

## REMOVAL OF DOMINATED ACTIONS

- ↳ Instead of reasoning on what agents would do, we take a "backward" approach and think about what they would ~~not~~ do:

### DOMINATION

Let's denote with  $\Sigma_{-i}$  the set of all  $\sigma_{-i}$

Given  $\sigma_i, \sigma'_i \in \Sigma_i$

- $\sigma_i$  STRICTLY DOMINATES  $\sigma'_i$  IFF

$$\forall \sigma_{-i} \in \Sigma_{-i} \quad u_i(\sigma_i, \sigma_{-i}) > u_i(\sigma'_i, \sigma_{-i})$$

- $\sigma_i$  WEAKLY DOMINATES  $\sigma'_i$  IFF

$$\forall \sigma_{-i} \in \Sigma_{-i} \quad u_i(\sigma_i, \sigma_{-i}) \geq u_i(\sigma'_i, \sigma_{-i})$$

$$\exists \sigma_{-i} \in \Sigma_{-i} \quad u_i(\sigma_i, \sigma_{-i}) > u_i(\sigma'_i, \sigma_{-i})$$

- $\sigma_i$  VERY WEAKLY DOMINATES  $\sigma'_i$  IFF

$$\forall \sigma_{-i} \in \Sigma_{-i} \quad u_i(\sigma_i, \sigma_{-i}) \geq u_i(\sigma'_i, \sigma_{-i})$$

DOMINANT STRATEGY: a strategy that dominates any other strategy  
(in one of the three flavors defined above)

- Dominant strategies are quite rare in reality
- If they exist, what should be expected from them?

One usually thinks that dominant strategies are also "good" in some sense: if I have a dominant strategy then it's better to play it.

Let's see this example (a very famous game in GT)

- 2 Criminals have been arrested
- the police can prove ~~nothing~~ a minor charge but not the major one
- Criminal are kept in separated rooms and offered the following bargain:

- BETRAY THE OTHER (Cooperate, C)
- STAY SILENT (S)

	S	C
S	-1, -1	-4, 0
C	0, -4	-3, -3

• Let's not already think about what we would do ---

• If you were an external, unbiased observer, what outcomes would you favor? (in pure strategies)

$$PE = \{(S, S); (C, S); (S, C)\}$$

• Let's see what happens when reasoning in dominant strategies

	S	C
S	-1, -1	-4, 0
C	0, -4	-3, -3

FOR PLAYER ① C STRICTLY DOMINATES S

FOR PLAYER ② IS THE SAME

→ DOMINANT STRATEGY

the dominant strategy makes us play the **\*ONLY\***   
 non Pareto-efficient outcome !!

Nevertheless, we can define a solution concept over this iterative   
 procedure we just used: **ITERATED DOMINANCE** (strict, weak, very weak)

→ iteratively removes from the game dominated actions

(it suffices to consider actions, since a dominated action   
 will never be played also in mixed strategies)

example:

		1		
		d	e	f
2	a	9, 3	10, 4	2, 2
	b	2, 1	1, 2	0, 15
	c	5, 6	4, 7	3, 9

IT IS NOT USEFUL TO   
 REMOVE DOMINATED   
 MIXED STRATEGIES

Solution: all  $\sigma$  such that  $\tilde{\sigma}_1(b) = 0$  and  $\tilde{\sigma}_2(d) = 0$

$$SID = \{ \sigma \mid \tilde{\sigma}_1(b) = \tilde{\sigma}_2(d) = 0 \}$$

Does the order of   
 elimination   
 count?

STRICT DOMINANCE: NO

WEAK AND VERY WEAK: YES

Let's discuss dominance from an algorithmic stance:

① DECIDE IF A STRATEGY  $\sigma_i$  IS (STRICTLY) DOMINATED BY A PURE STRATEGY  $a_i$

(Note that  $\sigma_i$  is, in general, mixed. Although it's not very useful to remove dominated mixed strategies, like we saw before, we here state the problem generally)

Simple algorithm: IS  $\sigma_i$  <sup>STRICTLY</sup> DOMINATED BY SOME  $a_i$ ?

FOR ALL  $a_{-i} \in A_{-i}$ ,  $a_i \neq \sigma_i$

dominated  $\leftarrow$  TRUE

FOR ALL  $a_{-i} \in A_{-i}$

IF  $u_i(\sigma_i, a_{-i}) \geq u_i(a_i, a_{-i})$

dominated  $\leftarrow$  FALSE

break;

RETURN dominated

runs in  $O(|A|)$   
(linear in the size of the game)

IS  $\sigma_i$  DOMINATED BY  $a_i$ ?



we saw how (in iterated dominance) it is convenient to consider \*pure\*  $\sigma_i$   
(if an action is dominated, then so is any  $\sigma_i$  that has that action in the support)

THE ALGORITHM IS COMPARING  $\sigma_i$  AND  $a_i$  CONSIDERING ONLY PURE STRATEGIES FOR THE OTHER PLAYERS ( $a_{-i} \in A_{-i}$ ). IS IT SAFE?

(The definition of dominance was stating the other way... considering mixed str.)

Let's formally prove this:

Given  $a_i, \sigma_i$

HP:  $\mu_i(a_i, a_{-i}) > \mu_i(\sigma_i, a_{-i}) \quad \forall a_{-i} \in A_{-i}$  (this is the condition that the algorithm checks)

TH:  $\mu_i(a_i, \sigma_{-i}) \leq \mu_i(\sigma_i, \sigma_{-i})$

If we prove TH the the algorithm is not sound because  
• the condition checked by the algorithm holds, so the algorithm will say " $a_i$  DOMINATES STRICTLY  $\sigma_i$ "

• Since TH holds  $a_i$  DOES NOT DOMINATE STRICTLY  $\sigma_i$



from TH:

$$\sum_{a_{-i}} \sigma_{-i}(a_{-i}) \mu_i(a_i, a_{-i}) \leq \sum_{a_{-i}} \sigma_{-i}(a_{-i}) \mu_i(\sigma_i, a_{-i})$$

then  $\exists a_{-i} \mu_i(a_i, a_{-i}) \leq \mu_i(\sigma_i, a_{-i})$

which contradicts the HP.

② DECIDE IF A STRATEGY  $\sigma_i$  IS (STRICTLY) DOMINATED BY A MIXED STRATEGY  $\sigma'_i$

We cannot use the enumeration here:

We can formulate a LINEAR FEASIBILITY PROGRAM:

Find a  $\sigma'_i$  such that:

$$\sum_{a_i \in A_i} \sigma'_i(a_i) u_i(a_i, a_{-i}) > u_i(\sigma_i, a_{-i}) \quad \forall a_{-i} \in A_{-i}$$

$$\sigma'_i(a_i) \geq 0 \quad \forall a_i \in A_i$$

$$\sum_{a_i \in A_i} \sigma'_i(a_i) = 1$$

No objective function, linear constraint.

A Linear Program can be solved in polynomial time.

There's only one problem: IT'S NOT A LINEAR PROGRAM!

Why? Short story: because of the strict inequality  $>$

In general a LP is:

$$\max w^T x$$

s.t.

$$Ax \leq b$$

$$x \geq 0$$

The good news is that we can still convert our problem as an LP with a "rather standard" trick

$$\min \sum_{a_i \in A_i} \sigma_i'(a_i)$$

s.t.

$$\sum_{a_i \in A_i} \sigma_i'(a_i) m_i(a_i, a_{-i}) \geq m_i(\sigma_i, a_{-i}) \quad \forall a_{-i} \in A_{-i}$$

$$\sigma_i'(a_i) \geq 0 \quad \forall a_i \in A_i$$

notice that in this problem:

this problem is always feasible

$$\sum_{a_i \in A_i} \sigma_i'(a_i) \langle \rangle = 1$$

WHY THIS WORKS?

- It's a minimization problem so at the optimum at least one of the  $\geq$  constraints should hold tight for one  $a_{-i}$

a  $\sigma_i'$  that strictly dominates  $\sigma_i$  exists IFF  $\text{OPT} < 1$

$\Rightarrow$  we can add positive probability and have the  $\geq$  constraint to hold as  $>$  for every  $a_{-i}$

Complexity:

SIMPLEX METHODS

- exponentially in the worst case
- efficient in practice

↳ SIMPLIFIED

INTERIOR POINTS METHOD

- Converge in  $P$  time
- sometimes outperform simplex

Simplex is still the most popular

### ③ ITERATIVE DOMINANCE

$M$  = number of players

$m$  = number of actions

need to solve  $O(Mm)$  linear programs

(each program has an exponential number of constraints  $m^M$ , but also the game is exp. in such dimension)



(there are games with non-exponential representations,  
Polymatrix games. We will see them if there is time)

Some questions about Iterated dominance:

	Strict dominance	Weak, Very weak dem.
CAN $G_i$ BE REDUCED WITH ITERATED DOMINANCE?		
CAN A GAME BE REDUCED TO A GAME WITH $A'_i \subseteq A_i$ FOR EACH PLAYER $i$ ?	P	NP-Complete
CAN A GAME BE REDUCED TO A GAME WHERE EACH PLAYER $i$ HAS $K_i$ ACTIONS		



The solution concept we saw so far are not very popular/interesting in game theory.

Let's see how they answer the question "How to play a game" a "How to solve a game"

PE: requires external point of view ... in some cases does not say anything (e.g., in zero sum games); "grand coalition" not the individual

DS: very rarely exists

ID: rarely solves a game, brings a trivial message actually (more useful to reduce the size of a game as we will see)

How can we get more insights on how a game will be played?

Let's do an experiment: PRISONERS' DILEMMA

		Tessie Pinkman	
		S	C
Inbetwe White	S	-1, -1	-4, 0
	C	0, -4	-3, -3

Suppose that you are one of these guys

You and the other guy have the same lawyer (Saul Goodman, for example)

Before deciding what to do you have a private hearing with your lawyer

Your lawyer is a TRUSTED GUY (People trust him)

He tells you: "STAY SILENT" → What you will do?

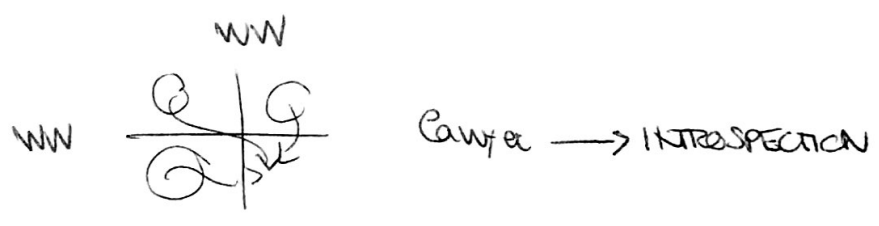
- 1) I trust my lawyer, so S
- 2) Wait a minute... the other guy is thinking the same!  $\rightarrow C$
- 3) " " "  $\rightarrow C$
- ...
- ...
- $\infty$  " " "

What if the lawyer suggests "cooperate with the police"

$\Rightarrow (C, C)$

$\Rightarrow$  The lawyer is not really a TRUSTED GUY

$(S, S)$  is something of an unsteady state: IF THE STRATEGY OF THE OTHER IS GIVEN THE PLAYER WANTS TO CHANGE HIS AND VICE VERSA!



This way of reasoning about a game based on the concept of steady state is the rationale behind the most popular selection concept in game theory: NASH EQUILIBRIUM (NE)

Let's formalize it by starting from the notion of best response

Best response of player  $i$ : Let's suppose that the other agents committed to play  $\sigma_{-i}$ , and that we know this.

→ WHAT'S THE BEST COURSE OF ACTIONS GIVEN SUCH KNOWLEDGE?

$$\sigma_i^* \in \Sigma_i \quad \text{s.t.} \quad u_i(\sigma_i^*, \sigma_{-i}) \geq u_i(\sigma_i, \sigma_{-i})$$

for any other  $\sigma_i \in \Sigma_i$

$$\rightarrow \sigma_i^* = \underset{\sigma_i}{\operatorname{argmax}} u_i(\sigma_i, \sigma_{-i})$$

Is the best response unique? NO! The agent can be indifferent between two or more actions:

KEY CONCEPTS: Suppose that  $\sigma_i^*$ ;  $S(\sigma_i^*) = \{a_1, a_2\}$

for example:

$$\sigma_i^*(a_1) = 0,7, \quad \sigma_i^*(a_2) = 0,3$$

The agent must be indifferent between  $a_1$  and  $a_2$

⇒  $a_1$  is a best response

$a_2$  is a best response

ANY MIXTURE BETWEEN  $a_1$  AND  $a_2$  IS A BEST RESPONSE

(e.g.,  $\sigma_i^*(a_1) = 0,5$   $\sigma_i^*(a_2) = 0,5$ )

NASH EQUILIBRIUM:

$\sigma = (\sigma_1, \sigma_2, \dots, \sigma_m)$  is a NE IF FOR ALL  $i$   $\sigma_i$  IS A BR TO  $\sigma_{-i}$

Given the strategy of the others, no agent has a unilateral incentive to change his strategy.

strict Nash:

$$\forall i \quad u_i(\sigma_i, \sigma_{-i}) > u_i(\sigma'_i, \sigma_{-i}) \quad \sigma'_i \neq \sigma_i \quad \text{unique best response}$$

Weak Nash:

$$\forall i \quad u_i(\sigma_i, \sigma_{-i}) \geq u_i(\sigma'_i, \sigma_{-i}) \quad \text{non unique best response}$$

(MIXED STRATEGY NE ARE WEAK) (PURE STRATEGY NE CAN BE WEAK OR STRICT)

Let's look again to our prisoners dilemma:

	S	C
S	-1, -1	-4, 0
C	0, -4	-3, -3

→ ONLY Pure NE (strict)

- Are NE Pareto efficient? In general, NO
- Iterated strict dominance preserves all Nash Equilibria
- Weak and very weak do not, but ....

Let's take another game:

	1, 1	2, 2	
			weak
			two pure NE
strict	3, 2	2, 1	

Ok, now let's take this one: MATCHING PENNIES

		H	T
i	H	1, -1	-1, 1
	T	-1, 1	1, -1

• How many pure Nash?  $\rightarrow$  None... (no strict NE possible)

• BTW, what do you think would be a good strategy to play this game?

$\rightarrow$  LET'S SUPPOSE THAT AN ORACLE TELLS US THAT PLAYERS WILL RANDOMIZE AT THE EQUILIBRIUM

$\Rightarrow$  Player  $i$  must be indifferent between H and T  
(necessary condition for randomization)

It means that:  $u_i(H) = u_i(T)$

$\Rightarrow$  w.l.o.g. Player  $j$  plays H with prob.  $p$  and T with  $(1-p)$

$$u_i(H) = p - (1-p) = 2p - 1$$

$$u_i(T) = -p + (1-p) = -2p + 1$$

$$2p - 1 = -2p + 1$$

$$4p = 2$$

$$\boxed{p = \frac{1}{2}}$$

In order to make player  $i$  indifferent between  $H$  and  $T$  player  $j$  must randomize  $(1/2, 1/2)$

$\Rightarrow$  BOTH PLAYERS RANDOMIZE  $(1/2, 1/2)$

$(1/2, 1/2)$  is not  $i$ 's unique BR! It's needed to have THE OTHER RANDOMIZE AS WELL

$\downarrow$  This is a NE (Weak) in mixed strategies

Sometimes a NE "makes sense" to us, just like in matching pennies

Sometimes it doesn't: in prisoners dilemma the unique, strict NE is the only outcome which is not Pareto efficient



THE REASON IS ACTUALLY THIS: PE DOES NOT IMPLY NE AND NE DOES NOT IMPLY PE!

You can verify that in the battle of the sexes game:

$(2, 1)$	$0, 0$
$0, 0$	$(1, 2)$

each player plays her "favorite show" with  $P=2/3$  and the other with  $P=1/3$

there are also two strict NE in pure strategies

BE CAREFUL! This simple procedure for computing NE in mixed strategies was very simple only because:

- We have two players
- We knew the equilibrium supports
- each player has only two actions

Step, we were able to find a mixed NE! Was this by chance? NO

**BIGGEST CENTRAL RESULT IN GAME THEORY:**

Any game with finite number of players and actions admits at least one Nash Equilibrium (we must admit mixed strategies)

[John Nash, 1950]

Some remarks:

• We saw this game has multiple NE

2, 1	0, 0
0, 0	1, 2

• Same holds for the "chicken game"  $\begin{matrix} T & W \\ W & (2, 1) \\ (1, 2) & 0, 0 \end{matrix}$  (NE in 1/2 1/2)



What to do when we have multiple NE?

1) Our analysis is still worth something: we know what the possible rational outcome are

• 2) But what the players are going to do??



EQUILIBRIUM SELECTION PROBLEM: a mechanism that induces the players to "expect" the same equilibrium

→ many theories ... one example: focal points

WE NEED TO GO TO LUNCH TOGETHER

	men entrance	room 5
men entrance	1, 1	0, 0
room 5	0, 0	1, 1

WE NEED TO MEET AT THE SAME TIME

	12:00 pm	11:53
12:00 pm	1, 1	0, 0
11:53	0, 0	1, 1

the "local" feature is abstracted away from the game but happens in real-life scenarios.

• There are a number of REFINEMENTS of NE, but some that are worth mentioning

-  $\epsilon$ -NASH EQUILIBRIUM

a unilateral deviation happens only if a player has a gain in utility which is  $\geq \epsilon$  with  $\epsilon > 0$

(in standard Nash  $\epsilon = 0$  (weak))

(it always exists!)

- STRONG NASH EQUILIBRIUM

no group of agents can jointly deviate

→ IMPLIES PARETO EFFICIENCY

→ RATHER RARE

(careful: a NE can be both strong and weak!)

Before tackling the algorithmic aspects of computing NE, let's introduce another solution concept which, as we will see, has a very interesting relationship with NE: MAXMIN and MINMAX



Nash equilibrium describes "rationality" in strategic games in its more natural, basic way.

With maxim/minimax we study rationality but under two (very related) playing attitudes

- EXTREMELY CAUTIOUS BEHAVIOR ①
- EXTREMELY AGGRESSIVE BEHAVIOUR ②

[WE ASSUME 2-PLAYER GAMES]

① Assumes that a worst case will always happen and then wants to play in a way that mitigates at best the worst case

● IT IS A MAXMIN PLAYER: it plays a strategy that maximizes her worst case payoff. → She seeks the best worst case

MAXMIN STRATEGY:  $\operatorname{argmax}_{\sigma_i} \min_{\sigma_{-i}} u_i(\sigma_i, \sigma_{-i})$

MAXMIN VALUE FOR PLAYER  $i$ :  $\max_{\sigma_i} \min_{\sigma_{-i}} u_i(\sigma_i, \sigma_{-i}) = v_i$

● Reasoning in this way amounts to assume that the other player will try to harm/punish us without taking care of her own payoffs. The other player is assumed to be the extremely aggressive player ②, a "foolish player".

Is it reasonable to play in this way? Is it reasonable to be extremely cautious?

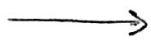
- NO! Why should the other guy be a "foolish player"?

but

● - YES! I can guarantee a utility of  $v_i$  without making any assumption about the other player

RATIONALITY  
+  
NO ASSUMPTIONS  
ON THE OPPONENT

MAXMIN



(equivalent to assume that  
the other guy is ②)

the maximin strategy is often called "security strategy" and  $v_i$  is often called "security level" of the game.

Let's take the side of player ②

②: is our "foolish" player, wants to guarantee a maximum punishment to the other, she seeks the worst best case for the other

IT IS A MINMAX PLAYER

MINMAX STRATEGY:  
(2-player games)  $\arg \min_{\sigma_i} \max_{\sigma_{-i}} u_i(\sigma_i, \sigma_{-i})$

MINMAX VALUE:  
(2-player games)  $\min_{\sigma_i} \max_{\sigma_{-i}} u_i(\sigma_i, \sigma_{-i}) = h_i$  (for the other!)

Maxmin and Minmax <sup>values</sup> always exist and are unique

• IN ANY 2-PLAYER GAME:

MAXMIN VALUE OF  $i$  = MINMAX VALUE OF  $i$

$$v_i = h_i$$

Why?