

SCILAB à l'École nationale des ponts et chaussées

<http://cermics.enpc.fr/scilab>

Halmstad 2006

*Dynamic programming and Markov chains*

Jean-Philippe CHANCELIER

23 novembre 2006 (dernière date de mise à jour)

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# 1 Finite horizon problem

Let  $(X_n)_{n \in \mathbb{N}}$  be a finite Markov chain with transition matrix  $M^{(n)}$ . We want to recursively compute :

$$v_n(x) = \mathbb{E} \left[ \sum_{k=n}^{T-1} \frac{1}{(1+r)^{k-n}} c_k(X_k) + \frac{1}{(1+r)^{T-n}} f(T, X_T) | X_n = x \right],$$

**Question 1** Write a first routine which returns a random stochastic matrix  $M$  of size  $N \times N$ . In *scilab* there is a function called `genmarkov` that you can also check if you want.

```
function M=my_gen_markov(n);
    P=rand(n,n,'u');
    y=sum(P,'c'); y = ones(y)./y ; y=y*ones(1,N);
    M=y.* P;
endfuncion
```

**Question 2** Choose a state size, generate a stochastic matrix  $M$ , then generate and plot some samples of the homogeneous Markov chain with states in  $[1, N]$  described by  $M$  (using `grand` in *Scilab*).

```
n=10;
M=my_gen_markov(n)
// generate and draw some typical samples
T=4; // horizon time
m=20; // number of samples
// generate the m-samples
// each sample is of length T
Y=grand(T,'markov',M,ones(m,1));
// just add the initial state to each sample
Y=[ones(m,1),Y];
// you can check the size of Y with size
size(Y)
// draw the first sample
plot(Y(1,:))
// draw the second sample
plot(Y(2,:))
```

**Question 3** *Choosing an instantaneous cost  $c$  and a final cost  $f$  recursively compute the value function  $v^n(x)$  and draw the result as a surface (i.e  $v(t,x)$ ). The computation can be stored in a matrix.*

```
function y=c(x); y=x; endfunction
function y=f(x);K=2; y=max(x-K,0); endfunction

states=(1:n)' // possible states
Cv=c(states) // vector of c possible values
fv=f(states) // vector of f possible values
// here you should check that Cv and fv are column vectors

r=0.05; // a discount factor
// I compute the value function and store the
// results in a matrix V
V=zeros(n,T);
V(:,T) = fv;
for i=T-1:-1:1
    V(:,i) = (Cv + M*V(:,i+1))/(1+r);
end
// plot the surface

plot3d(1:n,1:T,V)
```

**Question 4** *Using samples of the markov chain for a given starting state evaluate by Monte Carlo the cost function  $V(1,1)$  and compare the results with previous question.*

```
// test by monte carlo
// Compute V(1,1) by monte carlo
m=10000;
X0=ones(m,1);
X=grand(T-1,'markov',M,X0);
X=[X0,X];

// fix n
// Approximate the cost by Monte Carlo

n=1;
```

```
Cm= mean((1/(1+r).^ (T-n))*f(X(:,T)));
for i=(T-1):-1:n;
    Cm = mean((1/(1+r).^ (i-n))*c(X(:,i)))+ Cm;
end

// test

Cm -V(1,1)
```