## **Multi-Agent Systems**

# Homework Assignment 3 MSc AI, VU

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## 3 Sequential Games with Perfect Information

### 3.1 Reduced centipede game

Consider a sequential 2-player game with the following game-tree: at each decision node the associated player needs to decide whether to continue (c) or stop (s). The tree (including utilities) and the players' rationality are common knowledge.

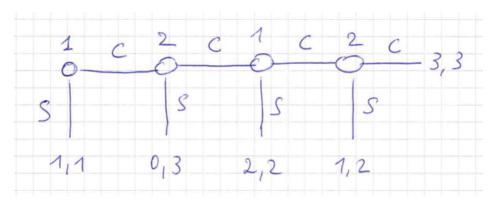


Figure 1: Shortened version of the centipede game.

#### Questions

- Write the normal form for this game and find all Nash equilibria in pure strategies (PNEs).
- List all subgames and determine which of these PNEs are also subgame-perfect?
- Can you solve this game using backward induction? Discuss.

#### 3.2 Boss and stealing employee

A boss notices that one of her employers has been stealing company material lately. The material was not all that valuable, so she is inclined to let it pass, preferring to keep the employee around rather than firing him and having to hire and retrain a replacement. Nevertheless she wants the stealing to stop.

She is therefore thinking to issue a warning at the next company meeting: the next person caught stealing company property will be fired immediately. She envisages the following game tree with pay-offs (see fig below).

- 1. Analyse this game using backward induction.
- 2. What are the pure actions for the two players (boss and employee)? Construct the normal form matrix.
- 3. Use this matrix to identify all the pure Nash equilibria of the normal form game.
- 4. Determine the subgame-perfect equilibrium (equilibria?) by eliminating all the Nash equilibria that fail to induce a NE in subgames.
- 5. Compare to the solution based on backward induction.

#### 3.3 Stackelberg's Duopoly Model

Stackelberg's duopoly model is a sequential version of Cournot's duopoly model. There are two firms that produce some bland product (e.g. fertilizer). Firm 1 moves first and decides to produce

a total quantity  $q_1$  (think of this as a continuous variable). Firm 2 observes this move and then decides to produce a quantity  $q_2$ . The market price (per unit) depends (linearly) on the total amount produced:

$$P(q_1, q_2) = \alpha - \beta(q_1 + q_2)$$

where  $\alpha, \beta > 0$  are known (positive) constants. Assume that both firms can produce the product at a fixed unit cost c. Hence the pay-off for each firm equals:

$$u_i(q_1, q_2) = P(q_1, q_2)q_i - cq_i.$$

- 1. Use backward induction to determine the optimal quantities for both firms.
- 2. Compare your results to the once obtained for the Cournot (simultaneous) model. Is there a "first mover" advantage?

#### **SOLUTIONS**

#### 3.1 Reduced centipede game

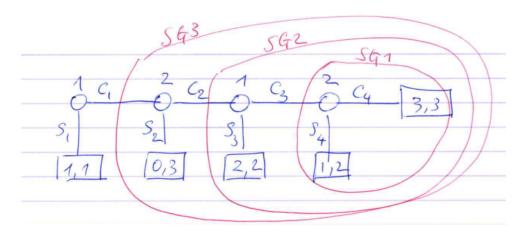


Figure 2: Centipede game with non-trivial subgames for future reference.

Each player has two decision nodes yielding the following pure strategies:

 $\bullet \ \ \mathsf{player} \ 1: \ \{s_1, c_1\} \times \{s_3, c_3\} = \{s_1s_3, s_1c_3, c_1s_3, c_1c_3\}$ 

• player 2 :  $\{s_2,c_2\} \times \{s_4,c_4\} = \{s_2s_4,s_2c_4,c_2s_4,c_2c_4\}$ 

Conversion to normal form yields the following matrix, with five Nash equilibria as indicated.

	5254	S2 C4	C254	C2 C4
5,53	1/1,1	1,1	1,1	1,1
S <sub>1</sub> C <sub>3</sub>	3/1,1	4)1,1	1,1	1,1
C153	0,3	0,3	2,2	2,2
C1 C3	0,3	0,3	1,2	5/3,3

Figure 3: Centipede, full game in normal form, with 5 pure NE (numbered for future reference).

Next, we determine the pure NE's for the three non-trivial subgames:

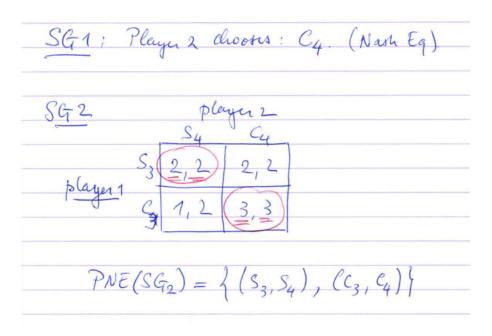


Figure 4: PNEs for subgames SG1 and SG2

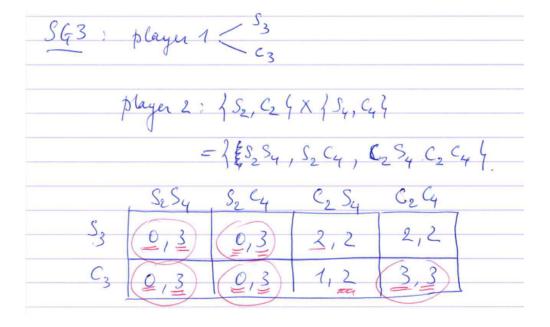


Figure 5: PNEs for subgame SG3

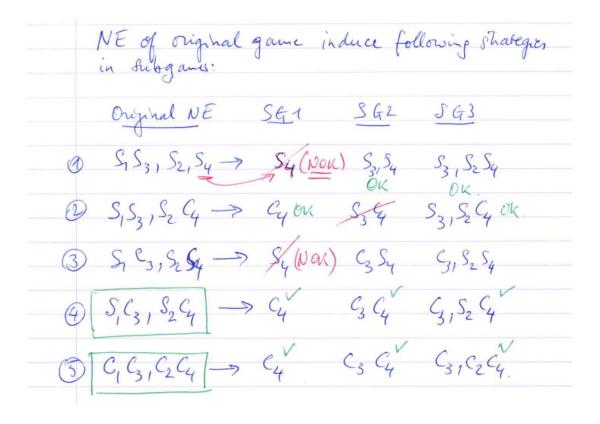


Figure 6: Only NE 4 and 5 induce Nash equilibria in all three subgames.

Induced Nash eq. in subgames Conclusion Only  $NE_4=(s_1c_3,s_2c_4)$  and  $NE_5=(c_1c_3,c_2c_4)$  induce Nash eq. in all subgames and are therefore subgame-perfect.

**Backward induction** Backward induction shows that player 2 is indifferent between his two options at his first decision point (both yield 3). He could therefore play any mixture of the two pure strategies. Hence it is impossible for player 1 to decide what his best option is. His choice will depend on other factors (not part of the game setup). E.g. if he's really risk-averse then he will go for  $s_1$  (i.e. stop at node 1) since this guarantees a pay-off of 1.

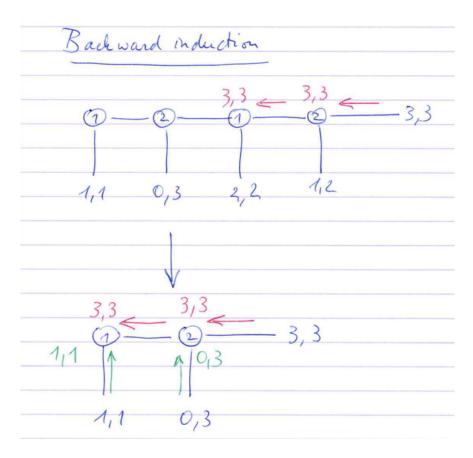


Figure 7: Reduction of game tree by using backward induction. At this stage, player 2 is indifferent between both actions.

#### 3.2 Boss and stealing employee

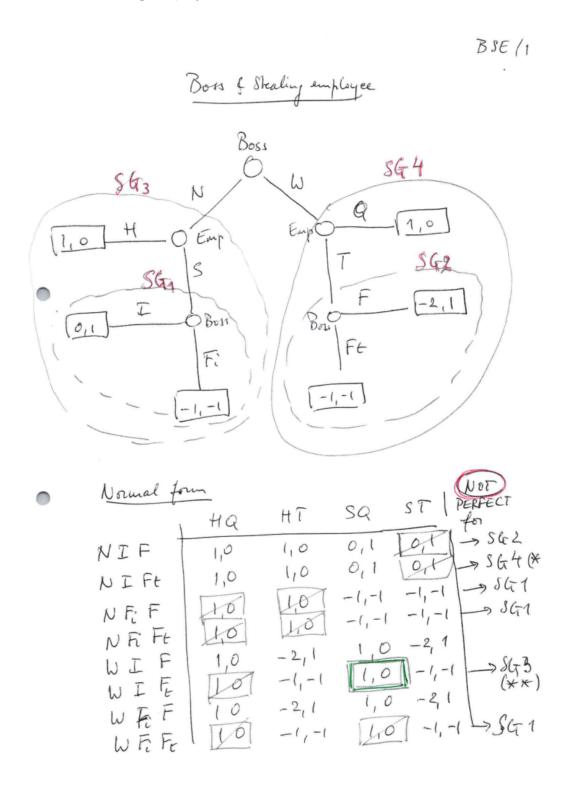


Figure 8: TOP: Game tree with subgames. Bottom: The normal form game with all Nash equilibria (black boxes) and the SPNE (boxed in green). Last column indicates in which subgame the NE fails to induce a subgame NE.

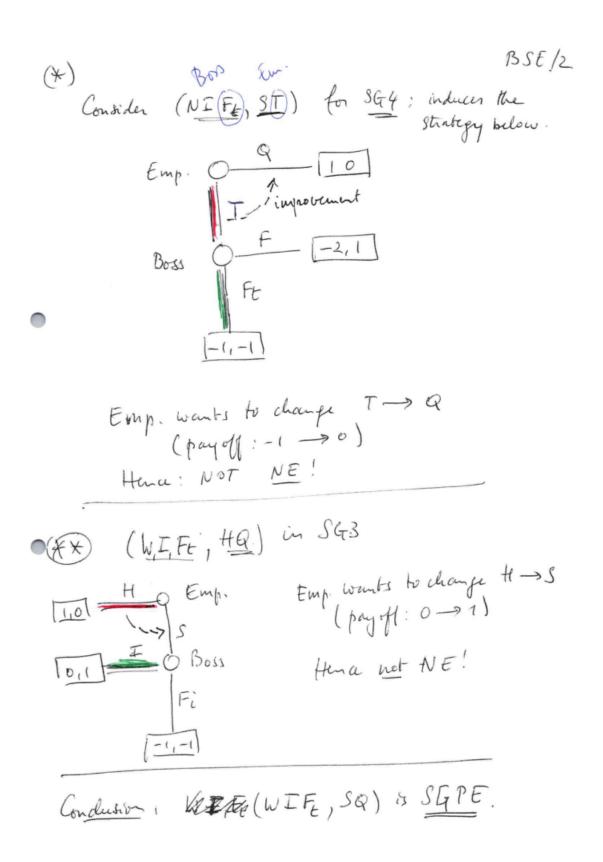


Figure 9: Amplification: induced NE

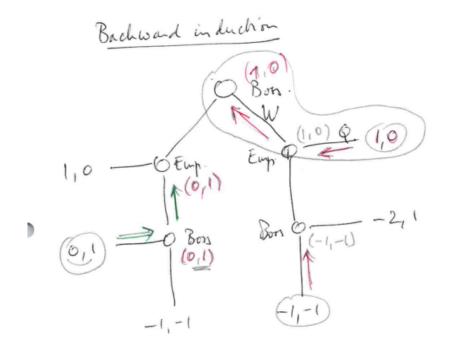


Figure 10: Backward induction solution: boss issues a warning, and employee quits stealing.

#### 3.3 Stackelberg's Duopoly

Sequential game: firm 1 (leader) moves first and produces quantity  $q_1$ . Subsequently, firm 2 responds by producing quantity  $q_2$ . We solve this game by backward induction.

Given  $q_1$ , what is the optimal value  $q_2^{\ast}$  for firm 2? To this end we compute:

$$\frac{\partial u_2}{\partial q_2} = \frac{\partial}{\partial q_2} \left\{ (P(q_1, q_2) - c)q_2 \right\} = (\alpha - c) - \beta(q_1 + 2q_2)$$

Hence:

$$\frac{\partial u_2}{\partial q_2} = 0 \qquad \Longrightarrow \qquad q_2^* = \frac{1}{2}(A - q_1) \quad \text{where} \quad A = (\alpha - c)/\beta.$$

Given the anticipated optimal response  $q_2^*$  of firm 2, what is the best action  $(q_1^*)$  for firm 1? The total produced quanity  $q_T = q_1 + q_2^* = (A + q_1)/2$ , hence:

$$P(q_1, q_2^*) = \alpha - \frac{\beta}{2}(A + q_1)$$

whence

$$u_1(q_1, q_2^*) = \frac{1}{2}((\alpha - c) - \beta q_1)q_1$$

For optimality, we need to insist on:

$$0 = \frac{\partial u_1}{\partial q_1} = \beta (A/2 - q_1)$$

from which we conclude:

$$q_1^* = A/2$$
 whence  $q_2^* = A/4$ .

Corresponding utilities The optimal total quantity is given by  $q_T^* = q_1^* + q_2^* = (3/4)A$ . This implies that  $P(q_1^*,q_2^*) - c = (\alpha-c) - \beta q_T^* = (\beta/2)A$ . From this we find

$$u_1^* = \frac{1}{8}A^2\beta$$
 and  $u_2^* = \frac{1}{16}A^2\beta$ 

clearly showing the first mover's advantage for the leader (firm 1).

**Comparison with Cournot's duopoly** In the case of Cournot we found (previous homework):

$$q_1^* = (A - q_2)/2$$
 and  $q_2^* = (A - q_1)/2$ .

Substituting the 2nd one in the first, yields for the optimal quantities in the Cournot case:

$$q_1^*=q_2^*=rac{1}{3}A$$
 with corresponding optimal utilities  $u_i^*=rac{1}{9}A^2eta.$