

# Further Solution Concepts

CMPUT 654: Modelling Human Strategic Behaviour

S&LB §3.4

# Recap: Pareto Optimality

**Definition:** Outcome  $o$  **Pareto dominates**  $o'$  if

1.  $\forall i \in N : o \succeq_i o'$ , and
2.  $\exists i \in N : o \succ_i o'$ .

Equivalently, **action profile**  $a$  Pareto dominates  $a'$  if  $u_i(a) \geq u_i(a')$  for all  $i \in N$  and  $u_i(a) > u_i(a')$  for some  $i \in N$ .

**Definition:** An outcome  $o^*$  is **Pareto optimal** if no other outcome Pareto dominates it.

# Recap: Best Response and Nash Equilibrium

## Definition:

The set of  $i$ 's **best responses** to a strategy profile  $s_{-i} \in S_{-i}$  is

$$BR_i(s_{-i}) \doteq \{s_i^* \in S_i \mid u_i(s_i^*, s_{-i}) \geq u_i(s_i, s_{-i}) \quad \forall s_i \in S_i\}$$

## Definition:

A strategy profile  $s \in S$  is a **Nash equilibrium** iff

$$\forall i \in N : s_i \in BR_{-i}(s_{-i})$$

- When at least one  $s_i$  is mixed,  $s$  is a **mixed strategy Nash equilibrium**
- When every  $s_i$  is deterministic,  $s$  is a **pure strategy Nash equilibrium**

# Lecture Outline

1. Recap & Logistics
2. Maxmin Strategies
3. Dominated Strategies
4. Rationalizability
5.  $\epsilon$ -Nash Equilibrium
6. Correlated Equilibrium

# Maxmin Strategies

## Question:

Why would an agent want to play a maxmin strategy?

What is the maximum amount that an agent can **guarantee** in expectation?

## Definition:

A **maxmin strategy** for  $i$  is a strategy  $\bar{s}_i$  that maximizes  $i$ 's worst-case payoff:

$$\bar{s}_i = \arg \max_{s_i \in S_i} \left[ \min_{s_{-i} \in S_{-i}} u_i(s_i, s_{-i}) \right]$$

## Definition:

The **maxmin value** of a game for  $i$  is the value  $\bar{v}_i$  guaranteed by a maxmin strategy:

$$\bar{v}_i = \max_{s_i \in S_i} \left[ \min_{s_{-i} \in S_{-i}} u_i(s_i, s_{-i}) \right]$$

# Minmax Strategies

## Question:

Why would an agent want to play a minmax strategy?

The corresponding strategy for the other player is the minmax strategy: the strategy that **minimizes the other player's** payoff.

**Definition:** (two-player games)

In a two-player game, the **minmax strategy** for player  $i$  against player  $-i$  is

$$s_i = \arg \min_{s_i \in S_i} \left[ \max_{s_{-i} \in S_{-i}} u_{-i}(s_i, s_{-i}) \right].$$

**Definition:** ( $n$ -player games)

In an  $n$ -player game, the **minmax strategy** for player  $i$  against player  $j \neq i$  is  $i$ 's component of the mixed strategy profile  $s_{(-j)}$  in the expression

$$s_{(-j)} = \arg \min_{s_{-j} \in S_{-j}} \left[ \max_{s_j \in S_j} u_j(s_j, s_{-j}) \right],$$

and the **minmax value** for player  $j$  is  $v_j = \min_{s_{-j} \in S_{-j}} \max_{s_j \in S_j} u_j(s_j, s_{-j})$ .

# Minimax Theorem

**Theorem:** [von Neumann, 1928]

In any finite, two-player, zero-sum game, in any Nash equilibrium  $s^* \in S$ , each player receives an expected utility  $v_i$  equal to both their maxmin and their minmax value.

# Minimax Theorem Proof

## Proof sketch:

1. Suppose that  $v_i < \bar{v}_i$ . But then  $i$  could guarantee a higher payoff by playing their maxmin strategy. So  $v_i \geq \bar{v}_i$ .
2.  $-i$ 's equilibrium payoff is  $v_{-i} = \max_{s_{-i}} u_{-i}(s_i^*, s_{-i})$ .
3. Equivalently,  $v_i = \min_{s_{-i}} u_i(s_i^*, s_{-i})$ . (**why?**)
4. So  $v_i = \min_{s_{-i}} u_i(s_i^*, s_{-i}) \leq \max_{s_i} \min_{s_{-i}} u_i(s_i, s_{-i}) = \bar{v}_i$ .
5. So  $\bar{v}_i \leq v_i \leq \bar{v}_i$ . ■

Zero-sum game, so

$$v_{-i} = -v_i$$

$$\max_{s_{-i}} u_{-i}(s_i^*, s_{-i}) = \max_{s_{-i}} -u_i(s_i^*, s_{-i})$$

$$\max_{s_{-i}} -u_i(s_i^*, s_{-i}) = -\min_{s_{-i}} u_i(s_i^*, s_{-i})$$



# Minimax Theorem Implications

In any **zero-sum** game:

1. Each player's maxmin value is equal to their minmax value.  
We call this the **value of the game**.
2. For both players, the maxmin strategies and the Nash equilibrium strategies are the same sets.
3. Any **maxmin strategy profile** (a profile in which both agents are playing maxmin strategies) is a Nash equilibrium. Therefore, each player gets the same payoff in every Nash equilibrium (namely, their value for the game).

**Corollary:** There is no **equilibrium selection** problem.

# Dominated Strategies

When can we say that one strategy is **definitely** better than another, from an **individual's** point of view?

**Definition:** (domination)

Let  $s_i, s'_i \in S_i$  be two of player  $i$ 's strategies. Then

1.  $s_i$  **strictly dominates**  $s'_i$  if  $\forall s_{-i} \in S_{-i} : u_i(s_i, s_{-i}) > u_i(s'_i, s_{-i})$ .
2.  $s_i$  **weakly dominates**  $s'_i$  if  $\forall s_{-i} \in S_{-i} : u_i(s_i, s_{-i}) \geq u_i(s'_i, s_{-i})$  and  $\exists s_{-i} \in S_{-i} : u_i(s_i, s_{-i}) > u_i(s'_i, s_{-i})$ .
3.  $s_i$  **very weakly dominates**  $s'_i$  if  $\forall s_{-i} \in S_{-i} : u_i(s_i, s_{-i}) \geq u_i(s'_i, s_{-i})$ .

# Dominant Strategies

## Definition:

A strategy is (strictly, weakly, very weakly) **dominant** if it (strictly, weakly, very weakly) dominates **every** other strategy.

## Definition:

A strategy is (strictly, weakly, very weakly) **dominated** if it is (strictly, weakly, very weakly) dominated by **some** other strategy.

## Definition:

A strategy profile in which every agent plays a (strictly, weakly, very weakly) dominant strategy is an **equilibrium in dominant strategies**.

## Questions:

1. Are **dominant strategies** guaranteed to exist?
2. What is the maximum number of **weakly** dominant strategies?
3. Is an equilibrium in dominant strategies also a **Nash equilibrium**?

# Prisoner's Dilemma again

	Coop.	Defect
Coop.	-1,-1	-5,0
Defect	0,-5	-3,-3

- *Defect* is a **strictly dominant** pure strategy in Prisoner's Dilemma.
  - *Cooperate* is **strictly dominated**.
- **Question:** Why would an agent want to play a **strictly dominant** strategy?
- **Question:** Why would an agent want to play a **strictly dominated** strategy?

# Battle of the Sofas

	Ballet	Soccer	Home
Ballet	2,1	0,0	1,0
Soccer	0,0	1,2	0,0
Home	0,0	0,1	1,1

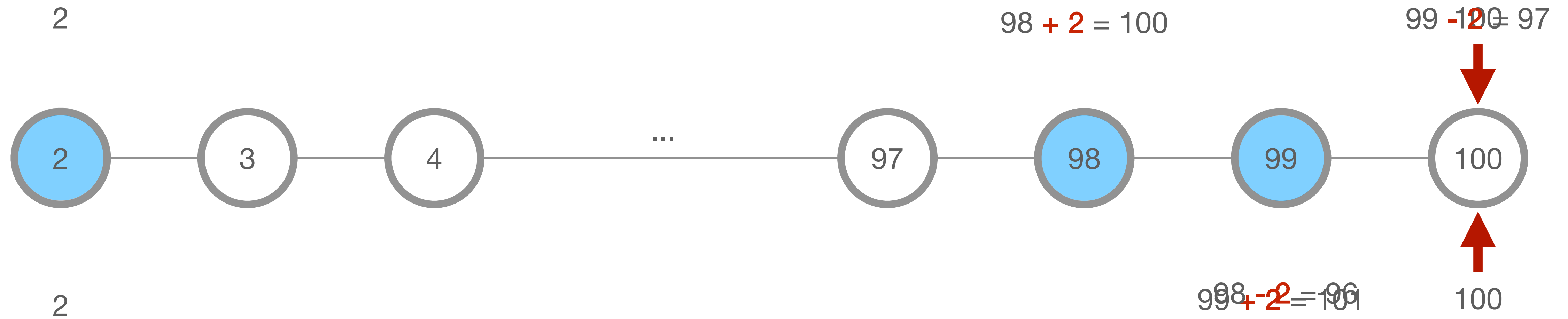
- What are the **dominated** strategies?
  - *Home* is a **weakly dominated** pure strategy in Battle of the Sofas.
- **Question:** Why would an agent want to play a **weakly dominated** strategy?

# Fun Game: Traveller's Dilemma



- Two players pick a number (2-100) simultaneously
- If they pick the same number  $x$ , then they both get  $\$x$  payoff
- If they pick different numbers:
  - Player who picked lower number gets **lower** number, plus **bonus** of \$2
  - Player who picked higher number gets **lower** number, minus **penalty** of \$2
- Play against someone near you, three times in total. Keep track of your payoffs!

# Traveller's Dilemma



- Traveller's Dilemma has a unique Nash equilibrium

# Iterated Removal of Dominated Strategies

- No **strictly dominated** pure strategy will ever be played by a fully rational agent.
- So we can remove them, and the game remains **strategically equivalent**
- But! Once you've removed a dominated strategy, another strategy that wasn't dominated before might **become dominated** in the new game.
  - It's safe to remove this newly-dominated action, because it's never a best response *to an action that the opponent would ever play*.
- You can repeat this process until there are no dominated actions left



# Iterated Removal of Dominated Strategies

	Ballet	Soccer	Home
Ballet	2,1	0,0	1,0
Soccer	0,0	1,2	0,0
Home	0,0	0,1	1,1

- Removing **strictly dominated** strategies preserves **all equilibria**. (**Why?**)
- Removing weakly or very weakly dominated strategies **may not** preserve **all equilibria**. (**Why?**)
- Removing weakly or very weakly dominated strategies preserves **at least one equilibrium**. (**Why?**)
  - But because not all equilibria are necessarily preserved, the **order** in which strategies are removed can **matter**.

	A	B	C	D
W				
X				
Y		○		
Z				

# Nash Equilibrium Beliefs

One characterization of Nash equilibrium:

1. **Rational behaviour:**

Agents maximize expected utility with respect to their beliefs.

2. **Rational expectations:**

Agents have **accurate** probabilistic beliefs about the behaviour of the other agents.

# Rationalizability

- We saw in the utility theory lecture that rational agents' **beliefs** need not be **objective** (or accurate)
- What strategies could possibly be played by:
  1. A **rational** player...
  2. ...with **common knowledge** of the rationality of **all players?**
- Any strategy that is a best response to **some beliefs consistent with** these two conditions is **rationalizable**.

## Questions:

1. What kind of strategy definitely could **not** be played by a rational player with common knowledge of rationality?
2. Is a rationalizable strategy guaranteed to exist?
3. Can a game have more than one rationalizable strategy?

# $\epsilon$ -Nash Equilibrium

- In a Nash equilibrium, agents best respond **perfectly**
- What if they are indifferent to **very small** gains in utility?
  - Could reflect modelling error (e.g., unmodelled cost of computational effort)

## **Definition:**

For any  $\epsilon > 0$ , a strategy profile  $s$  is an  **$\epsilon$ -Nash equilibrium** if, for all agents  $i$  and strategies  $s'_i \neq s_i$ ,

$$u_i(s_i, s_{-i}) \geq u_i(s'_i, s_{-i}) - \epsilon.$$

## **Questions:**

For a given  $\epsilon > 0$ ,

1. Is an  $\epsilon$ -Nash equilibrium guaranteed to **exist**?
2. Is **more than one**  $\epsilon$ -Nash equilibrium **guaranteed** to exist?

# $\epsilon$ -Nash Equilibrium Example

	L	R
U	1, 1	0, 0
D	$1+(\epsilon/2), 1$	500, 500

## Questions:

1. What are the **Nash equilibria** of this game?
2. What are the  **$\epsilon$ -Nash equilibria** of this game?

- Every Nash equilibrium is surrounded by a **region** of  $\epsilon$ -Nash equilibria
  - Every **numerical algorithm** for computing Nash equilibrium actually computes  $\epsilon$ -Nash equilibrium
- However, the reverse is not true! Payoffs from an  $\epsilon$ -Nash equilibrium can be **arbitrarily far** from Nash equilibrium payoffs.

# Correlated Equilibrium

## Examples

	Ballet	Soccer
Ballet	2, 1	0, 0
Soccer	0, 0	1, 2

	Go	Wait
Go	-10, -10	1, 0
Wait	0, 1	-1, -1

- In the unique mixed strategy equilibrium of Battle of the Sexes, each player gets a utility of  $2/3$
- If the players could first observe a coin flip, they could coordinate on **which** pure strategy equilibrium to play
  - Each would get utility of 1.5
  - **Fairer** than either pure strategy equilibrium, and **Pareto dominates** the mixed strategy equilibrium
- **Correlated equilibrium** is a solution concept in which agents get private, potentially-correlated **signals** before choosing their action
  - In both of these example, each agent sees the **same signal** perfectly, but that is not necessary in general

# Correlated Equilibrium

## Definition:

Given an  $n$ -agent game  $G = (N, A, u)$ , a **correlated equilibrium** is a tuple  $(\nu, \pi, \sigma)$ , where

$\nu = (\nu_1, \dots, \nu_n)$  is a tuple of random variables with domains  $(D_1, \dots, D_n)$ ,

$\pi$  is a joint distribution over  $\nu$ ,

$\sigma = (\sigma_1, \dots, \sigma_n)$  is a vector of mappings  $\sigma_i : D_i \rightarrow A_i$ , and

for every agent  $i$  and mapping  $\sigma' : D_i \rightarrow A_i$ ,

$$\sum_{d \in D_1 \times \dots \times D_n} \pi(d) u_i(\sigma_1(d_1), \dots, \sigma_n(d_n)) \geq \sum_{d \in D_1 \times \dots \times D_n} \pi(d) u_i(\sigma_1(d_1), \dots, \sigma'_i(d_i), \dots, \sigma_n(d_n))$$

**Question:** Why do the  $\sigma_i$ 's map to **pure strategies** instead of mixed strategies?

# Correlated Equilibrium Properties

## **Theorem:**

For every **Nash equilibrium**, there exists a corresponding correlated equilibrium in which each action profile appears with the same frequency.  
**(how?)**

## **Theorem:**

Any **convex combination** of correlated equilibrium payoffs can be realized in some correlated equilibrium. **(how?)**



# Correlated Equilibrium

## Another Example

	Ballet	Soccer
Ballet	2, 1	0, 0
Soccer	0, 0	1, 2

	Go	Wait
Go	-10, -10	1, 0
Wait	0, 1	-1, -1

- In our example correlated equilibria, each agent best-responded to the other **at every signal**
  - This is **not a requirement** of a correlated equilibrium
- Consider this correlated equilibrium, with  $D_1 = \{x, y, z\}$  and  $D_2 = \{m, r\}$ :

$$\begin{aligned} \pi[(x, m)] &= .25 & \sigma_r(x) &= X & \sigma_c(m) &= M \\ \pi[(y, m)] &= .25 & \sigma_r(y) &= Y & & \\ \pi[(z, r)] &= .5 & \sigma_r(z) &= Z & \sigma_c(r) &= R \end{aligned}$$

	L	M	R
X	0,8	3,6	-9,1
Y	0,2	3,9	-12,10
Z	1,0	0,-2	7,7

- Question:** Does the column player best-respond at each signal?
- Question:** What are the **marginal probabilities** for each player's actions?
- Question:** What would happen if the agents played **mixed strategies** with those marginal probabilities?

# Summary

- **Maxmin strategies** maximize an agent's **guaranteed payoff**
- **Minmax strategies** minimize the other agent's payoff as much as possible
- The **Minimax Theorem**:
  - Maxmin and minmax strategies are the **only** Nash equilibrium strategies in **zero-sum games**
  - Every Nash equilibrium in a zero-sum game has the **same payoff**
- **Dominated strategies** can be removed **iteratively** without strategically changing the game (too much)
- **Rationalizable** strategies are any that are a **best response** to some **rational belief**
- **$\epsilon$ -Nash equilibria**: stable when agents have no deviation that gains them more than  $\epsilon$
- **Correlated equilibria**: stable when agents have **signals** from a possibly-correlated randomizing device