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# Timed Petri Nets and Performance Evaluation of Systems

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#### Abstract

Several simple applications of timed Petri nets to modeling and performance analysis of concurrent systems are presented as an illustration of a uniform approach to analysis of a wide class of discrete–event systems. Such a unified approach is used in a graduate course on performance evaluation of systems at Memorial University.

## 1. INTRODUCTION

A graduate course on modeling and performance evaluation of systems, offered by the Department of Computer Science at Memorial University (CS–6726), covers a number of "standard" topics, including a brief introduction to discrete–event simulation and basics of queueing theory. It also contains a module (approximately two weeks) on modeling and evaluation of systems using timed Petri nets. Since this module is usually at the end of the course, it relies quite heavily of many concepts introduced earlier, like Markov and semi–Markov chains, stationary probabilities of states, solutions techniques, etc. The focus of this module is on modeling with Petri nets and then analysis and evaluation of the models.

Elemets of Petri net theory which are usually covered in this module include:

- basic concepts of ordinary Petri nets [1, 10, 12], bounded and unbounded nets, liveness and deadlocks, reachability graph;
- place and transition invariants [12], properties of nets based on invariants;
- inhibitor arcs and priorities;
- introduction to colored nets [9], token attributes and transition occurrences, unfolding into place/transition nets;
- timed [14, 8] and stochastic [3] nets, states and state transitions, deterministic and stochastic firing times; performance analysis.

Examples of timed Petri net models used for illustrations cover a wide range of systems:

- simple models of interactive systems; exhaustive reachability analysis, repeated for different values of model parameters, produces well-known characteristics of response time or throughput as a function of the initial marking;
- models of simple communication protocols with failures and timeouts used for recovery; the performance characteristics are obtained by reachability analysis and also by net reductions;
- models of multiprocessor systems; model symmetries are used for a straightforward conversion to colored nets; because of the size of the model, results are obtained by discrete–event simulation of the net model.

Evaluation of net models can be quite involved as it requires maintaining and updating detailed state descriptions of the model. It is, therefore, not surprising that many different tools have been developed for analysis of a variety of net types [7]. A collection of software tools developed for analysis of timed Petri net models, TPN-tools [15, 16], has a modular structure with common internal representation of models and a common 'language' for the specification of modeling nets. TPNtools support reachability analysis (with a simple interpreted language for extracting performance information from the generated state space), analysis of place and transition invariants, and also net simulation (with another simple interpreted language for post-processing of simulation results). TPN-tools accept a broad class of timed place/transition nets with arc weights, and also with inhibitor and interrupt arcs, as well as timed colored nets [15].

The remaining part of this paper discusses in greater detail several typical examples of timed net models. Section 2 provides a very brief overview of basic concepts of Petri nets and timed nets. Section 3 discusses a simple model of an interactive system; it also identifies some of many variations of this model including job classes and scheduling with and without preemption, unreliable and multiple processors. A model of a simple communication protocol is presented in Section 4, while Section 5 discusses a model of a more complex, distributed memory multithreaded architecture.

## 2. BASIC CONCEPTS

Petri nets have been proposed as a simple and convenient formalism for modeling systems that exhibit parallel and concurrent activities [1, 11, 12, 10]. In Petri nets, these activities are represented by the so called tokens which can move within a (static) graphlike structure of the net. More formally, a marked (place/transition) Petri net  $\mathcal{M}$  contains two basic components,  $\mathcal{M} = (\mathcal{N}, m_0)$ , the structure  $\mathcal{N}$  which is a bipartite directed graph,  $\mathcal{N} = (P, T, A)$ , where P and T are two disjoint classes of nodes, and A is a set of directed arcs,  $A \subseteq T \times P \cup P \times T$ , and an initial marking function  $m_0$ , which assigns nonnegative numbers of tokens to places of the net,  $m_0 : P \rightarrow \{0, 1, ...\}$ . Place/transition Petri net models are also known as 'condition/event' systems as places usually represent conditions (in the most general sense), while transitions - events. If a nonzero number of tokens is assigned to a place, the place is 'marked', which means that the condition represented by it is satisfied. If all places connected by directed arcs to a transition are marked, the transition is 'enabled' and can fire (i.e., the event represented by this transition can occur). Firing a transition removes (simultaneously) a single token from each of the input places of the transition and adds a single token to each of the transition's output places. This creates a new marking in a net, a new set of enabled transitions, and so on. The set of all possible marking functions which can be derived in such a way is called the set of reachable markings (or the forward marking class) of a net. This set can be finite or infinite.

An important extension of the basic net model is addition of inhibitor arcs [2, 13]. Inhibitor arcs (which connect places with transitions) provide a 'test if zero' condition which is nonexistent in the basic Petri net. Nets with inhibitor arcs are usually called inhibitor nets. In inhibitor nets, a transition is enabled only if all places connected to it by directed arcs are marked and all places connected by inhibitor arcs are empty (i.e., not marked). Formally, the set *B* of inhibitor arcs is an additional element of the net structure,  $\mathcal{N} = (P, T, A, B), B \subset P \times T$ , and usually the same place cannot be connected by a directed and inhibitor arc with the same transition,  $A \cap B = \emptyset$ .

In order to study performance aspects of Petri net models, the duration of activities must also be taken into account and included into model specifications. Several types of Petri nets 'with time' have been proposed by assigning 'firing times' to the transitions or places of a net. In timed nets [14], firing times are associates with transitions, and transition firings are 'real-time' events, i.e., tokens are removed from input places at the beginning of the firing period, and they are deposited to the output places at the end of this period (sometimes this is also called a 'three-phase' firing mechanism as opposed to 'one-phase' instantaneous firings of transitions). All firings of enabled transitions are initiated in the same instants of time in which the transitions become enabled (although some enabled transitions cannot initiate their firings). If, during the firing period of a transition, the transition becomes enabled again, a new, independent firing can be initiated, which will 'overlap' with the other firing(s). There is no limit on the number of simultaneous firings of the same transition (sometimes this is called 'infinite firing semantics'). Similarly, if a transition is enabled 'several times' (i.e., it remains enabled after initiating a firing), it may start several independent firings in the same time instant.

In timed nets, the initiated firings continue until their termination. A special type of inhibitor arcs, called interrupt arcs, provides a convenient extension which can discontinue transition firings. If, during a firing period of a transition, any place connected to this transition by an interrupt arc becomes marked, the firing discontinues, and tokens removed from the transition's input places at the beginning of firing are returned to these places. Interrupt arcs do not increase the "modeling power" of net models, but they provide a very convenient addition.

In timed nets, the firing times of some transitions may be equal to zero, which means that the firings are instantaneous; all such transitions are called immediate (while the other are called timed). Since the immediate transitions have no tangible effects on the (timed) behavior of the model, it is convenient to 'split' the set of transitions into two parts, the set of immediate and the set of timed transitions, and to fire first the (enabled) immediate transitions, and then (still in the same time instant), when no more immediate transitions are enabled, to start the firings of (enabled) timed transitions. It should be noted that such a convention effectively introduces the priority of immediate transitions over the timed ones, so the conflicts of immediate and timed transitions should be avoided.

The firing times of transitions can be either deterministic or stochastic (i.e., described by some probability distribution function); in the first case, the corresponding timed nets are referred to as D-timed nets, in the second, for the (negative) exponential distribution of firing times, the nets are called M-timed nets (Markovian nets). In both cases, the concepts of state and state transitions have been formally defined and used in the derivation of different performance characteristics of the model [14].

### 3. M-TIMED NET MODELS

A very simple model of an interactive computer system is shown in Fig.1, in which place  $p_1$  represents the (idle) processor, transition  $t_1$  models a processor executing a job, place  $p_2$  is the queue of jobs waiting for execution, transition  $t_2$  represents the 'thinking time' of users, and place  $p_3$  is simply a termination of job execution (which immediately initiates thinking phase because there is no other condition of  $t_2$ 's firing). The initial marking function indicates one processor ( $p_1$ ) and three jobs waiting for execution in  $p_2$  (the number of active users in this model is equal to the sum of initial marking of  $p_2$  and  $p_3$ ).



Fig.1. A simple model of an interactive system.

If the queue of waiting jobs  $(p_2)$  is nonempty and the processor is available (i.e.,  $p_1$  is marked),  $t_1$  is enabled, and a job from  $p_2$  can start its execution by firing  $t_1$  and removing single tokens from  $p_1$  and  $p_2$ . The job execution time is an exponentially distributed random variable; its average value is associated with  $t_1$  as the firing time. When the firing of  $t_1$  ends, a token is deposited into  $p_3$  (the completed job) and into  $p_1$  (the processor becomes available for the execution of another job); if, at this instant of time,  $p_2$  contains a token, another firing of  $t_1$  is initiated (again by removing tokens from  $p_1$  and  $p_2$ ). The token deposited in  $p_3$  initiates firing of  $t_2$ ; the job just completed enters its 'thinking phase', which is another exponentially distributed random variable with its average value associated with  $t_2$ . When the firing of  $t_2$  is finished, a token is deposited into  $p_2$ as a new job waiting for execution.

It should be observed that, in the net shown in Fig.1,  $t_2$  can have any number of simultaneous firings (actually this number is limited by the initial marking of  $p_2$  and  $p_3$ ), while  $t_1$  can be firing at most once at any instant of time (because of one initial token in  $p_1$ ).

If the initial marking function assigns more than one token to  $p_1$ , the model changes to an interactive system with several parallel processors, in which several jobs can be executed at the same time.

The exponentially distributed firing times of transitions can be combined into hypo- and hyperexponential distributions (and thus approximate other distributions). Fig.2(a) shows a model of a twostage hypo-exponential server, and Fig.2(b) a twostage hyper-exponential server in which the two transitions form a free-choice structure, with 'choice' probabilities describing random selections [14].



Fig.2. A model of a hypo-exponential (a) and hyper–exponential (b) server.

A modification of the model from Fig.1, in which the processing time is hyper-exponentially distributed, and the thinking time is hypo-exponentially distributed, is shown in Fig.3. Many other variations of this model can easily be derived.



Fig.3. Another model of an interactive system.

A different type of modification of the basic interactive model is shown in Fig.4; in this case, there are two classes of jobs (and users), say A and B; class A is represented by  $t_1$ ,  $p_3$ ,  $t_2$  and  $p_2$ , class B by  $t_3$ ,  $p_5$ ,  $t_4$  and  $p_4$ . The processor is shared by both classes; either  $t_1$  can fire or  $t_3$ , but not both. Jobs of class A have priority in accessing the processor; the inhibitor arc from  $p_2$  to  $t_3$ disables  $t_3$  if there are any waiting jobs of class A ( $p_2$ ), so class A jobs are selected for processing ( $t_1$ ) before class B jobs (non-preemptive priority scheduling).



Fig.4. A system with two classes of jobs.

It should be noted that if the inhibitor arc in Fig.4 is replaced by an interrupt arc (interrupt arcs have a

black dot instead of the arrowhead), the model will represent preemptive scheduling of class A jobs, in which executing jobs of class B will be interrupted (and preempted of the processor) if a job of class A is ready for execution.

Yet another modification of the basic model of an interactive system is shown in Fig.5; in this case the processor is assumed to be unreliable, so it goes through 'operative' - 'inoperative' cycle, with both 'operative' and 'inoperative' periods of time that are exponentially distributed (but – most likely – with different average values). The 'operative' - 'inoperative' cycle is represented by the subnet  $t_4$ ,  $p_4$ ,  $t_3$  and  $p_5$ , in which the firing time of  $t_4$  represents the 'operative' periods of time, and the firing time of  $t_3$  – the 'inoperative' periods of time; it should be observed that whenever  $t_3$  fires, the 'processor' token is removed form  $p_1$ , so no job can be executed during the firing periods of  $t_3$ . The interrupt arc from  $p_4$  to  $t_1$  is used for processor failures during execution of (user) jobs; if a token is deposited into  $p_4$ during  $t_1$ 's firing, the firing is interrupted by the arc  $(p_4, t_1)$ , the job token is returned to  $p_2$ , the processor token returns to  $p_1$ , from where it is removed by firing  $t_3$ .



Fig.5. A system with unreliable processor.

It should be observed that the net shown in Fig.5 is structurally similar to the net shown in Fig.4 (with an interrupt arc instead of the inhibitor arc); the model of processor failures is thus similar to a higher priority class of jobs that (conceptually) preempt the processor (for a failure and its repair).

## 4. D-TIMED NET MODELS

A model of a simple communication protocol with a timeout mechanism, shown in Fig.6, is used as an illustration of timed nets with deterministic firing times [16].

The token in  $p_1$  represents a message which a 'sender'  $(p_1)$  sends to a 'receiver'  $(p_3)$  and which is confirmed by an acknowledgement sent back to the sender. The message is sent by firing  $t_1$ , after which a single token is



Fig.6. A model of a simple communication protocol.

deposited in  $p_2$  (the message) and in  $p_5$  (the timeout). Firing time of  $t_2$  represents the 'communication delay' of sending a message, and firing time of  $t_6$ , the timeout time. When the firing of  $t_2$  is finished, a token is deposited in  $p_3$ , the receiver.  $p_3$  is a free-choice place, so  $t_3$ and  $t_4$  are enabled simultaneously, but only one of them can fire; the random choice is characterized by 'choice probabilities' assigned to  $t_3$  and  $t_4$ .  $t_3$  represents (in a simplified way) the loss or distortion of the message or its acknowledgement; it  $t_3$  is selected for firing (according to its free-choice probability), the token is removed from  $p_3$  as well as from the model ( $t_3$  is a 'token sink'). In such a case the timeout transition  $t_6$  will finish its firing with no token in  $p_6$ ; the termination of  $t_6$ 's firing regenerates the lost token in  $p_1$ , so the message will be retransmitted. If the message is received correctly,  $t_4$  is selected for firing rather than  $t_3$ , and after another communication delay (modeled by  $t_5$ ), tokens are deposited in  $p_6$  and  $p_1$  (so another message can be sent to the receiver). The token in  $p_6$  interrupts the firing of  $t_6$ , so the 'timeout token' is returned to  $p_5$  and immediately removed by firing  $t_7$ .

All immediate transitions (i.e., transitions with zero firing time) are represented by (thin) bars, while timed transitions are represented by (black) rectangles. The firing times of timed transitions must be selected in such a way that the timeout time  $(t_6)$  is greater than the sum of the delays of sending a message  $(t_2)$  and an acknowledgement  $(t_5)$ .

The transition  $t_4$  may seem redundant in this model but in fact is required due to the restriction that all free-choice classes of transitions must be uniform, i.e., each free-choice class must contain either immediate or timed transitions but not both [14].

It should be noted that only a small modification of the net in Fig.6 is needed to represent a 'sliding window' protocol, i.e., a protocol with several messages in different stages of transmission/acknowledgement or recovery.



Fig.7. An outline of a 16-processor system (a) and a model of a distributed memory multithreaded system (b).

# 5. COLORED NET MODELS

In colored Petri nets [9], tokens have attributes called colors. Token colors can be modified by (firing) transitions and also transitions can have several different occurrences (or variants) of firing. The basic idea of colored nets is to 'fold' identical parts of an ordinary Petri net. The original set of places is partitioned into a set of disjoint classes, and each class is replaced by a single place with token colors indicating which of the original places the tokens belong to. Similarly, the original set of transitions is partitioned into a set of disjoint classes, and each class is replaced by a single transition with occurrences indicating which of the original transitions the firing corresponds to.

A timed net model of a distributed memory multithreaded architecture is used as an illustration of colored net models [17]. The distributed memory system is composed of a number processors connected by an interconnection network; Fig.7(a) outlines a 16-processor system with a two-dimensional torus-like interconnection network.

Each node in Fig.7(a) is a multithreaded processor. Fig.7(b) shows a model of a processor as well as its connection with the interconnection network (using two switches, Tsinp and Tsout), and the network itself (transitions TnetN, TnetE, TnetS and TnetW). The processor shown in Fig.7(b) performs context switching (i.e., switching from one thread to another) for each long–latency memory access (local or remote).

The execution of threads is modeled by transition Trun with place Proc representing the (available) processor (if marked) and Ready – the pool of threads waiting for execution. The initial marking of Ready represents the average number of threads. It is assumed that this number does not change in time.

The firing time of Trun is exponentially distributed (all other firing times are deterministic) and its average value represents the runlength of threads, i.e., the average number of instructions executed before context switching occurs. Context switching is represented by transition Tcsw (with its firing time).

Mem is a free-choice place, with a random choice of either accessing local memory (Tloc) or remote memory (Trem); in the first case, the request is directed to Lmem where it waits for availability of Memory, and after accessing the memory, the thread returns to the pool of waiting threads, Ready. Memory is a shared place with two conflicting transitions, Trmem (for remote accesses) and Tlmem (for local accesses); the resolution of this conflict (if both accesses are waiting) is based on marking-dependent (relative) frequencies determined by the numbers of tokens in Lmem and Rmem, respectively.

Requests for remote accesses are directed to *Rem*,

and then, after a sequential delay (the switch modeled by Sout and Tsout), forwarded to Out, where a random selection is made of one of the four (for this interconnection network) adjacent nodes (transitions TnetN, TnetE, etc. represent links NORTH, EAST, SOUTH and WEST in Fig.7(a)). Similarly, the node incoming traffic is collected from all neighboring nodes in *Inp*, and, after a sequential delay (Sinp and Tsinp), forwarded to Dec. Dec is a free-choice place with three transitions sharing it: Tret, which represents the satisfied requests reaching their 'home' nodes; Tgo, which represents requests as well as responses forwarded to another node (another 'hop'); and *Tlocal*, which represents remote requests accessing the memory at the destination node; these remote requests are queued in *Rmem* and served by Trmem when the memory module Memory becomes available.

Colors are used to 'fold' processors into a single model shown in Fig.7(b). Since transitions TnetN, ..., TnetWpass messages between processors of the system, they must transform the colors of tokens. A more detailed description of colors and their transformations is given in [17]; some performance results are also shown there.

### 6. CONCLUDING REMARKS

Timed Petri nets provide a high–level formalism (at the level of abstraction similar to queueing systems) for modeling a wide class of discrete–event systems. The models usually correspond very closely to the real, modeled systems, so the selection of parameters and interpretation of results is quite straightforward.

Since the evaluation of net models can be automated, it is not discussed in this paper. However, it should be indicated that the evaluation of complex models can be quite involved, and therefore systematic methods that can deal with complex models are needed. Hierarchical approach [4, 5, 6] may provide a satisfactory solution once it is better understood.

At Memorial, Petri nets are also used in several other (undergraduate and graduate) courses, for example, operating systems (for modeling systems of interacting processes) and computer architecture (for representing concurrent activities).

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