Information Networks TSIN01 Assignment

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1 Introduction

The objective of this assignment is to implement slotted ALOHA protocol in a programming language in order to simulate its behaviour. This report will cover documentation about an implementation done on MATLAB as well as results discussions.

2 Slotted ALOHA

2.1 Protocol Flowchart

In each time slot, if a new packets arrives at an unbacklogged node, then the packet will be transmitted with a probability of q_a . But, if this packets arrives at a backlogged node, then it would be discarded. If a node is already backlogged, then it tries to retransmit with probability q_r . Figure 1 above shows this process.

2.2 Implementation on MATLAB

Slotted ALOHA Protocol was implemented on MATLAB. Basically, the strategy followed simulates the whole system at each time slot. Probabilities Qa and Qr are calculated, and then different cases are tested. For example, if we're at a situation where one backlogged node is retransmitting and no unbacklogged is transmitting, then this is a successful transmission. Afterwards, depending on whether it is a collision, feedback or idle situation, the state of backlog is updated and the packets entering/leaving the system as well.

As for question 4, the attempt rate is calculated at each time slot using the current value the backlog. And the probability of success, it is calculated for each possible value of the backlog n, using the formula $P_s = Q_a(1,n)*Q_r(0,n)+Q_a(0,n)*Q_r(1,n)$, and then it is multiplied by the probability (frequency) that this state n appears in the system. Finally, the frequency of success is obtained from simulation results by simply counting the number of successful transmission and dividing it by t=1000.

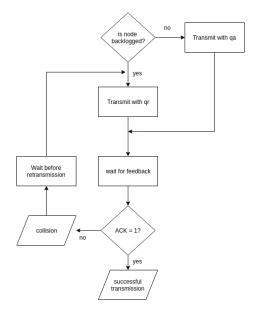


Figure 1: Slotted ALOHA flowchart

2.3 Simulation with $q_r = 0.01$

Simulation results for this case shows the following:

- The backlog is a significant fraction of m, but it increases in a reasonable way.
- The gap between the packets entering and leaving can be improved in the stabilized slotted ALOHA.
- The probability of success can be improved (It is around 0.32) as we know that the maximum is 1/e.
- The attempt rate increases when n increases and decreases with n as well. This can be verified by the formula $G(n) = (m-n) * q_a + n * q_r$

Below are shown figures obtained for question 3, regarding the backlog of the system, and the packets entering/leaving the system.

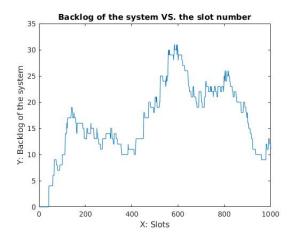


Figure 2: System Backlog

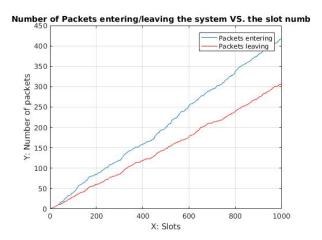


Figure 3: Packets entering vs. Packets leaving

Below are shown figures obtained for question 4, regarding the histogram of the backlog and the attempt rate.

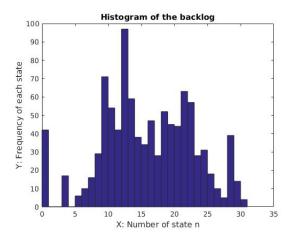


Figure 4: Histogram of the Backlog

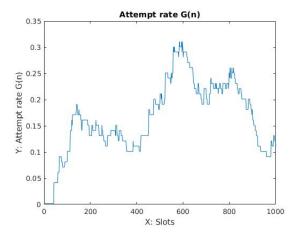


Figure 5: The attempt rate

2.4 Simulation with $\lambda = 0.5$

Simulation results for this case shows the following:

- The gap between the packets entering and leaving the system is larger. In fact, increasing lambda will affect the attempt rate, and as G increases the number of collisions increases, in other words not so many packets are leaving the system.
- Since the number of collisions is more important in this case, the backlog of the system is higher.

• Increasing the value of λ (The system was tested with 0.5, 0.6, 0.8) will not increase the probability of success more than 1/e.

Figures obtained for this simulation ($\lambda=0.5$, $q_r=0.01$), are shown down below.

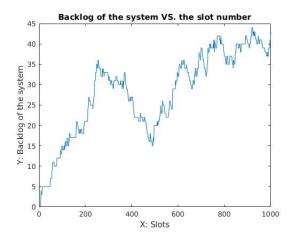


Figure 6: System Backlog

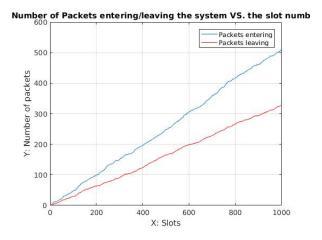


Figure 7: Packets entering/leaving the system

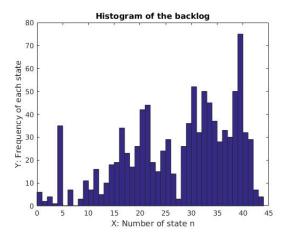


Figure 8: Histogram of the Backlog

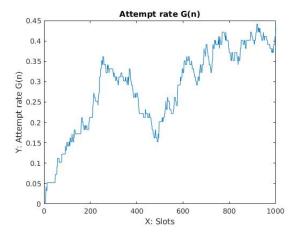


Figure 9: The attempt rate

2.5 Simulation with $q_r = 0.1$

Simulation results for this case shows the following:

- The attempt rate G(n) increases with n faster when the value of q_r is higher.
- The system is heavily backlogged and this happens when G(n) > 1.
- A large number of nodes becomes backlogged very quickly and thus an important number of new packets arrival are discarded.

- When q_r is very large, the system saturates. This statement can be verified with larger values than 0.1 as well.
- Another observation is that for some simulations, the backlog can become zero at some given time slots and this is due to the fact that q_r is not a very small value compared to the λ .

Figures obtained for the simulation with $q_r=0.1$ and $\lambda=0.37),$ are shown down below.

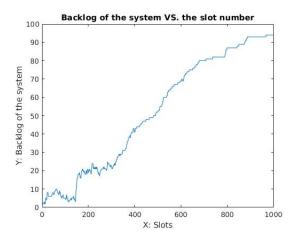


Figure 10: System Backlog

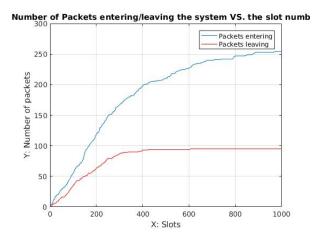


Figure 11: Packets entering/leaving the system

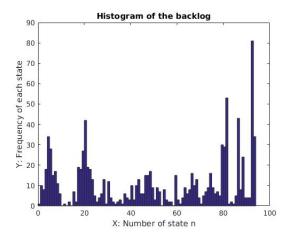


Figure 12: Histogram of the Backlog

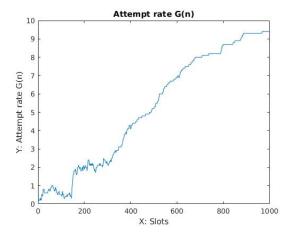


Figure 13: The attempt rate

3 Pseudo Bayesian Slotted ALOHA

The following subsections cover a Pseudo Bayesian stabilized slotted ALOHA.

3.1 Flowchart

The Pseudo Bayesian stabilization states that when a new packets arrives at an unbacklogged node, there is a probability q_r that this packets will be transmitted. If the node is already backlogged, then new arrivals are discarded.

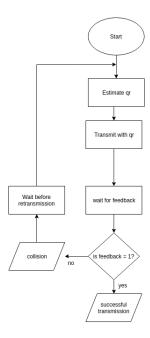


Figure 14: Pseudo Bayesian Slotted ALOHA flowchart

The flowchart shows that regardless of the node status, it will transmit with probability q_r . Figure 2 shows this process.

3.2 Implementation

At each time slot, Poisson packets arrival are simulated, then the number of packets entering the system is calculated. This value depend on the number of nodes that are unbacklogged, because an already backlogged node would discard any new arrival. Next, q_r is calculated, and the number of transmissions occuring in this time slot is obtained. Depending on this number, 0 (idle), 1 (success) or >= 2 (collision), the number of packets leaving is calculated and a new value for the backlog is estimated. This value is important for the calculation of q_r at each time slot.

3.3 Discussion of findings

Clearly, the gap between packets arrival and packets leaving is closed. The reason is that the system is stabilized with the Pseudo Bayesian, which estimates the backlog at each time t_t slot depending on the feedback at t_{t-1} and then adapts q_r . If too many idles, increase q_r , if too many collisions then decrease q_r . Moreover, the advantage of a such stabilization is that the system will return satisfying results for different values of λ .

Figures obtained for a stablized slotted aloha are shown down below.

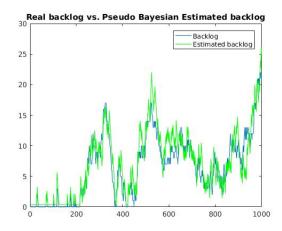


Figure 15: System Backlog

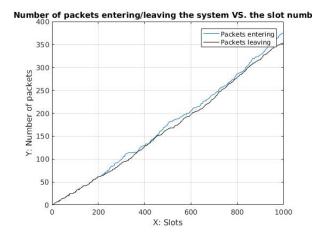


Figure 16: Packets entering/leaving the system

3.4 System Delay

The delay of the system using simulation results is calculated by tracking the time a packet enters the system and the time it leaves (successfly transmitted). The Pseudo Bayesian delay is calculated using the theoretical formula.

It can be seen that when λ is small numerical and theoretical values are very close, but as λ gets greater the gap between numerical and theoretical values becomes important. Another observation is that that ALOHA achieves lower delays when the arrival rate λ is small. Note that the source code used for this part calculations is attached in the Annex C.

Figure down below shows the system (theoretical/real) delay.

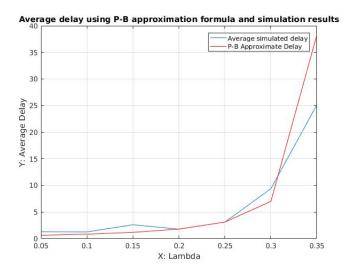


Figure 17: System delay (real/theoretical)

4 Conclusion

All simulations were done with the no-buffering assumption (m=100). The stabilized slotted ALOHA has a defined steady state behaviour for different arrival rates, as it has been tested on the last part. But the system discards a large number of arriving packages and thus has an important finite delay. Its maximum throughput is around 1/e, this can be improved by more sophisticated algorithms (Splitting Algorithms) seen in the second part of the course.

A Slotted ALOHA

```
%Name: Tinhinene AIT HAMOUDA
<sup>2</sup> %Personal Number: 920612-T403
  %Implementation of slotted ALOHA
  function out=slotted_aloha(lambda,q_r,m)
5 %
  % lambda: total arrival rate
  % q_a: transm. prob. of an unbacklogged node
  % q_r: retransmission prob. of backlogged nodes
  \% m: total number of nodes
  % n: number of backlogged nodes
  % m-n: number of unbacklogged nodes
  % t: time
  %
      *************************
  t=1000;%Time in slots
  slots=1:t;%Slots array
  n=0; Backlogged nodes at the beginning = 0
  backlog=zeros(size(1:t)); Backlog array of the system
  packet_arr = 1:t; %Array of packets arriving
  packet_leav = 1:t; %Array of packets leaving
  succ=0;%Counter of the successful transmissions
  state_probs=zeros(size(1:m));
  Att_Rate = 1:t; %Attemp rate array
23
  %Check lambda and m value
  if lambda <= 0 || lambda >1
     fprintf ('Syntax: s_aloha(lambda,q_r,m)');
26
     error ('Bad parameter: lambda shoud be between 0 and
27
        0.36 ');
  elseif \tilde{m} = ceil(m) \mid m=0
     fprintf ('Syntax: s_aloha(lambda,q_r,m)');
29
     error ('Bad parameter: m should be a positive integer '
        );
  end
31
32
  %Calculate q_a: The prob. of an unbacklogged node to send
       a packet
  q_a=1-exp(1)^(-lambda/m);
  fprintf('q_a is \%f \ n', q_a);
```

```
%Check q_r value
  if q_r < q_a \mid q_r >=1
     fprintf ('Syntax: s_aloha(lambda,q_r,m)');
     error ('Bad parameter: q_r should be between q_a and 1
        ');
  end
41
42
  %Print values
  fprintf('lambda is %f \n',lambda);
  fprintf('q_r is \%f \n',q_r);
  fprintf('m is %d \n',m);
  %Overall loop from slot 1 to 1000
49
  for i=1:t
51
     %Calculate Qa and Qr probabilities of the system
52
     Qa = zeros(size(1:101));
53
     Qr = zeros(size(1:101));
      for j = 0:100
55
          Qa(j+1)=binopdf(j,m-n,q_a);
      end
57
      for j = 0:100
         Qr(j+1)=binopdf(j,n,q_r);
59
     end
     %Generation of two random probabilities for the sake
62
         of comparison
     pQa = rand(1);
63
     pQb = rand(1);
65
     We have two overall cases:
66
     %1. No backlogged node (n==0)
     \%2. There is at least one backlogged node (n!=0)
69
     %Case 01: No backlogged node
      if n = 0
71
         if 0 \le pQa \&\& pQa \le sum(Qa(1:1)) \%Idle slot (Note
              that Qa(1) means j=0, no unbacklogged node is
             transmitting)
            packet_arr(i)=0;
73
            packet_leav(i)=0;
         elseif sum(Qa(1:1)) < pQa && pQa <= sum(Qa(1:2)) %
75
             Succssful slot (1 unbacklogged node is
             transmitting)
             packet_arr(i)=1;
76
```

```
packet_leav(i)=1;
77
              succ=succ+1;%Update succssful
          elseif sum(Qa(1:2)) < pQa && pQa <=1 %Collision slot
79
               (More than 1 unbacklogged node is transmitting)
              x=1:
80
              while x<101
81
                 if sum(Qa(1:x)) >= pQa
                     k=x-1; %k represents the number of
83
                         unbacklogged node which are
                         transmitting at the same time
                     break;
84
                end
85
                x = x+1;
86
              end
87
              n = n+k; %Update the backlog of the system
              packet_arr(i)=k;
89
              packet_leav(i)=0; %No packet will leave because
                   it is a collision case
          end
      %Case 02: There is at least one backlogged node
92
       else
          if 0 \ll pQa \&\& pQa \ll sum(Qr(1:1)) %No backlogged
94
              node is transmitting
                 if 0 \le pQb \&\& pQb \le sum(Qa(1:1)) \%Idle slot
95
                     packet_arr(i)=0;
                     packet_leav(i)=0;
97
                 elseif sum(Qa(1:1)) < pQb \&\& pQb <= sum(Qa
98
                     (1:2)) %Succssful slot
                     packet_arr(i)=1;
99
                     packet_leav(i)=1;
100
                     succ=succ+1;
101
                 elseif sum(Qa(1:2))<pQb && pQb<=1 %Collision
102
                    slot
                     x=1:
103
                     while x<101
104
                          if sum(Qa(1:x)) > = pQb
105
                              k=x-1;
106
                              break;
                         end
108
                         x = x+1;
109
                     end
110
                     n=n+k;
                     packet_arr(i)=k;
112
                     packet_leav(i)=0;
                 end
114
```

```
elseif sum(Qr(1:1)) < pQa && pQa <= sum(Qr(1:2))
115
                %One backlogged node is retransmitting
                 if 0 \le pQb \&\& pQb \le sum(Qa(1:1)) \%Succssful
116
                      slot (No unbacklogged node is
                     transmitting)
                     n=n-1; %Update backlog of the system (
117
                         goes from state n to n-1)
                     packet_arr(i)=1;%No new arrival
118
                     packet_leav(i)=1;
119
                     succ=succ+1;
120
                 elseif sum(Qa(1:1)) < pQb && pQb <=1 \%
121
                     Collision slot (1 or more unbacklogged
                     node is transmitting)
                     %Calculate the number of unbacklogged
122
                         node that just
                     %received a new packet
123
                     x=1;
124
                     while x<101
125
                          if sum(Qa(1:x)) > = pQb
                              k=x-1;
127
                              break;
128
                          end
129
                          x = x+1;
130
                     end
131
                     n = n+k;
132
                     packet_arr(i)=k;%k corresponds to the
133
                         number of new arrivals
                     packet_leav(i)=0;
134
                 end
135
136
             elseif sum(Qr(1:2)) < pQa && pQa <= 1 %Two or
137
                more backlogged node are retransmitting
138
                     0 \le pQb \&\& pQb \le sum(Qa(1:1)) \%No
139
                     unbacklogged node is transmitting
                     packet_arr(i)=0;
140
                     packet_leav(i)=0;
141
                 elseif sum(Qa(1:1)) < pQb && pQb <=1 %One or
                    more unbacklogged is transmitting
                     x=1;
143
                     while x<101
144
                          if sum(Qa(1:x)) > = pQb
                              k = x-1;
146
                              break;
                          end
148
                          x = x+1;
149
```

```
end
150
151
                     n = n+k:
152
                     packet_arr(i)=k;
                     packet_leav(i)=0;
154
                 end
155
          end
156
        backlog(i) = n; %Fill the array of the system's
157
           backlog
158
      end
   end
159
160
   %Figure 01: Setting up the plotting environment for the
161
       backlog of the system
   figure (1)
162
   plot(slots, backlog);
163
   xlabel ('X: Slots')
   ylabel ('Y: Backlog of the system')
165
   title ('Backlog of the system VS. the slot number')
167
   %Figure 02: Setting up the plotting environment for
       packets entering/leaving the system
   packets_arrived = 1:t;
   packets_left = 1:t;
   %At t(n+1) sum the number of packets arrived/left with
       the packets that
   %arrived/left the system at t(n)
   for x=1:t
173
        packets\_arrived(x) = sum(packet\_arr(1:x));
174
        packets\_left(x) = sum(packet\_leav(1:x));
175
   end
176
   figure (2)
177
   plot (slots, packets_arrived)
178
   hold on
   plot(slots, packets_left, 'r')
180
   grid on
   xlabel ('X: Slots')
182
   ylabel('Y: Number of packets')
   title ('Number of Packets entering/leaving the system VS.
184
       the slot number')
   legend('Packets entering', 'Packets leaving')
185
187
   %Figure 03: Setting up the plotting environment for the
       histogram of the backlog of the system
   figure (3)
```

```
_{190} M = \max(backlog);
        hist (backlog, M) %Array with the counts of the times in
                  each state
        nelements = hist (backlog, 100); %Count how many times
                  element x was seen
         for x = 1:m
193
                    state_probs(x) = nelements(x)/1000;
194
        end
195
         xlabel('X: Number of state n')
196
         ylabel ('Y: Frequency of each state')
         title ('Histogram of the backlog')
198
199
        %Figure 04: Setting up the plotting environment for the
200
                  attempt rate
        %Calculation of attempt rate plot (theoretical value):
201
         for z = 1:1000
202
                    Att_Rate(z) = q_a*(m-backlog(z))*q_a + q_r*(backlog(z))
203
                            ));
        end
204
         figure (4)
205
         plot(slots, Att_Rate)
        xlabel ('X: Slots')
207
         ylabel('Y: Attempt rate G(n)')
         title ('Attempt rate G(n)')
209
210
211
        %Compare frequency of success to the theoretical
                  probability of sucess
       %1. Calculation of average probability of success derived
213
                    from simulation
       Ps_sim = succ/t;
       %2. Calculation of average theoretical probability of
                  success
        Ps_{-}theor = 0;
216
         for i = 1:m
217
                   \%tmp: Qr(1,n)*Qa(0,n)+Qa(1,0)*Qr(0,n)
218
                   tmp = (binopdf(1, m-(i-1), q_a) * binopdf(0, (i-1), q_r)) + (binopdf(0, (
219
                            binopdf(0,m-(i-1),q_a)*binopdf(1,i-1,q_r));
                   %tmp2 : tmp*the probability that this state n happens
220
                   tmp2 = tmp * state_probs(i);
221
                    Ps_theor = Ps_theor + tmp2; \( \text{\text{Update Ps_theor}} \)
222
        end
223
224
       %Display values of simulation/theoretical probability of
                  success
```

B Stabilized Slotted ALOHA

```
<sup>1</sup> %Implementation of Pseudo Bayesian stabilization for
      Slotted ALOHA
3 m=100;%Total number of nodes
  n=0;%Real backlog
  backlog=zeros(size(1:1000)); %Backlog array
  n_estimated=0;%Estimated backlog
  backlog_estimate=zeros(size(1:1000)); %Estimated backlog
  node_status=zeros(size(1:100)); %Status of nodes (1 stands
       for backlogged / 0 for unbacklogged)
  Pr = zeros(size(1:20));%Probability of k packets arriving
       in a node at a given time slot
  packets_arrival=zeros(size(1:1000)); %Number of packets
      arriving at a time slot
  packets_leaving=zeros(size(1:1000)); Number of packets
11
      leaving at a time slot
  lambda=1/exp(1);%Arrival rate
12
13
  %Simulation of up to 20 packets arrival
  for j = 0:21
15
    %Poisson arrival of packets at a node
    Pr(j+1) = poisspdf(j, lambda/m);
  end
18
19
  for t = 1:1000
20
21
       transmit = 0; %Temporary variable to see how many
22
          packets are there in the system
23
      %Part 01: Figure our which nodes are backlogged
       count = 0:
25
       for j = 1:100 %Loop over all nodes
           a=rand(1); Random realization of Pr (probability
27
               that k packets arrived at node j)
           if node_status(j) == 0 %Unbacklogged node
28
               if 0 \le a && a \le Pr(1)\% No packet arrival:
                   Pr(x \le 0)
                   %Nothing changes
30
```

```
elseif a > sum(Pr(1:1))%More than one arrival
31
                    node_status(j)=1; %1. Node becomes
32
                        backlogged
                    n=n+1;%2. Update the backlog of the
33
                        system
                    count = count + 1;
34
                end
35
            else %Backlogged nodes
36
                %Nothing changes
37
           end
       end
39
       %Update number of packets that entered the system at
40
           this time slot
       packets\_arrival(t) = count;
41
       %At this stage we know which nodes are backlogged
43
44
       %Calculate qr
45
       if n_{estimated} >= 0 \&\& n_{estimated} < 1
          q_r = 1;
47
       else
          q_r = 1/n_estimated;
       end
51
       for j = 1:100 %Loop over all nodes and test the
52
           backlogged nodes
           if node_status(j) == 1 %Backlogged node (has a
53
              packet)
              b=rand(1); Random outcome for each backlogged
54
                  node
               if b \ll q_r
55
                   transmit = transmit +1;
56
57
          end
       end
59
       if transmit = 0 %Idle slot
61
            n_{estimated} = max(lambda, n_{estimated} + lambda - 1)
               ;%Based on feedback 0
            packets\_leaving(t) = 0;
       elseif transmit == 1 %Successful slot
           n = n-1; %Backlog decreases
           n_{estimated} = \max(lambda, n_{estimated} + lambda -
66
               1); Based on 1 feedback
           packets_leaving(t) = 1;
67
           %Update node_status : one backlogged node has to
68
```

```
become unbacklogged
            for x = 1:100
                if node_status(x) == 1
70
                     node_status(x)=0;%Free one backlogged to
                        become unbacklogged
                    break;
72
                end
73
            end
        else %Collision slot
75
            n_{estimated} = n_{estimated} + lambda + (exp(1)-2)
                ^-1;%Based on e feedback
            packets_leaving(t) = 0;
       end
78
79
       %Save backlog results at time t
       backlog(t) = n;
81
        backlog_estimate(t) = n_estimated;
82
   end
83
   slots = 1:1000;
85
   figure (1) %Setting up the plotting environment for the
       backlog of the system
   xlabel('Slot number, n')
   ylabel('Backlogged packets')
   plot(slots, backlog)
   hold on
   plot(slots, backlog_estimate, 'g')
   title ('Real backlog vs. Pseudo Bayesian Estimated backlog
   legend('Backlog', 'Estimated backlog')
93
94
95
   %Figure 02: Setting up the plotting environment for the
       packets entering/leaving the system
   packets_arrived=1:1000;%Count total number of packets
       entering from the begining
   packets_left = 1:1000; % Count total number of packets
       leaving from the begining
100
   for x=1:1000
101
        packets\_arrived(x) = sum(packets\_arrival(1:x));
        packets_left(x)= sum(packets_leaving(1:x));
103
   end
   figure (2)
105
   plot(slots, packets_arrived)
```

C Stabilized Slotted ALOHA, with different values of λ

```
_{1} W = zeros (size (1:7)); Pseudo Bayesian approximation delay
       (Theoretical)
<sup>2</sup> D = zeros(size(1:7)); %Average simulated delay (Real)
  index = 1;%This variable will be used to iterate through
     W and D arrays
  for lambda = 0.05:0.05:0.35
5
      m=100;%Total number of nodes
      n=0;%Real backlog
       backlog=zeros(size(1:1000)); Real backlog array
       n_estimated=0;%Estimated backlog
10
       backlog_estimate=zeros(size(1:1000)); %Estimated
11
          backlog array
       node_status=zeros(size(1:100)); %Status of nodes (1
          stands for backlogged / 0 for unbacklogged )
      Pr = zeros(size(1:100)); %Probability of k packets
13
          arriving in a node at a given time slot
       packets_arrival=zeros(size(1:1000));%Number of
          packets arriving at a time slot
       packets_leaving=zeros(size(1:1000));%Number of
          packets leaving at a time slot
       track_time=zeros(size(1:100));%Track packet delay
16
          arrav
       real_delay = []; %Accumulated real delay
17
       for j = 0:101
19
             %Poisson arrival of packets at a node
20
             Pr(j+1) = poisspdf(j, lambda/m);
      end
23
       for t = 1:1000
```

```
transmit=zeros(size(1:100)); %Temporary array to
26
               see how many nodes are trying to transmit in
               the system
               %Part 01: Figure our which nodes are
28
                   backlogged
                count = 0;
29
                for j = 1:100 %Loop over all nodes
30
                    a=rand(1); Random realization of Pr (
31
                        probability that k packets arrived at
                        node j)
                    if node_status(j) == 0 %Unbacklogged node
32
                         if 0 \le a \&\& a \le Pr(1)\% No packet
33
                            arrival: Pr(x \le 0)
                             %Nothing changes
34
                         elseif a > sum(Pr(1:1))%More than one
35
                             arrival
                             node_status(j)=1; \%1. Node
36
                                 becomes backlogged
                             track_time(j)=1;%Note arrival
37
                                time
                             n=n+1;\%2. Update the backlog of
38
                                 the system
                             count = count + 1;
39
                        end
40
                    else %Backlogged nodes
                        %Nothing changes
                    end
43
                end
44
                packets_arrival(t) = count; %Update number of
                    arrivals at this time slot
46
               %Calculate gr
47
                if n_estimated >= 0 \&\& n_estimated < 1
                   q_r = 1;
49
                else
                   q_r = 1/n_estimated;
51
                end
53
                for j = 1:100 %Loop over all nodes and test
54
                   the backlogged nodes
                   if node\_status(j) = 1 \%Backlogged node (
                       has a packet)
                       b=rand(1); Random outcome for each
                           backlogged node
                       if b \ll q_r
57
```

```
transmit(j) = 1;%This node is
58
                                transmitting
                        else%The node is not transmitting
59
                            track\_time(j) = track\_time(j) + 1;\%
                                Increment the delay time of
                                this node (packet)
                        end
61
                   end
62
                end
63
                if sum(transmit(1:100)) = 0 \%Idle slot
65
                    n_{estimated} = \max(lambda, n_{estimated} +
66
                        lambda - 1); %Based on feedback 0
                     packets_leaving(t) = 0;
67
                elseif sum(transmit) = 1 %Successful slot
                    n = n-1;%n decreases
69
                    n_{estimated} = \max(lambda, n_{estimated} +
70
                        lambda - 1); Based on feedback 1
                    packets_leaving(t) = 1;
                    %Update node_status : one backlogged node
72
                         has to become unbacklogged
                     for x = 1:100
73
                         if transmit(x) == 1
74
                             node_status(x) = 0;%Free one node
75
                                 to become unbacklogged
                             real_delay = [real_delay,
76
                                 track_time(x)];
                             track_time(x)=0;
77
                             break;
78
                         end
                    end
80
                else %Collision slot
81
                    n_{estimated} = n_{estimated} + lambda + (exp.)
82
                        (1)-2)^-1; Based on feedback e
                     packets_leaving(t) = 0;
83
                     track_time = track_time + node_status;
                end
85
                %Save backlog results at time t
87
                backlog(t) = n;
                backlog_estimate(t) = n_estimated;
       end
91
       packets_arrived =1:1000; %Total packets arrived from
93
           the begining
```

```
packets_left = 1:1000; %Total packets leaving from the
94
             begining
         for x=1:1000
95
                   packets\_arrived(x) = sum(packets\_arrival(1:x))
                   packets_left(x)= sum(packets_leaving(1:x));
         end
98
        D(index) = mean(real_delay);
100
        W(index) = ((exp(1) - 0.5)/(1-lambda*exp(1))) - ((exp(1) - 0.5)/(1-lambda*exp(1)))
101
             -1*((\exp(1) \cap \operatorname{lambda}) - 1))/(\operatorname{lambda}*(1 - ((\exp(1) - 1))*((\exp(1) - 1))))
             \exp(1) \hat{lambda}(-1)))));
         index = index + 1;
102
    end
103
104
105
    lambdaArray = [0.05 \ 0.1 \ 0.15 \ 0.2 \ 0.25 \ 0.3 \ 0.35];
106
    figure (3)
107
    plot (lambdaArray ,D)
    hold on
109
    plot (lambdaArray, W, 'r')
    grid on
111
    xlabel('X: Lambda')
    ylabel('Y: Average Delay')
    title ('Average delay using P-B approximation formula and
        simulation results')
   legend ('Average simulated delay', 'P-B Approximate Delay')
```