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# BIOLOGICALLY INSPIRED COMPUTATION MODELS

(Dissertation thesis)

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# Abstract

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This work discusses the research in the membrane systems, an emerging field of natural computing. Many variants of membranes systems have already been studied, most of them uses parallel rewriting and are computationally complete. Various sequential models have been proposed, however, in many cases they are weaker than their parallel variant. We investigated several variants in terms of computational power and decidability of behavioral properties. We have also proposed own variants and suggested many topics for future study.

**Keywords:** Computation models inspired by biology, Membrane systems, Sequential P systems, Maximal parallelism, Computational power

# Abstrakt

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V tejto práci sa zaoberáme výskumom v oblasti membránových systémov. Veľa variantov už bolo preskúmaných, väčšinou pri výpočte používajú paralelizmus a sú Turingovsky úplné. Navrhlo sa aj veľa sekvenčných modelov, ale väčšina z nich má slabšiu výpočtovú silu ako ich paralelný variant. Preskúmali sme niekoľko variantov z hľadiska výpočtovej sily, ako aj z hľadiska rozhodnuteľnosti behaviorálnych vlastností. Navrhli sme aj vlastné varianty a naznačili smery, akými sa môže rozvíjať tento výskum.

**Kľúčové slová:** Výpočtové modely inšpirované biológiou, Membránové systémy, Sekvenčné P systémy, Maximálny paralelizmus, Výpočtová sila

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# Introduction

There are a lot of areas in the theoretical computer science that are motivated by other science fields. Computation models motivated by biology forms a large group of them. They include neural networks, computational models based on DNA evolutionary algorithms, which have already found their use in computer science and proved that it is worth to be inspired by biology. L-systems are specialized for describing the growth of plants, but they have also found the applications in computer graphics, especially in fractal geometry. Other emerging areas are still awaiting for their more significant uses.

One of them is the membrane computing [61]. It is relatively young field of natural computing - in comparison: neural networks have been researched since 1943 and membrane systems since 1998 [59].

Membrane systems (P systems) are distributed parallel computing devices inspired by the structure and functionality of cells. Recently, many P system variants have been developed in order to simulate the cells more realistically or just to improve the computational power.

We will start by an introduction of various natural computing areas including models inspired by biology in chapter 1. In chapter 2 we recall some computer science basic notions that we will use through the work. P systems are formally presented in chapter 3, with the current state of the research in their variants, overview of software simulator MeCoSym and various case studies.

In chapter 4 we will present the current state of our work, mainly from theoretic viewpoint (computational power, decidability of behavioral properties), including the published results in sections 4.1 and 4.2.

# Chapter 1

## Natural computing

Recently, an interdisciplinary research between the fields of Computer Science and Biology has been rapidly growing. Natural computing consists of three classes of methods:

- those that are based on the use of computers to simulate natural phenomena
- those that employ natural materials (e.g., molecules) to compute
- those that take inspiration from nature for the development of novel problem-solving techniques

### 1.1 Bioinformatics

Bioinformatics has undergone a fast evolving process, especially the areas of genomics and proteomics. Bioinformatics can be seen as the application of computing tools and techniques for the management of biological data. Just to mention a few:

- the design of efficient algorithms for DNA sequence alignment,
- the investigation of methods for prediction of the three-dimensional structure of molecules and proteins,
- the development of data structures to effectively store huge amount of structured data.

## 1.2 Biomolecular computing

Biomolecular computing make use of molecules such as DNA and proteins to perform computations involving storing, retrieving and processing data. It takes advantage of the many different molecules to try many different possibilities at one, so it is somewhat similar to parallel computing.

Adleman in his 1994 report [2] demonstrated a proof of concept use of DNA as a form of computation which solved the Hamiltonian path problem. Since then, various Turing machines have been proven to be constructible with DNA [46].

DNA can also be used as a digital data storage with 5.5 petabits per cubic millimeter of DNA (see [20]). The information retrieval is, however, a slow process, as the DNA needs to be sequenced in order to retrieve data, so this method is intended mainly for a long-term archival of large amounts of scientific data.

## 1.3 Biologically inspired computing models

On the other hand, the birth of biologically inspired frameworks started the investigation of mathematical models and their properties and technological requirements for their implementation by biological hardware. Those frameworks are inspired by the nature in the way it “computes”, and has gone through the evolution for billions of years.

Neural networks, genetic algorithms and DNA computing are already well established research fields.

### 1.3.1 Neural networks

Inspired by the human brain, which contains on average 86 billions neurons [7], neurophysiologist Warren McCulloch in 1943 proposed a mathematical model of artificial neural network.

A single perceptron computes a function  $f(x)$ , where  $x$  is an input - a vector of real values.

The perceptron can learn itself by modifying parameters used to compute the function. This learning can be performed in various ways, we will mention only the supervised learning. Imagine a function with

- input: perceptron’s parameters
- output: error of the computed result  $f(x)$

If the perceptron receives a feedback in form of error (from the supervision, e.g. dataset used to train the perceptron), it can modify its parameters such the error will be minimized in the future. This can be done through the gradient descent method, which is used to find a local minimum of a function.

A single perceptron can only compute linear functions, so they are often connected with other perceptron to form a neural network. Often it is practically unusable to say what is the purpose of a single neuron in a more complex neural networks.

Neural networks have broad applicability to real world problems and are best if the modeled system has some tolerance to error such as:

- Image recognition: OCR, web search by image
- Music recognition by voice sample
- Time series forecast: weather, stock
- Diagnosing of illnesses

### 1.3.2 Evolutionary algorithms

Evolutionary algorithms are inspired by Darwin's theory of evolution. Basically, an algorithm starts with a population of random individuals (solutions to the problem). In each generation, the fitness of every individual is evaluated and the more fit individuals are replicated and mutated to form a new generation. The less fit individuals die.

Idea of evolutionary computing was introduced in the 1960's by I. Rechenberg. Nowadays they have been applied to find solution of many optimization problems. They also can be used to design or to train a neural network [55].

### 1.3.3 Membrane systems

Nature computes not only at the neural or genetic level, but also at the cellular level. In general, any non-trivial biological system has a hierarchical structure where objects and information flows between regions, what can be interpreted as a computation process.

The regions are typically delimited by various types of membranes at different levels from cell membranes, through skin membrane to virtual membranes which delimits different parts of an ecosystem. This hierarchical system can be seen in other field such as distributed computing, where again



Figure 1.1: The membrane structure of a P system and its associated tree [78]

well delimited computing units coexist and are hierarchically arranged in complex systems from single processors to the internet.

Membranes keep together certain chemicals or information and selectively determines which of them may pass through.

From these observations, Păun [59] introduces the notion of a membrane structure as a mathematical representation of hierarchical architectures composed of membranes. It is usually represented as a Venn diagram with all the considered sets being subsets of a unique set and not allowed to be intersected. Every two sets are either one the subset of the other, or disjoint. Outermost membrane (also called skin membrane) delimits the finite “inside” and the infinite “outside”.

Hierarchical structures are usually represented by trees, but membrane structures are visually better viewed as Venn diagram as seen in the figure 1.1.

Recently, several computational models based on the membrane structure have been created.

## P systems

P systems were introduced in 1998 as a system with membrane structure that contains multisets of objects and rewrite rules that are executed in a maximally parallel manner. Since then, a huge amount of variants have been created with various computation powers. We have investigated the power of several such variants. Additionally, we propose a new variants various notions of emptiness detection, where the rules can describe what will happen to an object that arrives to an empty membrane.

P systems with existing and newly proposed variants will be discussed in the chapter 3.

Aside from P systems, other models based on the membrane structure have been created such as the Calculus of Looping Sequences (CLS), which was inspired by P systems.



## The Calculus of Looping Sequences

Barbuti in [10] concluded that there is a need for a formalism having a simple notation, having the ability of describing biological systems at different levels of abstractions, having some notions of compositionality and being flexible enough to allow describing new kinds of phenomena as they are discovered, without being specialized to the description of a particular class of systems. The Calculus of Looping Sequences (CLS) was introduced in [10].

The membrane structure in CLS is defined recursively, consisting of terms  $T$  and sequences  $S$ :

$$\begin{aligned} T &::= S \mid (S)^L \rfloor T \mid T \mid T \\ S &::= \varepsilon \mid a \mid S \cdot S \end{aligned}$$

, where  $a$  is a symbol from the alphabet,  $\varepsilon$  represents the empty sequence,  $\cdot$  is a sequencing operator,  $(S)^L$  is a looping operator,  $\mid$  is a parallel composition operator and  $\rfloor$  is a containment operator.

Membranes are represented by a sequence that is looped around. Several extensions of the CLS have been proposed. In CLS+ the looping operator can be applied to a parallel composition of sequences, which represents a notion of a fluid membrane. CLS+ can be translated to CLS (see [10]). Milazzo in his PhD thesis [54] includes also a simulation of a P system using CLS. The major difficulty is simulating the maximal parallelism of rule application.

# Chapter 2

## Preliminaries

This chapter is about some basic notions of computer science which will be used through the work. We start by defining formal languages and basic models (grammars, machines) that define language families and end by defining multiset languages.

### 2.1 Formal languages

Our study is based on the classical theory of formal languages. We will recall some definitions:

**Definition 2.1.1.** *An **alphabet** is a finite nonempty set of symbols.*

**Definition 2.1.2.** *A **string** over an alphabet is a finite sequence of symbols from the alphabet.*

The length of the string  $s$  is denoted by  $|s|$ . We denote by  $\Sigma^*$  the set of all strings over an alphabet  $\Sigma$ . By  $\Sigma^+ = \Sigma^* - \{\varepsilon\}$  we denote the set of all nonempty strings over  $\Sigma$ .

**Definition 2.1.3.** *A **language** over the alphabet  $\Sigma$  is any subset of  $\Sigma^*$ .*

**Definition 2.1.4.** *A **family of languages** is a set of languages.*

### 2.2 Formal grammars

We are now ready to define the basic type of computation model inspired by the study of real languages - formal grammars. Realizing the parts of sentences could be labeled to indicate their function, it seems natural that one might notice that there appear to be rules dictating how these parts of speech are used.

**Definition 2.2.1.** A **formal grammar** is a tuple  $G = (N, T, P, \sigma)$ , where

- $N, T$  are disjoint alphabets of non-terminal and terminal symbols,
- $\sigma \in N$  is the initial non-terminal,
- $P$  is a finite set of rewriting rules of the form  $u \rightarrow v$ , with  $u \in (N \cup T)^* N (N \cup T)^*$  and  $v \in (N \cup T)^*$ .

**Definition 2.2.2.** A **rewriting step** in the grammar  $G$  is a binary relation  $\Rightarrow$  on  $(N \cup T)^*$ , where  $x \Rightarrow y$  only if  $\exists w_1, w_2 \in (N \cup T)^+$  and a rule  $u \rightarrow v \in P$  such that  $x = w_1 u w_2$  and  $y = w_1 v w_2$ .

**Definition 2.2.3.** Language defined by a grammar  $G$  is a set  $L(G) = \{w \in T^* \mid \sigma \Rightarrow w\}$ .

Languages that can be generated by a formal grammar are the recursively enumerable languages  $RE$ .

## 2.3 Chomsky hierarchy

In this section we introduce several well-known families of languages, introduced by Chomsky [19].

**Definition 2.3.1.** A **regular grammar** is a formal grammar, where the rewriting rules are of the form  $u \rightarrow v$ , where  $u \in N$  and  $v \in T^*(N \cup \{\varepsilon\})$ .

**Definition 2.3.2.** A **regular language** is a language generated by a regular grammar. The family of regular languages is denoted  $R$ .

**Definition 2.3.3.** A **context-free grammar** is a formal grammar, where rewriting rules are of the form  $u \rightarrow v$ , where  $u \in N$  and  $v \in (N \cup T)^*$ .

**Definition 2.3.4.** A **context-free language** is a language generated by a context-free grammar. The family of context-free languages is denoted  $CF$ .

**Definition 2.3.5.** A **context-sensitive grammar** is a formal grammar, where rewriting rules are of the form  $u \rightarrow v$ , where  $u \in (N \cup T)^* N (N \cup T)^*$ ,  $v \in (N \cup T)^*$  and  $|u| < |v|$ .

**Definition 2.3.6.** A **context-sensitive language** is a language generated by a context-sensitive grammar. The family of context-sensitive languages is denoted  $CS$ .

These families of languages forms the Chomsky hierarchy by means of inclusions:  $R \subset CF \subset CS \subset RE$ .

## 2.4 Matrix grammars

Context-free grammars are well-studied and well-behaved in terms of decidability, but many real-world problems cannot be described with context-free grammars. Grammars with regulated rewriting are grammars with mechanisms to regulate the application of rules, so that certain derivations are avoided. Thus, with context-free rules and regulated rewriting mechanisms, one can often generate languages that are not context-free.

One of these is a matrix grammar [24], in which instead of productions, productions are grouped together into finite sequences. A production cannot be applied separately, it must be applied in sequence.

**Definition 2.4.1.** A **matrix grammar** is a tuple  $G = (N, T, M, \sigma)$ , where:

- $N, T$  are disjoint alphabets of non-terminal and terminal symbols,
- $\sigma \in N$  is the initial non-terminal,
- $M$  is a finite set of matrices, which are sequences of context-free rules of the form  $u \rightarrow v$ , where  $u \in N$  and  $v \in (N \cup T)^*$ .

**Definition 2.4.2.** A **rewriting step**  $x \Rightarrow y$  holds only if there is a matrix  $(u_1 \rightarrow v_1, u_2 \rightarrow v_2, \dots, u_n \rightarrow v_n) \in M$  such that for each  $1 \leq i \leq n$  the following holds:  $x_i = x'_i u_i x''_i$  and  $x_{i+1} = x'_i v_i x''_i$ , where  $x_i, x'_i, x''_i \in (N \cup T)^*$  and  $x_1 = x$  and  $x_{n+1} = y$ .

**Example 2.4.1.** Consider the following matrix grammar:

$$G = (\{\sigma, X, Y\}, \{a, b, c\}, M, \sigma),$$

where  $M$  contains three matrices:

$$[S \rightarrow XY], [X \rightarrow aXb, Y \rightarrow cY], [X \rightarrow ab, Y \rightarrow c].$$

There are only context-free rules, yet the grammar generate the context-sensitive language  $\{a^n b^n c^n | n \geq 1\}$ .

The family of matrix grammars is denoted  $MAT$ . It is known that  $CF \subset MAT \subset RE$ . Interestingly,  $MAT \cap a^* \subset R$  (see [11]).

## 2.5 Lindenmayer systems

In 1968, a Hungarian botanist and theoretical biologist Aristid Lindenmayer introduced [51] a new string rewriting algorithm named Lindenmayer systems (or L-systems for short). They are used by biologists and theoretical

computer scientists to mathematically model growth processes of living organisms, especially plants. The difference with Chomsky grammars is that rewriting is parallel, not sequential.

The simplest version of L-systems assumes that the development of a cell is free of influence of other cells. This type of L-systems is called *0L* systems, where “0” stands for zero-sided communication between cells.

**Definition 2.5.1.** A *0L system* is a triple  $(\Sigma, P, \omega)$ , where  $\Sigma$  is an alphabet,  $\omega$  is a word over  $\Sigma$  and  $P$  is a finite set of rewriting rules of the form  $a \rightarrow x$ , where  $a \in \Sigma, x \in \Sigma^*$ .

It is assumed there is at least one rewriting rule for each letter of  $\Sigma$ . *0L* system works in parallel way, so all the symbols are rewritten in each step.

**Example 2.5.1.** Consider a *0L* system with alphabet  $\Sigma = \{a, b\}$ , initial word  $\omega = a$  and rewriting rules  $P = \{a \rightarrow b, b \rightarrow ab\}$ . Since in this system there is exactly one rule for every letter of the alphabet, the rewriting is thus deterministic and the generated words will be  $\{a, b, ab, bab, abbab, \dots\}$ .

*1L* systems allows the rewriting rules to include context of size 1, so it allows for rules of type  $yaz \rightarrow x$ .

L-systems with tables (*T*) have several sets of rewriting rules instead of just one set. At one step of the rewriting process, rules belonging to the same set have to be applied. The biological motivation for introducing tables is that one may want different rules to take care of different environmental conditions (heat, light, etc.) or of different stages of development.

**Definition 2.5.2.** An *extended (E0L) system* is a pair  $G_1 = (G, \Sigma_T)$ , where  $G = (\Sigma, P, \omega)$  is an *0L* system, where  $\Sigma_T \subseteq \Sigma$ , referred to as the *terminal alphabet*. The language generated by  $G_1$  is defined by  $L(G_1) = L(G) \cap \Sigma_T^*$ .

Such languages are called *E0L* languages. *E0L* languages with tables are called *ET0L* languages.

It is known that  $CF \subset E0L \subset ET0L \subset CS$  (see section 2.3 for definitions of *CF* and *CS*).

## 2.6 Multisets

**Definition 2.6.1.** A *multiset* over a set  $X$  is a mapping  $M : X \rightarrow \mathbb{N}$ .

We denote by  $M(x), x \in X$  the multiplicity of  $x$  in the multiset  $M$ .

**Definition 2.6.2.** The **support** of a multiset  $M$  is the set  $\text{supp}(M) = \{x \in X \mid M(x) \geq 1\}$ .

It is the set of items with at least one occurrence.

**Definition 2.6.3.** A multiset is **empty** when its support is empty.

A multiset  $M$  with finite support  $X = \{x_1, x_2, \dots, x_n\}$  can be represented by the string  $x_1^{M(x_1)} x_2^{M(x_2)} \dots x_n^{M(x_n)}$ . As elements of a multiset can also be strings, we separate them with the pipe symbol, e.g.

*element|element|other\_element*

**Definition 2.6.4.** *Multiset inclusion.* We say that multiset  $M_1$  is included in multiset  $M_2$  if  $\forall x \in X : M_1(x) \leq M_2(x)$ . We denote it by  $M_1 \subseteq M_2$ .

**Definition 2.6.5.** The **union** of two multisets  $M_1 \cup M_2$  is a multiset where  $\forall x \in X : (M_1 \cup M_2)(x) = M_1(x) + M_2(x)$ .

**Definition 2.6.6.** The **difference** of two multisets  $M_1 - M_2$  is a multiset where  $\forall x \in X : (M_1 - M_2)(x) = M_1(x) - M_2(x)$ .

**Definition 2.6.7.** Product of multiset  $M$  with natural number  $n \in \mathbb{N}$  is a multiset where  $\forall x \in X : (n \cdot M)(x) = n \cdot M(x)$ .

## 2.7 Semilinear sets

Some results in chapter 3 refer to semilinear sets [41], so we will define them in this section.

**Definition 2.7.1.** A linear set  $L(v_0, v_1, \dots, v_r)$  is a subset  $\{v_0 + \sum_{i=1}^r a_i v_i \mid a_i \in \mathbb{N}\}$  of  $\mathbb{N}^n$ , where  $v_0, v_1, \dots, v_r \in \mathbb{N}^n$ .

We call  $v_0$  the initial vector and  $v_1, \dots, v_r$  the generator vectors of the linear set. Basically, a linear set is a set of  $n$ -dimensional vectors given by integral linear combinations (with integer coefficients) of generator vectors added to the initial vector.

**Example 2.7.1.** For  $n = 1$  the linear set is a subset of  $\mathbb{N}$ . For  $n = 1$  and  $r = 1$  we get an arithmetic progression.

**Example 2.7.2.**  $L((0, 0), (0, 1), (1, 0))$  defines all pairs of natural numbers.

**Definition 2.7.2.** A subset of  $\mathbb{N}^n$  is called **semilinear** if it is a finite union of linear sets.

### 2.7.1 Parikh's mapping

In this subsection we show how semilinear sets and multisets relate to the formal language theory. We will start with several basic definitions.

The number of occurrences of a given symbol  $a \in \Sigma$  in the string  $w \in \Sigma^*$  is denoted by  $|w|_a$ .

**Definition 2.7.3.**  $\Psi_\Sigma(w) = (|w|_{a_1}, |w|_{a_2}, \dots, |w|_{a_n})$  is called a **Parikh image of the string**  $w \in \Sigma^*$ , where  $\Sigma = \{a_1, a_2, \dots, a_n\}$ .

When referring to the Parikh mapping for a language, this should be taken to mean the mapping applied to all the words on the language. This idea is expressed in the next definition.

**Definition 2.7.4.** For a language  $L \subseteq \Sigma^*$ ,  $\Psi_\Sigma(L) = \{\Psi_\Sigma(w) | w \in L\}$  is the **Parikh image of the language**  $L$ .

**Definition 2.7.5.** If  $FL$  is a family of languages, by  $PsFL$  we denote the family of Parikh images of languages in  $FL$ , e.g.  $PsCF, PsRE$ .

**Example 2.7.3.** Consider an alphabet  $V = \{a, b\}$  and a language  $L = \{a, ab, ba\}$ .  $\Psi_\Sigma(L) = \{(1, 0), (1, 1)\}$ . Notice that Parikh image of  $L$  has only 2 element while  $L$  has 3 elements.

**Example 2.7.4.** Consider the context-free grammar  $G = (N, T, P, \sigma)$ , where  $N = \{A, B\}$ ,  $T = \{a, b\}$  and with rules  $P = \{\sigma \rightarrow A\sigma B | B\sigma A | ab, A \rightarrow a, B \rightarrow b\}$ .

This means that the language generated by  $G$  contains strings where  $as$  and  $bs$  can occur intermixed. But, as is clear from the language definition, the same number of  $as$  and  $bs$  will always be present. Moreover, there will always be at least one of each letters.

Consider the words  $w_1 = aaaabbbb \in L(G)$  and  $w_2 = babababa \in L(G)$ . Both of these words have the same Parikh image:  $\Psi_\Sigma(w_i) = (4, 4)$ . It is interesting to note that most information embedded in a word generated with a context-free grammar is thrown away by the Parikh mapping.

This loss of information is expressed in the Parikh's theorem [57], stating that the Parikh image of a context-free language is semilinear. The biggest implication of the theorem though, is that it shows that if the order of the symbols is ignored, then it is impossible to distinguish between a regular set and a context-free language [50].

Another interesting result appeared in [44] that every semilinear set is a finite union of disjoint linear sets.

## 2.8 Register machines

As a referential universal language acceptor we will use Minsky's register machine [43]. Such a machine runs a program consisting of numbered instructions of several simple types. Several variants of register machines with different number of registers and different instructions sets were shown to be computationally universal (see [42] for some original definitions and [48] for the definition used in this thesis).

**Definition 2.8.1.** *A  $n$ -register machine is a tuple  $M = (n, P, i, h)$ , where:*

- $n$  is the number of registers,
- $P$  is a set of labeled instructions of the form  $j : (op(r), k, l)$ , where  $op(r)$  is an operation on register  $r$  of  $M$ , and  $j, k, l$  are labels from the set  $Lab(M)$  (which numbers the instructions in a one-to-one manner),
- $i$  is the initial label, and
- $h$  is the final label.

The machine is capable of the following instructions:

- $(add(r), k, l)$  : Add one to the contents of register  $r$  and proceed to instruction  $k$  or to instruction  $l$ ; in the deterministic variants usually considered in the literature we demand  $k = l$ .
- $(sub(r), k, l)$  : If register  $r$  is not empty, then subtract one from its contents and go to instruction  $k$ , otherwise proceed to instruction  $l$ .
- $halt$  : This instruction stops the machine. This additional instruction can only be assigned to the final label  $h$ .

A deterministic  $m$ -register machine can analyze an input  $(n_1, \dots, n_m) \in N_0^m$  in registers 1 to  $m$ , which is recognized if the register machine finally stops by the halt instruction with all its registers being empty (this last requirement is not necessary). If the machine does not halt, the analysis was not successful.

## 2.9 Petri nets

Another well-studied formalism often referred to (e.g. in [23, 32]) are Petri nets. Petri nets [64, 77] were introduced by Carl Adam Petri in 1962 in his PhD thesis. A Petri net is a graphical and mathematical tool for the



modeling of concurrent processes and analysis of system behavior. A Petri net is usually drawn as a directed bipartite graph with two kind of nodes. Places are represented by circles within which each small black dot denotes a token. Transitions are represented by bars. Each edge is either from a place to a transition or vice versa.

**Definition 2.9.1.** A **Petri net** is a tuple  $(P, T, \varphi)$ , where:

- $P$  is a finite set of places,
- $T$  is a finite set of transitions,
- $\varphi : (P \times T) \cup (T \times P) \rightarrow \mathbb{N}$  is a flow function.

The edges of the bipartite graph are annotated by either  $\varphi(p, t)$  or  $\varphi(t, p)$ , where  $p \in P$  and  $t \in T$  are two endpoints of the arc. If  $\varphi(p, t) = 1$  or  $\varphi(t, p) = 1$ , we usually omit the label.

**Definition 2.9.2.** A **marking** is a mapping  $\mu : P \rightarrow \mathbb{N}$ .

The mapping  $\mu$  assigns certain number of tokens to each place of the net.

**Definition 2.9.3.** A marking  $\mu_1$  **covers** marking  $\mu_2$ , when  $\forall p \in P : \mu_1(p) \geq \mu_2(p)$  - in each place there is no less tokens in  $\mu_1$  than in  $\mu_2$ . We denote it by  $\mu_1 \geq \mu_2$ .

**Definition 2.9.4.** A transition  $t \in T$  is **enabled** at a marking  $\mu$  iff  $\forall p \in P, \varphi(p, t) \leq \mu(p)$ .

If a transition  $t$  is enabled, it may fire by removing  $\varphi(p, t)$  tokens from each input place  $p$  and putting  $\varphi(t, p')$  tokens in each output place  $p'$ . We then write  $\mu \xrightarrow{t} \mu'$ , where  $\forall p \in P : \mu'(p) = \mu(p) - \varphi(p, t) + \varphi(t, p)$ .

**Example 2.9.1.** In the Figure 2.1 the Petri net has four places and two transitions. At the current marking the transition  $t_1$  is enabled and the transition  $t_2$  is not enabled. Firing the transition  $t_1$  takes one token from the place  $p_1$  and produces one token to places  $p_2, p_3$  and  $p_4$ . In the resulting marking both transitions  $t_1$  and  $t_2$  are enabled.

**Definition 2.9.5.** A **marked Petri net** is a tuple  $(P, T, \varphi, \mu_0)$ , where  $(P, T, \varphi)$  is a Petri net and  $\mu_0$  is called the initial marking.

**Definition 2.9.6.** A sequence of transitions  $\sigma = t_1 \dots t_n$  is a **firing sequence** from  $\mu_0$  iff  $\mu_0 \xrightarrow{t_1} \mu_1 \xrightarrow{t_2} \dots \xrightarrow{t_n} \mu_n$  for some markings  $\mu_1, \dots, \mu_n$ . We also write  $\mu_0 \xrightarrow{\sigma} \mu_n$ .

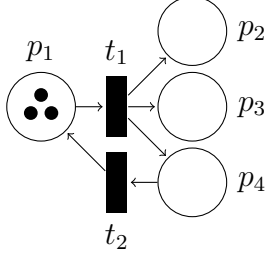


Figure 2.1: An example Petri net

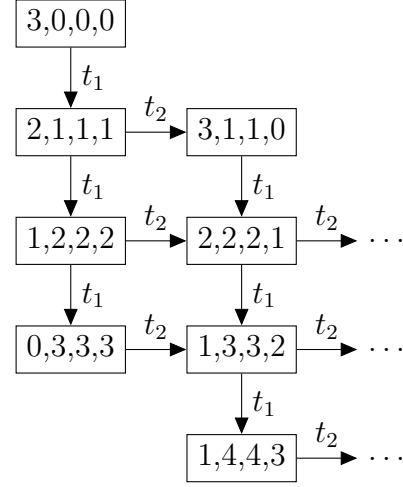


Figure 2.2: An example reachability graph

We write  $\mu_0 \xrightarrow{\sigma}$  to denote that  $\sigma$  is enabled and can be fired from  $\mu_0$ , i.e.,  $\mu_0 \xrightarrow{\sigma}$  iff there exists a marking  $\mu$  such that  $\mu_0 \xrightarrow{\sigma} \mu$ . The notation  $\mu_0 \xrightarrow{*} \mu$  is used to denote the existence of a firing sequence  $\sigma$  such that  $\mu_0 \xrightarrow{\sigma} \mu$ .

**Definition 2.9.7.** A marking  $\mu$  is *reachable* for a marked Petri net  $\mathcal{P} = (P, T, \varphi, \mu_0)$  iff  $\mu_0 \xrightarrow{*} \mu$ .

**Definition 2.9.8.** Let  $\mathcal{P} = (P, T, \varphi, \mu_0)$  be a marked Petri net. The **reachability set** of  $\mathcal{P}$  is  $R((P)) = \{\mu \mid \mu_0 \xrightarrow{*} \mu\}$ .

A notion of reachability graph is helpful for analyzing the behavior of a Petri net as a tool for visualisation of the structure of the reachability set.

**Definition 2.9.9.** Let  $\mathcal{P} = (P, T, \varphi, \mu_0)$  be a marked Petri net. The **reachability graph** of  $\mathcal{P}$  is a labelled graph whose nodes are the reachable markings and edge from  $\mu_1$  to  $\mu_2$  is labeled with a transition  $t \in T$  iff  $\mu_1 \xrightarrow{t} \mu_2$ .

**Example 2.9.2.** Consider a Petri net  $\mathcal{P}$  from the Figure 2.1. Its reachability graph is in the Figure 2.2.  $\mathcal{P}$  is not bounded because by alternately firing transitions  $t_1$  and  $t_2$  we can reach infinitely many different markings. We can also easily see that it is live, because in every marking for every transition  $t \in \{t_1, t_2\}$  there is a firing sequence ending with  $t$ .

In spite of its simplicity, the applicability of the technique of reachability graph analysis is rather limited in the sense that it suffers from the state

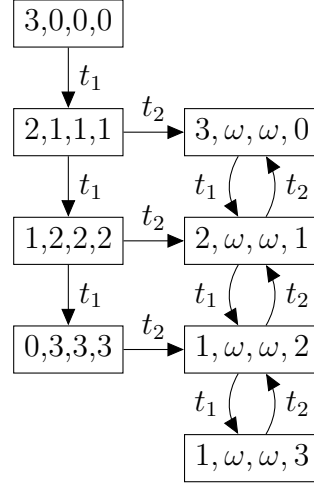


Figure 2.3: An example coverability graph

explosion phenomenon as the sizes of the reachability sets grow beyond any primitive recursive function in the worst case [77].

Coverability graph analysis offers an alternative to the technique of reachability graph analysis by abstracting out certain details to make the graph finite. To understand the intuition behind coverability graphs, consider the Figure 2.2 which shows a part of the reachability graph of the Petri net in the Figure 2.1. Consider the path  $(3, 0, 0, 0) \xrightarrow{t_1} (2, 1, 1, 1) \xrightarrow{t_2} (3, 1, 1, 0)$  along which the places  $p_2$  and  $p_3$  both gain an extra token in the end, i.e.  $(3, 0, 0, 0) > (3, 1, 1, 0)$ . Clearly they can be made to contain arbitrary large number of tokens by repeating the firing sequence  $t_1 t_2$  for a sufficient number of times, as  $(3, 0, 0, 0) \xrightarrow{t_1 t_2} (3, 1, 1, 0) \xrightarrow{t_1 t_2} (3, 2, 2, 0) \xrightarrow{t_1 t_2} \dots \xrightarrow{t_1 t_2} (3, n, n, 0)$ , for arbitrary  $n$ . In order to capture the notion of a place being unbounded, we short-circuit the above infinite sequence of computation as  $(3, 0, 0, 0) \xrightarrow{t_1} (2, 1, 1, 1) \xrightarrow{t_2} (3, \omega, \omega, 0)$ , where  $\omega$  is a symbol denoting something being arbitrarily large. As it turns out, the coverability graph of a Petri net is always finite [47]. The corresponding coverability graph of the example Petri net in the Figure 2.1 is in the Figure 2.3. The algorithm for generating the coverability graph of a Petri net [77] is shown on the following page.

### 2.9.1 Analysis of behavioral properties

Analysis of several behavioral properties is studied and following decidability problems are of special importance:

**Algorithm 1** Coverability graph algorithm

---

```

1: procedure COVERABILITYGRAPH(marked Petri net  $\mathcal{P} = (P, T, \varphi, \mu_0)$ )
2:   create a node  $\mu_{init}$  such that  $\mu_{init} = \mu_0$  and mark it as “new”
3:   while there is a “new” node  $\mu$  do
4:     for each transition  $t$  enabled at  $\mu$  do
5:       if there is a node  $\mu' = \mu + \Delta t$  then
6:         add an edge  $\mu \xrightarrow{t} \mu'$ 
7:       else if there is a path  $\mu_{init} \xrightarrow{*} \mu'' \xrightarrow{*} \mu$  such that  $\mu'' < \mu + \Delta t$  then
8:         add a “new” node  $x$  with
9:            $x(p) = \omega$  if  $\mu''(p) < (\mu + \Delta t)(p)$ 
10:           $x(p) = \mu''(p)$  otherwise
11:         add an edge  $\mu \xrightarrow{t} x$ 
12:       else
13:         add a “new” node  $x$  with  $x = \mu + \Delta t$  and an edge  $\mu \xrightarrow{t} x$ 
14:     mark  $\mu$  with “old”

```

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**The boundedness problem**

The boundedness problem is, given a marked Petri net  $\mathcal{P}$ , deciding whether  $|R(\mathcal{P})|$  is finite. This problem was first considered by Karp and Miller [47], where it was shown to be decidable using the technique of coverability graph analysis. A Petri net is unbounded iff an  $\omega$  occurs in the corresponding coverability graph. The algorithm presented there was basically an unbounded search and consequently no complexity analysis was shown. Subsequently, a lower bound of  $O(2^{cm})$  space was shown by Lipton in [52], where  $m$  is the number of places in the Petri net and  $c$  is a constant. Finally, an upper bound of  $O(2^{cn \log n})$  space was given by Rackoff in [68]. Here, however,  $n$  represents the size or number of bits in the problem instance and  $c$  is a constant.

**The covering problem**

The covering problem is, given a marked Petri net  $\mathcal{P}$  and a marking  $\mu$ , deciding whether there exists  $\mu' \in R(\mathcal{P})$  such that  $\mu' \geq \mu$ . The complexity (both upper and lower bounds) of the covering problem can be derived along a similar line of that of the boundedness problem [68].

**The reachability problem**

The reachability problem is, given a marked Petri net  $\mathcal{P}$  and a marking  $\mu$ , deciding whether  $\mu \in R(\mathcal{P})$ . This problem has attracted the most atten-

tion in the Petri net community. One reason is that the problem has many real-world applications; furthermore, it is the key to the solutions of several other Petri net problems. Before the decidability question of the reachability problem for general Petri nets was proven by Mayr in 1981 [53], a number of attempts had been made to investigate the problem for restricted classes of Petri nets, in hope of gaining more insights and developing new tools in order to conquer the general Petri net reachability problem. It should be noted that the technique of the coverability graph analysis does not answer the reachability problem as  $\omega$  abstracts out the exact number of tokens that a place can accumulate, should the place be potentially unbounded.

### The containment problem

The containment problem is, given two marked Petri nets  $\mathcal{P}_1$  and  $\mathcal{P}_2$ , deciding whether  $R(\mathcal{P}_1) \subseteq R(\mathcal{P}_2)$ . In the late 1960's, Rabin first showed the containment problem for Petri nets to be undecidable. Even though the original work of Rabin have never been published, a new proof based on Hilbert's Tenth Problem [25] was presented at MIT in 1972 [8].

### The equivalence problem

The equivalence problem: given two marked Petri nets  $\mathcal{P}_1$  and  $\mathcal{P}_2$ , deciding whether  $R(\mathcal{P}_1) = R(\mathcal{P}_2)$ . In 1975, Hack [38] extended Rabin's result of the containment problem by showing the equivalence problem to be undecidable as well. The proof was also based on Hilbert's Tenth Problem.

### The liveness problem

The liveness problem: given a marked Petri net  $\mathcal{P}$ , deciding whether for every  $t \in T, \mu \in R(\mathcal{P})$  there exists a sequence of transitions  $\sigma$  such that  $\mu \xrightarrow{\sigma t}$ , i.e.  $t$  is enabled after firing  $\sigma$  from  $\mu$ . In [36], several variants of the reachability problem were shown to be recursively equivalent. Among them is the single-place zero reachability problem, i.e. the problem of determining whether a marking with no tokens in a designated place can be reached. Hack also showed the single-place zero reachability problem to be recursively equivalent to the liveness problem, which is then as well decidable.

## 2.9.2 Backwards-compatible extensions

Conventional Petri nets have several limitations such as the inability to test for zero tokens in a place. Models often tend to become large, with no support

for structuring. To remedy these weaknesses, a number of extended Petri net models have been proposed in the literature. Some of these extensions only increase the modeling convenience by making the model more expressive while they do not actually increase the power of the basic model and are completely backwards-compatible, e.g. colored Petri nets.

### Colored Petri nets

A colored Petri net (CPN) has each token attached with a color, indicating the identity of the token. Moreover, each place and each transition has attached a set of colors. A transition can fire with respect to each of its colors. By firing a transition, tokens are removed from the input places and added to the output places in the same way as that in original Petri nets, except that a functional dependency is specified between the color of the transition firing and the colors of the involved tokens. The color attached to a token may be changed by a transition firing and it often represents a complex data-value. CPNs lead to compact net models by using of the concept of colors.

### 2.9.3 Turing complete extensions

The computational power of conventional or backwards-compatible Petri nets such as CPNs is strictly weaker than that of Turing machines [77]. From a theoretical viewpoint, the limitation of Petri nets is precisely due to the lack of abilities to test potentially unbounded places for zero and then act accordingly. With zero-testing capabilities, it is fairly easy to show the equivalence to register machines, which are Turing equivalent. We will mention several extensions, which add properties that cannot be modeled in the original Petri net.

#### Petri nets with inhibitor arcs

The inhibitor arc connects an input place to a transition. The presence of an inhibitor arc connecting an input place to a transition changes the transition enabling conditions. In the presence of the inhibitor arc, a transition is regarded as enabled if each input place, connected to the transition by a normal arc, contains at least the number of tokens equal to the weight of the arc, and no tokens are present on each input place connected to the transition by the inhibitor arc. The transition firing rule is the same for normally connected places. The firing, however, does not change the marking in the inhibitor arc connected places.

**Time petri nets**

Time Petri nets (TPN) are Petri nets in which each transition  $t$  has attached two times  $a \leq b$ . Assuming that  $t$  was last enabled at time  $c$ , then  $t$  may fire only during the interval  $[c + a, c + b]$  and must fire at time  $c + b$  at the latest unless it is disabled before by the firing of another transition. Firing a transition takes no time.

**Timed Petri nets**

Timed Petri nets (TdPN) are obtained from Petri nets by associating a firing time (delay) to each transition of the net. Moreover, each token has an age property, so the marking of a place  $p$  is a finite multiset of ages. The precondition of a transition with input place  $p$  is an interval. A transition is enabled if for every input place there exists an appropriate token, i.e. its age is included in the interval.

**Prioritized Petri nets**

Transitions in prioritized Petri nets have input arcs of two types: normal and prioritized. A place with a token and several transitions enabled from this place will fire the transition with a priority arc first. If there are more than one priority arc outgoing from a place which causes that more than one transition is enabled, then the firing choice is nondeterministic.

**Maximal parallel Petri nets**

Under the maximal parallel semantics, maximal sets of simultaneously enabled rules are fired. They are of interest due to their close connections with the model of P systems.

**2.9.4 Other extensions**

While the above extended Petri nets are powerful enough to simulate Turing machines, all nontrivial behavioral properties for such Petri nets become undecidable. A natural and interesting question to ask is: are there Petri nets whose powers lie between conventional Petri nets and Turing machines? As it turns out, the quest for such weaker extensions has attracted considerable attention in recent years.

### Reset nets

A reset arc does not impose a precondition on firing, and empties the place when the transition fires. This makes reachability and boundedness undecidable, while some other properties, such as termination, coverability remain decidable.

### Transfer nets

Petri nets with transfer arcs (transfer nets) can contain transitions that can also consume all the tokens present in one place regardless of the actual number of tokens and move them to another place. The termination and coverability remain decidable and reachability undecidable, on the other hand, in this case the boundedness is decidable [28].

## 2.10 Vector addition systems

Vector addition systems were introduced by Karp and Miller [47], and were later shown by Hack [37] to be equivalent to Petri nets.

**Definition 2.10.1.** A **vector addition system (VAS)** is a pair  $G = (x, W)$ , where  $x \in \mathbb{N}^n$  is an initial vector and  $W \subseteq \mathbb{Z}^n$  is a finite set of vectors, where  $n > 0$  is called the dimension of VAS.

The initial vector is seen as the initial values of multiple counters and the vectors in  $W$  are seen as actions that update the counters. These counters may never drop below zero.

**Definition 2.10.2.** The **reachability set** of the VAS  $G = (x, W)$  is the set  $R(G) = \{z \mid \exists v_1, \dots, v_j \in W : z = x + v_1 + \dots + v_j \wedge \forall 1 \leq i \leq j : x + v_1 + \dots + v_i \geq 0\}$ .

**Definition 2.10.3.** A **vector addition system with states (VASS)** is a tuple  $G = (x, W, Q, T, p_0)$ , where:

- $(x, W)$  is a vector addition system,
- $Q$  is a finite set of states,
- $T$  is a finite set of transitions of the form  $p \rightarrow (q, v)$ , where  $v \in W$  and  $p, q \in Q$  are states,
- $p_0 \in Q$  is the starting state.



The transition  $p \rightarrow (q, v)$  can be applied at vector  $y$  in state  $p$  and yields the vector  $y + v$  in state  $q$ , provided that  $y + v \geq 0$ .

**Example 2.10.1.** For the Petri net in the Figure 2.1, the corresponding VAS  $(x, W)$  is:

- $x = (3, 0, 0, 0)$ ,
- $W = \{(-1, 1, 1, 1), (1, 0, 0, -1)\}$ .

It is known [37] that Petri nets, VAS and VASS are computationally equivalent.

## 2.11 Büchi automaton

No need to include Buchi yet.

## 2.12 Calculi of looping sequences

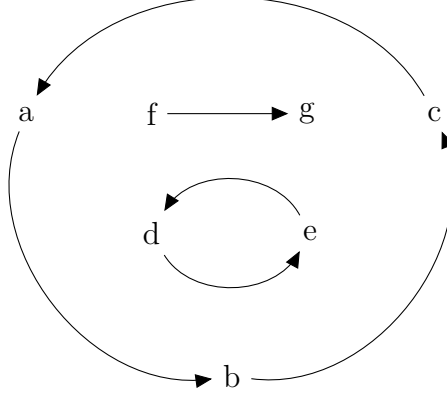
Another tool for describing biological membranes is the formalism Calculus of Looping Sequences (CLS) [10].

In the last few years many formalisms originally developed by computer scientists to model systems of interacting components have been applied to biology. Here, we can mention Petri nets (see Section 2.9). Others, such as P systems (see Chapter 3), have been proposed as biologically inspired computational models and have been later applied to the description of biological systems.

Many of these models either offer only very low-level interaction primitives or they are specialized to the description of some particular kinds of phenomena such as membrane interactions or protein interactions. Finally, P Systems have a simple notation and are not specialized to the description of a particular class of systems, but they are still not completely general. For instance, it is possible to describe biological membranes and the movement of molecules across membranes, and there are some variants able to describe also more complex membrane activities. However, the formalism is not so flexible to allow describing easily new activities observed on membranes without extending the formalism to model such activities.

For these reasons there was a new formalism called Calculus of Looping Sequences introduced.

CLS is a formalism based on term rewriting with some features, such as a commutative parallel composition operator, and some semantic means,



A representation of the term  $(a \cdot b \cdot c)^L \rfloor ((d \cdot e)^L \mid f \cdot g)$ .

Figure 2.4: Example CLS

such as bisimulations, which are common in process calculi. This permits to combine the simplicity of notation of rewriting systems with the advantage of a form of compositionality.

A CLS model consists of a term and a set of rewrite rules. The term is intended to represent the structure of the modeled system and the rewrite rules to represent the events that may cause the system to evolve.

We start with defining the syntax of terms. We assume a possibly infinite alphabet  $\Sigma$  of symbols.

**Definition 2.12.1.** *Terms  $T$  and sequences  $S$  of CLS are given by the following grammar:*

$$\begin{aligned} T &::= S \mid (S)^L \rfloor T \mid T \mid T \\ S &::= \varepsilon \mid a \mid S \cdot S \end{aligned}$$

where  $a \in \Sigma$  and  $\varepsilon$  represents the empty sequence. We denote with  $\mathcal{T}$  the infinite set of terms and with  $\mathcal{S}$  the infinite set of sequences.

In CLS we have a sequencing operator  $\_ \cdot \_$ , a looping operator  $(\_)^L$ , a parallel composition operator  $\_ \mid \_$  and a containment operator  $\_ \rfloor \_$ . Sequencing can be used to concatenate elements of the alphabet  $\Sigma$ . The empty sequence  $\varepsilon$  denotes the concatenation of zero symbols. A term can be either a sequence or a looping sequence (that is the application of the looping operator to a sequence) containing another term, or the parallel composition

of two terms. By definition, looping and containment are always applied together, hence we can consider them as a single binary operator  $(\_)^L \rfloor \_$  which applies to one sequence and one term.

**Example 2.12.1.** In the Figure 2.4 we show an example of CLS and its visual representation. The same structure may be represented by syntactically different terms, e.g.  $(b \cdot c \cdot a)^L \rfloor (f \cdot g \rfloor (e \cdot d)^L)$ . We introduce a structural congruence relation to identify such terms.

**Definition 2.12.2.** *The structural congruence relations  $\equiv_S$  and  $\equiv_T$  are the least congruence relations on sequences and on terms, respectively, satisfying the following rules:*

- $S_1 \cdot (S_2 \cdot S_3) \equiv_S (S_1 \cdot S_2) \cdot S_3$
- $S \cdot \varepsilon \equiv_S \varepsilon \cdot S \equiv_S S$
- $S_1 \equiv_S S_2$  implies  $S_1 \equiv_T S_2$  and  $(S_1)^L \rfloor T \equiv_T (S_2)^L \rfloor T$
- $T_1 | T_2 \equiv_T T_2 | T_1$
- $T_1 | (T_2 | T_3) \equiv_T (T_1 | T_2) | T_3$
- $T | \varepsilon \equiv_T T$
- $(\varepsilon)^L \rfloor \varepsilon \equiv_T \varepsilon$
- $(S_1 \cdot S_2)^L \rfloor T \equiv_T (S_2 \cdot S_1)^L \rfloor T$

Note that the last rule does not introduce the commutativity of sequences, but only says that looping sequences can rotate.

What could look strange in CLS is the use of looping sequences for the description of membranes, as sequencing is not a commutative operation and this do not correspond to the usual fluid representation of membrane surface in which objects can move freely. What one would expect is to have a multiset or a parallel composition of objects on a membrane. For this reason, a variant called CLS+ was introduced in [54], in which the looping operator can be applied to a parallel composition of sequences.

**Definition 2.12.3.** *Terms  $T$ , branes  $B$  and sequences  $S$  of CLS+ are given by the following grammar:*

$$\begin{aligned} T &::= S \mid (B)^L \rfloor T \mid T | T \\ B &::= S \mid B | B \\ S &::= \varepsilon \mid a \mid S \cdot S \end{aligned}$$

The structural congruence relation of CLS+ is a trivial extension of the one of CLS. The only difference is that commutativity of branes replaces rotation of looping sequences. CLS+ models can be translated into CLS models, while preserving the semantics of the model [10]. Moreover, in the same paper, a translation of maximal parallel P system to CLS is shown.

## 2.13 Graph theory

Biological membranes forms a hierarchical structure, which can be represented by a tree. In this section we define several notions from the graph theory taken from [27].

**Definition 2.13.1.** A **graph** is a pair  $G = (V, E)$  of sets such that  $E \subseteq V \times V$  and  $V \cap E = \emptyset$ . The elements of  $V$  are the vertices (or nodes) of the graph  $G$ , the elements of  $E$  are its edges.

The vertex set of a graph  $G$  is denoted by  $V(G)$ , its edge set as  $E(G)$ .

**Definition 2.13.2.** The **order of the graph**  $G$  is the number of its vertices, denoted by  $|G|$ . Graphs are (in)finite iff their order is (in)finite.

**Definition 2.13.3.** A vertex  $v \in V$  is **incident** with an edge  $e \in E$  iff  $v \in e$ , i.e. either  $e = (v, y)$ , where  $y \in V$  or  $e = (x, v)$ , where  $x \in V$ .

**Definition 2.13.4.** Two vertices  $x, y \in V(G)$  are **adjacent** iff  $(x, y) \in E(G)$ .

**Definition 2.13.5.** A **path** is a non-empty graph  $P = (V, E)$ , where  $V = \{x_0, x_1, \dots, x_k\}$  and  $E = \{(x_i, x_{i+1}) | 0 \leq i < k\}$  and the  $x_i$  are all distinct.

**Definition 2.13.6.** If  $P = (V, E)$  is a path where  $V = \{x_0, x_1, \dots, x_k\}$  and  $|V| \geq 3$ , then the graph  $C = (V, E \cup \{(x_k, x_0)\})$  is called a **cycle**.

**Definition 2.13.7.** A graph  $G = (V, E)$  is a **subgraph** of a graph  $G' = (V', E')$  iff  $V \subseteq V'$  and  $E \subseteq E'$ . We denote it by  $G \subseteq G'$  and also say that  $G'$  contains  $G$ .

**Definition 2.13.8.** A non-empty graph  $G$  is called **connected** iff any two of its vertices are linked by a path in  $G$ .

**Definition 2.13.9.** A graph not containing any cycle is called a **forest**.

**Definition 2.13.10.** A connected forest is called a **tree**.

Sometimes it is convenient to consider one vertex of a tree as special. Such a vertex is then called the root of this tree.

**Definition 2.13.11.** A tree  $T$  with a fixed root is called a **rooted tree**. The root node of  $T$  is denoted by  $r_T$ .

**Definition 2.13.12.** Let  $d$  be a node of a non-root tree  $T$ , i.e.  $d \in V(T) \setminus \{r_T\}$ . As  $T$  is a tree, there is a unique path from  $d$  to  $r_T$  [27]. The node adjacent to  $d$  on that path is also unique and is called a **parent node** of  $d$  and is denoted by  $\text{parent}_T(d)$ .

**Definition 2.13.13.** Let  $T_1, T_2$  be two rooted trees. A bijection  $f : V(T_1) \rightarrow V(T_2)$  is an **isomorphism** iff  $\forall x, y \in V(T_1) : (x, y) \in E(T_1) \Leftrightarrow (f(x), f(y)) \in E(T_2)$ .

Rooted trees  $T_1$  and  $T_2$  are called isomorphic if there exists an isomorphism on their nodes.

## 2.14 Bisimulations

For proving equivalence between two computation models, a notion of bisimulation is essential. Specifically, there are multiple notions that represent various equivalences. Definitions in this section are taken from [26].

**Definition 2.14.1.** A **state transition system** is a pair  $(S, \rightarrow)$ , where  $S$  is a set of states and  $\rightarrow \subseteq S \times S$  is a binary transition relation over  $S$ .

If  $p, q \in S$ , then  $(p, q) \in \rightarrow$  is usually written as  $p \rightarrow q$ . This represents the fact that there is a transition from state  $p$  to state  $q$ .

**Definition 2.14.2.** A **labeled state transition system (LTS)** is a tuple  $(S, A, \rightarrow)$ , where  $S$  is a set of states,  $A$  is a set of labels and  $\rightarrow \subseteq S \times A \times S$  is a ternary transition relation.

If  $p, q \in S$  and  $a \in A$ , then  $(p, a, q) \in \rightarrow$  is usually written as  $p \xrightarrow{a} q$ . This represents the fact that there is a transition from state  $p$  to state  $q$  with a label  $a$ .

**Definition 2.14.3.** Let  $(S_1, A, \rightarrow)$  and  $(S_2, A, \rightarrow)$  be two labeled transition systems. A **simulation** is a binary relation  $R \subseteq S_1 \times S_2$  such that if  $(s_1, s_2) \in R$  then for each  $s_1 \xrightarrow{a} t_1$  there is some  $s_2 \xrightarrow{a} t_2$  such that  $(t_1, t_2) \in R$ .

**Definition 2.14.4.** Let  $(S_1, A, \rightarrow)$  and  $(S_2, A, \rightarrow)$  be two labeled transition systems. A **bisimulation** is a binary relation  $R \subseteq S_1 \times S_2$  such that if  $(s_1, s_2) \in R$  then:

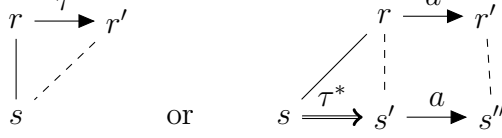


Figure 2.5: Transfer diagram for branching bisimulation

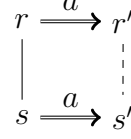


Figure 2.6: Transfer diagram for weak bisimulation

1. for each  $s_1 \xrightarrow{a} t_1$  there is some  $s_2 \xrightarrow{a} t_2$  such that  $(t_1, t_2) \in R$ ,
2. for each  $s_2 \xrightarrow{a} t_2$  there is some  $s_1 \xrightarrow{a} t_1$  such that  $(t_1, t_2) \in R$ .

Sometimes, we want to allow systems to perform internal (silent) steps, of which the impact is considered unobservable. There are multiple notions of the bisimulation. The definition above is called a strong bisimulation.

**Definition 2.14.5.** A labeled transition system with silent actions is a triple  $(S, A, \rightarrow)$ , where  $S$  is a set of states,  $A$  is a set of actions, also a silent action  $\tau$  is assumed that is not in  $A$  and  $\rightarrow \subseteq (A \cup \tau) \times S$  is the transition relation.

We use  $A_\tau$  to denote  $A \cup \{\tau\}$ . By  $\xRightarrow{\tau^*}$  we denote the transitive and reflexive closure of  $\xrightarrow{\tau}$ . For  $a \in A$  we define the relation  $\xRightarrow{a}$  on  $S$  by  $r \xRightarrow{a} s$  iff there exists  $r', s' \in S$  such that  $r \xRightarrow{\tau^*} r' \xrightarrow{a} s' \xRightarrow{\tau^*} s$ .

**Definition 2.14.6.** A run of a labeled transition system is a finite, non-empty alternating sequence  $\rho = s_0 a_0 s_1 a_1 \dots s_{n-1} a_{n-1} s_n$  of states and actions, beginning and ending with a state such that for  $0 \leq i < n$  :  $s_i \xrightarrow{a_i} s_{i+1}$ .

We also say that  $\rho$  is a run from  $s_0$ . We denote  $first(\rho) = s_0$  and  $last(\rho) = s_n$ .

**Definition 2.14.7.** A relation  $R \subseteq S \times S$  is called a **branching bisimulation** if it is symmetric and satisfies the following transfer property: if  $rRs$  and  $r \xrightarrow{a} r'$  then either  $a = \tau$  and  $r'Rs$  or there exist  $s', s'' \in S$  such that  $s \xRightarrow{\tau^*} s' \xrightarrow{a} s''$ ,  $rRs'$  and  $r'Rs''$ .

**Example 2.14.1.** The diagrams shown in the Figure 2.5 summarize the main transfer properties of branching bisimulation. We have used the dashed lines to represent the relations that have to be established in order to conclude that the two states connected by the plain line are equivalent.

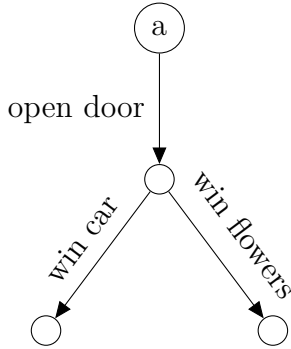


Figure 2.7: Example run of a labeled transition system

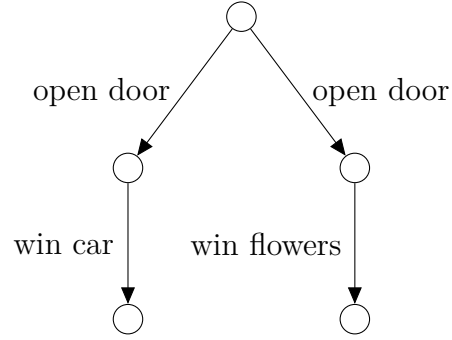


Figure 2.8: Example run of a labeled transition system with hidden branching before the first action

We could have strengthened the above definition of branching bisimulation by requiring all intermediate states in  $s \xRightarrow{\tau^*} s'$  to be related with  $r$ . However, that would lead to the same equivalence relation [26].

**Definition 2.14.8.** A relation  $R \subseteq S \times S$  is called a **weak bisimulation** if it is symmetric and satisfies the following transfer property: if  $rRs$  and  $r \xRightarrow{a} r'$  then there exist  $s' \in S$  such that  $s \xRightarrow{a} s'$  and  $r'R s'$ .

This means that two states are considered equivalent if they lead via the same sequences of visible actions to equivalent states. The intermediate states are not questioned. The diagram in the Figure 2.6 summarizes the transfer property for the weak bisimulation. We have used the same notational conventions of the Figure 2.5.

**Example 2.14.2.** In the Figure 2.7 a participant in a contest opens a door and then it is decided if he wins a car or flowers. In the Figure 2.8 the price is decided beforehand so when a participant opens a door, he can directly see his outcome. We can model these events (open door, win car, win flowers) as actions of a labeled transition system.

The contestant is not interested in the inner states of the system, he only sees these events. For him, the two systems are bisimilar in terms of the weak bisimulation.

In the state right after opening the door and before the price is given there is no way for him knowing the outcome. However, in the system from the Figure 2.8 some people who organize the contest already know what is the outcome. For them, the system is not bisimilar in terms of the branching bisimulations.

## 2.15 Rice's theorem

Consider any kind of software testing problem. Its description will typically start as “For a given program decide whether the function it computes is. . .”. In the setting of Turing machines, we often encounter natural problems of the form “Decide if the language recognized by a given Turing machine. . .”. Rice's theorem [69] proves in one clean sweep that all these problems are undecidable. That is, whenever we have a decision problem in which we are given a Turing machine and we are asked to determine a property of the language recognized by the machine, that decision problem is always undecidable. The only exceptions will be the trivial properties that are always true or always false.

Note that Rice's theorem is applicable only for Turing complete models. It means that the properties analyzed in section 2.9.1 can still be perfectly decidable as they are studied on Petri nets, which are not Turing complete.

We will mention Rice's theorem again in section 4.2.

## 2.16 Reaction systems

In this section we present reaction systems [70], a formal framework for investigating processes driven by interactions between biochemical reactions in living cells. These interactions are based on the mechanisms of facilitation and inhibition: a reaction can take place if all of its reactants are present and none of its inhibitors is present. If a reaction takes place, then it creates its products. Therefore to specify a reaction one needs to specify its set of reactants, its set of inhibitors, and its set of products. This leads to the following definition.

**Definition 2.16.1.** *A reaction is a triplet  $a = (R, I, P)$ , where  $R, I, P$  are finite sets. If  $S$  is a set such that  $R, I, P \subseteq S$ , then  $a$  is a reaction in  $S$ .*

The sets  $R, I, P$  are also denoted  $R_a, I_a, P_a$ , and called the reactant set of  $a$ , the inhibitor set of  $a$  and the product set of  $a$ .

**Definition 2.16.2.** *Let  $a$  be a reaction and  $T$  a finite set. Then  $a$  is enabled by  $T$ , denoted by  $a \text{ en } T$ , iff  $R_a \subseteq T$  and  $I_a \cap T = \emptyset$ .*

**Definition 2.16.3.** *Let  $a$  be a reaction and  $T$  a finite set. The result of  $a$  on  $T$  is defined by:  $\text{res}_a(T) = P_a$  if  $a \text{ en } T$  and  $\text{res}_a(T) = \emptyset$  otherwise.*

Clearly, if  $R_a \cap I_a \neq \emptyset$ , then  $\text{res}_a(T) = \emptyset$  for every  $T$ . Therefore, we can assume that, for each reaction  $a$ ,  $R_a \cap I_a = \emptyset$  and we will also assume that  $R_a \neq \emptyset$ ,  $I_a \neq \emptyset$  and  $P_a \neq \emptyset$ .



**Example 2.16.1.** Consider the reaction  $a$  with  $R_a = \{c, x_1, x_2\}$ ,  $I_a = \{y_1, y_2\}$ , and  $P_a = \{c, z\}$ . We can interpret  $c$  as the catalyzer of  $a$  as it is needed for  $a$  to take place, but is not consumed by  $a$ . Then  $a \text{ en } T$  for  $T = \{c, x_1, x_2, z\}$ , and  $a$  is not enabled on neither  $\{c, x_1, x_2, z, y_1\}$  nor on  $\{x_1, x_2, z\}$ .

A reaction  $a$  is enabled on a set  $T$  if  $T$  separates  $R_a$  from  $I_a$ , i.e.  $R_a \subseteq T$  and  $I_a \cap T = \emptyset$ . There is no assumption about the relationship of  $P_a$  to either  $R_a$  or  $I_a$ . When  $a$  is enabled by a finite set  $T$ , then  $\text{res}_a(T) = P_a$ . Thus, the result of  $a$  on  $T$  is “locally determined” in the sense that it uses only a subset of  $T$ . However, the result of the transformation is global as all elements from  $T \setminus P_a$  “vanished”. This is in great contrast to classical models like Petri nets (see section 2.9), where the firing of a single transition has only a local influence on the global marking which may be changed only on places that are neighbouring the given transition. In reaction systems there is no permanency of elements: an element of a global state vanishes unless it is sustained by a reaction.

**Definition 2.16.4.** Let  $A$  be a finite set of reactions. The result of  $A$  on  $T$  is defined by

$$\text{res}_A(T) = \bigcup_{a \in A} \text{res}_a(T)$$

There are no conditions on the relationship between reactions in  $A$  nor the notion of conflict here: if  $a, b \in A$  with  $a \text{ en } T$  and  $b \text{ en } T$ , then, even if  $R_a \cap R_b \neq \emptyset$ , still both  $a$  and  $b$  contribute to  $\text{res}_A(T)$ , i.e.  $\text{res}_a(T) \cup \text{res}_b(T) \subseteq \text{res}_A(T)$ .

There is no counting in reaction systems, it is a qualitative rather than quantitative model. This reflects the assumption about the “threshold supply” of elements: either an element is present, and then there is “enough” of it, or an element is not present.

The notion of conflict is reflected via the notion of consistency.

**Definition 2.16.5.** A set of reactions  $A$  is **consistent** iff  $R_a \cap I_b = \emptyset$ , i.e.  $R_a \cap R_b = \emptyset$  for any two reactions  $a, b \in A$ .

Clearly, if  $R_a \cap I_b \neq \emptyset$ , then  $a$  and  $b$  can never be together enabled.

**Definition 2.16.6.** A **reaction system** is an ordered pair  $\mathcal{A} = (S, A)$  such that  $S$  is a finite set and  $A$  is a set of reactions in  $S$ .

There are many situations where one needs to assign quantitative parameters to states (e.g. when dealing with time issues). A numerical value can

be assigned to a state  $T$  if there is a measurement of  $T$  yielding this value. This leads to the notion of reaction systems with measurements [29], where a finite set of measurement functions is added as a third component to reaction systems.

There are various extensions of reaction systems, but they are based on the core definition with basic notions of “no permanence” and “no counting” of elements. We will mention reaction systems again in section 3.2 as an inspiration for some variants of P systems.

# Chapter 3

## P systems

In subsection 1.3.3 we briefly introduced the notions of membrane, membrane structure and P system.

A P system [59] is a computing model which abstracts from the way the alive cells process chemical compounds in their compartmental structure. In short, in the regions defined by a membrane structure we have objects which can be described by symbols. Their multiplicity matters, that is, we work with multisets of objects placed in the regions of the membrane structure. Objects evolve according to given rules. Any object, alone or together with another objects, can be transformed in other objects, can pass through a membrane, and can dissolve the membrane in which it is placed. All objects evolve at the same time, in parallel manner across all membranes. The evolution rules are hierarchized by a priority relation, which is a partial order. By using the rules in a nondeterministic, maximally parallel manner, one gets transitions between the system configurations. A sequence of transitions is a computation. With a halting computation we can associate a result, in the form of the objects present in a given membrane in the halting configuration, or expelled from the system during the computation.

These aspects all together forms a P system as introduced in [59]. An example of a P system containing rules for computing the Fibonacci sequence can be seen in the figure 3.1.

In section 3.1 we will provide a formal definition of a P system. We will follow in section 3.2 by presenting most common P system variants along with a survey of known results and in section 3.3 we show how P systems can be of use in practice case studies.

### 3.1 Definitions

The definition of a P system is based on the notion of membrane structure [11], which is introduced in terms of the language  $MS$  over the alphabet  $\{[, ]\}$ , consisting of the strings recurrently defined as follows:

1.  $[] \in MS$ ,
2. if  $\mu_1, \dots, \mu_n \in MS$ , then  $[\mu_1 \dots \mu_n] \in MS$ ,
3. nothing else is in  $MS$ .

We assume that each pair of well matching parentheses  $[]$  can be labelled in a one-to-one manner by an integer in the set  $1 \dots m$ , e.g.  $[[ ]_2 ]_3 ]_1$ .

We define now an equivalence relation over the elements of  $MS$ : we write  $x \sim y$  if and only if:

1.  $x = []_i$  and  $y = []_i$ ,
2.  $x = [\mu_1 \dots \mu_n]_j$ ,  $y = [\xi_1 \dots \xi_n]_j$  and  $\mu_i \sim \xi_{p(i)}$  for every  $i$  and for some permutation  $p$ .

Thus, the order of parentheses is irrelevant as long as they are at the same hierarchical level. The set of equivalence classes with respect to the equivalence relation  $\sim$  is denoted by  $\overline{MS}$ .

**Definition 3.1.1.** Any element in  $\overline{MS}$  is called a **membrane structure**.

**Definition 3.1.2.** Each pair of matching parentheses  $[]$  appearing in a membrane structure  $\mu$  is called a **membrane**.

**Definition 3.1.3.** The external membrane of a membrane structure is called the **skin membrane**.

**Definition 3.1.4.** Any membrane without any other membrane inside (appearing in a membrane structure in the form  $[]$ ) is called an **elementary membrane**.

**Definition 3.1.5.** The number of membranes in  $\mu$  is called the **degree** of  $\mu$  and it is denoted by  $\deg(\mu)$ .

**Definition 3.1.6.** The depth of a membrane structure  $\mu$ ,  $\text{dep}(\mu)$ , is recurrently defined as:

1. if  $\mu = []$ , then  $\text{dep}(\mu) = 1$ ;

2. if  $\mu = [\mu_1 \dots \mu_n]$  for some  $\mu_1, \dots, \mu_n \in MS$ , then  $dep(\mu) = 1 + \max(dep(\mu_i) | 1 \leq i \leq n)$ .

Each membrane determines a compartment, also called region, the space delimited from above by it and from below by the membranes placed directly inside, if any exists. The correspondence membrane-region is one-to-one, that is why we sometimes use interchangeably these terms.

Next step is inserting objects into regions and adding them the possibility to evolve and communicate according to certain specified rules.

**Definition 3.1.7.** An **evolution rule** over an alphabet  $\Sigma$  is a pair  $(u, v)$ , which will be written as  $u \rightarrow v$ , where  $u$  is a string over  $\Sigma$  and  $v = v'$  or  $v = v'\delta$ , where  $v'$  is a string over  $\Sigma \times (\{here, out\} \cup \{in_j | 1 \leq j \leq m\})$  and  $\delta$  is a special symbol not in  $\Sigma$ .

An example of such rule is  $ab^2 \rightarrow (a, here)(b, in_3)(c, out)(c, here)$ . An evolution rule specifies for each object on the right side, whether it stays in the current region, moves through a membrane to the parent region or through a membrane to one of the child regions.

**Definition 3.1.8.** For an evolution rule  $r : u \rightarrow v$ , the length of  $u$  is called the **radius** of  $r$ .

Note that the strings  $u, v$  are understood as representations of multisets over  $\Sigma$ , in a sense from section 2.6.

We are now ready to proceed with a formal definition of a P system of degree  $m$ .

**Definition 3.1.9.** A **P system** is a tuple

$$\Pi = (\Sigma, \mu, w_1, w_2, \dots, w_m, R_1, R_2, \dots, R_m)$$

, where:

- $\Sigma$  is the alphabet of objects,
- $\mu$  is a membrane structure consisting of  $m$  membranes labeled with numbers  $1, 2, \dots, m$ ,
- $w_1, w_2, \dots, w_m$  are multisets of objects from  $\Sigma$  initially present in the regions  $1, 2, \dots, m$  of the membrane structure,
- $R_1, R_2, \dots, R_m$  are finite sets of evolution rules associated with the regions  $1, 2, \dots, m$  of the membrane structure.

Some more remarks about the definition of a  $P$  system are to be given, before explaining its functioning as a computing device.

Any of the initial multisets  $w_1, w_2, \dots, w_m$  can be empty as well as any of the sets of evolution rules  $R_1, R_2, \dots, R_m$ .

The  $(m+1)$ -tuple  $(\mu, w_1, w_2, \dots, w_m)$  constitutes the initial configuration of the  $P$  system  $\Pi$ . In general, the configuration is represented by the membrane structure of  $\Pi$  and the multisets of objects in the regions.

**Definition 3.1.10.** *A configuration of a  $P$  system  $\Pi$  is an  $(m+1)$ -tuple  $(\mu', w'_1, w'_2, \dots, w'_m)$ , where  $\mu'$  is a membrane structure and  $w'_1, w'_2, \dots, w'_m$  are multisets over  $\Sigma$  present in the regions  $1, 2, \dots, m$  of  $\mu'$ .*

Note that the membrane structure can be different from the initial membrane structure, according to the dissolving action, which will be explained later.

**Definition 3.1.11.** *A rule  $(r : u \rightarrow v) \in R_i$  is **applicable** in the configuration  $C = (\mu', w'_1, w'_2, \dots, w'_m)$  of the  $P$  system  $\Pi$ , iff the following conditions are fulfilled:*

1.  $u \subseteq w'_i$ ,
2. for any object, which appears in  $v$  in the form  $(a, in_j)$  there is a membrane  $j$  directly inside  $i$ ,
3. if  $v = v'\delta$ , then  $i$  is not the skin membrane.

**Definition 3.1.12.** *The result of the application of the rule  $r : u \rightarrow v \in R_i$  in the configuration  $C = (\mu', w'_1, w'_2, \dots, w'_m)$  of the  $P$  system  $\Pi$  is determined by the following prescription:*

- the multiset  $u$  is subtracted from  $w'_i$ ;
- if an object appears in  $v$  in the form  $(a, here)$ , then it remains in the same region  $i$  (the indication here will often be omitted);
- if an object appears in  $v$  in the form  $(a, out)$ , then it exits the membrane  $i$  and becomes an element of the region immediately outside it. If the membrane  $i$  is the skin membrane, then the object leaves the system and it will never come back;
- if an object appears in  $v$  in the form  $(a, in_j)$  and  $j$  a membrane immediately inside  $i$ , then the object  $a$  is added to the multiset  $w'_j$ . If it is not a membrane immediately inside  $i$ , then the application of the rule is not allowed;

- if the symbol  $\delta$  appears in  $v$ , then the membrane  $i$  is removed (we say it is dissolved) from  $\mu'$  and, at the same time, the multiset  $w'_i$  is added to the region immediately outside of the membrane  $i$ . The dissolving of the skin membrane is not allowed.

For better understanding of this process, we present an algorithm for the rule application below.

---

**Algorithm 2** Application of a single rule in a P system

---

```

1: procedure RULEAPPLICATION(applicable rule  $u \rightarrow v \in R_i$ , configuration
    $C = (\mu', w'_1, w'_2, \dots, w'_m)$ )
2:    $w_i := w_i - u$ 
3:   for all  $(a, \text{here}) \in v$  do
4:      $w_i := w_i + a$ 
5:   for all  $(a, \text{out}) \in v$  do
6:      $w_{\text{parent}(i)} := w_{\text{parent}(i)} + a$ 
7:   for all  $(a, \text{in}_j) \in v$  do
8:      $w_j := w_j + a$ 
9:   if  $v = v'\delta$  then
10:     $w_{\text{parent}(i)} := w_{\text{parent}(i)} + w_i$ 
11:     $w_i := \text{empty multiset}$ 

```

---

All these operations are performed in a maximal parallel mode: inside each region all applicable rules  $u \rightarrow v$  are used over all occurrences of multisets  $u$ , and all regions are processed at the same time. Hence, the parallelism is maximal at both a global and a local level: the global level involves all membranes at the same time, the local level involves all evolution rules and all objects inside each region.

**Definition 3.1.13.** *A multiset of rules*

$$\rho : \bigcup_{1 \leq i \leq m} R_i \rightarrow \mathbb{N}$$

is **simultaneously applicable** in the configuration  $C = (\mu', w'_1, w'_2, \dots, w'_m)$  of the P system  $\Pi$ , iff the following conditions are fulfilled:

1. for any membrane with label  $1 \leq i \leq m$ , there is enough objects to allow simultaneous application of rules:

$$\bigcup_{(r:u \rightarrow v) \in \text{supp}(\rho) \cap R_i} \rho(r) \cdot u \subseteq w'_i$$

,

2. for any membrane with label  $1 \leq i \leq m$ , any rule  $u \rightarrow v \in \text{supp}(\rho) \cap R_i$ , any object, which appears in  $v$  in the form  $(a, in_j)$  there is a membrane  $j$  directly inside  $i$ ,
3. for the skin membrane  $i$ , any rule  $r : u \rightarrow v'\delta \in R_i$  has no occurrence in the multiset:  $\rho(r) = 0$ .

The multiset of simultaneously applicable rules is maximal iff adding more rules to the multiset make it not simultaneously applicable. Simultaneous application of a multiset of rules arises no contradictions:

- if there is both  $(a, out)$  and  $\delta$  present in  $v$ , the object  $a$  ends up in the parent region,
- if there is a rule from  $R_i$  with  $v$  containing  $(a, in_j)$  and a rule from  $R_j$  with  $v$  containing  $\delta$ , the object  $a$  ends up in the region  $i$

**Definition 3.1.14.** A **computation step** of a  $P$  system is a relation  $\Rightarrow$  on the set of configurations such that  $C_1 \Rightarrow C_2$  iff there is a nonempty maximal multiset of simultaneously applicable rules, which, applied to  $C_1$ , can result in  $C_2$ .

For a configuration  $C_1$  there can be multiple possible results  $C_2$ , so one of them is nondeterministically chosen.

Starting from the initial configuration and applying the rules in the way described above, we obtain a sequence of transition among configurations; such a sequence is called a computation of  $\Pi$ .

**Definition 3.1.15.** An **infinite computation** of a  $P$  system is an infinite sequence of configurations  $\{C_i\}_0^\infty$  such that  $C_0$  is the initial configuration and  $C_i \Rightarrow C_{i+1}$  for all  $0 \leq i$ .

**Definition 3.1.16.** A **finite computation** of a  $P$  system is a sequence of configurations  $\{C_i\}_0^n$  such that  $C_0$  is the initial configuration and  $C_i \Rightarrow C_{i+1}$  for all  $0 \leq i < n$ .

**Definition 3.1.17.** A **halting configuration**  $C$  of a  $P$  system is a configuration with no applicable rule.

When no rule is applicable, there is only one maximal multiset of simultaneously applicable rules: an empty multiset, so there is no configuration  $C'$  such that  $C \Rightarrow C'$ .

**Definition 3.1.18.** A **halting computation** of a  $P$  system is a finite computation ending with a halting configuration.



1. By considering the multiplicity of objects present in a designated membrane in a halting configuration. In this case we obtain a vector of natural numbers. We can also represent this vector as a multiset of objects or as Parikh image of a string.
2. By concatenating the symbols which leave the system, in the order they are sent out of the skin membrane. If several symbols are expelled at the same time, then any ordering of them is assumed. In this case we generate a string.

**Example 3.1.1.** The P system in figure 3.1 computes a Fibonacci sequence. Maximal parallelism enforces the simultaneous movement of objects between regions 1 and 2. Every second step the number of occurrences of the object  $e$  in the skin membrane constitutes the following item in Fibonacci sequence. The P system has only one computation, which is infinite.

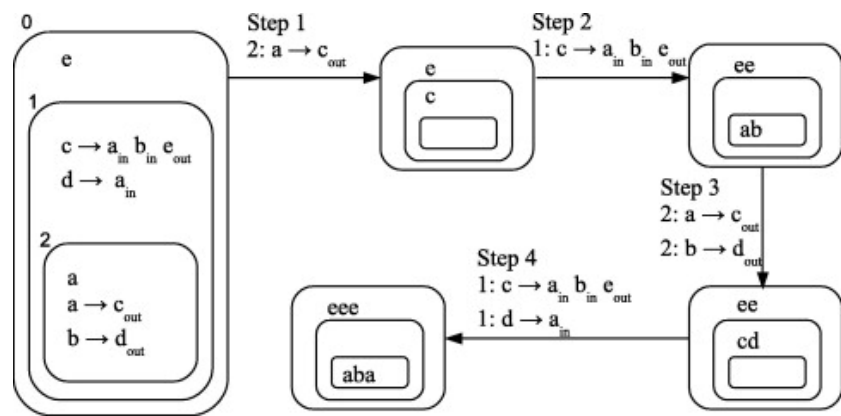


Figure 3.1: P system computing a Fibonacci sequence [14]

## 3.2 *P* system variants

Besozzi in his PhD thesis (see [11]) formulates three criteria that a good *P* system variant should satisfy:

1. It should be as much realistic as possible from the biological point of view, in order not to widen the distance between the inspiring cellular reality and the idealized theory.
2. It should result in computational completeness and efficiency, which would mean to obtain universal (and hence, programmable) computing devices, with a powerful and useful intrinsic parallelism.
3. It should present mathematical minimality and elegance, to the aim of proposing an alternative framework for the analysis of computational models.

In membrane computing, many models are equal in power with Turing machines. To be correct, we should speak about Turing completeness (or computational completeness). Because the proofs are always constructive, using the constructions from these proofs on a universal Turing machine or from a equivalent device, we obtain universal *P* systems, which are able to simulate any other *P* system of the given type. That is why we often speak about universality results, and not about computational completeness.

### 3.2.1 Accepting vs generating

In the Chomsky hierarchy, there are language acceptors (finite automata, Turing machines) and language generators (formal grammars).

Bordhin in [12] extends grammars to allow for accepting languages by interchanging the left side with the right side of a rule. The mode will apply rewriting rules to an input word and accept it when it reaches the starting nonterminal. However, the input word consists of terminal symbols, which could not be rewritten when using original definition, hence they consider the pure version of various grammar types where they give up the distinction between terminal and nonterminal symbols.

The regular, context-free, context-sensitive and recursively enumerable languages were shown to have equal power in accepting and generating mode. Some other grammars (programmed grammars with appearance checking) are shown to be more powerful in accepting mode than in generating mode. For deterministic Lindenmayer systems, the generating and accepting mode are incomparable.

It can be interesting to investigate accepting and generating mode also in *P* system variants. The original *P* system from section 3.1 defines the language as a generator. The accepting mode is usually defined as in [11]. A fixed membrane is specified as the input membrane. The system is said to accept a multiset (the initial contents of the input membrane), a number (the size of the input membrane) or a relation (various combinations of the occurrences of certain symbols in the input membrane) iff there is a computation that reaches a given halting configuration (or just a configuration).

In many variants the generating and accepting mode are equivalent. Barbuti in [9] showed some variants where the *P* system in accepting mode is strictly stronger than in generating mode.

### 3.2.2 Active vs passive membranes

Most of the studied *P* system variants assume that the number of membranes can only decrease during a computation, by dissolving membranes as a result of applying evolution rules to the objects present in the system [66]. A natural possibility is to let the number of membranes also to increase during a computation, for instance, by division, as it is well-known in biology. Actually, the membranes from biochemistry are not at all passive, like those in the models briefly described above. For example, the passing of a chemical compound through a membrane is often done by a direct interaction with the membrane itself (with the so-called protein channels or protein gates present in the membrane); during this interaction, the chemical compound which passes through membrane can be modified, while the membrane itself can in this way be modified (at least locally).

In [66] Păun considers *P* systems with active membranes where the central role in the computation is played by the membranes: evolution rules are associated both with objects and membranes, while the communication through membranes is performed with the direct participation of the membranes; moreover, the membranes can not only be dissolved, but they also can multiply by division. An elementary membrane can be divided by means of an interaction with an object from that membrane.

There are also other ways to define the creation of new membranes. In section 4.2 we present a variant with a special evolution rule which creates new membrane when a given multiset of objects is present in the region.

### *P* systems with polarized membranes

Polarizing membranes [66] is a special extension of active *P* systems, where each membrane is supposed to have an electrical polarization (we will say

charge), one of the three possible: positive, negative, or neutral. If in a membrane we have two immediately lower membranes of opposite polarizations, one positive and one negative, then that membrane can also divide in such a way that the two membranes of opposite charge are separated; all membranes of neutral charge and all objects are duplicated and a copy of each of them is introduced in each of the two new membranes. The skin membrane is never divided. If at the same time a membrane is divided and there are objects in this membrane which are being rewritten in the same step, then in the new copies of the membrane the result of the evolution is included.

In this way, the number of membranes can grow, even exponentially. As expected, by making use of this increased parallelism we can compute faster. For example, the SAT problem, which is NP complete, can be solved in linear time, when we consider the steps of computation as the time units. Moreover, the model is shown to be computationally universal.

### 3.2.3 Cooperative vs non-cooperative

If a *P* system contains evolution rules whose radius is greater than 1, then it is said to be cooperative, otherwise it is a non-cooperative system. Non-cooperative *P* systems have all rules restricted to contain only one object on the left side. *P* systems with cooperative rules are universal [59], while *P* systems with non-cooperative rules only characterize Parikh image of context-free languages (*PsCF*) [72]. It seems to relate with context-free and context-sensitive grammars in Chomsky's hierarchy mentioned in section 2.3.

Păun [59] also defines catalytic *P* systems where catalysts are a specified subset of the alphabet  $C \subseteq \Sigma$ . In a catalytic system the only possible rule of radius greater than 1 is of the form  $ca \rightarrow cv$ , where  $c \in C$ ,  $a \in \Sigma \setminus C$  and  $v \in (\Sigma \setminus C)^*$  and that is the only form of a rule that can contain a catalyst. If  $C = \emptyset$  then the system is called non-catalytic. Catalysts are not modified by applying the catalytic rule. Surprisingly, *P* systems with catalytic rules are universal, even two membranes in the *P* system are sufficient to achieve universality.

Freund in [33] showed that two catalysts and one membrane are enough for universality and raised an open problem whether one catalyst is sufficient. He conjectured that for computationally universal *P* systems the results obtained in this paper are optimal not only with respect to the number of membranes (2), but also with respect to the number of catalysts.

From some point of view, catalysts are way too powerful in restricting the parallelism - they directly participate in the rules, hence the number of catalytic rules that can be applied in one step, is bounded by number of

catalysts.

A variant with promoters and inhibitors have been proposed (see [43]).

In the case of promoters, the rules are possible only in the presence of certain symbols. An object  $p$  is a promoter for a rule  $u \rightarrow v$  and we denote this by  $u \rightarrow v|_p$ , if the rule is applicable only in the presence of object  $p$ . Note that unlike in the case with catalysts, promoters allow the associated rules to be applied as many times as possible.

If an object  $i$  is an inhibitor for a rule  $u \rightarrow v$ , we denote this by  $u \rightarrow v|_{-i}$ . Such rule is applicable as long as inhibitor  $i$  is not present in the region.

Ionescu in [43] showed that *P* systems with non-cooperative catalytic rules with only one catalyst and with promoters / inhibitors are universal. One of our results (see section 4.1) uses inhibitors to achieve universality for sequential *P* systems.

Non-cooperative rules with no catalysts and with inhibitors were studied in [73], the equivalence with the Parikh image of Lindenmayer systems (*ETOL* as defined in section 2.5) was proved.

Dang [40] proposes a simple cooperative system (*SCO*) as a *P* system where the only rules allowed are of the form  $a \rightarrow v$  or of the form  $aa \rightarrow v$ , where  $a$  is an object and  $v$  is a multiset of objects not containing  $a$ . This variant is investigated with various modes of parallelism, so their results will be mentioned in the subsection 3.2.7

Another interesting variant is where the only rules are the catalytic rules of the form  $ca \rightarrow cv$ , so there are no rules of radius 1. This variant is called purely catalytic systems and was introduced by Ibarra in [41]. The computational completeness was shown to hold with just three catalysts [33], while when initialized with just one catalyst, the equivalence with Petri nets has been proven [39].

### 3.2.4 Rules with priorities

In the original definition of a *P* system [59], a partial order relation over set of rewriting rules have been specified. The rule can be used only if no rule of a higher priority in the region can be applied at the same time.

Sosík in [75] showed that the priorities may be omitted from the maximal parallel model without loss of computational power, thus maintaining universality.

Sequential *P* systems (see subsection 3.2.7) with prioritized rules are universal [42], while without the priorities they are not.

As mentioned in subsection 3.2.3, *P* systems with non-cooperative rules only characterize the Parikh image of context-free languages (*PsCF*) [72], it was an open problem, whether priorities could improve the computational

power. In [71] Sburnan showed that the variant with prioritized rules is more powerful and characterize exactly the Parikh image of *ETOL* (see section 2.5 and subsection 2.7.1 in preliminaries).

We may conclude here that adding a priority relation over rules is a powerful feature which often boosts the computational power by allowing finer control mechanisms and limiting otherwise uncontrolled nondeterministic selection of rules to be applied.

### 3.2.5 Energy in *P* systems

Various notions of energy has been proposed for use in *P* systems. Păun in [67] considers a *P* system where each evolution rule “produces” or “consumes” some quantity of energy, in amounts which are expressed as integer numbers. In each moment and in each membrane the total energy involved in an evolution step should be positive, but if “Too much” energy is present in a membrane, then the membrane will be destroyed (dissolved). This variant was investigated in two cases, both were shown to be universal:

1. when using only two membranes and unbounded amount of energy,
2. when using arbitrarily many membranes and a bounded energy associated with rules

Freund in [34] introduced a new variant where the rules are assigned directly to membranes (every rule consume objects on one side of the membrane and produce objects on the other side) and every membrane carries an energy value that can be changed during a computation by objects passing through the membrane.

This variant is universal even in sequential mode if we allow priorities on the objects. When omitting the priority relation, only the family of Parikh sets generated by context-free matrix grammars (*PsMAT* as defined in section 2.4) is obtained.

### 3.2.6 Symport / antiport rules

Păun in [58] proposes a new way of communicating between membranes.

Symports allow two chemicals to pass together through a membrane in the same direction using symport rules of type  $(ab, in)$  or  $(ab, out)$ . Antiports allow two chemicals to pass simultaneously through a membrane in opposite directions using antiport rules of type  $(a, in; b, out)$ .

A *P* system with symport/antiport rules uses only these two types of rules and nothing else. Surprisingly, this *P* system variant has been shown

to be computationally complete. Five membranes are enough for this result as shown in [58]. If more than two chemicals may collaborate when passing through membranes, two membranes are sufficient for universality.

Dang in [23] showed some results about the sequential *P* systems with symport/antiport rules. When working in just one membrane, its reachability set is the same as of vector addition systems. Thus it is not universal in contrast to the maximal parallel variant, which is universal.

### 3.2.7 Parallelism options

Original definition of *P* system (see [59]) uses maximal parallelism when doing a step of computation. There is an obvious biological motivation relying on the assumption that “if we wait long enough, then all reaction which may take place will take place”. This condition is rather powerful, because it decreases the non-determinism of the system’s evolution. For various reasons ranging from looking for more realistic models to just the mathematical challenge, the maximal parallelism was questioned.

Dang in [23] investigates the sequential mode. In each step, from the set of applicable rules across all membrane one is nondeterministically chosen and applied.

**Definition 3.2.1.** *A computation step of a sequential *P* system is a relation  $\Rightarrow$  on the set of configurations such that  $C_1 \Rightarrow C_2$  holds iff there is an applicable rule in a membrane in  $C_1$  such that applying that rule can result in  $C_2$ .*

For purely catalytic systems with 1 membrane, the sequential mode generates only the semilinear sets and thus is strictly weaker than the maximally parallel version. Sequential version of symport / antiport systems are equivalent to vector addition systems making it strictly weaker than the original maximally parallel version.

Investigation of the sequential mode continues in [42]. Sequential *P* system without priorities with cooperative rules with rules for membrane dissolution are not universal by showing they can be simulated by vector addition systems with states (VASS). This holds even when the membrane creation is allowed for bounded number of created membranes. However, if any number of membranes are allowed to be created, the system becomes universal. This result was shown by simulation of the register machine (see section 2.8).

We have further investigated this universal sequential variant in chapter 4 where we will show some of our interesting results on the decidability problems of existence of finite / infinite computation.

Even though the variant without rules for creation of new membranes is not universal, we have studied the effect of adding inhibitors, which was shown to be universal.

Dang in [40] proposes several restricted versions of parallelism. *n*-Max-Parallel version nondeterministically selects a maximal subset of at most *n* rules to apply. It is proved that 9-Max-Parallel SCO (defined in the subsection 3.2.3) is universal.  $\leq n$ -Parallel version is similar, but does not require the condition of a maximal subset of rules. It is shown to be weaker than *n*-Max-Parallel version. *n*-Parallel version requires the size of the subset of rules to apply to be exactly *n*. All three versions are equal to the sequential mode when *n* = 1. For non-universality results, Dang showed the variants are able to be simulated by vector addition systems.

Ciobanu in [21] proposes even more restricted version of parallelism: minimal parallelism. For each region, if at least one rule can be applied, then at least one rule will be applied. The symport / antiport rules variant has been shown to be universal. In [22] the results are extended to a variant with active membranes with unbounded membrane creation and polarisations, which was shown to be universal.

Freund in [32] studied the asynchronous mode of *P* systems, where in each step, arbitrary many rules can be applied. The application of rules is hence done in parallel way, but are not synchronized or somewhat controlled.

Obviously, for *P* systems without priorities this is equivalent with just letting them work in the sequential mode, but for *P* systems with priorities this observation would not be true any more, because the outcome of performing one rule might affect the applicability of another rule.

### 3.2.8 Toxic objects

Some of the *P* system variants are aimed at increasing modeling power. Introducing toxic objects [5] does not increase computational power nor modify the decidability of behavioral properties, but such *P* systems allow for smaller descriptonal complexity, especially for smaller number of rules. Moreover, they have a clear direct biological motivation. Toxic objects are a specified subset of alphabet. They must not stay idle as otherwise the computation is abandoned without yielding a result. Alhazov in [5] used toxic objects to improve the known results for catalytic and purely catalytic *P* systems by significantly reducing the number of rules needed for the constructions in proofs.



### 3.2.9 Variants inspired by reaction systems

Reaction systems (section 2.16) deal with two assumptions made about the chemistry of a cell.

1. We assume that we have the “threshold” supply of elements. Either an element is present and then we have “enough” of it, or an element is not present. Therefore we deal with a qualitative rather than quantitative calculus.
2. We do not have the “permanence” feature in our model. If nothing happens to an element in P systems, then it remains / survives (status quo approach). On the contrary, in reaction systems, an element remains / survives only if there is a reaction sustaining it.

We will present variants of P systems inspired by these assumptions in following subsubsections.

#### Set membrane systems

Standard models of membrane systems have configurations, where any given compartment is represented as a multiset of objects and each computational action is represented by a multiset of simultaneously executed (multiple copies of) individual evolution rules.

Such strong reliance on counting (through multiple copies of objects and rules) may lead to potential problems in two respects. First, one may wonder how realistic is the counting (multiset) mechanism if one needs to represent huge numbers of molecules and instances of biochemical reactions. Second, a membrane system would normally have an infinite state space, making the application of formal verification techniques impractical or indeed impossible (there exists a rich body of results proving Turing completeness of even very simple kinds of membrane systems).

A radical solution to the state space problems can be provided by reaction systems (section 2.16), which, however, model biochemical reactions in living cells using qualitative (based on presence and absence of entities) rather than quantitative rewriting rules.

Set membrane systems [49] are based on sets (of objects or rules) together with the associated set operations, rather than on multisets and multiset operations.

**Definition 3.2.2.** *A set membrane system is a tuple*

$$\Pi = (\Sigma, \mu, w_1, \dots, w_m, R_1, \dots, R_m)$$

, such that  $\Sigma$  is a finite set of objects,  $\mu$  is a membrane structure with  $m$  membranes,  $w_i \subseteq \Sigma$  is a set of objects initially present in region  $i$  and  $R_i$  is a finite set of evolution rules of the form  $u \rightarrow v$ , where  $u \subseteq \Sigma$  is a nonempty set of objects and  $v \subseteq \Sigma_i$  is a set of indexed objects with  $\Sigma_i$  being defined as:

$$\Sigma_i = \Sigma \cup \{a_{out} | a \in \Sigma\} \cup \{a_{in_j} | a \in \Sigma \text{ and } i = \text{parent}(j)\}$$

The difference between the “qualitative” and the “quantitative” interpretation of the evolution rules is twofold. First, there may be two enabled evolution rules in a compartment with a common object in their left hand sides while there is only a single representant of that object in the current state in the compartment. In the current qualitative setup, the two rules can be executed together. That is, objects are characterized by their presence rather than their quantity. Second, if two simultaneously executed rules produce the same object in the same compartment, instead of adding two instances of this object, only one is added, so that we never have more than a single representant of an object in any given compartment.

Kleijn in [49] describes different ways to define a computation step. An interesting property of maximal parallel steps is that there is always exactly one maximal parallel set of enabled rules, thus such system is deterministic.

Alhazov in [4] proposed P systems, where the multiplicities of objects are ignored, which is essentially the same as set membrane systems. He proved that with bounded number of membranes they have a very limited computing power, exactly the Parikh images of regular languages. On the other hand, allowing membrane creation or division implies the computational completeness.

### P systems with no permanence

The second assumption of the reaction systems theory is much easier to handle in terms of membrane computing. If we want to preserve an object  $a$  which is not evolving, we may provide a dummy rule for it, of the type  $a \rightarrow a$ , changing nothing. Still, many technical problems appear in this framework. The presence of such dummy rules makes the computation endless, while halting is the “standard” way to define successful computations in membrane computing. Moreover, the rules are nondeterministically chosen, hence the dummy rules can interfere with the “computing rules”.

While the second difficulty is a purely technical one, the first one can be overpassed by considering other ways of defining the result of a computation in a P system, and there are many suggestions in the literature. Three of them are assumed in [60].

1. The local halting (the computation stops when at least one membrane in the system cannot use any rule).
2. Signal-objects (the result consists of the number of objects in a specified membrane at the moment when a distinguished object appears in the system).
3. Signal-events (the result consists of the number of objects in a specified membrane at the moment when a distinguished rule is used in the system).

The paper [60] includes a proof of computational completeness for the variant with cooperative rules along with an open problem for the variant with catalytic rules.

### 3.3 Case studies

Although *P* systems were inspired by the functioning of a biological cell, the applications has already far exceeded the scope of a cell. *P* systems are already being used in many problems ranging from modeling biological processes and population dynamics through social network problems to image processing and effectively solving hard problems.

#### 3.3.1 MeCoSym

There is an online collection of various case studies on the MeCoSim webpage [56]. The number of scenarios and the level of detail vary among the different case studies, possibly including detailed descriptions, references to related publications, charts and videos.

MeCoSim (Membrane Computing Simulator) [65] is a software that offers the users a General Purpose Application to model, design, simulate, analyze and verify different types of models based on *P* systems. Some of the main features of MeCoSim are the following:

- Simulation of models of *P* systems under different initial conditions. It enables the load of *P*-Lingua based models, parsing, edition, debugging, and different simulation types.
- Visualization capabilities for analyzing *P* systems: alphabet, membrane structure, multisets and graphs viewers.
- Highly customizable platform for defining inputs, outputs, parameters and graphs for each model of a family of *P* systems.

- Repositories system for the visual management of available online resources, including plugins, custom applications, models and scenarios.
- Export option for releasing end-user applications for solving practical problems, abstracting *P* system functionalities.
- Plugins architecture, permitting the extension of the functionality with Java jars or external non-Java programs. MeCoSim is written in Java.
- Auto-update capability, using the latest release of the program whenever it runs.

MeCoSim development started in 2010, and a number of case studies have been analyzed since then, covering many variants of *P* systems, different areas of interest and application domains. The examples contain, at least, some snippets of code, along with the minimal needed files to run some scenario in MeCoSim.

### 3.3.2 Population dynamics

The Bearded Vulture (*Gypaetus barbatus*) is an endangered species in Europe that feeds almost exclusively on bone remains of wild and domestic ungulates. Spanish researchers in [16] presented a model of an ecosystem related to the Bearded Vulture in the Pyrenees (NE Spain), by using *P* systems. The evolution of six species is studied: the Bearded Vulture and five subfamilies of domestic and wild ungulates upon which the vulture feeds. *P* systems provide a high level computational modeling framework which integrates the structural and dynamic aspects of ecosystems in a comprehensive and relevant way. *P* systems explicitly represent the discrete character of the components of an ecosystem by using rewriting rules on multisets of objects which represent individuals of the population and bones. The inherent stochasticity and uncertainty in ecosystems is captured by using probabilistic strategies.

This research was extended in [15] where they also proposed model for exotic invasive species of Zebra Mussel for the design of a plan for the management of the reservoir of Ribarroja in the area of Ebro River basin because this species create significant environmental problems and economic costs due to its ability to block all types of infrastructure and water pipes.

### 3.3.3 Cellular Signalling Pathways

Perez in [62] proposed a model for EGFR Signalling Cascade. Cellular signalling pathways are fundamental to the control and regulation of cell be-

haviour. More than 60 proteins and 160 chemical reactions were included in the model. Membrane structure consists of 3 regions: the environment, the cell surface and the cytoplasm.

### 3.3.4 Solving SAT in linear time

The discovery of the NP-Complete problems has created a vigorous industry producing proofs of NP-Completeness [1]. But does NP-Completeness really imply intractability of interesting instances? This question seems to divide the Computer Science community into two camps, the pessimists who believe that NP-Complete problems require exponential resources and are therefore intractable and the optimists who expect a subexponential algorithm to emerge eventually. There is however a viable third belief, namely that the resources required do rise exponentially but slowly enough for large practical problems to be tractable.

A number of algorithms have been reported, using an approach more sophisticated than the obvious search of all possible solutions to achieve run times significantly less than the naive approach would suggest, but on a sequential machine these do not yet seem to solve real large problems in reasonable time. On the other hand the naive approach to most NP-Complete problems parallelises easily but yields an algorithm which is too slow even on large parallel machines. However, where the sophisticated algorithms can be parallelised, the result may well be that very large problems which have appeared intractable can be solved quite easily with machines which exist today and will be cheap tomorrow.

Polynomial time solutions to NP-complete problems are usually achieved by trading time for space [76].

P systems with their inherent parallelism seem to be a natural choice due to the capability of cells to produce an exponential number of new membranes in polynomial time. However, many simulators of P system are inefficient since they cannot handle the parallelism of these devices. Nowadays, we are witnessing the consolidation of the GPUs as a parallel framework to compute general purpose applications such as bitcoin mining.

The simulation of P systems with active membranes using GPUs is analyzed in [18] and an efficient linear solution to the SAT problem is illustrated. They compared it to the classical simulator and reported up to 94x of speedup for 256 literals in the formula. The major constraint of this parallel simulation is the GPU memory size, which can be overcome with a data partition on a cluster of GPUs.

As time passes, GPU mining of bitcoins is largely dead these days. The majority is now mining with Application Specific Integrated Circuits (ASIC)

[74]. The proposal of ASIC for *P* systems could be the possible aim of future research of *P* system simulators.

### 3.3.5 Implementation of *P* systems in vitro

“In vitro” are studies in experimental biology that uses components of an organism that have been isolated from their usual biological surroundings in order to provide a more convenient analysis.

This topic could lead to the construction of computers based on *P* systems, and this kind of experiments could be for *P* systems what are DNA experiments for DNA computing: in vitro use of molecules to calculate. The speed of these processes occurring at membranes (both artificial and natural) is much higher as compared with DNA computing experiments, providing us with a faster computation [6].

There was a planned experiment of computing the Fibonacci sequence using *P* systems in vitro (see [35]) using test tubes as membranes and DNA molecules as objects, evolving under the control of enzymes. Number of objects in a multiset was represented by a pre-defined “mole” of the substance and synchronization was obtained by “waiting enough”, such that all reactions that can take place in a test tube actually take place. Hence, they required a variant where reactions do not cycle and proposes the Local loop-free *P* systems, which were shown to be universal. Communication was done by moving all the relevant objects to the next tube in a mechanical way. The final result was read by spectrometry.

Many questions and open problems arose from this planned experiment, e.g. if there is any chance to effectively solve NP-Complete problems in this framework.

There are various opinions on the possibility of computer made of real biological cells. As for now it seems too difficult to grasp. Probably, there are also physical constraints with respect to the physical stability in time of a such complicated proteic structure, as compared with the physical stability of a silicon based component now commonly used in computers. Here, we should not forget that first bulbs made by Edison had a rather short working life too. The ability of scientists to design chemicals, proteins, with changed desired chemical and physical characteristics has improved significantly in the last decade, and the hardware of a *P* systems based computer probably needs even more progress in this demiurgic (thus dangerous) activity.

## Chapter 4

# On the edge of universality of sequential P systems

In this chapter we propose various modifications of sequential P systems and study their effect on computing power and decidability of behavioral properties.

We have presented the current state of the research of the P system variants. Especially the parallelism options have been investigated very well, but there are still some gaps that should be filled. For many variants the universality has been proven only when working in the maximally parallel mode. In most cases the sequential mode is strictly weaker, but this is not always true.

We have studied several variants of sequential P systems in terms of computational power and decision power of behavioral properties. Two of these results have appeared as a contribution on the Computability in Europe conference series.

### 4.1 Inhibitors

A sequential variant without priorities and with cooperative rules is not universal (see [40]). They have tried modifying the variant to increase the computational power and showed that with rules for membrane creation with unbounded number of membranes it became universal.

We have tried another approach using rules with inhibitors. This variant is computationally complete in both generating and accepting case. For the generative case we present a proof by a simulation of maximal parallel P system and in the accepting case we prove it can simulate a register machine.

Original definition of P systems with inhibitors (see [43]) allow to use

only one inhibitor per rule, e.g.  $u \rightarrow v|_{\neg i}$ . Alternative definition (see [3]) allow to use whole inhibitor set in the rule like  $u \rightarrow v|_{\neg B}$ , where  $B$  is a set of objects. Such a rule can be applied only if no element of  $B$  is present in the region.

For sequential P systems, the following lemma will show the equivalence of these definitions for our setting. However, a special condition must be fulfilled, the regions with such rules cannot be empty.

**Lemma 4.1.1.** *If there is at least one object present in each region of a P system, rewriting step in P system with inhibitor set can be simulated by multiple consecutive steps of P system with single inhibitor.*

**Proof 4.1.1.** Consider a P system with the alphabet  $\Sigma$ . For each rule  $u \rightarrow v|_{\neg B}$ , where  $B = \{b_1, b_2, \dots, b_n\}$  we will have rules:

$$\begin{aligned} & c \rightarrow c|_{\neg GONE_{b_1}} \text{ for all } c \in \Sigma, b \in B \\ & u|_{\neg GONE_{b_1}}|_{\neg GONE_{b_2}} \dots |_{\neg GONE_{b_n}} \rightarrow v|_{\neg GONE_{b_1}}|_{\neg GONE_{b_2}} \dots |_{\neg GONE_{b_n}} \end{aligned}$$

Note that symbols  $GONE_b$  are created automatically when some object  $c$  is present in the region.

**Theorem 4.1.2.** *The sequential P system with inhibitors defines the same Parikh image of language as P system with maximal parallelism.*

**Proof 4.1.2.** We show that we can simulate maximal parallel step of P system with several steps of sequential P system with inhibitors. The proof is quite technical with some workarounds.

It is important to note that in the maximal parallel step the rewriting occurs in all membranes, so we need to synchronize this process. Every membrane will have a state, represented as an object.

The *RUN* state represents that the rewriting still occurs. When there are no more rules to apply, the region has done its maximal parallel step and proceeds to the state *SYNCHRONIZE*. Other states are just technical - we need to implement sending objects between membranes and preparing for the next maximal parallel step by unmarking newly created objects in the current maximal parallel step, which have been marked to prevent double rewriting in one step.

- *RUN*: Rewriting occurs. Objects that are to be sent to the parent membrane are directly sent because the parent membrane is already in *RUN* or *SYNCHRONIZE* phase, so the  $a'$  symbols that are sent don't break anything. But objects that are to be sent down, cannot be sent immediately because child membranes can be in the previous



phase waiting to restore symbols from previous step. Current symbols could interfere with them and be rewritten twice in this step. Such objects are only marked as “to be sent down”:  $a^\downarrow$

- *SYNCHRONIZE*: Rewriting has ended and the membrane is waiting to get signal *SYNCED* from the parent membrane to continue to the next step.
- *SENDDOWN*: Signal *SYNCED* was caught and now all descendant membranes are in *SYNCHRONIZE* phase so  $a^\downarrow$  can be sent down.
- *RESTORE*: All  $a'$  symbols are being restored to  $a$ , so the next step of rewriting can take place.
- For every rule  $r_i \in R$  such that

$$r_i = a_1^{M(a_1)} a_2^{M(a_2)} \dots a_n^{M(a_n)} \rightarrow a_1^{N(a_1)} a_2^{N(a_2)} \dots a_n^{N(a_n)}$$

we will have the following rules:

$$\begin{aligned} & a_1^{M(a_1)-m_1} \dot{a}_1^{m_1} a_2^{M(a_2)-m_2} \dot{a}_2^{m_2} \dots a_n^{M(a_n)-m_n} \dot{a}_n^{m_n} | RUN \\ & \rightarrow a_1^{N(a_1)} \dot{a}_1^{m_1} a_2^{N(a_2)} \dot{a}_2^{m_2} \dots a_n^{N(a_n)} \dot{a}_n^{m_n} | RUN \end{aligned}$$

There will be such rule for each  $0 \leq m_i \leq M(a_i)$ . It represents the idea that  $\dot{a}$  can be used in rewriting in the same way as  $a$ . Right side of the rules contains symbols  $\dot{a}'$ , that prevents the symbols to be rewritten again.

- For every symbol  $a \in V$  we will have the following rules:

$$a | RUN \rightarrow \dot{a} | RUN |_{-\dot{a}}$$

There will be at most one occurrence of  $\dot{a}$ .

- For every rule  $r_i \in R$  there will be a rule that detects if the rule  $r_i$  is not applicable. According to left side of the rule  $r_i$ , symbol  $UNUSABLE_i$  will be created when there is not enough objects to fire the rule  $r_i$ . It means that left side of rule  $r_i$  requires more instances of some object than are present in membrane.

If the left side is of type:

- $a$ : It is a context free rule. The rule can't be used if there is no occurrence of  $a$  nor  $\dot{a}$ .

$$RUN \rightarrow UNUSABLE_i | RUN |_{-\{UNUSABLE_i, a, \dot{a}\}}$$

- $ab$ : It is a cooperative rule with two distinct objects on the left side. The rule cannot be used if there is one of them missing.

$$RUN \rightarrow UNUSABLE_i | RUN |_{\neg\{UNUSABLE_i, a, \dot{a}\}}$$

$$RUN \rightarrow UNUSABLE_i | RUN |_{\neg\{UNUSABLE_i, b, \dot{b}\}}$$

- $a^2$ : It is a cooperative rule with two same objects. The rule can't be used if there is at most one occurrence of the symbol. That happens if there is no occurrence of  $a$ . There can still be  $\dot{a}$ , but at most one occurrence.

$$RUN \rightarrow UNUSABLE_i | RUN |_{\neg\{UNUSABLE_i, a\}}$$

- For every membrane with label  $i$  there will be a rule:

$$\begin{aligned} & UNUSABLE_1 | UNUSABLE_2 | \dots | UNUSABLE_m | RUN \\ & \rightarrow SYNCHRONIZE | SYNCTOKEN_i \uparrow \end{aligned}$$

If no rule can be used, maximal parallel step in the region is completed hence it goes to the synchronization phase and sends a synchronization token to the parent membrane.

- For every membrane there will be a rule:

$$\begin{aligned} & SYNCHRONIZE | SYNCTOKEN_j \\ & \rightarrow SYNCHRONIZE | SYNCTOKEN_j \uparrow \end{aligned}$$

Membrane resends all synchronization tokens from child membranes to the parent membrane.

- In the skin membrane there is a rule which collects all the synchronization tokens from all membranes  $1 \dots k$  and then sends down signal that synchronization is complete. But before that, there can be some symbols that should be sent down, but they weren't, because the region below could have not started the rewriting phase that time. The result was just marked with  $a^{\downarrow}$ .

$$\begin{aligned} & SYNCTOKEN_1 | \dots | SYNCTOKEN_k | SYNCHRONIZE \\ & \rightarrow SENDDOWN \end{aligned}$$

- Every membrane other than skin membrane have to receive the signal to go to the senddown phase:

$$SYNCHRONIZE | SYNCED \rightarrow SENDDOWN$$

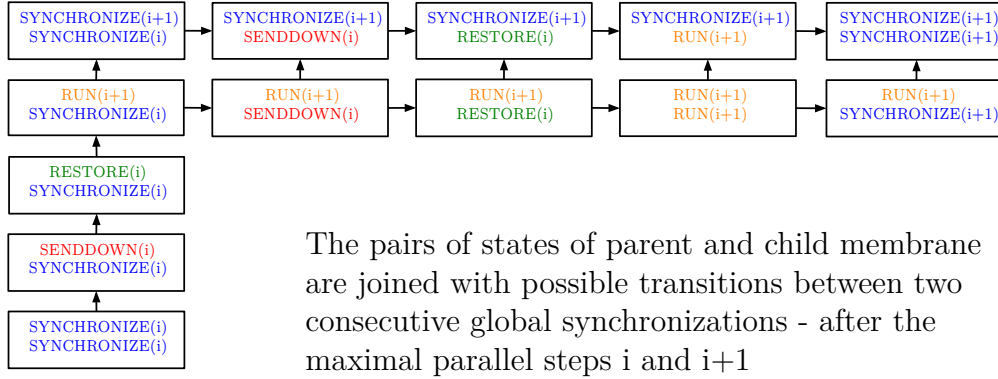


Figure 4.1: Possible pairs of states of parent and child membrane

- Every membrane will have rules for every symbol  $a \in V$  to send down all unsent objects that should have been sent down:

$$SENDDOWN|a^{\downarrow} \rightarrow SENDDOWN|a' \downarrow$$

- Every membrane will have a rule for detecting when all such objects have been sent and it goes to restore phase:

$$SENDDOWN \rightarrow RESTORE|_{\neg\{a_i^{\downarrow} | 1 \leq i \leq n\}}$$

- In the restore phase all symbols  $a'$  will be rewritten to  $a$  in order to be able to be rewritten in the next maximal parallel step:

$$RESTORE|a' \rightarrow RESTORE|a$$

- When using lemma 4.1.1, there may be some  $GONE$  symbols left and now is the time to clear them:

$$RESTORE|GONE_i \rightarrow RESTORE$$

- When the restore phase ends, it sends down a signal that all membranes have been already synchronized and next phase of rewriting has began in upper membranes:

$$RESTORE \rightarrow RUN|SYNCED \downarrow |_{\neg\{a_i^{\downarrow} | 1 \leq i \leq n\} \cup \{GONE_i | 1 \leq i \leq n\}}$$

The pairs of possible phases of the parent and child membrane are shown in the figure 4.1 along with transitions between two consecutive global synchronizations - after the maximal parallel steps  $i$  and  $i + 1$ .

In the figure 4.2 the membrane structure is presented as a hierarchical structure. Every membrane is in one of four phases. It can be seen that

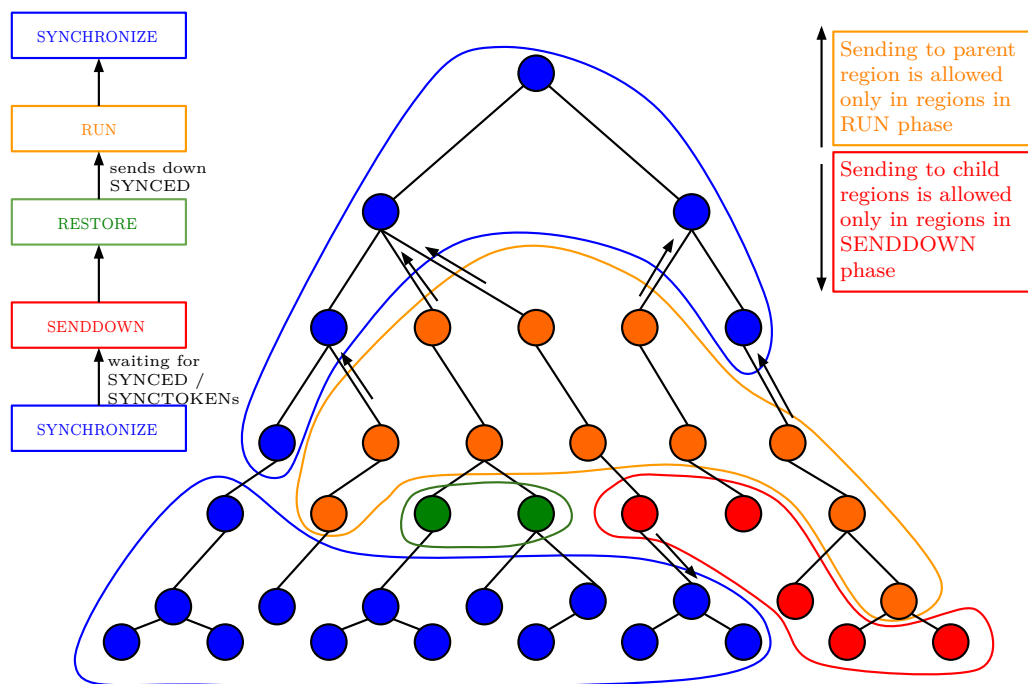


Figure 4.2: Snapshot of all membrane states while simulating

the sending of the objects is performed in such phases that the receiving membrane is in either *RUN* or *SYNCHRONIZE* phase, so the received objects (marked  $a'$ ) does not interfere with rewriting.

Another interesting idea can be seen in the figure 4.2 that when a region is in the *SENDDOWN* phase and objects are sent through the child membrane, the receiving region is in the *SYNCHRONIZE* phase waiting for the *SYNCED* signal, which will be sent to it when *SENDDOWN* and *RESTORE* phases finished.

All membranes are nonempty during the simulation because at least the object representing the current phase is always present. By lemma 4.1.1 the rules with set of inhibitors can be simulated by single inhibitors.

We have also reached this result in the accepting case by simulation of register machines.

**Theorem 4.1.3.** *Sequential  $P$  systems with inhibitors can simulate register machines and thus equal  $PsRE$ .*

**Proof 4.1.3.** Suppose we have a  $n$ -register machine  $M = (n, P, i, h)$ . In our simulation we will have a membrane structure consisting of single membrane and the contents of register  $j$  will be represented by the multiplicity of the object  $a_j$ .

We will simulate the register machine by  $P$  system  $(\Sigma, \mu, w, R)$ , where:

- $\Sigma$  is an alphabet consisting of symbols that represent registers  $a_1, \dots, a_n$ , instruction labels from the register machine  $M$  and a halting symbol  $\#$ ,
- $\mu$  is a membrane structure consisting of one single membrane,
- $w$  is initial contents of the membrane. It contains symbols for the input for the machine  $a_i^{n_i}$  where  $n_i$  is initial state of register with label  $i$  and initial instruction label  $e$ .
- $R$  is a set of rules in the skin membrane.

For all instructions of type  $(e : add(j), f)$  we will have the rule

$$e \rightarrow a_j | f$$

For all instructions of type  $(e : sub(j), f, z)$  we will have rules:

$$\begin{aligned} e | a_j &\rightarrow f \text{ and} \\ e &\rightarrow z | \neg a_j. \end{aligned}$$

And finally halting rules:

$$\begin{aligned} h|a_j &\rightarrow h|\# \text{ for all } a \leq j \leq n, \\ \# &\rightarrow \#. \end{aligned}$$

When the halting instruction is reached, if there is an object present in the membrane, the hash symbol  $\#$  is created and it will cycle forever. If there is no object present, there is no rule to apply and computation will halt. It corresponds to the condition that all registers should be empty when halting.  $\square$

### 4.1.1 Concluding remarks

Although these results are not very surprising as similar results already hold for Petri nets, which are equivalent to sequential P systems, the simulation of maximal parallel P system used in the proof for generating case is valuable not only for the universality, but also can be seen as a method of conversion between P systems in sequential manner and maximally parallel manner, which may be essential for future works on P systems and other multiset rewriting systems. Sequential variants are promising alternative to traditional maximal parallel variants and will be good subject for the further research. Future plans include research of other more restricted variants such as omitting cooperation in the rules or restricting the power of inhibitors.

## 4.2 Active membranes

In this section we study a variant of sequential P systems where universality can be achieved without checking for zero by allowing membranes to be created unlimited number of times [42]. Such P systems are called active P systems. Contrary, if we place a limit on the number of times a membrane is created, we get a class of P systems which is only equivalent to vector addition systems, hence not universal.

In Subsection 4.2.1 we will introduce membrane structure and formally define membrane configuration and active P system, because standard definitions are not convenient for our formal proofs.

The Subsection 4.2.3 contains two main results. The existence of an infinite computation is surprisingly shown to be decidable. On the other hand, the existence of a halting computation is shown to be undecidable. Why is the first result surprising? At first sight it seems to relate to the Rice's theorem (see section 2.15), because it is a decidability problem for a Turing complete computation model. But the existence of an infinite computation is

not a property of the language generated or accepted by the active P system. It is the property of the computation itself, therefore the Rice's theorem is not applicable here.

### 4.2.1 Active P systems

**Definition 4.2.1.** Let  $\Sigma$  be a set of objects. We denote by  $\mathbb{N}^\Sigma$  a set of all mappings from  $\Sigma$  to  $\mathbb{N}$ , so it contains all multisets of objects from  $\Sigma$ . A **membrane configuration** is a tuple  $(T, l, c)$ , where:

- $T$  is a rooted tree,
- $l \in \mathbb{N}^{V(T)}$  is a mapping that assigns for each node of  $T$  a number (label), where  $l(r_T) = 1$ , so the skin membrane is always labeled with 1,
- $c \in (\mathbb{N}^\Sigma)^{V(T)}$  is a mapping that assigns for each node of  $T$  a multiset of objects from  $\Sigma$ , so it represents the contents of the membrane.

**Definition 4.2.2.** An **active P system** is a tuple  $(\Sigma, C_0, R_1, R_2, \dots, R_m)$ , where:

- $\Sigma$  is a set of objects,
- $C_0$  is initial membrane configuration,
- $R_1, R_2, \dots, R_m$  are finite sets of rewriting rules associated with the labels  $1, 2, \dots, m$  and can be of forms:
  - $u \rightarrow w$ , where  $u \in \Sigma^+$ ,  $w \in (\Sigma \times \{\cdot, \uparrow, \downarrow_j\})^*$  and  $1 \leq j \leq m$ ,
  - $u \rightarrow w\delta$ , where  $u \in \Sigma^+$ ,  $w \in (\Sigma \times \{\cdot, \uparrow, \downarrow_j\})^*$  and  $1 \leq j \leq m$ ,
  - $u \rightarrow [_j v]_j$ , where  $u \in \Sigma^+$ ,  $v \in \Sigma^*$  and  $1 \leq j \leq m$ .

Although rewriting rules are defined as strings,  $u, v$  and  $w$  represent multisets of objects from  $\Sigma$ . For the first two forms, each rewriting rule may specify for each object on the right side, whether it stays in the current region (we will omit the symbol  $\cdot$ ), moves through the membrane to the parent region ( $\uparrow$ ) or to a specific child region ( $\downarrow_j$ , where  $j$  is a label of a membrane). If there are more child membranes with the same label, one is chosen non-deterministically. We denote these transfers with an arrow immediately after the symbol. An example of such rule is the following:  $abb \rightarrow ab \downarrow_2 c \uparrow c\delta$ . Symbol  $\delta$  at the end of the rule means that after the application of the rule, the membrane is dissolved and its contents (objects, child membranes) are propagated to the parent membrane. Active P systems differ from classic

(passive) P systems in ability to create new membranes by rules of the third form. Such rule will create new child membrane with a given label  $j$  and a given multiset of objects  $v$  as its contents.

**Definition 4.2.3.** For an active P system  $(\Sigma, C_0, R_1, R_2, \dots, R_m)$ , configuration  $C = (T, l, c)$ , membrane  $d \in V(T)$  the rule  $r \in R_{l(d)}$  is **applicable** iff:

- $r = u \rightarrow w$  and  $u \subseteq c(d)$  and for all  $(a, \downarrow_k) \in w$  there exists  $d_2 \in V(T)$  such that  $l(d_2) = k \wedge \text{parent}(d_2) = d$ ,
- $r = u \rightarrow w\delta$  and  $u \subseteq c(d)$  and for all  $(a, \downarrow_k) \in w$  there exists  $d_2 \in V(T)$  such that  $l(d_2) = k \wedge \text{parent}(d_2) = d$  and  $d \neq r_T$ ,
- $r = u \rightarrow [{}_j v]_j$  and  $u \subseteq c(d)$ .

In this section we assume only sequential systems, so in each step of the computation, there is one rule nondeterministically chosen among all applicable rules in all membranes to be applied as already stated in the definition 3.2.1.

#### 4.2.2 Active membranes with a limit on the total number of membranes

We will now introduce a variant with a global limit upon the membrane structure. We achieve this by restricting the rule application such that if the rule would result in a structure exceeding the limit, the rule will not be applicable.

**Definition 4.2.4.** An active P system with a limit on the total number of membranes is a tuple  $\Pi = (\Sigma, L, C_0, R_1, R_2, \dots, R_m)$ , where:

- $(\Sigma, C_0, R_1, R_2, \dots, R_m)$  is an active P system from the definition 4.2.2,
- $L \in \mathbb{N}$  is a limit on the total number of membranes.

Anytime during the computation, a configuration  $(T, l, c)$  is not allowed to have more than  $L$  membranes, so the following invariant holds:  $|V(T)| \leq L$ . This is achieved by adding a constraint for rule of the form  $r = u \rightarrow [{}_k v]_k$ , which is defined to be applicable iff  $u \subseteq c(d)$  and  $|V(T)| < L$ . If the number of membranes is equal to  $L$ , there is no space for newly created membrane, so in that case such rule is not applicable.



**Definition 4.2.5.** For active P system with a limit on the total number of membranes  $(\Sigma, L, C_0, R_1, R_2, \dots, R_m)$ , configuration  $C = (T, l, c)$ , membrane  $d \in V(T)$  the rule  $r \in R_{l(d)}$  is **applicable** iff:

- $r = u \rightarrow w$  and  $u \subseteq c(d)$  and  $\forall (a, \downarrow_k) \in w \exists d_2 \in V(T) : l(d_2) = k \wedge \text{parent}(d_2) = d$ ,
- $r = u \rightarrow w\delta$  and  $u \subseteq c(d)$  and  $\forall (a, \downarrow_k) \in w \exists d_2 \in V(T) : l(d_2) = k \wedge \text{parent}(d_2) = d$  and  $d \neq r_T$ ,
- $r = u \rightarrow [{}_j v]_j$  and  $u \subseteq c(d)$  and  $|V(T)| < L$ .

### 4.2.3 Termination problems

In this subsection we recall the halting problem for Turing machines. The problem is to determine, given a deterministic Turing machine and an input, whether the Turing machine running on that input will halt. It is one of the first known undecidable problems. On the other hand, for non-deterministic machines, there are two possible meanings for halting. We could be interested either in:

- whether there exists an infinite computation (the machine can run forever), or
- whether there exists a finite computation (the machine can halt).

We can ask the same questions for non-deterministic P systems. For example we can look at the P system from the figure 4.3. Its computation tree (figure 4.4) contains an infinite branch, so there exists an infinite computation with rule  $r_1$  applied in each step. There is also a finite branch, so there exists a finite computation, e.g. applying rule  $r_2$  results in a halting configuration.

We will prove the (un)decidability of these problems on active P systems with limit on the total number of membranes. These problems are defined for both generating and accepting mode, but in the accepting mode we consider the questions for a given P system along with the input multiset. The results are quite interesting, because:

**Theorem 4.2.1.** *Sequential active P systems with limit on the total number of membranes are universal.*

**Proof 4.2.1.** The proof of this theorem for sequential active P systems in [42] uses simulation of register machines and during the simulation, every configuration has at most three membranes. Hence the active P system with limit on the total number of membranes exists (e.g. with  $L = 3$ ), so the universality holds.  $\square$

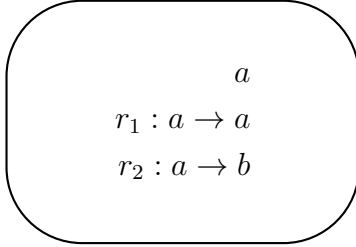


Figure 4.3: A single-membrane sample P system

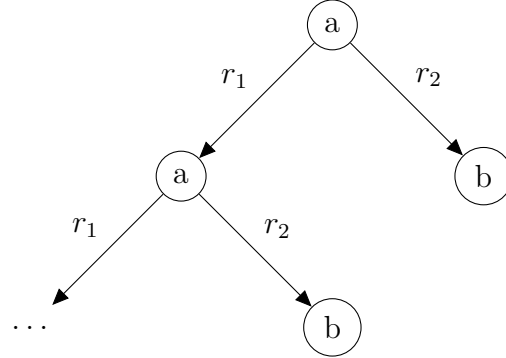


Figure 4.4: The computation tree of the P system from the figure 4.3

This variant is not very realistic from biological point of view. Assuming membranes to know the number of membranes in the whole system is simply not plausible. Although we believe the results also hold for the variant without limit on the total number of membranes, due to technical difficulties it remains an open problem.

### Existence of infinite computation

We will propose an algorithm for deciding existence of infinite computation. Basic idea is to consider the minimal coverability graph ([31]), where nodes are configurations and an edge leads from the configuration  $C_1$  to the configuration  $C_2$ , whenever there is a rule applicable in  $C_1$ , which results in  $C_2$ . The construction in [31] is performed on Petri nets, where the configuration consists just of a vector of natural numbers. The situation is the same for single-membrane sequential P systems. We need to modify the construction for active P systems.

**Definition 4.2.6.** A configuration  $C_2 = (T_2, l_2, c_2)$  **covers** configuration  $C_1 = (T_1, l_1, c_1)$  iff  $\exists$  isomorphism  $f : T_1 \rightarrow T_2$  preserving membrane labels and contents:  $\forall d \in T_1$  the following properties hold:  $l_1(d) = l_2(f(d)) \wedge c_1(d) \subseteq c_2(f(d))$ . We will denote this with  $C_1 \leq C_2$ .

**Example 4.2.1.** In the figure 4.5 there are four membrane configuration.  $C_1 \leq C_2$ , because the membrane structures consists of one membrane, so the corresponding trees are isomorphic. The label is the same and the contents of the membrane in  $C_1$  is a subset of the contents of the membrane in  $C_2$ . It does not have to be a proper subset, i.e.  $C_1 \leq C_1$ .  $C_1$  and  $C_3$  are incomparable, because the label is different, so neither  $C_1 \leq C_3$  nor  $C_3 \leq C_1$  holds.  $C_1$  and

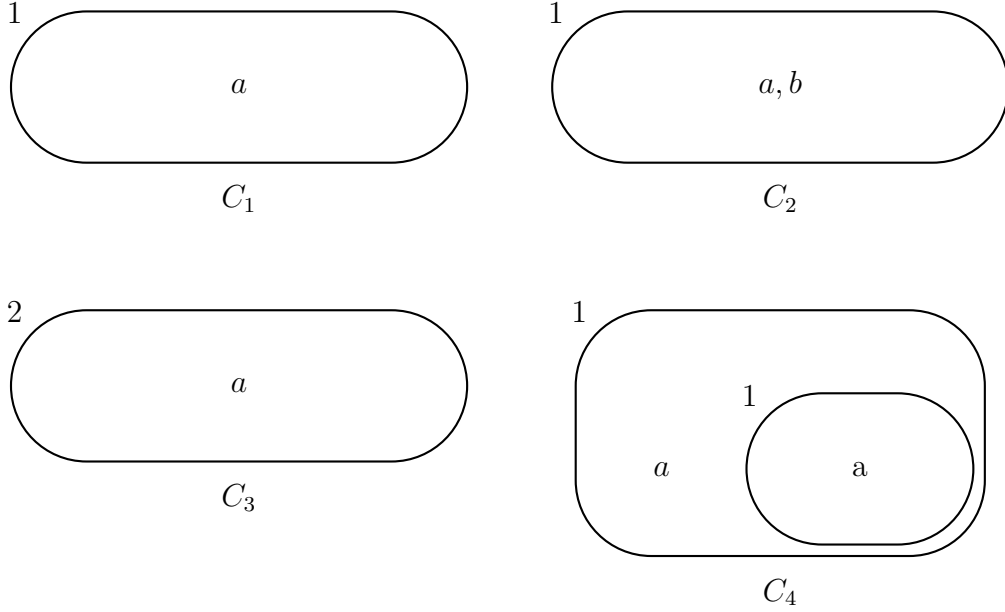


Figure 4.5: Sample membrane configurations

$C_4$  are also incomparable, because the trees of their membrane structure are not isomorphic.

We will now follow with a proof of an important property of the covering relation - that it maintains rule applicability.

**Lemma 4.2.2.** *For sequential active  $P$  system with limit on the total number of membranes, if  $C_2 = (T_2, l_2, c_2)$  **covers** configuration  $C_1 = (T_1, l_1, c_1)$ , then there is an isomorphism  $f : T_1 \rightarrow T_2$  such that if a rule  $r$  is applicable in membrane  $d \in T_1$ , then  $r$  is applicable in  $f(d)$ .*

**Proof 4.2.2.** Suppose  $r$  is applicable in  $d$ . Then the left side  $u$  of the rule  $r$  is contained within the contents of the membrane  $u \subseteq c_1(d)$ . Because  $C_1 \leq C_2$ , then there is an isomorphism  $f : T_1 \rightarrow T_2$  such that  $c_1(d) \subseteq c_2(f(d))$  and then  $u \subseteq c_2(f(d))$ .

There are three possible forms of the rule  $r$ .

- If  $r = u \rightarrow w$ , then, because  $r$  is applicable in  $d$ ,  $\forall(a, \downarrow_k) \in w \exists d_2 \in V(T_1) : l_1(d_2) = k \wedge \text{parent}_{T_1}(d_2) = d$ . Because  $C_1 \leq C_2$ , then for  $f(d_2) \in V(T_2)$  the following holds:  $l_2(f(d_2)) = l_1(d_2) = k$  and  $\text{parent}_{T_2}(f(d_2)) = f(d)$ . Hence  $r$  is applicable in  $f(d)$ .
- If  $r = u \rightarrow w\delta$ , then  $d \neq r_{T_1}$ . Since  $f$  is an isomorphism, then also  $f(d) \neq r_{T_2}$ . Other properties follows from the previous case.

- If  $r = u \rightarrow [{}_kv]_k$ , then  $|V(T_1)| < L$ . Isomorphism preserves number of nodes, hence  $|V(T_2)| = |V(T_1)| < L$  and  $r$  is applicable in  $f(d)$ .  $\square$

Now, we will define the encoding of a configuration  $C = (T, l, c)$  into a tuple of integers.

A membrane  $d \in T$  will be encoded as  $(n + m)$ -tuple  $enc(d) \in \mathbb{N}^{(n+m)}$ , where first  $n$  numbers will be actual counts of objects and next  $m$  numbers will encode the membrane label:

$$enc(d)_i = \begin{cases} c(d)(a_i) & \text{if } i \leq n \\ 0 & \text{if } n < i \leq m \wedge i - n \neq l(d) \\ 1 & \text{if } n < i \leq m \wedge i - n = l(d) \end{cases}$$

The entire tree will be encoded into concatenated sequences of encoded nodes in the preorder traversal order. This sequence is then padded with zeroes to have length  $(n + m)L$  as that is the maximal length of encoded tree.

Since there are only finitely many non-isomorphic trees with at most  $L$  nodes ([17]), there is a constant  $z$  such that we can uniquely assign the tree an order number  $o(T) \leq z$ .

The entire configuration will be encoded in tuple which consists of  $z$  parts. All but the part with index  $o(T)$  will contain just zeros. The part with index  $o(T)$  will contain the encoding of the tree.

**Example 4.2.2.** Consider  $L = 2$ . There are just two rooted trees with at most 2 nodes. We can define  $o(T) = 1$  for the single-node tree and  $o(T) = 2$  for the tree with a root and one child. So the encodings of configurations from figure 4.5 contain two parts. Configurations  $C_1, C_2$ , and  $C_3$  consists of one membrane, so their  $o(T) = 1$  and the second part is filled with zeroes. Configuration  $C_4$  contains two membranes, so its  $o(T) = 2$  and the first part of its encoding will be filled with zeroes.

- $enc(C_1) = \overbrace{\underbrace{1}_{c(a)} \underbrace{0}_{c(b)} \underbrace{1}_{l=1?} \underbrace{0}_{l=2?}}^{\text{skin membrane encoded}} \underbrace{0000}_{\text{padding to fit } (n+m)L} \overbrace{00000000}^{\text{second part filled with zeroes}},$
- $enc(C_2) = 1110000000000000,$
- $enc(C_3) = 1001000000000000,$
- $enc(C_4) = \overbrace{00000000}^{\text{skin membrane encoded}} \underbrace{1010}_{\text{child membrane encoded}} 1010$

We will now show that comparing two encodings corresponds to covering of two configurations. Recall that configurations are encoded into tuples of integers, so the comparison is performed position by position.

**Lemma 4.2.3.** *For configurations  $C_1 = (T_1, l_1, c_1)$  and  $C_2 = (T_2, l_2, c_2)$ ,  $enc(C_1) \leq enc(C_2) \Rightarrow C_1 \leq C_2$ .*

**Proof 4.2.3.** Both  $enc(C_1)$  and  $enc(C_2)$  contain  $z$  parts and exactly one part which contains non-zero values. The non-zero part of  $enc(C_1)$  must be non-zero also in  $enc(C_2)$ , because  $enc(C_1) \leq enc(C_2)$ . Then  $o(T_1) = o(T_2)$ , so the trees are isomorphic. Suppose there is an isomorphism  $f : T_1 \rightarrow T_2$ . For every membrane  $d \in T_1$ ,  $l_1(d) = l_2(f(d))$  and  $c_1(d) \subseteq c_2(f(d))$ . Hence,  $C_1 \leq C_2$ .  $\square$

**Lemma 4.2.4.** *For sequential active  $P$  system with limit on the total number of membranes  $L$  for every infinite sequence of configurations  $\{C_i\}_{i=0}^\infty \exists i < j : C_i \leq C_j$ .*

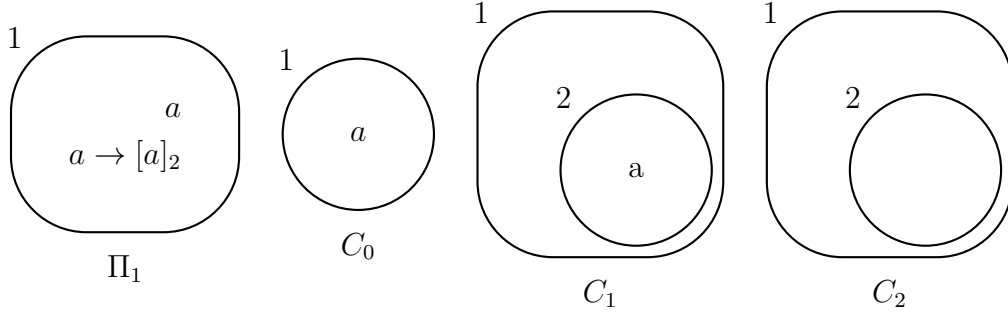
**Proof 4.2.4.** Suppose an infinite sequence  $\{enc(C_i)\}_{i=0}^\infty$ . We use a variation of Dickson's lemma ([30]): Every infinite sequence of tuples from  $\mathbb{N}^k$  contains an increasing pair. Applied to our sequence, there are two positions  $i < j : enc(C_i) \leq enc(C_j)$ . From lemma 4.2.3,  $C_i \leq C_j$ .  $\square$

**Theorem 4.2.5.** *Existence of infinite computation for active  $P$  systems with limit on the total number of membranes is decidable.*

**Proof 4.2.5.** The algorithm for deciding the problem will traverse the reachability graph. When it encounters a configuration that covers another configuration, from lemma 4.2.2 follows that the same rules can be applied repeatedly, so the algorithm will halt with the answer YES. Otherwise, the algorithm will answer NO. Algorithm will always halt, because if there was an infinite computation, from lemma 4.2.4 there would be two increasing configurations which is already covered in the YES case.  $\square$

### Existence of halting computation

In this subsection we will focus on the opposite problem: whether there is a computation that is halting. Recall that halting computation has no applicable rule in the last configuration. First, we will reduce this problem to the reachability problem. It is a problem of determining, for a given configuration  $C$ , whether there exists a computation from  $C_0$  to  $C$ . The reachability of active  $P$  systems can be then reduced to the reachability of register machines, which is undecidable.

Figure 4.6: Example P system  $\Pi_1$ 

For a given P system  $\Pi$  and a target configuration  $C$  we will construct a P system  $\Pi'$  such that there is a halting computation of  $\Pi' \Leftrightarrow C$  is reachable for  $\Pi$ . Suppose  $\Pi = (\Sigma, C_0, R_1, \dots, R_m)$  and  $C = (T, l, c)$ . Then we will construct  $\Pi' = (\Sigma', C'_0, R'_1, \dots, R'_m)$ , where:

- $\Sigma' = \Sigma \cup \{\xi_d \mid d \in V(T)\}$ ,
- $C'_0 = (T, l, c')$ , where  $\forall d \in V(T) \setminus r_T : c'(d) = c(d)$  and  $c'(r_T) = c(r_T) \cup \{\xi_{r_T}\}$ ,
- $\forall i \in \{1, \dots, m\} : R'_i = R_i \cup \{\xi_d c(d) \rightarrow \xi_{d'} \downarrow_{l(d')} \mid d, d' \in V(T), l(d) = i, \text{parent}(d') = d\}$ .

The  $\xi_d$  objects are called verifiers, they are intended to verify if the contents of the membrane corresponds to the contents in the target configuration  $C$ . After this verification it descends down into child membranes for the verification of other parts of the membrane structure. Initially, there is an object  $\xi_{r_T}$  in the skin membrane. Verification is performed in the rule  $\xi_d c(d) \rightarrow \xi_{d'} \downarrow_{l(d')}$ , where on the right side there is  $\xi_{d'}$  object for every child membrane  $d'$  in the target configuration  $C$ .

The construction is not complete. The system should not be able to halt unless the verification takes place. That is why we introduce a new object  $\omega$  to each membrane with a rule  $\omega \rightarrow \omega$  and the verifier will erase them with rule  $\xi_d \omega c(d) \rightarrow \xi_{d'} \downarrow_{l(d')}$ . One application of this rule will erase the  $\omega$  object and propagate proper  $\xi$  object to every child membrane. We also need to ensure that newly created membranes contain the  $\omega$  object, so we replace every rule for membrane creation  $u \rightarrow [{}_k v]_k$  with  $u \rightarrow [{}_k v \omega]_k$ .

**Example 4.2.3.** An example P system  $\Pi_1 = (\{a, b\}, C_0, \{a \rightarrow [a]_2\}, \{\})$  is depicted in the Figure 4.6. The target configuration  $C_1$  with the membrane

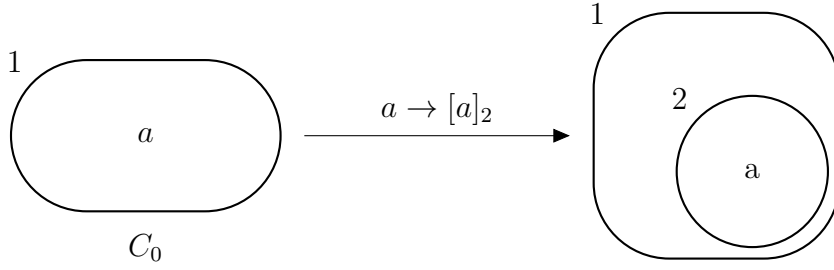


Figure 4.7: Computation of  $\Pi_1$

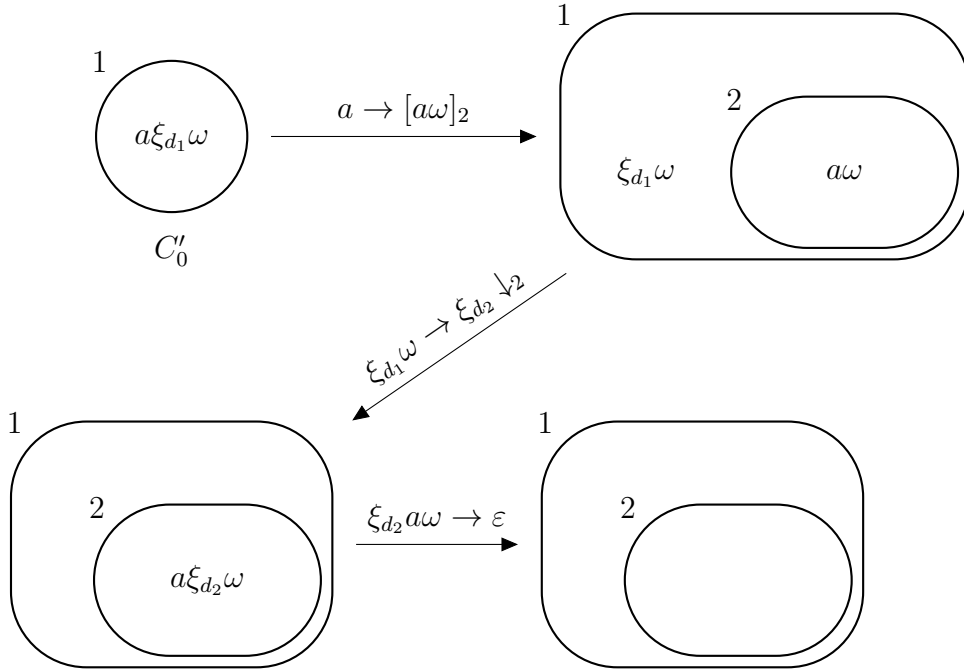
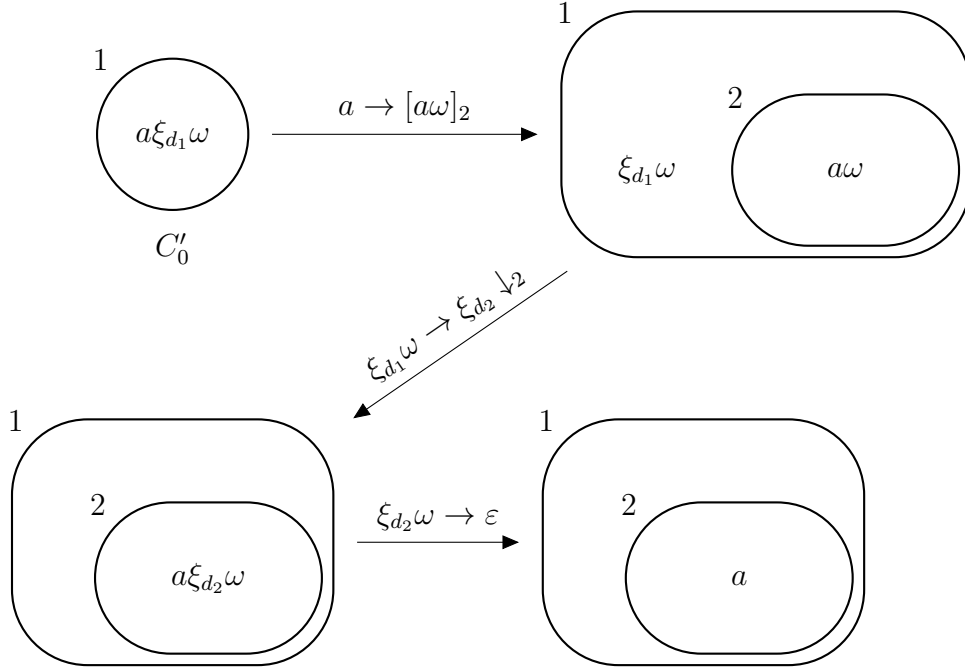


Figure 4.8: Computation of  $\Pi'_1$

Figure 4.9: Computation of  $\Pi'_2$ 

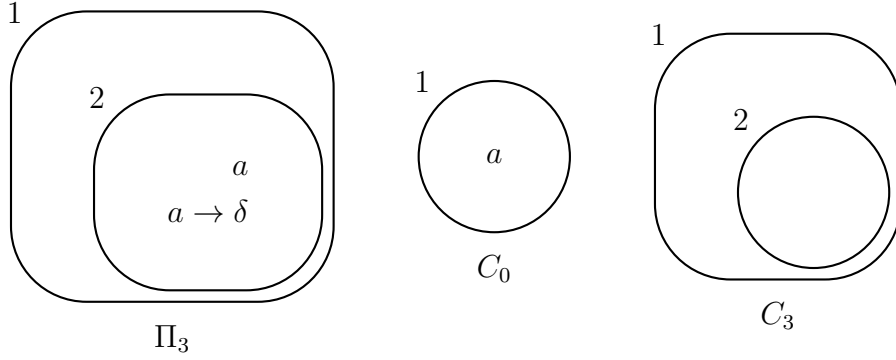
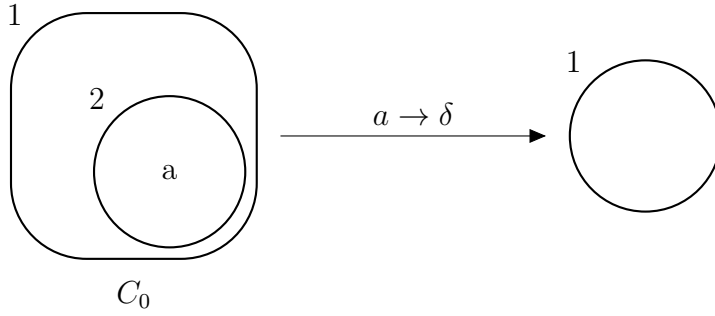
structure consisting of the root membrane  $d_1$  with label 1 and its child membrane  $d_2$  with label 2 can be easily reached by applying the rule  $a \rightarrow [a]_2$  in the skin membrane. This computation is shown in the Figure 4.7.

We will construct a corresponding P system  $\Pi'_1 = (\{a, b, \xi_{d_1}, \xi_{d_2}, \omega\}, C'_0, \{a \rightarrow [a]_2, \xi_{d_1}\omega \rightarrow \xi_{d_2}, \omega \rightarrow \omega\}, \{\xi_{d_2}a\omega \rightarrow \varepsilon, \omega \rightarrow \omega\})$ . The initial configuration  $C'_0$  is shown in the Figure 4.8. There is also a halting computation which corresponds to the computation of  $\Pi_1$  that reaches the target configuration  $C_1$ .

**Example 4.2.4.** There is still a problem. We actually check, whether a target configuration is contained within the current configuration. If our target configuration is  $C_2$  from the Figure 4.6, the resulting P system  $\Pi'_2 = (\{a, b, \xi_{d_1}, \xi_{d_2}, \omega\}, C'_0, \{a \rightarrow [a]_2, \xi_{d_1}\omega \rightarrow \xi_{d_2}, \omega \rightarrow \omega\}, \{\xi_{d_2}\omega \rightarrow \varepsilon, \omega \rightarrow \omega\})$  will have the same halting computation shown in the Figure 4.9 although the configuration  $C_2$  cannot be reached.

If there are additional objects which cannot be erased, so the target configuration cannot be reached, we need to ensure  $\Pi'$  will not halt. We will add a rule  $a \rightarrow a$  to each membrane for each object  $a \in \Sigma$ , so  $\Pi'$  can halt only if all objects are erased. This modification renders the computation in the Figure 4.9 as not halting.



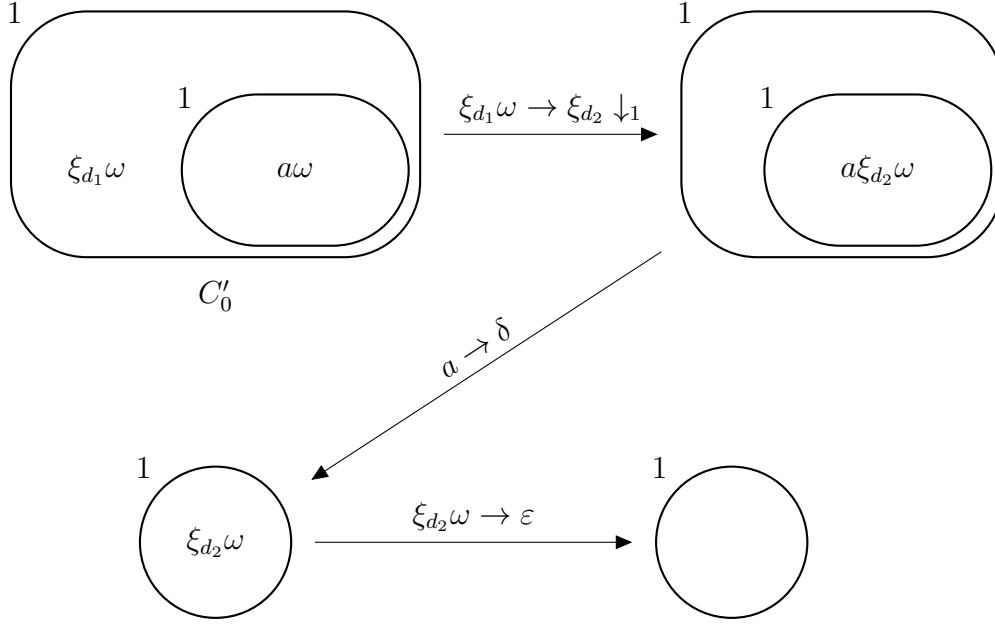
Figure 4.10: Example P system  $\Pi_3$ Figure 4.11: Computation of  $\Pi_3$ 

The last issue to solve is the dissolution. It is still possible that in the middle of the verifying, some of already verified membranes got dissolved and all yet unverified membranes will be successfully verified causing  $\Pi'$  to halt, although without that dissolution it would be unable to reach  $C$ .

**Example 4.2.5.** In the figure 4.10 there is a P system  $\Pi_3 = (\{a\}, C_0, \{a \rightarrow \delta\})$ . The target configuration  $C_3$  cannot be reached, because erasing  $a$  will also dissolve the child membrane. We cannot keep the membrane while getting rid of  $a$ . The only possible computation is depicted in the Figure 4.11.

The resulting P system will be  $\Pi'_3 = (\{a, \xi_{d_1}, \xi_{d_2}, \omega\}, C'_0, \{a \rightarrow \delta, a \rightarrow a, \xi_{d_1}\omega \rightarrow \xi_{d_2}, \xi_{d_2}\omega \rightarrow \varepsilon, \omega \rightarrow \omega\})$ . Its initial configuration  $C'_0$  and the halting computation are shown in the Figure 4.12.

We need to ensure all dissolution happen before the verification takes place. We will add a new object  $\sigma$ , which stands as a footprint object. It will be created as a result of the verification rule  $\xi_d \omega c(d) \rightarrow \sigma \xi_{d'} \downarrow_{l(d')}$ . If a membrane is dissolved after it was verified, then two  $\sigma$ s will meet in the

Figure 4.12: Computation of  $\Pi'_3$ 

same membrane, because the parent membrane also contains  $\sigma$  as it had been verified before. We will add a rule  $\sigma\sigma \rightarrow \sigma\sigma$  to prevent  $\Pi'$  from halting.

The final construct is:

- $\Sigma' = \Sigma \cup \{\omega, \sigma\} \cup \{\xi_d \mid d \in V(T)\}$ ,
- $C'_0 = (T, l, c')$ , where  $\forall d \in V(T) \setminus r_T : c'(d) = c(d) \cup \{\omega\}$  and  $c'(r_T) = c(r_T) \cup \{\omega, \xi_{r_T}\}$ ,
- $\forall i \in \{1, \dots, m\} : R'_i = \{r \mid r \in R_i, r = u \rightarrow w \vee r = u \rightarrow w\delta\} \cup \{u \rightarrow [{}_kv\omega]_k \mid u \rightarrow [{}_kv]_k \in R_i\} \cup \{a \rightarrow a \mid a \in \Sigma\} \cup \{\sigma\sigma \rightarrow \sigma\sigma, \omega \rightarrow \omega\} \cup \{\xi_d\omega c(d) \rightarrow \sigma\xi_{d'} \downarrow_{l(d')} \mid d, d' \in V(T), l(d) = i, \text{parent}(d') = d\}$ .

We need to prove two implications in order to formally prove correctness of this construction.

**Lemma 4.2.6.** *If  $C$  is reachable for  $\Pi$  then there is a halting computation of  $\Pi'$ .*

**Proof 4.2.6.** Consider a computation  $\Pi$  with  $C$  as the last configuration. For  $\Pi'$  there is a corresponding computation as the rules of  $\Pi$  are included in  $\Pi'$  with an exception of the rule  $u \rightarrow [{}_kv]_k$ , which has a corresponding rule with the same left side:  $u \rightarrow [{}_kv\omega]_k$ . The corresponding computation of

$\Pi'$  will result in a configuration, where in every membrane  $d$ , the contents will be  $\omega c(d)$ , and the skin membrane will contain an additional  $\xi_{r_T}$ . Then the cascade of applications of the rule  $\xi_d \omega c(d) \rightarrow \sigma \xi_{d'} \downarrow_{l(d')}$  can start in the skin membrane, cascading down from parents to children until all the membranes applied that rule. The objects  $\omega c(d)$  will be replaced by  $\sigma$  and the computation will halt.  $\square$

The other direction of the implication is more complicated, so the following lemmas will state some properties about computations of  $\Pi$  and  $\Pi'$ .

**Lemma 4.2.7.** *For all halting computations of  $\Pi'$  there is no rule of form  $u \rightarrow w\delta$  applied in the membrane  $d'$  after the application of rule  $\xi_d \omega c(d) \rightarrow \sigma \xi_{d'} \downarrow_{l(d')}$  in membrane  $d = \text{parent}(d')$ .*

**Proof 4.2.7.** After the application of the rule  $\xi_d \omega c(d) \rightarrow \sigma \xi_{d'} \downarrow_{l(d')}$ , the object  $\sigma$  remains in the membrane. There is no possible interaction of  $\sigma$  with other objects, only with another  $\sigma$ . If a child membrane  $d'$  is dissolved with a rule  $u \rightarrow w\delta$ , then two objects  $\sigma$  will meet in the membrane  $d$  and the computation will not halt, which contradicts the fact that the computation is halting.  $\square$

**Lemma 4.2.8.** *For all halting computations of  $\Pi'$  there is no rule of form  $u \rightarrow [{}_k v \omega]_k$  applied in the membrane  $d'$  after the application of rule  $\xi_d \omega c(d) \rightarrow \sigma \xi_{d'} \downarrow_{l(d')}$ .*

**Proof 4.2.8.** After the application of the rule  $r = \xi_d \omega c(d) \rightarrow \sigma \xi_{d'} \downarrow_{l(d')}$  in membrane  $d$ , there will not be any of  $\xi$  objects present in the membrane, because they are only sent into child membranes, which cannot be dissolved, because of Lemma 4.2.7. So there will be no more of rule  $r$  applied in membrane  $d$ . The newly created membrane will never receive any of  $\xi$  objects, so the object  $\omega$  will never be erased and the computation will not halt, which contradicts the fact that the computation is halting.  $\square$

**Lemma 4.2.9.** *If a halting computation of  $\Pi'$  exists then there is a halting computation, where for every membrane  $d \in V(T)$  in the target configuration  $C = (T, l, c)$  the last rule used is  $r = \xi_d \omega c(d) \rightarrow \sigma \xi_{d'} \downarrow_{l(d')}$ .*

**Proof 4.2.9.** Consider membrane  $d$ : let  $C_1$  be the configuration before the application of  $r$ ,  $C_2$  the configuration after the application of  $r$  and  $C_3$  the halting configuration.

First consider elementary membranes, let such a membrane be  $d$ . As it has no child membranes,  $C_2$  is contained within  $C_1$  (with the exception of the  $\sigma$  object). Therefore the sequence of steps from  $C_2$  to  $C_3$  can be applied

starting from  $C_1$  instead of  $C_2$ . It would result in a configuration  $C_4$ , where  $d$  contains exactly the objects  $\xi_d \omega c(d)$ , assuming  $d$  has not been dissolved, what is ensured by lemma 4.2.7. So the rule  $r = \xi_d \omega c(d) \rightarrow \sigma$  can be applied, resulting in configuration, where  $d$  contains exactly one  $\sigma$  and nothing else, so no more rule will be applied in  $d$ .

Consider a membrane  $d$ , which is not elementary, so it has child membranes. In  $C_1$  the verifier is in  $d$  and no child membrane contains the verifier. In  $C_2$  every child membrane contains the verifier. We cannot use the same argument, because  $C_2$  is not contained within  $C_1$ .

We will proceed by induction, starting from the elementary membranes to parent membranes. Assume the lemma holds for child membranes. Then we have a computation, which contains a configuration  $C_5$ , after which only verification rules are applied in child membranes. So the sequence of steps from  $C_2$  to  $C_5$  does not contain the verification rule in child membranes. Hence this sequence can be used starting from  $C_1$  instead of  $C_2$ , resulting in a configuration  $C_6$ , where application of verification rule in  $d$  results in  $C_5$ . So again, after  $C_6$  only verification rules are applied.  $\square$

**Lemma 4.2.10.** *If there is a halting computation of  $\Pi'$  then  $C$  is reachable for  $\Pi$ .*

**Proof 4.2.10.** According to lemma 4.2.9 there is also a halting computation where in every membrane  $d$  the last used rule is  $r = \xi_d \omega c(d) \rightarrow \sigma \xi_{d'} \downarrow_{l(d')}$ . So the corresponding computation in  $\Pi$  will result in the configuration  $C_5$ , where every membrane  $d$  contains exactly  $c(d)$ . If  $C_5$  contains a membrane not present in  $C$ , it will contain the object  $\omega$ , which will not be reached by any of objects  $\xi$  so the computation will not halt. If  $C$  contains a membrane  $d'$  not present in  $C_5$ , then the membrane  $d = \text{parent}(d')$  will never get rid of  $\omega$ , because the rule  $r = \xi_d \omega c(d) \rightarrow \sigma \xi_{d'} \downarrow_{l(d')}$  cannot be applied due to lack of the child membrane  $d'$ . Hence  $C = C_5$  and there is a computation of  $\Pi$  that will result in  $C$ .  $\square$

**Theorem 4.2.11.** *Existence of halting computation for active P systems with limit on the total number of membranes is undecidable.*

**Proof 4.2.11.** For a given P system  $\Pi$  and a target configuration  $C$  we have constructed a P system  $\Pi'$  such that there is a halting computation of  $\Pi'$  iff the  $\Pi$  can reach configuration  $C$ . The two directions of the equivalence have been proven in lemmas 4.2.6 and 4.2.10. Using this construction, we can reduce the existence of halting computation to reachability of register machines [42], which is known to be undecidable.  $\square$

#### 4.2.4 Concluding remarks

We have studied the termination problems for active sequential P systems. Unlike deterministic systems, the termination problems cannot be simply reduced to the halting problem. We have shown that active P systems with limit on the number of membranes have decidable existence of infinite computation and undecidable existence of halting computation. It is currently unknown whether the same results apply also for a variant without the limit on the number of membranes, so it could be a subject for the future study.

Regarding the open problem stated in [42] about sequential active P systems with hard membranes (without communication between membranes), it could be interesting to find a connection between the universality and decidability of these termination problems.

### 4.3 Emptiness detection

*“In general, it seems that any extension which does not allow zero testing will not actually increase the modeling power (or decrease the decision power) of Petri nets but merely result in another equivalent formulation of the basic Petri net model. (Modeling convenience may be increased)”* [63], page 203.

The above quote from [63] was a fair summary of current beliefs in the Petri net community regarding extensions of the basic Petri net mode: extensions are either Turing-powerful or they are not real extensions.

It is not the case as shown in [28]. There exist extensions of Petri nets which do not allow zero testing but that will actually increase the computational power and decrease the decision power (e.g. boundedness becomes undecidable).

In this chapter we investigate several “weak” extensions of sequential P systems, which allow for zero-testing, aiming to fit in layers between mere reformulations of the basic sequential P system and universal sequential P systems with inhibitors. The work is currently in progress, therefore the results are mostly partial with just rough outlines of the proofs.

We will extend the definition of evolution rules with additional decision option for objects that are being sent through a membrane to another region. Recall the original definition of the evolution rule 3.1.7:  $u \rightarrow v$ , where  $u$  is a string over  $\Sigma$  and  $v = v'$  or  $v = v'\delta$ , where  $v'$  is a string over  $\Sigma \times (\{here, out\} \cup \{in_j | 1 \leq j \leq m\})$  and  $\delta$  is a special symbol not in  $\Sigma$ . Recall also the algorithm 2, which will be extended in following subsections.

### 4.3.1 Objects avoiding empty regions

We will have a specific subset of objects, which when occur in a rule in form of  $(a, out)$  or  $(a, in_j)$ , and the target region is empty, they are not sent and stay in the current region instead. For a clarification, we present an algorithm for the rule application below (algorithm 3).

---

**Algorithm 3** Application of a single rule in a P system with objects avoiding empty regions

---

```

1: procedure RULEAPPLICATION(applicable rule  $u \rightarrow v \in R_i$ , configuration
    $C = (\mu', w'_1, w'_2, \dots, w'_m)$ , set of objects avoiding empty regions  $\Gamma \subseteq \Sigma$ )
2:    $w_i := w_i - u$ 
3:   for all  $(a, here) \in v$  do
4:      $w_i := w_i + a$ 
5:   for all  $(a, out) \in v$  do
6:     if  $a \in \Gamma$  and  $parent(i)$  is empty then
7:        $w_i := w_i + a$ 
8:     else
9:        $w_{parent(i)} := w_{parent(i)} + a$ 
10:  for all  $(a, in_j) \in v$  do
11:    if  $a \in \Gamma$  and  $j$  is empty then
12:       $w_i := w_i + a$ 
13:    else
14:       $w_j := w_j + a$ 
15:  if  $v = v'\delta$  then
16:     $w_{parent(i)} := w_{parent(i)} + w_i$ 
17:     $w_i :=$  empty multiset

```

---

### 4.3.2 Objects altering when sent to empty region

We will have rules of type  $u \rightarrow v$ , where  $u$  is a string over  $\Sigma$  and  $v = v'$  or  $v = v'\delta$ , where  $v'$  is a string over  $\Sigma \times (\{here, out\} \cup \{in_j | 1 \leq j \leq m\}) \times \Sigma$  and  $\delta$  is a special symbol not in  $\Sigma$ .

An occurrence of  $(a, out, b)$  or  $(a, in_j, b)$  in the right hand side of a rule is interpreted so that if the target region is empty, the object is altered and  $b$  is sent instead of  $a$  if the target region is nonempty. We present an algorithm for this variant of the rule application on the next page (algorithm 4).

---

**Algorithm 4** Application of a single rule in a P system with objects altering when sent to empty region

---

```

1: procedure RULEAPPLICATION(applicable rule  $u \rightarrow v \in R_i$ , configuration
    $C = (\mu', w'_1, w'_2, \dots w'_m)$ )
2:    $w_i := w_i - u$ 
3:   for all  $(a, here, b) \in v$  do
4:      $w_i := w_i + a$ 
5:   for all  $(a, out, b) \in v$  do
6:     if  $parent(i)$  is empty then
7:        $w_{parent(i)} := w_{parent(i)} + b$ 
8:     else
9:        $w_{parent(i)} := w_{parent(i)} + a$ 
10:  for all  $(a, in_j, b) \in v$  do
11:    if  $j$  is empty then
12:       $w_j := w_j + b$ 
13:    else
14:       $w_j := w_j + a$ 
15:  if  $v = v'\delta$  then
16:     $w_{parent(i)} := w_{parent(i)} + w_i$ 
17:     $w_i :=$  empty multiset

```

---

### 4.3.3 Vacuum objects

In the common sense, vacuum represents a state of space with no or a little matter in it. Using vacuum in modelling frameworks can help express certain phenomena more easily. We define a new  $P$  system variant, which creates a special vacuum object in a region as soon as the region becomes empty. If we made the vacuum to be removed automatically when an object enters the region, there would be no difference with the variant without vacuum objects because of no interactions with it. Instead, the vacuum can be removed explicitly by a rule, e.g. with some interaction with other object. However, it is still created automatically, so we allow the vacuum object to occur only on the left side of rules.

One can object that if there is an interaction of the vacuum object with another object in the same region, the region is nonempty at that time and it does not make sense to have nonempty region with vacuum. But the vacuum object can be regarded as a memory footprint of the past event, when the region was empty. It is just waiting there to be processed.

In the following, the vacuum object is denoted by  $\nu$ .

We will have rules of type  $u \rightarrow v$ , where  $u$  is a string over  $\Sigma \cup \{\nu\}$  and  $v = v'$  or  $v = v'\delta$ , where  $v'$  is a string over  $\Sigma \times (\{here, out\} \cup \{in_j | 1 \leq j \leq m\})$  and  $\delta$  and  $\nu$  are special symbols not in  $\Sigma$ .

There will be a phase in the computational step before the rewriting takes place. The vacuum object is created in all empty membranes. It can be seen as a special implicit rule with highest priority.

**Theorem 4.3.1.** *Sequential  $P$  systems with vacuum objects are computationally complete.*

**Proof 4.3.1.** We will prove the universality by simulating the register machine. If there was a symbol for every register as in the proof 4.1.3, the vacuum object would be created only if all registers are empty. But for the simulation of the  $sub()$  instruction we need to detect when one concrete register is empty.

We will have a membrane for each register. These membranes will be contained in the skin membrane. The value of register  $i$  will be represented by the multiplicity of object  $a$  in membrane  $i$ .

The alphabet will consist of the instruction labels from the register machine and the counter object  $a$ . Initially, the skin membrane contains only the instruction label. There will be rules to send the instruction label to the corresponding membrane where the instruction is executed. After the execution the next instruction label is sent back to the skin membrane.

We will have following rules in the skin membrane:



- $e \rightarrow e \downarrow_j$  for an instruction of type  $e : (add(j), f)$  or  $e : (sub(j), f, z)$  and
- $h \rightarrow h \downarrow$  for a halting instruction  $h$ .

And in every inner membrane  $j$ :

- $e \rightarrow a|f \uparrow$  for instructions of type  $e : (add(j), f)$ ,
- $e|a \rightarrow f \uparrow$  for instructions of type  $e : (sub(j), f, z)$ ,
- $e|\nu \rightarrow z \uparrow$  for instructions of type  $e : (sub(j), f, z)$ , and
- $h|a \rightarrow h|a$

When halting, if there is an nonempty register, it will cycle forever with the last rule. However, if all registers are empty, the halting instruction label will stay in all membranes and the computation will halt.  $\square$

#### 4.3.4 Concluding remarks

The above presented variants show possible implementations of zero-check by the feature of emptiness detection which is specific for membrane systems. The aim of the current research is to find a variant with zero-check that won't lead to computational completeness. The current status is that sequential P systems with objects altering when sent to empty region (subsection 4.3.2) and sequential P systems with vacuum objects (subsection 4.3.3) are universal because we can simulate a register machine. On the other hand, the other variant with objects avoiding empty regions (subsection 4.3.1) is more promising for our goal because the standard construction of register machine do not work. We conjecture this variant is not universal, possibly equivalent with Petri nets.

### 4.4 Notions from reaction systems

The variants of P systems inspired by reaction systems introduced in subsection 3.2.9 have been inspected only for maximal parallel semantics. The various proposed semantics turned out to be deterministic and the research continued to define various semantics for computational step [49] and halting conditions [60]. The sequential mode was only mentioned in [49] under the notion of “min-enabled” computational step. As well as the maximal parallel mode, the sequential set membrane systems can only generate the

regular languages [4]. The situation is changed with active membranes. It seems that it is not so black-and-white in terms of computational power of the sequential active P systems that are working with:

- sets instead of multisets,
- the assumption of non-permanency of objects.

We left these proposals as a topic for the future study.

# Conclusions

We have studied several variants of sequential P systems in order to obtain universality without using maximal parallelism. A variant with rewriting rules that can use inhibitors was shown to be universal in both generating and accepting case. The generating model is able to simulate maximal parallel P system and the accepting model can simulate a register machine. The constructive proof for the generating case is valuable not only for the universality, but also can be seen as a method of conversion between P systems in sequential manner and maximally parallel manner, which may be essential for future works on P systems and other multiset rewriting systems. Sequential variants are promising alternative to traditional maximal parallel variants and will be good subject for the further research. Future plans include research of other more restricted variants such as omitting cooperation in the rules or restricting the power of inhibitors.

In addition, we have defined a new variants of zero-testing, aiming to fit in layers between mere reformulations of the basic sequential P system and universal sequential P systems with inhibitors. These include various forms of detection of empty membranes, which is specific for membrane systems. As for now, the work is currently in progress, and the results obtained so far have been just the computational completeness. However, one variant with objects avoiding empty regions is more promising for our goal because the standard construction of register machine do not work. We conjecture this variant is not universal, possibly equivalent with Petri nets.

There are many features not yet combined, so we suggest them for the further research (non-cooperative rules, rules with priorities, decaying objects, deterministic steps, ...).

Aside from the research of the computational power, there are many open problems in the area of decision problems of certain properties. Interesting ideas for future work can be taken from [13]. They define an abstract notion of negative application conditions for general rewriting systems, which is for multiset rewriting rendered as the usage of inhibitors. Although they considered only nondeleting rules (after application of each rule the resulting

multiset is a superset of the current multiset), interesting results were shown that the termination of rewriting was shown to be decidable.

We have investigated the decidability problems of existence of (in)finite computation for a universal class of P systems with active membranes. We have shown and published our results that are on both sides of the decidability barrier. Regarding the open problem stated in [42] about sequential active P systems with hard membranes (without communication between membranes), it could be interesting to find a connection between the universality and decidability of these termination problems.

We research sequential P systems with active membranes also in combination with notions inspired by reaction systems, i.e. using sets instead of multisets and the assumption of non-permanency of objects. There are no results yet in this area and our proposals could be set as a single topic for the future study.

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# Appendix

Some statistics:

- This thesis consists of 98 definitions, 6 theorems, 15 proofs, 9 lemmas, 18 figures, 19 examples, 11 chapters, 33 sections, 36 subsections, 21 subsubsections, 348 begins, 40 tex files
- Github repository consists of 15 milestones, 164 issues, 342 commits
- Editors used: vim, SublimeText, Inkscape, Gimp, Github, Google docs
- LaTeX packages: cmap, inputenc, lmodern, fontenc, babel, amsfonts, amsmath, msthm, mathtools, import, algorithm, noend, algpseudocode, graphicx, graphics, rotating, tikz, caption, hyperref, varioref, imakeidx, scrpage2, etoolbox, bibunits, pdfpages
- Grants requested: 3
- Grants approved: 0
- Papers submitted: 4
- Papers accepted: 2

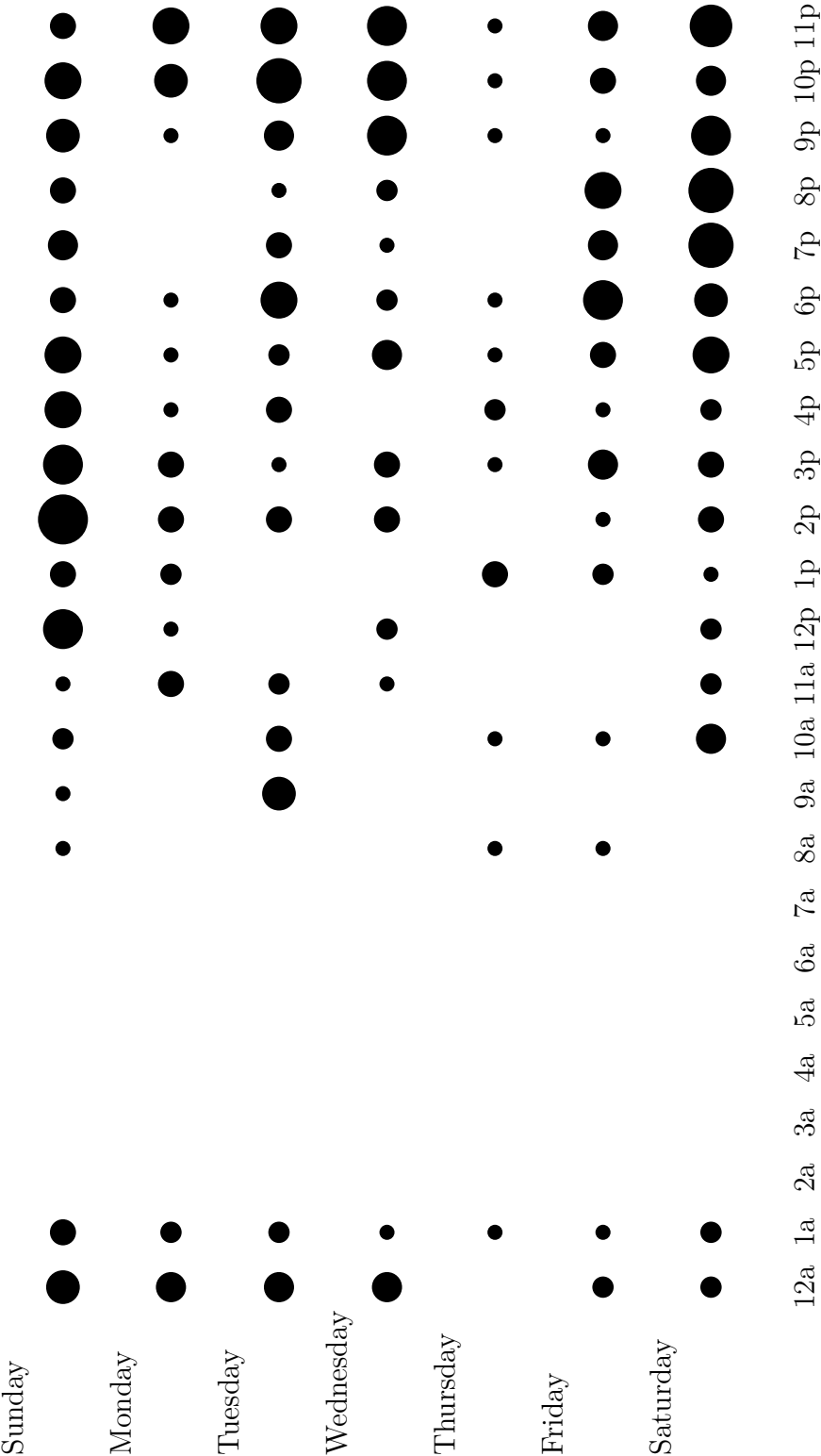


Figure 13: Github punchcard



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