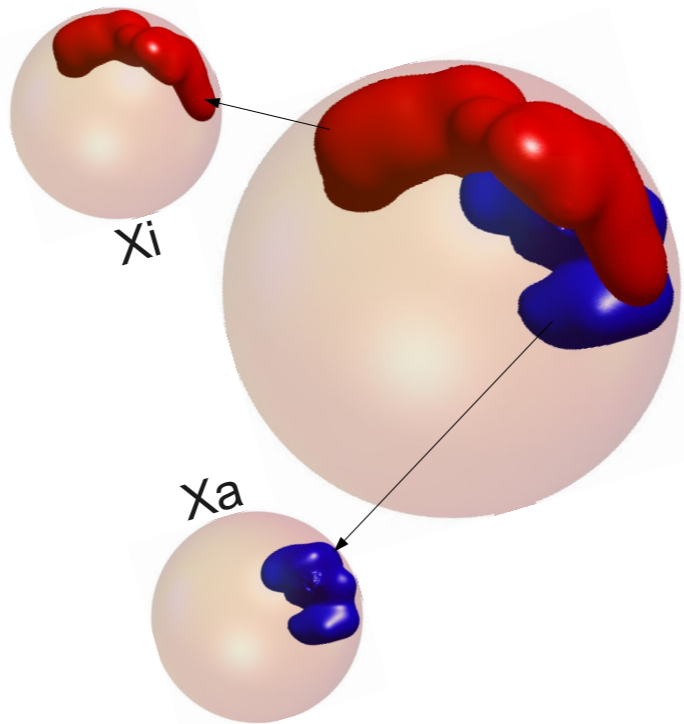


Active Matter and Nuclear Physics



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The Institute of Mathematical Sciences, Chennai, INDIA

Outline

Non-equilibrium
physics

Self-propelled objects

Living matter as active
matter

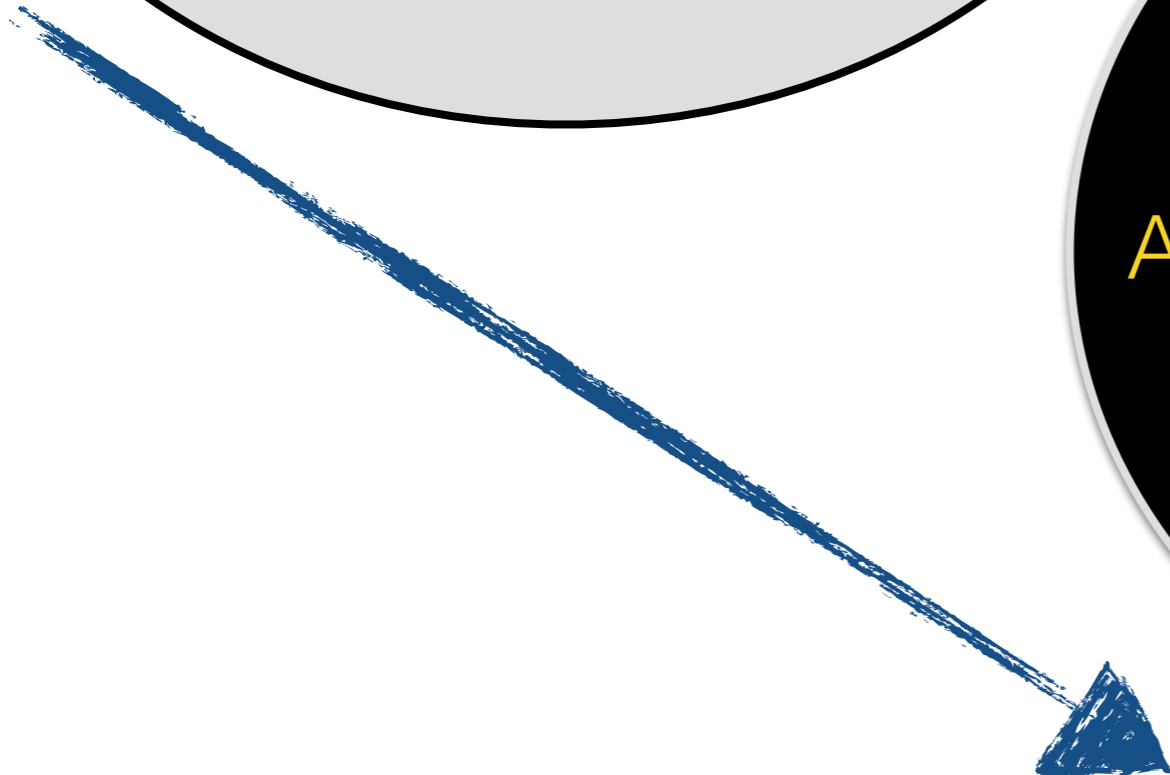
Nuclear architecture

Chromosome positioning

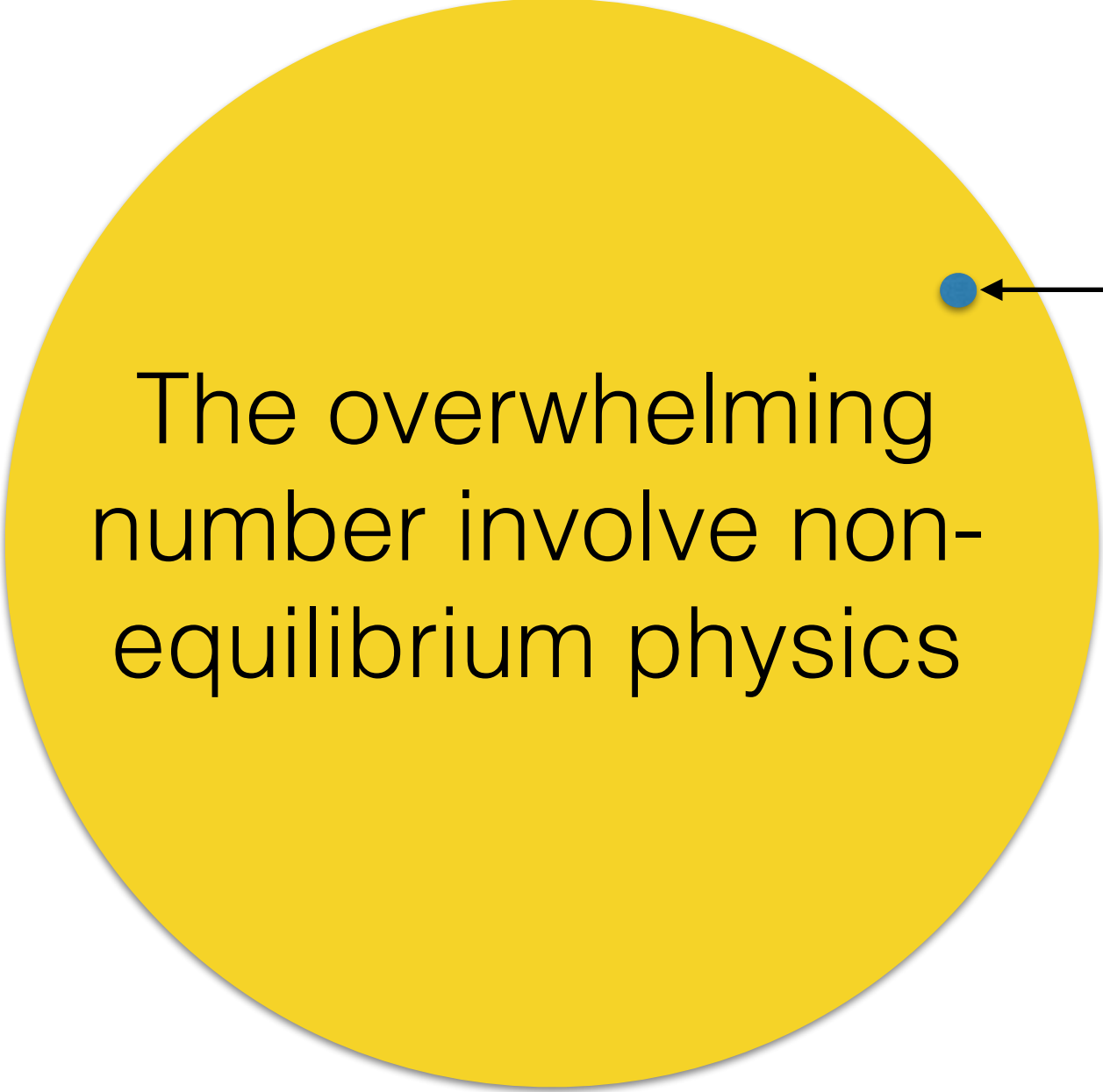
Applying active matter ideas

Results & Predictions

Conclusions



In the space of all interesting problems
in condensed matter physics (largely)



The overwhelming
number involve non-
equilibrium physics

Those involving
equilibrium
physics are a
truly tiny fraction

Many ways in which
a system can be
non-equilibrium

Non-equilibrium

Driving at macroscopic
scales, bulk or
boundary, a route to
non equilibrium



Indian traffic

https://www.youtube.com/watch?v=_Yj36G9ukDc



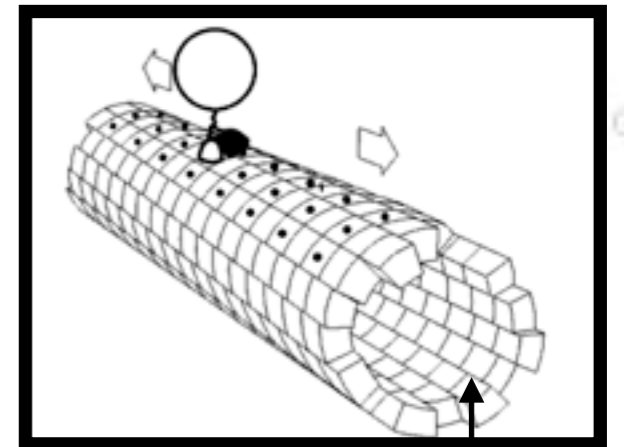
Molecular Motor

Single molecule,
mechano-chemical
cycle.

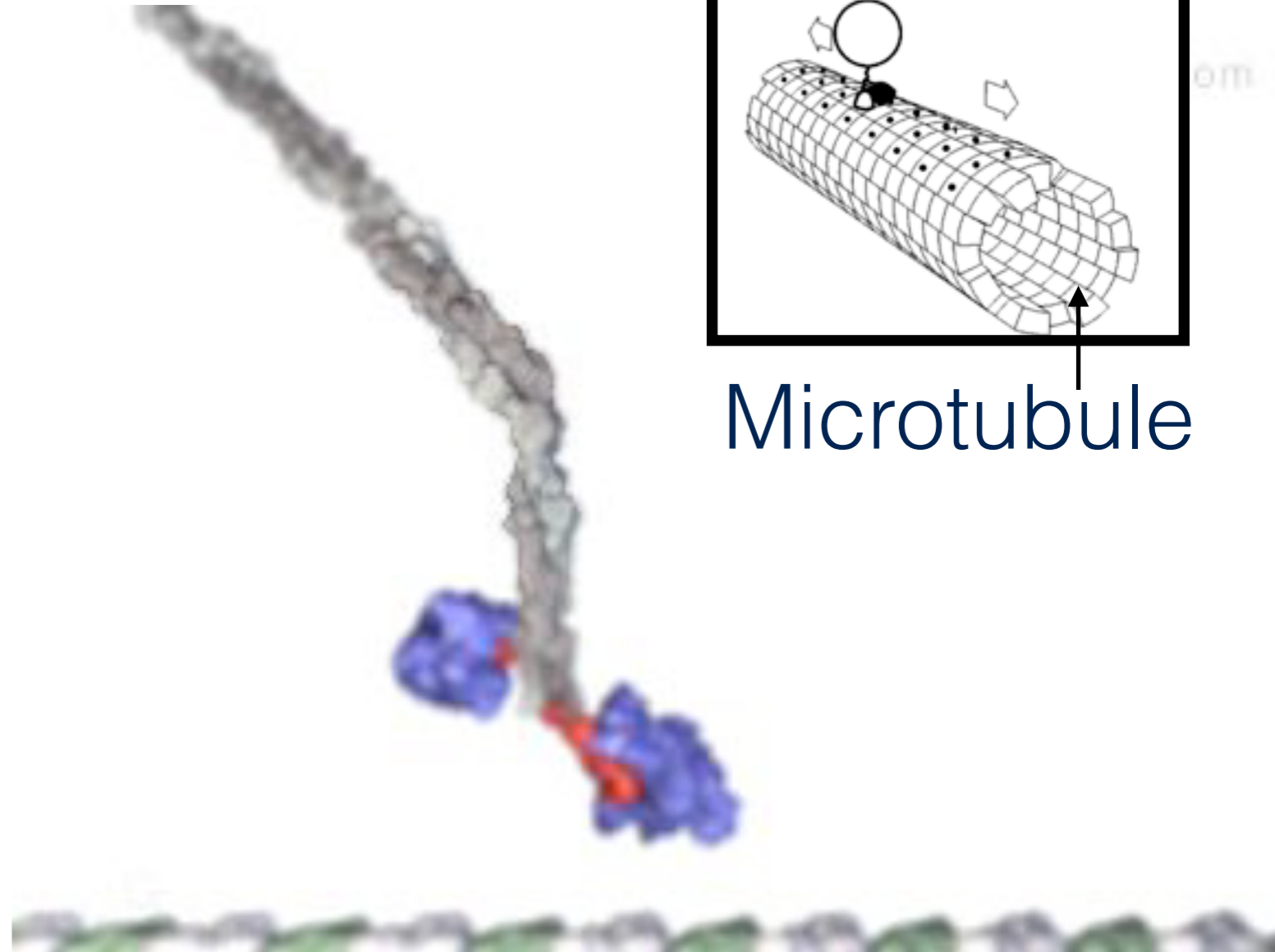
Energy-rich
molecule, ATP,
broken down to
ADP (Hydrolysis)

Cell makes lots of
ATP. Concentrations
are not in
equilibrium

Kinesin



Microtubule



<http://valelab.ucsf.edu/moviepages/movies.html>

http://python.rice.edu/~kolomeisky/kinesin_walking.gif

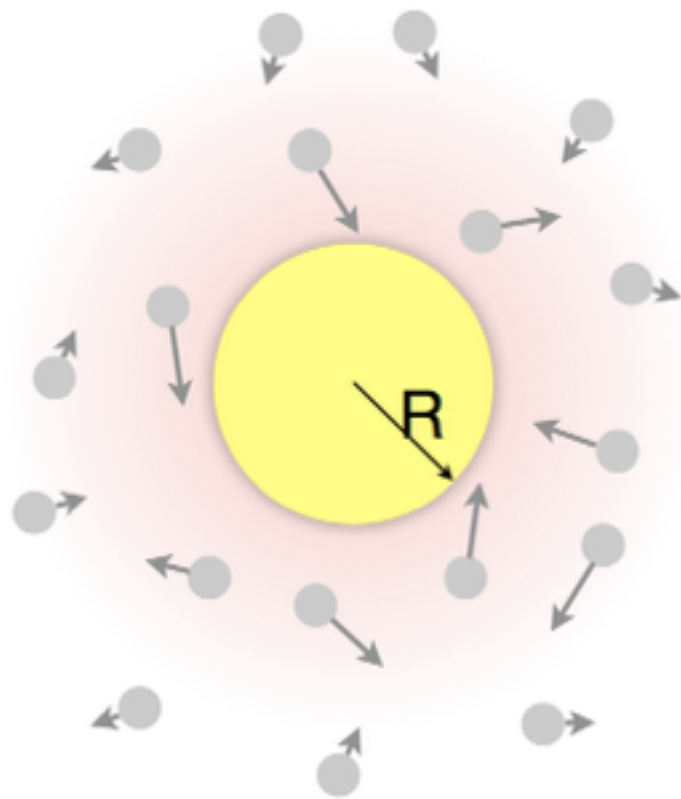
Examples of “self-propelled particles”



Thinking about self-propelled particles and how to describe them (individually, collectively) was the initial motivation for the study of active matter

But what is “passive” matter?

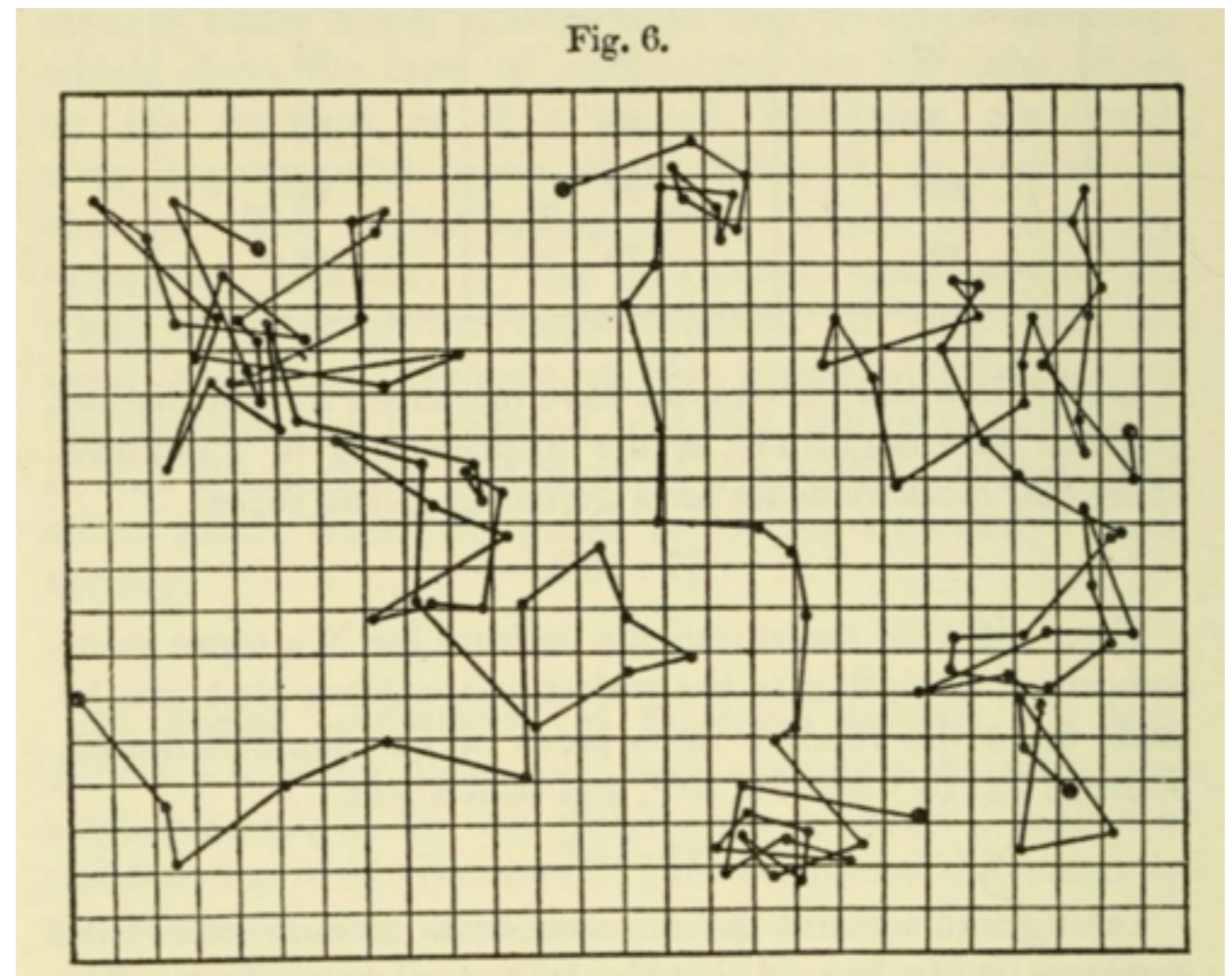
“Passive” Matter



Trajectory of a micron sized particle in a fluid

Random, **Brownian** motion

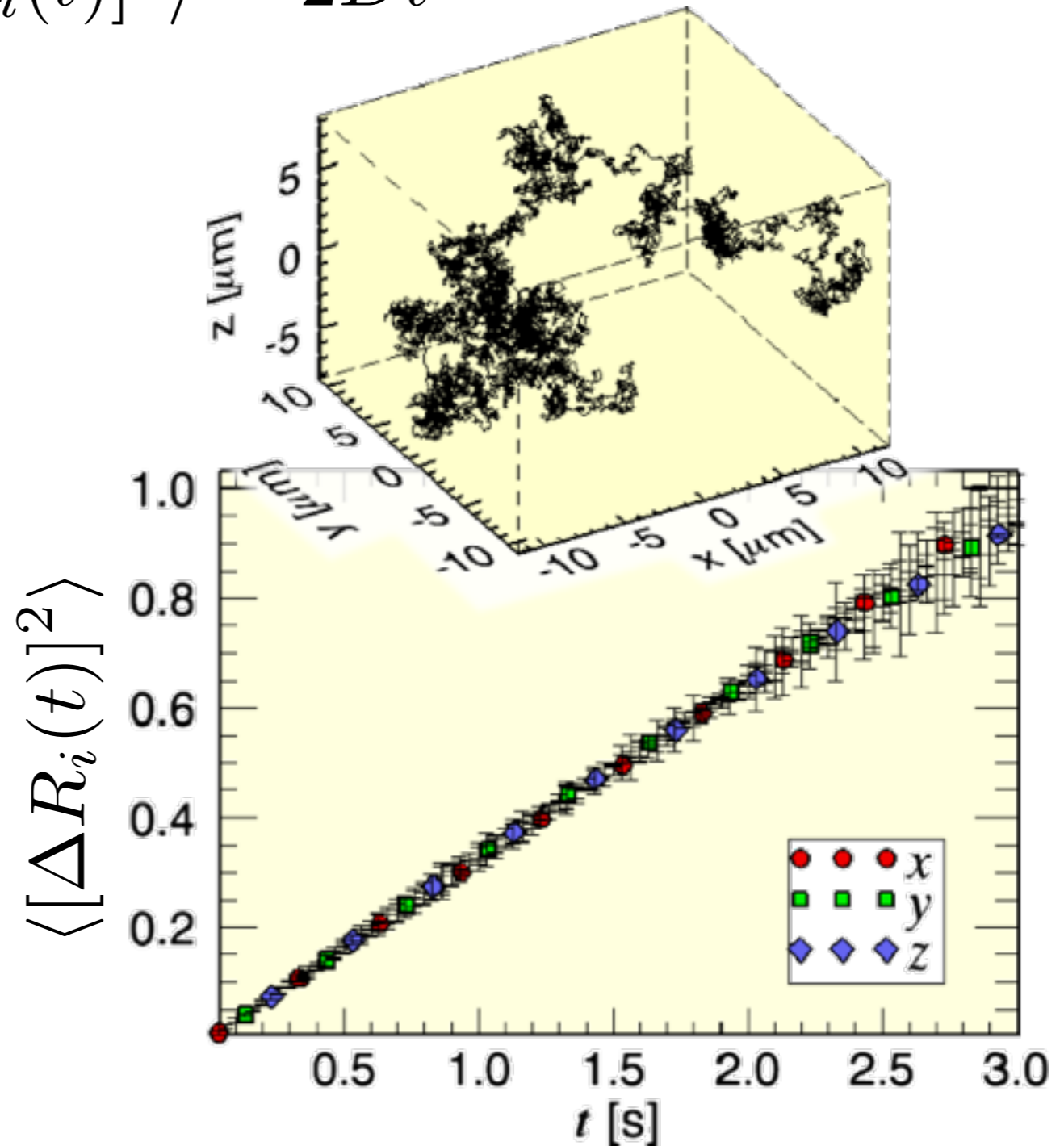
Particle buffeted about by other particles which we cannot see, but whose presence we infer



$$\langle [R_i(t) - R_i(0)]^2 \rangle = \langle [\Delta R_i(t)]^2 \rangle = 2Dt$$

Diffusion

Experiment: Three-dimensional trajectory of a polystyrene bead (radius 0.75 microns) freely moving in a fluid.



$$D = 0.1695 \pm 0.0001 \mu \text{ m}^2/\text{s}$$

In three dimensions

$$\langle |\vec{R}|^2 \rangle = 6Dt$$

What does the diffusion constant depend on?

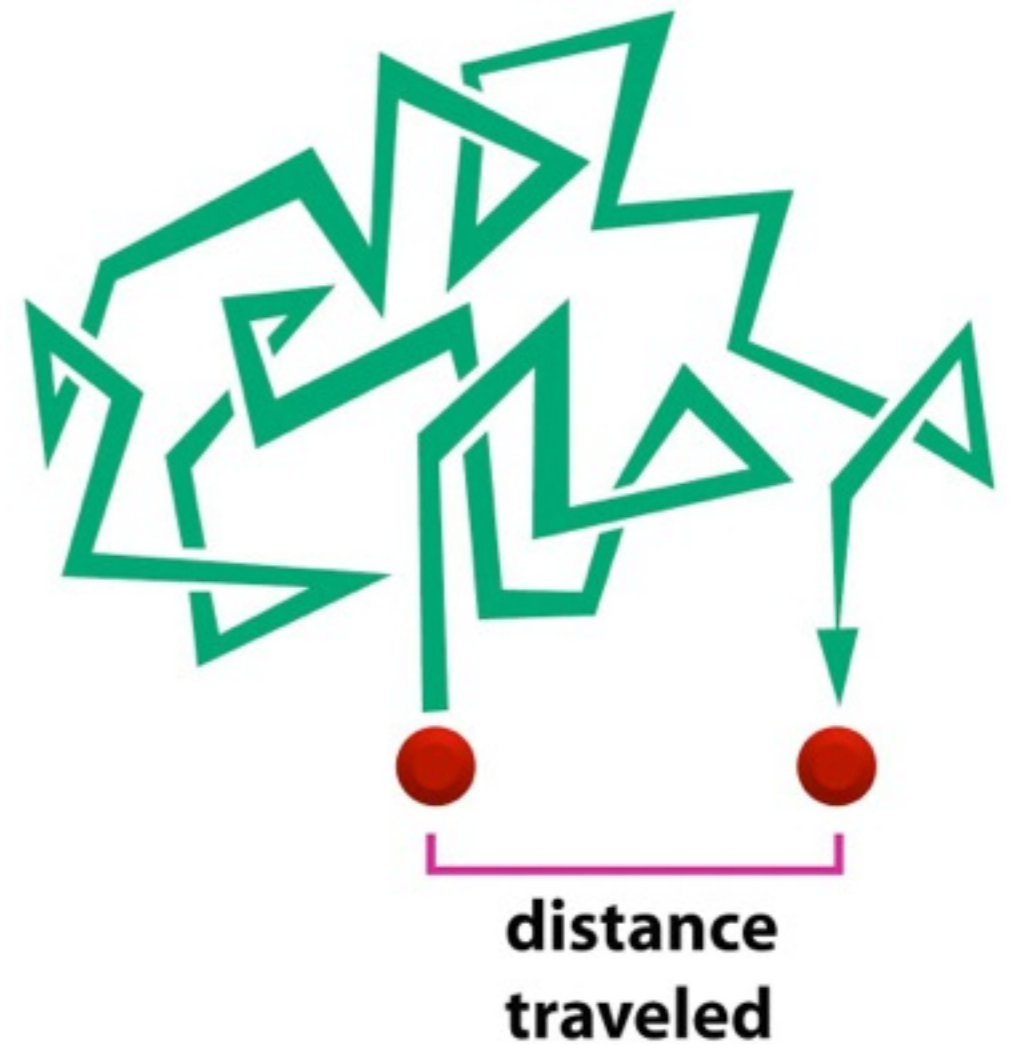


Figure 2-48 Molecular Biology of the Cell 5/e (© Garland Science 2008)

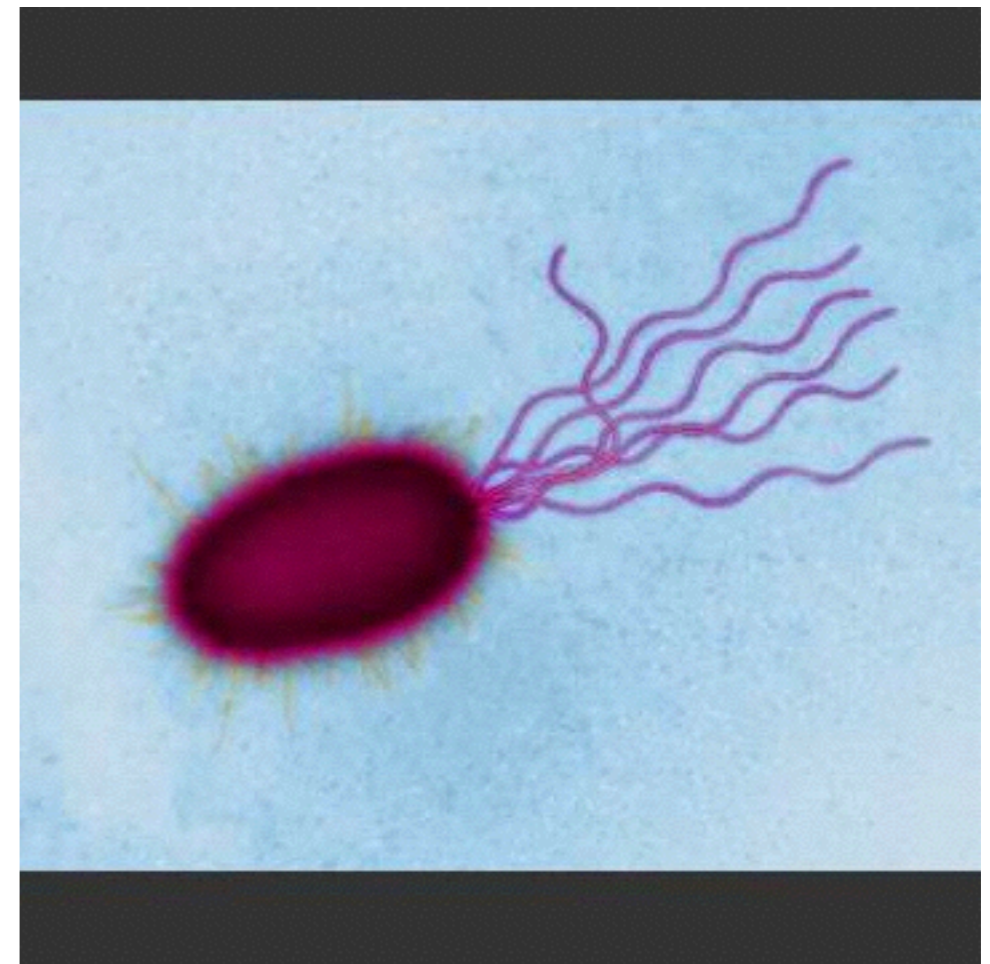
Stokes-Einstein

It's given by

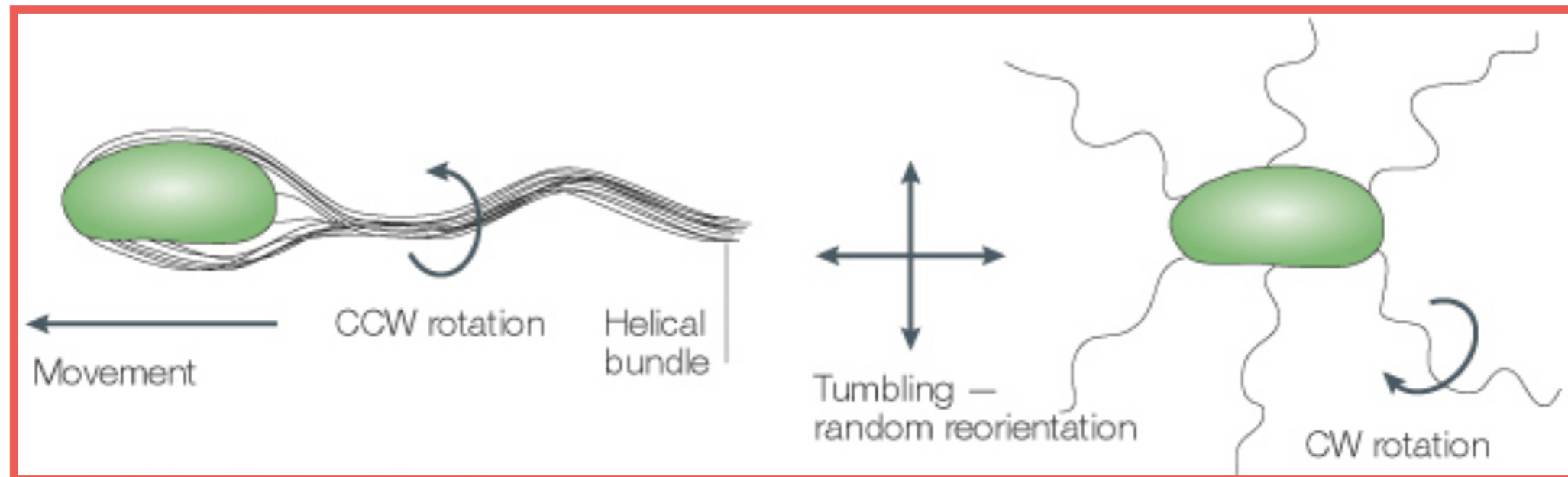
$$D = \frac{k_B T}{6\pi\eta a}$$

A fluctuation-dissipation relation

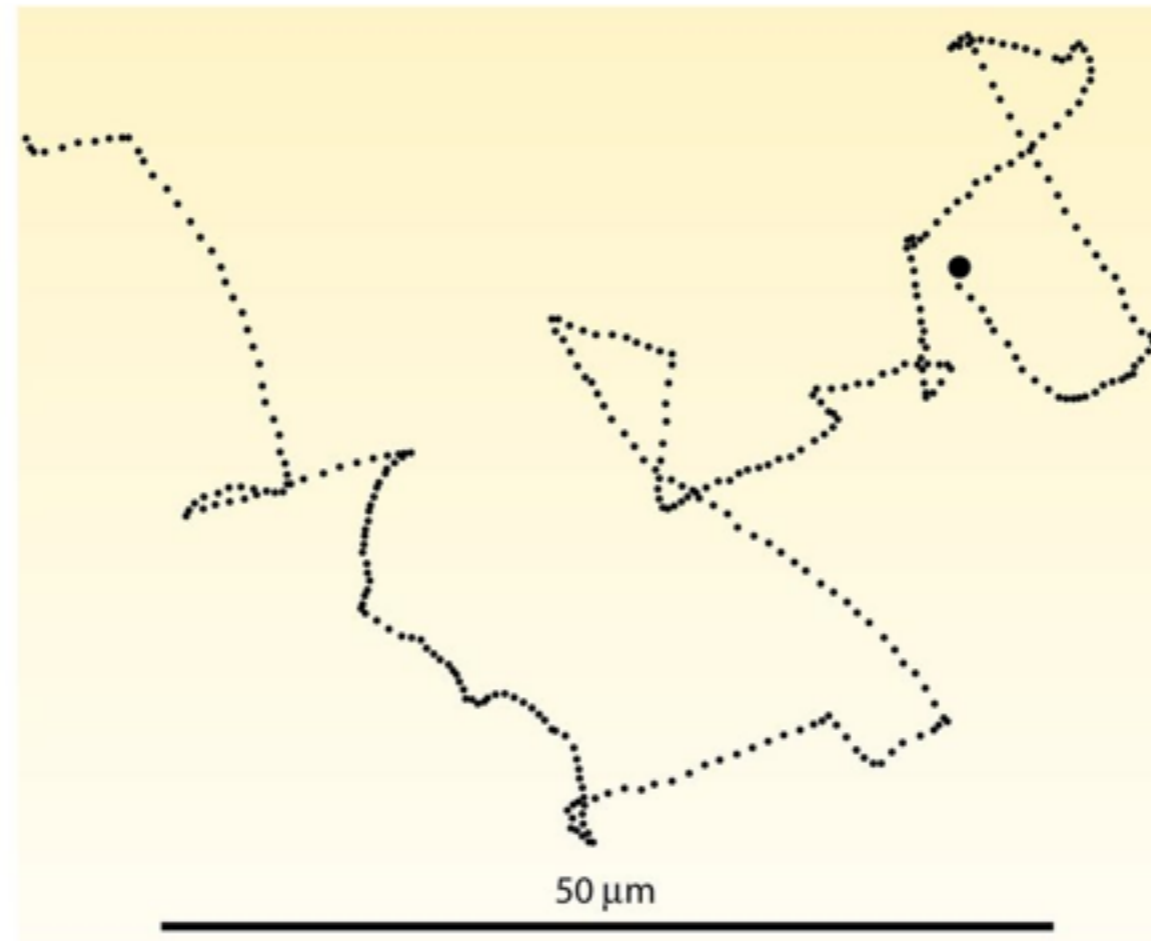
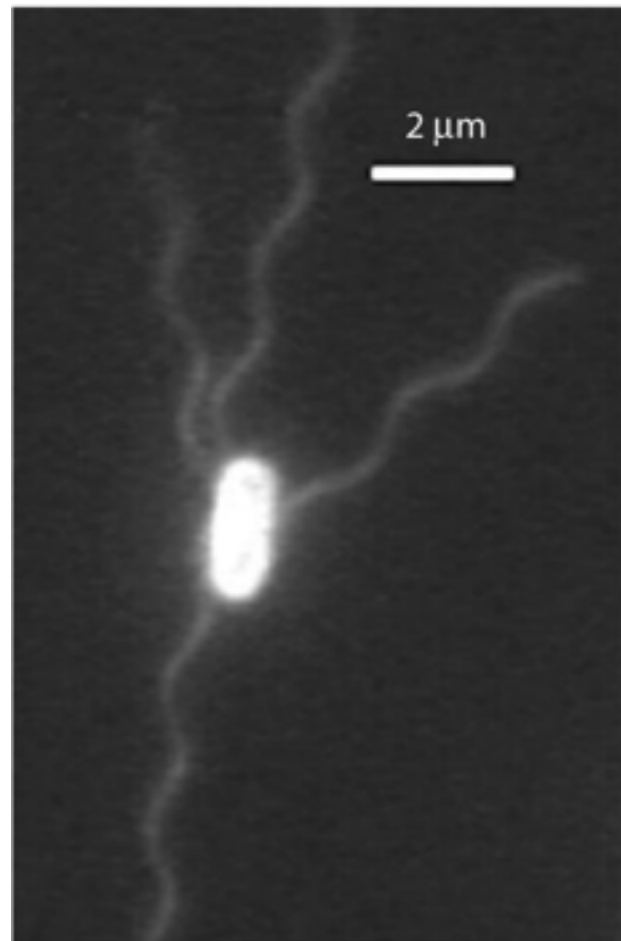
What about the motion of a similarly sized, live bacterium, *E. coli*?



<http://ccdb.wishartlab.com/CCDB/GP2118.jpg>



<http://www.ebi.ac.uk/biomodels/ModelMonth/2009-09/figure1.gif>

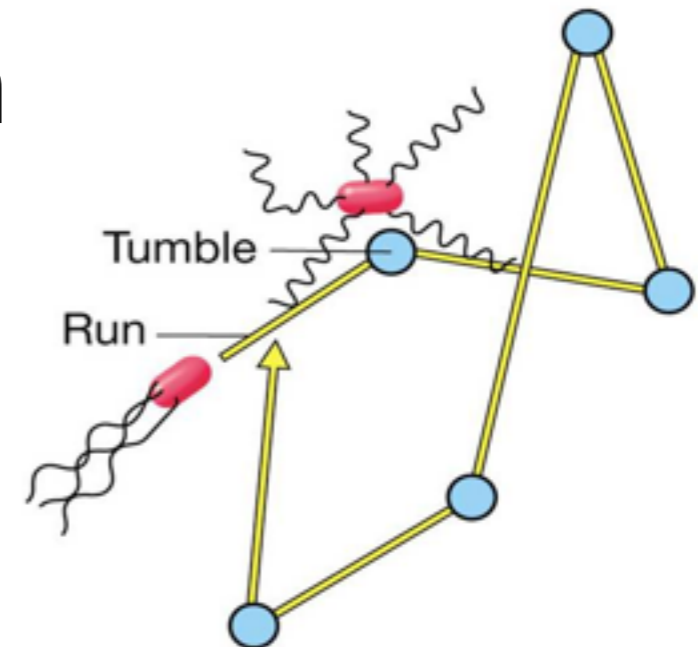


When looked at over a long time, the trajectories look “Brownian”, but are they?

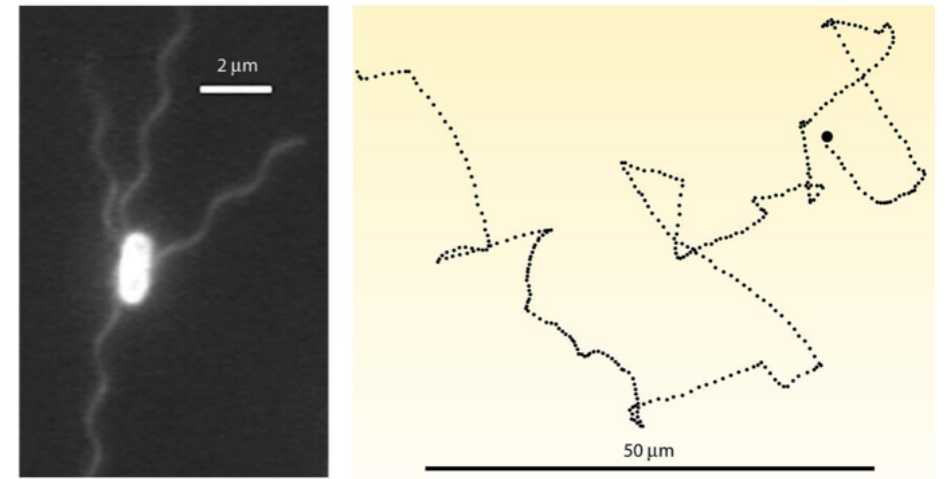
Remember, in thermal equilibrium

$$\langle [\mathbf{R}(t) - \mathbf{R}(0)]^2 \rangle = 2Dt$$

$$D = \frac{k_B T}{6\pi\eta a}$$



The bacterium, *E. coli* moves along its axis at fixed velocity (runs). Micron sized so susceptible to noise



$$\partial_t \vec{r} = v_0 \hat{u} + \vec{\eta}$$

“directed motion” “noise”

Angle diffuses with diffusion constant D_R

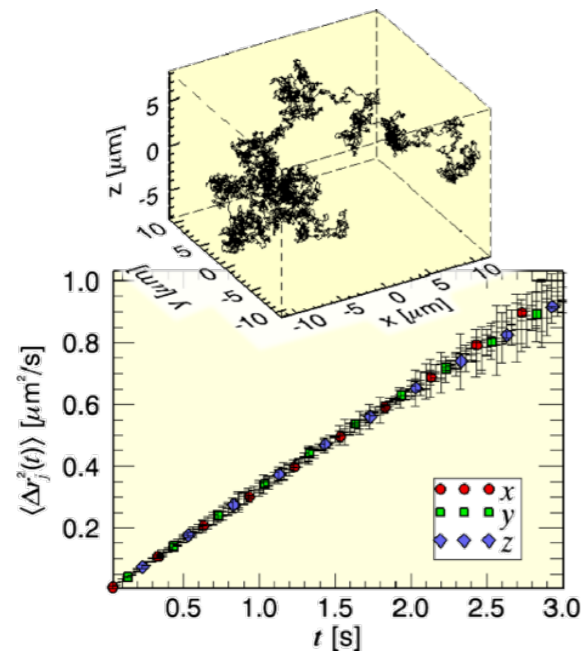
But axis also changes (2d) - an angle θ

$$\partial_t \theta = \eta^R$$

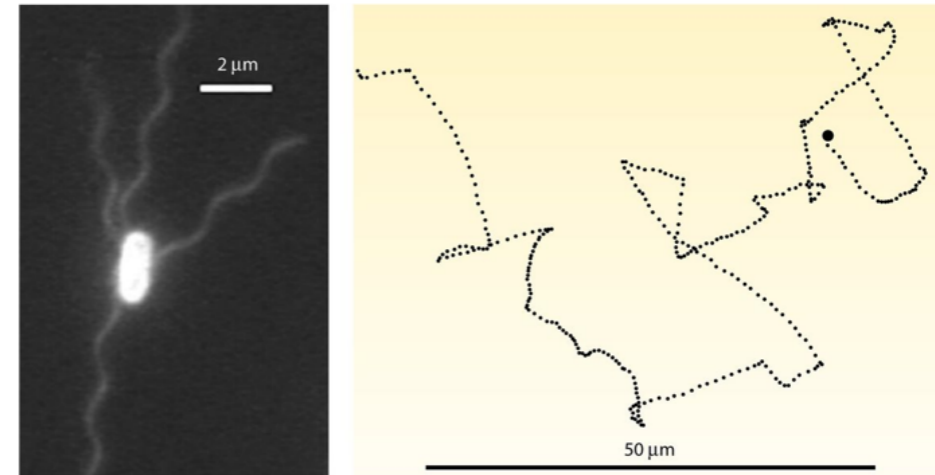
The final result for the particle displacement is

$$\langle [\vec{r}(t) - \vec{r}(0)]^2 \rangle = 4 \left(D + \frac{v_0^2}{4D_R} \right) t = 4D_{eff} t$$

D_{eff} can be much, much bigger than D !

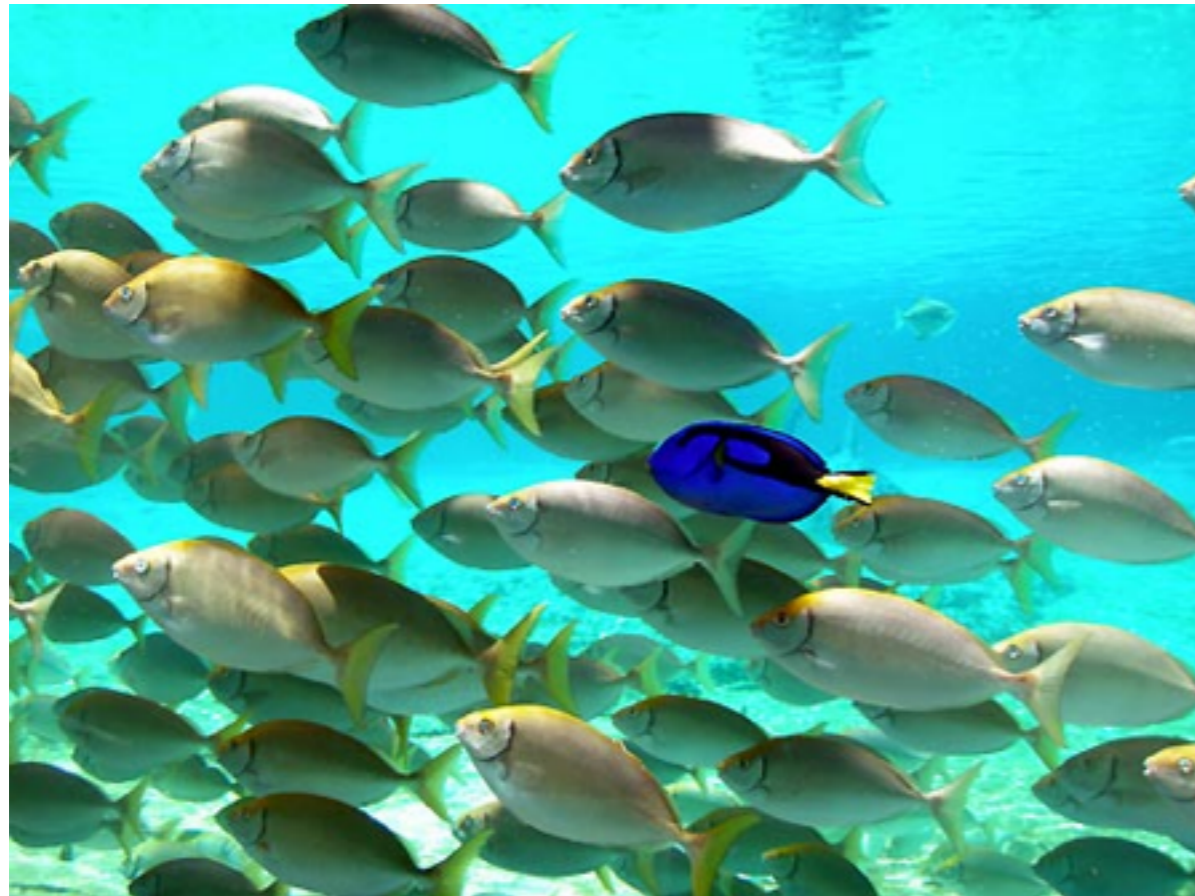


versus



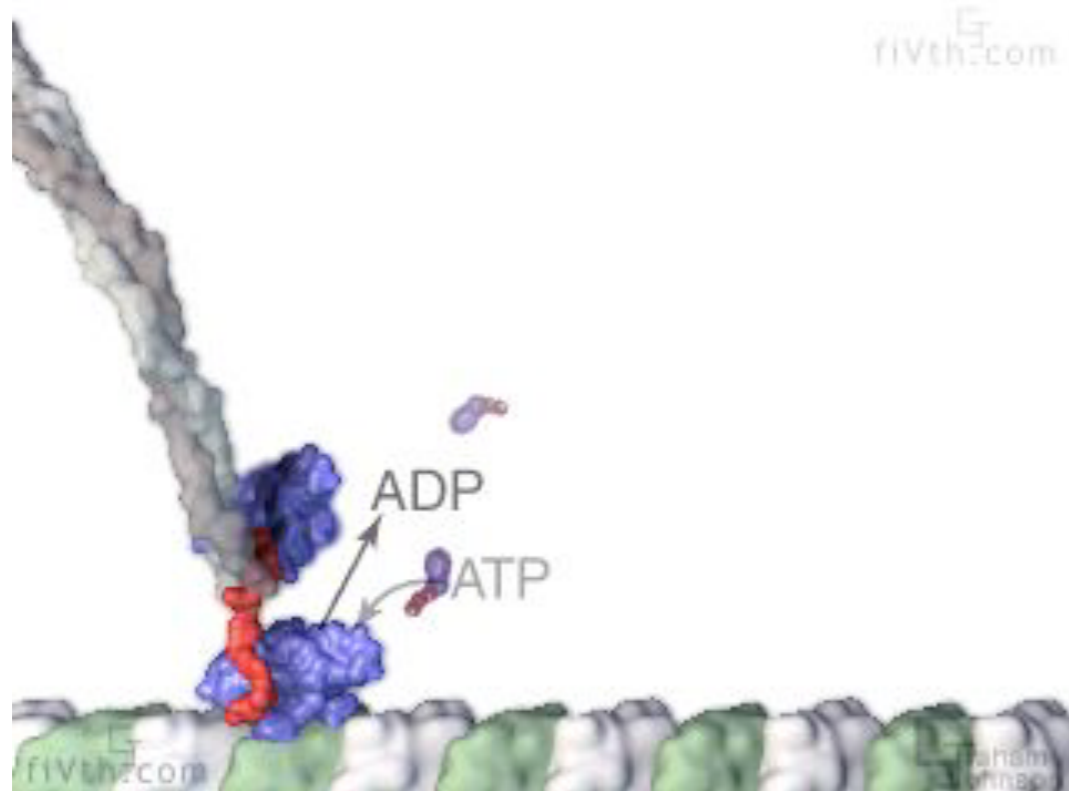
The “passive” colloid and the “living” bacterium are very different. The bacterium appears as if it is diffusing, at long times, but D is not what equilibrium physics predicts. An FDT violation.

The bacterium is “self-propelled” and thus out of equilibrium!



Idea motivating active matter studies: Drive the system out of equilibrium by adding energy on a microscopic scale, as for the self-propelled particle

Viewed from a very general perspective: This is how all cells function!



<http://valelab.ucsf.edu/moviepages/movies.html>

Energy input at the
nanoscale in biological
systems.

ATP hydrolysis releases
energy powering cellular
processes

Summary (so far)

Living matter
Driven at a microscopic
scale.



<http://manbir-online.com/grafics/ageing.jpg>

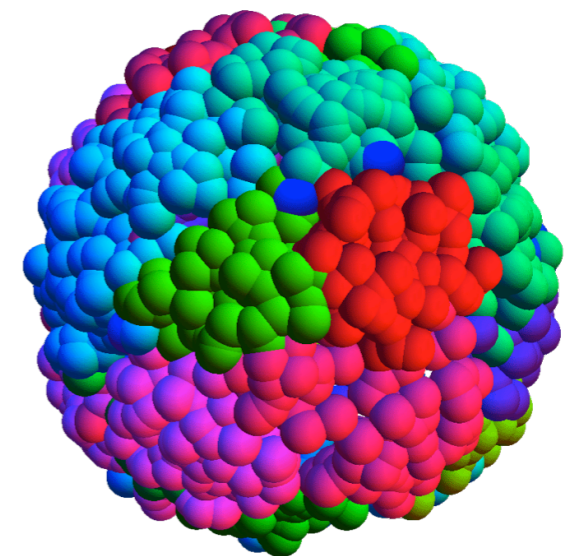
Such systems are
active systems

Active matter ideas provide a powerful way of describing non-equilibrium aspects of biological systems

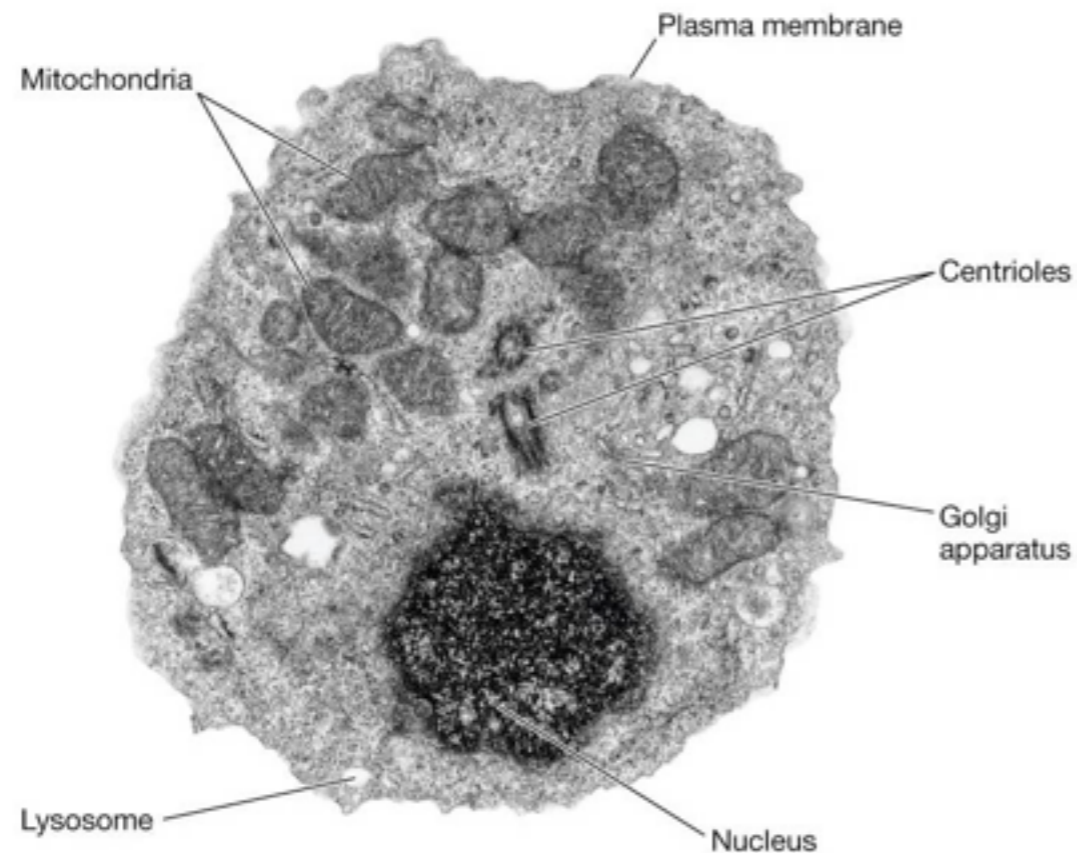
Active Gel Physics, Prost, Julicher and Joanny Nature Physics (2015);
Hydrodynamics of Soft Active Matter, Marchetti et al. Rev. Mod. Phys. (2013);
The Mechanics and Statistics of Active Matter, Ramaswamy, Ann. Rev. Cond. Matt. Phys. (2010).

Used to model: bacterial swimming, cell motility, developmental processes ..

Our work: Use active matter ideas to understand the large-scale architecture of the cell nucleus



About 10^{13} cells in the human body and ~ 200 cell types



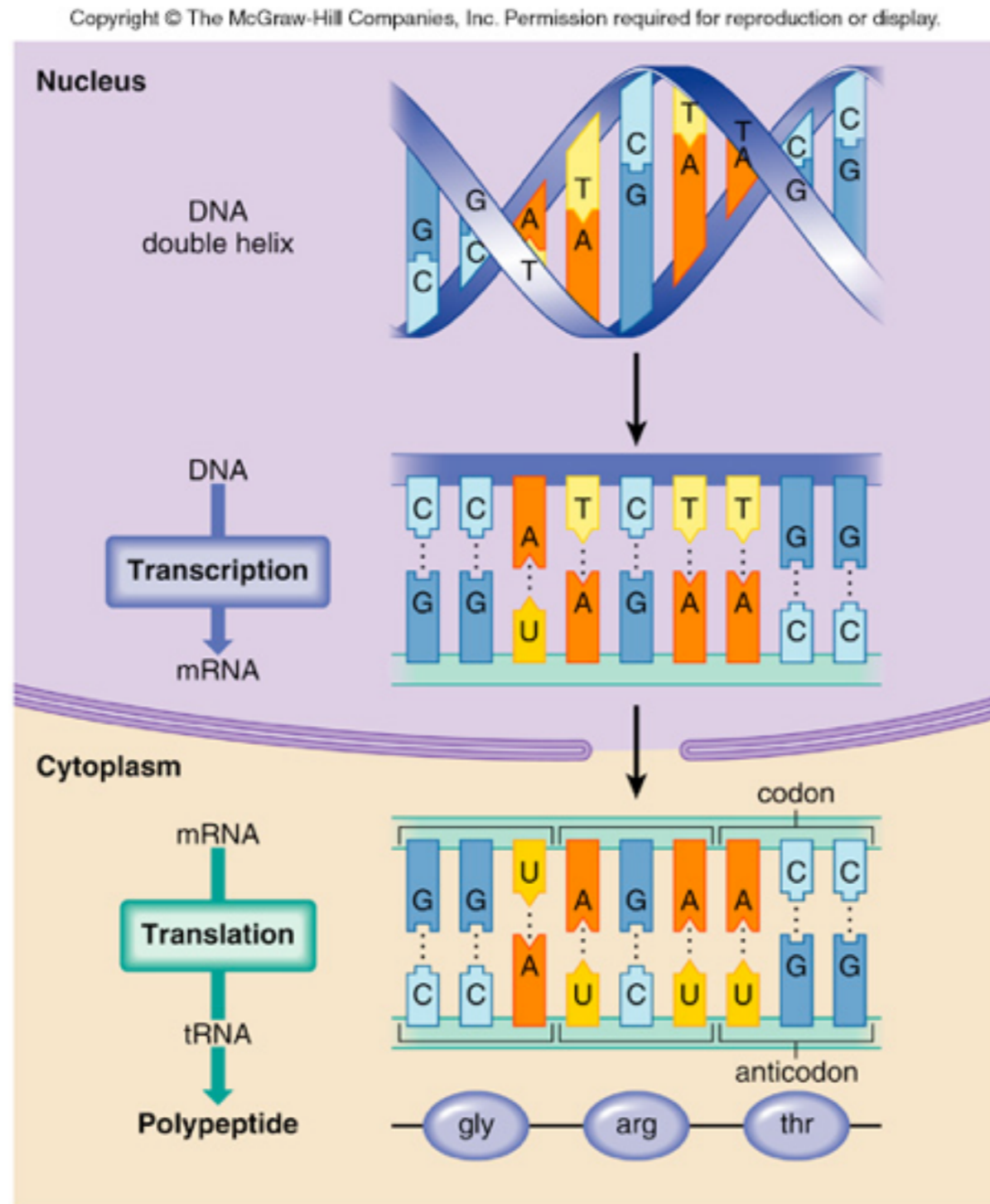
<http://www.oncoursesystems.com/>

23 pairs of
chromosomes
in the nucleus of
each (somatic) cell

Each chromosome
is a single long
DNA molecule

Total DNA length of about 2m in each nucleus, packed
into about a 5-10 micron region

DNA as information carrier



Transcription

Sequence in coding DNA



Translation

Proteins

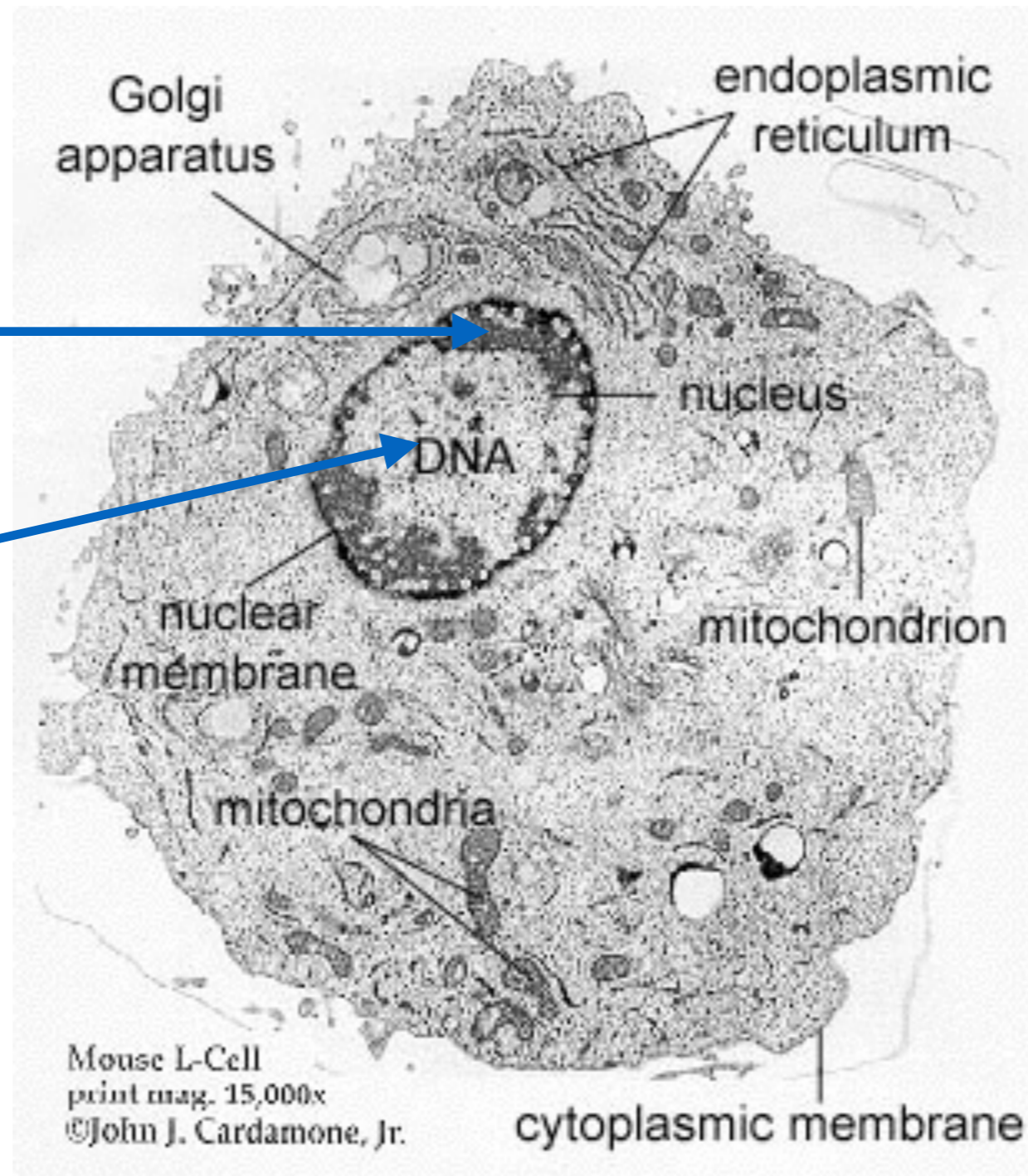
.. and as physical molecule

Nucleus in animal cells

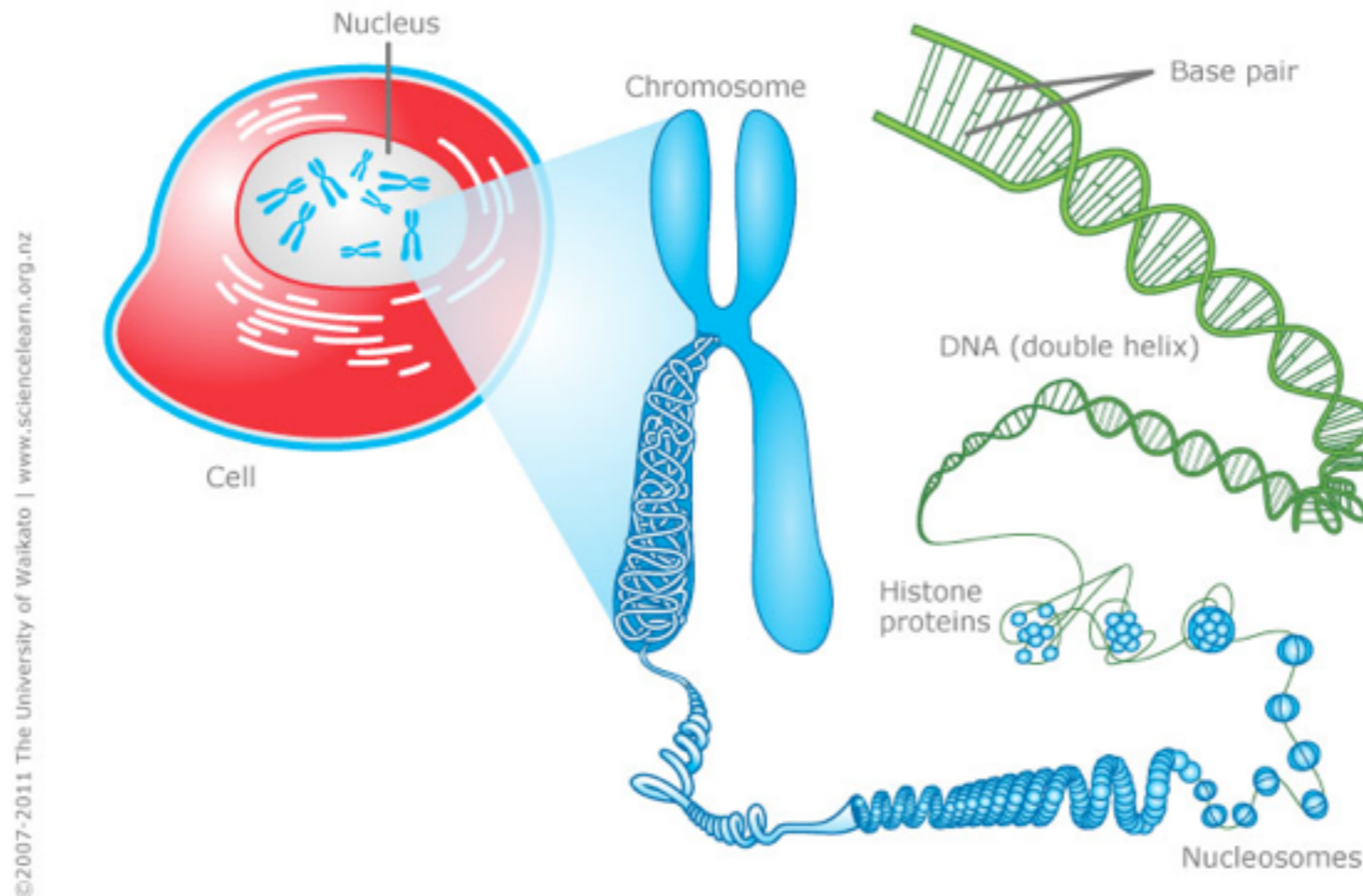
Tightly packed DNA,
gene-poor,
HETEROCHROMATIN



Loosely packed
DNA, gene-rich,
EUCHROMATIN



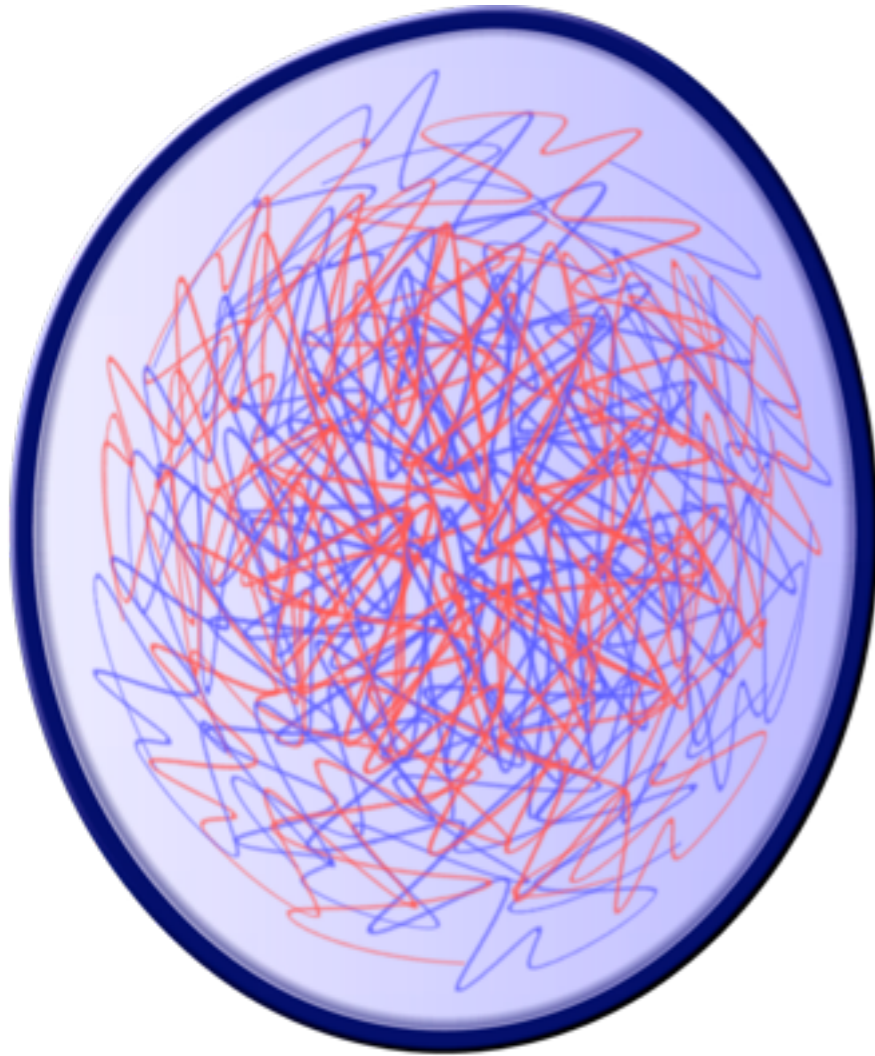
Total DNA length of about 2m in each nucleus,
packed into about a 5-10 micron region



How is DNA
compacted
within the
nucleus?

DNA compacted by **histones**
DNA + histones: **chromatin**
Elementary unit: **nucleosome**

What we used to think ...



During the 1970s and 1980s, most researchers seemed content with the assumption that the nucleus is filled with intermingling chromatin fibers and loops like a dish of spaghetti, an assumption widely reflected by textbooks of cell biology

T. Cremer and M. Cremer, Cold Spring Harb. Perspect. Biol. (2010)

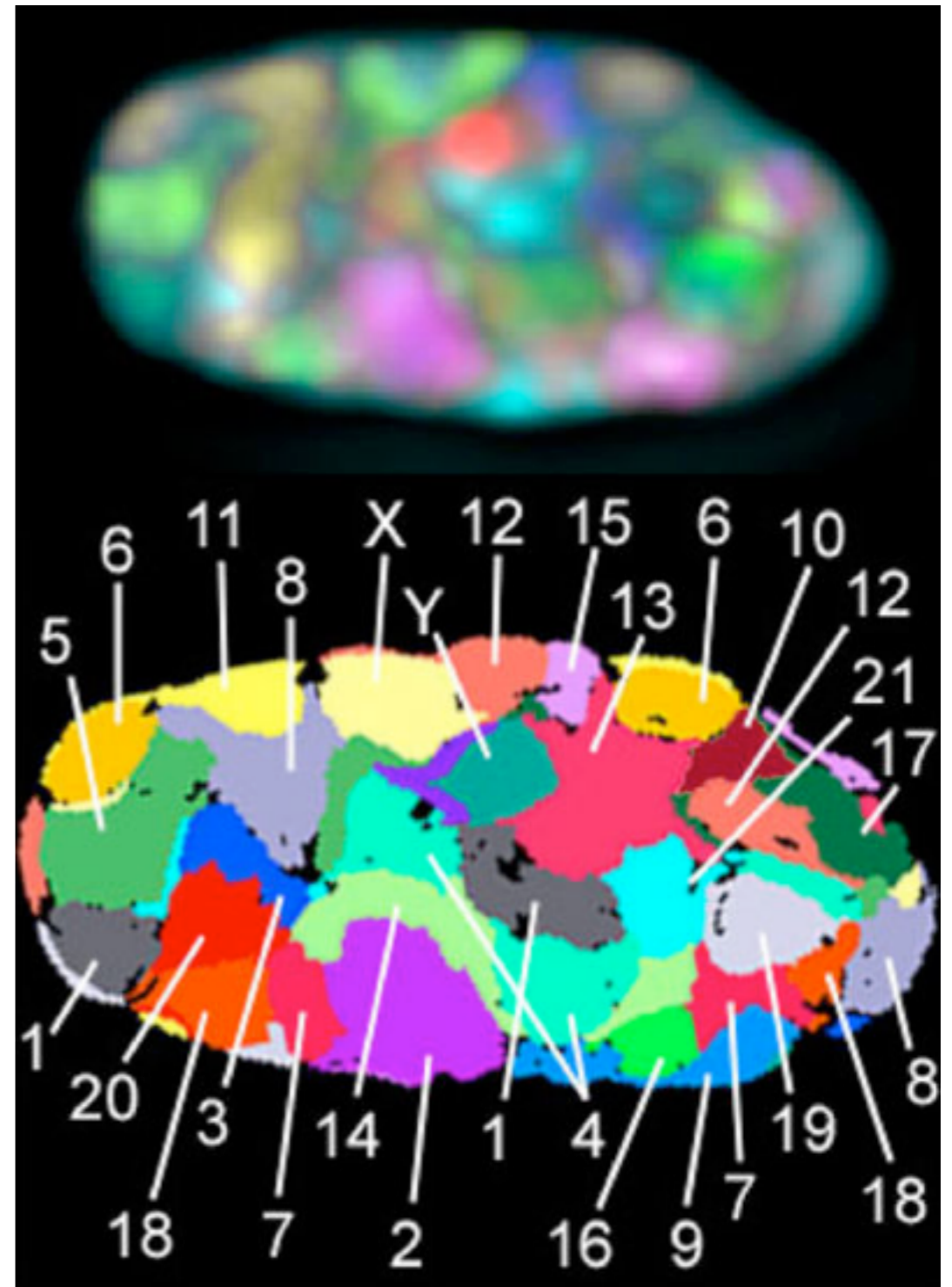
What we know about the large-scale architecture of interphase (between cell divisions) chromatin

Individual chromosomes

- Are territorial
- Have nonrandom arrangements

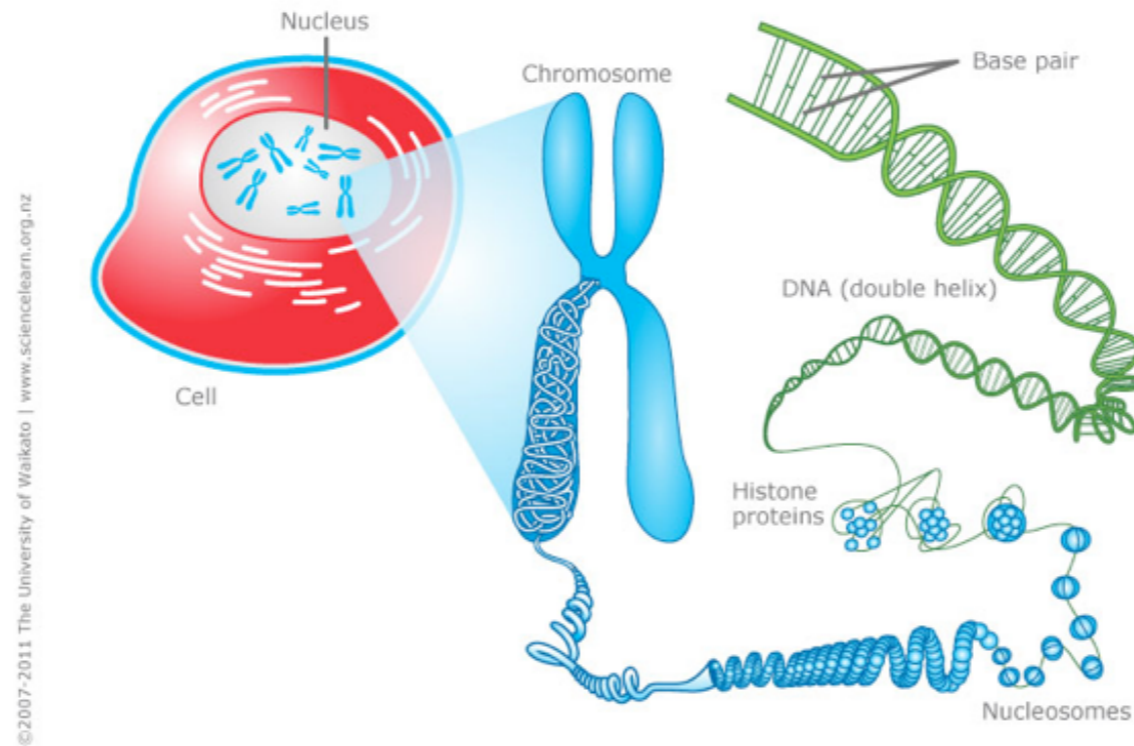
Rabl 1885, Boveri 1908, Stack 1977, 90's: Cremer, Bickmore, Misteli, ..

Bolzer et al, PLoS Biol 3(5) : e157 (2005)



FISH: Each chromosome coloured a different colour by a fluorescent label

Reminder



Chromosome: Long DNA molecule, 23 pairs in nucleus

Histones: Special proteins that pack DNA tightly

Chromatin: DNA + histones + “things binding to DNA”

Nucleosomes: Basic unit of DNA + histones

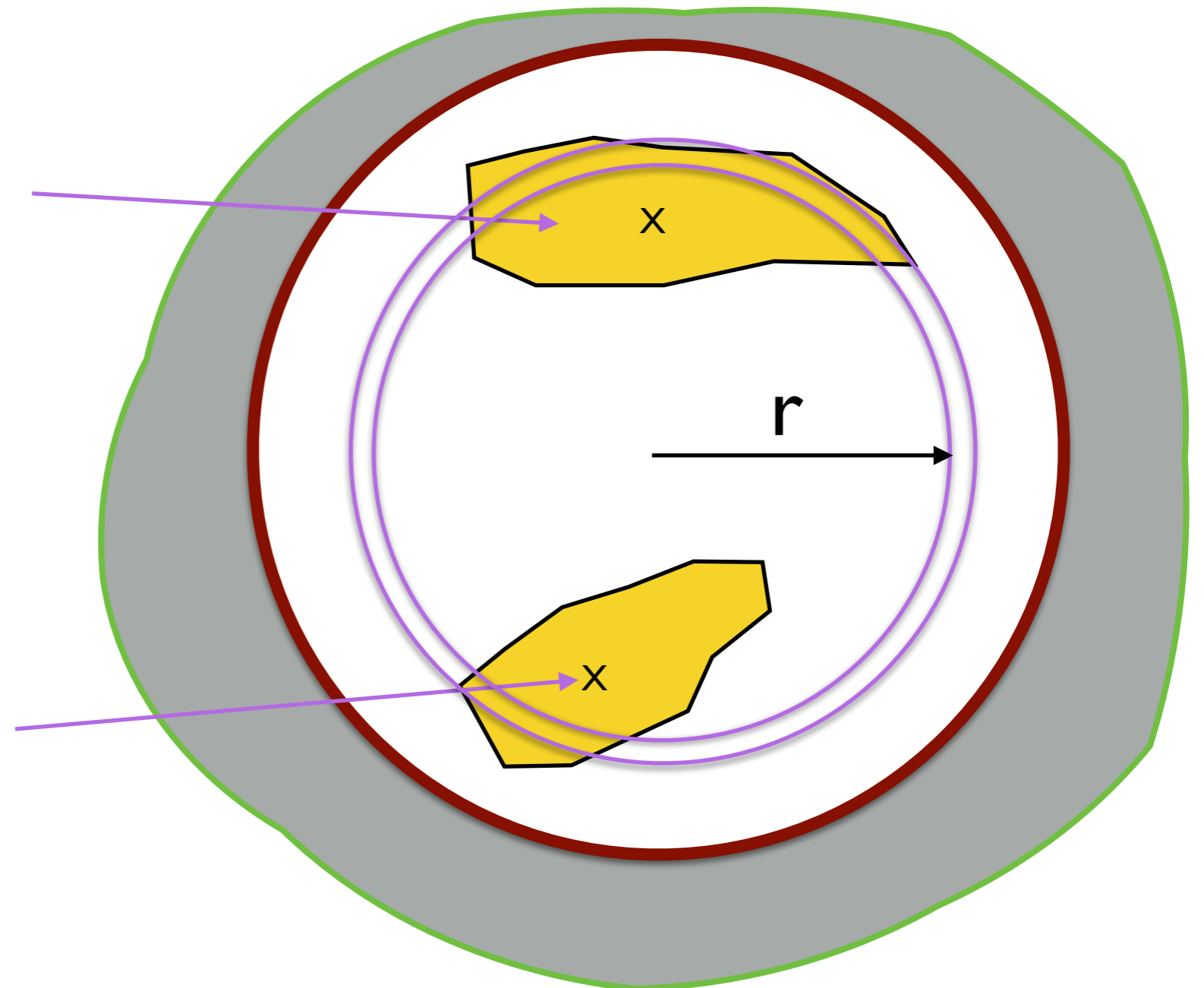
ATP: Energy storage. Hydrolysis releases energy

Chromatin at large scales: What is measured?

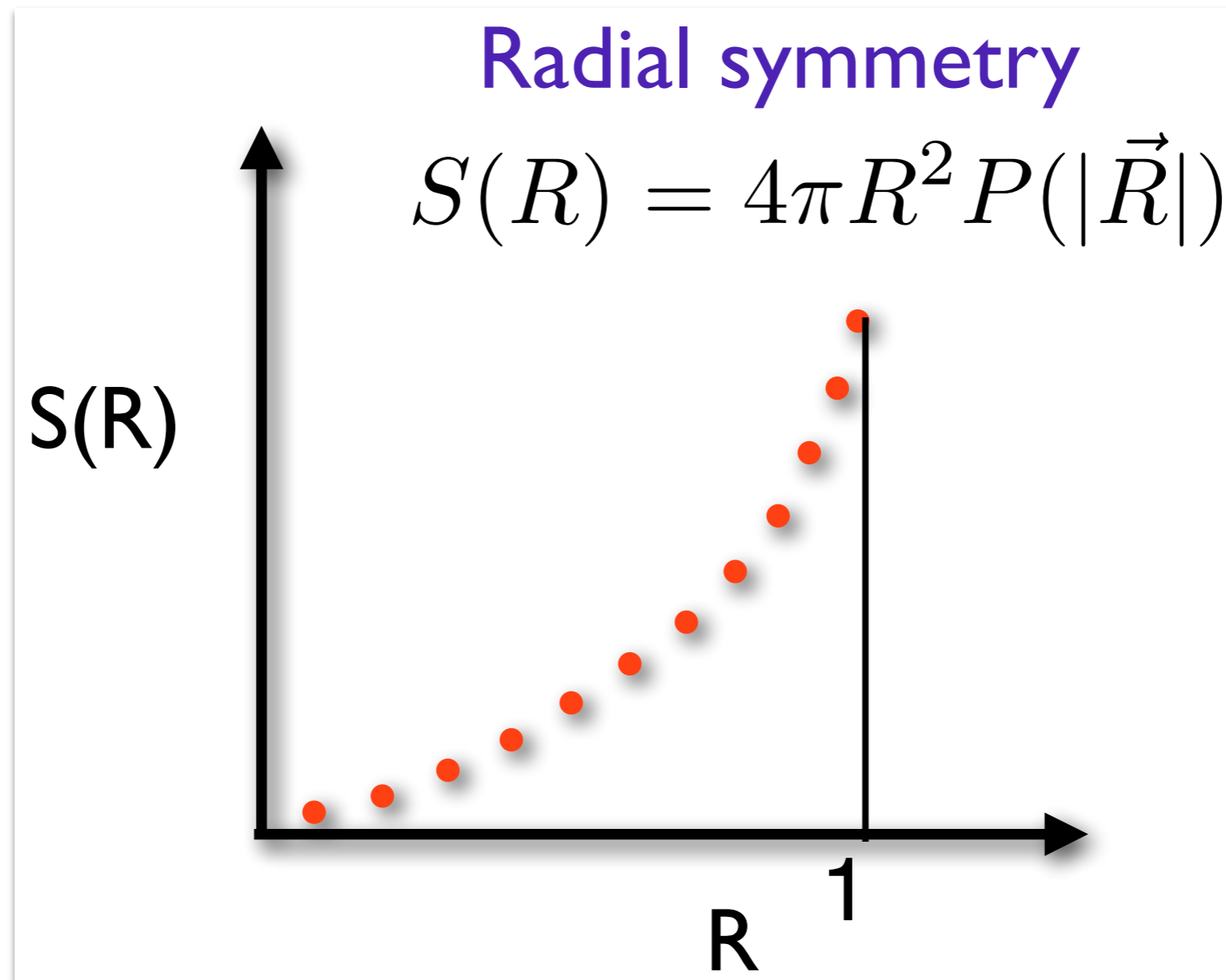
3-d radial densities

DNA density associated with a chromosome

Centre of mass distribution of a chromosome's DNA



Diagnostic for non-random placement

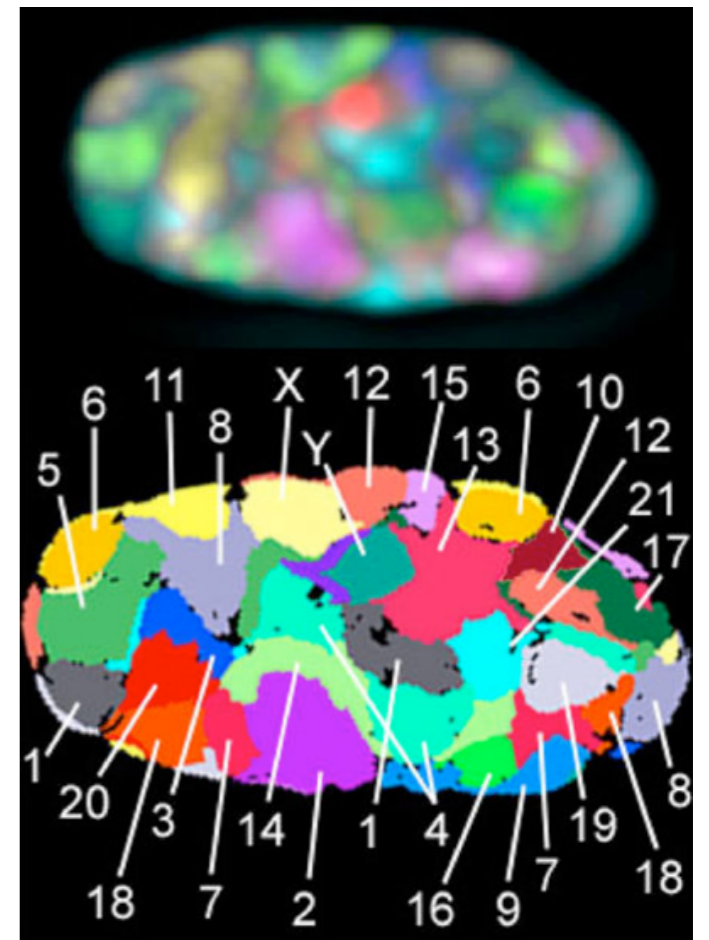


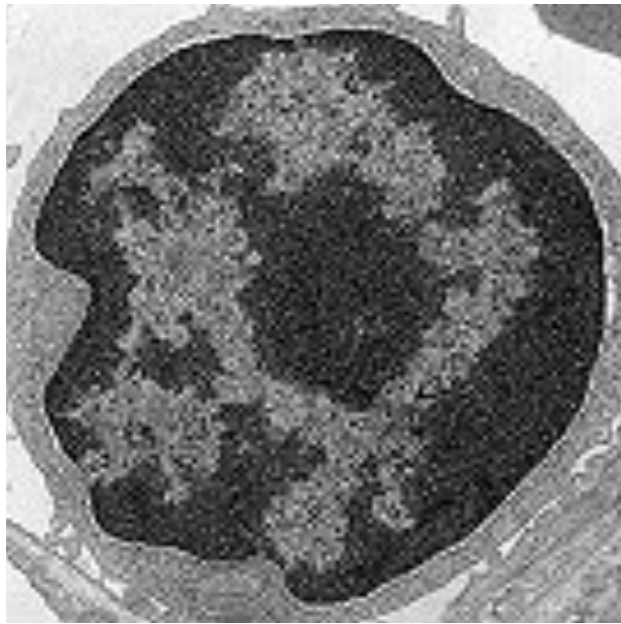
If each chromosome distributed uniformly, then $S(R)$ quadratic, maximum at edge of nucleus

Nuclear architecture is not random

1. Chromosomes are territorial (don't intermingle in the bulk)
2. Gene-rich, actively transcribed DNA (euchromatin) more centrally located than gene-poor regions of DNA (heterochromatin)
3. Individual chromosomes often radially positioned by gene density. More gene-dense chromosomes associated to nuclear interior
4. Radial positioning by chromosome size also seen in some cell types

Bolzer et al, PLoS Biol 3(5)
e157 (2005)

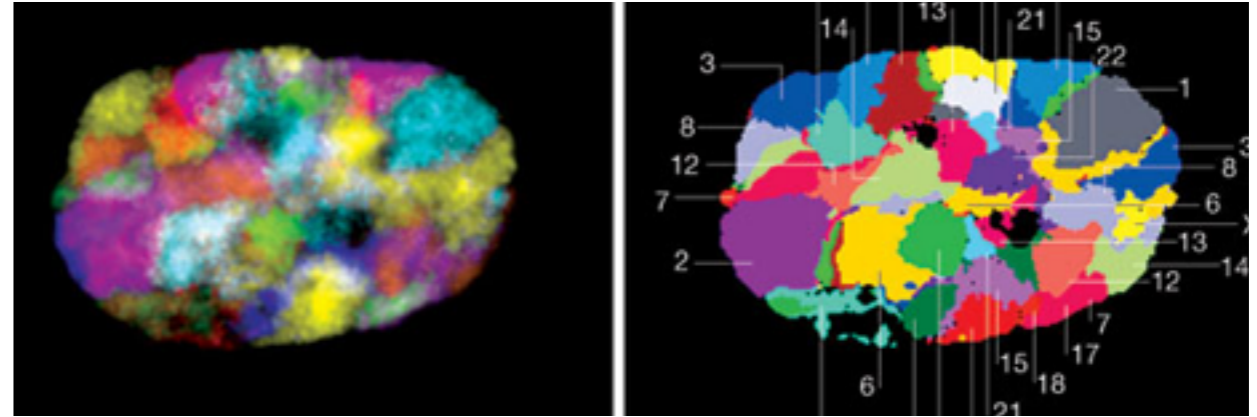




Peripheral gene-poor chromatin/Interior gene-rich chromatin

2

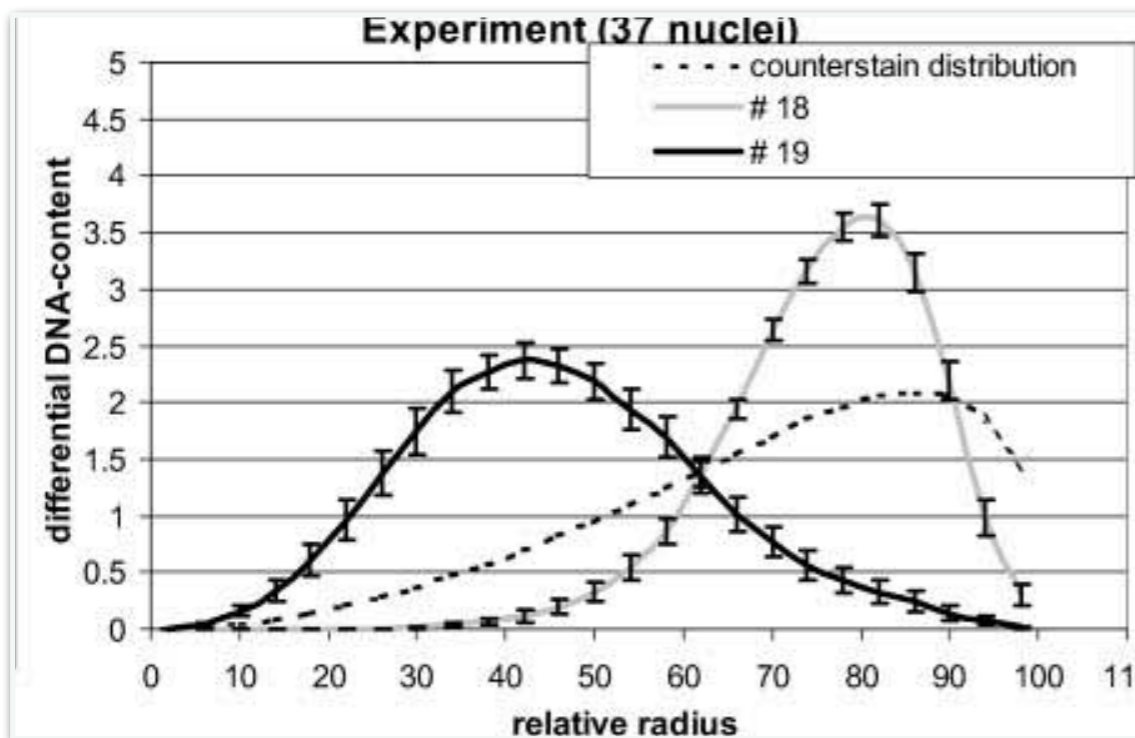
Experimental Data



Chromosome territories

3

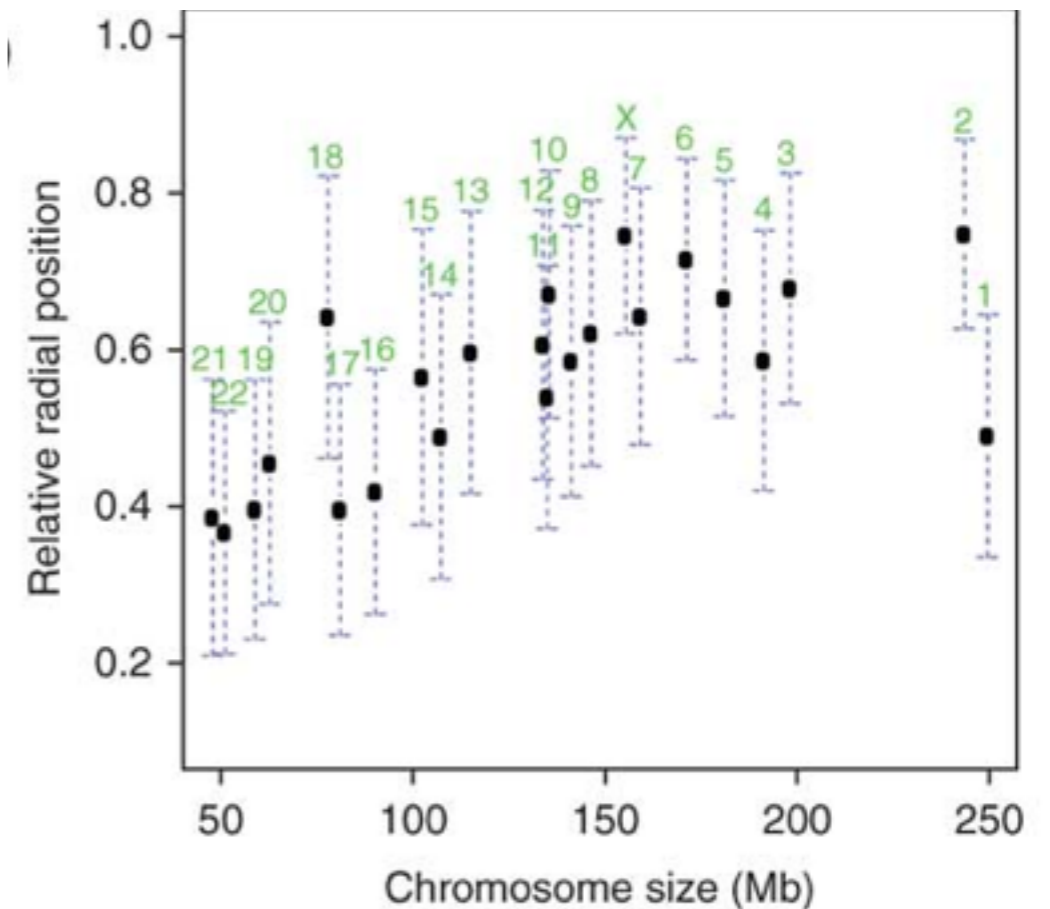
Chromosome positioning by gene density



Kreth et al Biophys J 86(5): 2803-12 (2004)

4

Chromosome positioning by size



Kalhor et al, Nat Biotech 30, 90-98 (2012)

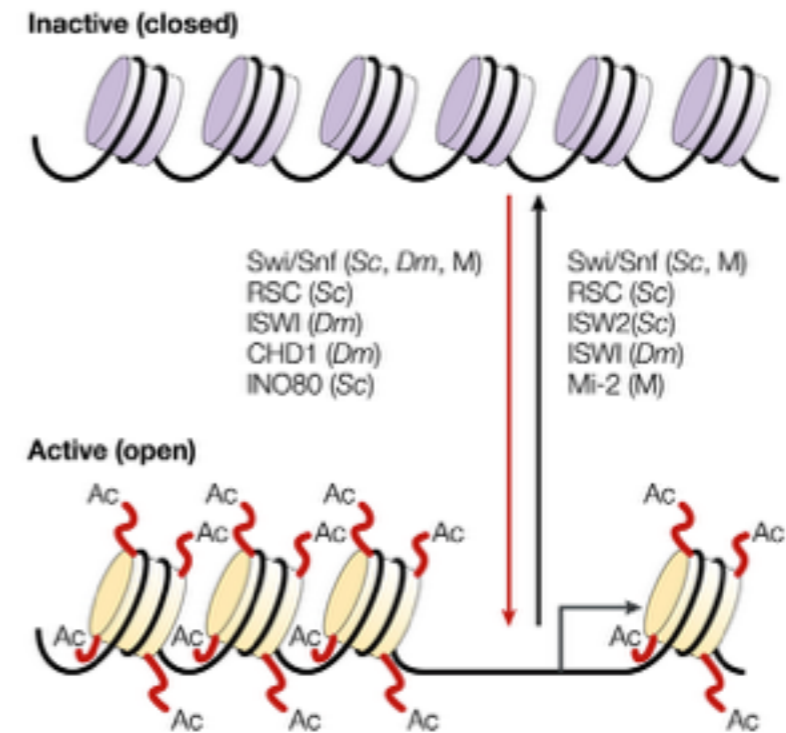
Hypothesis

Activity, inhomogeneous across gene-rich and gene-poor regions, is a central determinant of large-scale nuclear architecture

Where does activity come from?

Chromatin in living cells has many energy consuming (active) processes which act on it, exerting forces locally

Transcription, chromatin remodelling, DNA repair ..



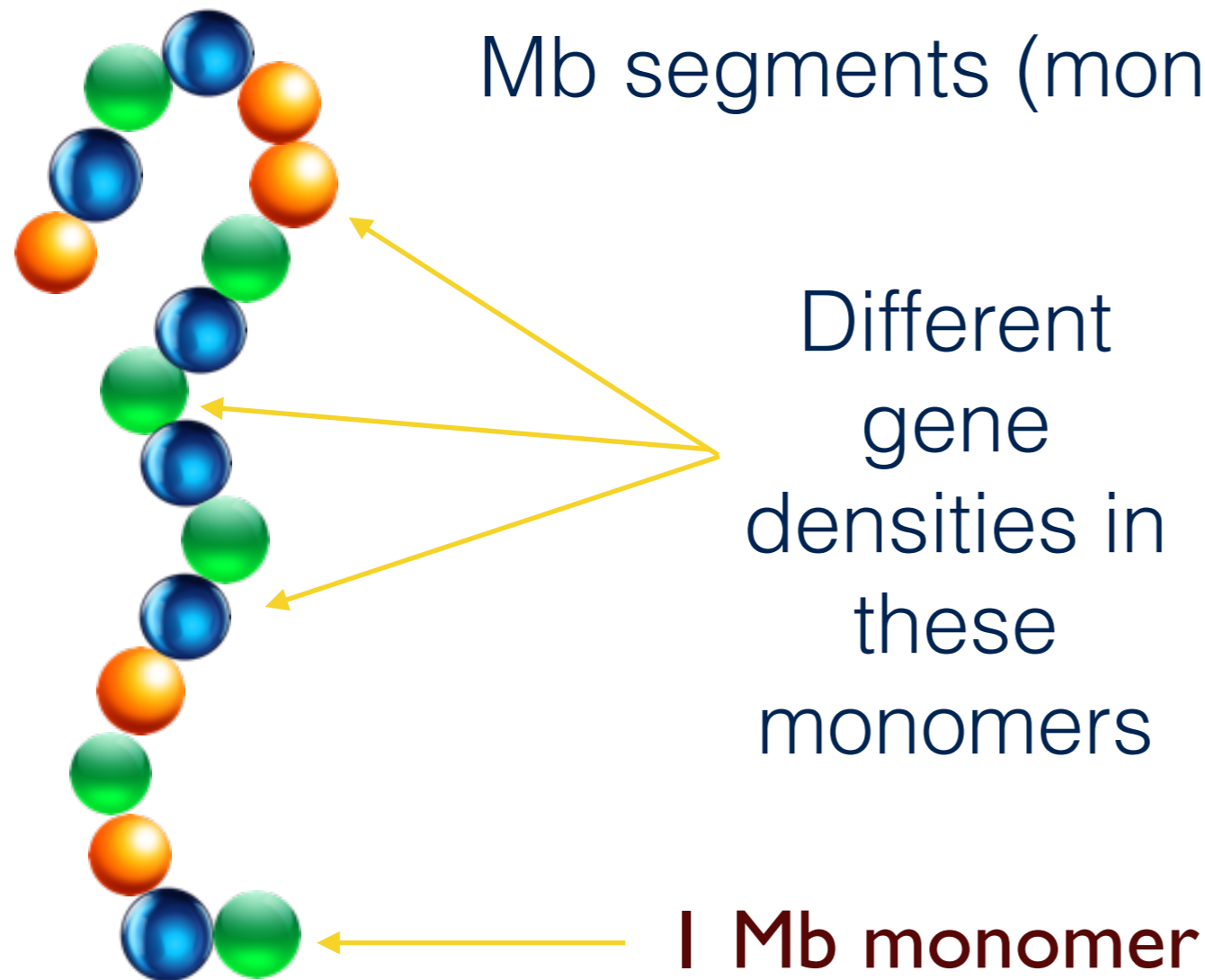
Nature Reviews | Molecular Cell Biology

Tsukiyama, Nat. Rev. Mol. Cell Biol. 3, 422-429 (2002)

All theoretical work so far on nuclear architecture ignores such effects

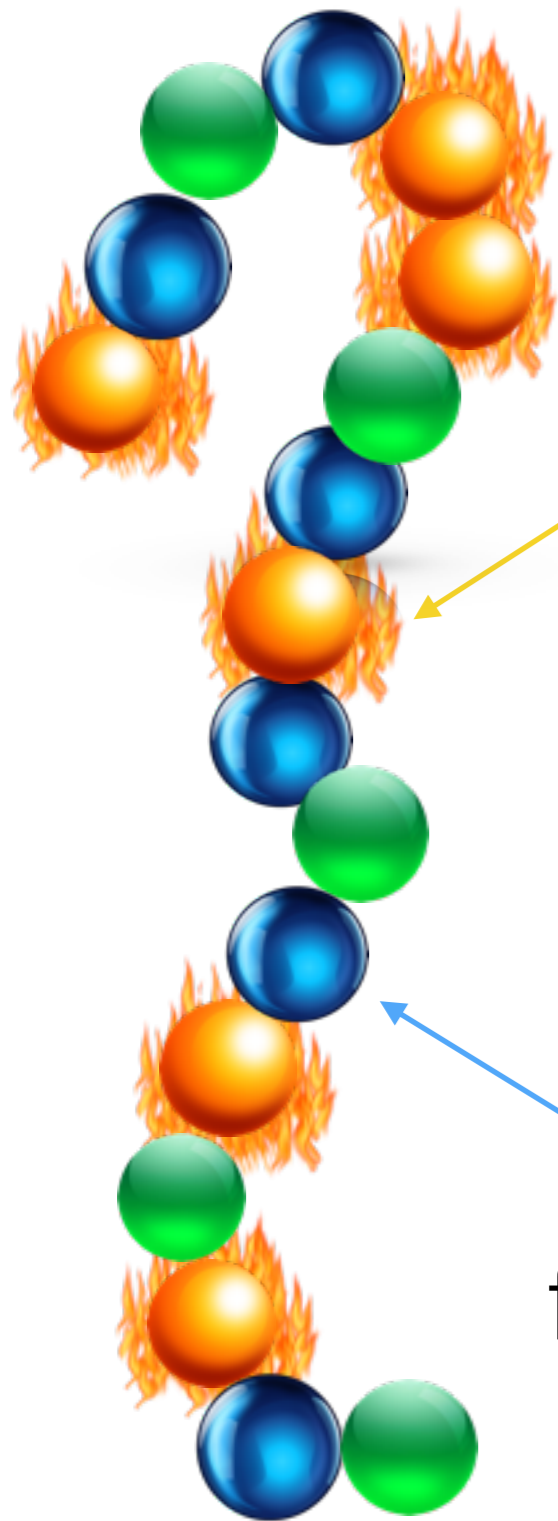
A model for activity of chromatin

Model each chromosome as a set of 1 Mb segments (monomers)



Such 1 Mb segments are known to be “building blocks” of chromosome territories

The “activity” of each monomer should be set by (transcription levels of) the genes it contains



More active:

Larger
fluctuations.
High effective
temperature

Less active:

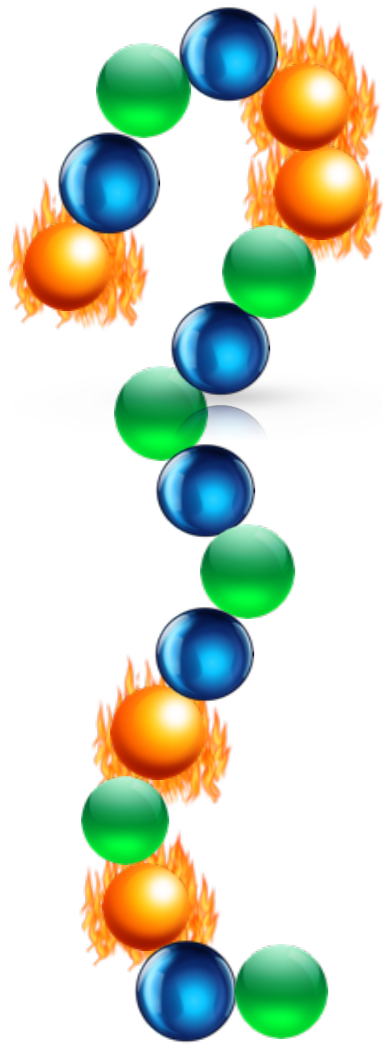
Smaller
fluctuations. Low
effective
temperature
(= physiological)

The “activity” of each 1 Mb monomer comes from driving at 10-20 bp scale. Large scale separation

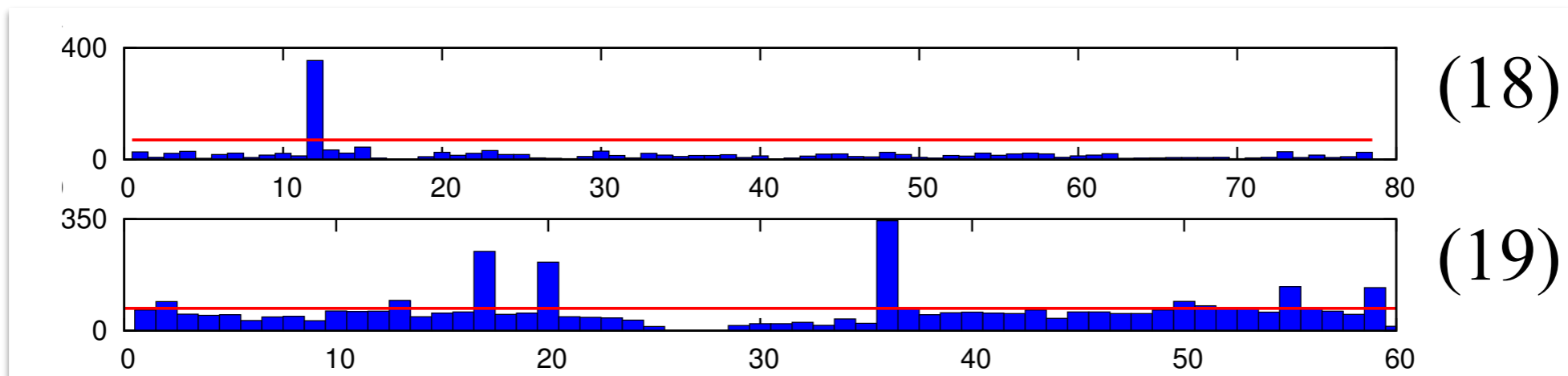
Each such event consumes energy and exerts forces. Once averaged, translates physically to random forces on monomers

Coarse-grained, equivalent to a temperature, but not the same across monomers
Models physical effects of activity most simply

Simplest model ignores cell type specificity



1. Compute gene density across each 1 Mb segment on each chromosome
2. Consider the top 5% of monomers by gene density.
3. Make them “active”; see a larger effective temperature ($T = 20$; passive: $T = 1$)
4. Each chromosome has a unique pattern (a fingerprint) of active/passive monomers



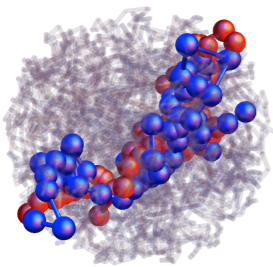
Brownian dynamics, 3-d: 6098 monomers, Gene density: GENECARDS database
 Self-repelling monomers, spring potential for bonds, Gaussian core potential
 Varied nuclear shape: spherical, ellipsoidal + passive & active confinement
 Fraction of permanent loops Random loop model: Bohn et al [PRE 76, 051805 (2007)]

$$\zeta \frac{d\mathbf{r}_i}{dt} = \mathbf{F}_i + \eta_i$$

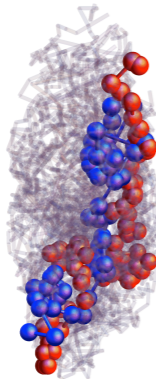
$$\langle \eta_i^\alpha(t) \eta_j^\alpha(t') \rangle = 2k_B T_i \zeta \delta_{ij} \delta(t - t').$$

We generalise the model of [Kreth et al, Biophys J 86(5): 2803-12 (2004)] to include activity, active and passive confinement and varied nuclear shapes

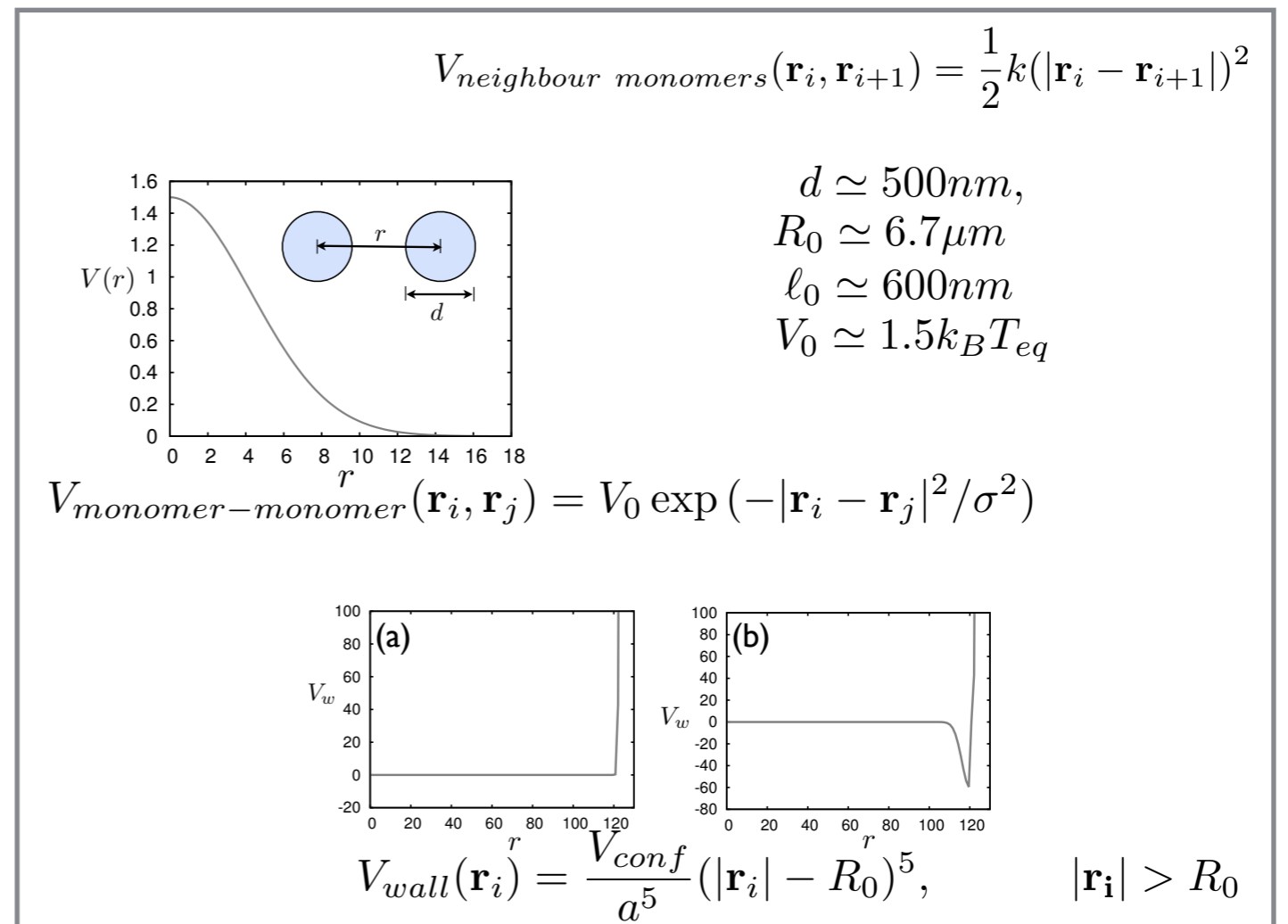
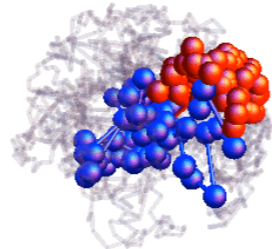
A.



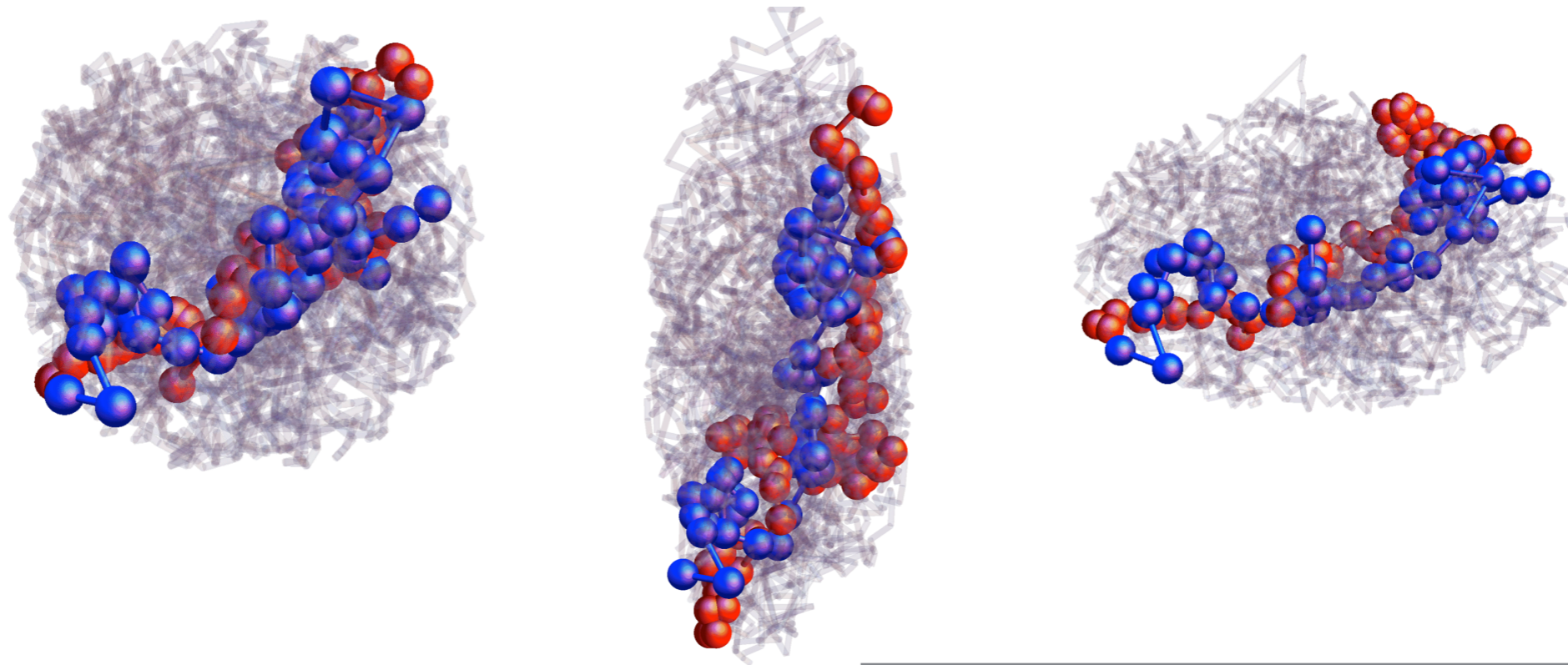
B.



C.



Our model simulates
individual chromosomes
within a nucleus

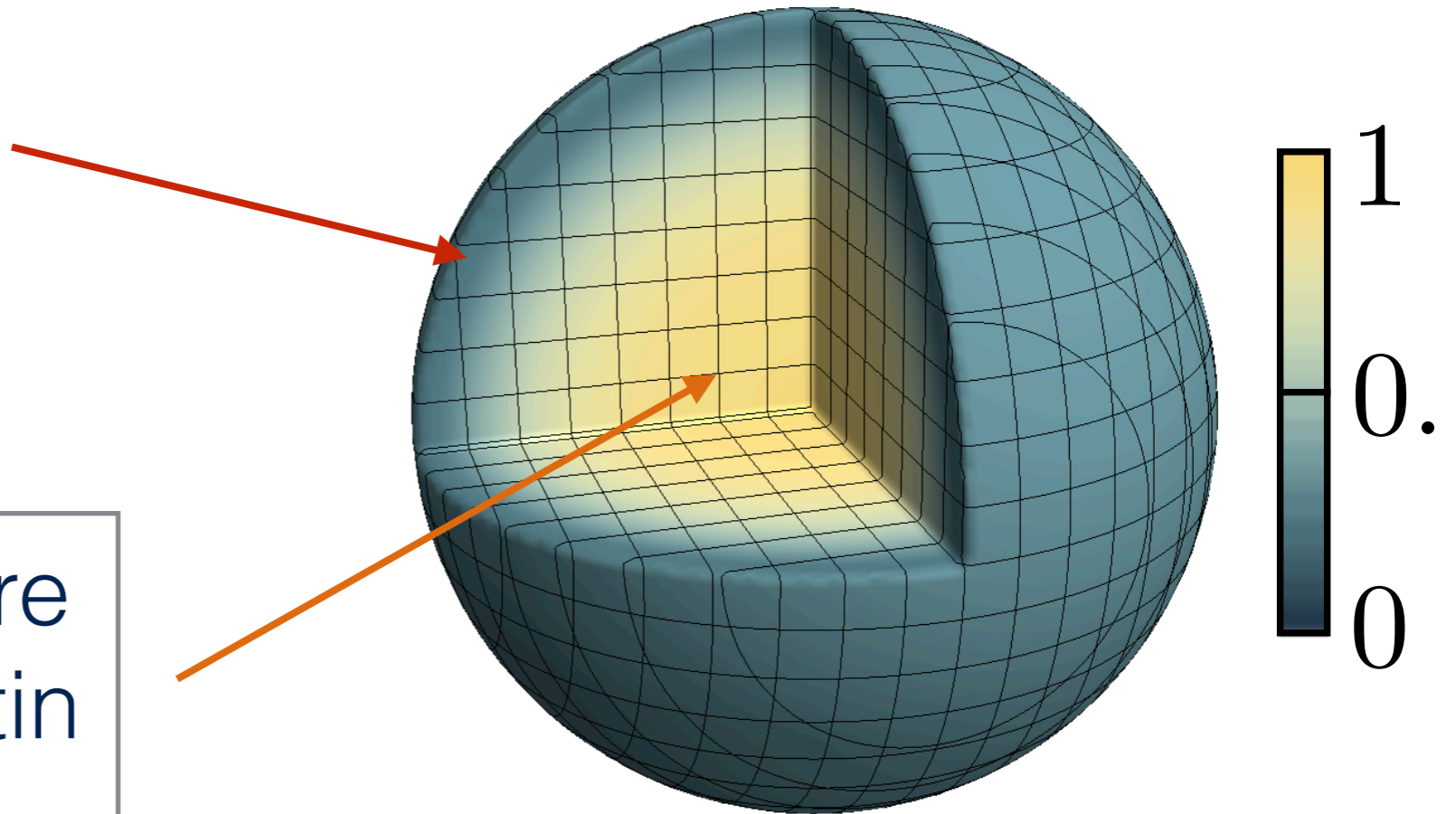


Chromosome 18/19

Theoretical Predictions

Gene-poor, less active chromatin (heterochromatin) near periphery

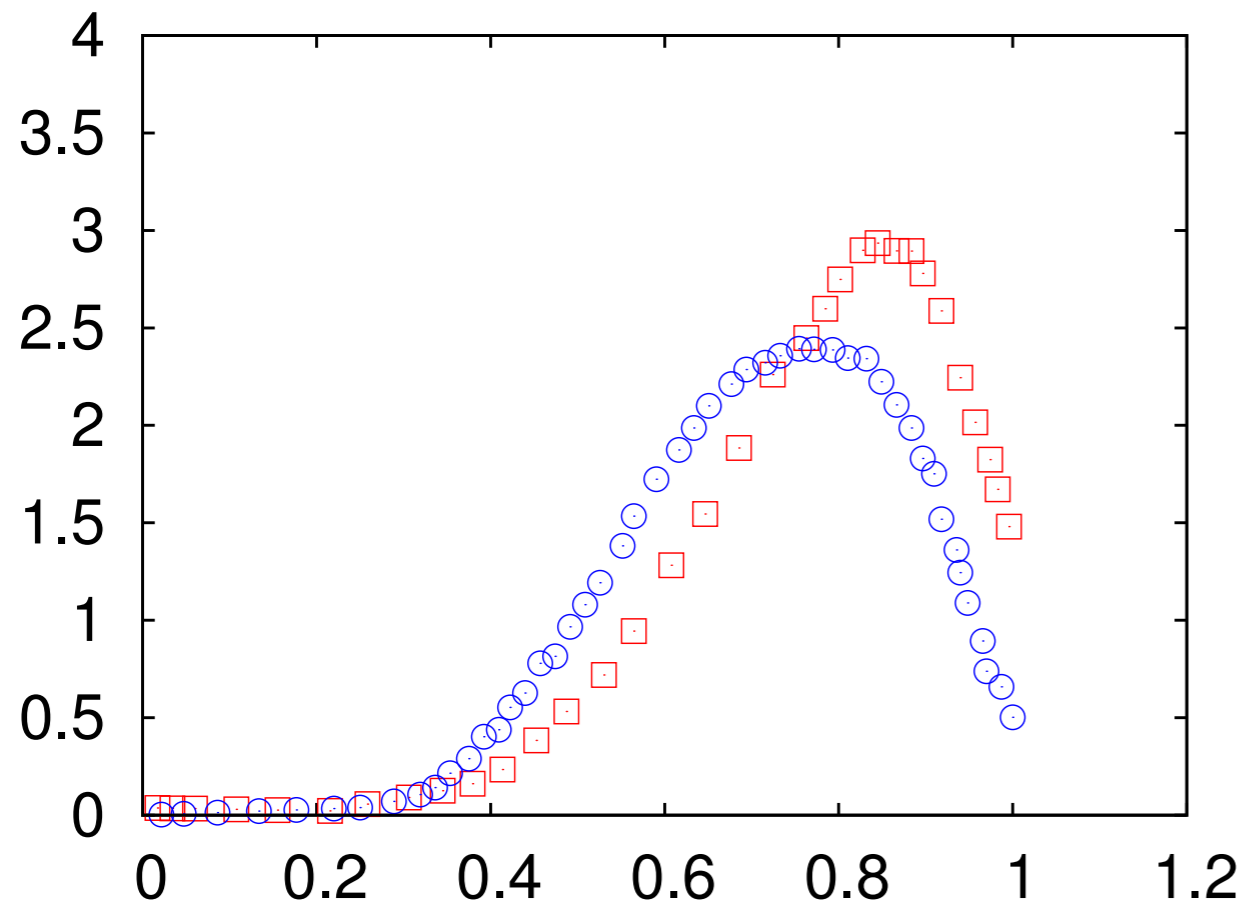
Gene-rich, more active chromatin (euchromatin) more central



Shading indicates local gene density, low = dark, high = bright

Theoretical Predictions

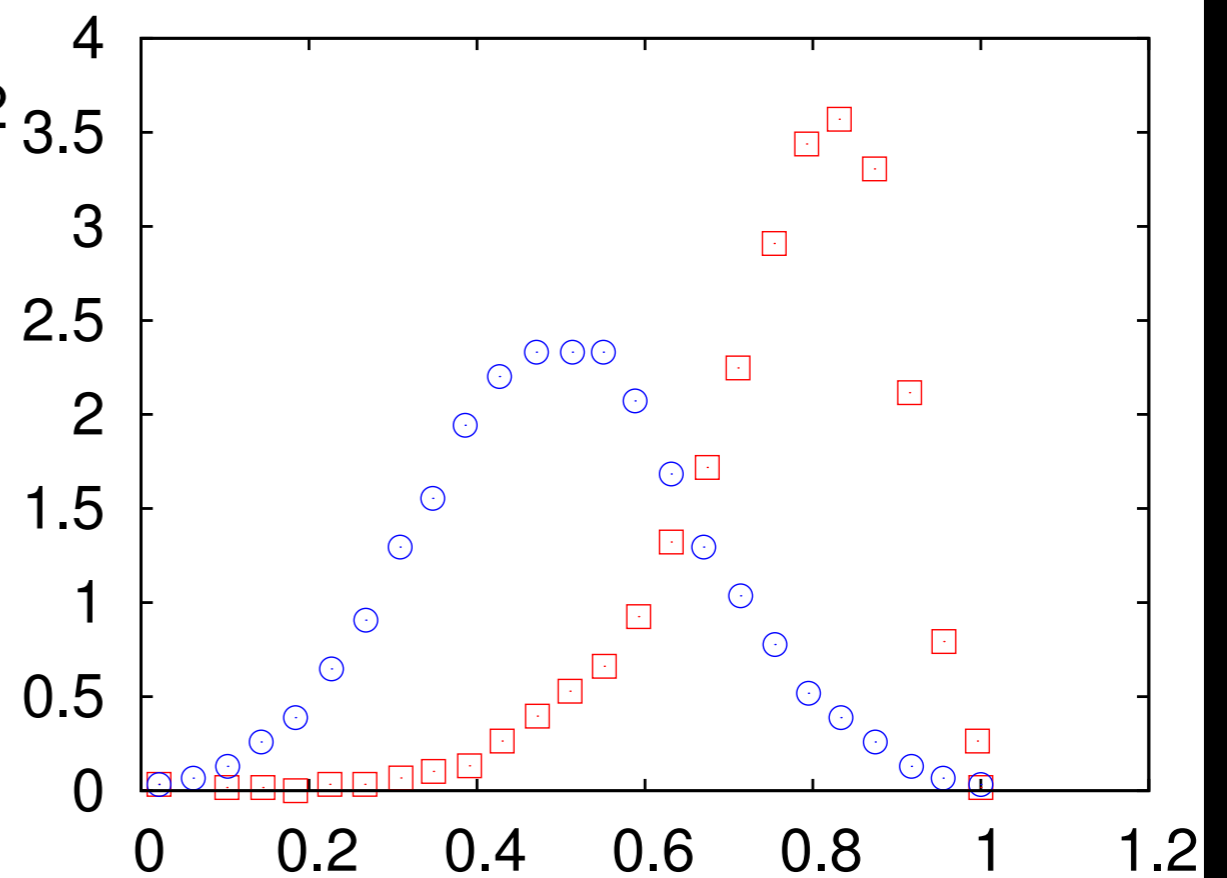
Expts: Cremer et al, Chrom. Res. 2001, Weierich et al Chrom Res. 2003, Kreth et al Biophys J 2005



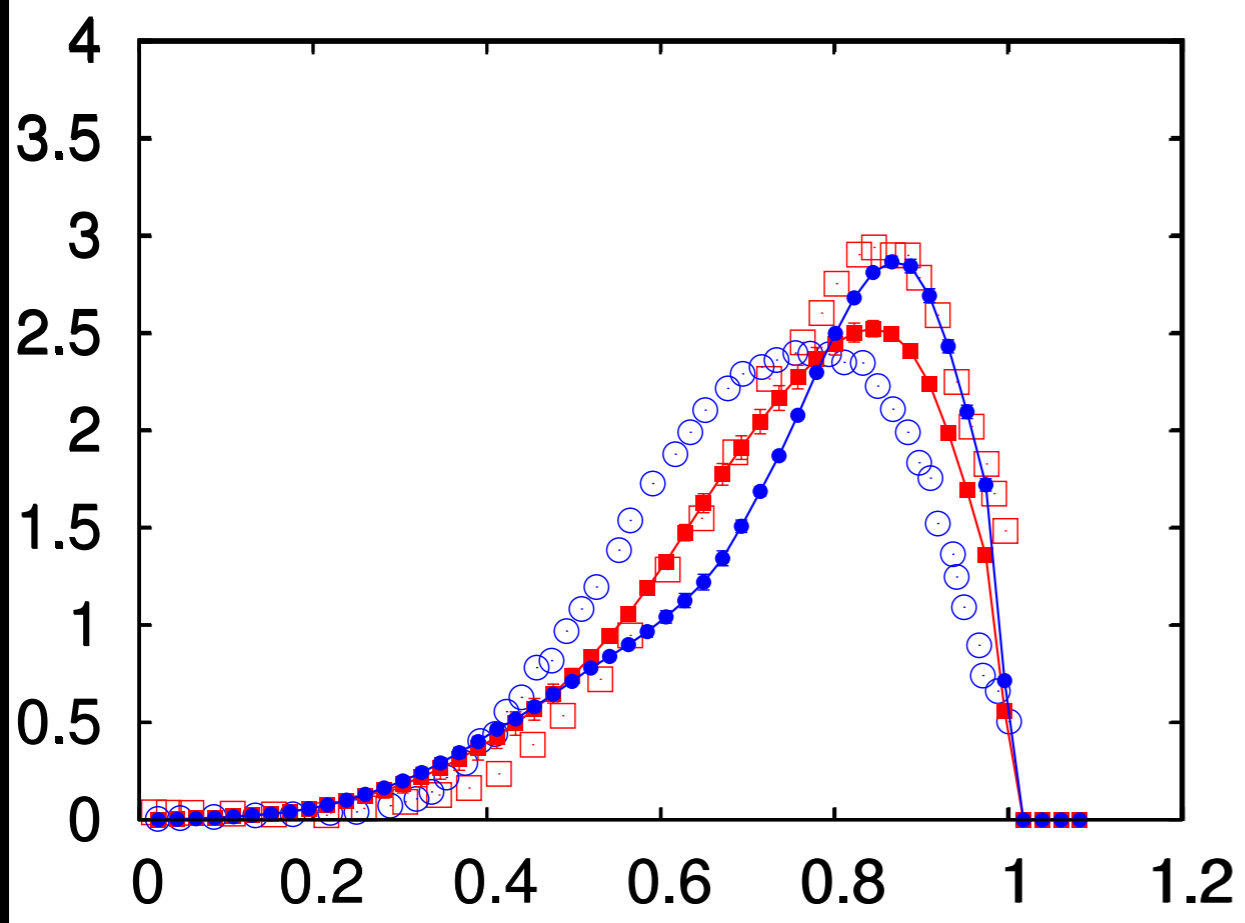
Chromosome 12/20

Experimental data

Chromosome 18/19



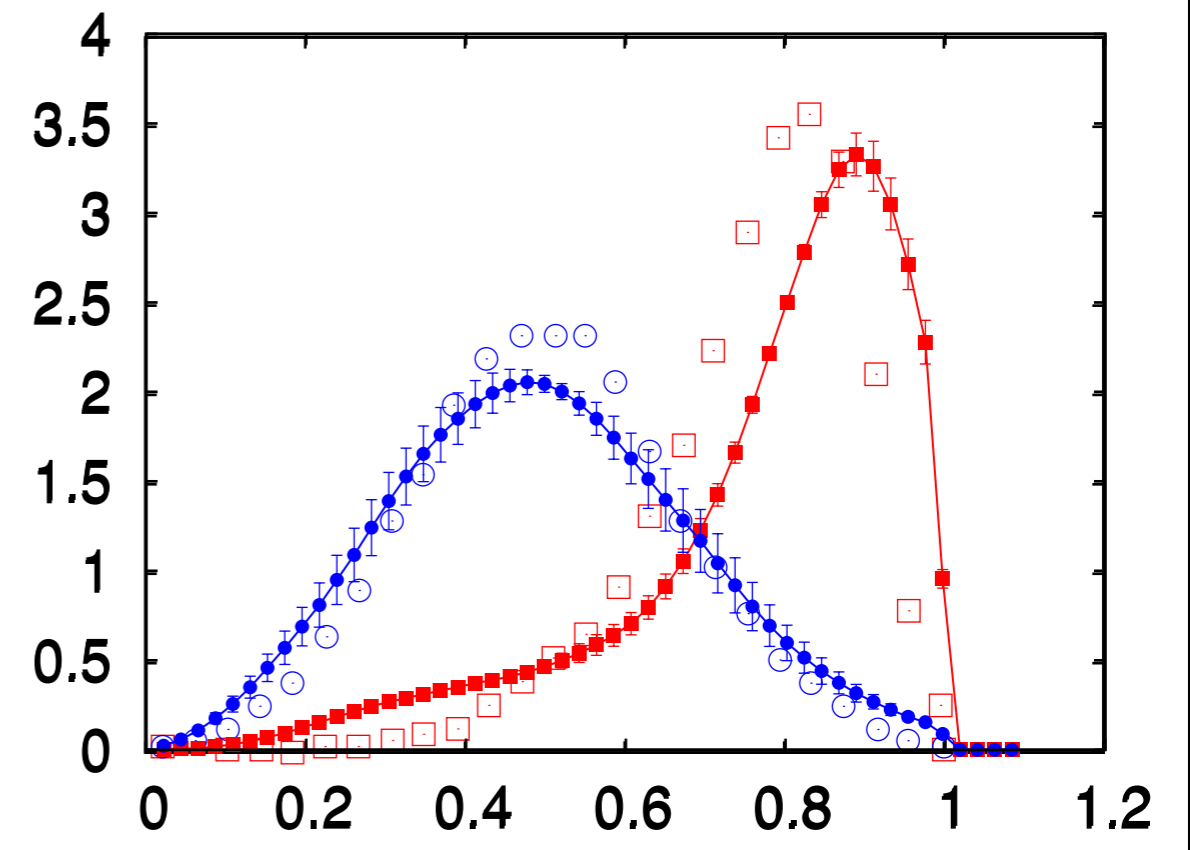
Theoretical Predictions



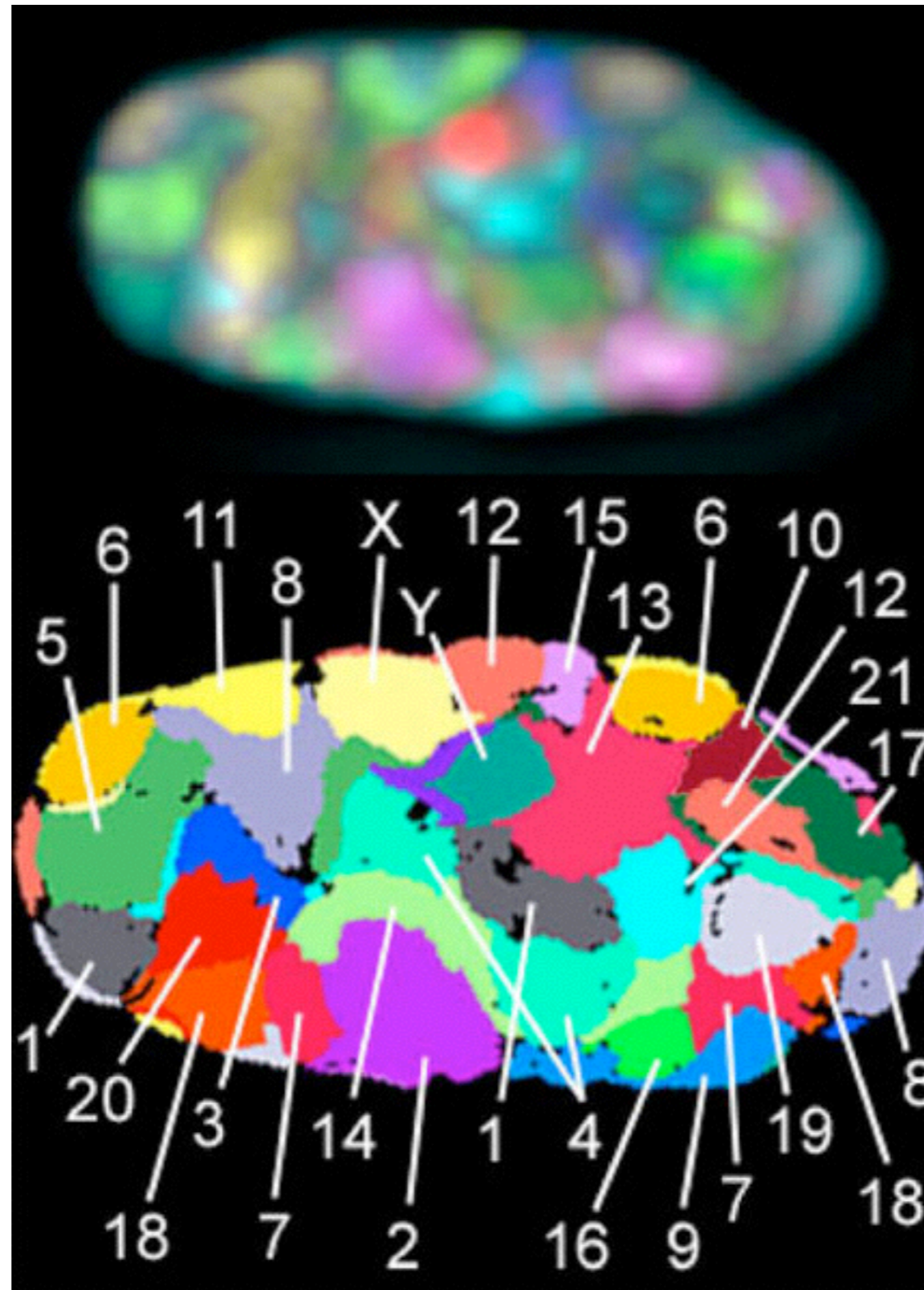
Chromosome 12/20

Symbols: Experimental data
Lines: Simulations

Chromosome 18/19



Chromosome Territories: Rabl 1885, Boveri 1908, Stack 1977 +

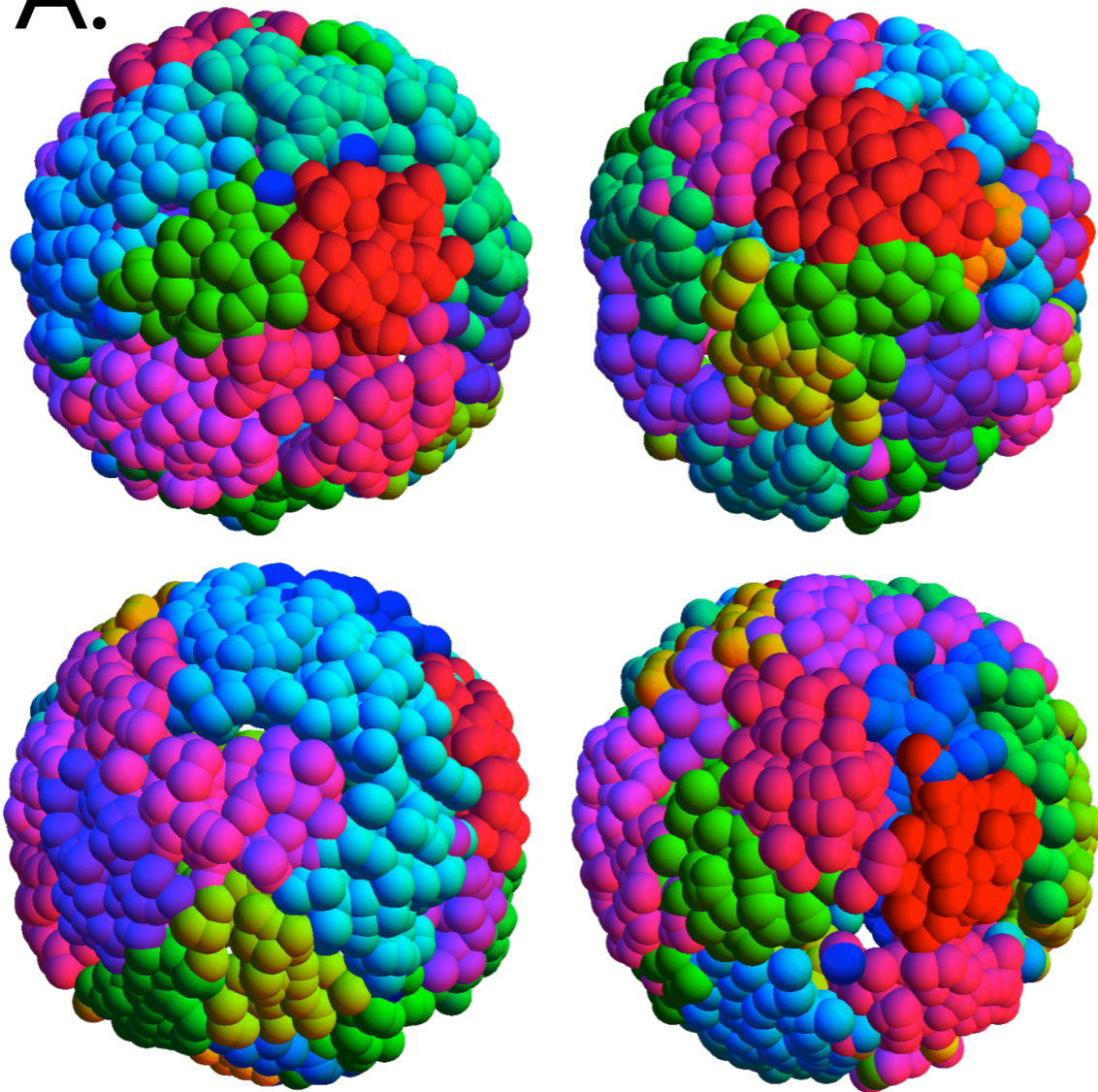


3-d FISH images

Bolzer et al, PloS Biology (2005)

Theoretical Predictions

A.

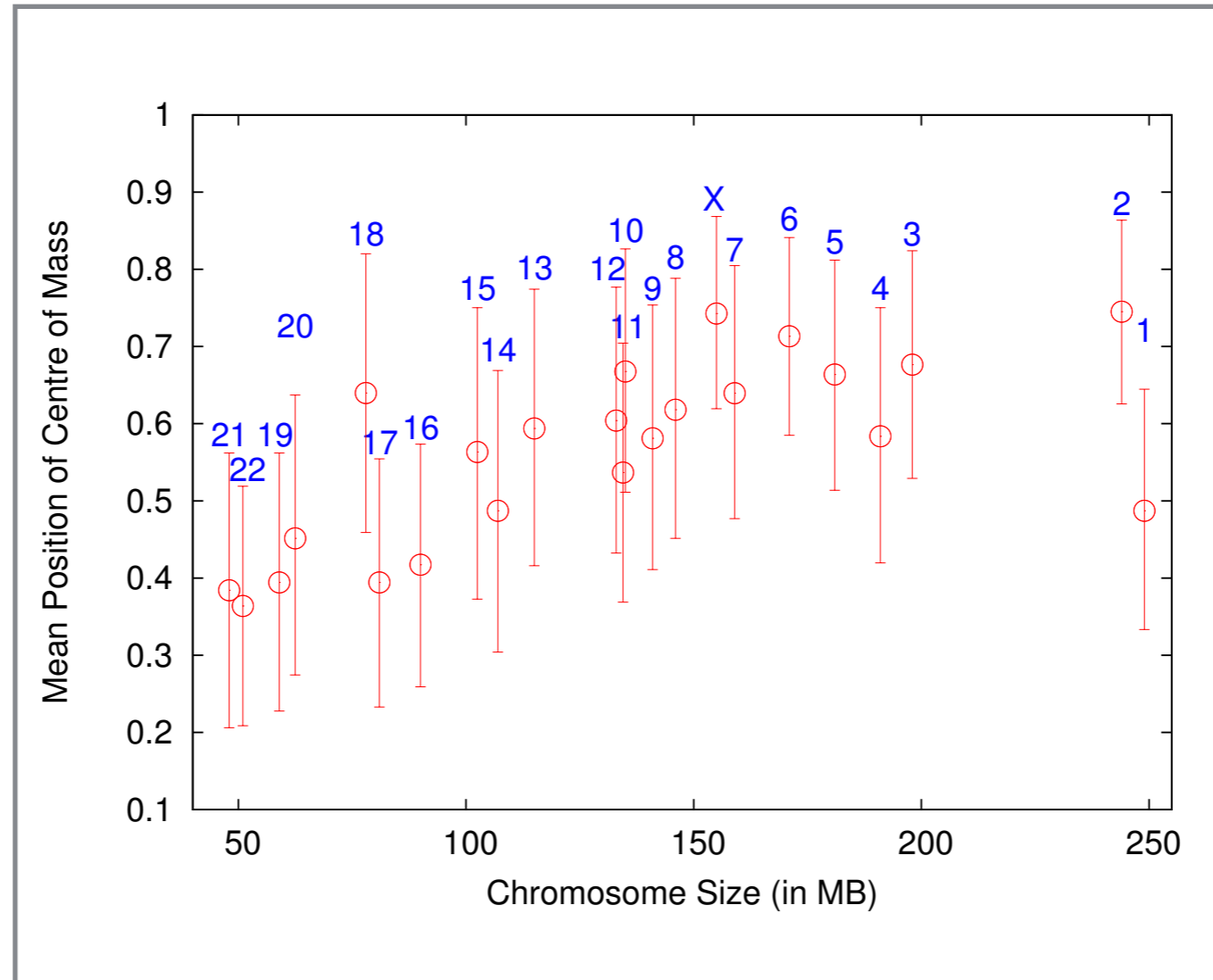


Simulations starting from many different initial conditions. Each chromosome a different colour

Chromosome territoriality follows naturally from our model

Chromosome territoriality is robust

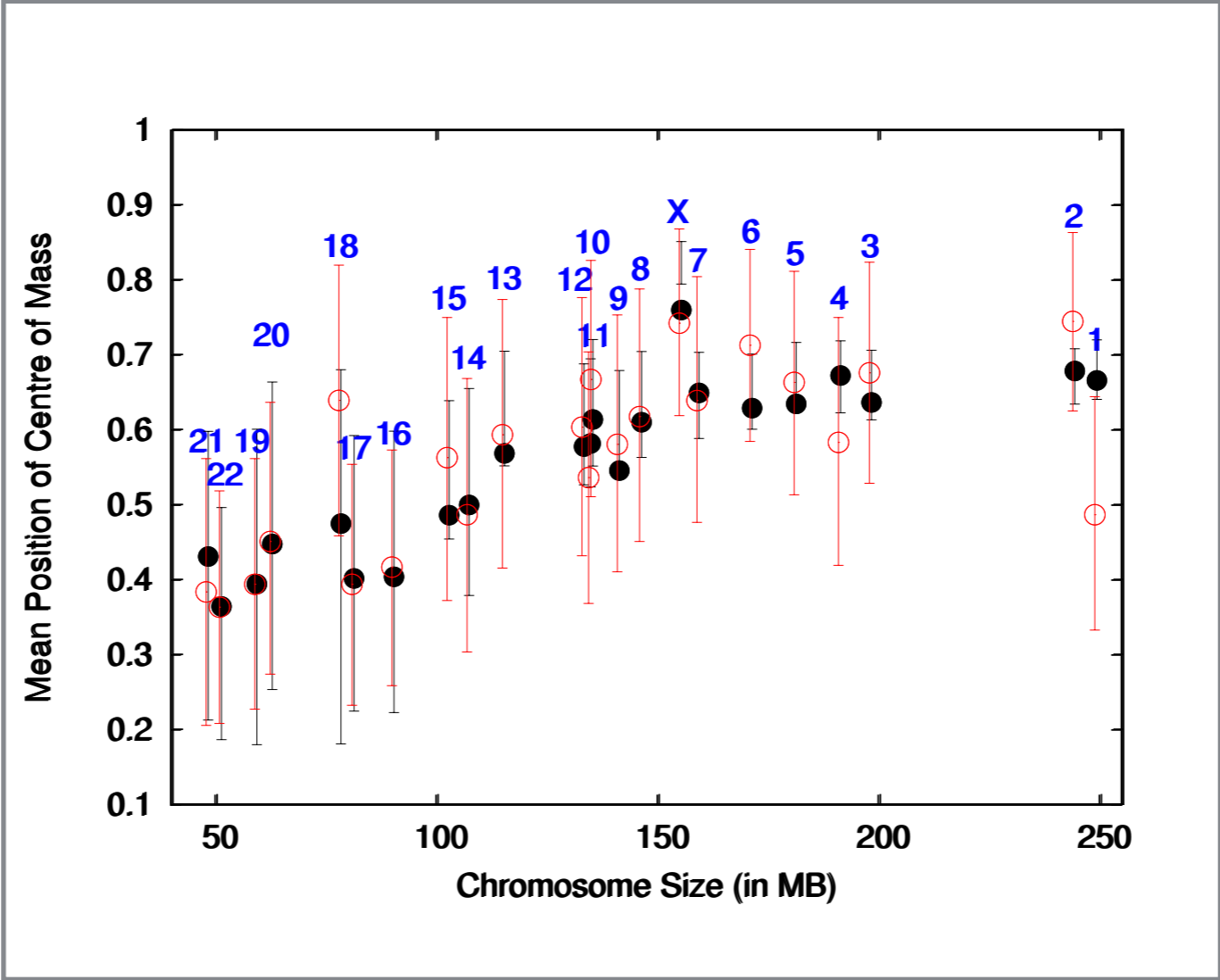
Centre of Mass Distribution



Kalhor et al, Nat Biotech (2012)

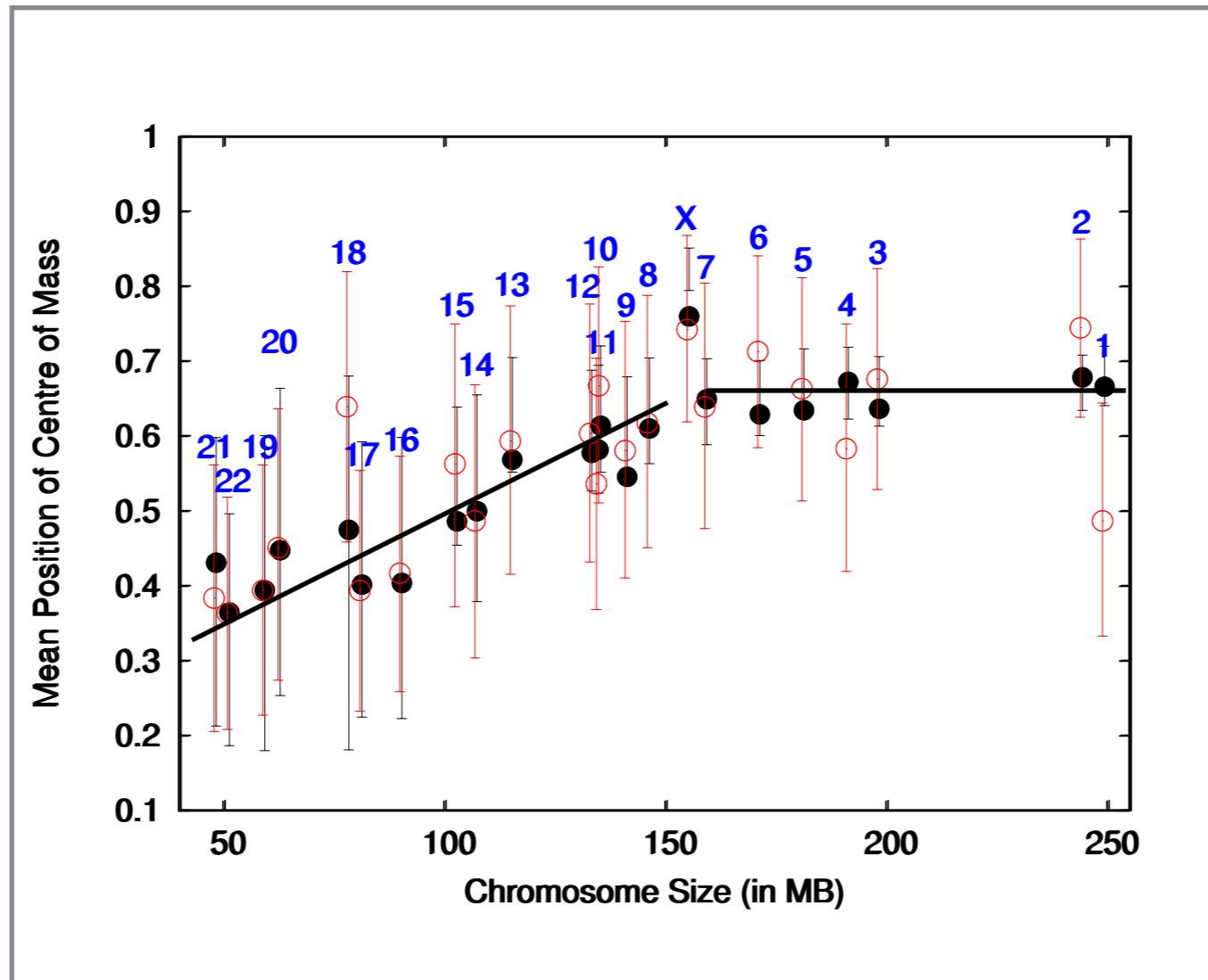
Open circles: Experiment

Theoretical Predictions



Open circles: Experiment
Closed circles: Theory

Theoretical Predictions



Captures
systematics of the
experiments.
Reasonable
qualitative and
quantitative
agreement

A statistical mechanics and biophysics of large-scale nuclear architecture?

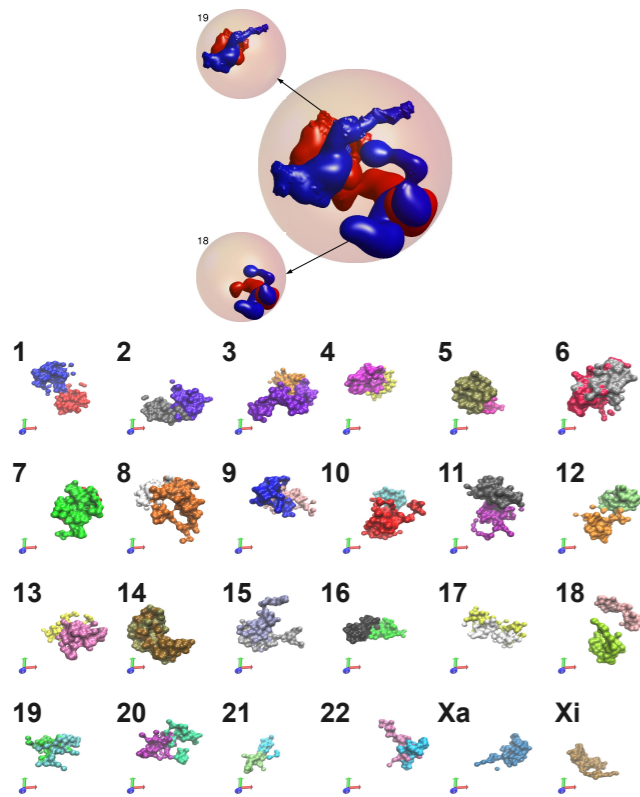
Simplest model
(surprisingly good)



- No cell-type specificity
- Number of genes, averaged over 1 Mb region, proxy for activity.
- Random loop model enforces compactness at large scales

More refined model
(additional biological input)

- Transcriptome data (RNA-seq) for cell-type specific transcription levels - infer activity from expression
- Hi-C measurements - infer looping of individual chromosomes

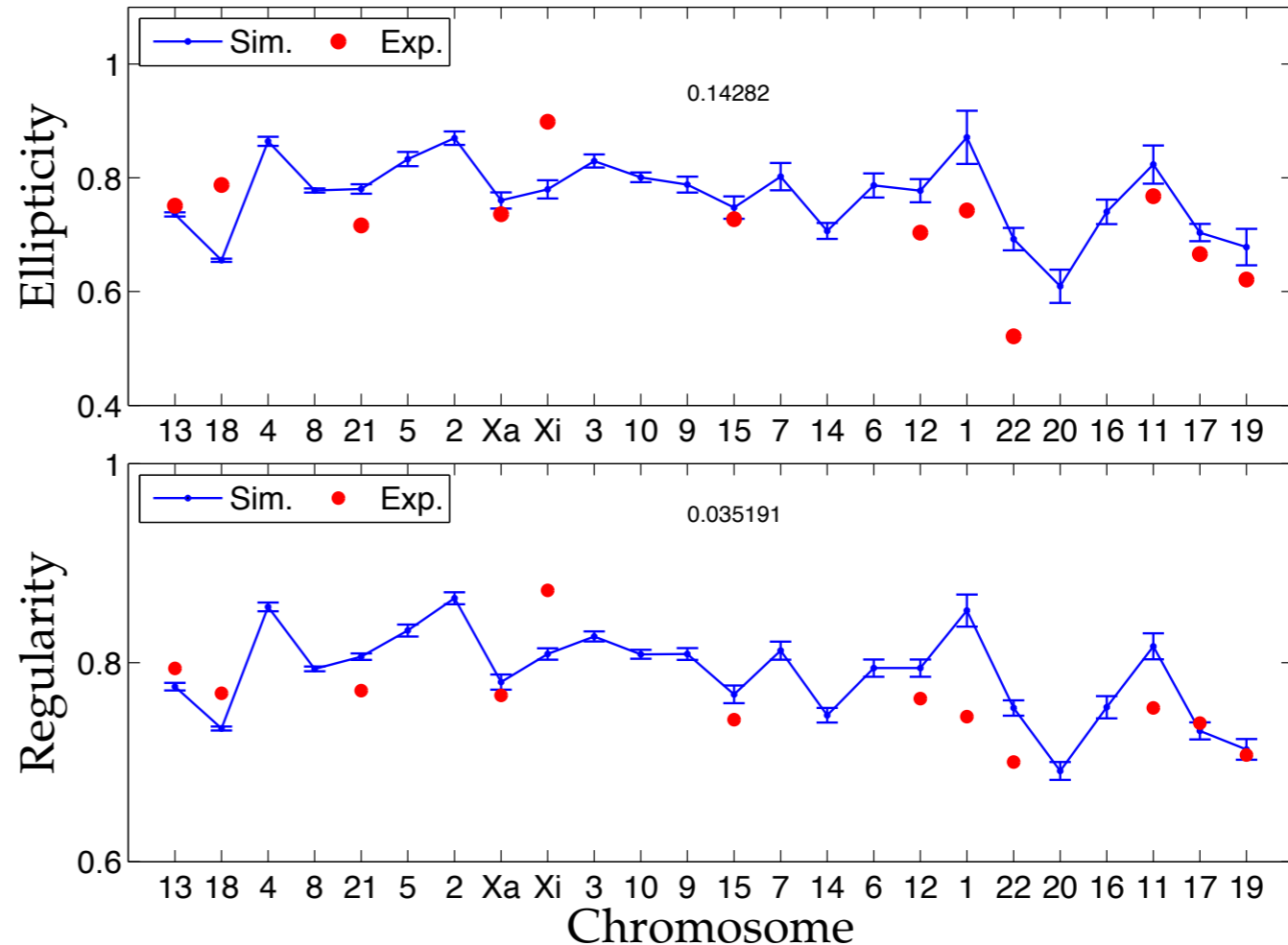


- Configurational Snapshot: Chromosomes 18 and 19 (2 homologs each)
- Territories for all chromosomes. 2d projections to compare to available data (2d FISH)
- Structural measures: Regularity from surface to volume ratio, ellipticity measures anisotropy

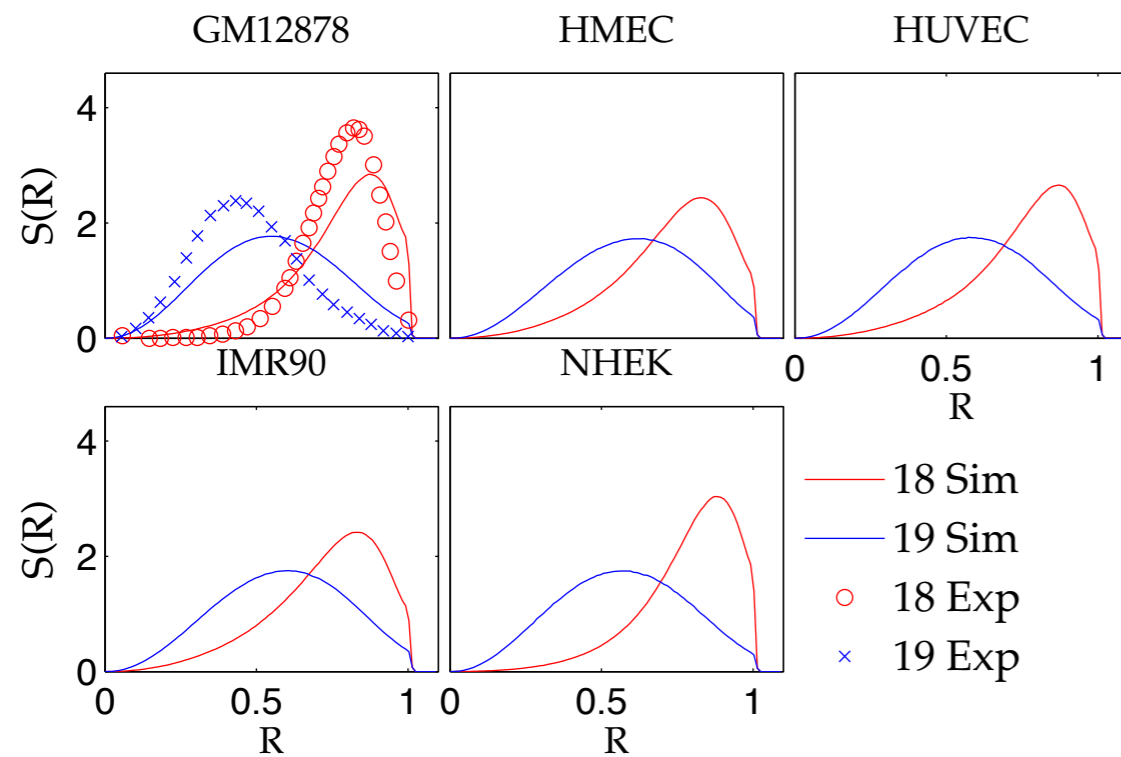
- More active chromosomes are rougher and less spherical in character
- Qualitative agreement with experimental data

Data: Sehgal et al, *Chromosoma* (2014)
 WI-38 and MRC5 normal human fibroblast cells

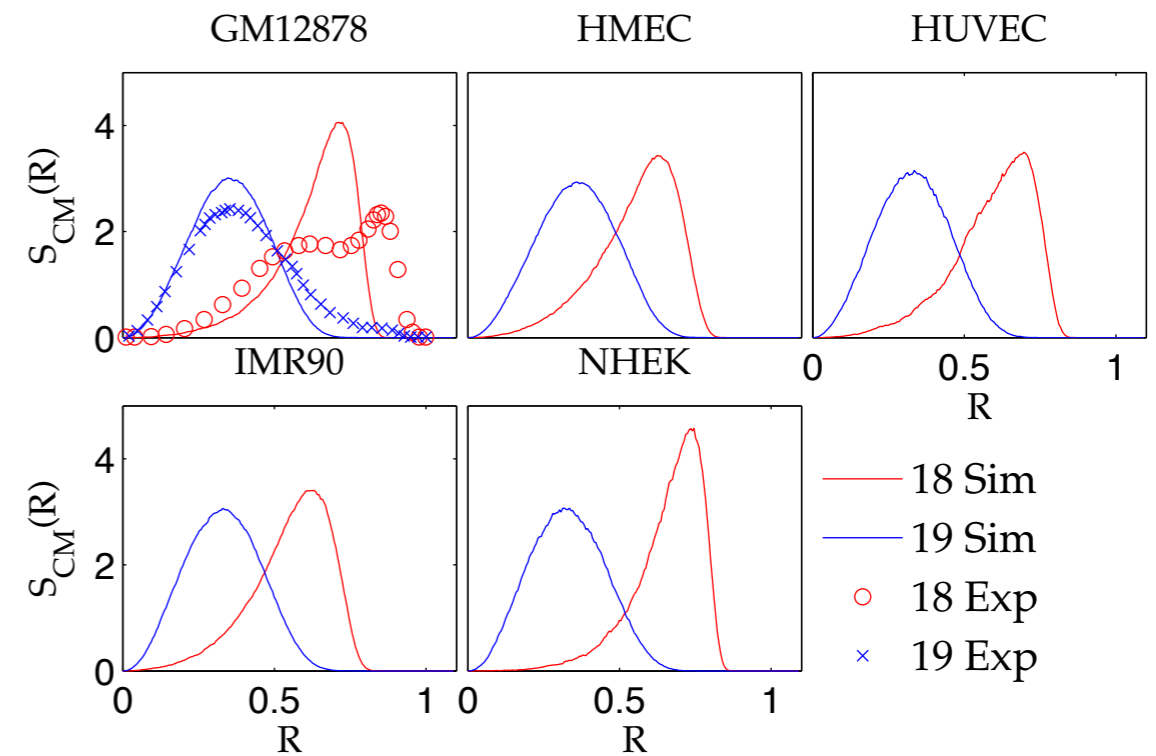
Simulations vs experimental data



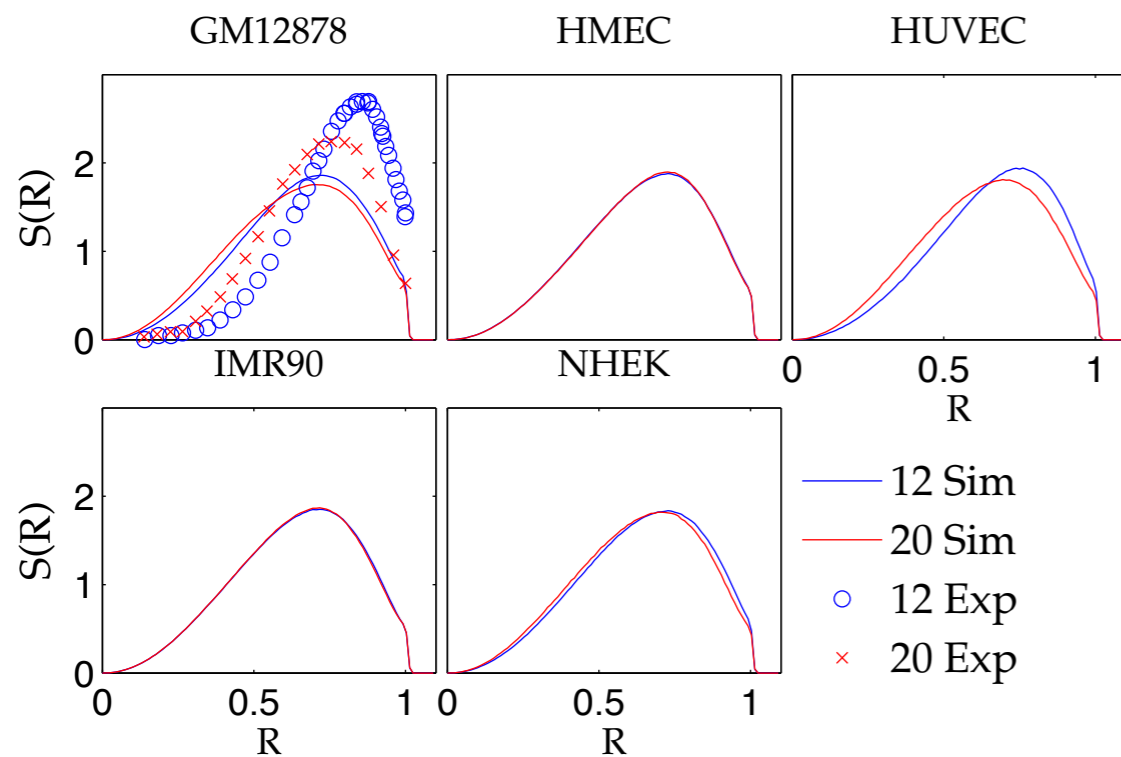
DNA density distribution: 18/19



Chromosome centre-of-mass distribution: 18/19



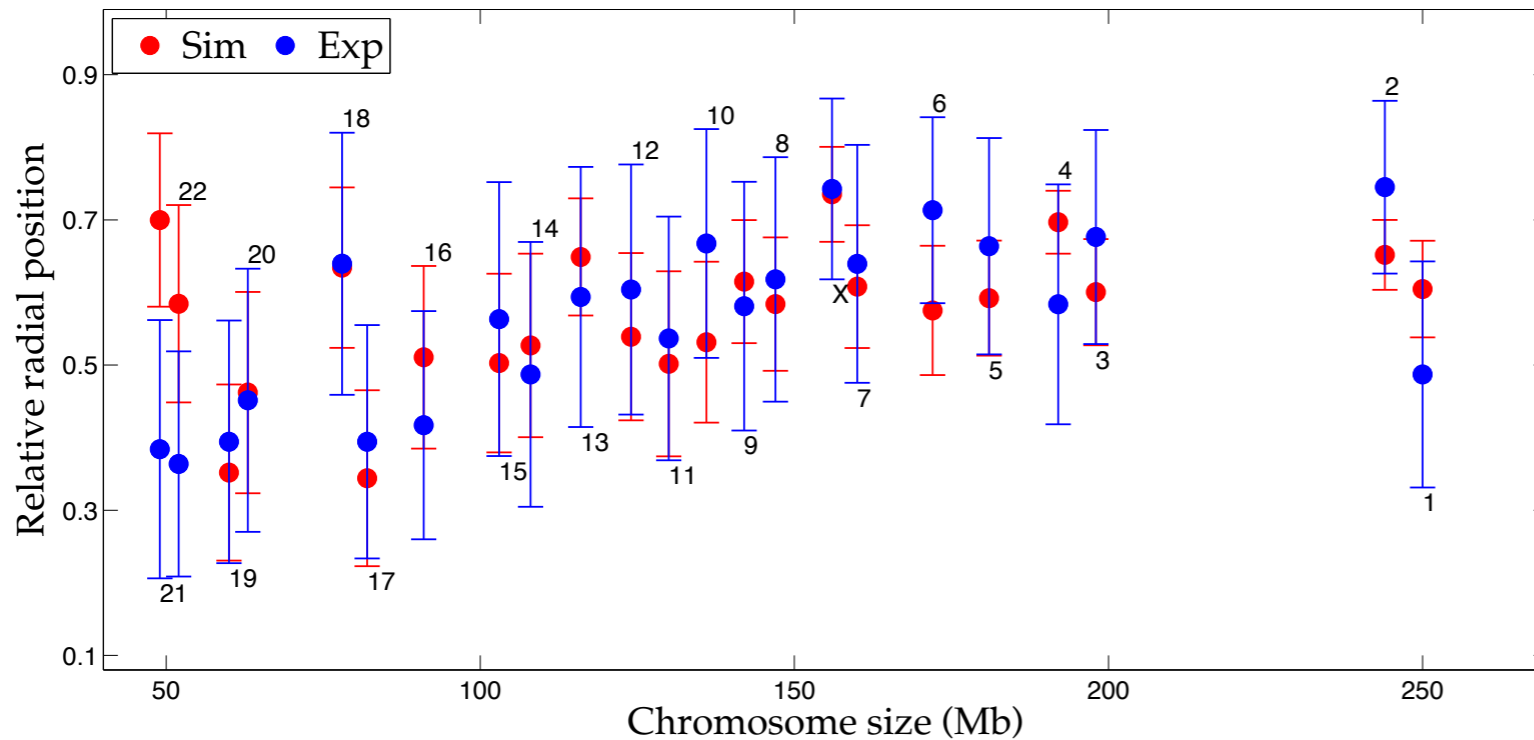
DNA density distribution: 12/20



- Reasonable agreement with experiment
- Stronger cell-type dependence in centre-of-mass distributions.

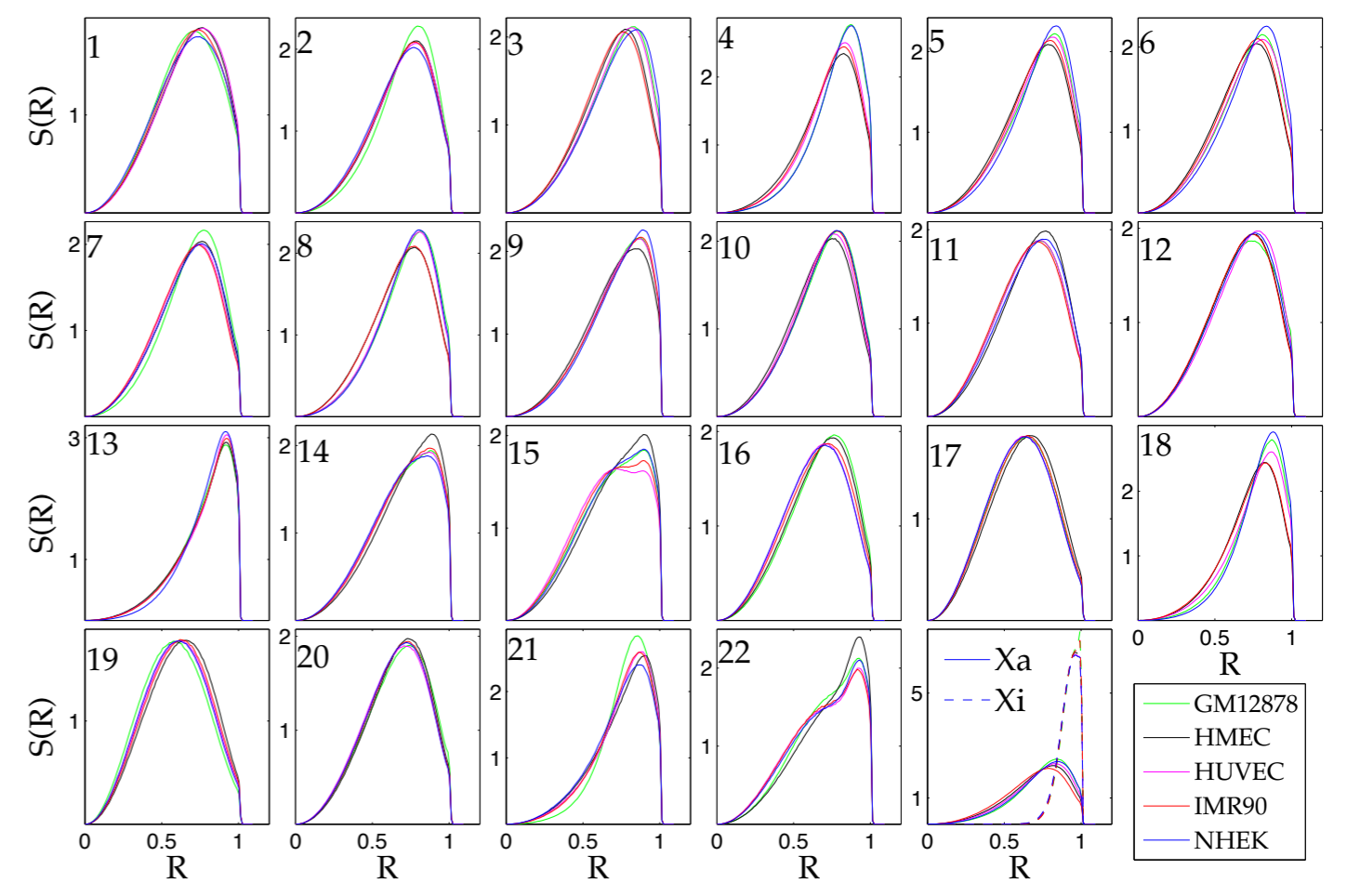
Data: Kalhor et al, Nat Biotech 30, 90–98 (2012)

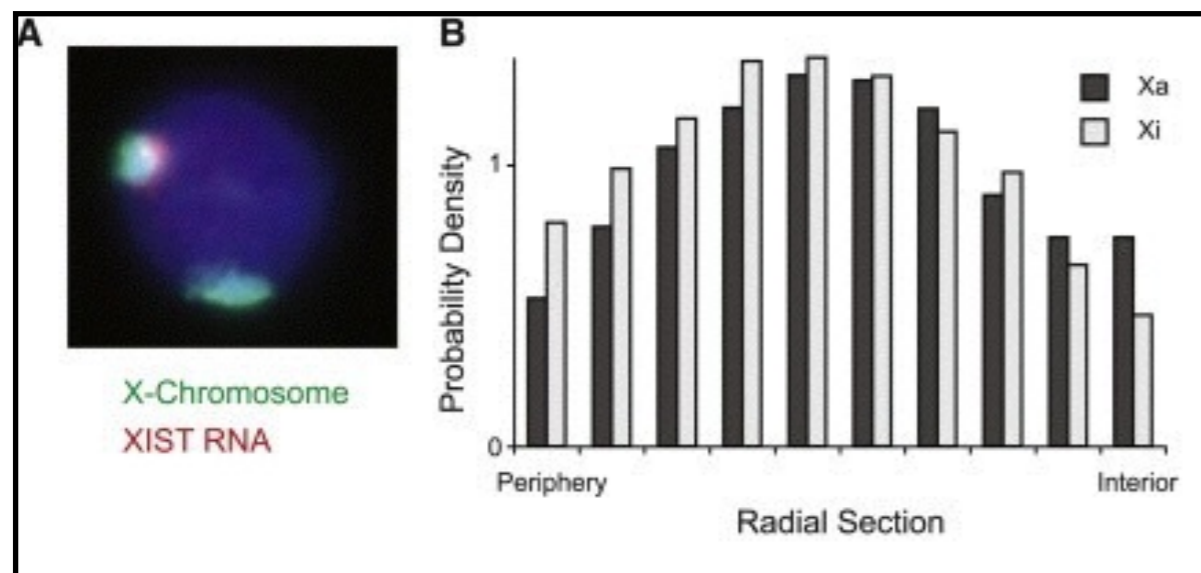
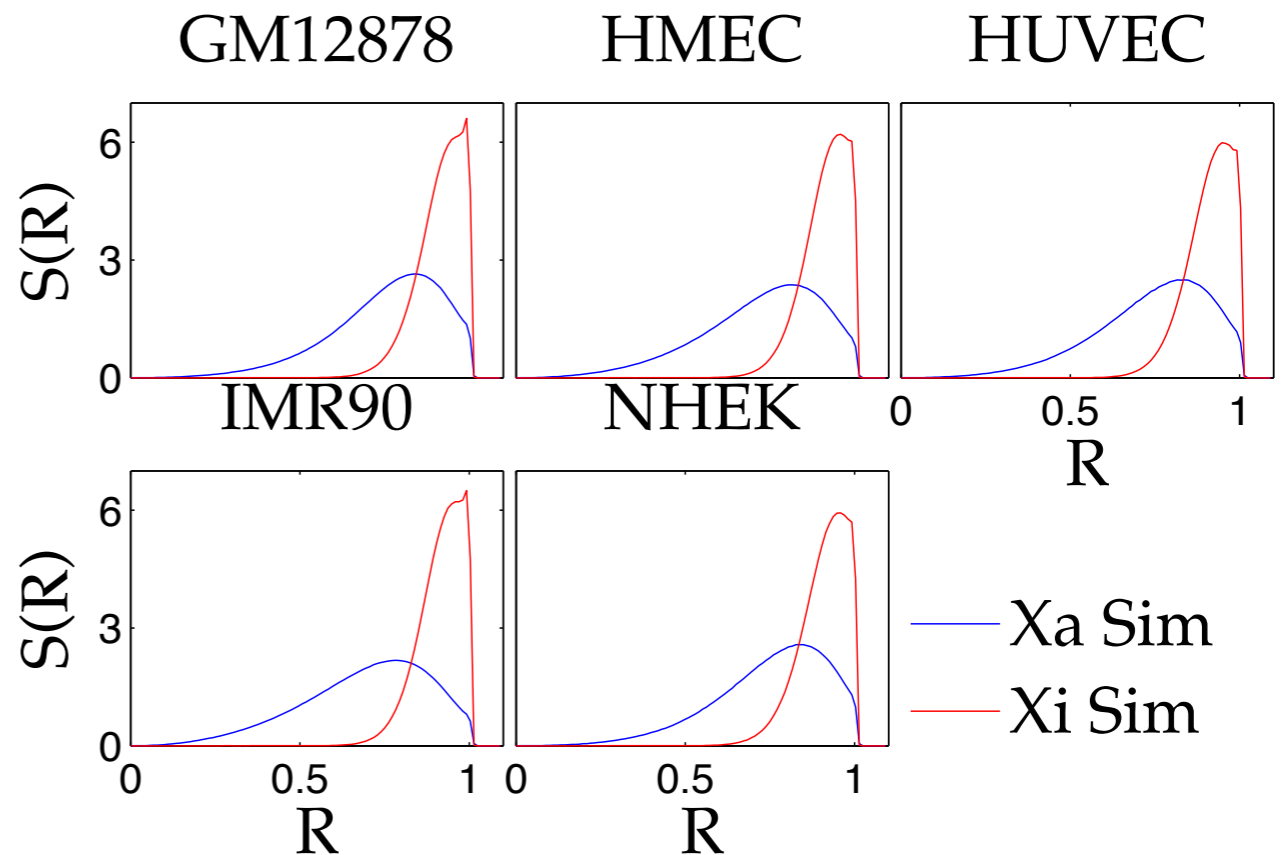
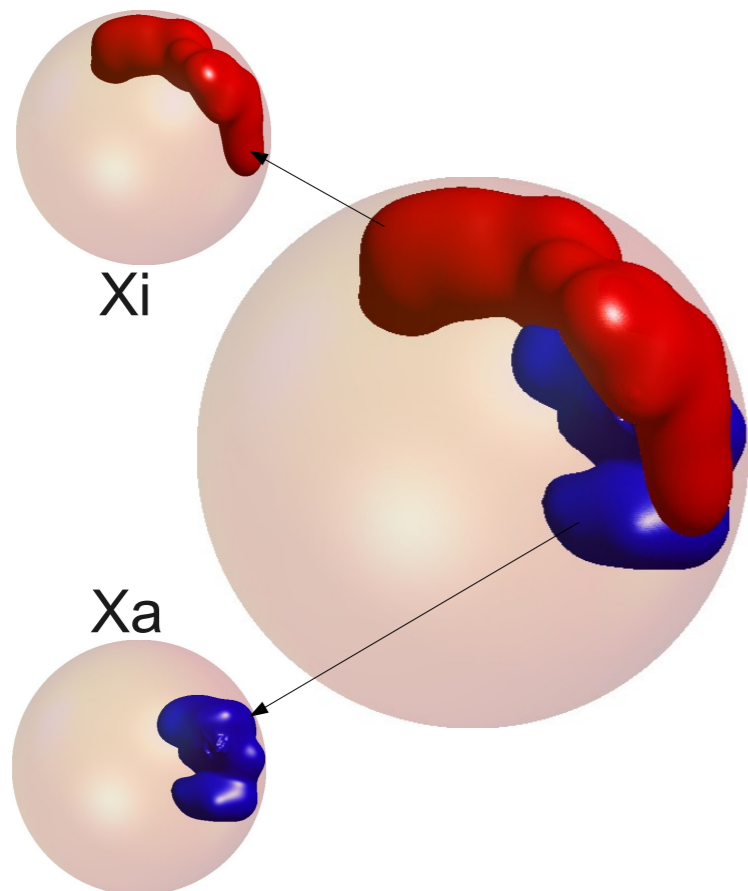
$$\chi^2=0.6901$$



- Chromosome centre-of-mass positions for all chromosomes
- Fair agreement for larger chromosomes

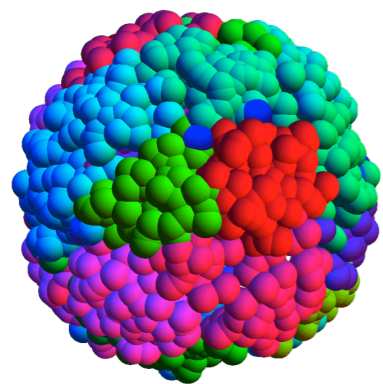
- DNA density distribution $S(R)$ for all 5 cell types and all chromosomes
- Largely the same across cell types, cell-type differences larger in centre-of-mass distribution



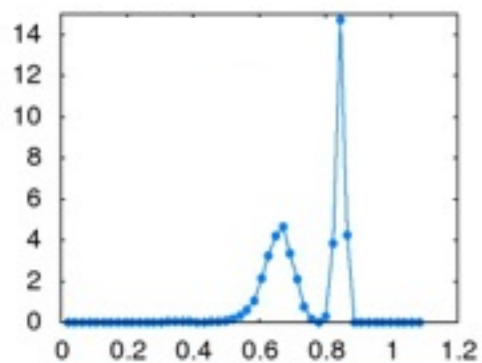


- X-chromosomes in female cells (XX) asymmetrically distributed, with the inactive X chromosome located more peripherally than the active X
- We recover this very non-trivial feature

Data: Naughton et al, *Mol Cell* 40(3):397-409 (2010)
Female SAT03 cells

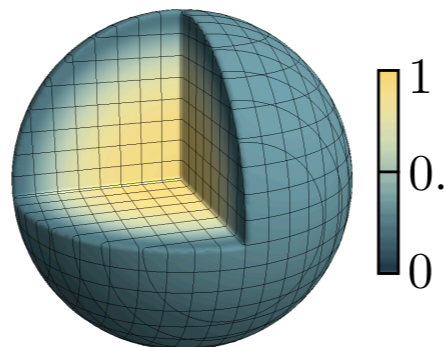


I. Chromosome territories

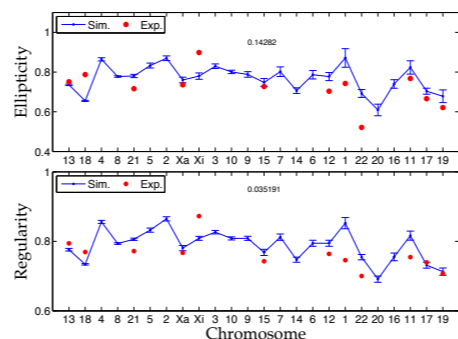
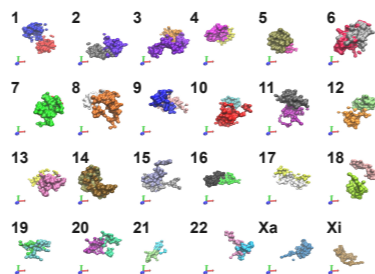


8. X-chromosome positioning

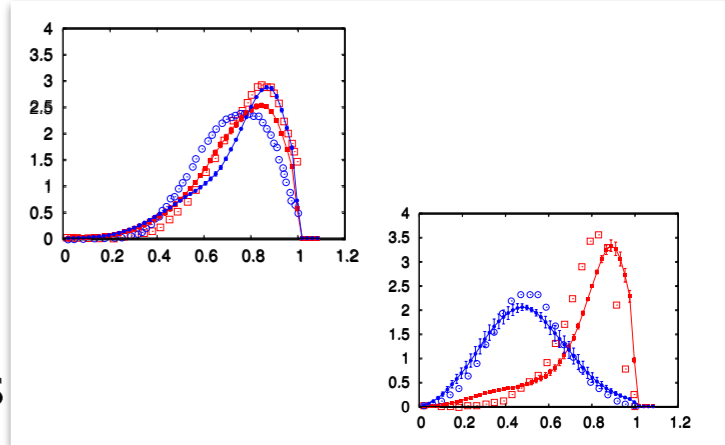
2. Heterochromatin & euchromatin distribution



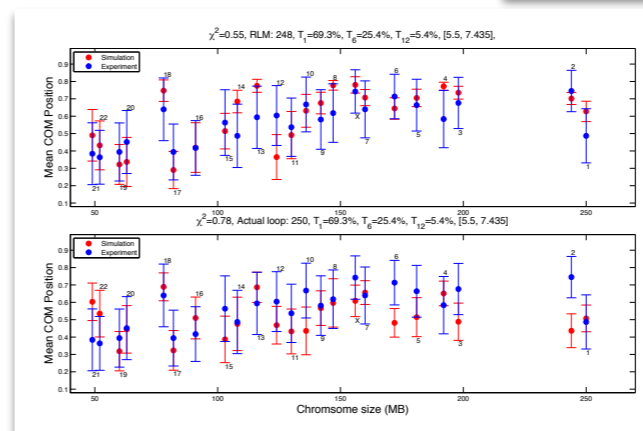
Visual Summary



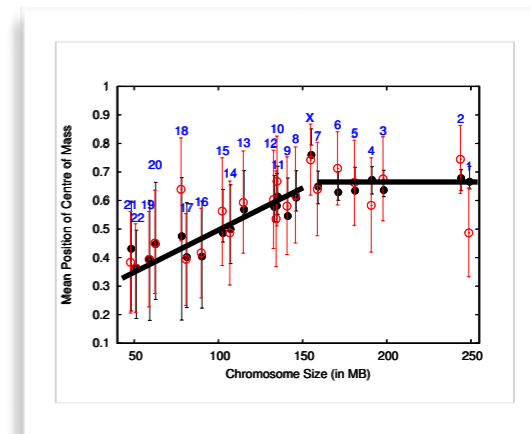
5. Shape statistics of chromosome territories



4. Chromosome COM distributions

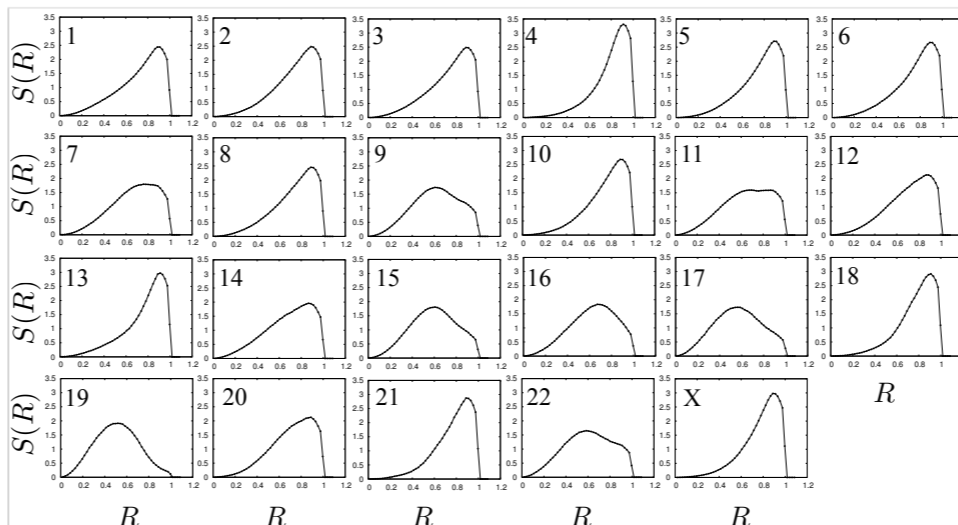


3. S(R) for individual chromosomes (18/19 & 12/20)



6. Positioning by chromosome size

7. Radial DNA distributions for all chromosomes



These results follow once we specify the pattern of activity on each chromosome and how they loop

Conclusions

“ .. the position of each chromosome is largely determined by the activity of all its genes; that is, the number and pattern of active and silent genes on a given chromosome .. “

1. A proposal for the physics of large-scale nuclear architecture which emphasizes inhomogeneous activity, conceptually rooted in very modern statistical mechanics and biophysical ideas.
2. Positioning by gene density and/or size and chromosome territory formation both originate in the physical phenomenon of “**activity-based segregation**”. An activity-based positioning code?
3. A predictive approach to nuclear architecture (inhomogeneous activity, looping + specific interactions with the nuclear envelope)

Summary

In thermal equilibrium
and out of it

Self-propelled objects
and active matter

Living matter as
active matter

Nuclear architecture

Chromosome positioning

Application of active
matter ideas

Predictions

Conclusions

Active matter and
the architecture of
the cell nucleus

In what way(s) does living matter differ from non-living matter?

“Nothing” in physical biology makes sense except in the light of non-equilibrium (active) processes

Cf. T. Dobzhansky's classic essay: “[Nothing in Biology Makes Sense Except in the Light of Evolution](#)”

Search for unifying principles through active matter, applications to physical biology via such examples

Importance of “coarse-graining”, the fundamental modelling step.

Complexity of what is measured. Only indirect probes and noisy data. Statistical analysis and relevant models crucial

Value of simple models



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Vidyasagar College,
Nadia, India
and
Forschungszentrum
Jülich, Germany

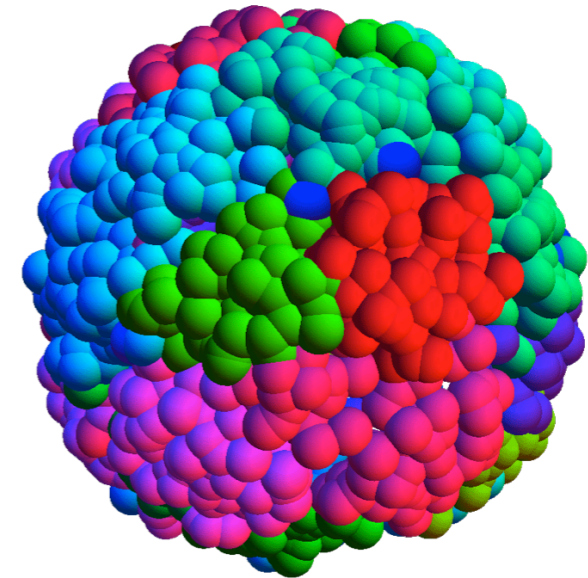


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Ganai, Sengupta and Menon, Nucl. Acids Res. 42(7) 4145 (2014)
Agrawal, Ganai, Sengupta, Menon, J. Stat. Mech (2017)
Agrawal, Ganai, Sengupta, Menon, in preparation
Agrawal, Menon, in preparation



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DAE-SRC Fellowship

PRISM, IMSc

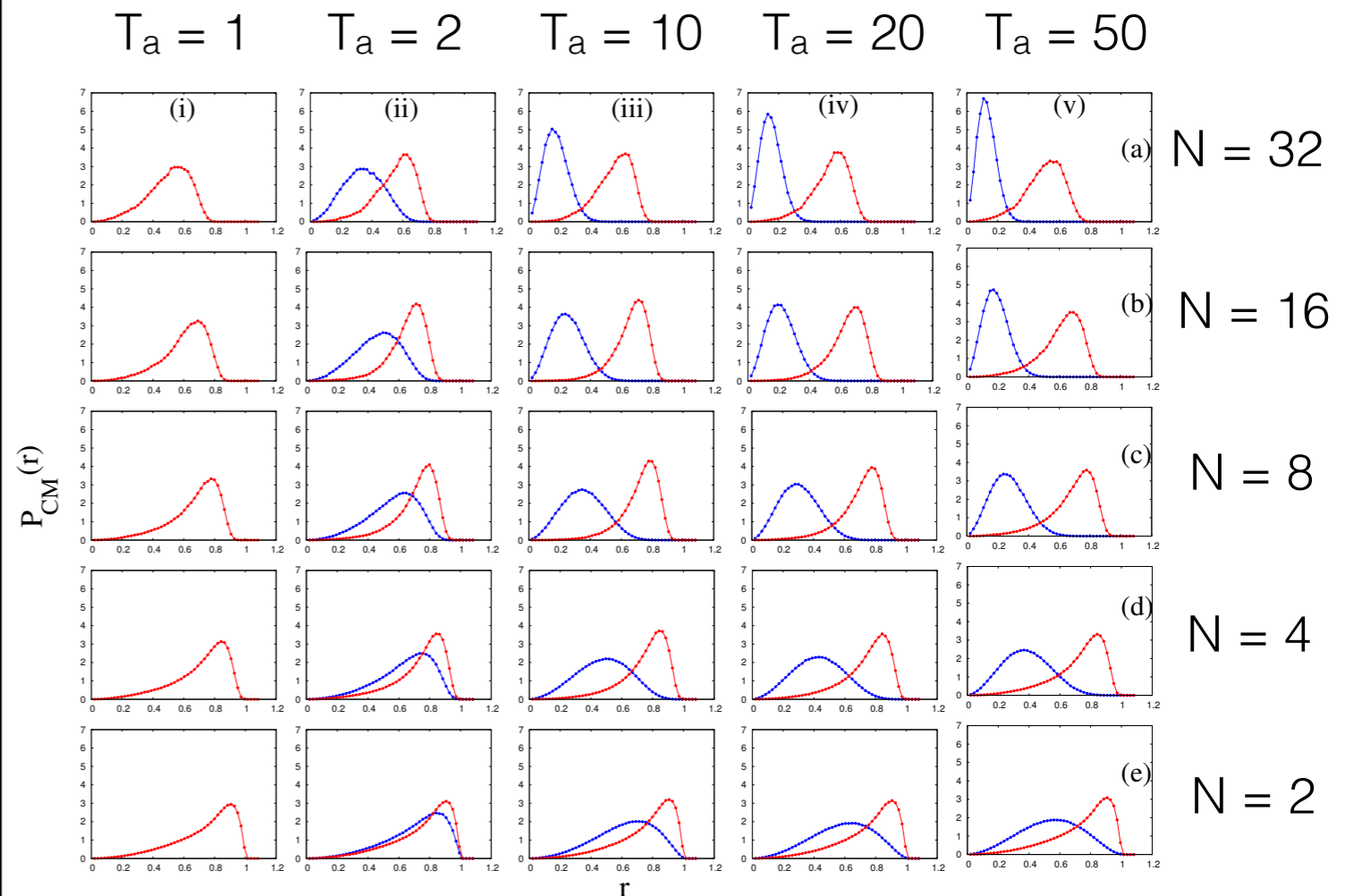
Activity-based segregation?

Phase-separation generic to self-propelled systems, e.g. motility-induced phase separation (Cates, Tailleur, Baskaran, Marchetti + ..) Also [Weber et al, PRL (2016)] in binary mixtures of particles with different diffusivities.

Confinement important here, also polymer character

Hot particles exclude the cold ones, drive them to the boundary. Relation to “reverse osmosis” in active systems. [Lion & Allen, EPL (2014)]

Simple model of active-inactive polymer mixture, no polydispersity



See similar segregation

Brownian dynamics, 3-d, spherical confinement: 512 monomers subdivided into polymers of N monomers each, 50% active and 50% inactive