# **A Very Accurate Approximation for Cell Loss Ratio in**

## **ATM Networks**♣

A. T. Haghighat, Ph.D. Candidate in Computer Engineering Iran Telecommunication Research Center, End of North Kargar, Tehran 14399, Iran Email: kfaez@cic.aku.ac.ir Email: kfaez@cic.aku.ac.ir

### **Abstract**

We like to find the CLR in ATM networks when the statistical multiplexing is an important factor. In this paper, first we have proposed the combination of three analytical expressions, which approximate the cell loss probability, based on the fluid-flow approximation model and two stationary approximation models. Second, we have provided a very accurate numerical model for the finite buffer, which lies at the input of each VP. The sources are statistically independent and each traffic source has a two-state Markov model. This simulation is done at the cell level and its results are very accurate. We have compared the results of the numerical simulation with the results of the analytical approximation models. Also we have used the linear estimation to find an accurate expression for cell loss approximation in ATM networks loss approximation in ATM networks

### 1. Introduction

ATM as a high-speed cell switching technology can support multiple classes of traffic sources with different quality of service  $(QoS)$  requirements and diverse traffic characteristics. In this study we are interested in one of the QoS requirements: cell loss probability.

In our study the sources are statistically independent and each traffic source has a two-state Markov model [1]. A single source has a variable bit rate alternated asynchronously between On and Off state and bounded by the peak rate r. Such a source in an On state transmits at peak rate and in an *Off* state transmits at zero bit rate. The duration of the *On* and the *Off* state are assumed to be exponentially distributed and therefore the source is completely characterized by three parameters, namely peak rate r, utilization  $\rho$ , and b, where  $\rho$  is the fraction of time the source is active and *b* is the mean of the *On* state period. Other parameters fraction of interest, such as the mean *m* and the variance  $\sigma^2$  of the bit rate are identified completely from the source metric vector  $(r, 0, h)$ .  $\mathbf{r}$  the bit rate are identified completely from the source metric vector *(r,* ρ*, b)*:

$$
m = \rho \cdot r
$$

$$
\sigma^2 = \rho (1 - \rho) r^2
$$

*and*  $\sigma^2 = \rho (1 - \rho) r^2$ <br>The advantages of the above physical model are its simplicity and flexibility, such as it can be used for connections ranging from burst to continuous bit streams.

The remainder of this paper is organized as follows: in section 2, we discussed analytical approximation models. In section 3, we proposed an accurate numerical model for finding the approximation models. In the model in section  $\alpha$  and  $\alpha$  is a section  $\alpha$  and  $\alpha$  model for  $\alpha$  finding the finite huffer which lies at the input of each VP. In section 4, we cell loss probability in the finite buffer, which lies at the input of each VP. In section 4, we have  $\mathbf{y}$ 

 $\stackrel{\text{\textbf{4}}}{\text{\textbf{5}}}$  This research was supported by the Iran Telecommunication Research<br>Contae under contrast T500.4704

proposed a new accurate expression for the cell loss ratio in the buffers of ATM switchs. The conclusion of our study is discussed in section 5.

### 2. Combination of Three Models

In this paper, first we have proposed the combination of three analytical expressions, which approximate the cell loss probability, based on the fluid-flow approximation model and two stationary approximation models. These models have been proposed to approximate the equivalent capacity of two-state Markov sources. Most of researchers that studied the routing in ATM networks used only the results of the fluid-flow approximation model for the call admission function  $(51, 56, 77, 81)$ . But, we showed that for a good approximation, we must combine all the existing models to obtain an accurate result for different ranges of connections characteristics. The following expressions calculate the cell loss ratio in a finite buffer, which lies at the input of each VP. We consider a finite buffer with the capacity of x (Mbit) capacity, FIFO queuing and two-state Markov (On-Off) arrival traffic. Let F be the ratio of the VP capacity C to the VC peak rate  $r(F=C/r)$  and L be the number of VCs in the VP. Considering to the fluid-flow approximation model[1],[2], we have:  $\mathcal{C}$  vertices to the fluid-flow approximation model  $\mathcal{C}$ , we have  $\mathcal{C}$ 

$$
PI_{loss}(L) \begin{cases} = \exp\left(-\frac{x}{r}\left(1+\delta\cdot\frac{L\delta}{F}\right)\left(1-\frac{F}{L}\right)\right) \text{ if } (L>F) \\ = 0 \quad \text{ if } (L\leq F) \end{cases} \tag{1}
$$

On the other hand, we have found  $P_2$ <sub>loss</sub> (*L*), which is the cell loss probability obtained from stationary approximation using binomial distribution. We have: stationary approximation using binomial distribution. We have:

$$
F = k' = \begin{bmatrix} C \\ r \end{bmatrix}, \quad P_k = \begin{bmatrix} L \\ k \end{bmatrix} \rho^k (1 - \rho) L - k
$$

$$
P2_{loss} (L) = \sum_{k=F+1}^{L} P_k
$$
(2)

Also, we have obtained  $P_3$ <sub>loss</sub> (*L*), which is the cell loss probability based on stationary approximation using Gaussian distribution, as follows:  $\mathbf{r}_{\mathbf{r}}$ 

$$
P3_{\text{loss}}(L) = e^{\frac{r^2}{L}(-\frac{(F - \rho L)^2}{2L\sigma^2}) - 0.5\ln(2\pi)}
$$
\n(3)

Since, all three of the above approximations are conservative and valid upper bounds[2],[8] (we will show this fact according to our numerical results),  $P_{loss}(L)$  can be obtained from the following expression: following expression:

$$
Ploss(L)=min\{P1loss(L), P2loss(L), P3loss(L)\}\tag{4}
$$

**3. A Numerical Model**<br>We like to provide a very accurate numerical model for the finite buffer, which lies at the input of each VP. Just like the analytical models, here again, we consider a finite buffer with the capacity of x (Mbit) capacity, FIFO queuing and two-state Markov ( $On$ - $Off$ ) arrival the capacity of x (Mbit) capacity, FIFO queuing and two-state Markov (*On-Off*) arrival

traffic. The result, which has to be calculated at the end, is the buffer overflow probability (the loss probability). Figures 1 show this model briefly. We will obtain the  $P_{loss}$  for different values of L and  $\delta$  by providing a program in C++ language based on this model. The aims and objectives of this simulation are as follows:

- This simulation is done at the cell level and the results of the numerical model are very important. Figures 2 to 4 show the results of our simulation
- Finding an accurate expression for cell loss ratio is the main aim of this research.<br>• Figures 3 of different analytical methods, which have represented in this pa
- Evaluation of different analytical methods, which have represented in this paper for  $P_{loss}$  approximation. In this research we have compared the results of the numerical simulation with the results of the Fluid-flow approximation, stationary approximation using Gaussian distribution and stationary approximation using binomial distribution using Gaussian distribution and stationary approximation using binomial distribution
- Proving the fact that the analytical methods of the  $P_{loss}$  approximation are inaccurate<br>and conservative and each of them works out better in a particular range of L (the number of VCs in the VP) and  $\delta (1/\delta)$  is the mean of *Off* periods). These results lead to the substantiation of the expression, which has obtained from the combination of all the the substantiation of the expression, which has obtained from the combination of all the three analytical approximation methods.
- The result of the simulation will help us to determine the minimum, maximum and average error of each of the analytical methods. These results lead to find out the more average error of each of the analytical methods. These results lead to find out the more accurate expressions for calculating the cell loss probability.
- This model has a great flexibility, such that we can also use it for other disciplines (other than  $F(\text{EO})$ ) such as weighted fair queuing (WFO) just by modifying some (other than FIFO) such as weighted fair queuing (WFQ), just by modifying some variables and a small part of the program logic. Also, we can easily use an arrival traffic model else than  $On$ -Off Markov model by modifying the random generators (as an instance, we can use the self-similar traffic generator). These changes are not feasible easily in analytical models and all the algebraic calculations must be repeated from the beginning or we have to ignore the model entirely and using other analytical models. We can use non-homogeneous traffics in this model, too.

Considering to the simulation results, if we assume that the maximum error coefficient (that is equivalent to the minimum of the proportion of the analytical and numerical results) in  $PI_{loss}$ ,  $P_{2l_{\text{loss}}}$ , and  $P_{3l_{\text{loss}}}$  are respectively α1, α2 and α3, then we can write the previous analytical expressions (1, 2, and 3) in a more accurate form as follows:

$$
P1_{loss} = α1*PI_{loss}
$$
 (old)  
\n
$$
P2_{loss} = α2*P2_{loss}
$$
 (old)  
\n
$$
P3_{loss} = α3*P3_{loss}
$$
 (old)  
\nWhere:  
\n
$$
α1=1.04*102
$$
  
\n
$$
α2=9.55*10-3
$$
  
\n
$$
α3=7.37*10-3
$$

Where:

$$
\alpha
$$
3=7.37\*10<sup>-3</sup>  
Finally,  $P_{loss}(L)$  can be calculated from the following expression:

$$
P_{loss}(L) = \min\{PI_{loss}(L), P2_{loss}(L), P3_{loss}(L)\}\tag{5}
$$

To find the upper bound for  $P_{loss}$ , we used the maximum error coefficient. These expressions are the results of combining the analytical and numerical methods, which are discussed in this are the results of combining the analytical and numerical methods, which are discussed in this paper.

We repeate the simulation for  $P_{\text{max}}$  and the VP capacity and the VP capacity and the buffer size and we saw the expression  $(5)$  is a valid upper bound for  $P_{\text{max}}$  $\frac{1}{1}$  is a valid upper bound for  $\frac{1}{1}$  is a valid upper bound for  $\frac{1}{1}$ 

**4. A Very Accurate Model**<br>Although the results of the numerical model are very accurate, but these results can not be used directly in the ATM routing algorithm or call admission function. Actually we need an explicit and simple expression, which can approximate  $P<sub>loss</sub>$  as a function of different parameters such as L,  $\delta$ , x, and  $F(C/r)$ . In the previous section, we found constant coefficients for compensating the error of the P, expression, which have been obtained by the three for compensating the error of the  $P_{loss}$  expression, which have been obtained by the three analytical models. But in this section, we like to estimate a new accurate expression for cell loss ratio based on the results of the exact numerical model. In other words, we want to find the  $P_{loss}$  expression as a function of the model parameters. Usually the desired cell loss probability is considered in the range of  $10^{-6}$  to  $10^{-19}$  [2]. But we have considered the range of  $10^{-3}$  to  $10^{-9}$  from  $R_{\text{tot}}$  to  $\frac{1}{2}$  and a gravitation of the model of  $\frac{1}{2}$  We will take function in th  $\frac{1}{2}$ <br>10<sup>-3</sup> to 10<sup>-9</sup> for P<sub>loss</sub> to find a valid expression in a wide range of L. We will try to find an<br>expression which can approximate P<sub>lass</sub> in this range with high accuracy expression, which can approximate  $P_{loss}$  in this range with high accuracy.

The figures 2 to 4 show  $PN<sub>loss</sub>$  (the numerical model results) in comparison with the results of The figures analytical approximation models, for  $\delta$  respectively equal to 0.125, 1, and 5. Note that these curves are drawn logarithmically. We have chosen these values (0.125, 1 and 5) for  $δ$  to find a general expression which can be used in a wide range of arrival traffics, from almost burst traffic  $(δ=0.125, 0=1/9)$  to nearly continuous bit streams  $(δ=5, 0=5/6)$ almost burst traffic ( $\delta$ =0.125,  $\rho$ =1/9) to nearly continuous bit streams ( $\delta$ =5,  $\rho$ =5/6).

Figures 2 to 4 show that the logarithm of  $PN<sub>loss</sub>$  in the range of 10 to 10<br>of L. So, we can use the linear estimation method to obtain an expression t of L. So, we can use the linear estimation method to obtain an expression for the  $P_{loss}$ . But the problem is that each of these lines can be used just for particular  $F(F=C/r)$ , x and  $\delta$ . In the other word if  $F \times x$  and  $\delta$  are constant and the P<sub>ro</sub> (we have called it w) is a function of I other word, if F, x and  $\delta$  are constant and the P<sub>loss</sub> (we have called it  $\psi$ ) is a function of L (Number of VCs), then the slope of  $\psi$  will be a function of F, x and  $\delta$ . We have the following expressions: expressions:

$$
ln(P_{loss}) = \psi(L, F, x, \delta)
$$

$$
ln(P_{loss}) = \psi(L, F, x, \rho)
$$

Since  $\rho = \delta/(\delta + 1)$ , we can write:

```
\frac{\partial \psi(L, F, x, ρ)}{\partial L} = f(F, x, ρ)
```
Considering that  $\psi$  is a linear function of L. Table 1 shows the end points of 27 lines, which estimate  $\psi$  for x of 24, 48, and 96, F of 25, 50, and 100, and  $\delta$  of 0.125, 1, and 5. These ranges are considered wide to achieve an expression, which is valid in all ranges of F, x, L, and  $\delta$ . We have liked to find a line, in which the end points ((X1,Y1) and (X2,Y2)) are the function of E, x, and  $\delta$ . These parametric end points must be fit to all of 27 end points ((x1,y1)) function of F, x, and ρ. These parametric end points must be fit to all of 27 end points ((x1,y1) and (x2,y2)) in Table 1.

As we have already mentioned, in ATM networks, the desired CLR is considered in the range of  $10^{-6}$  to  $10^{-9}$  [2]. But we have considered the range of nearly  $10^{-3}$  to nearly  $10^{-9}$  (because of limitation of the results of simulation, these values are not exactly equal to  $10^{-3}$  and  $10^{-9}$  for  $P_{\text{true}}$  to find a valid expression in a wide range of I. We will try to find an expression which  $P<sub>loss</sub>$  to find a valid expression in a wide range of L. We will try to find an expression, which can approximate  $P_{loss}$  in this range with high accuracy. Since in all end points, y1 is nearly equal to 9.5\*10<sup>-8</sup> and y2 is nearly equal to  $1.9*10^{-3}$  (these values are the averages of y1 and y2 is nearly equal to  $1.9*10^{-3}$  (these values are the averages of y1 and y2 is nearly equal to  $1.9*10^{-3}$ in Table 1), we can write:

 $Y1=ln(9.5*10^{-1})=-16.17$ <br> $Y2=ln(1.9*10^{-3})=-6.27$  $Y2=ln(1.9*10^{-})=-6.27$ 

Although Y1 and Y2 found easily, but finding X1 and X2 as functions of network and traffic individually. Then we have write a program to find the coefficients of the expressions by try end error (iteration) method. Finally we have found the following expressions, which are the accurate approximation of  $X1$  and  $X2$ :  $\mathcal{L}$  and  $\mathcal{L}$  and  $\mathcal{L}$  and  $\mathcal{L}$  is  $\mathcal{L}$  and  $\mathcal{L}$  :

$$
X1 = 0.53\frac{F}{\rho} + 0.5F + \frac{5}{\delta}(\frac{F}{25} - 1) + \frac{2.5}{\delta}(\frac{x}{24} - 1)
$$
  

$$
X2 = 0.8\frac{F}{\rho} + 0.24F + \frac{2}{\delta}(\frac{F}{25} - 1) + \frac{2.5}{\delta}(\frac{x}{24} - 1)
$$

The linear estimation can be written as Follows: The linear estimation can be written as Follows:

$$
y = \frac{Y2(X1 - x) + Y1(x - X2)}{X1 - X2}
$$

and a simple modification, we can write: and a simple modification, we can write:

$$
Ploss = e \frac{171.6 - 64.35F - 6.875x + 66L\delta - 69.058F\delta}{20 + F + 0.066F\delta} \tag{6}
$$

 $S_{\text{S}}$  for calculating  $\sim$   $\frac{1}{1000}$  for calculating  $\sim$   $\frac{1}{1000}$  and  $\sim$   $\frac{1}{1000}$  algorithms of  $\sim$   $\sim$   $\sim$   $\sim$ So, we can use the expression (6) for calculating  $P<sub>loss</sub>$  in the routing algorithms of ATM

### 5. Conclusion

In this paper, first we discussed three analytical approximation methods for cell loss ratio and combined these methods for finding the more accurate expression (4). Since the results of the  $P<sub>loss</sub>$  expression (4) are not accurate, we provided a very accurate numerical model for the finite buffer at the input of each VP. We used the maximum error coefficient and found a more accurate expression (5) for  $P_{loss}$ . Then we used the linear estimation to find the  $P_{loss}$  as a function of the model parameters and found a very accurate expression for calculating the cell  $loss probability (expression (6)).$ 

The curves of figures 2 to 4 show that our approximation model ( $P6<sub>loss</sub>$ , which can be  $\text{c}$  calculated by expression (6)) is accurate (note that PN<sub>bor</sub> is the results of an accurate model of calculated by expression (5)) is accurate (note that PNloss is the results of an accurate model of  $P_{1...}$  $P<sub>loss</sub>$ ).

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Table 1 The End Points of Estimated lines



**Figure 1. Numerical Model of Finite Buffer with On\_Off Markov Sources.**





