

## Modeling and Analysis of IoT Real-Time System Using TCPN

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**Abstract:** The time-sensibility is an important feature of Internet of Things (IoT). For the purpose of accurately modeling the IoT real-time systems with complex timing constraints and eliminating timing constraint conflicts, in this study, Timing Constraint Petri Net (TCPN) is chosen as an unitized modeling method of timing constraints and system orchestration process. A method of temporal behavior analysis and verification is presented to find and eliminate timing constraint conflicts from local and global viewpoints, respectively. Some important analysis and verification formulas are presented and proved. Via model analysis and verification, the period of validity of each system activity can be obtained, which facilitates the system monitoring and management. By an example, the effectiveness of the proposed method is illustrated. The proposed method can help to guarantee the timely and successful response of each system activity and furthermore, it can help to guarantee the stability and reliability of IoT real-time system.

**Key words:** Internet of things, real-time system, timing constraint Petri net, timing analysis

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### INTRODUCTION

In recent years, the technology of Internet of Things (IoT) has attracted highly attention of academia. IoT promotes the further developments of the existing technologies of sensing, computing and communication. Especially, IoT focuses on the real-time and intelligent interactions among humans, computers and things (Guo *et al.*, 2012). Unlike the traditional Internet and sensor networks, most IoT systems are real-time or time-sensitive systems (Shen *et al.*, 2010). For example, in a hospital IoT system, it is required that the monitor data of a patient in intensive care must be analyzed and processed on time and without any error. High stability and reliability become the basic characteristics of IoT. However, in an IoT real-time system, it is a difficult work to guarantee the system's stability and reliability, mostly due to the complex time restrictions on target events and system activities. These time restrictions are called system timing constraints. For example, an event is valid only if it happens within or after a time limit and a system activity is valid only if it starts and finished within or after a time limit. Except the whole response time of system needs to be satisfied, every process time of events and system activities must satisfy their timing constraints, respectively. Any violation of timing constraints will destroy the stability and reliability of IoT real-time system. Because there exist the time sequences and logic dependent relationships between system events and activities, timing constraint conflicts often happen after imposing a serials of timing constraints to an IoT real-time

system. Initial timing constraints imposed to an IoT real-time system usually are referred to as relative time limits, which only consider the local and individual timing requirements. When checking and verifying the correctness of the whole system timing constraints from a global viewpoint, timing constraint conflicts could be found. We need to consider the actual starting time and duration of every system event and activity according to their time sequences and logic dependent relationships, as well as transform the relative time limits to the absolute time limits. Therefore, timing constraint modeling and analysis of IoT real-time system become very important, which can facilitate the verification of timing constraints and the temporal management of large-scale IoT applications.

How to express the timing constraints is an important problem in the research of IoT real-time system modeling. In the work of Li *et al.* (2009), the period of time that an RFID (Radio Frequency Identification) event can legally live in a system is divided into different categories for controlling the time restrictions. Furthermore, they present a special data structure, which is called double level sequence list, to record the intermediate stages of events and to process the unordered event streams. In the work of Li *et al.* (2011), an IoT services modeling approach is proposed based on timed automata. The timing constraints of system activities are reflected as some clock variables. An activity can be executed only when an expression of clock variables is satisfied. These works have made a good job in the expression of timing constraints. However, these solutions remain hard to be

used to reflect the complex timing constraints of the IoT real-time system. A main reason is the timing constraints of the IoT real-time system include not only the lifecycles of system events and the executable periods of system activities but also the communication delay time, the system decision-making time and the actual duration of activities. Any missing of timing constraints will produce the untruthfulness of system model. In addition, multiple timing constraints could be imposed to a single activity. How to express timing constraints in this situation is not well solved in the works above mentioned.

The QoS support of IoT system is still an open issue that needs to be researched to meet the requirements of IoT scenarios (Atzori *et al.*, 2010). The analysis and verification of temporal characteristics are important steps to guarantee the QoS of IoT system. In the work of Funk *et al.* (2009), an analysis framework of IoT system is presented. In this framework, the data collection mechanisms can be dynamically refined and the collected data can be analyzed. Unfortunately, their work stop at the phase of conceptual design and the concrete system analysis methods still need to be researched. Some works concentrate on using the available time information of data to construct intelligent behaviors of system (Kortuem *et al.*, 2010; Munoz-Organero *et al.*, 2010). However, only simple temporal relations are analyzed in these works. How to verify the validity of intelligent behaviors with timing constraints is still not clear. Many technologies and methods, such as smart workflow (Giner *et al.*, 2010) and contextual reasoning (Garcia-Macias *et al.*, 2011), are researched to construct a self-adaptive IoT system. However, due to the lack of effectual temporal modeling method, the universality of these research results is restricted.

Being different from the related works, we focus on the modeling and analysis of IoT real-time system with complex timing constraints. The various timing constraints and the possible system orchestration processes are synthetically reflected by Timing Constraint Petri Net (TCPN) in this study. Based on the presented modeling method, we can conveniently transform the temporal context in real world to the corresponding timing constraints and impose them to the IoT real-time system. In order to guarantee the stability and reliability of system, the analysis methods of timing constraint information are described in detail in this study. In contrast with classical TCPN, more strict verification conditions of timing constraints are defined. Through modeling and analysis of timing constraint information, we can find the possible timing constraint conflicts and then adjust and eliminate them. In addition, the concrete activities which produce timing constraint conflicts can be

identified and the effectiveness of system can be predicted. The method presented in this study has high universality, which can help construct a robust IoT real-time system.

The main contribution of this study is twofold: (1) An unitized modeling method of complex timing constraints of IoT real-time system and system orchestration process and (2) An analysis and verification method of the timing constraints.

## THE TIMING CONSTRAINT SPECIFICATION AND MODELING OF IOT REAL-TIME SYSTEM BASED ON TCPN

Here, first, the categories and basic relationships of timing constraints in IoT real-time system are discussed in detail. Then a modeling method of IoT real-time system is presented based on TCPN. Finally, a modeling example is described.

**The categories and basic relationships of timing constraints:** In a typical IoT real-time system, most system processes exist in temporal context and have timing constraints. After carefully analyzing various IoT real-time system, we divide timing constraints into three categories, which are defined as below.

**Definition 1:** Timing constraints to enable activities ( $tC_{enable}$ ): A  $tC_{enable}$  is a time interval, during which a condition to enable an activity can be satisfied and sustained. A  $tC_{enable}$  is a time pair denoted as ( $tC_{enable}^{min}, tC_{enable}^{max}$ ). A condition becomes true and may be used to enable an activity only between  $tC_{enable}^{min}$  to  $tC_{enable}^{max}$  after a task starts up.

The precondition that an activity can be enabled usually is the required resources have been acquired. In here, the resources have extensive contents, which include data, communication link, system memory and so on. After a task starts up, it needs some delay time to acquire these resources. For example, in a RFID application system, in order to complete a task, the RFID readers need to read the RFID tags and transfer the RFID data to the system for further processing. These actions will produce a delay time before the activity of data processing is enabled. Therefore, in a  $tC_{enable}$ , if a task starts up at time  $t_0$ , then  $tC_{enable}^{min}$  means the activity can be enabled only after a period of delay time from  $t_0$  to  $t_0 + tC_{enable}^{min}$ .

In addition, because every activity has a duration of execution, an activity can be successfully finished only when its enabling condition is satisfied and sustained no change in its execution duration. In another word, the acquired resources of the activity must be held on and

keep valid in the execution duration. The IoT real-time systems are often constructed in a dynamic and distributed environment. Most resources have their own temporal features. For example, the blood-pressure information of a patient in intensive care has a period of validity. If this information are not processed in time, they become invalid and must be acquired again for further intelligent analysis. Therefore, in a  $tC_{enable}$ , if a task starts up at time  $t_0$ , then  $tC_{enable}^{max}$  means the activity must be finished before the time  $t_0 + tC_{enable}^{max}$ .

**Definition 2:** Timing constraints of executable activities ( $tC_{executable}$ ): The  $tC_{executable}$  is the period of time that an activity can be executed after it is enabled. A  $tC_{executable}$  is a time pair denoted as  $(tC_{executable}^{min}, tC_{executable}^{max})$ . An activity can be executed only between  $tC_{executable}^{min}$  to  $tC_{executable}^{max}$  after it is enabled.

When all enabling conditions are satisfied, an activity is said to be enabled. An activity, which is enabled at time  $t_0$ , is said to be executable during the time period from  $t_0 + tC_{executable}^{min}$  to  $t_0 + tC_{executable}^{max}$ . After an activity is enabled, the system needs some time to verify the data or accomplish the data transformation. Therefore, the delay time from  $t_0$  to  $t_0 + tC_{executable}^{min}$  can not be ignored in an IoT real-time system. In addition, in order to guarantee the execution result can be acquired on time,  $tC_{executable}^{max}$ , as a execution deadline, is usually imposed to an activity.

**Definition 3:** Timing constraints on execution duration of activity ( $tC_{duration}$ ): The  $tC_{duration}$  is the execution time limit of an activity. It represents the amount of time an activity takes to perform its target task.

A  $tC_{duration}$  can be denoted as  $[tC_{duration}]$ . For example, [5] means an activity needs to spend 5 time units from its beginning to end. In contrast with  $tC_{enable}$  and  $tC_{executable}$ , a  $tC_{duration}$  only includes a single time variable. The actual beginning time of an activity is dynamically determined at run-time.

The categories and basic relationships of timing constraints in IoT real-time system are illustrated by Fig. 1. In three categories of timing constraints,  $tC_{enable}$  needs to be emphasized.  $tC_{enable}$  is associated with enabling conditions of activities. It is important to note that multiple enabling conditions are maybe imposed to a single activity. Therefore, there maybe exist multiple  $tC_{enable}$  to an activity. In this situation, the enabling period is determined by all  $tC_{enable}$  imposed to the activity. In Fig. 1, as an example, two  $tC_{enable}$  are imposed to an activity. The enabling period of this activity can be determined by the expression:

$$\text{Max}(t_01 + tC_{enable}^{min}, t_02 + tC_{enable}^{min}), \text{Min}(t_01 + tC_{enable}^{max}, t_02 + tC_{enable}^{max})$$

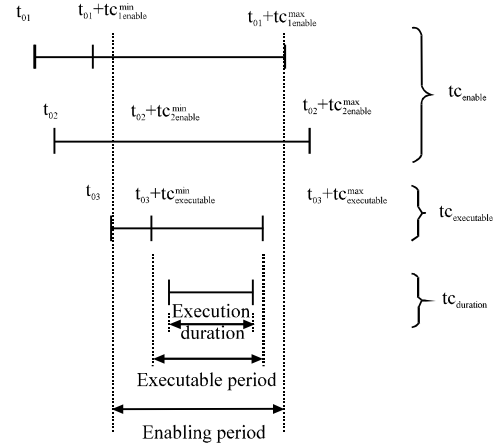


Fig. 1: The categories and basic relationships of timing constraints

in which  $t_01$  is the task startup time of  $tC_{enable}$  and  $t_02$  is the task startup time of  $tC_{enable}$ . In Fig. 1, we suppose  $t_01 + tC_{enable}^{min} < t_02 + tC_{enable}^{min}$  and  $t_01 + tC_{enable}^{max} < t_02 + tC_{enable}^{max}$ , then the enabling period of this activity is  $(t_02 + tC_{enable}^{min}, t_01 + tC_{enable}^{max})$ . Being different from the  $tC_{enable}$ , there is only one  $tC_{executable}$  imposed to an activity. In Fig. 1,  $t_03$  is the enabling startup time. In here,  $t_03 = t_02 + tC_{enable}^{min}$ . In order to guarantee the activity is executed successfully, the execution duration must less than or equal to the executable period, i.e.:

$$tC_{duration} \leq tC_{executable}^{max} - tC_{executable}^{min}$$

From above discussion, we can know the time variables in  $tC_{enable}$  and  $tC_{executable}$  are relative time variables without considering the actual startup time. There exist many activities and their timing constraints in an IoT real-time system. The execution sequence of activities will affect the actual startup time of the timing constraints. Therefore, we need to consider the initial startup time of the system, transform the relative time variables to absolute time variables and then verify the timing constraints from a global viewpoint. The detailed global analysis of timing constraints will be presented in subsequent content of this study.

**The modeling of timing constraints and system processes based on TCPN:** Petri nets are mainly used for modeling and analyzing the discrete systems with asynchronous, concurrent and non-deterministic features. The Timing Constraint Petri Net (TCPN) extends the basic Petri nets by associating places and transitions with timing constraints. TCPN has been proved suitable for modeling the systems with conflict structures. Once an IoT real-time system is modeled by a TCPN, we can detect the system

defects by formal verification and eliminate these problems. Especially, via verification of timing constraints, we can guarantee the IoT real-time systems meet the desired temporal demands.

**Definition 4:** Timing constraint Petri net (Tsai *et al.*, 1995)  
A TCPN is a 6-tuple  $(P, T, F, C, D, M)$  where:

- $P$  is a finite set of places, i.e.,  $P = \{p_1, p_2, \dots, p_m\}$
- $T$  is a finite set of transitions, i.e.,  $T = \{t_1, t_2, \dots, t_n\}$
- $F \subseteq (P \times T) \cup (T \times P)$  is finite set of arcs which connect places and transitions
- $C$  is a set of integer pairs,  $(TC_{\min}(pt_i), TC_{\max}(pt_i))$ , where  $pt_i$  is either a place or a transition
- $D$  is a set of firing durations,  $[FIRE_{\text{dur}}(pt_i)]$ , where  $pt_i$  is either a place or a transition
- $M$  is a set of marking with m-vector,  $(M_{(p_1)}, \dots, M_{(p_j)}, \dots, M_{(p_m)})$ , where  $M_{(p_j)}$  denotes the numbers of token in place  $p_j$ .  $M_0$  denotes the initial marking

A TCPN is an unitized model of timing constraints and system orchestration process. According to the above discussed timing constraint categories of IoT real-time system, based on TCPN, an IoT real-time system with complex timing constraints can be accurately described. The enabling conditions of system activities are represented by places. The tasks and resources of system are represented by tokens in places. An IoT real-time system timing constraint  $tC_{\text{enable}}$  with a time pair  $(tc_{\text{enable}}^{\min}, tc_{\text{enable}}^{\max})$  is represented by the time pair  $(TC_{\min}(p_i), TC_{\max}(p_i))$  on a corresponding place  $p_i$  in TCPN. The system activities are represented by transitions. An IoT real-time system timing constraint  $tC_{\text{executable}}$  with a time pair  $(tc_{\text{executable}}^{\min}, tc_{\text{executable}}^{\max})$  on an activity  $j$  is represented by the time pair  $(TC_{\min}(t_j), TC_{\max}(t_j))$  on transition  $t_j$  in TCPN. An IoT real-time system timing constraint  $tC_{\text{duration}}$  on an activity  $j$  is represented by  $[FIRE_{\text{dur}}(t_j)]$  on transition  $t_j$  in TCPN. The system states are represented by marking set  $M$ .

Some important modeling issues need to be explained as follow:

- The firing mode of transitions in TCPN is different from that in basic Petri net. In TCPN, a transition is said to be enabled if there is at least one token in each of its input places as well as each timing constraint on its input places is satisfied. After a transition is enabled, the transition is said to be fireable if the timing constraint on it is satisfied. The firing of a transition needs to spend a period of time, during which the enabling tokens are preserved. After a transition completes its firing successfully,

the movement of tokens from each input place to each output place of it spends no time

- TCPN follows the weak firing mode. Any enabled transition is not forced to fire immediately. When a transition in a conflict structure has a higher priority than others, this transition is often specified with an earlier deadline. Therefore, TCPN is suitable for modeling and analyzing the conflict structures
- For those places and transitions without explicit timing constraints associated with them, the default values of  $(TC_{\min}(pt_i), TC_{\max}(pt_i))$  is  $(0, \infty)$  and the default value of  $[FIRE_{\text{dur}}(t_i)]$  is  $[0]$

**A modeling example of IoT real-time system:** The patient monitoring systems are a class of typical IoT real-time systems. As a modeling example, first, the specifications of a patient monitoring system are listed as follow:

- **S1:** The physical information of a patient is sampled every 60 time units (TU). The activity of sampling takes 10 TU. After acquiring monitoring data, the system must response to emergent situations within 50 TU and response to normal situations within 50 TU
- **S2:** The verification and transformation of initial sampling data takes 5 TU. However, this activity must wait for 6 TU after the completion of sampling data due to the data transfer delay time
- **S3:** After the verification and transformation of initial sampling data, the system begins to analyze pulse, blood pressure and cardiogram data respectively in a parallel manner. The analysis of pulse takes 5 TU. The analysis of blood pressure takes 8 TU. The analysis of cardiogram takes 15 TU
- **S4:** After three kinds of individual data analysis, the results of analysis are associated together and a further synthesis analysis is performed. The activity of synthesis analysis takes 6 TU
- **S5:** The synthesis analysis result only can be used within 23 TU in order to avoid data invalidation.
- **S6:** Through contrasting between the result of synthesis analysis and the margin of safety preset for a patient, the system can determine whether an emergent situation occurs or not. Due to the communication delay of querying safety information from a external database, the activity of safety checking must wait for 4 TU and complete within 15 TU after the completion of synthesis analysis. The activity of safety checking takes 3 TU
- **S7:** If safety checking is successful, then the patient log file is updated. The activity of log update takes 5 TU

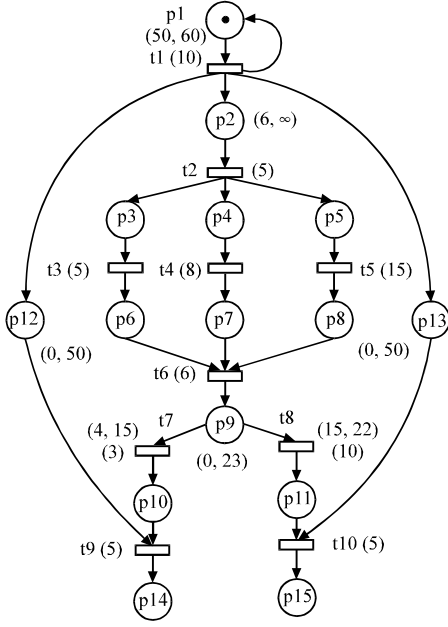


Fig. 2: The TCPN example of a patient monitoring system.

- **S8:** If safety checking is fail, i.e., an emergent situation occurs, then the system produces an alarm. The activity of emergency response must wait for 15 TU and complete within 22 TU after the completion of synthesis analysis. The activity of emergency response takes 10 TU
- **S9:** After the emergency response, it takes 10 TU to record the alarm information

According to the system specifications above described, we can transform them into a TCPN shown in Fig. 2.  $t_1$  represents the activity of data sampling.  $t_2$  represents the activity of data verification and transformation.  $t_3$ ,  $t_4$  and  $t_5$  represent three parallel activities, i.e., pulse analysis, blood pressure analysis and cardiogram analysis, respectively.  $t_6$  represents the activity of synthesis analysis.  $t_7$  represents the activity of safety checking. If  $t_7$  is fired and completed successfully, then the activity of log update, denoted as  $t_9$ , is executed. If  $t_7$  is not completed successfully, then the activity of emergency response, denoted as  $t_8$ , is executed. Therefore,  $t_7$  has a higher priority than  $t_8$  by specifying  $t_7$  with an earlier deadline.  $t_{10}$  represents the activity of recording the alarm information. The timing constraints in system specifications are imposed on corresponding places and transitions, respectively.

### THE TIMING CONSTRAINT ANALYSIS AND VERIFICATION OF IOT REAL-TIME SYSTEM BASED ON TCPN

After modeling an IoT real-time system by TCPN, the timing constraints in the model need to be verified to

avoid the timing constraint conflicts. In this section, first, we present a local verification method to find possible simple timing constraint conflicts. Then we present a global verification method to find complex and potential timing constraint conflicts. Different from classical TCPN (Tsai *et al.*, 1995) and some related works (Juan *et al.*, 2001; Dai *et al.*, 2008), more strict and practical verification conditions of timing constraints are analyzed and given.

In order to facilitate the expression and discussion, some abbreviative notations are defined as follow:

**Definition 5:**  $IP(t_j)$  is a set of input places of  $t_j$ ,  $OP(t_j)$  is a set of output places of  $t_j$ ,  $IT(p_i)$  is a set of input transitions of  $p_i$ ,  $OT(p_i)$  is a set of output transitions of  $p_i$ .  $EEBT(t_j)$  is the earliest enabling beginning time of  $t_j$ ,  $LFET(t_j)$  is the latest enabling ending time of  $t_j$ ,  $EFBT(t_j)$  is the earliest fire beginning time of  $t_j$ ,  $LFET(t_j)$  is the latest fire ending time of  $t_j$ .  $(EFBT(t_j), LFET(t_j))$  is the period of validity of  $t_j$ .  $Tk_{arr}(p_i)$  is the time at which a token arrives at place  $p_i$ .

**Local timing constraint analysis and verification:** As we can see in Fig. 2, the initial timing constraints imposed on a TCPN only include local temporal information, i.e., a timing constraint  $(TC_{min}(t_j))$ ,  $(TC_{max}(t_j))$  or  $[FIRE_{dur}(t_j)]$  only affects transition  $t_j$  and a timing constraint  $(TC_{min}(p_i))$ ,  $(TC_{max}(p_i))$  only affects the output transition of  $p_i$ . The token arrival time of place and the enabling startup time of transition are not considered. However, we can verify these initial timing constraints to find some possible timing constraint conflicts. Two basic verification conditions are listed as follow:

$$TC_{max}(pt_j) \geq TC_{min}(pt_j) \quad (1)$$

$$TC_{max}(t_j) - TC_{min}(t_j) \geq FIRE_{dur}(t_j) \quad (2)$$

The condition (Eq. 1) assures to form a correct time interval  $(TC_{min}(p_i))$ ,  $(TC_{max}(p_i))$ . The condition (Eq. 2) assures the executable period of  $t_j$  is greater than or equal to the actual execution period of  $t_j$ . In addition, we need to guarantee a transition's enabling period is long enough to support its execution, so another verification condition is listed as follow:

$$\forall p_i \in IP(t_j), \exists TC_{max}(p_i) - TC_{min}(p_i) - TC_{min}(t_j) \geq FIRE_{dur}(t_j) \quad (3)$$

We need to prove the necessity and correctness of condition (Eq. 3) by following theorem.

**Theorem 1:** If  $TC_{max}(p_i) - TC_{min}(p_i) - TC_{min}(t_j) < FIRE_{dur}(t_j)$  for any input place  $p_i$  of transition  $t_j$ , then  $t_j$  can not complete its firing process successfully.

**Proof:** A transition  $t_j$  can be fired only if it is enabled by every input place of  $t_j$  simultaneously and will stop firing once one of its input places stops enabling it. Therefore, it is obvious that the expression  $TC_{\max}(p_i) - TC_{\min}(p_i) \geq FIRE_{dur}(t_j)$  must be satisfied for any input place  $p_i$  of  $t_j$ . After being enabled,  $t_j$  must wait a delay time  $TC_{\min}(t_j)$  before it is fired, so the actual enabling period to guarantee the firing process of  $t_j$  is  $TC_{\max}(p_i) - TC_{\min}(p_i) - TC_{\min}(t_j)$  for any input place  $p_i$  of  $t_j$ . If  $TC_{\max}(p_i) - TC_{\min}(p_i) - TC_{\min}(t_j) < FIRE_{dur}(t_j)$ , then the enabling period will be over before the end of firing process of  $t_j$ , so the firing process will fail.

Some important problems related to local timing constraint verification need to be explained as follow:

- Even if all three conditions from Eq. 1 to 3 are satisfied, there is no guarantee that the firing process of a transition  $t_j$  will complete successfully. For example, in Fig. 3a, local verification condition 1-3 are all satisfied because  $10 > 2$ ,  $15 > 5$ ,  $9 > 1$ ,  $9 - 1 = 8 > [7]$ ,  $10 - 2 - 1 = 7 = [7]$  and  $15 - 5 - 1 = 9 > [7]$ . However, when the token arrival time of  $p_1$  is  $T_{01} = 6$  and the token arrival time of  $p_2$  is  $T_{02} = 0$ , then the absolute timing constraints imposed on  $p_1$  and  $p_2$  are (8,16) and (5,15), respectively. Therefore, the absolute enabling period is (8,15) and the absolute executable period is (9,17). Under the combined constraints coming from the absolute enabling period and the absolute executable period, the period of validity to guarantee the firing process of  $t_1$  is (9,15). Because  $15 - 9 = 6 < [7]$ ,  $t_1$  can not complete its firing process successfully
- Some classical TCPN analysis methods are not strict enough to be used to find timing constraint conflicts in local verification process. For example, in the research of Tsai *et al.* (1995), when the arrival times of tokens in each input place are not considered, a transition  $t_j$  is called a Weakly Schedulable Transition (WST) if and only if:

$$\begin{aligned} EFBT(t_j) &= \text{Max}\{TC_{\min}(p_i)\} + TC_{\min}(t_j) \\ LFET(t_j) &= \text{Min}\{TC_{\max}(p_i)\} + TC_{\max}(t_j) \\ LFET(t_j) &\geq EFBT(t_j) \text{ and } LFET(t_j) - EFBT(t_j) \geq FIRE_{dur}(t_j) \end{aligned}$$

where,  $p_i \in IP(t_j)$ .

However, in fact, even if a transition is not a WST, it can still complete its firing process successfully in some situation. For example, in Fig. 3a,  $EFBT(t_1) = \text{Max}\{2, 5\} + 1 = 6$ ,  $LFET(t_1) = \text{Min}\{10, 15, 9\} = 9$  and  $LFET(t_1) - EFBT(t_1) = 9 - 6 = 3 < [7]$ , so  $t_1$  is not a WST. However, in run time, if the token arrival time of  $p_1$  is  $T'_{01} = 4$  and the token arrival time of  $p_2$  is  $T_{02} = 0$ , then the enabling intervals of  $p_1$  and  $p_2$  are (6,14) and (5,15), respectively. Therefore, the absolute enabling period is (6, 14) and the absolute executable period is (7, 15). Under the combined constraints coming from the absolute

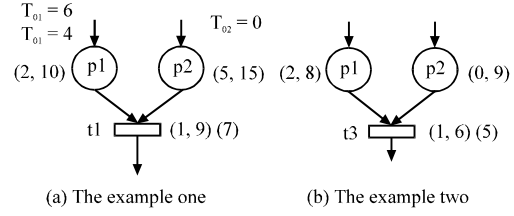


Fig. 3(a-b): The examples of timing constraint analysis and verification

enabling period and the absolute executable period, the period of validity to guarantee the firing process of  $t_1$  is (7,14). Because  $14 - 7 = 7 = [7]$ ,  $t_1$  can complete its firing process successfully.

**Global timing constraint analysis and verification:** Via local verification, only some simple timing constraint conflicts can be found. In order to guarantee all transitions can successfully complete their firing processes under the system timing constraints, we need to make global timing constraint analysis and verification. The initial marking  $M_0$  and the arrival times of tokens in each place must be taken into account. The functional analysis and verification to a TCPN model can be performed by existing Petri net analysis technology, such as reachability analysis, without considering timing constraints. Therefore, we only focus on timing constraint analysis and verification to guarantee the correctness of system timing behaviors.

**Theorem 2:** When each of the input places of a transition  $t_j$  has a certain token arrival time,  $t_j$  can successfully complete its firing process if and only if:

$$\begin{aligned} EFBT(t_j) &= \text{Max}\{TK_{arr}(p_i) + TC_{\min}(p_i)\} + TC_{\min}(t_j) \\ LFET(t_j) &= \text{Min}\{\text{Max}\{TK_{arr}(p_i) + TC_{\min}(p_i)\} + TC_{\max}(t_j), \\ &\quad \text{Min}\{TK_{arr}(p_i) + TC_{\max}(p_i)\}\} \text{ and } LFET(t_j) - EFBT(t_j) \geq FIRE_{dur}(t_j) \end{aligned}$$

where,  $p_i \in IP(t_j)$ .

**Proof:** The enabling period ( $EEBT(t_j)$ ,  $LEET(t_j)$ ) of  $t_j$  is determined by every enabling interval on the input places of it, so:

$$\begin{aligned} EEBT(t_j) &= \text{Max}\{TK_{arr}(p_i) + TC_{\min}(p_i)\} \text{ and} \\ LEET(t_j) &= \text{Min}\{TK_{arr}(p_i) + TC_{\max}(p_i)\} \end{aligned}$$

where  $p_i \in IP(t_j)$ .

When considering the enabling startup time, i.e.,  $EEBT(t_j)$ , the absolute executable period of  $t_j$  is ( $EEBT(t_j) + TC_{\min}(t_j)$ ,  $EEBT(t_j) + TC_{\max}(t_j)$ ). Therefore, under

the combined constraints coming from the enabling period and the executable period, the period of validity (EEBT( $t_i$ ), LFET( $t_i$ )) is:

$$\begin{aligned} \text{EFBT}(t_i) &= \text{EEBT}(t_i) + \text{TC}_{\min}(t_i) = \\ &\quad \text{Max}\{\text{TK}_{\text{arr}}(p_i) + \text{TC}_{\min}(p_i)\} + \text{TC}_{\min}(t_i) \text{ and} \\ \text{LFET}(t_i) &= \text{Min}\{\text{EEBT}(t_i) + \text{TC}_{\max}(t_i), \text{LEET}(t_i)\} \\ &= \text{Min}\{\text{Max}\{\text{TK}_{\text{arr}}(p_i) + \text{TC}_{\min}(p_i)\} + \text{TC}_{\max}(t_i), \\ &\quad \text{Min}\{\text{TK}_{\text{arr}}(p_i) + \text{TC}_{\max}(p_i)\}\} \end{aligned}$$

where,  $p_i \in \text{IP}(t_i)$ . If  $\text{LFET}(t_i) - \text{EFBT}(t_i) > 0$ , then  $t_i$  can be fired successfully. However, only when  $\text{LFET}(t_i) - \text{EFBT}(t_i) \geq \text{FIRE}_{\text{dur}}(t_i)$ ,  $t_i$  can complete its firing process successfully.

For example, in Fig. 3a, when  $\text{TK}_{\text{arr}}(p_1) = 6$  and  $\text{TK}_{\text{arr}}(p_2) = 0$ , according to Theorem 2,  $\text{EFBT}(t_i) = \text{Max}\{6+2, 0+5\} + 1 = 9$ ,  $\text{LFET}(t_i) = \text{Min}\{\text{Max}\{6+2, 0+5\} + 9, \text{Min}\{6+10, 0+15\}\} = 15$  and  $\text{LFET}(t_i) - \text{EFBT}(t_i) = 6 < \text{FIRE}_{\text{dur}}(t_i) = 7$ , so  $t_i$  can not complete its firing process successfully. However, when  $\text{TK}_{\text{arr}}(p_1) = 4$  and  $\text{TK}_{\text{arr}}(p_2) = 0$ , according to Theorem 2:

$$\begin{aligned} \text{EFBT}(t_i) &= \text{Max}\{4+2, 0+5\} + 1 = 7 \\ \text{LFET}(t_i) &= \text{Min}\{\text{Max}\{4+2, 0+5\} + 9, \\ &\quad \text{Min}\{4+10, 0+15\}\} = 14 \text{ and} \\ \text{LFET}(t_i) - \text{EFBT}(t_i) &= 7 = \text{FIRE}_{\text{dur}}(t_i) = 7 \end{aligned}$$

so  $t_i$  can complete its firing process successfully.

In contrast with classical TCPN analysis methods, Theorem 2 is more strict and exact. For example, in the research of Tsai *et al.* (1995), when the arrival times of tokens are considered, a transition  $t_i$  is called a Strongly Schedulable Transition (SST) if and only if:

$$\begin{aligned} \text{EFBT}(t_i) &= \text{Max}\{\text{Min}\{\text{TK}_{\text{arr}}(p_i)\} + \text{TC}_{\min}(p_i)\} + \text{TC}_{\min}(t_i) \\ \text{LFET}(t_i) &= \text{Min}\{\text{Max}\{\text{TK}_{\text{arr}}(p_i)\} + \text{Min}\{\text{TC}_{\max}(p_i)\}, \text{TC}_{\max}(t_i)\} \\ \text{LFET}(t_i) - \text{EFBT}(t_i) &\geq \text{FIRE}_{\text{dur}}(t_i) \end{aligned}$$

where,  $p_i \in \text{IP}(t_i)$ .

However, in fact, even if a transition is not a SST, it can still complete its firing process successfully in some situation. For example, in Fig. 3b, we suppose  $\text{TK}_{\text{arr}}(p_1) = 6$  and  $\text{TK}_{\text{arr}}(p_2) = 7$ . According to the definition of SST:

$$\begin{aligned} \text{EFBT}(t_3) &= \text{Max}\{6+2, 6+0\} + 1 = 9 \\ \text{LFET}(t_3) &= \text{Min}\{7 + \text{Min}\{8, 6\}, 7 + \text{Min}\{9, 6\}\} = 13 \text{ and} \\ \text{LFET}(t_3) - \text{EFBT}(t_3) &= 13 - 9 = 4 < [5] \end{aligned}$$

so  $t_3$  is not a SST. However, through analysis, we can know the absolute enabling period of  $t_3$  is  $(\text{Max}\{6+2, 7+0\}, \text{Min}\{6+8, 7+9\}) = (8, 14)$  and the absolute executable period is  $(8+1, 8+6) = (9, 14)$ . Therefore, the period of validity of  $t_3$  is  $(9, 14)$ . Because  $14 - 9 = 5 = [5]$ ,  $t_3$  can complete its firing process successfully. According to Theorem 2, we also can get the period of validity of  $t_3$  is  $(9, 14)$ .

It is important to note TCPN follows weak firing mode, which does not force any enabled transition to fire immediately. Therefore, in most situations, the token arrival time of a place  $p_j$  has a time interval denoted as  $(\text{ETK}_{\text{arr}}(p_j), \text{LTK}_{\text{arr}}(p_j))$ .  $\text{ETK}_{\text{arr}}(p_j)$  is the earliest token arrival time of  $p_j$  and  $\text{LTK}_{\text{arr}}(p_j)$  is the latest token arrival times of  $p_j$ .

**Theorem 3:** The token arrival time interval of a place  $p$  can be got by following formulas:

$$\begin{aligned} \text{ETK}_{\text{arr}}(p) &= \text{Min}\{\text{EFBT}(t_i) + \text{FIRE}_{\text{dur}}(t_i)\} \text{ and} \\ \text{LTK}_{\text{arr}}(p) &= \text{Min}\{\text{LFET}(t_i)\} \end{aligned}$$

where,  $t_i \in \text{IT}(p)$ .

**Proof:** A transition  $t_i$  ends its firing process earliest at  $\text{EFBT}(t_i) + \text{FIRE}_{\text{dur}}(t_i)$  and latest at  $\text{LFET}(t_i)$ . After  $t_i$  completes its firing process, the movement of tokens from each input place to each output place of  $t_i$  uses no time. Therefore, when multiple input transitions are considered:

$$\begin{aligned} \text{ETK}_{\text{arr}}(p) &= \text{Min}\{\text{EFBT}(t_i) + \text{FIRE}_{\text{dur}}(t_i)\} \text{ and} \\ \text{LTK}_{\text{arr}}(p) &= \text{Min}\{\text{LFET}(t_i)\} \end{aligned}$$

When the token arrival time interval needs to be considered, we calculate EFBT and LFET by forward and backward calculation respectively. In forward calculation, we suppose every transition is fired immediately once it can be fired, so the token arrival time is  $\text{ETK}_{\text{arr}}$  for every output place of these transitions, i.e.,  $\text{TK}_{\text{arr}}(p_i) = \text{ETK}_{\text{arr}}(p_i)$ . Therefore, after the initial token arrival time of a system is ascertained, we can calculate EFBT of every transition by Theorem 2 and 3 step by step. In backward calculation, if a transition  $t_j$  with bounded value of  $\text{LFET}(t_j)$  can be found, then we can calculate the LFET values for all the transitions which are fired before  $t_j$  based on the firing sequence. The backward calculation formula is presented in following Theorem 4.

**Theorem 4:** The latest fire ending time of  $t_i$  is:

$$\text{LFET}(t_i) = \text{Min}\{\text{LFET}(t_j) - \text{FIRE}_{\text{dur}}(t_j) - \text{TC}_{\min}(p_i)\}$$

where  $p_i \in \text{IP}(t_i)$  and  $p_j \in \text{OP}(t_i)$ .

**Proof:**  $\text{LFET}(t_i) = \text{FIRE}_{\text{dur}}(t_i)$  is the latest fire beginning time of  $t_i$ , so  $\text{LTK}_{\text{arr}}(p_i)$  is  $\text{LFET}(t_j) - \text{FIRE}_{\text{dur}}(t_j) - \text{TC}_{\min}(p_i)$ . When  $t_i$  has multiple output places, in order to guarantee each  $\text{LTK}_{\text{arr}}(p_j)$  is satisfied,  $\text{LFET}(t_i) = \text{Min}\{\text{LTK}_{\text{arr}}(p_j)\}$ .

For example, from system specification S1 in previous modeling example of a patient monitoring system, we know the system must response to emergent situations within 50 TU and response to normal situations within 50 TU after acquiring monitoring data. Therefore, in Fig. 2, if

we assume  $t_1$  ends its firing at  $T_0$ , then we can set  $LFET(t_9) = LFET(t_{10}) = T_0 + 50$  to guarantee the system makes response in time. According to Theorem 4, we can get:

$$LFET(t_9) = LFET(t_{10}) - FIRE_{dur}(t_9) - TC_{min}(p_{10}) = T_0 + 50 - 5 - 0 = T_0 + 45$$

Through forward and backward calculation, we can get EFBT and LFET of each transition. If  $LFET(t_i) - EFBT(t_i) < FIRE_{dur}(t_i)$ , then a global timing constraint conflict is found.

### AN EXAMPLE OF TIMING CONSTRAINT ANALYSIS AND VERIFICATION OF IOT REAL-TIME SYSTEM

We still use above mentioned patient monitoring system to make timing constraint analysis and verification. The initial TCPN model of the system has been shown in Fig. 2. First, we make local timing constraint verification via the local verification conditions (1) to (3). Two timing constraint conflicts can be found in the initial model. They are:

$$TC_{max}(t_8) - TC_{min}(t_8) = 22 - 15 = 7 < FIRE_{dur}(t_8) = (10)$$

$$\text{and } TC_{max}(p_9) - TC_{min}(p_9) - TC_{min}(t_8) = 23 - 0 - 15 = 8 < FIRE_{dur}(t_8) = (10)$$

To eliminate this two timing constraint conflicts, we relax the timing constraints by increasing  $TC_{max}(t_8)$  from 22 to 25 and  $TC_{max}(p_9)$  from 23 to 25, so that:

$$TC_{max}(t_8) - TC_{min}(t_8) = 25 - 10 = 15 > FIRE_{dur}(t_8) = (10) \text{ and}$$

$$TC_{max}(p_9) - TC_{min}(p_9) - TC_{min}(t_8) = 25 - 0 - 10 = 15 > FIRE_{dur}(t_8) = (10)$$

After eliminating local timing constraint conflicts, the TCPN model is shown in Fig. 4a.

Next, we make global timing constraint verification. In Fig. 4(a),  $t_1$  is a special transition with responsibility to sample the physical information of a patient. In fact, in the continual system running process,  $t_1$  runs in parallel with other transitions. Therefore, we assume  $t_1$  ends its firing at  $T_0$  according to the analysis tradition of TCPN.

We make forward calculation first. Based on Theorem 2, we can get:

$$EFBT(t_2) = Tk_{arr}(p_2) + TC_{min}(t_2) = T_0 + 6 + 0 = T_0 + 6$$

And then, based on Theorem 3, we can get  $ETK_{arr}(p_3) = EFBT(t_2) + FIRE_{dur}(t_2) = (T_0 + 6) + 5 = T_0 + 11$ . According to the analysis in previous subsection, we know  $Tk_{arr}(p_3) = ETK_{arr}(p_3)$  in forward calculation. Therefore, based on Theorem 2, we can get:

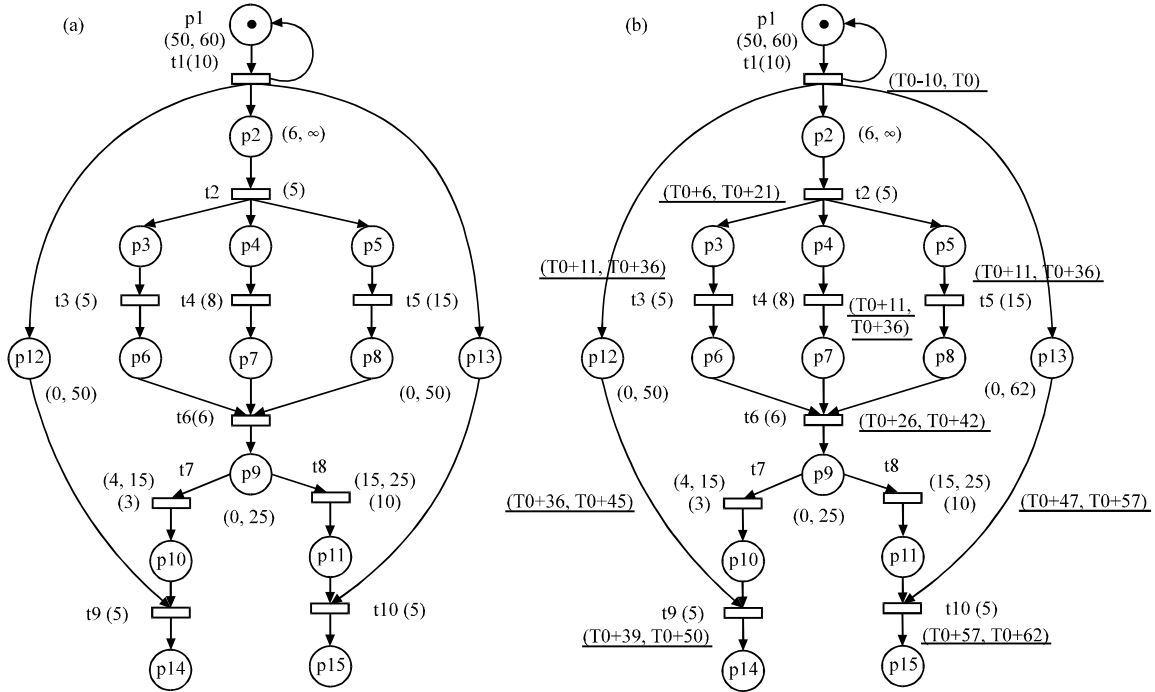


Fig. 4(a-b): The timing constraints analysis and verification of the patient monitoring system



Table 1: Results of global timing constraint analysis

	$t_1$	$t_2$	$t_3$	$t_4$	$t_5$	$t_6$	$t_7$	$t_8$	$t_9$	$t_{10}$
FIRE <sub>dur</sub>	10	5	5	8	15	6	3	10	5	5
EFBT	$T_0-10$	$T_0+6$	$T_0+11$	$T_0+11$	$T_0+11$	$T_0+26$	$T_0+36$	$T_0+47$	$T_0+39$	$T_0+57$
LFET	$T_0$	$T_0+14$	$T_0+29$	$T_0+29$	$T_0+29$	$T_0+35$	$T_0+45$	$T_0+45$	$T_0+50$	$T_0+50$

Table 2: Periods of validity of transitions in the final model

	$t_1$	$t_2$	$t_3$	$t_4$	$t_5$	$t_6$	$t_7$	$t_8$	$t_9$	$t_{10}$
FIRE <sub>dur</sub>	10	5	5	8	15	6	3	10	5	5
EFBT	$T_0-10$	$T_0+6$	$T_0+11$	$T_0+11$	$T_0+11$	$T_0+26$	$T_0+36$	$T_0+47$	$T_0+39$	$T_0+57$
LFET	$T_0$	$T_0+21$	$T_0+36$	$T_0+36$	$T_0+36$	$T_0+42$	$T_0+45$	$T_0+57$	$T_0+50$	$T_0+62$

$$EFBT(t_3) = Tk_{arr}(p_3) + TC_{min}(t_3) = (T_0+11)+0+0 = T_0+11$$

According to the same method, we can get the EFBT values of other transitions. The calculation results of EFBT are shown in Table 1.

After finishing forward calculation, we make backward calculation. In previous subsection, we have known  $LFET(t_9) = LFET(t_{10}) = T_0+50$  and  $LFET(t_7)-0-0 = T_0+45$ . According to Theorem 4, we can get  $LFET(t_8) = LFET(t_{10}) - TC_{min}(p_{11}) = (T_0+50) - 5 - 0 = T_0+45$ . Therefore:

$$LFET(t_6) = \text{Min}\{LFET(t_7) - FIRE_{dur}(t_{10}) - TC_{min}(p_9), LFET(t_8) - FIRE_{dur}(t_8) - TC_{min}(p_9)\} = \text{Min}\{T_0+45-3-0, T_0+45-10-0\} = T_0+35$$

According to the same method, we can get the LFET values of other transitions. The calculation results of LFET are shown in Table 1.

From Table 1, we can find two global timing constraint conflicts. They are:

$$LFET(t_8) - EFBT(t_8) = (T_0+45) - (T_0+47) = -2 < FIRE_{dur}(t_8) = (10) \text{ and } LFET(t_{10}) - EFBT(t_{10}) = (T_0+50) - (T_0+57) = -7 < FIRE_{dur}(t_{10}) = (5)$$

To eliminate this two timing constraint conflicts, we relax the timing constraint by increasing  $TC_{max}(p_{13})$  from 50 to 62, so that  $LFET(t_{10}) = T_0+62$ . Via recalculation, we get the periods of validity of transitions in the final model, in which there are no timing constraint conflicts left. The results of recalculation are shown in Table 2 and the final model is shown in Fig. 4b. The periods of validity of transitions are underlined in the final model.

## CONCLUSION AND FUTURE WORK

By using TCPN, an IoT real-time system with various categories of timing constraints can be modeled accurately. By taking advantage of the timing constraint analysis and verification methods presented in this study, the local and global timing constraint conflicts can be found and eliminated and the activities producing

conflicts can be ascertained. In addition, via analysis and calculation, the period of validity of each system activity, i.e., the absolute time range for a activity to execute, can be obtained. This facilitates the monitoring and management of the system activities. Through timely and successful response of each system activity, the high stability and reliability of IoT real-time system are guaranteed.

Some problems are left and still need to be resolved in the future work. When global timing constraint conflicts are found, we most probably eliminate them by adjusting multiple existing timing constraints. How to find a suitable adjustment scheme to reset new timing constraint values from a global viewpoint is a difficult and important problem. In addition, the algorithms of automatic model analysis and verification are needed for large-scale IoT applications. These problems will be researched in our future work.

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