

# Tutorial on Molecular Computing

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## 1 Introduction

- Computing
- DNA strands
- Peptides and Antibodies

## 2 DNA Computing

- What is DNA Computing
- First papers on DNA Computing
- Theoretical Models

## 3 Peptide Computing

- As a Computational Model
- Solving SAT Problem
- Hamiltonian Path Problem
- Theoretical Models

## 4 Remarks and Open Problems

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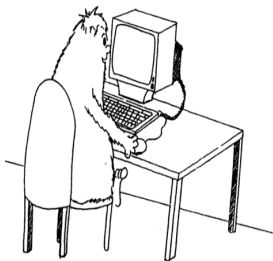
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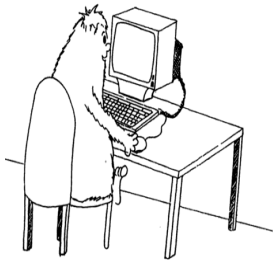
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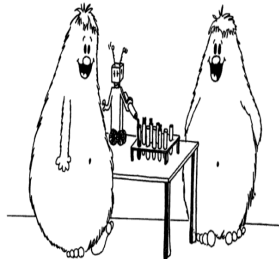
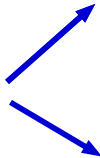
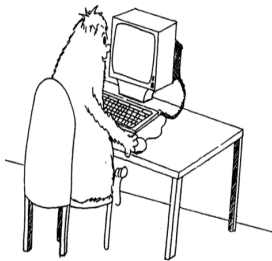
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# Computing...

## What is computing...

Turing model:

- Finite number of symbols.
- Finite number of state of the system.
- Transition of the system.
- Head reading finite number of symbols at a time.
- An infinite tape to (re)write.

# Silicon Computers

## Facts

- Computes “fast”,
- Stores huge amount of data,
- Retrieves data fast,
- Communicates fast.

## Limits

- Problems that have no efficient algorithms - Is  $NP=P$ ? is still open.
- Physical limits in terms of speed.
- Deterministic and sequential machines.
- Lack of machines that can do intellectual work on our behalf.
- Security, fault-tolerance – attacks, faults are pre-defined.

## 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

## Others

- Quantum mechanical phenomena
- Reaction-diffusion process

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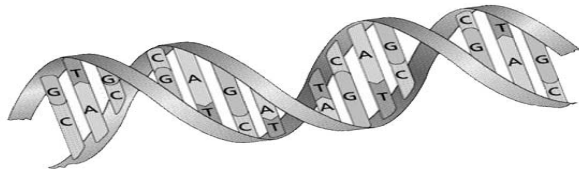
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# DNA Strands



- 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.
- *A* always bonds with *T* and *G* with *C*.

# 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 polymerases 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

# DNA Strands

```
TATAGCCGCTCGATTACGGC  
GCTAATGCCG CGGCGCGTAT
```

Two sticky ends

```
TATAGCCGCTCGATTACGGC  
GCTAATGCCG
```

One sticky end

# DNA Strands

**TATAGCCGCTCGATTACGGC**  
**GCTAATGCCG CGGCGCGTAT**

Two sticky ends

**TATAGCCGCTCGATTACGGC**  
**GCTAATGCCG**

One sticky end

**TATAGCCGCTCGATTACGGC GCGCGCATATACGATGTAT**  
**GCTAATGCCG CGGCGCGTAT**

Two sticky ends

# DNA Strands

**TATAGCCGCTCGATTACGGC**  
**GCTAATGCCG CGGCGCGTAT**

Two sticky ends

**TATAGCCGCTCGATTACGGC**  
**GCTAATGCCG**

One sticky end

**TATAGCCGCTCGATTACGGC GCCGCGCATATACGATGTAT**  
**GCTAATGCCG CGGCGCGTAT**

Two sticky ends

**GCCGCGCATATACGATGTAT**

Single strand

# About complementarity

- Watson-Crick complementarity is given by nature.
- Without complementarity it will be many-many relations which will be quite uninteresting.
- 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.

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# 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

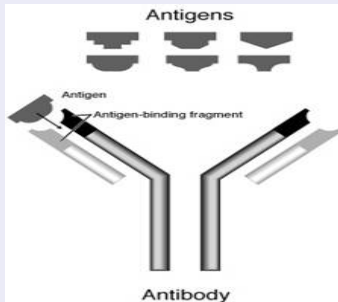
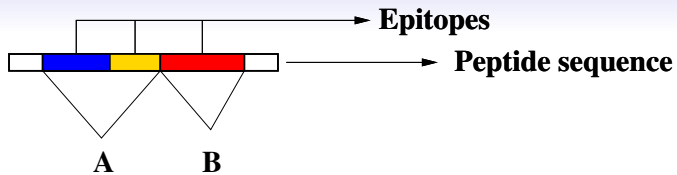


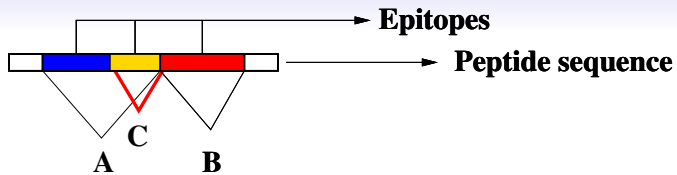
Figure: Antibody-antigen binding



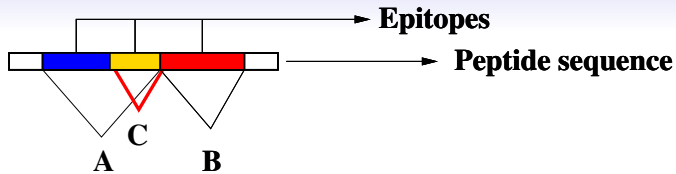




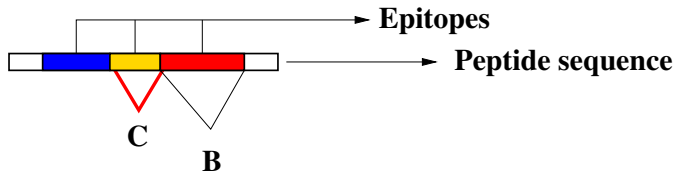
**Peptide sequence with antibodies**



**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 epitope to bind with.
- There can be many antibodies that bind to a single or overlapping epitopes.

# Molecular 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.

# Outline

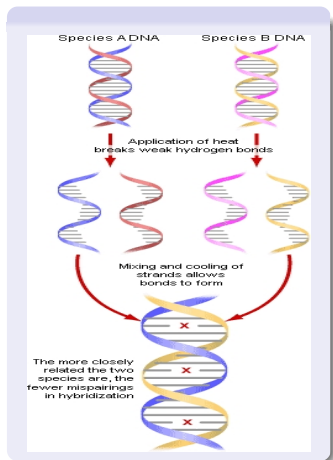
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# DNA Computing

- 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.



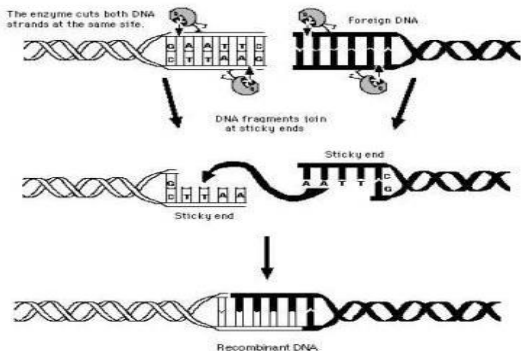
# DNA hybridization



- 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



# DNA Computing

- Prepare specific DNA strands according to the problem.
- Allow them to hybridize and form various strands that denotes all possible solutions of the problem.
- Explore those DNA strands and eliminate the strands that will not lead to solution.
- At the end of final elimination step if we find a strand then that will be the solution for the problem.
- Adleman's experiment in 1994 (Science) to find Hamiltonian path of the given instance of a graph.

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## Tom Heads' 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.

# Adleman's' Experiment

- Adleman in 1994 took an instance of a graph and using DNA strands and DNA hybridization solved the Hamiltonian path problem in the wetlab.
- Basic idea in this work was elimination method.
- Using inherent parallelism in the model explore all the possible paths and eliminate those not satisfying the conditions for a Hamiltonian path.

# Adleman's' Experiment

## Problem statement

The Hamiltonian path problem (HPP) is stated as follows:

Input: A directed graph  $G$  with  $n$  vertices, among which  $v_{in}$  and  $v_{out}$  are designated vertices.

Output: Yes if any path remains, No otherwise.

# Adleman's' Experiment

## Non-deterministic algorithm:

- 1 Random paths in  $G$  are generated in large quantities.
- 2 Paths that do not begin with  $v_{in}$  and end in  $v_{out}$  are eliminated.
- 3 All paths that do not involve exactly  $n$  vertices are rejected.
- 4 Keep only those paths where all  $n$  vertices are represented.



# Adleman's' Experiment

## Preprocessing steps:

- Specific DNA strands are selected for each vertices.
- For each vertex  $i$  associate a random 20-mer sequence, say  $s_i$ .
- For each edge  $e_{ij}$  from vertex  $i$  to vertex  $j$  choose a 20-mer sequence  $s_{ij}$  where
  - If the vertex is not a start or end vertex then the prefix consists of 10-mer suffix of  $s_i$  and 10-mer prefix of  $s_j$ .
  - If the vertex is a start or end vertex then the sequence will be whole of  $s_i$ .

ATATCGGCGAGCTAATGCCG      CGGCGCGTATATGCTACATA

Figure: DNA strands for vertices

GCTAATGCCGCGGCGCGTAT

Figure: DNA strand for edge

TATAGCCGCTCGATTACGGC | GCCGCGCATATACGATGTAT  
 GCTAATGCCG | CGGCGCGTAT

Figure: After DNA hybridization

# Adleman's' Experiment

## Generating paths

- For each vertex  $i$ ,  $\bar{s}_i$  and for each edge  $e_{ij}$ , the sequence  $s_{ij}$  are mixed and put in a soup.
  - The DNA sequence  $\bar{s}_i$  serves as a splint to bring nucleotides associated with compatible edges together for ligation.
  - At the end of this step we have generated all possible paths and much more in the graph.

# Adleman's' Experiment

## Generating paths

- Next step is elimination:
  - Using filtering technique keep those sequences that start with vertices  $v_{in}$  and  $v_{out}$ .
  - Check the length of the sequences to see if it has  $n$  vertices in it (it has to be of length  $20 \times n$  (In this case it has to be length 140-mer, since there are 7 vertices).
  - Do a filtering method again to check if all  $n$  vertices are in the path..
- If there are any DNA strands left in the soup then the answer is there is a Hamiltonian path in the graph or else there is no Hamiltonian path.

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## 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.

## Definition

An extended  $H$  system is a quadruple  $\gamma = (V, T, A, R)$  where  $V$  is an alphabet,  $T \subseteq V$ ,  $A \subseteq V^*$ , and  $R \subseteq V^* \# V^* \$ V^* \# V^*$ ;  $\#$ ,  $\$$  are special symbols not in  $V$ .

$V$  is the alphabet of,  $T$  is the terminal alphabet,  $A$  is the set of axioms, and  $R$  is the set of splicing rules; the symbols in  $T$  are called terminals and those in  $V - T$  are called nonterminals.

For  $x, y, z, w \in V^*$  and  $r = u_1 \# u_2 \$ u_3 \# u_4$  in  $R$  we define  $(x, y) \vdash_r (z, w)$  if and only if  $x = x_1 u_1 u_2 x_2$ ,  $y = y_1 u_3 u_4 y_2$  and  $z = x_1 u_1 u_4 y_2$ ,  $w = y_1 u_3 u_2 x_2$  for some  $x_1, x_2, y_1, y_2 \in V^*$

## Definition

For an  $H$  system  $\gamma = (V, T, A, R)$  and for any language  $L \subseteq V^*$ , we write

$$\sigma(L) = \{z \in V^* \mid (x, y) \vdash_r (z, w) \text{ or } (x, y) \vdash_r (w, z), \text{ for some } x, y \in L\}$$

and we define

$$\sigma^*(L) = \bigcup_{i \geq 0} \sigma^i(L),$$

where

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

for  $i \geq 0$ .

The language generated by the  $H$  system is defined by

$$L(\gamma) = \sigma^*(A) \cap T$$



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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].

# Peptide Computing

- Peptides are sequence over 20 basic amino acids.
- Interactions between peptides and antibodies is the basic operations.
- Antibodies recognizes a subsequence of a peptide, called epitopes, by binding to it.
- Binding of antibodies to epitopes has associated power called affinity.
- Higher priority to the antibody with larger affinity power.
- Affinity power of antibodies presents an option to remove and attach antibodies – resembles a rewriting system.

# Computing Model

- Form peptide sequences for each possible solution of the given problem – preprocessing step.
- Choose antibodies according to the current instance of the problem.
- Eliminate those sequences that will not lead to solutions.
- End of experiment – if the fluorescence is detected then a solution exist.
- Decipher the sequence to find the solution.

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# Satisfiability Problem

## Problem

Let  $F$  be a formula over  $n$  variables. Does there exist an assignment of truth values to every variable in  $F$  such that  $F$  becomes *true*.

# Satisfiability Problem

- Let  $F$  be formula in conjunctive normal form
- There are  $n$  variables
- Find an assignment that makes  $F$  *true*
- There are  $2^n$  possible assignments

# Satisfiability Problem

## Formula

$$F = (v_1 \vee \neg v_2) \wedge \neg v_2 \wedge (v_1 \vee v_2)$$

## Possible Assignments

$X_i$	$X_i(v_1)$	$X_i(v_2)$
$X_1$	<i>false</i>	<i>false</i>
$X_2$	<i>false</i>	<i>true</i>
$X_3$	<i>true</i>	<i>false</i>
$X_4$	<i>true</i>	<i>true</i>



# Satisfiability Problem

## Formula

$$F = (v_1 \vee \neg v_2) \wedge \neg v_2 \wedge (v_1 \vee v_2)$$

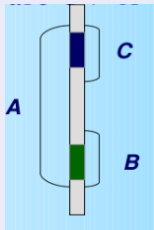
## Possible Assignments

$X_i$	$X_i(v_1)$	$X_i(v_2)$
$X_1$	<i>false</i>	<i>false</i>
$X_2$	<i>false</i>	<i>true</i>
$X_3$	<i>true</i>	<i>false</i>
$X_4$	<i>true</i>	<i>true</i>

# Satisfiability Problem

- For each assignment prepare a peptide and different antibodies binding to overlapping epitopes
- Binding affinities are  $C > A > B$

## Single peptide

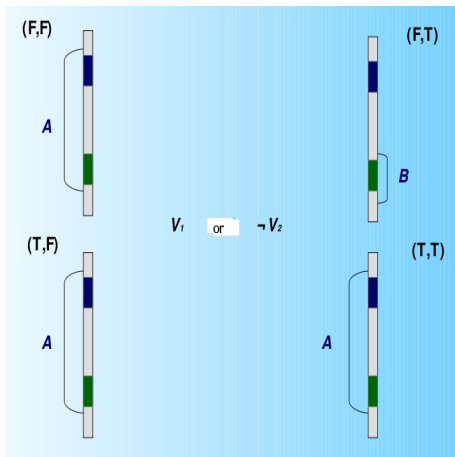


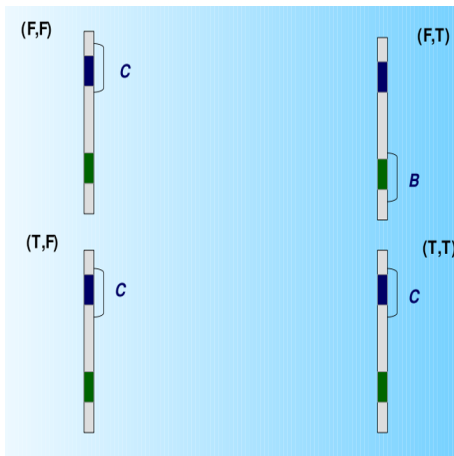
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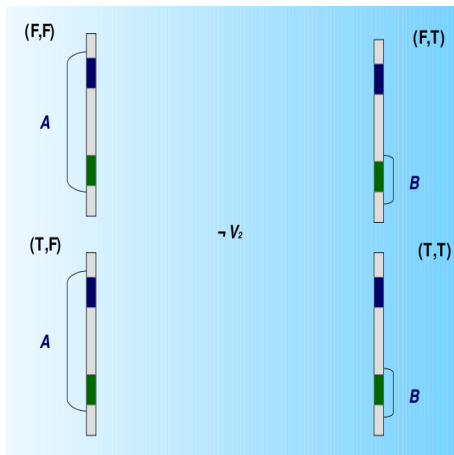
- Prepare partial solutions  $G_1, G_2, \dots, G_k$  where  $G_i$  contains antibody  $A$  if  $C_i$  is *true* under corresponding assignment  $X$
- $G_1 = \{A_1, A_3, A_4\}, G_2 = \{A_1, A_3\}, G_3 = \{A_2, A_3, A_4\}$

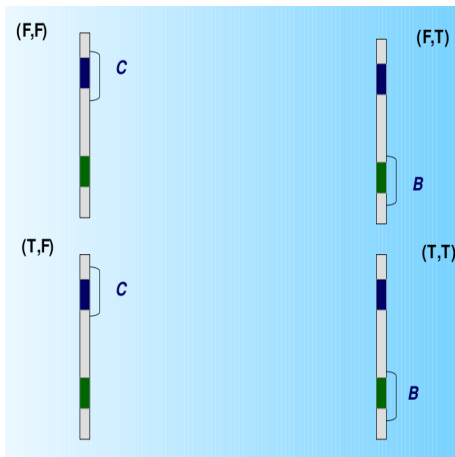
# Algorithm

- 1 Let  $m = k$ . While  $m > 0$ , repeat the following steps:
  - 1 The antibody set  $G_m$  is added. The antibodies  $A$  of  $G_m$  bind to their epitopes.
  - 2 Antibodies  $B$  are added. Antibodies  $B$  bind to all free binding sites for  $B$ .
  - 3 Antibodies  $C$  are added. Antibody  $C$  binds to all of its epitopes, since it has the highest binding affinity. Note that all antibodies  $A$  of set  $G_m$  are removed, whereas antibodies  $B$  remain bound to their epitopes.
  - 4 Antibodies  $C$  are removed by adding epitopes for  $C$  in excess.
  - 5 All remaining antibodies are attached to their epitopes by adding linker.
  - 6 Let  $m = m - 1$ .
- 2 Add labelled antibody  $A$  or  $B$ .
- 3 Detect whether there are labelled antibodies present.

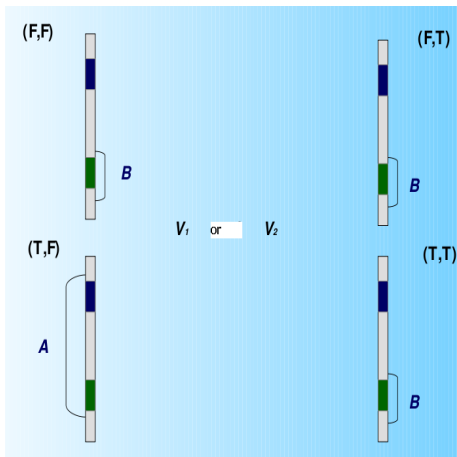


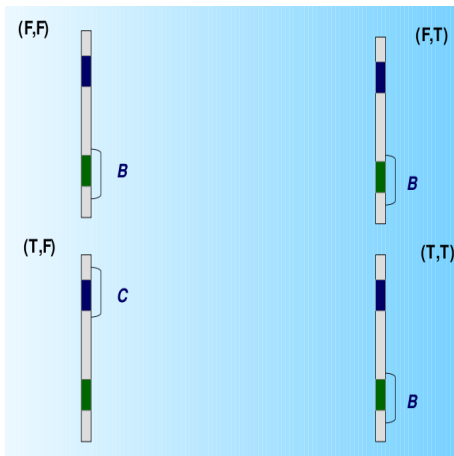


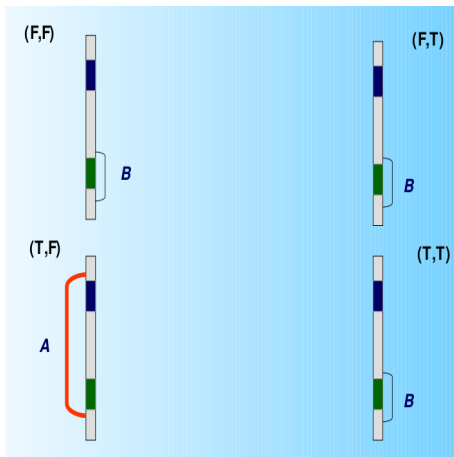












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# Hamiltonian Path Problem

- $G = (V, E)$  is a directed graph;
- $V = \{v_1, v_2, \dots, v_n\}$  is the vertex set;
- $E = \{e_{ij} \mid v_i \text{ is adjacent to } v_j\}$  is the edge set  
 $v_1$  – source vertex and  $v_n$  – end vertex.
- Problem: Test whether there exists a Hamiltonian path between  $v_1$  and  $v_n$ .

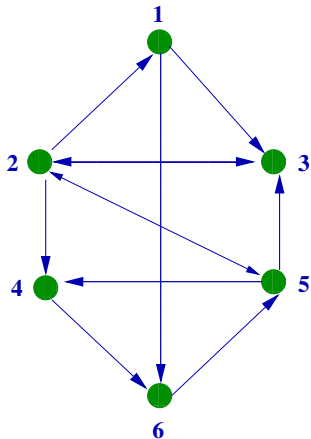
# Peptides Formation

- Each vertex  $v_i$  has a corresponding epitope  $ep_i$ ,
- Each peptide has  $ep_1$  on one extreme and  $ep_n$  on the other extreme,
- Each peptide has a doubly duplicated permutation of  $ep_2, \dots, ep_{n-1}$  in between  $ep_1$  and  $ep_n$ .

# Antibody Formation

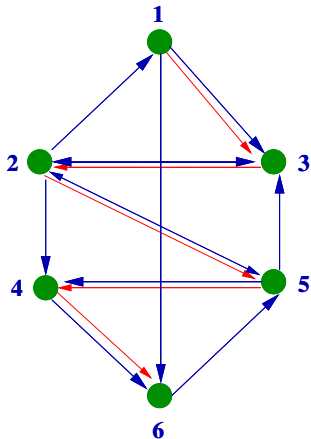
- Form antibodies  $A_{ij}$  – site =  $ep_i ep_j$  if  $v_j$  is adjacent to  $v_i$ ,
- Form antibodies  $B_{ij}$  – site =  $ep_i ep_j$  if  $v_j$  is not adjacent. to  $v_i$ ,
- Form antibody  $C$  – site is the whole of peptide,
- $Affinity(B_{ij}) > Affinity(C)$
- $Affinity(C) > Affinity(A_{ij})$

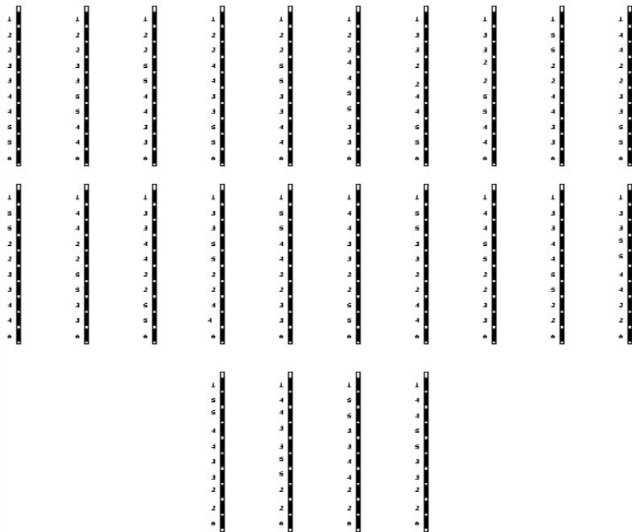
# Graph $G$

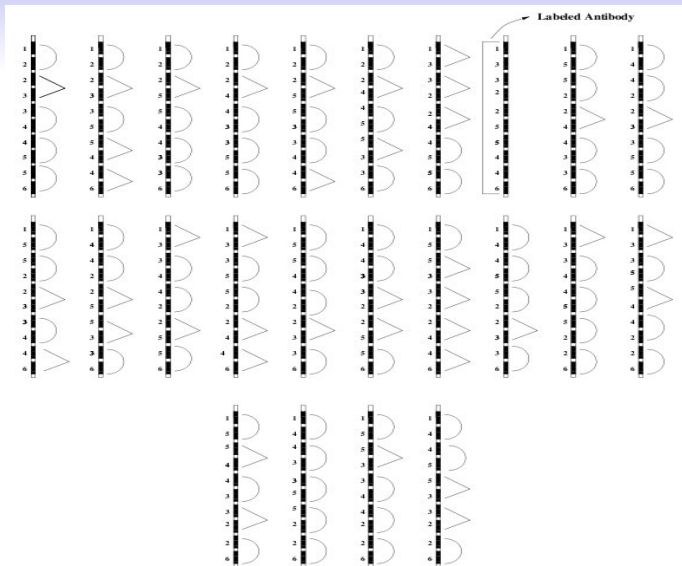


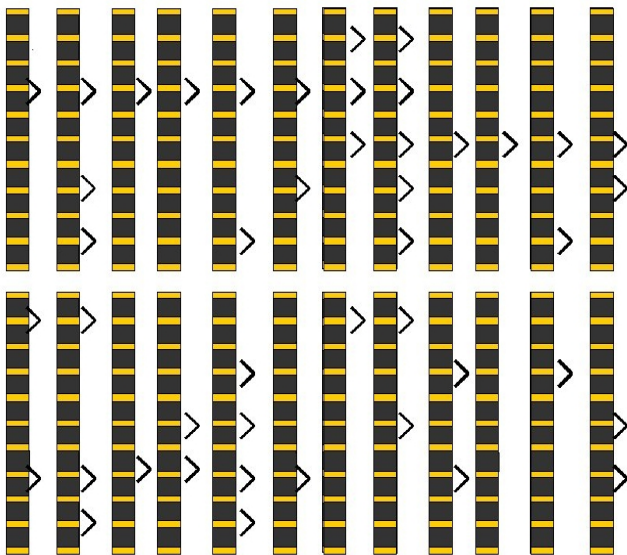


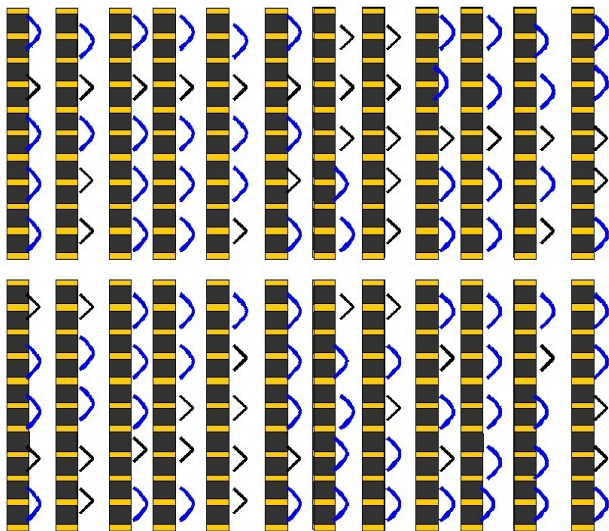
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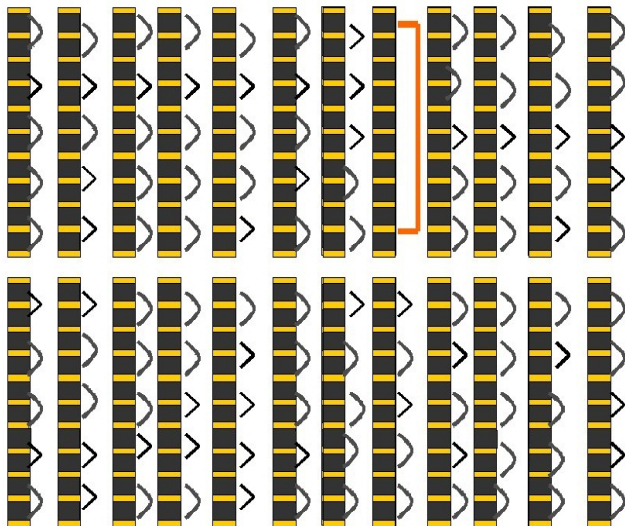


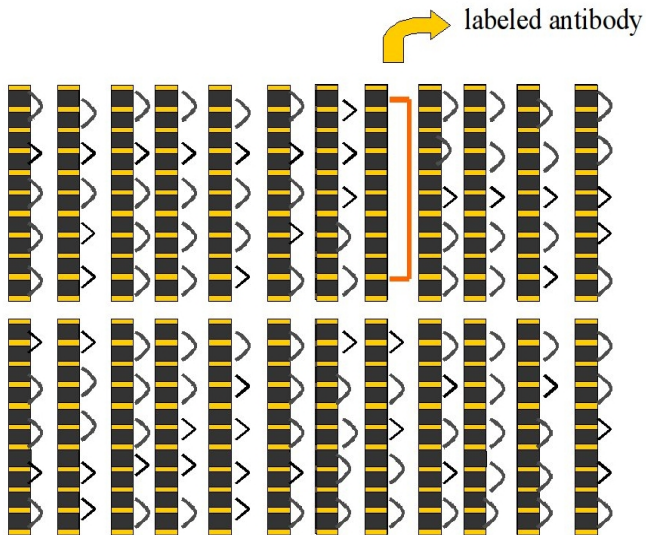












# Complexity

- Number of peptides =  $(n - 2)!$
- Length of peptides =  $O(n)$
- Number of antibodies =  $O(n^2)$
- Number of Bio-steps is constant



# Outline

- 1 Introduction**
  - Computing
  - DNA strands
  - Peptides and Antibodies
- 2 DNA Computing**
  - What is DNA Computing
  - First papers on DNA Computing
  - Theoretical Models
- 3 Peptide Computing**
  - As a Computational Model
  - Solving SAT Problem
  - Hamiltonian Path Problem
  - Theoretical Models
- 4 Remarks and Open Problems**

# Formal Model for Peptide Computing

- Capabilities and limitations of this computing paradigm
- Computability implies peptide computability. Converse?
- If converse true, under what conditions?

# 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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# Sufficiency Condition

Peptide computer is simulated by a Turing machine if

- 1  $E$  and  $A$  are (at least) computably enumerable
- 2  $\alpha$  is decidable
- 3  $\beta$  and  $\chi$  are computable

# Other Models

## Automaton Models inspired by Peptide Computing

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

Modelling gate operations and Boolean circuits

Model to do binary addition in parallel

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# Solving Hard Problems

## Problems

- Existing methods encode all possible solutions, hence number of molecules is exponential [Hartmanis 1995]
- Preprocessing steps

# Solving Hard Problems

## Possible Solutions

- Incremental (building) elimination of peptide sequence; compare with [M. Arita et al 1997] in DNA Computing.
  - Reduces number of peptide sequences
  - Preprocessing steps are avoided but included as a part of algorithm
  - Number of steps increases in the order of input size
  - What kind of problems can be solved in this way?
  - Will be an interesting problem to look into in Molecular computing as a whole



Do we have to change the computing paradigm for molecular computing to a series of partial encodings and processing before decoding?

# Future Problems

- Try solving a small instance of the Hamiltonian path problem in wetlab
- Extend that to basic operations
- Study how the theoretical model works out in wetlab
- Defining basic operations for peptide computing: using ideas from aqueous computing [Tom Head et al 2002]
- Conditions for a peptide computer where each step ends within a finite number of iterations
- Dynamic non-determinism in peptide computer

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# Future Problems

## On Immunity-based Systems[Ishida 2004] and Peptide Computing

### Immunity-based System

Information processing  
Self-nonsel self distinguishing  
Survival is the main concern

### Peptide Computing

Computational model  
Self-nonsel self model  
Computing is the main concern

Study about common area between these two fields