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## DISTRIBUTION OF END-TO-END DELAY IN MESSAGE-SWITCHED NETWORKS*

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## ABSTRACT

An open queueing network model is used to derive the distribution of end-to-end delay in a message-switched network. It is shown that under fixed routing, the endmoend delay of messages belonging to a particular sourcemdestination node pair is given by a sum of independent and exponentially distributed pandom variables. The generalization of this basic result to random routing and to messages belonging to a group of sourcedestination pairs is also considered. Numerical examples based on a hypothetical network are presented.

Keywords: Message-Switched Networks, Queueing Model, Delay Distribution

## 1．Introduction

A message－switched network 〈1〉 is a collection of switching nodes connected together by a set of communication channels．It provides a message service to the users at the various nodes． Messages in this network are routed from one node to another in a storeandoforward manner until they reach their destinations．$A$ key performance measure of this network is the end－cooend delay which is the elapsed time from the arrival of a message at its source to the successful delivery of this message at its destination．In 1964，Kleinrock 〈1〉 developed an open queueing network model for message－switched networks and derived an expression for the mean end－tomend delay．This expression has been used extensively for performance analysis 〈3〉 and network design〈3〉。

Kleinrock＇s result is a mean delay taken over all the messages delivered by the network；no distinction is made on the basis of source or destination．In this paper．we treat messages with the same sourcerdestination pair as belonging to a particular message class，and derive the distribution of endoto end delay for each class．Both fixed and random routing are considered．Gur result is therefore a detailed characterization of end to－end delay in a message－switched network．It allows us to determine statistics such as the mean．variance，and 90 mercentile of endotoend delay for a particular source－ destination pair．

Our derivation is based on Kleinrock＇s model＜1＞with
emphasis given to classes of messages．A description of this model is given in section 2 ．This model is also a special case of the general queueing network model studied by Baskett，et．al。〈4〉．Baskett＇s result will therefore be used as the point of departure for our analysis．In section 3．our basic result on the distribution of endecomend delay for the case of fixed routing is derived．This basic result is generalized to pandom routing in section 4 and to messages belonging to a group of sourcerdestination pairs in section 5．Finally sections 6 and 7 are devoted to numerical examples and application of results．

## 2．Model Description

We first assume，as in 〈1〉，that the delay experienced by a message in a message－switched network is approximated by the queueing time and the data transfer time in the channels．The processing time at the switching nodes and the propagation delays are assumed to be negiligible．Let $M$ be the number of channeis and $\mathcal{C}_{i}$ be the capacity of channel $i_{0} i=1,2 \ldots . \ldots$ in our open queueing network model，each of the $M$ channels is represented by an independent server．We assume that all channels are error－ free，and the queueing discipline at each channel is firstocome， first－served（FCFS）．

Messages are classified according to source－destination pairs．In particular，a message is said to belong to class（s，d）
if its source node is $s$ and its destination node is de Let $R$ be the total number of message classes. In a network with $N$ switching nodes, $R=N(N-1)$. For convenience, we assume that message classes are numbered from 1 to $R$, and we use $r$ instead of (s,d) to denote a message class. The arrival process of class $p$ messages from outside the network is assumed to be Poisson with mean rate $\gamma(r)$. Message lengths for all classes are assumed to have the same exponential distribution and we use $1 / \mu$ to denote the mean message length. It follows from this last assumption that the service time of all messages at channel i is exponential with mean $1 / \mu C_{i}$. For the mathematical analysis to be tractable. Kleinrock's independence assumption $\langle 1\rangle$ is used. This assumption states that each time a message enters a switching node a new length is chosen from the exponential message length distribution.

The message routing algorithm can be fixed. or random. in fixed routing, a unique path is defined for each message class. and we use $a(r)$ to denote the pach for class $r$. $a(r)$ is essentially an ordered set of channels over which class $r$ messages are routed. In random routing, we allow the possibility of alternate paths, and the routing algorithm selects one of these paths according to a probability distribution. We will use $k_{r}$ to denote the number of alternate paths for class $r_{0} a_{j}(r)$ to represent the set of channels in the $j$-th path, and $q_{j}(r)$ the probability that the $j=$ th path is selected, $j=1,2 \ldots k_{r}$ 。

## 3. Distribution of End io End Delav

We first consider the case of fixed routing, Let $\lambda_{i r}$ $(i=1,2 \ldots \ldots M ; r=1,2 \ldots, R)$ be the mean arrival rate of class $r$ messages to channel $i$. With fixed routing. $\lambda_{i r}$ is given by:

$$
\lambda_{i r}=\left\{\begin{array}{cl}
\gamma(r) & \text { if channel } i \in a(r)  \tag{1}\\
0 & \text { otherwise }
\end{array}\right.
$$

Let $\rho_{i r}$ be the utilization of channel i by class $r$ messages.

$$
\begin{equation*}
\rho_{i r}=\ddot{\lambda}_{i r} / \mu C_{i} \tag{2}
\end{equation*}
$$

The total utilization of channel $i$ (denoted by $\rho_{i}$ ) can then be written as:

$$
\begin{equation*}
\rho_{i}=\sum_{r=1}^{R} \rho_{i r} \tag{3}
\end{equation*}
$$

We require that $\rho_{i} \leq 1$ for $i \equiv 1,2 \ldots \ldots M_{0}$. This is equivalent to the requirement that no channel is saturated, the condition for a stable network.

Let $t_{r}(x)$ be the probability density function ( $p d f$ ) of the end-to-end delay of class $r$ messages, and $T_{r}^{*}(s)$ be its Laplace Transform, i.e..

$$
\begin{equation*}
T_{r}^{*}(s)=\int_{0}^{\infty} e^{-s x_{t_{r}}}(x) d x \tag{4}
\end{equation*}
$$

The main result of this paper can be stated as follows:

Theorem: For our model of a messageoswitched network with fixed routing,

$$
\begin{equation*}
T_{r}^{*}(s)=\prod_{i \in a(r)} \frac{\mu C_{i}\left(1-\rho_{i}\right)}{s+\mu C_{i}\left(1-\rho_{i}\right)} \tag{5}
\end{equation*}
$$

A proof of this theorem is given in the Appendix.

Let $|a(r)|$ be the number of channels in $a(r)$. our theorem indicates that the endotooend delay of class $r$ messages is given by the sum of $|a(r)|$ independent random variables. The $i=t h$ random variable in this sum is exponential with mean $\left(\mu C_{i}\left(1-\rho_{i}\right)\right)^{-1}$; it can be interpreted as the delay at the $i=t h$ channel in the path of class $r$. It is of interest to note that the mean of this $i$ oth random variable is a function of $\rho_{i}$ and not $\rho_{i r}$ implying that all messages routed, through a particular channel have the same delay distribution at this channel.
$T_{r}^{*}(s)$ can easily be inverted, by using parifal fraction $\langle 2\rangle$ 。 to give $\tau_{r}(x)$. The mean $\bar{T}_{r}$ and variance $\sigma_{r}^{2}$ of class $r$ delay can also be obtained from $T_{r}^{*}(s)$. They are given by:

$$
\begin{equation*}
\bar{T}_{r}=\sum_{i \in a(r)} \frac{1}{\mu C_{i}\left(\overline{\left.1-\rho_{i}\right)}\right.} \tag{6}
\end{equation*}
$$

and

$$
\begin{equation*}
\sigma_{r}^{2}=\sum_{i \in a(r)} \frac{1}{\left[\mu c_{i}\left(1-\rho_{i}\right)\right]^{2}} \tag{7}
\end{equation*}
$$

## 4. Generalization to Bandom Bouting

With random routing, a çlass $r$ message can be routed through one of $k_{r}$ alternate paths, and the $j$ oth path is selected with probability $q_{j}(r)$ 。 our analysis in the last section is applicable if we treat each alternate path as a separate message class. We thus replace class $r$ by $k_{r}$ artificial classes. Let these classes be $r_{1}, r_{2}, \ldots . r_{k_{r}}$, then

$$
\begin{align*}
& \gamma\left(r_{j}\right)=\gamma(r) q_{j}(r)  \tag{8}\\
& \lambda_{i r_{j}}=\left\{\begin{array}{cl}
\gamma\left(r_{j}\right) & \text { if channel i } \in a_{j}(r) \\
0 & \text { otherwise }
\end{array}\right. \tag{9}
\end{align*}
$$

and

$$
\begin{equation*}
\rho_{i}=\sum_{r=1}^{R} \sum_{j=1}^{k_{r}} \lambda_{i r_{j}} / \mu C_{i} \tag{10}
\end{equation*}
$$

Applying our theorem in the last section, we get:

$$
\begin{equation*}
T_{r_{j}}^{*}(s)=\prod_{i \in a_{j}(r)} \frac{\mu C_{i}\left(l-\rho_{i}\right)}{s+\mu C_{i}\left(l-\rho_{i}\right)} \tag{11}
\end{equation*}
$$

$T_{r}^{*}(s)$ can then be obtalned by removing the artificial class from our model, i.e..

$$
\begin{equation*}
T_{r}^{*}(s)=\sum_{j=1}^{k_{r}} q_{j}(r) T_{r_{j}}^{*}(s) \tag{12}
\end{equation*}
$$

Similar to the case of fixed routing, this Laplace Transform can also be inverted to give $t_{r}(x)$. As to the mean and variance
of class $r$ delay, we have:

$$
\begin{equation*}
\bar{T}_{r}=\sum_{j=1}^{k_{r}} q_{j}(r) \sum_{i \in a_{j}(r)} \frac{1}{\mu C_{i}\left(1-o_{i}\right)} \tag{13}
\end{equation*}
$$

and

$$
\begin{equation*}
\sigma_{r}^{2}=\sum_{j=1}^{k_{r}} q_{j}(r)\left[\sum_{i \in a_{j}(r)} \frac{1}{\left[\mu C_{i}\left(1-\rho_{i}\right)\right]^{2}}+\left[\sum_{i \in a_{j}(r)} \overline{\mu C_{i}\left(1-\rho_{i}\right)}\right]^{2}\right]-\bar{T}_{r} \tag{14}
\end{equation*}
$$

## 5. Generalization to Message Groups

It is often useful to consider the endotoond delay of messages belonging to a group of source-destination pairs. For example, we can study the delay characteristics of (a) messages sent among a subset of the nodes, (b) messages sent from a particular source node or (c) messages sent to a particular destination. We thus define a group $G$ to contain a number of message classes, and message is said to belong to group $G$ if its class membership is in $G$ 。 It is easy to see that our result for random routing is directly applicable to message groups. We thus have the following result for $T_{G}^{*}(s)$, the Laplace Transform of the pdf of group $G$ delay:

$$
\begin{equation*}
T_{G}^{*}(s)=\sum_{r \in G} \frac{\gamma(r)}{\gamma_{G}} T_{r}^{*}(s) \tag{15}
\end{equation*}
$$

where $T_{G}^{*}(s)$ is given by Eq. (5) or (12), and $\gamma_{G}=\sum_{r \in G} \gamma(r)$.

In the special case that all classes of messages belong to a single group, we have the Laplace Transform of the pdf of the overall endocooend delay:

$$
\begin{equation*}
T^{*}(s)=\sum_{r=1}^{R} \frac{r(r)}{r} T_{r}^{*}(s) \tag{16}
\end{equation*}
$$

where $\gamma=\sum_{r=1}^{R} \gamma(r)$.

## 6. Numerical Examples

Our numerical examples are based on the hypothetical network shown in figure 1。 This network has 5 nodes and 10 channels. The external arrival rate of messages belonging to each sourcedestination pair is given by the traffic matrix in Figure 2. All channels are assumed to have the same capacity and the mean message length is chosen such that the mean service time at each channel (i.e.. $1 / \mu C_{i}$ ) has a value of 0.1 .

We first consider the case of fixed routing and assume that the routing algorithm is based on the shortest path. In our example network, there is a unique shortest path between each pair of nodes. Suppose we are interested in the endotooend delay from node 1 to node 2. Denoting this source-destination palr by class 1, we apply Eq. (5) and get:

$$
T_{1}^{*}(s)=\left[\frac{3}{s+3}\right]\left[\frac{2}{s+2}\right]\left[\frac{4}{s+4}\right]
$$

This Laplace Transform can be inverted to give:

$$
t_{1}(x)=-24 e^{-3 x}+12 e^{-2 x}+12 e^{-4 x}
$$

A plot of $t_{f}(x)$ is shown in figure 3. The mean, variance, and 90-percentile of class 1 delay are also shown.

We next consider the case of random routing and assume that $25 \%$ of class 1 messages are shifted to the path $\{1,3,8,9\}$. This implies that the remaining $75 \%$ are sent over the shortest path $\{1,5,9\}$. Applying Eq. (12), and inverting the resulting $T_{j}^{*}(s)$, we get:

$$
t_{y}(x)=-25.2 e^{-3 x}+30 e^{-2.5 x}+99 e^{-4.5 x}-19.8 e^{-5.5 x}-84 e^{-4 x}
$$

A plot of this pdf. together with its mean variance and 90-percentile, are shown in figure 4. A comparison between Figures 3 and 4 indicates that the mean class 1 delay under random routing is smaller. This is due to the fact that a fraction of traffic has been directed from a more heavily utilized channel (channel 5) to a couple of less heavily utilized channels (channels 3 and 8 )。

As a third example, we consider the end-tomend delay of all messages originated from node 1 under fixed shortestopath routing. Applying our results for message groups (Eq.(15)), we get the plot shown in Figure 5.

Finally, in figure 6, we show the pdf of the end-toend delay over all messages under fixed, shortest-path routing.

## 7．Application of Resules

The results of this paper provide a detalled characterization of endotomend delay in a messagesswitched network．They are useful for performance analysis and network design．They also find application in the analysis or simulation of aseraresource network 〈3〉（or a subscriber network 〈6〉）where terminals communicate with remote computers via a messageoswitched network． The messagerswitched network can be treated as a＂blackmbox＂with delay distribution given by the inverted Laplace Transform of Eq．（5）or（12）depending on whether fixed or random routing is used．This would reduce（a）the complexity of analysis and（b） the cost of simulation．

It should be noted that the derivation of our results is based on a rather general open queueing network model．These results have a wider scope of application than simply to message switched networks．

## 8．Conclusion

We have used Kleinrock＇s model＜l＞to derive the distribution of endmtooend delay in a message－switched network．Both fixed and random routing have been considered．dur resulis find application in performance analysis of message－switched networks． and in the analysis or simulation of useroresource networks 〈3〉。

## Beferences

1. L. Kleinrock, Communication Nets a Stochastic Message flow and Delays (McGraw-Hill. New York, 1964).
2. L. Kleinrock, Queueing Systems, Volume 1: Theory (Wileya Interscience, New York, 1975).
3. L. Kleinrock, Queueing Systems, Volume 2: Computer Applications (WileyoInterscience. New York, 1976).
4. Fo Baskett, K. Chandy, Ro Muntz, and Fo Palacios, Open, Closed, and Mixed Network of Queues with Different Classes of Customers, Journal of the ACM 22 (1975) 2480260.
5. R. Cooper, Introduction to Queueing Theory (Macmillan. New York, 1972)。
6. D. Davies and D. Barber, Communication Networks for Computers (John Wiley and Sons. New York, 1973).

Appendix: Proof of the Main Theorem

We first prove two lemmas.

## Lemma 1:

Let $N_{r}(z)$ be the generating function of the total number of class $r$ messages in the network at equilibrium.

$$
\begin{equation*}
N_{r}(z)=\prod_{i \in a(r)} \frac{1-\rho_{\mathbf{i}}}{1-\rho_{i}+\rho_{i r}(1-z)} \tag{Al}
\end{equation*}
$$

Proof:
Let $\left(S_{1}, S_{2} \ldots \ldots S_{M}\right)$ be the state of our network model where $S_{i}=\left(n_{i 1} \cdot n_{i 2} \ldots . n_{i R}\right)$ is the state of channel $i$ and $n_{i r}$ is the number of class $r$ messages (in queue or in transmission) at. channel 1 . Since our model is a special case of the general queueing network model analysed by Basket, et.al. 〈4〉, we apply Basket's result and get the following expression for the equilibrium state probabilities:

$$
\begin{equation*}
P\left(S_{1}, S_{2}, \ldots, S_{M}\right)=P_{1}\left(S_{1}\right) P_{2}\left(S_{2}\right) \ldots P_{M}\left(S_{M}\right) \tag{AZ}
\end{equation*}
$$

where

$$
\begin{equation*}
P_{i}\left(S_{i}\right)=\left(1-\rho_{i}\right)\left[\sum_{r=1}^{R} n_{i r}\right]!\prod_{r=1}^{R} \frac{1}{n_{i r}!} \rho_{i r}^{n_{i r}} \tag{AB}
\end{equation*}
$$

and $\rho_{i r}$ and $\rho_{i}$ are defined in Eqs.(2) and (3) respectively.
$P_{i}\left(S_{i}\right)$ is also the marginal probability that channel $i$ is in state $S_{i}$. Let $N_{i r}(z)$ be the generating function of the number of
class $r$ messages at channel $i_{0} N_{i r}(z)$ can be wititen as:

$$
\begin{equation*}
N_{i r}(z)=\sum_{\text {all states } S_{i}} P_{i}\left(S_{i}\right) z^{n_{i r}} \tag{A4}
\end{equation*}
$$

Using Eq. (A3) in Eq. (A4), and after simplification, we get:

$$
\begin{equation*}
N_{i r}(z)=\frac{1-\rho_{\mathbf{i}}}{1-\rho_{\mathbf{i}}^{+} \rho_{\mathbf{i r}}(1-z)} \tag{A5}
\end{equation*}
$$

From Eqs.(A2) and (A5), it is easy to see that $N_{r}(z)$ has the product form in $E q_{0}(A l)$ because the equilibrium state probablifies are the same as if the state variable of the $M$ channels are mutually independent.

## Lemma 2:

Let $p_{n}(r)$ be the equilibrium probability that the number of class $r$ messages in the network is $n$, and
$d_{n}(r)$ the probabillty that a class $r$ departure left behind $n$ class $r$ messages.

Then

$$
\begin{equation*}
p_{n}(r)=d_{n}(r) \quad n=0,1,2 \ldots \tag{A6}
\end{equation*}
$$

Proof:
A proof of this lemma for the single server queue is available in $\langle 2,5\rangle$. By treating the whole network as a single service facility, the same proof can be used for our network model.

We now prove our main theorem. Let $D_{r}(z)$ be the generating function of the number of class messages left behind by a class $r$ departure。 Eq. (A6) implies that:

$$
\begin{equation*}
N_{r}(z)=D_{r}(z) \tag{A7}
\end{equation*}
$$

Since we have assumed fixed routing and a FCFS discipline at each channel. the number of class $r$ messages left behind by a class $r$ departure must equal to the number of class $r$ arrivals during the stay of the departing message in the network. Since we have also assumed a Poisson arrival process. $D_{r}(z)$ is given by $\langle 2\rangle$ :

$$
\begin{equation*}
D_{r}(z)=T_{r}^{*}(\gamma(r)-\gamma(r) z) \tag{A8}
\end{equation*}
$$

Substituting sor $\gamma(r)=\gamma(r) z$. Eq. (A8) is reduced to:

$$
\begin{equation*}
T_{r}^{*}(s)=D_{r}(1-S / \gamma(r)) \tag{A9}
\end{equation*}
$$

Finally, using Eq. (A1) and (A7) in Eq. (A9), we get:

$$
\begin{equation*}
T_{r}^{*}(s)=\prod_{i \in a(r)} \frac{\mu C_{i}\left(1-\rho_{i}\right)}{s+\mu C_{i}\left(1-\rho_{\mathbf{i}}\right)} \tag{A10}
\end{equation*}
$$

QED


Figure 1. Hypothetical Network


Figure 2. Traffic Matrix


Figure 3. End-tc-end Delay from Node 1 to Node 2 (Fixed Routing)


Figure 4: End-to-end Delay from Node 1 to Node 2 (Random Routing)


Figure 5. End-to-end Delay of Messages Originated from Node 1 (Fixed Routing)


Figure 6. Overall End-to-end Delay

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--Distribution of end-to-end delay in message-switched networks.

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