A person in silhouette is running on a beach at sunset. The person is in the foreground, moving from right to left. The background shows the ocean and a colorful sky with orange, red, and blue hues. The person's reflection is visible in the wet sand.

“In the first place, there can be no living science unless there is a widespread instinctive conviction in the existence of an Order of Things, and, in particular, of an Order of Nature.”

– Alfred Whitehead

Module II: Computations in the Biological World, Lecture III.a

Chi-Ning Chou @ 2022 January Mini-Course “What is Computation? From Turing Machines to Black Holes and Neurons”

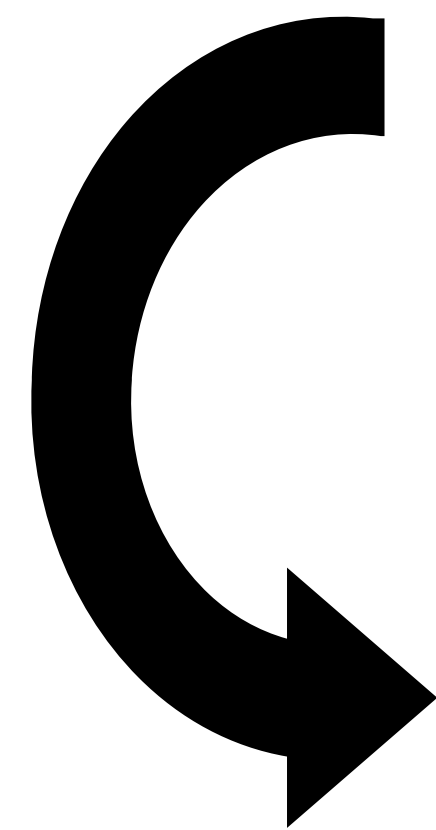
Entering the Living World: Algorithms & Computations in Biology

Module III: Computations in the Biological World

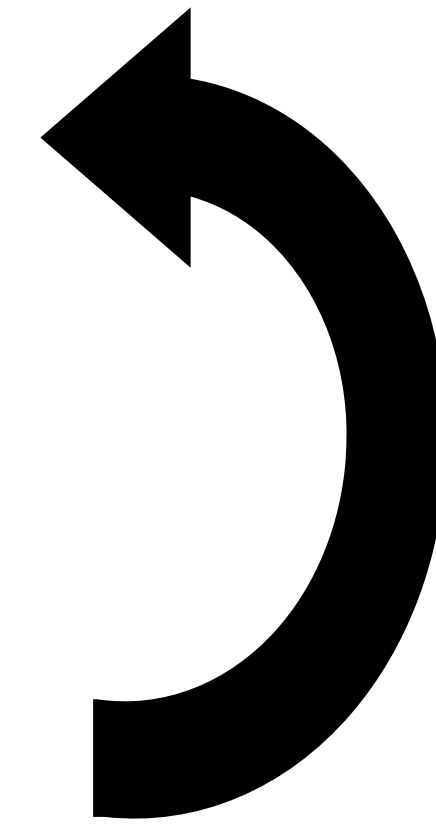
“In the first place, there can be no living science unless there is a widespread instinctive conviction in the existence of an Order of Things, and, in particular, of an Order of Nature.”

– Alfred Whitehead

Inspiration



Biology
&
Computation



Tools



What is Biology and Why Care?

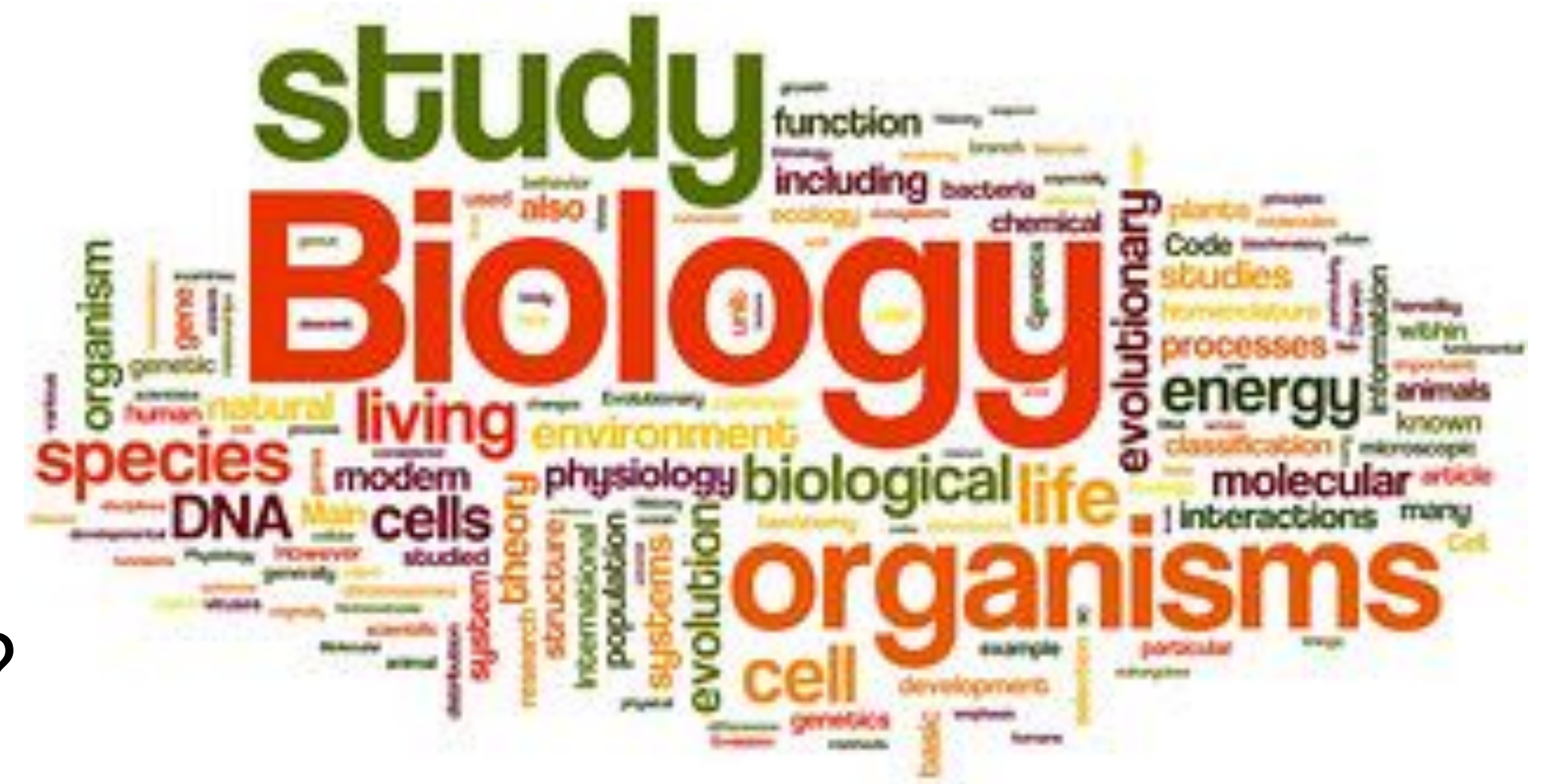
“Biology is the scientific study of life. It is a natural science with a broad scope but has several unifying themes that tie it together as a single, coherent field.”

– Wikipedia

- We humans are living beings!
- Computational methods are widely used in the study of biology.

Q: What are the computations in the biological worlds?

Q: Biology as constraints or inspirations?



Why Biology?

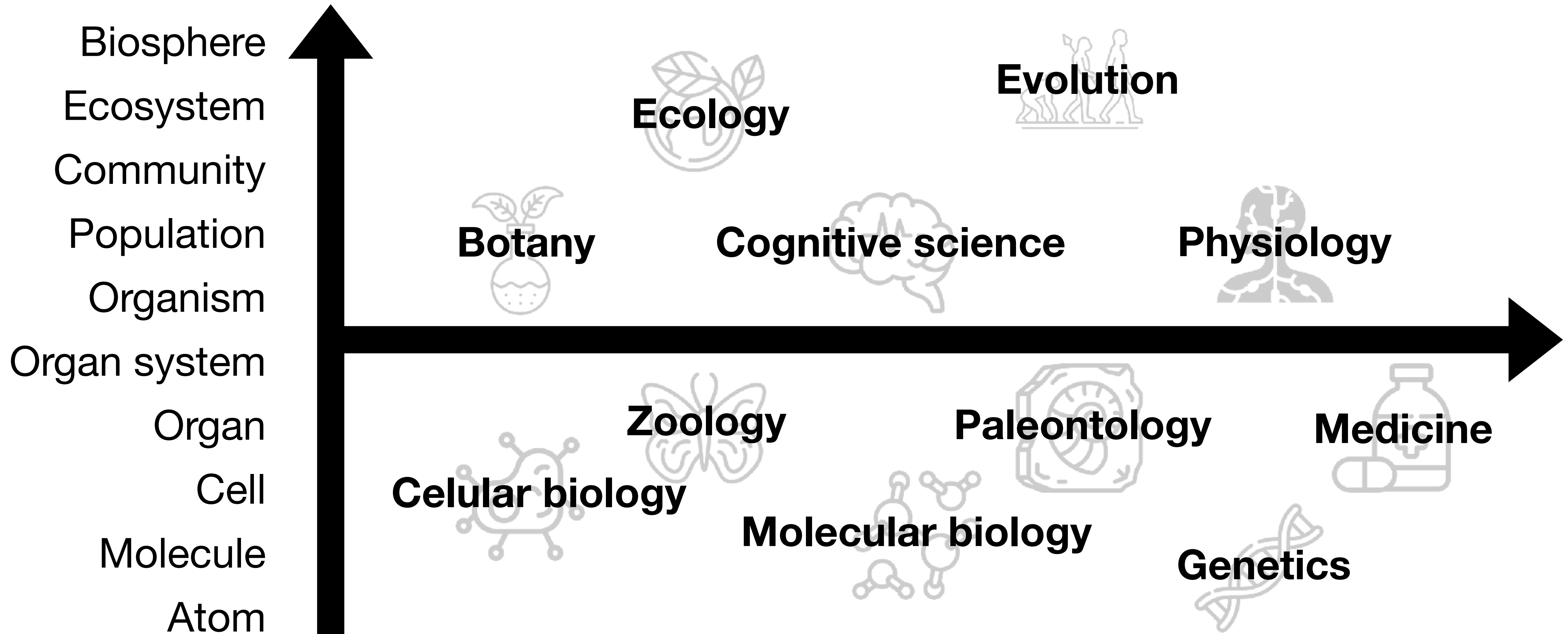
Module III: Computations in the biological world



I encourage you to **enjoy** the many examples we are going to see throughout the lectures and **build up your own story!**

The Scope of Biology

An extremely diverse scientific field!



Distinguishing Characteristics of Life

“All these characteristics of living organisms distinguish them categorically from inanimate systems.”

– Ernst Mayer

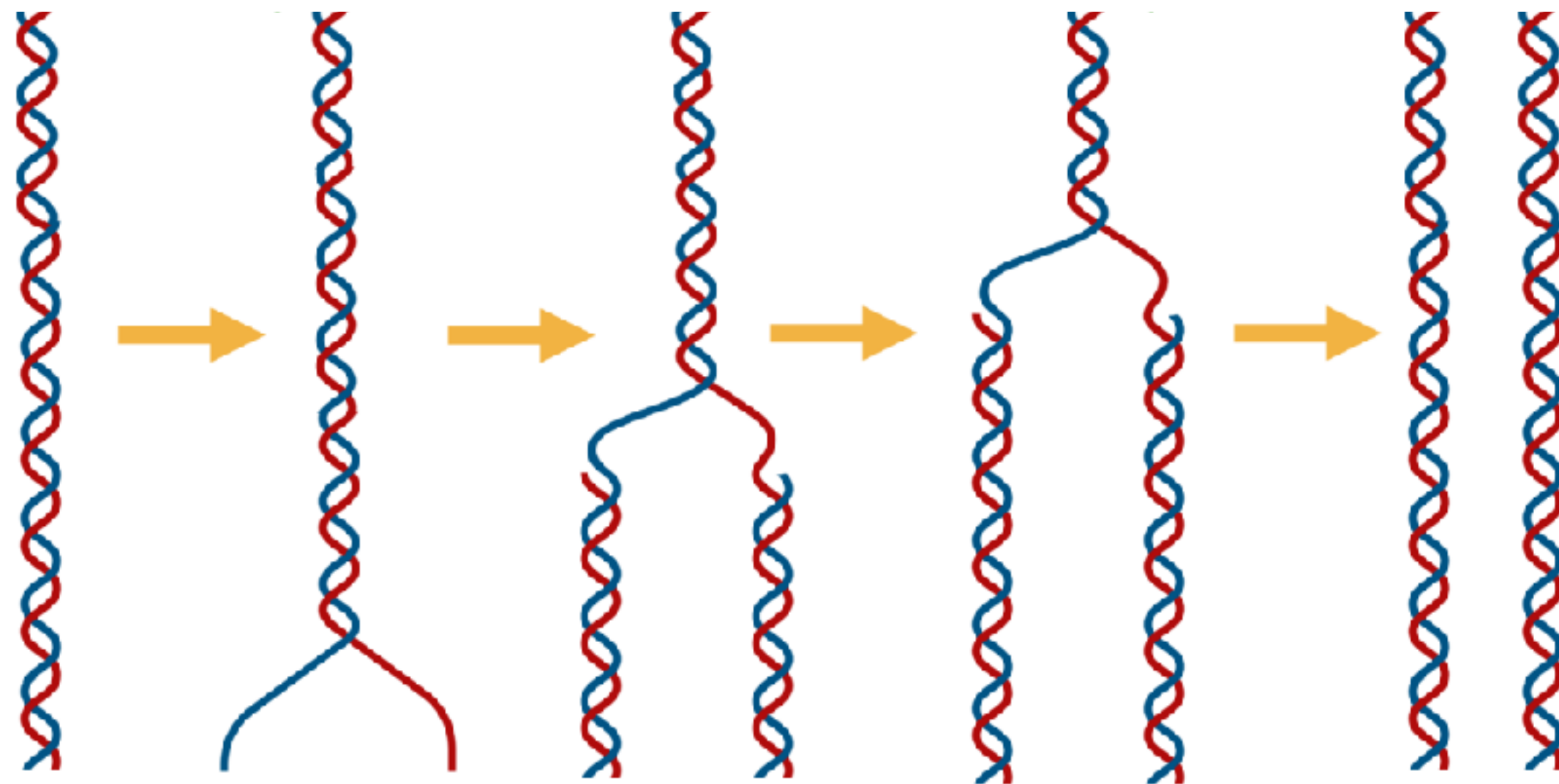
A capacity

- for evolution.
- for self-replication.
- for growth and differentiation via a genetic program.
- for metabolism (the binding and releasing of energy).
- for self-regulation, to keep the complex system in steady state.
- for response to stimuli from the environment through perception and sense organs.
- for change at two levels, that of the phenotype and that of the genotype.

**Life is
Complicated!!**

Biological Algorithms vs. Computer Algorithms

Example: copying strings



DNA Replication
(An oversimplified version)

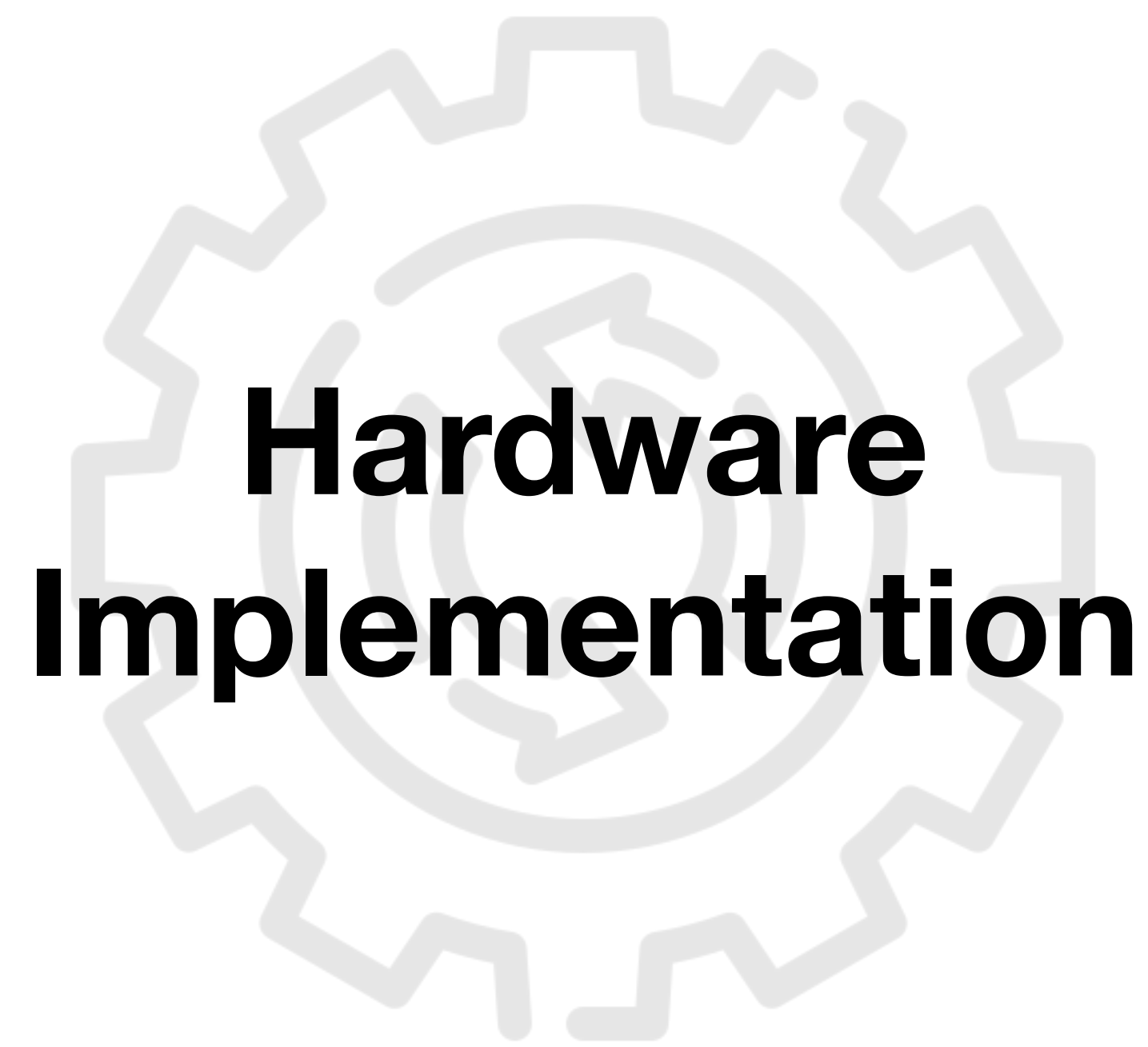
```
char *  
strcpy (char *dest, const char *src)  
{  
    return memcpy (dest, src, strlen (src) + 1);  
}  
  
void *  
memcpy (void *dest, const void *src, size_t len)  
{  
    char *d = dest;  
    const char *s = src;  
    while (len--)  
        *d++ = *s++;  
    return dest;  
}
```

String Copying in C

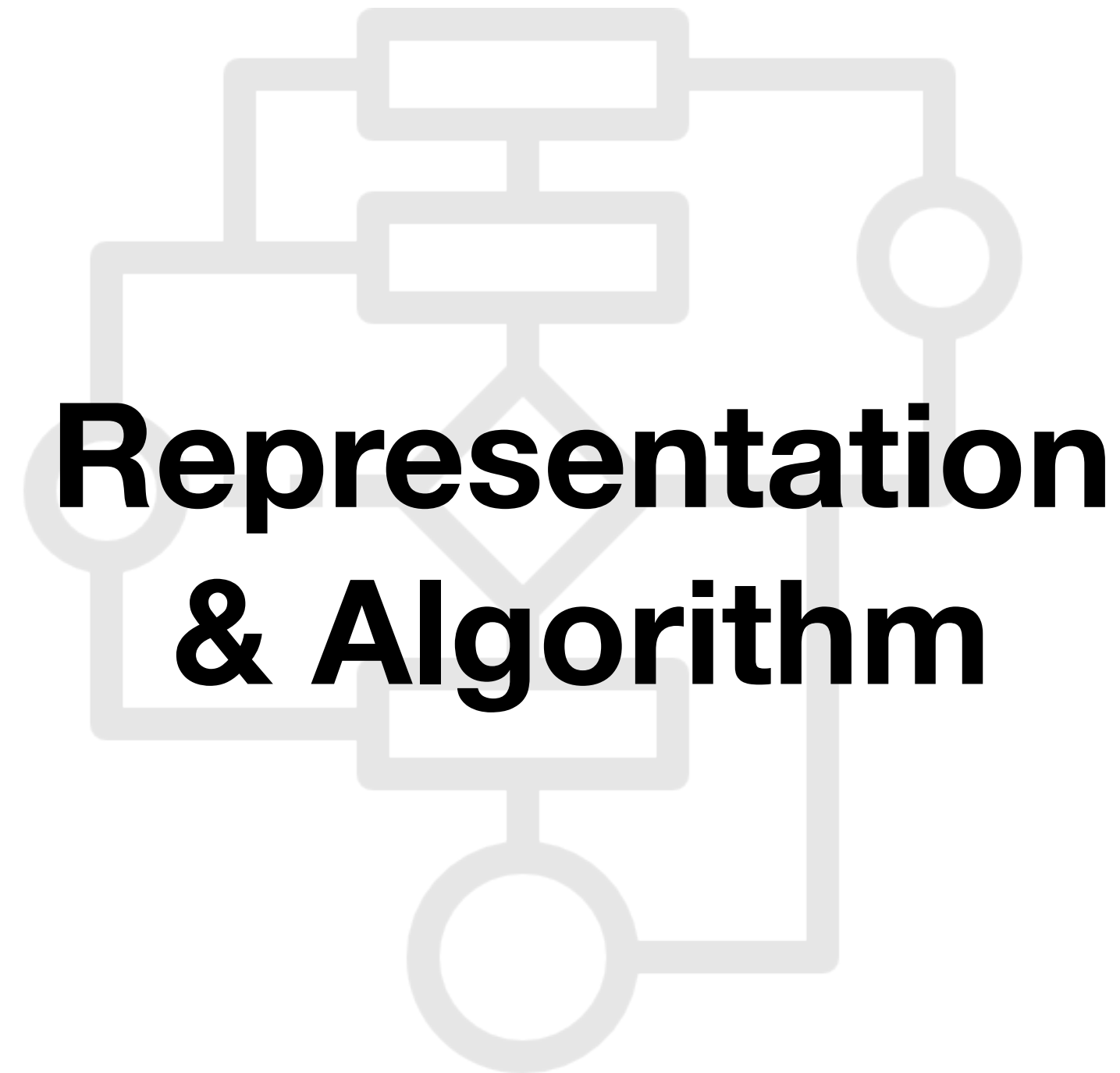
“Algorithm” in Biology might be Multi-Functional or Goalless!?

Different Angles to Think

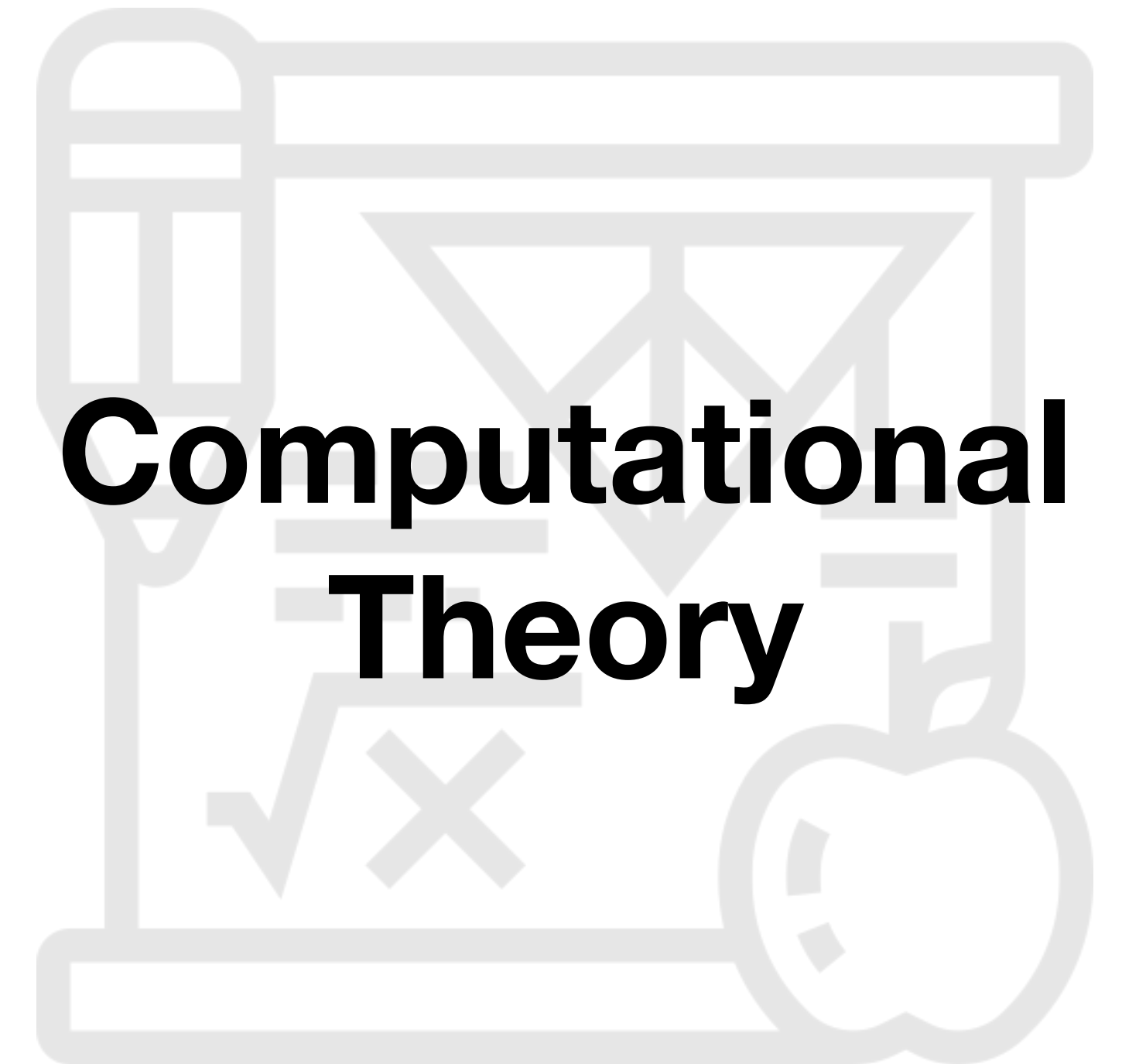
Marr's three levels of analysis



E.g., genotype and phenotype



E.g., heritable variation, differential reproduction, fitness, competition

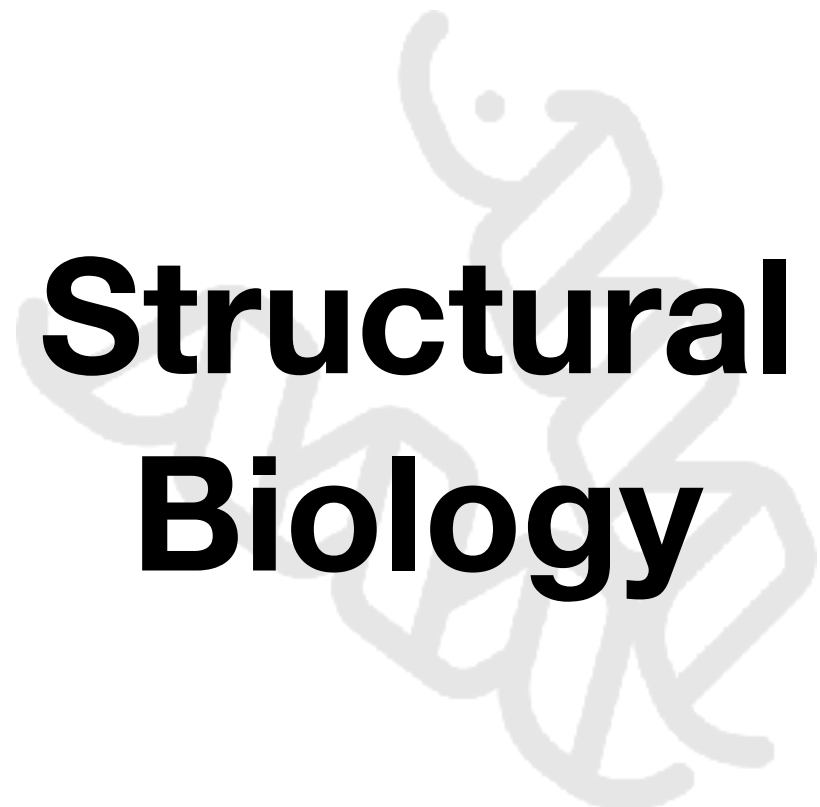


E.g., natural selection

Computation → Biology

Computational Biology & Bioinformatics

Study biology using computational, statistical, and mathematical methods



**Structural
Biology**



**System
Biology**



**Theoretical
Biology**



Genomics



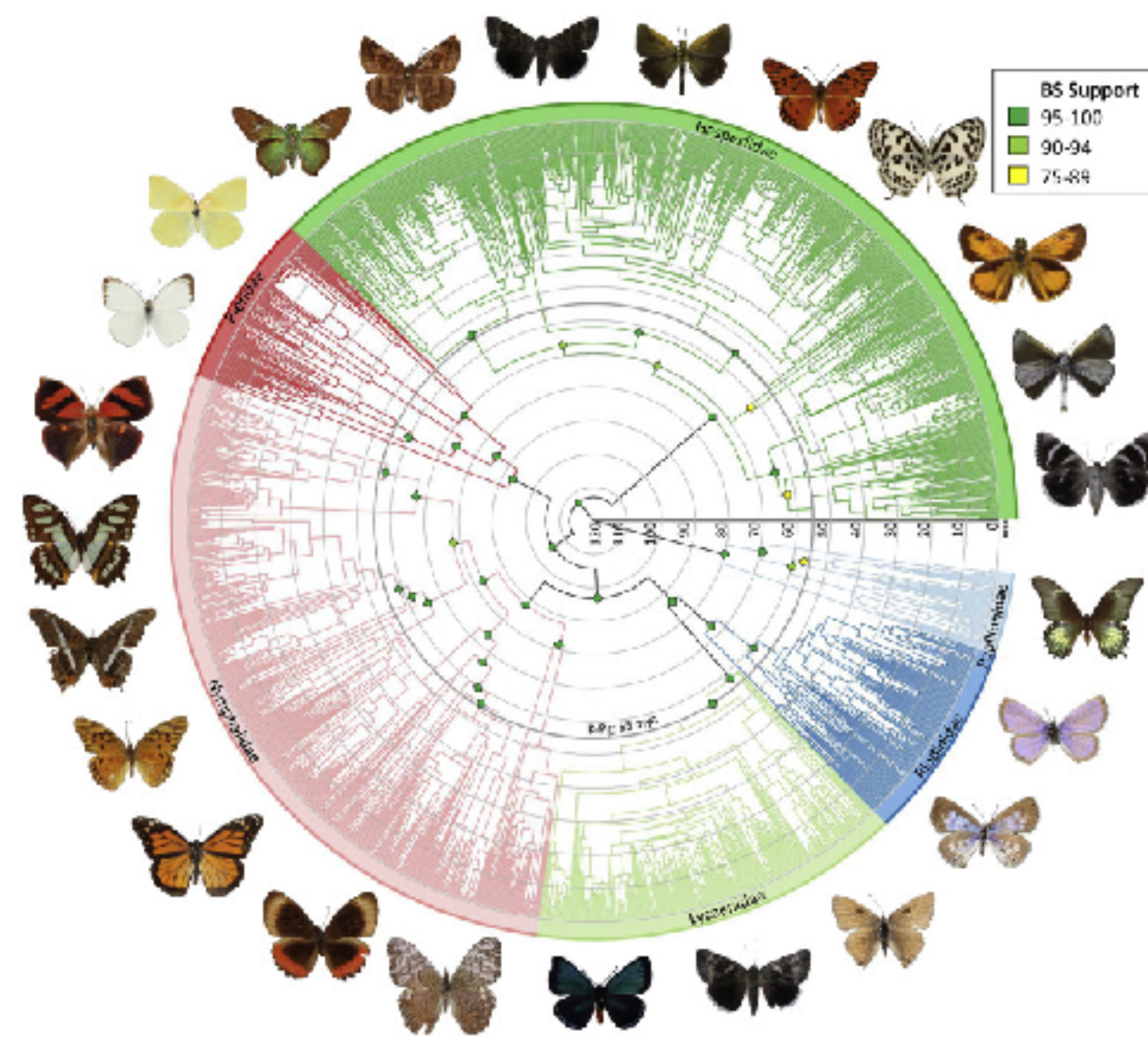
Neuroscience



**Evolutionary
Biology**

Example: A Study in Butterflies

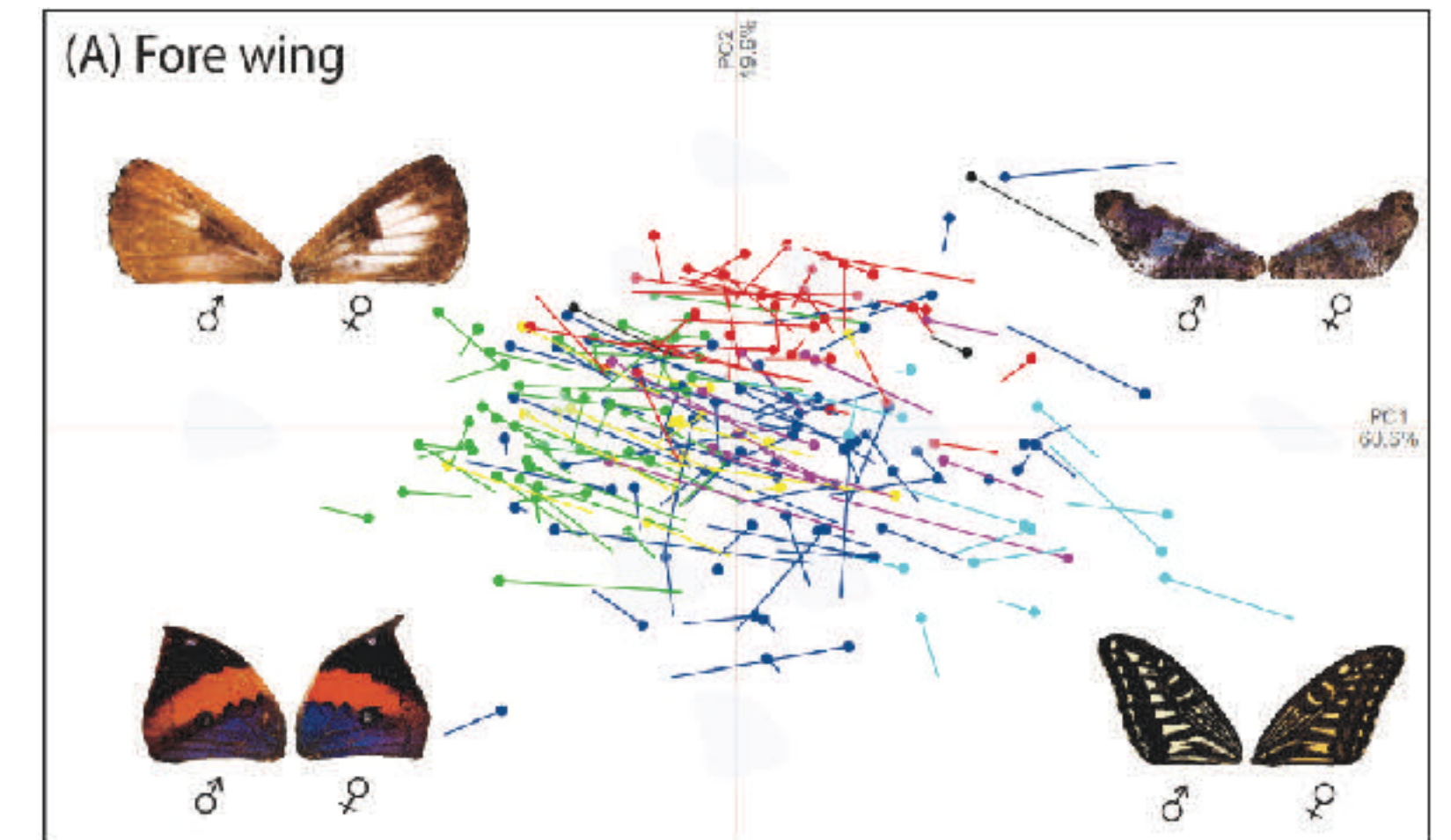
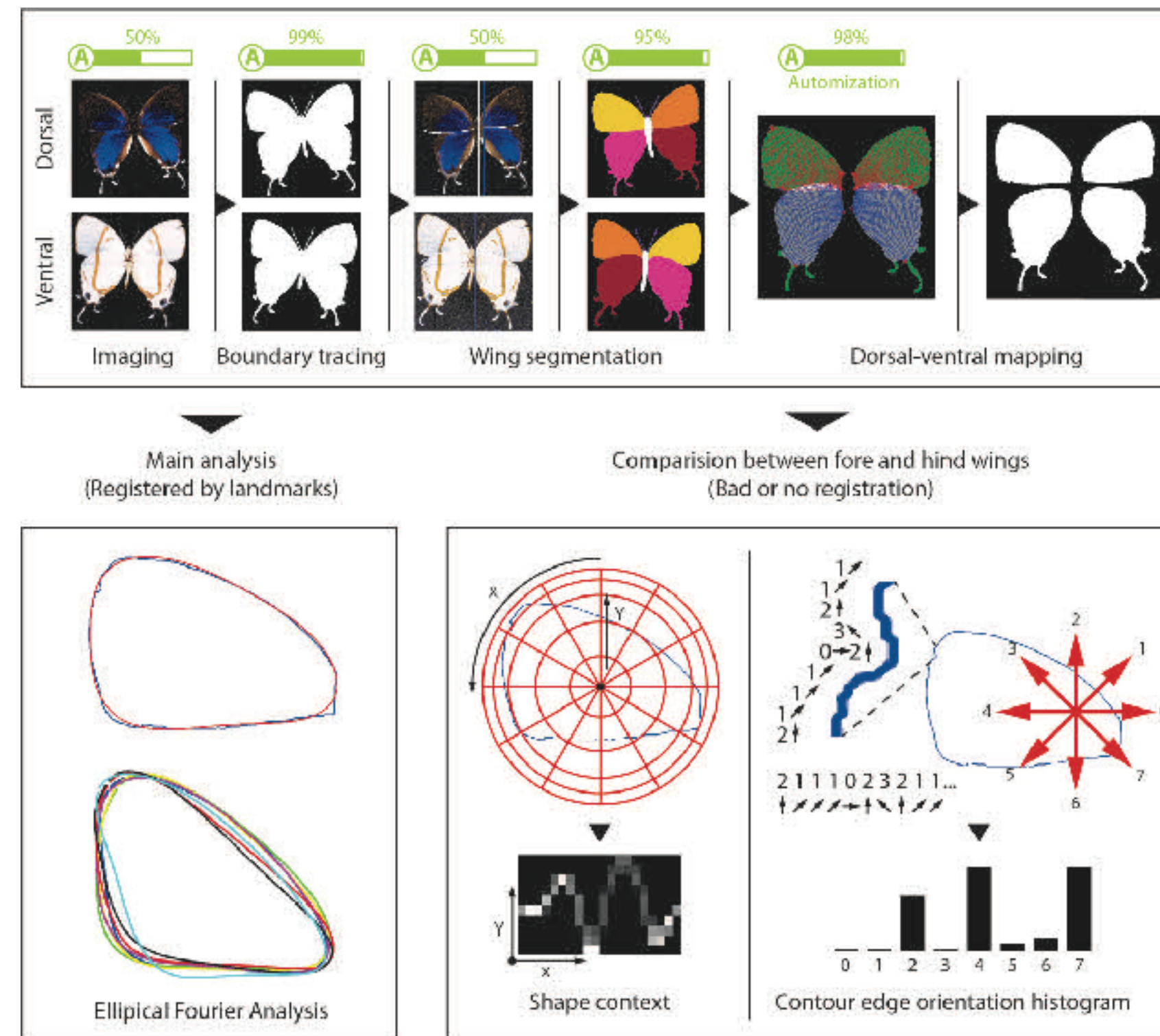
Thank Wei-Ping Chan, my dearest roommate, for sharing his projects!



Building phylogenetic tree

[Espeland et al. 2018]

Computer-assisted analysis

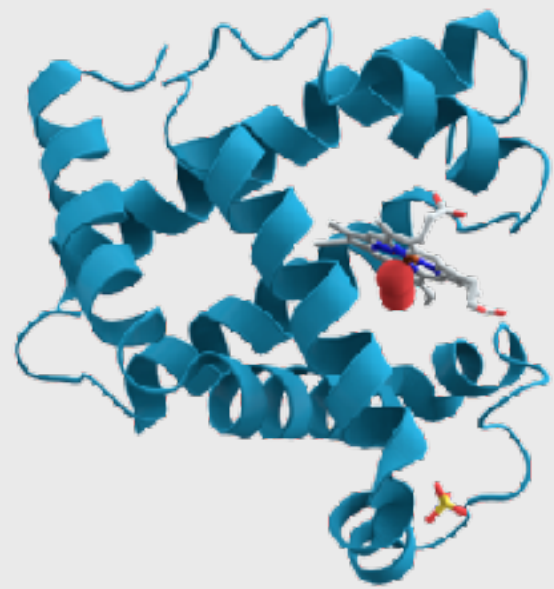


Data analysis

- Principal component analysis (PCA), General linear mixed model (GLMM), Structural equation modeling (SEM), etc.
- Ancestral state reconstruction, morphological disparity through time, etc.

AlphaFold

A game changer in the study of protein folding

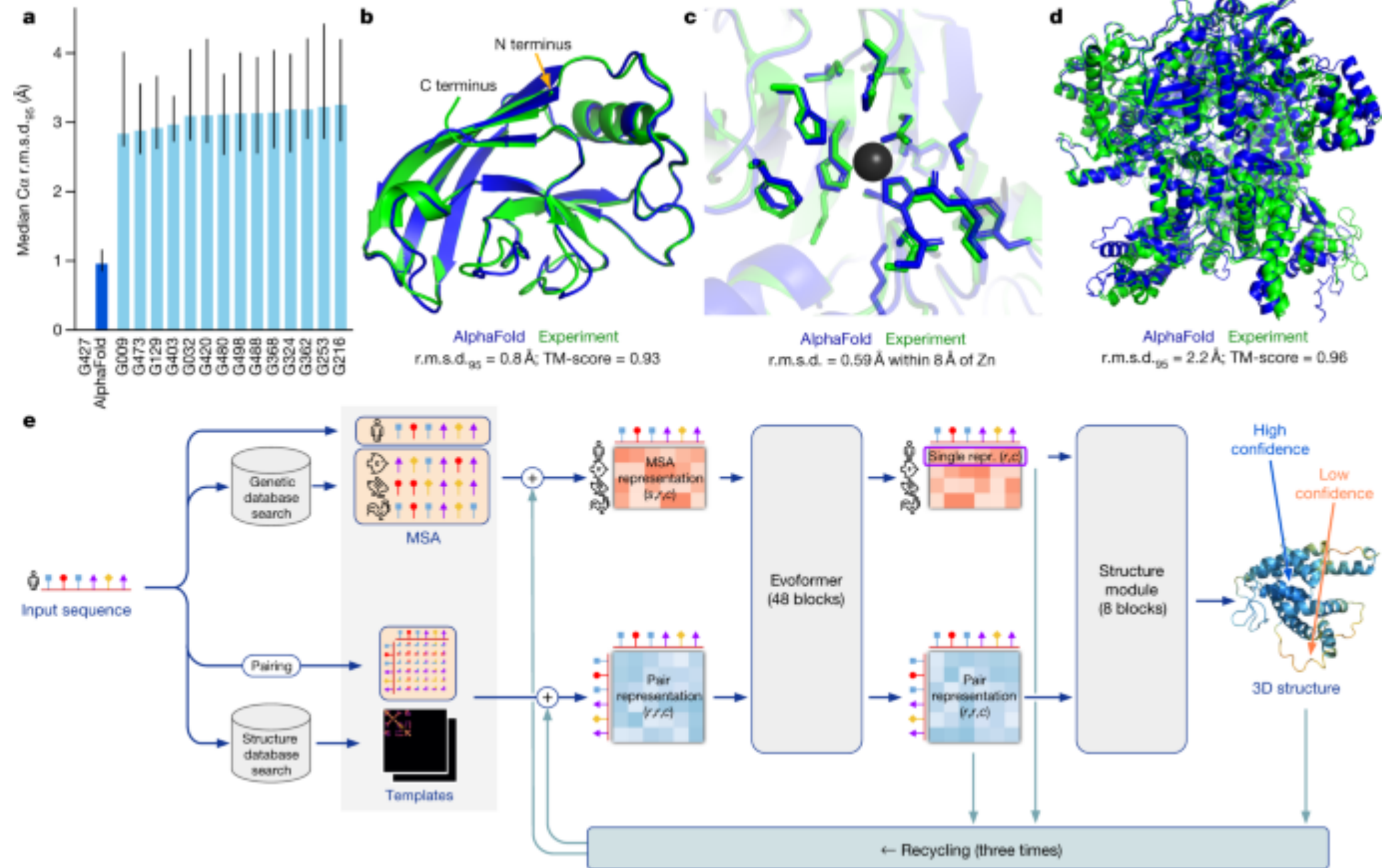


Myoglobin

The 3D shape of a protein determines its function.

The Structure Problem

Given a string of different amino acids, what's the shape of protein?

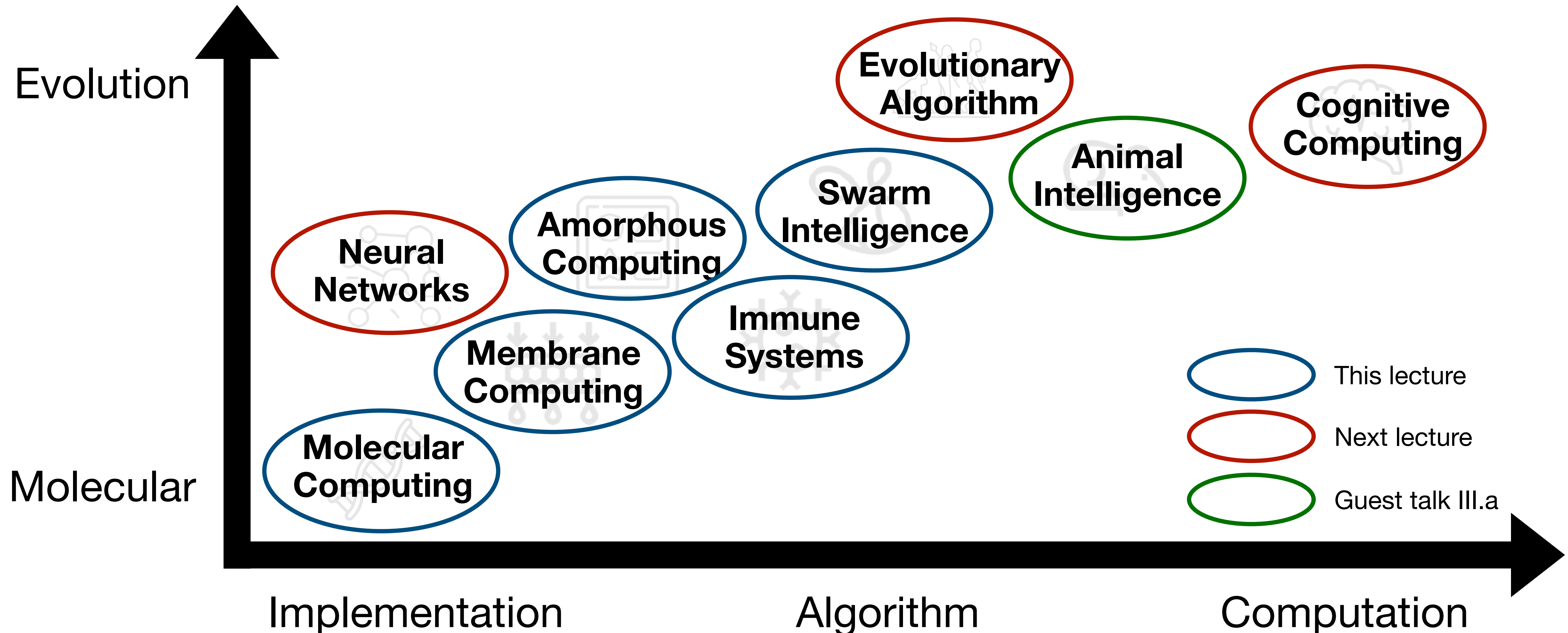


Biology → Computation

Disclaimer: I'm not an expert in any of the example, so please feel comfortable to correct me!

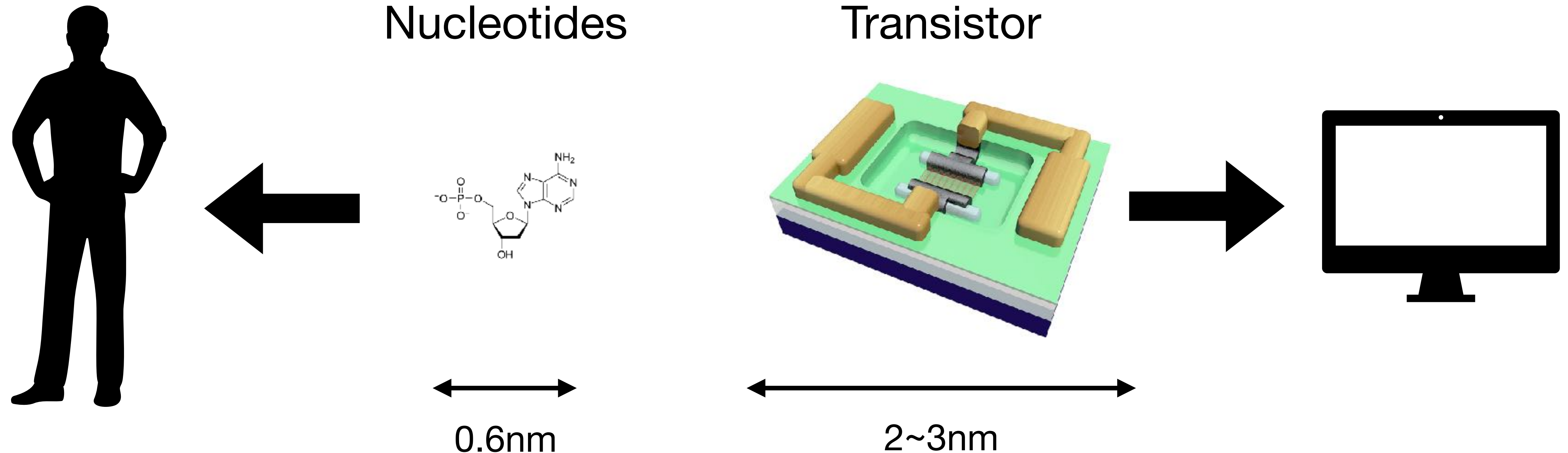
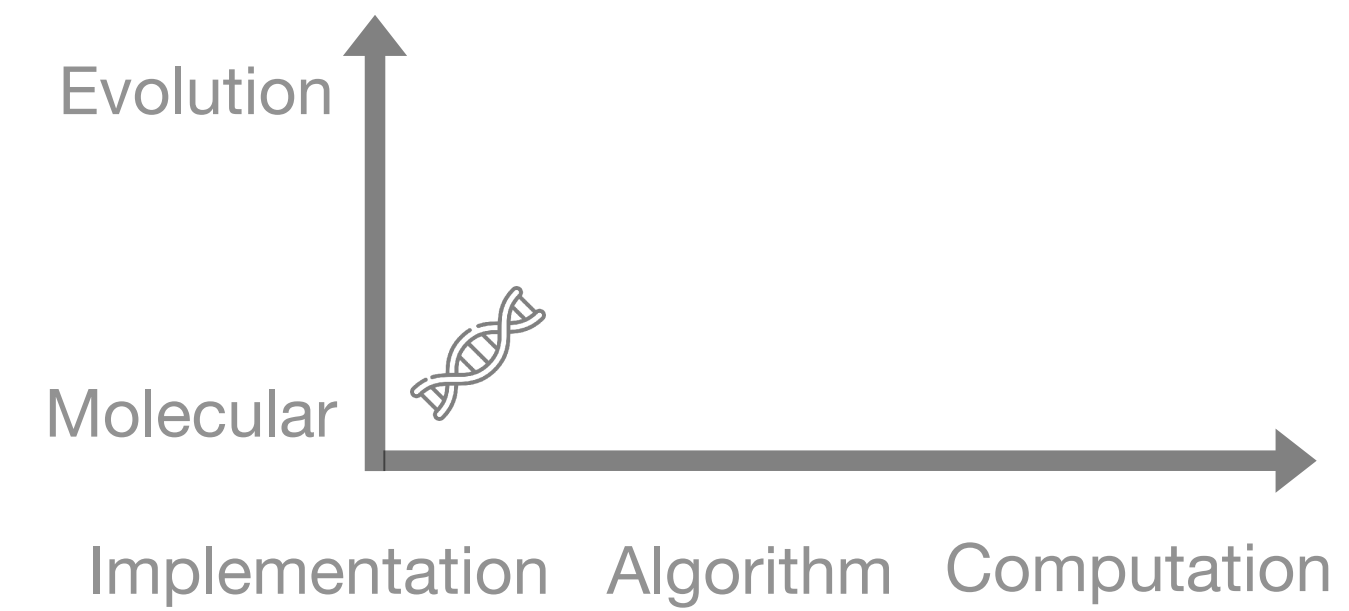
Biological Computation

Also known as natural computing, bio-inspired computing, etc.



Molecular Computing

With a focus on DNA computing

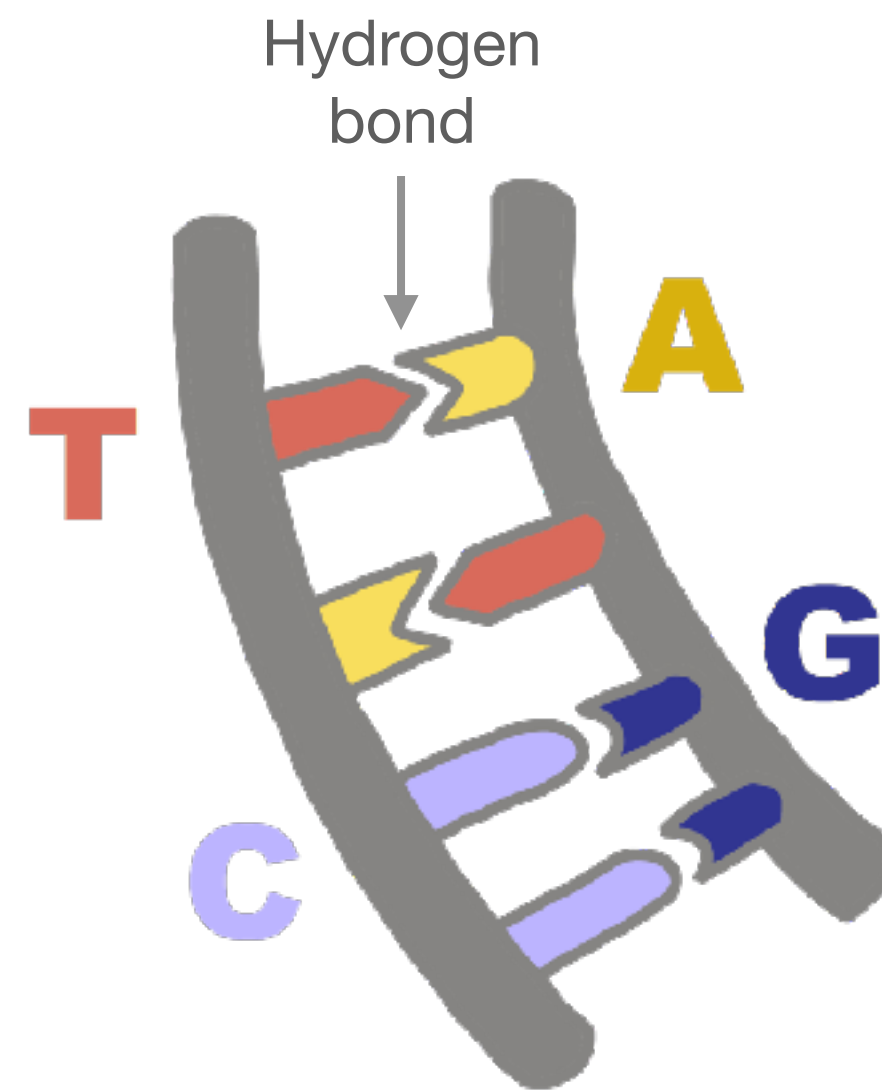


Use molecules to perform basic computational operations!?

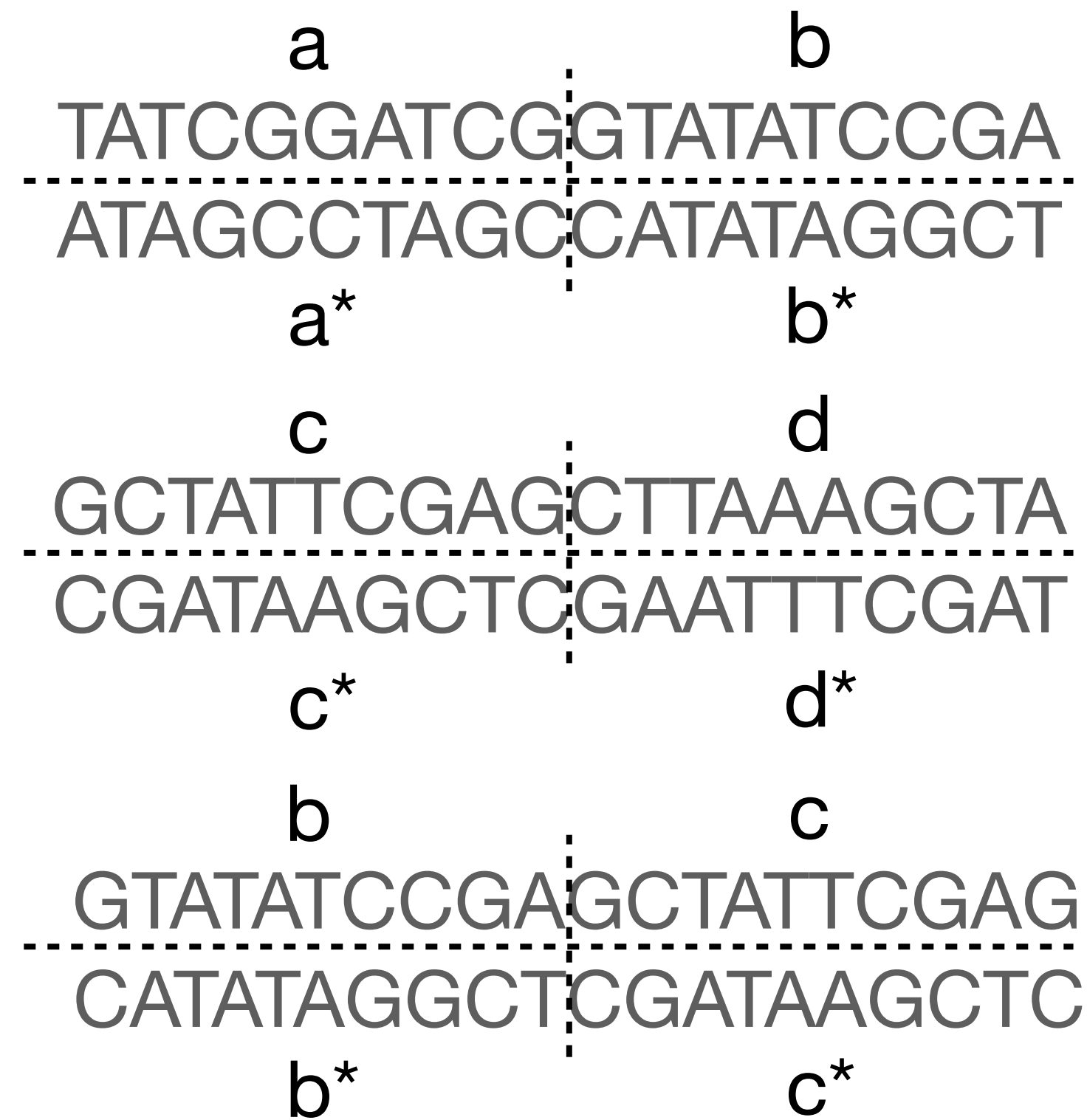
Basic Facts about DNA



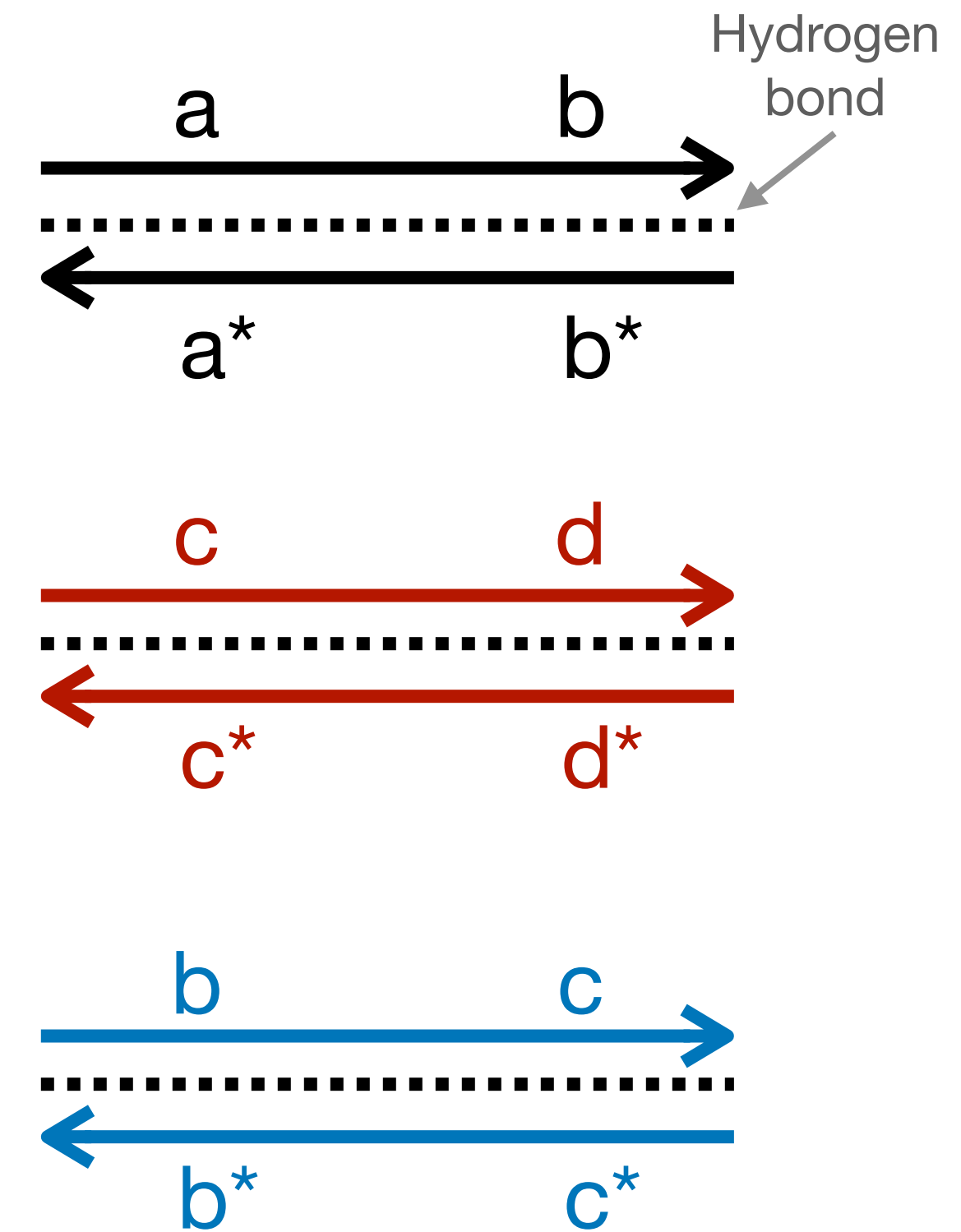
DNA



Nucleotides



Oligonucleotide

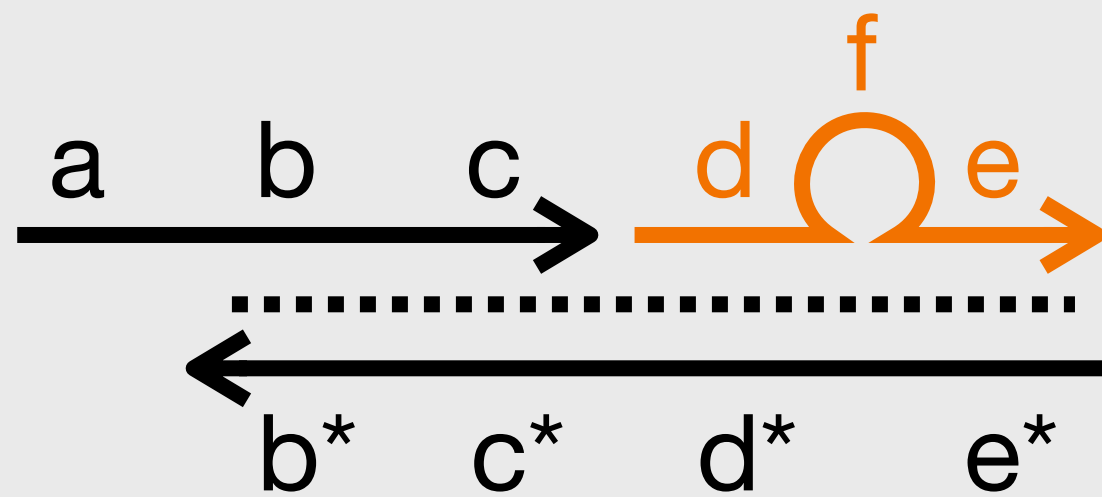


An abstraction

Nucleotides provide basic elements to encode information!

A Simple Logical AND Gate via DNA

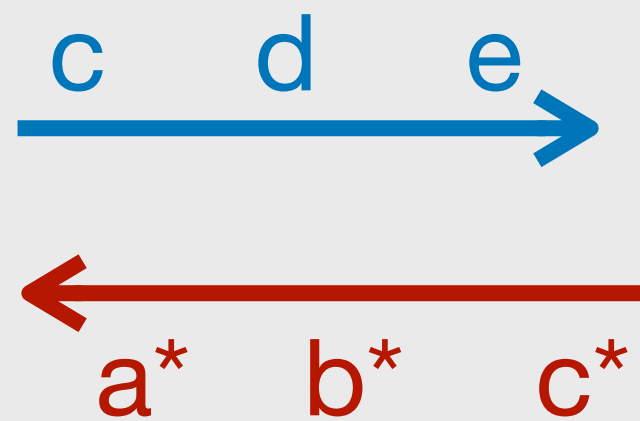
AND gate



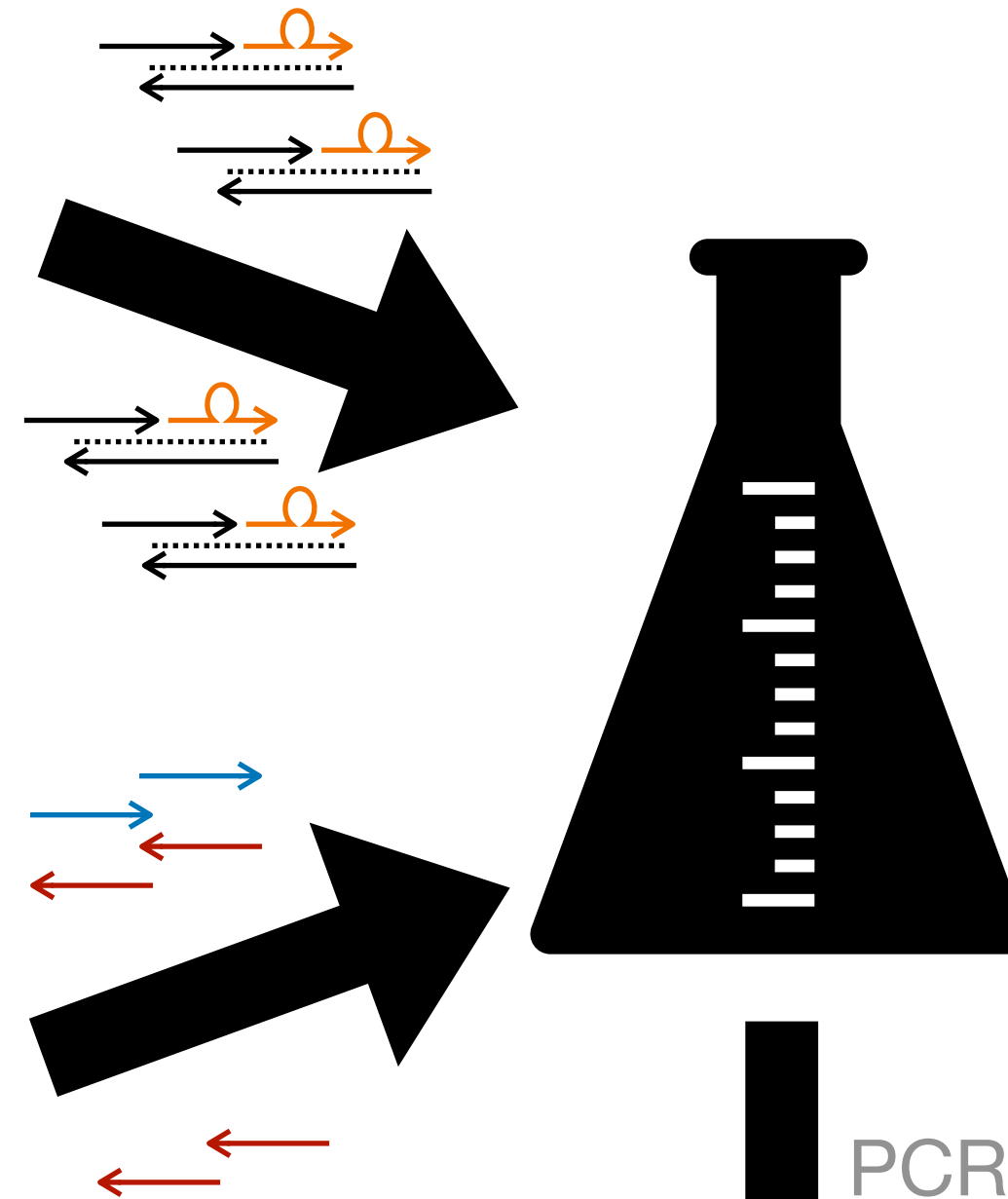
Inputs

(The presence of the Oligonucleotide encodes 0/1)

- Inputs = (1,1)

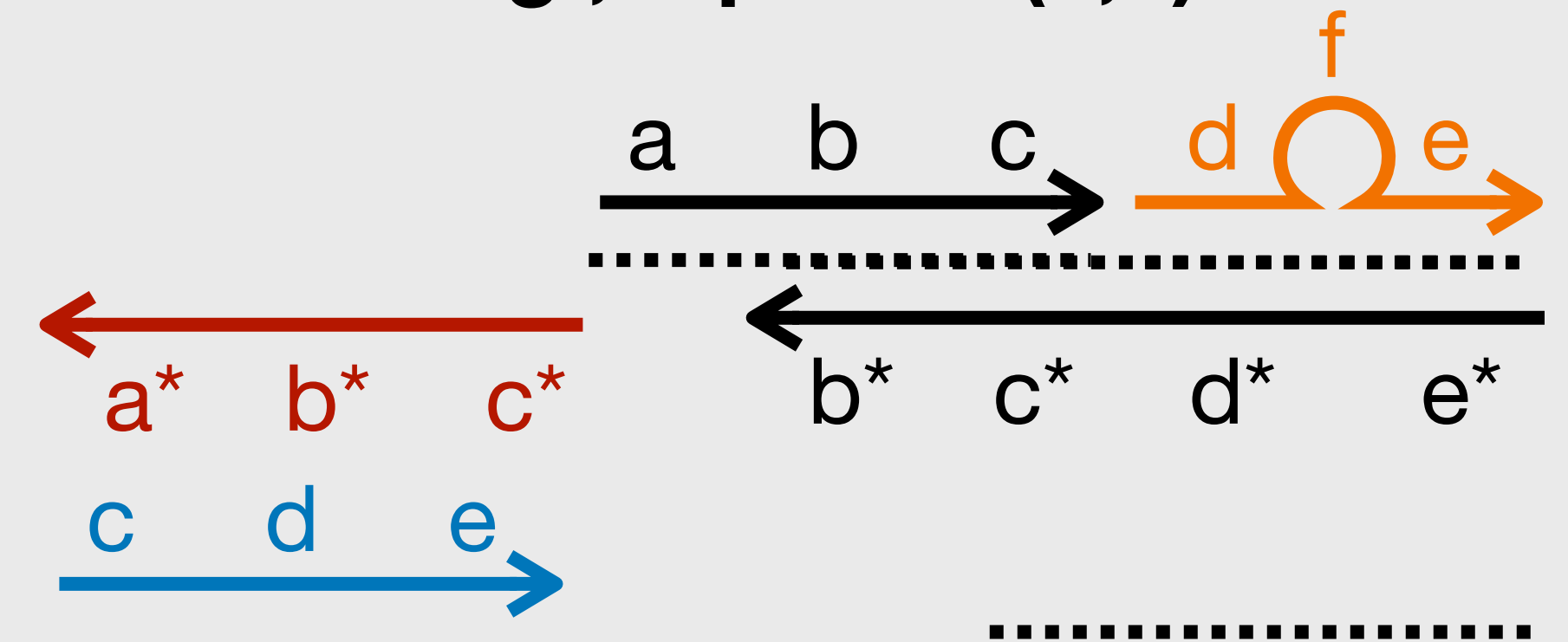


- Inputs = (0,1)

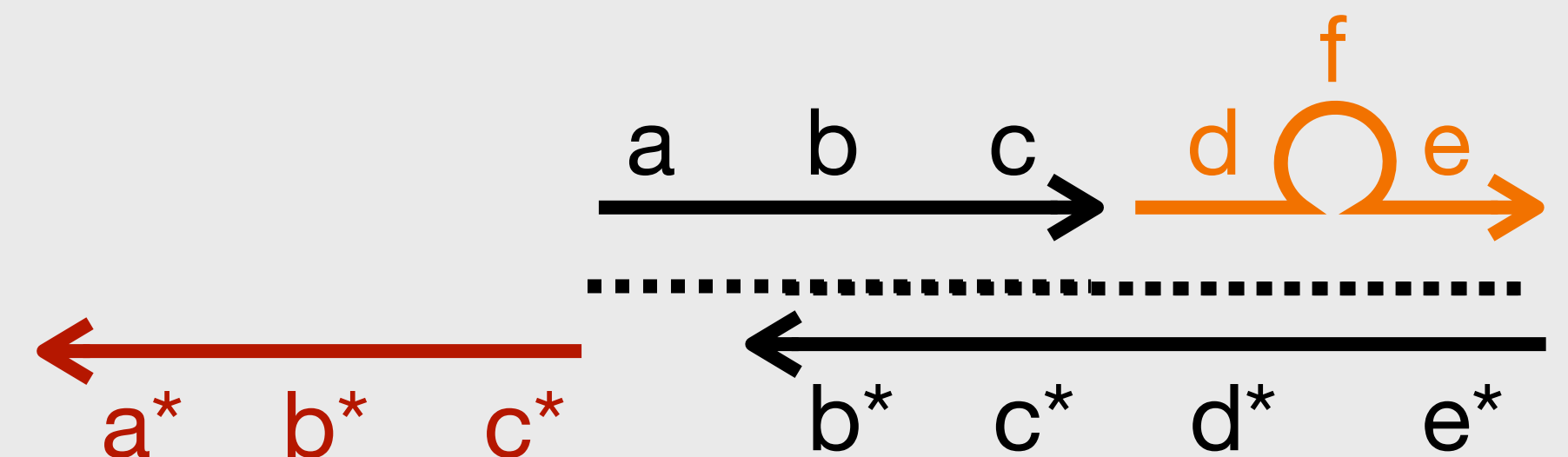


Output = 1 or Output = 0

E.g., inputs = (1,1)



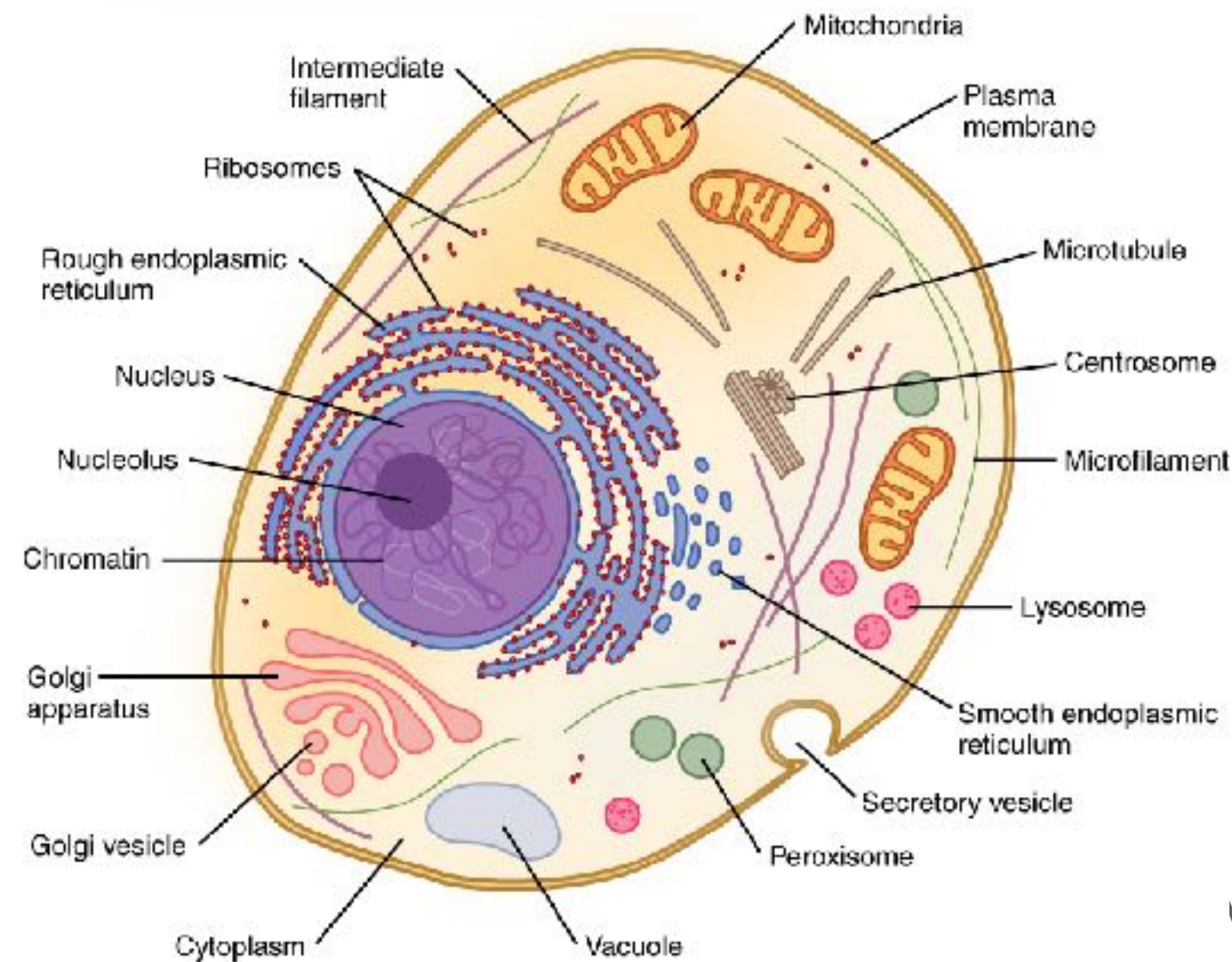
E.g., inputs = (0,1)





Salvador
(Jan. 19
2pm-3pm ET)

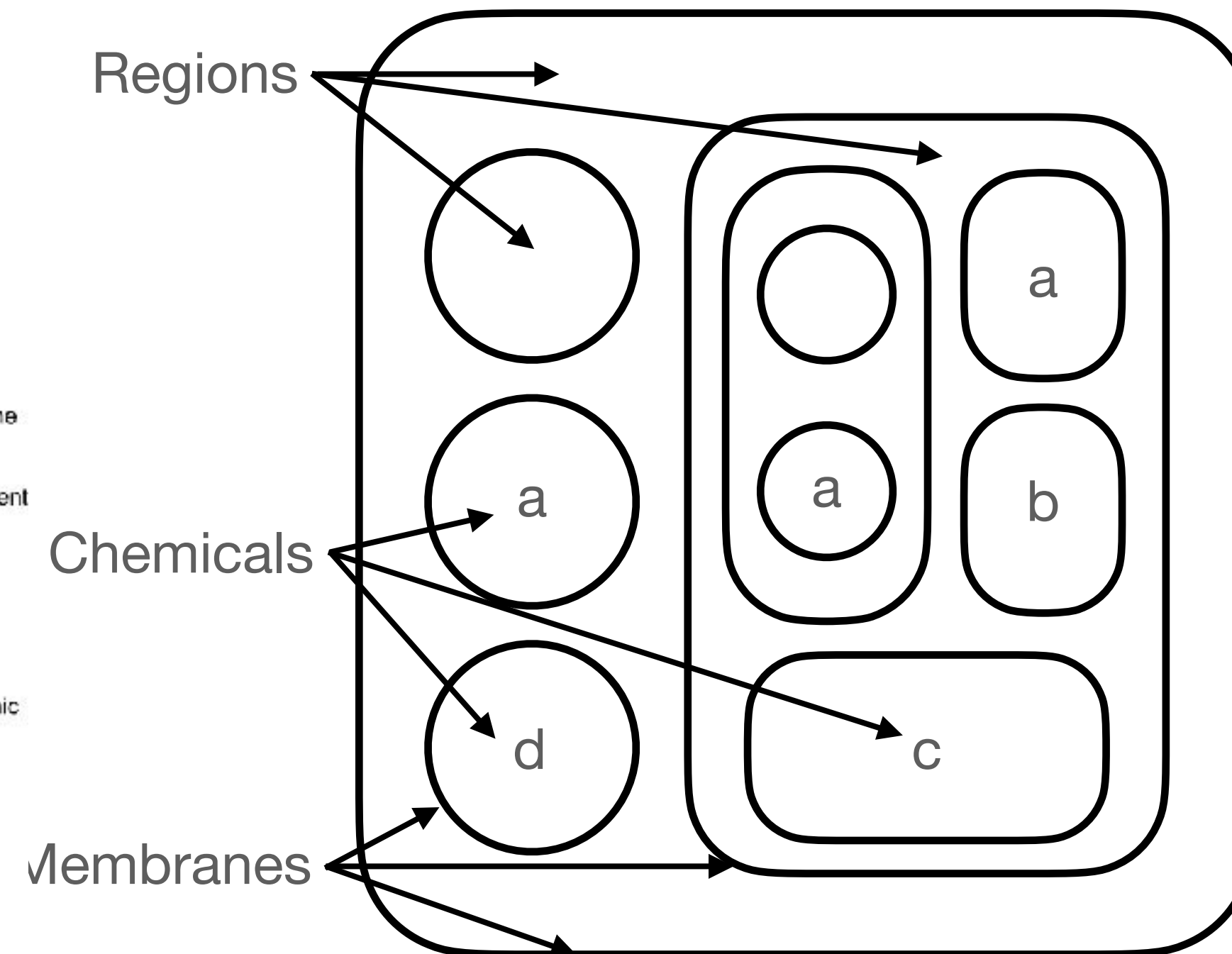
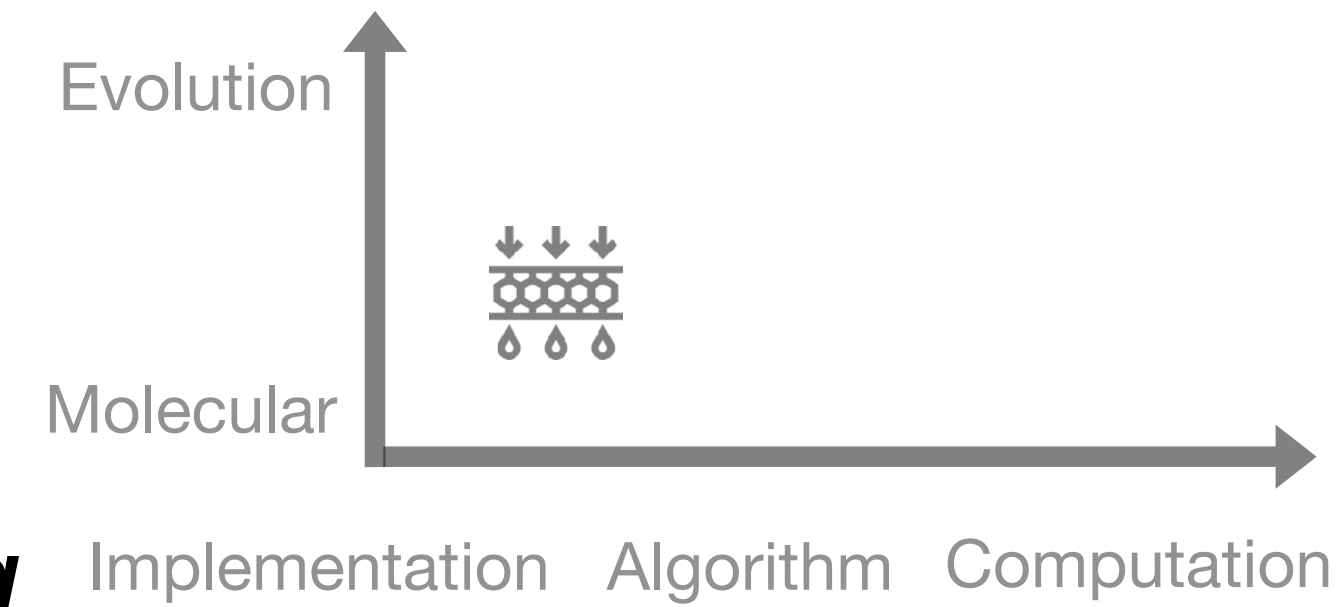
*“DNA Computing,
Cellular Automata, and
Beyond”*



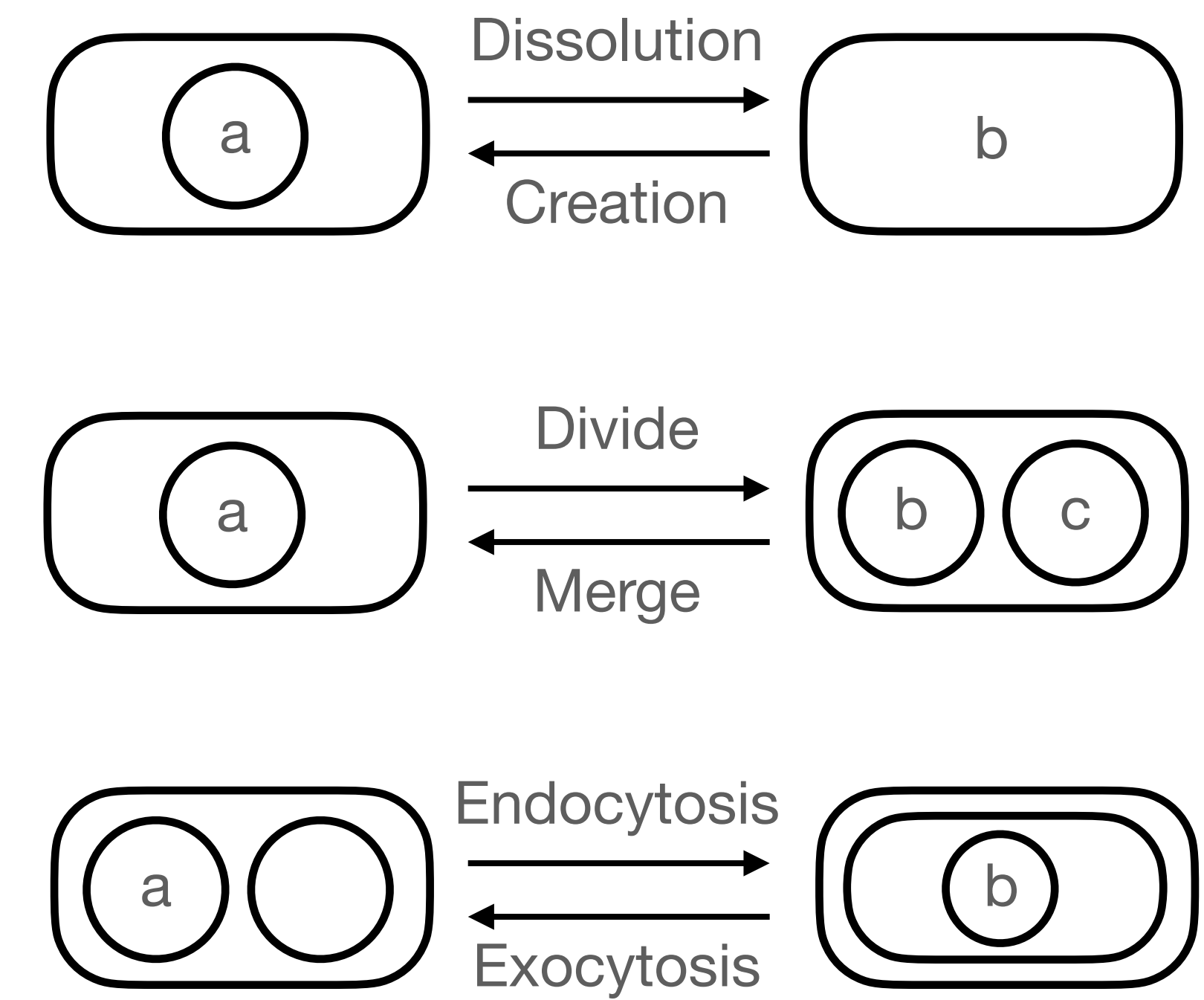
A cell

Membrane Computing

Sometimes called cellular computing

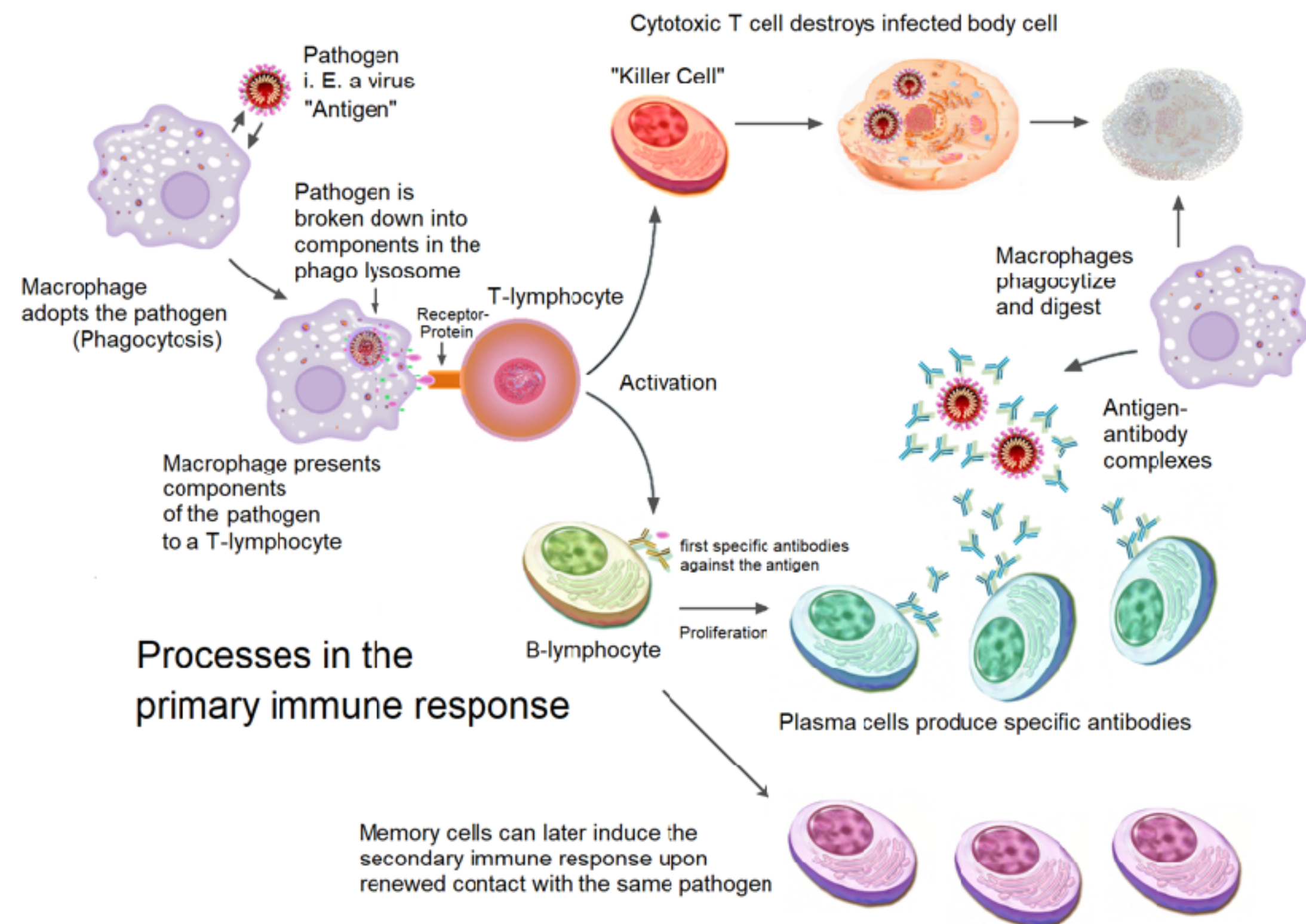
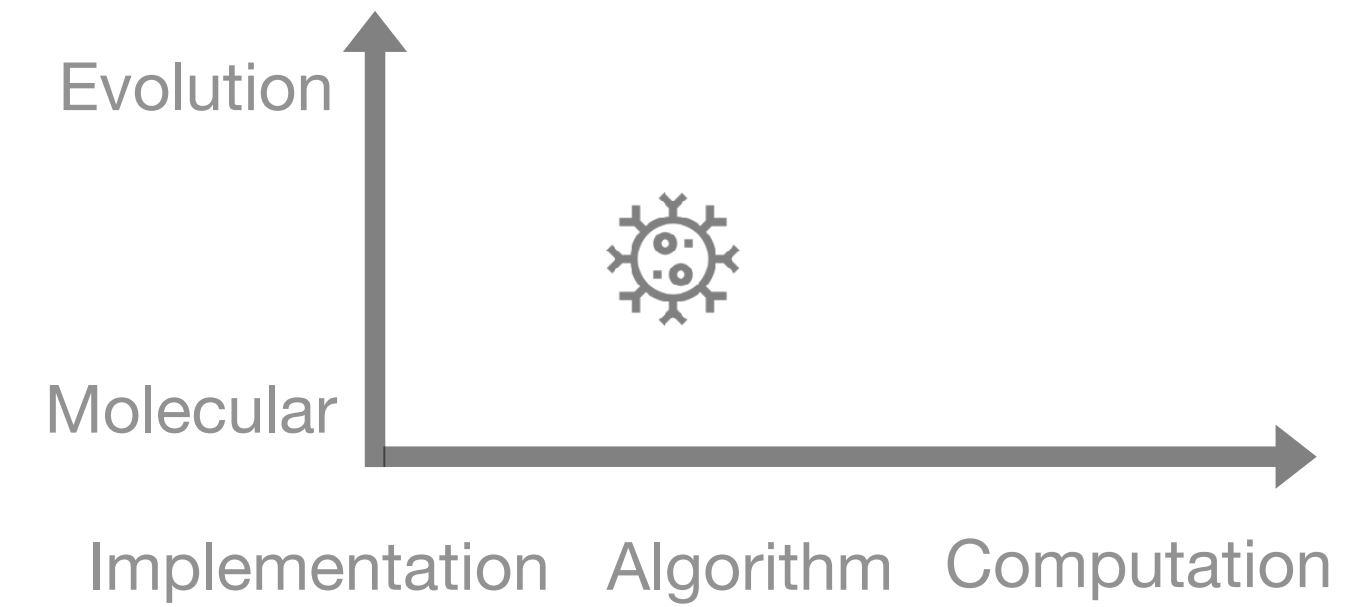


An abstraction (e.g., P system)



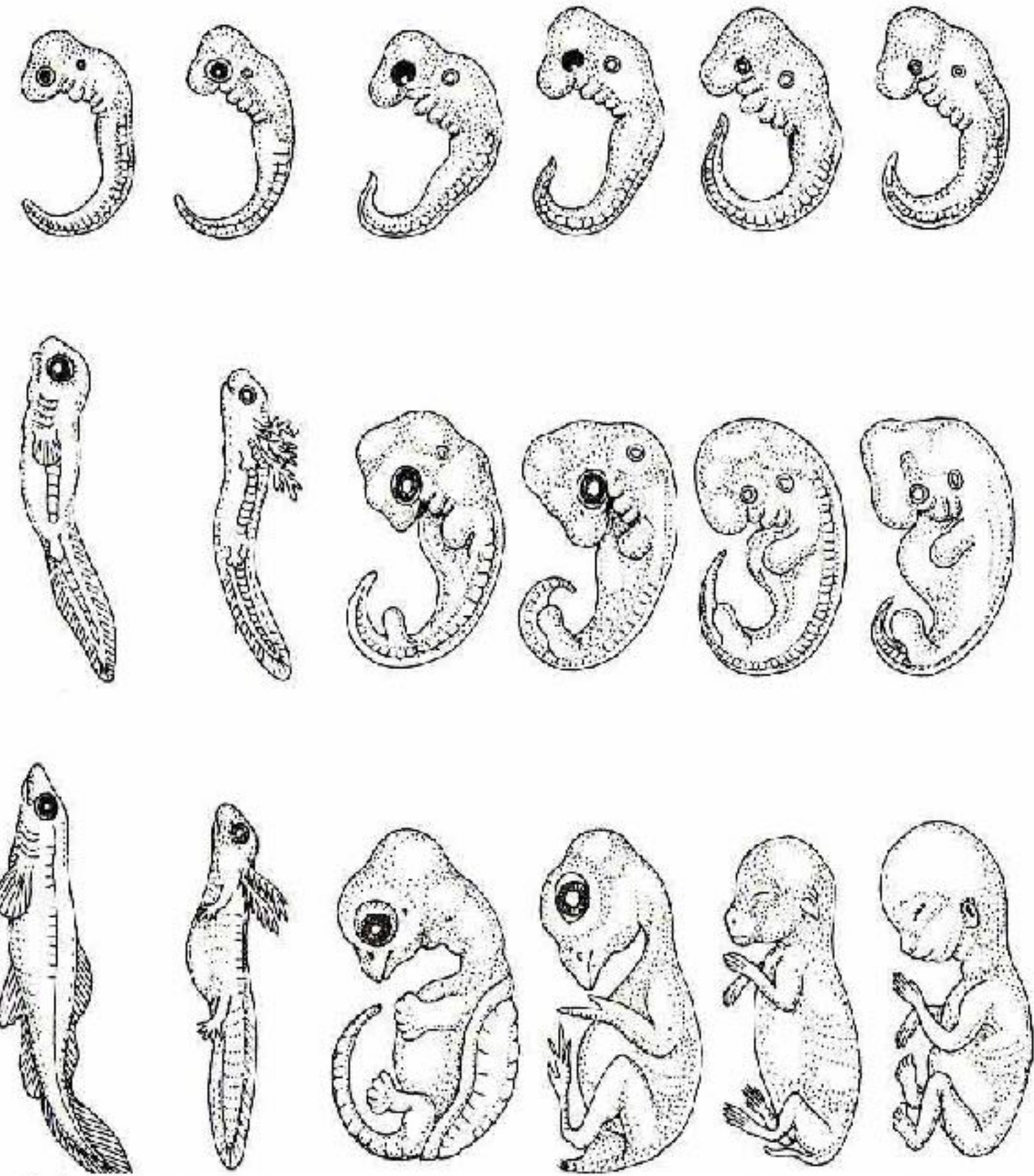
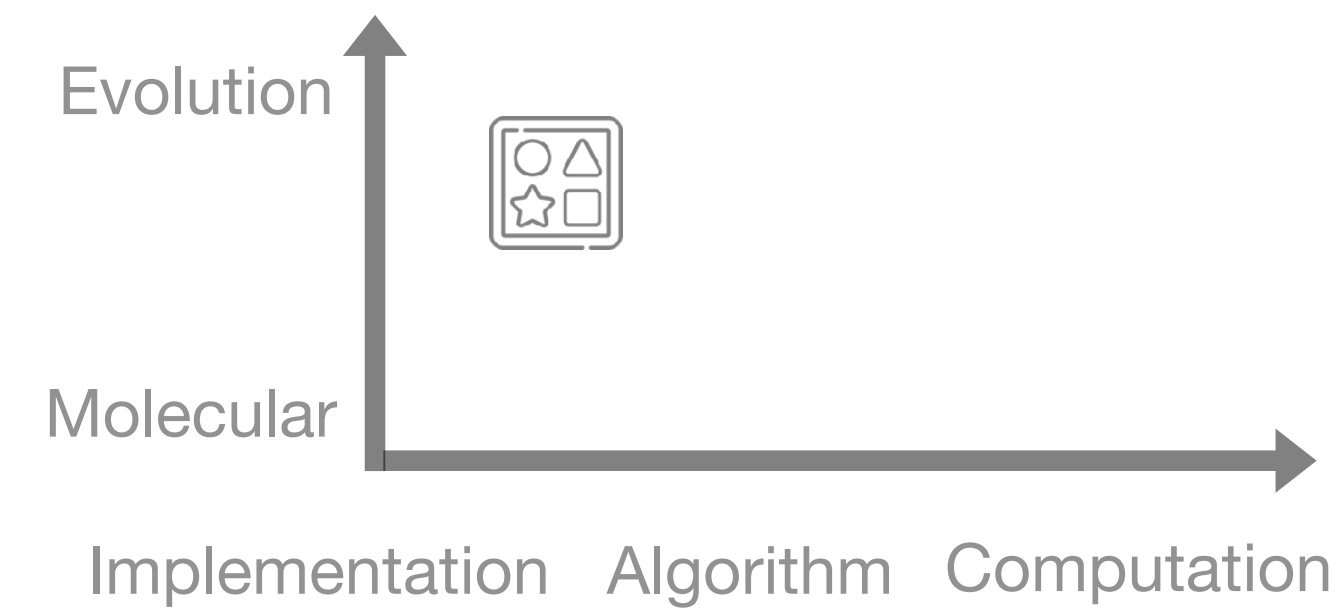
Many models here (e.g., P system & Cellular automata) are Turing-complete*!

Immune Systems



What is foreign and what is a part of its own system?

Amorphous Computing



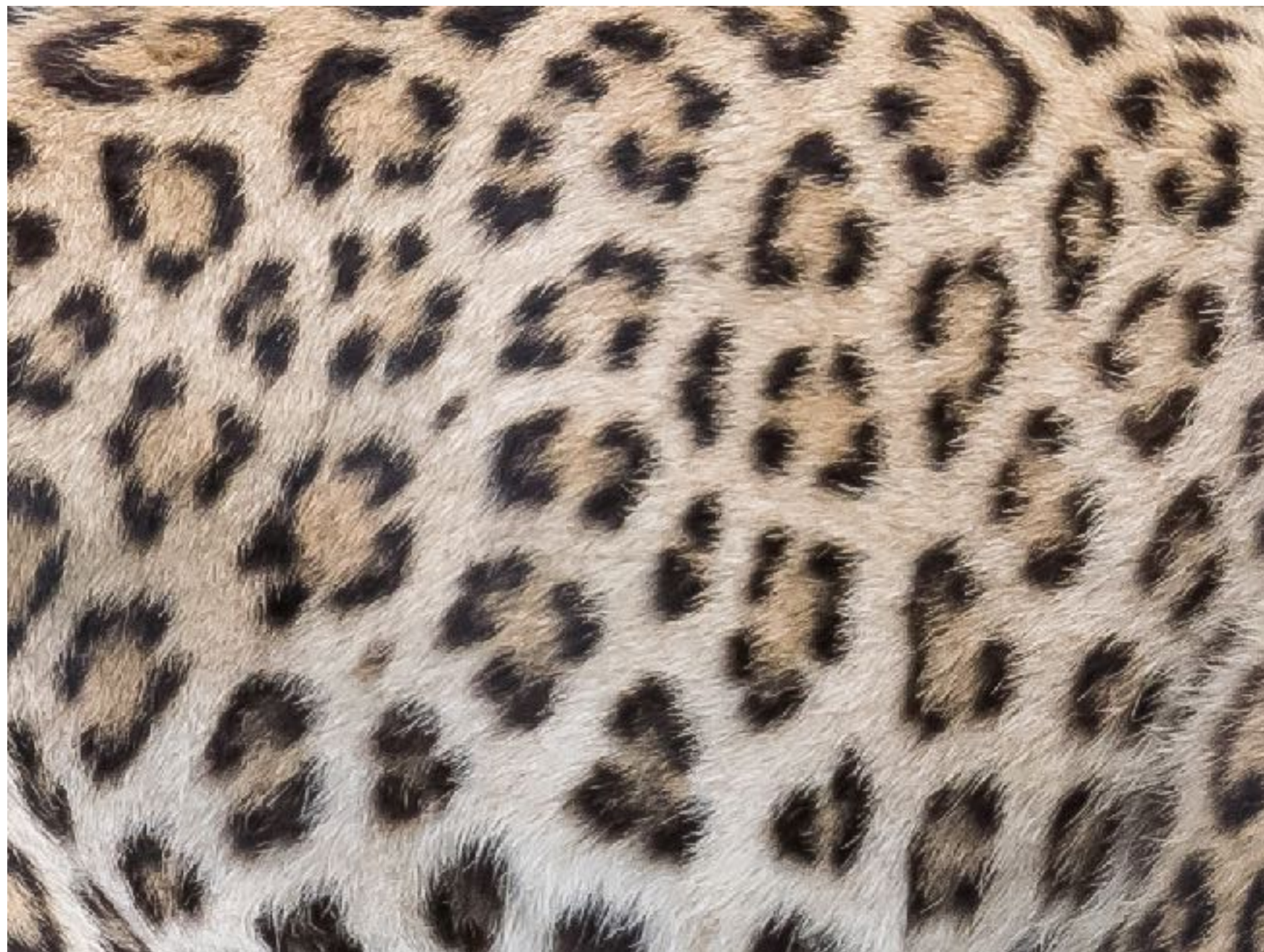
How do organisms form reliably and consistently while the cells

- are asynchronous,
- are interconnected in an unknown and time-varying ways,
- communicate locally,
- and identically programmed!?

Emergent phenomena!

What's the underlying computational aspect of emergent properties?

Example: Turing's Leopards' Spots Problem



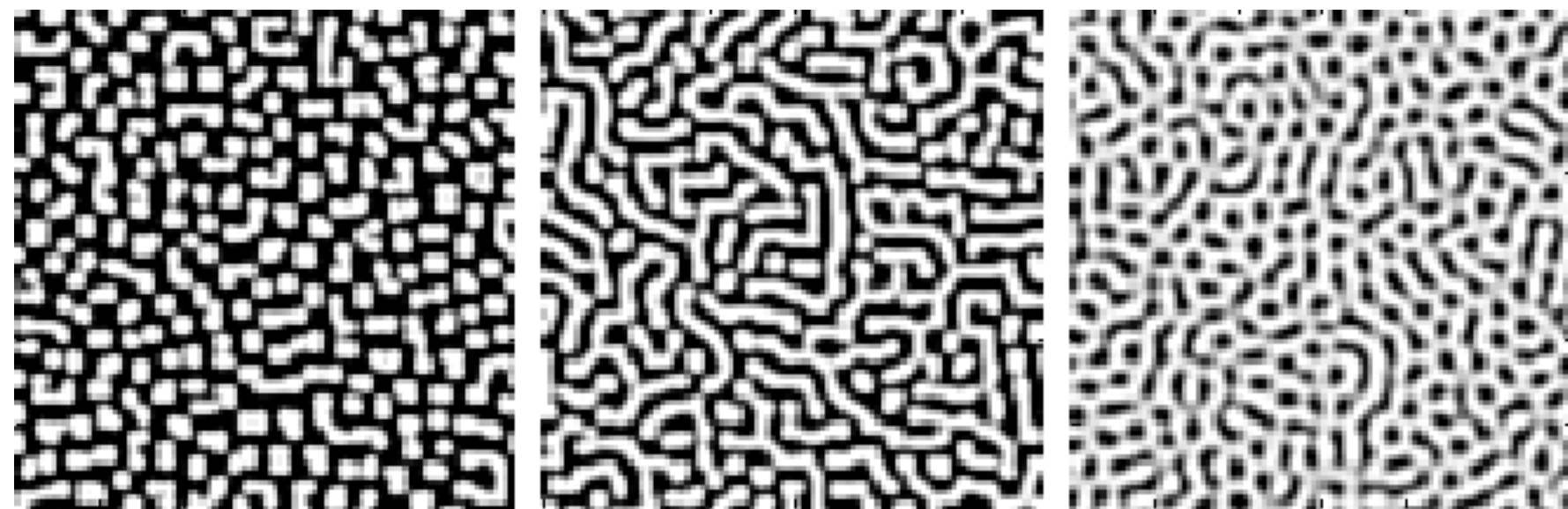
Q: How do the diverse patterns appear ubiquitous in nature?

Q: Why these patterns are hexagons, spirals, stripes, etc.?

THE CHEMICAL BASIS OF MORPHOGENESIS

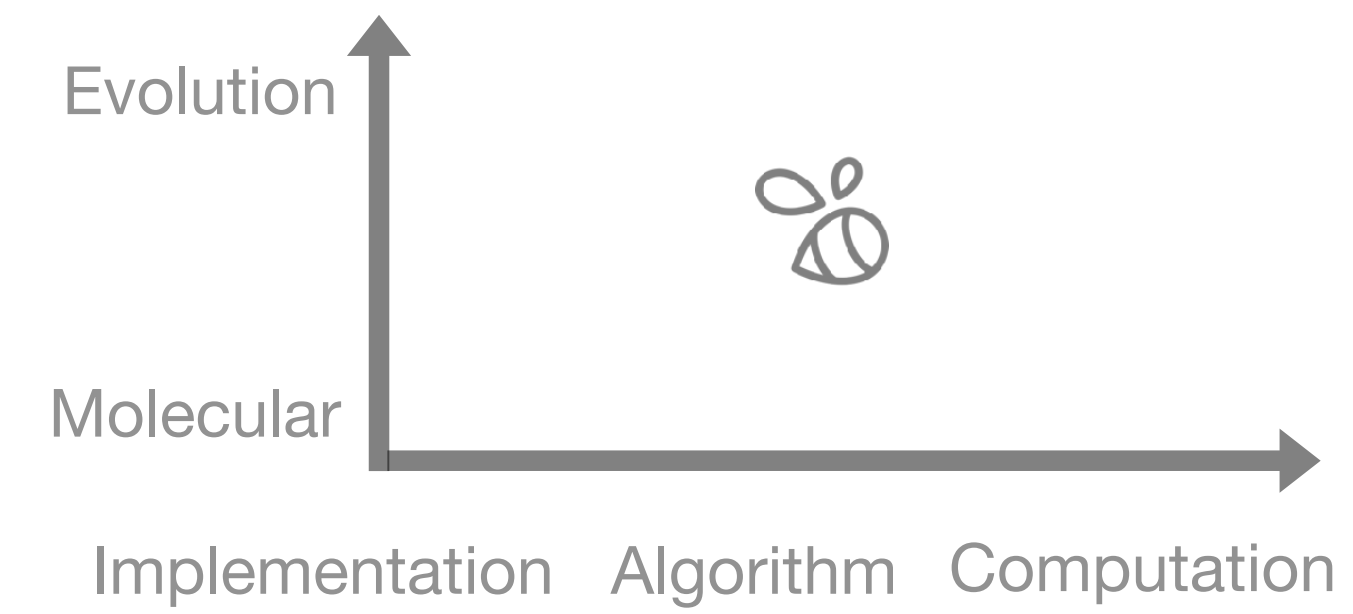
By A. M. TURING, F.R.S. *University of Manchester*

(Received 9 November 1951—Revised 15 March 1952)

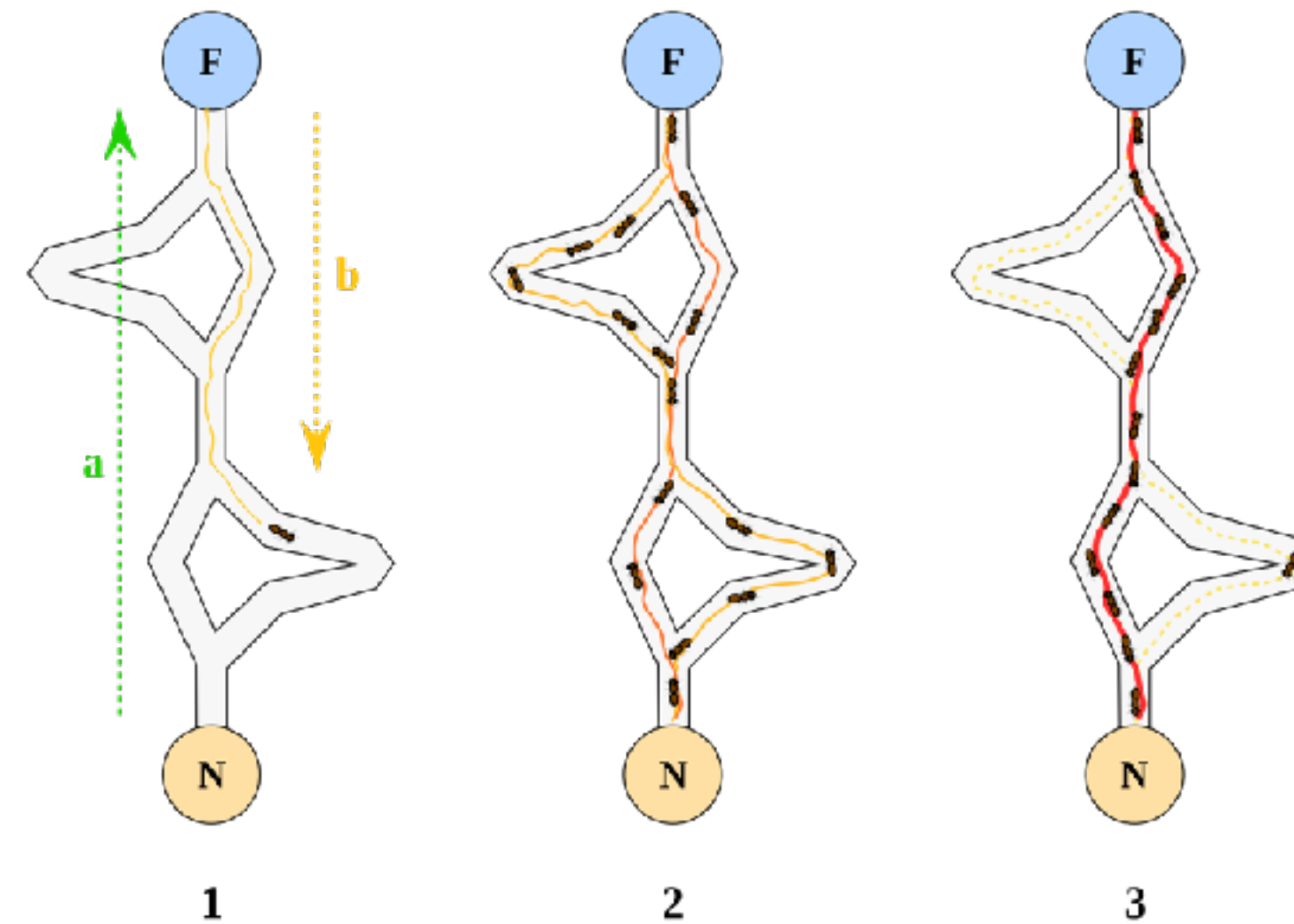


The diffusion and reaction between two “morphogens” would introduce complex pattern that looks like coming from random chaos!

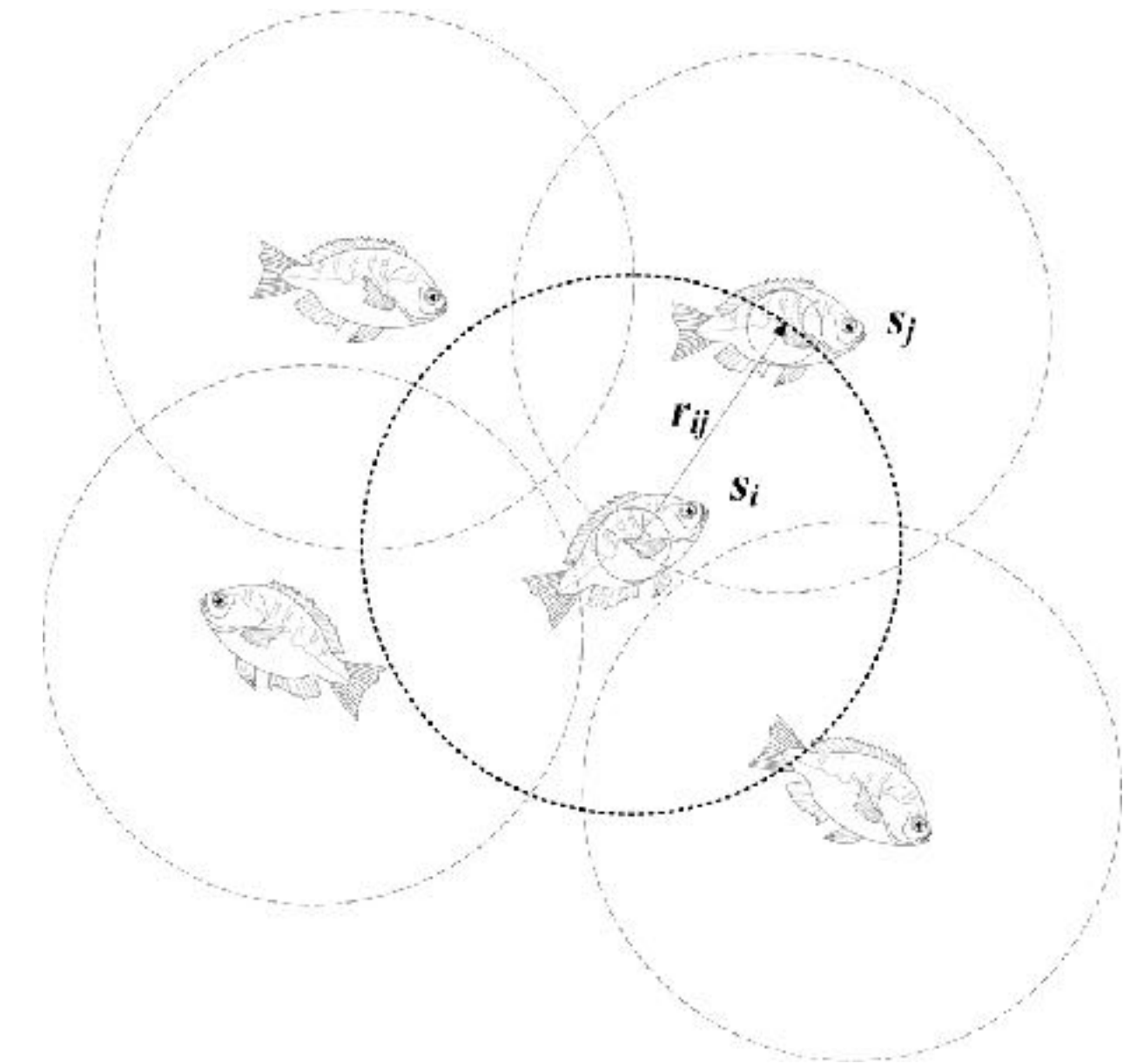
Swarm Intelligence



Slime mold solving maze



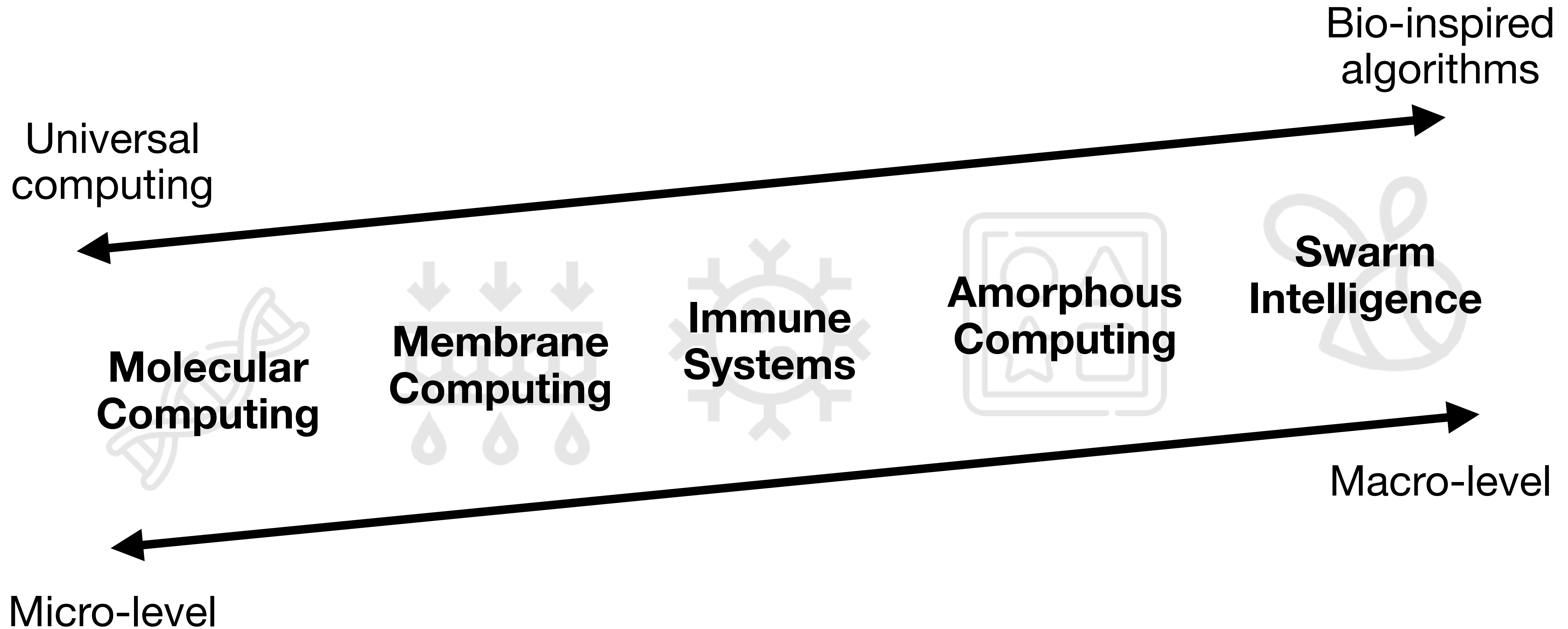
Ant colony optimization



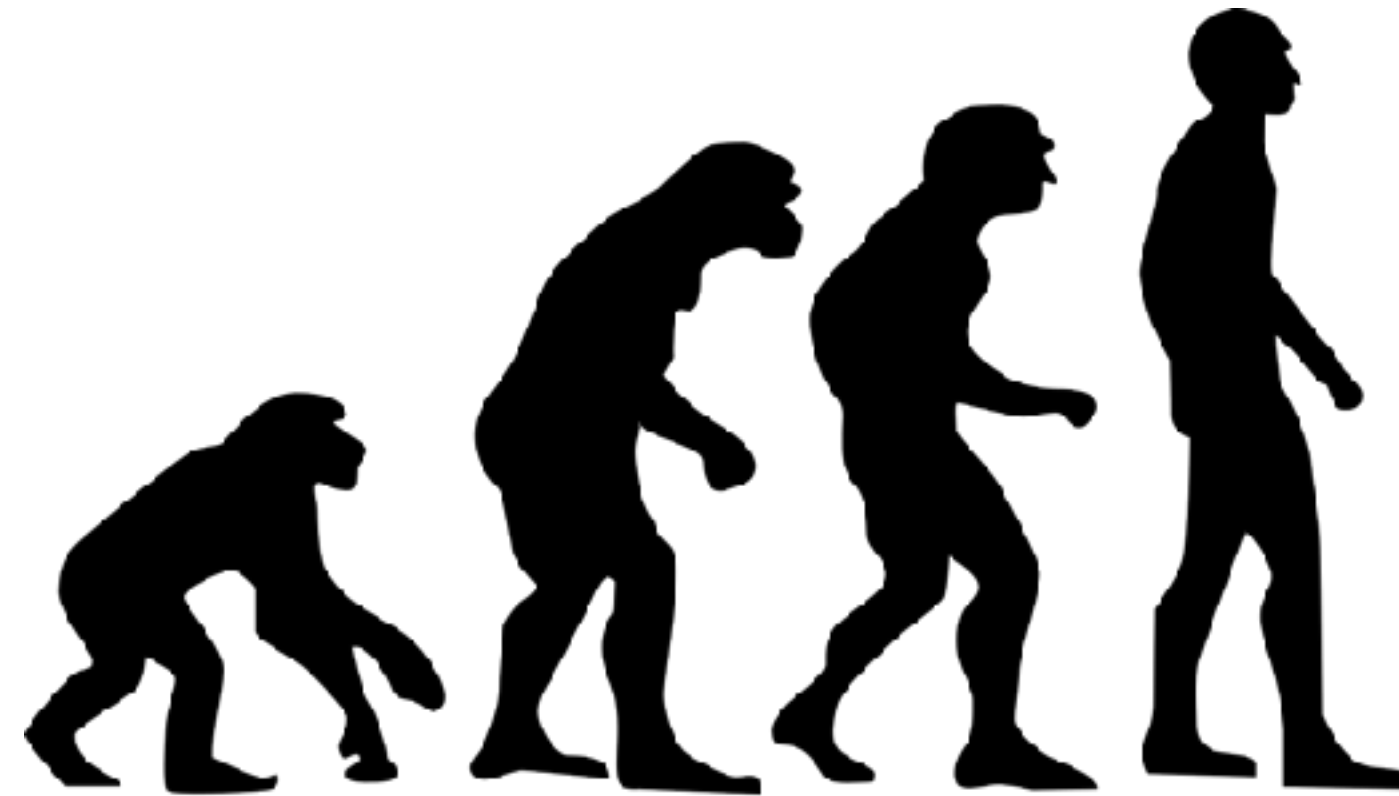
Fish Swarm algorithm

Inspired lots of algorithms and metaheuristics!

A Bird-Eye View



More to Come...



**Neuroscience &
Cognitive Science**

Evolution

Animal Intelligence

Lecture III.b

Guest Talk III.c

Summary

Key Concepts

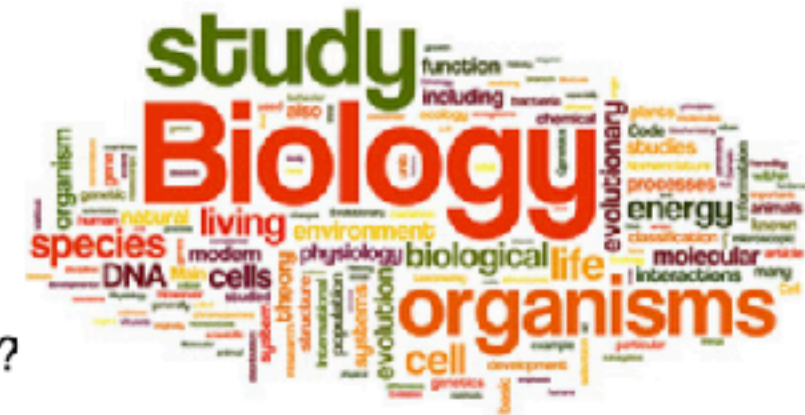
What is Biology and Why Care?

"Biology is the scientific study of life. It is a natural science with a broad scope but has several unifying themes that tie it together as a single, coherent field."
 – Wikipedia

- We humans are living beings!
- Computational methods are widely used in the study of biology.

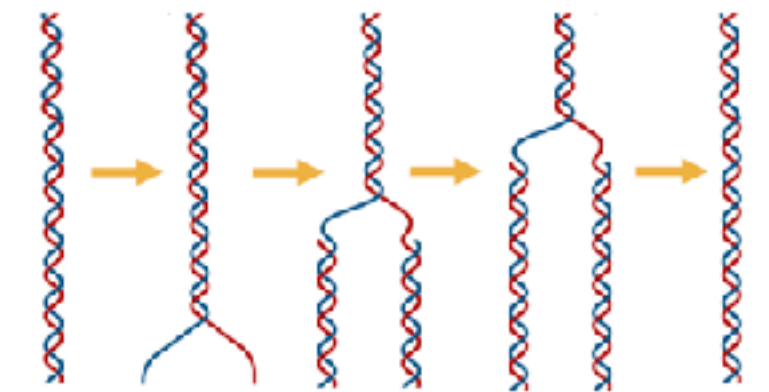
Q: What are the computations in the biological worlds?

Q: Biology as constraints or inspirations?



Biological Algorithms vs. Computer Algorithms

Example: copying strings



DNA Replication
 (An oversimplified version)

```
char *
strcpy (char *dest, const char *src)
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    return memcpy (dest, src, strlen (src) + 1);
}

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{
    char *d = dest;
    const char *s = src;
    while (len--)
        *d++ = *s++;
    return dest;
}
```

String Copying in C

"Algorithm" in Biology might be Multi-Functional or Goalless!?

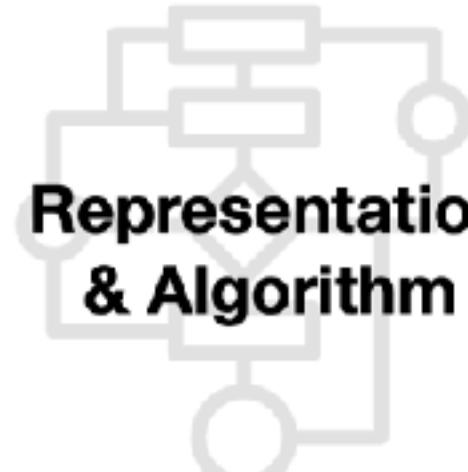
Different Angles to Think

Marr's three levels of analysis



Hardware Implementation

E.g., genotype and phenotype



Representation & Algorithm

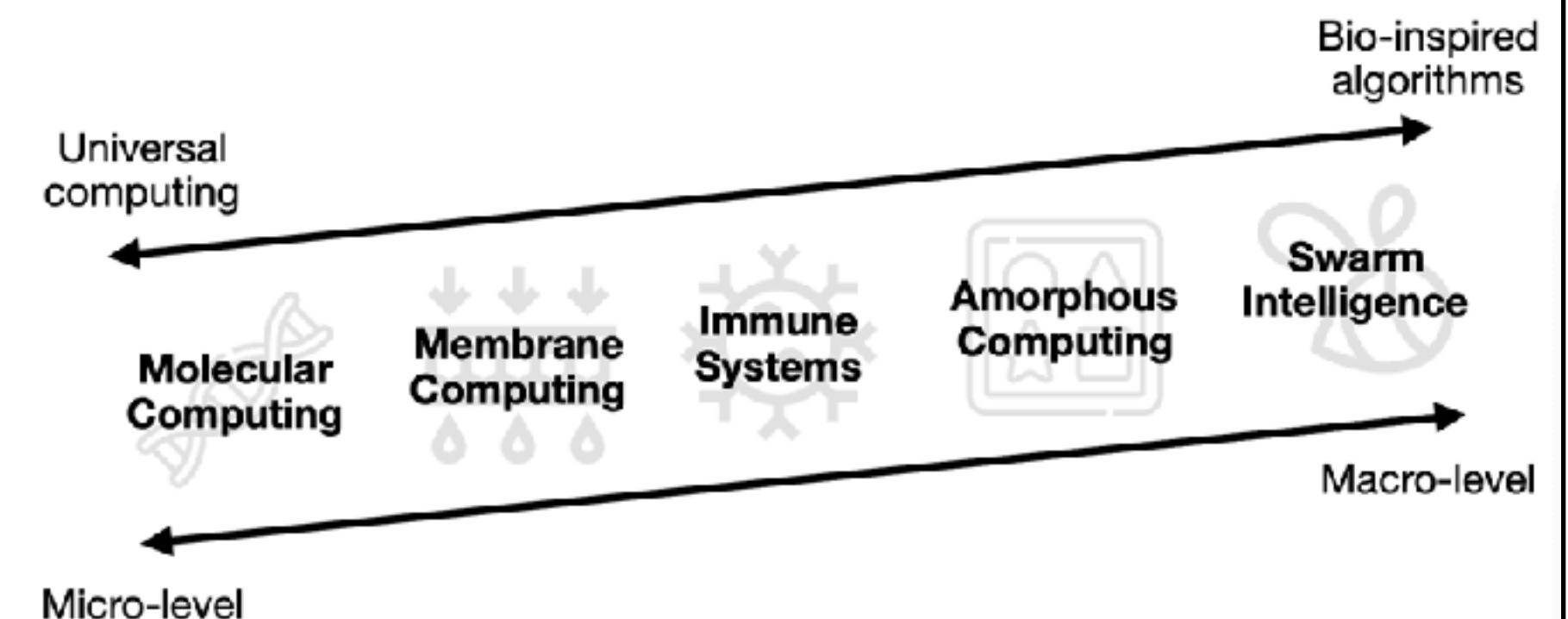
E.g., heritable variation, differential reproduction, fitness, competition



Computational Theory

E.g., natural selection

A Bird-Eye View



Guest Speakers for Module III



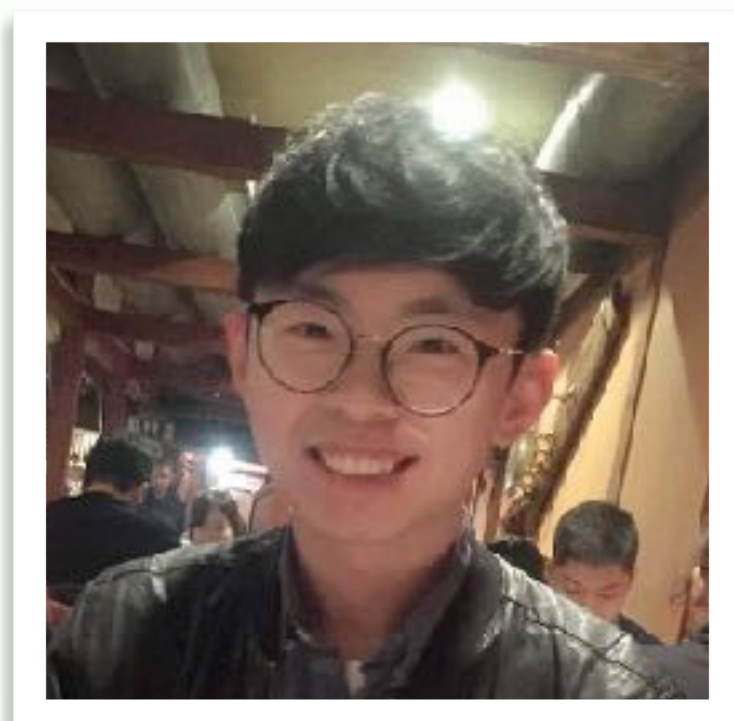
“Into the Unknown: (De)constructing Creativity in the Age of Human-Machine Partnership”

Angel Hsing-Chi Hwang
(Jan. 17 11am-12pm ET)

“A Road to Totality: Between Art and Computation”



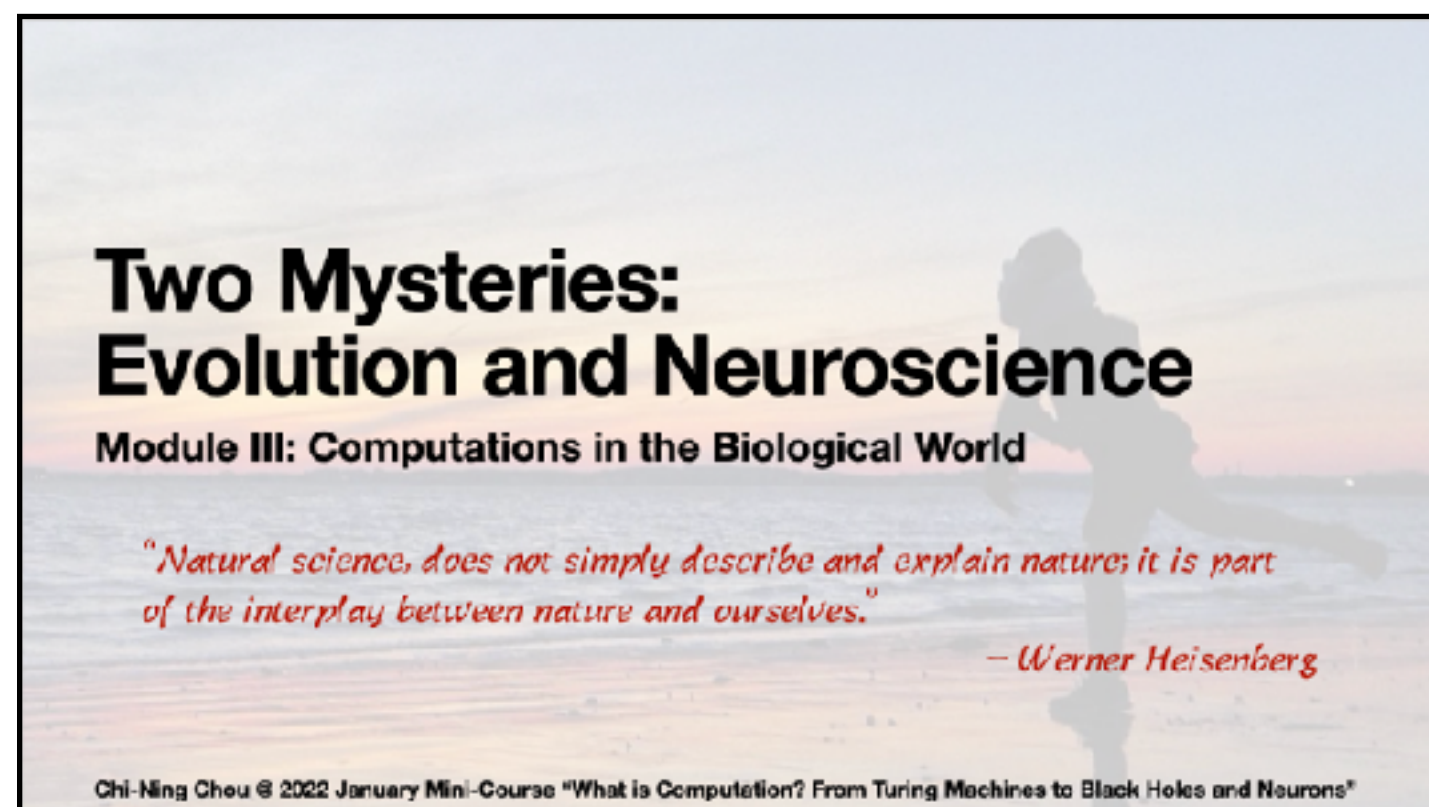
Zhiqian Wang
(Jan. 19 11am-12pm ET)



“Animal Intelligence: Flexible Computation Under Uncertainty”

Brabeeba Wang
(Jan. 20 11am-12pm ET)

Next



Lecture III.b

(Jan. 14 10am-10:50am ET)



Salvador

(Jan. 19
2pm-3pm ET)

*"DNA Computing,
Cellular Automata, and
Beyond"*

Check them out on the calendar!

Food for Thought

Q: How do you think the “computations” done in the biological world differ from that in the physical world as well as the mathematical formulation?

Q: Can you come up with some examples of biological computation from your own life experience?

Q: Do you think the current studies (at least those being discussed in this lecture) of biological computation have captured most of the computational insights?

Exercise

- If you have come up with some example of biological computation, try to formalize it and abstract out the computational insight.
- Find one example you like the most from this lecture and look into it!

References

Articles:

- Schnitzer, M. Biological computation: Amazing algorithms. Nature 416, 683 (2002), [link](#).
- Chelly Dagdia, Z., Avdeyev, P. & Bayzid, M.S. Biological computation and computational biology: survey, challenges, and discussion. Artif Intell Rev 54, 4169–4235 (2021), [link](#).

Books:

- Nowak, Martin A. Evolutionary dynamics: exploring the equations of life. Harvard university press, 2006, [link](#).
- Jones, Neil C., Pavel A. Pevzner, and Pavel Pevzner. An introduction to bioinformatics algorithms. MIT press, 2004, [link](#).
- Gillespie, John H. Population genetics: a concise guide. JHU Press, 2004, [link](#).

Fun reads:

- Stanley, Kenneth O., and Joel Lehman. Why greatness cannot be planned: The myth of the objective. Springer, 2015, [link](#).
- Schrödinger, Erwin. What is life?: With mind and matter and autobiographical sketches. Cambridge university press, 1992, [link](#).
- Mayr, Ernst. This is biology : the science of the living world. Harvard University Press, 2001, [link](#).
- Banatre, Jean-Pierre, et al., eds. Unconventional Programming Paradigms: International Workshop UPP 2004, Le Mont Saint Michel, France, September 15-17, 2004, Revised Selected and Invited Papers. Vol. 3566. Springer Science & Business Media, 2005, [link](#).