

Coping with the noisy* nature of **life** in teaching & other philosophic ruminations.

*that is unpredictable

Mike Klymkowsky. - MCD Biology - UC Boulder

Intended take home messages:

- biological systems (including us) are often inherently unpredictable; they are stochastic - a word we will define

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- biological systems (including us) are often inherently unpredictable; they are stochastic - a word we will define
- what we “are” and do, and what happens to us is influenced but **not determined** by genes and environment
 - luck and our responses to it important
- there are good reasons to embrace free will over determinism

Disclaimers + caveats

I am not ...

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I am not ... ● a philosopher or philosophy professor

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How would Socrates teach science?



By Ann Riedl and Mike Klymkowsky

Aug. 4, 2022

Disclaimers + caveats

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the challenge (to be comprehensible)....

“If you care about being thought credible and intelligent, do not use complex language where simpler language will do.”
— Daniel Kahneman

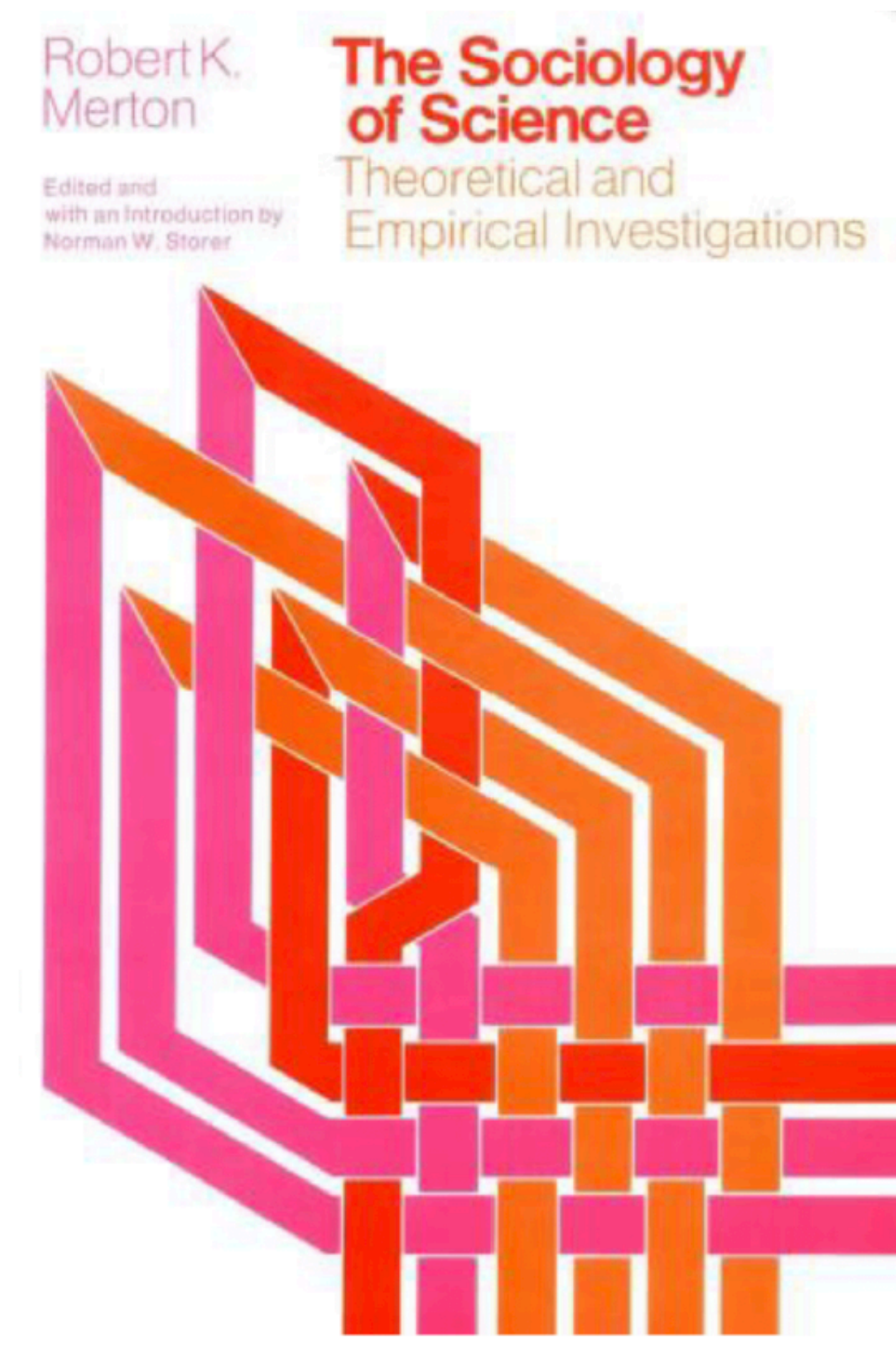


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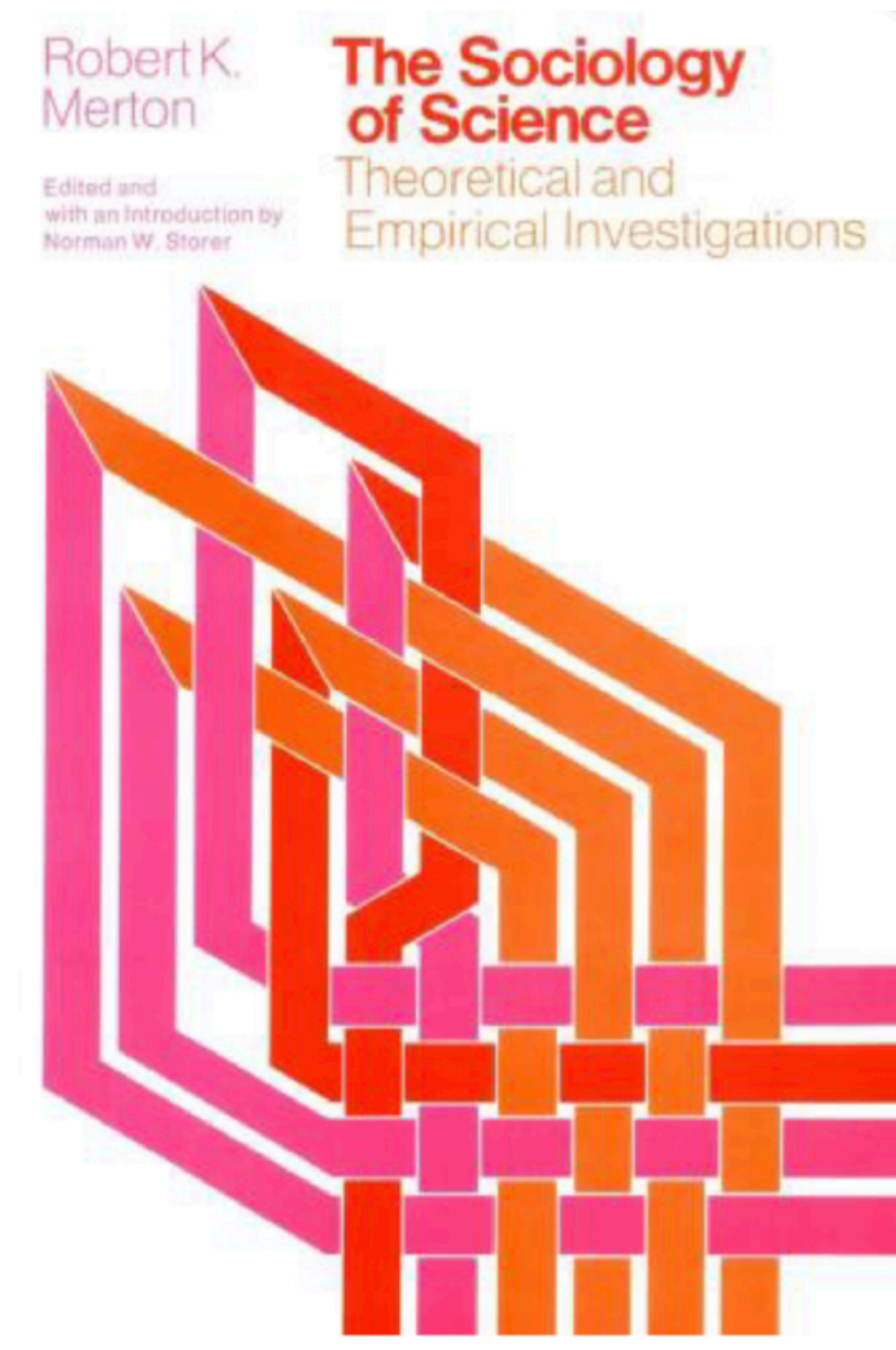
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Basic (scientific) assumptions are ...



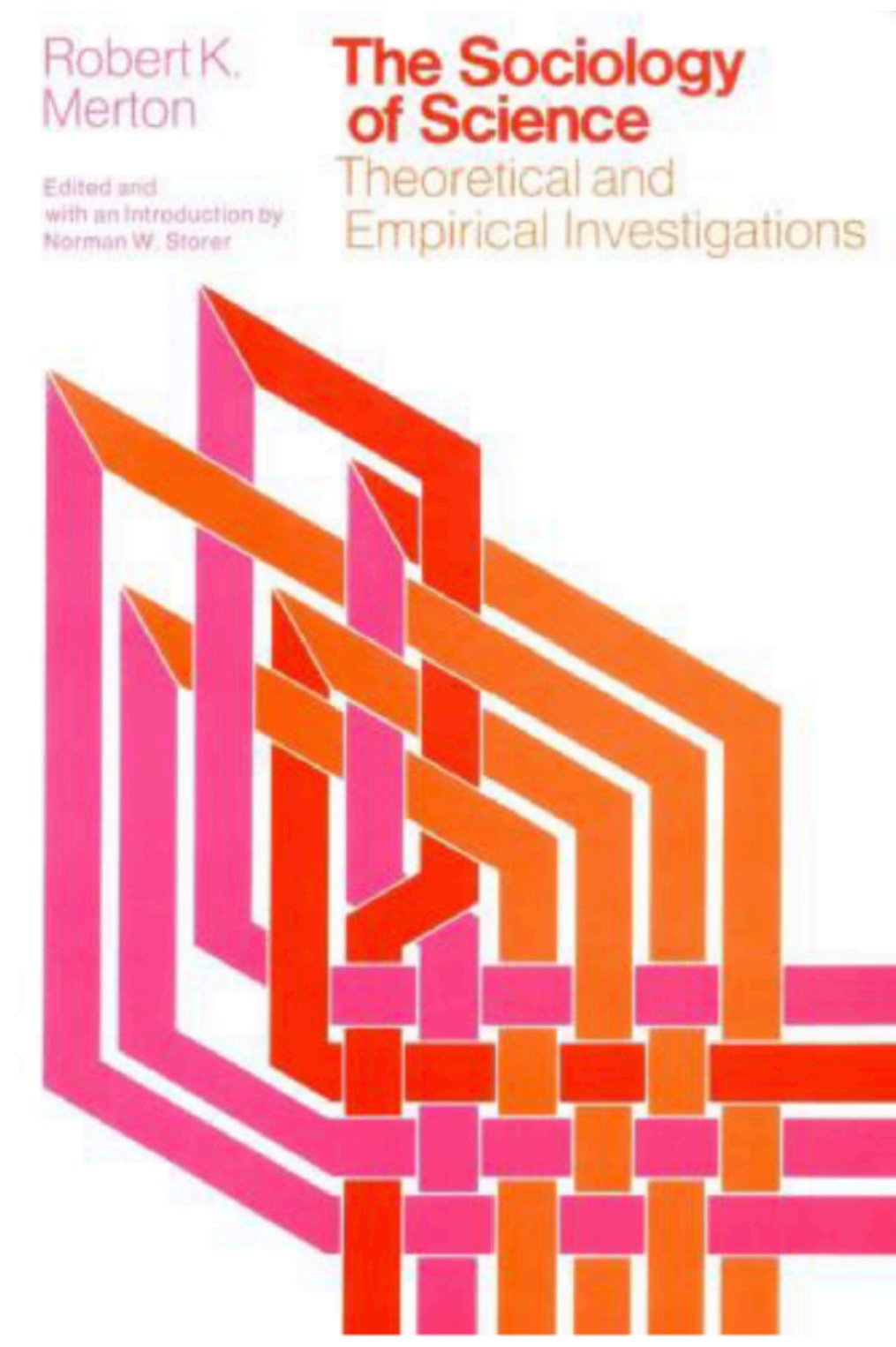
Basic (scientific) assumptions are ...

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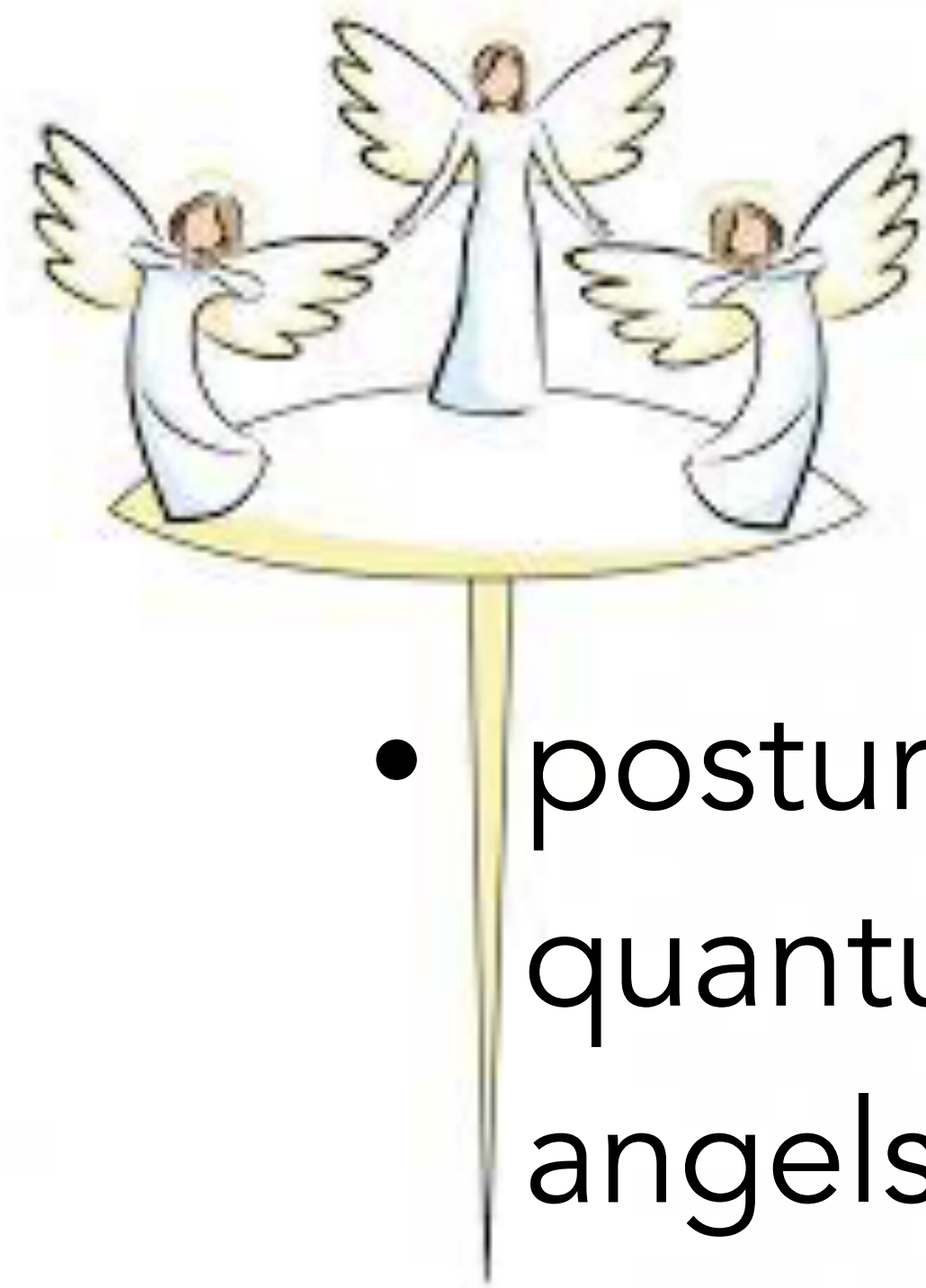
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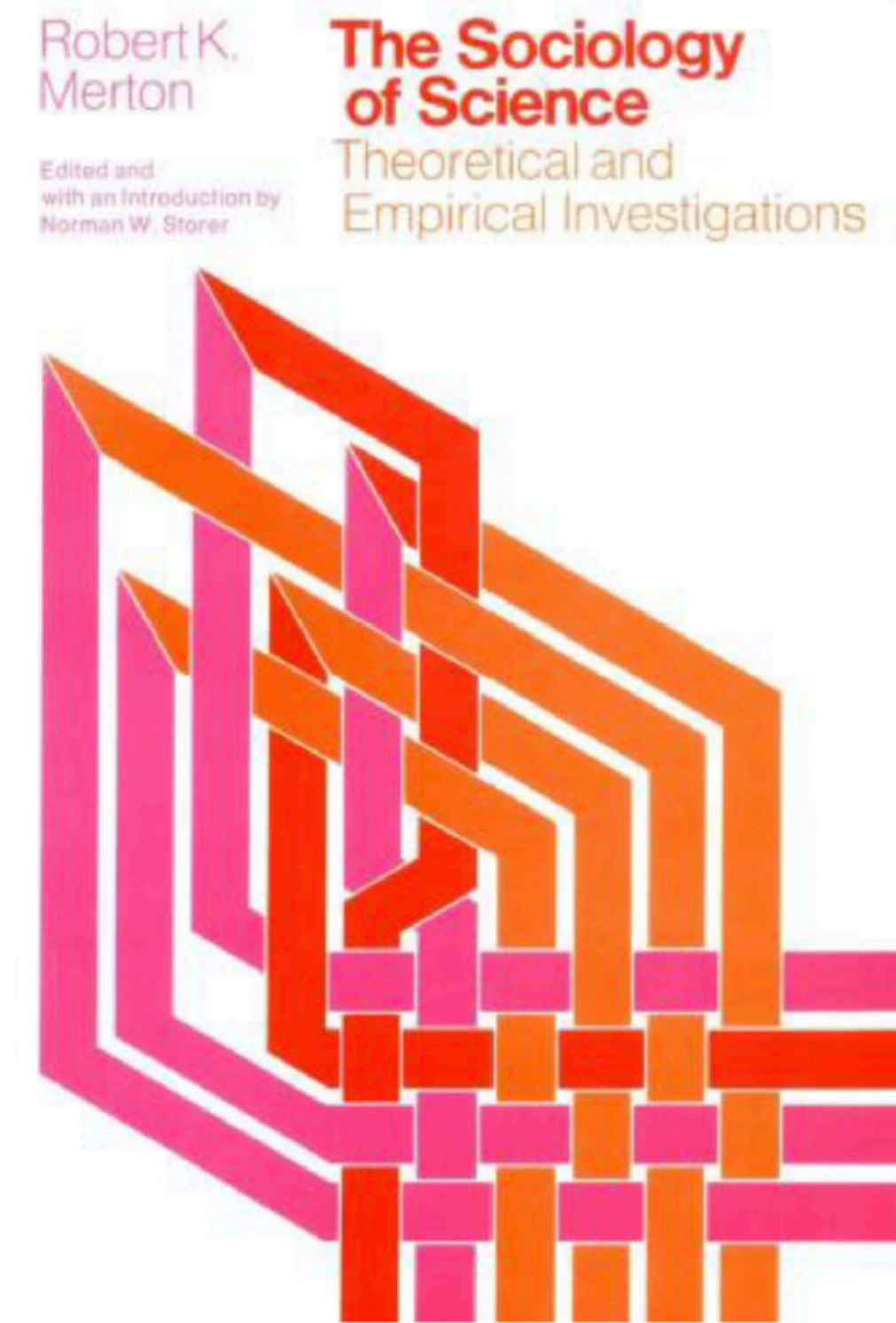


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- that the universe is natural not super-natural or miraculous
- not everything knowable



- posturing about the unknowable (multi-verses, quantum consciousness, the universe as simulation, angels on the head of a pin, and such) is anti-scientific



the story of a journey ...



the story of a journey ...

- how to best **teach** developmental biology



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- how to best **teach** developmental biology



the story of a journey ...

– how to best **teach** developmental biology



- focus on common developmental mechanisms

the story of a journey ...

– how to best **teach** developmental biology



- focus on common developmental mechanisms
- characteristic of socio-cellular processes

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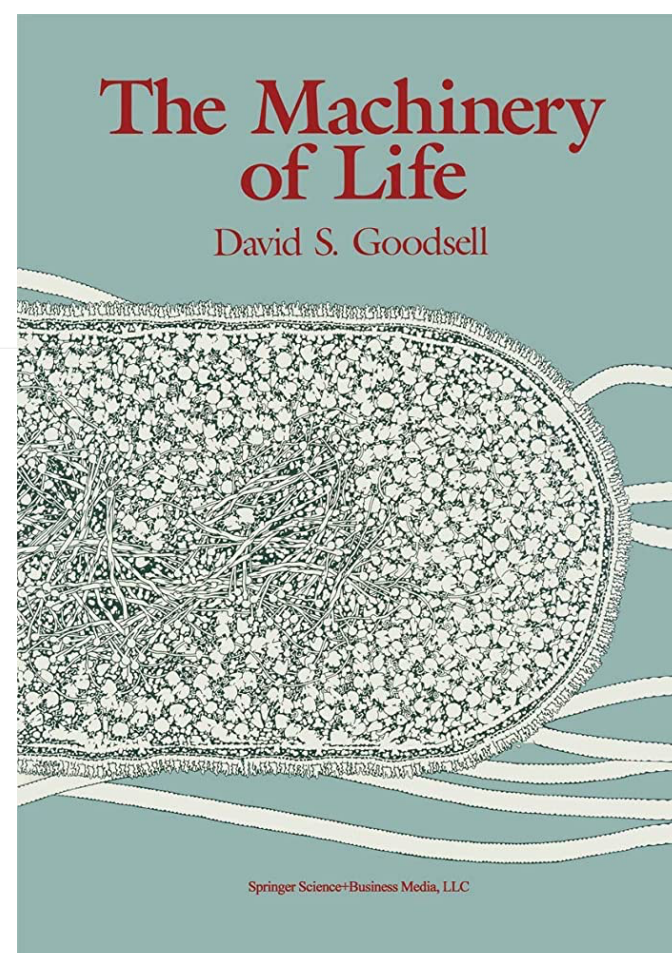
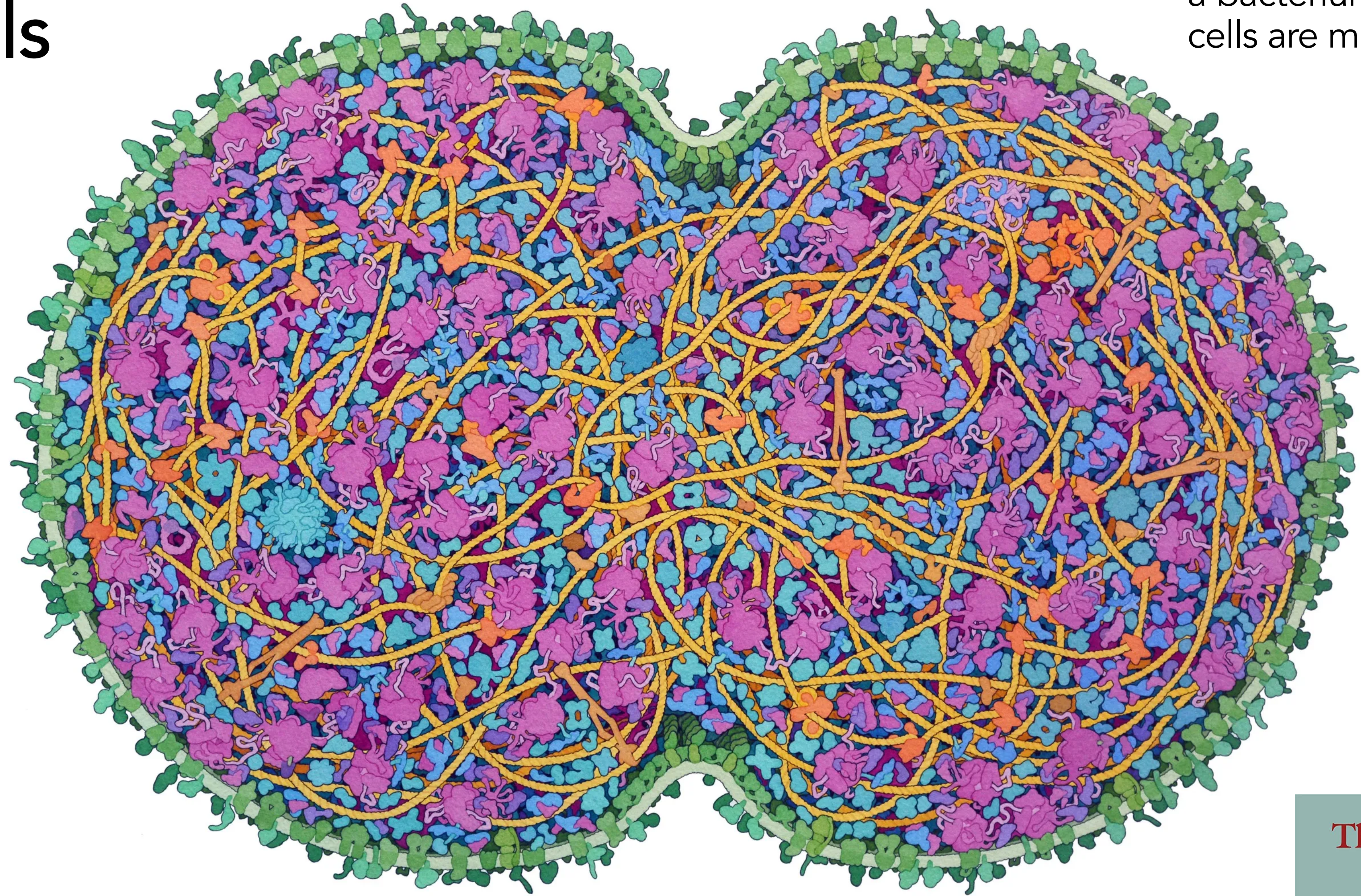


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- such processes, and their biological roles, are rarely introduced to students
- but their ubiquity is being increasingly recognized

it all starts with cells

a bacterium, eukaryotic
cells are much bigger

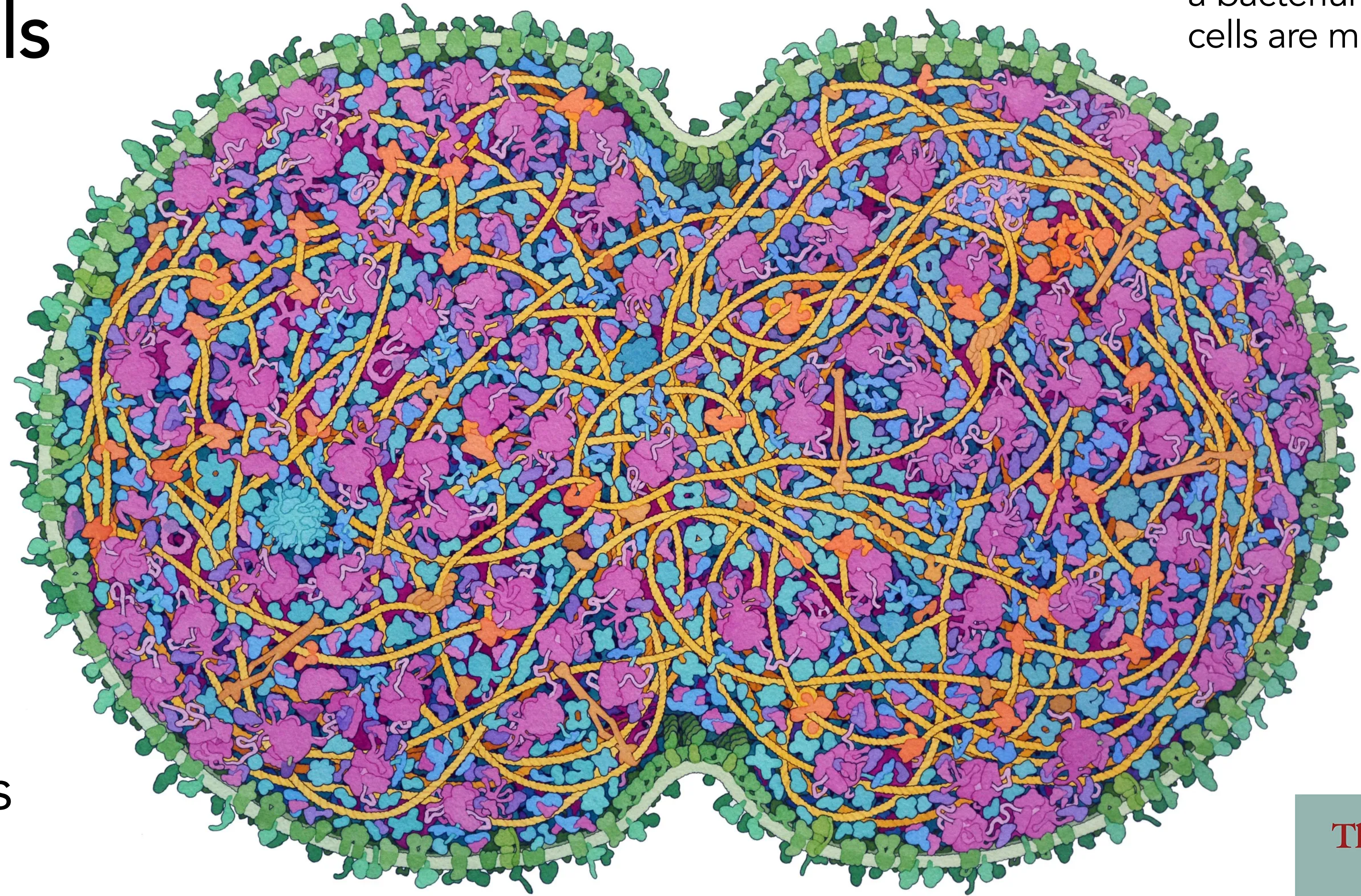


Thinking about the Conceptual Foundations of the
Biological Sciences

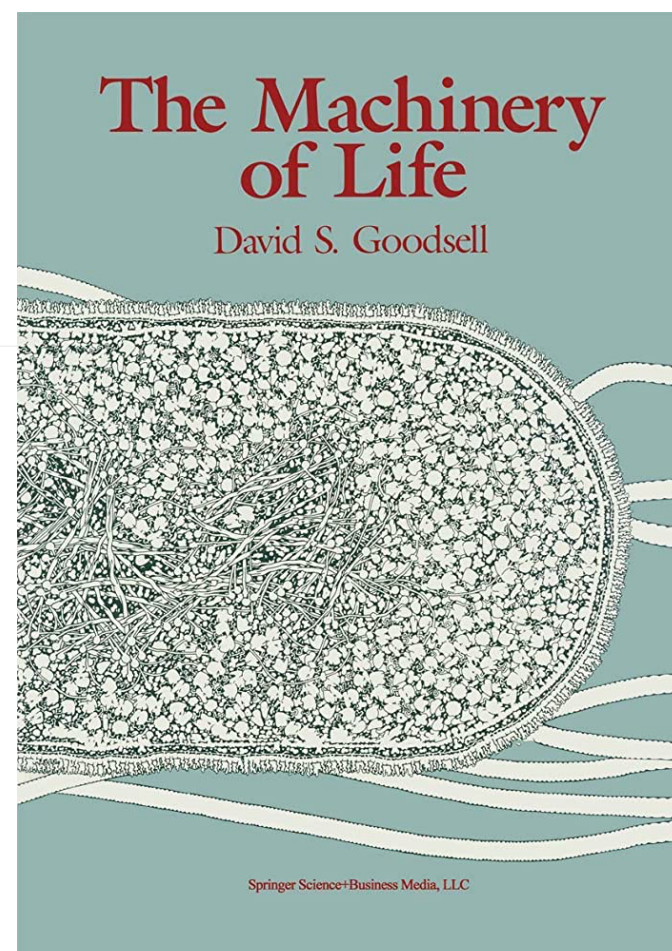
M. W. Klymkowsky

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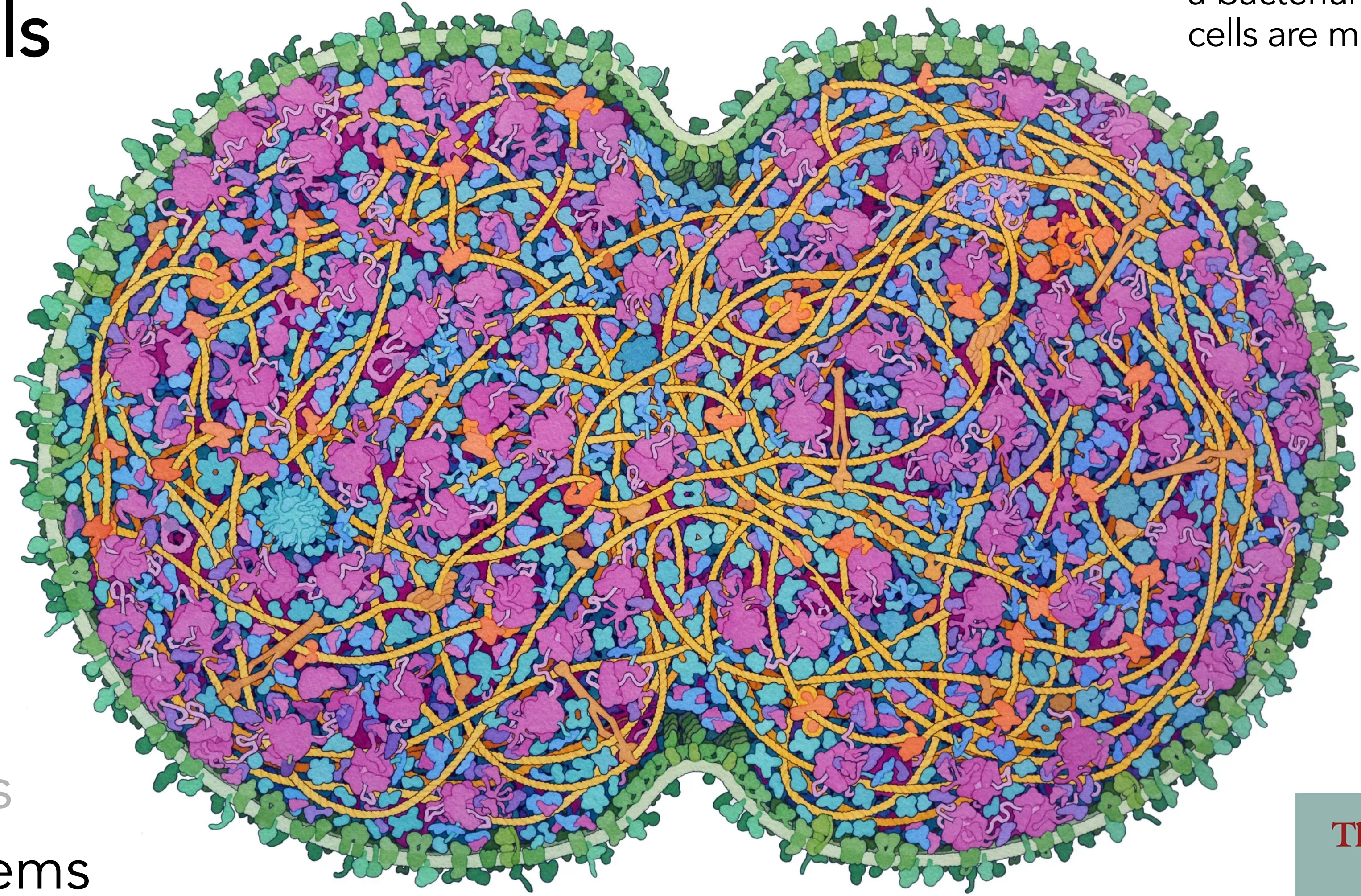


- bounded, continuous

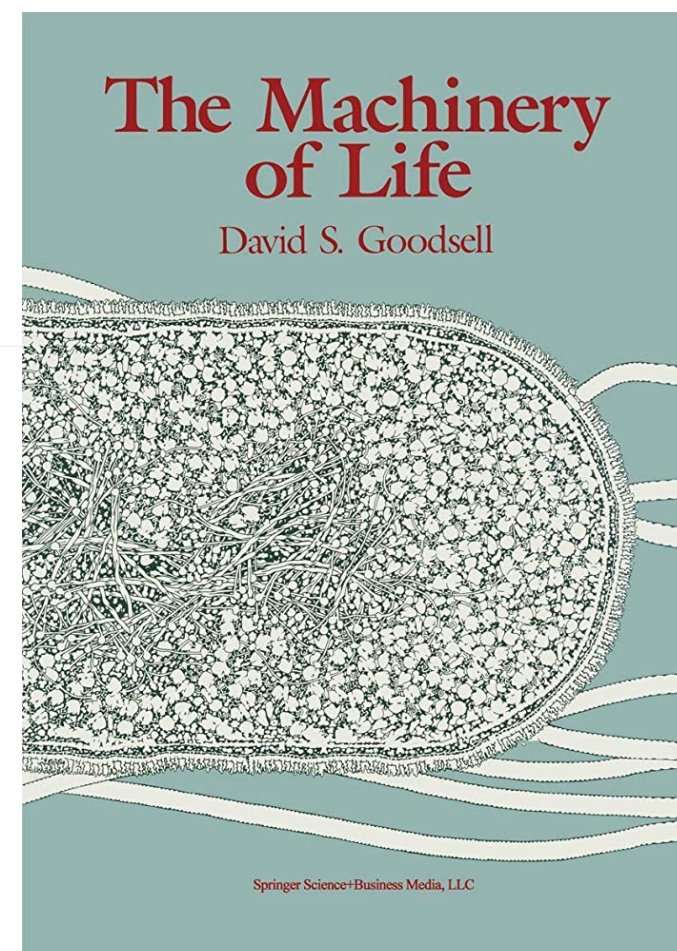


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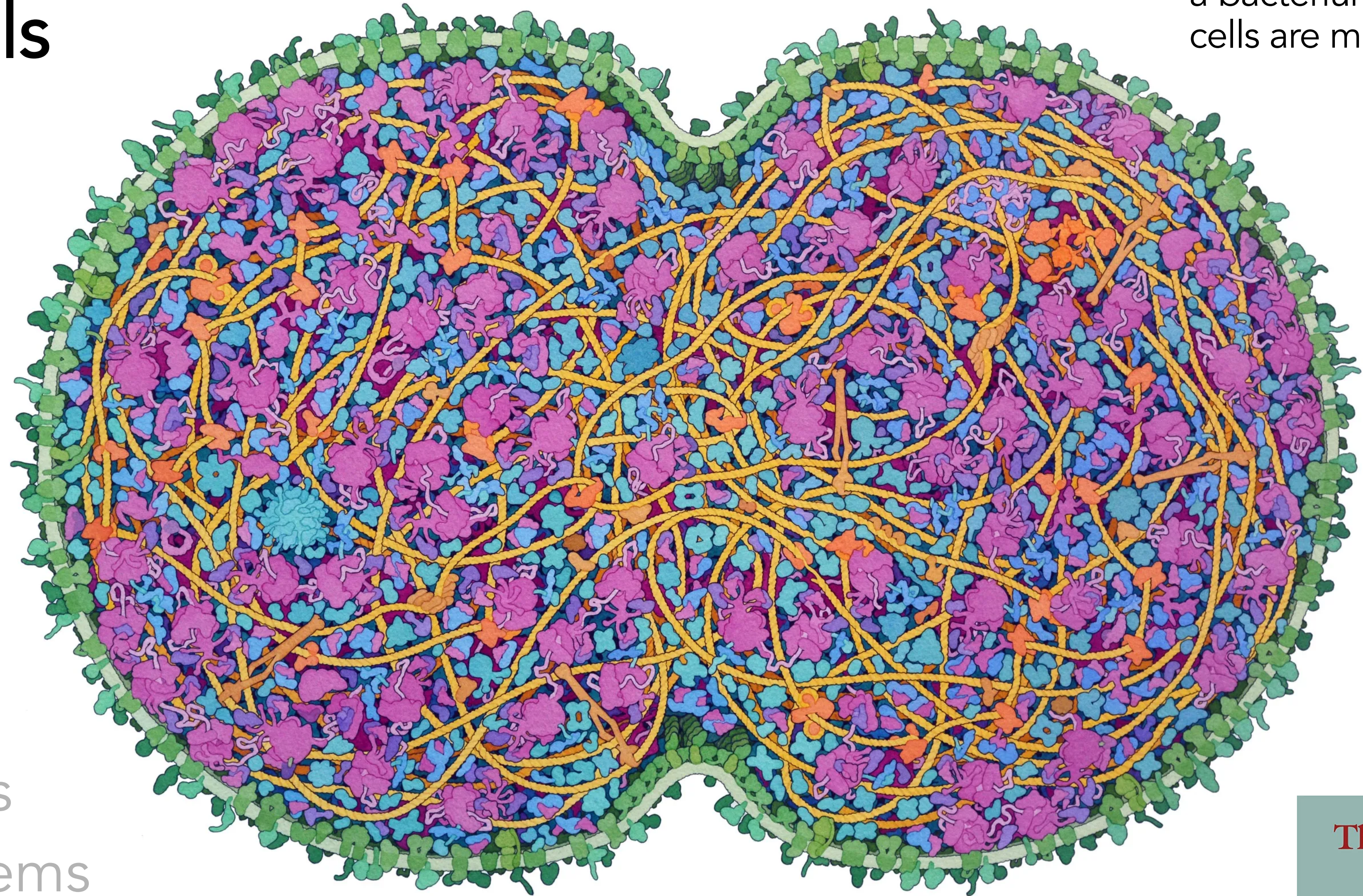


- bounded, continuous
- non-equilibrium systems

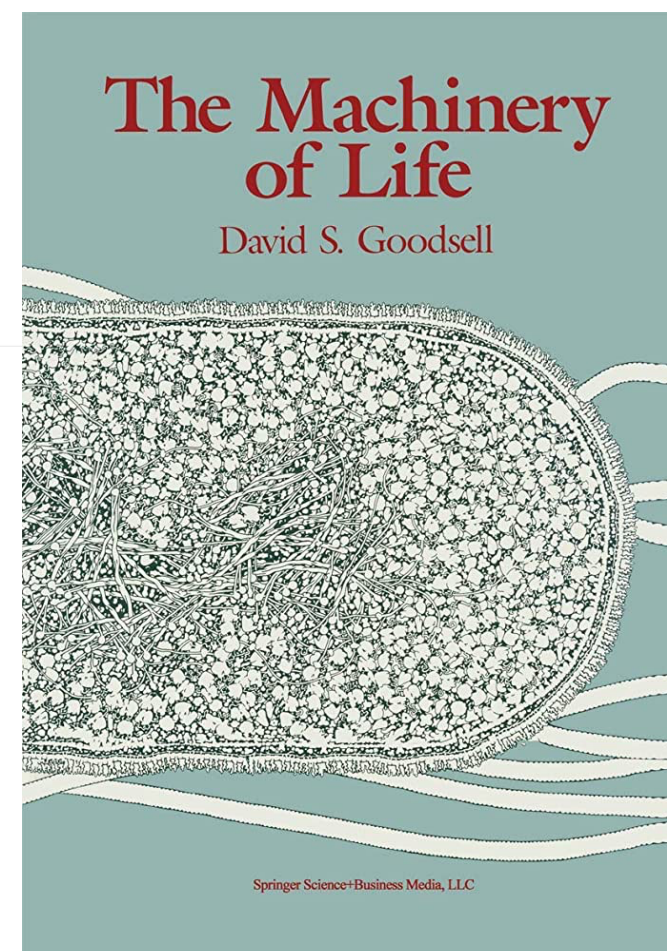


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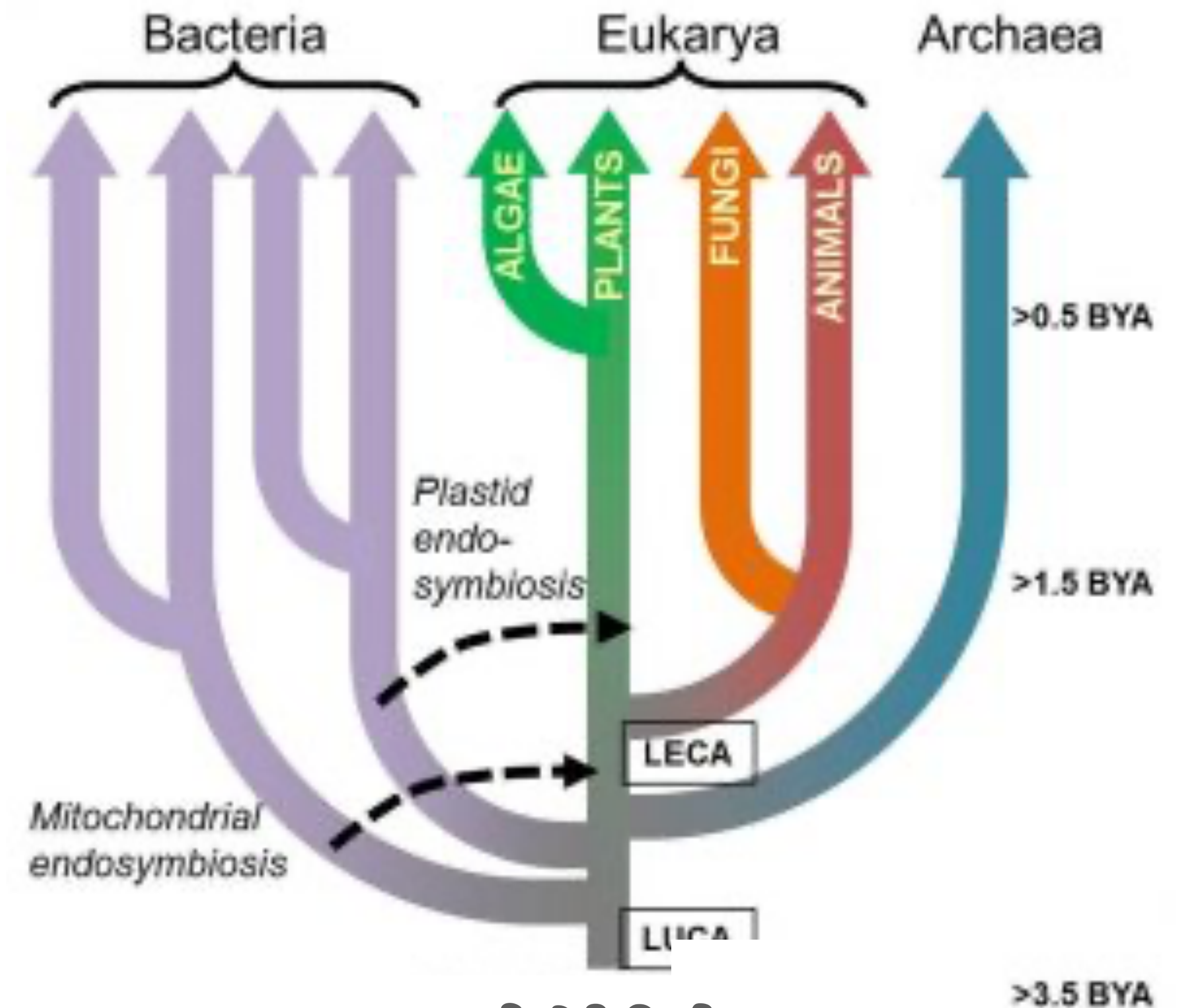
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- bounded, continuous
- non-equilibrium systems
- controlled by selection-derived information stored in DNA & cell structure



Cellular systems are ancient ...
an unbroken (~3.5 billion year
long) lineage



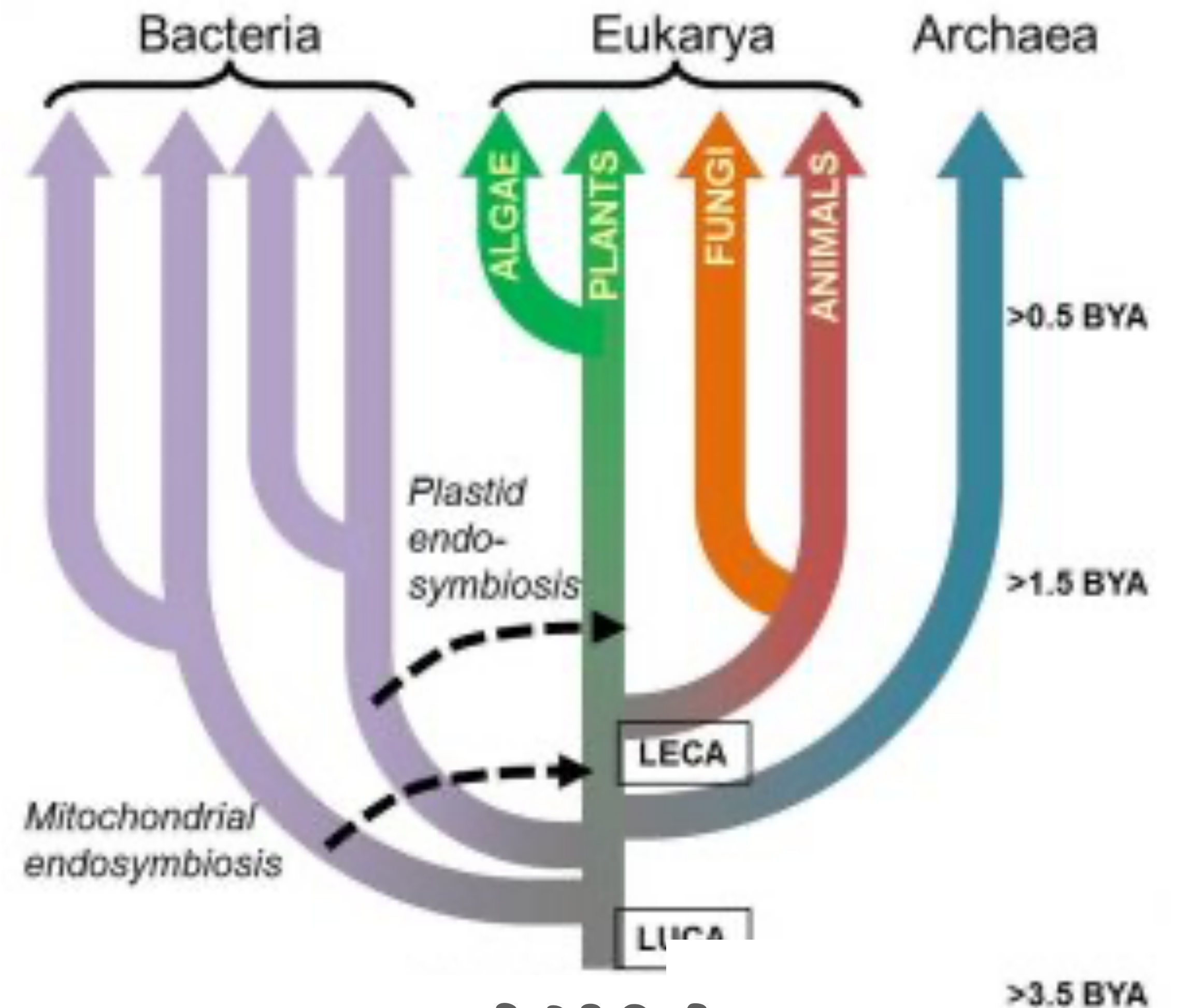
LUCA

origin of "living" systems
exact details are unknowable

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All cells, in all organisms, share a
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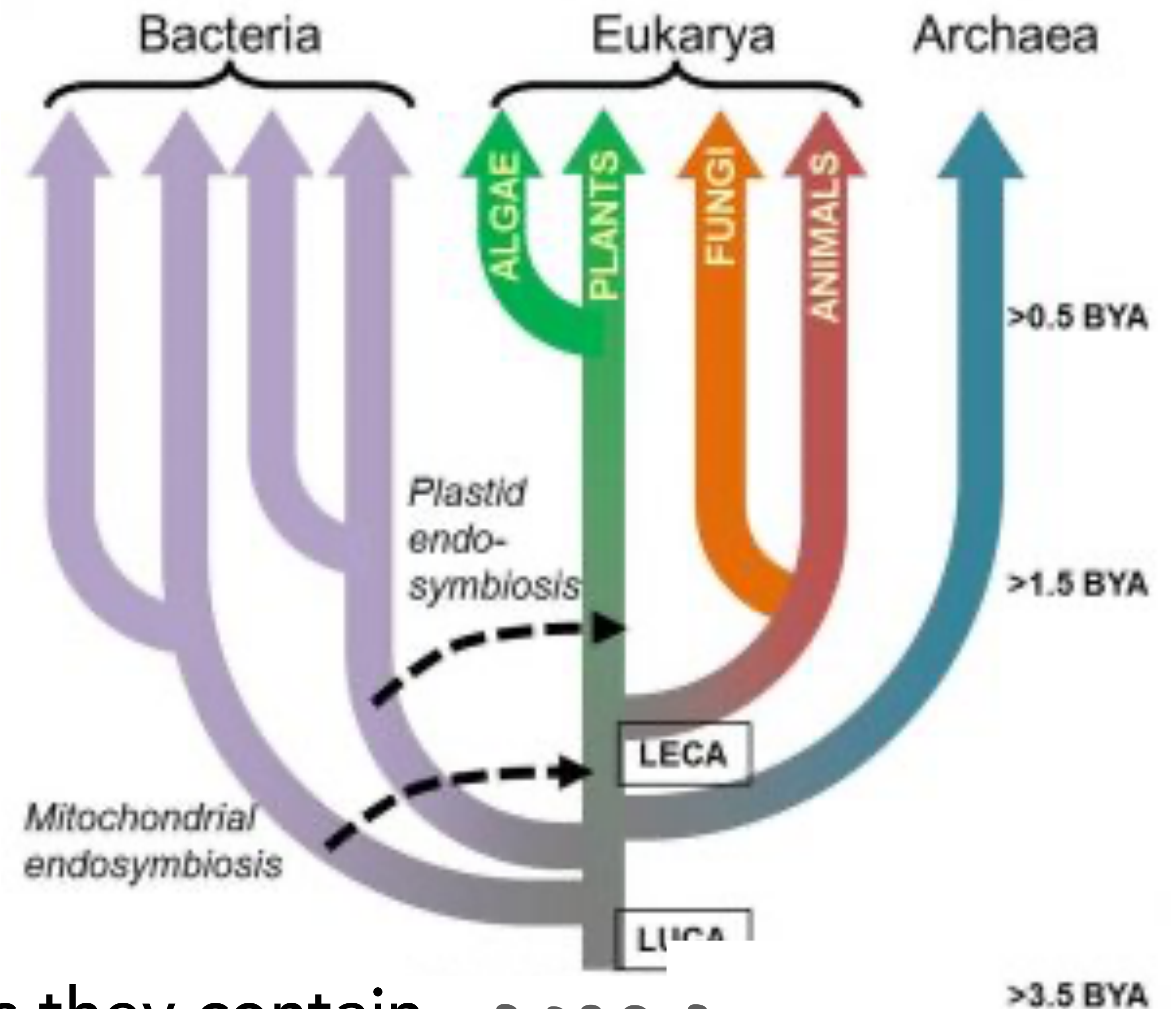
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All cells, in all organisms, share a
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Cells differ in terms of the genes they contain
and the structures and processes then make possible



LUCA

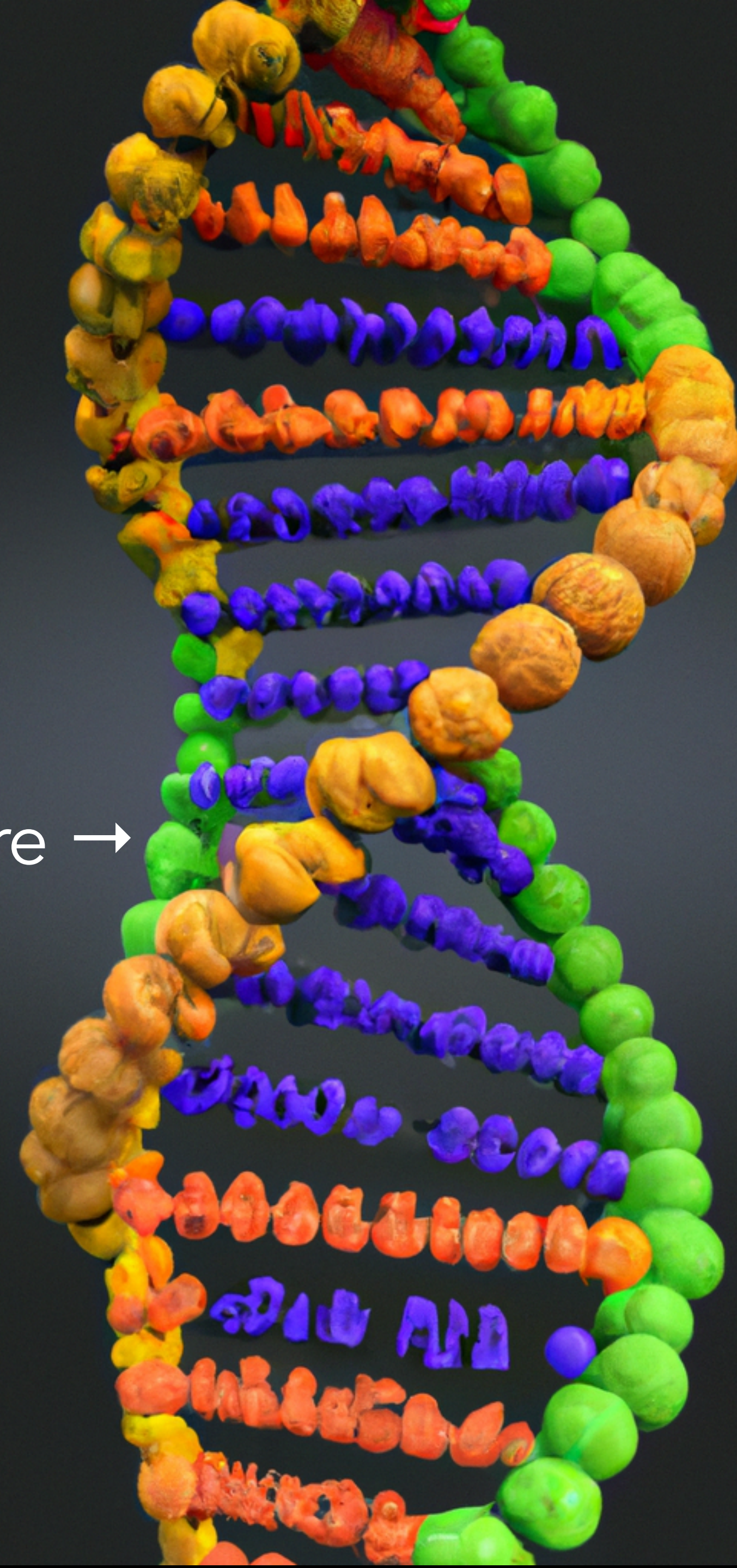
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I was hoping to use AI
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still has a way to go
(something weird happening here →



Cells “obey” the law ...

one reason to take chemistry

Using Catalysis to Drive Chemistry Away from Equilibrium: Relating Kinetic Asymmetry, Power Strokes, and the Curtin–Hammett Principle in Brownian Ratchets

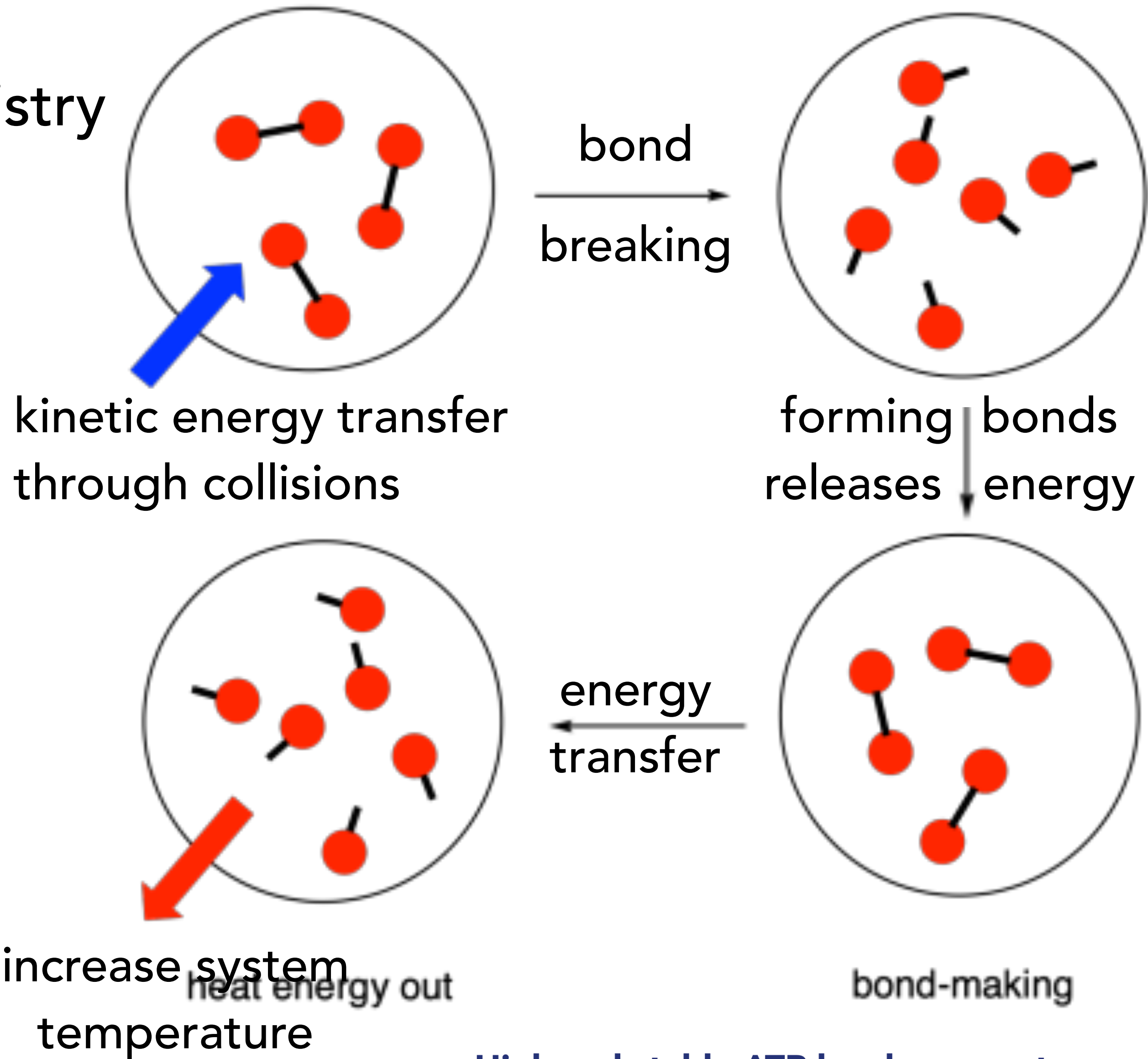
Shuntaro Amano, Massimiliano Esposito, Elisabeth Kreidt, David A. Leigh,^{*} Emanuele Penocchio,^{*} and Benjamin M. W. Roberts

High and stable ATP levels prevent aberrant intracellular protein aggregation in yeast

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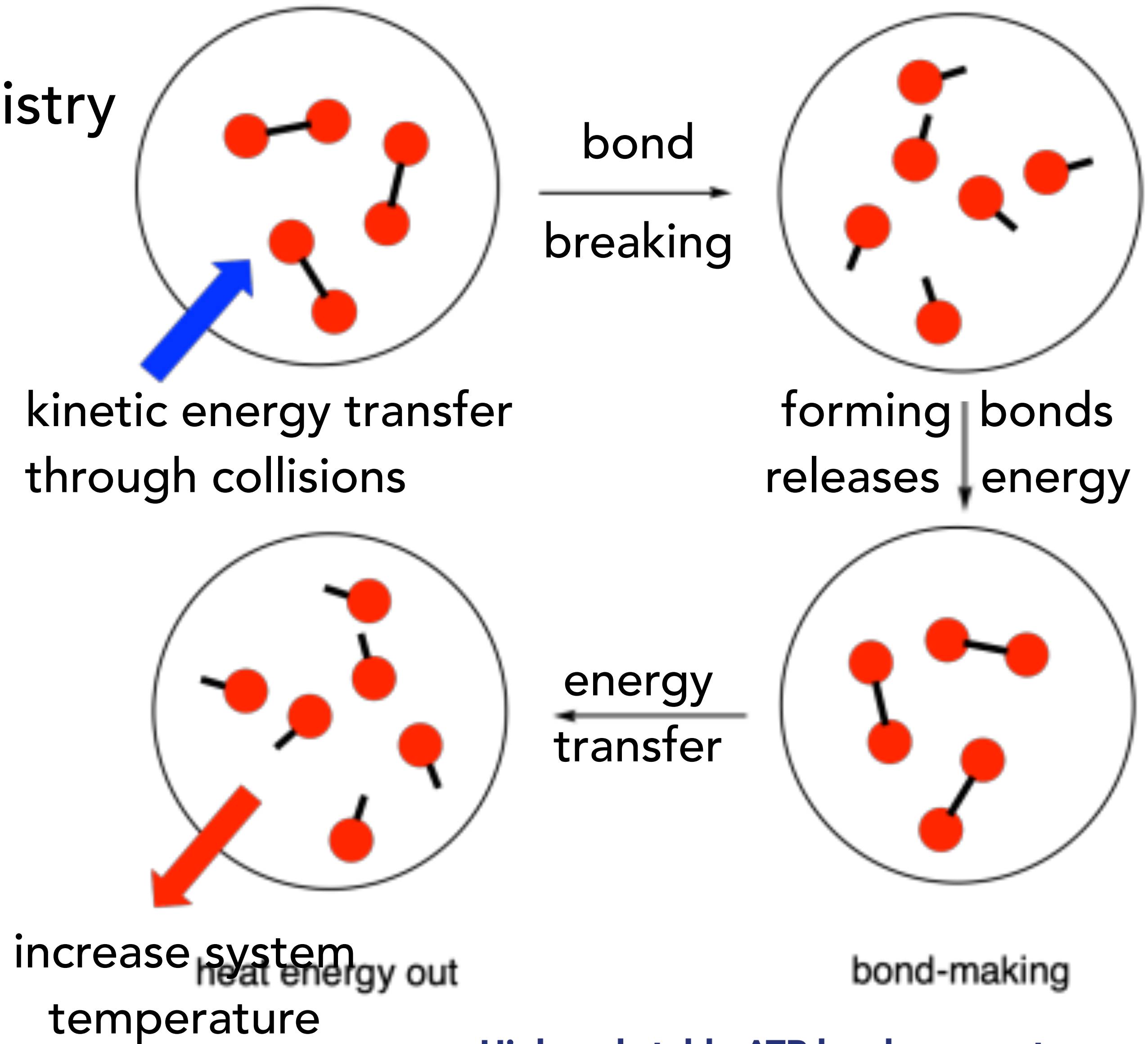
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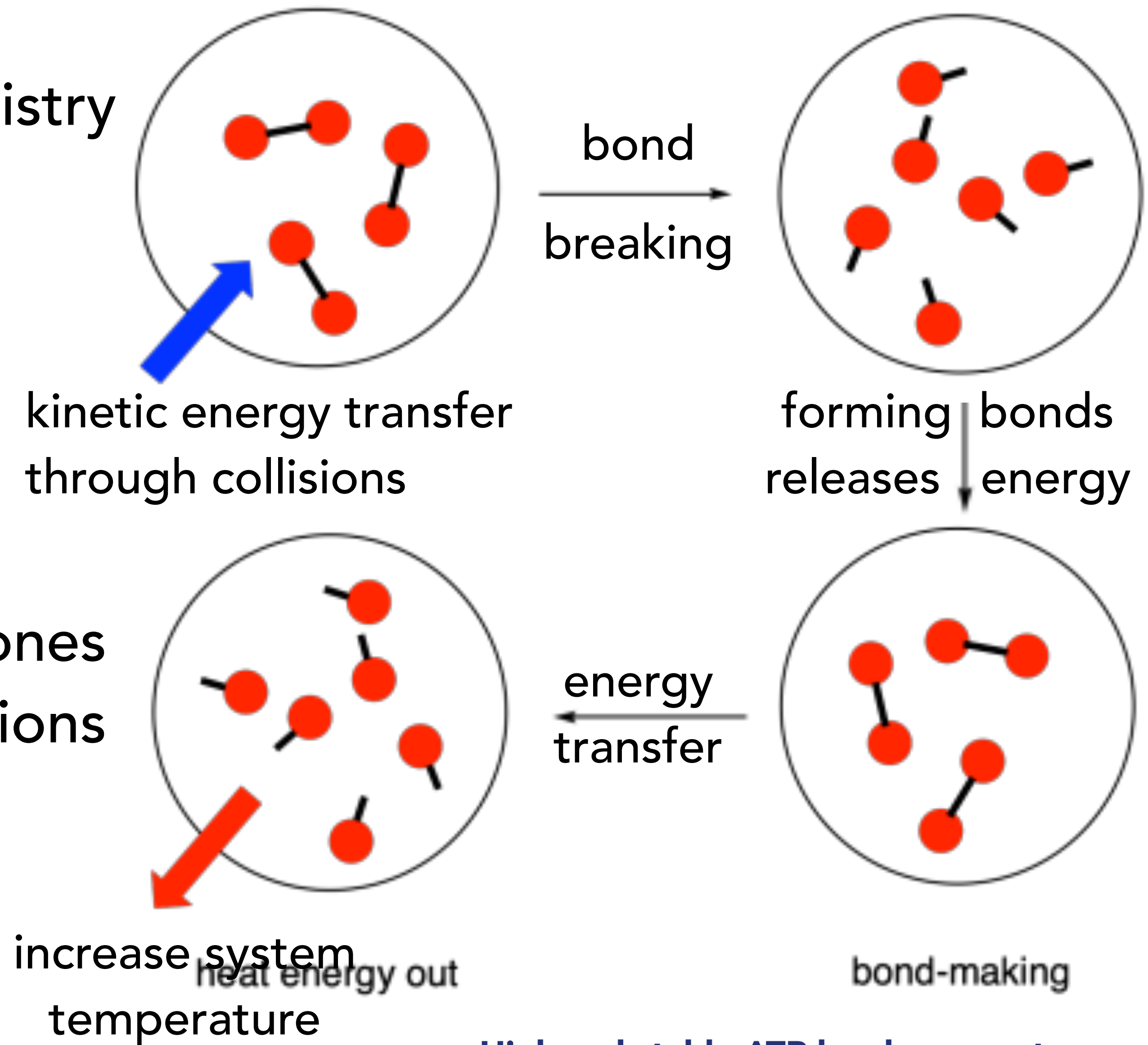
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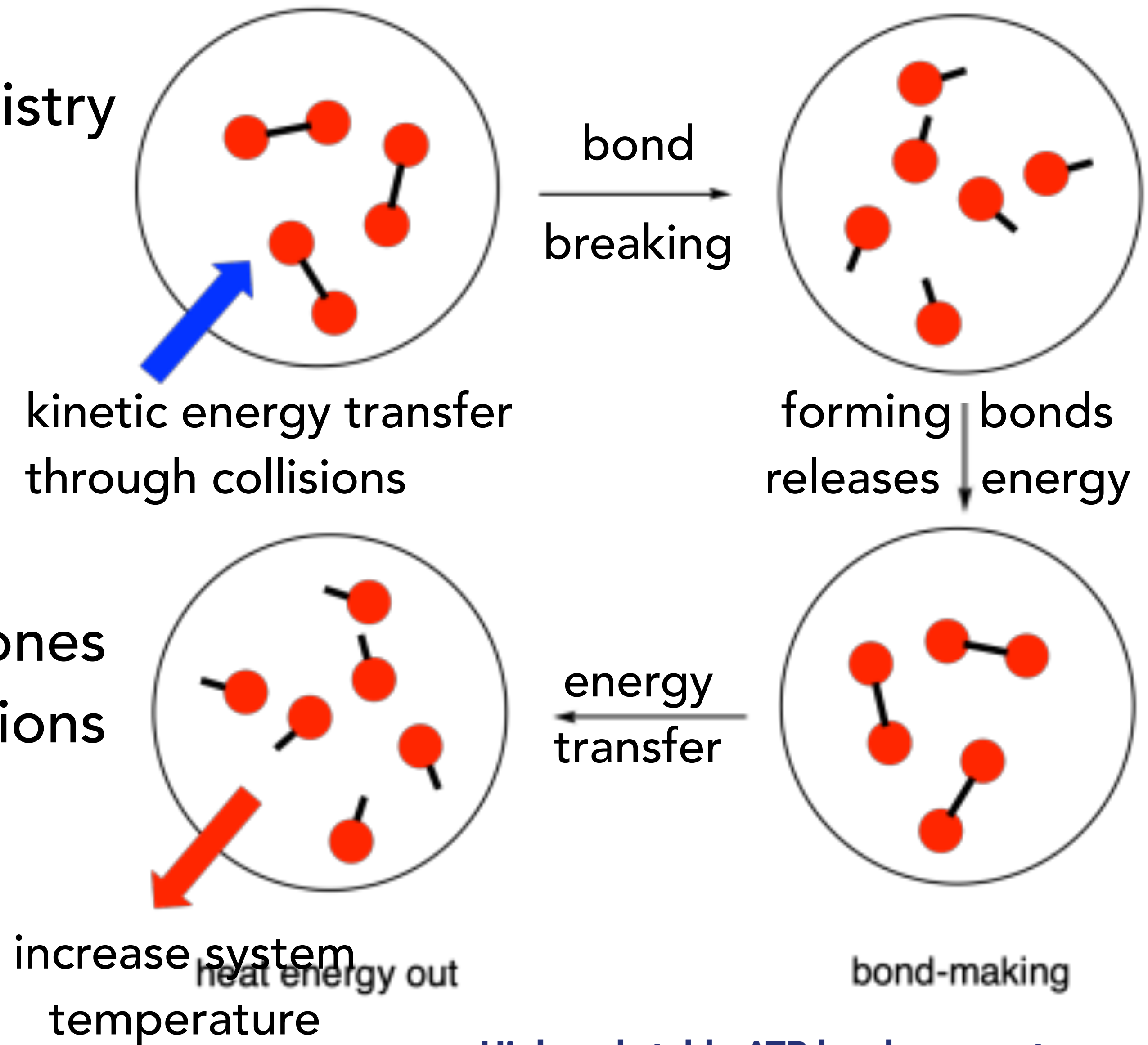
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BUT cellular processes are
inherently noisy



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Why noisy?

Size-dependent studies of macromolecular crowding on the thermodynamic stability, structure and functional activity of proteins: *in vitro* and *in silico* approaches

Sumra Shahid, Md. Imtaiyaz Hassan, Asimul Islam ^{*}, Faizan Ahmad

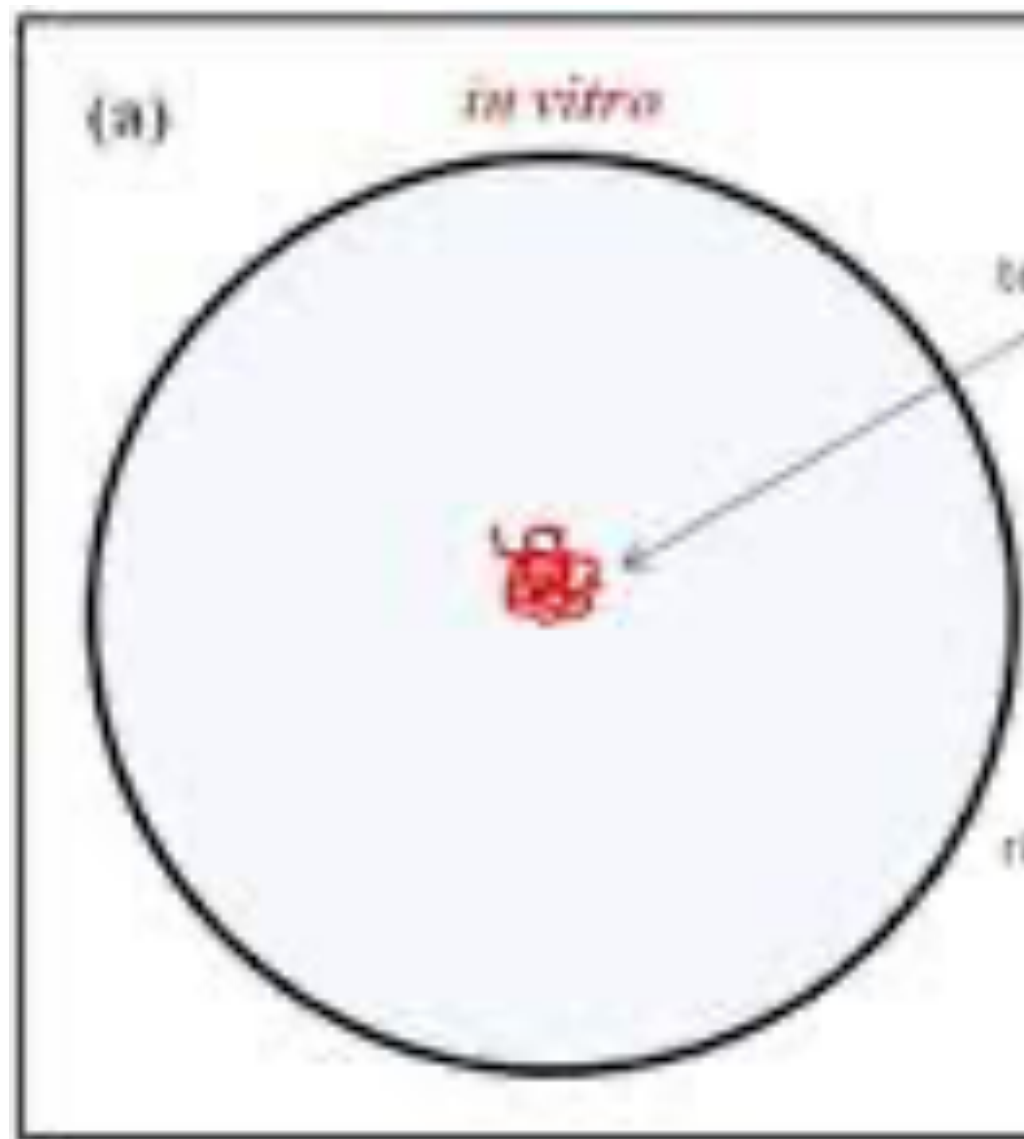
Why noisy? – because cells are small

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A typical chemical / physical system consists of bizzillions (of a few types) of molecules



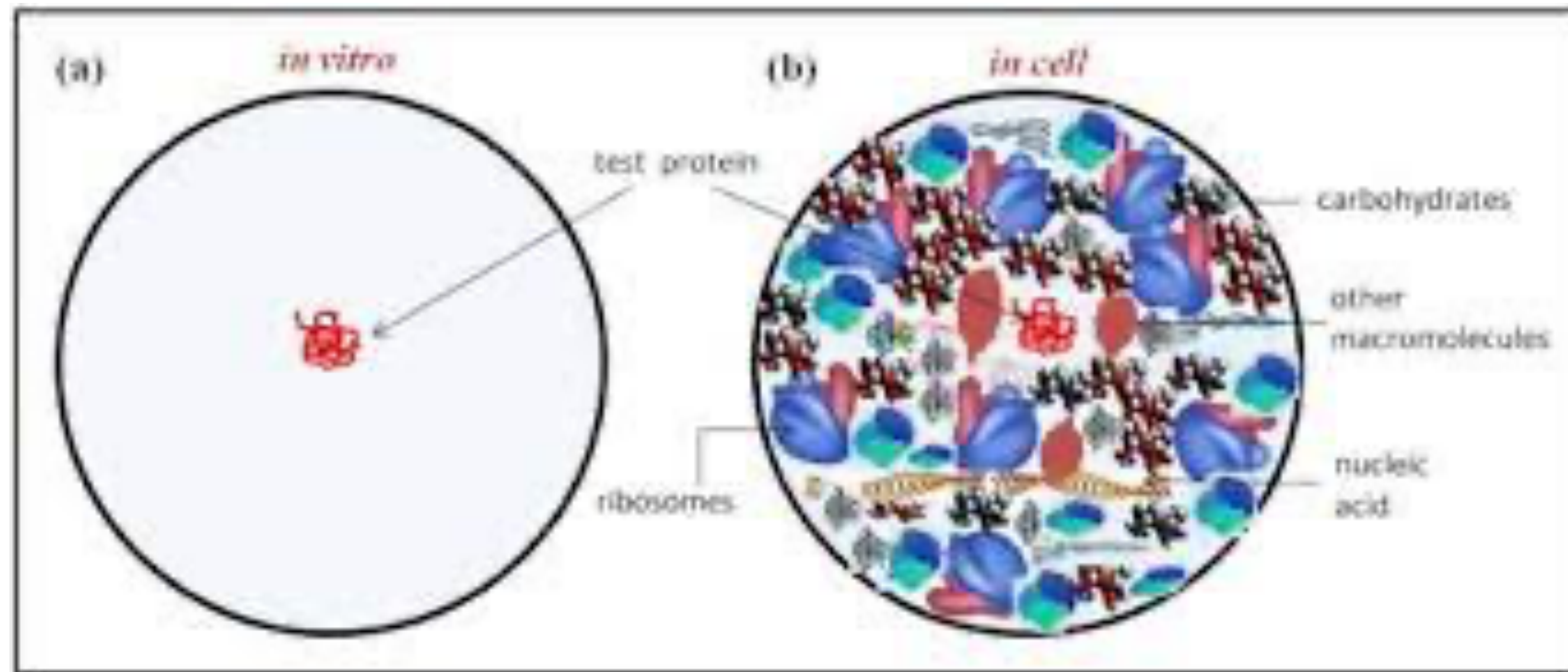
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Why noisy?

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A typical chemical / physical system consists of bizzillions (of a few types) of molecules



each cell contains (relatively) small numbers of many different types of interacting molecules and one or two copies of each gene

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- while **stochastic** means ...
 - individual events are **unpredictable**
 - while the behavior of a large (enough) population is predictable



Moses as a kid

Throwing (fair) dice - a stochastic process



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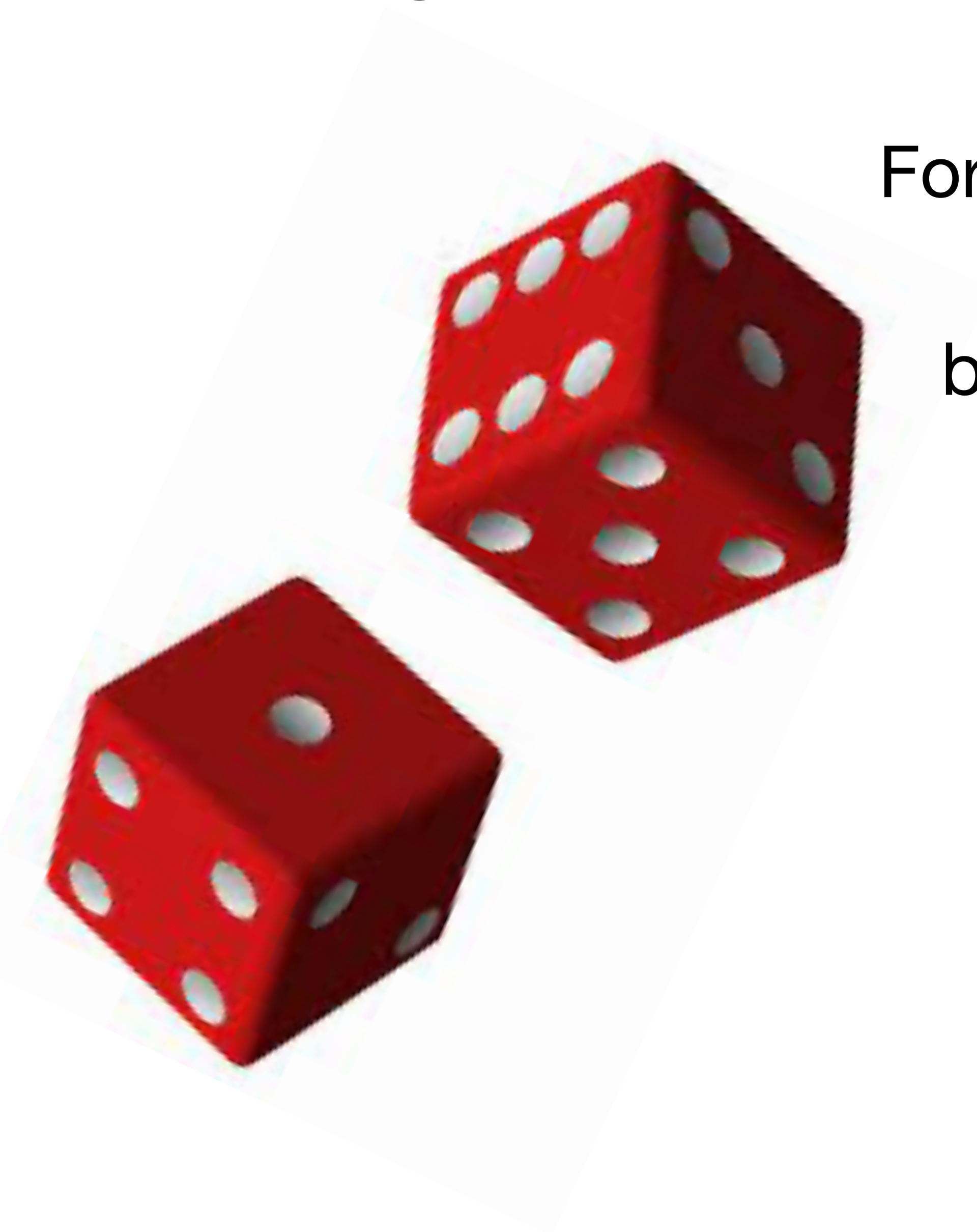
For any one throw, the outcome is unpredictable



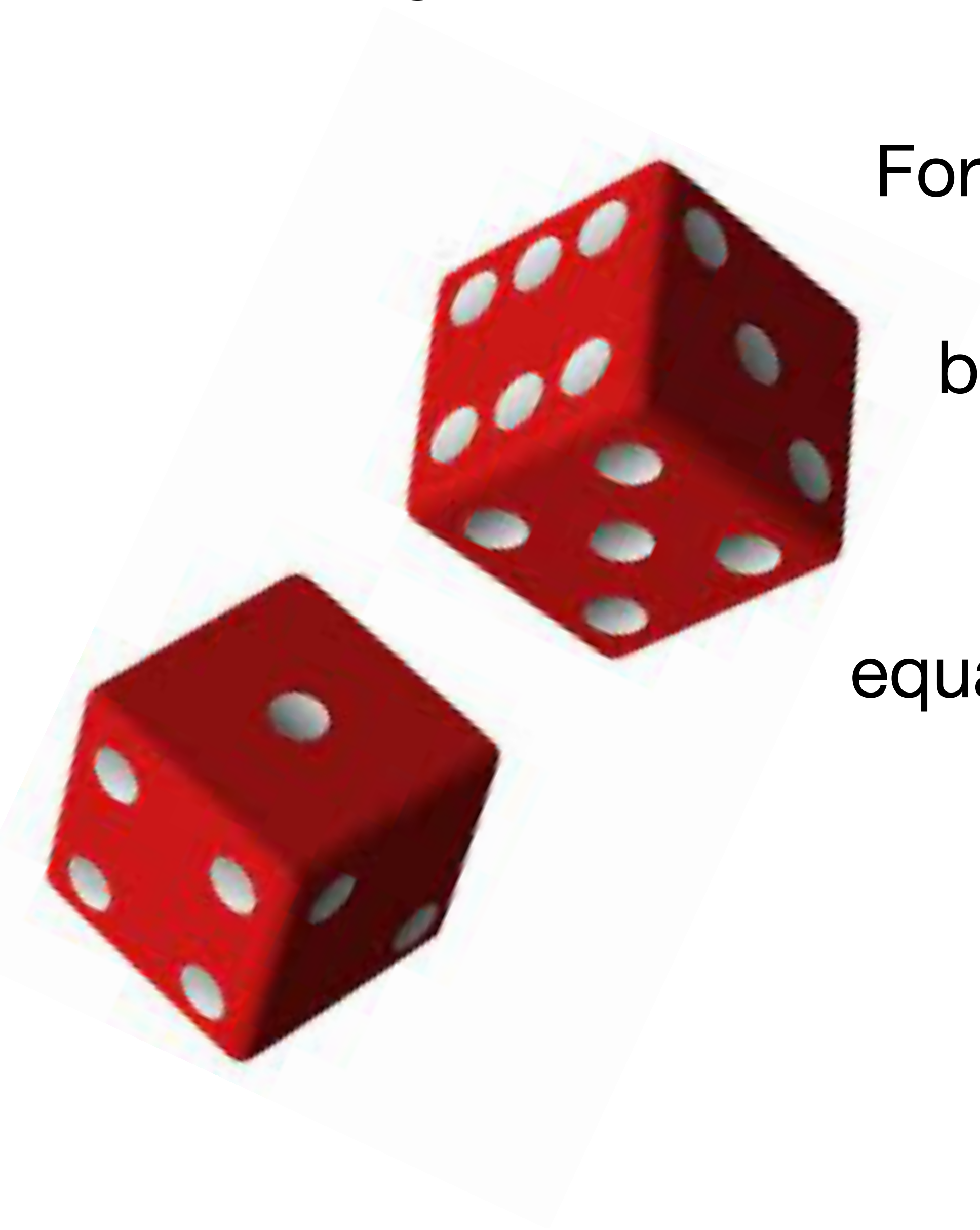
Throwing (fair) dice - a stochastic process

For any one throw, the outcome is unpredictable

but as the number of throws increases the
overall outcome becomes predictable

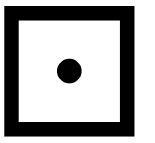
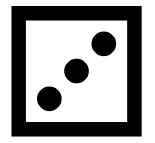
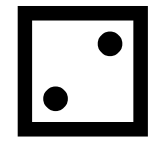
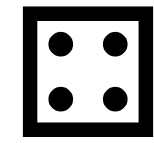
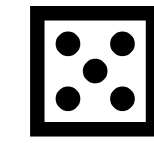
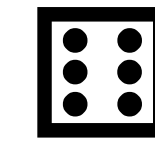


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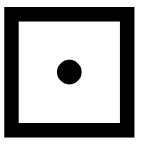
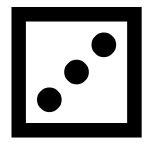
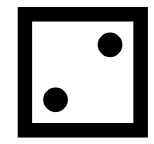
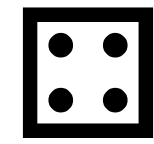
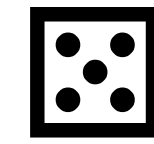
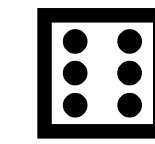
equal numbers of      

Throwing (fair) dice - a stochastic process



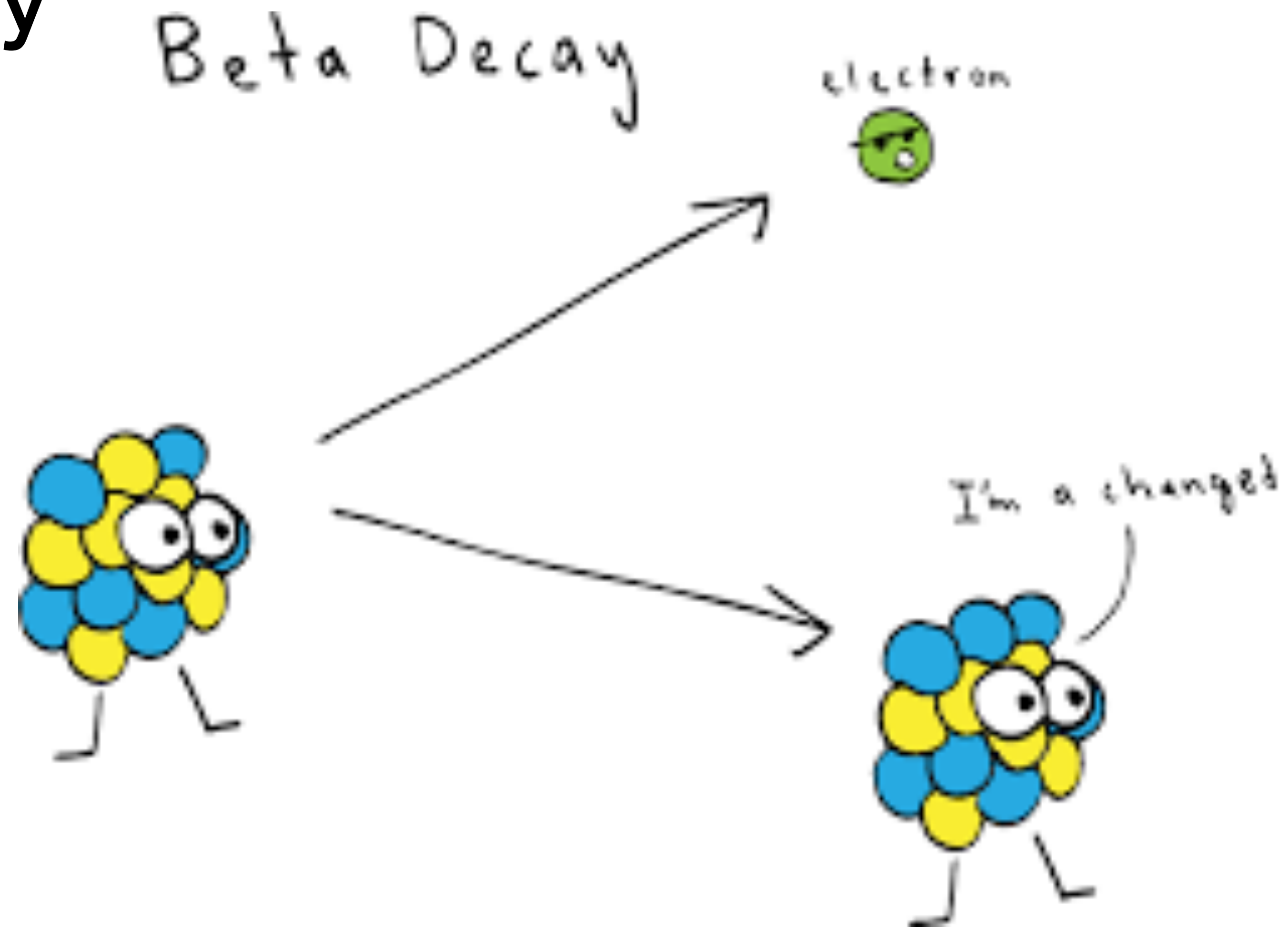
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equal numbers of      

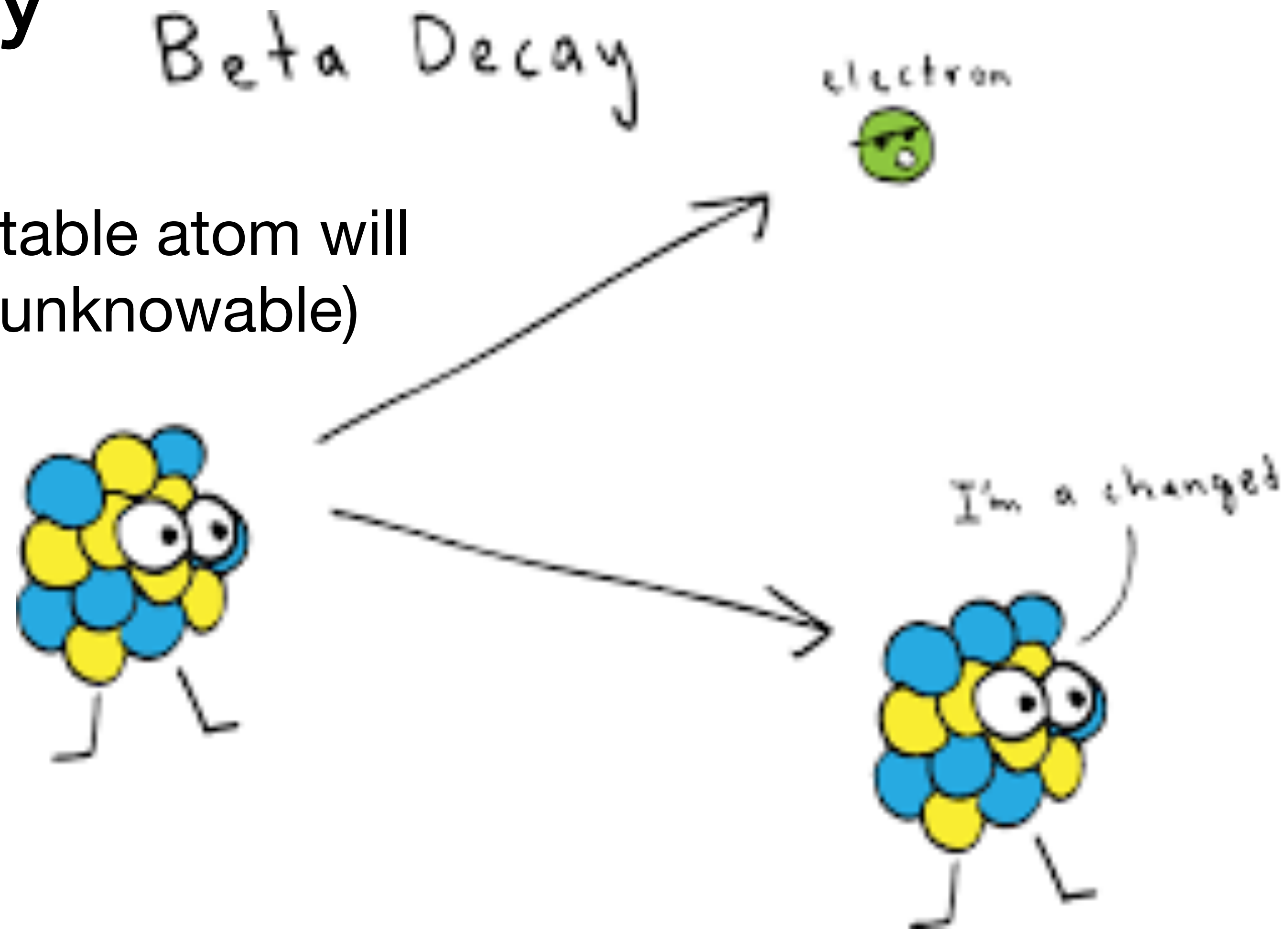
Each throw (event) is independent – gambler's fallacy

Same with radioisotope decay



Same with radioisotope decay

when any particular unstable atom will decay is unpredictable (unknowable)



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maybe the next moment,
maybe in a billion years



Beta Decay



I'm a changed



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But consider bazillions of atoms: the time at which 50% have decayed can be known very accurately

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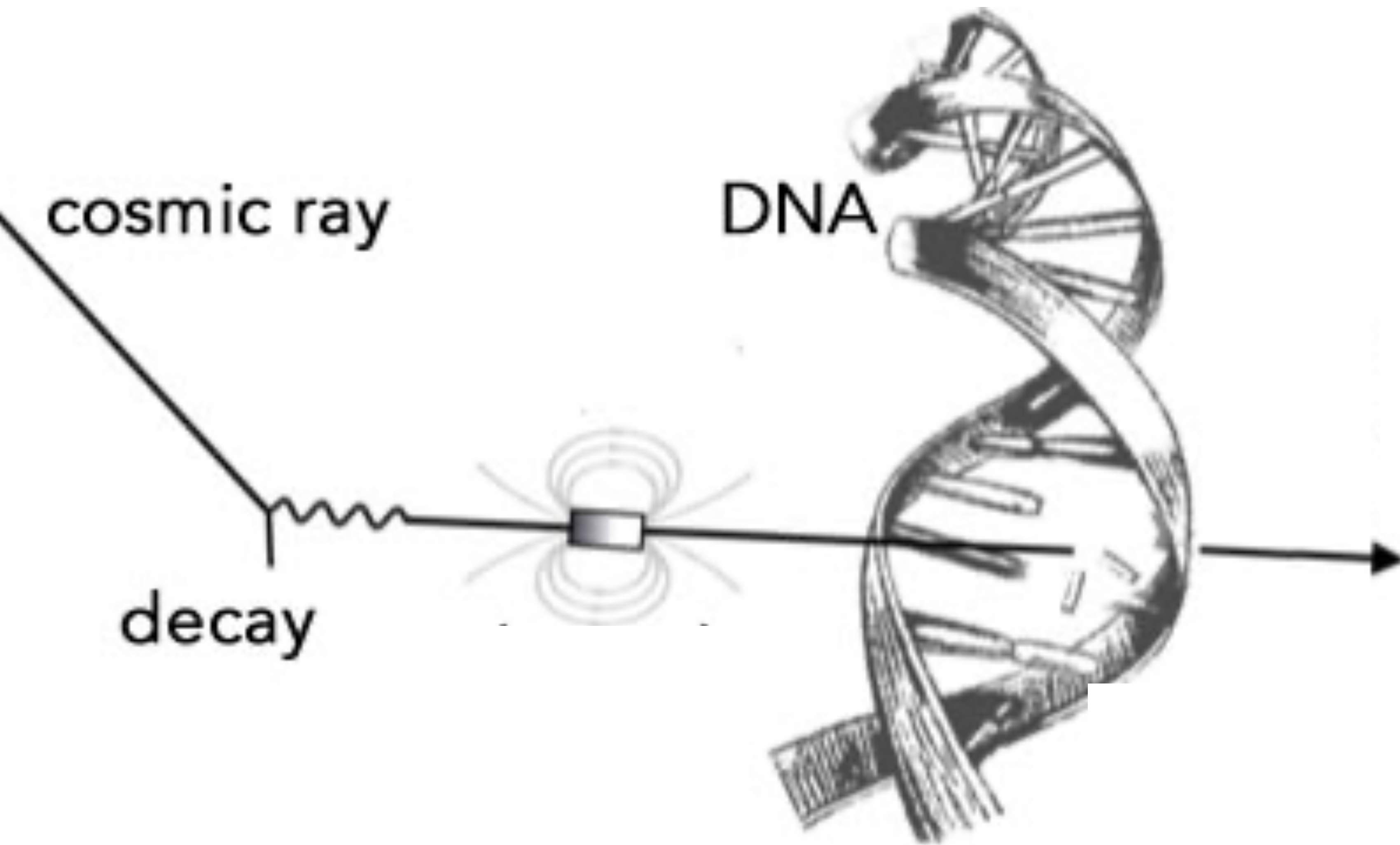


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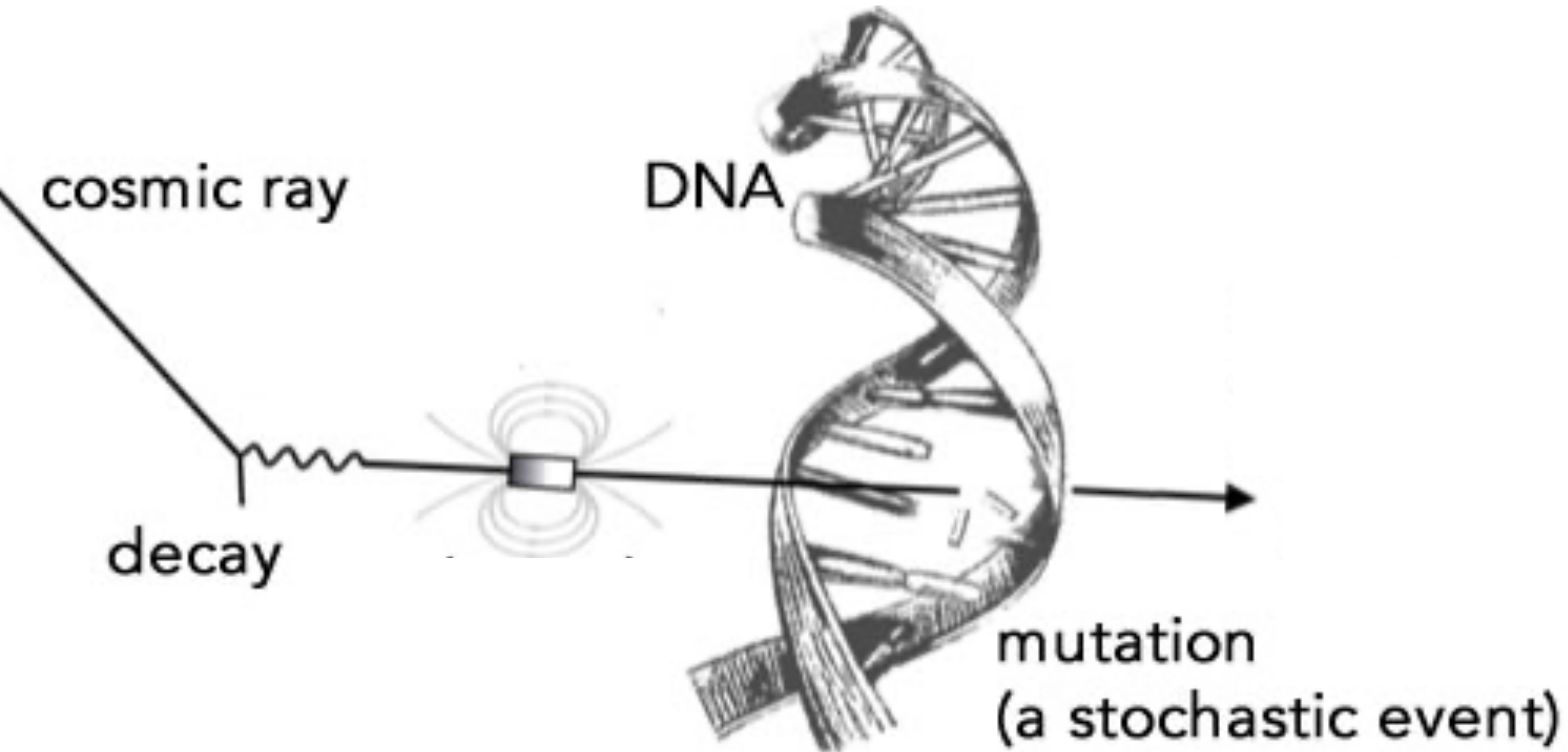
generally (in chemistry and physics) individual events do not “matter “

**not so in biological systems, stochastic events can matter
(big time)**

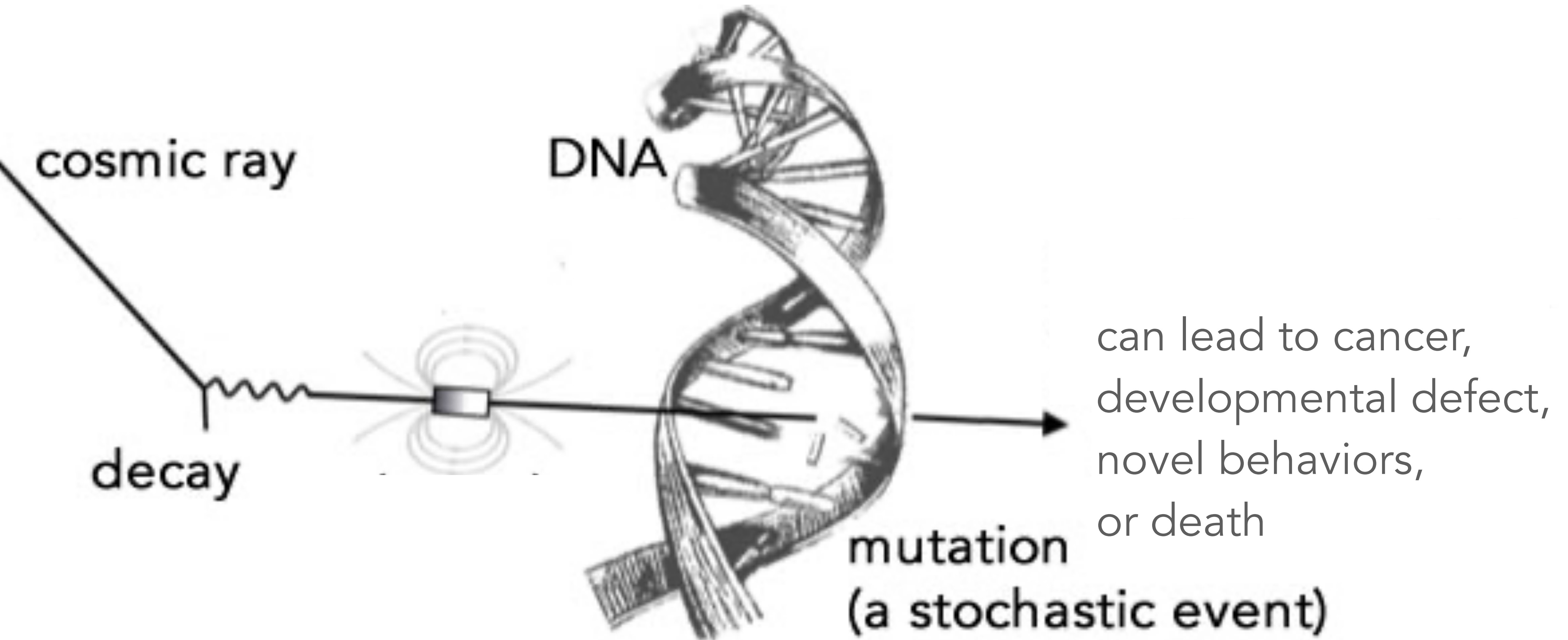
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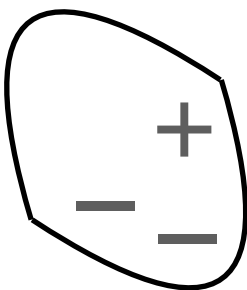
beyond mutation: molecular interactions are stochastic

interactions

based on surface

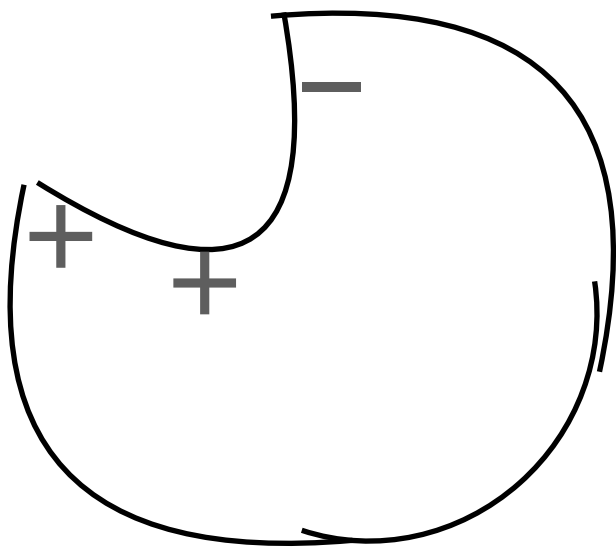
+/- charges
and molecular

shape



regulator

regulated
protein



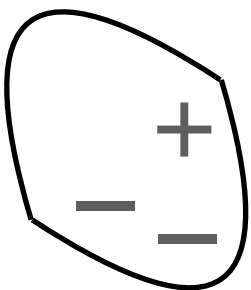
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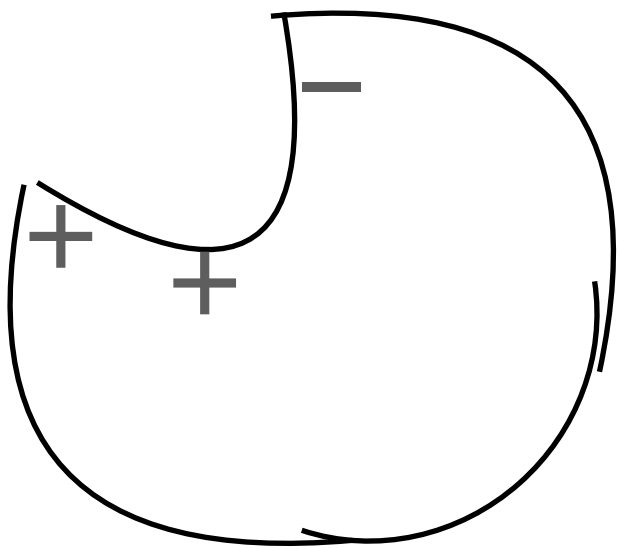
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based on unpredictable (and
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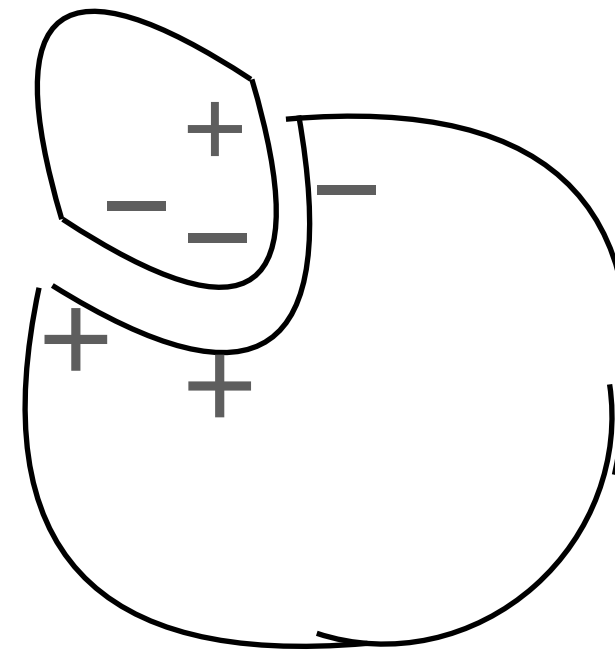
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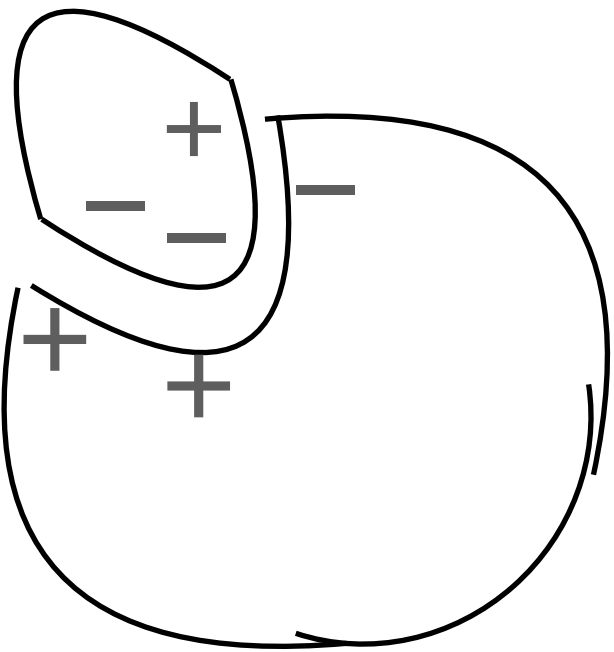
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on binding,
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downstream effects

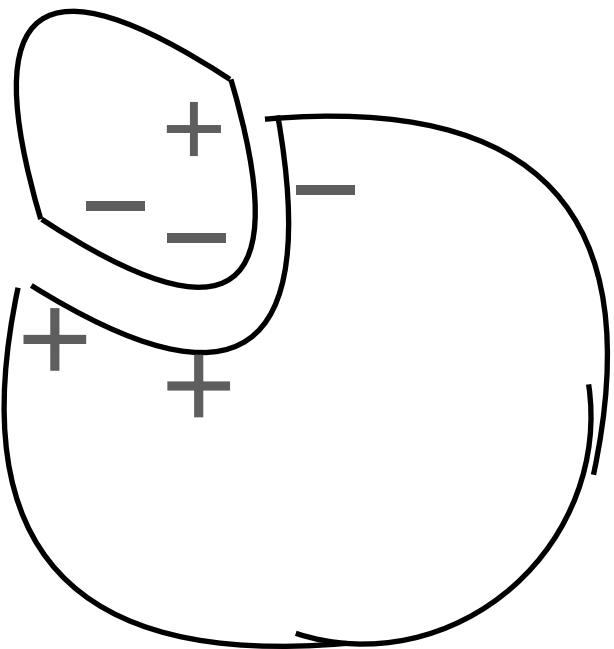
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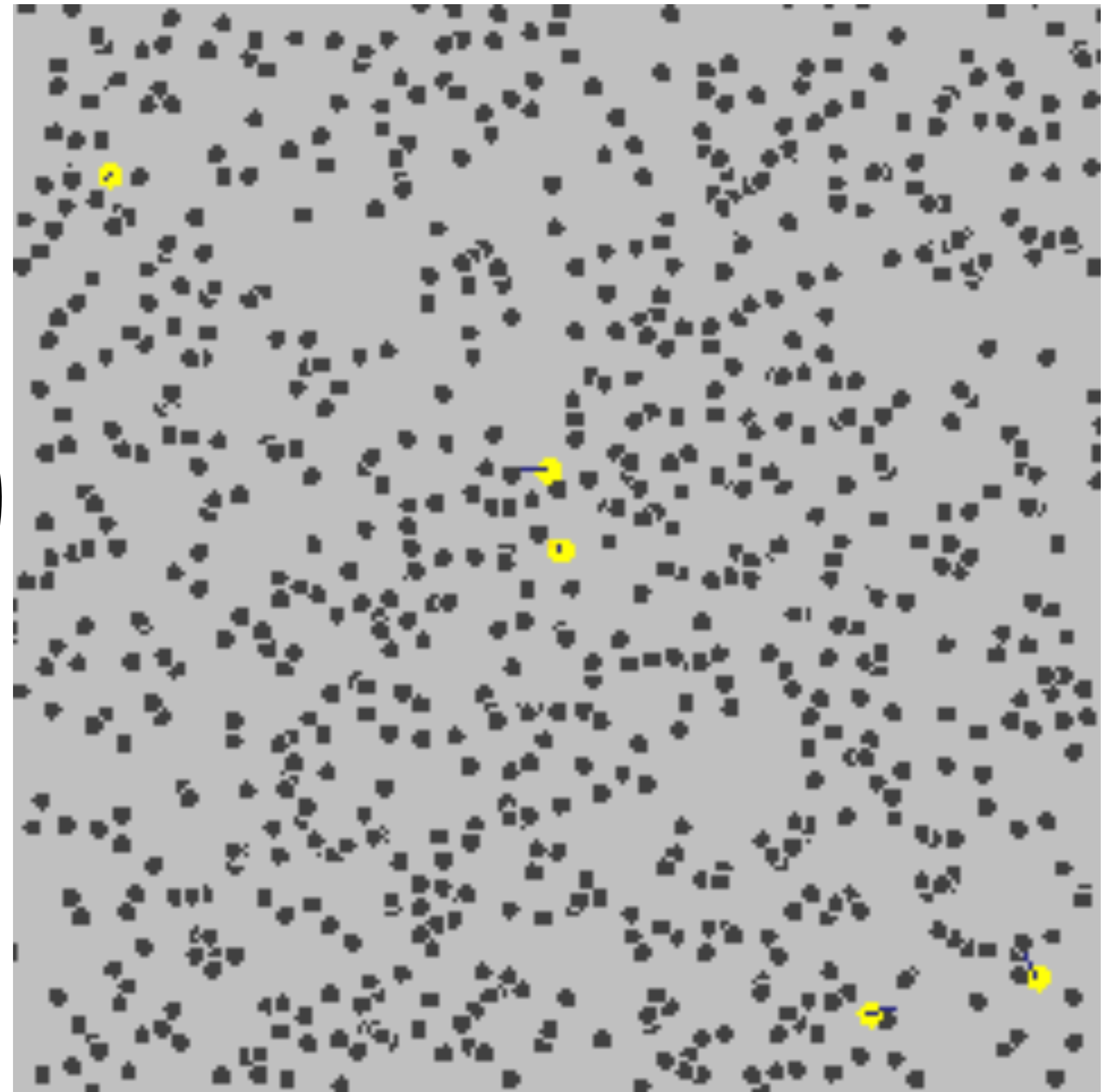
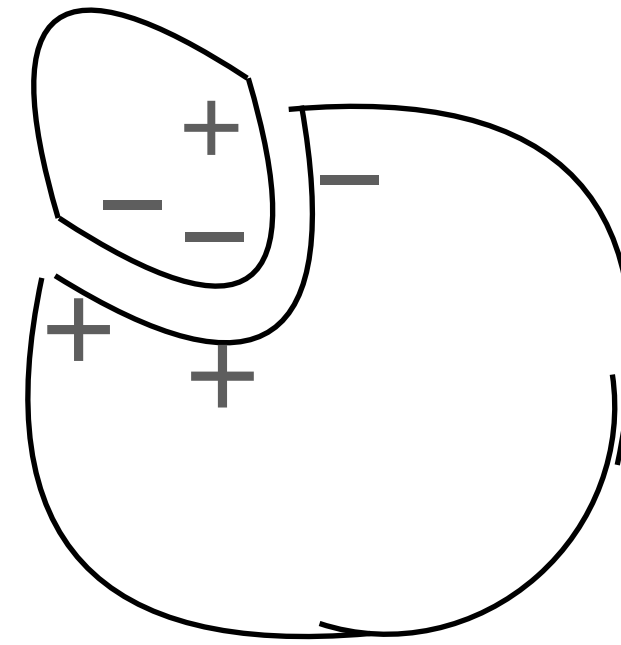


downstream effects

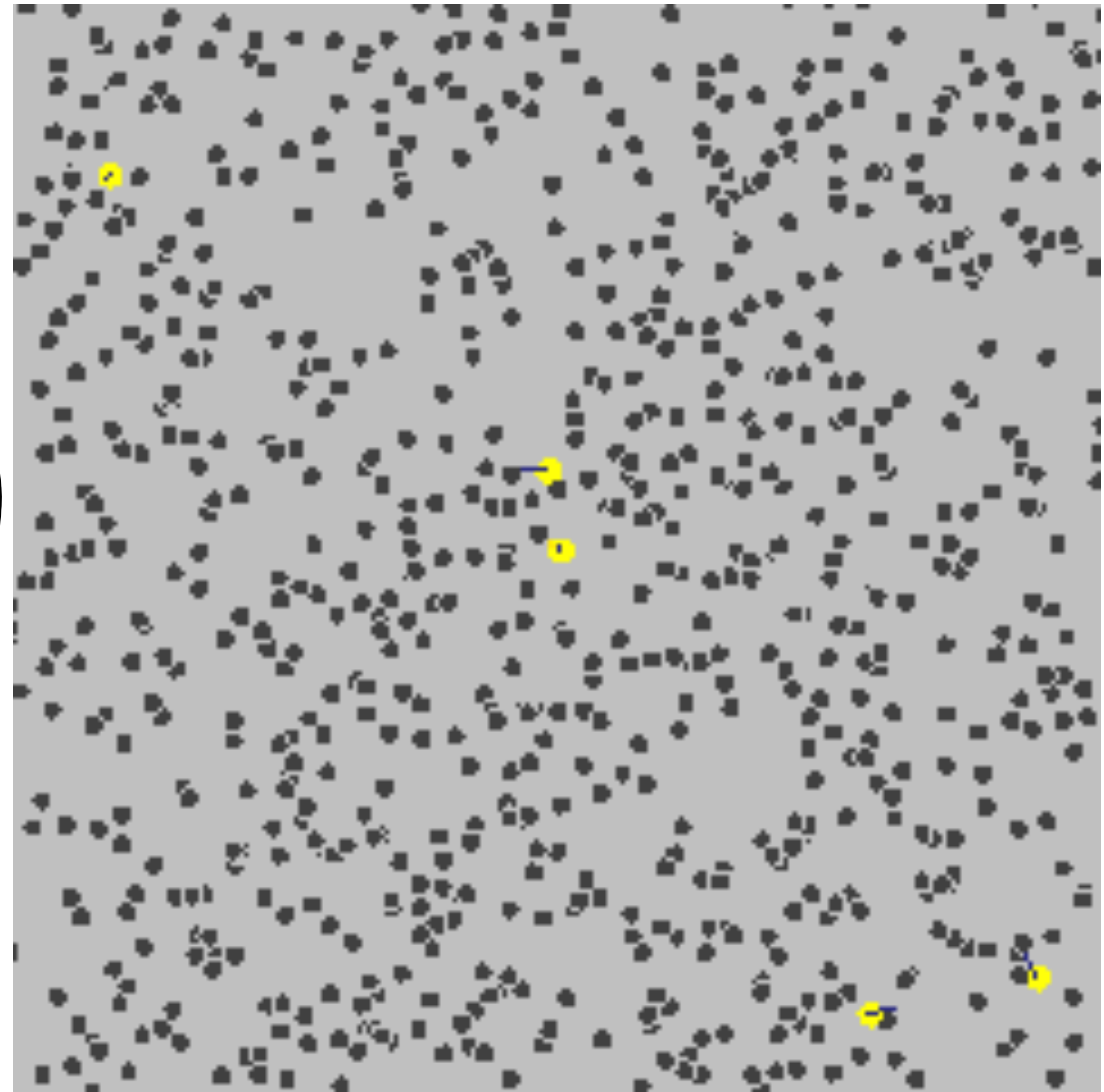
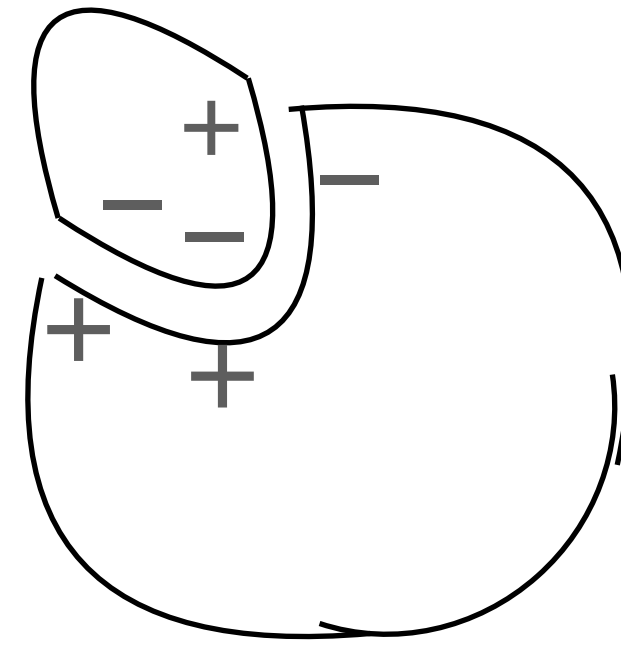


altered gene expression, etc.

the (kinetic) energy that breaks bonds is delivered through collisions with other molecules (brownian motion)

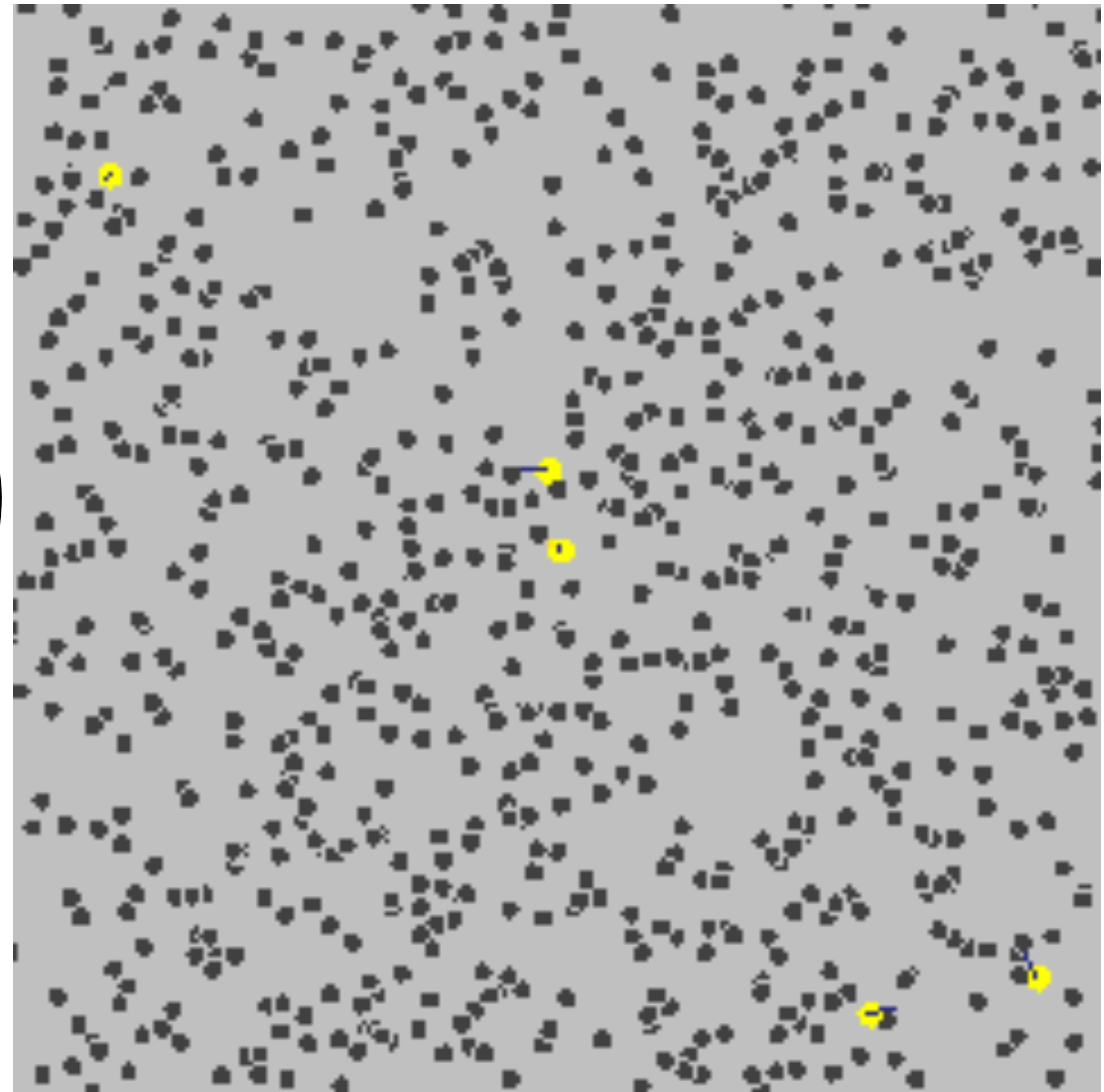
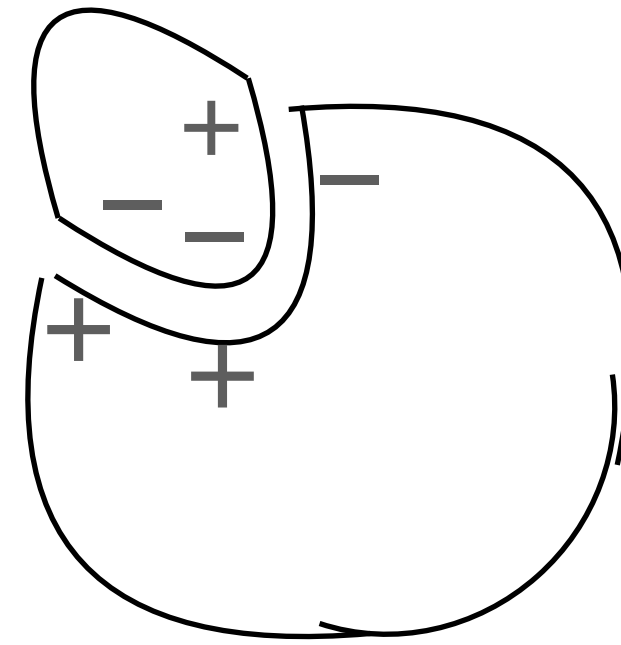


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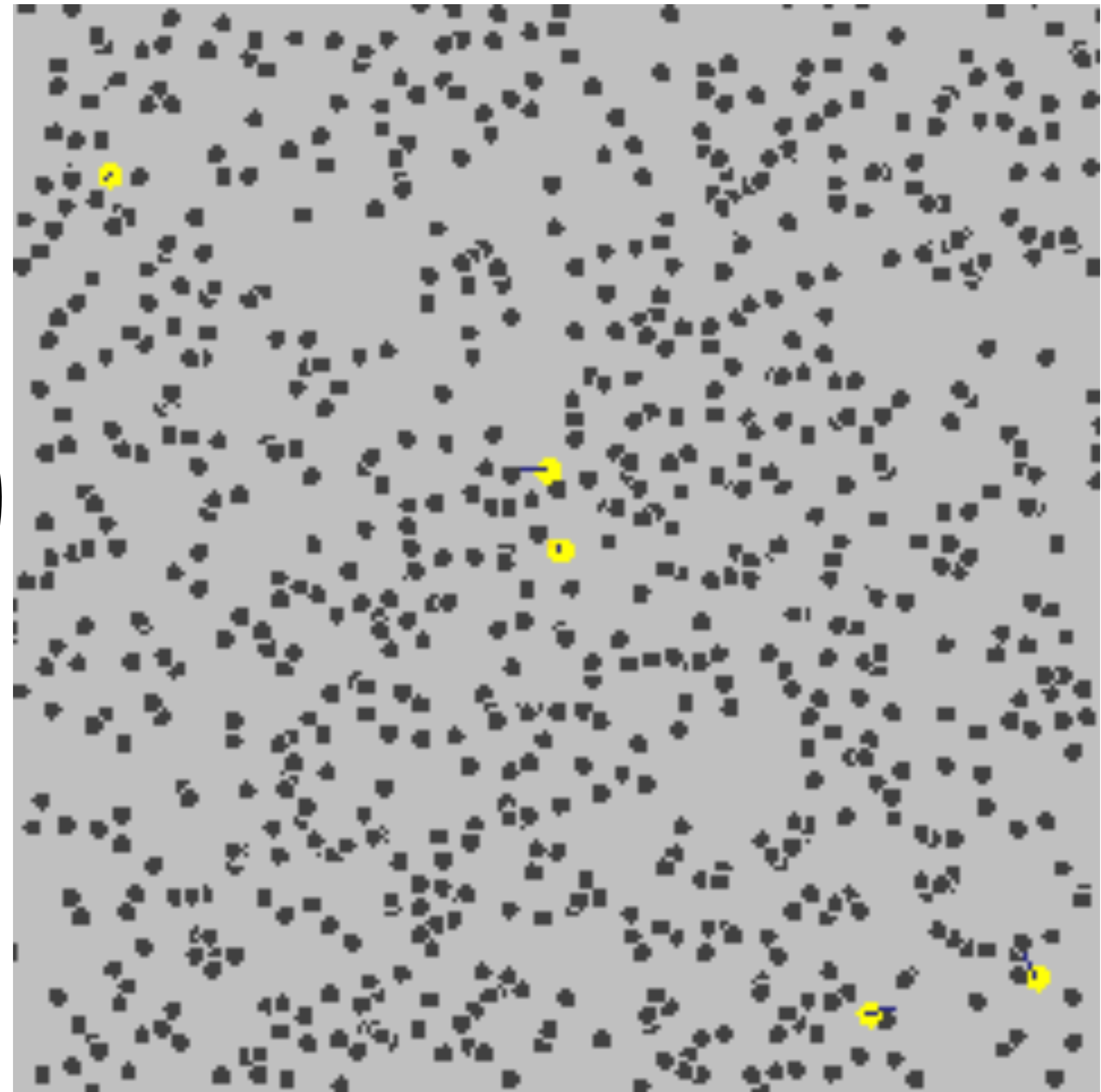
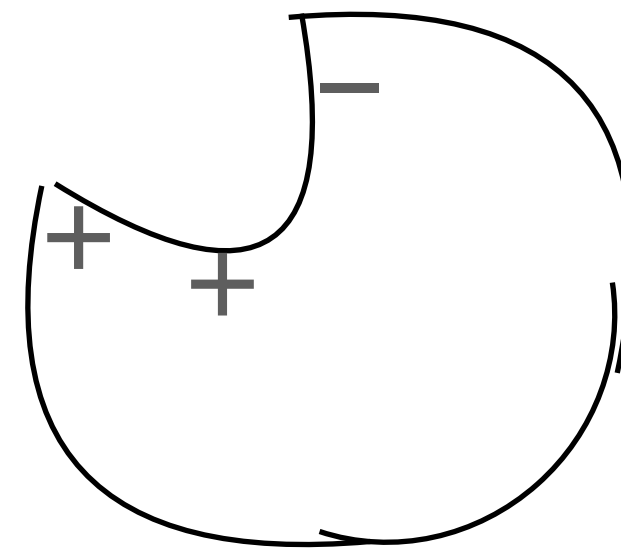
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How long two molecules interact is stochastic; unpredictable



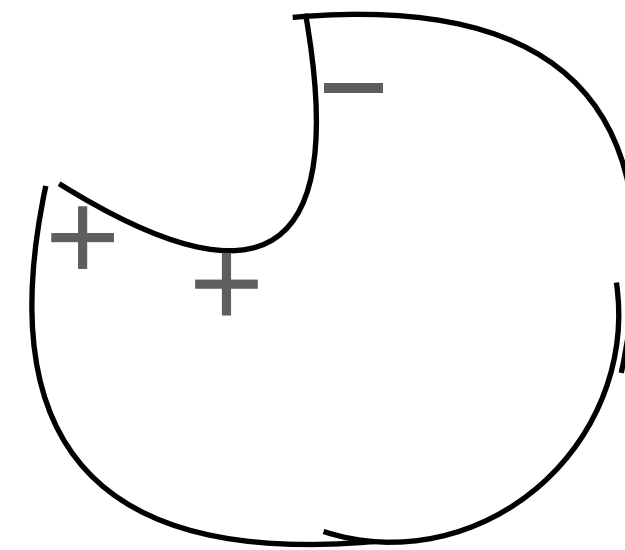
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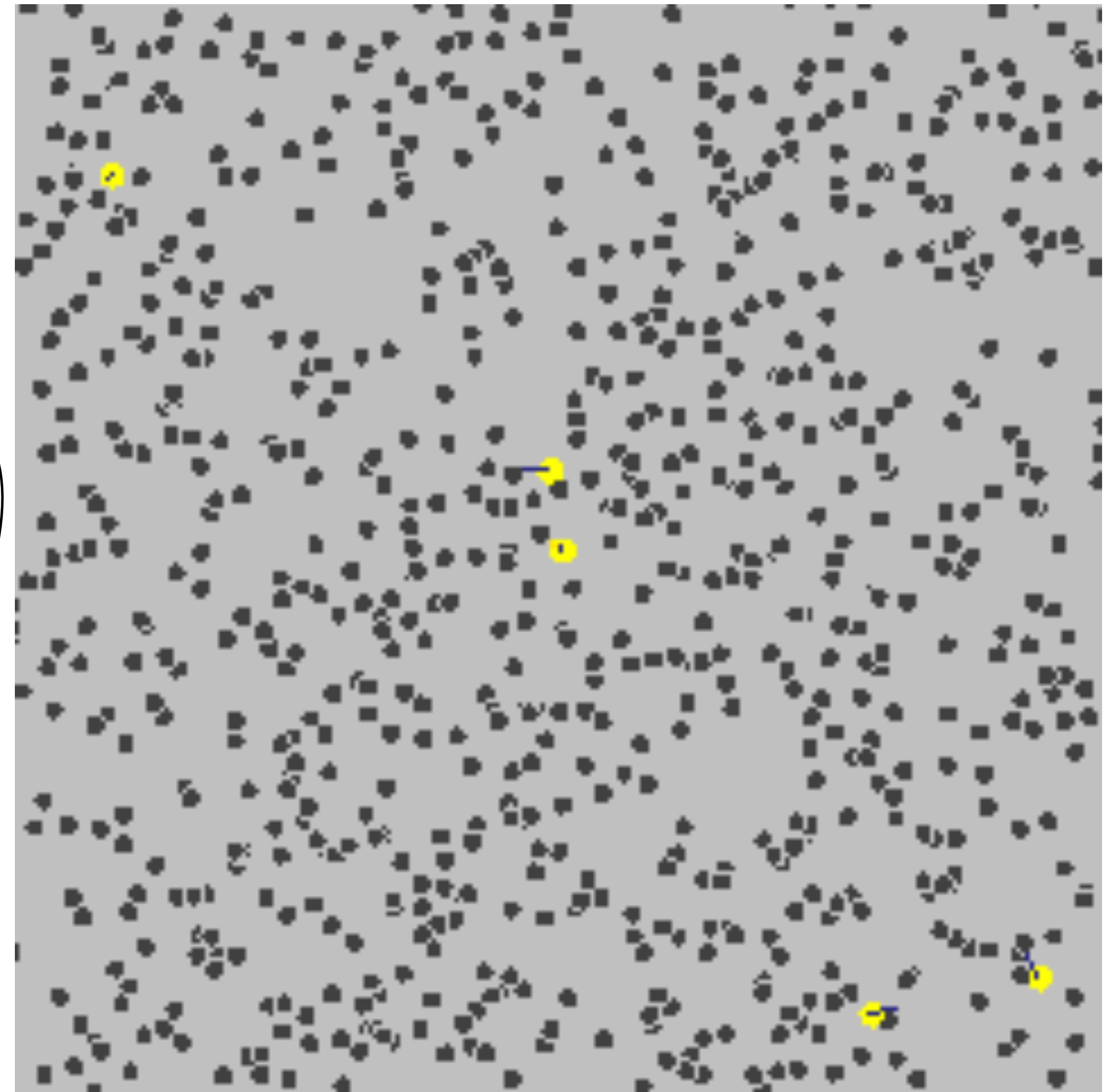


the (kinetic) energy that breaks bonds is delivered through collisions with other molecules (brownian motion)

How long two molecules interact is stochastic; unpredictable



complex "half-life" (a population measurement) is based on strength of binding interaction



Stochasticity can
be a difficult
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explicitly or
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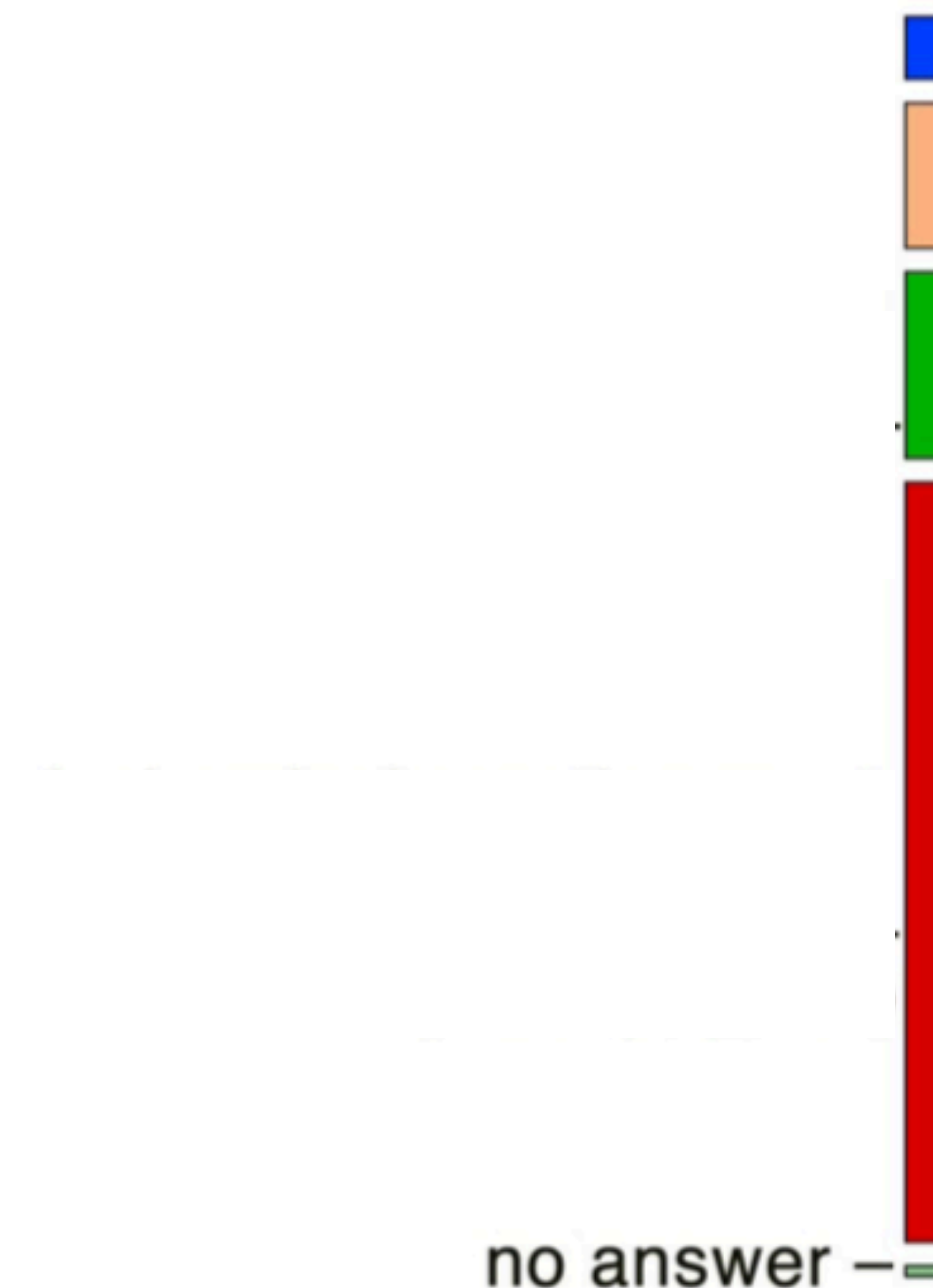
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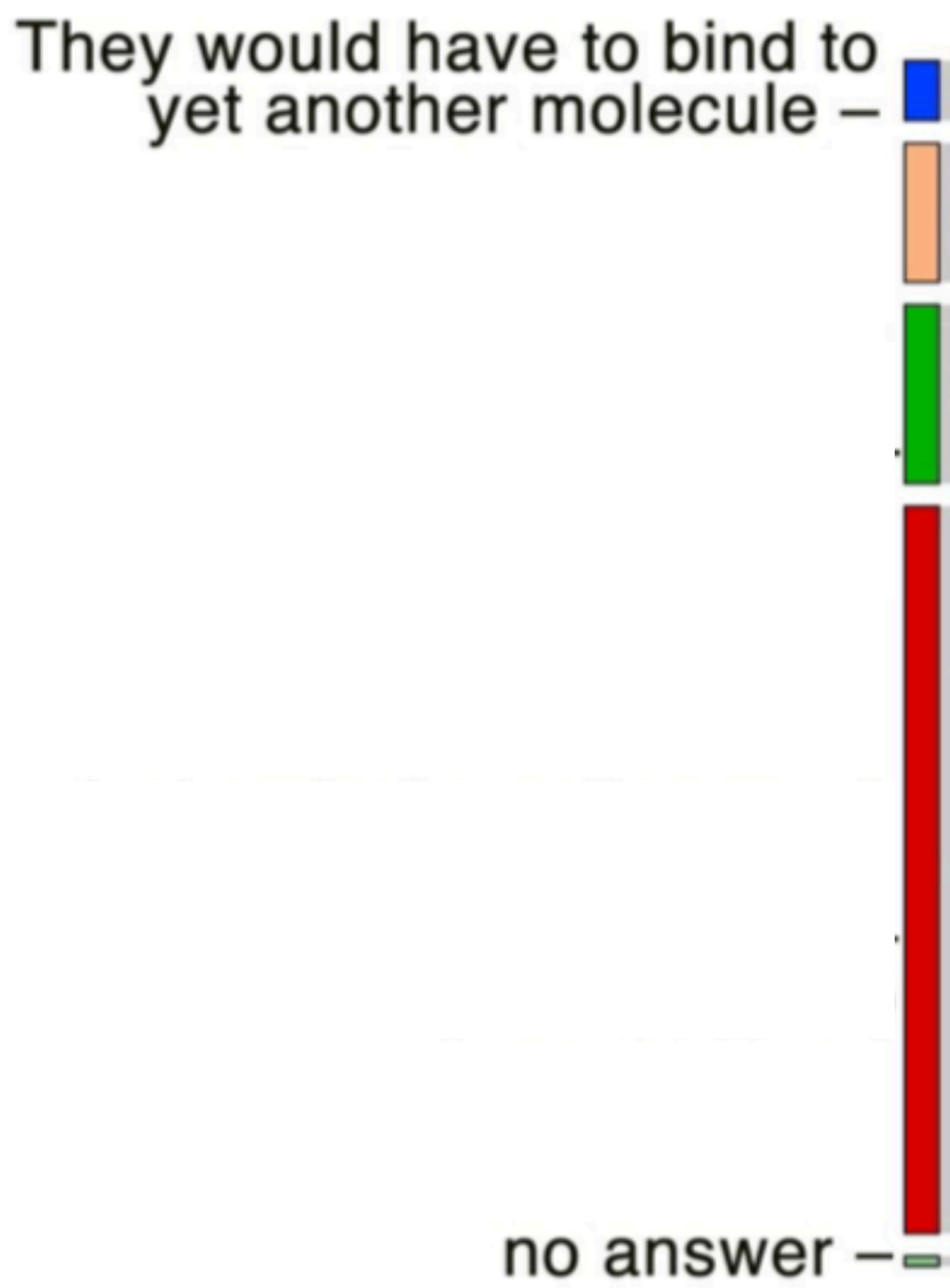
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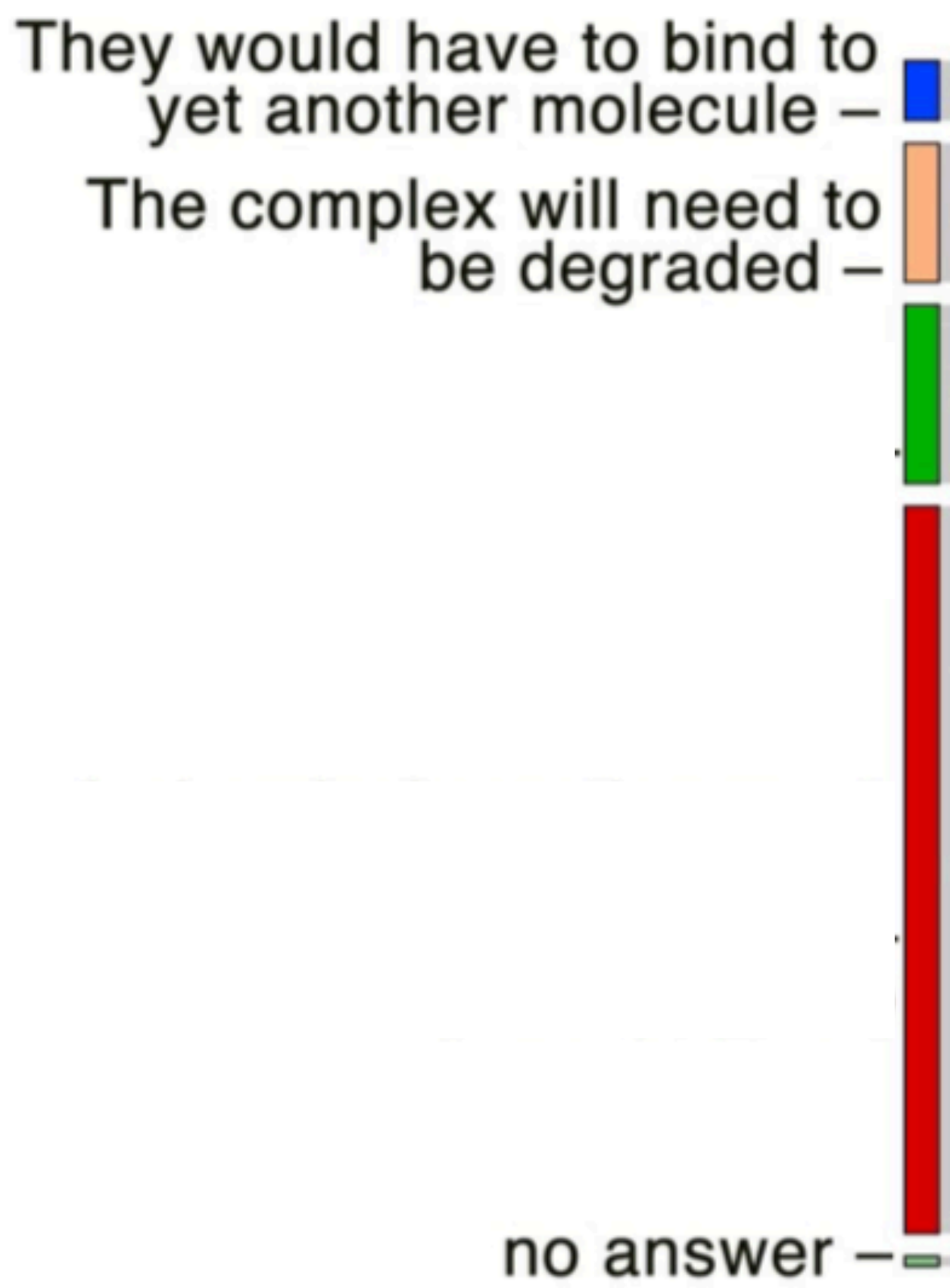
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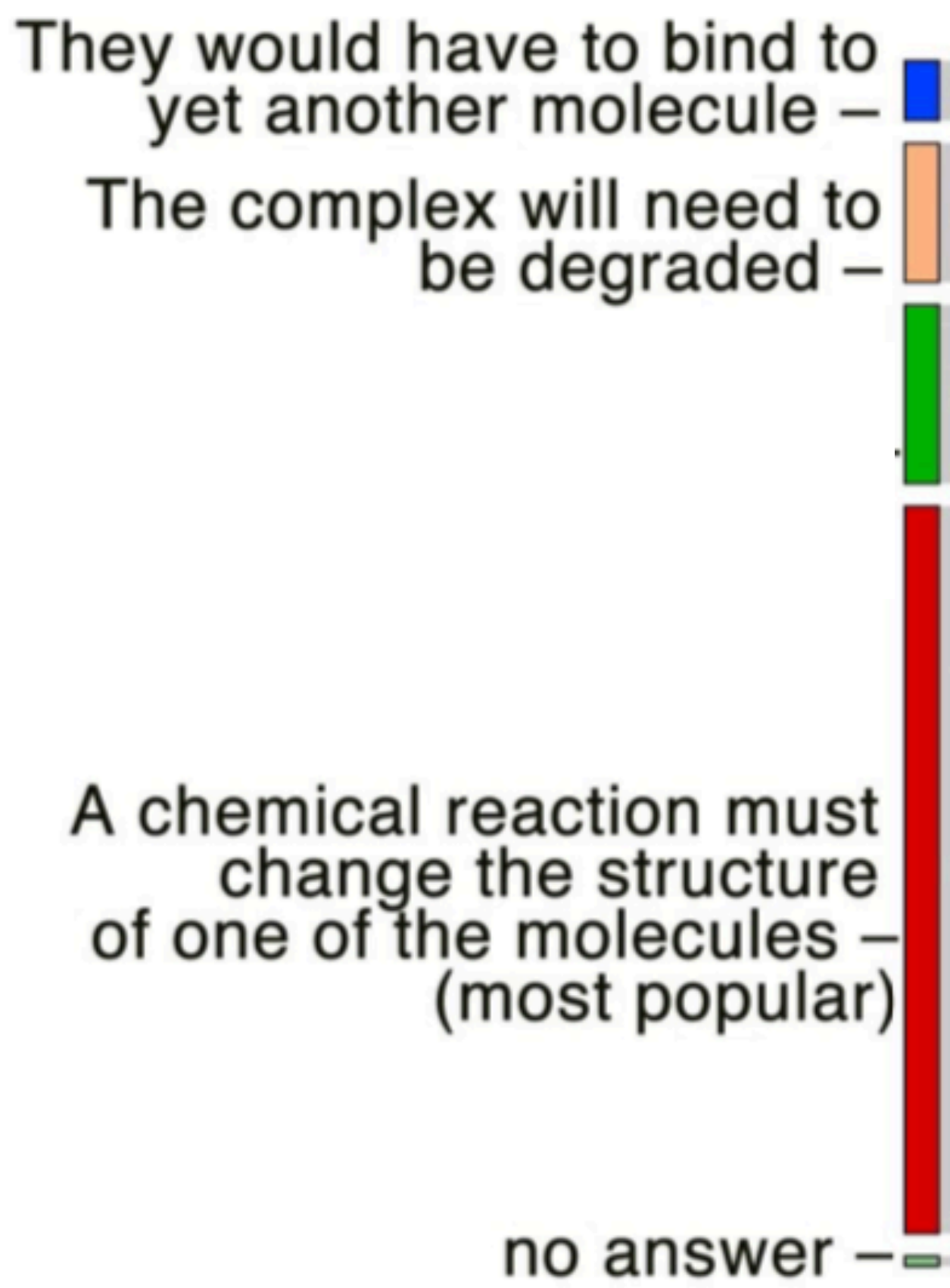
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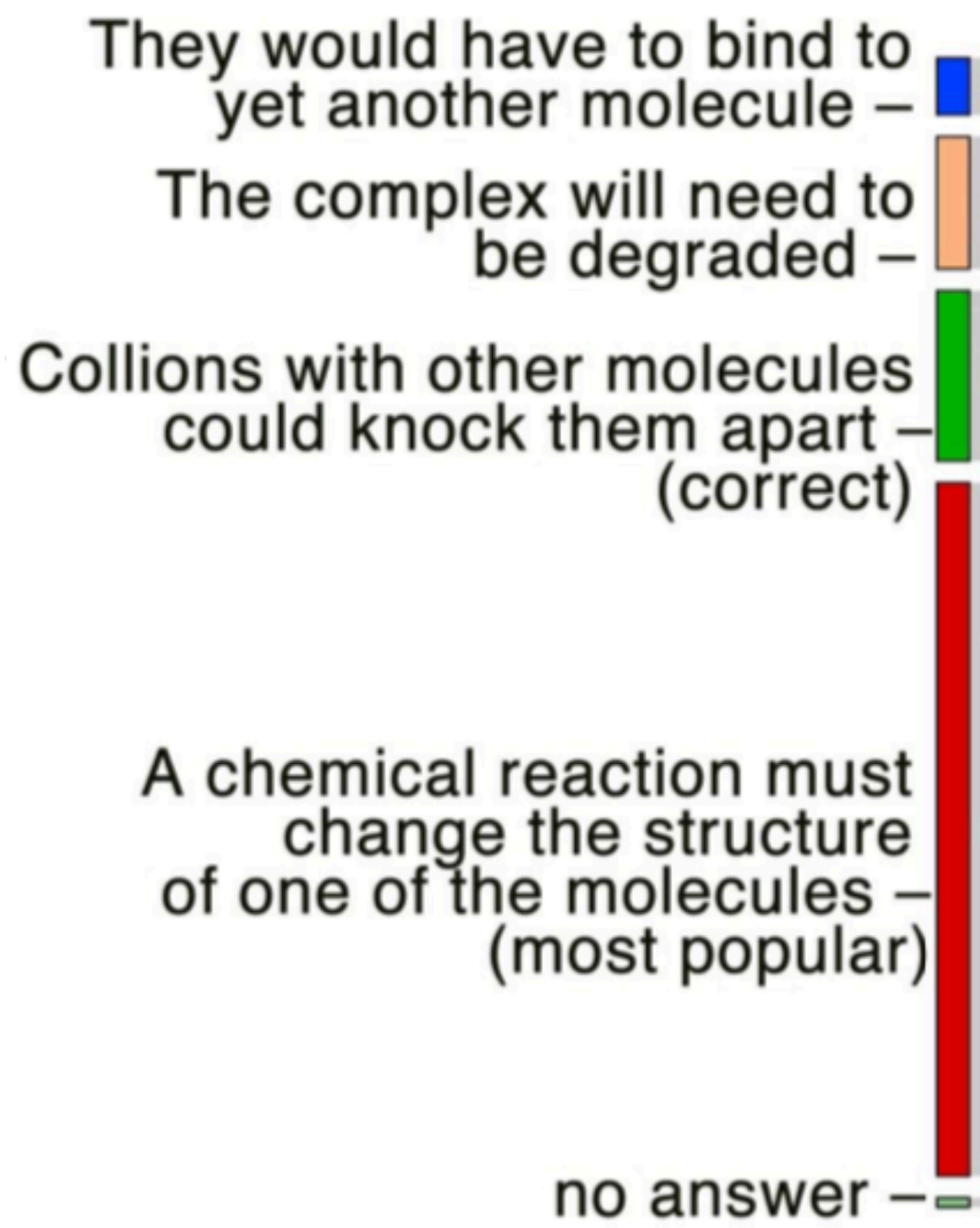
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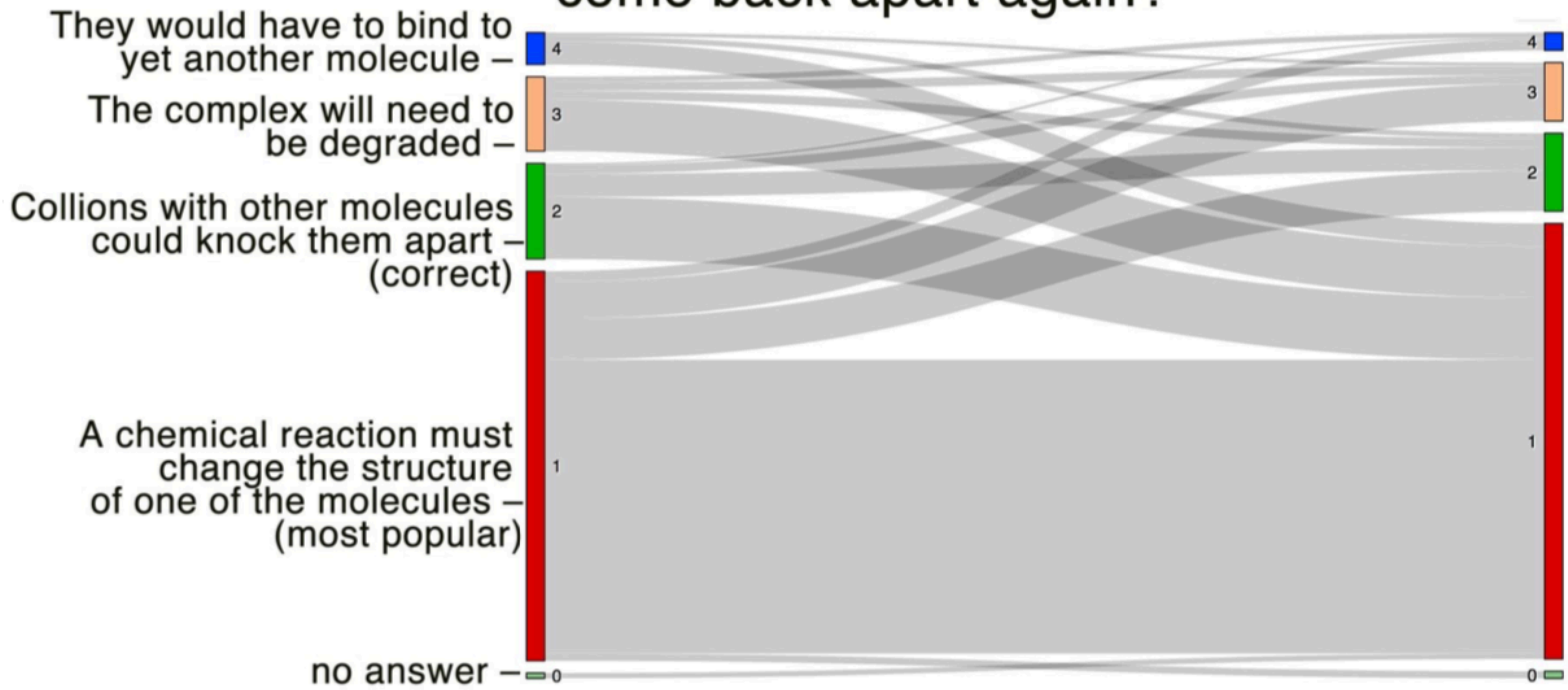
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stochastic gene expression in bacteria: lac operon

(a flash from the past for Larry)

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(a flash from the past for Larry)

- lactose (mammalian milk sugar) is energetically expensive for bacteria to use
 - requires synthesis of lactose-specific enzymes
- a bacterium may never encounter lactose in their environment
- what to do?

How does one sense the presence of lactose?

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- when a bacteria needs energy, it can “ask” whether lactose is present

How does one sense the presence of lactose?

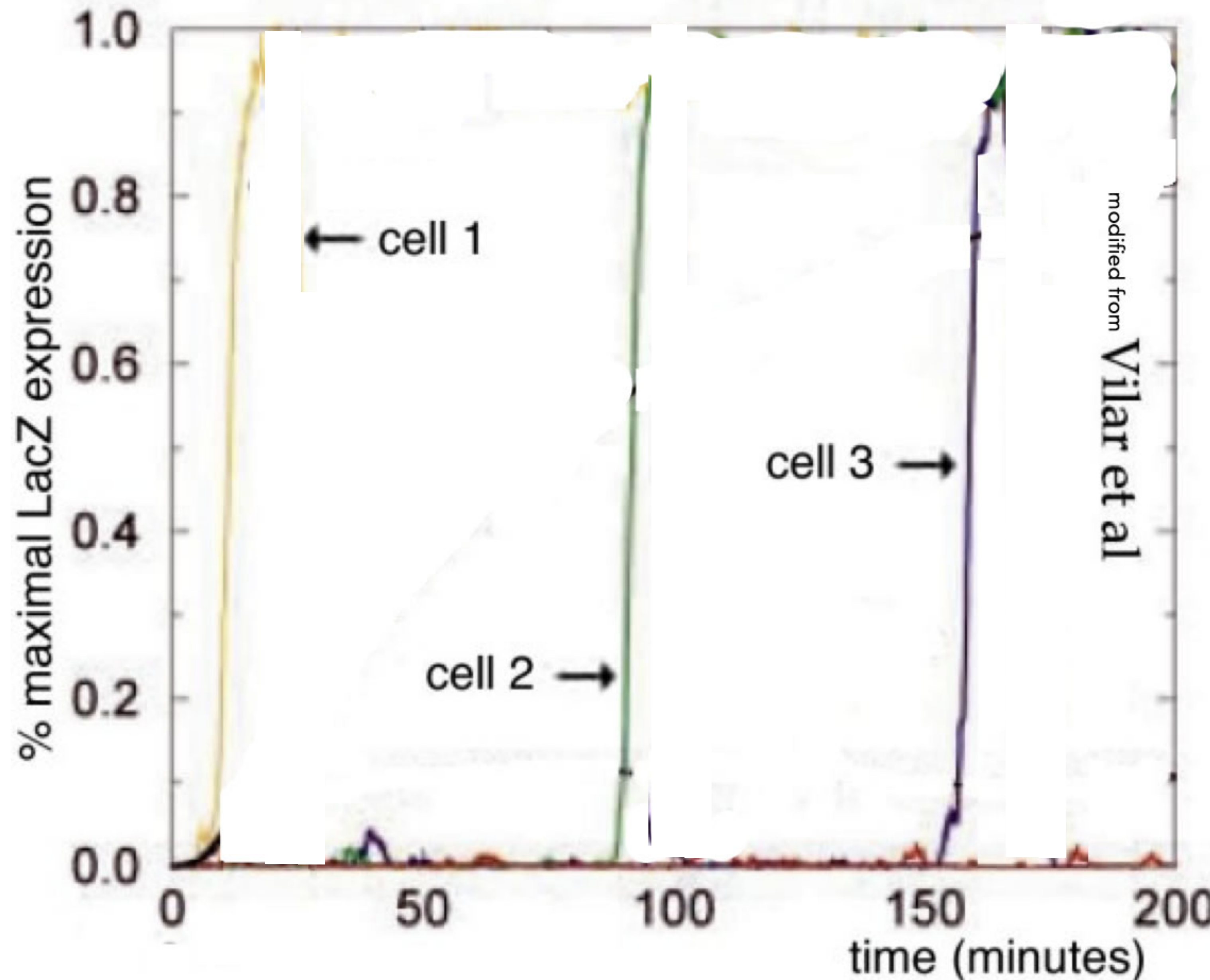
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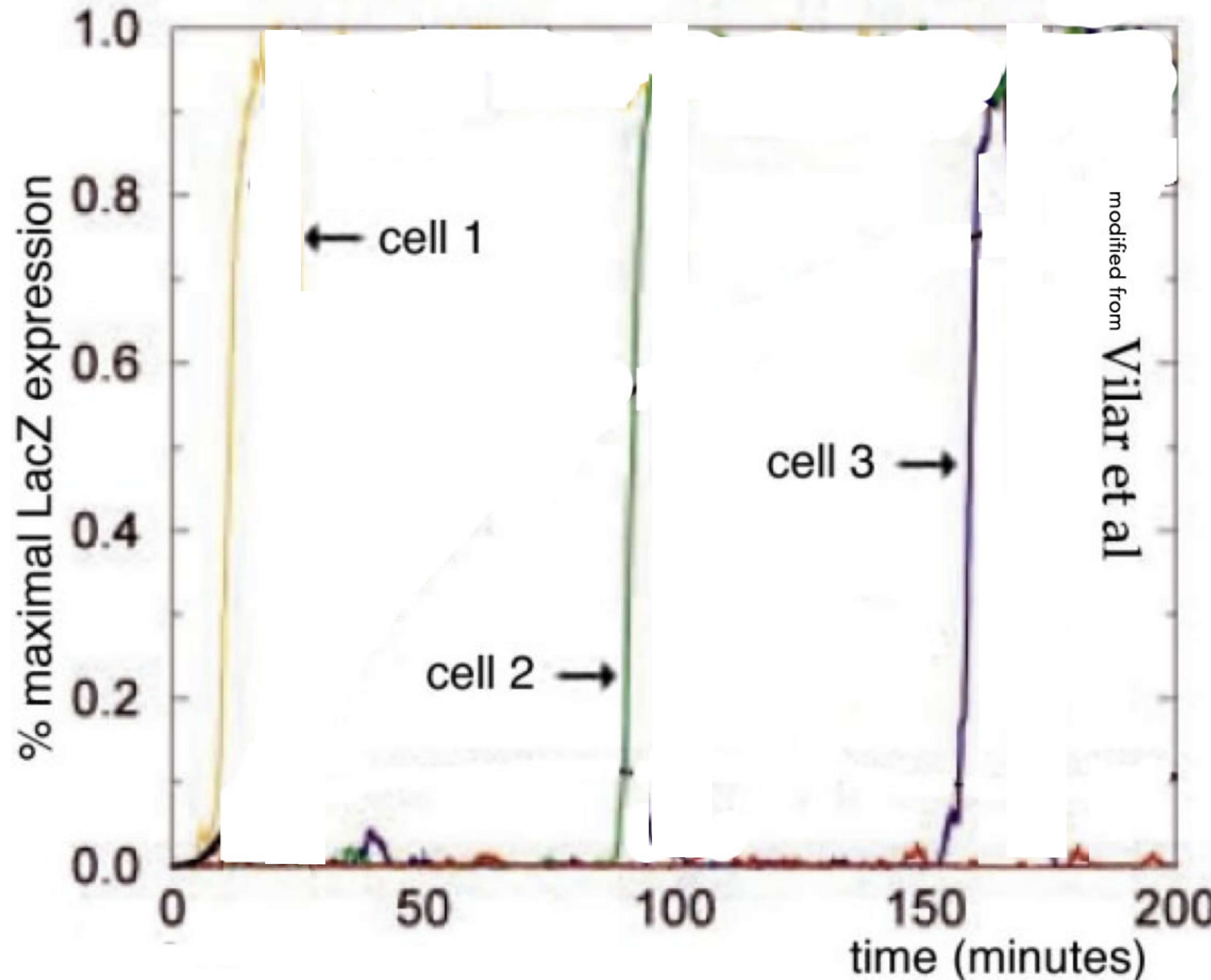
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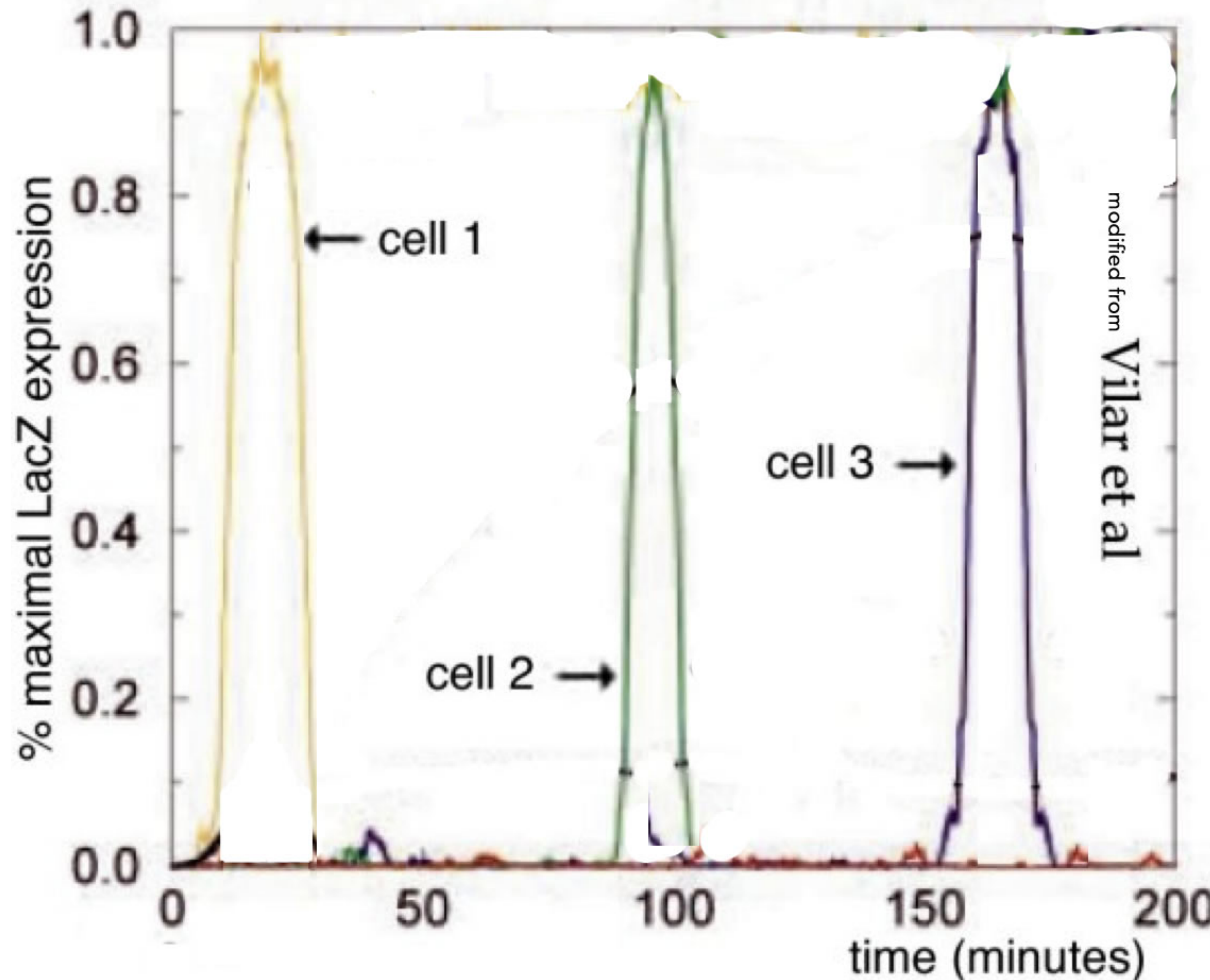
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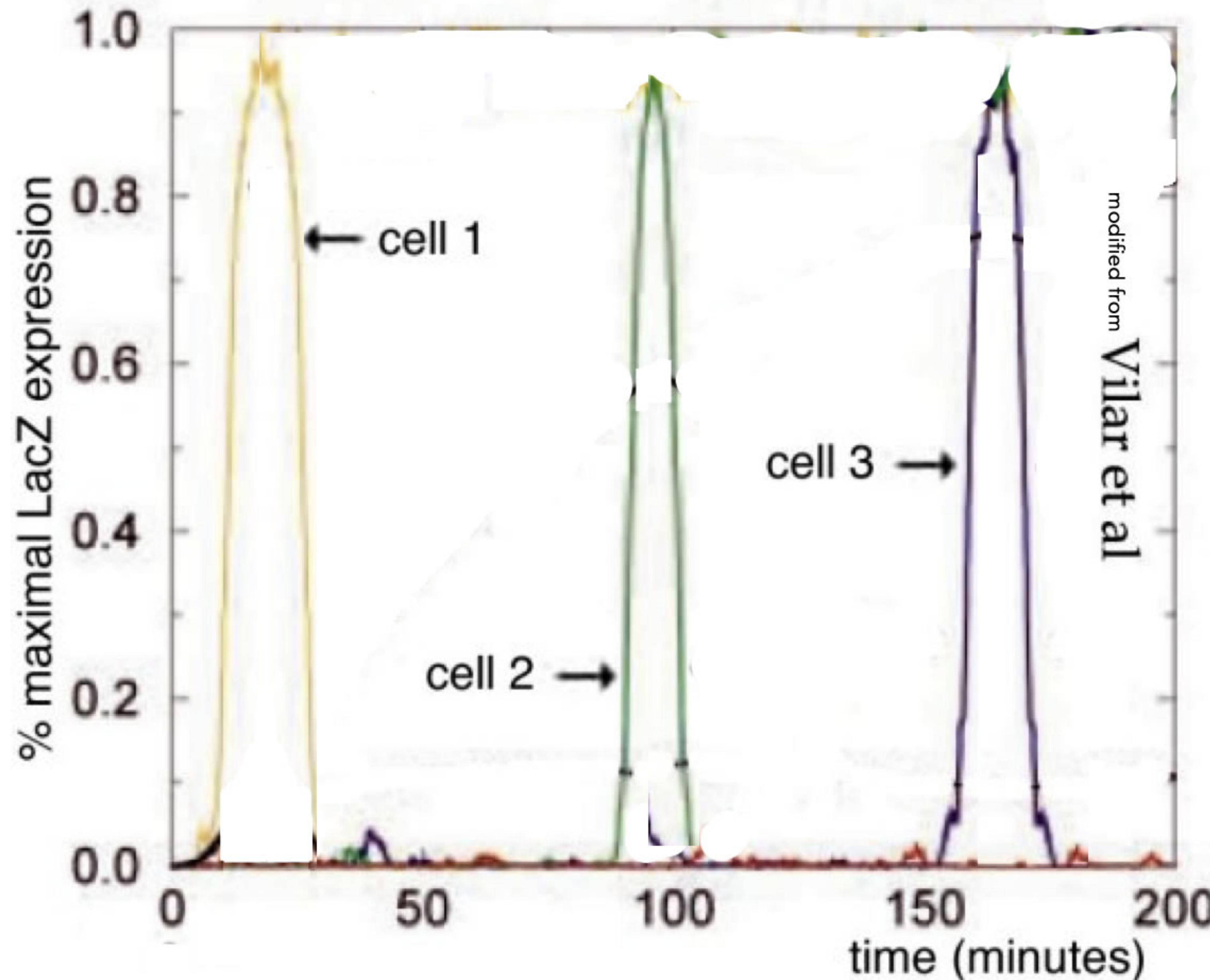
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no need to express lac sensing system all the time (expensive)



BUT if lactose present ...

*ENZYME INDUCTION AS AN ALL-OR-NONE PHENOMENON**

BY AARON NOVICK AND MILTON WEINER 1957

BUT if lactose present ...

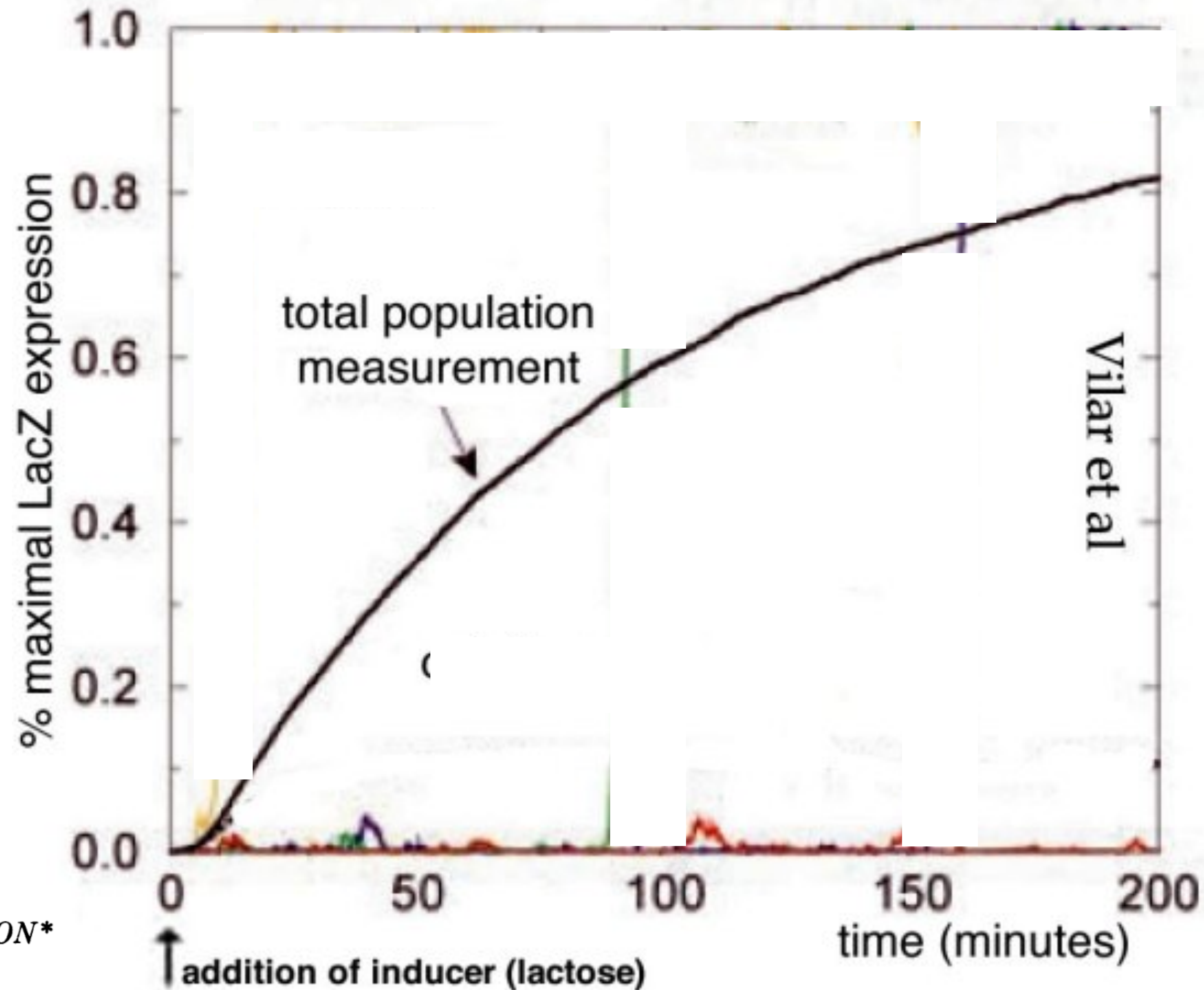
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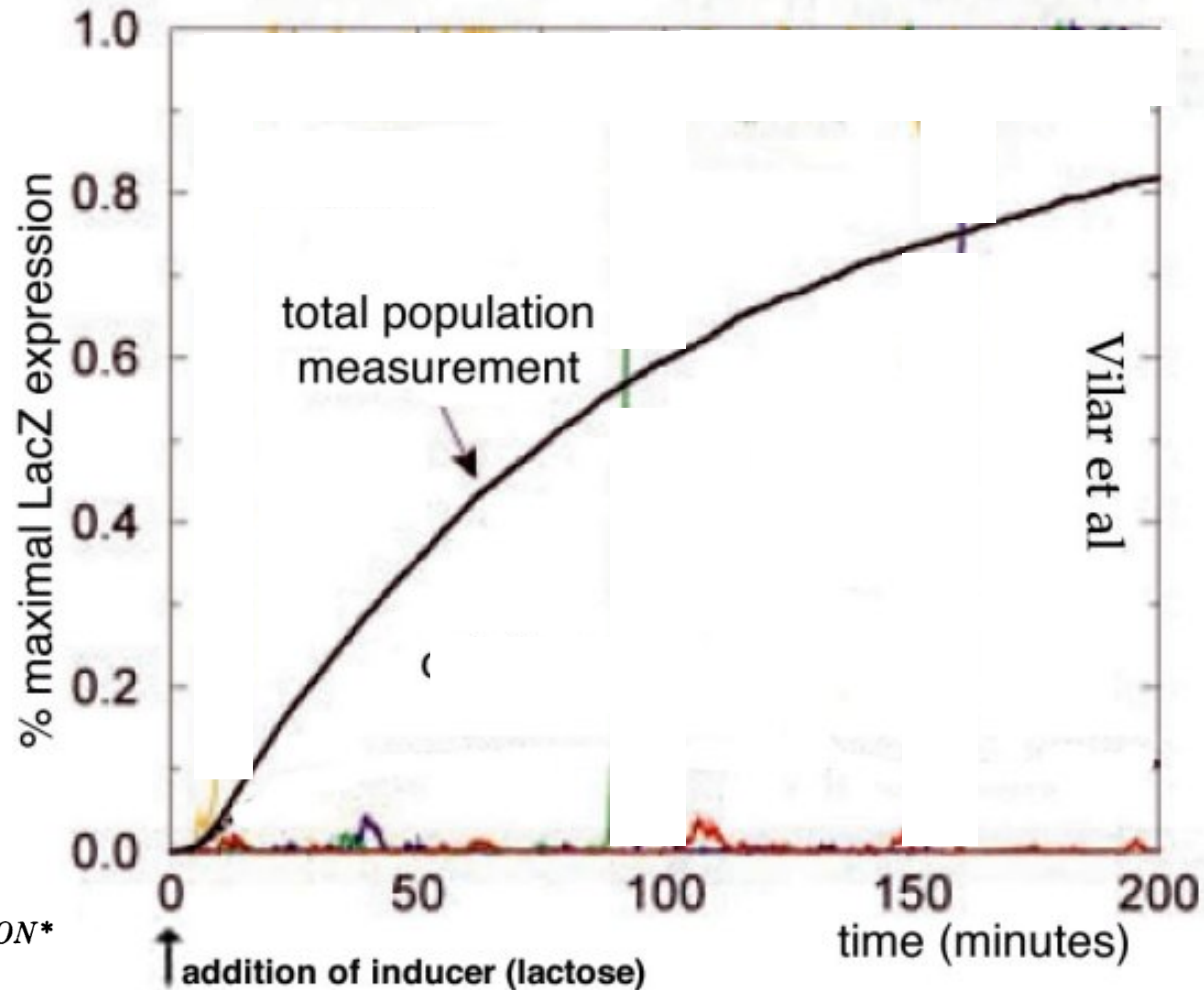


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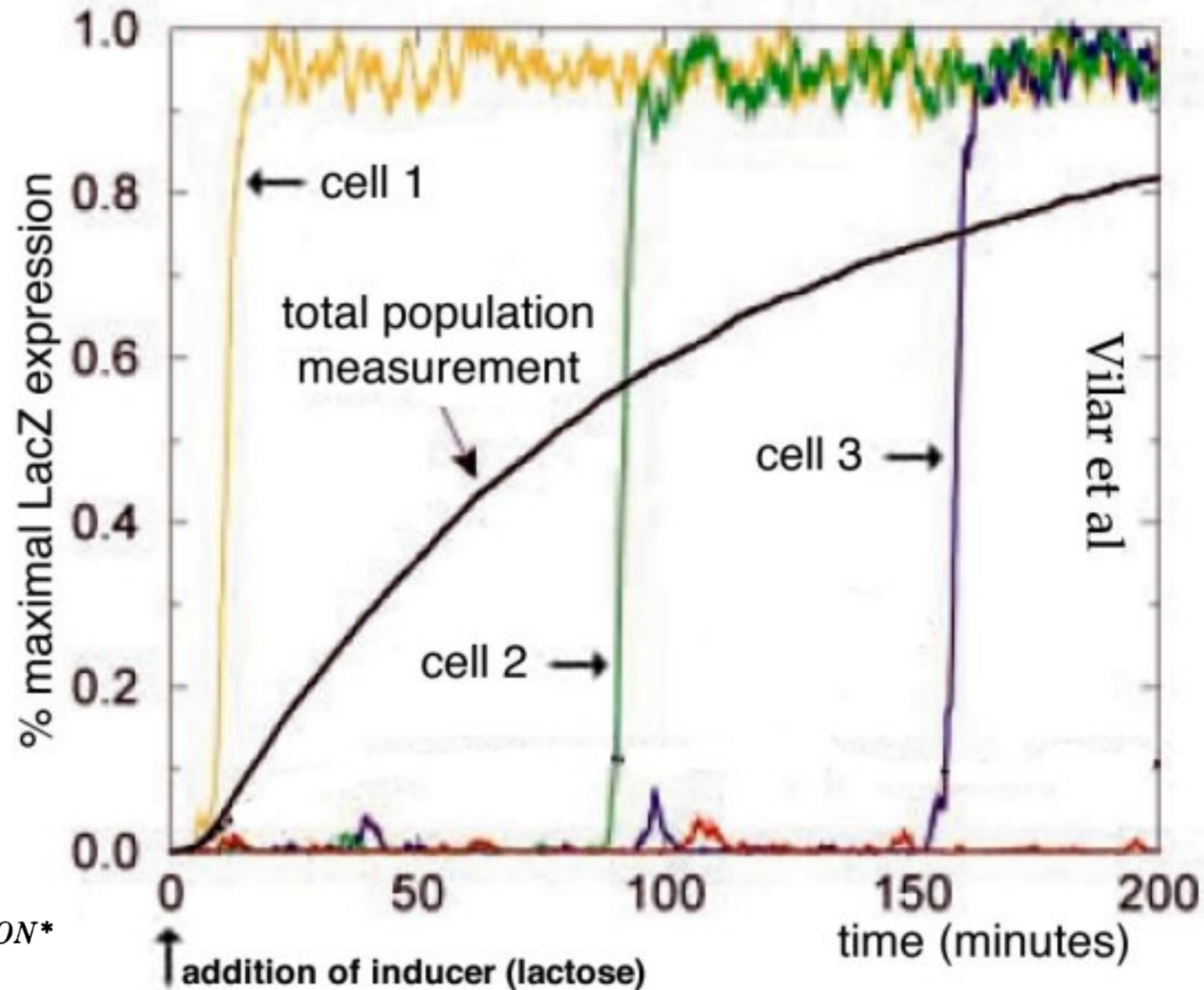


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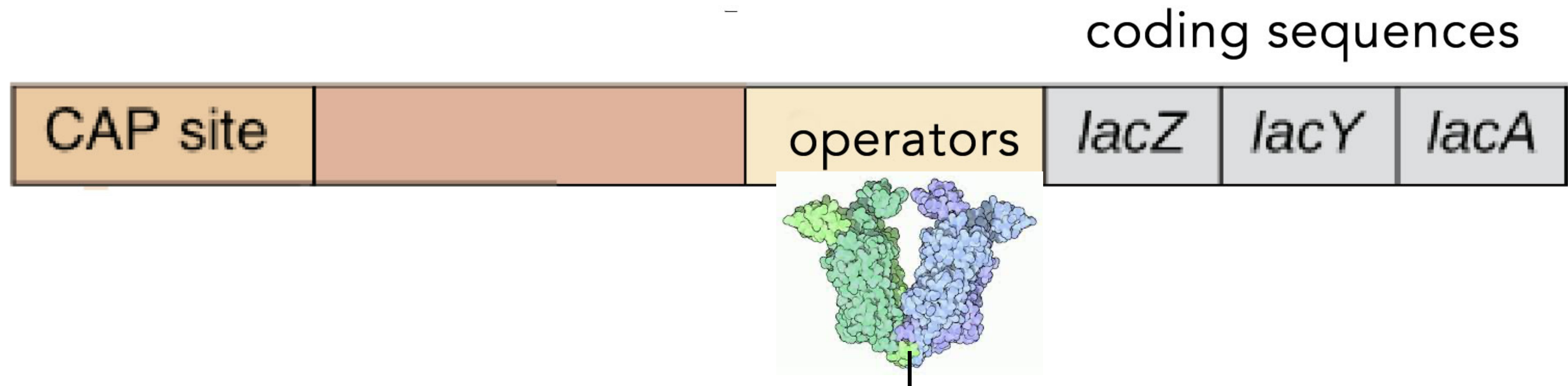
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How does the cell do it?



lac Repressor (always present)

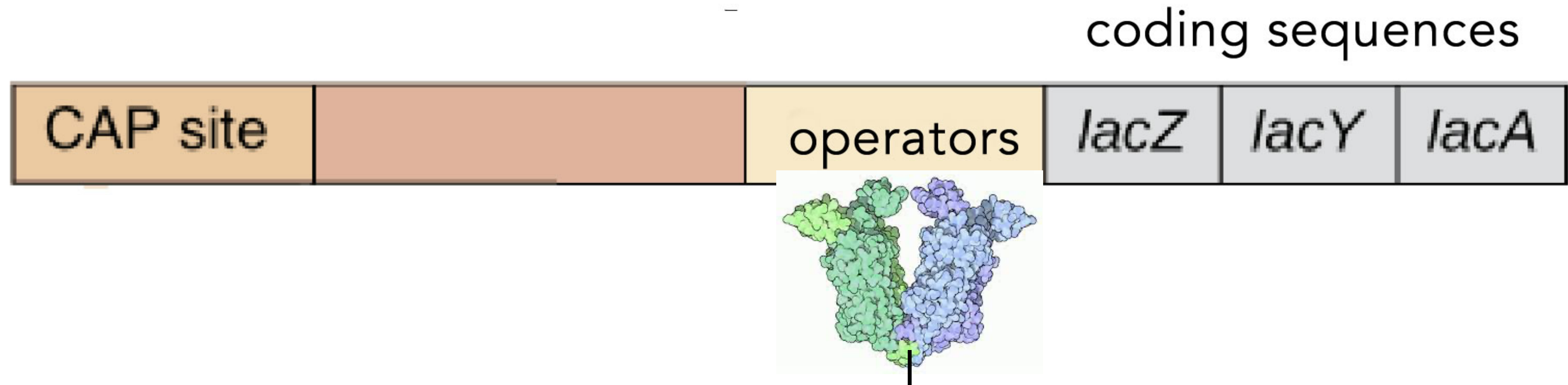
~10 copies / cell

(bopping on an off)

How does the cell do it?

when other (more easily digestible) energy sources present

genes are off



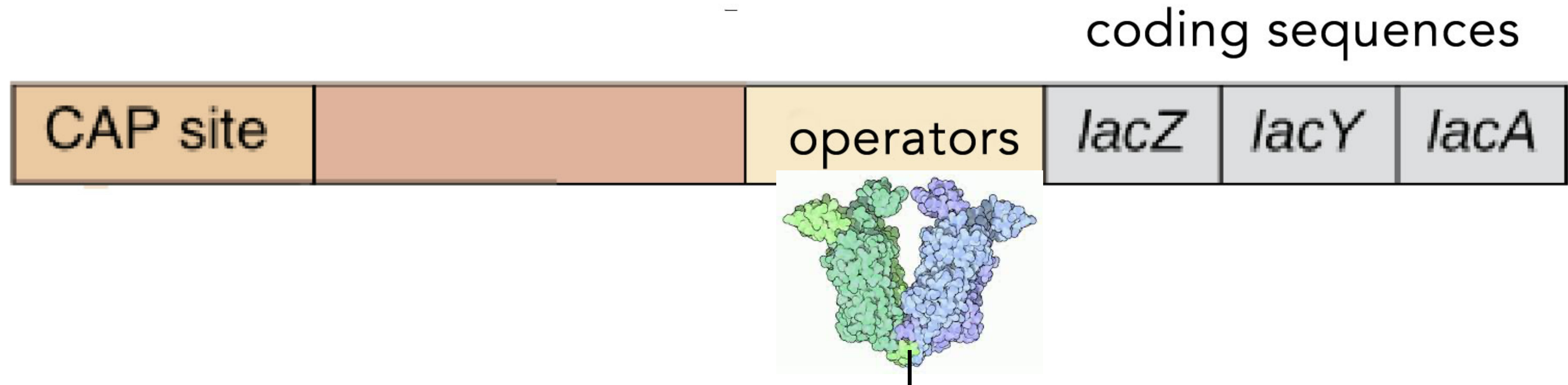
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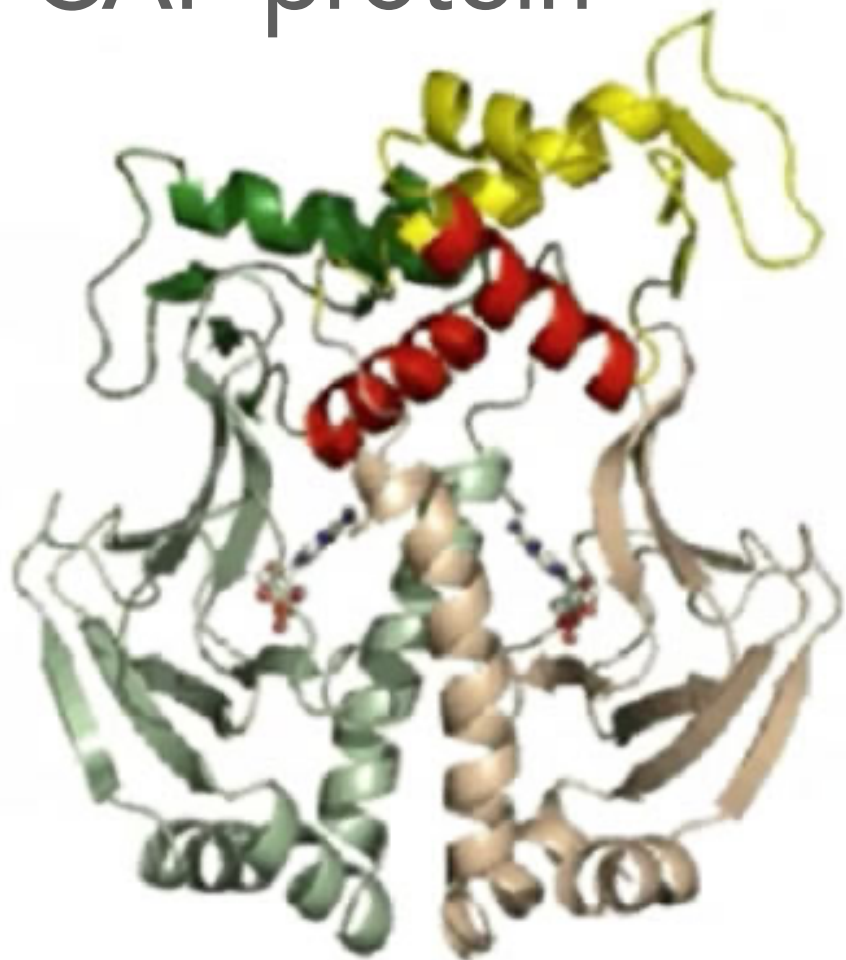
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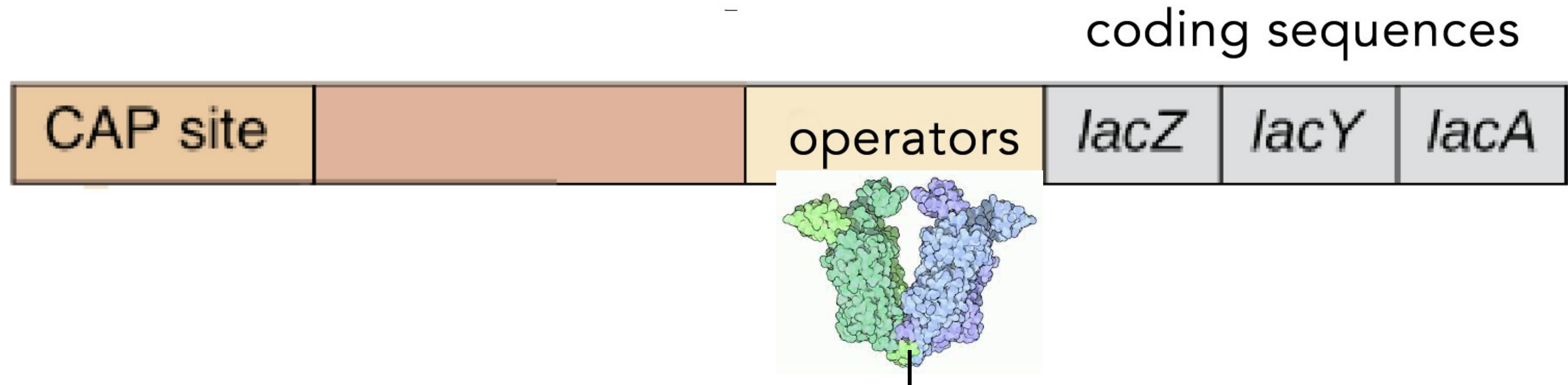


inactive
DNA binding domains "hidden"

* original image from Khan academy, worth watching: Sal Khan's 2023 talk on AI powered learning

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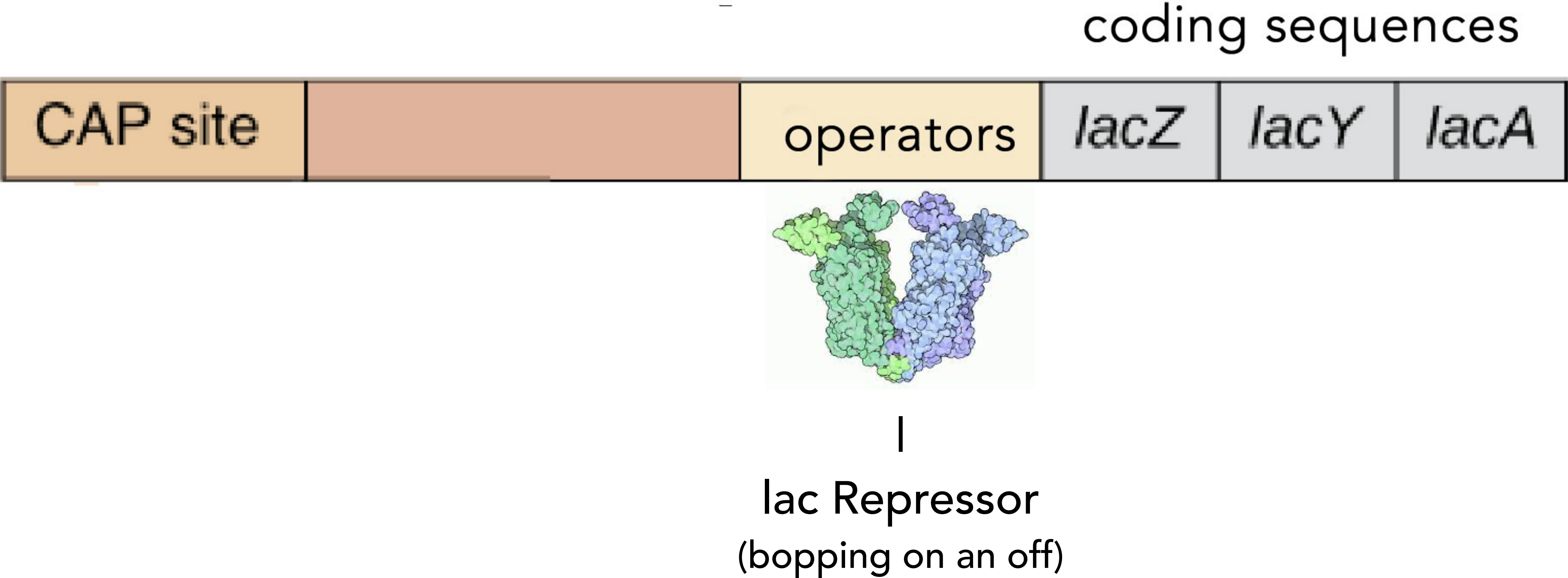
lac Repressor (always present)

~10 copies / cell

(bopping on an off) → no effect

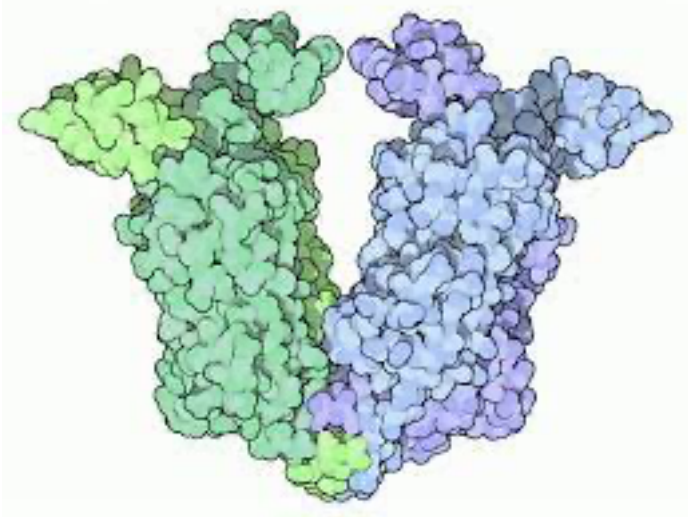
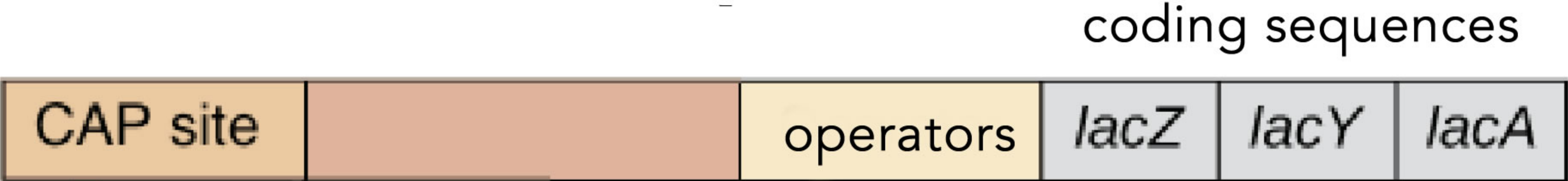
(activator not active)

In a starving cell



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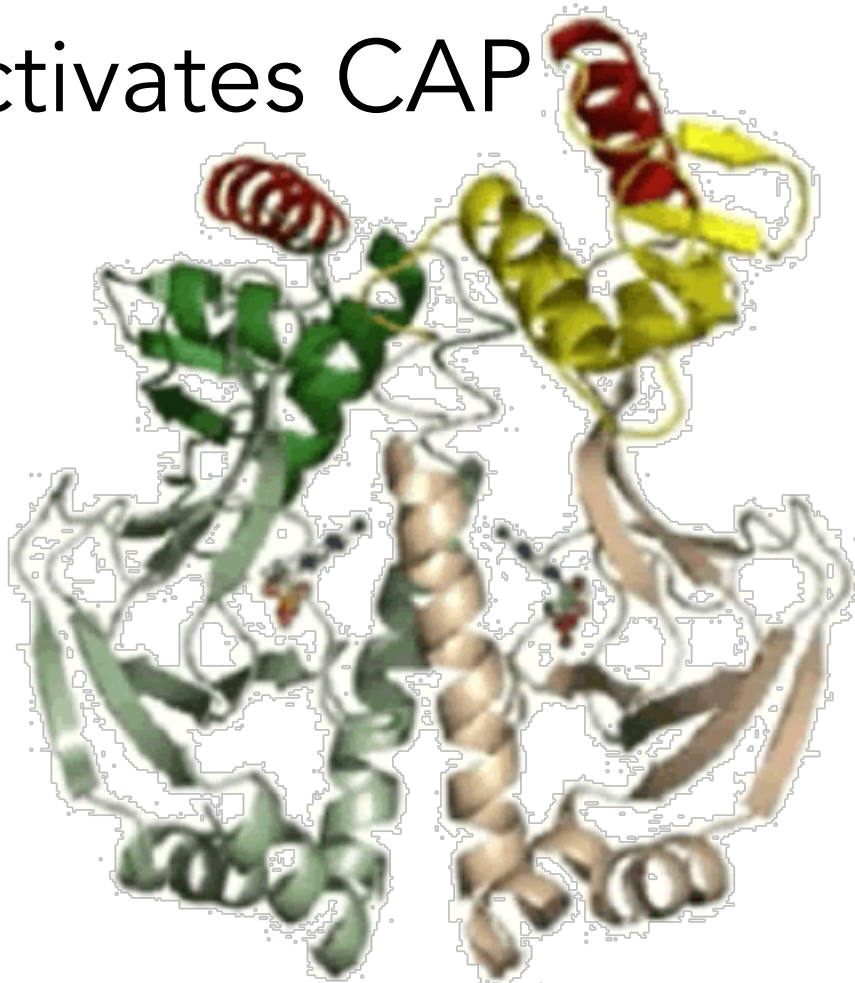
In a starving cell



|

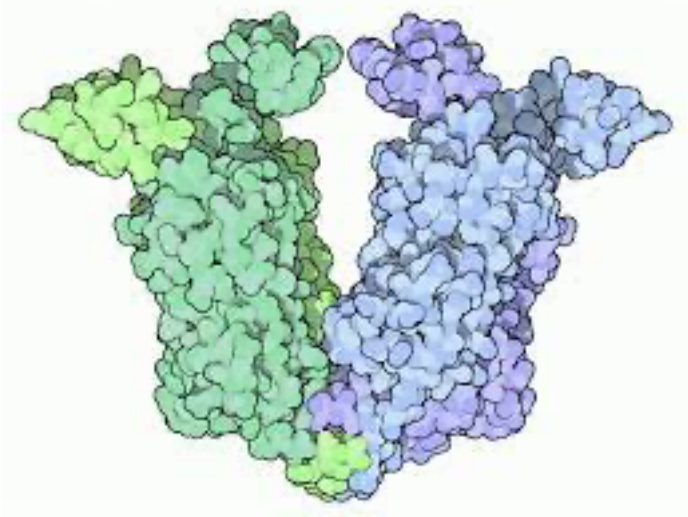
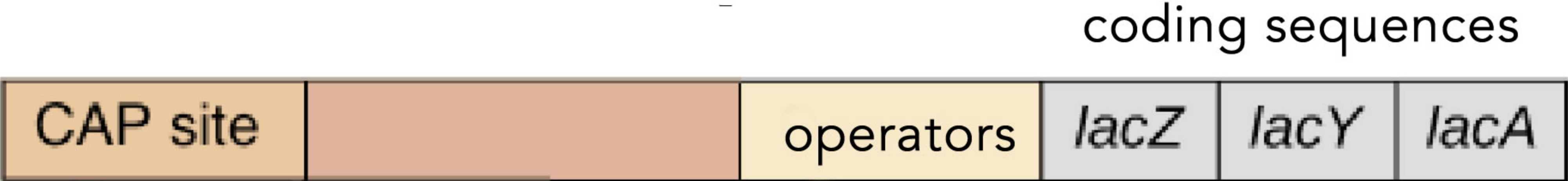
lac Repressor
(bopping on an off)

cAMP (starvation signal)
synthesized, binds +
activates CAP



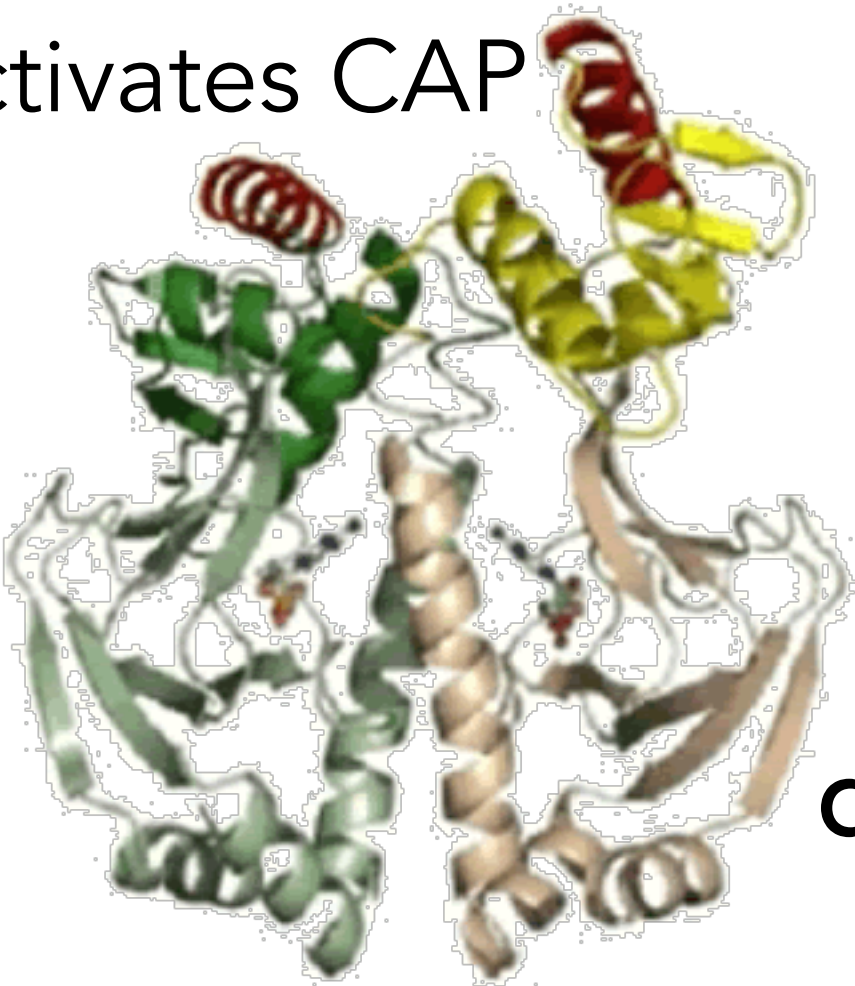
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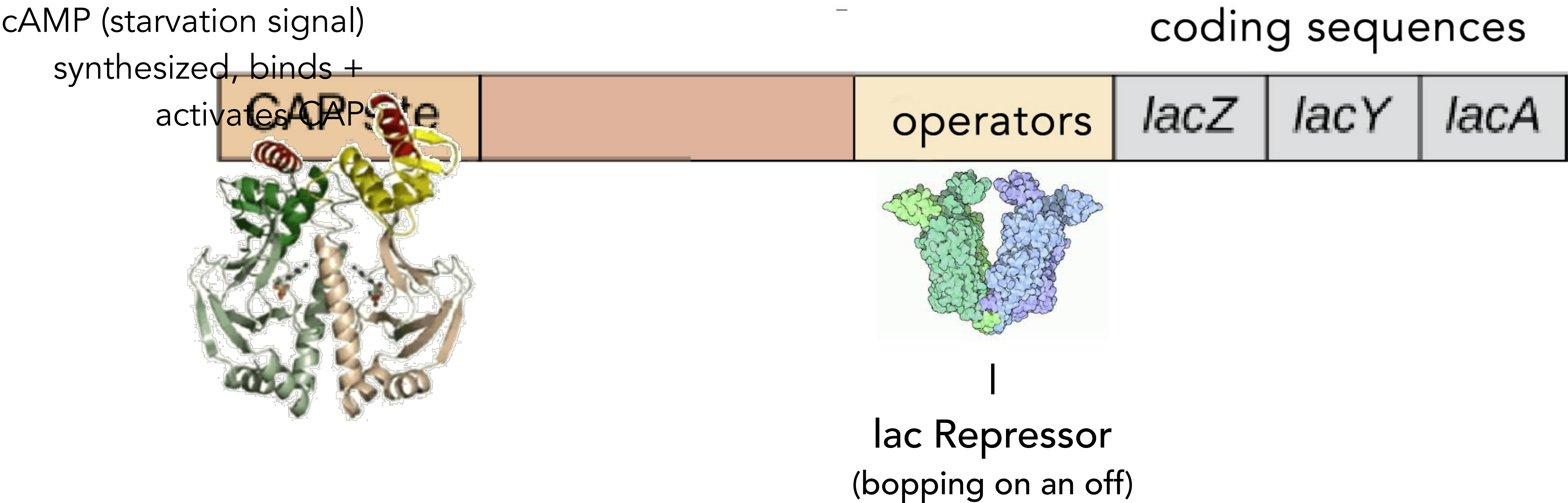


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domains emerge

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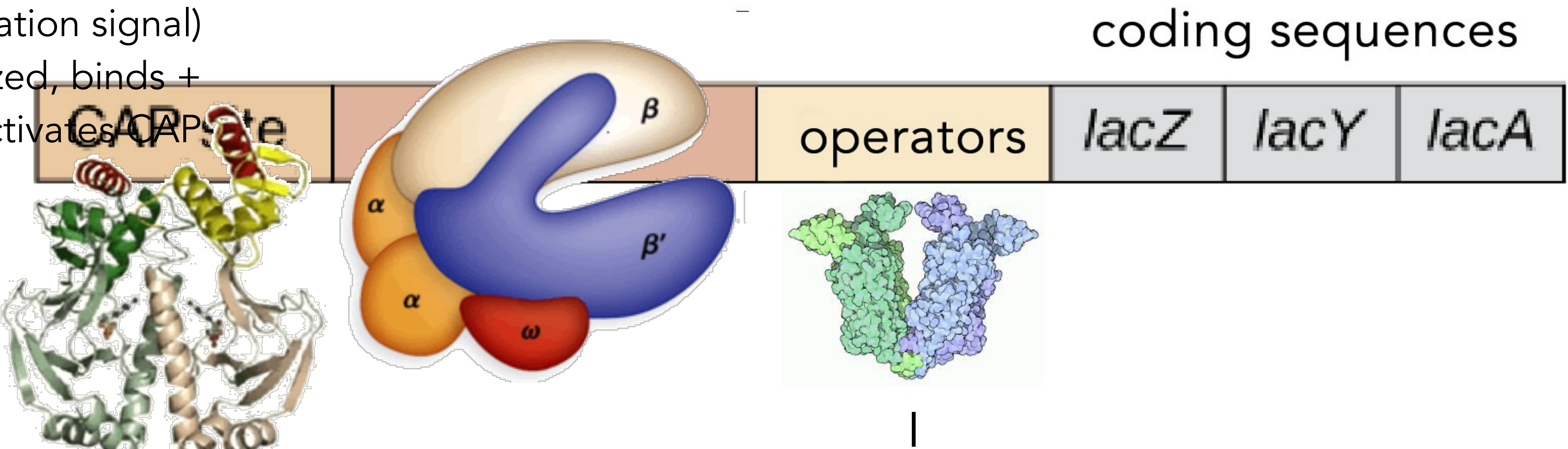


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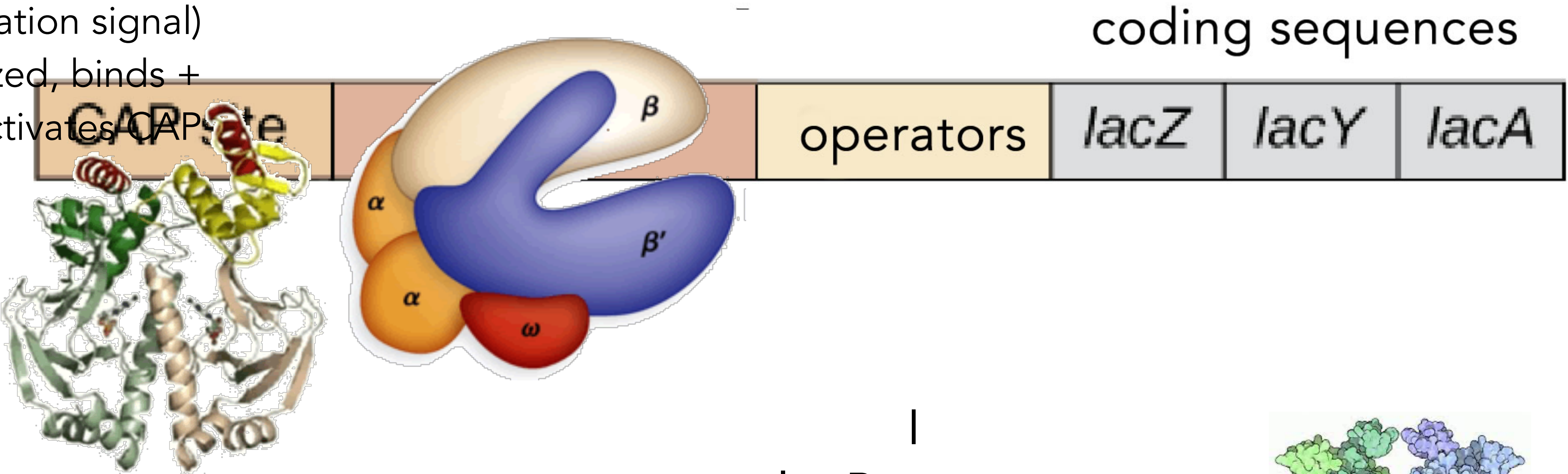
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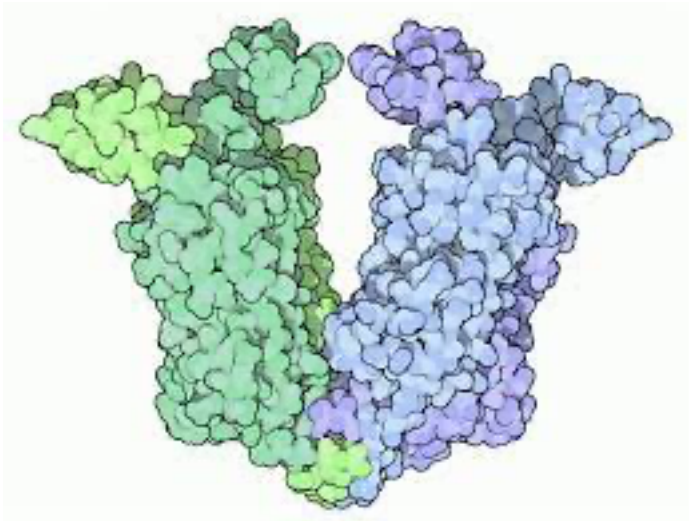
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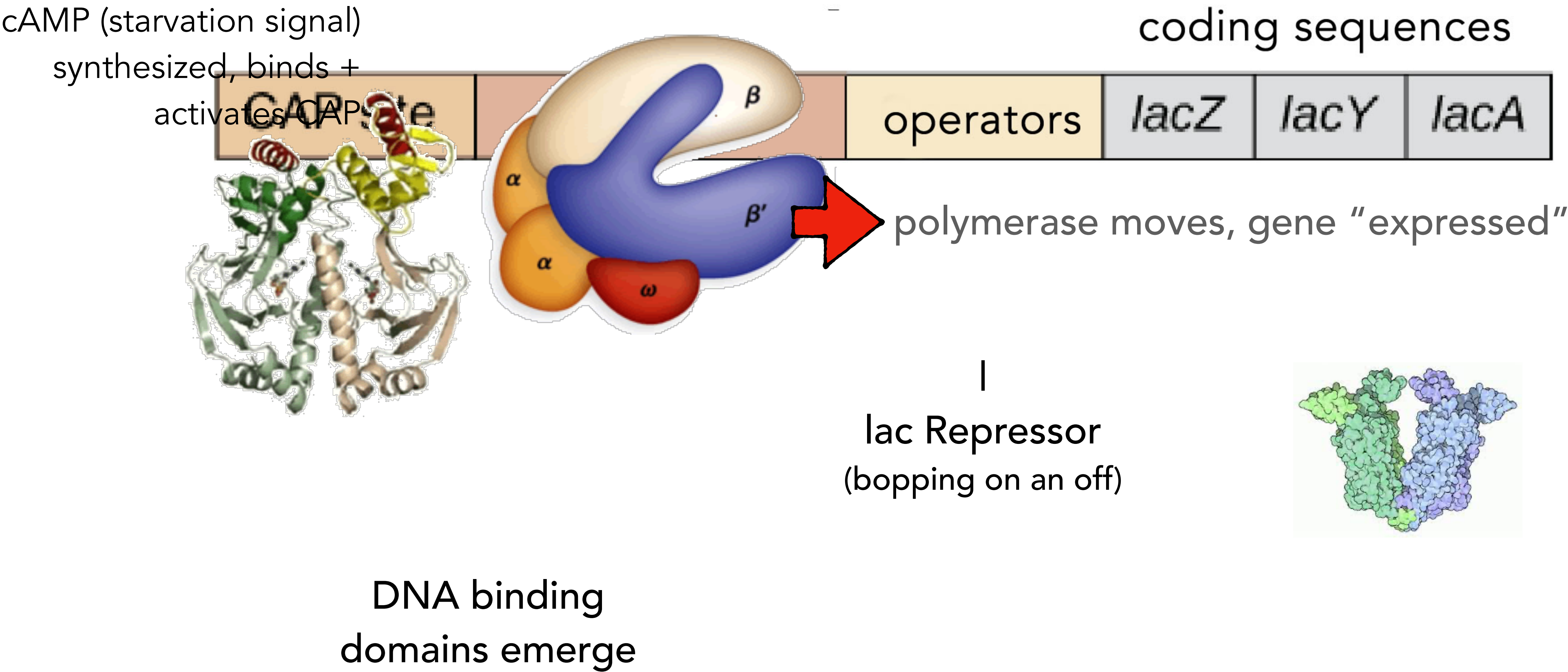
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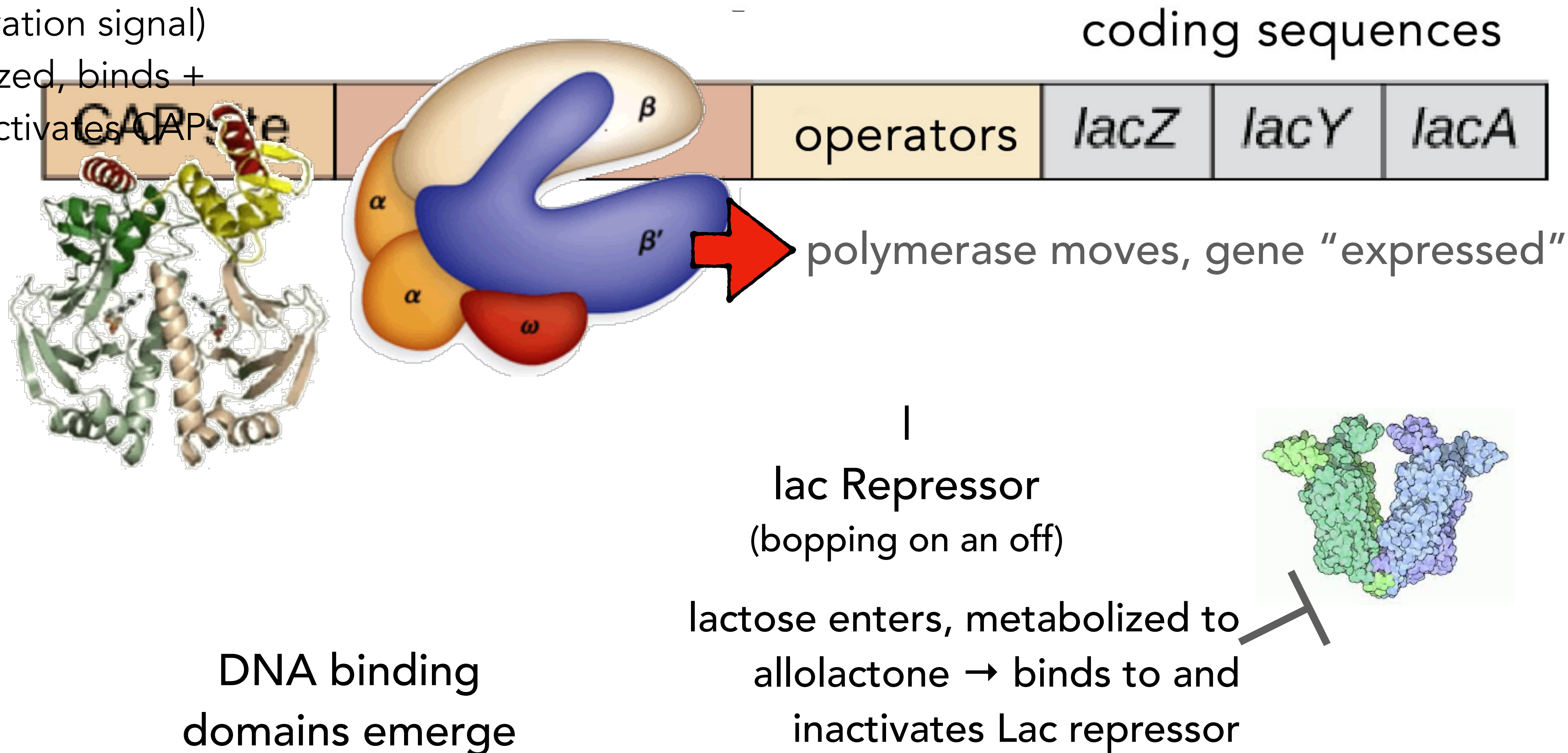
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Visualizing stochastic gene expression

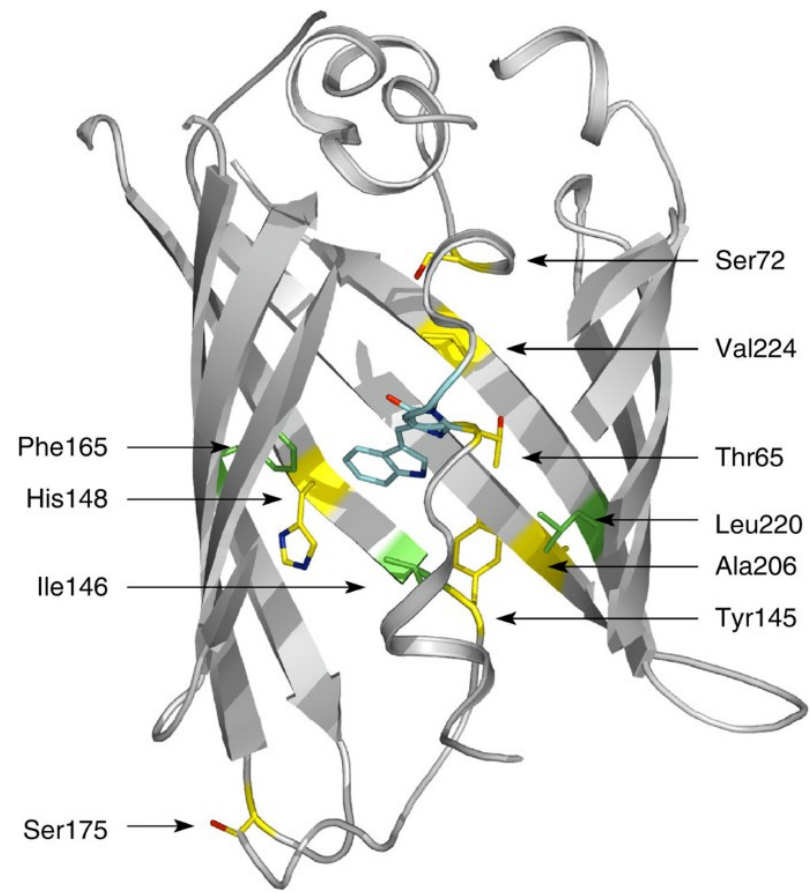
classic study on gene expression Elowitz et al 2002.

Stochastic Gene Expression in a Single Cell

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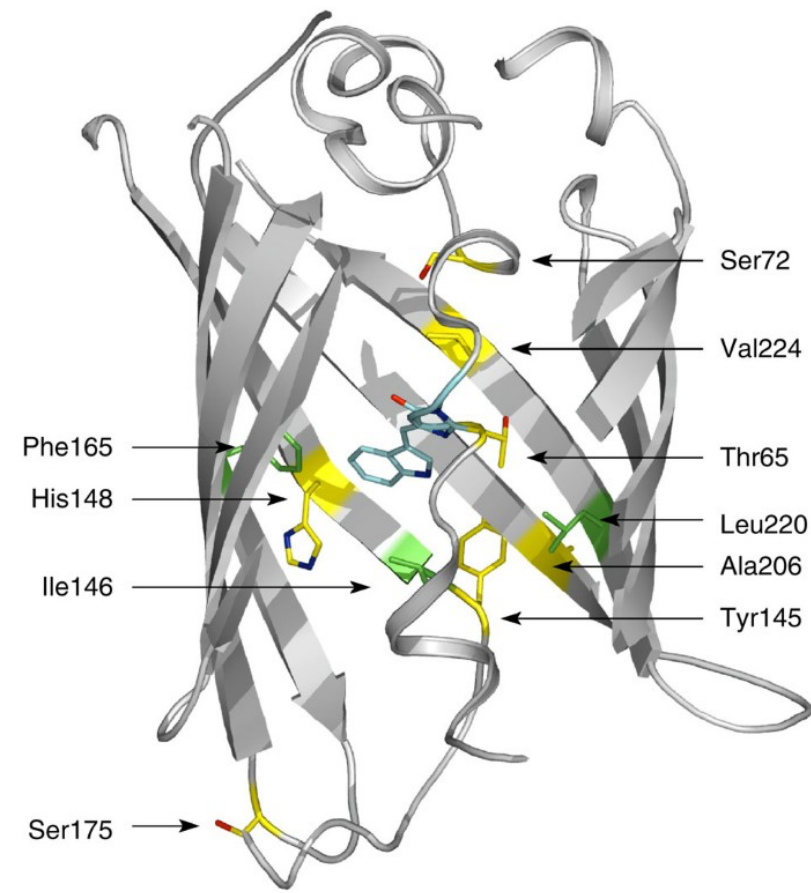
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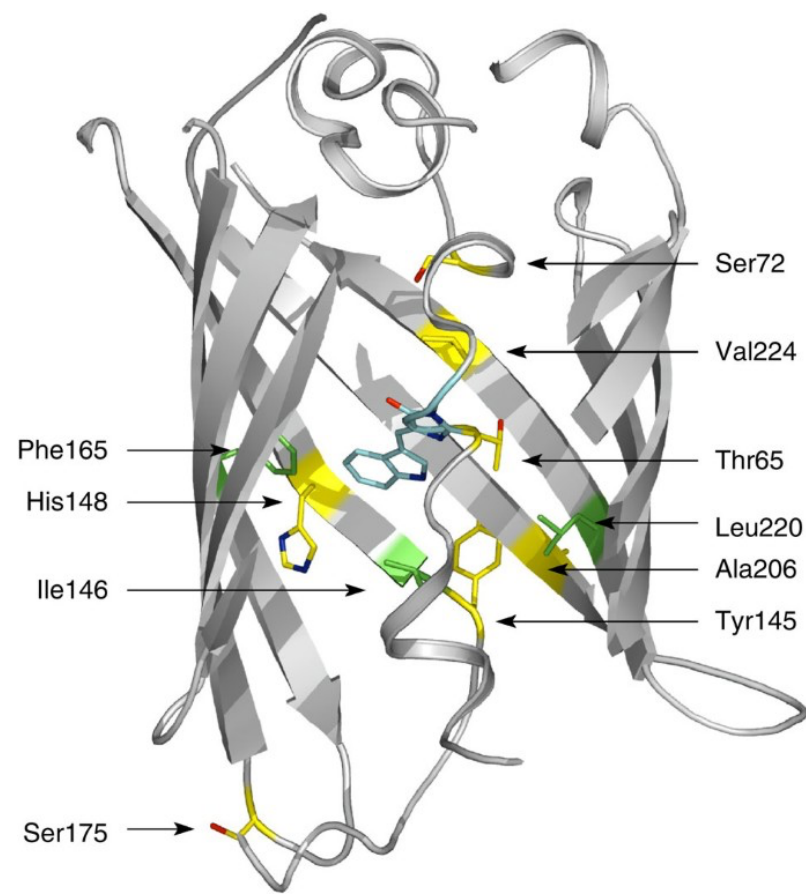
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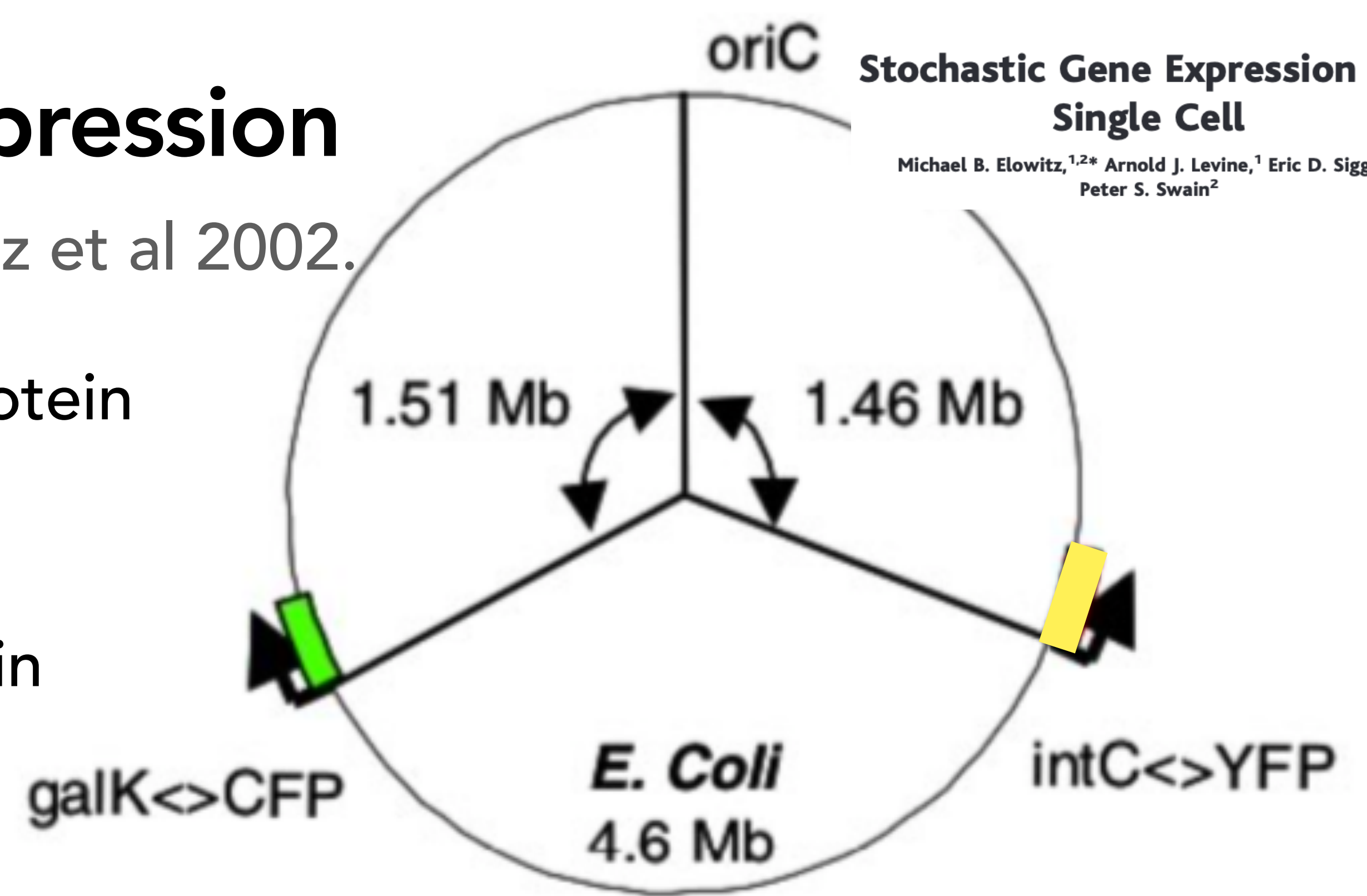


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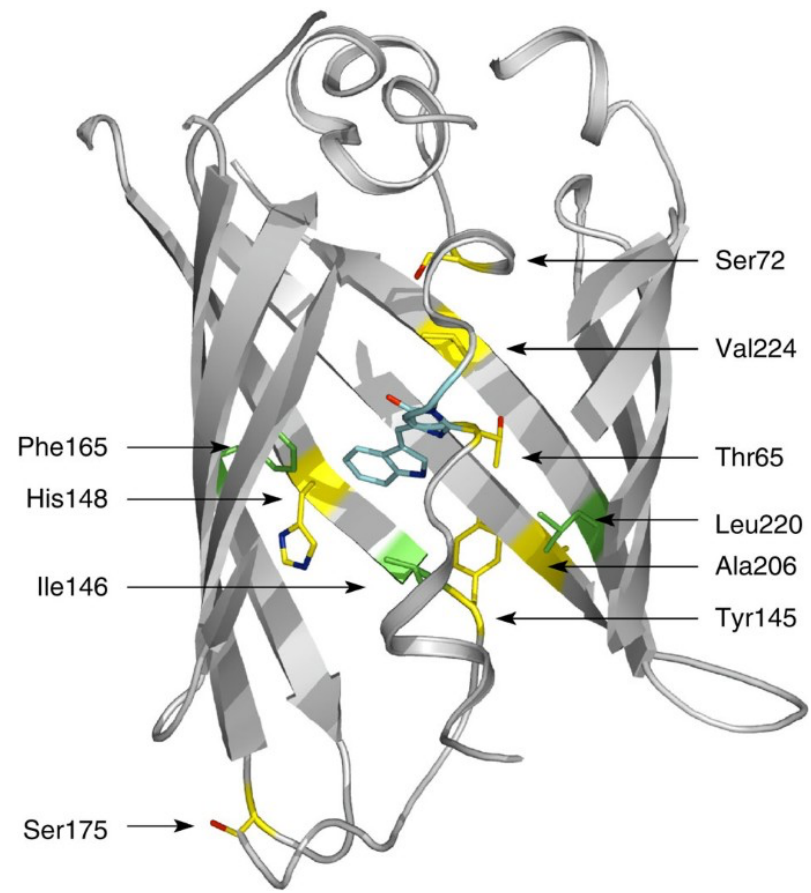
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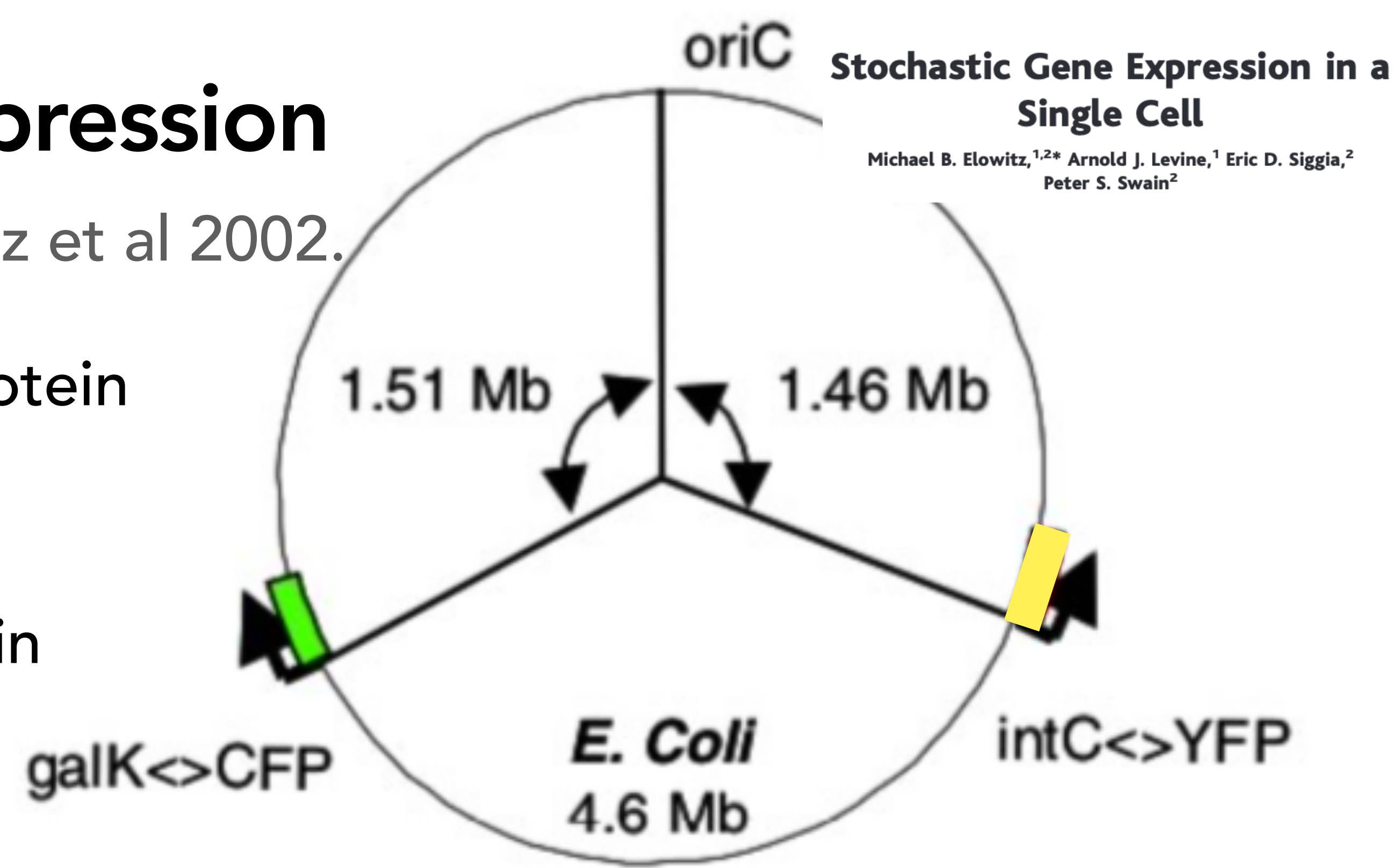
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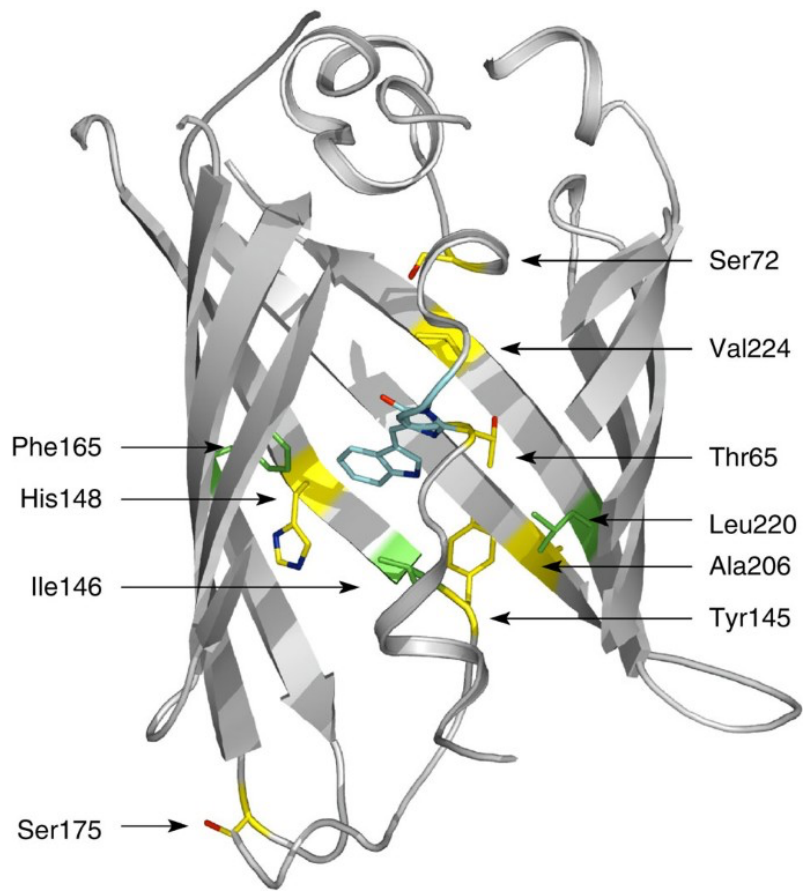
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same regulatory sequences used to drive expression (act independently)



Visualizing stochastic gene expression

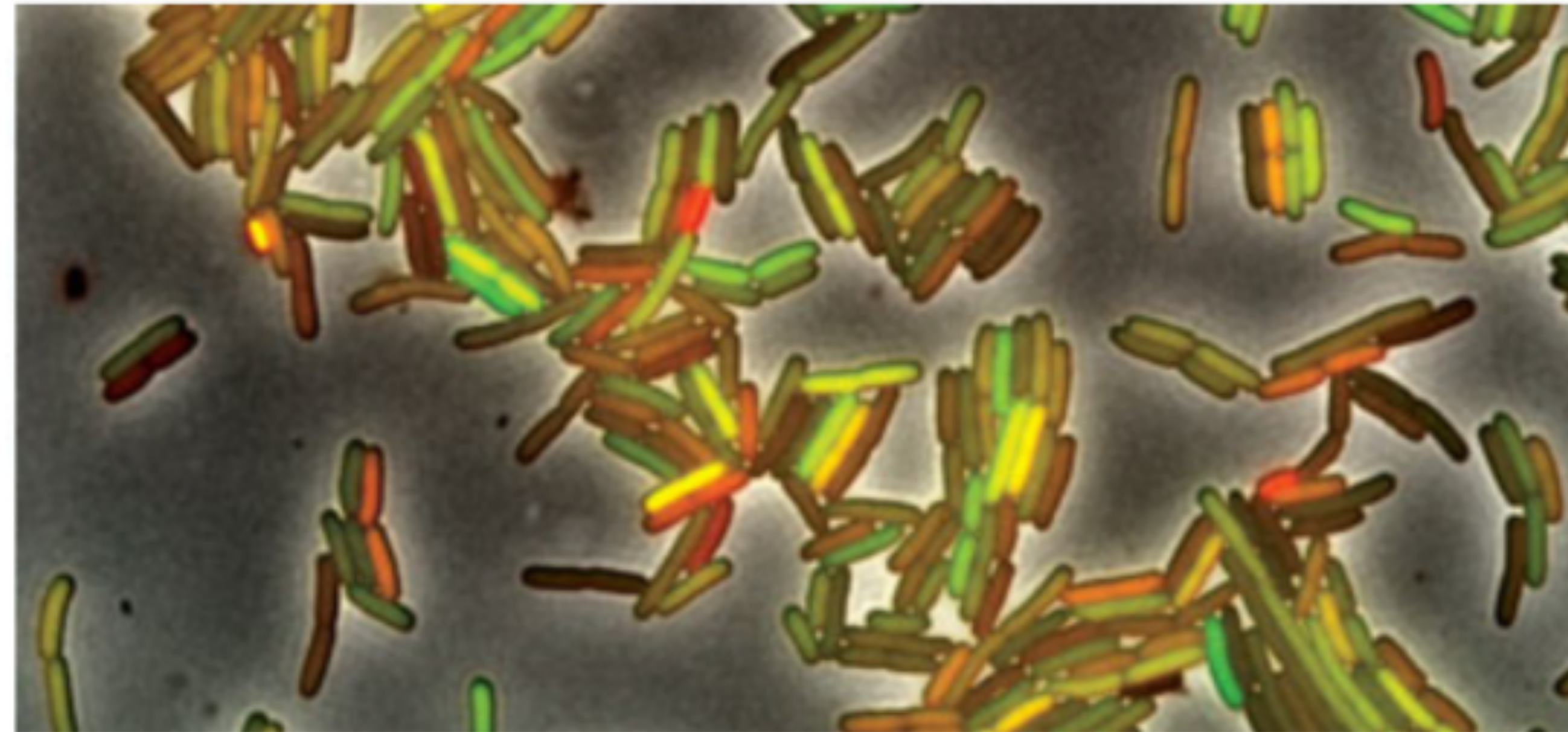
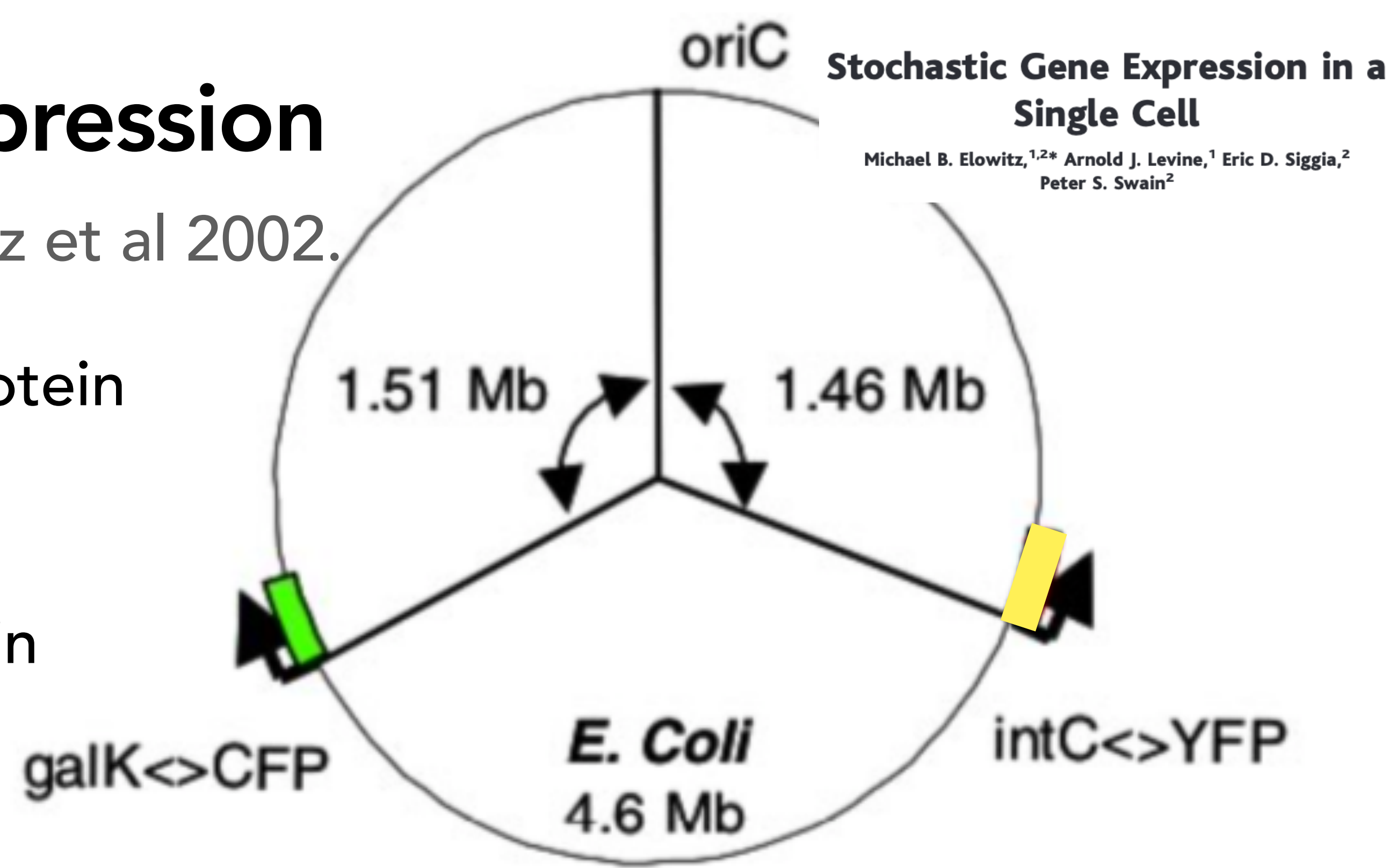
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Why stochastic behaviors are critical for social system

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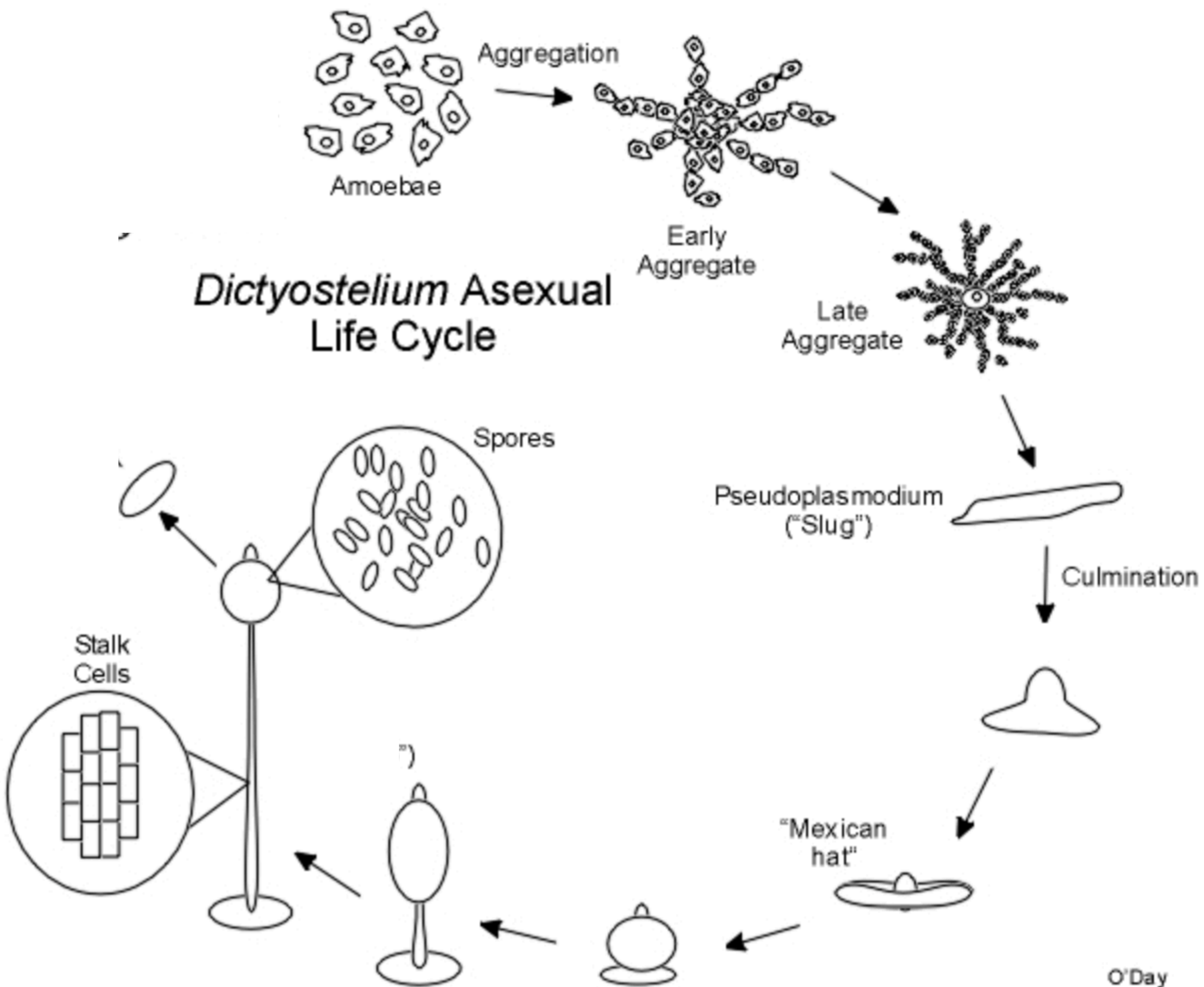
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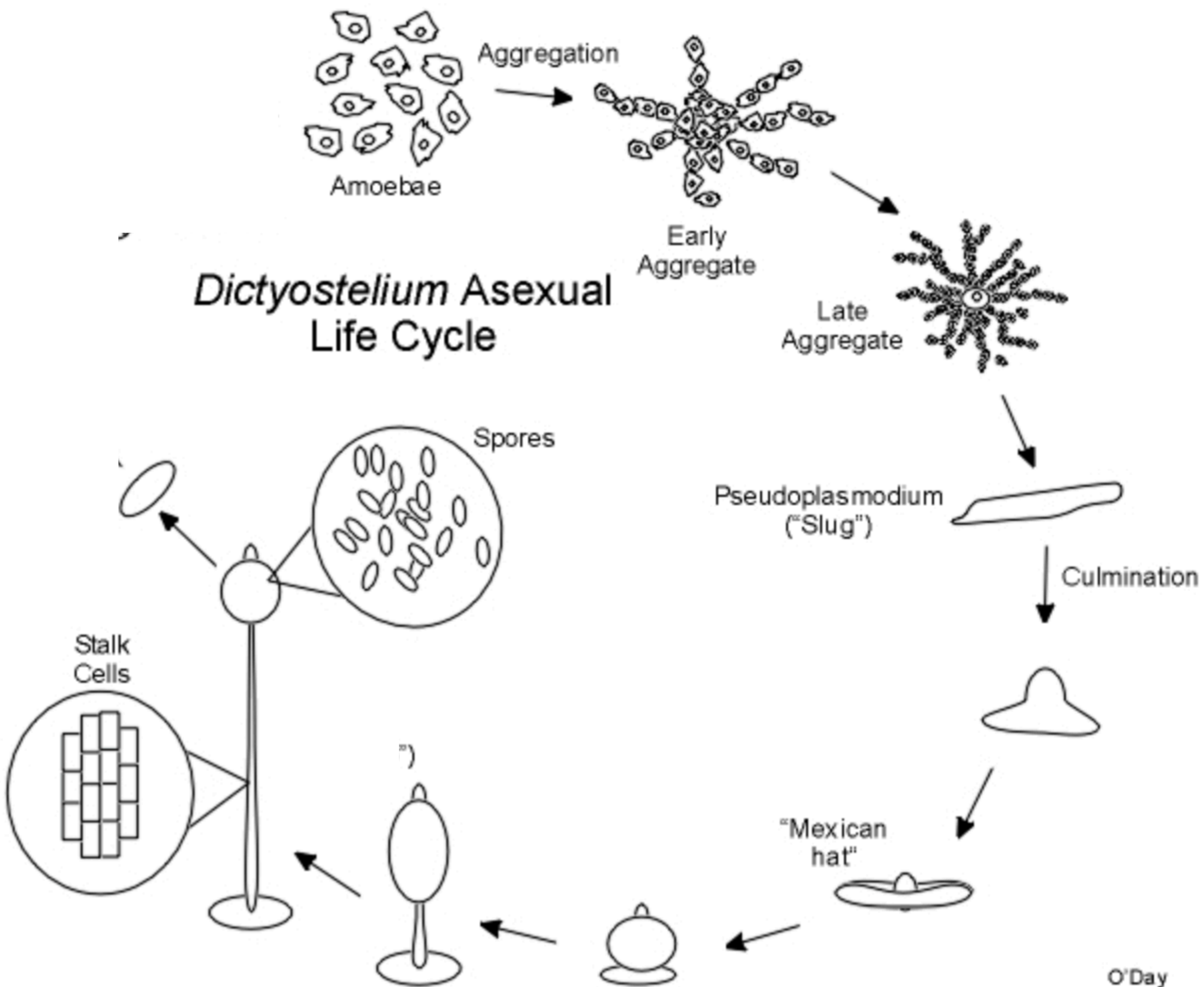
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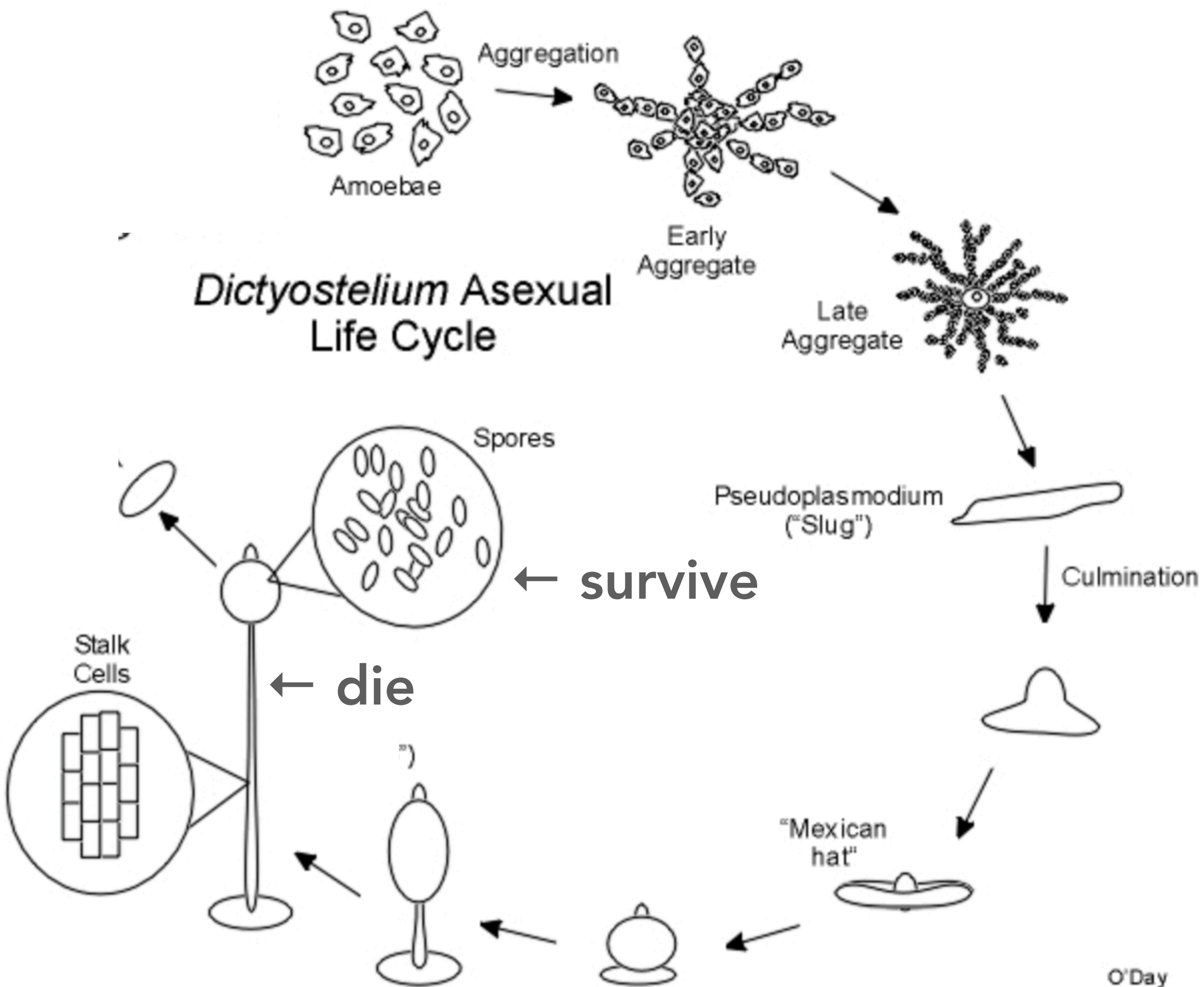
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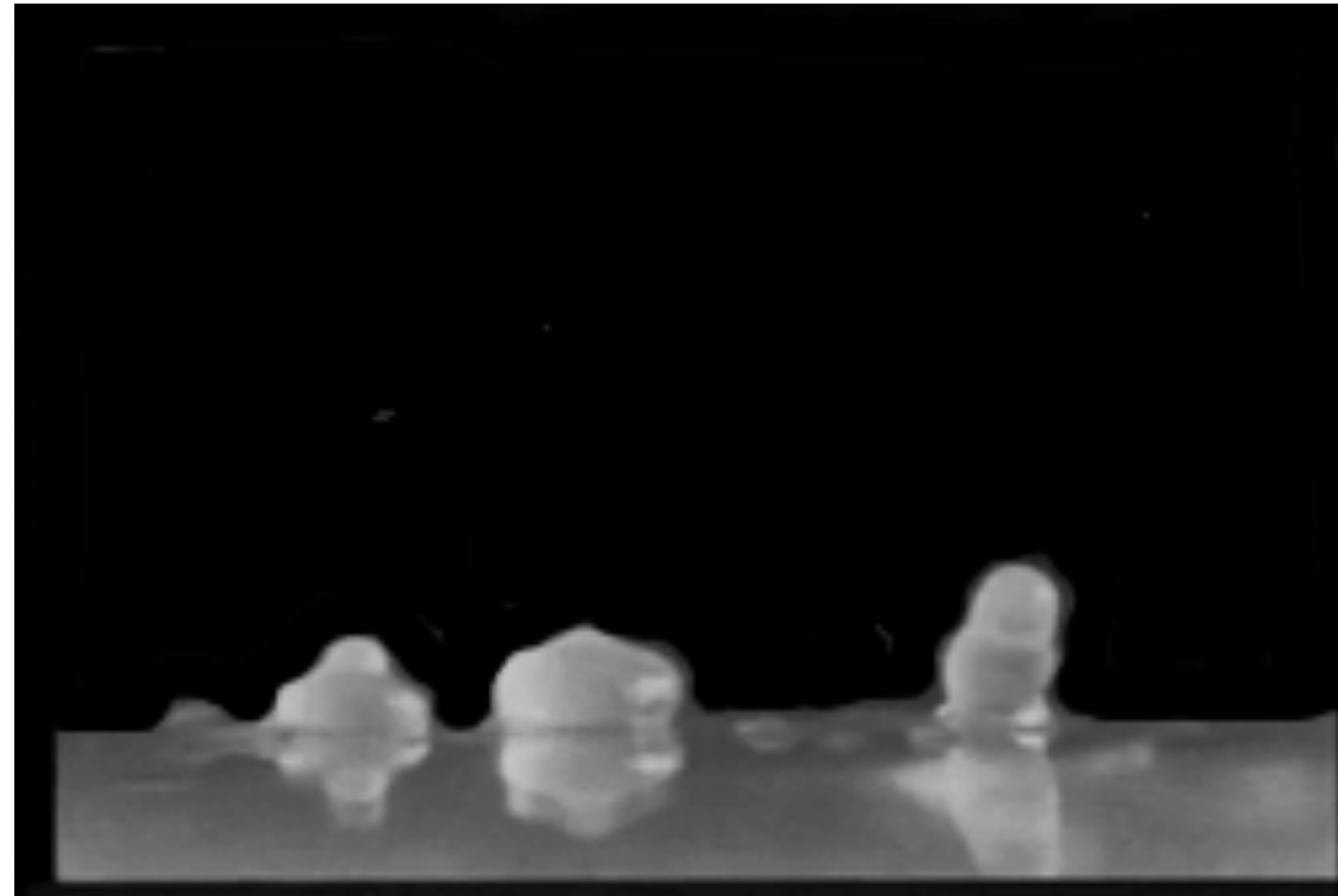
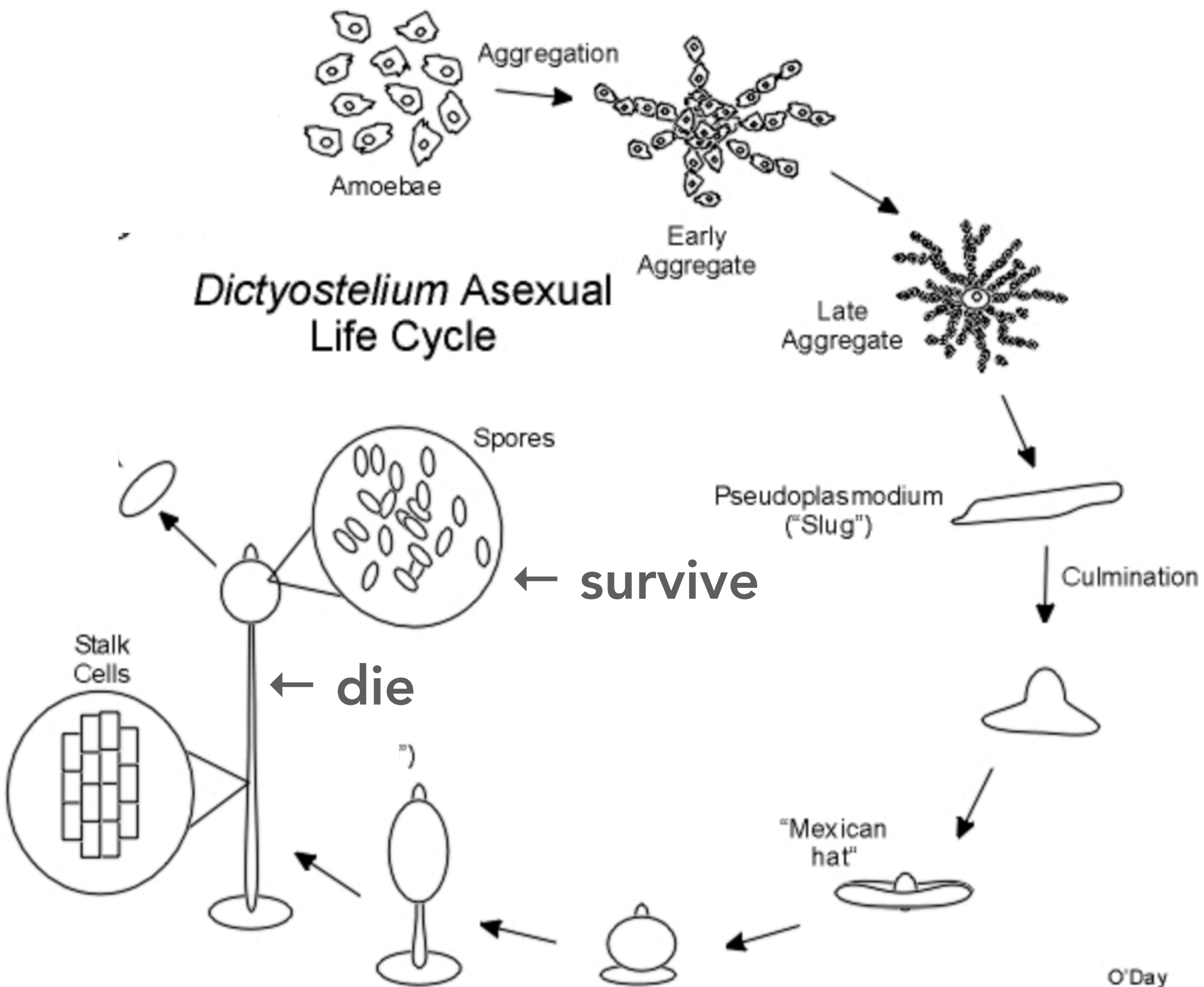
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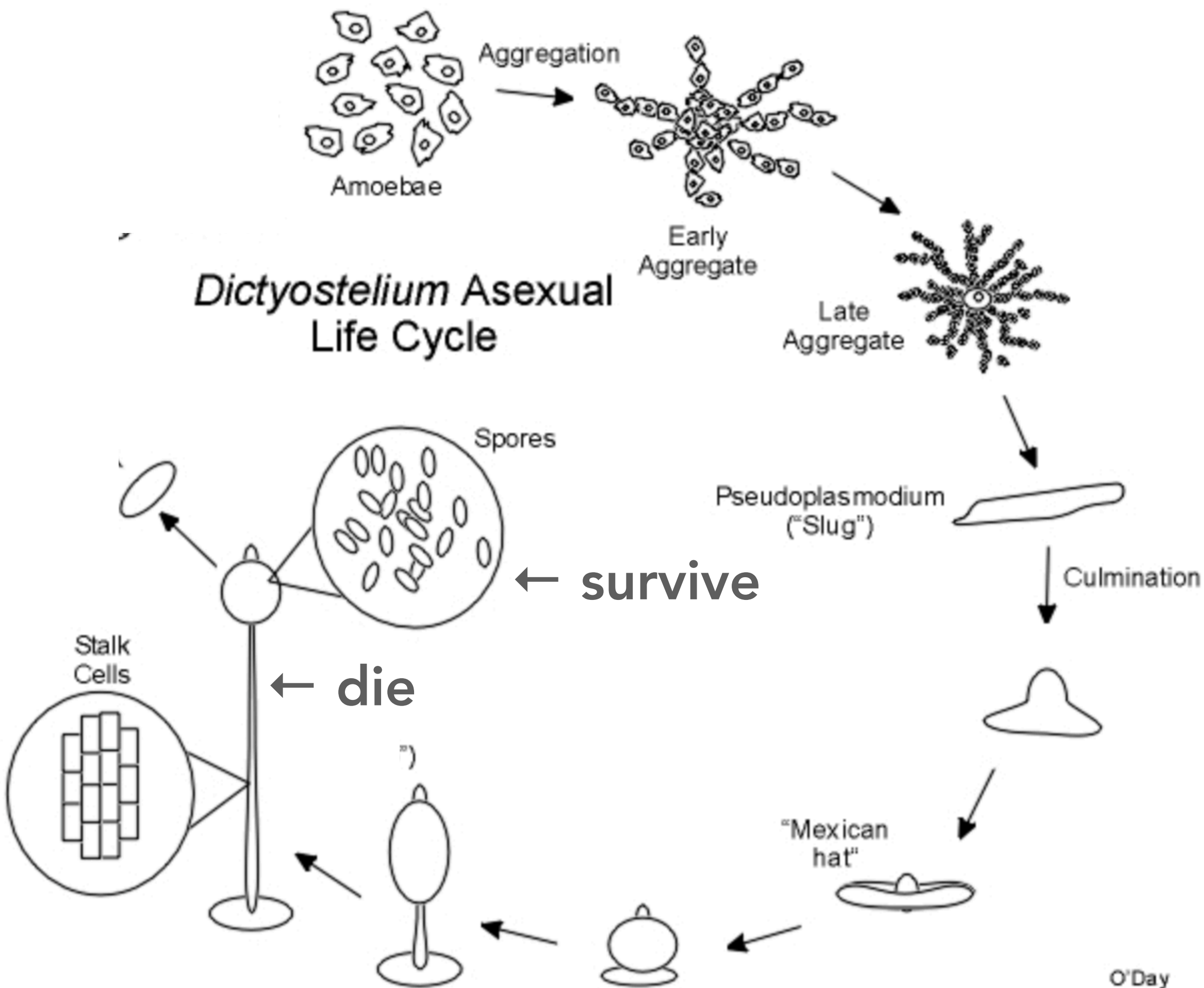
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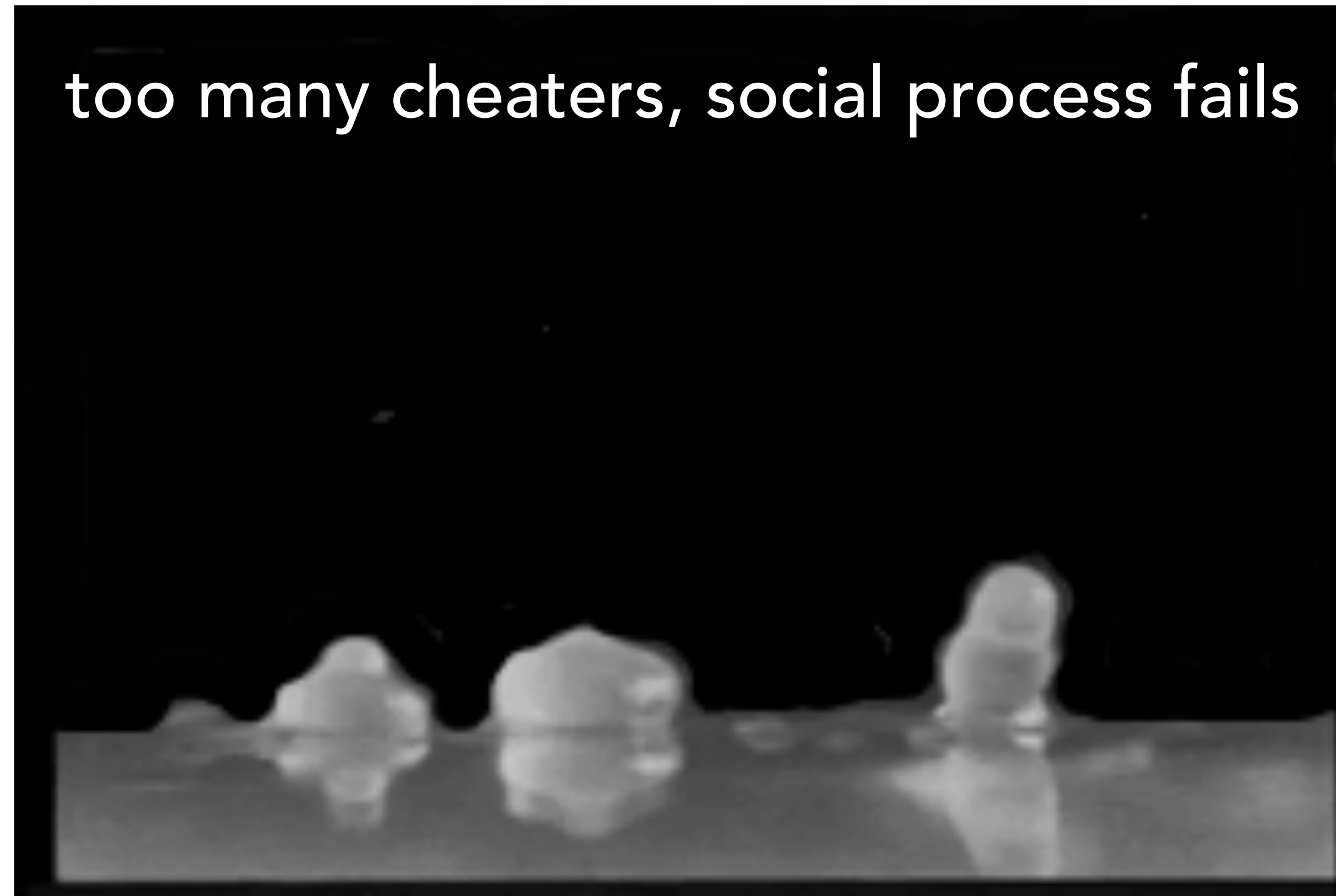
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sacrifice best achieved through stochastic choices (suppress social cheaters)

too many cheaters, social process fails




Cooperative behavior + stochastic choices






Order by chance: origins and benefits of stochasticity in immune cell fate control

Kathleen Abadie^{1,a}, Nicholas A. Pease^{1,2,a},
Matthew J. Wither^{1,a} and Hao Yuan Kueh^{1,3}



Neural precursors of decisions that matter—an ERP study of deliberate and arbitrary choice

Uri Maoz^{1,2,3,4,5,6*}, Gideon Yaffe⁷, Christof Koch⁸, Liad Mudrik^{9,10}

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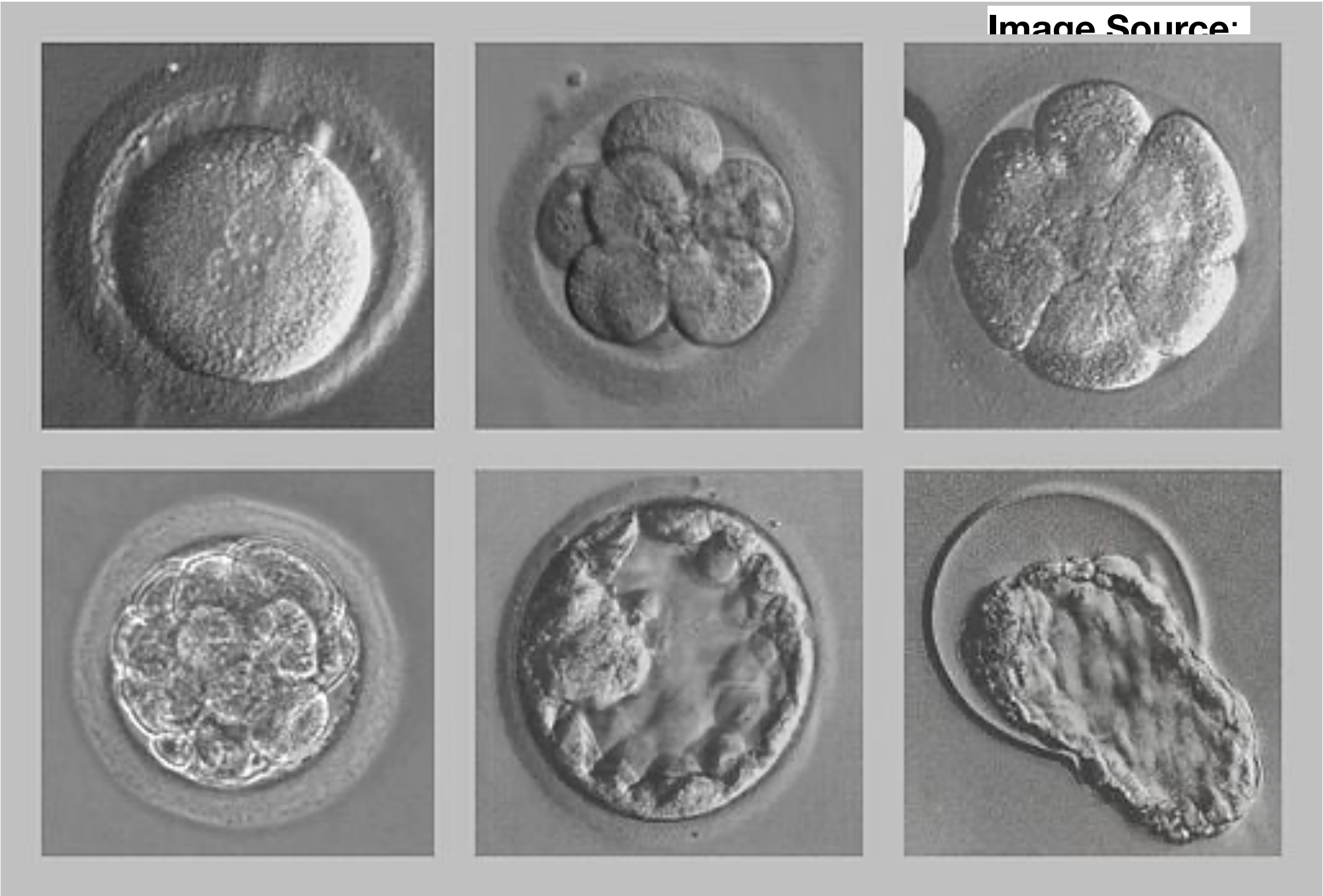
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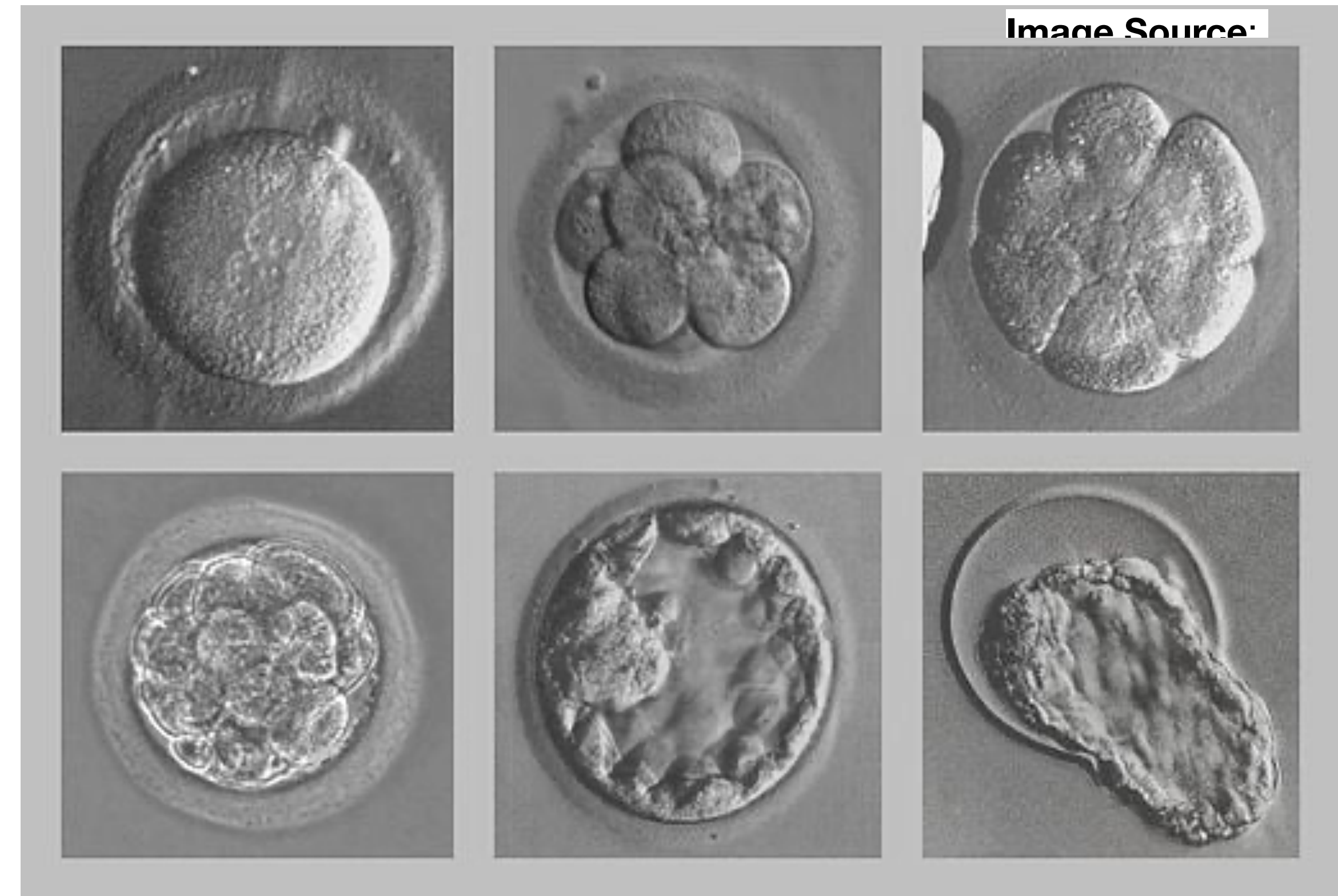
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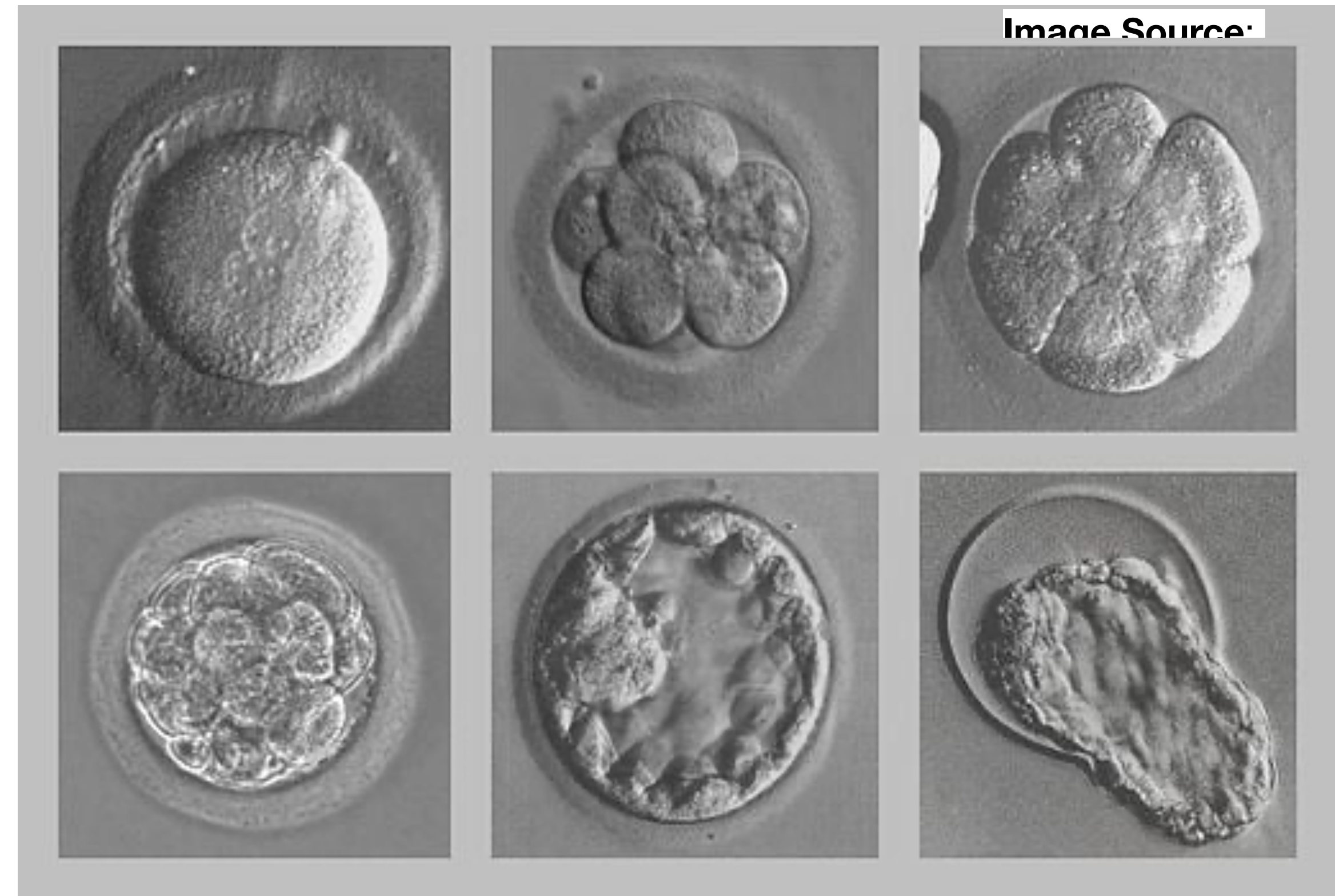
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stochastic effects influence development of behavior of immune and nervous systems






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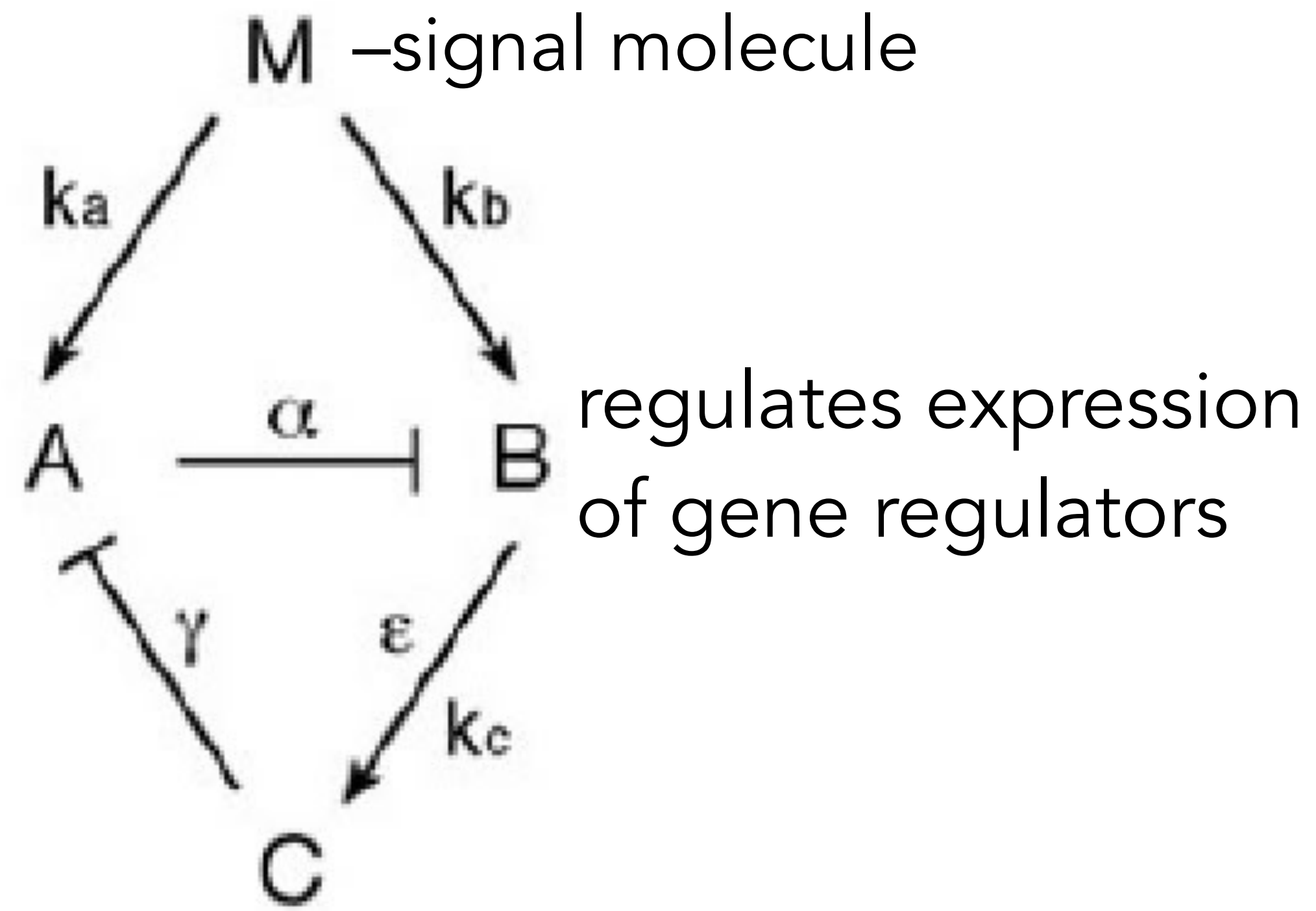
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Stochastic event can have down stream effects



Research article

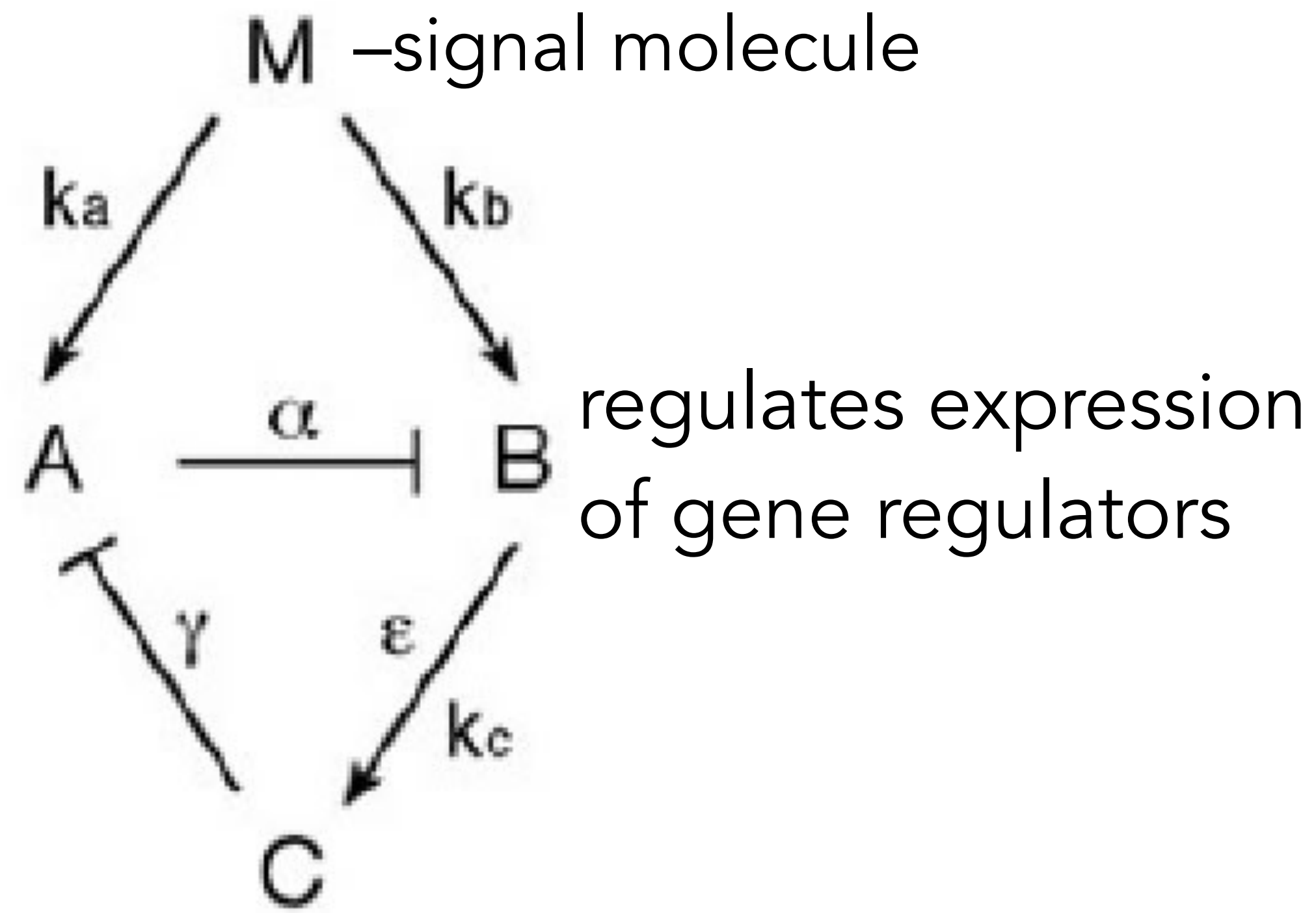
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Yasushi Saka^{*1,2} and James C Smith¹

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outcome (is A or B expressed?)

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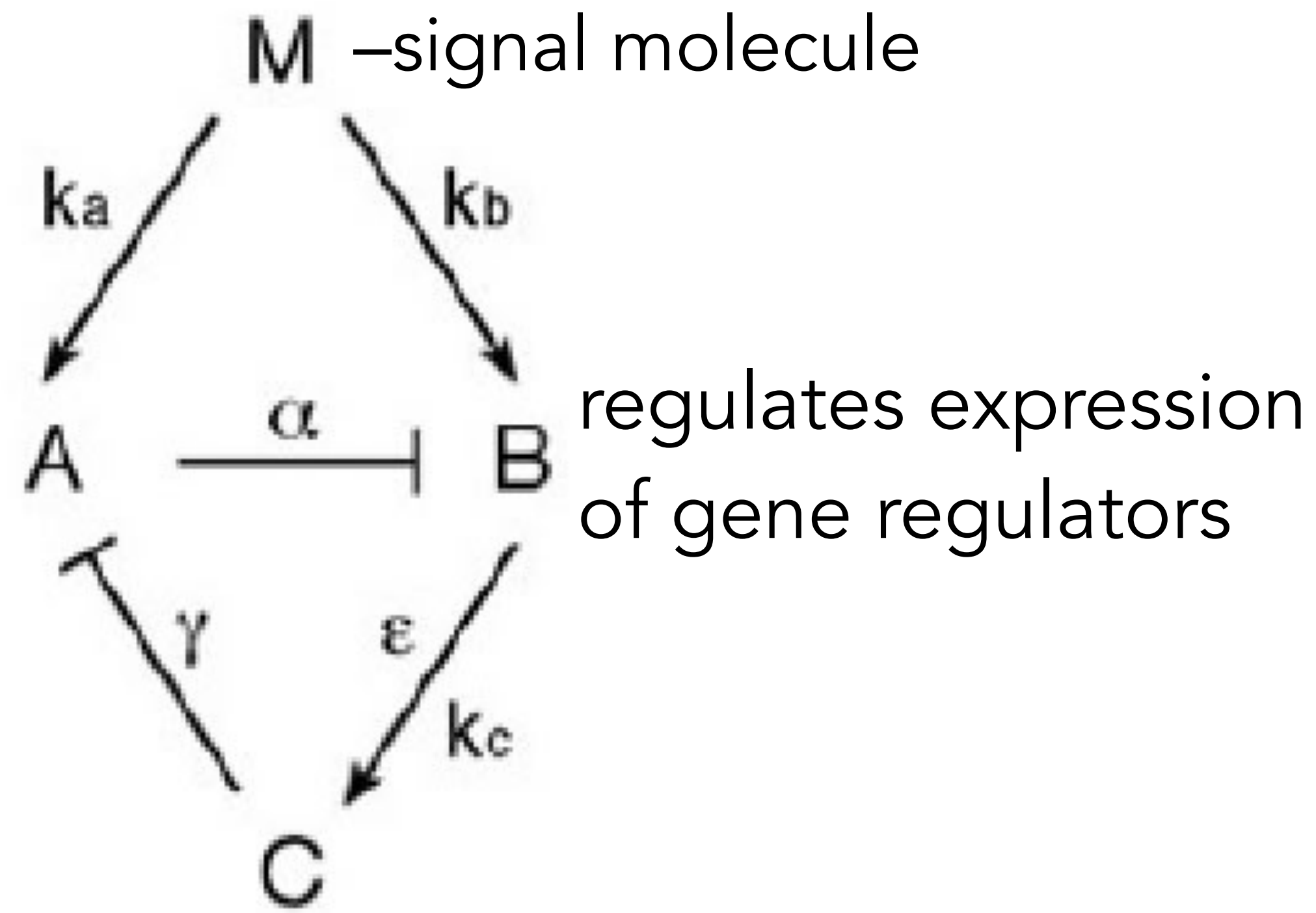
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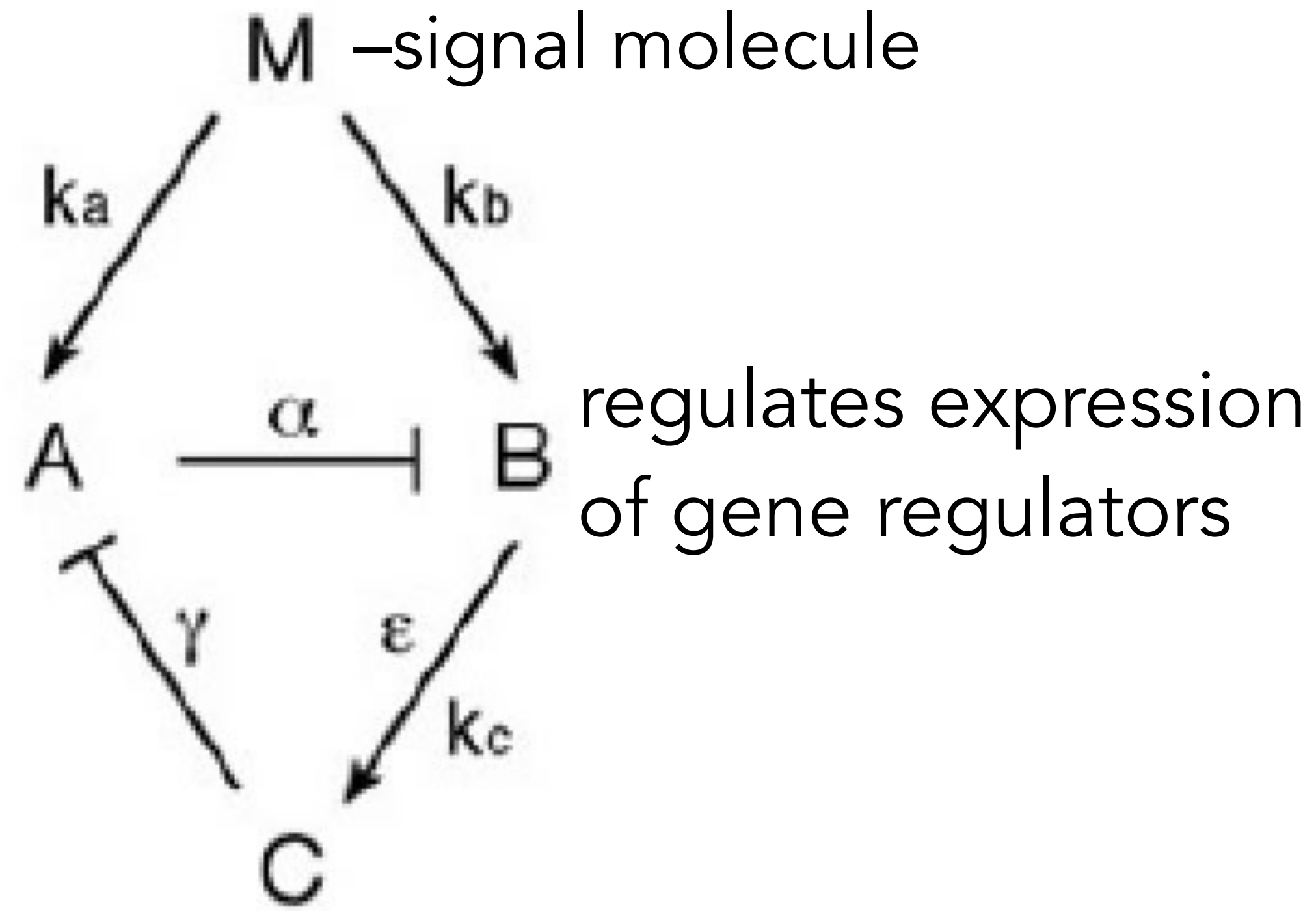
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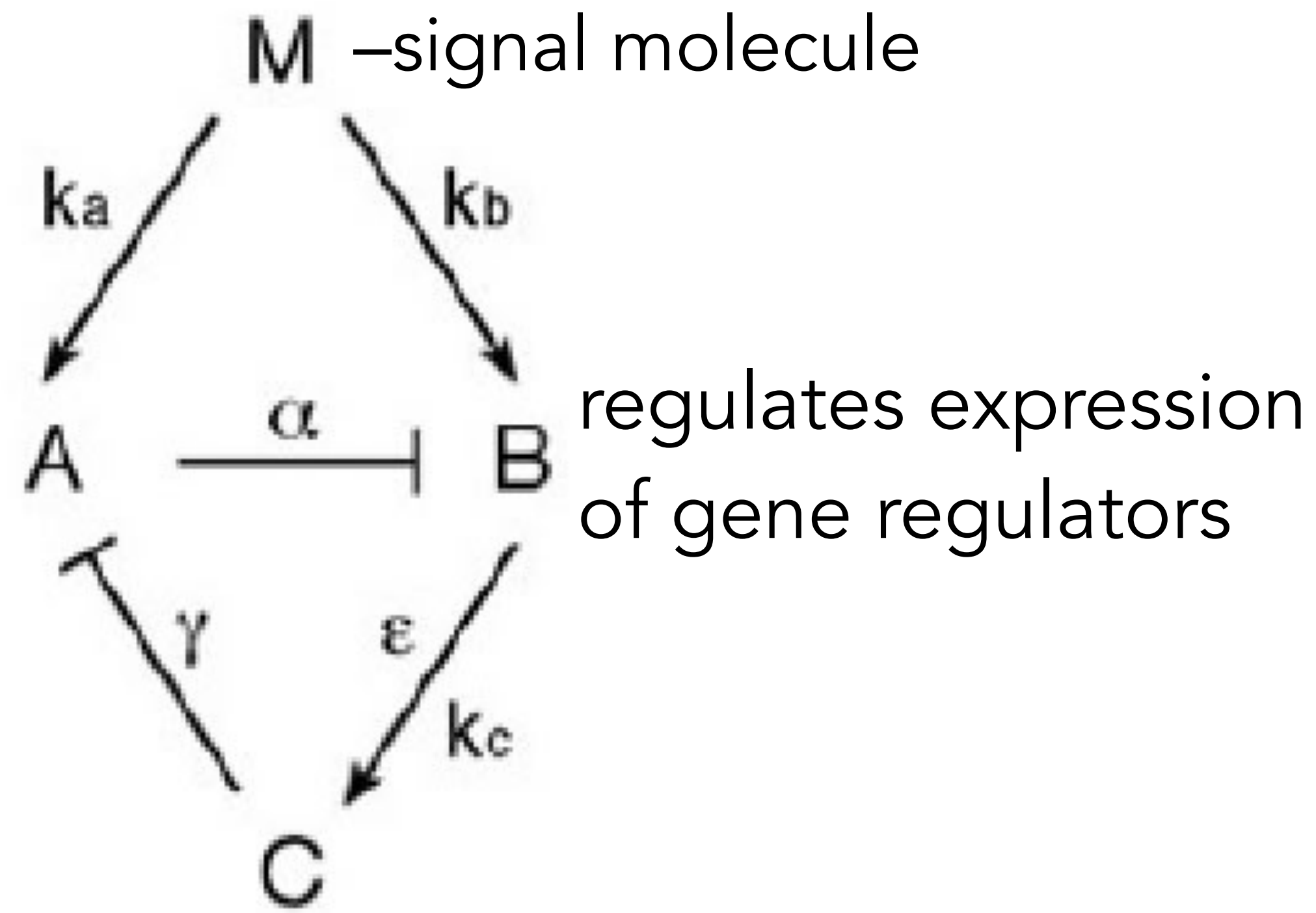
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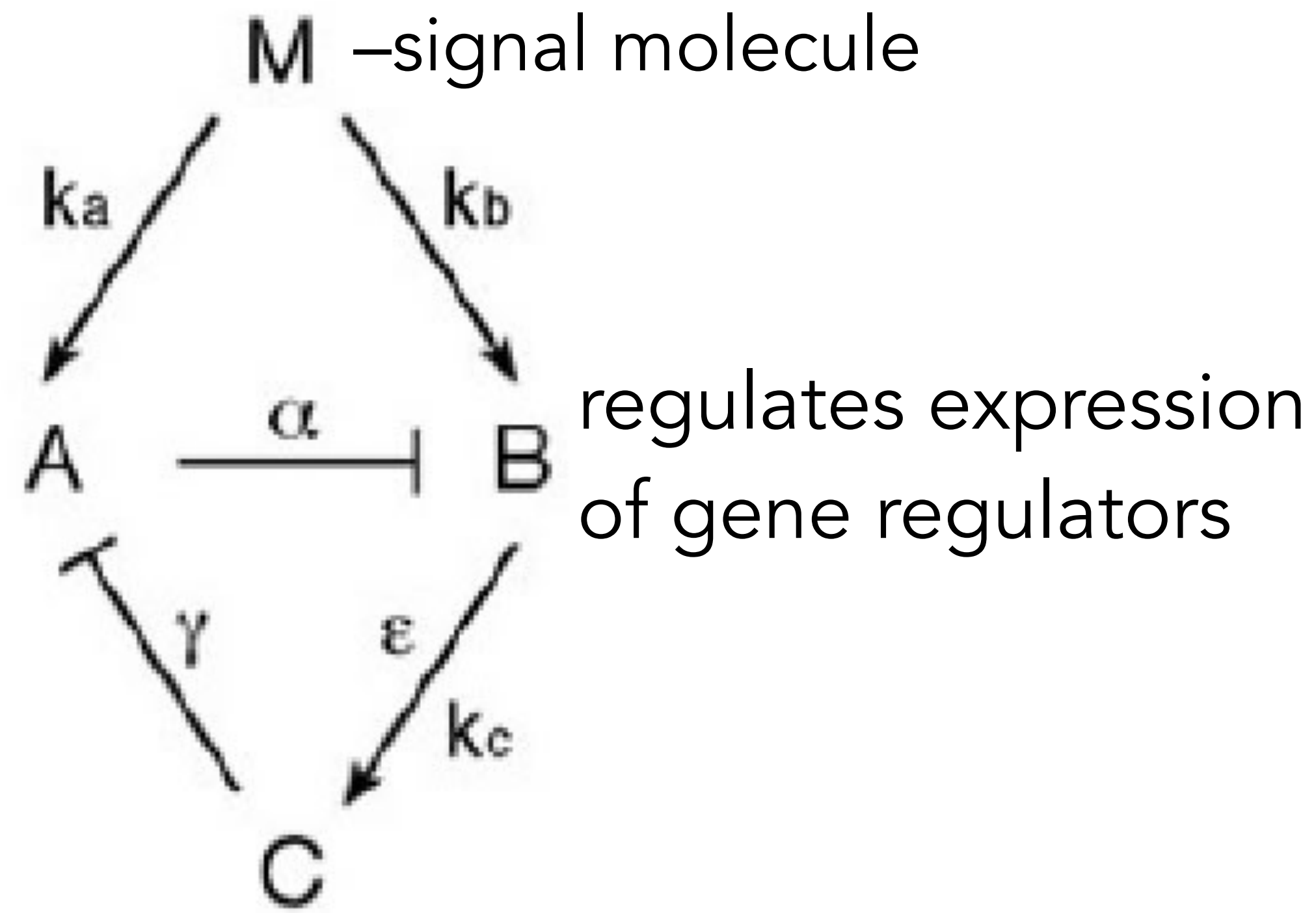
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prepares system for next signal

Research article

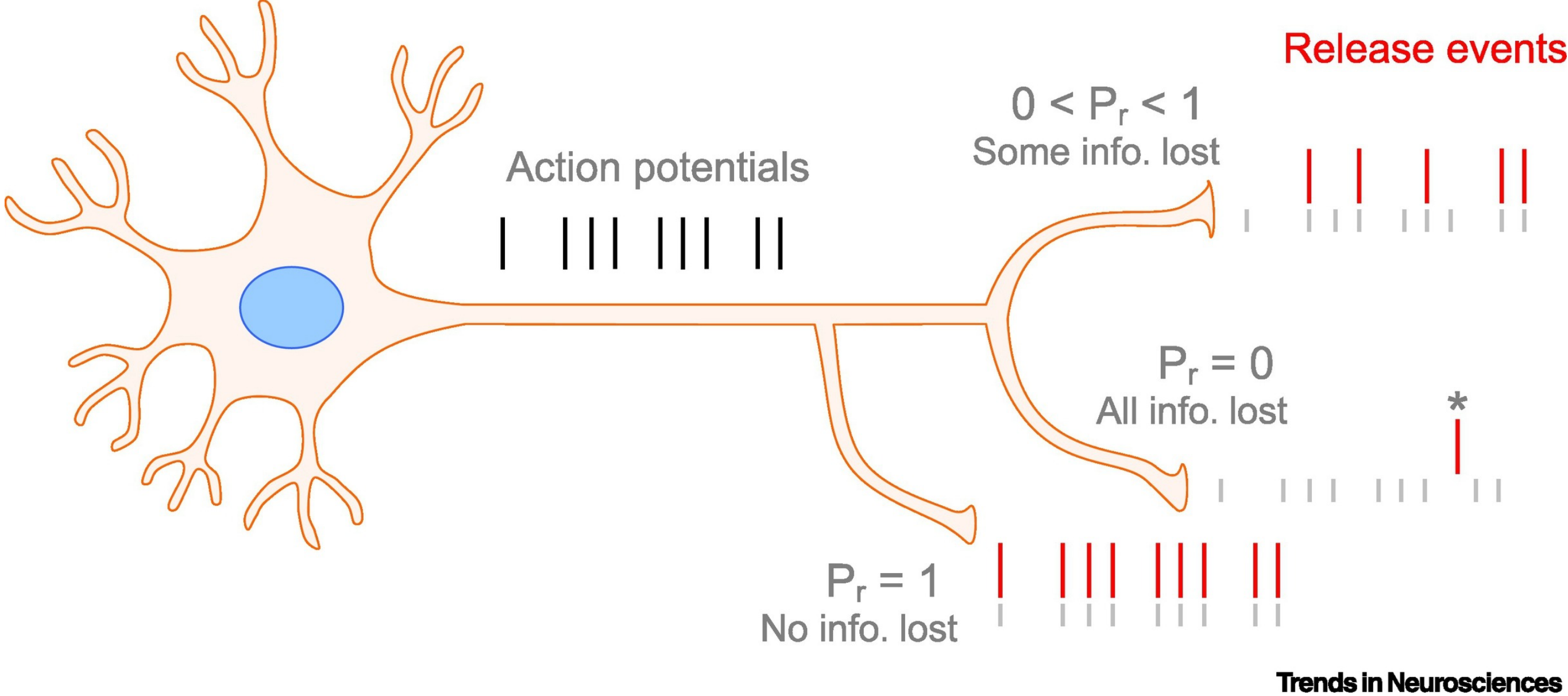
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Noisy neural networks*



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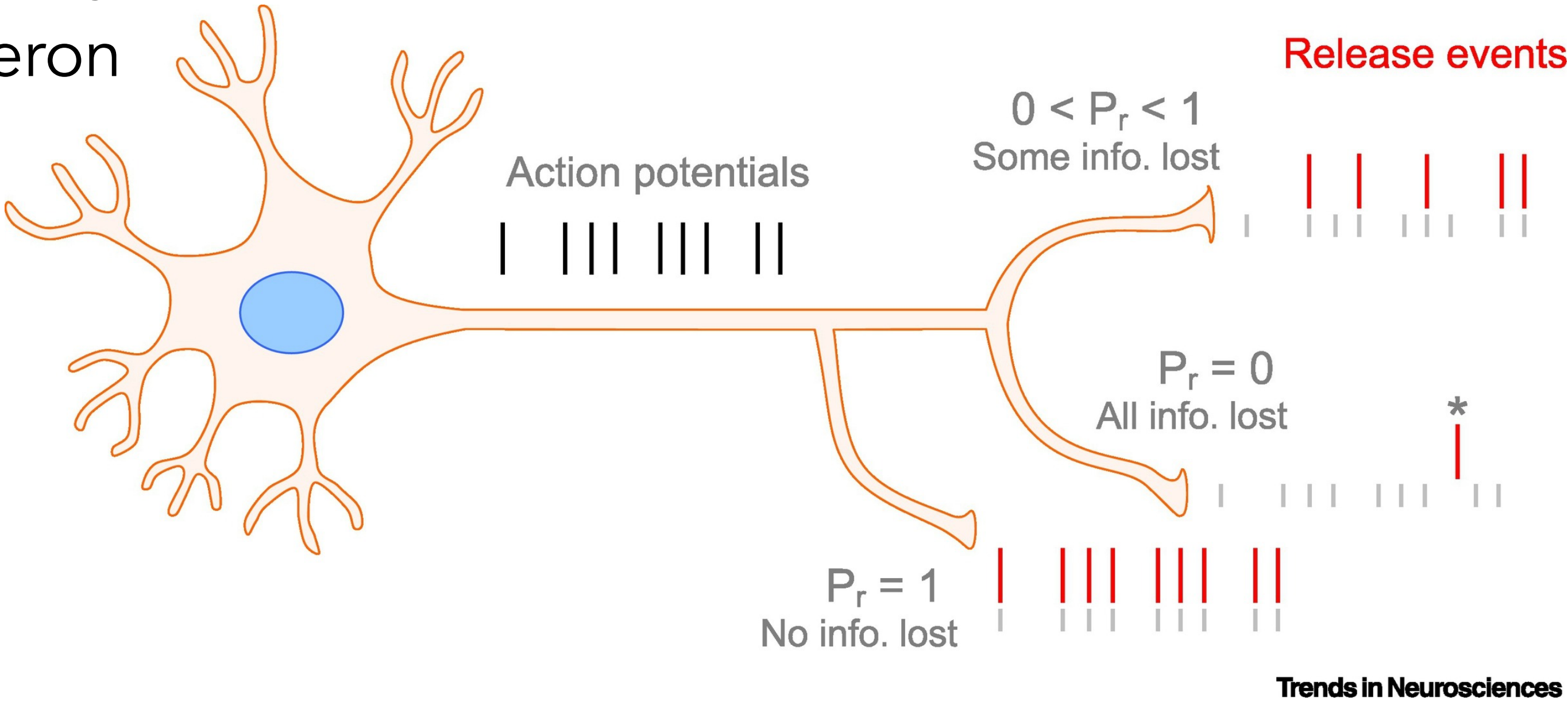
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Dmitri A. Rusakov^{1,*}, Leonid P. Savtchenko^{1,*}, and Peter E. Latham^{2,*}

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Noisy neural networks*

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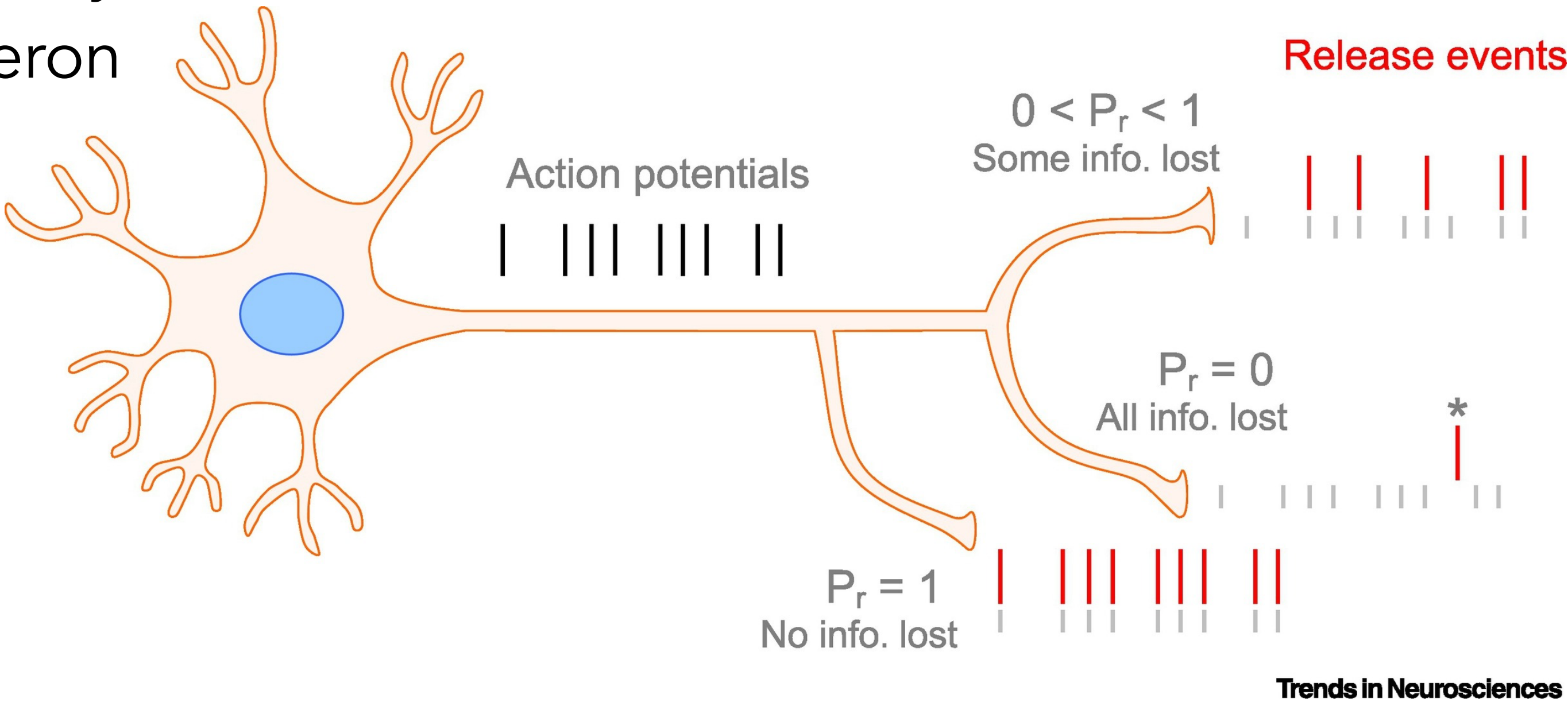
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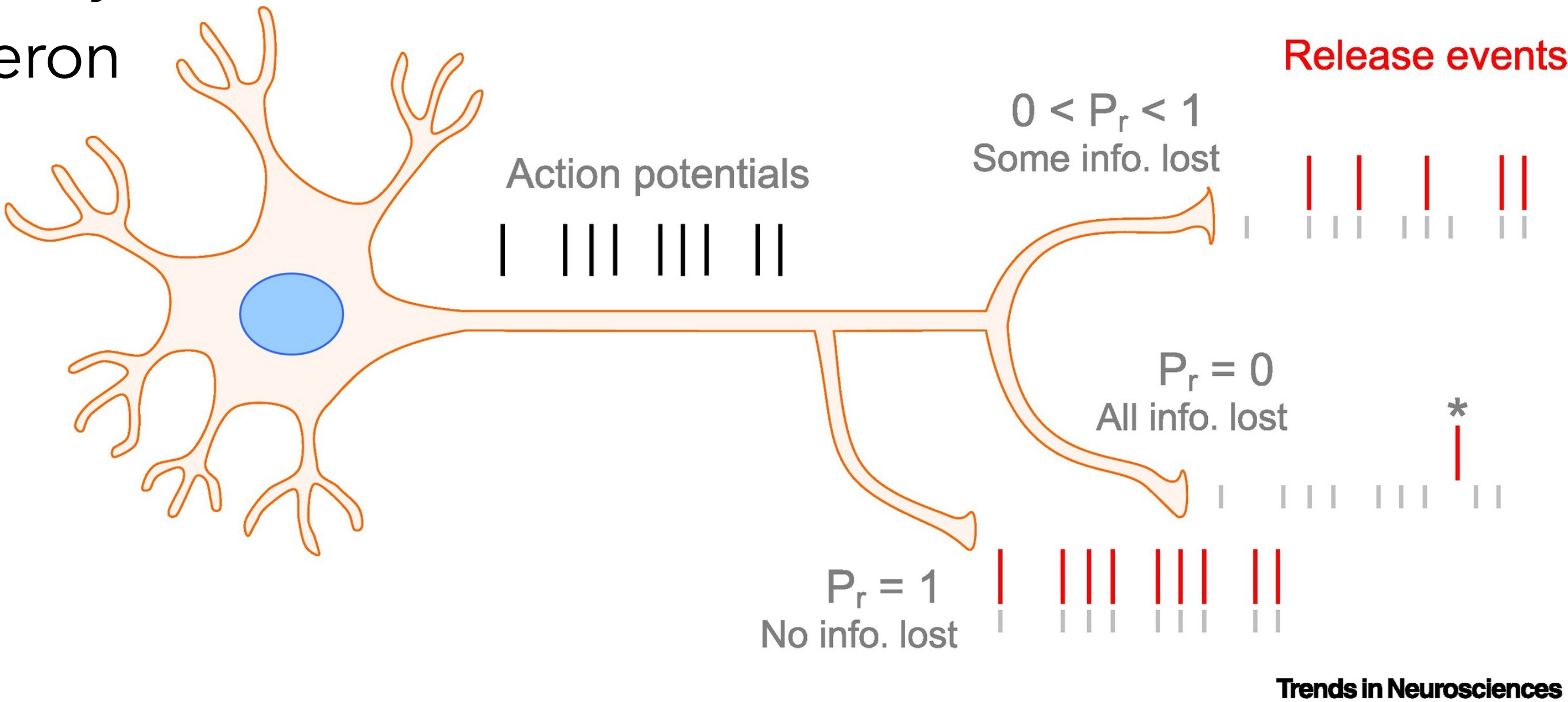
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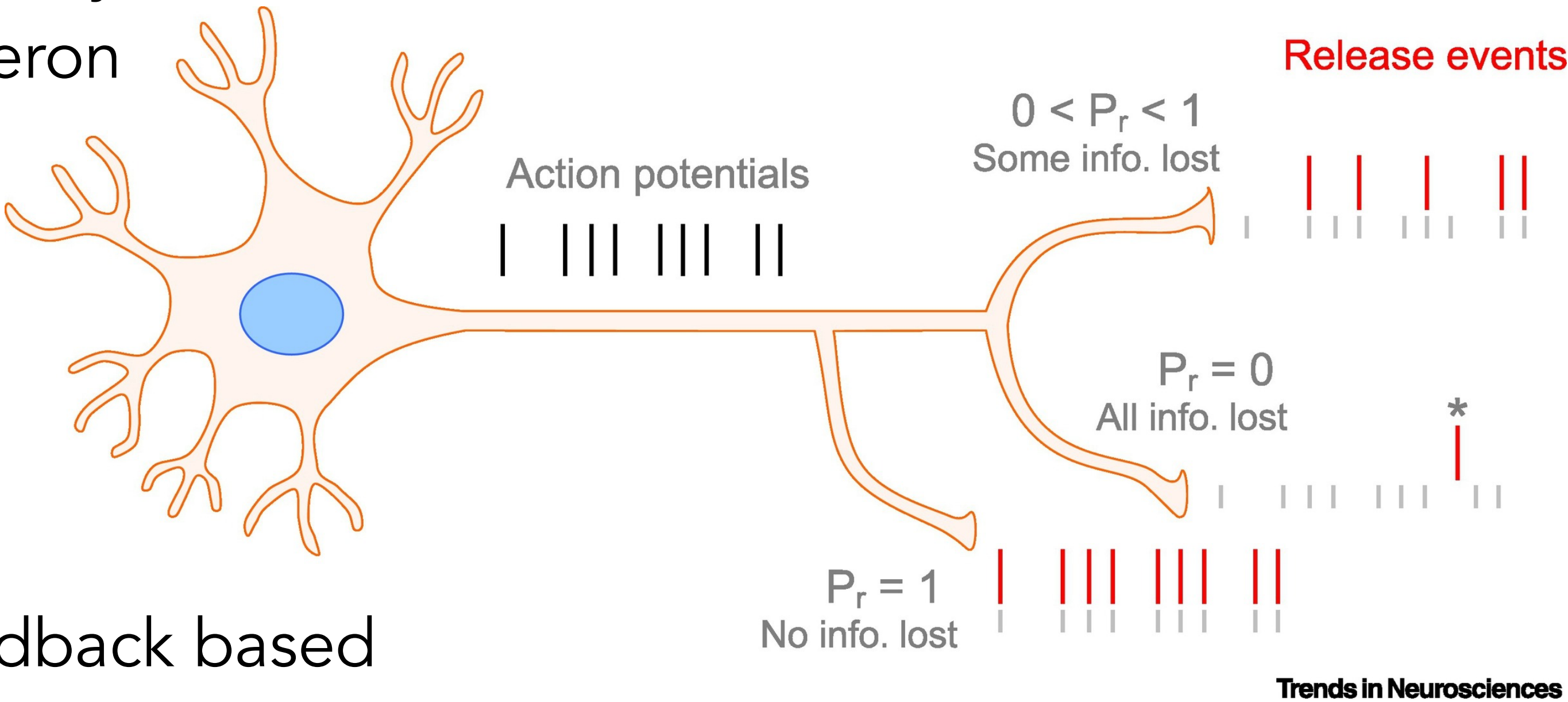
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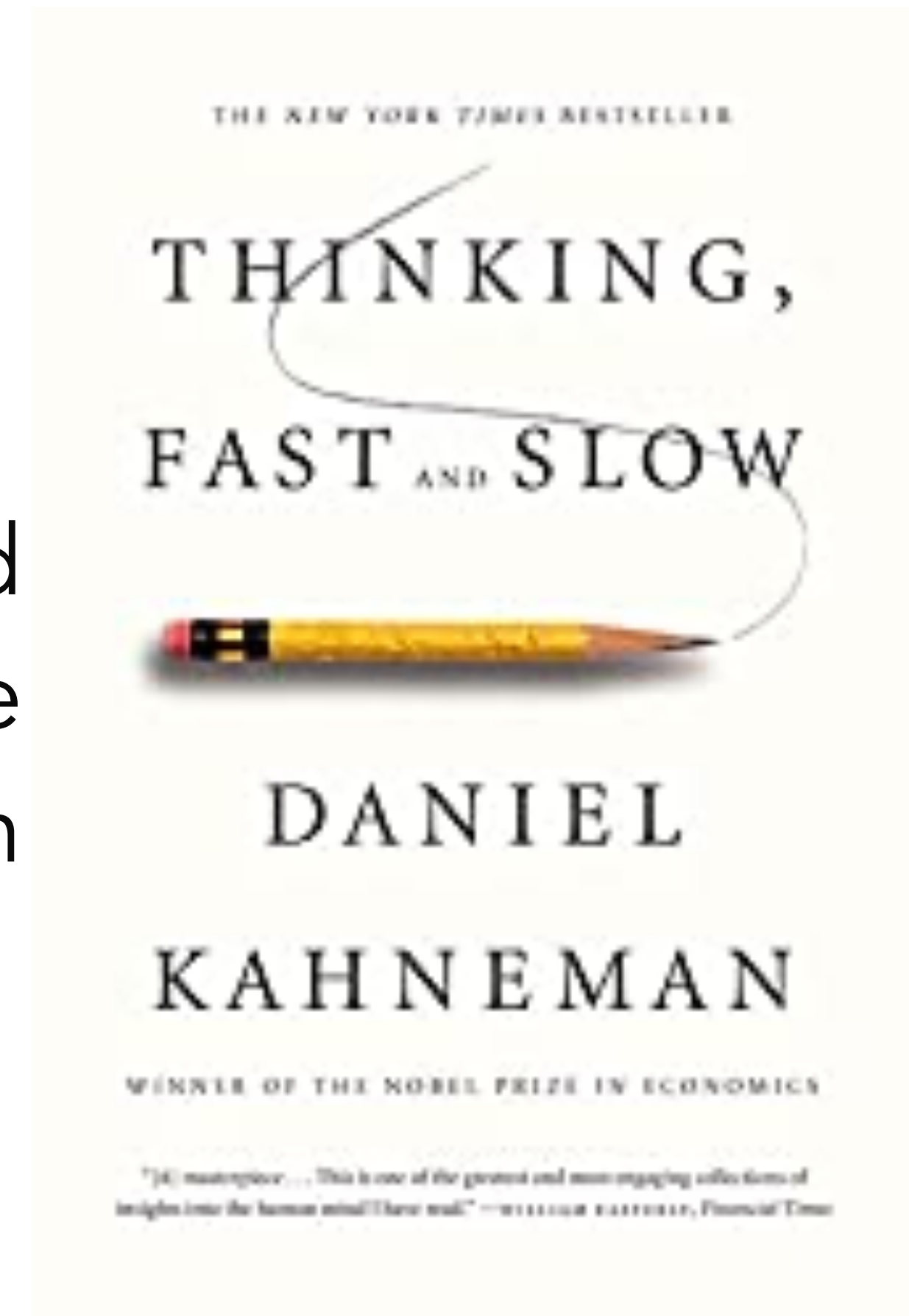
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At various levels (cellular and organismic),
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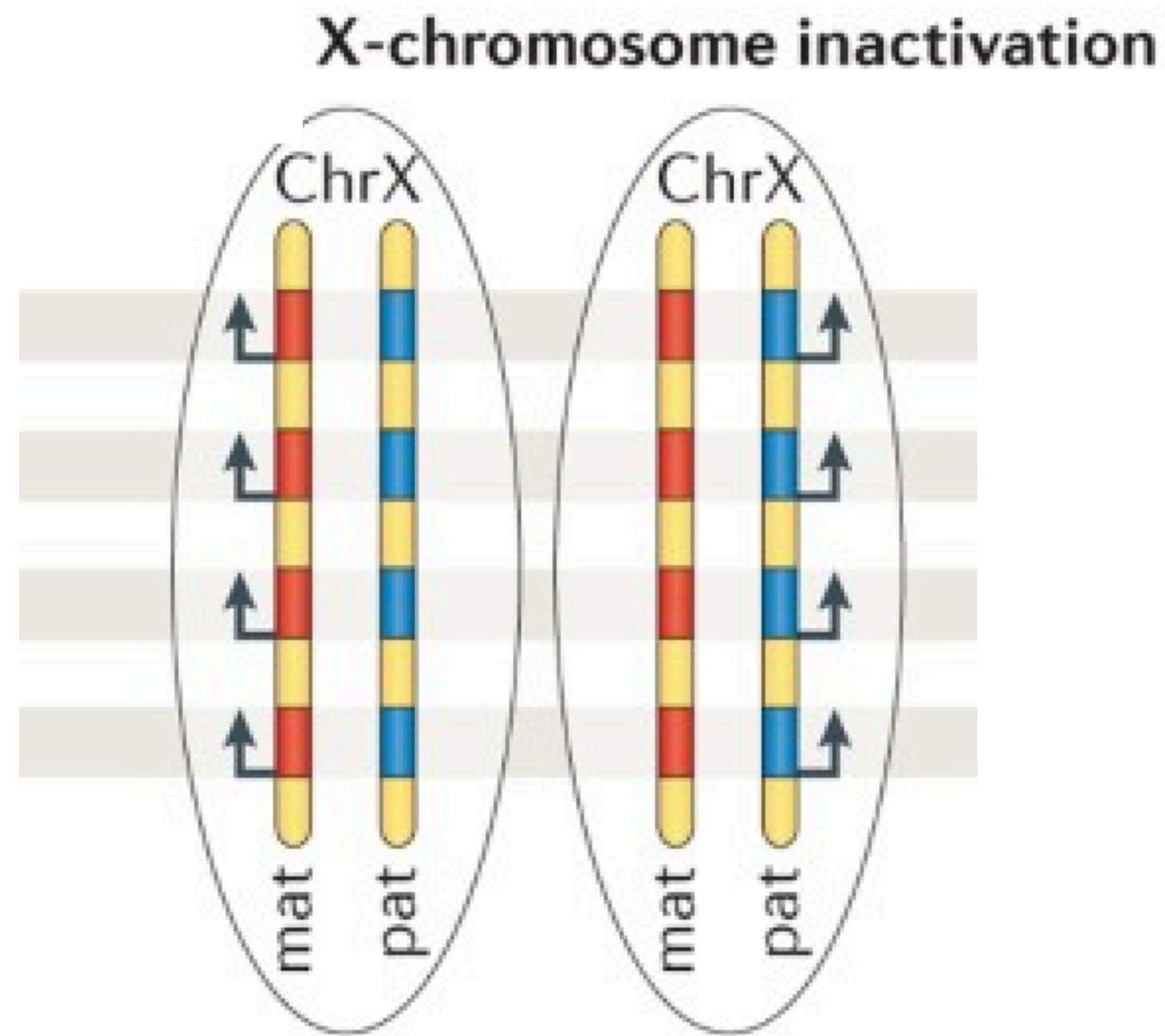
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“We are prone to overestimate how much we understand
about the world and to underestimate the role of chance
in events.” — Daniel Kahneman

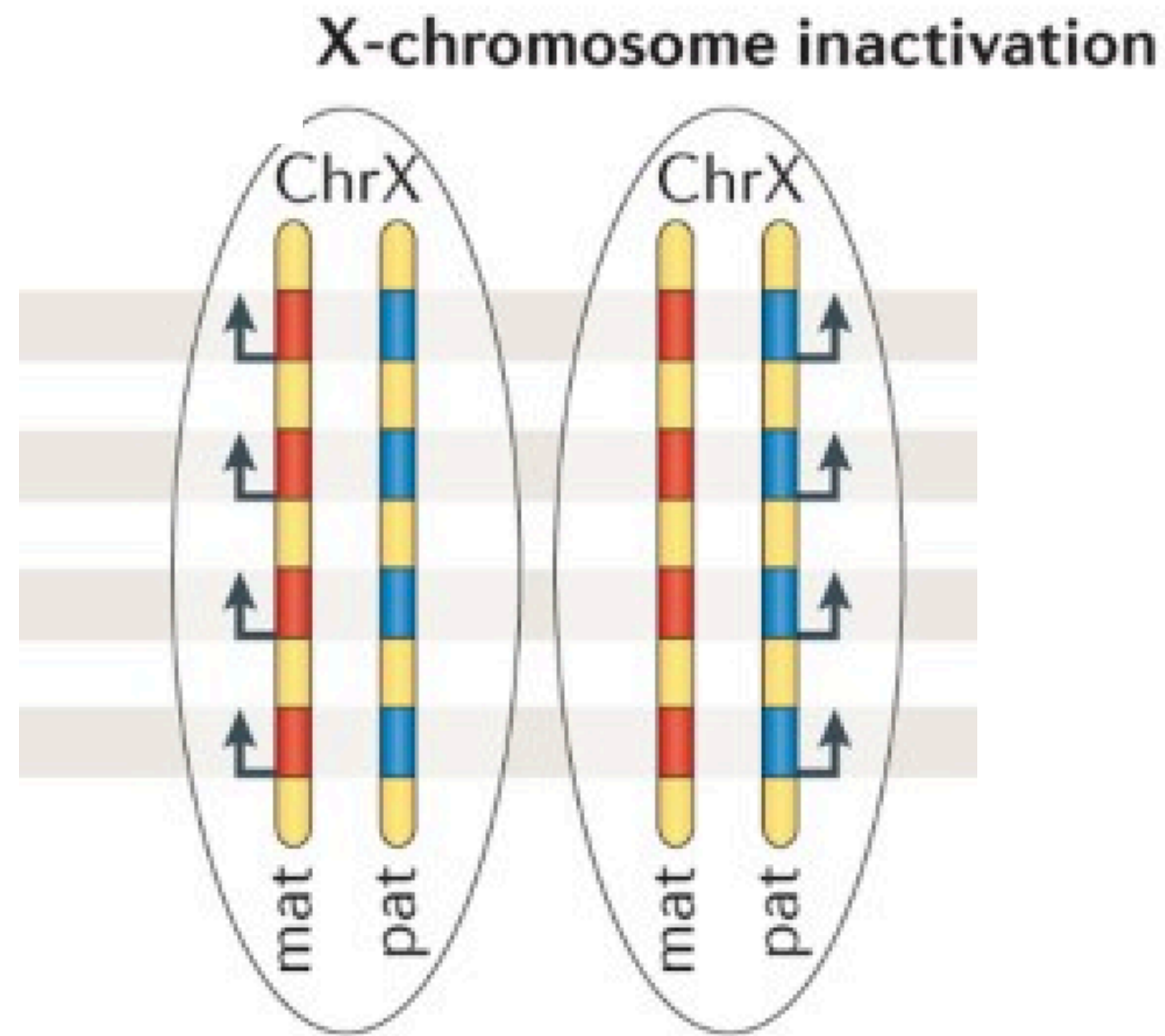


higher level stochastic processes – X-inactivation (barr body formation)



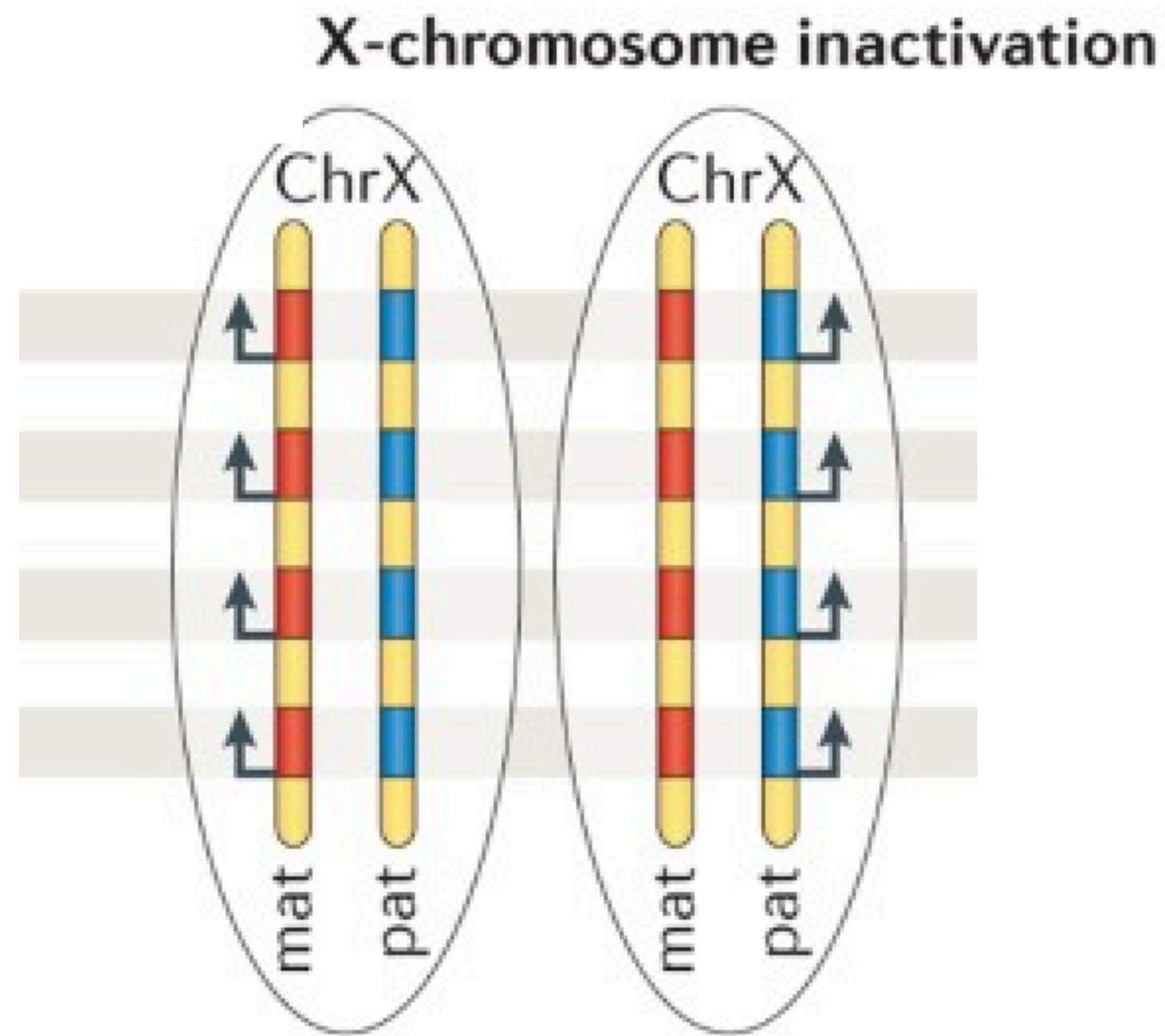
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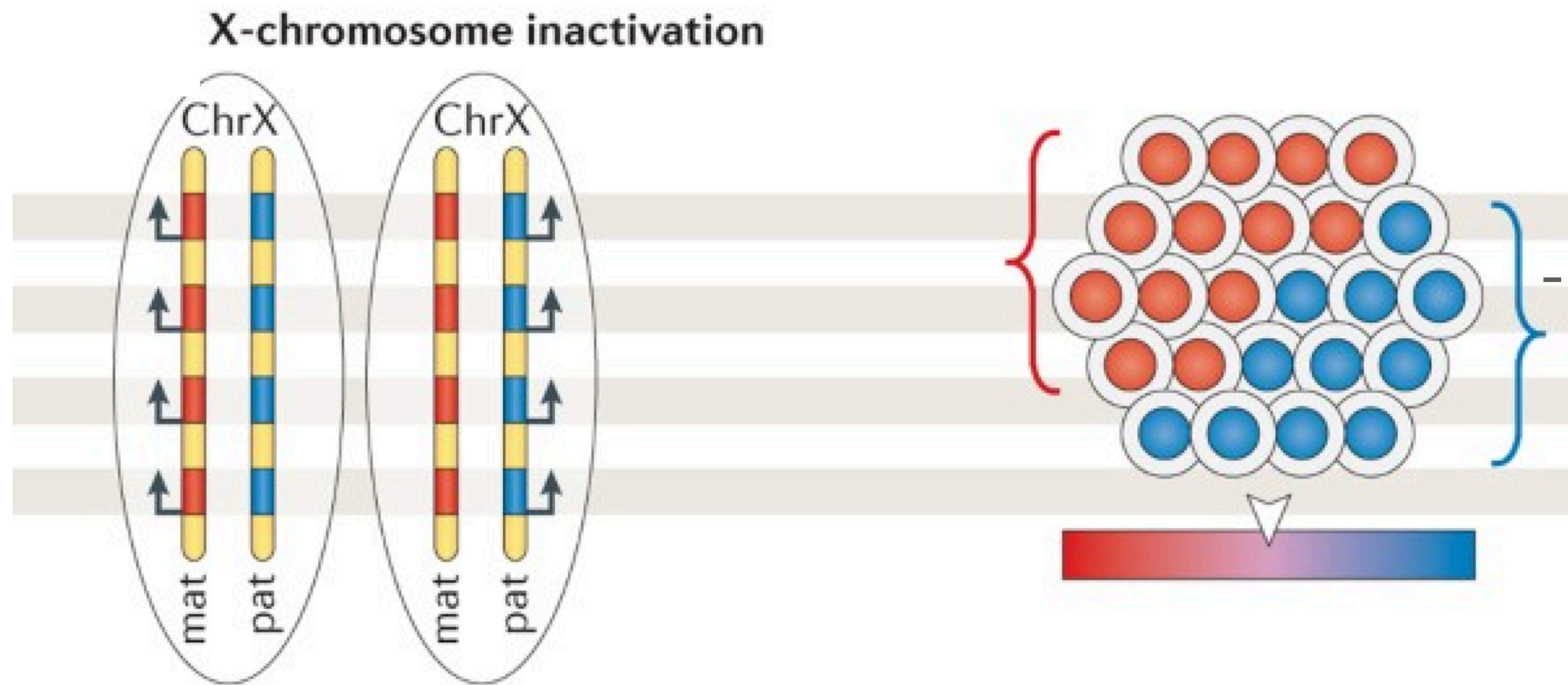
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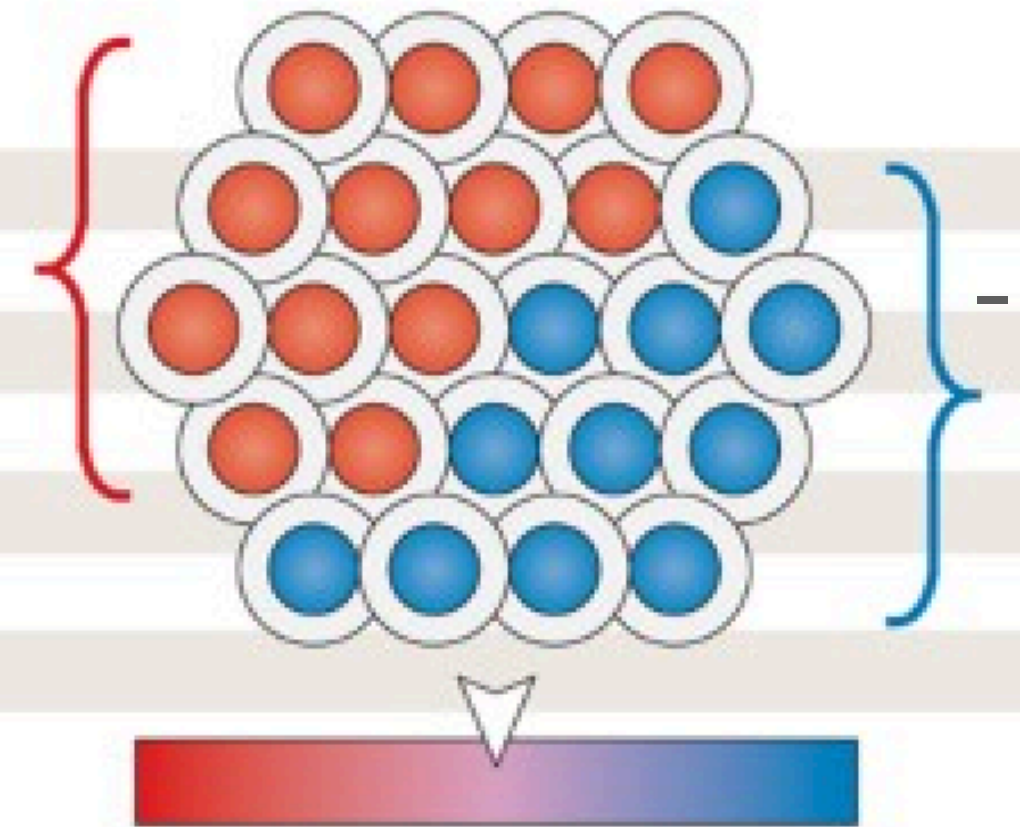
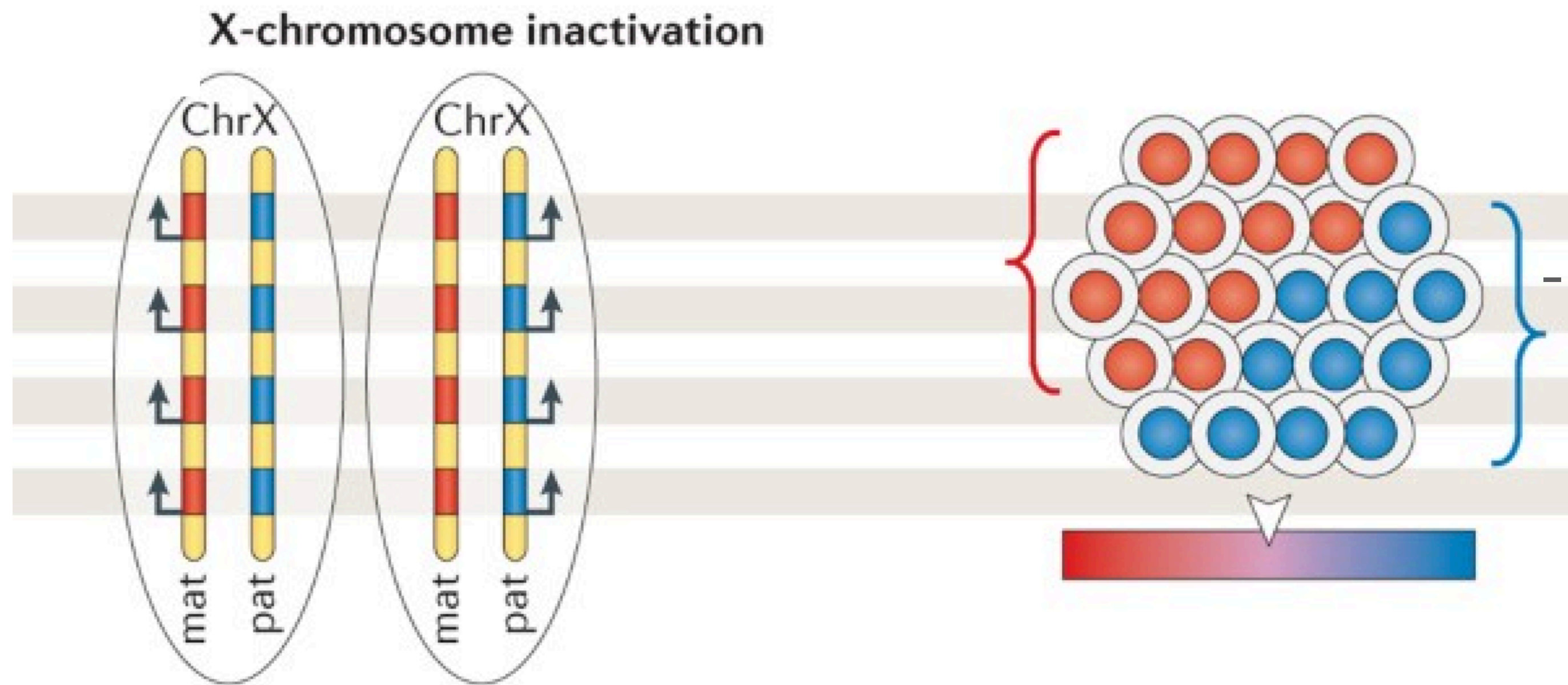


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[Tetsuya Goto](#)* and [Marilyn Monk](#)



unexpected stochastic processes - monoallelic gene expression

Resource

Random allelic expression in the adult human body

Stephanie N. Kravitz,^{1,2} Elliott Ferris,² Michael I. Love,^{4,5} Alun Thomas,³ Aaron R. Quinlan,^{1,6} and Christopher Gregg^{1,2,6,7,*}

¹Department of Human Genetics, University of Utah, Salt Lake City, UT, USA
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³Department of Internal Medicine, Epidemiology, University of Utah School of Medicine, Salt Lake City, UT, USA
⁴Department of Biostatistics, University of North Carolina at Chapel Hill, Chapel Hill, NC, USA
⁵Department of Genetics, University of North Carolina at Chapel Hill, Chapel Hill, NC, USA
⁶These authors contributed equally
⁷Lead contact
*Correspondence: chris.gregg@neuro.utah.edu
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Random monoallelic expression: regulating gene expression one allele at a time.

[Eckersley-Maslin MA](#)¹ , [Spector DL](#)¹ 

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- widespread monoallelic expression of genes

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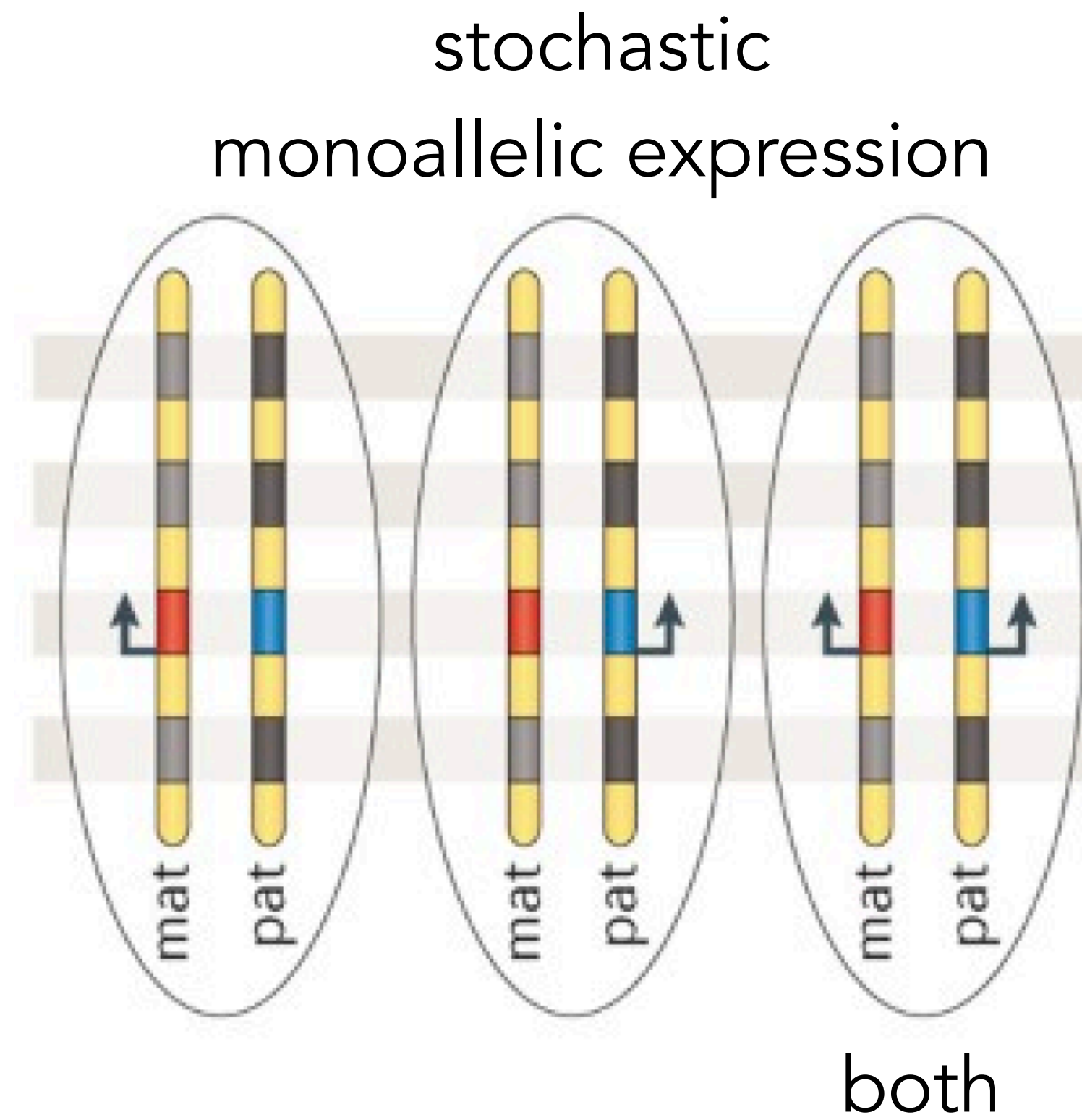
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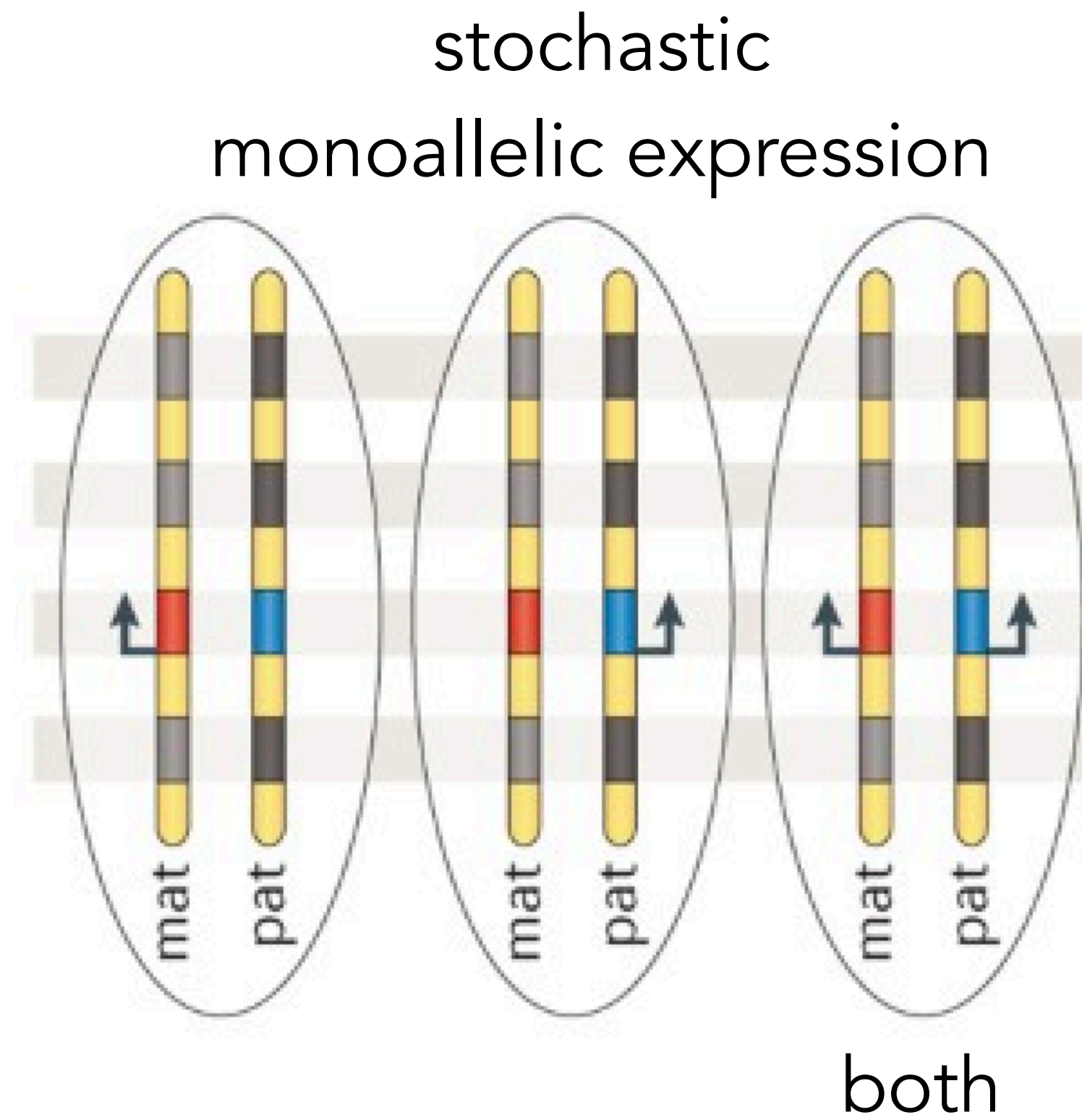
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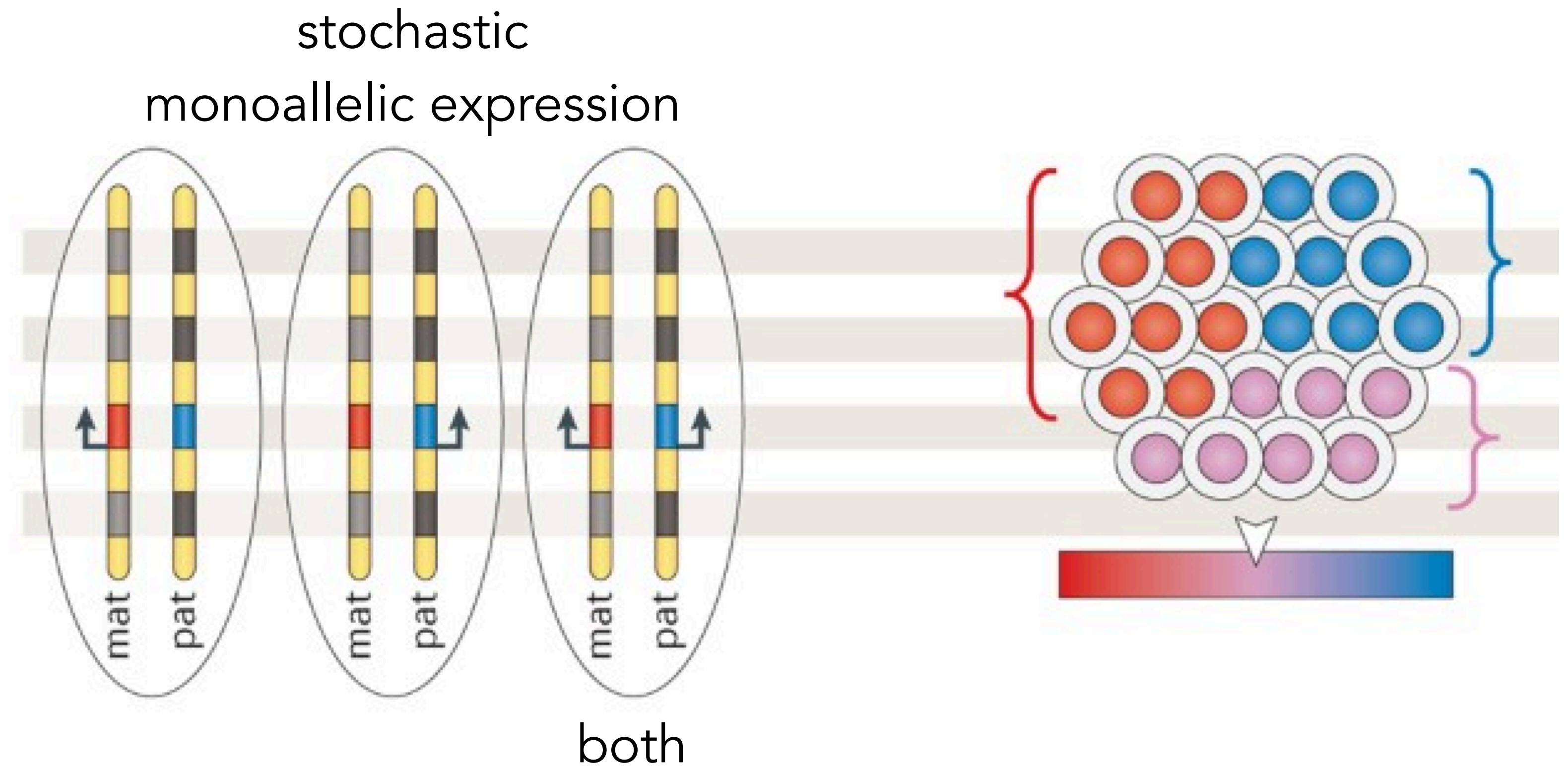
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unexpected stochastic processes - monoallelic gene expression

- widespread monoallelic expression of genes
- more autosomal genes subject to monoallelic expression than the number of genes on the X



Resource

Random allelic expression in the adult human body

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⁶These authors contributed equally

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Random monoallelic expression: regulating gene expression one allele at a time.

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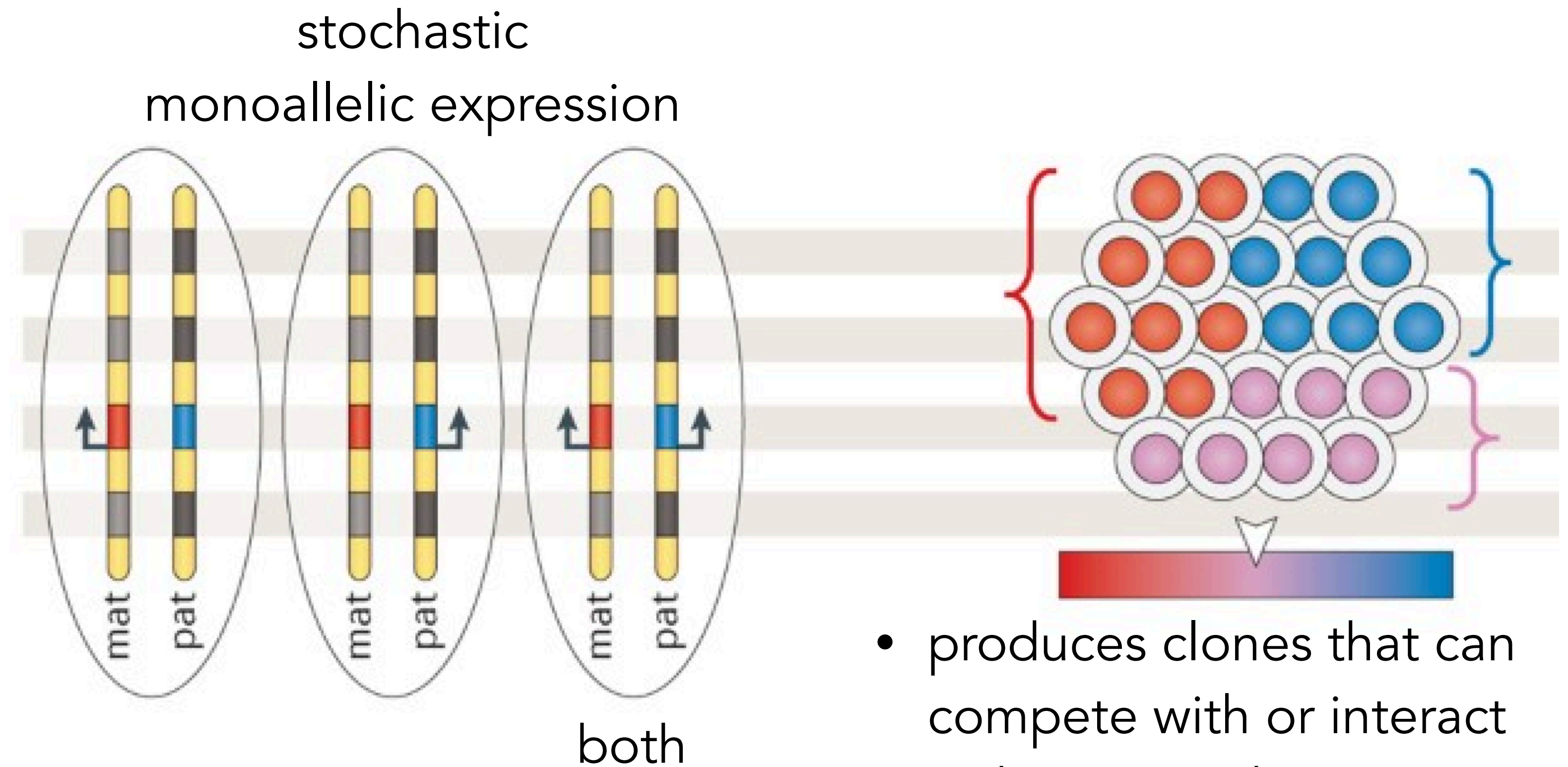
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Stochastic monoallelic expression and phenotypic diversity

Mutations in FOXP2 can cause developmental verbal dyspraxia with profound speech and language deficits.

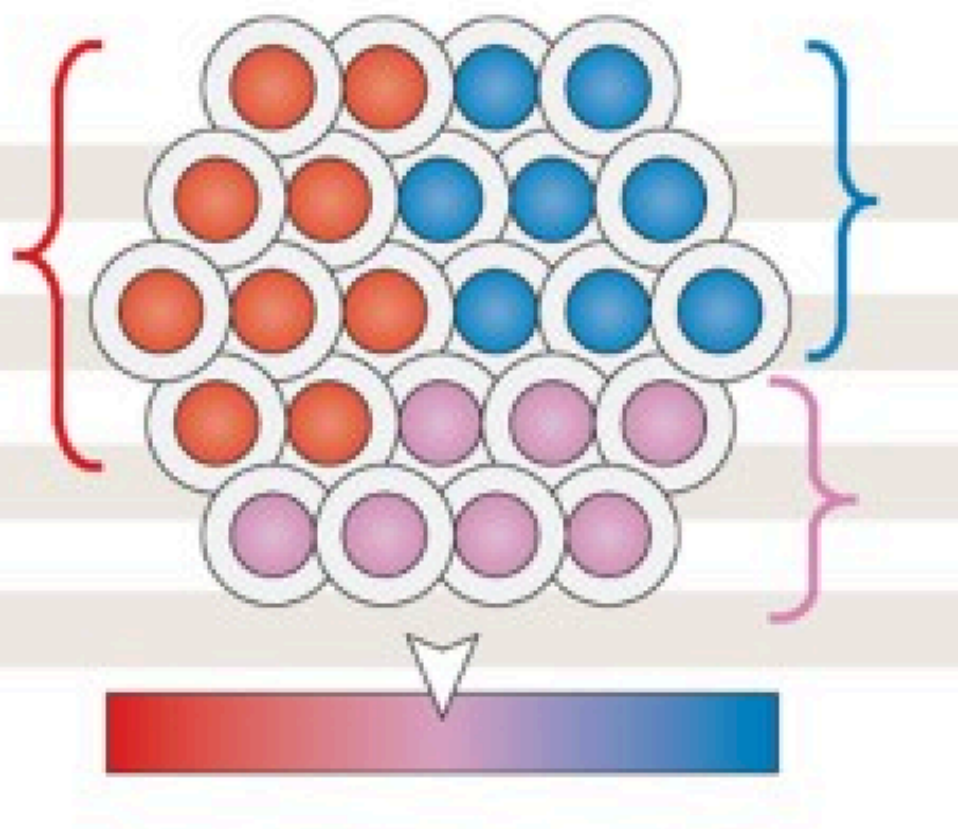
Monoallelic expression of the human *FOXP2* speech gene

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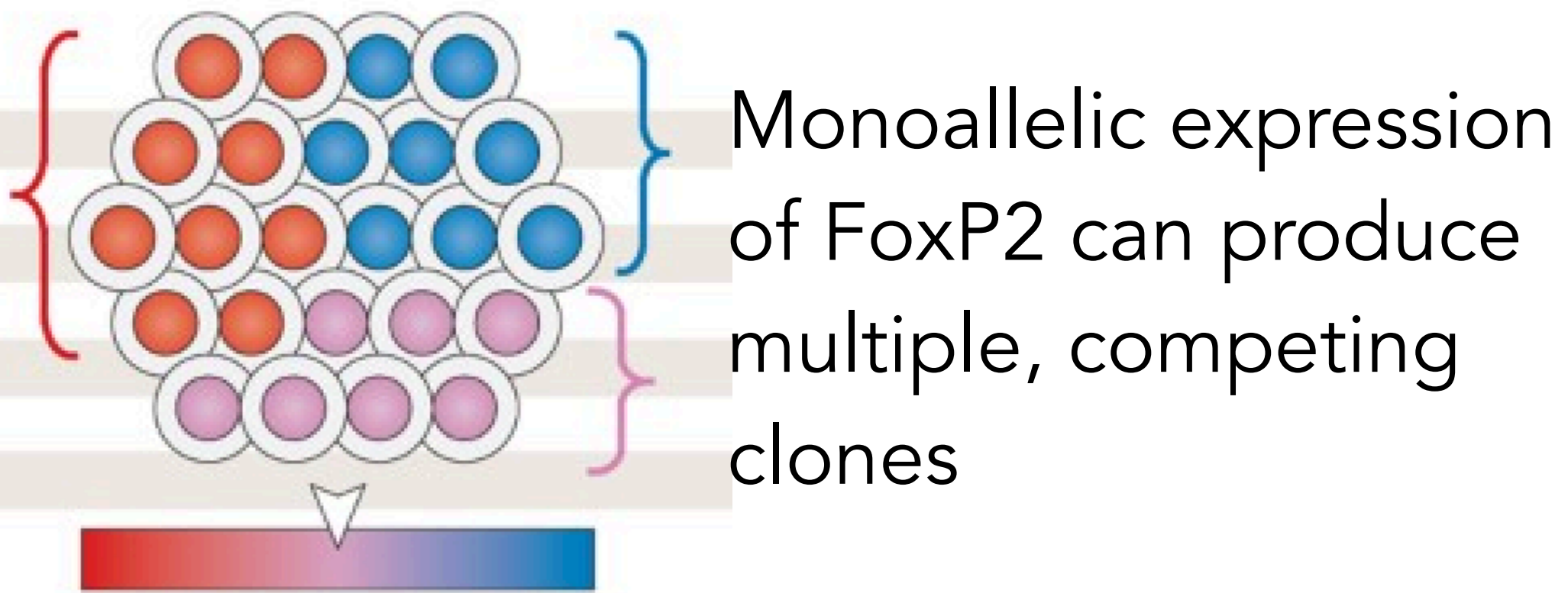
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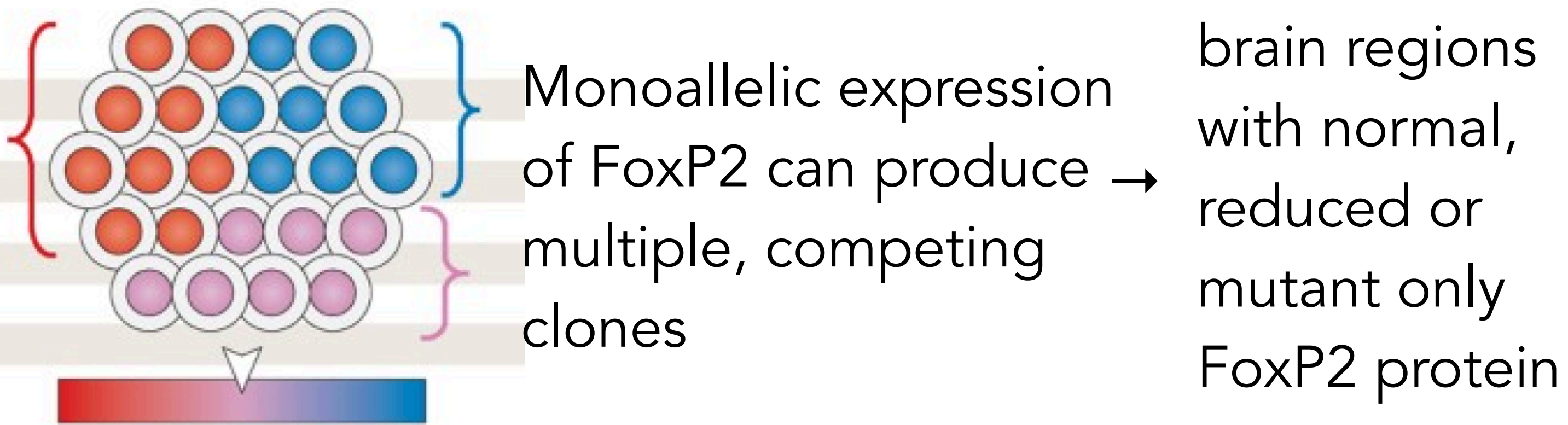
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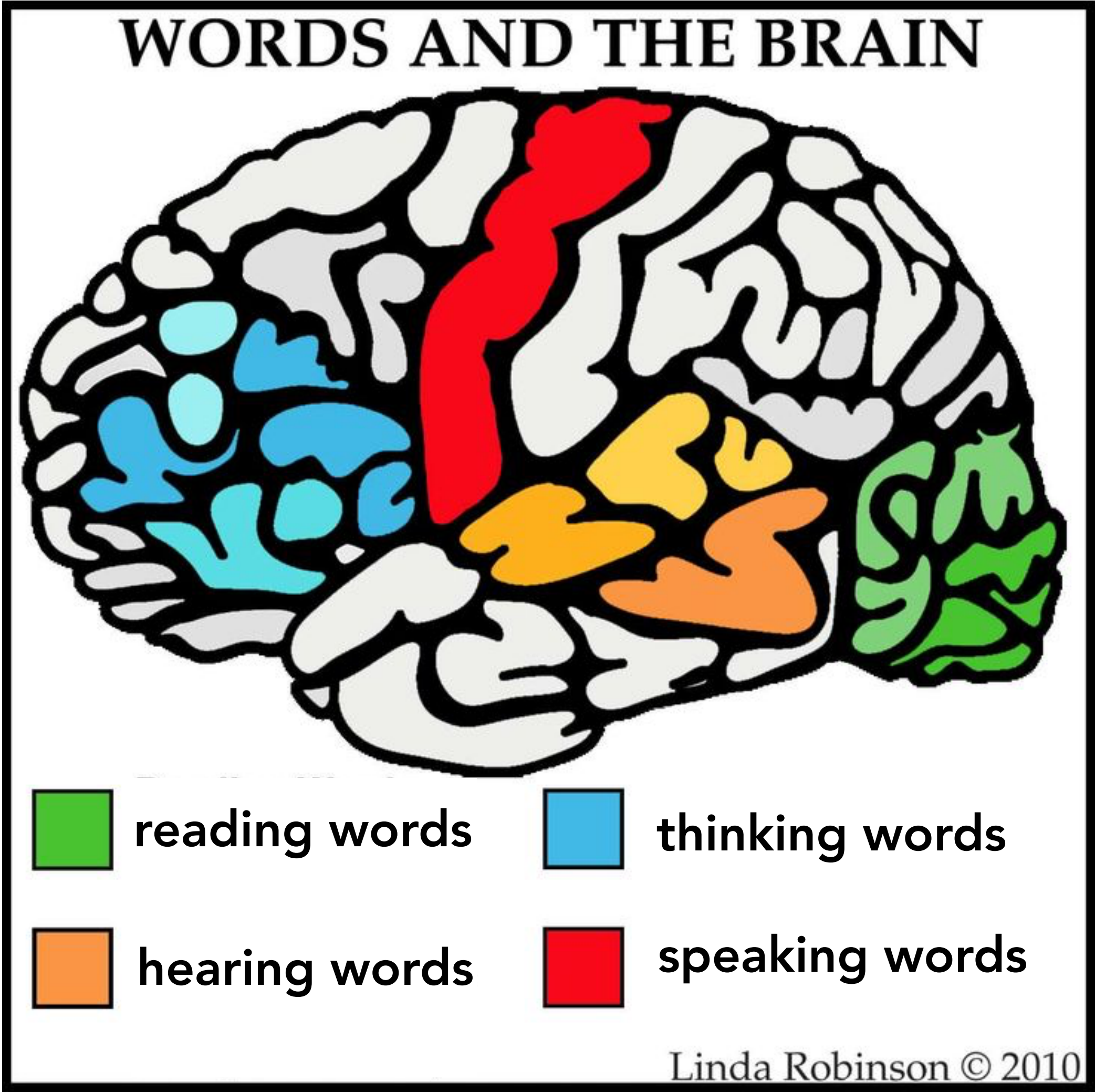
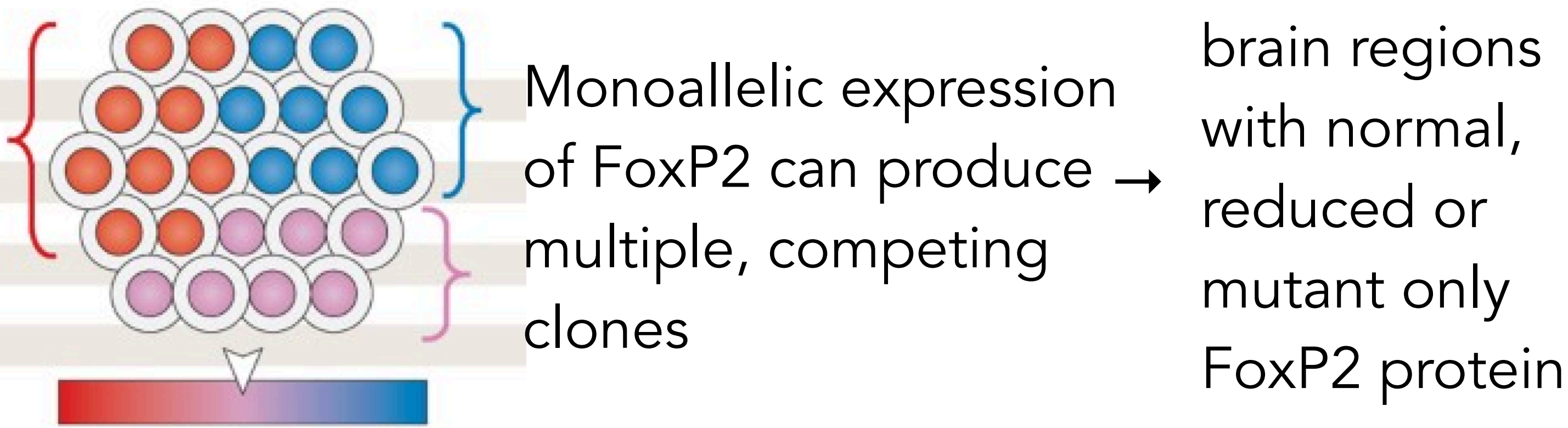
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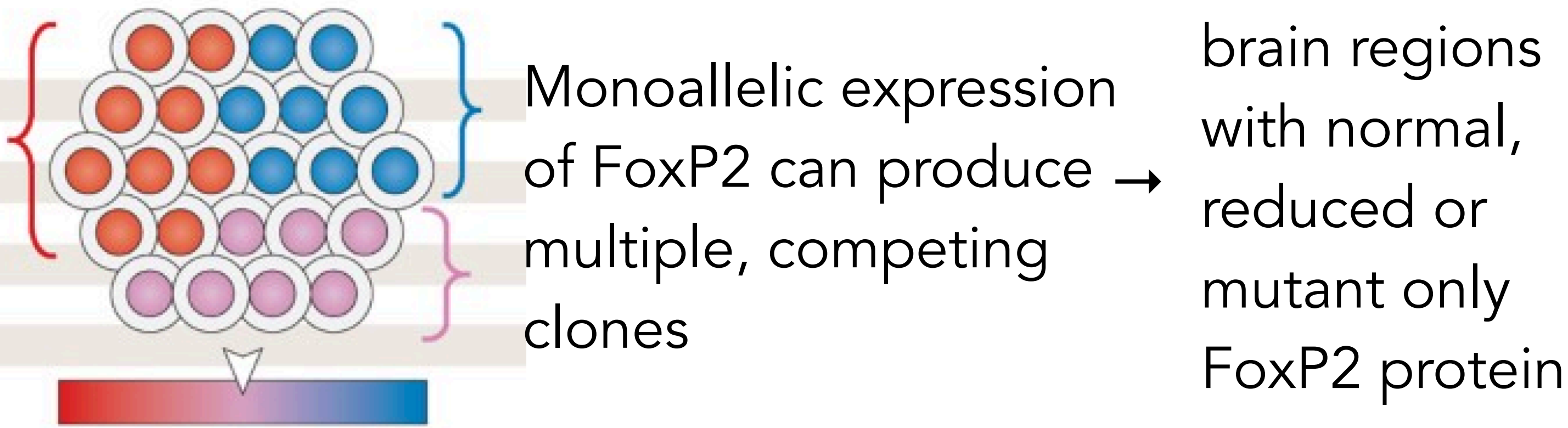
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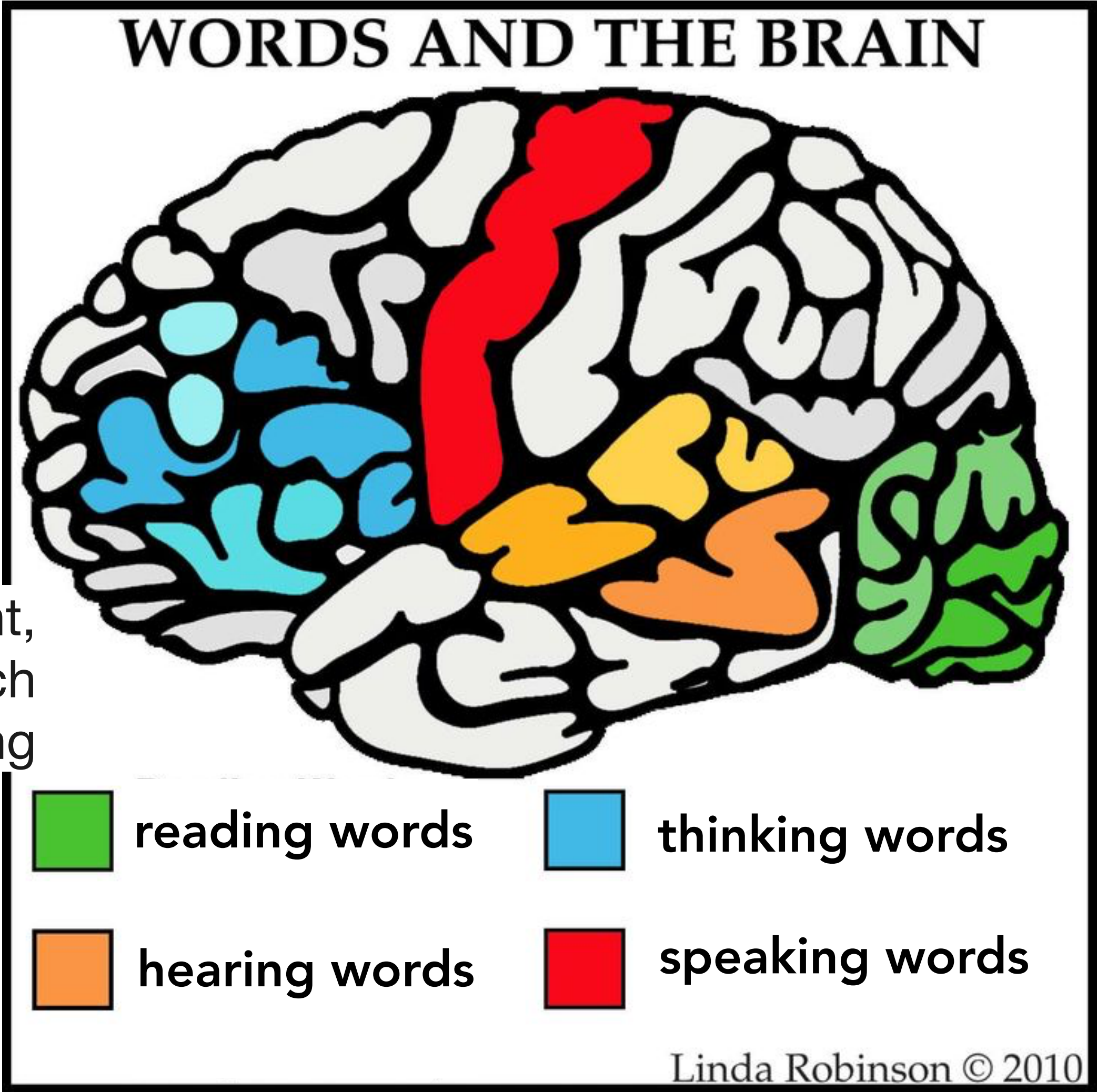
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e.g **Wernicke’s Aphasia**: Fluent, grammatically correct speech with little meaning



Visualizing the stochastic behaviors of cells

single cell RNA sequencing (identifies gene expressed)

SINGLE-CELL ANALYSIS

The dynamics of gene expression in vertebrate embryogenesis at single-cell resolution

James A. Briggs, Caleb Weinreb, Daniel E. Wagner, Sean Megason, Leonid Peshkin, Marc W. Kirschner,* Allon M. Klein*

ARTICLE

<https://doi.org/10.1038/s41467-019-12609-4>

OPEN

Cell competition corrects noisy Wnt morphogen gradients to achieve robust patterning in the zebrafish embryo

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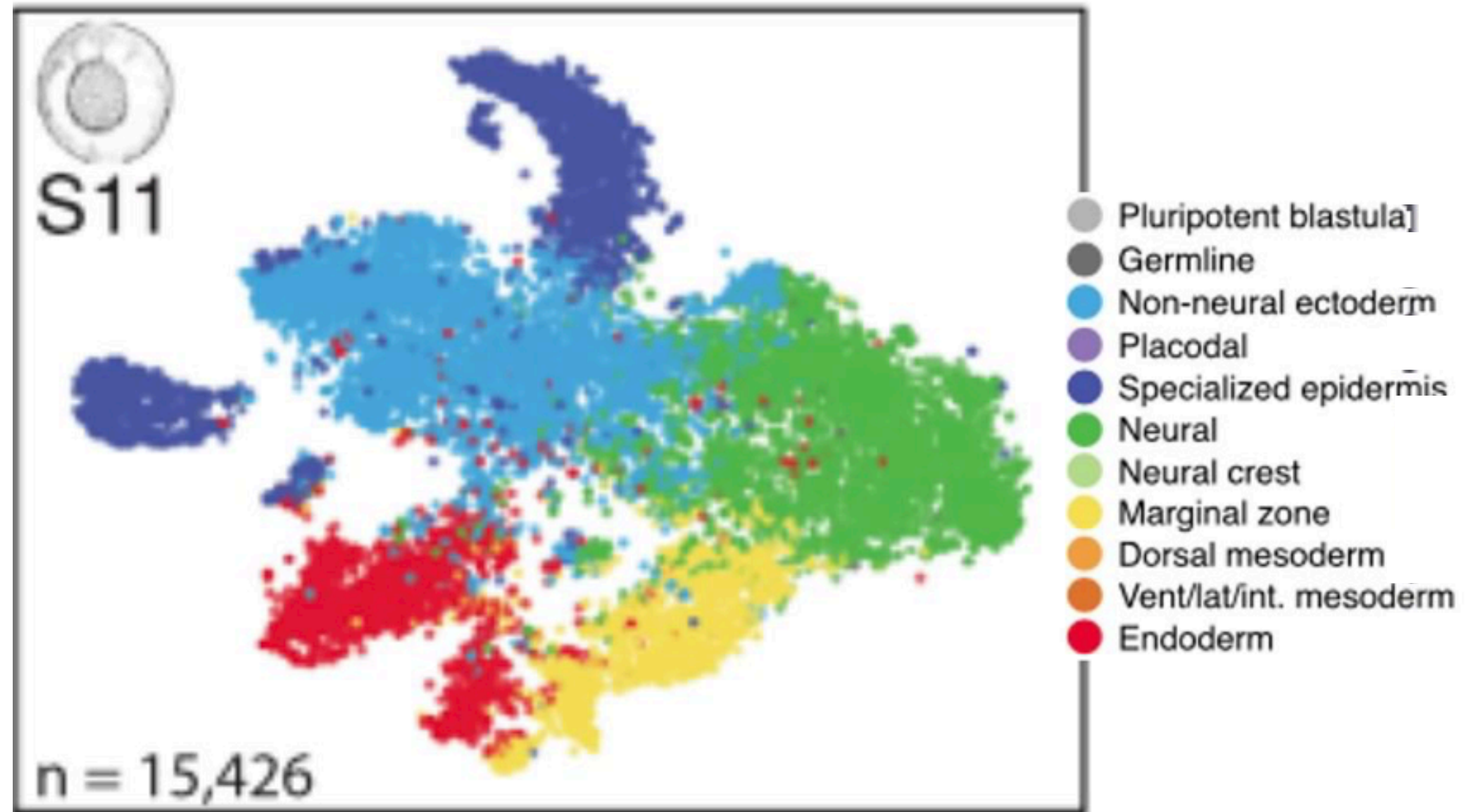
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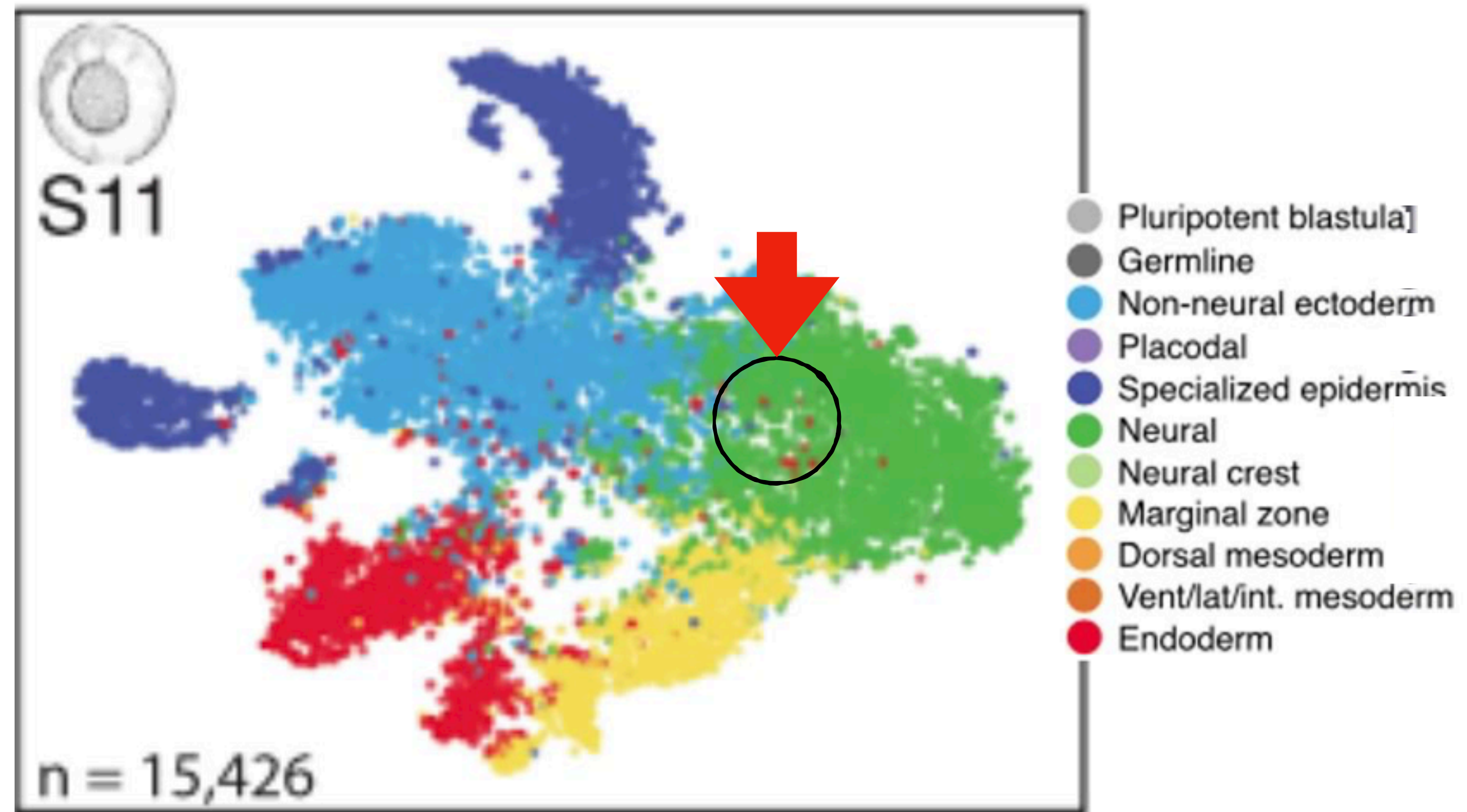
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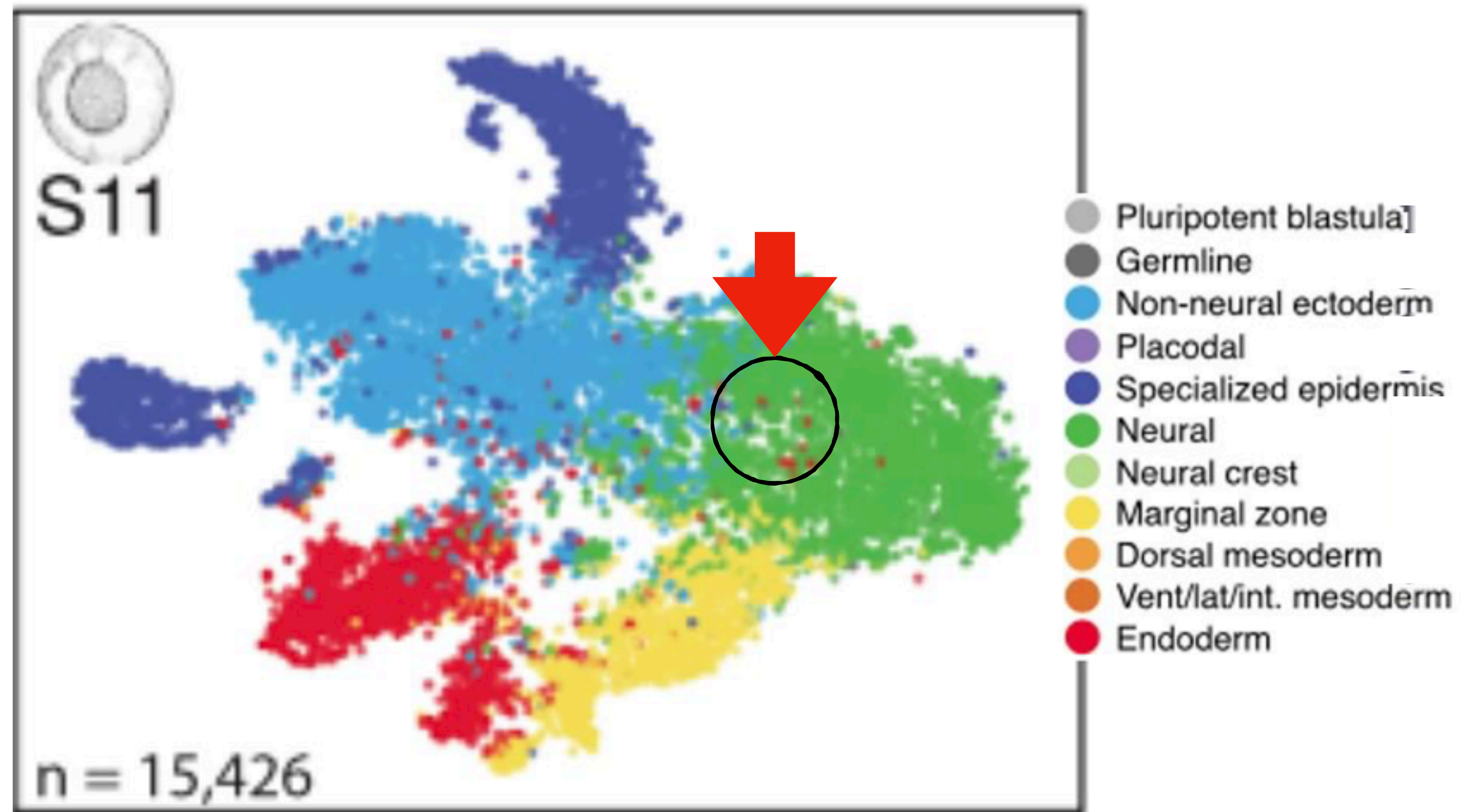
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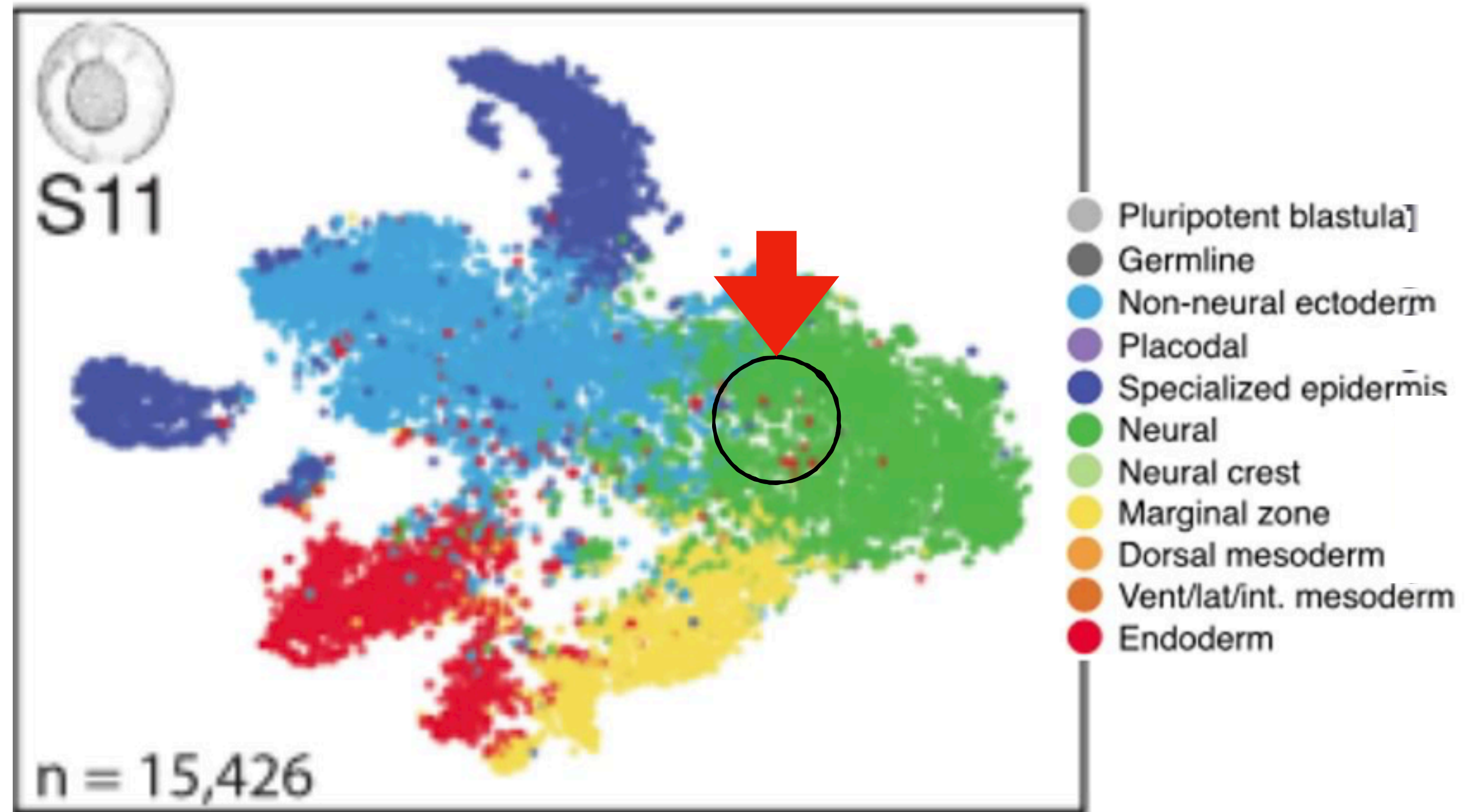
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- inhibiting their removal can lead to developmental abnormalities



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stochastic effects can not be avoided and can be useful

Laboratory Animals (1990) 24, 71–77

A third component causing random variability beside environment and genotype. A reason for the limited success of a 30 year long effort to standardize laboratory animals?

KLAUS GÄRTNER

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Primer

**Stochasticity,
individuality and
behavior**

Kyle Honegger and Benjamin de Bivort

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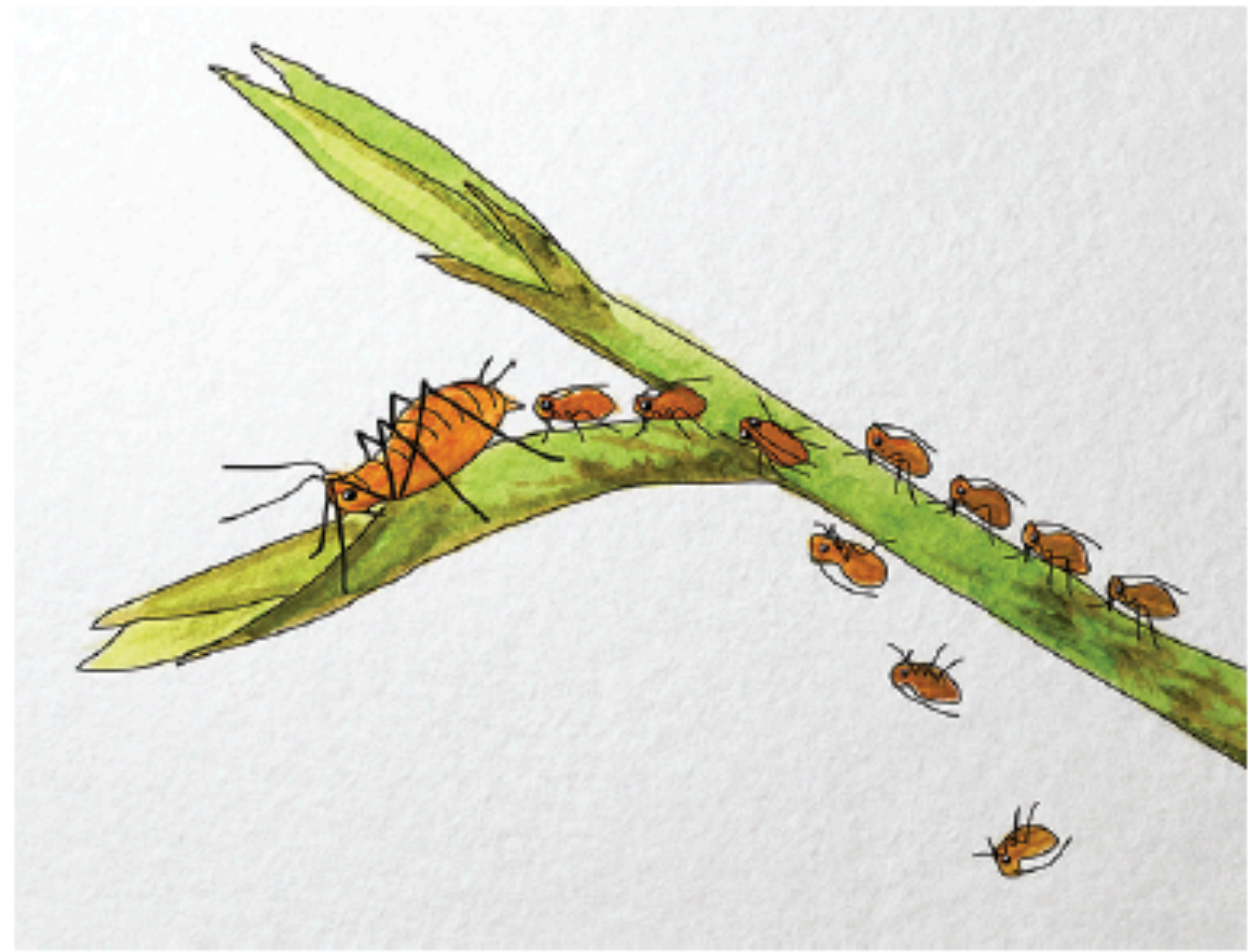
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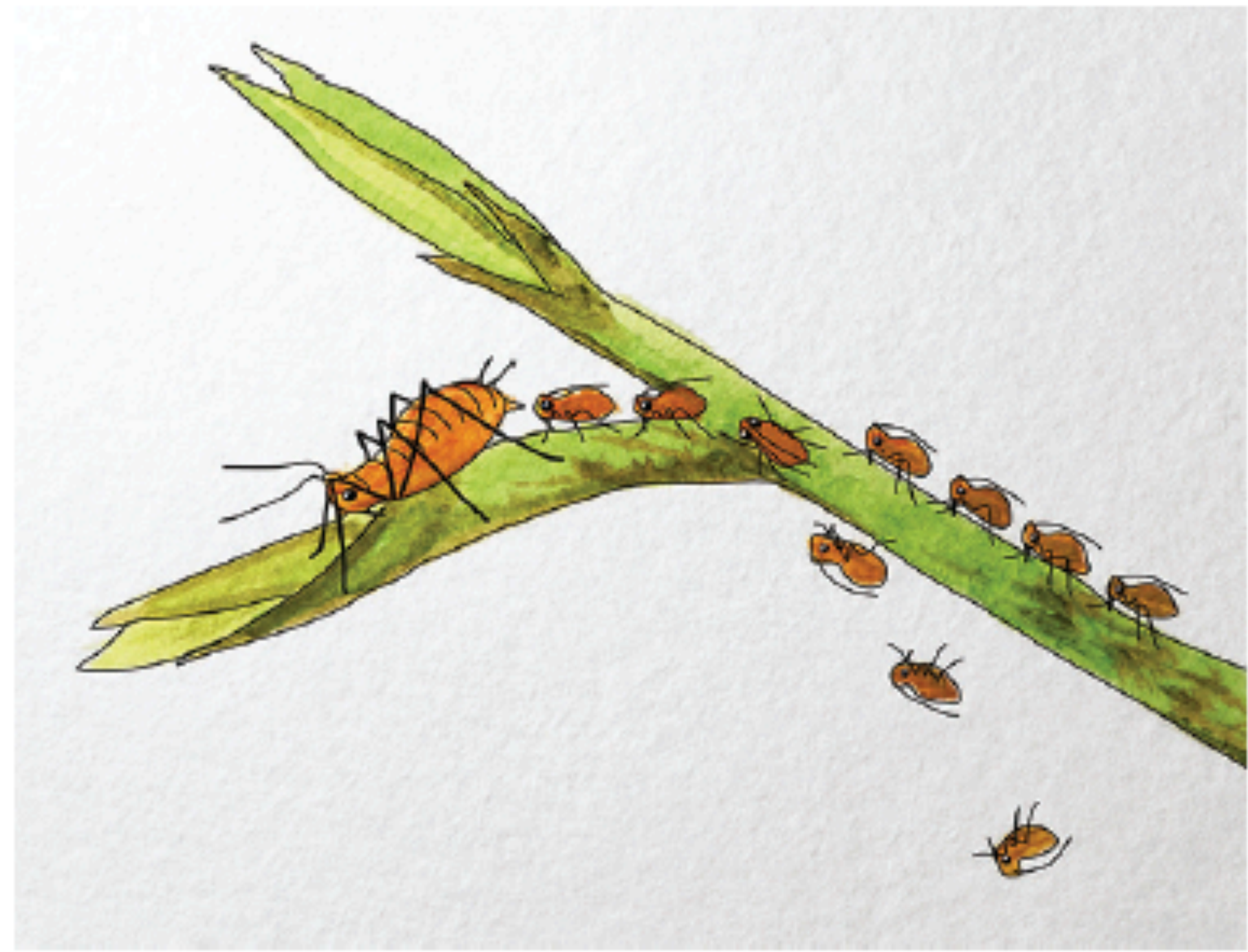
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→ unpredictable variation can be useful, keeps others guessing

conclusions



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determined by genes and
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- recognize the ubiquity of such processes, their implications and how they are used and controlled
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My first act of free will is to believe in free will
- William James, 1842-1910 pragmatist

thanks!