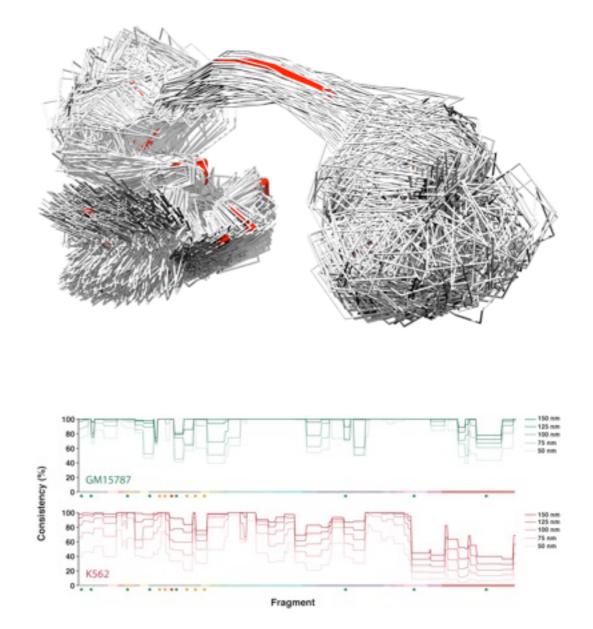




## Summary

## 5C data results in comprehensive interaction matrices to build a consistent 3D model





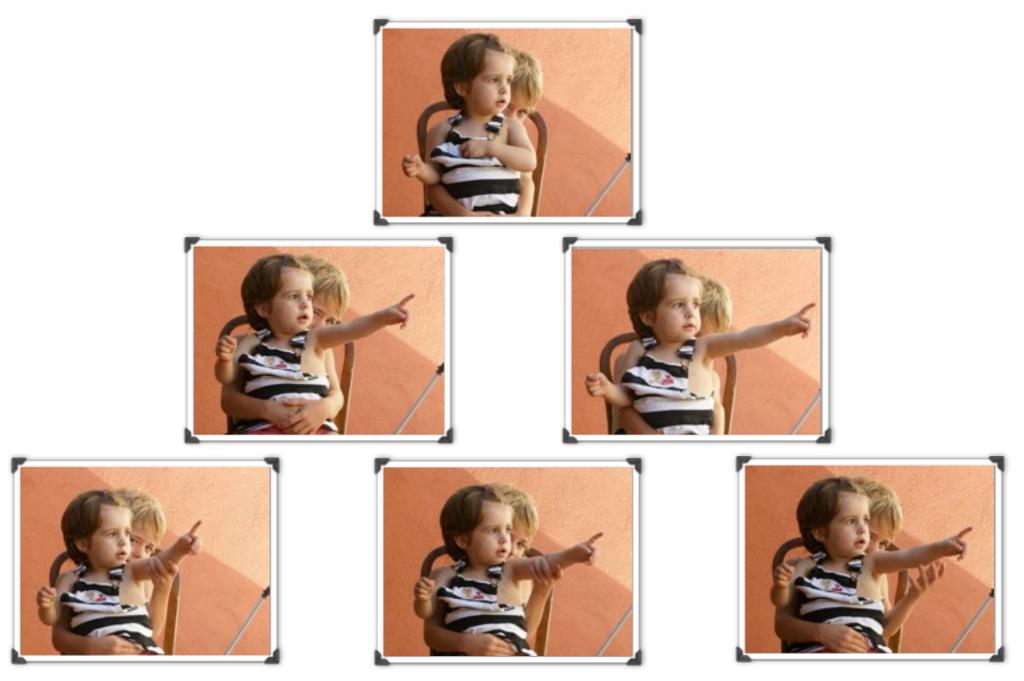
## Summary

#### Models allow for 5C data de-convolution





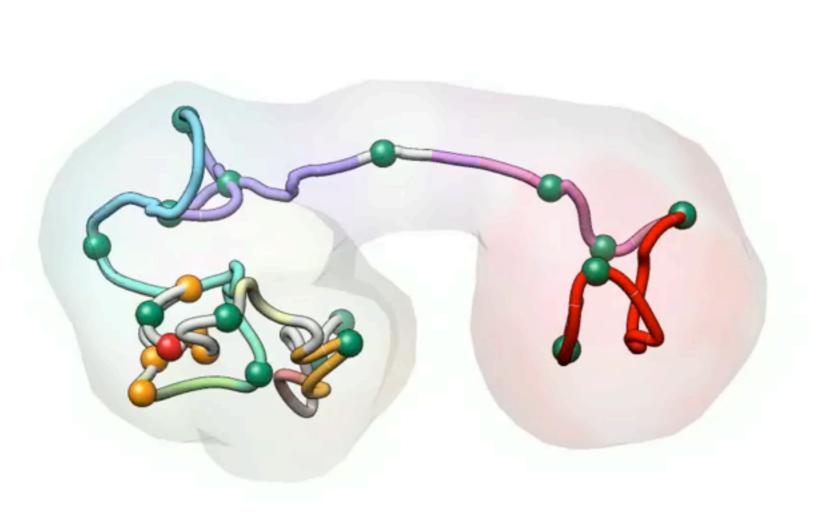
#### Models allow for 5C data de-convolution

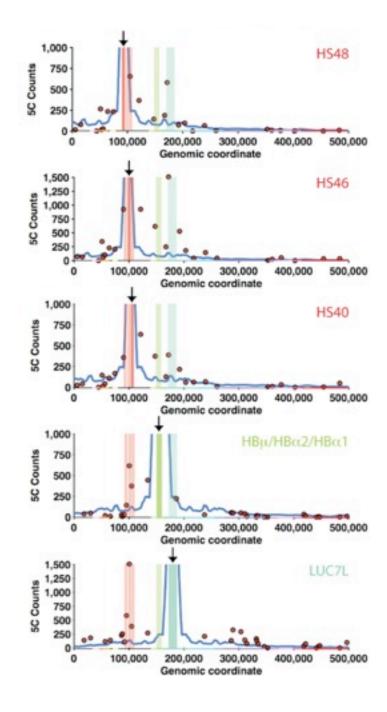


20

## Summary

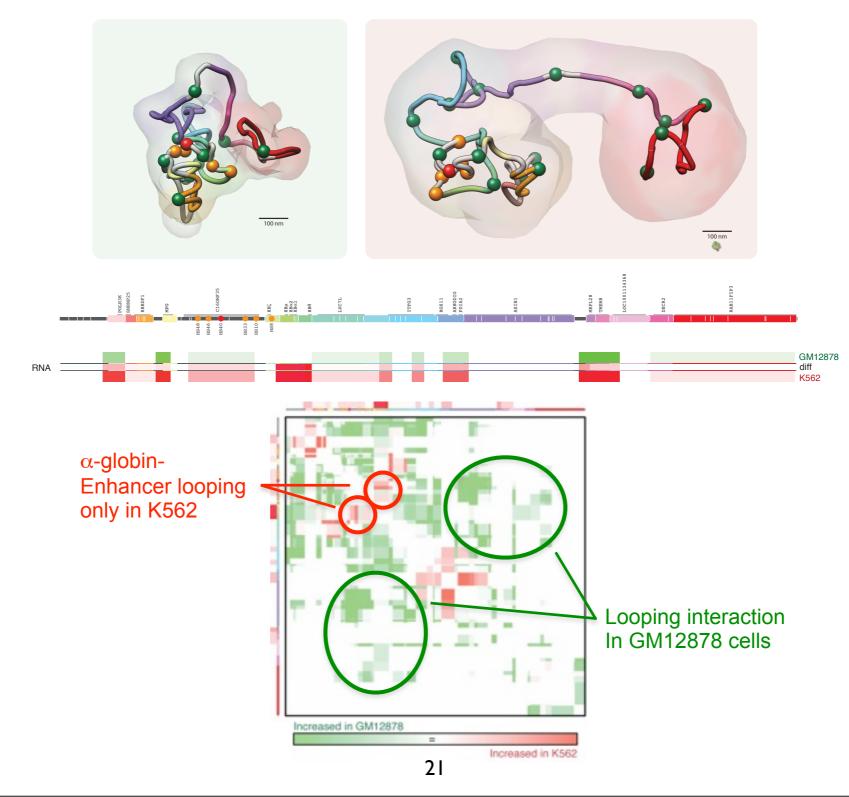
#### Selected models reproduce known (and new) interactions

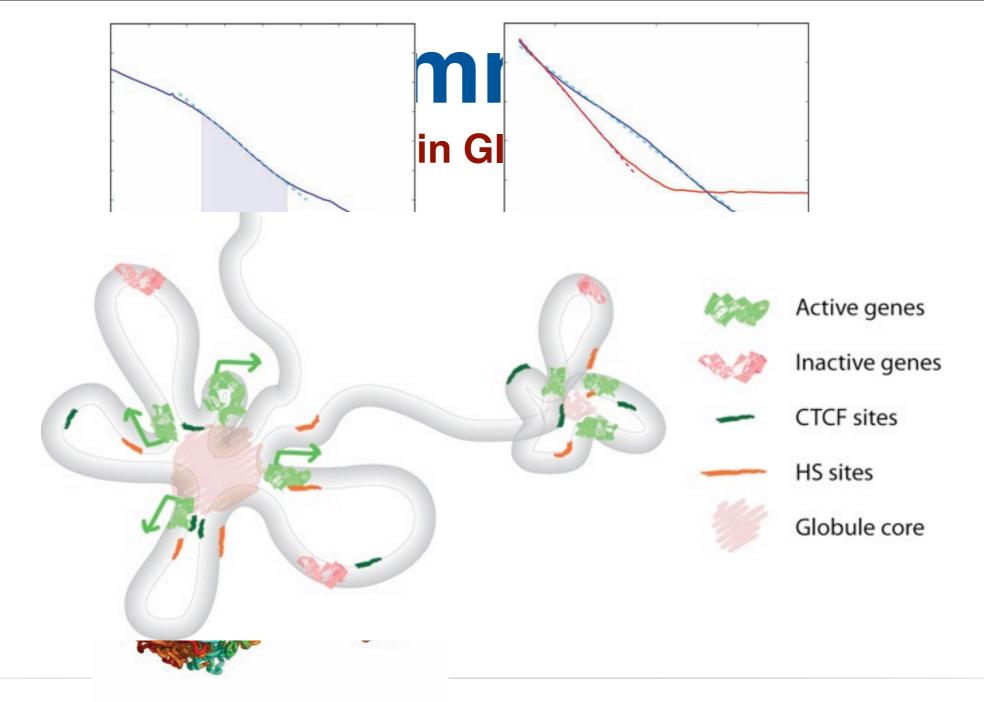


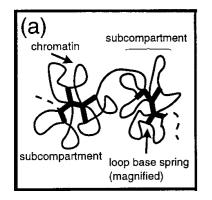




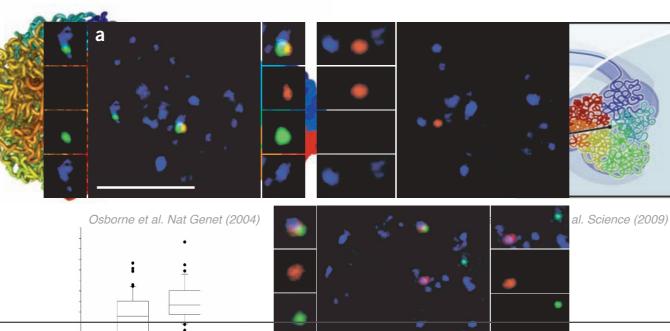
## Large-scale changes in conformation correlate with gene expression of resident genes

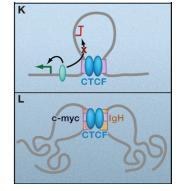






Münkel et al. JMB (1999)

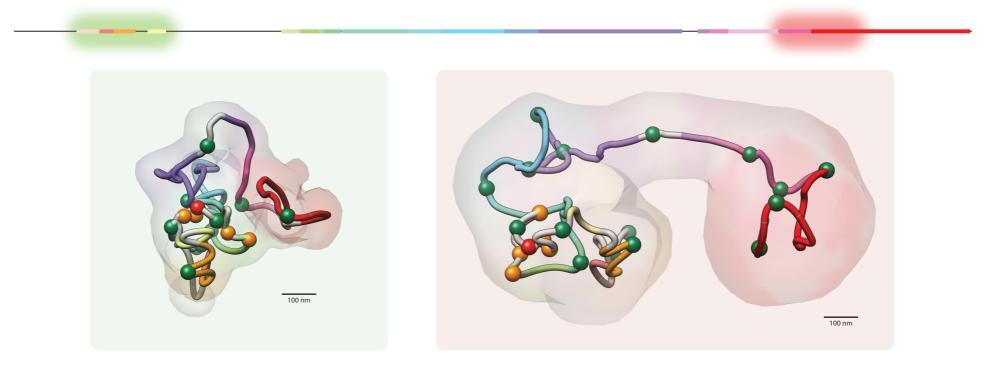


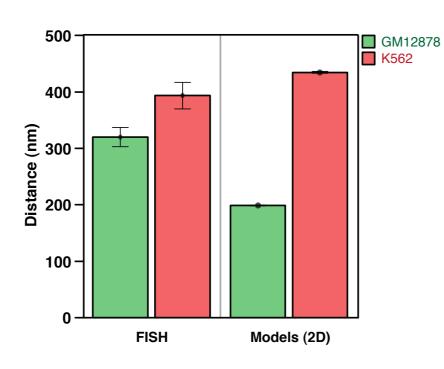


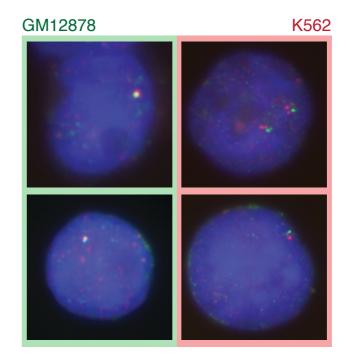
Phillips and Corces. Cell (2009)

### **Initial validation**

FISH experiments by the Lawrence Lab (UMASS)



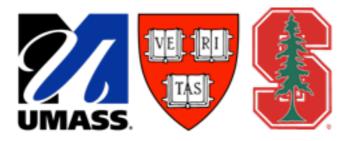




Jeanne Lawrence (UMASS)

# **Other applications**

Caulobacter crescentus whole genome



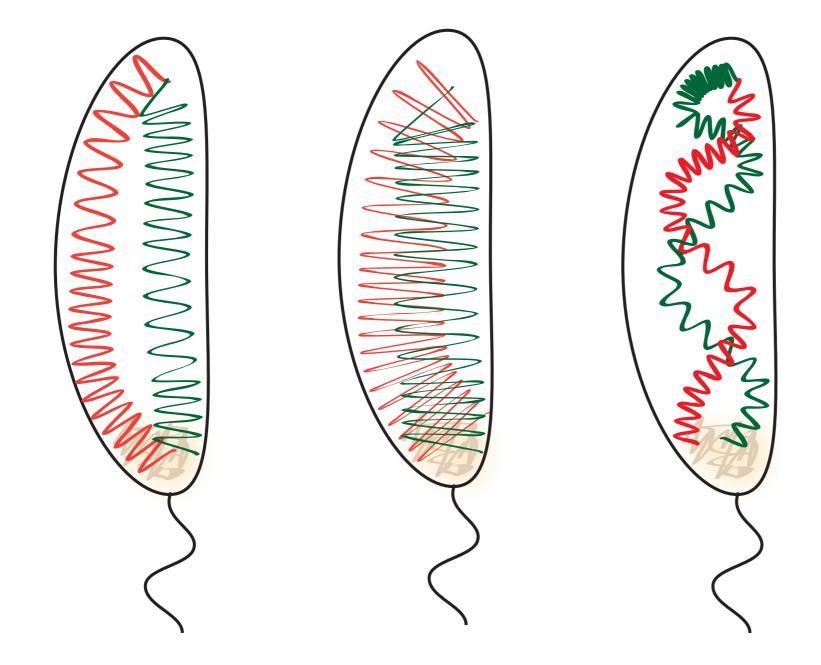
#### Human Chromosome 21 & mRNA chimeras





### Other applications...

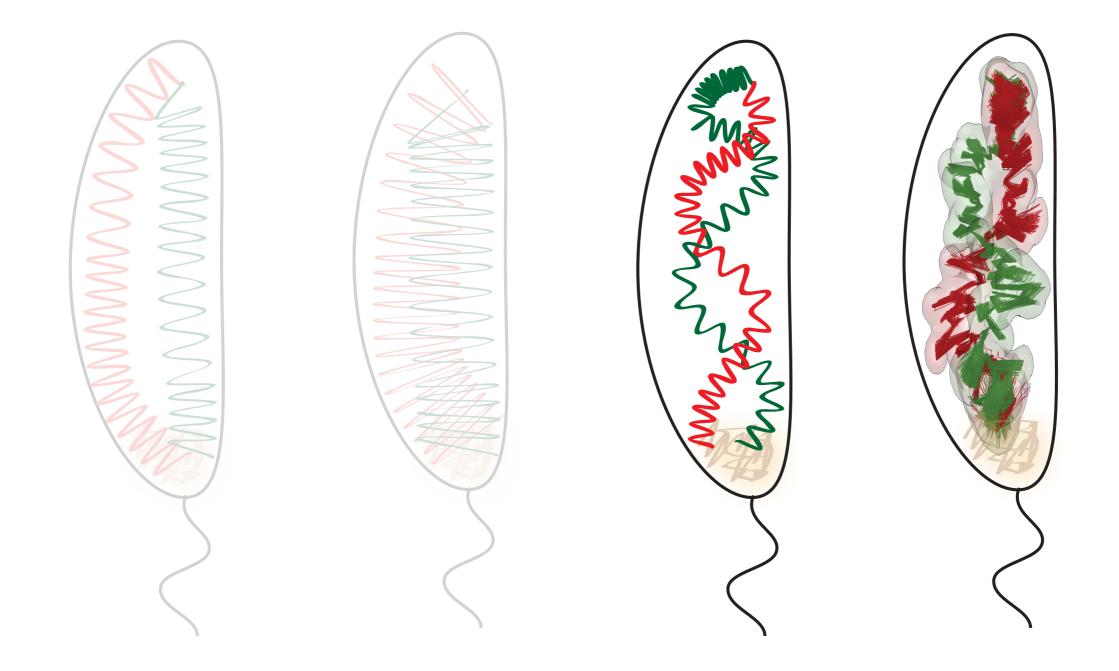
Caulobacter crescentus whole genome Mark A. Umbarger





### Other applications...

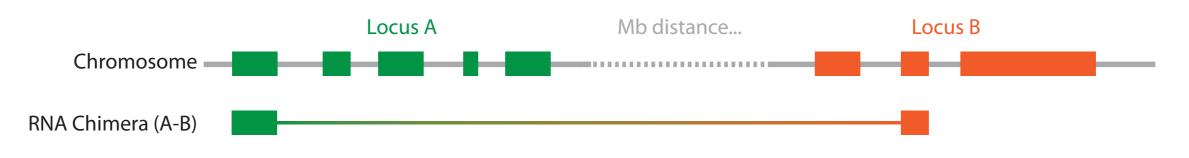
Caulobacter crescentus whole genome Mark A. Umbarger

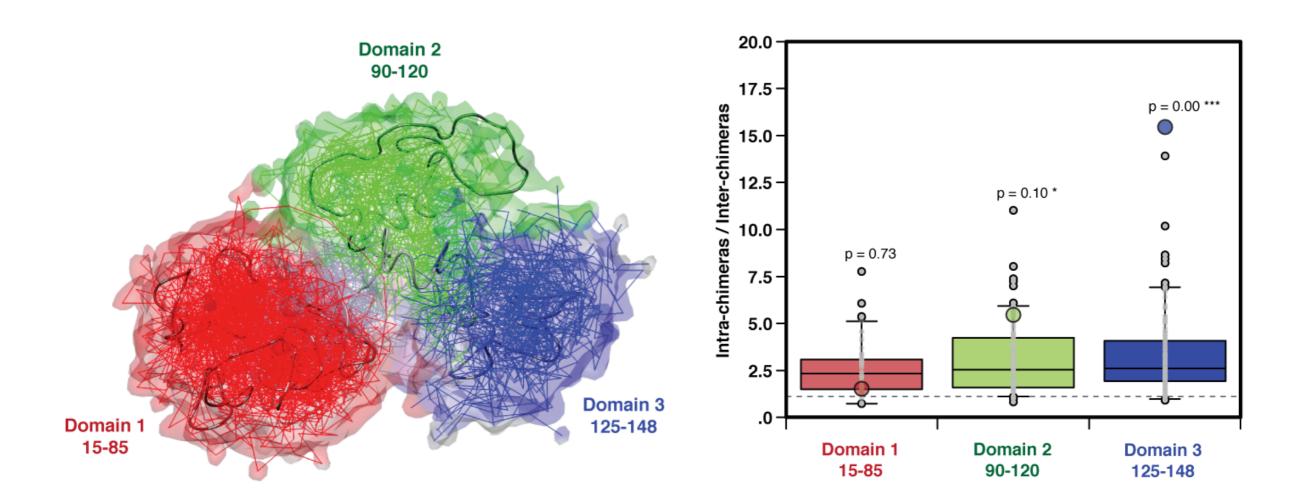




### Other applications...

#### Whole (low-res) human chromosome 21 and RNA chimeras Sarah Djebali







## Acknowledgments



Job Dekker Program in Gene Function and Expression Department of Biochemistry and Molecular Pharmacology University of Massachusetts Medical School Worcester, MA, USA





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Davide Baù Postdoctoral fellow Structural Genomics Unit

Valencia, Spain

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Emidio Capriotti Postdoctoral fellow Structural Genomics Unit

