# A Deterministic Cellular Array Model of Reaction-Diffusion Systems for Parallel Generation of Pseudo-Random I.I.D. Sequences 

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#### Abstract

This paper presents a deterministic cellular array model of reaction-diffusion systems for parallel generation of pseudorandom binary i.i.d. sequences. As diffusion systems contain the Brownian particles, the cellular array contains virtual molecules which move like simple random walkers with their composition changed. Then, the direction which the virtual molecules move in will be i.i.d. Numerical experiments show that the pseudorandom i.i.d. sequences generated from the cellular array possess almost the same statistical properties as truly random binary i.i.d. sequences.


## 1. Introduction

Binary pseudorandom sequences which play important roles in communication and information processing fields are generated in various ways. Algebraic methods which employ linear feedback shift registers [1] are most widely applied in the fields. Chaotic methods using discretized piecewise linear maps [2] can generate not only independently and identically distributed (i.i.d.) sequences but also Markovian sequences. A method using cellular array models of probabilistic physical systems [3] is also proposed to generate Markovian sequences. In this paper, we will build a deterministic cellular array model of reactiondiffusion systems for parallel generation of pseudorandom binary i.i.d. sequences. As diffusion systems contain the Brownian particles, the cellular array contains virtual molecules which behave like simple random walkers. Then, the direction which the particles move in will be i.i.d. In Sections 2, we will introduce the cellular array. In Section 3, we will investigate the statistics of the sequences generated from the array.

## 2. Cellular Array

### 2.1. Diffusion Cellular Array

We first present a cellular array model of diffusion systems without reaction between their ingredients [4]. Figure 1 shows a one-dimensional cellular array model. We assume in the array pseudo-Brownian particles each of which carries a truth variable taking " 1 " or


Figure 1: A diffusion cellular array.
" 0 " and moves from a cell to one of its adjacent cells for one time step. The cells in the array are switches which take parallel or cross connection between two inputs $a_{l}, a_{r}$ and two outputs $u_{l}, u_{r}$. Suppose that a particle which goes out from $u_{r}$ of $C e l l_{i-1}$ enters to $a_{l}$ of $C e l l_{i}$. When the internal connection of $C e l l_{i}$ is parallel, the particle changes its direction and goes back to $C e l l_{i-1}$. When the connection is cross, the particle keeps its direction and moves to $C e l l_{i+1}$. The internal connection of each cell is determined by a logic function $F$,

$$
\begin{equation*}
\text { Parallel } / \overline{\mathrm{Cross}}=F\left(a_{l}, a_{r}, q\right) \tag{1}
\end{equation*}
$$

where $a_{l}$ and $a_{r}$ are the truth variables of two particles which enter the cell and $q \in\{1,0\}$ is an internal state of the cell. A logic function $F_{q}$ determines the state at each time step,

$$
\begin{equation*}
q \leftarrow F_{q}\left(a_{l}, a_{r}, q\right) \tag{2}
\end{equation*}
$$

If the probabilities that the internal connection is parallel and cross are even, that is

$$
\begin{equation*}
\operatorname{Prob}(F=1)=\operatorname{Prob}(F=0)=0.5 \tag{3}
\end{equation*}
$$

a particle in a cell moves to its left and right adjacent cells at even probabilities. Then, we regard all the pseudo-Brownian particles in the array as simple random walkers.

The sequence of the direction of a simple random walker is ideally a binary i.i.d. sequence. We once expected that pseudorandom i.i.d. sequences of fine quality would be obtained by the cellular array model of diffusion systems. However, unfortunately, we saw a small difference between the statistical properties of the sequences obtained by the diffusion cellular array and truly random binary i.i.d. sequences.


Figure 2: A reaction-diffusion cellular array.

### 2.2. Reaction-Diffusion Cellular Array

We introduce reaction cells and construct a cellular array model of reaction-diffusion systems. The reaction cells change the truth variables which the particles in the cellular array model of diffusion systems possess. Then, we expect to see very randomized motion of the particles in the cellular array model of reactiondiffusion systems.

We construct a three-layer cellular array as shown in Fig. 2. The cellular array executes simplified microscopic simulation of diffusion and the following chemical reaction.

$$
\begin{equation*}
A \rightleftharpoons B+C \tag{4}
\end{equation*}
$$

The upper and the lower layers are the diffusion arrays introduced in the previous subsection. The inputs and the outputs of the cells in the upper array are denoted by $b_{l}, b_{r}, v_{l}$, and $v_{r}$. Cells for reaction (4) form the middle layer. The pseudo-Brownian particles possessing truth values " 1 "s and " 0 "s in the lower diffusion array represent molecules $A$ and $C$. The pseudoBrownian particles possessing truth values " 1 "s in the upper diffusion array represent molecules $B$. We assume in the upper diffusion array that there exists no molecule (which we call molecule $\phi$ ) at the locations which particles possessing truth values "0"s occupy. The internal connections of the lower and the upper diffusion cells are always different. Then, the connections in the upper cells are determined by

$$
\begin{equation*}
\text { Parallel } / \overline{\operatorname{Cross}}=\overline{F\left(a_{l}, a_{r}, q\right)} \tag{5}
\end{equation*}
$$

Reaction cells simulate the chemical reaction given by Eq. (4). Each reaction cell has two inputs $u, v$, two outputs $a, b$ and one internal state $e$. They all take truth values " 1 "s and " 0 "s. The cell operation rule is described by three logic functions $G_{a}, G_{b}$, and $G_{e}$,

$$
\begin{align*}
a & \leftarrow G_{a}(u, v, e)  \tag{6}\\
b & \leftarrow G_{b}(u, v, e)  \tag{7}\\
e & \leftarrow G_{e}(u, v, e) \tag{8}
\end{align*}
$$

The inputs and the outputs are connected to the outputs and the inputs of diffusion cells, as shown in Fig.
2. Input $u$ takes the value that a particle at the output of the lower diffusion cell has, that is, $u=1$ if the particle is molecule $A, u=0$ if the particle is molecule $C$. Input $v$ takes the value that a particle at the output of the upper diffusion cell has, that is, $v=1$ if the particle is molecule $B, v=0$ if the particle is molecule $\phi$. If output $a=G_{a}=1$, a molecule at the output of the lower diffusion cell is changed to (or kept as) $A$. If $a=0$, the molecule is changed to (or kept as) $C$. Then, the molecule returns to the lower diffusion array. If output $b=G_{b}=1$, a molecule at the output of the upper diffusion cell is changed to (or kept as) molecule $B$. If $b=0$, the molecule is changed to (or kept as) molecule $\phi$. Then, it returns to the upper diffusion array. The internal state $e$ represents whether or not the molecules entered in the reaction cell have kinetic energy greater than activation energy. If $e=1$, reaction (4) occurs in the cell. Two reaction cells receive molecules from the same upper and lower diffusion cells. Let the internal states of the left and right reaction cells of the pair be $e_{l}$ and $e_{r}$. Before the reaction cells operate according to Eqs. (6), (7) and (8), $e_{l}$ and $e_{r}$ may be exchanged. The exchange also depends on the logic function $F$ which determines internal connections of the diffusion cells. The exchange rule is expressed by:

$$
\begin{align*}
e_{l} & \leftarrow F e_{l}+\bar{F} e_{r}  \tag{9}\\
e_{r} & \leftarrow \bar{F} e_{l}+F e_{r} \tag{10}
\end{align*}
$$

The reaction-diffusion system modeled by the threelayer cellular array is a materially closed system because the reaction cells conserve the total number of molecules $A$ and $B$, and the total number of molecules $A$ and $C$. Let the expectation of the number of molecules $A$ in $C e l l_{i}$ at time $n$ be denoted by $w_{i}(n)$. From the operations of the diffusion and the reaction cells, we can derive the following equation:

$$
\begin{align*}
& \frac{w_{i}(n+2)-w_{i}(n)}{2} \\
& \quad=\quad D\left\{\left(w_{i+1}(n)-w_{i}(n)\right)-\left(w_{i}(n)-w_{i-1}(n)\right)\right\} \\
& \quad+\quad k w_{i}(n) \tag{11}
\end{align*}
$$

where $D=1 / 32$ and $k=-3 / 8$. Equation (11) corresponds to a difference equation obtained by the discretization of the following linear partial differential equation:

$$
\begin{equation*}
\frac{\partial w}{\partial t}=D \frac{\partial^{2} w}{\partial x^{2}}-k w \tag{12}
\end{equation*}
$$

The first and the second terms of the right hand side represent diffusion and reaction respectively. Diffusion coefficient $D$ depends on the logic functions $F$ and $F_{q}$. If $\operatorname{Prob}(F=1) \neq 1 / 2$, coefficient $D$ is smaller than $1 / 32$ and an advection term is added to Eq. (12). Reaction speed $k$ depends on the logic functions $G_{a}, G_{b}$, and $G_{e}$.


Figure 3: Probability distributions.

## 3. Numerical Experiments

In this section, we investigate the statistical properties of the sequences generated by a reaction-diffusion cellular array model. The specifications on the reaction-diffusion cellular array model are as follows: Both the upper and lower diffusion cellular arrays have $(N=) 19$ diffusion cells and $(2 N=) 38$ molecules. Then the number of the cells required to form the reaction layer is 38 . Boundary conditions for the two diffusion cellular arrays are periodic, that is, the two arrays are circular. Logic functions which determine the operation of the diffusion cells are given by

$$
\begin{align*}
F\left(a_{l}, a_{r}, q\right) & =a_{l} \oplus a_{r} \oplus q  \tag{13}\\
F_{q}\left(a_{l}, a_{r}, q\right) & =\overline{a_{l}} \oplus q \tag{14}
\end{align*}
$$

Logic functions which determine the operation of the reaction cells are given by

$$
\begin{align*}
G_{a}(u, v, e) & =u \bar{e}+\bar{v} e  \tag{15}\\
G_{b}(u, v, e) & =\bar{u} e+v \bar{e}  \tag{16}\\
G_{e}(u, v, e) & =\overline{u \oplus v \oplus e} \tag{17}
\end{align*}
$$

Pseudorandom i.i.d. sequences to be examined are the sequences of the directions $d(n)$ which molecules in
the lower diffusion cellular array move in. If the internal connection of $C e l l_{i}$ is parallel at time $n$, a molecule which enters to $\mathrm{Cell}_{i}$ from input $a_{l}$ goes out from output $u_{l}$ and moves to Cell $_{i-1}$. Then, $d(n)=-1$. If the connection is cross, the molecule moves to Cell $_{i+1}$. Then, $d(n)=+1$. From time $n=n_{0}+1, n_{0}=10^{7}$, we acquire sequences of length $2 \times 10^{6},\left\{d\left(n_{0}+1\right), \cdots d\left(n_{0}+\right.\right.$ $\left.\left.2 \times 10^{6}\right)\right\}$ by tracking the motion of molecules moving in the array which is given an initial condition at time $n=0$. (From time $n=0$ to $n_{0}$ we discard the sequences.) We can obtain ( $2 N=$ ) 38 sequences in parallel for one initial condition. We acquire $100 \times 2 N$ sequences for $(M=) 100$ different initial conditions. We divide each sequence into ( $L=$ ) 100 subsequences of length $2 \times 10^{4}$. Then, we obtain totally ( $L \times M \times 2 N=$ ) 380,000 subsequences. We use them for samples to investigate the statistical properties.

We also acquire sequences from cellular automata whose behavior is governed by the following iteration called Rule30 [5]:

$$
\begin{equation*}
c_{i}(n+1) \leftarrow c_{i-1}(n) \oplus c_{i}(n) \oplus c_{i+1}(n) \oplus c_{i}(n) c_{i+1}(n) \tag{18}
\end{equation*}
$$

where $c_{i}(n)$ denotes the state of a cell at location $i, i=0,1, \cdots, 37$, at time $n$. We compare the se-

Table 1: Probabilities that $x_{M}, \chi^{2}, x_{R} j, x_{L}$ are out of the pass ranges.

| Test | Pass range | Truly random binary i.i.d. | Reaction-diffusion cellular array | Cellular automata (Rule30) |
| :---: | :---: | :---: | :---: | :---: |
| Monobit test | $9725<\mathrm{X}_{\mathrm{M}}<10275$ | 10-4 | $1.06 \times 10^{-4}$ | $1.97 \times 10^{-4}$ |
| Poker test | $2.16<\chi 2<46.17$ | 10-4 | $9.21 \times 10^{-5}$ | $3.82 \times 10^{-4}$ |
| Runs test Length 1 | $2314<X_{\text {R1 }}<2686$ | $7.36 \times 10^{-5}$ | $6.32 \times 10^{-5}$ | $5.00 \times 10^{-5}$ |
| Length 2 | $1113<X_{\text {R } 2}<1387$ | $1.88 \times 10^{-5}$ | $1.58 \times 10^{-5}$ | $2.08 \times 10^{-4}$ |
| Length 3 | $526<\mathrm{X}_{\text {R }}<724$ | $1.87 \times 10^{-5}$ | $1.58 \times 10^{-5}$ | $8.16 \times 10^{-5}$ |
| Length 4 | $239<X_{\text {R } 4}<385$ | $1.68 \times 10^{-5}$ | $1.84 \times 10^{-5}$ | $3.90 \times 10^{-4}$ |
| Length 5 | $102<X_{\text {R } 5}<210$ | $1.30 \times 10^{-5}$ | $1.58 \times 10^{-5}$ | $1.05 \times 10^{-5}$ |
| Length > 5 | $102<X_{R>5}<210$ | $9.02 \times 10^{-6}$ | $2.63 \times 10^{-6}$ | $1.42 \times 10^{-4}$ |
| The longest run test | XL<26 | $2.98 \times 10^{-4}$ | $2.95 \times 10^{-4}$ | $2.92 \times 10^{-4}$ |

quences generated from the reaction-diffusion cellular array model with the sequences generated from the cellular automata which operate according to Rule30.

## Monobit Test

Figure 3(a) shows a probability distribution of the number $x_{M}$ of " +1 " $s$ contained in a subsequence.

## Poker Test

We obtain from a subsequence 5,000 four-bit words $\boldsymbol{d}_{m}=\left(d\left(n_{l}+4 m+1\right), d\left(n_{l}+4 m+2\right), d\left(n_{l}+4 m+3\right)\right.$, $\left.d\left(n_{l}+4 m+4\right)\right), m=0, \cdots, 4999, n_{l}=n_{0}+2 \times 10^{4} \times l$, $l=0, \cdots, 99$. There exist 16 kinds of word, $\boldsymbol{w}_{k}, k=0$, $\cdots, 15$, in a set of 5,000 word elements. Let the number of words such that $\boldsymbol{d}_{m}=\boldsymbol{w}_{k}$ in the set be denoted by $f_{k}$. Figure 3(b) shows the probability distribution of $\chi^{2}$ given by the following expression in terms of $f_{k}$ :

$$
\begin{equation*}
\frac{16}{5000} \sum_{k=0}^{15} f_{k}^{2}-5000 \tag{19}
\end{equation*}
$$

## Runs Test

Figures 3 (d) to (i) show probability distributions of the numbers $x_{R j}$ of " +1 " runs of lenght $(j=) 1,2, \cdots$, 5 and longer than 5 contained in a subsequence.

## The Longest Run Test

Figure 3(c) shows a probability distribution of the length $x_{L}$ of the longest " +1 " run contained in a subsequence.

Table 1 shows probabilities that $x_{M}, \chi^{2}, x_{R j}, x_{L}$ are out of the ranges which were the PASS RANGE designated in FIPS 140-2 randomness tests. We see from Figs. 3 and Tab. 1 that the pseudorandom sequences generated from the reaction-diffusion cellular array have almost the same statistical properties as truly random binary i.i.d. sequences. We see
from Tab. 1 that the sequence the cellular automata with Rule 30 generate contains more runs whose length are longer than 5 than truly random binary i.i.d. sequences.

## 4. Conclusions

We have found that the pseudorandom i.i.d. sequences generated from the deterministic reactiondiffusion cellular array model have almost the same statistical properties as truly random i.i.d. sequences.

A diffusion cell permutes two molecules at each time step. Discretized chaotic maps [2] are also considered to permute small intervals of variable space. It is interesting that both discrete systems generate pseudorandom sequences by permutation. Permutation seems to be an origin of randomness.

## References

[1] P. Fan and M. Darnell, "Sequence Design for Communication Applications," Research Studies Press, 1996.
[2] D. Yoshida, A. Tsuneda and T. Inoue, "An Algorithm for the Generation of Maximal-Period Sequences based on One-Dimensional Chaos Maps with Finite Bits," IEICE Trans. on Fundamentals, Vol.E87-A, No.6, pp.1371-1376, 2004.
[3] H. Fujisaka, K. Furuta, S. Soga, K. Haeiwa and T. Kamio, "A Parallel Method for Generating Pseudorandom Binary Markovian Sequences," Proc. Int'l Symp. on Spread Spectrum Techniques and Applications, pp.103-107, 2006.
[4] H. Fujisaka, D. Hamano, M Sakamoto and T. Kamio, "A Binary-Quantized Pseudo-Diffusion Systems," Proc. Int'l Symp. on Circuits and Systems, pp.720-723, 2004.
[5] A. Ilachinski, "Cellular Automata: A Discrete Universe," World Scientific Publishing, 2001.

