# DEPARTMENT OF COMPUTER AND MATHEMATICAL SCIENCES

Application of Petri Nets

in

Manufacturing Planning and Control

Gap Dewalagama Peter Cerone

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# **TECHNICAL REPORT**

# VICTORIA UNIVERSITY OF TECHNOLOGY (P O BOX 14428) MELBOURNE MAIL CENTRE MELBOURNE, VICTORIA, 3000 AUSTRALIA

TELEPHONE (03) 688 4249 / 4492 FACSIMILE (03) 688 4050

Footscray Campus

# APPLICATION OF PETRI NETS IN MANUFACTURING PLANNING AND CONTROL

GAP Dewalagama,

P. Cerone

#### ABSTRACT

This paper is concerned with the application of Petri nets in manufacturing planning and control. The modelling techniques of manufacturing systems using Petri nets are presented. To represent uncertain events such as processing time, machine failure and repair time etc. stochastic Petri nets are used. The SPNP package is utilised for the performance analysis of the resulting Petri net model. The most popular PC based design and drafting software package, AutoCAD is used to enhance the modelling power of SPNP by graphically generating the Petri net model. AutoLISP, which is an extension to AutoCAD is used to read the Petri net model from the graphic screen of AutoCAD and automatic generation of the source code for the SPNP package input file.

# **1** INTRODUCTION

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The behaviour of manufacturing systems is extremely complex and it is difficult to analyze theoretically. Thus a Petri net model may be used to analyze the behaviour of the manufacturing system in its design stage, performance and reliability evaluation, production planning and control and so forth.

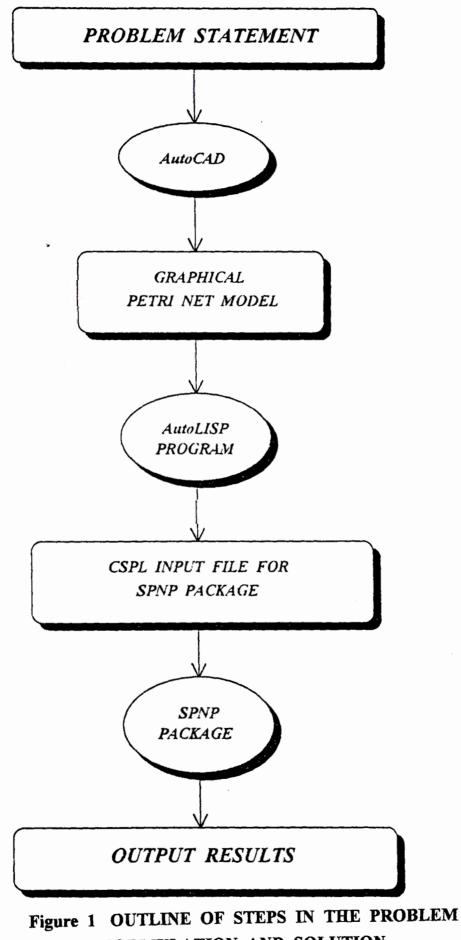
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One problem in simulating a manufacturing system is to describe the stochastic behaviour, such as variation of processing time, failure of machines, repair time etc. Stochastic Petri nets are effective tools for modelling the dynamic and stochastic behaviour of continuous-time discrete concurrent processes, [Hatono et al. (1989)]. They can be applied to model manufacturing systems under uncertainty.

The applicability of the Stochastic Petri net approach to anything but the smallest examples rests on the availability of efficient tools for the model construction and debugging, model analysis and simulation, computation of aggregate results and display of results. The user friendliness and the graphical capabilities of the tool are of paramount importance.

In this paper a manufacturing system using two processing machines and an assembly machine is modelled using Stochastic Petri nets. This stochastic Petri net is analyzed to obtain performance indices. The tool used is the Stochastic Petri Net Package (SPNP), developed at Duke University by Trivedi and coworkers, in which the stochastic Petri nets are described in the input language for SPNP called CSPL (C-based SPN Language). A drawback with the SPNP package is that it does not have a graphical interface.

To overcome the lack of a graphical interface, arguably the most popular PC based design and drafting software package, AutoCAD is used to generate the net model and an AutoLISP routine is used to read the net information from the drawing and to generate the source code in a format suitable for CSPL.



FORMULATION AND SOLUTION

# 2 STOCHASTIC AND GENERALISED STOCHASTIC PETRI NETS

A Stochastic Petri net can be defined as a tuple;

SPN = { P, T, 
$$\Pi(.)$$
, I(.), O(.), H(.), W(.), M<sub>0</sub> }, (1)

where  $PN = \{P, T, \Pi(.), I(.), O(.), H(.), M_0\}$  is the Petri net underlying the SPN defined above [Ajmone et al. (1991)]. The function W(.) defines the stochastic component of the SPN model, and it maps transitions into real positive numbers. For the transition  $t_i \in T$ , the function W(.), represented as  $w_i$  is called the 'rate' of the transition  $t_i$ . In the case where several transitions are simultaneously enabled, the transition that has the shortest delay time will fire first. An enabled transition  $t_i$  will not fire when it becomes disabled because of the firing of other transitions, before its firing time  $d_i$  has passed. A set of enabled transitions is said to be conflicted at time  $\tau$ , if for any pair of transitions  $t_i$  and  $t_j$  in the set,  $t_i$  becomes disabled when  $t_j$  is fired at time  $\tau$  or vice versa. Suitable conflict resolution strategies must be used to resolve such conflicts. For example, priority rules can be given for conflicting transitions to resolve conflicts.

In order to cope with the state-space explosion problem, stochastic Petri nets have been extended to a class of generalized stochastic Petri nets (GSPN), [Tadao Murata (1989)]. In a GSPN there are two types of transitions:

- Time delays associated with transitions are exponentially distributed random variables. These are called timed transitions, and are represented as bars, (
- Time delays associated with transitions are deterministically zero. These are called immediate transitions and are used to represent logical controls or activities whose delay times are negligible, compared with those associated with timed transitions. Immediate transitions are represented as boxes, ( \_\_\_\_\_\_).

Markings that enable only the timed transitions are called tangible markings and markings that enable immediate transitions are called vanishing markings. A marking which does not enable any transition is called an absorbing marking [Ajmone et al. (1991)]. A set of vanishing markings that are mutually reachable by immediate

transition firings is called a loop ( of vanishing markings ). A loop is said to be absorbing, if no marking in it reaches a marking outside the loop, otherwise the loop is said to be transient. An absorbing loop is considered an error. The dynamic behaviour of the **GSPN** is equivalent to a continuous-time stochastic process. In a vanishing marking, the probability values associated with the enabled immediate transitions are used to probabilistically select the enabled immediate transitions to fire. The time spent in any vanishing marking is deterministically equal to zero. Reduction of the statespace can be achieved by discarding vanishing markings that correspond to some intermediate states in which the system spends zero or negligible amount of time.

The Stochastic Petri net model is analyzed by studying the structural properties of the underlying Petri net and by computing the steady state or transient probability distribution of the associated stochastic model. The **SPN** model can be translated into continuous-time Markov chains, [ see Ajmone et al. (1991) ]. There are a large number of techniques available to analyze this kind of stochastic model.

Due to the memoryless property of the exponential distribution of firing delays, the reachability graph of a bounded stochastic Petri net is isomorphic to a finite state Markov Chain. The Markov Chain of a SPN can be obtained from the reachability graph of the Petri net underlying the SPN. The Markov Chain state space is the reachability set  $R(M_0)$ , of the Petri net.

Suppose the delay  $d_i$  associated with transition  $t_i$  is represented by a non-negative continuous random variable X with the exponential distribution function:

$$F_{x}(x) = Pr [X \le x] = 1 - e^{-W_{i}x}$$

The average delay time is given by:

$$\overline{\mathbf{d}_{i}} = \int_{0}^{\infty} [1 - \mathbf{F}_{\mathbf{x}}(\mathbf{x})] d\mathbf{x} = \int_{0}^{\infty} e^{-\mathbf{w}_{i}\mathbf{x}} d\mathbf{x} = 1/\mathbf{w}_{i} \quad (2)$$

Where  $w_i$  is the firing rate of transition  $t_i$  [Tadao Murata (1989)]. The transition rate from state  $M_i$  to state  $M_j$  is given by:

$$q_{ij} = w'_{i1} + w'_{i2} + \dots$$

(for transitions  $t_1, t_2, \ldots$  transforming  $M_i$  into  $M_j$ ). The square matrix  $Q = [q_{ij}]$  of order  $s = |R(M_0)|$  is known as the transition rate matrix.

For the reversible stochastic Petri net, i.e.  $M_0 \in R(M_i)$  for every  $M_i \in R(M_0)$ , it is possible to compute the steady-state probability distribution  $\Pi$ , [see, Tadao Murata (1989)] from the continuous-time Markov chain, by solving the linear system,

$$\Pi \mathbf{Q} = \mathbf{0}, \qquad \sum_{i=1}^{S} \pi_{i} = 1 , \qquad (3)$$

where  $\pi_i$  is the probability of being in state  $M_i$  and  $\Pi = (\pi_1, \pi_2, \dots, \pi_s)$ . From the steady-state distribution  $\Pi$ , it is possible to compute various performance indexes of a system modelled by a SPN. For example, [see Tadao Murata (1989)]:

#### 1. The probability of a particular condition.

Let A be the subset of the reachability set  $R(M_0)$ , satisfying a particular condition. Then the probability of satisfying the condition A is given by,

$$\mathbf{P}\{\mathbf{A}\} = \sum_{i \in A} \pi_{\mathbf{i}}$$
(4)

#### 2. The expected value of the number of tokens in a place pi.

Let B(i,n) be the subset of  $R(M_0)$  for which the number of tokens in a kbounded place  $p_i$  is n. Then, the expected value of the number of tokens in place  $p_i$  is given by,

$$\mathbf{E}[\mathbf{m}_{i}] = \sum_{n=1}^{k} n \mathbf{P}[\mathbf{B}(i,n)]$$
(5)

This can be used to compute the average queue length of a system such as a bank queue or an input buffer of a machine etc.

# 3. The mean number of firings of a transition $t_j$ , in unit time.

Let  $B_j$  be the subset of  $R(M_0)$  in which a transition  $t_j$  is enabled. Thus, the mean number of firings of transition  $t_j$  in unit time is given by,

$$\mathbf{f}_{\mathbf{j}} = \sum_{M_i \in B_j} \pi_{\mathbf{i}} \left( \mathbf{w}'_{\mathbf{j}} / - \mathbf{q}_{\mathbf{i}\mathbf{j}} \right)$$
(6)

Where  $w'_j$  is the firing rate of transition  $t_j$  and  $-q_{ij}$  is the sum of firing rates of transitions enabled at  $M_i$ , i.e. the transition rate leaving state  $M_i$ .

# **3** APPLICATION OF GENERALIZED STOCHASTIC PETRI NETS

Real-time control systems are, in general, highly concurrent by nature. Because of their conceptual complexity, the designer of such systems needs some help from specification through to implementation. Petri nets are among the most promising formal tools for managing concurrency. This approach needs a specification or modelling formalism in which the assertions expressing the properties under study can be mathematically proved. Thus it must be clear and unambiguous. The important features for a good specification formalism are, [Silva (1989)]:

- \* From the modelling point of view :
  - Practical expressive power, allowing the model building by means of stepwise refinement and modular composition methodologies.
  - Clear and explicit modelling of activities and events.
  - Graphical representation, as a way to improve the necessary dialog between designers and users, and as a way to facilitate documentation tasks.
- \* From the verification and analysis point of view :
  - The existence of a powerful analysis and verification theory to allow the formal verification of the specification. Properties can be of logical or qualitative nature such as dead-lock freeness, mutual exclusion, liveness, boundedness, reachability, fairness, etc., or performance indices or quantitative properties such as upper / lower bounds, average behaviour for throughputs, working ratios, queue lengths, etc..
  - The existence of computer packages to help the designer during the design, analysis and verification phases.

Petri nets fit reasonably well with the above features for the specification and analysis of concurrent systems for the following reasons, [Velilla et al. (1988)]:

- Petri nets provides an easy-to-understand and rigorous semantic of true concurrency.
- There exists an extensive body of theory that allows formal validation of Petri net models, such as boundedness and liveness properties, mutual exclusion, synchronic distance, fairness, etc.
- The graphical representation of Petri net models make them a well suited support for the necessary dialog between users and designers.
- The independence of implementation techniques. There are a wide variety of applications from programmable logic controllers to ADA based implementations.

There are several steps to be followed in the study of a system using the GSPN approach, [Ajmone et al. (1991)].

- The model must be constructed using a structural technique, using either top-down or bottom-up approach, depending on the type of the system to be modelled.
- The constructed model must be validated using structural analysis methods, possibly proving some behavioural properties of the model.
- The performance indices required, must be defined, in terms of GSPN markings and the transition firings.
- The reachability set and the reachability graph are generated, in order to obtain the continuous-time Markov chain, associated with the GSPN model.
- The Markov chain is solved.
- The performance indices are computed from the Markov chain solution.

These steps have to be performed using suitable software tools that provide the GSPN modelling environment with the graphical creation and modification of the model, the definition of performance indices, the structural analysis and the stochastic analysis of the model.

By using a Petri net based approach, formal specification and formal validation of the system under consideration can be easily achieved. If the model is a good abstraction of the system, the analyst can quickly carry out trade-off studies, answer "what if" questions, perform sensitivity analysis and design alternatives. As running of simulations can sometimes be very time consuming, it is useful for the system designers to use analytic models, instead of, or in addition to simulation models. Each kind of analytic model is well suited for some particular set of applications, but every model type also has its limitations.

Modelling tools for designing complex systems must be selected such that, qualitative and quantitative analysis can be achieved in an efficient manner. Markov chains and queuing network models have been used for the exact quantitative analysis. As discussed above, Petri net models have been introduced for designing, validating and computing performance measures of complex systems. In these models, either stochastic or deterministic timing interpretation is added to the autonomous Petri net scheme, as well as a given decision policy for the resolution of conflicts. Petri nets provide synchronization capabilities that are not allowed with classical queuing networks.

Stochastic Petri net models are 'state-space' models, that is, the analysis requires the generation of a 'state-space', an enumeration of the possibilities of what can happen to the system, [Sahner et al. (1991)]. However, certain kinds of real-life system structures and dependencies violate the assumptions made by these models. State-space methods, such as those based on Markov and semi-Markov models, can capture system dependencies. They are very widely applicable, but a possible large size of state-space can be a problem during model generation and model analysis. Another important feature is that the possibility to set up multiple models for the same underlying system. This is a good validity check for both the construction and analysis of the models.

In solving stochastic Petri net models the major drawback is the generation of the large state space of the underlying Markov model. To avoid the large state space explosion, Monte-Carlo simulation can be used. In addition, simulation allows the treatment of non-Markovian stochastic Petri nets as well. The major drawback of simulation is the potentially large execution time needed. An alternative to these costly approaches is the use of model decomposition and / or model reduction.

One decomposition approach is to decompose the system into subsystems and an SPN sub-model for each subsystem is developed. Then an overall model is composed from the constituent sub-models, taking into account various interactions among subsystems. This approach consists of taking advantage of the natural decomposition by solving subsystems in isolation and exchanging solution components as and when required.

In model reduction, some of the places and / or transitions which will not have any effect on the numerical results, are removed from the net model. As an example, for the computation of the numerical results the **GSPN** is simplified by eliminating the immediate transitions. This results in a small reachability set and a small reachability graph, but it does not affect the size of the continuous time Markov chain (**CTMC**) or the numerical results. In this approach the execution time and memory requirements savings are substantial.

The cost evaluation for the use of tools, there are two relevant aspects, [Velilla et al. (1988)]. The first aspect is the extra memory occupation, and the other is the time overhead in execution. Extra memory occupation is estimated based on the net structural parameters, such as the number of transitions (m), number of places (n), the amount of synchronization (number of input places per transition  $f_s$ ), the amount of parallelism (number of output places per transition  $f_p$ ), the amount of descendence (number of output transitions per place  $f_d$ ), and the amount of ascendance (number of input transitions per place  $f_a$ ). Of course, not all these parameters are independent. In particular,

$$f_s \cdot m = f_d \cdot n$$
 and  $f_p \cdot m = f_a \cdot n$ .

The estimation of time overhead can be done analogously. The time overhead depends on behavioural data like the mean number of tokens and their distribution in the net.

# **4** APPLICATION OF PETRI NETS TO MANUFACTURING SYSTEMS

#### Design and Performance Analysis

The design of a manufacturing system requires extensive performance evaluation, to be able to decide among alternatives. Typical performance figures are throughputs (product rates), work in process and time span for each product, machine utilizations (use ratios), queue lengths or time distributions to access machines or transport subsystems, and so on. Alternatives to be considered at this level are : different layouts and transport systems, number of machines in a given work station, machines of different speeds and stores of different sizes, for example.

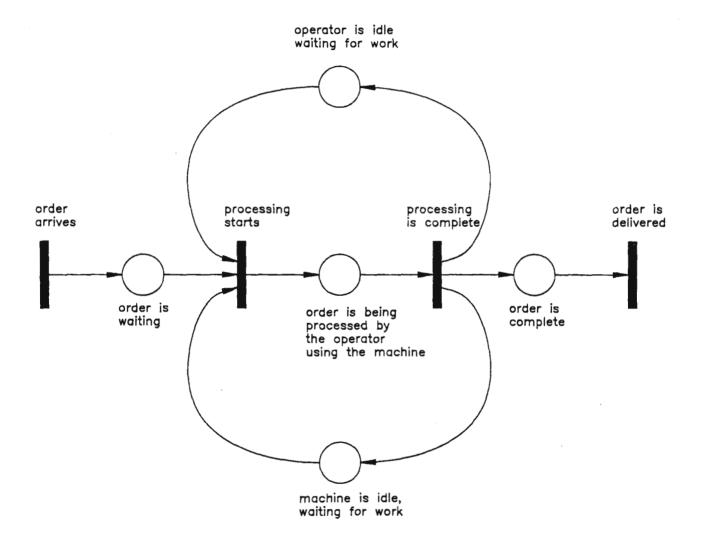
The introduction of stochastic or deterministic timing specification is essential if we want to use Petri net models for the performance evaluation of manufacturing systems. Since Petri nets are bipartite graphs, there can be two ways of introducing the concept of time in them, namely, associating a time interpretation with either places or transitions. Since transitions represent activities that change the state (marking) of the net, it seems natural to associate a duration with these activities (transitions). This allows the modeller to set up and solve a variety of model types, to compare results for different models of the same system, to see how altering system parameters affects measures of effectiveness of the system, and to experiment with modelling techniques.

Manufacturing systems are too complex, disruptions are frequent and human behaviour cannot be modelled by a set of equations. Therefore the aim is to design and control the manufacturing system in order to simultaneously meet the flexibility and optimality requirements. Unfortunately, these two requirements are frequently contradictory. For example, it is clear that it makes no sense to compute an optimal long term schedule for a system which is likely to be altered in the near future. Also, what is good for flexibility is frequently bad for optimality and vise versa, even at a detailed level. The concept of flexibility is relatively new and unformalized. It may be addressed by defining a set of acceptable solutions, rather than an optimal one. These acceptable solutions are defined by giving a set of constraints that have to be satisfied. In doing so, the control of the manufacturing system is no longer a strict hierarchy. The instances of exceptional situations such as emergency stoppages due to breakdowns, discarding of products, etc., can also be represented in the Petri net model for the manufacturing system. The occurrences of these exceptional situations can alter the net state and abort the tasks associated with transition firings. Constraints in a manufacturing system can define preferences relative to the time intervals surrounding the operations. Also some local constraints can define local preferences associated with the orders and resources involved in the conflict ( e.g. order priority, machine reliability, etc. ). They admit a certain amount of flexibility in interpretation. In practice some of these problems are considered prior to execution, in producing the production schedule, while others involve problems at a decision making level ( i.e. in which order should two waiting products be loaded onto a free machine ).

The integration of control functions of manufacturing systems require the identification of the following characteristics of such a system, [Dewasurendra et al. (1991)]

- Some common modelling environment for the different functions.
- Possibility to carry out substantial structural changes in a part of the system without affecting the whole system.
- Possibility of quick reaction to external events.
- Efficient communication among modules of the system.
- Ability to generate efficient action plans in the absence of well defined goals or criteria.
- The ability to work with estimated parameters (temporal, for instance).
- The ability to test the action plans in simulation.
- The ability to revise action plans locally.

The realization of manufacturing systems producing a large variety of products is extremely complex. Some of the factors that contribute to the complexity are; the continually changing product mix of orders, product structures and machine flexibility resulting in multiple production routes for products, large variation in production batch sizes, tool capacity constraints, and the random failure of the resources. From the point of view of the operations, a machine can perform an operation without changing its current tool configuration or it can demand a set-up operation before starting the given operation. The behaviour of all machines can be represented by linear combinations of these two elementary behaviours. Thus the part of the Petri net which corresponds to the Generic Machine will not change in its structure for different manufacturing systems.



# Figure 2 PETRI NET MODEL OF A MANUFACTURING SYSTEM

Figure 2 represents a behavioural model of a manufacturing system which consists of a Petri net. Its vision of the system state at any time is defined by the net marking. The evaluation of the system state is achieved by firing transitions. The net's transitions are defined with tasks to be done at the plant level. Firing a transition induces the execution of the task.

#### Reliability of Manufacturing Systems

Let us assume that the manufacturing system is able to detect a machine failure and reconfigure itself automatically. The system can still operate as long as 'enough' machines are available, which depends on the structural design of the system. The trade-offs involved in terms of system's reliability are as follows, [Sahner et al. (1991)]:

- The number of machinery needed to continue operations depends on the particular system design. System reliability is higher, if fewer machine items are required for the process. But the designing of a system requiring fewer number of machinery may increase the capital cost of machinery and design cost.
- Another arrangement may be to design a system with dedicated machines for some operations and some machines for multiple operations. This system could potentially have better performance than the first design, but it could be less reliable.

By incorporating the failure of machinery etc. to the Petri net model, it is possible to study the effect on the performance figures of the manufacturing system. But the subject of reliability of manufacturing systems will not be dealt with any further here.

## 5 PROBLEM DESCRIPTION AND THE PETRI NET MODEL

In this paper a roller door manufacturing system is modelled using Petri nets. Figure 3 shows the layout diagram of the manufacturing facility. The system consists of two loading bays, one for galvanised material and the other for coloured material, where the raw materials are loaded onto the roll forming machines. Two roll forming machines produce the 'curtains', one for a galvanised finish and the other for colours. The galvanised roll former produces curtains in galvanised finish as and when orders for galvanised doors are received. The colour roll former produces curtains in different colours depending on the number of orders for each colour. The colour roll former is loaded with a certain colour when an economical quantity of orders ( the buffer size for coloured door orders ) have been received for that colour. The economical quantity for colour doors may be determined based on the following criteria:

- Minimize wastage of material due to change over of colour.
- The demand for different colours.
- Urgent orders for certain colours.

The processing time for roll forming of material for orders is not a constant. This is an important reason why Stochastic Petri nets may be used in the modelling. As the curtain is made by joining 950 mm wide panels, the processing time for an order varies according to the door height and the door width.

There is a separate facility for the manufacture of drum assemblies for the doors. The drum assemblies are basically the same for all types of doors. Again the processing time varies according to the door measurements, as the number of springs varies.

Roll formed panels are seam-joined and assembled to the roller drum using the assembly machine. This assembly time also varies according to the door size. The same assembly machine is used for galvanised and colour doors. The assembled doors are sent to the dispatch bay for loading to the delivery trucks.

It is required to find out the optimum quantity of orders to be processed for one cycle of operation (a normal working day), and to determine the average queue lengths of various machines, average utilization of machines and the average throughputs of machines. This can be done in a manner as outlined in Section 2 and using in particular equations (2) - (6). Also the buffer size for coloured door orders is to be determined.

In this analysis the following assumptions were made :

- Interarrival time for orders is considered to be zero, as all the orders to be processed for a day are from the previous day.
- Processing times and repair or maintenance times are assumed to be exponentially distributed.
- Movement of roll formed panels to the assembly machine is considered very small.

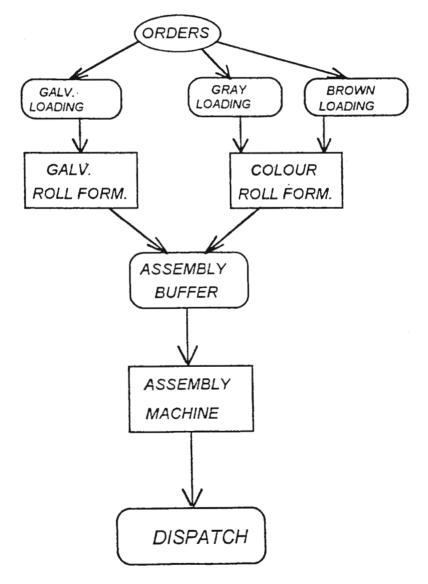


Figure 3 LAYOUT DIAGRAM OF THE ROLLER DOOR MANUFACTURING FACILITY

# **6** THE PETRI NET MODEL

The Petri net model for the 'Roller Door' manufacturing system described is shown in Figure 4 and Figure 5. This Petri net is drawn using the AutoCAD design and drafting package incorporating attribute blocks. Use of AutoCAD and AutoLISP to enhance the modelling power of Petri nets is described in Appendix A.

#### The Detailed Petri Net Model

Tokens in the place **p\_order** represent the receipt of orders for roller doors of all types. The immediate transitions **t\_gal**, **t\_gray**, and **t\_brown**, with the probability values assigned to them are used to logically represent the distribution of orders for galvanised finish, gray colour, and brown colour doors. Tokens in the places **p\_gal\_buf**, **p\_gr\_buf**, and **p\_br\_buf** represent the orders for different finishes in respective buffers awaiting processing.

A token in each place **p\_m1\_free** and **p\_m2\_free** represent the idling state of the galvanised roll former and of the roll former for coloured material respectively. Firing of the immediate transition **t\_gal\_m1\_set** represents the assigning of the galvanised roll former to produce galvanised panels. It is assumed that this machine is always loaded with galvanised material. A token in the place **p\_gal\_in\_m1** represents the roll forming of galvanised panels for an order. Firing of the timed transition **t\_gal\_m1\_rel** represents the end of processing, and the release of the roll former to the idling state. Tokens in the place **p\_gal\_wait\_m3** represent the panels for galvanised finish orders awaiting assembly. It is important here to note that the number of panels for an order is usually between three to seven depending on the door height, and the length of a panel for an order is the same, but may be different from order to order.

Firing of the immediate transition t\_gr\_m2\_set ( t\_br\_m2\_set ) represents the assigning of the second roll former for gray ( brown ) coloured orders. Only one out of these two transitions will fire when there are 'Y' tokens ( number of orders for each colour ) in the places p\_gr\_buf or p\_br\_buf. The quantity 'Y' ( the batch size or the buffer size ) is to be determined for the optimal operation of the system. Firing of one of these transitions will remove 'Y' tokens from the place p\_gr\_buf ( p\_br\_buf ) and assigns 'Y' tokens to the place p\_gr\_in\_m2 ( p\_br\_in\_m2 ). This represents the roll forming of gray ( brown ) coloured panels for 'Y' orders, and is achieved by assigning

the input and output arcs of transition t\_gr\_m2\_set (t\_br\_m2\_set) with a weight of magnitude 'Y'. Firing of the timed transition t\_gr\_end (t\_br\_end) represents the end of processing of one order for gray colour. Roll formed panels go to the buffer represented by the place p\_col\_wait\_m3 and await assembly. The number of tokens in this place represent the number of coloured orders awaiting assembly.

Also the firing of the timed transition  $t_gr_end$  ( $t_br_end$ ) places a token in the place  $p_gr_end$  ( $p_br_end$ ). When 'Y' tokens are collected in the place  $p_gr_end$  ( $p_br_end$ ) the immediate transition  $t_gr_m2_rel$  ( $t_br_m2_rel$ ) is enabled and can fire, indicating the release of the roll former for coloured panels to the idling state, after processing 'Y' gray (brown) orders. The processing of a batch of 'Y' orders is represented by assigning the input arc to the immediate transition  $t_gr_m2_rel$  ( $t_br_m2_rel$ ) with a weight of magnitude 'Y'.

Now the firing of the immediate transition t\_gal\_m3 ( t\_col\_m3 ) assigns the assembly machine for the assembly of galvanised ( coloured ) panels to produce galvanised ( coloured ) finish doors. A token in the place p\_gal\_in\_m3 ( p\_col\_in\_m3 ) represents the assembly process of galvanised ( coloured ) panels for an order. The firing of the timed transition t\_gal\_m3\_rel ( t\_col\_m3\_rel ) represents the completion of the assembly process of a galvanised ( coloured ) finish door, and the release of the assembly machine to the idling state.

The tokens in the place  $p\_product\_ready$  represent the storage of finished products. The firing of the transition  $t\_exit$  represent the loading of a finished product for delivery.

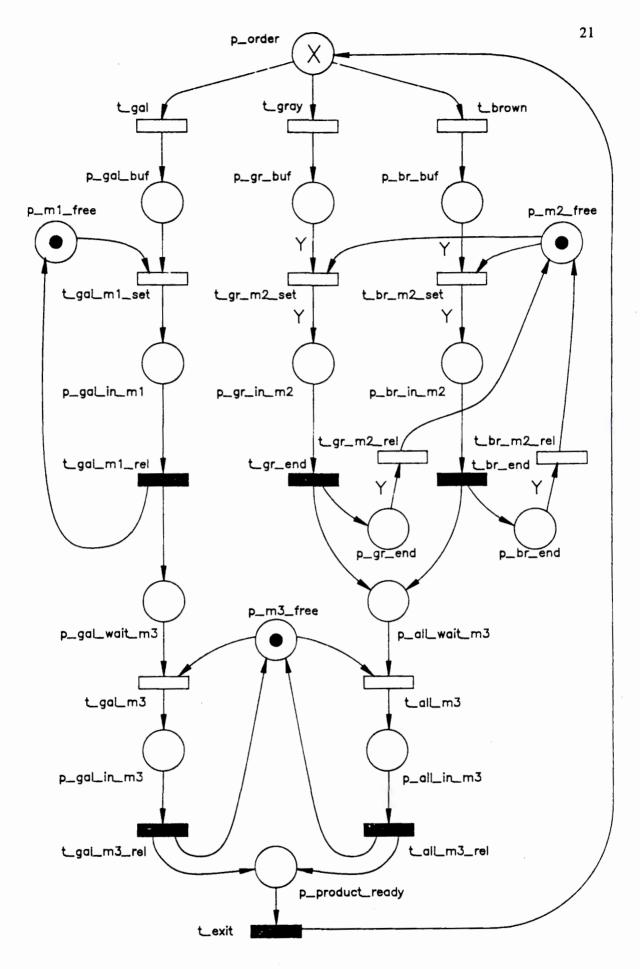


Figure 4 PETRI NET MODEL FOR THE ROLLER DOOR MANUFACTURING SYSTEM

#### The Modified Petri Net Model

The Petri net model described in Figure 4 gives a very good graphical representation of the system being modelled. The model consists of places, immediate transitions, timed transitions, input arcs and output arcs. The immediate transitions were used as logical controls and to represent activities which consume negligible amount of time.

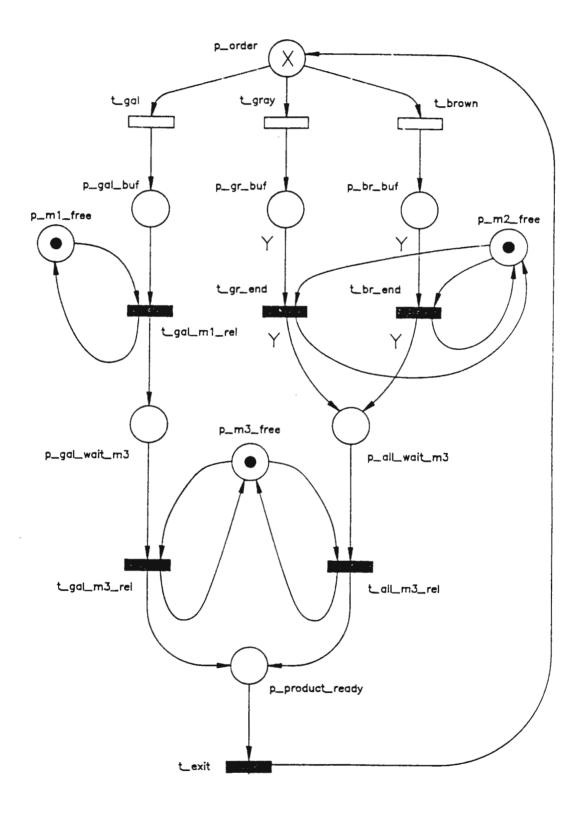
As the number of nodes ( places and transitions ) in a Petri net increases, the time taken to analyze the net also increases, due to the state space explosion. The analysis time can be reduced significantly by reducing the number of nodes in the net model. This can be achieved by deleting some of the immediate transitions and places which are used only for logical control of the net, but do not have any effect on the analytical results.

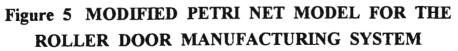
In the previous net model, the immediate transitions  $t_gal$ ,  $t_gray$ , and  $t_brown$  cannot be removed from the net model as they represent the probabilistic distribution of orders for different finishes of doors.

The removal of the transition t\_gal\_m1\_set and the place p\_gal\_in\_m1 will not have any effect on the analysis. This part of the net has to be rearranged as shown in Figure 5. The removal of the immediate transitions t\_gr\_m2\_set and t\_br\_m2\_set together with places p\_gr\_in\_m2 and p\_br\_in\_m2 however, has to be done carefully as a batch of orders ( 'Y' ) is involved here. This is achieved by multiplying the time delays associated with the timed transitions t\_gr\_end and t\_br\_end by the batch size ( 'Y' ) and assigning the input and output arcs of these transitions a weight equal to the batch size ( 'Y' ). Also by introducing input and output arcs ( with weights of magnitude one ) between t\_gr\_end ( t\_br\_end ) and p\_m2\_free, the assignment and the release of the roll former for coloured panels can be represented. The timed transition t\_gr\_end ( t\_br\_end ) in the modified net will be enabled when there are 'Y' tokens in the place p\_gr\_buf ( p\_br\_buf ). Now the firing of the timed transition t\_gr\_end ( t\_br\_end ) ends the processing of 'Y' gray ( brown ) coloured orders, depositing 'Y' tokens in the place p\_col\_wait\_m3, and releases the roll former to the idling state.

The tokens in the place p\_gal\_wait\_m3 ( p\_col\_wait\_m3 ) represent the galvanised ( coloured ) orders awaiting assembly. The firing of the timed transition t\_gal\_m3\_rel ( t\_col\_m3\_rel ) represents the end of assembly of a galvanised finish ( coloured ) door, and the release of the assembly machine to the idling state.

The number of tokens in the place  $p\_product\_ready$  represent the completed doors of all types, awaiting delivery. The firing of the timed transition  $t\_exit$  represents the end of loading of a door. This transition is connected to the place  $p\_order$  by the output arc for the steady state operation.





## 7 ANALYSIS AND RESULTS

In order to reduce the complexity of the analysis, the GSPN model was structurally reduced before approaching the solution phase. In the reduction process most of the immediate transitions were eliminated as described in Section 6. The advantages obtained with the reduction are that by reducing the vanishing markings the complexity is reduced in the solution of the continuous-time Markov chain underlying the GSPN.

In order to numerically solve, with acceptable time and space complexity, the Markovian model derived from a GSPN description is in the restriction to exponential distributions and finite buffer ( queue ) sizes, and in the model dimensions. For this reason, only exponential distributions were considered in the model for the different processing times. Also the maximum number of orders ( tokens ) were limited to a smaller number. The analysis process was repeated using different number of tokens in the order buffer, starting from 6 and increasing in steps of 2 to a maximum of 20. By plotting the results into line graphs, it was possible to study the behaviour of the system.

The sales data for the past six months were analysed to determine the distribution of different finishes for doors being manufactured. This distribution is represented by assigning probability values to the following transitions.

| FINISH     | TRANSITION | PROBABILITY VALUE |
|------------|------------|-------------------|
| GALVANISED | t_gal      | 0.4               |
| GRAY       | t_gray     | 0.3               |
| BROWN      | t_brown    | 0.3               |

#### Table 1 TRANSITION PROBABILITIES

The mean processing times were obtained by averaging the processing times for the past six months. The reciprocal of these values (see equation (2)) give the rate values needed for the GSPN. Table 2 gives the mean processing times and the processing rate values.

| PROCESS             | TRANSITION   | MEAN TIME | RATE VALUE             |
|---------------------|--------------|-----------|------------------------|
|                     |              | ( min. )  | ( sec. <sup>-1</sup> ) |
| GAL. ROLL FORMING   | t_gal_m1_rel | 15.0      | 1.11E <sup>-3</sup>    |
| GRAY ROLL FORMING   | t_gr_end     | 20.0      | 8.33E-4                |
| BROWN ROLL FORMING  | t_br_end     | 20.0      | 8.33E-4                |
| GAL. PANEL ASSEMBLY | t_gal_m3_rel | 10.0      | 1.67E <sup>-3</sup>    |
| COL. PANEL ASSEMBLY | t_all_m3_rel | 15.0      | 1.11E <sup>-3</sup>    |
| LOADING (DISPATCH)  | t_exit       | 5.0       | 3.33E <sup>-3</sup>    |

#### Table 2 MEAN PROCESSING TIMES AND RATES

In the SPNP input file (CSPL) the predefined function pr\_expected is used to output the information about the places and transitions which represent manufacturing functions to be studied.

For example, to determine the average queue length for the assembly machine for coloured doors, the following functions were used (equation (5)):

reward\_type qlenallm3() { return(mark("p\_all\_wait\_m3"));}
pr\_expected("Ave. Q. Len. of Colours Awaiting Assembly", qlenallm3);

To determine the average utilization of the assembly machine by the coloured panels:

reward\_type utilm3all() { return(enabled("t\_all\_m3\_rel"));}
pr\_expected("Utilization of Assembly Machine for Colours", utilm3all);

To determine the average throughput of coloured doors (equation (6)):

# reward\_type tputall() { return(rate("t\_all\_m3\_rel"));} pr\_expected("Average Throughput of Coloured Doors", tputall);

The results obtained are shown in Figures 6 to 11 and the curves plotted using these values versus the number of tokens (number of orders for doors) in the order buffer. Figures 6 and 7 show the average queue length for processing color doors and average queue length for assembly machine (for galvanised doors), respectively for buffer size 3, 4 and 5. Figures 8 and 9 show the average utilization of color roll former

and average utilization of assembly machine by coloured doors, respectively for buffer size 3, 4 and 5. Figures 10 and 11 show the average throughput of galvanised doors and average throughput of coloured doors, respectively for buffer size 3, 4 and 5. The average queue length is given as the average number of doors ( tokens ) waiting at a particular station. The average throughput is given as the average number of doors ( tokens ) per second.

The impact of the buffer size on the results is smaller as the number of orders increases. This is because the system tends to get saturated as the number of orders increases. In this situation the buffer size can be determined considering the other factors such as priority orders. Another important fact to be observed here is that the optimal capacity of this manufacturing system is around 20 orders for a cycle of operation. Any increase in the number of orders beyond 20 will not have any significant effect on the performance indexes, but the queue lengths for orders will increase.

| # ORDERS | BUFFER = 3 | BUFFER = 4 | BUFFER = 5 |
|----------|------------|------------|------------|
| 6        | 1.9643     | 2.1856     | 2.3897     |
| 8        | 2.3648     | 2.7881     | 3.0135     |
| 10       | 2.7517     | 3.2222     | 3.6157     |
| 12       | 3.1109     | 3.6292     | 4.0744     |
| 14       | 3.4411     | 4.0195     | 4.4955     |
| 16       | 3.8192     | 4.3831     | 4.8442     |
| 18       | 4.1845     | 4.7536     | 5.2091     |
| 20       | 4.4873     | 5.1178     | 5.5691     |

AVE. OUEUE LENGTH FOR COLOUR ORDERS

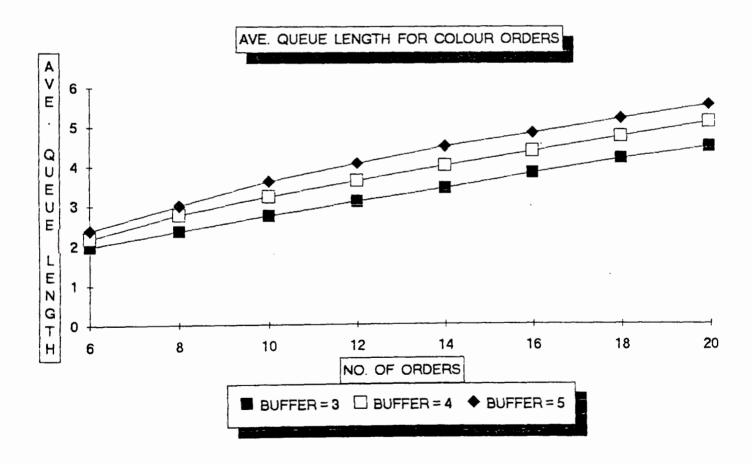


Figure 6 AVERAGE QUEUE LENGTH FOR COLOUR DOORS FOR BUFFER SIZE 3, 4, AND 5

| # ORDERS | BUFFER = 3 | BUFFER = 4 | BUFFER = 5 |
|----------|------------|------------|------------|
| 6        | 0.2455     | 0.1832     | 0.1461     |
| 8        | 0.3576     | 0.2581     | 0.2064     |
| 10       | 0.4491     | 0.3541     | 0.2682     |
| 12       | 0.5242     | 0.4357     | 0.3521     |
| 14       | 0.5849     | 0.5037     | 0.4263     |
| 16       | 0.6512     | 0.5601     | 0.4926     |
| 18       | 0.7216     | 0.6319     | 0.5603     |
| 20       | 0.8019     | 0.7313     | 0.6329     |

AVE. QUEUE LENGTH FOR ASS/MC (GALV. DOORS)

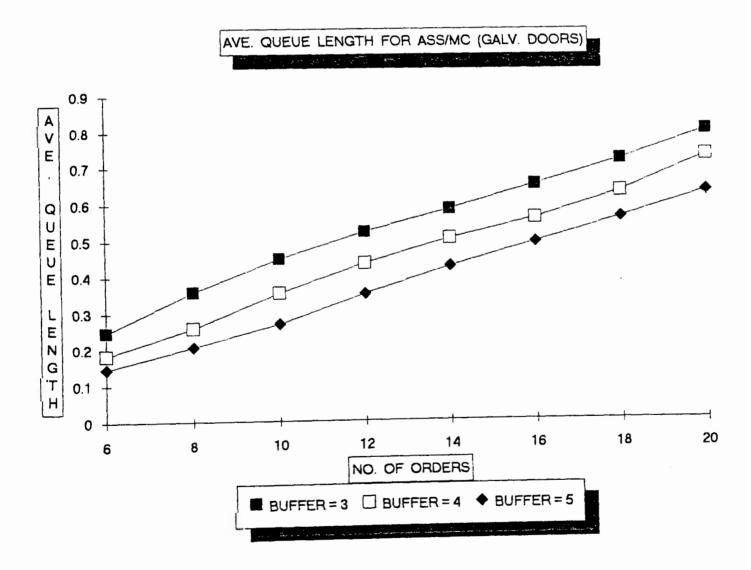


Figure 7 AVERAGE QUEUE LENGTH FOR ASSEMBLY MACHINE (GALV. DOORS) FOR BUFFER SIZE 3, 4, AND 5

| # ORDERS | BUFFER = 3 | BUFFER = 4 | BUFFER = 5 |
|----------|------------|------------|------------|
| 6        | 0.3032     | 0.2059     | 0.1234     |
| 8        | 0.4042     | 0.3088     | 0.2264     |
| 10       | 0.4735     | 0.3947     | 0.3128     |
| 12       | 0.5236     | 0.4581     | 0.3875     |
| 14       | 0.5603     | 0.5053     | 0.4459     |
| 16       | 0.5728     | 0.5412     | 0.4983     |
| 18       | 0.5805     | 0.5642     | 0.5398     |
| 20       | 0.5896     | 0.5802     | 0.5663     |

# AV. UTILIZATION OF COL. ROLL FORMER

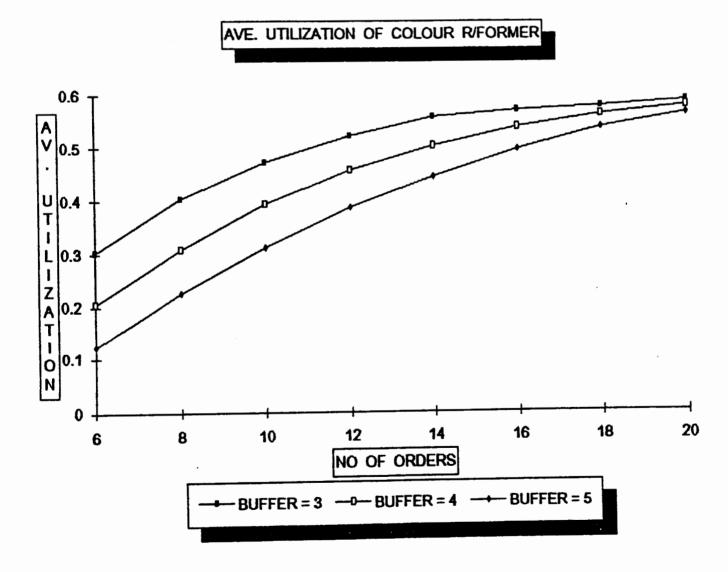


Figure 8 AVERAGE UTILIZATION OF COLOUR ROLL FORMER FOR BUFFER SIZE 3, 4, AND 5

| # ORDERS | BUFFER = 3 | BUFFER = 4 | BUFFER = 5 |
|----------|------------|------------|------------|
| 6        | 0.4551     | 0.3198     | 0.2084     |
| 8        | 0.6066     | 0.4634     | 0.3518     |
| 10       | 0.7107     | 0.5925     | 0.4695     |
| 12       | 0.7858     | 0.6876     | 0.5816     |
| 14       | 0.8411     | 0.7584     | 0.6694     |
| 16       | 0.8702     | 0.8123     | 0.7483     |
| 18       | 0.8913     | 0.8548     | 0.8062     |
| 20       | 0.9034     | 0.8861     | 0.8576     |

AV. UTILIZATION OF ASS/MC BY COL DOORS

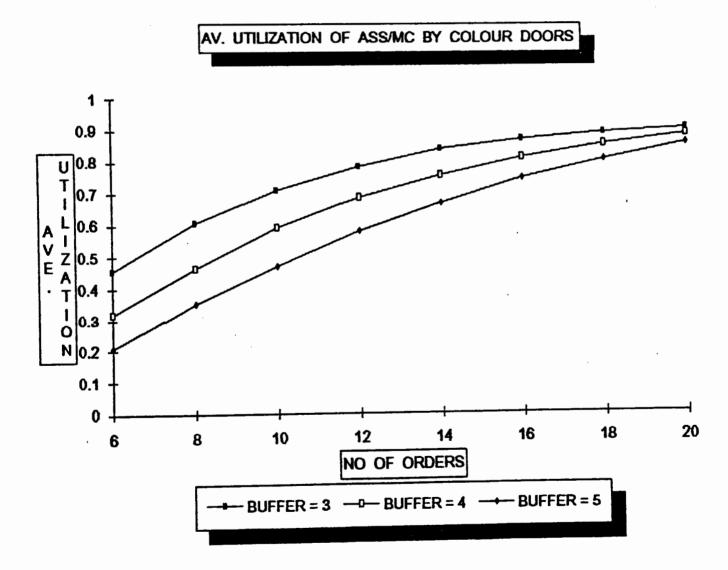


Figure 9 AVERAGE UTILIZATION OF ASSEMBLY MACHINE BY COLOURED DOORS, FOR BUFFER SIZE 3, 4, AND 5

| # ORDERS | BUFFER = 3 | BUFFER = 4 | BUFFER = 5 |
|----------|------------|------------|------------|
| 6        | 0.00029    | 0.000219   | 0.000129   |
| 8        | 0.00043    | 0.000341   | 0.000249   |
| 10       | 0.00055    | 0.000441   | 0.000357   |
| 12       | 0.00062    | 0.000509   | 0.000431   |
| 14       | 0.00065    | 0.000561   | 0.000495   |
| 16       | 0.00067    | 0.000601   | 0.000542   |
| 18       | 0.00068    | 0.000638   | 0.000598   |
| 20       | 0.00069    | 0.000665   | 0.000634   |

AV. THROUGHPUT OF GAL. DOORS

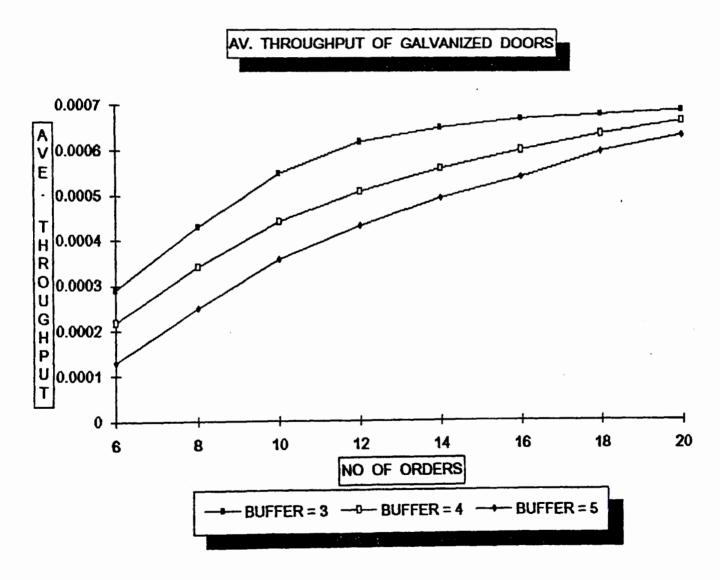


Figure 10 AVERAGE THROUGHPUT OF GALVANISED DOORS FOR BUFFER SIZE 3, 4, AND 5

| # ORDERS | BUFFER = 3 | BUFFER = 4 | BUFFER = 5 |
|----------|------------|------------|------------|
| 6        | 0.0005     | 0.000355   | 0.000231   |
| 8        | 0.00067    | 0.000511   | 0.000391   |
| 10       | 0.00079    | 0.000661   | 0.000521   |
| 12       | 0.00087    | 0.000763   | 0.000646   |
| 14       | 0.00093    | 0.000842   | 0.000743   |
| 16       | 0.00095    | 0.000902   | 0.000833   |
| 18       | 0.00096    | 0.000913   | 0.000874   |
| 20       | 0.00097    | 0.000924   | 0.000902   |

#### AV. THROUGHPUT OF COLOUR DOORS

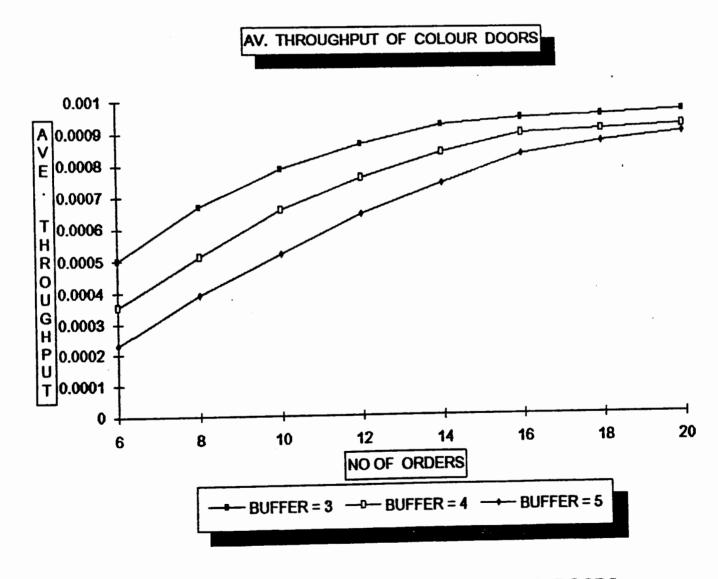


Figure 11 AVERAGE THROUGHPUT OF COLOURED DOORS FOR BUFFER SIZES 3, 4, AND 5

#### 8 CONCLUSIONS

In this paper a summary of the structural and temporal definitions that lead to the Generalised Stochastic Petri Net approach for the modelling of manufacturing systems has been presented. Also the problem of computing the steady-state performance measures of some classes of manufacturing systems modelled with Generalised Stochastic Petri Nets has been addressed. As an example, a roller door manufacturing system was modelled and its performance measures such as the queue length, throughput and utilisation values were computed for different set-ups of the system. It has been shown how the use of Petri nets and Petri net Tools can help the examination of different aspects of a manufacturing system design and performance analysis.

It has been shown in the literature that GSPN permit a modular approach to the model development process, using either a top-down or a bottom-up approach [ Hatono et al. (1989) ], in which the specification of the model components can be represented in greater detail. Also the modular approach helps in tackling the high memory requirement and long CPU times needed for the analysis of very large systems. Use of a coloured Petri net tool would make the net much simpler by reducing the number of places and transitions.

For the generation of the Petri net model and the input file for the SPNP package, AutoCAD Release 9 and AutoLISP Release 9 were used. Now AutoCAD and AutoLISP Release 12 are available which provide more flexibility and enhancements to the generation of the Petri net and the input file for the SPNP package.

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# **APPENDIX A**

### **GRAPHICAL INTERFACE**

The popular PC based design and drafting software package, AutoCAD is used to enhance the modelling power, by graphically generating the Petri net model. AutoLISP, which is an extension to AutoCAD is used to read the Petri net model from the graphic screen of AutoCAD and automatic generation of the source code for the SPNP package input file. Refer to Figure 1 for an overview of the problem solution plan.

#### AutoCAD Drawing

To draw the Petri net on the graphic screen, the AutoCAD entities called attribute blocks are used [ AutoCAD Release 9 (1987), Reference Manual ]. An attribute is a drawing entity designed to hold textual data and to link that data to graphic objects ( blocks ) within the drawing database. Each time an attribute block is inserted into a drawing, the user will be prompted by the attribute to add textual information to that block. The textual information can be the name of the place, or the transition, number of tokens for a place, or the firing rate of a transition. This information will remain with that block forever. Later on, the data contained in these attribute blocks can be extracted and the information used to keep track of the objects in the drawing.

In this paper, attribute blocks are used to represent the "building blocks" of Petri nets, such as place, immediate transition, timed transition, input arc, output arc, and inhibitor arc. Following is an example of an attribute block used to represent a 'place'.

| Block name    | : PLACE           |
|---------------|-------------------|
| Usage         | : place           |
| Attribute tag | : PNAME (visible) |
| prompt        | : Place name      |
| Attribute tag | : TOKEN (visible) |
| prompt        | : No. of tokens   |
| default value | : 0               |

#### AutoLISP Program

AutoLISP is a subset of common LISP with many additional built-in graphics handling functions. AutoLISP is the programming language within AutoCAD that allows the writing of programs that will manage and manipulate the graphic and non-graphic data. [AutoLISP Release 9 (1987), Programmer's Reference ] AutoLISP lets users and AutoCAD developers write macro programs and functions in a powerful high-level language that is well suited to graphics applications.

A drawing database is structured exactly the same way as any other database. Its purpose is to describe a drawing in a non-graphic way. A drawing database file consists of records of alphanumeric descriptions of drawing primitives (AutoCAD drawing entities). Here an AutoLISP program is used to extract and use data from AutoCAD drawings of Petri nets. These data are the attribute blocks used to construct the Petri nets.

An association list is a list, structured so that it can be accessed by the "assoc" function. The following AutoLISP program "entist", will list all the entity association lists in a drawing :

```
(defun entist ()
 (setq e (entnext)) ; sets e to the first entity name
 (while e ; loop as long as there are entities
 (print (entget e)) ; print the entity list
 (terpri) ; new line
 (setq e (entnext e)) ; set e to next entity
)
```

The AutoLISP program, entlst, is a basic loop structure that will look at every item in the drawing database. By inserting certain control statements in the middle of this loop structure, it is possible to cause the program to look only for drawing entities that meet certain criteria.

```
( setq enttyp ( cdr ( assoc 0 ( entget e ))))
( setq blknm ( cdr ( assoc 2 ( entget e ))))
```

From the AutoCAD drawing of the Petri net consisting of attribute blocks, the association lists are extracted using a program similar to "entist". Only the necessary information required for the SPNP input file is extracted from the association list, using the "assoc" function.

#### **APPENDIX B**

#### STOCHASTIC PETRI NET PACKAGE

The Stochastic Petri Net Package (SPNP) is a versatile modelling tool for solution of stochastic Petri net (SPN) models. The stochastic Petri net models are described [Ciardo et al. (1992)] in the input language for SPNP called C-based SPN Language (CSPL). The CSPL is an extension of the C programming language, with some additional constructs. The SPN models specified to SPNP are 'SPN Reward Models' or stochastic reward nets (SRN), which are based on the 'Markov Reward Models' paradigm. This provides a powerful modelling environment for dependability analysis, performance analysis and performability modelling. The package allows the solution of the SRN to obtain either steady-state metrics or transient metrics.

In addition to standard features available to describe the mechanisms of Petri net models, this package has a few special features. Some of the special features are :

- The marking dependent enabling function associated with a transition. The value of this function is evaluated by the expression containing the marking(s) of one or more places. If this function evaluates to 1, in a marking, then the transition is enabled, if the value is 0, then the transition is disabled.
- The marking dependent arc multiplicity. Arcs can have multiplicity which is not constant, but rather it is a function of the marking. This feature may help to reduce the size of the reachability graph, and it may allow compact models.

The SRN to be studied is described in a CSPL file, which is a C file specifying the structure of the SRN and the desired outputs, by means of predefined functions, for example,  $pr_std_average()$ ; outputs, for each place, the probability that it is not empty and its average number of tokens; for each timed transition, the probability that it is enabled and its average throughput. The average throughput  $E[T_a]$  for transition a is defined as (equation (6)):

$$\mathbf{E}[\mathbf{T}_{\mathbf{a}}] = \sum_{i \in R(a)} \pi_{\mathbf{i}} \mathbf{w'}_{\mathbf{a}}$$

where  $\mathbf{R}(\mathbf{a})$  is the subset of reachable markings that enable transition  $\mathbf{a}$ ,  $\pi_i$  is the probability of marking  $\mathbf{i}$ , and  $\mathbf{w'}_{\mathbf{a}}$  is the rate of transition  $\mathbf{a}$  in marking  $\mathbf{i}$ .

