Petri-net modeling of production systems based on production management data

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Abstract. Timed Petri nets can be used for the modeling and analysis of a wide range of concurrent discrete-event systems, e.g. production systems. This paper describes how to apply production management data and timed Petri nets to the modeling of production systems. Information about the structure of a production facility and about the products that can be produced is usually given in production-data management systems. We describe a method for using these data to algorithmically build a Petri-net model. The Petri-net model can be further used to develop different analyses of the treated system.

1 Introduction

Any production management information system requires a detailed plan of production operations. This can be achieved with a variety of software tools, which are capable of (near optimal) scheduling the operations that are performed on different manufacturing equipment, taking into account the finite number of available resources, precedence constraints, etc.

In general, an adequate model of the production process is needed in order to derive a feasible schedule that can be realized on the available manufacturing equipment. Within the changing production environment the effectiveness of production modeling is therefore a prerequisite for a successful scheduling system.

Petri nets (PN) represent a powerful graphical and mathematical modeling tool [9]. Many different extensions of classical PNs exist, and these are able to model a variety of real systems. In particular, timed Petri nets can be used to model and analyze a wide range of concurrent discrete-event systems [1], [4], [5], [14]. Several previous studies have addressed the timed Petri-net-based analysis of discrete-event systems. Lopez [7], for example, deals with the simulation of the deterministic timed Petri net for both timed places and timed transitions by using the firing-duration concept of time implementation. Petri nets can also be used in the design and operation of batch processes [8]. Aalst [2] discusses the use of Petri nets in the context of workflow management. There exists a lot of literature on the applicability of the PNs in the modelling, analysis, synthesis and implementation of systems in the manufacturing applications domain. For example, a comprehensive bibliography can be found in [15]. Authors in [10] show that management strategies can be appropriately modeled by means of PNs. Strategies that are considered in the article are push, pull and kanban strategy. Yu et al. [13] propose a

new class of Petri nets, called Buffer nets, for modeling flexible manufacturing systems (FMS). They present an approach that can build up a Petri net from a FMS specification language. Tacconi [11] used the discrete-event matrix state equation together with the Petri net state equation to obtain a complete dynamical description of a production system.

A Petri-net model can be used to analyze a modeled system. Logical properties, such as operability, the absence of deadlock, safety and hazards, etc. can be analyzed, verified and validated. When time is integrated into PN models, quantitive performance indices, such as cycle time, production rates and resource utilization, can be derived and evaluated. With this analysis different possible task schedules can be evaluated. The schedules obtained using PN theory are event-driven and deadlock free. Their other feature is that the completition time or makespan criterion is the optimization objective.

The information about the structure of a production facility and about the products that can be produced is usually given in the form of Manufacturing Resource Planning (MRP II) which is a common way to express the production management systems. With these systems an additional scheduling tool can be appended. In this configuration the company can plan future activities while anticipating the market, but at the same time being flexible enough to handle changes in the short term [3]. Czerwinski [6] proposed a method for scheduling products with the bill of the material (BOM), using an improved Lagrangian Relaxation technique. An approach presented by Yeh [12] maintains production data by using a bill of manufacture (BOMfr), which integrates the BOM and the routing data. Production data are then used to determine the production jobs that need to be completed in order to meet demands.

Our work is based on using the data from production management systems where the product structure is given in the form of the BOM and the process structure in the form of routings. These two groups of data items, together with the work centers as capacity units, form the basic elements of the manufacturing process. In this paper we propose a method for using these data to automate the procedure of building up the Petri-net model of a production system.

In the next section we describe timed Petri nets, where time is introduced by using the holding-durations concept. Section 3 describes a method for modeling the basic production activities with such a PN is described. In addition, the procedure for using existing data from production-data management systems to build a model of an overall production system is presented. Finally, the conclusions are presented in section 5.

2 **Timed Petri nets**

Petri nets are a graphical and mathematical modeling tool that is applicable to many systems. Using Petri nets it is possible to study information-processing systems that are characterized as being concurrent, asynchronous and parallel.

A Petri net is a bipartite directed graph with two types of nodes, called places and transitions. Nodes are interconnected by directed arcs. State of the system is denoted by distribution of tokens (called marking) over the places. A PN can be represented by the multiple $PN = (P, T, I, O, M_0)$, where:

- $P = (p_1, p_2, p_3, ..., p_n)$ is a finite set of places,

- $T = (t_1, t_2, t_3, ..., t_n)$ is a finite set of transitions,
- $I: (P \times T) \to \mathbb{N}$ is the input arc function. If k input arcs connect p_j to t_i , then $I(p_j, t_i) = k$.
- $O: (P \times T) \to \mathbb{N}$ is the output arc function. If k output arcs connect t_i to p_j , then $O(p_j, t_i) = k$.
- $M_0: P \to \mathbb{N}$ is the initial marking.

A transition t_j is enabled by a given marking if, and only if, $M(p_j) \ge I(p_j, t_i)$ for all $p_j \in P$. An enabled transition can fire, and as a result remove tokens from input places and create tokens in output places. If the transition t_j fires, then the new marking is given by $M'(p_j) = M(p_j) + O(p_j, t_i) - I(p_j, t_i)$.

An important concept in PNs is that of conflict. Conflict occurs between transitions that are enabled by the same marking, where the firing of one transition disables the other transition. Also, concurrency (parallel activities) can easily be expressed in terms of a PN. A situation where conflict and concurrency are mixed is called a confusion.

The concept of time is not explicitly given in the original definition of Petri nets. However, for the performance evaluation and scheduling problems of dynamic systems it is necessary to introduce time delays. As described in [4], there are three basic ways of representing time in Petri nets: firing durations, holding durations and enabling durations. The names given to Petri nets augmented with time vary greatly from one researcher to another. Time delays can be assigned to places or transitions. Given that a transition represents an event, it is natural that time delays should be associated with transitions. Holding durations work by classifying tokens into two types, available and unavailable. Available tokens can be used to enable a transition, whereas unavailable tokens cannot. To each transition a time duration is assigned, and when firing occurs, the action of removing and creating tokens happens instantaneously. However, the created tokens are not available to enable new transitions until they have been in their output place for the time specified by the transition that created them. This principle is graphically represented in Figure 1.

Fig. 1. Timed Petri net with holding durations

By using holding durations the formal representation of the timed Petri net is extended with the information of time, represented by the multiple $PN = (P, T, I, O, M_0, Timestamp, Time_t)$, where:

- $-P, T, I, O, M_0$ are the same as above,
- $Timestamp: P \to 2^{\mathbb{R}_0^+}$. To each place $p_i \in P$ a set of non-negative real numbers is associated, representing timestamps of tokens residing in the place.
- $-Time_t: T \to \mathbb{R}^+_0$ is the function that assigns to each transition $t_i \in T$ a time delay.

To each transition fixed time delay is associated as described with $Time_t$ function. The state of a timed Petri net is given by the distribution of tokens over the places and the corresponding timestamps of the tokens. To each token a non-negative real number (timestamp) is associated, which defines for how many time units the token remains unavailable. Available token has a timestamp with value 0. In any time interval, the marking is defined with $M = M_a + M_u$, such that M_a is made of available and M_u of unavailable tokens. A transition t_j is enabled by a given marking if, and only if $M_a(p_j) \ge I(p_j, t_i)$ for all $p_j \in P$. The firing of transitions is considered instantaneous. The model remains at a given model time as long as there are enabled transitions. A new marking is determined and the timestamps of tokens remain unchanged, while newly produced tokens receive the timestamps as prescribed with transitions that produced them. When no more transitions are enabled at the current time, the time is incremented as defined with the time increment. The values of timestamps are decremented for that value until enabling condition is satisfied again.

3 The modeling of production activities

In this section the modeling of production activities using timed Petri nets is presented. Many classes of PN can be used to describe production process like state machines, marked graphs, assembly Petri nets, etc., which can be used to describe production processes [15]. Aalst, in his work [4], provides a method for mapping scheduling problems onto timed Petri nets, where the standard Petri-net theory can be used. To support the modeling of scheduling problems, he proposed a method to map tasks, resources and constraints onto a timed Petri net. In this paper a different representation of time in Petri nets is used.

Here we present the method of describing the production system activities with timed Petri nets using the holding-duration representation of time. The places represent resources and jobs/operations, and the transitions represent decisions or rules for resources assignment/release and starting jobs.

As it can be seen from Figure 1 operation can be described with one place and two transitions. The transition t determines the processing time of an operation. During that time the created token is unavailable in place p.

An operation possibly needs resources, usually with a limited capacity, to be executed; this is illustrated in Figure 2. The token in place p_{R1} gives information about the availability of the resource. When the resource begins with the execution the unavailable token appears in place p_{1op} . After the time defined by transition t_{1in} the token becomes available and the resource becomes free to operate on the next job. For this reason zero time needs to be assigned to transition t_{1out} . To be able to define the time for the next operation place p_1 is added. There are common situations where more operations use the same resource, e.g. an AGV, mixing reactor. In that case the place noting the resource is connected to all those operations. Similarly, there are situations where a particular operation can be done on two different resources. This is represented as two coupled operations, between places p_0 and p_1 .

When parallel activities need to be described the Petri-net structure presented in Figure 3 is used. Transitions t_{11in} and t_{12in} define the duration of each operation.







Fig. 3. Two parallel operations

Precedence constraints are modeled by adding an extra place. Figure 4 shows the situation where the task presented with p_{1op} precedes the task presented with place p_{2op} .



Fig. 4. Precedence constraint

In Petri-net modeling, the place nodes can be used to represent the status of a resource (e.g., its availability), the stage of a process plant operation (e.g., undergoing) and a condition (e.g., its satisfaction). The presence of a token in a place indicates if a resource is available, a process plant operation is undergoing, or a condition is true (e.g., material is available). Transition nodes are used to model events, e.g., the starting and ending of an operation.

4 Modeling using the data from production management systems

In a production management system, e.g. MRP II, the product structure is given in the form of the BOM and the process structure in the form of routings. These two groups of data items together with the work centers as capacity units, form the basic elements of the manufacturing process. These data can be effectively used to build up a model of the production system with Petri nets. Here we provide a method for recognizing basic

production elements from the management system's database and using them to build up a Petri-net model of this production system.

The BOM is a listing or description of the raw materials and items that make up a (semi)product, along with the required quantity of each. It can be represented as BOM = (R, E, q, pre), where:

- -R is a root item,
- E are sub-items,
- -q are quantities of required items,
- pre is precedence constraints matrix. pre(i, j) = 1 indicates that *i*-th item precedes *j*-th item.

If any of the sub-items E is composed of any other sub-items, the same definition is used to describe its dependencies. Listings of all the items which appear in a product define the BOM structure of a product.



Fig. 5. BOM structure of product I (a) and its component M (b)

In Figure 5a there is an example of a BOM describing the production of product I. It is composed of three components, i.e. 3 items of J, one K item and two items of L. From the graph it is clear that item J has to be completed before the production of item K can begin – see dotted line. The BOM of product I would be represented as:

BOM = (R, E, q, pre), where $R = \begin{bmatrix} I \end{bmatrix}, \quad E = \begin{bmatrix} J \ K \ L \end{bmatrix}, \quad q = \begin{bmatrix} 3 \ 1 \ 2 \end{bmatrix} \text{ and } pre = \begin{bmatrix} 0 \ 1 \ 0 \\ 0 \ 0 \ 0 \\ 0 \ 0 \end{bmatrix}.$

Each of sub-items (in our case J, K or L) can be composed of sub-items from a lower level. In this case this sub-item represent a root item in the next BOM, defining from which sub-items is consisted from.

Each item from BOM is represented with a Petri-net structure PN_{Ei} . This structure is represented graphically in Figure 6. Item I is represented with the nodes t_{Iin} , p_{Iop} and t_{Iout} . To be able to prescribe how many of each item is required the transition t_{Rin} and the place p_{Rin} are added in front, and p_{Rout} and t_{Rout} are added behind this structure. The weight of the arcs that connect t_{Rin} and p_{Rin} and p_{Rout} and t_{Rout} determine the quantity q of the required items. In this way an item is represented with a timed PN defined as:

$$\begin{split} PN_{E_{i}} &= (P, T, I, O, M_{0}, Timestamp, Time_{-}t), \text{ where} \\ P &= \{p_{R_{in}}, p_{I_{op}}, p_{R_{out}}\}, \quad T = \{t_{R_{in}}, t_{I_{in}}, t_{I_{out}}, t_{R_{out}}\}, \quad I = \begin{bmatrix} 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & q \end{bmatrix} \\ O &= \begin{bmatrix} q & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix}, \quad \begin{array}{c} M_{0}(p_{i}) &= 0, \quad Timestamp(p_{i}) = \emptyset, \quad \forall p_{i} \in P, \\ n &= 1, \\$$



Fig. 6. PN structure representing one item in the BOM

The construction of the overall Petri net is an iterative procedure that starts with the root of the BOM and continues until all the items have been considered. If the item requires any more sub-assemblies (i.e. items from a lower level) the item is substituted with lower-level items. If there are more than one sub-items, they are given as parallel activities. In Figure 7 the PN_{Ei} structure of the previous example is given, where item I is composed of three sub-items: J, K and L. When one item had to be produced before another, the precedence constraints had to be introduced. In our case item J had to be finished before the production of item K could begin.



Fig. 7. Example of PN structure defined from the BOM

For each item that can appear in the production process the routing shows the sequence of production operations and associated work centers. The processing times are associated with each of the operations.

Each operation that appears in the routing represent basic production activity. Their Petri-net representations are placed in the model. Some of their representations are de-

scribed in previous section. The time durations of the operations are assigned to the transitions depicted as t_{in} . All the placed operations are connected as prescribed by the required technological sequence.

The required resources are assigned to the operations. Each resource that exists in the facility is represented by a place. If there are more operations that need the same resource, they are all connected to the place representing that resource. The capacity of a resource is demonstrated by the number of tokens in it.

A routing for item K is presented in Table 1. Three operations are needed to produce this item; the third takes 12 seconds, using the resource R3 and the second operation can be done on two different resources, but the first operation is defined with a product M. The structure of this semi-product is defined with a BOM described in Figure 5b.

Table 1. Routing of item I	Κ
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Operations	Duration	Resources
Op10	_	М
Op20	10s (9s)	R1 (R2)
Op30	12s	R3

The PN structure in Figure 8 is achieved if the sequence of operations described with a previous routing is modeled.



Fig. 8. Routing of item K modeled with timed Petri net

In this a way the routings are submodels that are inserted into the main model defined with the BOM. However, these sub-items can also be described with a BOM as it can be seen from the example in the case of first operation - Op10. The construction of the overall Petri-net model can be achieved by combining all of the intermediate steps. Products to be produced and required quantities of finished products are determined

by a work order (WO). A Petri-net model is build for each product as defined with BOM

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and routing data. At the end the Petri-net model should be verified and simplified, if possible. The modeling procedure can be summarized in the following algorithm:

Algorithm 1

[R, q] = readWO()
For i = 1 to length(R)
 PN = placePN(R(i), [], q(i), [])
 PN = routing(PN, R(i))
end

First, data about the WO are read. The products which are needed to be produced are given in vector R and in vector q the quantities of the desired products are passed. For each product first the Petri-net structure PN_{Ei} (see Figure 6) is determined and placed on the model. The weight q is assigned to the corresponding arcs. The step when the routing() is called is described in more detail with algorithm 2:

Algorithm 2

```
function routing(PN, R)
[E, q, pre] = readBOM(R)
datRoute = readRouting(R)
for i = 1 to length(datRoute.Op)
    if datRoute.Resources ==BOM
        PN1 = placePN(R, E, q, pre)
        for j = 1 to length(E)
            routing(PN, E(j))
            PN = insertPN(PN, PN1)
        end
    else
        PN = construct_PN(PN, datRoute)
    end
```

end

First, the routing and the BOM data are read from the database. For each operation that compose the routing, algorithm checks if it is made up of sub-item(s). If this is the case, function *placePN()* is used to determine the PN structure of a given BOM, see Figure 7. For each of those sub-items the routing data need to be implemented. With function *insertPN()* the resulted subnet is inserted in the main PN. If the operation represents the production operation function *constructPN()* is called. With it basic elements (Figures 2– 4) are recognized and placed in the model. All the data about resources and time durations are acquired from the routing table. A prototype of the described algorithm has been implemented in Matlab.

5 Conclusion

Production management data and timed Petri nets with the holding-duration principle were used to model production activities. In production management systems the product structure is usually given in the form of the BOM and the process structure in the form of routings. These two groups of data items, together with the work centers as capacity units, form the basic elements of the manufacturing process. A procedure for using existing data from production management systems to build the Petri-net model was developed.

The proposed method is an effective way to get an adequate model of the production process, which can be used to develop different analyses of the treated system, e.g. schedules. The intention of the future work is to make some additional tests of the provided method on the real manufacturing environment.

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