



GAME THEORY: Lecture 3

Ugur Soytaş



Mixed Strategies

Strategic randomization



Mixed Strategy

- ◆ Let $S_i = \{s_{i1}, s_{i2}, \dots, s_{ik}\}$ be the set of pure strategies for player i , then a mixed strategy is a probability distribution $P_i = (p_{i1}, p_{i2}, \dots, p_{ik})$, where p_{ij} is the probability of player i selecting the pure strategy s_{ij} .
- ◆ Note that $0 \leq p_{ij} \leq 1$ and $\sum_{j=1}^k p_{ij} = 1$.
- ◆ **Completely mixed strategy:** If $p_{ij} > 0$ for all j . (If all pure strategies have non-zero probability of being played)
- ◆ **Degenerate mixed strategy:** If one $p_{ij} = 1$ (other strategies have 0 probability of being played)



Why do players use mixed strategies?

- ◆ If there is no NE in pure strategies, then it may be the only rational choice
- ◆ Keep the opponents indifferent between their pure strategies
- ◆ To prevent being exploited in strictly competitive games (special case of above)
- ◆ If players cannot coordinate or not know how (i.e. coordination games)
- ◆ Randomization by authorities (i.e. to ration limited capacity in towns)
- ◆ Randomization by nature (evolutionary game theory)



Solving Equilibrium in Mixed Strategies

- ◆ **Hint:** Use one player's payoffs to solve for other player's probability allocation in equilibrium
 - ❖ Every finite strategic game has a mixed strategy equilibrium
 - ❖ Every finite strategic game has a Nash equilibrium, possibly in mixed strategies



Matching Pennies

Player 2

Player 1

| | Heads | Tails |
|-------|-------|-------|
| Heads | 1, -1 | -1, 1 |
| Tails | -1, 1 | 1, -1 |

No NE in pure
strategies



Mixed Strategies in Matching Pennies

- ◆ Set of (pure) strategies, $S_i = \{ H, T \}$, $i = 1, 2$
- ◆ Let mixed strategy set for Player 1, $p_1 = (a, 1-a)$ Player 2, $p_2 = (b, 1-b)$
- ◆ Player 1 will choose a strategy to maximize “expected payoff”.

Expected payoff from playing H against p_2 :

$$E(u_1(H)) = b(-1) + (1-b)1 = 1-2b$$

Expected payoff from playing T against p_2 :

$$E(u_1(T)) = b(1) + (1-b)(-1) = 2b-1$$



Best Response Function of Player 1

♦ Player 1 will choose:

- Pure strategy H ($a=1$) if $1-2b > 2b-1 \Rightarrow \text{if } b < \frac{1}{2}$
- Pure strategy T ($a=0$) if $1-2b < 2b-1 \Rightarrow \text{if } b > \frac{1}{2}$
- Mixed strategy ($a, 1-a$) (i.e., indifferent between H & T)
if $1-2b = 2b-1 \Rightarrow \text{if } b = \frac{1}{2}$

♦ Player 1's best response function:

$$\mathbf{a^*(b)} = \begin{cases} a = 1 & \text{if } b < \frac{1}{2} \\ a = 0 & \text{if } b > \frac{1}{2} \\ 0 \leq a \leq 1 & \text{if } b = \frac{1}{2} \end{cases}$$



Best Response Function of Player 2

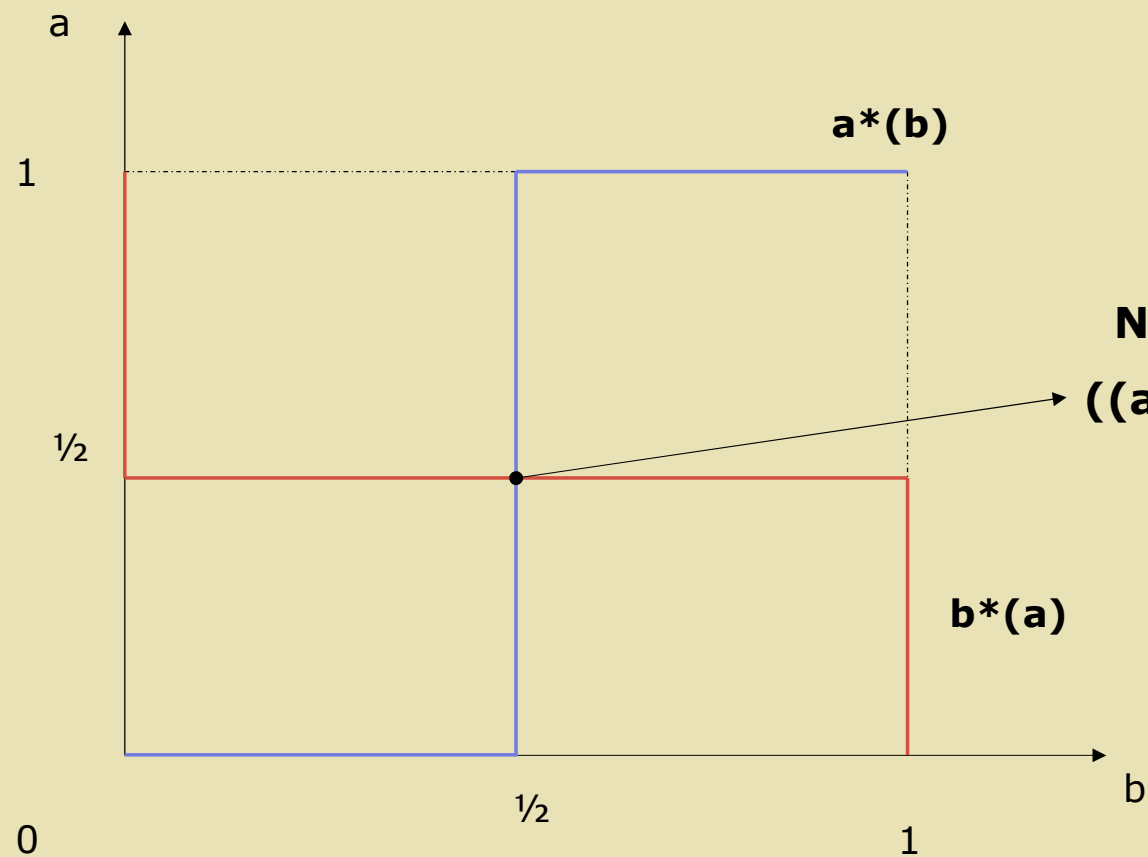
♦ Player 2 will choose:

- Pure strategy H ($b=1$) if $a(-1)+(1-a)(1) > a(1)+(1-a)(-1) \Rightarrow \text{if } a < \frac{1}{2}$
- Pure strategy T ($b = 0$) if $a(-1)+(1-a)(1) < a(1)+(1-a)(-1) \Rightarrow \text{if } a > \frac{1}{2}$
- Mixed strategy ($b, 1-b$) if $a(-1)+(1-a)(1) = a(1)+(1-a)(-1) \Rightarrow \text{if } a = \frac{1}{2}$

♦ Player 2's best response function:

$$\mathbf{b}^*(a) = \begin{cases} b = 1 & \text{if } a < \frac{1}{2} \\ b = 0 & \text{if } a > \frac{1}{2} \\ 0 \leq b \leq 1 & \text{if } a = \frac{1}{2} \end{cases}$$

Best Response Functions



NE in mixed strategies:

$$((a^*, 1-a^*), (b^*, 1-b^*)) = ((\frac{1}{2}, \frac{1}{2}), (\frac{1}{2}, \frac{1}{2}))$$



Battle of the Sexes

| | | Husband | |
|------|-------------|-------------|-------|
| | | Rock & Roll | Movie |
| Wife | Rock & Roll | 2, 1 | 0, 0 |
| | Movie | 0, 0 | 1, 2 |

2 NE: (R&R, R&R) and (Movie, Movie)



Wife's Expected Payoffs

- ◆ Let $p_{\text{Wife}} = (a, 1-a)$ be Wife's and $p_{\text{Husband}} = (b, 1-b)$ be Husband's mixed strategy
- ◆ Then for Wife

Expected payoff from playing $a = 1$ against husband's mix:

$$E(u_W(1, 0)) = 2b + 0(1-b) = 2b$$

Expected payoff from playing $a = 0$ against husband's mix:

$$E(u_W(0, 1)) = 0b + 1(1-b) = 1-b$$



Wife's Best Response Function

- ◆ Wife maximizes expected payoffs, so she
 - will choose ($a = 1$) if $2b > 1 - b$ \Rightarrow if $b > 1/3$
 - will choose ($a = 0$) if $2b < 1 - b$ \Rightarrow if $b < 1/3$
 - Will choose ($0 \leq a \leq 1$) if $2b = 1 - b$ \Rightarrow if $b = 1/3$

$$a^*(b) = \begin{cases} a = 1 & \text{if } b > 1/3 \\ a = 0 & \text{if } b < 1/3 \\ 0 \leq a \leq 1 & \text{if } b = 1/3 \end{cases}$$

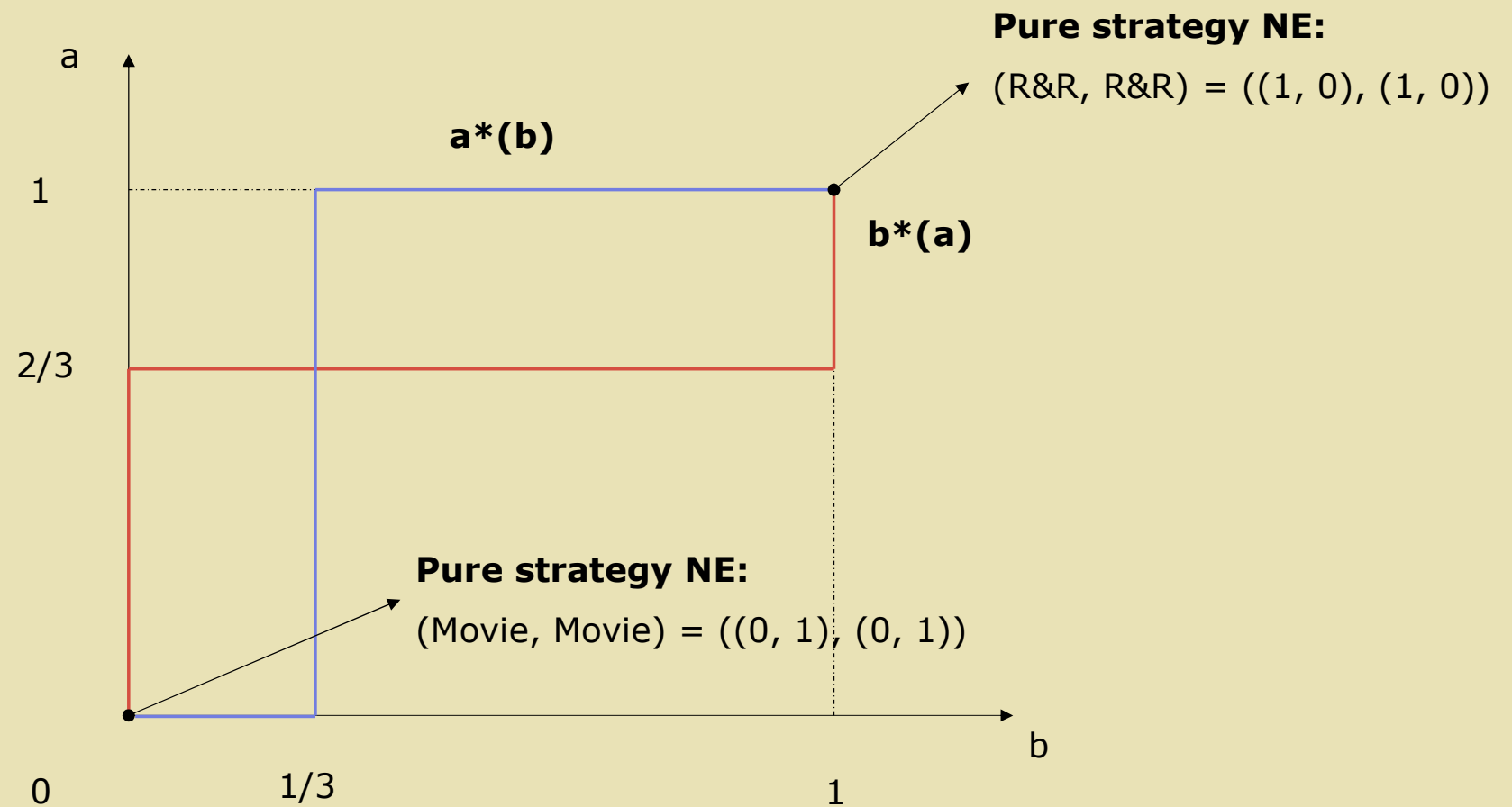


Husband's Best Response Function

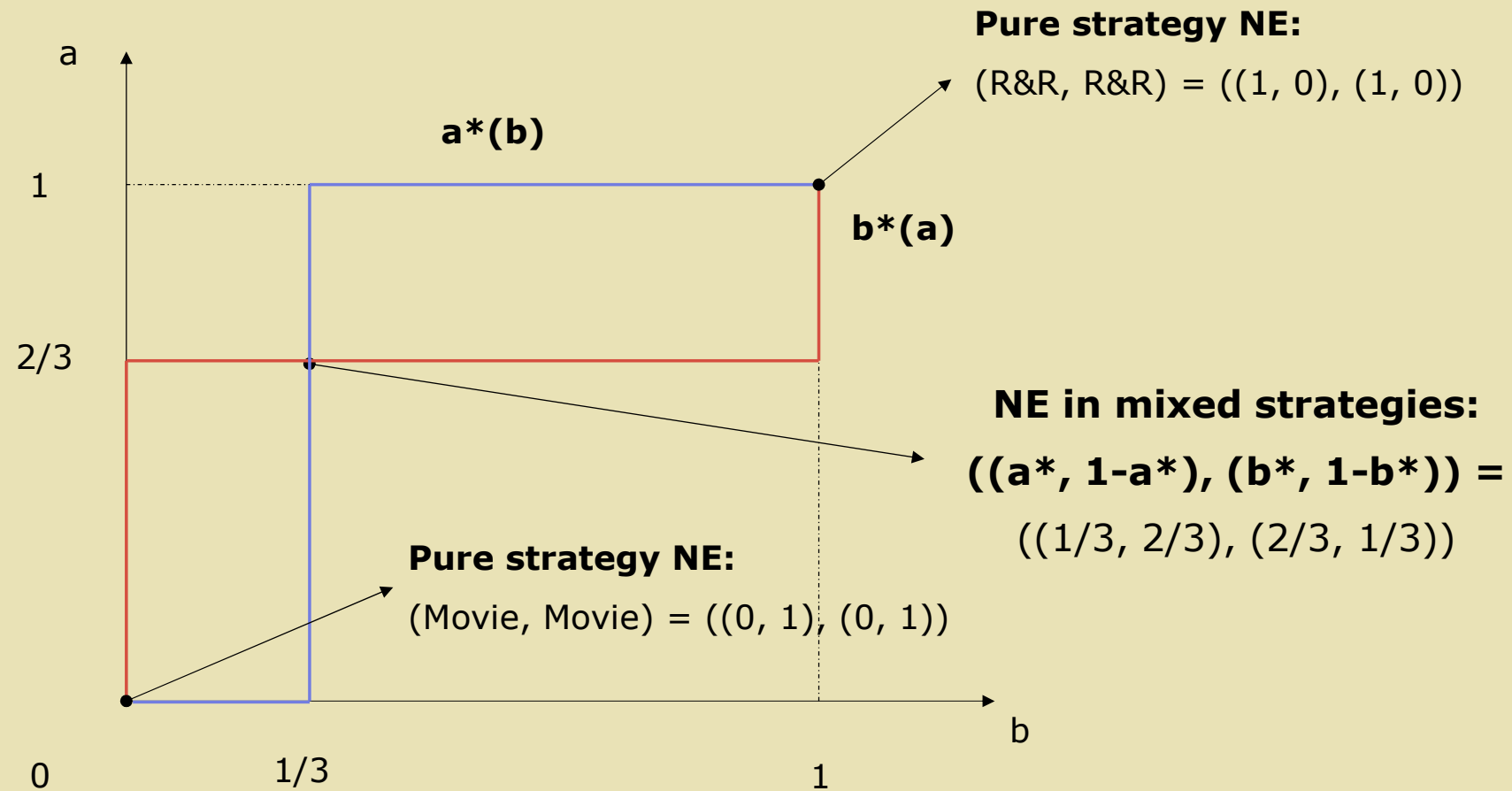
- ◆ Using Wife's probabilities to assess Husband's expected payoffs yields:

$$\mathbf{b}^*(a) = \begin{cases} b = 1 & \text{if } a > 2/3 \\ b = 0 & \text{if } a < 2/3 \\ 0 \leq b \leq 1 & \text{if } a = 2/3 \end{cases}$$

Best Response Functions



Best Response Functions



A still life composition of various objects on a light-colored, textured surface. In the top left, a portion of a wooden checkers board with a blue border and several wooden pieces is visible. Below it, a blue ribbon with a circular medal hangs. To the right, a red ribbon with a circular medal is partially visible. In the center, a silver star-shaped medal with a central emblem is displayed. At the bottom left, a round, silver compass with a white face and black markings is shown. A pair of thin-framed glasses with dark lenses and a thin metal bridge lies diagonally across the lower center. A small, thin, reddish-brown object, possibly a pen or a small stick, lies horizontally across the middle of the frame.

Games with Imperfect Information

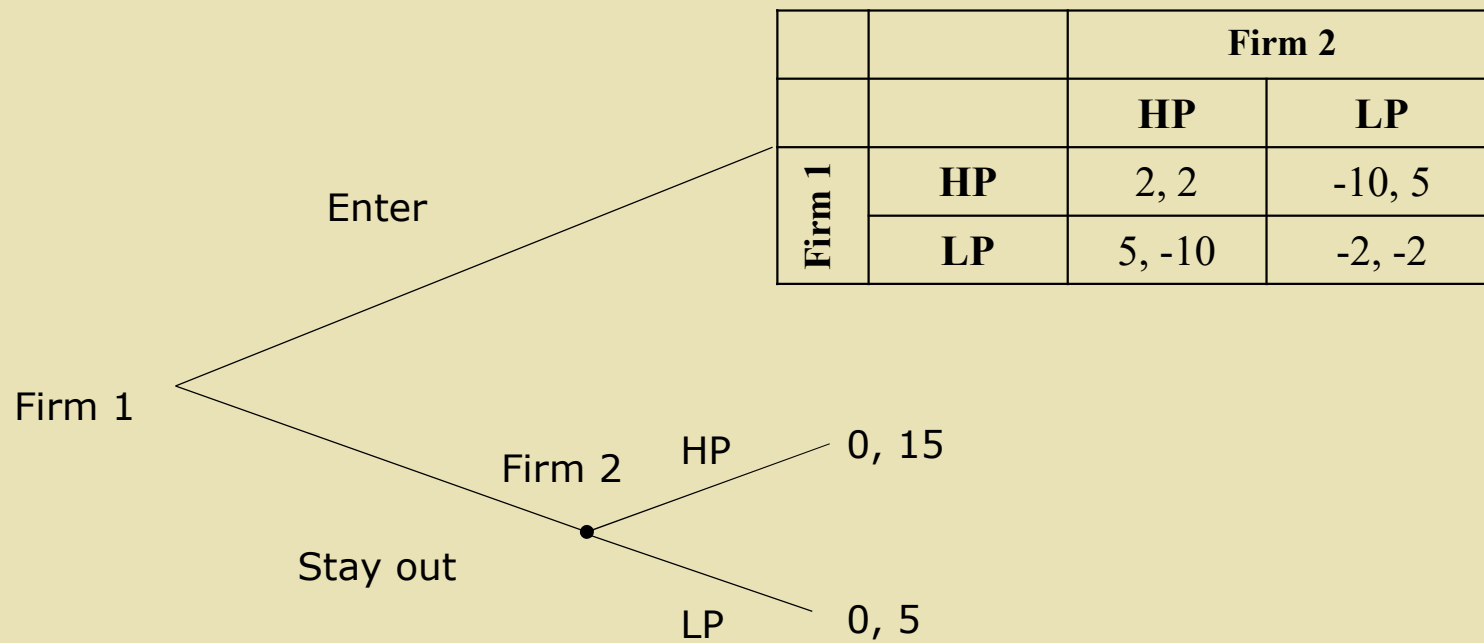
Combining sequential and
simultaneous move



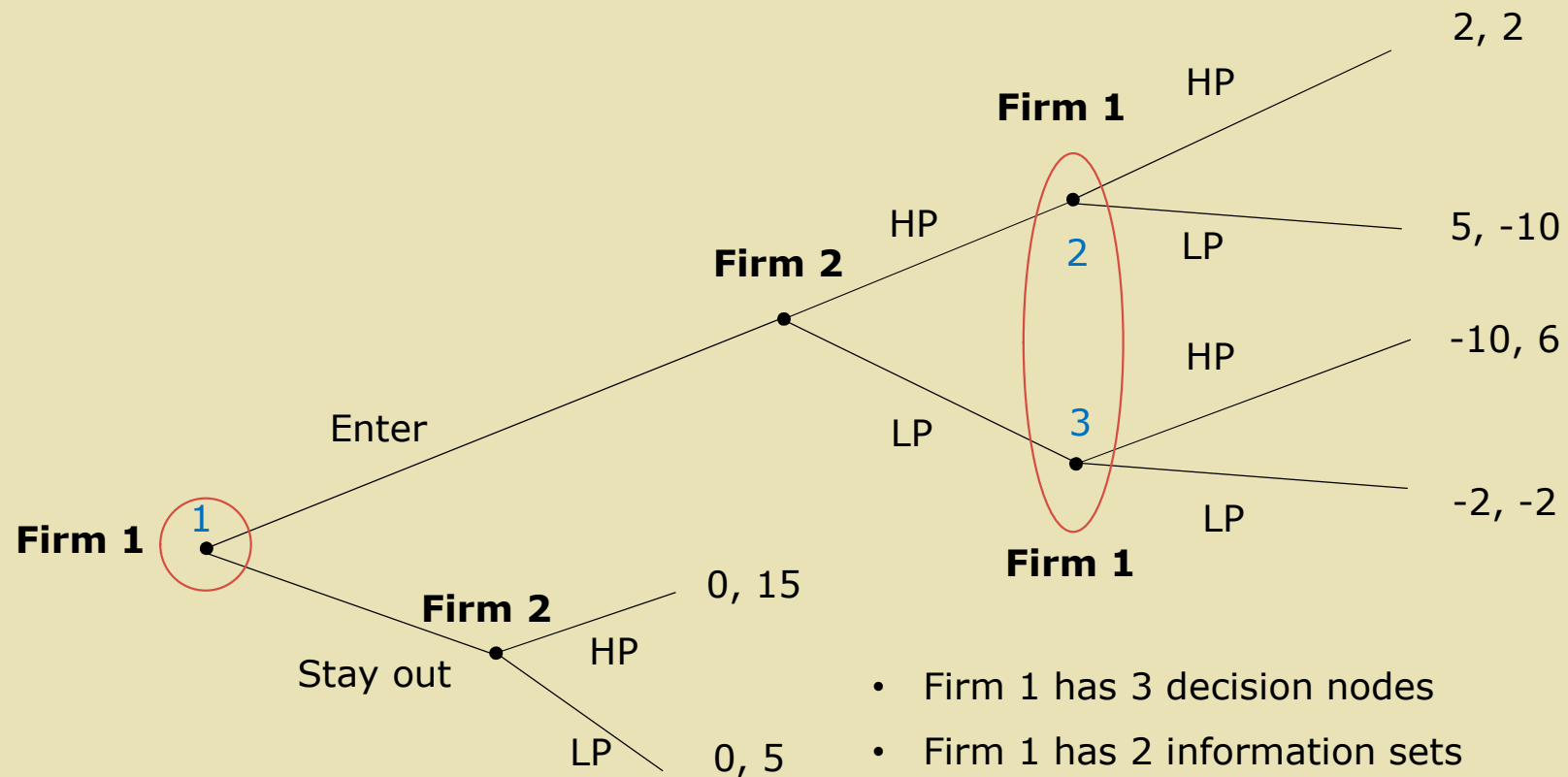
Complete and Imperfect Information

- ◆ **Complete information:** Players know each others moves and payoffs (payoff functions are common knowledge)
- ◆ **Perfect information:** Players know what other players have chosen
 - Complete and perfect info games: all information sets are singletons (e.g., chain store, Stackelberg duopoly)
 - Complete and imperfect info games: at least one information set is non-singleton (e.g., repeated PD, repeated Price War)

Sequential and Simultaneous moves combined



Sequential and Simultaneous moves combined (alternative display)



- Firm 1 has 3 decision nodes
- Firm 1 has 2 information sets
 $i1 = \{1\}$ $i2 = \{2, 3\}$



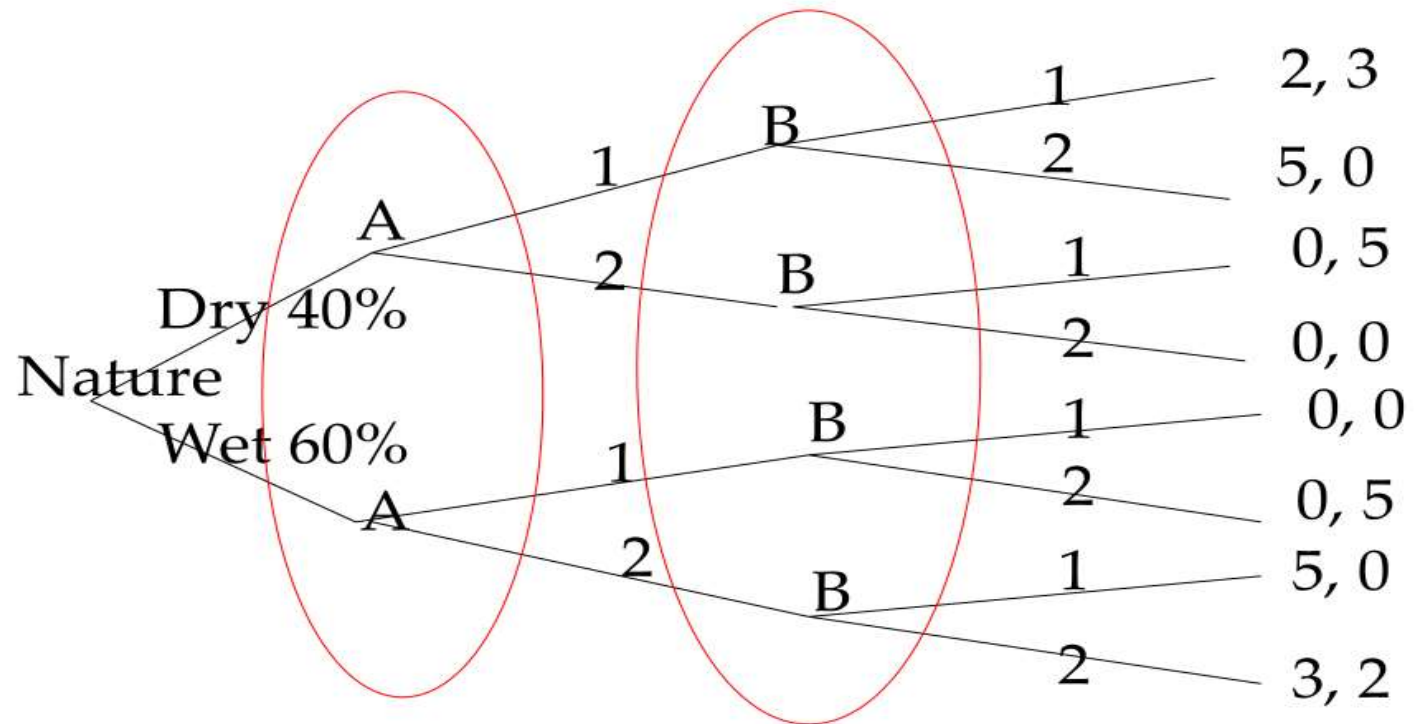
Exogenous Uncertainty

Two farmers decide at the beginning of the season what crop to plant. If the season is dry only type I crop will grow. If the season is wet only type II will grow. Suppose that the probability of a dry season is 40% and 60% for the wet weather. The following table describes the Farmers' payoffs.

| Dry | Crop 1 | Crop 2 |
|--------|--------|--------|
| Crop 1 | 2, 3 | 5, 0 |
| Crop 2 | 0, 5 | 0, 0 |

| Wet | Crop 1 | Crop 2 |
|--------|--------|--------|
| Crop 1 | 0, 0 | 0, 5 |
| Crop 2 | 5, 0 | 3, 2 |

Nature as a player





Payoff Matrix

- When A and B both choose Crop 1, with a 40% chance (Dry) that A, B will get 2 and 3 each, and a 60% chance (Wet) that A, B will get both 0.

$$E(u_A(\text{Crop I, Crop I})): 40\% \times 2 + 60\% \times 0 = 0.8$$

$$E(u_B(\text{Crop I, Crop I})): 40\% \times 3 + 60\% \times 0 = 1.2$$

- If they both choose Crop II, with 40% chance A gets 0 and B gets 0, and with 60% chance A gets 3 and B gets 2

$$E(u_A(\text{Crop II, Crop II})): 40\% \times 0 + 60\% \times 3 = 1.8$$

$$E(u_B(\text{Crop II, Crop II})): 40\% \times 0 + 60\% \times 2 = 1.2$$

| | Crop I | Crop II |
|---------|----------|----------|
| Crop I | 0.8, 1.2 | 2, 3 |
| Crop II | 3, 2 | 1.8, 1.2 |

2 NE:

(Crop I, Crop II)
and

(Crop II, Crop I)



Static Games of Incomplete Information

Static Bayesian Games



Incomplete Information

- ◆ Payoff functions are not common knowledge. At least one player is uncertain about another player's payoffs.
- ◆ **Harsanyi transformation:** Transform games with incomplete information into games with complete but imperfect information. It treats players with different payoffs as distinct types.



Normal form definition

- ◆ Set of players, $I = \{1, 2, \dots, n\}$
- ◆ Set of actions, $A = \{A_1, A_2, \dots, A_n\}$, where $A_i = \{a_{i1}, a_{i2}, \dots, a_{ik}\}$, $i \in I$
- ◆ Set of types, $T = \{T_1, T_2, \dots, T_n\}$, where $T_i = \{t_{i1}, t_{i2}, \dots, t_{ih}\}$ and h is number of types for player i
- ◆ Set of beliefs, $P = \{P_1, P_2, \dots, P_n\}$
- ◆ Payoff functions, $U = \{u_1, u_2, \dots, u_n\}$, where $u_i(a_1, a_2, \dots, a_n; t_{ij})$, $i \in I$, $j = 1, \dots, h$
- ◆ Player i 's type t_{ij} is privately known by i , but not others.
(incomplete information)



Timing of static Bayesian game

- ◆ Harsanyi steps:

1. Nature draws a type vector, $t = (t_1, t_2, \dots, t_n)$
2. Nature reveals t_i to player i , but not to others
3. Players simultaneously choose their actions
4. The payoffs are received

- ◆ Steps 1&2 transform the incomplete info game into an imperfect info game. (Players do not observe Nature's move, except own type)



Bayesian Nash Equilibrium

- ◆ A strategy profile $s^* = \{s_1^*(t_1), s_2^*(t_2), \dots, s_n^*(t_n)\}$ constitutes a Bayesian NE if for each $i \in I$ and $t_i \in T_i$

$$u_i(s_i^*; t_i) \geq u_i(s_1^*(t_1), \dots, s_i'(t_i), \dots, s_n^*(t_n), t_i)$$

- ❖ In a finite static Bayesian game (I and T are finite sets), there exists a Bayesian NE, possibly in mixed strategies



BoS Game with Incomplete Information

- ◆ $I = \{\text{Lady, Man}\}$
- ◆ $A_i = \{\text{Bach, Stravinsky}\}, i \in I$
- ◆ $T_L = \{x\}, T_M = \{\text{loving, hating}\}$
- ◆ $P_L(\text{loving} \mid x) = P_L(\text{hating} \mid x) = 0.5$ and
 $P_M(x \mid \text{loving}) = P_M(x \mid \text{hating}) = 1$
- ◆ Payoffs are given as follows:



BoS incomplete information payoffs

Loving type (0.5)

| | | Man | |
|------|------------|------|------------|
| | | Bach | Stravinsky |
| Lady | Bach | 2,1 | 0,0 |
| | Stravinsky | 0,0 | 1,2 |

Hating type (0.5)

| | | Man | |
|------|------------|------|------------|
| | | Bach | Stravinsky |
| Lady | Bach | 2,0 | 0,2 |
| | Stravinsky | 0,1 | 1,0 |



BoS Harsanyi steps

1. Nature draws a type vector: either (x, loving) or (x, hating)
 2. Nature reveals the man his type but not to the lady
 3. Players simultaneously choose Bach or Stravinsky
 4. Payoffs are received
-
- ◆ When nature reveals the types individually, how does the expected payoff matrix look like?

Expected Payoffs for BoS

| loving | B | S |
|--------|-----|-----|
| B | 2,1 | 0,0 |
| S | 0,0 | 1,2 |

| hating | B | S |
|--------|-----|-----|
| B | 2,0 | 0,2 |
| S | 0,1 | 1,0 |

Man: We consider actions by and payoffs to loving and hating types

Lady: We consider all strategies and expected payoffs available to type x

For example: $u_L(B, (B,B); p_L) = 2*0.5 + 2*0.5 = 2$

$u_L(S, (B,S); p_L) = 0*0.5 + 1*0.5 = 0.5$

| | (B,B) | (B,S) | (S,B) | (S,S) |
|---|----------|------------|------------|----------|
| B | 2, (1,0) | 1, (1,2) | 1, (0,0) | 0, (0,2) |
| S | 0, (0,1) | 0.5, (0,0) | 0.5, (2,1) | 1, (2,0) |



Finding BNE in pure strategies

- Mark best responses for the Lady for each strategy pair for man types
- Mark best responses for loving man for each strategy of the lady
- Mark best responses for loving man for each strategy of the lady

| | (B,B) | (B,S) | (S,B) | (S,S) |
|---|---------------------------|-----------------------------------|------------------------------|--------------------------|
| B | <u>2</u> , (<u>1</u> ,0) | <u>1</u> ,(<u>1</u> , <u>2</u>) | <u>1</u> ,(0,0) | 0,(0, <u>2</u>) |
| S | 0, (0, <u>1</u>) | 0.5, (0,0) | 0.5, (<u>2</u> , <u>1</u>) | <u>1</u> ,(<u>2</u> ,0) |

Bayesian NE in pure strategies: (B, (B,S))



Bayesian NE in mixed strategies

- ◆ Derive best response functions for Loving Man, Hating Man, and Lady separately
- ◆ Check if there can be an equilibrium in which both types mix (not in this game!)
- ◆ Check equilibrium where only Loving mixes
- ◆ Check equilibrium where only Hating mixes
- ◆ There are 3 equilibria:
 1. $\{(1,0), ((1,0),(0,1))\}$ (pure strategy BNE: $(B, (B,S))$)
 2. $\{(2/3,1/3), ((2/3,1/3),(0,1))\}$
 3. $\{(1/3,2/3), ((0,1),(2/3,1/3))\}$



Static Bayesian Game Applications

- ◆ A new interpretation of mixed strategies
 - ❖ A mixed strategy NE in a complete information game can be interpreted as a pure strategy Bayesian NE in a related game with incomplete information
- ◆ Private value first-price sealed bid auctions
- ◆ Private value second-price sealed bid auctions
- ◆ Oligopolistic competition where the firms choose quantities simultaneously, and cost functions are private information
- ◆ Job seeker and employer salary negotiations



Dynamic Games of Incomplete Information

Dynamic Bayesian Games



Recall: equilibrium concepts

- ◆ NE for static games of complete information
- ◆ SPE for dynamic games of complete information
(SPE refines NE: eliminates incredible threats)
- ◆ Bayesian NE for static games of incomplete information
+ **Perfect Bayesian NE** for dynamic games of incomplete information



Perfect Bayesian NE

- ◆ It consists of a strategy profile $s^* = \{s_1^*, \dots, s_n^*\}$ and a belief profile $p^* = \{p_1^*, \dots, p_n^*\}$ (a collection of probability assessments for each information set) such that
 1. S^* constitutes a NE, given p^*
 2. At each info set of player i , player's move maximizes u_i , given p_i^* at that info set (sequential rationality)
 3. p_i^* can be derived from s^* and common prior beliefs
 4. p^* are consistent with s^* and Bayes' rule



Bayes' Rule

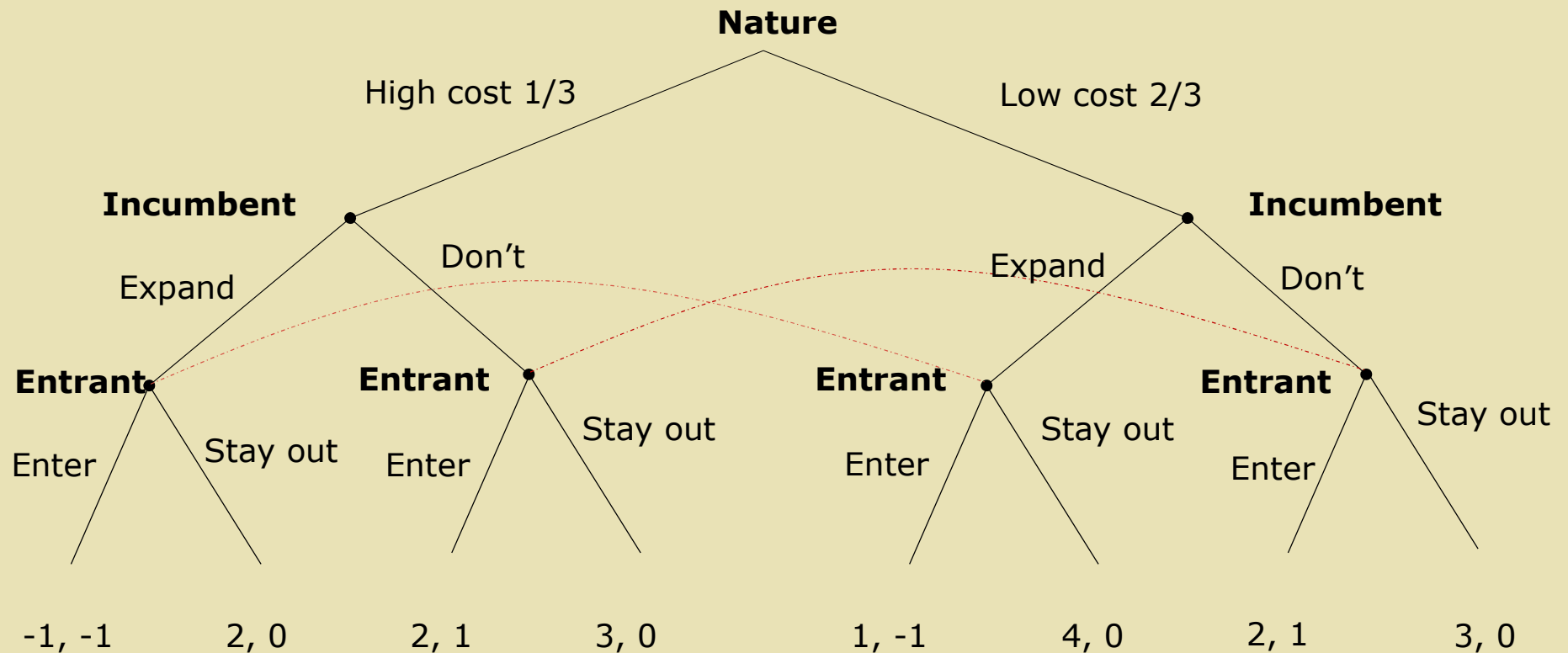
$$P(A|B) = \frac{P(B|A)P(A)}{P(B)}$$

where A and B are events and $P(B) \neq 0$

$P(A|B)$: conditional probability of event A given B is true

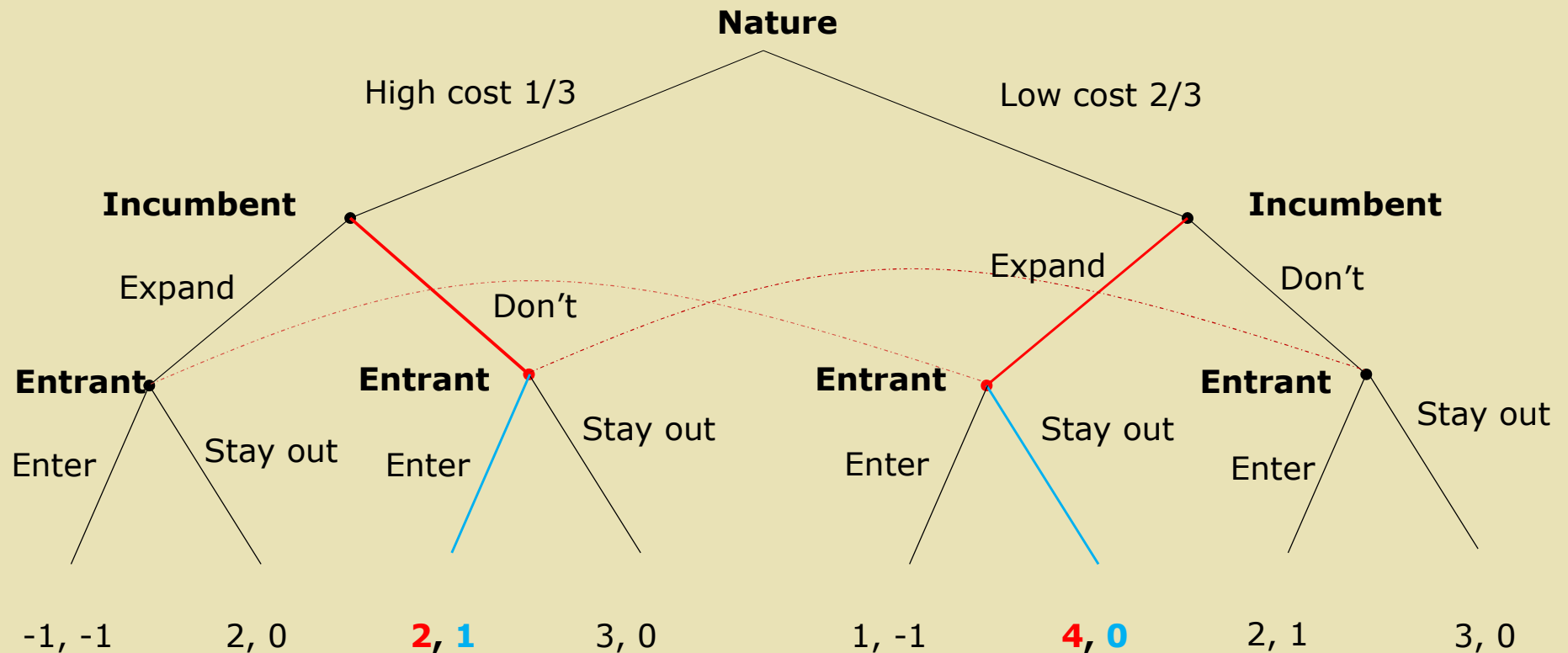
$P(A)$ and $P(B)$: a priori (marginal) probabilities of A and B

Entry Deterrence Game



- Incumbent's strategy profile must specify a move for each of its types.
Example: (Expand | High cost, Don't | Low cost)
- Entrant has 2 info sets, and strategy must specify a move for each info set
Example: (Enter | Expand, Stay out | Don't)

Expected payoffs for a particular strategy profile: {(Don't, Expand), (S, E)}



{(Don't, Expand), (S, E)}

$$E(u_{\text{entrant}}) = 1(1/3) + 0(2/3) = 1/3$$

$$E(u_{\text{HCIncumbent}}) = 2$$

$$E(u_{\text{LCIncumbent}}) = 4$$

Normal Form with conditional expected payoffs

$\{(\text{Don't}, \text{Expand}), (S, E)\}$ payoffs are $\{(2, 4), 1/3\}$

| | | Entrant (if expand, if don't) | | | |
|-----------------------------|------------------|-------------------------------|-------------------|-------------------|----------------------|
| | | (Enter, Enter) | (Enter, Stay out) | (Stay out, Enter) | (Stay out, Stay out) |
| Incumbent (if HC, if LC) | (Expand, Expand) | $(-1, 1), -1$ | $(-1, 1), -1/3$ | $(1, 4), 0$ | $(1, 4), 0$ |
| | (Expand, Don't) | $(-1, 2), 1/3$ | $(-1, 3), -1/3$ | $(1, 2), 2/3$ | $(1, 3), 0$ |
| | (Don't, Expand) | $(2, 1), -1/3$ | $(3, 1), -2/3$ | $(2, 4), 1/3$ | $(3, 4), 0$ |
| | (Don't, Don't) | $(2, 2), 1$ | $(3, 3), 0$ | $(2, 2), 1$ | $(3, 3), 0$ |

2 pure strategy equilibria (candidates for PBNE):

A) $\{(\text{Don't}, \text{Expand}), (\text{Stay out}, \text{Enter})\}$

B) $\{(\text{Don't}, \text{Don't}), (\text{Enter}, \text{Enter})\}$ (implausible because it involves incredible threat)

We must check if belief profiles of the Entrant are consistent with A and B

Note: Entrant has 2 info sets therefore p^* must have 2 probability assessments



Checking beliefs using Bayes' rule

Information set 1 (connecting Expand choice of incumbent)

- ◆ Suppose $q = P(HC \mid \text{Expand})$ (hence $1-q = P(LC \mid \text{Expand})$)

$$q = \frac{\left(\frac{1}{3}\right)P(\text{Expand} \mid HC)}{\left(\frac{1}{3}\right)P(\text{Expand} \mid HC) + \left(\frac{2}{3}\right)P(\text{Expand} \mid LC)}$$

- ◆ Evaluate PBNE candidates

(Don't, Don't): $q = \frac{\frac{1}{3}(0)}{\left(\frac{1}{3}\right)(0) + \left(\frac{2}{3}\right)(0)} = \frac{0}{0}$ indeterminate (there are no beliefs consistent with (Don't, Don't))

(Don't, Expand): $q = \frac{\frac{1}{3}(0)}{\left(\frac{1}{3}\right)(0) + \left(\frac{2}{3}\right)(1)} = 0$ so $q=0$ and $1-q=1$ is **consistent** with (Don't, Expand)



Continue checking beliefs using Bayes' rule

Information set 2 (connecting Don't choice of incumbent)

- ◆ Suppose $p = P(HC \mid \text{Don't})$ (hence $1-p = P(LC \mid \text{Don't})$)

$$p = \frac{(\frac{1}{3})P(\text{Don't}|HC)}{(\frac{1}{3})P(\text{Don't}|HC) + (\frac{2}{3})P(\text{Don't}|LC)}$$

- ◆ Evaluate PBNE candidates

(Don't, Don't): $p = \frac{\frac{1}{3}(1)}{(\frac{1}{3})(1) + (\frac{2}{3})(0)} = \frac{1}{3}$ but $p = 1/3$ and $1-p = 2/3$ is exactly the same with priori probabilities (not PBNE)

(Don't, Expand): $p = \frac{\frac{1}{3}(1)}{(\frac{1}{3})(1) + (\frac{2}{3})(0)} = 1$ so $p = 1$ and $1-p = 0$ is **consistent** with (Don't, Expand).



PBNE of Entry Deterrence game

The unique perfect Bayesian Nash equilibrium constitutes

- ◆ Strategy profile:

$\{(\text{Don't} \mid \text{High cost}, \text{Expand} \mid \text{Low cost}); (\text{Stay out} \mid \text{Expand}, \text{Enter} \mid \text{Don't})\}$

- ◆ Belief profile:

$\{\text{Expand: } (0, 1), \text{Don't: } (1, 0)\}$



Conclusion: You May Choose

- ◆ Which game to play
- ◆ With whom to play
- ◆ Which strategies are available to each player
- ◆ What payoff each outcome will yield

More importantly

- ◆ Whether to play or not