# Using sticker to solve the 3-dimensional matching problem in molecular supercomputers

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Abstract: Adleman demonstrated that DNA (*Deoxyribonucleic acid*) strands could be applied for dealing with solutions to an instance of the NP-complete Hamiltonian path problem (HPP) (Adleman, 1994). The Adleman techniques could also be used to solve the NP-complete satisfiability (SAT) problem (the first NP-complete problem) (Lipton, 1995). Furthermore, *sticker* is used for enhancing the Adleman-Lipton model (Roweis et al., 1999). In this paper, we first use sticker to construct solution space of DNA library sequences for the 3-dimensional matching problem. Then, in the Adleman-Lipton model, we propose an algorithm to remove illegal solution and find legal solution for the 3-dimensional matching problem from solution space of sticker. Finally, a simulation result for our algorithm is generated.

**Keywords:** molecular supercomputing; DNA-based parallel algorithms; the NP-complete problem; parallel computing.

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#### **1** INTRODUCTION

Nowadays, it is possible to produce roughly  $10^{18}$  DNA strands that fit in a test tube through advances in molecular biology (Sinden, 1994). Those  $10^{18}$  DNA strands can be applied for representing  $10^{18}$  bit information. Basic biological operations can be used to simultaneously operate  $10^{18}$  bit information. This is to say that there are  $10^{18}$  data processors to be parallel executed. Hence, it is very obvious that biological computing can provide very huge parallelism for dealing with the problem in real world.

Adleman wrote the first paper in which it was demonstrated that DNA (*deoxyribonucleic acid*) strands could be applied for figuring out solutions to an instance of the NP-complete Hamiltonian path problem (HPP) (Adleman, 1994). Lipton wrote the second paper in which it was shown that the Adleman techniques could also be used to solving the NP-complete satisfiability (SAT) problem (the first NP-complete problem) (Lipton, 1995). Adleman and his co-authors proposed *sticker* for enhancing the Adleman-Lipton model (Roweis et al., 1999).

In this paper, we use *sticker* to construct solution space of DNA library sequences for the 3-*dimensional matching problem*. Simultaneously, we also apply DNA operations in the Adleman-Lipton model to develop one DNA algorithm. The main result of the proposed DNA algorithm shows that the 3-*dimensional matching problem* is resolved with biological operations in the Adleman-Lipton model from solution space of sticker. Furthermore, this work represents obvious evidence for the ability of DNA-based computing to solve the NP-complete problem.

The rest of this paper is organised as follows. In Section 2, the Adleman-Lipton model is introduced in detail and the comparison of the model with other models is also given. In Section 3, the first DNA algorithm is proposed for solving the 3-dimensional matching problem from solution space of

sticker in the Adleman-Lipton model. In Section 4, the experimental result of simulated DNA computing is also given. Conclusions are drawn in Section 5.

#### 2 DNA MODEL OF COMPUTATION

In subsection 2.1, the summary of DNA structure and the Adleman-Lipton model is described in detail. In subsection 2.2, the comparison of the Adleman-Lipton model with other models is also introduced in detail.

#### 2.1 The Adleman-Lipton model

acid) DNA (deoxyribonucleic is a polymer, А is strung together from monomers called which deoxyribonucleotides (Sinden, 1994; Paun et al., 1998). Distinct nucleotides are detected only with their bases, which come from adenine, guanine, cytosine, and thymine. Those bases are abbreviated as A, G, C, and T, respectively. A DNA strand is essentially a sequence (polymer) of four types of nucleotides detected by one of four bases they contain (Sinden, 1994; Boneh et al., 1996; Paun et al., 1998). Two strands of DNA can form (under appropriate conditions) a double strand, if the respective bases are the Watson-Crick complements of each other -A matches T and C matches G; also 3' end matches 5' end. The length of a single stranded DNA is the number of nucleotides comprising the single strand. Thus, if a single stranded DNA includes 20 nucleotides, then we say that it is a 20-mer (it is a polymer containing 20 monomers). The length of a double stranded DNA (where each nucleotide is base paired) is counted in the number of base pairs. Thus, if we make a double stranded DNA from a single stranded 20-mer, then the length of the double stranded DNA is 20-base pairs, also written as 20 bp. (More

discussion of the relevant biological background refers to Sinden, 1994; Boneh et al., 1996; Paun et al., 1998.)

In the Adleman-Lipton model (Adleman, 1994; Lipton, 1995), *splints* were used to construct to correspond to the edges of a particular graph, the paths of which represented all possible binary numbers. As it stands, their construction indiscriminately builds all splints that lead to a complete graph. This is to say that hybridisation has higher probabilities of errors. Hence, Adleman and his co-authors (Roweis et al., 1999) proposed the sticker-based model, which was an abstract model of molecular computing based on DNA with a random access memory and a new form of encoding the information, to enhancing the Adleman-Lipton model.

The DNA operations proposed by Adleman and Lipton, cited from Adleman (1994), Lipton (1995), Boneh et al. (1996), and Adleman (1996), are described below. These operations will be used for calculating solutions of the 3-dimensional matching problem.

#### The Adleman-Lipton model:

A (test) tube is a set of molecules of DNA (i.e., a multi-set of finite strings over the alphabet  $\{A, C, G, T\}$ ). Given a tube, one can perform the following operations:

- *Extract.* Given a tube *P* and a short single strand of DNA, *S*, produce two tubes +(*P*, *S*) and -(*P*, *S*), where +(*P*, *S*) is all of the molecules of DNA in *P* which contain the short strand *S* and -(*P*, *S*) is all of the molecules of DNA in *P* which do not contain the short strand *S*.
- *Merge.* Given tubes  $P_1$  and  $P_2$ , yield  $\cup (P_1, P_2)$ , where  $\cup (P_1, P_2) = P_1 \cup P_2$ . This operation is to pour two tubes into one, with no change of the individual strands.
- *Detect.* Given a tube *P*, say 'yes' if *P* includes at least one DNA molecule, and say 'no' if it contains none.
- *Append*. Given a tube *P* and a short strand of DNA, *Z*, the operation will append the short strand, *Z*, onto the end of every strand in the tube *P*.
- *Discard*. Given a tube *P*, the operation will discard the tube *P*.
- *Read.* Given a tube *P*, the operation is used to describe a single molecule, which is contained in the tube *P*. Even if *P* contains many different molecules each encoding a different set of bases, the operation can give an explicit description of exactly one of them.

#### 2.2 Other related work and comparison with the Adleman-Lipton model

Techniques in the Adleman-Lipton model could be used to solve the NP-complete Hamiltonian path problem and satisfiability (SAT) problem in linearly increasing time and exponentially increasing volumes of DNA (Adleman, 1994; Lipton, 1995). Quyang et al. (1997) showed that restriction enzymes could be used to solve the NP-complete clique problem (MCP). The maximum number of vertices that they can process is limited to 27 because the size of the pool with the size of the problem exponentially increases (Quyang et al., 1997).

Arita et al. (1997) described new molecular experimental techniques for searching a Hamiltonian path. Morimoto et al. (1999) offered a solid-phase method to finding a Hamiltonian path. Narayanan and Zorbala (1998) the Adleman-Lipton proved that model was extended towards solving the travelling salesman problem. Shin et al. (1999) presented an encoding scheme that applies fixed-length codes for representing integer and real values. Their method could also be employed towards solving the travelling salesman problem. Amos (1997) proposed parallel filtering model for resolving the Hamiltonian path problem, the sub-graph isomorphism problem, the 3-vertex-colourability problem, the clique problem, and the independent-set problem.

Roweis et al. (1999) proposed sticker-based model to enhance the Adleman-Lipton model. Their model could be used for determining solutions to an instance of the set cover problem. Perez-Jimenez and Sancho-Caparrini (2001) employed sticker-based model (Roweis et al., 1999) to resolve knapsack problems. Fu (1997) proposed new algorithms to resolve 3-SAT, 3-coloring, and the independent set. Winfree's self-assembling reactions for tiling fault tolerance in error-preventing codes and self-control of non-determinism and molecule formation and reaction efficiency were proposed in Winfree et al. (1998). Garzon and Deaton (1999). presented a review of the most important advances in molecular computing. In our previous work, Chang and Guo (2002a, 2002b) proved how the DNA operations from solution space of *splint* in the Adleman-Lipton model could be employed for developing DNA algorithms. Those DNA algorithms could be applied for resolving the dominating-set problem, the vertex cover problem, the clique problem, the independent-set problem, the 3-dimensional matching problem, and the set-packing problem. In our previous work, Chang et al., (2003) also employed the sticker-based model and the Adleman-Lipton model to deal with the dominating-set problem for decreasing error rate of hybridisation.

#### 3 USING STICKER FOR SOLVING THE 3-DIMENSIONAL MATCHING PROBLEM IN THE ADLEMAN-LIPTON MODEL

In subsection 3.1, the summary of the 3-dimensional matching problem is described. Applying sticker to constructing solution space of DNA sequences for the 3-dimensional matching problem is introduced in subsection 3.2. In subsection 3.3, one DNA algorithm is proposed to resolve the 3-dimensional matching problem. In subsection 3.4, the complexity of the proposed algorithm is described.

### 3.1 Definition of the 3-dimensional matching problem

Assume that W, X, and Y are disjoint sets having the same number q of elements. Suppose that W, X, and Y are  $\{w_1, \ldots, w_q\}$ ,  $\{x_1, \ldots, x_q\}$  and  $\{y_1, \ldots, y_q\}$ , respectively. Assume that a finite set  $C \subseteq W \times X \times Y$  and C is  $\{(w_k, x_l, y_m)| w_k \in W, x_l \in X, \text{ and } y_m \in Y \text{ for } q \ge k, l, \text{ and } m \ge 1\}$ . Assume that |C| denotes the number of elements in C and  $|C| \ge t$ , where *t* is a positive integer. A 3-dimensional matching for *C* is a subset  $C^1 \subseteq C$  with  $|C^1| \le t$  such that no two elements of  $C^1$  agree in any coordinate (Cormen et al., 2003; Garey and Johnson, 1979). The 3-dimensional matching problem is to find a minimum-size 3-dimensional matching for *C*. The problem has been proved to be an NP-complete problem (Garey and Johnson, 1979).

The 3-dimensional matching problem asks: Given four finite sets above, how many elements are in a *minimum-size* 3-dimensional matching? In Figure 1, three finite sets W, X, and Y are  $\{1, 2\}$ ,  $\{3, 4\}$  and  $\{5, 6\}$ , respectively, and a finite set  $C \subseteq W \times X \times Y$  and  $C = \{(1, 3, 5), (2, 4, 6), (1, 4, 6)\}$ . The four sets, W, X, Y, and C denote such a problem. The *minimum-size* 3-dimensional matching for C is  $\{(1, 3, 5), (2, 4, 6)\}$ . Hence, the size of the 3-dimensional matching problem in Figure 1 is two. It is indicated from Garey and Johnson (1979) that finding a minimum-size 3-dimensional matching is an NP-complete problem, so it can be formulated as a 'search' problem.

$$W = \{1, 2\}, X = \{3, 4\}, Y = \{5, 6\} \text{ and } C \subseteq W \times X \times Y \text{ and}$$
  
 $C = \{(1, 3, 5), (2, 4, 6), (1, 4, 6)\}.$ 

Figure 1 The finite sets of our problem

#### 3.2 Using sticker for constructing solution space of DNA sequence for the 3-dimensional matching problem

In the Adleman-Lipton model, their main idea is to first generate solution space of DNA sequences for those problems resolved. Then, basic biological operations are used to remove illegal solution and find legal solution from solution space. Therefore, the first step of resolving the 3-dimensional matching problem is to produce a test tube, which contains all of the possible 3-dimensional matching. Assume that a set  $C_d$  with  $\{w_k, x_l, y_m\}$  is a subset in C and it only contains three *order* elements. The first, second, and third elements in  $C_d$  come from W, X, and Y, respectively. Therefore, the finite set C can be regarded as a collection of subsets of three order elements, and C can be represented as  $\{C_1, ..., C_B\}$ , where  $C_d$  is  $\{(w_k, x_l, y_m)| w_k \in W, x_l \in X, \text{ and} y_m \in Y \text{ for } q \ge k, l, \text{ and } m \ge 1\}$  for  $B \ge d \ge 1$ .

Suppose that a *B*-digit binary number represents all possible  $2^B$  choices for subsets of three order elements. Also assume that  $3 \times B$  one-digit binary numbers represent  $3 \times B$  elements in the subsets in *C*. Suppose that the  $(3 \times d)$ th,  $(3 \times d + 1)$ th and  $(3 \times d + 2)$ th one-digit binary numbers, respectively, correspond to the first element, the second element and the third element in the subset  $C_d$  for  $B \ge d \ge 1$ . That is to say that the three order elements in the subset  $C_d$  are represented with three continuous bits. Suppose that  $C^1$  is 3-dimensional matching for *C*. If the *d*th bit in *B* bits is set to 0, then it represents the corresponding subset out of  $C^1$  and the three order elements in the subset are excluded from  $C^1$ . That is to say that the  $(3 \times d)$ th,  $(3 \times d + 1)$ th, and  $(3 \times d + 2)$ th one-digit binary numbers are not appended

onto the tail of those binary numbers, containing the value 0 of the *d*th bit. If the *d*th bit in *B* bits is set to 1, then it represents the corresponding subset in  $C^1$  and the three order elements in the subset are included in  $C^1$ . Therefore, it is very obvious that the  $(3 \times d)$ th,  $(3 \times d + 1)$ th and  $(3 \times d + 2)$ th one-digit binary numbers, subsequently, are appended onto the tail of those binary numbers, containing the value 1 of the *d*th bit.

To implement this way, it is assumed that a *B*-bit binary number *Z* is represented as a binary number  $z_1, ..., z_B$ , where the value of  $z_j$  is 1 or 0 for  $1 \le j \le B$ . A bit  $z_j$  is the *j*th bit in a *B*-bit binary number *Z* and it represents the *j*th subset in *C*. Assume that  $3 \times q$  one-digit binary numbers are, subsequently,  $w_1, ..., w_q, x_1, ..., x_q$  and  $y_1, ..., y_q$ , where  $q \ge B$ . Assume that  $w_k, x_l$  and  $y_m$  represent the *kth* element in *W*, the *l*th element in *X*, and the *m*th element in *Y*, respectively. A *B*-bit binary number *Z* includes all possible  $2^B$  choices of subsets. Each choice of subsets corresponds to a possible 3-dimensional matching. If the value of  $z_j$  is set to 1 and the corresponding subset consists of three order elements  $w_k, x_l$  and  $y_m$ , then the value 1 for the three bits is, subsequently, appended onto the tail of those binary number, including the value 1 of the *jth* bit.

Consider the four finite sets in Figure 1. Three subsets,  $C_{3}$ ,  $C_2$ , and  $C_1$  represent  $\{1, 3, 5\}$ ,  $\{2, 4, 6\}$  and  $\{1, 4, 6\}$ , respectively, for C. Table 1 denotes solution space of 3-dimensional matching for the four finite sets in Figure 1. In Table 1, the binary number, 000, indicates that the corresponding 3-dimensional matching is empty. In Table 1, the binary numbers, 001, 010, and 011, represent that those corresponding 3-dimensional matching are  $\{C_3\}$ ,  $\{C_2\}$ , and  $\{C_2, C_3\}$ , respectively. The binary numbers, 100, 101, and 110, in Table 1 represent that those corresponding 3-dimensional matching, subsequently, are  $\{C_1\}, \{C_1, C_3\}, \{C_1, C_3\}, \{C_2, C_3\}, \{C_3, C_3\}, \{C_$ and  $\{C_1, C_2\}$ . In Table 1, the binary number, 111, represents that the corresponding 3-dimensional matching is  $\{C_1, C_2, C_3\}$ . Though there are eight 3-digit binary numbers for representing eight possible 3-dimensional matching in Table 1, not every 3-digit binary number corresponds to a *legal* solution. Hence, in the following subsection, basic biological operations are used to develop an algorithm for removing illegal solutions and determining legal answers.

**Table 1**The solution space for the four finite sets inFigure 1

3-digit binary number	The corresponding 3-dimensional matching
000	Ø
001	{C <sub>3</sub> }
010	{C <sub>2</sub> }
011	$\{C_2, C_3\}$
100	{C <sub>1</sub> }
101	$\{C_1, C_3\}$
110	$\{C_1, C_2\}$
111	$\{C_1, C_2, C_3\}$

To represent all possible 3-dimensional matching for the 3-dimensional matching problem, sticker (Roweis et al., 1999; Braich et al., 2000) is used to construct solution space for that problem resolved. For every bit  $z_i$  representing the jth subset in C, two distinct 15 base value sequences were designed. One represents the value '1' of  $z_i$  and another represents the value '1' of  $z_i$ . For the sake of convenience of presentation, assume that  $z_i^1$  denotes the value of  $z_i$  to be 1 and  $z_i^0$  defines the value of  $z_i$  to be zero. Similarly, for every bit  $w_k$ ,  $x_l$ , and  $y_m$  representing the *kth*, lth, and mth elements in W, X and Y, two distinct 15 base value sequences were also designed. One represents the value, 1, for  $w_k$ ,  $x_l$ , and  $y_m$  and another represents the value, 0, to  $w_k$ ,  $x_l$ , and  $y_m$ . For the sake of convenience of presentation, assume that  $w_k^1$ ,  $x_l^1$ , and  $y_m^1$  denote the value of  $w_k$ ,  $x_l$ , and  $y_m$  to be 1 and  $w_k^0$ ,  $x_l^0$ , and  $y_m^0$  define the value of  $w_k$ ,  $x_l$ , and  $y_m$  to be zero.

Each of the  $2^{B}$  possible 3-dimensional matching was represented by a library sequence of  $15 \times (B + 3 \times q)$  bases consisting of the concatenation of one value sequence for each bit. DNA molecules with library sequences are termed library strands and a combinatorial pool containing library strands is termed a library. The probes used for separating the library strands have sequences complementary to the value sequences.

Errors in the separation of the library strands are errors in the computation (Roweis et al., 1999; Braich et al., 2000). Sequences must be designed to ensure that library strands have little secondary structure that might inhibit intended probe-library hybridisation. The design must also exclude sequences that might encourage unintended probe-library hybridisation. To help achieve these goals, sequences were computer-generated to satisfy the following constraint (Braich et al., 2000).

- 1 library sequences contain only As, Ts, and Cs
- 2 all library and probe sequences have no occurrence of more consecutive identical nucleotides
- 3 every probe sequence has at least four mismatches with all 15 base alignment of any library sequence (except for with its matching value sequence)
- 4 every 15 base subsequence of a library sequence has at least 4 mismatches with all 15 base alignment of itself or any other library sequence
- 5 no probe sequence has a run of more than 7 matches with any 8 base alignment of any library sequence (except for with its matching value sequence)
- 6 no library sequence has a run of more than 7 matches with any 8 base alignments of itself or any other library sequence
- 7 every probe sequence has 4, 5, or 6, Gs in its sequence.

Constraint (1) is motivated by the assumption that library strands composed only of As, Ts, and Cs will have less secondary structure than those composed of As, Ts, Cs, and <u>Gs (Mir, 1998)</u>. Constraint (2) is motivated by two assumptions: first, that long homopolymer tracts may have unusual secondary structure and second, that the melting temperatures of probe-library hybrids will be more uniform

if none of the probe-library hybrids involve long homopolymer tracts. Constraints (3) and (5) are intended to ensure that probes bind only weakly where they are not intended to bind. Constraints (4) and (6) are intended to ensure that library strands have a low affinity for themselves. Constraint (7) is intended to ensure that intended probe-library pairings have uniform melting temperatures.

The Adleman program (Braich et al., 2000) was modified for generating those DNA sequences to satisfying the constraints above. For example, for representing the three subsets in C in Figure 1, the DNA sequences generated were:  $z_1^0 = AATTCACAAACAATT$ ,  $z_2^0 = ACTCCTTCCCTACTC$ ,  $z_3^0 = TCTCTCTCTAATCAT$ ,  $z_1^1 = TCTCCCTATTTATTT$ ,  $z_2^1 = TCACCAAACCTAAAA$ , and  $z_3^{1} = CCATCATCTACCTTA$ . Similarly, for representing every element in W, X, and Y in Figure 1, the DNA sequences generated were:  $w_1^0 = ACTCACATACACCAC$ ,  $x_1^0 = CTTCTCCACTATACT, \quad x_1^0 = AAACTATCATACTTC,$  $= TTCAATAAACATTTT, \quad y_1^0 = TTTTTCTCTCCCCAAA,$  $w_2^0 = CTTCTCCACTATACT, x_2^0 = TTCAATAAACATTTT,$  $y_2^0 = TTTACCCTACTATCA, \quad w_1^1 = CAACCTATTATCTTA,$  $w_2^{1} = CCTAAATCTCCAATA, x_1^{1} = CTCTCAACAATCAAA,$  $x_2^1 = ACCTCCTTAACACTT, y_1^1 = CCCTATCACTAATAC$ and  $y_2^1 = TATAACCCATCCATA$ . For every possible 3-dimensional matching to C in Figure 1, the corresponding library strand was synthesized by employing a mix-and-split combinatorial synthesis technique (Cukras et al., 1998). Similarly, for any *n*-subset set, all of the library strands for representing every possible 3-dimensional matching could be also synthesised with the same technique.

## 3.3 The DNA algorithm of solving the 3-dimensional matching problem

The following DNA algorithm is proposed to solve the 3-dimensional matching problem.

- Algorithm 1: Solving the 3-dimensional matching problem. (1) Input ( $T_0$ ), where the tube  $T_0$  is to encode all possible  $2^B$  choices of subsets of three order elements for three finite sets  $W = \{w_1, ..., w_q\}$ ,  $X = \{x_1, ..., x_q\}$ , and  $Y = \{y_1, ..., y_q\}$  and a collection  $C = \{C_1, ..., C_B\}$ , where  $C_d = \{(w_k, x_l, y_m)|w_k \in W, x_l \in X, \text{ and } y_m \in Y \text{ for } q \ge k, l, \text{ and}$   $m \ge 1\}$  for  $B \ge d \ge 1$ .
  - (2) Forall *i* = 1 to *B*, where *B* is the number of subsets in *C*.

(2a)  $T_{ON} = +(T_0, z_i^{-1})$  and  $T_{OFF} = -(T_0, z_i^{-1})$ .

Assume that  $(w_k, x_l, y_m)$  is the element in the subset,  $C_i$ .

(2b)  $T_{BAD} = +(T_{ON}, w_k^{1})$  and  $T_{ON} = -(T_{ON}, w_k^{1})$ .

- (2c) Discard the tube  $T_{BAD}$ .
- (2d) Append( $T_{ON}, w_k^{-1}$ ).
- (2e)  $T_{BAD} = +(T_{ON}, x_l^{-1})$  and  $T_{ON} = -(T_{ON}, x_l^{-1})$ .
- (2f) Discard the tube  $T_{BAD}$ .
- (2g) Append( $T_{ON}, x_l^1$ ).
- (2h)  $T_{BAD} = +(T_{ON}, y_m^{-1})$  and  $T_{ON} = -(T_{ON}, y_m^{-1})$ .
- (2i) Discard the tube  $T_{BAD}$ .

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(2j) Append(T_{ON}, y_m^{-1}).
     (2k) T_0 = \bigcup (T_{ON}, T_{OFF}).
 End Forall
 (3) Forall j = 1 to q
     (3a) T_0 = +(T_0, w_j^{-1}) and T_{BAD} = -(T_0, w_j^{-1}).
     (3b) Discard the tube T_{BAD}.
     (3c) T_0 = +(T_0, x_j^1) and T_{BAD} = -(T_0, x_j^1).
     (3d) Discard the tube T_{BAD}.
     (3e) T_0 = +(T_0, y_j^{-1}) and T_{BAD} = -(T_0, y_i^{-1}).
     (3f) Discard the tube T_{BAD}.
  End Forall
(4) Forall i = 0 to B - 1
    For j = i down to 0
           (a) T_{j+1}^{ON} = +(T_j, z_{i+1}^{-1}) and T_j = -(T_j, z_{i+1}^{-1}).

(b) T_{j+1} = \cup (T_{j+1}, T_{j+1}^{ON}).
   EndFor
End Forall
(5) For d = 1 to B
                If (detect (T_d) = 'yes') then
        (a)
                                       Read (T_d) and terminate
                              (b)
                                       the algorithm.
       EndIf
   End For
```

**Theorem 3-1:** In light of those steps in Algorithm 1, the 3-dimensional matching problem for finite sets W, X, and Y and B-subset set C can be resolved.

*Proof*: A test tube of DNA strands, which represent all possible  $2^{B}$  input bit sequences  $z_{1}, ..., z_{B}$ , is yielded in Step (1). It is very obvious that the test tube contains all possible  $2^{B}$  choices of 3-dimensional matching.

From definition of 3-dimensional matching (Garey and Johnson, 1979), Step (2) will be executed B times for representing three order elements in each subset. The first execution of Step (2a) uses 'extraction' operation to form two test tubes:  $T_{ON}$  and  $T_{OFF}$ . The first tube  $T_{ON}$  consists of all of the strands that have  $z_i = 1$ . That is to say that the first subset occurs in the tube  $T_{ON}$ . The second tube  $T_{OFF}$  consists of all of the strands that have  $z_i = 0$ . This is to say that the first subset does not appear in the tube  $T_{OFF}$ . Obviously, from the definition of 3-dimensional matching, the number of order elements in each subset in C is all three. The first, second, and three elements are from W, X, and Y, respectively. Therefore, Steps (2b) to (2j) are used to represent all of three order elements in each subset. The first execution of Step (2b) applies 'extraction' operation to generate two tubes:  $T_{BAD}$  and  $T_{ON}$ . The first tube  $T_{BAD}$ includes all of the strands that have  $w_k = 1$ . That is to say that the first element in the first subset appears repeatedly in other subsets in the tube  $T_{BAD}$ . From the definition of 3-dimensional matching (Garey and Johnson, 1979), the first tube  $T_{BAD}$  includes illegal choices of 3-dimensional matching. Hence, the first tube  $T_{BAD}$  is discarded in Step (2c). The second tube  $T_{ON}$  includes all of the strands that have  $w_k = 0$ . That is to say that the first element in the first subset does not occur in the tube  $T_{ON}$ . Step (2d) uses 'append' operation to append the short strand,  $w_k^{1}$ ,

representing the first element in the first subset, onto the end of every strand in the tube  $T_{ON}$ . Hence, the tube  $T_{ON}$  now contains the first element in the first subset. Similarly, the first execution of Step (2e) applies 'extraction' operation to generate two tubes:  $T_{BAD}$  and  $T_{ON}$ . The first tube  $T_{BAD}$ includes all of the strands that have  $x_l = 1$ . That is to say that the second element in the first subset appears repeatedly in other subsets in the tube  $T_{BAD}$ . Due to definition of 3-dimensional matching, the first tube  $T_{BAD}$  includes illegal choices of 3-dimensional matching. Hence, the first tube  $T_{BAD}$  is discarded in Step (2f). The second tube  $T_{ON}$  includes all of the strands that have  $x_l = 0$ . That is to say that the second element in the first subset does not occur in the tube  $T_{ON}$ . From the definition of 3-dimensional matching, Step (2g) uses 'append' operation to append the short strand,  $x_l^1$ , representing the second element in the first subset, onto the end of every strand in the tube  $T_{ON}$ . Hence, the tube  $T_{ON}$ now contains the second element in the first subset. Then, the first execution of Step (2h) applies 'extraction' operation to generate two tubes:  $T_{BAD}$  and  $T_{ON}$ . The first tube  $T_{BAD}$ includes all of the strands that have  $y_m = 1$ . That is to say that the third element in the first subset occurs repeatedly in other subsets in the tube  $T_{BAD}$ . It is indicated from the definition of 3-dimensional matching that the first tube  $T_{BAD}$ includes illegal choices of 3-dimensional matching. Hence, the first tube  $T_{BAD}$  is discarded in Step (2i). The second tube  $T_{ON}$  includes all of the strands that have  $y_m = 0$ . That is to say that the third element in the first subset does not occur in the tube  $T_{ON}$ . Because of definition of 3-dimensional matching, Step (2j) uses 'append' operation to append the short strand,  $y_m^{-1}$ , representing the third element in the first subset, onto the end of every strand in the tube  $T_{ON}$ . Thus, the tube  $T_{ON}$  now contains the third element in the first subset. This is to say that all of the elements in the first subset are included in  $T_{ON}$ . Therefore, the first execution of Step (2k) applies 'merge' operation to pour two tubes  $T_{ON}$ and  $T_{OFF}$  into the tube  $T_0$ . The tube  $T_0$  includes every element in the first subset. Similarly, after other (B-1)times to Step (2) are executed, every order element in each subset is represented in the corresponding DNA sequences in the tube  $T_0$ .

Step (3) is used for checking whether DNA strands in the tube  $T_0$  exactly represent every element in finite sets W, X, and Y. Since the number of elements in finite sets W, X, and Y is all q, Step (3) will be executed q times for finding correct choices of 3-dimensional matching. The first execution of Step (3a) applies 'extraction' operation to check which subsets include the first element in W and which subsets do not contain the first element in W. Therefore, two tubes are generated. The second tube  $T_{BAD}$ includes illegal choices of subsets and therefore the tube  $T_{BAD}$  is discarded in Step (3b). Similarly, the first execution of Step (3c) applies 'extraction' operation to check which subsets contain the first element in X and which subsets do not consist of the first element in X. Two tubes are generated. The second tube  $T_{BAD}$  includes illegal choices of subsets and therefore the tube  $T_{BAD}$  is discarded in Step (3d). Then, the first execution of Step (3e) applies 'extraction'

operation to check which subsets consists of the first element in *Y* and which subsets do not include the first element in *Y*. Two tubes are generated. Due to the definition of 3-dimensional matching, the second tube  $T_{BAD}$  includes illegal choices of subsets and therefore the tube  $T_{BAD}$  is discarded in Step (3f). Similarly, after other (q - 1) times for Step (3) are executed, every element in *W*, *X*, and *Y* is represented in the corresponding DNA sequences in the tube  $T_0$ . That is to say that the remaining DNA strands in the tube  $T_0$  represent legal choices of 3-dimensional matching.

When each time of the outer loop in Step (4) is executed, the number of execution for the inner loop is (i + 1) times. At the first execution of the outer loop, the inner loop is only executed one time. Therefore, Steps (4a) and (4b) are executed one time. Step (4a) uses 'extraction' operation to form two test tubes:  $T_1^{ON}$  and  $T_0$ . The first tube  $T_1^{ON}$ contains all of the strands that have  $z_1 = 1$ . The second tube  $T_0$  consists of all of the strands that have  $z_1 = 0$ . That is to say that the first tube encodes every 3-dimensional matching with the first subset in *C* and the second tube represents every 3-dimensional matching without the first subset in *C*. Then, Step (4b) applies 'merge' operation to pour the tube  $T_1^{ON}$  into the tube  $T_1$ . After repeat to execute Steps (4a) and (4b), it finally produces *B new* tubes. The tube  $T_d$  for  $B \ge d \ge 1$  encodes those DNA strands that contain *d* subsets.

Because the 3-dimensional matching problem is to find a minimum-size 3-dimensional matching, the tube  $T_1$  first is detected with 'detection' operation in Step (5a). If it returns 'yes', then the tube  $T_1$  contains minimum-size 3-dimensional matching. Therefore, Step (5b) uses 'read' operation for describing 'sequence' of a molecular in the tube  $T_1$  and terminating the algorithm. Otherwise, repeat to execute Step (5a) until a minimum-size 3-dimensional matching is found in the tube detected.

The sets in Figure 1 can be applied for showing the power of Algorithm 1. In Figure 1, three finite sets W, X, and Y are  $\{1, 2\}, \{3, 4\}, \text{ and } \{5, 6\}, \text{ respectively. A finite set}$  $C \subseteq W \times X \times Y$  and  $C = \{(1, 3, 5), (2, 4, 6), (1, 4, 6)\}$ . Every triple element in C can be regarded as a 3-order-element subset. Therefore, the finite set C can be regarded as a collection of subsets of three order elements. Assume that the collection C is  $\{C_1, C_2, C_3\}$ , where  $C_1, C_2$  and  $C_3$  are  $\{1, 3, 5\}, \{2, 4, 6\}, \text{ and } \{1, 4, 6\}, \text{ respectively}.$  From Step (1) in Algorithm 1, the tube  $T_0$  is filled with eight library stands with those techniques mentioned in subsection 3.2, representing eight possible 3-dimensional matching for W, X, Y, and C.

Because the number of the subsets in the collection *C* is three, the number of execution to Step (2) of Algorithm 1 is three times. At the first execution of Step (2a) in Algorithm 1, two tubes are yielded. The first tube,  $T_{ON}$ , includes the numbers 1\*\* (\* can be either 1 or 0). The second tube,  $T_{OFF}$ , contains the numbers 0\*\*. That is to say that the first tube,  $T_{ON}$ , includes  $\{C_1\}$ ,  $\{C_1, C_3\}$ ,  $\{C_1, C_2\}$ , and  $\{C_1, C_2, C_3\}$  and the second tube,  $T_{OFF}$ , contains  $\Phi$ ,  $\{C_3\}$ ,  $\{C_2\}$ , and  $\{C_2, C_3\}$ . Due to the first execution to Step (2b) of Algorithm 1, two tubes are generated. The first tube,  $T_{BAD}$ , contains all of the strands that have  $w_1 = 1$ . That is to say that the first element, 1, in  $C_1$  appears repeatedly in the tube  $T_{BAD}$ . It is indicated from the definition of 3-dimensional matching that the tube  $T_{BAD}$  includes illegal choices. Therefore, the tube  $T_{BAD}$  is discarded in Step (2c). The second tube  $T_{ON}$  contains all of the strands that have  $w_1 = 0$ . This is to say that the first element, 1, in  $C_1$  does not occur in the tube  $T_{ON}$ . Step (2d) of Algorithm 2 uses 'append' operation to append DNA sequences of representing 1 onto the tube  $T_{ON}$ . The tube  $T_{ON}$  now contains the first element in  $C_1$ . This is to say that the tube  $T_{ON}$ consists of the strands representing those bit strings:  $1001(w_1 = 1), 1011(w_1 = 1), 1101(w_1 = 1)$  and  $1111(w_1 = 1)$ .

Similarly, the first execution of Step (2e) applies 'extraction' operation to generate two tubes:  $T_{BAD}$  and  $T_{ON}$ . The first tube  $T_{BAD}$  includes all of the strands that have  $x_1 = 1$ . That is to say that the second element, 3, in  $C_1$ appears repeatedly in other subsets in the tube  $T_{BAD}$ . The first tube  $T_{BAD}$  includes illegal choices. Hence, the first tube  $T_{BAD}$  is discarded in Step (2f). The second tube  $T_{ON}$  includes all of the strands that have  $x_1 = 0$ . That is to say that the second element, 3, in  $C_1$  does not occur in the tube  $T_{ON}$ . Step (2g) uses 'append' operation to append DNA sequences of representing 3 onto the end of every strand in the tube  $T_{ON}$ . The tube  $T_{ON}$  now contains also the second element in  $C_1$ . That is to say that the tube  $T_{ON}$  contains the strands representing those bit strings:  $10011(w_1 = 1)(x_1 = 1)$ ,  $10111(w_1 = 1)(x_1 = 1), \quad 11011(w_1 = 1)(x_1 = 1) \text{ and } \quad 11111$  $(w_1 = 1)(x_1 = 1).$ 

Then, the first execution of Step (2h) applies 'extraction' operation to generate two tubes:  $T_{BAD}$  and  $T_{ON}$ . The first tube  $T_{BAD}$  includes all of the strands that have  $y_1 = 1$ . That is to say that the third element, 5, in  $C_1$  appears repeatedly in other subsets in the tube  $T_{BAD}$ . That is to say, the first tube  $T_{BAD}$  includes illegal choices. Thus, the first tube  $T_{BAD}$  is discarded in Step (2i). The second tube  $T_{ON}$  includes all of the strands that have  $y_1 = 0$ . That is to say that the third element, 5, in  $C_1$  does not occur in the tube  $T_{ON}$ . Step (2j) uses 'append' operation to append DNA sequences of representing 5 onto the end of every strand in the tube  $T_{ON}$ . The tube  $T_{ON}$  now contains the third element in  $C_1$ . This is to say that the tube  $T_{ON}$  includes the strands representing those bit strings:  $100111(w_1 = 1)(x_1 = 1)(y_1 = 1)$ , 101111 $(w_1 = 1)(x_1 = 1)(y_1 = 1),$  $110111(w_1=1)(x_1=1)(y_1=1),$ and  $111111(w_1=1)(x_1=1)(y_1=1)$ . Then, the first execution of Step (2k) applies 'merge' operation to pour two tubes  $T_{ON}$  and  $T_{OFF}$  into the tube  $T_0$ . The tube  $T_0$  now includes the strands representing those bit strings: 000, 001, 010, 011,  $100111(w_1 = 1)(x_1 = 1)(y_1 = 1)$ ,  $101111(w_1 = 1)(x_1 = 1)$  $(y_1 = 1)$ ,  $110111(w_1 = 1)(x_1 = 1)(y_1 = 1)$ , and  $111111(w_1 = 1)$  $(x_1 = 1)(y_1 = 1)$ . Similarly, after other two times to Step (2) are executed, the tube  $T_0$  contains the strands representing those bit strings: 000,  $001111(w_1 = 1)(x_2 = 1)$  $(y_2 = 1), \quad 010111(w_2 = 1)(x_2 = 1)(y_2 = 1), \quad 100111(w_1 = 1)$  $(x_1 = 1)(y_1 = 1)$ , and  $110111111(w_1 = 1)(x_1 = 1)(y_1 = 1)$  $(w_2 = 1)(x_2 = 1)(y_2 = 1).$ 

From the definition of 3-dimensional matching, finding a 3-dimensional matching for W, X, Y, and C is to check whether every element in W, X, and Y appears

exactly in chosen subsets. Because the number of the elements in W, X, and Y is all 2, Step (3) of Algorithm 1 will be executed two times. The first execution of Step (3a) in Algorithm 1 results in that two tubes are generated. The first tube  $T_0$  contains those bit strings:  $001111(w_1=1)(x_2=1)(y_2=1), 100111(w_1=1)(x_1=1)(y_1=1),$ and  $110111111(w_1=1)(x_1=1)(y_1=1)(w_2=1)(x_2=1)(y_2=1)$ . The second tube  $T_{BAD}$  includes these bit strings: 000 and  $010111(w_2=1)(x_2=1)(y_2=1)$ . This is to imply that 3-dimensional matching in the second tube  $T_{BAD}$  is all illegal choices. Therefore, Step (3b) is used to discard the second tube  $T_{BAD}$ . Similarly, The first execution of Step (3c) in Algorithm 1 indicates that two tubes are produced. The first tube  $T_0$  contains those bit strings:  $100111(w_1=1)(x_1=1)$  $110111111(w_1 = 1)(x_1 = 1)(y_1 = 1)(w_2 = 1)$  $(y_1 = 1)$ and  $(x_2 = 1)(y_2 = 1)$ . The second tube  $T_{BAD}$  consists of the bit string:  $001111(w_1 = 1)(x_2 = 1)(y_2 = 1)$ . That is to say that 3-dimensional matching in the second tube  $T_{BAD}$  is an illegal choice. Therefore, Step (3d) is used to discard the second tube  $T_{BAD}$ . Similarly, the first execution of Step (3e) in Algorithm 1 represents that two tubes are yielded. The first  $T_0$  includes  $100111(w_1=1)(x_1=1)(y_1=1)$ tube and  $110111111(w_1=1)(x_1=1)(y_1=1)(w_2=1)(x_2=1)(y_2=1)$ . The second tube  $T_{BAD}$  does not consists of any bit string. Step (3f) is used to discard the second tube  $T_{BAD}$ . The similar processing can be applied to deal with the second element in W, X, Y. After all of operations in Step (3) are processed, the remaining strands in the tube  $T_0$  represent legal 3-dimensional matching,  $110111111(w_1 = 1)(x_1 = 1)(y_1 = 1)$  $(w_2 = 1)(x_2 = 1)(y_2 = 1).$ 

The first execution of Step (4a) in Algorithm 1 applies 'extraction' operation to produce two tubes,  $T_1^{ON}$  and  $T_0$ . The tube  $T_1^{ON}$  contains the bit string, 110111111( $w_1$ =1) ( $x_1$ =1)( $y_1$ =1)( $w_2$ =1)( $x_2$ =1)( $y_2$ =1). The tube  $T_0$  does not include any bit string. Step (4b) applies 'merge' operation to pour the tube  $T_1^{ON}$  into the tube  $T_1$ . The tube  $T_1$  includes the bit string, 110111111( $w_1$ =1)( $x_1$ =1)( $y_1$ =1)( $w_2$ =1)( $x_2$ =1) ( $y_2$ =1), representing a 3-dimensional matching, { $C_1, C_2$ }. After repeat to execute Steps (4a) and (4b), it finally produces three *new* tubes. The new tube  $T_d$  for  $3 \ge d \ge 1$  encodes the 3-dimensional matching that contains *d* subsets. The tube  $T_2$  contains the bit string, 110111111( $w_1$ =1)( $x_1$ =1)( $y_2$ =1). The tubes  $T_1$  and  $T_3$  do not include any bit string.

The 3-dimensional matching problem is to find a minimum-size 3-dimensional matching. Therefore, Step (5) is used to find a minimum-size 3-dimensional matching. Because the number of the element in C is three, Step (5a) at most will be executed three times. When the first time of Step (5a) is executed, the tube  $T_1$  is first detected with 'detection' operation. 'Detection' operation for the tube  $T_1$  returns 'no'. That is to say that the tube  $T_1$  does not contains a minimum-size 3-dimensional matching. Next, the second time of Step (5a) is executed, the tube  $T_2$  is detected with 'detection' operation. 'Detection' operation for the tube  $T_2$  returns 'yes'. Therefore, Step (5b) applies 'read' operation to describe 'sequence' of a molecular in the tube  $T_2$  and terminates the algorithm. A minimum-size 3-dimensional matching is found to be  $\{(1, 3, 5), \{2, 4, 6\}\}$ .

#### 3.4 The complexity of the proposed DNA algorithm

The following theorems describe time complexity of Algorithm 1, volume complexity of solution space in Algorithm 1, the number of the tubes used in Algorithm 1, and the longest library strand in solution space in Algorithm 1.

**Theorem 3-2:** Suppose that W, X, and Y are disjoint sets which have the same number q of elements. Assume that W, X, and Y are  $\{w_1, ..., w_q\}$ ,  $\{x_1, ..., x_q\}$ , and  $\{y_1, ..., y_q\}$ , respectively. Suppose that  $C \subseteq W \times X \times Y$  and C is  $\{C_1, ..., C_B\}$  where  $C_d$  is  $\{w_k, x_b, y_m| w_k \in W, x_l \in X, and$  $y_m \in Y$  for  $q \ge k$ , l, and  $m \ge 1$  for  $1 \le d \le B$ . The 3-dimensional matching problem for W, X, Y and C can be resolved with  $O(B^2)$  biological operations in the Adleman-Lipton model.

Proof: Algorithm 1 can be applied for solving the 3-dimensional matching problem for any B-subset set C. Algorithm 1 includes four main steps. Step 2 is mainly used to construct DNA sequences for every element in each subset in C and to remove illegal library strands from all of the  $2^{B}$  possible library strands. From Algorithm 1, it is very obvious that Step (2a) to Step (2k) totally take  $4 \times B$ 'extraction' operations,  $3 \times B$  'discard' operations,  $3 \times B$ 'append' operations and B 'merge' operations. Step (3) is mainly applied to check which library strands exactly include every element in W, X, and Y. It is indicated from Algorithm 1 that Step (3a) to Step (3f) take  $3 \times B$  'extraction' operations and  $3 \times B$  'discard' operations. Step (4) is mainly applied to figure out the number of element in every legal 3-dimensional matching. Algorithm 1 indicates that Step (4a) takes  $(B \times (B-1)/2)$  'extraction' operations and Step (4b) takes  $(B \times (B-1)/2)$  'merge' operations. Step 5 is used to find a minimum-size 3-dimensional matching from legal 3-dimensional matching. According to Algorithm 1, Step (5a) at most takes B 'detection' operations and Step (5b) takes one 'read' operation. Hence, from the statements mentioned above, it is at once inferred that the time complexity of Algorithm 1 is  $O(B^2)$  biological operations in the Adleman-Lipton model.

**Theorem 3-3:** Suppose that W, X, and Y are disjoint sets which have the same number q of elements. Assume that W, X, and Y are  $\{w_1, ..., w_q\}$ ,  $\{x_1, ..., x_q\}$ , and  $\{y_1, ..., y_q\}$ , respectively. Suppose that  $C \subseteq W \times X \times Y$  and C is  $\{C_1, ..., C_B\}$  where  $C_d$  is  $\{w_k, x_b, y_m | w_k \in W, x_l \in X, and$  $y_m \in Y$  for  $q \ge k$ , l, and  $m \ge l\}$  for  $l \le d \le B$ . The 3-dimensional matching problem for W, X, Y and C can be resolved with  $O(2^B)$  library strands in the Adleman-Lipton model.

Proof: Refer to Theorem 3-2.

**Theorem 3-4:** Suppose that W, X, and Y are disjoint sets that have the same number q of elements. Assume that W, X, and Y are  $\{w_1, \ldots, w_q\}$ ,  $\{x_1, \ldots, x_q\}$ ,

and  $\{y_1, ..., y_q\}$ , respectively. Suppose that  $C \subseteq W \times X \times Y$ and C is  $\{C_1, ..., C_B\}$  where  $C_d$  is  $\{w_k, x_b, y_m | w_k \in W, x_l \in X,$ and  $y_m \in Y$  for  $q \ge k$ , l, and  $m \ge 1\}$  for  $1 \le d \le B$ . The 3-dimensional matching problem for W, X, Y and C can be resolved with O(B) tubes in the Adleman-Lipton model.

Proof: Refer to Theorem 3-2.

**Theorem 3-5:** Suppose that W, X, and Y are disjoint sets which have the same number q of elements. Assume that W, X, and Y are  $\{w_1, ..., w_q\}$ ,  $\{x_1, ..., x_q\}$ , and  $\{y_1, ..., y_q\}$ , respectively. Suppose that  $C \subseteq W \times X \times Y$  and C is  $\{C_1, ..., C_B\}$  where  $C_d$  is  $\{w_k, x_b, y_m | w_k \in W, x_l \in X, and y_m \in Y \text{ for } q \ge k, l, and m \ge 1\}$  for  $1 \le d \le B$ . The 3-dimensional matching problem for W, X, Y and C can be resolved with the longest library strand,  $O(15 \times B + 15 \times 3 \times q)$ , in the Adleman-Lipton model.

Proof: Refer to Theorem 3-2.

#### 4 EXPERIMENTAL RESULTS OF SIMULATED DNA COMPUTING

We finished the modification of the Adleman program (Braich et al., 2000) in a PC with one Pentium(R) 4 and 128 MB main memory. Our operating system is Window 98 and our compiler is C++ Builder 6.0. This program modified was applied to generate DNA sequences for solving the 3-dimensional matching problem. Because the source code of the two functions *srand48*() and *drand48*() was not found in the *original* Adleman program, we used the standard function *srand*() in C++ builder 6.0 to replace the function *srand48*() and added the source code to the function *drand48*(). We also added subroutines to the Adleman program for simulating biological operations in the Adleman-Lipton model in Section 2. We added subroutines to the Adleman program to simulating Algorithm 1 in subsection 3.3.

The Adleman program is used to constructing each 15-base DNA sequence for each bit of the library. For each bit, the program is applied for generating two 15-base random sequences (for the '1' and the '0') and checking to see if the library strands satisfy the seven constraints in subsection 3.2 with the new DNA sequences added. If the constraints are satisfied, the new DNA sequences are 'greedily' accepted. If the constraints are not satisfied, then mutations are introduced one by one into the new block until either: (A) the constraints are satisfied and the new DNA sequences are then accepted or (B) a threshold for the number of mutations is exceeded and the program has failed and so it exits, printing the sequence found so far. If  $(B + 3 \times q)$ -bits that satisfy the constraints are found then the program has succeeded and it outputs these sequences.

Consider those sets W, X, Y and C in Figure 1. The set, C, includes three subsets:  $C_1$ ,  $C_2$ , and  $C_3$ . The sets W, X, and Y are  $\{1, 2\}$ ,  $\{3, 4\}$ , and  $\{5, 6\}$ , respectively. DNA sequences generated by the Adleman program modified were shown in Table 2. The program took one mutation and two mutations to make new DNA sequences for the front six elements and the last three elements. With the nearest neighbour parameters, the program was used to calculate the enthalpy, entropy, and free energy for the binding of each probe to its corresponding region on a library strand. The energy was shown in Table 3. Only G really matters to the energy of each bit. For example, the delta G for the probe binding a '1' in the first bit is thus estimated to be 25 kcal/mol and the delta G for the probe binding a '0' is estimated to be 24.3 kcal/mol.

**Table 2**Sequences chosen to represent the three subsetsin C and every element in W, X and Y in Figure 1

Subset	5'→3' DNA Sequence
C <sub>1</sub> <sup>0</sup>	AATTCACAAACAATT
C <sub>2</sub> <sup>0</sup>	ACTCCTTCCCTACTC
C <sub>3</sub> <sup>0</sup>	TCTCTCTCTAATCAT
$C_1^1$	TCTCCCTATTTATTT
C <sub>2</sub> <sup>1</sup>	TCACCAAACCTAAAA
$C_3^1$	CCATCATCTACCTTA
w <sub>1</sub> <sup>0</sup>	ACTCACATACACCAC
w <sub>2</sub> <sup>0</sup>	CTTCTCCACTATACT
x <sub>1</sub> <sup>0</sup>	AAACTATCATACTTC
x <sub>2</sub> <sup>0</sup>	TTCAATAAACATTTT
y1 <sup>0</sup>	TTTTTCTCTCCCAAA
y <sub>2</sub> <sup>0</sup>	TTTACCCTACTATCA
W <sub>1</sub> <sup>1</sup>	CAACCTATTATCTTA
W2 <sup>1</sup>	CCTAAATCTCCAATA
x <sub>1</sub> <sup>1</sup>	CTCTCAACAATCAAA
x <sub>2</sub> <sup>1</sup>	ACCTCCTTAACACTT
y <sub>1</sub> <sup>1</sup>	CCCTATCACTAATAC
y <sub>2</sub> <sup>1</sup>	TATAACCCATCCATA

The program simulated a mix-and-split combinatorial synthesis technique (Cukras et al., 1998) to synthesise the library strand to every possible 3-dimensional matching. Those library strands were shown in Table 4 and, respectively, represent every possible 3-dimensional matching:  $\emptyset$ , { $C_3$ }, { $C_2$ }, { $C_2$ ,  $C_3$ }, { $C_1$ }, { $C_1$ ,  $C_3$ }, { $C_1$ ,  $C_2$ }, and { $C_1$ ,  $C_2$ ,  $C_3$ }. The program was also applied to figure out the average and standard deviation for the enthalpy, entropy, and free energy over all probe/library strand interactions. The energy is shown in Table 5. The standard deviation for delta G is small because this is partially enforced by the constraint that there are 4, 5, or 6 Gs (the seventh constraint in subsection 3.2) in the probe sequences.

**Table 3** The energy for the binding of each probe to its corresponding region on a library strand

	Enthalpy energy	Entropy energy	
Vertex	(H)	(S)	Free energy (G)
$C_1^1$	114.4	299.4	25
$C_1^0$	107.8	278.6	24.3
$C_2^1$	111.5	284.8	26.2
$C_{2}^{0}$	109.1	279	25.9
$C_3^1$	105.2	270.5	24.4
$C_{3}^{0}$	97.3	252.3	22.1
$W_1^1$	107	282.4	22.5
$W_1^0$	94.7	239.8	22.8
$W_2^1$	111.1	288.3	25
$w_2^0$	101.9	266	22.4
x <sub>1</sub> <sup>1</sup>	101.3	258	24.1
x1 <sup>0</sup>	102.1	269.7	21.4
$x_2^1$	109.6	282.8	25
$x_{2}^{0}$	110.6	289.3	23.9
y1 <sup>1</sup>	106.3	278.3	23.1
y1 <sup>0</sup>	114.8	292.2	27.5
y2 <sup>1</sup>	109.6	282.8	25.1
y2 <sup>0</sup>	106.8	278.4	23.5

**Table 4** DNA sequences chosen represent every possible3-dimensional matching in the tube  $T_0$ 

Ø	5'-AATTCACAAACAATTACTCCTTCCCTACTCT CTCTCTCT
	3'-TTAAGTGTTTGTTAATGAGGAAGGGATGAG GAGAGAGATTAGTA-5'
{ <i>C</i> <sub>3</sub> }	5'-AATTCACAAACAATTACTCCTTCCCTACTCC CATCATCTACCTTA-3'
	3'-TTAAGTGTTTGTTAATGAGGAAGGGATGAG GGTAGTAGATGGAAT-5'
{ <i>C</i> <sub>2</sub> }	5'-AATTCACAAACAATTTCACCAAACCTAAAAT CTCTCTCT
	3'-TTAAGTGTTTGTTAAAGTGGTTTGGATTTTA GAGAGAGA
$\{C_2, C_3\}$	5'-AATTCACAAACAATTTCACCAAACCTAAAAC CATCATCTACCTTA-3'
	3'-TTAAGTGTTTGTTAAAGTGGTTTGGATTTTG GTAGTAGATGGAAT-5'
{ <i>C</i> <sub>1</sub> }	5'-TCTCCCTATTTATTTACTCCTTCCCTACTCT CTCTCTCT
	3'-AGAGGGATAAATAAATGAGGAAGGGATGA GAGAGAGAGA
$\{C_1, C_3\}$	5'-TCTCCCTATTTATTTACTCCTTCCCTACTCC CATCATCTACCTTA-3'
	3'-AGAGGGATAAATAAATGAGGAAGGGATGA GGGTAGTAGATGGAAT-5'
$\{C_1, C_2\}$	5'-TCTCCCTATTTATTTTCACCAAACCTAAAAT CTCTCTCT
	3'-AGAGGGATAAATAAAAGTGGTTTGGATTTT AGAGAGAGA
$\{C_1, C_2, \dots, C_n\}$	5'-TCTCCCTATTTATTTTCACCAAACCTAAAAC

C<sub>3</sub>} CATCATCTACCTTA-3' 3'-AGAGGGATAAATAAAAGTGGTTTGGATTTT GGTAGTAGATGGAAT-5'

**Table 5**The energy over all probe/library strandinteractions

	Enthalpy energy (H)	Entropy energy (S)	Free energy (G)
Average	106.728	276.255	24.1222
Standard deviation	5.34658	14.4172	1.53821

The Adleman program was employed for computing the distribution of the types of potential mishybridisations. The distribution of the types of potential mishybridisations is the absolute frequency of a probe-strand match of length k from 0 to the bit length 15 (for DNA sequences) where probes are not supposed to match the strands. The distribution was, subsequently, 280, 574, 933, 1520, 2008, 2074, 1552, 920, 507, 207, 70, 13, 0, 0, 0, and 0. It is pointed out from the last four zeros that there are 0 occurrences where a probe matches a strand at 12, 13, 14, or 15 places. This shows that the third constraint in subsection 3.2 has been satisfied. It is very clear that the number of matches peaks at 5(2074). That is to say that there are 2074 occurrences where a probe matches a strand at 5 places.

The results for simulation of Step 2 to Step 5 are shown in Tables 6–9, respectively. From the tube  $T_2$ , the answer was found to be  $\{C_1, C_2\}$ .

**Table 6**DNA sequences generated by Step 2 representpossible 3-dimensional matching in the tube  $T_0$ 

Ø	5'-AATTCACAAACAATTACTCCTTCCCTACT CTCTCTCTCT
$\{C_3\}$	5'-AATTCACAAACAATTACTCCTTCCCTACT CCCATCATCTACCTTA
	CAACCTATTATCTTAACCTCCTTAACACTTT ATAACCCATCCAT
$\{C_2\}$	5'-AATTCACAAACAATTTCACCAAACCTAAA ATCTCTCTCT
	CCTAAATCTCCAATAACCTCCTTAACACTTT ATAACCCATCCAT
$\{C_1\}$	5'-TCTCCCTATTTATTTACTCCTTCCCTACT CTCTCTCTCT
	CAACCTATTATCTTACTCTCAACAATCAAAC CCTATCACTAATAC-3'
$\{C_1, C_2\}$	5'-TCTCCCTATTTATTTTCACCAAACCTAAA ATCTCTCTCT
	CAACCTATTATCTTACCTAAATCTCCAATAC TCTCAACAATCAAAA
	CCTCCTTAACACTTCCCTATCACTAATACTA TAACCCATCCAT
	CCTCCTTAACACTTCCCTATCACTAATACT TAACCCATCCAT

**Table 7**DNA sequences generated by Step 3 representlegal 3-dimensional matching in the tube  $T_0$ 

$\{C_1, C_2\}$	5'-TCTCCCTATTTATTTTCACCAAACCTAAAA
	TCTCTCTCTAATCAT
	CAACCTATTATCTTACCTAAATCTCCAATAC
	TCTCAACAATCAAAA
	CCTCCTTAACACTTCCCTATCACTAATACTA
	TAACCCATCCATA-3'

**Table 8**DNA sequences generated by Step 4 representlegal 3-dimensional matching in the tube  $T_2$ 

$\{C_1, C_2\}$	5'-TCTCCCTATTTATTTTCACCAAACCTAAAA TCTCTCTCT
	CAACCTATTATCTTACCTAAATCTCCAATACT CTCAACAATCAAAA
	CCTCCTTAACACTTCCCTATCACTAATACTAT AACCCATCCAT

**Table 9** The answer was found from Step 5 in the tube  $T_2$ 

The answer	5'→3' DNA sequence
$\{C_1, C_2\}$	5'-TCTCCCTATTTATTTTCACCAAACCTAA AATCTCTCTCT
	CAACCTATTATCTTACCTAAATCTCCAATA CTCTCAACAATCAAAA
	CCTCCTTAACACTTCCCTATCACTAATAC TATAACCCATCCAT

#### 5 CONCLUSIONS

The famous Cook's theorem (Cormen et al., 2003; Garey and Johnson, 1979) is that if one algorithm for one NP-complete problem will be developed, then other problems will be solved by means of reduction to that problem. Cook's theorem is correct in a general *electronic* computer. In this paper, we proposed the algorithm for dealing with the 3-dimensional matching problem. Another famous NP-complete problem is the set-partition problem. The set-partition problem can be reduced to the 3-dimensional matching problem. But our algorithm cannot be applied to solving the set-partition problem. Therefore, we are not sure whether Cook's theorem is correct in a *molecular* computer.

Currently, there still are lots of NP-complete problems unsolved because it is very difficult to make basic biological operations for supporting mathematical operations. We are not sure whether molecular computing can be applied to dealing with every NP-complete problem. Therefore, in the future, our main work is to solve other NP-complete problem unresolved with the Adleman-Lipton model and the sticker model.

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