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Empirical Methods HA 6

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Problem 1

The Bellman equation is of the form:

$$V(p, x) = \max_{x' \in [0, x]} \{p(x - x') - \frac{1}{5}(x - x')^{\frac{3}{2}} + \delta E_{p'|p} V(p', x')\}$$

,

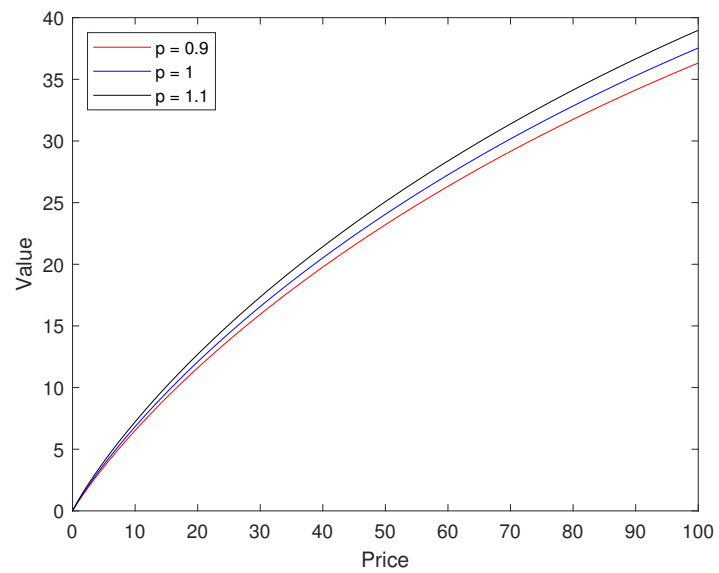
$$p' = \frac{1}{2} + \frac{1}{2}p + \epsilon, \delta = 0.95, x \in [0, 100], \epsilon \sim N(0, 0.01)$$

A pair (p, x) is a state variable, where p is a price at a given time period and x is a stock of lumber in the firm. x' is a stock of lumber at the next period, which is our policy variable. Price follows an AR(1) process.

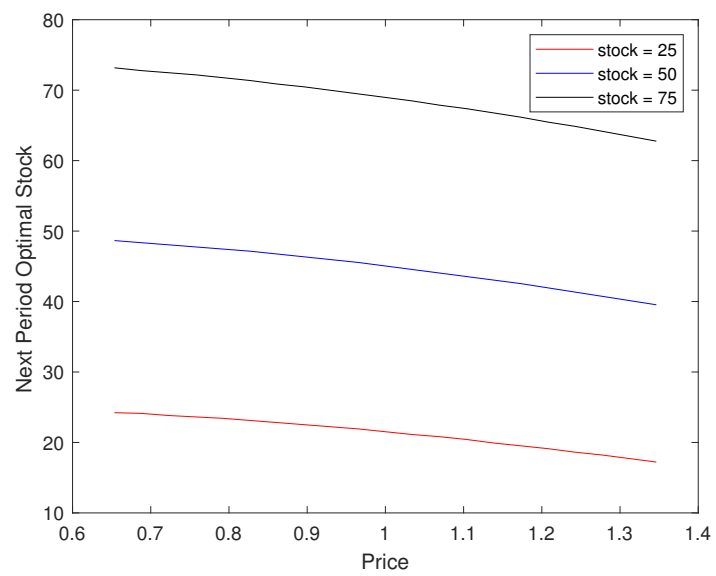
Problem 2

See the code.

Problem 3

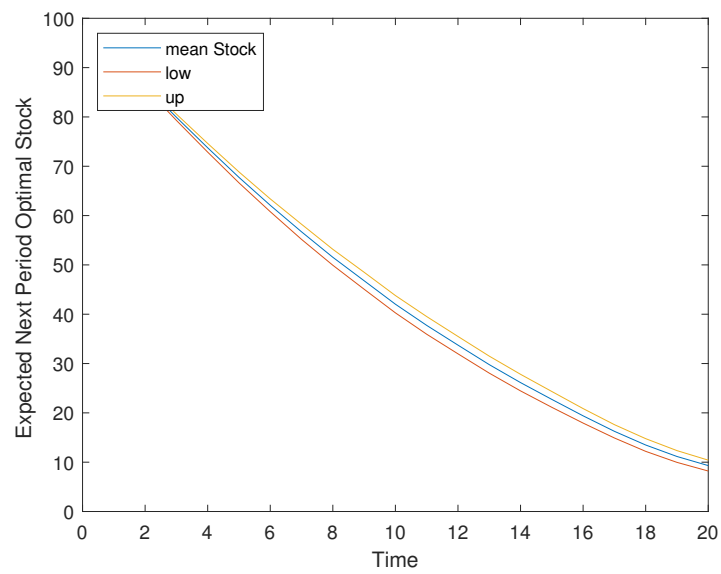


Problem 4



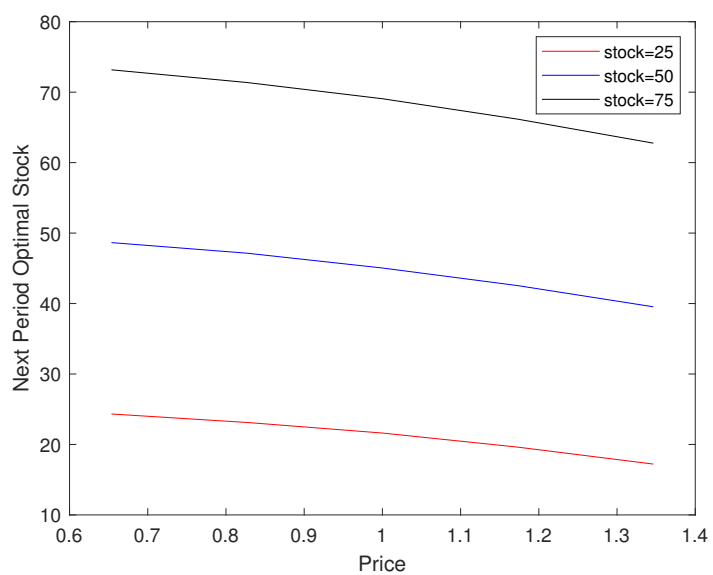
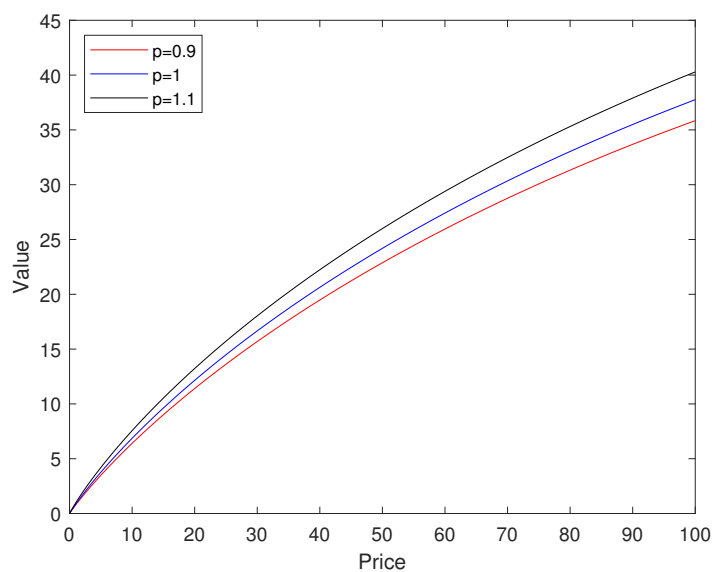
Problem 5

One may see that the confidence interval tends to expand over time. This result is natural since the further we are in the future the more uncertainty we face.



Problem 6

One may notice that on this grid the distance between the graphs of the value functions for the different prices is becoming larger when the price increases in comparison with the finer grid. Everything else seems to be pretty the same, therefore 5 points is also quite good a grid.



Matlab Code

```
1
2
3 function [prob,grid,invdist]=tauchen(N,mu,ro,sigma)
4
5 % N, number of grid points,
6 % mu, mean of the error term
7 % ro, AR(1) parameter
8 % sigma, std. of the error process
9
10
11 mux=mu/(1-ro);
12 sigmax=sigma/sqrt(1-ro^2);
13
14 epsl=mux-3*sigmax;          % this area (betw epsl and epsl) is going
    to capture more than 99 per cent,
15 epsh=mux+3*sigmax;          % i.e. prob that an observation fall into
    this area( 3 std dev far from the mean) is at least 99%.
16 eps=linspace(epsl,epsh,N);
17 w=(eps(2)-eps(1))/2;    % half of the steps between the grids
18
19 if N==1; prob=1;
20 else
21
22     p=zeros(N);
23     p(:,1)=normcdf(((eps(1)+w-mu)*ones(N,1)-ro*eps')/sigma);    %
        prob that future shock will be eps(1), i.e.{P11, P21,...,Pn1}'
24     p(:,N)=ones(N,1)-normcdf(((eps(N)-w-mu)*ones(N,1)-ro*eps')/sigma
        );    %the last column of the transition matrix
25     for j=2:(N-1)
26         p(:,j)=normcdf(((eps(j)+w-mu)*ones(N,1)-ro*eps')/sigma)-
            normcdf(((eps(j)-w-mu)*ones(N,1)-ro*eps')/sigma);
27     end
28 end
29 prob=p;
```

```

30     grid=eps;
31
32
33     Trans= prob ' ;
34     probst = (1/N)*ones(N,1); % initial distribution of states
35     test = 1;
36
37     while test > 10^(-8);
38         probst1 = Trans*probst;
39         test=max(abs(probst1-probst));
40         probst = probst1;
41     end
42     invdist=probst;

```

Matlab Code

```
1 function u = u(p,x)
2 x1 = x.*(x>=0);
3 out = p.*x1-0.2*x1.^(1.5);
4 u=out-100*(x<0);
5 end
```

Matlab Code

```
1 %% Problem 1
2 %See the pdf file
3
4 %% Problem 2
5
6 [prob,grid]=tauchen(21,0.5,0.5,0.1);
7 %% Problems 3 & 4
8
9 delta = 0.95;
10 S = 1000;
11 P = repmat(grid,S,1);
12 pi = prob;
13 stock = linspace(0,100,S);
14 S1 = repmat(stock',1,length(grid));
15 v_init = zeros(S,length(grid));d_init=ones(S,length(grid));
16 v_revised = ones(S,length(grid));d_revised=ones(S,length(grid));
17 diff=1;
18
19 while diff>0.001
20     Ev=v_init*pi';
21     for i=1:S
22         U=u(P,stock(i)-S1);
23         [v_revised(i,:),d_revised(i,:)]=max(U+delta*Ev);
24     end
25     diff=norm(v_revised-v_init)/norm(v_revised);
26     disp(['Change in value function:',num2str(diff)]);
27     v_init=v_revised;
28 end
29 policy = stock(d_revised);
30 figure(1)
31 plot(stock,v_init(:,8),'r-',stock,v_init(:,11),'b-',stock,v_init(:,14),'k-');
32 legend({'p = 0.9','p = 1','p = 1.1'},'Location','northwest');
33 xlabel('Price');
```



```

34 ylabel( 'Value' );
35 figure(2)
36 plot( grid , policy(250,:) , 'r-' , grid , policy(500,:) , 'b-' , grid , policy
      (750,:) , 'k-' );
37 legend( { 'stock = 25' , 'stock = 50' , 'stock = 75' } , 'Location' , '
      northeast' );
38 xlabel( 'Price' );
39 ylabel( 'Next Period Optimal Stock ' );
40 %% Problem 5
41
42 rng(1000);
43 sims = 50;
44 decision_sim = zeros(sims,20);
45 p_gen = zeros(sims,20);
46
47 for k=1:sims
48     % Generate the time series for price
49     p_gen(k,1)=11; %vector of indices.
50     for i=1:19
51         draw=mnrnd(1,prob(p_gen(k,i) ,:));
52         p_gen(k,i+1)=find(draw==1);
53     end
54     decision_sim(k,1)=d_revised(1000,11);
55     for j=1:19
56         decision_sim(k,j+1)=d_revised( decision_sim(k,j) , p_gen(k,j+1)
            );
57     end
58     disp( [ 'Iteration:' , num2str(k) ] );
59 end
60 sim_stock=stock( decision_sim );
61 sim_stock_mean=mean(sim_stock ,1);
62 sim_stock_se=std(sim_stock ,1);
63 sim_stock_lb=sim_stock_mean-1.645*(sim_stock_se)/sqrt(sims);
64 sim_stock_ub=sim_stock_mean+1.645*(sim_stock_se)/sqrt(sims);
65 plot(1:1:20,sim_stock_mean , 1:1:20,sim_stock_lb ,1:1:20,sim_stock_ub

```

```

    );
66 legend({'mean Stock','low','up'},'Location','northwest');
67 xlabel('Time');
68 ylabel('Expected Next Period Optimal Stock ');
69
70 %% Problem 6
71
72 [prob1,grid1]=tauchen(5,0.5,0.5,0.1);
73
74 delta = 0.95;
75 S = 1000;
76 P = repmat(grid1,S,1);
77 pi2 = prob1;
78
79 stock1=linspace(0,100,S);
80 S1=repmat(stock1',1,length(grid1));
81 v_init2=zeros(S,length(grid1));d_init2=ones(S,length(grid1));
82 v_revised2=ones(S,length(grid1));d_revised2=ones(S,length(grid1));
83 diff2=1;
84
85 while diff2 > 0.001
86     Ev=v_init2*pi2';
87     for i=1:S
88         U=u(P,stock1(i)-S1);
89         [v_revised2(i,:),d_revised2(i,:)]=max(U+delta*Ev);
90     end
91     diff2=norm(v_revised2-v_init2)/norm(v_revised2);
92     disp(['Change in value function:',num2str(diff2)]);
93     v_init2=v_revised2;
94 end
95 policy2=stock1(d_revised2);
96
97 figure(3)
98 plot(stock1,v_init2(:,2),'r-',stock1,v_init2(:,3),'b-',stock1,
    v_init2(:,4),'k-');

```

```

99  legend({ 'p=0.9 ', 'p=1 ', 'p=1.1 ' }, 'Location ', 'northwest ');
100 xlabel( 'Price ');
101 ylabel( 'Value ');
102 figure(4)
103 plot(grid1 , policy2(250,:) , 'r-', grid1 , policy2(500,:) , 'b-', grid1 ,
      policy2(750,:) , 'k-');
104 legend({ 'stock=25 ', 'stock=50 ', 'stock=75 ' }, 'Location ', 'northeast ');
105 xlabel( 'Price ');
106 ylabel( 'Next Period Optimal Stock ');

```