# A METHOD FOR APPROXIMATE ANALYSIS

# OF GENERAL QUEUEING NETWORKS\*

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## ABSTRACT

An approximate analytical method for general queueing networks is presented. Accurate results are obtained by using composite queues which closely capture the behavior of nonlocal balance queues. The method uses an iterative approach which converges rapidly. Arbitrary numbers of queues and job classes are allowed.

## KEY WORDS AND PHRASES

Approximate solution, performance evaluation, queueing networks.

#### 1. INTRODUCTION

Queueing network models are widely used in analysing the performance of computing systems: an entire issue of the ACM Computing Surveys [1] was devoted to the subject. Markov models are the most general analytic performance models of computing systems. Unfortunately, Markov models are usually computationally intractable when there are more than two queues in the system. A class of models that are tractable are called product form networks [2]. However, queues in a product form network must have very special service disciplines called local balance disciplines [3], or they must have a very special service time density: density. Product form networks are very exponential restrictive. For example, a network where jobs are assigned priorities does not have product form. Heuristic techniques must perforce be used to analyze many realistic models [4]. Balbo [5] and Tripathi [6] have excellent, comprehensive studies of approximation techniques, including those of Bard Sauer and Chandy [8], Shum and Buzen [9], and Sevcik, Levi, Tripathi, and Zahoran [10]. Balbo's empirical analysis of several approximation algorithms showed that Marie's approach [11] was one of the best. We show Marie's approach can be used with priority disciplines and networks with multiple job classes.

## 2. NORTON'S THEOREM

The algorithm is based on "Norton's theorem" of decomposition / aggregation [12]. Consider a closed local balance network Z with M queues (fig. 1) and K classes of jobs (or customer chains).

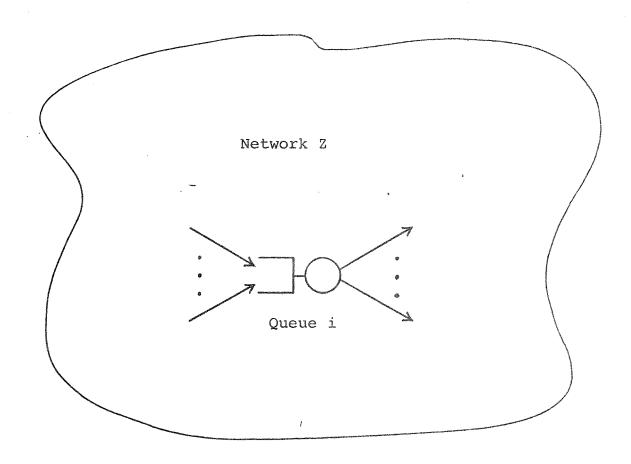


Figure 1.

Assume that there are  $N_k$  jobs of class k in the network,  $k=1,\ldots,K$ . Suppose we wish to analyze the equilibrium queue-length distribution for some specific queue, say queue i in network Z. It is possible to construct a two-queue network (fig. 2), consisting of queue i and another queue,

called the <u>complement</u> of queue i, and with the same population as in the original network, such that the equilibrium queue-length distribution for queue i in the two-queue network is the same as in the original network.

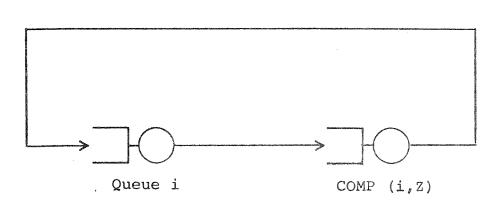


Figure 2.

The complement of queue i in network Z is denoted by COMP(i,Z). COMP(i,Z) is specified by a K dimensional matrix  $H_i$ , where the rate of service of class j jobs in the complement, when there are  $n_k$  jobs of class k, k=1,...,K, is  $H_i(n_1,...,n_{j-1},n_{j-1},n_{j+1},...,n_K)/H_i(n_1,...,n_K)$ .

The class of decomposition methods of Marie [11], Chandy, Herzog and Woo [13], and others (see Balbo [5] or Tripathi [6]) are based on Norton's theorem.

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#### 3. ALGORITHM

Given a network A:

Let Z be the network obtained by assuming all queues in A have local balance.

- 1. For each queue j,
  - (a) construct a two-queue network consisting of the original queue j and COMP(j,Z);
  - (b) compute the equilibrium probability P[j,n̄],
     where n̄ = (n<sub>1</sub>,...,n<sub>K</sub>), of n<sub>k</sub> jobs of class k,
     k=1,...K in queue j of this two-queue network by
     solving Markov balance equations;
  - (c) construct (section 4) a local balance queue Q'(j), such that a two-queue network of Q'(j) and COMP(j,Z) yields the same P[j,n] as the network of Q(j) and COMP(j,Z).
- 2. Define a local balance network Z' obtained by replacing Q(j) in A by Q'(j) for every queue j. If the statistics for Z and Z' are close (as defined in [13]), assume that the statistics for Z' are satisfactory approximations.
  - Otherwise, set  $Z \leftarrow Z'$  (i.e., call network Z' by Z) and go to step 1.

- 4. CONSTRUCTING THE LOCAL BALANCE EQUIVALENT QUEUE Q'(J)
  (step lc of section 3)
- Q'(j) is specified by a matrix  ${\tt A}_{\tt j}$  , where  ${\tt A}_{\tt j}$  has the same interpretation  ${\tt H}_{\tt i}$  , and [12]

$$P[j,\bar{n}] \quad oc \quad A_{j}(\bar{n}) \quad H_{j}(\bar{N} - \bar{n}) . \tag{1}$$

Hence

$$A_{j}(\bar{n}) \propto P[j,\bar{n}] / H_{j}(\bar{N} - \bar{n}).$$
 (2)

Any proportionality constant can be used to compute  $A_j(\bar{n})$  from eqn. 2, and the proportionality constant for eqn. 1 can be determined from

$$\sum_{\bar{n}} P[j,\bar{n}] = 1.$$

#### 5. RESULTS

Fifty-six networks were analyzed with queues having the following disciplines: first-come-first-served, preemptive priority, nonpreemptive priority, processor sharing, and infinite server. Results obtained were uniformly good, and convergence was rapid. The algorithm typically required two or three iterations at a termination tolerance of .01. Only six networks required more than four iterations, and these were networks with more than one heavily loaded priority queue.

A histogram of tolerance errors for the algorithm presented here (MCOMP) and for a processor-sharing approximation (see section 6) as measured against simulation results are presented below (fig. 3). Tolerance is defined as the maximum of the errors in utilization queue length / N<sub>k</sub>, and wait time / cycle time / over all queues and classes m,k. The detailed results will be found in a subsequent report.

		MCOMP	Processor Sharing			
	Interv begins value					
T O L E R A N C E	0.00 0.01 0.02 0.03 0.04 0.05 0.06 0.07 0.08 0.09 0.10 0.20 0.30 0.40 0.50 0.60 0.70 0.80 0.90	**************************************	*  *  *  *  *  *  *  *  *  *  *  *  *			
	1.00		***			

Figure 3.

## 6. EXAMPLE

The following network (fig. 4) was analyzed by simulation, by the algorithm described here (MCOMP), and by assuming processor-sharing at the priority queue.

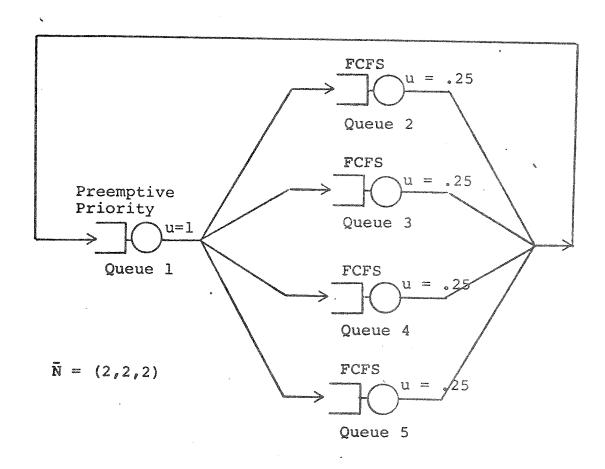


Figure 4.

The measurements obtained from these analyses are given below (fig. 5).

MCOMP: Termination tolerance = .001. Number of iterations = 2.

Simulation: Number events = 100000. Simulated time = 83445 sec.

	Queue	Class	Simul. Meas.	MCOMP Meas.	Diff.	Proc. Meas.	Sharing Diff.
Utilization	1-5	1 2 3	.232 .201 .166	.223 .202 .175	.009 .001 .009	.200 .200 .200	.032 .001 .034
Queue Length	1 2-5	1 2 3 1 2 3	. 262 . 382 . 543 . 435 . 405 . 364	. 254 . 382 . 565 . 437 . 405 . 359	.008 .000 .022 .002 .000	.400 .400 .400 .400 .400	.138 .018 .143 .035 .005
Throughput (jobs/sec.)	1 2-5	1 2 3 1 2 3	.232 .201 .166 .0580 .0503	.223 .202 .175 .0558 .0504	.009 .001 .009 .0022 .0001	.200 .200 .200 .05 .05	.032 .001 .034 .0080 .0003
Wait Time (sec.)	1 2-5	1 2 3 1 2 3	1.13 1.90 3.27 7.50 8.06 8.78	1.14 1.89 3.23 7.82 8.02 8.20	.01 .01 .04 .32 .04	2.00 2.00 2.00 8.00 8.00 8.00	0.87 0.10 1.27 0.50 0.06 0.78
Maximum Differe	ences	·					
Utiliza Queue l Wait Ti		.009 .011 .012		.034 .072 .105			
Overall	(Tolera	nce)	٩		.012		.105

Figure 5.

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