# Game Theory: introduction and applications to computer networks 

## Zero-Sum Games (follow-up)

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Part of the slides are based on a previous course with D. Figueiredo (UFRJ) and H. Zhang (Suffolk University)

## Saddle Points main theorem

$\square$ The game has a saddle point iff $\max _{v} \min _{w} u(v, w)=\min _{w} \max _{v} u(v, w)$

|  | Colin |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | A | B | D | $\mathrm{min}_{w}$ |
| A | 12 | -1 | 0 | -1 |
| B | 5 | 1 | -20 | -20 |
| c | 3 | 2 | 3 | 2 |
| D | -16 | 0 | 16 | -16 |
| max ${ }_{\text {v }}$ | 12 | 2 | 16 |  |

- Rose C $\varepsilon$ argmax $\min _{w} u(v, w)$ most cautious strategy for Rose: it secures the maximum worst case gain independently from Colin's action (the game maximin value)
- Colin $B \varepsilon \operatorname{argmin} \max _{v} u(v, w)$ most cautious strategy for Colin: it secures the minimum worst case loss (the game minimax value)


## Saddle Points main theorem

$\square$ Another formulation:

- The game has a saddle point iff maximin $=$ minimax ,
$\square$ This value is called the value of the game


## Saddle Points main theorem

$\square$ The game has a saddle point iff $\max _{v} \min _{w} u(v, w)=\min _{w} \max _{v} u(v, w)$
N.C.

Two preliminary remarks

1. It holds (always)
$\max _{v} \min _{w} u(v, w)<=\min _{w} \max _{v} u(v, w)$
because $\min _{w} u(v, w)<=u(v, w)<=$ max $_{v} u(v, w)$ for all $v$ and $w$
2. By definition, $(x, y)$ is a saddle point iff
o $u(x, y)<=u(x, w)$ for all w in $S_{\text {Colin }}$

- i.e. $u(x, y)=\min _{w} u(x, w)$
o $u(x, y)>=u(v, y)$ for all $v$ in $S_{\text {Rose }}$
- i.e. $u(x, y)=\max _{v} u(v, y)$


## Saddle Points main theorem

$\square$ The game has a saddle point iff $\max _{v} \min _{w} u(v, w)=\min _{w} \max _{v} u(v, w)$

1. $\max _{v} \min _{w} u(v, w)<=\min _{w} \max _{v} u(v, w)$
2. if $(x, y)$ is a saddle point
$\circ u(x, y)=\min _{w} u(x, w), \quad u(x, y)=\max _{v} u(v, y)$
N.C.
$u(x, y)=\min _{w} u(x, w)<=\max _{v} \min _{w} u(v, w)<=\min _{w} \max _{v} u(v, w)<=\max _{v} u(v, y)=u(x, y)$

## Saddle Points main theorem

$\square$ The game has a saddle point of $\max _{v} \min _{w} u(v, w)=\min _{w} \max _{v} u(v, w)$

## SC.

$x$ in $\operatorname{argmax} \min _{w} u(v, w)$
$y$ in argmin $\max _{v} u(v, w)$
We prove that $(x, y)$ is a saddle-point
$w_{0}$ in $\operatorname{argmin}_{w} u(x, w)\left(\max _{v} \min _{w} u(v, w)=u\left(x, w_{0}\right)\right)$
$v_{0}$ in $\operatorname{argmax}_{v} u(v, y)\left(\min _{w} \max _{v} u(v, w)=u\left(v_{0}, y\right)\right)$
$u\left(x, w_{0}\right)=\min _{w} u(x, w)<=u(x, y)<=\max _{v} u(v, y)=u\left(v_{0}, y\right)$


But $u\left(x, w_{0}\right)=u\left(v_{0}, y\right)$ by hypothesis, then
$u(x, y)=\min _{w} u(x, w)=\max _{v}(v, y)$

## Saddle Points main theorem

$\square$ The game has a saddle point iff $\max _{v} \min _{w} u(v, w)=\min _{w} \max _{v} u(v, w)$

|  | Colin |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | $A$ | $B$ | $D$ | $\min _{w}$ |
| $A$ | 12 | -1 | 0 | -1 |
|  |  |  |  |  |
|  | 5 | 1 | -20 | -20 |
|  | 3 | 2 | -3 | 2 |
|  | -16 | 0 | 16 | -16 |
| max $_{v}$ | 12 | 2 | 16 |  |

This result provides also another way to find saddle points

## Properties

$\square$ Given two saddle points $\left(x_{1}, y_{1}\right)$ and $\left(x_{2}, y_{2}\right)$,
o they have the same payoff (equivalence property):

- it follows from previous proof:

$$
u\left(x_{1}, y_{1}\right)=\max _{v} \min _{w} u(v, w)=u\left(x_{2}, y_{2}\right)
$$

o $\left(x_{1}, y_{2}\right)$ and $\left(x_{2}, y_{1}\right)$ are also saddle points(interchangeability property): $y_{1} \quad \mid \quad y_{2}$

- as in previous proof

They make saddle point a very nice solution!

| $y_{1}$ |  | $y_{2}$ |  |  |
| :---: | :--- | :--- | :--- | :--- |
|  |  |  |  |  |
|  |  |  |  |  |
| $x_{2}$ |  |  |  |  |
|  |  |  |  |  |
| $x_{1}$ | - | $<=$ |  |  |
|  |  |  |  | $\ddots$ |

## What is left?

$\square$ There are games with no saddle-point!
$\square$ An example?

|  | $R$ | $P$ | $S$ | $\min$ |
| :---: | :---: | :---: | :---: | :---: |
| $R$ | 0 | -1 | 1 | -1 |
| $P$ | 1 | 0 | -1 | -1 |
| $S$ | -1 | 1 | 0 | -1 |
| $\max$ | 1 | 1 | 1 |  |
| minimax |  |  |  |  |

maximin <> minimax

## What is left?

$\square$ There are games with no saddle-point!

- An example? An even simpler one



## Some practice: find all the saddle points

|  | $A$ | $B$ | $C$ | $D$ |
| :---: | :---: | :---: | :---: | :---: |
| $A$ | 3 | 2 | 4 | 2 |
| $B$ | 2 | 1 | 3 | 0 |
| $C$ | 2 | 2 | 2 | 2 |


|  | $A$ | $B$ | $C$ |
| :---: | :---: | :---: | :---: |
| $A$ | -2 | 0 | 4 |
| $B$ | 2 | 1 | 3 |
| $C$ | 3 | -1 | -2 |


|  | $A$ | $B$ | $C$ |
| :---: | :---: | :---: | :---: |
| $A$ | 4 | 3 | 8 |
| $B$ | 9 | 5 | 1 |
| $C$ | 2 | 7 | 6 |

## Games with no saddle points


$\square$ What should players do?
o resort to randomness to select strategies

## Mixed Strategies

$\square$ Each player associates a probability distribution over its set of strategies
$\square$ Expected value principle: maximize the expected payoff


Rose' s expected payoff when playing $A=1 / 3^{*} 2+2 / 3 * 0=2 / 3$ Rose's expected payoff when playing $B=1 / 3^{\star}-5+2 / 3^{*} 3=1 / 3$
$\square$ How should Colin choose its prob. distribution?
$2 \times 2$ game


Rose's exp. gain when playing $A=2 p+(1-p)^{*} 0=2 p$
Rose' s exp. gain when playing $B=-5^{\star} p+(1-p)^{\star} 3=3-8 p$
$\square$ How should Colin choose its prob. distribution?

- Rose cannot take advantage of $p=3 / 10$
- for $p=3 / 10$ Colin guarantees a loss of $3 / 5$, what about Rose' $s$ ?
$2 \times 2$ game Colin's expected loss


Colin's exp. loss when playing $A=2 q-5^{\star}(1-q)=7 q-5$
Colin's exp. loss when playing $B=0^{\star} q+3^{\star}(1-q)=3-3 q$

- How should Rose choose its prob. distribution?
- Colin cannot take advantage of $q=8 / 10$
- for $q=8 / 10$ Rose guarantees a gain of?
$2 \times 2$ game

$\square$ Rose playing the mixed strategy $(8 / 10,2 / 10)$ and Colin playing the mixed strategy $(3 / 10,7 / 10)$ is the equilibrium of the game
- No player has any incentives to change, because any other choice would allow the opponent to gain more
- Rose gain 3/5 and Colin loses 3/5
$m \times 2$ game

$\square$ By playing $p=3 / 10$, Colin guarantees max exp. loss $=3 / 5$
- it loses $3 / 5$ if Rose plays $A$ or $B$, it wins $13 / 5$ if Rose plays $C$
$\square$ Rose should not play strategy $C$
$m \times 2$ game
Colin's expected loss
 not less than 3/5


## Minimax Theorem

$\square$ Every two-person zero-sum game has a solution, i.e, there is a unique value $v$ (value of the game) and there are optimal (pure or mixed) strategies such that

- Rose's optimal strategy guarantees to her a payoff $>=v$ (no matter what Colin does)
- Colin's optimal strategies guarantees to him a payoff $<=v$ (no matter what Rose does)
$\square$ This solution can always be found as the solution of a kxk subgame
$\square$ Proved by John von Neumann in 1928!
o birth of game theory...


## How to solve mxm games

I if all the strategies are used at the equilibrium, the probability vector is such to make equivalent for the opponent all its strategies

- a linear system with $m-1$ equations and $m-1$ variables
- if it has no solution, then we need to look for smaller subgames


> Example:
> $\quad 2 x-5 y+3(1-x-y)=0 x+3 y-5(1-x-y)$
> $\quad 2 x-5 y+3(1-x-y)=1 x-2 y+3(1-x-y)$

## How to solve $2 \times 2$ games

$\square$ If the game has no saddle point
o calculate the absolute difference of the payoffs achievable with a strategy
o invert them
o normalize the values so that they become probabilities

Colin


## How to solve $m \times n$ matrix games

1. Eliminate dominated strategies
2. Look for saddle points (solution of $1 \times 1$ games), if found stop
3. Look for a solution of all the $h \times h$ games, with $h=\min \{m, n\}$, if found stop
4. Look for a solution of all the (h-1)x(h-1) games, if found stop
5. ...
$h+1$. Look for a solution of all the $2 \times 2$ games, if found stop
Remark: when a potential solution for a specific kxk game is found, it should be checked that Rose's m-k strategies not considered do not provide her a better outcome given Colin's mixed strategy, and that Colin's n-k strategies not considered do not provide him a better outcome given Rose's mixed strategy.

## Game Theory: introduction and applications to computer networks

## Two-person non zero-sum games

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## Outline

- Two-person zero-sum games
- Matrix games
- Pure strategy equilibria (dominance and saddle points), ch 2
- Mixed strategy equilibria, ch 3
- Game trees, ch 7
- Two-person non-zero-sum games
- Nash equilibria...
- ...And its limits (equivalence, interchangeability, Prisoner's dilemma), ch. 11 and 12
o Strategic games, ch. 14
- Subgame Perfect Nash Equilibria (not in the book)
- Repeated Games, partially in ch. 12
- Evolutionary games, ch. 15
$\square$ N-persons games


## Two-person Non-zero Sum Games

$\square$ Players are not strictly opposed
o payoff sum is non-zero

$\square$ Situations where interest is not directly opposed

- players could cooperate
o communication may play an important role
- for the moment assume no communication is possible

What do we keep from zero-sum games?
$\square$ Dominance
$\square$ Movement diagram
o pay attention to which payoffs have to be considered to decide movements

Player 2

$\square$ Enough to determine pure strategies equilibria

- but still there are some differences (see after)


## What can we keep from zero-sum games?

$\square$ As in zero-sum games, pure strategies equilibria do not always exist...

$\square$...but we can find mixed strategies equilibria

