Efficient Restrictions of Immediate Observation Petri Nets^{*}

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Abstract. In a previous paper we introduced immediate observation Petri nets [9], a subclass of Petri nets with application domains in distributed protocols and theoretical chemistry (chemical reaction networks). IO nets enjoy many useful properties [9,13], but like the general case of conservative Petri nets they have a PSPACE-complete reachability problem. In this paper we explore two restrictions of the reachability problem for IO nets which lower the complexity of the problem drastically. The complexity is NP-complete for the first restriction with applications in distributed protocols, and it is polynomial for the second restriction with applications in chemical settings.

Keywords: Petri nets, reachability, computational complexity

1 Introduction

In this paper we refine our results about the complexity of verifying immediate observation Petri nets [9] in the case of two restrictions of such nets. Petri nets and their subclasses are widely used and studied in the context of software and system verification (e.g. [7]), but also others such as game theory (e.g. [11]), chemical reaction networks (e.g. [3]) etc. Unfortunately many important problems there have high complexity, and reachability is at least TOWER-hard in the general case [6]. This motivates the study of subclasses of Petri nets.

Immediate observation Petri nets (IO nets) are a reformulation of immediate observation population protocols, which have been introduced by Angluin et al. in [2]. Initially, they were studied from the point of view of computing predicates in a distributed system, where their expressive power is lower than general population protocols (conservative Petri nets) but still considerable. Many verification problems for IO nets are PSPACE-complete; among them set-parametrized problems for sets defined by boolean combinations of bounds on token counts. This is a significant improvement compared to the general or conservative case of Petri nets, where EXPSPACE-hard [4] and even harder verification problems are the

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norm. IO nets provide a natural description of some distributed systems, but also can be used to describe enzymatic chemical networks [1].

Of course, a subclass of reachability problems with a better computational complexity raises some natural, even if informal, questions. What allows better complexity and can it be generalized to some wider subclass? What keeps the complexity from being even lower and are there useful subclasses without these obstacles? Are there applications where a typical problem can be solved more efficiently? We believe that branching immediate observation nets, a generalization of IO nets and basic parallel processes with reachability problem in PSPACE[13], answer the first question. The present paper is devoted to the last two questions.

We consider two restrictions, the first one a syntactic restriction defining a subclass of IO nets, and the second a condition on the initial and final markings considered in the reachability problem for IO nets. The first restriction is plausible in some distributed systems, and it also bears similarity to the delayed observation population protocols introduced by Angluin et al. in [2]. The second restriction has applications in some chemical systems (enzymatic chemical reaction networks, [1]). We show the first restriction entails an NP-complete reachability problem, and for the second restriction we provide a polynomial algorithm deciding reachability or giving a witness that the restriction does not hold.

The rest of the paper is organized as follows. In section 2, we recall some general definitions regarding Petri nets, as well as the classic maximum flow minimum cut problem. Section 3 defines immediate observation Petri nets. Then we show the effects for reachability complexity of two restrictions on IO nets: keeping transitions enabled once enabled in Section 4, and requiring all token counts and their combinations to be large or zero in Section 5. Finally, we summarize our results in the conclusion and outline some further directions.

2 Preliminaries

Multisets. A multiset on a finite set E is a mapping $C: E \to \mathbb{N}$, i.e. for any $e \in E, C(e)$ denotes the number of occurrences of element e in C. Let $\{e_1, \ldots, e_n\}$ denote the multiset C such that $C(e) = |\{j \mid e_j = e\}|$. Operations on \mathbb{N} like addition or comparison are extended to multisets by defining them component wise on each element of E. Given $X \subseteq E$ define $C(X) \stackrel{\text{def}}{=} \sum_{e \in X} C(e)$. We call $\sum_{e \in E} C(e)$ the size of C and note it |C|.

Place/transition Petri nets with weighted arcs. A Petri net N is a triple (P, T, W) consisting of a finite set of places P, a finite set of transitions T and a weight function $W: (P \times T) \cup (T \times P) \to \mathbb{N}$. A marking M is a multiset on P, and we say that a marking M puts M(p) tokens in place p of P. The size of M, denoted by |M|, is the total number of tokens in M. The preset $\cdot t$ and postset t^{\bullet} of a transition t of T are the multisets on P given by $\cdot t(p) = W(p, t)$ and $t^{\bullet}(p) = W(t, p)$. A transition t is enabled at a marking M if $\cdot t \leq M$, i.e. $\cdot t$ is component-wise smaller or equal to M. If t is enabled then it can be fired, leading to a new marking $M' = M - \cdot t + t^{\bullet}$. We let $M \stackrel{t}{\to} M'$ denote this. Given

 $\sigma = t_1 \dots t_n$ we write $M \xrightarrow{\sigma} M_n$ when $M \xrightarrow{t_1} M_1 \xrightarrow{t_2} M_2 \dots \xrightarrow{t_n} M_n$, and call σ a firing sequence. We write $M' \xrightarrow{*} M''$ if $M' \xrightarrow{\sigma} M''$ for some $\sigma \in T^*$, and say that M'' is reachable from M'.

Flows and cuts. A flow graph is a triple G = (V, A, c) where V is a finite set of vertices, $A \subseteq V^2$ is a finite set of arcs, and $c : A \to \mathbb{N} \cup \{\infty\}$ is a nonnegative capacity function on arcs. Given an arc $a \in A$, we call c(a) the capacity of a. Notice that this capacity can be infinite. A flow graph contains two special vertices i and o, called the *inlet* and *outlet*, such that i has no incoming arc and o has no outgoing arc. A flow of a flow graph is a function $f : A \to \mathbb{N}$ such that $f(a) \leq c(a)$ for each arc $a \in A$, and for each vertex $v \in V \setminus \{i, o\}$, the sum of the flow over v's incoming arcs is equal to the sum of the flow over v's outgoing arcs. The value of a flow is the sum $\sum_{(i,p)\in A} f((i,p))$ of the flow over all arcs from the inlet, or equivalently the sum $\sum_{(p,o)\in A} f((p,o))$ of the flow over all arcs to the outlet. A *cut* in a flow graph G = (V, A, c) is a pair of disjoint subsets $V_I \sqcup V_O = V$ such that the inlet is in V_I and the outlet is in V_O . The *capacity* of a cut (V_I, V_O) is the sum of the capacities of all the arcs going from vertices in V_I . We precedule the sum a = (u, v) crosses the *cut*, if $u \in V_i$ and $v \in V_O$.

We recall two classic theorems.

Theorem 1 (Max-flow min-cut theorem [10]). In a flow graph, the maximum value of a flow is equal to the minimum capacity of a cut.

Theorem 2 (Dinitz algorithm [8]). Given a flow graph, a flow with the maximum value and a cut with the minimum capacity can be found in polynomial time.

3 Immediate observation Petri nets

We recall the definition of immediate observation nets (IO nets) from [9].

Definition 1. A transition t of a Petri net is an immediate observation transition (IO transition) if there are places p_s, p_d, p_o , not necessarily distinct, such that $\bullet t = \langle p_s, p_o \rangle$ and $t^{\bullet} = \langle p_d, p_o \rangle$. We call p_s, p_d, p_o the source, destination, and observed places of t, respectively. We denote by $p_s \xrightarrow{p_o} p_d$ such a transition. A Petri net is an immediate observation net (IO net) if all its transitions are IO transitions.

Following the graphical convention of [12] for contextual nets, we represent the Petri net arcs (p_o, t) and (t, p_o) by an undirected arc between t and p_o in our figures. This emphasizes that transition t has a read-only relation to its observed place p_o . In the examples, we also consider IO nets containing transitions with no observed place. To make the net a formally correct IO net, it suffices to add an extra marked place which acts as observed place for these transitions.

IO nets are *conservative*, i.e. there is no creation or destruction of tokens.

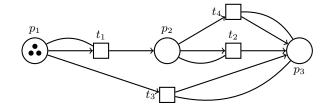


Fig. 1: An IO net.

Example 1. Figure 1 shows an IO net taken from the literature on population protocols [2]. Intuitively, it models a protocol allowing a crowd of undistinguishable agents that can only interact in pairs to decide whether they are at least 3. Given a marking M_0 with tokens only in p_1 , if $M_0(p_1) \ge 3$, then repeated firing of an arbitrary enabled transition eventually puts all the tokens into p_3 .

In [9], we showed that given an IO net N and two markings M, M', deciding whether M' is reachable from M is a PSPACE-complete problem. The proof of PSPACE-hardness for the reachability problem in IO nets uses a reduction from the halting problem of linear-space Turing machines. The reduction is done by simulating the runs of the Turing machine: places describe the state of the head and of the tape cells, and transitions model the movement of the head and the change in the symbols on the tape cells. In the construction a specific "success" place becomes marked if and only if the machine reaches the halting state without exceeding the permitted space.

The nets provided by this reduction have two common properties. First, the transitions get enabled and disabled a large number of times. Second, the markings put at most one token per place. We show how forcing a strong enough contrary condition to at least one of these properties leads to much easier verification.

4 First restriction: transition enabling

The PSPACE-hardness proof for IO reachability relies on the observation requirements of some transitions switching between satisfied and unsatisfied many times. In some distributed systems, observations correspond to irrevocable declarations of the agents, for example in some multi-phase commit protocols. We consider IO nets where a token move enabled by observing some token remains enabled even when the observed token has changed places. We formalize such a property in the following definition.

Definition 2. An IO net is non-forgetting if for each transitions $p \xrightarrow{r} q$ and $r \xrightarrow{s} r'$ there is also a transition $p \xrightarrow{r'} q$.

Consider a marking of an IO net where the observation place of some transition with source place p and destination place q is marked. If there is a token in place p, then it can move to q. We say that the *token move from* p to q is enabled. In a non-forgetting IO net, once the token move from p to q is enabled in some marking of a firing sequence, it stays enabled in the subsequent markings of the firing sequence. Notice that the token move from p to q being enabled in a marking is not equivalent to a transition from p to q being enabled: a transition is enabled when both its observation place and its source place are marked, whereas a token move is enabled as soon as the observation place of some suitable transition is marked.

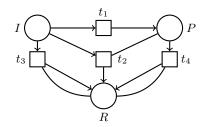


Fig. 2: A non-forgetting Petri net.

Example 2. The non-forgetting IO net of Figure 2 models one of the steps of updating a shared state: A proposal can be published and stored, and every agent has an opportunity to veto it.

All agents start in the initial state I. Some agent can propose a change by moving from state I to state P. If there is a proposal, an agent can move from state I to state P to support the proposal, or go to the state R to reject the proposal. If there is an agent rejecting the proposal (i.e. in the state R), other agents can move to R both from I and from P to recognise the fact that the proposal has been rejected. Note that the agents cannot reject a proposal before it has been created, which is encoded by P being the observed place of t_2 . Also note that the agent proposing a change cannot start rejecting it until some other agent rejects it.

The reachability problem for such IO nets becomes much simpler.

Theorem 3. The reachability problem for non-forgetting IO nets is in NP.

Proof. Let N be a non-forgetting IO net. Consider a (non-empty) firing sequence σ of N from markings M to M'. It can be decomposed into n non-empty subsequences σ_i such that $M = M_0 \xrightarrow{\sigma_1} M_1 \xrightarrow{\sigma_2} M_2 \dots \xrightarrow{\sigma_n} M_n = M'$ for some n > 0, and such that M_i are the markings of the firing sequence in which new token moves become enabled. Recall that since N is non-forgetting, a token move once enabled remains enabled. There are at most $|P|^2$ such subsequences in any firing sequence, and in each subsequence the set of enabled token moves is fixed.

Example 3. Consider the net of Example 2, and the firing sequence $t_2^3 t_4$ from marking (4,1,0), which put 4 tokens in I, 1 tokens in P and 0 token in R, to marking (1,0,4). This firing sequence is decomposed into two subsequences: (4,1,0) $\xrightarrow{t_2}$ (3,1,1) and (3,1,1) $\xrightarrow{t_2^2 t_4}$ (1,0,4). In the first, the token moves from

I to R and from I to P are enabled. In the second, these token moves as well as the token move from P to R are enabled.

To show that the reachability problem for non-forgetting IO nets is in NP, we define a reachability certificate and show how it can be verified in polynomial time. The certificate corresponding to a firing sequence consists of the markings in which some token move is enabled for the first time. Such a certificate has polynomial length by the above considerations on the number of subsequences.

We now show that the reachability problem in an IO net with a fixed set of enabled token moves is reducible to the maximum flow problem on graphs. Let N be an IO net, let M, M' be two markings of N. We define G as the flow graph with vertices identified with the places P of N, as well as two additional vertices i and o, the inlet and outlet of the flow graph. For each enabled token move from p to q for some places p, q, there is an arc from p to q in G with infinite capacity. Each vertex p identified with a place of N has one incoming arc from the inlet iwith capacity M(p), and one outgoing arc to the outlet o with capacity M'(p).

Example 4. Figure 3 illustrates two such flow graphs for the non-forgetting IO net of Example 2. The first flow graph corresponds to the enabled token moves from I to R and from I to P, with markings M = (4, 1, 0) and M' = (3, 1, 1). The second flow graph corresponds to the enabled token moves from I to R, from I to P and from P to R, with markings M = (3, 1, 1) and M' = (1, 0, 4).

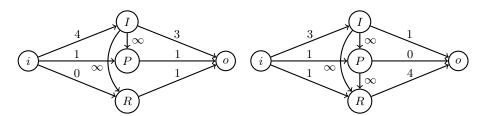


Fig. 3: Flow graphs corresponding to the non-forgetting net of Fig. 2.

A firing sequence σ from M to M' in N corresponds naturally to an integer flow f on G, where for all vertices p and q corresponding to places of the IO net, f(i, p) = M(p), f(p, o) = M'(p) and f(p, q) is equal to the number of transitions from p to q in σ . This flow has value |M| = |M'|.

Conversely, an integer flow of value |M| = |M'| corresponds to a firing sequence in N, provided N has a fixed set of enabled token moves. Let us consider such a flow f. It corresponds to a multiset θ of token moves. Starting with the marking M, we remove from the multiset some token move with the source place having more tokens than in M' and fire some corresponding enabled transition. We continue until we reach M'. The details of the construction and its correctness proof are purely technical and can be found in the appendix.

We see that verifying a certificate requires a polynomial number of invocations of a polynomial-time algorithm. This concludes the proof.

In fact the reachability problem is NP-complete.

Theorem 4. Reachability problem for non-forgetting IO nets is NP-hard.

Proof (Sketch). NP-hardness of reachability is proved by a reduction from the NP-complete SAT problem. Consider a SAT instance represented as a circuit of binary "NAND" $(\neg(x \land y))$ operations. One can construct a net such that its runs correspond to the input nodes of the circuit choosing arbitrary input values, and the operation nodes of the circuit evaluating the function given the chosen values of the inputs. The technical details are provided in the appendix.

5 Second restriction: token counts

Another property of the PSPACE-hardness reduction for IO nets is the low number of tokens in each place. Specifically, no reachable marking puts more than one token in any place. Some systems exhibit a very different behaviour. For instance in most cases of chemical reaction networks, the number of individual molecules is much larger than the number of species of molecules. Additionally, we do not expect any chance "near-misses" between the configuration of the molecules before and after a reaction sequence. If the total amount of molecules of some group of species before the reaction sequence is approximately equal to the amount of molecules of some other group of species afterwards, there must be a precise equality following from some conservation laws.

This behaviour can be formalized by the following condition.

Definition 3. A pair of markings M and M' of an IO net of place set P is a nearmiss pair if there exists sets of places X and Y such that $0 < |M(X) - M'(Y)| \le |P|^3$. A pair which is not a near-miss is called a no-near-miss pair.

Observe that each place of markings M and M' such that M, M' are a nonear-miss pair can be either unmarked or contain at least $|P|^3$ tokens. This can be seen by examining sets $X = \{p\}$ and $Y = \emptyset$, or $X = \emptyset$ and $Y = \{p\}$ in the definition.

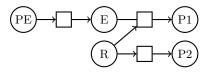


Fig. 4: An example of an IO net with enzyme production and use.

Example 5. Consider the IO net of Figure 4 which models a system where an enzyme E can be produced by an enzyme producer PE, and where a resource molecule R can transform into a product molecule P1 in the presence of an enzyme E, or into a product molecule P2. On the one hand, the total amount of the two products P1 and P2 together must match the amount of resource R consumed; on the other hand, it would be surprising if the two products were produced in the same amounts with high but imperfect precision, as there is

7

nothing ensuring such an approximate equality. Informally, we can consider the scales from an example of [5] cited in [1]. Five species of molecules are considered in a milliliter-scale cell (although with a different net which is not immediate observation). The concentrations of molecules are measured in picomoles per milliliter. As a picomole contains more than 10^{11} molecules, equalities that hold up to 10^3 molecules have a relative error of 10^{-8} . Such equalities might be expected to follow from some conservation laws and be precise.

Theorem 5. The IO net reachability problem for no-near-miss pairs of markings is in P. Moreover, there is a polynomial-time algorithm such that for every pair of markings M, M' it either resolves reachability, giving a witness firing sequence if it exists, or reports a near-miss in M and M'.

Even though the no-near-miss property is NP-complete (e.g. via SUBSET-SUM), making a proof of its violation an alternative valid answer of the algorithm simplifies IO reachability.

Remark 1. Requiring only that the initial and final markings of a firing sequence have many tokens in the non-empty places does not give us a better complexity than the general PSPACE-complete case.

Example 6. Consider two markings on the net of Figure 4, M with 200 tokens in PE and 400 tokens in R, and M' with 200 tokens in E and 400 tokens in P1. The pair (M, M') is a no-near-miss, and we will illustrate the algorithm by verifying reachability from M to M'.

The core idea of the algorithm is to maintain an increasing set of restrictions. Once there are no restrictions to add, we either construct a firing sequence from M to M' satisfying the obtained restrictions and no other ones, use the restrictions to prove that M cannot reach M', or find a near-miss in M and M'.

5.1 Restrictions

We first recall some definitions from [9], and then describe our restrictions and what it means for a restriction set to be stable.

Trajectories and histories. Since the transitions of IO nets do not create or destroy tokens, we can give tokens identities. Given a firing sequence, each token of the initial marking follows a *trajectory* through the places of the net until it reaches the final marking of the sequence. The trajectories of the tokens between given source and target markings constitute a *history*.

A trajectory of IO net N is a sequence $\tau = p_1 \dots p_k$ of places. We let $\tau(i)$ denote the *i*-th place of τ . The *i*-th step of τ is the pair $\tau(i)\tau(i+1)$. A history H of length h is a multiset of trajectories of length h. Given an index $1 \leq i \leq h$, the *i*-th marking of H, denoted M_H^i , is defined as follows: for every place p, $M_H^i(p)$ is the number of trajectories $\tau \in H$ such that $\tau(i) = p$. The markings M_H^1 and M_H^h are the *initial* and *final* markings of H, and we write $M_H^1 \xrightarrow{H} M_H^h$. A history H of length $h \geq 1$ is realizable if there exist transitions t_1, \dots, t_{h-1} and numbers $k_1, \dots, k_{h-1} \geq 0$ such that

- $M_{H}^{1} \xrightarrow{t_{1}^{k_{1}}} M_{H}^{2} \cdots M_{H}^{h-1} \xrightarrow{t_{h-1}^{k_{h-1}}} M_{H}^{h}, \text{ where for every } t \text{ we define } M' \xrightarrow{t^{0}} M \text{ iff } M' = M.$
- For every $1 \leq i \leq h-1$, there are exactly k_i trajectories $\tau \in H$ such that $\tau(i)\tau(i+1) = p_s p_d$, where p_s, p_d are the source and target places of t_i , and all other trajectories $\tau \in H$ satisfy $\tau(i) = \tau(i+1)$. Moreover, there is at least one trajectory τ in H such that $\tau(i)\tau(i+1) = p_o p_o$, where p_o is the observed place of t_i . We say that t_i realizes step i of H.

We say that $t_1^{k_1} \cdots t_{h-1}^{k_{h-1}}$ realizes H. Intuitively, at a step of a realizable history only one transition occurs, although perhaps multiple times, for different tokens. From the definition of realizable history we immediately obtain:

- $-M' \xrightarrow{*} M$ iff there exists a realizable history with M' and M as initial and final markings.
- Every firing sequence that realizes a history of length h has accelerated length at most h.

Restriction definition. Given an IO net N, places p, q, r of N, and two markings M and M', we say that a token goes from p to q via r if there exists a realizable history H of length h between M and M' and a trajectory τ in H such that $\tau(1) = p, \tau(h) = q$ and $\tau(i) = r$ for some $i \in \{1, \ldots, h\}$.

Given a pair M, M', our algorithm computes a set \mathcal{R} of *restrictions* of the form (p, r, q). We say a restriction (p, r, q) is *correct* if no token goes from p to q via r, i.e. if there is no realizable history from M to M' containing a trajectory from p to q passing through r. We say that a pair of places (p,q) is *forbidden* if for all $r \in P$ the restriction (p, r, q) is in \mathcal{R} . Forbidding a pair (p, q) means adding the restriction (p, r, q) to \mathcal{R} for all $r \in P$. A pair of places (p, q) that is not forbidden is *allowed*.

Flow graph. We define a correspondence between the reachability problem in an IO net with a (correct) restriction set and the maximum flow problem for a certain flow graph.

Let N be an IO net of place set P, let M, M' be two markings of N, and let \mathcal{R} be a set of restrictions. We define the flow graph G = (V, A, c) with 2|P| + 2 vertices. There are two vertices for each place $p \in P$, an "initial" copy v_p^i and a "final" copy v_p^f , as well as a distinguished inlet vertex i and a distinguished outlet vertex o. For each place $p \in P$, there is an arc $a = (i, v_p^i)$ with capacity c(a) = M(p), and an arc $a = (v_p^f, o)$ with capacity c(a) = M'(p). For each pair of places $(p,q) \in P^2$ such that (p,q) is allowed in \mathcal{R} , there is an arc $a = (v_p^i, v_q^f)$ from the initial p-labeled vertex to the final q-labeled vertex with infinite capacity. Note that the maximum flow value in graph G thus constructed is at most |M| = |M'|.

Example 7. Figure 5 illustrates the flow graph G constructed for the IO net of Figure 4, the markings M = (200, 0, 400, 0, 0) and M' = (0, 200, 0, 400, 0), and the restriction set that allows only pairs of the form (p, p) and also the pairs (PE, E), (R, P1), (R, P2).

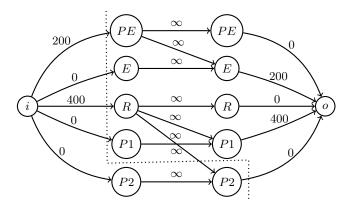


Fig. 5: Flow graph for the IO net of Figure 4 with a cut.

A realizable history H from M to M' naturally corresponds to a flow of value |M|: the flow that saturates all the arcs with the finite capacities (i.e. the arcs from the inlet and to the outlet), and assigns to an infinite-capacity arc from v_p^i to v_q^f the number of trajectories from p to q in H. Since this flow saturates all the finite edges, it is a maximum flow.

Stable restriction set. We define the notion of a stable set of restrictions for a pair of marking M and M'. Intuitively, a stable set of restrictions does not immediately exclude reachability from M to M', and cannot be extended.

Definition 4. A set \mathcal{R} of correct restrictions for an IO net N and configurations M and M' is stable if the following conditions hold.

- 1. The maximum flow in the corresponding flow graph is equal to the size |M| of the configurations M (and M').
- 2. For each two places p and q, if there is a minimum cut of the flow graph with v_p^i in the outlet component and v_q^f in the inlet component, the pair (p,q) is forbidden.
- 3. For each larger set of restrictions $\mathcal{R}' \supseteq \mathcal{R}$, either there is a pair (p,q) such that the triple $(p,p,q) \in \mathcal{R}' \setminus \mathcal{R}$, or there is exists a transition $s \xrightarrow{o} d$ and triples $(p,s,q), (p',o,q') \notin \mathcal{R}'$ and $(p,d,q) \in \mathcal{R}' \setminus \mathcal{R}$.
- 4. For each larger set of restrictions $\mathcal{R}' \supseteq \mathcal{R}$, either there is a pair (p,q) such that the triple $(p,q,q) \in \mathcal{R}' \setminus \mathcal{R}$, or there exist a transition $s \xrightarrow{o} d$ and triples $(p,d,q), (p',o,q') \notin \mathcal{R}'$ and $(p,s,q) \in \mathcal{R}' \setminus \mathcal{R}$.

Each of these conditions prohibits some property that can rule out reachability or imply new restrictions. We give some intuition now, then prove formally in Section 5.2 that in the case where M and M' are a no-near-miss pair, we can build a realizable history from M to M' from a stable set of restrictions. Moreover the history constructed will show that the set of restrictions cannot be extended.

We call the first two conditions *flow-based stability conditions*. The first condition corresponds to the fact that if a restriction set leads to a flow graph

with a maximum flow smaller than |M|, then there can be no realizable history from M to M' consistent with such restrictions. The second condition uses the fact that a minimum cut has the same value as a maximum flow, which has size |M| by the first flow-based condition. Let (p,q) be a pair violating the condition. A max flow f that uses the edge from v_p^i to v_q^f can be decomposed into a sum of two flows f_1 and f_2 : f_1 the flow with value 1 along path $i - v_p^i - v_q^f - o$ and $f_2 = f - f_1$ which has value |M| - 1. Flow f_1 uses two arcs of the minimum cut thus yielding a contradiction by leaving a cut of capacity |M| - 2 to f_2 . This contradicts existence of a maximum flow using the edge from v_p^i to v_q^f and thus the existence of a realizable history from M to M' with trajectories from p to q.

Example 8. Figure 5 illustrates a minimal cut on the flow graph G of Example 7 in which the path $i \to v_R^i \to v_{P2}^f \to o$ contains two arcs crossing the cut. The restriction set is not stable and (R, P2) must be forbidden.

We call the last two conditions reachability-based stability conditions. They rule out an inductive proof of a larger restriction set in the following sense. Given a larger set \mathcal{R}' which violates one of these conditions, we will show by induction on the step number that any realizable history deduced from \mathcal{R} is also coherent with \mathcal{R}' , and thus we can replace \mathcal{R} with the larger set \mathcal{R}' .

5.2 Firing sequence construction

We show how to construct a firing sequence from a stable restriction set, possibly reporting a near-miss instead. The proof that the near-miss reports are correct is after the construction, in Section 5.3.

Given a flow graph G = (V, A, c), we define two operations on the capacity c relative to a place pair $(p,q) \in P^2$ and an integer k > 0. Increasing c by k along (p,q) consists in increasing $c(i, v_p^i)$ and $c(v_q^f, o)$ by k. Decreasing c by k along (p,q) consists in decreasing $c(i, v_p^i)$ and $c(v_q^f, o)$ by k. This decreasing operation is not possible if $c(i, v_p^i)$ or $c(v_q^f, o)$ are smaller than k.

From stable restriction set to solution flow. Given a stable set of restrictions with b allowed pairs (p, q), a solution flow is a result of the following procedure: Construct the flow graph G. Decrease the capacity by |P| along each allowed pair; if this step fails because some arc has insufficient capacity, terminate the algorithm and report that M, M' is a near-miss pair. Otherwise, compute a maximal flow. If it has value less than $|M| - b \times |P|$, terminate the algorithm and report that M, M' is a near-miss pair. Otherwise, increase its capacity by |P| along each (allowed) pair.

Example 9. In our running example, consider a stable set of restrictions \mathcal{R} allowing only the triples (PE, PE, E), (PE, E, E), (R, R, P1), and (R, P1, P1). This corresponds to a solution flow assigning the edges of the path $i \to PE \to E \to o$ the value 200 and the edges of the path $i \to R \to P1 \to o$ the value 400.

Observe that when a solution flow exists, it might not be unique. The algorithm builds a firing sequence from the solution flow.

From solution flow to firing sequence. Let \mathcal{R} be a stable restriction set of the algorithm, and let f be a corresponding solution flow. Intuitively, our construction of the solution flow makes sure the flow has value at least |P| along each pair (p, q) allowed by \mathcal{R} . We use the reachability-based stability conditions to construct a realizable history from this flow, such that for every pair (p, q) there are at most $f(v_p^i, v_q^f)$ trajectories from p to q.

We define three markings M_m, M_i and M_f . We denote A(p,q) the set of all places r such that the triple (p, r, q) is allowed, i.e. $(p, r, q) \notin \mathcal{R}$. Let M_m be the marking such that $M_m(r)$ is equal to the cardinality of the set $\{(p,q)|r \in A(p,q)\}$ for all r. Let M_i be the marking such that $M_i(p) = \sum_q |A(p,q)|$. Note that as $|A(p,q)| \leq |P|$ we have $M_i(p) \leq f(i, v_p^i)$. Symmetrically, let M_f be the marking such that $M_f(q) = \sum_p |A(p,q)|$; we have $M_f(q) \leq f(v_q^f, o)$. We are going to construct a history from M_i to M_m and from M_m to M_f .

Example 10. In our running example with \mathcal{R} , we obtain $M_i = \langle PE, PE, R, R \rangle$, $M_f = \langle E, E, P1, P1 \rangle$, and $M_m = \langle PE, E, R, P1 \rangle$.

We build a history from M_i to M_m with trajectories labeled by allowed pairs (p,q) with many trajectories per pair. Each trajectory for pair (p,q) starts in place p. The stability condition guarantees that we can extend some trajectory to extend the set of places reached by trajectories labeled (p,q), until trajectories of every pair have reached all allowed intermediate places r such that (p, r, q) is allowed. For each reached place r some trajectory stays in r until the end of the history. The history from M_m to M_f is built in a similar way but using backward search from M_f . After combining the two histories into a history from M_i to M_f , we duplicate some trajectory for each pair of places until we have a history from M to M'. The construction consists of technical details and can be found in the appendix.

Finally, we extract a firing sequence from the realizable history from M to M' by associating a transition and an iteration count to each step of the history. Each step with k trajectories going from p_s to p_d with $p_s \neq p_d$ is associated to a transition t iterated k times from p_s to p_d , where t realizes the step. This is possible by realizability of the history.

5.3 Correctness given a stable restriction set

We prove that given a stable set of correct restrictions, the algorithm always yields a correct answer in polynomial time. In case of a near-miss, both reporting the near-miss and correctly resolving reachability is considered a correct answer.

A near miss is reported in two cases of the solution flow construction, the second being more technical. We give a sketch of the proof, the technical details are provided in the appendix.

Lemma 1. The near-miss reports are correct.

Proof (Sketch). We prove that the algorithm's reports of near-misses are correct for a net N, markings M, M' and a stable set of restrictions \mathcal{R} . A near miss is

reported in two cases. In the first case we cannot decrease some edge capacity by |P|, after having attempted at most |P| - 1 decreases for this edge beforehand. This corresponds to a place of M or M' having more than 0 but less than $|P|^2$ tokens, which constitutes a near-miss.

In the second case after decreasing the capacity by |P| along each of the *b* allowed pairs, there is some cut (V_I, V_O) with capacity less than |M| - b|P|. Each decrease operation decreases the capacity of each cut at most by 2|P|, so the original capacity of the cut is less than |M| + b|P|. On the other hand, it is strictly more than |M|, as decreasing by |P| along some pair reduced the capacity by more than |P|, which is impossible for any minimum cut by the second flow-based stability condition. The sets $X = V_I \cap \{v_p^i | p \in P\}$ and $Y = V_I \cap \{v_p^f | p \in P\}$ provide a near-miss.

If the algorithm does not report a near-miss, then it successfully constructs a solution flow and reports that M' is reachable from M. A realizable history can be constructed from the solution flow, proving that M can reach M'. Moreover the realizable history and then firing sequence from M to M' can be constructed in polynomial time and are correct by construction.

Lemma 2. The algorithm runs in polynomial time given a stable set of restrictions.

The runtime analysis is straightforward, and can be found in the appendix.

5.4 Computing a stable restriction set

We show that there is a polynomial algorithm that either computes a stable restriction set, or correctly reports unreachability. Starting with the empty set of restrictions, the algorithm repeatedly finds violations of the stability conditions and modifies the restriction set by adding some correct restrictions, or reports unreachability. Once no violations can be found, the algorithm terminates. As the total number of possible triples is $|P|^3$, only a polynomial number of iterations is needed. It remains to show that the violations as well as the corresponding additional correct restrictions can be found in polynomial time.

First condition. A violation can be found by computing the maximum flow. Such a violation immediately implies unreachability, since a realizable history induces a maximum flow of value |M|.

Second condition. A violation can be found by considering all the allowed pairs of places (p,q) and computing the maximum flow after decreasing the capacity by one along (p,q). If the decrease is successful and the maximum flow is |M| - 2, then (p,q) is a violating pair, as argued in the section with the flow-based stability conditions. We add new correct restrictions by forbidding it. If the decrease yields a maximum flow of |M| - 1 then this pair does not create a violation. If the decrease is not possible, then we add new correct restrictions by forbidding (p,q). Indeed if the decrease is not possible, then the capacity between i and v_p^i (resp. between v_q^f and o) is zero. The pair (p,q) must be forbidden as there is no realizable history in which a token goes from p to q. The pair provides a violation of the condition by the cut which puts only v_p^i and o into the outlet component V_O (resp., only v_q^f and i into the inlet component V_I) and which is minimal because it has capacity |M|.

Third and fourth condition. Checking for violations of reachability-based stability conditions shares part of the approach used to construct a history out of a solution flow. For the third condition, the algorithm enumerates upper bounds on an extended set of restrictions \mathcal{R}' violating the condition. We start with \mathcal{R}' equal to all the triples. We observe that \mathcal{R}' cannot contain (p, p, q) for any pair (p, q) such that (p, p, q) is not in \mathcal{R} . We exclude such (p, p, q) from \mathcal{R}' . Then as long as there is a transition $s \xrightarrow{o} d$ and there are triples $(p, s, q), (p', o, q') \notin \mathcal{R}'$ and $(p, d, q) \in \mathcal{R}' \setminus \mathcal{R}$, we exclude (p, d, q) from \mathcal{R}' . If we end up proving that $\mathcal{R}' = \mathcal{R}$, there can be no violation.

Otherwise we prove that all the restrictions in \mathcal{R}' are correct and thus that \mathcal{R} is extendable. Indeed, by induction, any history satisfying the restrictions in \mathcal{R} on all steps must also satisfy the restrictions in \mathcal{R}' .

The fourth condition is handled in a symmetric way.

Example 11. In our running example, starting from an empty restriction set, the second condition reports violations because decreasing is not possible. It forbids all the pairs but (PE, E), (PE, P1), (R, E), (R, P1). Checking violations of the third condition forbids all triples except (PE, PE, E), (PE, E, E), (R, R, P1), (R, P1, P1), (R, P2, P1). Checking the fourth condition additionally forbids (R, P2, P1) leaving only four allowed triples (PE, PE, E), (PE, E, E), (R, R, P1), (R, P1, P1). This set of restrictions is stable.

This procedure for constructing a stable set of restrictions, coupled with the previous algorithm in which the stable set was part of the input, completes the proof of Theorem 5.

6 Conclusion and future work

We have considered two restrictions of the IO net reachability problem with a promise for much simpler verification for some applications and established the reachability complexity in both these cases, which is NP-complete in one case and polynomial in the other.

We leave the question of complexity of set-set reachability under these restrictions for future research. Another related question is defining a notion of "approximate" reachability that would provide a reduction in complexity for IO nets, as merely bounding the maximum difference between token counts or the sum of differences preserves PSPACE-hardness of the reachability problem.

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A First restriction: transition enabling

We provide the details of the firing sequence construction out of a flow.

Lemma 3. An integer flow of value |M| = |M'| corresponds to a firing sequence in N, provided N has a fixed set of enabled token moves.

Proof. Let us consider such a flow f. It corresponds to a multiset θ of token moves containing exactly f(p, q) token moves from p to q for every pair of places $p,q \in P$. To prove existence of a firing sequence for each such multiset, we consider the following (simple but inefficient) procedure, starting from M. We repeatedly pick a token move from some p to some q from the multiset such that p has more tokens in the current marking than in the final marking M'. This is possible because IO nets are conservative: if there is no such place p then the current marking is equal to M' and we are done. We fire a transition of N with source place p and destination place q, and remove the token move from the multiset. The existence of such a transition, enabled in the current marking, is given by the fact that the token move is enabled and so there exists a transition of N from p to q whose observed place is marked.

We describe the reduction from SAT to the reachability problem for nonforgetting IO nets.

Theorem 4. Reachability problem for non-forgetting IO nets is NP-hard.

Proof. NP-hardness of reachability is proved by a reduction from the SAT problem. Consider a SAT instance represented as a circuit of binary "NAND" $(\neg(x \land y))$ operations (any propositional formula can be converted into such form in linear time). We construct a net with the following places.

- For each input x_i of the SAT circuit we add places x_i^{\perp} , x_i^0 , x_i^1 . Informally, marking these places corresponds to the input value being unknown, set to 0 and to 1 respectively.
- For each operation node n_j , we add places $n_j^{(\perp,\perp)}$, $n_j^{(\perp,1)}$, $n_j^{(1,\perp)}$, n_j^0 , n_j^1 . Informally, these places correspond to our knowledge about the inputs and the output value of the node n_i : we can know neither input, know that one of the inputs is 1, or know the output value of the node being 0 or 1 (if one output is 0, the node has the value 1 regardless of the other input).

The transitions are as follows.

- A token can move from a place x_i^{\perp} to either of the places x_i^0 or x_i^1 . A token in one of the places $n_j^{(\perp,\perp)}$, $n_j^{(\perp,1)}$, $n_j^{(1,\perp)}$ can observe a token in p_k^0 or p_k^1 where p_k is an input to n_j and move to the place corresponding to its updated information about the arguments.
- Let n_o be the output operation node. Any token can observe a token in n_o^1 and perform any move that would be allowed by some observation (ensuring the non-forgetting property), or move to n_a^1 .

The initial marking puts one token into each x_i^{\perp} and $n_j^{(\perp,\perp)}$.

Such a net is a non-forgetting IO net, and it is easy to see that any execution in this net from the initial marking corresponds to guessing some inputs and evaluating the circuit. In particular, the marking with all the tokens in n_{α}^{1} is reachable iff the circuit is satisfiable. This completes the proof.

B Second restriction: token counts

Below are the omitted or sketched proofs for the polynomial algorithm for reachability of no-near-miss pairs.

B.1 From solution flow to firing sequence

First we provide the details of the construction of a history from a solution flow.

We start with the history from M_i to M_m . We first produce an ordering of the triples (p, r, q) not in \mathcal{R} and not of the form (p, p, q), and associate a transition to each of them using the first reachability-based stability condition satisfied by our stable set \mathcal{R} . We initialize \mathcal{R}' to be the set of triples (p, r, q) not in \mathcal{R} and not of the form (p, p, q). Note that the first reachability-based stability condition ensures that for each allowed pair (p, q), the triple (p, p, q) is allowed.Indeed, a restriction set additionally forbidding the pair (p, q) violates the condition. While $\mathcal{R} \neq \mathcal{R}'$, we pick a transition $s \xrightarrow{o} d$ and triples $(p, s, q), (p', o, q') \notin \mathcal{R}'$ and $(p, d, q) \in \mathcal{R}' \setminus \mathcal{R}$. We number (p, d, q), associate to it the transition $s \xrightarrow{o} d$, remove it from \mathcal{R}' and continue.

We say a place r' is an *initially-reachable child* of place r for pair (p,q) if (p,r',q) was excluded from \mathcal{R}' because of some transition $r \xrightarrow{s} r'$. The notion of *initially-reachable descendant* is defined by transitive and reflexive closure over the initially-reachable child relation.

We define the first step of the history from M_i to M_m to consist of trajectories of length 1 such that there is exactly one trajectory in p for each triple (p, r, q)such that $r \in A(p,q)$. We label each trajectory with its triple (p, r, q). This first step corresponds to the marking M_i . The idea is to extend each trajectory of M_i labeled (p, r, q) from p until it reaches place r.

We construct the history by adding one step per triple in our ordering. At each new step i + 1, we maintain two things:

- If there is a trajectory τ with $\tau(i) = p$ then there is a trajectory τ' with $\tau'(i+1) = p$, i.e. a place once marked by the history stays marked.
- If \hat{r} is the last place of a (p, r, q)-labeled trajectory, then r is an initiallyreachable descendant of place \hat{r} for pair (p, q), and (p, \hat{r}, q) is the triple with the largest number in the ordering such that this holds.

Initially this holds as p is an ancestor for all $r \in A(p,q)$.

At each step, we pick the next triple (p, r', q) in the ordering. It is associated to a transition $\hat{r} \xrightarrow{s} r'$. For every place d which is a descendant of r', we extend trajectories labeled (p, d, q) with a step from \hat{r} to r'. The rest of the trajectories in the history are extended with "horizontal" steps preserving their current places. By construction, for some p', q' the triple (p', s, q') is earlier in the certificate, so the history includes a trajectory having already reached the place s and still in s, and so realizability is preserved. Eventually all the trajectories reach the place r of their label (p, r, q). As a trajectory marked with (p, r, q) reaches r and stays there

afterwards, the final marking puts in each place r exactly $\{(p,q) \mid r \in A(p,q)\}$, thus we reach the marking M_m .

We construct a realizable history from M_m to M_f in a symmetrical way. We produce an ordering of the triples (p, r, q) not in \mathcal{R} and not of the form (p, q, q), and associate a transition to each of them using the second reachability-based stability condition satisfied by our stable set \mathcal{R} . We define the symmetric notions of *finally-reachable child* and *finally-reachable descendant*. Then we construct the trajectories of the history from M_m to M_f , working backwards from M_f on trajectories labeled (p, r, q) from q until r.

We concatenate these two histories (identifying the trajectories labeled (p, r, q)in them) to obtain a history from M_i to M_f with $|A(p,q)| \leq |P| \leq f(v_p^i, v_q^f)$ trajectories from p to q. We pick an arbitrary trajectory from p to q and increase its multiplicity in the multiset by $f(v_p^i, v_q^f) - |A(p,q)|$. We do this until there are $f(v_p^i, v_q^f)$ trajectories for every pair of places (p,q). This provides a realizable history from M to M'. Realizability is preserved as the sets of steps at each position in the history stay the same and only multiplicities change. Such changes cannot create a violation of the realizability criterion.

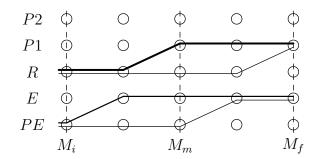


Fig. 6: A history obtained from a solution flow and a stable set of restrictions. Bold trajectories are taken with multiplicities 199 and 399.

Example 12. In our running example, from the previously shown restrictions and solution flow in Example 9, we can obtain the history illustrated in Figure 6 with 199 copies of trajectory PE, E, E, E, E, 1 copy of PE, PE, PE, E, E, 399 copies of R, R, P1, P1, P1, and 1 copy of R, R, R, P1. Note that this history results from a certain ordering, and that a different ordering provides a different history.

B.2 Correctness given a stable restriction set

Lemma 1. The near-miss reports are correct.

Proof. A near miss is reported in two cases. In the first case, the report arises because decreasing capacity c of flow graph G = (V, A, c) by |P| along the b

allowed pairs of \mathcal{R} is impossible. In this case, M, M' is a near-miss pair as there are less than $|P|^2$ tokens in some marked place of M or M'. This can be seen by examining sets $X = \{p\}$ and $Y = \emptyset$, or $X = \emptyset$ and $Y = \{p\}$ in the definition of a near-miss.

In the second case, the report arrises because decreasing capacity c of flow graph G = (V, A, c) by |P| along the b allowed pairs of \mathcal{R} leads to a maximum flow value less than $|M| - b \times |P|$. We call c' the capacity post-decrease, and note G' = (V, A, c'). Equality of the minimum cut and the maximum flow gives existence of a cut in G' with capacity less than $|M| - b \times |P|$. Consider such a cut (V_I, V_O) of capacity $\kappa' < |M| - b \times |P|$. We write κ the capacity of cut (V_I, V_O) in G before the decrease operation. Since the maximum flow, and thus minimum cut, of G is |M|, we have $\kappa \ge |M|$. Therefore there exists an allowed pair (p,q) such that the arcs (i, v_p^i) and (v_q^f, o) both cross the cut, as otherwise $\kappa' \ge |M| - b \times |P|$. Since the restriction set is stable, decreasing by 1 along any allowed pair keeps any cut capacity in G bigger or equal to |M| - 1. Thus we have $\kappa > |M|$. By structure of G and G', the decreasing operation can reduce a cut capacity by at most $2b \times |P|$. So $\kappa - \kappa' \le 2b|P|$, and using the inequalities above as well as the fact that there are at most $b \le |P|^2$ allowed pairs, we get $|M| < \kappa < |M| + |P|^3$.

Consider the following two vertex sets based on cut (V_I, V_O) . Let $X = V_I \cap \{v_p^i | p \in P\}$ and $Y = V_I \cap \{v_p^f | p \in P\}$. Our cut is finite, so only finite capacity arcs cross it, namely the arcs from the inlet to vertices v_p^i and from vertices v_p^f to the outlet. The capacity in G of this cut is thus $\kappa = M(P \setminus X) + M'(Y)$. Since $|M| < \kappa < |M| + |P|^3$ and |M| = M(P), we know $0 < M(P \setminus X) + M'(Y) - M(P) < |P|^3$. By set considerations $M(P) - M(P \setminus X) = M(X)$, and so finally $0 < M'(Y) - M(X) < |P|^3$. The sets X, Y prove that M, M' are a near-miss.

Lemma 2. The algorithm runs in polynomial time given a stable set of restrictions.

Proof. First the algorithm computes a stable set of restrictions. To this end it repeatedly finds violations of stability conditions and deduces additional restrictions.

A check of flow-based stability conditions requires a computation of maximum flow in the flow graph corresponding to the current restriction set, then one additional maximum flow computation for each allowed pair. A check of reachability-based stability conditions can be performed by repeated enumeration of possible combinations of three triples and verification of existence of corresponding transitions. It is clear that both checks can be implemented in polynomial time.

Each iteration either terminates the algorithm or adds at least one new triple to the set of known correct restrictions. As the total number of triples is polynomial and each iteration takes polynomial time, the total runtime of computing a stable set is polynomial.

If a stable set of restrictions is found, a solution flow can be found by a maximum flow algorithm, unless a near-miss is reported.

If a near-miss is reported, a proof can be constructed either directly by checking all the token counts, or by running a minimum cut algorithm.

If a solution flow is found, a history constructed contains two steps per allowed triple, one in M_i to M_m and one in M_m to M_f . The numbering of triples for each part can be built by enumerating combinations of three triples, then a pass through the numbering is enough to build reachability child relations. One more traversal of the numbering, adding one step to each trajectory at each step, is enough to build the half-history.

To construct a firing sequence it suffices to enumerate all pairs of horizontal and non-horizontal steps at each position in the history, and check all the transitions for each pair. Note that identical steps of different trajectories need not be considered separately.

We observe that all the steps can be performed in polynomial time.