Abstract: Axon P systems are a class of spiking neural P systems. In this paper, the axon P systems are used as number generators and language generators. As a language generator, the relationships of the families of languages generated by axon P systems with finite and context-free languages are considered. As a number generator, a characterization of the family of finite sets can be obtained by axon P systems with only one node. The relationships of sets of numbers generated by axon P systems with semilinear sets of numbers are also investigated. This paper partially answers some open problems formulated by H. Chen, T.-Ô. Ishdorj and Gh. Păun.

Keywords: Membrane computing, SN P systems, Axon P systems

1 Introduction

The spiking neural P systems (in short, SN P systems) are a class of bio-inspired computing devices introduced in [6], which attempts to incorporate the idea of spiking neurons into the area of membrane computing. The resulting models are a variant of tissue-like and neural-like P systems, with specific ingredients and way of functioning inspired from spiking neurons. In SN P systems, the main “information-processor” is the neuron, while the axon is only a channel of communication without any other role – which is not exactly the case in neurobiology. So, recently, a special form of spiking neural P systems, called axon P systems, is introduced in [3], which corresponds to the activity of Ranvier nodes of neuron axon. Actually, axon P systems are a sort of linear SN P systems. Spikes are transmitted along the axon, to the left and to the right, from one node to another node, and an output is provided by the rightmost node. A symbol $b_i$ is associated with a step when $i$ spikes exit the system, in this way a string is associated with a computation. In [3], the language generating power of axon P systems under the above definition was investigated, and many open problems and research topics were formulated. In this paper, we continue the study of axon P systems, specifically, the number generative power and the language generative power are investigated, and in this context we answer some open problems formulated in [3].

SN P systems can be used as number generators (e.g., [2, 4, 6, 7]) or language generators (e.g., [1, 2, 5, 10, 12]). As a variant of SN P systems, axon P systems can also be used as number generators and language generators. As a number generator, we do not care whether or not the computation halts, but we only request that the output node spikes exactly twice during the computation, and the result of a computation is the number of steps elapsed between the two moments when the output node spikes. In this case, a characterization of the family of finite sets is given by axon P systems with one node. Also, the relationships of sets of numbers generated by axon P systems with semilinear sets of numbers are also investigated. As a language generator, each configuration is described by a corresponding string, and the result of a halting computation is defined as the strings associated with configurations where the system emits a spike. In this case, the relationships of the families of languages generated by axon P systems with finite and context-free languages are considered.

The paper is organized as follows. In Section 2, formal language theory prerequisites useful in the following sections are recalled. In Section 3, the definition of axon P systems and the problems considered in this paper are given. Axon P systems as number generators and language generators are investigated respectively in Section 4 and Section 5. Conclusions and remarks are drawn in Section 6.

2 Formal Language Theory Prerequisites

We assume the reader to be familiar with basic language and automata theory, as well as basic membrane computing [8] (for more updated information about membrane computing, please refer to [11]), so that we specify here only a few notations and basic definitions.
Let us start by mentioning the following convention: when comparing two generative or accepting devices, number zero is ignored (this corresponds to the usual convention in language theory of ignoring the empty string).

For an alphabet \( V \), \( V^* \) denotes the set of all finite strings over \( V \), with the empty string denoted by \( \lambda \). The set of all nonempty strings over \( V \) is denoted by \( V^+ \). When \( V = \{ a \} \) is a singleton, then we write simply \( a^* \) and \( a^+ \) instead of \( \{ a \}^*, \{ a \}^+ \). The length of a string \( x \in V^* \) is denoted by \( |x| \). For a language \( L \subseteq V^* \), the set \( \text{length}(L) = \{ |x| \mid x \in L \} \) is called the length set of \( L \). The families of finite, regular, linear and context-free languages are denoted by \( \text{FIN}, \text{REG}, \text{LIN}, \text{CF} \), respectively. The families of length sets of languages in \( \text{FIN}, \text{REG}, \text{LIN} \) and \( \text{CF} \) are denoted by \( \text{NFIN}, \text{NREG}, \text{NLIN}, \text{NCF} \), respectively.

The family of languages generated by \( \omega \)-L systems is denoted by \( \omega \)-\( \text{L} \), and we add the letter \( E \) in front of \( \omega \)-\( \text{L} \) if extended \( \omega \)-\( \text{L} \) systems are used. We also denote by \( \text{SLIN} \), the family of semilinear sets of numbers (the subscript indicates that we work with one-dimensional vectors, not with semilinear sets of vectors in general). It is known that the following equalities hold true: \( \text{NREG} = \text{NLIN} = \text{NCF} = \text{SLIN}_1 \) (see, e.g., [8]).

A regular expression over an alphabet \( V \) is defined as follows: (i) \( \lambda \) and each \( a \in V \) is a regular expression, (ii) if \( E_1, E_2 \) are regular expressions over \( V \), then \( (E_1)(E_2), \{ E_1 \} \cup \{ E_2 \} \), and \( \{ E_1 \}^+ \) are regular expressions over \( V \), and (iii) nothing else is a regular expression over \( V \). With each expression \( E \) we associate a language \( L(E) \), defined in the following way: (i) \( L(\lambda) = \{ \lambda \} \) and \( L(a) = \{ a \} \), for all \( a \in V \), (ii) \( L(E_1(E_2)) = L(E_1) \cup L(E_2), L(\{ E_1 \} \cup \{ E_2 \}) = L(E_1,E_2), L(\{ E_1 \}^+) = L(E_1)^+ \), for all regular expressions \( E_1, E_2 \) over \( V \). Non-necessary parentheses are omitted when writing a regular expression, and also \( (E_1)^+ \cup (\lambda) \) can be written as \( E^+ \).

A Chomsky grammar is given in the form \( G = (N, T, S, P) \), with \( N \) being the nonterminal alphabet, \( T \) the terminal axiom, \( S \in N \) the axiom, and \( P \) is the finite set of productions. For regular grammars, the productions are of the form \( u \rightarrow v \), for some \( u \in N, v \in T \cup TN \) (in regular grammars, we also allow productions of the form \( u \rightarrow \lambda \), but only when this is useful for simplifying the grammar: because of the convention that the empty string is not counted when comparing the languages generated by two grammars, such productions are not necessary in regular grammars).

### 3 Axon P Systems

We now introduce the axon P systems.

An axon P system of degree \( m \geq 1 \) is a construct of the form

\[ \Pi = (O, \rho_1, \ldots, \rho_m), \]

where:

1. \( O = \{ a \} \) is the singleton alphabet (\( a \) is called spike);
2. \( \rho_1, \ldots, \rho_m \) are (Ranvier) nodes, of the form

\[ \rho_i = (n_i, R_i), 1 \leq i \leq m, \]

where:

a) \( n_i \geq 0 \) is the initial number of spikes contained in \( \rho_i \);

b) \( R_i \) is a finite set of rules of the form \( E/a^c \rightarrow (a', a') \), where \( E \) is a regular expression over \( a \), \( c \geq 1 \), and \( l, r \geq 0 \), with the restriction that \( R_i \) contains only rules with \( l = 0 \).

The nodes are arranged along an axon in the order \( \rho_1, \ldots, \rho_m \), with \( \rho_m \) at the end of the axon; this means that node \( \rho_m \) is the output node of the system.

A rule \( E/a^c \rightarrow (a', a') \in R_i \) is used as follows. If the node \( \rho_i \) contains \( k \) spikes, and \( a^k \in L(E), k \geq c \), then the rule can be applied, and this means consuming (removing) \( c \) spikes from \( \rho_i \) (thus only \( k - c \) spikes remain in \( \rho_i \)), and it sends \( l \) spikes to its left hand neighbor and \( r \) spikes to its right hand neighbor; the first node, \( \rho_i \), does not send spikes to the left, while in the case of the rightmost node, \( \rho_m \), the spikes sent to the right are "lost" in the environment. A global clock is assumed, marking the time for the whole system, hence the functioning of the system is synchronized.

If a rule \( E/a^c \rightarrow (a', a') \) has \( E = a^d \), then we will write it in the simplified form \( a^c \rightarrow (a', a') \).

If several rules can be used at the same time, then the one to be applied is chosen non-deterministically.
During the computation, a configuration of the system is described by the number of spikes present in each node; thus, the initial configuration is \((n_1, \ldots, n_m)\).

Using the rules as described above, one can define transitions among configurations. A transition between two configurations \(C_1, C_2\) is denoted by \(C_1 \Rightarrow C_2\). If \(C_1 = (k_1, k_2, \ldots, k_m)\), then \(C_2 = (k_1', k_2', \ldots, k_m')\), where \(k_i' = (k_i - c_i) + r_{i-1} + l_{i+1}, i\) is the current node, \(c_i\) is number of spikes consumed in this node, and \(r_{i-1}, l_{i+1}\) are the numbers of spikes sent to this node by the neighboring nodes, \(2 \leq i \leq m - 1\). In the case of \(i = 1\) or \(i = m\), there is only one neighbor. Any sequence of transitions starting in the initial configuration is called a computation. A computation halts if it reaches a configuration where no rule can be used.

In this paper, we consider the following two ways of defining the result of a computation for axon P systems.

(i) Similar to [6] and [10], we do not care whether or not the computation halts, but we only request that the output node spikes exactly twice during the computation. Then, the number of steps elapsed between the two spikes is the number computed by the axon P system along that computation. We denote by \(N_2(\Pi)\) the set of numbers computed in this way by the axon P system \(\Pi\), and by \(Spik_2AP_m(\text{rule}_k, \text{cons}_p)\) the family of sets \(N_2(\Pi)\) generated by axon P systems with at most \(m\) nodes, at most \(k\) rules in each node, each rule consuming at most \(p\) spikes. As usual, any of these parameters is replaced by * if it is not bounded.

(ii) As formulated in [3], a language is associated with a computation of axon P systems in the following way: for each node \(p_i\), we consider a symbol \(c_i\) and a configuration \((k_1, \ldots, k_m)\) is described by the string \(c_1 k_1 \ldots c_m k_m\); then, the result of a halting computation is defined as the strings associated with configurations where the system emits a spike. All these strings form the language generated by the system. We denote by \(L(\Pi)\) the language generated in this way by the axon P system \(\Pi\), and by \(LAP_m(\text{rule}_k, \text{cons}_p)\) the family of languages \(L(\Pi)\) with \(m, k, p\) having the same meaning as above.

4 Axon P Systems as Number Generators

In this section, we investigate the number generative power of axon P systems.

4.1 A Characterization of NFIN

In [6], it has been proved that SN P systems can characterize NFIN by using only one neuron. For axon P systems, we have a similar result.

**Theorem 1.** \(NFIN = Spik_2AP_1(\text{rule}_*, \text{cons}_*)\).

**Proof.** The inclusion \(Spik_2AP_1(\text{rule}_*, \text{cons}_*) \subseteq NFIN\) can be easily proved: in each step, the number of spikes in an axon P system with only one node decreases by at least one, hence any computation lasts at most as many steps as the number of spikes present in the system at the beginning. Thus, axon P systems with only one node can only compute finite sets of numbers.

To prove the opposite inclusion \(NFIN \subseteq Spik_2AP_1(\text{rule}_*, \text{cons}_*)\), let us take a finite set of numbers, \(F = \{n_1, \ldots, n_k\}\), and we assume that we have \(n_1 < n_2 < \ldots < n_k\).

An axon P system that generates \(F\) is shown in Figure 1.

Initially, the node contains \(n_k + 1\) spikes, hence, only the rule \(a^{n_k+1} / a \rightarrow (\lambda, a)\) can be used in the first step. It consumes one spike and immediately sends a spike to the environment. In the next step, we have to continue with rules \(a^{n_k+1-t} / a \rightarrow (\lambda, \lambda)\), for \(t = 1\), and then for the respective \(t = 2, \ldots, n_i\). But for \(t = n_i\) (in step \(n_i + 1\)), there is another rule \(a^{n_k+1-t} \rightarrow (\lambda, a)\) which can be used, non-deterministically chosen. If we choose the second rule, the system will send a spike to the environment again and then the computation halts. Therefore, the number \(n_i\) will be generated. If we choose the first rule, the process will continue, and in a similar way the numbers \(n_2, \ldots, n_k-1\) can be generated in turn. In step \(n_k + 1\) (the last step) only the rule \(a^{n_k+1-t} \rightarrow (\lambda, a)\) with \(t = n_k\) can be used, therefore, the number \(n_k\) can be generated and this concludes the computation.

Consequently, all the numbers in \(F\) can be generated by the above axon P system, which concludes the proof. \(\square\)
Theorem 2.

As mentioned in Section 4.1, SN P systems with one neuron generate exactly the family of finite sets of numbers. Actually, SN P systems with two neurons also characterize the family of finite sets. So, the following results on axon P systems are unexpected: such systems with two nodes generate all semilinear sets of numbers.

4.2 Relationships with Semilinear Sets of Numbers

As mentioned in Section 4.1, SN P systems with one neuron generate exactly the family of finite sets of numbers. Actually, SN P systems with two neurons also characterize the family of finite sets. So, the following results on axon P systems are unexpected: such systems with two nodes generate all semilinear sets of numbers.

Theorem 2. $SLIN_1 \subseteq \text{Spik}_2 \text{AP}_2(\text{rule}_s, \text{cons}_s)$.

Proof. Consider a regular grammar $G = (N, T, S, P)$ with $N = \{A_1, A_2, \ldots, A_n\}, n \geq 1$, $S = A_n$, $T = \{b_1, b_2, \ldots, b_s\}$, and the productions in $P$ are of the forms $A_i \rightarrow b_i A_j$, $A_i \rightarrow b_k$, $1 \leq i, j \leq n$, $1 \leq k \leq s$.

Then $\text{length}(L(G))$ can be generated by an axon P system as shown in Figure 2.

In the initial configuration, we have $n + 1$ spikes in node $\rho_1$ and $2n + 1$ spikes in node $\rho_2$, therefore, in the first step, only the rule $a^{2n+1}/a \rightarrow (\lambda, a)$ can be used in node $\rho_2$, and the rule $a^{n+1}/a \rightarrow (\lambda, \lambda)$ is used in node $\rho_1$. Thus, a spike is sent to the environment and $n$ spikes remain in node $\rho_1$ and $2n$ spikes in node $\rho_2$. In the next step, node $\rho_2$ fires by a rule $d^{n+i}/a^{n+i-j} \rightarrow (d^i, \lambda)$ or $d^{n+i}/(\lambda, a)$, which will remain in node $\rho_2$ forever. Moreover, in this step another spike is sent to the environment again.

Assume that in some step $t$, the rule $a^{n+i}/a^{n+i-j} \rightarrow (d^i, \lambda)$ or $A_i \rightarrow b_i A_j$, or $d^{n+i}/(\lambda, a)$, and the rule $a^{n+1}/a \rightarrow (\lambda, a)$ is used in node $\rho_1$. Then, in step $t + 1$ node $\rho_2$ receives $n$ spikes, and in this way, the computation continues.

If the second rule is used, then no spike is sent to node $\rho_1$, all spikes in node $\rho_2$ are consumed, and $n$ spikes are received from node $\rho_2$, which will remain in node $\rho_2$ forever. Moreover, in this step another spike is sent to the environment again. Then the computation halts.

We know that, if we use a production $A_i \rightarrow b_i A_j$, then the length of a string generated by the grammar $G$ increases by one, and this corresponds to the number of steps increasing by one by using the associated rule $a^{n+i}/a^{n+i-j} \rightarrow (d^i, \lambda)$ or $d^{n+i}/(\lambda, a)$ one time in the axon P system. Moreover, the second spike is sent to the environment and the computation halts whenever a rule $a^{n+1} \rightarrow (\lambda, a)$ is used, which corresponds to a production $A_i \rightarrow b_i$ being used in $G$.

Therefore, the length set of all the strings in $L(G)$ can be generated, and the proof is complete. \qed

The inclusion in the previous theorem is proper.

Theorem 3. $\text{Spik}_2 \text{AP}_2(\text{rule}_s, \text{cons}_s) \setminus SLIN_1 \neq \emptyset$.

Proof. Let us consider the axon P system from Figure 3. In the initial configuration, only node $\rho_1$ contains $5$ spikes, hence it fires in the first step by the rule $a(a^4)^{10}/a^4 \rightarrow (\lambda, a^{10})$ and sends $16$ spikes to node $\rho_2$. In the next step, the rule $a \rightarrow (a, \lambda)$ or $a \rightarrow (\lambda, a^2)$ can be used in node $\rho_1$, non-deterministically chosen.

If we use the rule $a \rightarrow (a, \lambda)$, then we get a number of spikes of the form $4k + 1$ in the second node, hence the first rule $a(a^4)^{10}/a^4 \rightarrow (a^4, \lambda)$ in node $\rho_2$ is applied as many times as possible, thus returning
the spikes to node $\rho_1$. To end this returning, we have to use the rule $a \rightarrow (\lambda, \lambda)$ in node $\rho_2$, which makes again the number of spikes from node $\rho_1$ to be of the form $4k + 1$ (note that no rule can be applied in any node when the number of spikes is multiple of 4). This process can be iterated any number of times, thus multiplying by 4 the number of spikes present in node $\rho_1$.

Assume that we have a configuration $\langle 4^n + 1, 0 \rangle$ in step $t$, for some $n \geq 1$; initially, this is the case, with $n = 1$. In node $\rho_1$, the rule $a(a^i)^+ / a^i \rightarrow (\lambda, a^i)$ can be used as many times as possible until the node remains with only one spike. It moves all spikes to the second node, multiplied by 4. Therefore, in step $t + 4^{n-1} + 1$, we have a configuration $\langle 1, 4^{n+1} \rangle$. In the next step, node $\rho_1$ can also use the rule $a \rightarrow (\lambda, a^3)$ instead of $a \rightarrow (a, \lambda)$. Then the number of spikes from node $\rho_2$ is of the form $4k + 3 (4^{n+1} + 3$ spikes), hence the rule $a^3(a^i)^+ / a \rightarrow (\lambda, a)$ should be applied in step $t + 4^{n-1} + 3$ and a spike is sent to the environment. At the same time, the number of spikes decreases by one and will be of the form $4k + 2 (4^{n+1} + 2$ spikes). Therefore, the rule $a^2(a^i)^+ / a \rightarrow (\lambda, \lambda)$ should be applied in step $t + 4^{n-1} + 4$. This rule does not change the form of the number of spikes and it remains in the form of $4k + 2$, hence it is used as many times as possible. In this way, no spike is sent to the environment until the number of spikes from $\rho_2$ becomes 6 and this process needs $4^n - 1$ steps. Then, in the step $t + 4^{n-1} + 4^{n+1}$, the rule $a^6 \rightarrow (\lambda, a)$ should be used and the second spike is sent to the environment. Therefore, the number of steps elapsed between the two spikes which were sent to the environment is $4^n$ and the computation halts.

Consequently, the set $\{4^n \mid n \geq 1\}$ can be generated by this system, which, obviously, is not a semilinear set. 

In [6], it has been shown that semilinear sets of numbers can be characterized by SN P systems with a bound on the number of spikes present in any neuron, but the number of neurons is not bounded. The following theorem also gives a characterization of semilinear sets of numbers, but here only two nodes are used in the axon P systems.

**Theorem 4.** $\text{SLIN}_1 = \text{Spik}_2\text{AP}_2(\text{rule}_s, \text{cons}_s, \text{bound}_s)$, where bound$_s$ indicates that axon P systems have a bound on the number of spikes present in any node, but this bound is not specified.

**Proof.** From Theorem 2, it is enough to prove the inclusion $\text{Spik}_2\text{AP}_2(\text{rule}_s, \text{cons}_s, \text{bound}_s) \subseteq \text{SLIN}_1$.

The proof is similar to the one of Lemma 9.1 in [6], so we do not recall it here. 

![Figure 2: An axon P system generating a semilinear set](image)

![Figure 3: An axon P system generating a non-semilinear set $\{4^n \mid n \geq 1\}$](image)
5 Axon P Systems as Language Generators

We now pass to considering the language generative power of axon P systems.

All strings generated by an axon P system in the way mentioned in Section 3 are of the form $c_1^k c_2^k \ldots c_m^k$, where $\langle k_1, k_2, \ldots, k_m \rangle$ is a configuration of the system. Therefore, if there is a bound on the number of spikes in any node of axon P systems, we can directly have the following result.

Remark 5. $LAP_n(\text{rule}_c, \text{cons}_n, \text{bound}_n) \subseteq \text{FIN}$, for $n \geq 1$.

Moreover, as a direct consequence of this restrictive way of defining the languages associated with axon P systems, we cannot find a characterization of finite languages for the general axon P systems. For instance, it is not difficult to find that the string $c_1 c_2 c_1$ cannot be generated by any axon P system.

5.1 Beyond CF

Theorem 6. There exists at least a language $L \in \text{EoL} - \text{CF}$, which can be generated by axon P systems.

Proof. Let us consider the language $L = \{c_1^{2n} c_2^{2n} c_3^{2n} | n \geq 1\}$; it is obvious that $L \in \text{EoL} - \text{CF}$.

We construct the axon P system whose initial configuration is shown in Figure 4.

![Figure 4: An axon P system generating the language $\{c_1^{2n} c_2^{2n} c_3^{2n} | n \geq 1\}$](image)

Initially, each node of the system contains two spikes. Hence, each node can be activated, and in node $\rho_1$, both the rule $(a^2)^+ / a^2 \rightarrow (\lambda, a^2)$ and the rule $(a^2)^+ / a \rightarrow (a, a)$ can be applied, non-deterministically chosen. If the first rule is applied, then the two spikes in each node are consumed and no spike is sent to the environment. At the same time, each node accumulates 4 spikes (the 4 spikes in nodes $\rho_1$ and $\rho_3$ are received from node $\rho_2$; the 4 spikes in node $\rho_3$ are received from both node $\rho_1$ and node $\rho_2$, two from node $\rho_1$ and two from node $\rho_2$). In this way, all the nodes can be activated in the next step. If in node $\rho_3$ we continue using the rule $(a^2)^+ / a^2 \rightarrow (\lambda, a)$, then in a similar way each node obtains 6 spikes. This process can be iterated until the second rule is applied. In this case, the number of spikes in each node increases by two in each step. Therefore, each node of the system accumulates $2n$ spikes in step $n$, for $n \geq 1$.

At any moment, we can also apply the second rule in node $\rho_2$. Assume that it is applied in step $n + 1$, then node $\rho_3$ sends a spike to the environment, which means that the string $c_1^{2n} c_2^{2n} c_3^{2n}$ is generated by this system. At the same time, node $\rho_1$ accumulates $2n + 2$ spikes, node $\rho_2$ accumulates $2n + 1$ spikes, and node $\rho_3$ accumulates $2n + 3$ spikes. In the next step, only node $\rho_1$ can be activated. Thus, it consumes two spikes and sends two spikes to node $\rho_2$. This process can be iterated until all the spikes in node $\rho_1$ are moved to node $\rho_2$, and then the computation halts.

Therefore, the language $\{c_1^{2n} c_2^{2n} c_3^{2n} | n \geq 1\}$ can be generated by the axon P system and this concludes the proof.

6 Conclusions and Remarks

In this paper, the number generative power and the language generative power of axon P systems are investigated. As a variant of SN P systems, there remain many open problems and research topics about axon P systems to be considered. One important aspect is suggested by the research about SN P systems. For instance, as usual in SN P systems, an arbitrary delay can be considered in axon P systems. What about considering the spike trains (finite or infinite) themselves as the result of a computation in axon P systems, as investigated in [10]. The various applications for axon P systems also deserve to be considered.

As suggested by Gheorghe Păun in [9], a more general and probably more interesting problem is combining neurons and axons in a global model; maybe also astrocytes can be added, thus obtaining a
more complex model, closer to reality. Please refer to [3, 9] for more open problems and research topics related to axon P systems.

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