

# Mathematics in Bio-Computing

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- 2 DNA Operations
- 3 Peptides and Antibodies
- 4 Formal Models in Bio-Computing
  - DNA Computing
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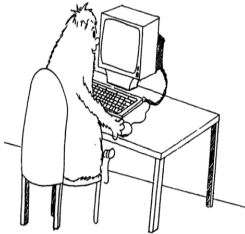
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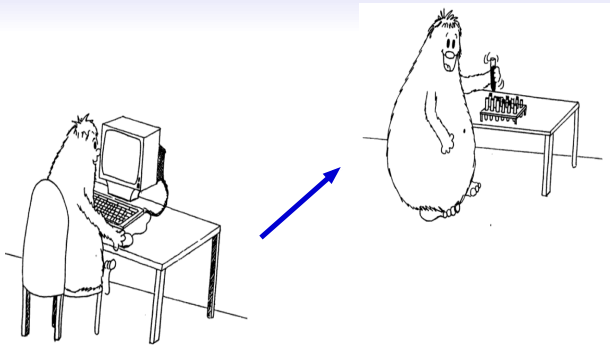
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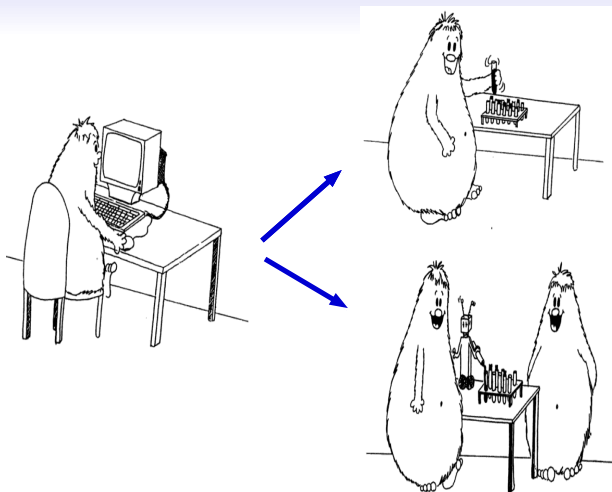
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Pictures from book: DNA Computing. New  
Computing Paradigms

Richard Feynman's visionary talk on sub-microscopic computers.

## From *Computing with Cells and Atoms* by Cristian S. Calude and Gh. Păun

*...It seems that progress in electronic hardware (and the corresponding software engineering) is not enough; for instance, the miniaturization is approaching the quantum boundary, where physical processes obey laws based on probabilities and non-determinism, something almost completely absent in the operation of classical computers. So, new breakthrough is needed...*

# Natural Computing

## Bio

- DNA hybridization
- Immune reaction
- Membrane computing using cells

## Others

- Quantum mechanical phenomena
- Reaction-diffusion process

# DNA Strands



- DNA consists of polymer chains – DNA strands.
- Chain consists of nucleotides that differ only in their bases.
- There are four bases: *A* (adenine), *G* (guanine), *C* (cytosine) and *T* (Thymine).
- Double-helical structure is formed through bonding of two strands. Watson-Crick complementarity – *A* always bonds with *T* and *G* with *C*.
- Orientation of DNA strands: 5' to 3'(upper) and 3' to 5'(lower).

# Operations on DNA

- The length of a DNA strand can be measured using gel electrophoresis.
- A known DNA strand can be fished in a solution containing many DNA strands using a filtering method.
- A double stranded DNA can be denatured into two single strands by heating.
- Two DNA strands can be hybridized into a single double stranded DNA molecule (DNA strands bind together respecting the Watson-Crick complementary property).

# Operations on DNA

- A class of enzymes called polymerase can lengthen a partially double stranded to make it as a complete double stranded molecule.
- Enzymes called restriction endonucleases cut DNA strands at the specific site where a specific sequence of nucleotides are present.
- Enzymes ligases can paste two DNA strands with overhanging ends provided those ends are Watson-Crick complementary of each other. This process is called ligation.
- Specific set of DNA sequences can be multiplied using a polymerase chain reaction.
- The exact sequence in the DNA strand can be found out by polymerase action on the strand. This process is called sequencing.

# DNA Strands

**TATAGCCGCTCGATTACGGC**  
**GCTAATGCCG CGGCGCGTAT**

Two sticky ends



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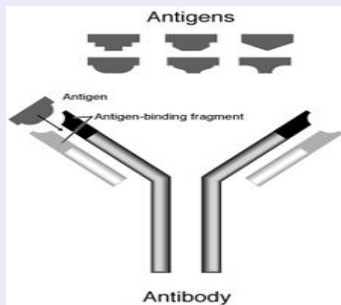
Single strand

# About complementarity

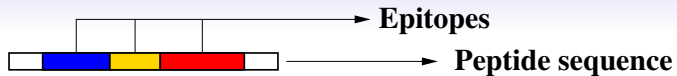
- Watson-Crick complementarity is given by nature.
- Note that on the condition that the bases are complementary in nature the two strands bind – hence in the perspective of computation we can view it as *in vitro* the hybridization takes place on some condition  $D$  being satisfied.
  - this gives the notion of computing.
  - this also resembles the transition function of a Turing machine.
  - this can be exploited at least for *in vitro* experiments.

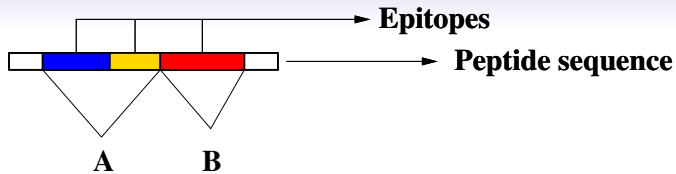
# Peptides and Antibodies

- Peptides – short proteins – sequence over 20 basic amino acids.
- Interactions between peptides and antibodies – Immune reactions.
- Antibodies recognize specific sequence in peptides – epitopes.
- Affinity power of antibodies presents an option to remove and attach antibodies – resembles a rewriting system

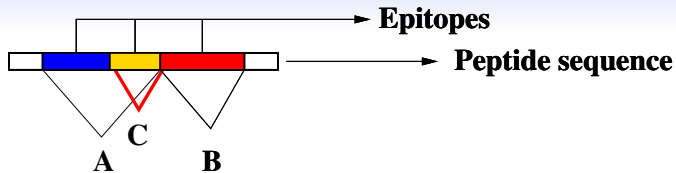


**Figure:** Antibody-antigen binding



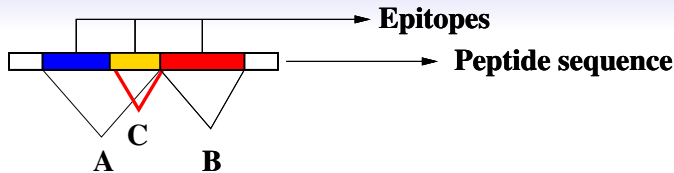


**Peptide sequence with antibodies**

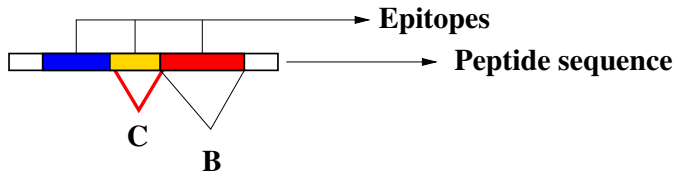


**Peptide sequence with antibodies**





**Peptide sequence with antibodies**



**Peptide sequence with antibodies**

# Peptides and Antibodies

- Epitopes for different antibodies or same antibody can overlap.
- There is a power called affinity associated with the binding of antibodies to its epitopes.
- One antibody can have more than one epitopes to bind with.
- There can be many antibodies that bind to a single or overlapping epitopes.

# Bio-Computing

- Interactions between molecules as a computing model.
  - DNA hybridization,
  - DNA splicing,
  - Binding of antibodies to epitopes and so on.
- Massively parallel and non-deterministic.
  - Multiple copies of molecules – multiset.
- Has the potential to solve hard problems easily.
  - Brute force in a massively parallel way.
- Energy efficient.

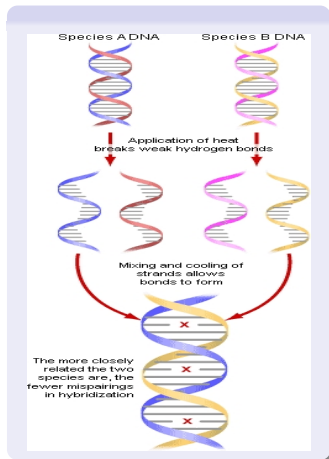
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# DNA Computing

- Uses DNA strands and the interactions between strands as operations.
- Interactions are DNA hybridization, splicing and so on.
- Note that we will be having multiple copies of each strands so many things happen at the same time.
- Hence it is massively parallel and highly non-deterministic.

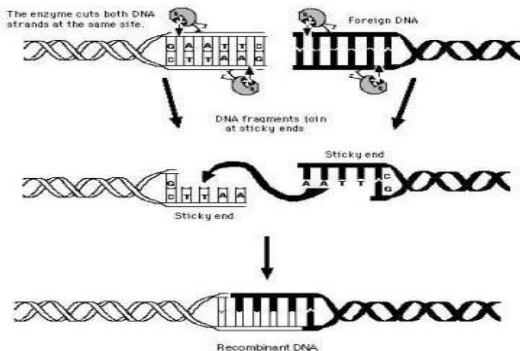
# DNA hybridization



- DNA splicing resembles a rewriting process.
- Cutting of two DNA strands at specific sites and making fragments of DNA.
- If the sticky ends of the fragments of DNA are complementary in nature then they recombine to form new DNA strands.
- Note that there will be several copies of DNA strands floating around – Parallel and non-deterministic.

# Recombinant DNA

## Restriction Enzyme Action of EcoRI



# Tom Head's work

- Tom Head in 1987 gave a mathematical model for the recombinant behavior of DNAs by defining Splicing systems.
  - His work combined Formal language theory and Molecular biology.
  - He treated a DNA strand as a linear string or word over 4 alphabet  $[A/T]$ ,  $[C/G]$ ,  $[G/C]$  and  $[T/A]$ .
  - His definition of splicing system resembles the recombinant behavior of DNA.
  - His study was aimed at the analysis of the generative capacity of these type of systems.



# Splicing system

- Splicing system is also called as  $H$ -system.
- The generative capacity of  $H$ -system is studied with respect to the Chomskian hierarchy of languages.
- A splicing operation over two words is defined as follows:

Let the splicing rule be given by  $(u_1 \# u_2 \$ u_3 \# u_4)$  where  $u_i$ s are strings over a finite alphabet.

The result of splicing  $x$  and  $y$  are  $z$  and  $w$  if and only if  $x = x_1 u_1 u_2 x_2$ ,  $y = y_1 u_3 u_4 y_2$  and  $z = x_1 u_1 u_4 y_2$ ,  $w = y_1 u_3 u_2 x_2$ .

- The splicing system or  $H$ -system is a generative system that uses this splicing operation as a basic tool.

## $H$ scheme

For an  $H$  scheme  $\sigma = (V, R)$  and a language  $L \subseteq V^*$  we define

$$\sigma_1^0(L) = L,$$

$$\sigma_1^{i+1} = \sigma_1^i(L) \cup \sigma_1(\sigma_1^i(L)), i \geq 0,$$

and

$$\sigma_1^*(L) = \bigcup_{i \geq 0} \sigma_1^i(L).$$

## $H$ Scheme

For two families of languages  $FL_1$  and  $FL_2$  we define

$$H(FL_1, FL_2) = \{\sigma_1^*(L) \mid L \in F \in FL_1, \sigma = (V, R) \text{ with } R \in FL_2\}.$$

For an  $H$  scheme  $\sigma = (V, R)$  where  $R$  is finite, we define the radius of  $\sigma$  as

$$\text{radius}(\sigma) = \max(|x| \mid x = u_i, 1 \leq i \leq 4, \text{ for } u_1 \# u_2 \$ u_3 \# u_4 \in R\}.$$

If the radius of  $H$  scheme is bounded by a positive number  $p$  then it is denoted by  $H(FL, [p])$ .

# Other models

- Sticker systems
- Self-assembly systems
- Insertion-deletion systems
- Watson-Crick Automata

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# Peptide Computing

- Proposed by H. Hug and R. Schuler [Hug,Schuler 2001].
- Solve some difficult combinatorial problems.
  - Satisfiability problem.
  - Hamiltonian path problem [M.S. Balan et al 2002].
- Universally complete [M.S. Balan et al 2002].

# Formal Model for Peptide Computing

- Capabilities and limitations of this computing paradigm
- Understand how immune system computes

# Peptide Computer

Quintuple:  $\mathcal{P} = (X, E, A, \alpha, \beta)$

- $X$  is a finite alphabet;
- $E \subseteq X^+$  is a language;
- $A$  is a countable alphabet with  $A \cap X^* = \emptyset$ ;
- $\alpha \subseteq E \times A$  is a relation;
- $\beta : E \times A \rightarrow \mathbb{R}_+$  is a mapping such that  $\beta(e, a) > 0$  if and only if  $(e, a) \in \alpha$ .



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# Peptide Computer

- A-attachment: partial mapping  $\tau$  from decomposition of  $w \in X^*$  with respect to  $E$  to  $A$ .  $z = w_\tau$ .
- If affinity of  $a$  is more in  $z$  we say it dominates.
- Reaction between words and symbols – if  $a$  dominates  $(i, j)$  in  $z$  then multiset  $R(z, a)$  is formed and  $\tau \rightarrow \tau'$ .
- Reaction between words – if  $a$  in  $z'$  dominates some position in  $z$ .

# About reactions

- Reactions occur when instability occurs:
  - $a$  dominates  $(i, j)$  in  $z$ .
  - $a$  in  $z'$  dominates  $(i, j)$  in  $z$ .
- One basic reaction can trigger a sequence of reactions.

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# Definitions

- *Peptide configuration* is a finite multiset of words in  $(X \cup \alpha)^+ \cup A$ .
- Peptide configuration  $P$  is said to be *stable* if  $R(P) = \{P\}$ .
- *Peptide instruction* has the form  $+P$  or  $-P$  where  $P$  is a peptide configuration.
- *Peptide program* is the one which controls the instruction set and the halting function.
- *Peptide computation* is a sequence of transition of stable configurations from  $c_0, c_1 \cdots c_i$  (with respect to the peptide program) where  $\chi(c_i) = 1$  for the first time.
- A function  $f$  is peptide computable if we proper encoding and decoding together with a peptide program to carry out the computation.

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# Other Models

## Automaton Models inspired by Peptide Computing

- Binding-Blocking Automata
- String Binding-Blocking Automata
- Rewriting Binding-Blocking Automata



# Remarks

- Unwanted DNA hybridization:
  - Theory of codes is being used to design DNA strands.
- Cross-reactivity in peptide-antibody interactions:
  - Theory of codes can be used.
- Three dimensional structure of proteins.
- Automation issues.

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