



대기행렬 이론 개론

VIII. Computer Simulation

■ 학습 목표

- 컴퓨터 시뮬레이션을 통한 통신네트워크 성능 분석 방법을 학습한다.
- 대기행렬이론을 이용한 수학적 성능 분석 방법과 컴퓨터 시뮬레이션을 이용한 성능 분석 방법을 비교한다.

■ 목차

- 1. Random Number Generation
- 2. The Inversion Transform Method
- 3. Traffic Generation
- 4. Computer Simulation

1. Random Number Generation (1/2)

A random number generator is a computational or physical device designed to generate a sequence of numbers or symbols that lack any pattern, i.e. appear random.

Most C implementations have, lurking within, a pair of library routines for initializing, and then generating, random numbers. In ANSI C, the synopsis is:

source 7.1.0 rand()

```
#include <stdlib.h>
#define RAND_MAX 32767

void srand(unsigned seed);
int rand(void);
```

Random Number Generation (2/2)

- The random number has the uniformity and the independence.

You initialize the random number generator by invoking `srand(seed)` with some arbitrary seed. You obtain successive random numbers in the sequence by successive calls to `rand()`. That function returns an integer that is typically in the range 0 to the largest representable positive value of type `int` (inclusive). Usually, as in ANSI C, this largest value is available as `RAND_MAX`, but sometimes you have to figure it out for yourself. If you want a random float value between 0.0 (inclusive) and 1.0 (exclusive), you get it by an expression like

```
x = (float)rand() / (RAND_MAX+1.0);
```

Example

```
#define A    16807L          /* multiplier (7**5) for 'ranf' */
#define M    2147483647L    /* modulus (2**31-1) for 'ranf' */

static long SeedTable[16]= {0L, /* seeds for streams 1 thru 15 */
    1973272912L,  747177549L,   20464843L,   640830765L,  1098742207L,
    78126602L,   84743774L,   831312807L,  124667236L,  1172177002L,
    1124933064L, 1223960546L,  1878892440L, 1449793615L,  553303732L};

static int strm=1;          /* index of current stream */

double ranf(void)
{
    short *p,*q,k; long Hi,Lo;
    p=(short *)&SeedTable[strm]; Hi=*(p+1)*A; /* 16807*H->Hi */
    *(p+1)=0; Lo=SeedTable[strm]*A; /* 16807*L->Lo */
    p=(short *)&Lo; Hi+=*(p+1); /* add high-order bits of Lo to Hi */
    q=(short *)&Hi; /* low-order bits of Hi->Lo */
    *(p+1)=*q&0x7fff; /* clear sign bit */
    k=*(q+1)<<1; if (*q&0x8000) k++; /* Hi bits 31-45->K */
    /* form Z + K [- M] (where Z=Lo) : presubtract M to avoid overflow */
    Lo-=M; Lo+=k; if (Lo<0) Lo+=M;
    SeedTable[strm]=Lo;
    return((double)Lo*4.656612875E-10); /* Lo x 1/(2**31-1) */
}
```

Random Integer Generator

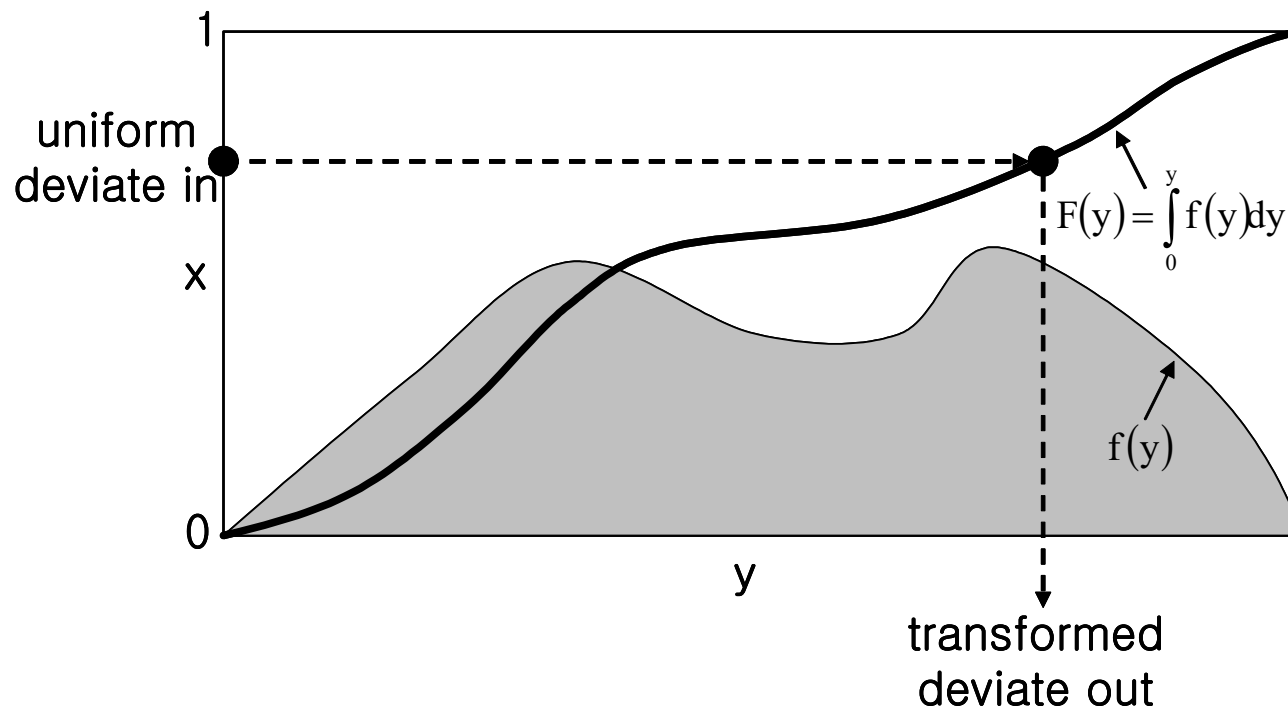
- Random Integer Generator
 - ‘rani’ returns an integer equiprobably selected from the set of integers $i, i+1, i+2, \dots, n$.

```
int rani(int i, int n)
{
    if (i==n)    return i;
    if (i>n) { printf("random Argument Error: i > n\n"); exit(1); }
    n-=i; n=(int) ( (n+1.0)*ranf() );
    return(i+n);
}
```


2. The Inversion Transform Method

How to generate sample values from the exponential distribution? This section gives you answers.

We consider the cumulative distribution function $y = F(x)$, where y is uniformly distributed in $[0, 1]$. The sample value x can then be generated from the inverse function $x = F^{-1}(y)$. In some cases, it is possible to determine directly the inverse of the distribution function of a theoretical distribution.



Example – Exponential Distribution

- Exponential distribution

For example, suppose interarrival times are exponentially distributed with mean λ . The cumulative distribution is given by

$$F(x) = 1 - e^{-\lambda x}$$
$$x = -\frac{1}{\lambda} \ln(1 - y)$$

where y is a random variate uniformly distributed in $[0, 1]$, $(1 - y)$ is identically distributed, therefore, we can rewrite as

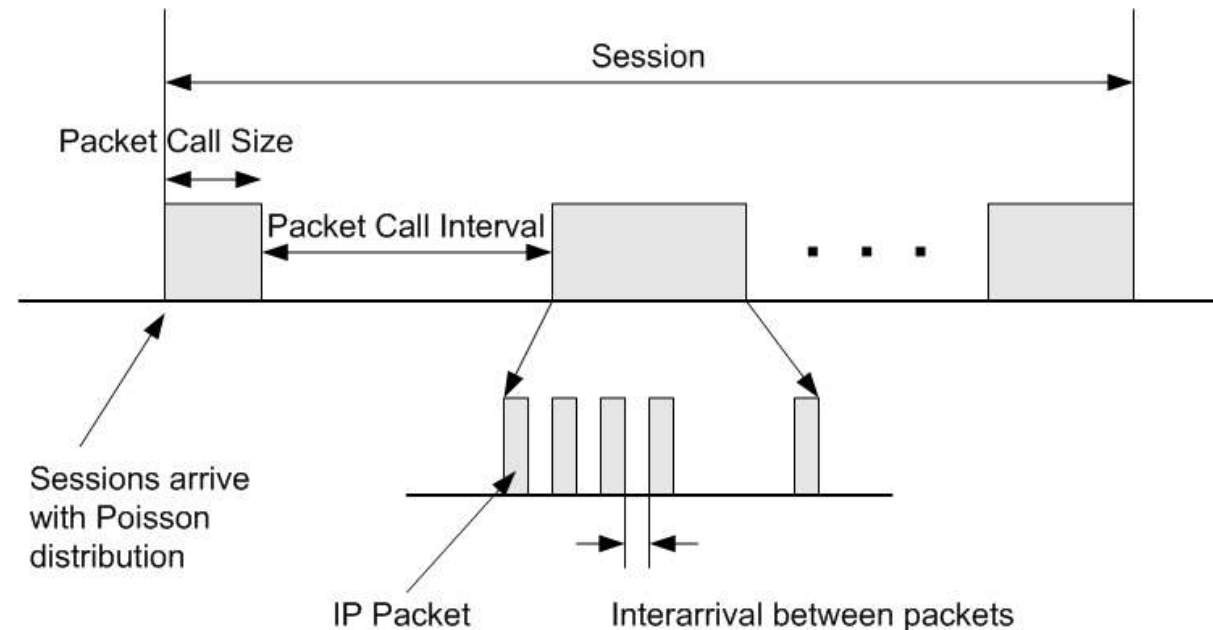
$$x = -\frac{1}{\lambda} \ln y$$

- C codes

```
double expntl(double mean)
{
    return (-mean*log(ranf()));
}
```


Example – Pareto Distribution (1/2)

- Pareto distribution
 - A pareto distribution has a heavy-tail. It is useful to model internet traffic using a pareto distribution.



- One session in web traffic model is composed of packet calls and one call consists of packets. The packet calls per session are geometrically distributed and inter-arrival time between packet calls is exponentially distributed. The number of packets per packet call is Pareto distributed with parameter $\beta = 1.1$ and $k = 2.27$ (mean number = 25).

Example – Pareto Distribution (2/2)

- Pareto distribution

$$F(x) = \begin{cases} 1 - \left(\frac{k}{x}\right)^\alpha & \text{if } x \geq k > 0 \\ 0 & \text{if } x < k \end{cases}$$

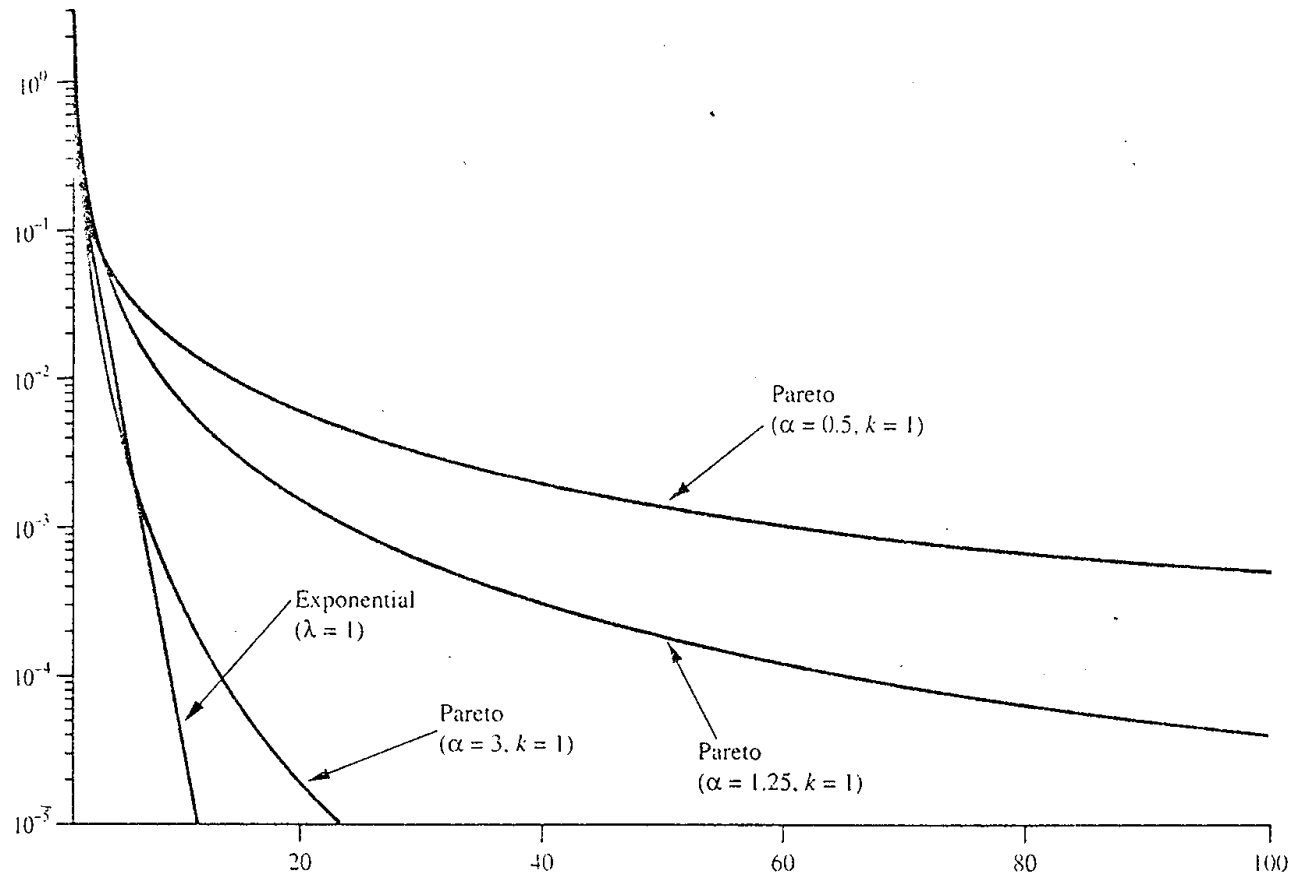
- C codes

```
double pareto(double alpha, double k)
{
    double u;

    u = ranf();
    if (u==0.0) return k;
    else      return k / pow(u, 1.0/alpha);
}
```

Exponential Distribution vs. Pareto Distribution

- The comparison of an exponential distribution and pareto distributions
 - The heavy-tail property of pareto distribution means that probability of pareto distribution is greater than that of exponential distribution as x increases. It is considered that the heavy-tail property is suitable for modeling an Internet traffic which has data transmissions **for a long time.**)



3. Traffic Generation

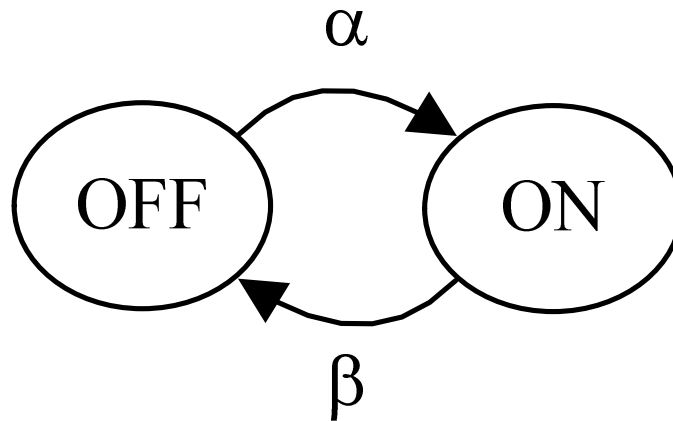
- Data traffic
 - FTP traffic can be modeled as a Poisson process.
 - The interarrival time between packets is exponentially distributed.

```
#define END_SIMTIME 36000 /* simulation time */
int poisson_traffic(int queueNum, double lambda, double avgPktLength)
{
    int numArrival=0;
    double arrivalTime, departureTime;

    for (arrivalTime=0.0; arrivalTime<END_SIMTIME; arrivalTime+=expntl(1./lambda))
    {
        departureTime = arrivalTime + expntl(avgPktLength);
        insert_queue(arrivalTime, departureTime);
        /* insert the packet into a traffic_queue */
        numArrival++;
    }
    return numArrival;
}
```

Voice Traffic Model

- Voice traffic
 - In VoIP services, the ON–OFF source model has been used to characterize traffic from a single voice source. A voice packet arrives at fixed intervals of T ms during talk spurts or in the ON state, and no packet arrives during silences or in the OFF state.



Voice Traffic Generation (1/2)

- There are K voice users. Each user generates ON-OFF voice traffic with the avgTalkTime and the avgSilentTime.

```
#define END_SIMTIME 36000 /* simulation time */
int voice_traffic(int K, double avgTalkTime, double avgSilentTime)
{
    int    userIndex;
    int    numArrival=0;
    double arrivalTime, departureTime;
    int    state, nextState;
    double onPeriod, offPeriod;

    for (userIndex=0; userIndex<K; userIndex++)
    {
        state = rani(0, 1);
        ...
    }
    return numArrival;
}
```


Voice Traffic Generation (2/2)

```
for (arrivalTime=0.0; arrivalTime<END_SIMTIME; \  
    arrivalTime=departureTime, state=nextState) {  
    // ON state  
    if (state==1)  
    {  
        onPeriod      = expntl(avgTalkTime);  
        departureTime = arrivalTime + onPeriod;  
        nextState     = 0;  
        insert_queue(arrivalTime, departureTime, userIndex);  
        /* insert the packet into a traffic_queue */  
    }  
    // OFF state  
    else  
    {  
        offPeriod     = expntl(avgSilentTime);  
        departureTime = arrivalTime + offPeriod;  
        nextState     = 1;  
    }  
}
```

4. Computer Simulation

- We consider an uplink for a wireless communication system with N users and a base station. The N users generate data packets at a Poisson rate λ and the service times of the packets are exponentially distributed with a mean of 1 second. Plot the average delay as the value of ρ increases.
- There are two kinds of simulation methods: time-based simulation and event-based simulation.

Definitions

```
#include <stdio.h>
#include <stdlib.h>
#include <math.h>

// Simulation environment
#define SIM_TIME    1.0e6    // Simulation time
#define SERV_TIME  1.00     // Mean service time

double ranf();
double expntl(double mean);
double mm1_ana(double lambda);    // Analysis
double mm1_sim(double lambda);    // Event-based simulation
double mm1_sim2(double lambda);   // Time-based simulation
```

Main Functions

```
int main()
{
    double    lambda;
    double    mu = 1.0 / SERV_TIME;
    FILE      *fp;

    fp = fopen("f_result.txt", "w");
    if (fp==NULL)
    {
        printf("File open error\n");
        exit(1);
    }

    for (lambda = 0.01; lambda <= mu; lambda += mu/50.0)
    {
        fprintf(fp, "%lf\t%lf\t%lf\t%lf\n", \
                lambda, mm1_ana(lambda), \
                mm1_sim(lambda), mm1_sim2(lambda));
        fflush(fp);
    }

    fclose(fp);
    return 0;
}
```

Analysis

- Average sojourn time

$$W = E(T) = \frac{L}{\lambda} = \frac{1}{\mu - \lambda} = \frac{1}{\mu(1 - \rho)}$$

```
// M/M/1 Analysis
double mm1_ana(double lambda)
{
    double mu = 1.0 / SERV_TIME;

    return (1.0 / (mu - lambda));
}
```

Event-based Simulation (1/2)

```
// M/M/1 Event-based simulation in terms of arrivals and departures
```

```
double mm1_sim(double lambda)
```

```
{
```

```
    double    Ta = 1.0/lambda;    // Mean time between arrivals
```

```
    double    Ts = SERV_TIME;    // Mean service time
```

```
    double    time = 0.0;        // Simulation time
```

```
    double    t1 = 0.0;          // Time for next event #1 (arrival)
```

```
    double    t2 = SIM_TIME;    // Time for next event #2 (departure)
```

```
    unsigned int n = 0;          // Number of customers in the system
```

```
    unsigned int c = 0;          // Number of service completions
```

```
    double    b = 0.0;          // Total busy time
```

```
    double    s = 0.0;          // Area of number of customers in system
```

```
    double    tn = time;        // Variable for "last event time"
```

```
    double    tb;                // Variable for "last start of busy time"
```

```
    double    throughput;        // throughput = c / time
```

```
    double    utilization;       // utilization = b / time
```

```
    double    mean_number;       // mean_number = s / time;
```

```
    double    delay;            // delay = mean_number / throughput;
```


Event-based Simulation (2/2)

```
// Main simulation loop
while (time < SIM_TIME)
{
    if (t1 < t2) // *** Event #1 (arrival) ***
    {
        time = t1; // Update area under "s" curve
        s = s + n * (time - tn); // tn = "last event time" for next event
        n++;
        tn = time;
        t1 = time + expntl(Ta);
        if (n == 1)
        {
            tb = time; // Set "last start of busy time"
            t2 = time + expntl(Ts);
        }
    }
    else // *** Event #2 (departure) ***
    {
        time = t2; // Update area under "s" curve
        s = s + n * (time - tn); // tn = "last event time" for next event
        n--; // Increment number of completions
        tn = time;
        c++;
        if (n > 0)
            t2 = time + expntl(Ts);
        else {
            t2 = SIM_TIME; // Update busy time sum if empty
            b = b + time - tb;
        }
    }
}
}
```

Time-based Simulation (1/3)

```
// M/M/1 Time-based simulation
#define MAX_PKTS          1000000

typedef struct {
    double arrivalTime;
    double departureTime;
} pktType;

double mm1_sim2(double lambda)
{
    pktType      *pktList;
    int          i = 0;
    int          numArrivals = 0;
    double       sumDelay = 0.0;
    double       waitingTime;
    double       arrivalTime;

    pktList = (pktType *)malloc(sizeof(pktType) *MAX_PKTS);
    if (!pktList)
    {
        printf("allocation error\n");
        return -1;
    }
    ...
}
```

Time-based Simulation (2/3)

```
// traffic generation
for (arrivalTime = 0.0; arrivalTime <= SIM_TIME; \
      arrivalTime += expntl(1.0/lambda))
{
    if (i >= MAX_PKTS)
    {
        printf("Out of MAX_PKTS\n");
        return -1;
    }
    else
    {
        pktList[i].arrivalTime = arrivalTime;
        pktList[i].departureTime =
            arrivalTime + expntl(SERV_TIME);

        i++;
        numArrivals++;
    }
}
```

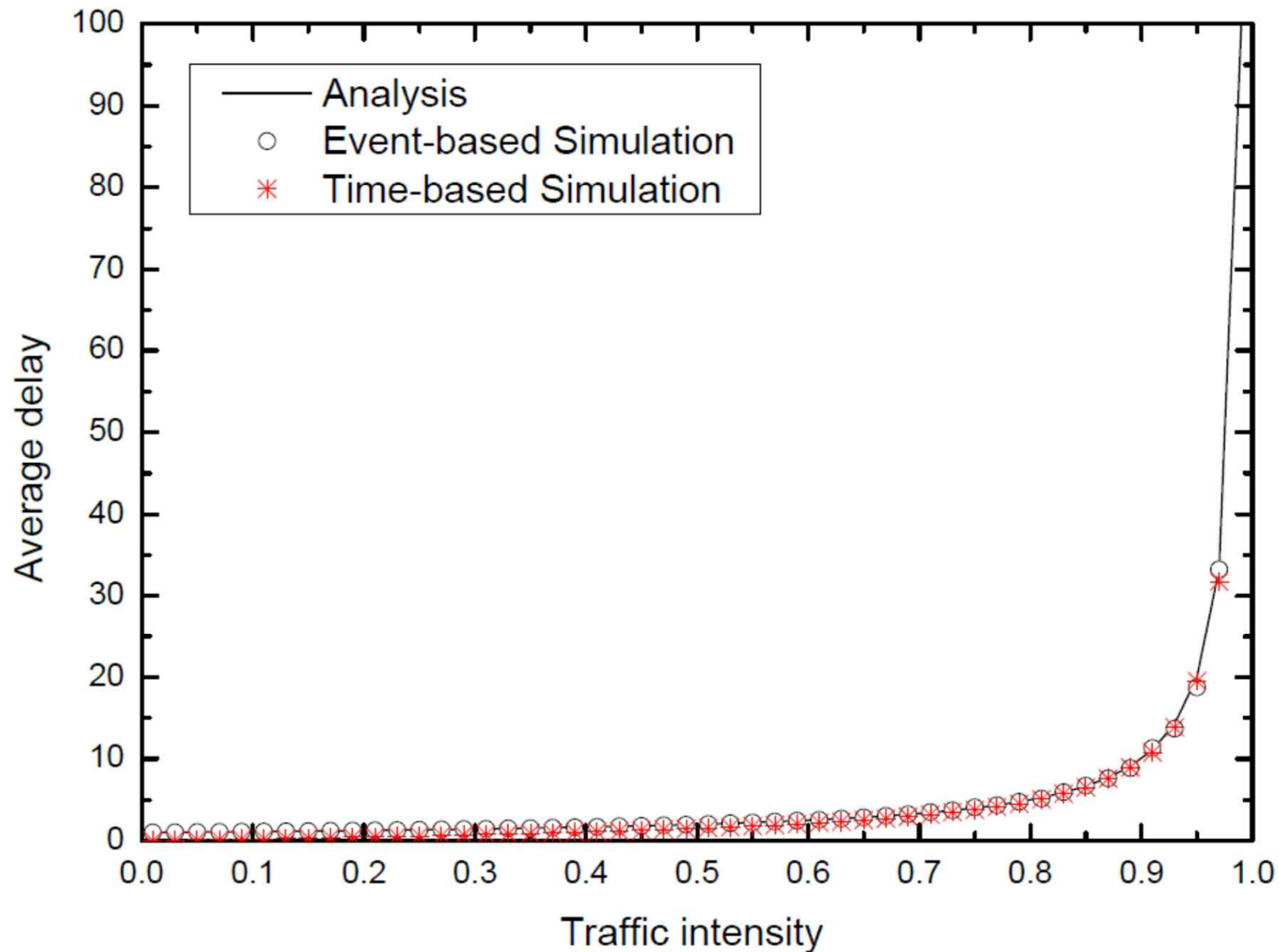
Time-based Simulation (3/3)

```
// scheduling
for (i=1; i<numArrivals; i++)
{
    if (pktList[i].arrivalTime < pktList[i-1].departureTime)
    {
        waitingTime = \
            pktList[i-1].departureTime - pktList[i].arrivalTime;
        pktList[i].departureTime += waitingTime;
        sumDelay +=
            pktList[i].departureTime - pktList[i].arrivalTime;
    }
}

free(pktList);

return sumDelay / (double)numArrivals;
}
```

Average Delay



Summary

- Random Number Generation
 - Generate a sequence of numbers that lack any pattern, i.e., appear random
 - The random number has the uniformity and the independence

- The Inversion Transform Method
 - Generate sample values from the exponential distribution
 - Examples: exponential distribution, pareto distribution

- Traffic Generation
 - Data traffic: Poisson process model
 - Voice traffic: ON-OFF source model

- Computer Simulation
 - Time-based simulation and event-based simulation