#### Chapter 11, sections 1, 4, and 5

#### **Extensive form games with imperfect information**

Generalize extensive form games with perfect information in two directions:

- (1) there may be moves by chance/nature
- (2) players may be imperfectly informed about earlier choices

Histories that a player cannot distinguish are gathered in an information set.

# Def. 200.1 An extensive form game

$$\Gamma = \langle N, H, P, \underbrace{f_c, (\mathcal{I}_i)_{i \in N}}, (\succsim_i)_{i \in N} \rangle$$
new stuff

consists of

 $\boxtimes$  nonempty, finite set N of *players*,

 $\boxtimes$  set H of *histories*, summarizing the sequence of actions/chance moves so far.

- same restrictions as before in def. 89.1,
- $Z \subseteq H$  set of terminal histories,
- actions after nonterminal history  $h \in H$  are  $A(h) = \{a \mid (h, a) \in H\},\$

 $\boxtimes$  player function  $P: H \setminus Z \to N \cup \{c\}$  assigning to each nonterminal history a player/chance whose turn it is to take an action,

 $\boxtimes f_c$  assigns to each history  $h \in H$  with P(h) = c a prob measure  $f_c(\cdot \mid h)$  over actions A(h), indep of every other such measure  $f_c(\cdot \mid h')$ . Roughly (finite case),  $f_c(a \mid h)$  is the prob that chance chooses a.

 $\boxtimes$  for each player  $i \in N$ ,  $\mathcal{I}_i$  is a partition of  $\{h \in H \mid P(h) = i\}$  such that

$$\forall I_i \in \mathcal{I}_i, \forall h, h' \in I_i : A(h) = A(h').$$
 (1)

(Same set of actions in each history of an information set: otherwise i could distinguish the histories!)

- ullet  $\mathcal{I}_i$  is the information partition,  $I_i \in \mathcal{I}_i$  is an information set.
- idea: i cannot distinguish histories h, h' in the same information set.

• define  $P(I_i) = i$  and  $A(I_i) = A(h)$  for arbitrary  $h \in I_i$ . Well-defined by (1)!

 $\boxtimes$  for each player  $i \in N$  a preference relation  $\succsim_i$  over terminal histories. Often assumed to satisfy the vNM axioms, in which case we represent them by a Bernouilli function  $u_i$  on Z.

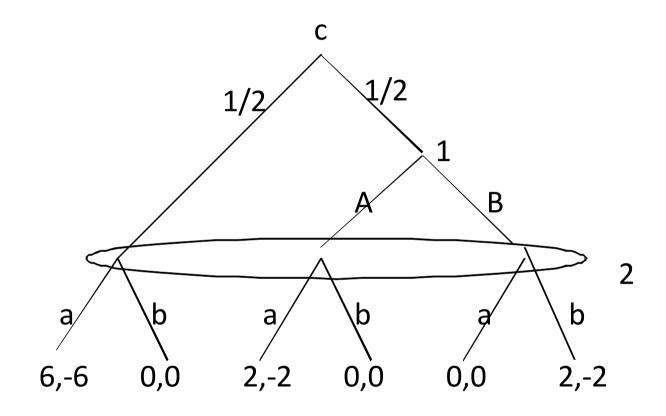
Remark: extensive form games with perfect information

$$\Gamma = \langle N, H, P, (\succsim_i)_{i \in N} \rangle$$

are embedded as a special case: no chance moves and each information set is a singleton (only one history).

**Notational convention:** when drawing game trees, information sets are indicated by ovals/dotted lines.

Fig. 212.1 An extensive form game with chance move



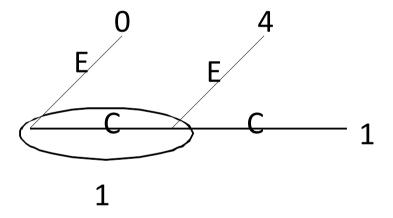
Strategic form:

$$\begin{array}{cccc} & a & b \\ A & {\bf 4}, -{\bf 4} & {\bf 0}, {\bf 0} \\ B & {\bf 3}, -{\bf 3} & {\bf 1}, -{\bf 1} \end{array}$$

# (Im)perfect recall

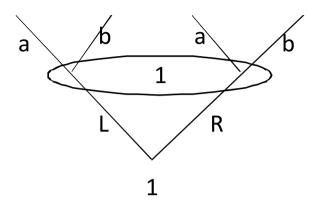
Do you remember what you knew in the past?

## **Example 1.** Absentminded driver

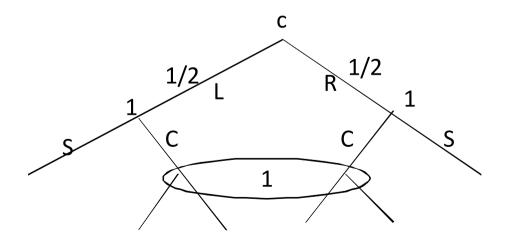


Two crossings on your way home. You need to (C)ontinue on the first, (E)xit on the second. But you can't recall *whether* you already passed a crossing.

**Example 2.** The player forgot what he decided in the initial node.



**Example 3.** Pl 1 knew the chance move, but forgot it.



#### **Experience and perfect recall**

Consider a history  $h \in H$  with P(h) = i. The experience  $X_i(h)$  along history h lists, in chronological order:

- (1) which information sets  $I_i$  player i encountered
- (2) what action i chose there

**Def. 203.3** Extensive form game  $\Gamma = \langle N, H, P, f_c, (\mathcal{I}_i)_{i \in N}, (\succsim_i)_{i \in N} \rangle$  has *perfect recall* if

$$\forall i \in N, \forall I_i \in \mathcal{I}_i, \forall h, h' \in I_i : X_i(h) = X_i(h').$$

You have the same experience in each history of your information set: you recall exactly what sequence of events got you there!

# Example 1 (cont)

 $\boxtimes$  Only one information set,  $\{\emptyset, C\}$ ,

$$\boxtimes X_1(\emptyset) = (\{\emptyset, C\})$$
, but

$$\boxtimes X_1(C) = (\underbrace{\{\emptyset, C\}}_{\text{1's first info set }}, \underbrace{C}_{\text{choice there }}, \underbrace{\{\emptyset, C\}}_{\text{resulting info set}})$$

 $\boxtimes X_1(\emptyset) \neq X_1(C)$ : imperfect recall!

# Example 2 (cont)

 $\boxtimes$  Consider information set  $\{L, R\}$ .

$$\boxtimes X_1(L) = (\{L, R\}, L, \{L, R\})$$

$$\boxtimes X_1(R) = (\{L, R\}, R, \{L, R\})$$

 $\boxtimes X_1(L) \neq X_1(R)$ : imperfect recall!

# Example 3 (cont)

 $\boxtimes$  Consider information set  $\{(L,C),(R,C)\}.$ 

$$\boxtimes X_1((L,C)) = (\underbrace{\{L\}}_{\text{1's first info set choice there}}, \underbrace{\{(L,C),(R,C)\}}_{\text{resulting info set}})$$

$$\boxtimes X_1((R,C)) = (\{R\}, C, \{(L,C), (R,C)\})$$

 $\boxtimes X_1((L,C)) \neq X_1((R,C))$ : imperfect recall!

#### Exc. 203.2 Can you define experience formally?

 $\boxtimes$  If  $h = \emptyset$ ,  $X_i(\emptyset)$  consists of the information set containing the initial node.

 $\boxtimes$  Consider a history  $h = (a^1, \dots, a^k) \in H$  with P(h) = i.

 $\boxtimes$  Write  $h^0 = \emptyset$  and for  $r = 1, \dots, k : h^r = (a^1, \dots, a^r)$ .

 $\boxtimes$  Steps after which i acts:  $R(i) = \{r \in \{0, ..., k\} \mid P(h^r) = i\}.$ 

 $\boxtimes$  Corresponding info sets: for each  $r \in R(i)$ , let  $I_i^r \in \mathcal{I}_i$  be the info set containing  $h^r$ .

 $\boxtimes$  Order the elements of R(i) in increasing order:  $r_1 < \cdots < r_\ell$ .

$$\boxtimes X_i(h) = \{ \underbrace{I_i^{r_1}}_{1^{st} \text{ info set of } i}, \underbrace{a^{r_1+1}}_{\text{ what } i \text{ does there}}, \underbrace{I_i^{r_2}, a^{r_2+1}, \dots, I_i^{r_\ell-1}, a^{r_\ell}, I_i^{r_\ell}}_{\text{etc.}} \}.$$

#### Three types of strategies

 $\boxtimes$  Consider an extensive form game  $\Gamma = \langle N, H, P, f_c, (\mathcal{I}_i)_{i \in N}, (\succsim_i)_{i \in N} \rangle$ .

oximes **Def. 203.1:** a *pure strategy* of pl  $i \in N$  is a function  $s_i$  that assigns to each information set  $I_i \in \mathcal{I}_i$  of pl i a feasible action  $s_i(I_i) \in A(I_i)$ .

 $\boxtimes$  **Def. 212.1**: a *mixed strategy* of pl  $i \in N$  is a probability distribution  $\sigma_i$  over the pure strategies of pl i.

"Global randomization" at the beginning of the game.

 $oxed{oxed}$  **Def. 212.1:** a behavioral strategy of pl.  $i \in N$  is a collection  $\beta_i = (\beta_i(I_i))_{I_i \in \mathcal{I}_i}$  of (indep) probability measures over the actions in i's information sets:  $\beta_i(I_i)$  is a prob meas over  $A(I_i)$ .

"Local randomization" as play proceeds.

Other terminology/notational conventions:

 $\boxtimes$  let  $h \in I_i \in \mathcal{I}_i$  and  $a \in A(h)$ . The prob assigned to a is denoted by  $\beta_i(h)(a)$  or  $\beta(I_i)(a)$ .

#### **Outcomes**

Each profile  $\sigma = (\sigma_i)_{i \in N}$  of mixed strategies induces an *outcome*  $O(\sigma)$ , a prob measure over terminal outcomes.

How to compute  $O(\sigma)$  in finite games?

 $\boxtimes$  Let  $h = (a^1, \dots, a^k)$  be a history.

 $\boxtimes$  Pure strategy  $s_i$  of player i is consistent with h if i chooses the actions described by h: for each initial segment  $(a^1, \ldots, a^\ell)$  with  $P(a^1, \ldots, a^\ell) = i$ :

$$s_i(a^1,\ldots,a^\ell)=a^{\ell+1}.$$

oximes The prob of choosing a pure strategy  $s_i$  that is consistent with h is

$$\pi_i(h) = \sum_{s_i \text{ consistent with } h} \sigma_i(s_i).$$

(similar for nature, whose behavior is given by  $f_c$ ).

 $\boxtimes$  Prob of reaching terminal node h is

$$\prod_{i \in N \cup \{c\}} \pi_i(h).$$

Similarly, each profile  $\beta = (\beta_i)_{i \in N}$  of behavioral strategies induces an outcome  $O(\beta)$ , a prob measure over terminal outcomes.

How to compute  $O(\beta)$  in finite games?

 $\boxtimes$  Let  $h = (a^1, \dots, a^k)$  be a terminal history.

oximes The prob of reaching terminal node  $h=(a^1,\ldots,a^k)$  is

$$\prod_{\ell=0}^{k-1} \beta_{P(a^1,...,a^{\ell})}(a^1,...,a^{\ell})(a^{\ell+1}).$$

# Does the distinction between mixed/behavioral strategies matter?

Not if they generate the same probability measures over terminal histories.

Strategies  $\sigma_i$  and  $\beta_i$  of pl  $i \in N$  are outcome-equivalent if — given the pure strategies of the remaining players — they give rise to the same outcome (as in lecture 9):

for all 
$$s_{-i}$$
:  $O(\sigma_i, s_{-i}) = O(\beta_i, s_{-i}).$ 

# Prop. 214.1 (Outcome equivalence under perfect recall)

In a finite extensive form game with perfect recall:

- (a) each behavioral strategy has an outcome-equivalent mixed strategy,
- (b) each mixed strategy has an outcome-equivalent behavioral strategy.

Proof sketch:

(a) Given beh. strategy  $\beta_i$ , assign to pure strategy  $s_i$  the probability

$$\sigma_i(s_i) = \prod_{I_i \in \mathcal{I}_i} \beta_i(I_i)(s_i(I_i)).$$

[Intuition:  $s_i$  selects action  $s_i(I_i)$  in info set  $I_i$ . How likely is that?]

(b) Given mixed strategy  $\sigma_i$ , consider an info set  $I_i \in \mathcal{I}_i$  of pl i and an action  $a \in A(I_i)$ . How should we define  $\beta_i(I_i)(a)$ ?

Consider history  $h \in I_i$ . Probability of choosing consistent with h is  $\pi_i(h)$ .

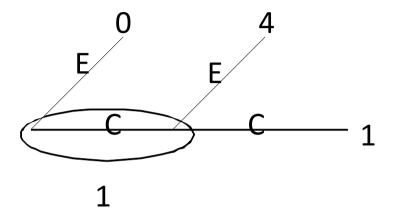
[Perfect recall:  $\pi_i(h) = \pi_i(h')$  for all  $h, h' \in I_i$ ].

**Define** 

$$\beta_i(I_i)(a) = \frac{\pi_i(h, a)}{\pi_i(h)}$$
 if  $\pi_i(h) > 0$  (and arbitrarily otherwise).

[Intuition: conditional on being consistent with h, how likely is i to choose a?]

# Example 1 (cont)



Pure strategies?

Mixed strategies?

Behavioral strategies?

Outcome equivalence?

 $\boxtimes$  Pure: Only one information set  $I_1 = \{\emptyset, C\}$ , two actions: C and E. So two pure strategies, with associated payoffs

$$C$$
 1  $E$  0

 $\boxtimes$  Mixed: let  $p=\sigma_1(C)$  be the prob of choosing pure strategy C (and 1-p the prob of choosing E). Expected payoff: p

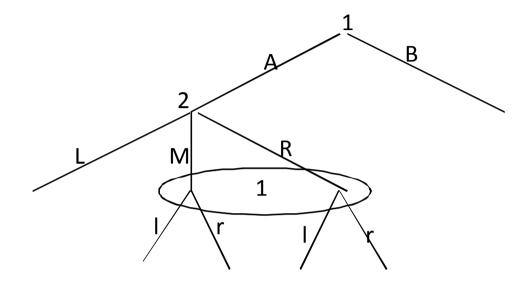
 $\boxtimes$  Behavioral: let  $q = \beta_1(I_1)(C)$  be the prob of choosing action C in the info set (and 1-q the prob of choosing E in the info set). Expected payoff:

$$0 \cdot (1-q) + 4 \cdot q(1-q) + 1 \cdot q^2 = q(4-3q).$$

oximes No behavioral strategy is outcome-equivalent with p=1/2 (why?)

oximes No mixed strategy is outcome-equivalent with q=1/2 (why?)

#### Exc. 216.1



Which behavioral strategy is outcome-equivalent with mixed strategy

$$\sigma_1(A\ell) = 5/10, \sigma_1(Ar) = 0, \sigma_1(B\ell) = 1/10, \sigma_1(Br) = 4/10$$
?

$$\boxtimes \beta_1(\emptyset)(A) = \pi_1(A)/\pi_1(\emptyset) = (5/10)/1 = 1/2 \text{ and } \beta_1(\emptyset)(B) = 1/2.$$

$$\boxtimes \beta_1(\{(A,M),(A,R)\})(\ell) = \pi_1((A,M,\ell))/\pi_1(A,M) = (5/10)/(5/10) = 1$$
 and  $\beta_1(\{(A,M),(A,R)\})(r) = 0$ .

## Nash equilibrium

 $\boxtimes$  As in the case of extensive form games with perfect information, we can construct a corresponding strategic game.

 $\boxtimes$  A Nash equilibrium in mixed strategies is a mixed-strategy profile  $\sigma^* = (\sigma_i^*)_{i \in N}$  such that no player can profitably deviate to another mixed strategy:

for all  $i \in N$  and all mixed strategies  $\sigma_i$  of pl  $i : O(\sigma^*) \succsim_i O(\sigma^*_{-i}, \sigma_i)$ . This is just a mixed Nash equilibrium of the corresponding strategic game.

**Corollary:** Every finite extensive form game with perfect recall has a Nash equilibrium in mixed/behavioral strategies.

Proof: Finite extensive form game results in finite strategic game, which has a Nash eq. in mixed strategies (lecture 1). By outcome-equivalence, we can construct a Nash equilibrium in behavioral strategies.