

SCILAB à l'École nationale des ponts et chaussées

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

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*Dynamic programming and Markov chains*

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# 1 Stopping time problem

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

$$u_n(x) = \sup_{\tau \mathcal{F}_n \text{ t.a.}, n \leq \tau \leq N} \mathbb{E} \left[ \sum_{k=n}^{\tau-1} c^{(k)}(X^k) + \psi^\tau(X^\tau) | X^n = x \right].$$

The control is a stopping time  $n \leq \tau \leq N$ . As shown in the course the value function can be recursively computed by :

$$\begin{cases} u_n(x) &= \max(M^{(n)}u_{n+1} + c^{(n)}, \psi^n), \quad n = 0, \dots, N-1 \\ u_N &= \psi^N. \end{cases} \quad (1)$$

And the optimal stopping time :

$$\tau_n = \inf\{N \geq k \geq n, u_k(X^k) = \psi^k(X^k)\}$$

is such that :

$$u_n(X^n) = \mathbb{E} \left[ \sum_{k=n}^{\tau_n-1} c^{(k)}(X^k) + \psi^{\tau_n}(X^{\tau_n}) | X^n \right].$$

**Question 1** Write a first routine which returns a stochastic matrix  $M$  of size  $N \times N$ .

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

**Question 3** Choosing an instantaneous cost  $c$  and a final cost  $K$  recursively compute the value function  $v^n(x)$  and draw the result as a surface (i.e  $v(x, t)$ ). Compute also  $u^n(x)$  which for a given state at time  $n$  returns 1 if the optimal strategy is to go on and 2 if the optimal strategy is to stop. Note that the `max` function can be used to get the maximum value of two quantities but also to get the indice of the value which realize the `max`.

```
// A stopping time problem.
c=... // instantaneous cost
K=... // final cost

r=0.05;
C=ones(N,T); // a matrix to store the value function
U=2*ones(N,T); // a matrix to store the control (1 or 2)
```

```

C(:,T) = ... ;

for i=T-1:-1:1
    ....
    C(:,i)= Ci;
    U(:,i)= ki;
end

plot3d(1:N,1:T,C)

```

**Question 4** *Using samples of the markov chain for a given starting state evaluate by Monte Carlo the cost function  $v_0(1)$  and compare the results with previous question.*

```

m=10000; // number of samplings
Cm=0;    // we want to evaluate C(1,1);
for k=1:m // loop on sampling
    // the k-th trajectory.
    X=.... // sample a trajectory
    // the control along the trajectory
    for i=1:T, u(i)=... end
    stop=... // the stopping time
    cost=0;
    ...
    cost = .. // evaluate the cost for the m-th trajectory
    Cm=Cm+cost/m; // compute the mean
end

```