# Markov chains

### Exercice 1:

We have a biased coin that returns heads with the probability  $p \in (0,1)$ .

- 1. We can simulate an unbiased die with an unbiased coin in the following way:
  - The coin is first thrown: heads denotes 1, 2, 3, and tail denotes 4, 5, 6.
  - Then we throw the coin twice: if we get heads, heads, then we say 1 (or 4), if we get heads, tail we say 2 (or 5), if we get tail, heads we say 3 (or 6) and if we get tail, tail we start again from the first throw.
  - (a) Draw the underlying Markov chain and justify that it simulates a balanced die.
  - (b) What is the average number of coin rolls for this simulation of a die?
- 2. Find in the same spirit an algorithm to simulate an unbiased die by casting the biased coins several times. Present it in the form of a Markov chain.

## Exercice 2:

A rectangular image is formed of  $m \times n$  square pixels, m representing the number of pixels in width and n in length. We consider the following algorithm: At each step, a pixel is chosen uniformly, and then an immediate neighbor is chosen (if it is not on an edge, it has 8 immediate neighbors) with a uniform probability and it takes his color. Demonstrate that with probability 1, the image becomes monochromatic.

### Exercice 3:

Two players A and B play heads or tails, where head occurs with probability  $0 \le p \le 1$ . Each time head(resp. tail) occurs player A(resp. B) gives 1 coin to player B(resp. A). They play till one of them runs out of money. Given that A starts with a coins and B with b, what is the probability that A wins?

### Exercice 4:

Let  $\mathcal{C}$  be a Markov chain on N states with a transition matrix P. We assume that P is Doubly stochastic, i.e.  $\forall i \in [1, N], \sum_j p_{i,j} = \sum_j p_{j,i} = 1$  (the sum of each column and each row is 1).

1. We suppose that the chain C is irreducible and aperiodic. Given an initial distribution v, what is the value of  $\lim_{n\to\infty} v \cdot P^n$ 

# Exercice 5:

A board game consists of a ring of N squares numbered from 0 to N-1. At each stage, the player rolls a balanced die and advances the corresponding number of squares. We denote by  $X_n$  the player's position at the nth step.

- 1. Draw the Markov chain, give N=7.
- 2. What are the properties of this chain? Justify that the chain has a stationary distribution.
- 3. Determine without calculation the stationary distribution.

## Social choice

Let there be a society with N voters and a set  $C = \{A, B, C, \ldots\}$  of finite candidates. Each voter  $i \in [N]$  has a preferences  $\succ_i$  on the candidates (a total order). We call the set of all personal preferences of the voters in our society a profile (N-tuple of preferences). A Social Choice Correspondence (SCC) f, is a function from every profile to a candidate (or a set of candidates in case of ties).

### Exercice 6:

Given 2 candidates  $A, B \in \mathcal{C}$  Condorcet's majority principle states that if most voters prefer A to B, then B should not be elected.

- 1. Given 3 candidates  $\{A, B, C\}$ , can you build a profile in which no candidate can be elected according to Condorcet's majority principle?
- 2. Let there be N voters, a profile P, and candidates C. We say that a candidate  $A \in \mathcal{C}$ weakly beats or weakly dominates a candidate B if there exists  $H \subset [N]$  such that  $|H| \geq N/2$ and  $\forall i \in H \ A \succ_i B$ . Denote by :

$$CW(P) = \{ A \in \mathcal{C} \mid \forall B \in \mathcal{C}, A \text{ weakly dominates } B \}$$

the set of Condorcet winners. We say that a SCC f is Condorcet if

$$CW(P) \neq \emptyset \Rightarrow f(P) \subseteq CW(P)$$

Build a SCC which is Condorcet.

A social welfare function (SWF) f is a function from every profile to a preference  $\succ_s$  which is called the *social preference*.

We say that a SWF respects unanimity if it puts candidate A above B when every voter puts A above B.

We say that a SWF is independent of irrelevant alternatives (IIA) if the position of A compared to B on the social choice depends only on their relative ranking in every voter's preference. I.e f is IIA if given a profile  $P = \{\succ_i\}_{i \in [N]}$ , candidates A, B, C, and a social preference  $f(P) = \{\succ_s\}$  which ranks  $A \succ_s B$ , then changing the profile  $\succ_i$  to  $\succ_i'$  where :

$$\forall i \in [N], \text{ if } A \succ_i B \Rightarrow A \succ_i' B; \text{ and if } B \succ_i A \Rightarrow B \succ_i' A$$

Then for the new profile P' we get that the social choice  $f(P') = \{\succ'_s\}$  has that  $A \succ'_s B$ .

## Exercice 7:

Build a SWF which respects unanimity and is IIA.

We call a SWF dictatorship if there exists a voter  $k \in [N]$  such that for any profile P  $f(P) = \{\succ_k\}$ .

## Exercice 8:

We will proof the following theorem by Arrow, which was originally proven by him in 1951-1963 and for which (among other works) he received a Nobel prize in economics.

**Theorem 1** Any SWF on  $|A| \ge 3$  that respects unanimity and IIA is a dictatorship.

The original proof was very long and complicated, so instead we follow a proof by John Geanakoplos 96 (in his paper he gives 3 different proofs for this theorem):

1. For any candidate  $A \in \mathcal{C}$  if every voter i ranks A at the top or the bottom of his preferences then  $\succ_s$  must also rank A at either the top or the bottom.

Pick a profile that puts the candidate D in the last place in every voter's preference (which gives us that D is at the bottom of the social choice). Going from voter 1 till N move D from the bottom to the top of the preference. At some voter  $v \in [N]$  (for clarity we will call him Vlad) the candidate will also move to the top of the social choice (by unanimity).

- 2. Show that if Vlad prefers the candidate A over  $B(A, B \neq D)$  then the social choice will have the same preference (i.e  $A \succ_v B \Rightarrow A \succ_s B$ ).
- 3. Show that Vlad is a dictator.