# Mixing and Matching

Recall the following game from the previous lectures: Matching Pennies.

|    | H        | T        |
|----|----------|----------|
| H  | <u>1</u> | -1       |
| 11 | -1       | <u>1</u> |
| T  | -1       | <u>1</u> |
| 1  | <u>1</u> | -1       |

There is no "pure-strategy" Nash equilibrium. How might a prediction be made? Neither rationalisability nor iteratively eliminating strictly dominated strategies helps.

Suppose row player tossed their (fair) coin...

Column player (equipped with vNM utility) would receive  $\frac{1}{2} \times 1 + \frac{1}{2} \times (-1) = 0$  upon playing H. Column receives  $\frac{1}{2} \times (-1) + \frac{1}{2} \times 1 = 0$  upon playing T. Column is indifferent!

...and might decide by tossing a (fair) coin...

#### **Mixed Strategies**

This is referred to as mixing, or playing *mixed strategies*. Extend Definition 1 to incorporate this:

**Definition 10.** The *mixed extension* of a game  $\mathcal{G} = \langle N, \{S_i\}_{i \in \mathbb{N}}, \{u_i\}_{i \in \mathbb{N}} \rangle$  is the game  $\Gamma$ , where:

- 1.  $\Gamma = \langle N, \{\Delta(S_i)\}_{i \in N}, \{U_i\}_{i \in N} \rangle$ .
- 2.  $\Delta(S_i)$  is the set of probability distributions over  $S_i$ , and  $\Delta(S) = \times_{i \in N} \Delta(S_i)$ .
- 3.  $U_i : \Delta(S) \mapsto \mathcal{R}$  is a vNM expected utility function that assigns to each  $\sigma \in \Delta(S)$  the expected value under  $u_i$  of the lottery over S induced by  $\sigma$ .

Consider part (3) for finite games. Suppose player i plays mixed strategy  $\sigma_i \in \Delta(S_i)$ . Denote the probability that this places on pure strategy  $s_i \in S_i$  as  $\sigma_i(s_i)$ . Then,

$$U_i(\sigma) = \sum_{s \in S} u_i(s) \prod_{j \in N} \sigma_j(s_j).$$

**Notation.** Define  $\sigma_{-i} \in \Delta(S_{-i}) = \times_{j \neq i} \Delta(S_j)$  analogously to the pure strategy case.

### Nash Equilibrium

Definition 7a can be immediately brought to bear: A mixed-strategy Nash equilibrium of a game G is a Nash equilibrium of its mixed extension  $\Gamma$ . Formally...

**Definition 11a.** A mixed-strategy Nash equilibrium is a strategy profile  $\sigma^* \in \Delta(S)$  such that,

$$U_i(\sigma_i^*, \sigma_{-i}^*) \ge U_i(\sigma_i, \sigma_{-i}^*) \quad \forall \sigma_i \in \Delta(S_i) \text{ and } \forall i \in N.$$

**Definition 11b.**  $\sigma^* \in \Delta(S)$  is a Nash equilibrium if and only if  $\sigma_i^* \in B_i(\sigma_{-i}^*)$  for all  $i \in N$ .

Definitions for rationalisability and dominance can be extended to mixed strategies similarly.

Definition 11b gives a useful insight into the properties of mixed-strategy Nash equilibria. For a mixed strategy  $\sigma_i$  to be a best response to a given combination of opponents' strategies  $\sigma_{-i}$ , every pure strategy in its support must also be a best response to  $\sigma_{-i}$ . Therefore all pure strategies in the support of the equilibrium strategy for a given player must yield the same payoff to that player...

Use this indifference property to find equilibria.

#### **Equilibrium in Matching Pennies**

Consider, once again, the matching pennies game:

|     | H        | T        |
|-----|----------|----------|
| H   | <u>1</u> | -1       |
| 1.1 | -1       | <u>1</u> |
| T   | -1       | <u>1</u> |
| 1   | <u>1</u> | -1       |

Now suppose row mixes with probability x and 1 - x on H and T respectively. Abusing notation,

$$U_C(H) = x \times 1 + (1 - x) \times (-1) = 2x - 1,$$

$$U_C(T) = x \times (-1) + (1 - x) \times 1 = 1 - 2x.$$

Column is indifferent only when  $2x - 1 = 1 - 2x \Leftrightarrow x = \frac{1}{2}$ . Similarly for row. The mixed-strategy Nash equilibrium involves both players mixing with probability  $\frac{1}{2}$ .

Notice row player's equilibrium strategy is determined by column's payoffs and vice versa!

#### **Battle of the Sexes Revisited**

**Players.** The players are M.Phil. student 1 (row) and 2 (column).

**Pure Strategies.** The strategies available to both players are Cafe and Pub.

**Mixed Strategies.** Row chooses Cafe w.p.  $x \in [0, 1]$ , column chooses Cafe w.p.  $y \in [0, 1]$ .

**Payoffs.** Represent the payoffs in the strategic form matrix:

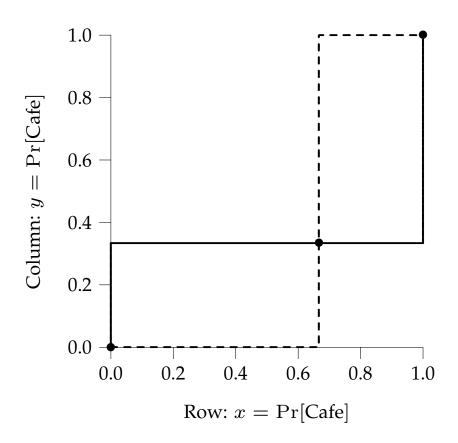
|               | Cafe $(y)$ | Pub (1 - y) | Expected   |
|---------------|------------|-------------|------------|
| Cafe $(x)$    | 3          | 1<br>1      | 4y + (1-y) |
| Pub $(1 - x)$ | 0          | 3           | 3(1-y)     |

Expected 3x x + 4(1-x)

Column chooses y=1 whenever 3x>x+4(1-x)  $\Leftrightarrow$  6x>4  $\Leftrightarrow$  x>2/3. Row chooses x=1 whenever 4y+(1-y)>3(1-y)  $\Leftrightarrow$  6y>2  $\Leftrightarrow$  y>1/3.

# **Plotting Best-Response Functions**

Best-responses are now:  $B_i(\sigma_{-i}) = \{ \sigma_i \in \Delta(S_i) \mid U_i(\sigma_i, \sigma_{-i}) \geq U_i(\sigma'_i, \sigma_{-i}), \ \forall \sigma'_i \in \Delta(S_i) \}.$ 



- Plot functions for Battle of the Sexes.
- Equilibria occur where  $\sigma_i \in B_i(\sigma_{-i}), \ \forall i$ .
- Two pure equilibria: x=y=1 and x=y=0.
- One mixed equilibrium:  $x = \frac{2}{3}$  and  $y = \frac{1}{3}$ .
- Three equilibria: An odd number...
- Generically, odd numbers of equilibria.

Note that, in mixed extensions of finite games, the best-response functions will be continuous. Hence they must always intersect: a "fixed point" theorem yields existence of Nash equilibrium.

# **Dominance and Mixed Strategies**

In the following game, no strategy is strictly dominated by another pure strategy:

|   | L    | M    | R    |
|---|------|------|------|
| T | 4 10 | 3 0  | 1 3  |
| B | 0 0  | 2 10 | 10 3 |

Suppose column plays L with probability  $\frac{1}{2}$  and M with probability  $\frac{1}{2}$ , so that  $\sigma_C = (\frac{1}{2}, \frac{1}{2}, 0)$ .

 $U_C(\sigma_C, \sigma_R) = 5$ , whatever row plays (for all  $\sigma_R$ ). This is better than a payoff of 3 from playing R.

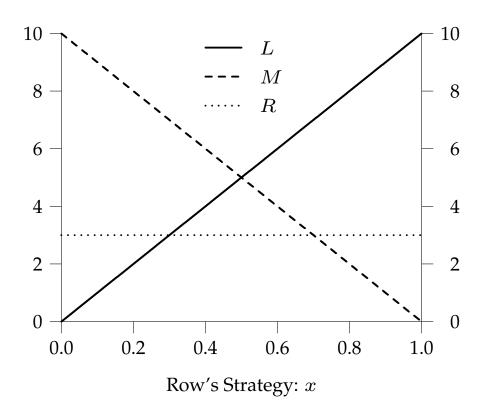
R is strictly dominated by a mixed strategy placing probability  $\frac{1}{2}$  on L and M, and therefore:

A single strategy profile survives iterated deletion of strictly dominated strategies:  $\{T, L\}$ .

#### **Never-Best-Responses**

 $T \quad (x)$   $B \quad (1-x)$  Column's Payoff

| L    | M       | R    |
|------|---------|------|
| 4 10 | 3 0     | 1 3  |
| 0 0  | 2 10    | 10 3 |
| 10x  | 10(1-x) | 3    |

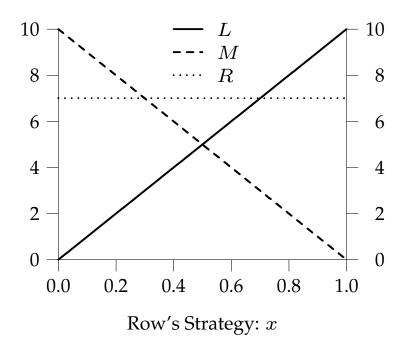


- Plot column's payoffs to each strategy.
- Irrespective of the value of the belief x, R is never-a-best-response.
- In fact, a strategy is strictly dominated if and only if it is never-a-best-response.
- Rational players would always play a best response given some beliefs.
- The equilibrium is at  $\{T, L\}$ .

#### **Dominated Mixed Strategies**

A mixed strategy with positive weight on a strictly dominated pure strategy is strictly dominated. But a mixed can be dominated by a pure even if all strategies in its support are undominated.

|   | $L \hspace{1cm} M$ |      | R   |  |
|---|--------------------|------|-----|--|
| T | 3 10               | 0 0  | 1 7 |  |
| B | 0 0                | 3 10 | 1 7 |  |



- Plot column's payoffs to each strategy. x is the weight attached to T by row.
- Note that neither the pure strategy L nor M is strictly dominated by R.
- The strategy which places probability  $\frac{1}{2}$  on each of L and M earns 5.
- This *is* strictly dominated by *R*.
- Nash:  $\{T, L\}$ ,  $\{B, M\}$ ,  $\{x \in [\frac{3}{10}, \frac{7}{10}], R\}$ .

#### A Return to Rationalisability

|   | L    | M    | R    |
|---|------|------|------|
| T | 4 10 | 3 0  | 1 3  |
| B | 0 0  | 2 10 | 10 3 |

Only T and L are rationalisable. Consider R: Not rationalisable as there is no belief such that R would be a best response. Thus B is not rationalisable, row would need to believe R is to be played by column. Thus M is not rationalisable, as this requires column to believe that row will play B.

Restricting to pure strategies for a moment — no strategies are strictly dominated:

Rationalisable strategies ⊂ Iterated deletion of dominated strategies survivors.

Allowing for mixed strategies again, R is strictly dominated by a 50:50 mix over L and M. Then B is strictly dominated by T, and then M is strictly dominated by L. So now:

• Rationalisable strategies = Iterated deletion of dominated strategies survivors.

# Rationalisability and Dominance

Recall  $R = \times_{i \in N} R_i$  where  $R_i$  is the set of rationalisable strategies for player i, and A is the set that survives iterated deletion of dominated strategies. In textbooks, one often sees:

$$R \subseteq A$$
 and  $R = A$  if  $n = 2$ .

However, under the definition of rationalisability from the last lecture, R = A generally. Why?

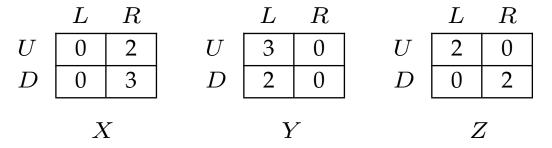
The classic definition (and the one most textbooks follow) restricts the kinds of beliefs players can have about their opponents' play. In particular, opponents must mix *independently*.

Here, a player can rationalise a strategy based on a belief which requires opponents to *correlate* their strategies. An example (might) help to enlighten. Row, column, and matrix player...

|   | L |          |                                    |   |   |       | L | _ |
|---|---|----------|------------------------------------|---|---|-------|---|---|
| U | 0 | 2        | ig  U                              | 3 | 0 | ig  U | 2 | 0 |
| D | 0 | 3        | $egin{array}{c} U \ D \end{array}$ | 2 | 0 | D     | 0 | 2 |
|   |   | <u> </u> |                                    | Y | 7 |       |   |   |

#### Rationalisability and Correlation

Is *Z* dominated? Is it rationalisable when beliefs are "independent"? When they can "correlate"?



Suppose row plays U with probability p, column plays L with probability q. For Z to be strictly dominated there must exist a (mixed) strategy  $\sigma_M$  which does strictly better for all p and q.

In particular,  $\sigma_M$  would have to do better than Z for p=q=1 and for p=q=0. Then:

$$3\sigma_M(X) + 2\left[1 - \sigma_M(X) - \sigma_M(Y)\right] > 2,$$

$$3\sigma_M(Y) + 2\left[1 - \sigma_M(X) - \sigma_M(Y)\right] > 2.$$

Which immediately yields a contradiction. Can Z be rationalised?

# **Independence and Correlation**

So *Z* survives iterated deletion of strictly dominated strategies. Is it rationalisable?

To what pair of *independent* mixed strategies is it a best response? None! Suppose it were a best response to the mixed strategy pair p (row plays U:  $\sigma_R(U) = p$ ) and q (i.e.  $\sigma_C(L) = q$ ). Then

$$2pq + 2(1-p)(1-q) > 3pq + 2(1-p)q$$
, and  $2pq + 2(1-p)(1-q) > 2p(1-q) + 3(1-p)(1-q)$ .

Some elementary algebra confirms that these inequalities are mutually inconsistent.

But Z is a best response to a belief that assigns probability  $\frac{1}{2}$  to  $\{U, L\}$  and probability  $\frac{1}{2}$  to  $\{D, R\}$ . Is such a belief *rational*? Some say no...some say yes...why should correlated play be ruled out?

#### **Information Partitions**

A mixed strategy might be interpreted as a pure strategy of an extended game in which a player receives a private, independently distributed signal, and conditions behaviour upon this signal. e.g. in matching pennies, toss a coin and play H if it comes up heads and T if it comes up tails.

What if these signals were not independent, but rather (possibly imperfectly) correlated?

A "state of nature" is  $\omega \in \Omega$ . The probability of  $\omega$  occurring is  $\pi(\omega)$ . Hence  $\sum_{\omega \in \Omega} \pi(\omega) = 1$ .

An information partition  $\mathcal{P}_i$  for player  $i \in N$  is a partition of  $\Omega$ . It has typical element  $P_i \in \mathcal{P}_i$ .

e.g. 
$$\Omega = \{x, y, z\}, \quad \mathcal{P}_1 = \{\{x, y\}, z\}, \quad \mathcal{P}_2 = \{x, \{y, z\}\}.$$

So, for example, if the state is z player 1 knows this, but player 2 only knows it is either y or z. If the state is y player 1 knows it is either x or y and player 2 knows it is either y or z, etc.

So this would allow players to correlate their actions. A strategy tells each player what to do given their signal. e.g. if the coin-toss was publicly seen, both players might choose to play H if heads and T if tails (although this would be very bad for row player!)

# **Raising Payoffs by Correlating Actions**

Suppose 
$$\Omega = \{x, y, z\}$$
,  $\mathcal{P}_1 = \{\{x, y\}, z\}$ ,  $\mathcal{P}_2 = \{x, \{y, z\}\}$ , and  $\pi(x) = \pi(y) = \pi(z) = \frac{1}{3}$ .

Assign strategies for player 1 (row) as T if  $\{x, y\}$  is observed, and B if z is observed. Player 2 (column) plays L if  $\{y, z\}$  is observed and R if x is observed. Can player 1 do any better? No:

By playing T if  $\{x, y\}$  gets 4, playing B would yield 3.5 (the state is x with probability  $\frac{1}{2}$  and player 2 plays L, the state is y with probability  $\frac{1}{2}$  and 2 plays R). By playing B if z, gets 7, T yields 6.

Symmetrically, player 2 can do no better—this is a correlated equilibrium.

The second matrix illustrates what happens in each state. Each player gets 5 in equilibrium!

Note the symmetric mixed-strategy equilibrium, play T (and L) with probability  $\frac{2}{3}$ , yields  $4\frac{2}{3}$  to each player, whilst pure strategy equilibria yield 7 and 2 respectively.

### **Correlated Equilibrium**

Putting these ideas together yields the following formal definition.

**Definition 12.** A correlated equilibrium of a game  $\mathcal{G} = \langle N, \{S_i\}_{i \in N}, \{u_i\}_{i \in N} \rangle$  consists of:

- 1. Probability Space.  $(\Omega, \pi)$ . State space  $\Omega$  with probability measure  $\pi$ ,
- 2. Information Partition. Partition of  $\Omega$ ,  $\mathcal{P}_i$  for each player  $i \in N$ ,
- 3. Strategy.  $\beta_i : \Omega \mapsto S_i$  where  $\beta_i(\omega) = \beta_i(\omega')$  whenever  $\omega \in P_i$  and  $\omega' \in P_i$ , some  $P_i \in \mathcal{P}_i$ , such that, for all  $i \in N$ , and each strategy for  $i, \beta_i' : \Omega \mapsto S_i$ ,

$$\sum_{\omega \in \Omega} \pi(\omega) u_i(\beta_i(\omega), \beta_{-i}(\omega)) \ge \sum_{\omega \in \Omega} \pi(\omega) u_i(\beta_i'(\omega), \beta_{-i}(\omega)).$$

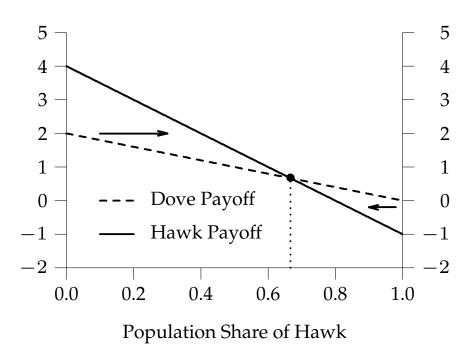
- Notice that the probability distribution, and the state space itself are endogenous.
- It is apparent that the set of correlated equilibria contains the set of Nash equilibria.

# **Evolutionary Games and Hawk-Dove**

Recall Hawk-Dove from the first lecture. It has a mixed equilibrium with  $\sigma_i(\text{Hawk}) = y = \frac{2}{3}$ .

|      | Hawk(y) | Dove $(1-y)$ |
|------|---------|--------------|
| Hawk | -1 $-1$ | 4 0          |
| Dove | 0 4     | 2 2          |

Row's Payoff 
$$4(1-y)-y$$
  $2(1-y)$ 



- Think of a population of players, each playing the game against the rest.
- e.g. if half the population are Hawks, Hawk yields  $1\frac{1}{2}$ , playing Dove yields 1.
- As before, plot payoffs against *y* (now the population proportion playing Hawk).
- If y is small, higher payoff from Hawk. Dove better when y is large.

Move in direction of higher payoff—mixed equilibrium is "evolutionarily stable".

# **Evolutionarily Stable Strategies**

To formalise this notion, consider a single population of agents playing a *symmetric* game  $\mathcal{G} = \langle \{1,2\}, \{\Delta(S), \Delta(S)\}, \{U_1, U_2\} \rangle$ , where  $U_1(\sigma, \sigma') = U_2(\sigma', \sigma) = U(\sigma, \sigma')$  for  $\sigma, \sigma' \in \Delta(S)$ .

A strategy is evolutionarily stable if a "small move away" from it (called a *mutation*) within the population results in pressure to "move back toward" it. That is,  $\sigma^*$  is evolutionarily stable if

$$(1 - \varepsilon)U(\sigma, \sigma^*) + \varepsilon U(\sigma, \sigma) < (1 - \varepsilon)U(\sigma^*, \sigma^*) + \varepsilon U(\sigma^*, \sigma).$$

In words: the payoff the "mutant" strategy  $\sigma$  gets in the mutated population is lower than the payoff the original strategy  $\sigma^*$  gets in the mutated population. Or equivalently:

**Definition 13.** An evolutionarily stable strategy (ESS) of  $\mathcal{G}$  is a  $\sigma^* \in \Delta(S)$  where

- 1.  $(\sigma^*, \sigma^*)$  is a Nash equilibrium and,
- 2.  $U(\sigma, \sigma) < U(\sigma^*, \sigma)$  for all  $\sigma \neq \sigma^*$  such that  $\sigma \in B(\sigma^*)$ .

Note that an ESS is always Nash, but the reverse is not true...

#### **ESS** in Hawk-Dove

In particular, only symmetric Nash-equilibrium strategies are candidates to be ESSs. It is straightforward to check that the symmetric mixed in Hawk Dove is an ESS.

|      | $\operatorname{Hawk}(y)$ | Dove $(1-y)$ |
|------|--------------------------|--------------|
| Hawk | -1 $-1$                  | 4 0          |
| Dove | 0 4                      | 2 2          |

Notice that  $U(\frac{2}{3},\frac{2}{3})=\frac{2}{3}$ , and that  $\sigma(\text{Hawk})=\frac{2}{3}$  constitutes a Nash equilibrium strategy. Now consider a mutation to Hawk. Checking condition 2,  $U(1,1)=-1<-\frac{2}{3}=U(\frac{2}{3},1)$ .

What about a mutation to Dove? Checking condition 2,  $U(0,0) = 2 < \frac{10}{3} = U(\frac{2}{3},0)$ . It is easy to check other mutations and conclude that  $\sigma(\text{Hawk}) = \frac{2}{3}$  is indeed an ESS.

- Does this provide a neat justification for mixed-strategy Nash equilibria?
- Note this definition is the *single* population version of ESS...
- Under the multiple-population definition, the Hawk-Dove mixed equilibrium is not stable.
- Also note that an ESS may not exist—consider Rock-Scissors-Paper...

#### **Rock-Scissors-Paper Revisited**

The unique mixed-strategy Nash equilibrium involves  $\sigma(R) = \sigma(S) = \sigma(P) = \frac{1}{3}$ . Is this an ESS?

|    | R        | S        | P        |
|----|----------|----------|----------|
| R  | 0        | -1       | <u>1</u> |
| 1ι | 0        | <u>1</u> | -1       |
| S  | <u>1</u> | 0        | -1       |
| D  | -1       | 0        | <u>1</u> |
| P  | -1       | <u>1</u> | 0        |
| 1  | <u>1</u> | -1       | 0        |

No! Playing R against R yields 0. Playing  $(\frac{1}{3}, \frac{1}{3}, \frac{1}{3})$  against R yields 0. Condition 2 fails.

To summarise: call E the set of equilibria with evolutionarily stable strategies. Then...

$$E \subseteq Z \subseteq R = A \subseteq \Delta(S)$$
.

If C is the set of correlated equilibria,  $Z \subseteq C$ . "=" is replaced by " $\subseteq$ " when the more common notion of rationalisability is used (the one here is sometimes called *correlated rationalisability*).