

Importance of Sequence Design Methods Considering Hybridization Kinetics for *in vivo* DNA Computers

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Keywords: Sequence Design, DNA Computer, Hybridization Kinetics.

Abstract: A DNA computer is a DNA-based synthetic system inspired by biology. One of the goals of DNA computer research is to develop an *in vivo* DNA computer, which can function within living cells through non-destructively processing intracellular signals under isothermal conditions. DNA computers working in isothermal conditions need a set of nucleotide sequences satisfying a kinetic condition in addition to the thermodynamic conditions considered previously, because the progress of computation under isothermal conditions is often dominated by the rate of nucleic acid hybridization reactions. We thus developed a method to predict the hybridization reaction rate from nucleotide sequences and have demonstrated experimentally the importance of hybridization reaction rates and the usefulness of our method. The present method is general and can be used to develop any hybridization-based DNA/RNA system such as DNA computers, DNA sensors, DNA nanostructures, and nucleic acid drugs, working in isothermal conditions.

1 DEOXYRIBONUCLEIC ACID (DNA) BASED SYNTHETIC SYSTEMS

Recent advances in DNA nanotechnology have allowed the development of several types of DNA-based synthetic systems (Stulz *et al.*, 2011). A DNA computer (Adleman, 1994), for instance, is one such DNA-based synthetic system that can perform computations. DNA computers employ nucleic acid reactions, such as hybridization, strand exchange, and enzymatic strand synthesis and cleavage reactions to process input information and produces output results. Hybridization reactions play an important role in DNA computers and DNA-based synthetic systems as they enable the systems to possess highly programmable attributes.

2 *in vivo* DNA COMPUTERS

One of the goals of DNA computer research is to develop an *in vivo* DNA computer, which can function within living cells (Benenson, 2012; Hemphill and Deiters, 2013). *In vivo* DNA computers are expected to be widely used in fields

ranging from basic to applied biology and medicine. For instance, an *in vivo* DNA computer can be used as a non-destructive measuring instrument. It can collect information on cell conditions from mRNAs transcribed in a cell, and can report the information outside the cell by enclosing it in vesicles such as exosomes. An *in vivo* DNA computer can also be used to develop intelligent drugs. This computer can use the information it has collected to produce RNA and protein molecules as drugs to treat unfavorable cell conditions or induce differentiation of cells to form organs.

Fuzzy logic (Kosko and Isaka, 1993) may provide a theoretical basis for the operation of *in vivo* DNA computers. Values of data *in vivo* DNA computers can collect in living cells are in fact fuzzy. In addition, molecular reaction circuits of *in vivo* DNA computers cannot perform sufficiently precise operations, unlike electronic circuits. Thus, implementation of fuzzy logic may be important for the operation of *in vivo* DNA computers.

Certain evolutionary systems may be successfully combined with *in vivo* DNA computers to more closely mimic the process of natural selection. For instance, an *in vivo* DNA computer could automate iterative cycles of mutagenesis, selection, and amplification processes employed in the directed evolution (or evolutionary molecular

engineering) method (Packer and Liu, 2015) to simulate the evolution of proteins or nucleic acids toward a user-defined goal. Automation allows the user to optimize the method.

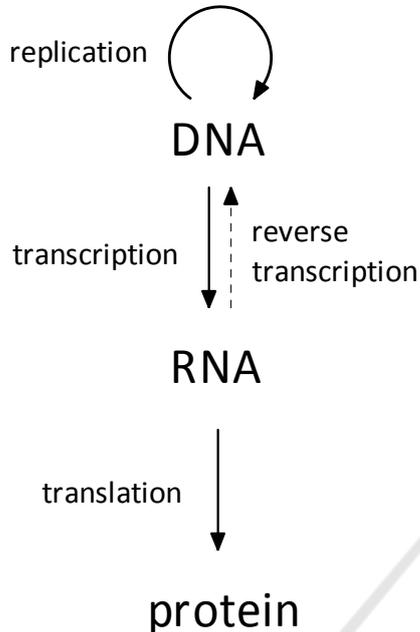


Figure 1: Central dogma of molecular biology.

3 REVERSE-TRANSCRIPTION-AND-TRANSCRIPTION-BASED AUTONOMOUS COMPUTING SYSTEM (RTRACS)

RTRACS is a modular DNA computer that works under isothermal conditions using DNA as a program and RNA as a variable (Nitta and Suyama, 2004; Takinoue *et al.*, 2008). RTRACS provides a promising framework for *in vivo* DNA computers, because the idea of RTRACS was inspired by the central dogma of molecular biology. The dogma defines the flow of genetic information within a biological system (Fig. 1). Genomic DNA storing genetic information in the form of a DNA sequence is transcribed onto a messenger RNA (mRNA), which is then translated into a protein to assemble replicated systems. Considering information stored in genomic DNA as a source program and small pieces of the information transferred into mRNA as variables, the information flow within a biological system and that within a computer appear to be homologous. This implies that a biological system is itself a DNA computer that uses DNA as a

program and RNA as a variable. RTRACS uses DNA and RNA in a manner similar to a biological system. Therefore, RTRACS is highly compatible with a biological system, and can provide a suitable framework for *in vivo* DNA computers.

RTRACS performs computations using the network or circuit of modularized computational elements called function modules. In the network, function modules are connected together by RNA molecules (Fig. 2). An RTRACS program is written using the network structure of function modules. A function module accepts input RNA molecules and returns output RNA molecules produced through molecular reactions that include DNA-DNA hybridizations, DNA-RNA hybridizations, and enzymatic reactions with reverse transcriptase, RNase H, and RNA polymerase. The input and output RNA sequences contain not only the values for input and output data but also information regarding the connection of function modules. The RNA sequences consist of code word sequences (orthonormal sequences) with high sequence specificity.

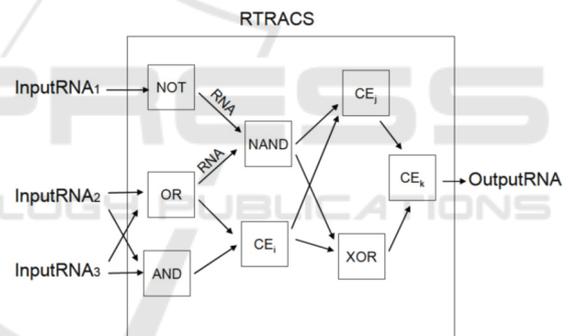


Figure 2: Network of function modules used in RTRACS to perform computation.

4 RTRACS-BASED *in vivo* DNA COMPUTER

We describe here, an example of a synthetic genetic circuit constructed using RTRACS function modules. The synthetic circuit is compatible with endogenous genetic circuits, namely, genetic circuits within a cell. Thus, the synthetic gene circuit can work as an *in vivo* DNA computer, which measures cellular conditions and applies appropriate action to the cell in response to these conditions.

The synthetic genetic circuit has two input mRNAs and one output mRNA translated into a target protein (Fig. 3a) and works as follows. First,

two input mRNAs, X and Y, are encoded as RNA sequences used in RTRACS. Second, the coded RNAs are processed by the function module that performs the AND operation, and an output RNA is produced according to the value of the operation result. Third, the produced RNA is decoded into mRNA of protein Z. Finally, the mRNA is translated into protein Z. Unlike the natural genetic circuit inherently present in a cell (Fig. 3b), the synthetic genetic circuit (Fig. 3a) has an advantage that the input mRNA molecules are not necessarily the sequences of transcription factors. In addition, any protein can be produced as the output. Preliminary experiments using green fluorescence protein as the output protein demonstrated that the synthetic genetic circuit functions within a cell-free protein synthesis environment.

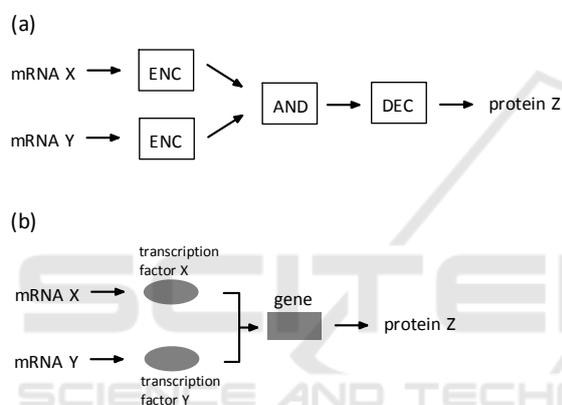


Figure 3: Regulation of gene expression with transcription factors. (a) A synthetic mechanism constructed using RTRACS. (b) A natural mechanism widely employed for genetic circuits in living cells.

5 SEQUENCE DESIGN FOR *in vivo* DNA COMPUTERS

DNA computers need a set of nucleotide sequences of high hybridization specificity. A reliable design method for such a sequence set usually adopts the following three thermodynamic conditions: presence of normality, orthogonality, and prevention of stable secondary self-folding. Normality implies that all sequences within the set have similar melting temperatures, while orthogonality indicates that any two sequences in the set, except sequences complementary to each other, do not hybridize into a stable double strand with comparable melting temperature to a double strand formed between complementary strands. The prevention of stable

secondary self-folding helps sequences take double-stranded forms with complementary strands rather than maintain their single-stranded form.

DNA computers working in isothermal conditions, such as RTRACS and *in vivo* DNA computers, need a set of nucleotide sequences satisfying a kinetic condition in addition to the three thermodynamic conditions. Namely, all hybridization reaction rates are required to be adequate for reliable computation. The progress of computation under isothermal conditions is often dominated by the rate of nucleic acid hybridization reactions. Therefore, various undesirable problems would occur in computation if the hybridization reaction rates are not appropriate. For example, a computation is not completed within the expected timeline if the computation includes a very slow hybridization step. Timing problems tend to occur in parallel computing if the speed of computation differs largely between processes.

To ensure that the design of nucleotide sequence sets satisfies the kinetic condition, we developed a method to predict the rate of hybridization reactions involved in DNA computation from nucleotide sequences. The method predicts the rate based on the nucleation-zipper model of complementary strand hybridization and can be applied not only to DNA-DNA hybridization reactions but also to DNA-RNA and RNA-RNA hybridization reactions.

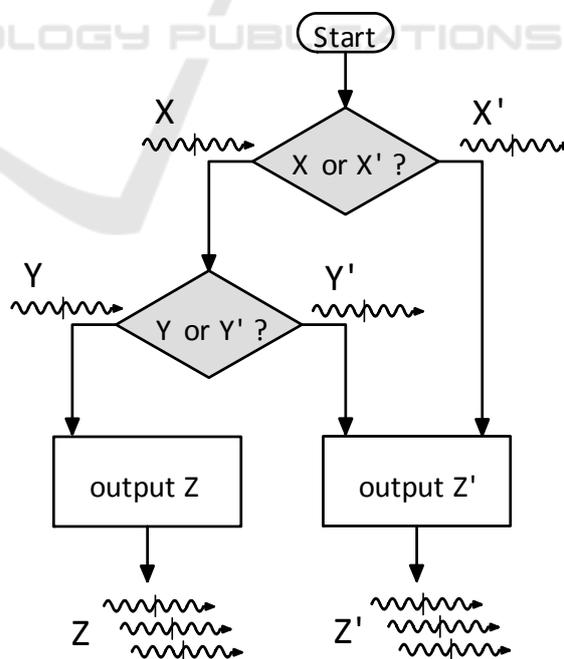


Figure 4: Schematic diagram of computational processes in logic gate modules.

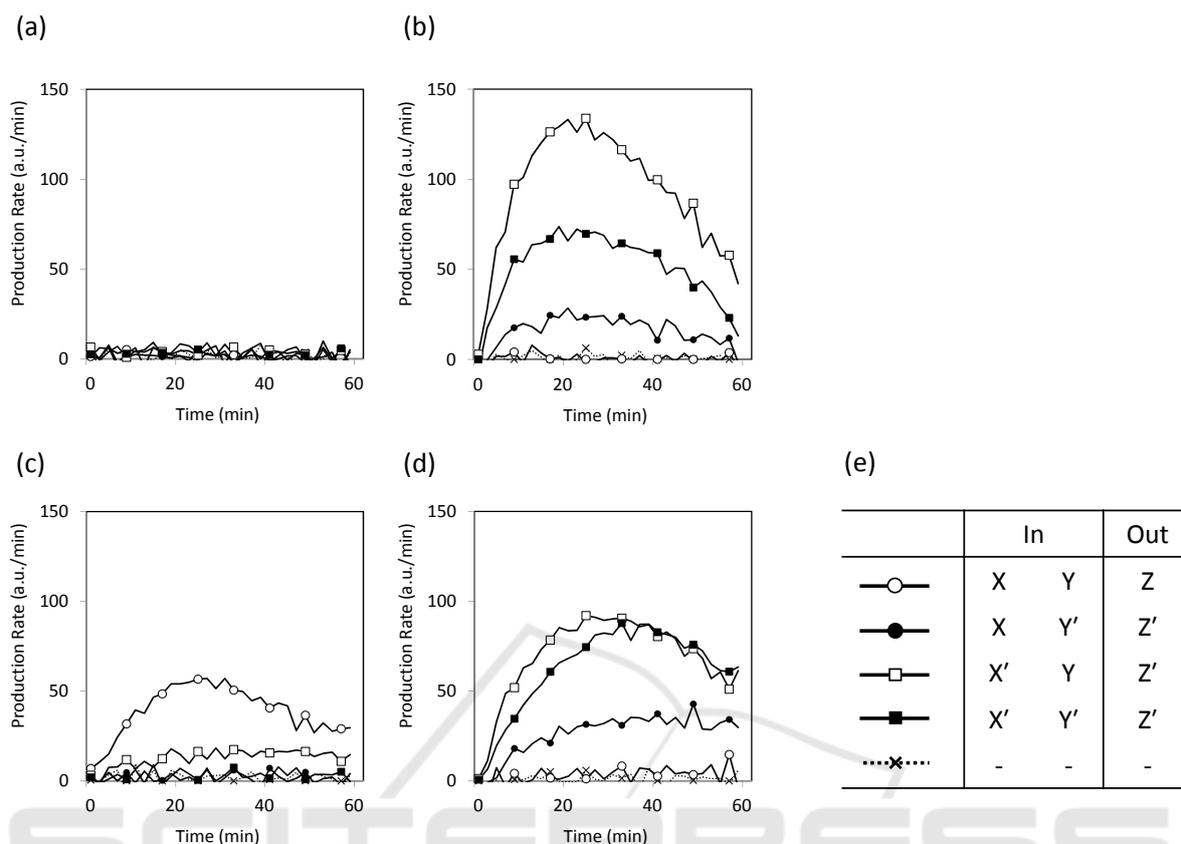


Figure 5: Output production rates of LGM1 and LGM2. (a) Z and (b) Z' output of LGM1. (c) Z and (d) Z' output of LGM2. The rate is defined as the speed at which a change in the intensity of fluorescence emitted from output RNA occurs. (e) The input-output relation (truth table) for LGM and line types of the input combinations. The results were obtained as follows. The reaction mixtures contained 100 mM primer DNA cx that specifically binds to input X, 10 mM primer DNA cx' that specifically binds to input X', 2 mM each of converter DNAs transcribing output Z and Z', 100 mM each of input RNAs corresponding to the specified input combination, 250 mM each of 2'-O-methyl molecular beacons with FAM and Cy5 dyes specifically binding to output Z and Z', respectively, 0.3 unit/ μ L AMV Reverse Transcriptase (Promega), 1 unit/ μ L Hybridase Thermostable RNase H (Epicentre), Thermo T7 RNA polymerase (Toyobo), 5 mM DTT, 0.15 mM of each dNTP, and 1 mM of each NTP in a 20 μ L reaction buffer (40 mM Tris-HCl [pH 8.0], 50 mM NaCl, 9.6 mM $MgCl_2$). The mixtures were prepared on ice and immediately incubated at 50°C to measure the fluorescence intensity of FAM (Z output) and that of Cy5 (Z' output) once every 2 minutes using a real time polymerase chain reaction detection system, CFX96 (Bio-Rad).

The method was applied to design nucleotide sequence sets for logic gate modules (LGMs) of RTRACS. LGM can perform various logical operations including AND, OR, NAND, NOR, INH, and NINH (Kan *et al.*, 2014). A schematic diagram of the computational processes forming LGM is shown in Fig. 5. LGM accepts four combinations of input RNA molecules: (X, Y), (X, Y'), (X', Y), and (X', Y'). The output RNA molecule Z is produced only if the input combination is (X, Y). The output RNA molecule Z' is produced if the combination is one of the other three. There are DNA-RNA hybridization reactions in the decision process of X or X', and Y or Y'. We designed two sets of nucleotide sequences, one for LGM1 and the other

for LGM2. The sequence set for LGM1 was designed using only the thermodynamic conditions. In contrast, the set for LGM2 was designed using both, kinetic and thermodynamic conditions. After applying the kinetic condition to nucleotide sequences in the set for LGM1, those sequences that did not satisfy the kinetic condition were replaced with those satisfying both, kinetic and thermodynamic conditions to generate the sequence set for LGM2.

Experimental results of the operation of LGM1 and LGM2 agreed with the predicted kinetic properties of their sequences. LGM1 did not work correctly and produced no output RNA Z for the input combination (X, Y), while LGM2 correctly

produced output RNA Z according to the truth table of LGM (Fig. 6a, c). As for output RNA Z', LGM1 and LGM2 both, correctly produced the output (Fig. 6b, d). These results were consistent with the hybridization rate prediction, which stated that the hybridization reaction rate related to the decision process of Y in LGM1 only was too slow to produce output RNA Z promptly. These results demonstrate the importance of predicting hybridization reaction rates for the development of LGMs and usefulness of the present kinetic method.

Our kinetic method to predict the hybridization reaction rate from nucleotide sequences is general and its application is not limited to the development of LGMs of RTRACS. The method can be used to develop any hybridization-based DNA/RNA system such as DNA computers, DNA sensors, DNA nanostructures, and nucleic acid drugs, especially working in isothermal conditions. The method is also useful in other areas of biological research, such as identification of non-coding RNA functions and understanding their mechanism.

ACKNOWLEDGEMENTS

This work was supported by Grant-in-Aid for Scientific Research on Innovative Areas [23119007] to A.S. from the Ministry of Education, Culture, Sports, Science, and Technology, Japan. H.K. acknowledges support from the Japan Society for the Promotion of Science through Program for Leading Graduate Schools (ALPS).

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