

### Problem 1. 2-player game

Consider the a game between two players. Both players have three pure strategies available to them. Both players are maximizers. The pay-off matrix is given as:

$$P = \begin{bmatrix} (3, 1) & (7, 8) & (5, 6) \\ (5, 4) & (2, 3) & (4, 2) \\ (1, 3) & (4, 10) & (6, 7) \end{bmatrix}.$$

In each entry, the first element denotes the utility of the row player and the second element denotes the utility of the column player. Answer the following questions.

- Find all pure Nash equilibria of the game. Are these equilibria admissible?
- Compute a mixed Nash equilibrium.
- Does this game admit an exact potential function?

### Problem 2. (Renewable energy game)

Consider the following game:

- Player 1 is the owner of a solar power plant.
- Player 2 is the grid operator, which has to ensure that the power grid works reliably, and that the total demand is always equal to the total generation.

With a small probability  $\epsilon$ , there might be a sudden imbalance in the grid, such that generation is not enough to meet the demand. For this reason, Player 1 (the solar power plant) is required to maintain some *reserve*, that is, to inject a bit less of its available solar power production, so that it can *ramp up* (increase its power generation) in these rare cases of extra demand. Maintaining the reserve has a cost, denoted by  $c$ , for Player 1, as the generator is selling less power than the available solar power. In case of extra demand, Player 2 (the grid operator) can also decide, instead of asking Player 1 to ramp up its generation, to *shed* (disconnect) some low-priority loads to restore power balance, at a cost  $s$  for Player 2. In this case, the reserve of Player 1 is not used. If, in the rare case of extra demand, Player 2 decides not to shed (and instead it asks Player 1 to ramp up generation), but Player 1 is not maintaining the reserve, then we have a blackout, that costs Player 2 a large sum  $b$ , greater than  $s$ . To summarize,

- Player 1 has two possible actions:
  - (R) *To reserve*, i.e. to sell less power than the available power and therefore be able to ramp up if requested by the grid operator.
  - (NR) *Not to reserve*, i.e. to sell all the available power, and not be able to ramp up if requested by the grid operator.
- Player 2 has two possible actions:
  - (S) *To shed*, i.e. in case of extra demand, to disconnect low priority loads instead of using the reserve.
  - (NS) *Not to shed*, i.e. in case of extra demand, to keep all loads connected and ask Player 1 to ramp up.

Player 1 does not know which action Player 2 will play in case of the rare event, and Player 2 cannot tell whether Player 1 is maintaining the reserve before deciding its action (to shed or not).

- Express the game in bi-matrix form.

**HINT:** Each outcome in the matrices represents the expected outcome given that the extra demand will only happen with probability  $\epsilon$ . For example, if Player 1 plays (R) and Player 2 plays (S), the outcome of the game will be  $J_1 = c$  for Player 1 and  $J_2 = \epsilon s$  for Player 2.

- b) Are there dominated strategies? What is/are the pure Nash equilibrium/a of this game?
- c) Consider now the case in which a *fine*  $f$  is introduced. Player 1 is fined only if the extra demand event happens, **and** Player 2 decides not to shed loads, **and** Player 1 didn't maintain the reserve. Only in this case, Player 1 has to pay the positive fine  $f$  to Player 2. Complete the payoff matrix corresponding to the game with the proposed fine.

$$\begin{array}{cc} & \begin{array}{cc} S & NS \end{array} \\ \begin{array}{c} R \\ NR \end{array} & \left[ \begin{array}{cc} (c, \epsilon s) & (c, \cdot) \\ (\cdot, \epsilon s) & (\cdot, \cdot) \end{array} \right] \end{array}$$

- d) i) What range of values of  $f$  guarantees that you don't have dominated strategies?  
 ii) Is the resulting game an ordinal potential game?
- e) For the range of values of  $f$  computed in i) above, perform the following tasks.
- Find all the pure Nash equilibria of this game (and their equilibrium values).
  - Find all mixed Nash equilibria of this game (and their equilibrium values).
  - What are the pure security policies for the two Players? What is the outcome, if both players choose to play their respective security policies?
- f) For what values of  $f$  can we be sure that Player 1 will always maintain the reserves?
- g) What is the Nash equilibrium and the resulting outcome in this case?

Let us define the Welfare function  $W(y, z)$  as

$$W(y, z) = J_1(y, z) + J_2(y, z)$$

where  $y$  and  $z$  denote the strategies played by Player 1 and Player 2, respectively and  $J_1(y, z)$  is the payoff for Player 1 and  $J_2(y, z)$  is the payoff for Player 2. Let us recall the definition of Price of Anarchy as

$$PoA = \frac{\max_{(y, z) \in NE} W(y, z)}{\min_{(y, z)} W(y, z)},$$

where the max operator is done with respect to all pairs of strategies  $(y, z)$  that are Nash Equilibria, while the min operator is done with respect to all possible strategies.

Let  $c = 1$ ,  $s = 200$ ,  $b = 1000$ ,  $\epsilon = 0.01$ .

- h) i) Assume Player 1 plays (NR) and Player 2 plays (NS), and therefore Player 1 has to pay the fine (with probability  $\epsilon$ ). How does the Welfare depend on the fine  $f$ ?  
 ii) What is the Price of Anarchy with no fine ( $f = 0$ )?  
 iii) Prove that the Price of Anarchy is minimized when the value  $f$  of the fine satisfies the conditions derived in (f).

### Problem 3. (ConsensusGame)

We are going to play a game motivated by the following problem. Let  $(V, E)$  denote a finite undirected graph with vertices  $v_i \in V$ ,  $i \in \{1, \dots, n\}$  and edges  $E \subseteq \{(v_i, v_j) : v_i, v_j \in V\}$ . Each vertex represents a person (player) and the edge  $(v_i, v_j)$  exists if  $i$  and  $j$  are friends (think for example of a social network). Let  $N_i = \{(v_j, v_j) : v_j \in V\} \subset E$  denote the neighbors of player  $i$ , namely, those players who are linked to  $i$ . Player  $i$  has two choices:  $x_i \in \{0, 1\}$ , (think for example, deciding between going to two different cafes). The cost for player  $i$  is  $J_i(x_i, x_{-i}) = \sum_{j \in N_i} |x_i - x_j|$ . By minimizing this cost, player  $i$  is trying to attend the same event as her neighbors. Consider the following *dynamics*. Each player starts by picking her favorite activity. Then, at each time step, one player updates her strategy by computing  $\min_{x_i} J_i(x_i, x_{-i})$ .

- a) Show that consensus (in this case, agreeing on attending the same event) is a pure strategy Nash equilibrium.

- b) Show that there can be other pure strategy Nash equilibria - you may provide an example.
- c) Derive an exact potential function for the game.
- d) Consider a graph with  $n = 10$  vertices and randomly generate the edges. Randomly initialize an action  $x_i \in \{0, 1\}$  corresponding to each vertex. Implement the best-reply dynamics in Matlab (or in other program you prefer). First, discuss what you expect to see from your simulation. Next, report your observations (attach a figure showing the total number of agreements at each iteration as well as the trajectory corresponding to 3 randomly selected vertices. Discuss whether the simulations are consistent with your expectations.
- e) Repeat the same experiment, but this time, let players update their strategies simultaneously rather than iteratively. How are the results different from the previously discussed sequential case?

**Problem 4. The metro ticket controller game**

TL can send a ticket controller on your metro **one single time** in the month of April.

Every day, you decide whether to buy a ticket or not, without knowing whether the ticket controller will get on the metro.

A metro ticket costs 5 CHF, and the fine is 30 CHF.

- a) Formulate game in extensive form (for a “month” of 2 days)
- b) Compute the number of pure strategies of both players and the dimension of the game matrix.
- c) Use backward induction for the last stage to reduce the game to a single stage game.
- d) Compute the Nash equilibrium strategy for the single stage game above.