

Weekly presentation SCM research

*6th presentation: Introduction to
Markov Chains*



Summary

I/Introducton

1) Definition

2) Examples

II/ One-step transition theory

1) Theory

2) Examples

III/ Inventory control



I/ Introduction

1) *Definition*

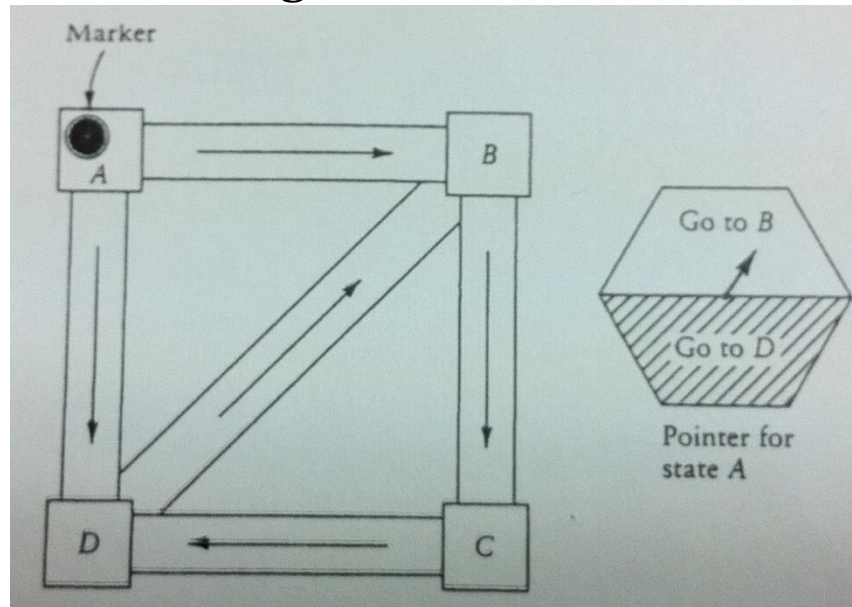
- dynamic aspect of probability
- System that is in a particular state at each moment in time, as a result of various random influences, the state changes from one moment to the next
- Stochastic system represented as a transition diagram made up of nodes and one-way paths
- To be called a Markov chain, two rules need to apply:
 - ***No-memory rule***
 - ***Time-homogeneous rule***



I/ Introduction

1) Definition

- Markov Chain as a board game



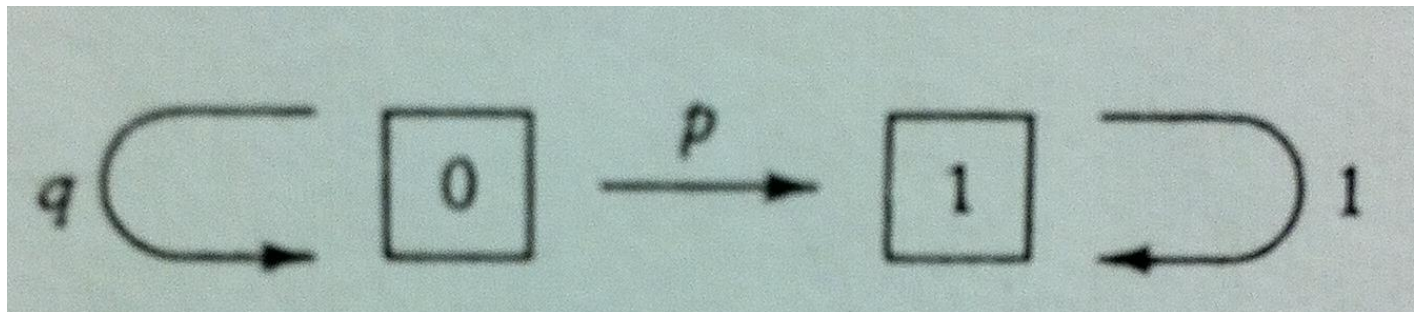
- To be called a Markov chain, two rules need to apply:
 - **No-memory rule**
 - **Time-homogeneous rule**

I/ Introduction

2) *Examples*

Waiting game

- 2 states, 0 and 1
- Represents several independent rounds of flips of a coin (probability of head is p , otherwise $q = 1 - p$)



I/ Introduction

2) *Examples*

Bold play

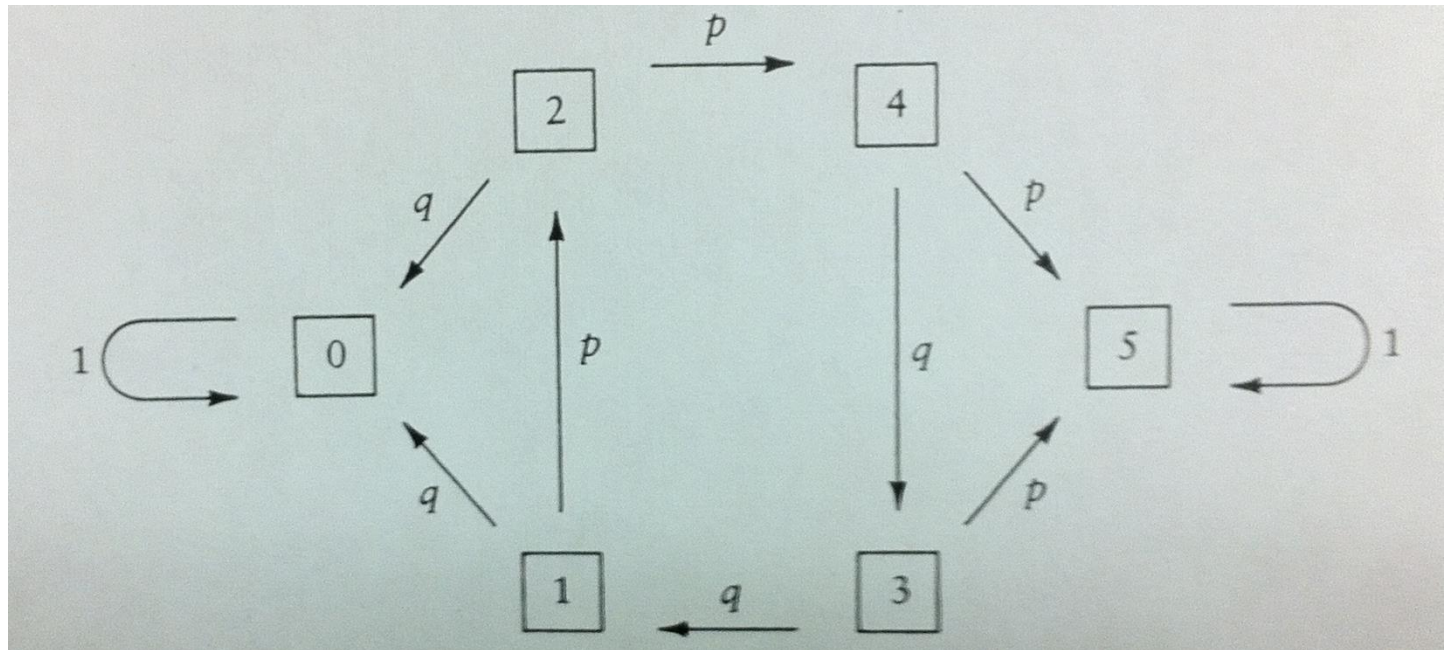
- *Suppose we have \$1, but desperately need \$5*
- *We play a game with win probability p at each round, and a double or nothing payoff*
- *Bold play strategy -> bet everything we have if winning the round would give us the goal of \$5 or less; if not we bet only the necessary amount to go up to \$5 in case of winning*



I/ Introduction

2) Examples

Bold play



I/ Introduction

2) Examples

Bold play

Table 6.3 Simulation of 1000 Games of Bold Play

p	0.2	0.3	0.4	0.5	0.6	0.7
WIN FREQUENCY	0.010	0.042	0.105	0.202	0.342	0.483
AVERAGE LENGTH	1.30	1.52	1.78	2.05	2.25	2.47

Table 6.1 Simulation of 1000 Games of Gambler's Ruin
($N = 5$, Initial State = 1)

p	0.2	0.3	0.4	0.5	0.6	0.7
WIN FREQUENCY	0.004	0.017	0.087	0.208	0.394	0.582
AVERAGE LENGTH	1.58	2.21	3.06	3.97	4.38	4.81

II/ One-step transition

1) Theory

- finite state system, goes from one state to another in discrete time steps by the random mechanism
- one-step transition probability : P_{ij} = probability of moving from state i to state j in one step

$$0 \leq p_{ij} \leq 1$$

$$\sum_j p_{ij} = 1$$

- Answer two basic questions

- *What is the chance of winning (to move the marker from a designated starting node to a finishing node) ?*
- *what is the expected length of time needed to win?*



II/ One-step transition

1) Theory

Joint probabilities

- Random choice of the starting node, can be any of them
-> π_i is the probability of picking node i as the starting position
- we define a discrete random variable $X(n)$ by setting $X(n) = i$ if the marker is at node i at the n th move
-> the sequence $\{X(n)\}$ describes the possible random paths that can be taken in playing the game
- By definition $\{\pi_i\}$ is the probability mass function of $X(0)$



II/ One-step transition

1) Theory

Joint probability mass function

- $A_k = \{X(k) = ik\}$
- $B_k = \{X(0) = i_0, \dots, X(k) = ik\}$
- $P\{A_{n+1}/B_n\} = P\{A_{n+1}/A_n\}$

- Theorem : Multiplication rule for path probabilities

For any transition diagram with one-step transition probabilities p_{ij} and any initial distribution π for $X(0)$, the probability of B_k is the product of the probability π_{i_0} of starting at node i_0 multiplied by the probabilities $P_{i_s, i_{s+1}}$ of each step $i_s \rightarrow i_{s+1}$

$$P(B_k) = P(A_k/A_{k-1}) P(A_{k-1}/A_{k-2}) \dots P(A_1/A_0) P(A_0)$$

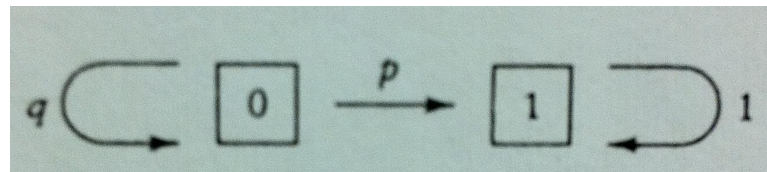


II/ One-step transition

2) Examples

Waiting game

- Considering that the marker is at 0, what is the probability that after k flips it will be at 1?



- If the first outcome of heads occurs on the m th flip then the corresponding path is $(0) \rightarrow \dots \rightarrow (0) \rightarrow (1) \rightarrow \dots \rightarrow (1)$ with probability $q^{m-1}p$

- Then we sum for all possible values of m

$$P\{X(k) = 1 / X(0) = 0\} = 1 - q^k$$

II/ One-step transition

2) *Examples*

Bold play VS Timid Play

• Bold play $\frac{p^3(1+q)}{1-p^2q^2}$ Timid play $p^4(1+3pq)$

• Choice of black or red in roulette, $p = 18/38 = 0.4737$

• Unlimited number of trial, goal $N = 5$

Bold play 0.1730 *Timid play* 0.1602

• Limited of 6 or fewer trials

Bold play 0.1622 *Timid play* 0.0880



III/ Inventory control

- Method

- Calculate the one-step transition probabilities P_{ij}
- Verify that the no-memory and time-homogeneity properties are valid

Inventory model

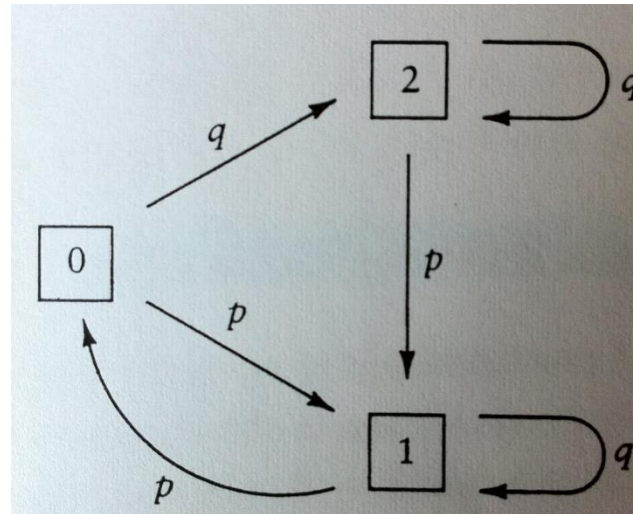
- Wholesaler distributor with randomly fluctuating inventory of a certain item. The orders are shipped out at the end of the day, with possible back orders for the next day
- $S=2$, full inventory size at the end of the day (- back orders)
- Continuous review policy, with critical level $s=0 < S$
- $D(n) = 1 \text{ or } 0$ is the total items order on the n th day
- $X(n)$ state of the system at the end of the day n

$$X(n+1) = \begin{cases} X(n) - D(n+1) & \text{if } X(n) > s \\ S - D(n+1) & \text{if } X(n) \leq s \end{cases}$$



III/ Inventory control

- Diagram



- Simulation

- Compute random daily demands $D(n)$

$$g(u) = \begin{cases} 0 & \text{for } 0 < u \leq 0.1 \\ 1 & \text{for } 0.1 < u \leq 0.3 \\ 2 & \text{for } 0.3 < u \leq 0.6 \\ 3 & \text{for } 0.6 < u \leq 0.85 \\ 4 & \text{for } 0.85 < u < 1 \end{cases}$$

III/ Inventory control

- $X(0) = 3$

- $S = 3$

- $s = 0$

$$x_2 = \begin{cases} x_1 - d_2 & \text{if } x_1 \geq 1 \\ 3 - d_2 & \text{if } x_1 \leq 0 \end{cases}$$

- Numerical example

- $u_1 = 0.405$

$$d_1 = 2$$

$$x_1 = 3 - d_1 = 1$$

- $u_2 = 0.829$

$$d_2 = 3$$

$$x_2 = 1 - d_2 = -2 \text{ (5 items restocked)}$$

- $u_3 = 0.152$

$$d_3 = 1$$

$$x_3 = 3 - d_3 = 2$$

- $u_4 = 0.927$

$$d_4 = 4$$

$$x_4 = 2 - d_4 = -2 \text{ (again 5 items)}$$

- $u_5 = 0.556$

$$d_5 = 2$$

$$x_5 = 3 - d_5 = 1$$

- Average unfilled demand is 4/5 order per day

- We can compare effectiveness of different inventory policies by changing s and S

***Thank you for your
attention!***

