

# Complexity of Nash Equilibrium

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# Outline

- 1 Complexity Recap
- 2 Nash
- 3 Reduction from Nash
- 4 Reduction to Nash

# Complexity Recap

## Definition (P)

The set of **decision** problems that can be solved in polynomial time by a **deterministic** Turing machine.  
e.g., is this list sorted?

## Definition (NP)

The set of **decision** problems that can be solved in polynomial time by a **non-deterministic** Turing machine.  
e.g., is this boolean formula satisfiable?

# Complexity Recap

## Definition (Reduction)

Transforming one problem into another (using a deterministic Turing machine).

$A \leq_P B$  means “Problem  $A$  can be solved using an algorithm for problem  $B$ , with polynomial additional cost.”

- $A \leq_P B$  and  $B \in NP$  implies  $A \in NP$ .

# Complexity Recap

## Definition ( $X$ -hard)

A problem is  $X$ -hard iff it is at least as hard as any problem in  $X$ .

- $A \leq_P B$  and  $A$  is NP-hard implies  $B$  is NP-hard.

## Definition ( $X$ -complete)

A problem is  $X$ -complete iff it is in  $X$  and  $X$ -hard.

- $A \leq_P B$ ,  $B \leq_P A$  and  $A$  is NP-complete implies  $B$  is NP-complete.

# Where does Nash fit in?

- As a **decision problem**, it's easy:  
Does this game have a Nash equilibrium? Yes!

# Where does Nash fit in?

- As a **decision problem**, it's easy:  
Does this game have a Nash equilibrium? Yes!
- Ask slightly more and it becomes NP-complete, e.g.,
  - Does this game have more than one Nash equilibrium?
  - Does this game have a Nash equilibrium equilibrium where action  $a_i$  is played with non-zero probability?
  - Does this game have a Nash equilibrium equilibrium where action  $a_i$  is played with zero probability?
- But what's the complexity of **finding** a Nash equilibrium?

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# Where does Nash fit in?

- What's the complexity of **finding** a Nash equilibrium?

## Definition (FNP)

The set of **function** problems that can be solved in polynomial time by a non-deterministic Turing machine.  
e.g., find a satisfying assignment for this boolean formula.

- $\epsilon$ -NASH  $\in$  FNP.

# Where does Nash fit in?

- What's the complexity of **finding** a Nash equilibrium?

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## Definition (FNP)

The set of **function** problems that can be solved in polynomial time by a non-deterministic Turing machine.  
e.g., find a satisfying assignment for this boolean formula.

- $\epsilon$ -NASH  $\in$  FNP.
- What's that  $\epsilon$  mean?
- Where did the  $\epsilon$  come from? Games with more than two players might not have any rational-valued Nash equilibrium.

# Where does Nash fit in?

## Definition (PPAD)

The set of function problems where a solution is guaranteed to exist, by a parity argument on a directed graph.

- $\text{PPAD} \subseteq \text{FNP}$ .

## Theorem (Daskalakis et al, Chen & Deng)

$\epsilon$ -Nash is PPAD-complete.

# Where does Nash fit in?

## Definition (PPAD)

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- $\text{PPAD} \subseteq \text{FNP}$ .

## Theorem (Daskalakis et al, Chen & Deng)

*$\epsilon$ -Nash is PPAD-complete.*

- Agenda:
  - Show  $\epsilon\text{-NASH} \leq_P \text{BROUWER}$  (PPAD-complete)  
i.e.,  $\epsilon\text{-NASH} \in \text{PPAD}$
  - Show  $\text{BROUWER} \leq_P \epsilon\text{-NASH}$   
i.e.,  $\epsilon\text{-NASH}$  is PPAD-hard.

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# Nash's Theorem " $\Rightarrow$ " NASH $\in$ PPAD

Nash



Brouwer

Kick Dive	Left	Right
Left	1, -1	-1, 1
Right	-1, 1	1, -1



$f: [0,1]^2 \rightarrow [0,1]^2$ , cont.  
such that  
fixed point  $\equiv$  Nash eq.

Penalty Shot Game

# Nash's Theorem " $\Rightarrow$ " NASH $\in$ PPAD

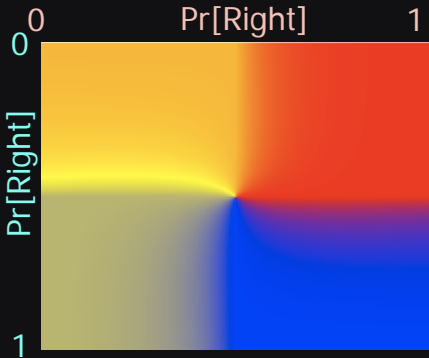
Nash



Brouwer

Kick \ Dive	Left	Right
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Penalty Shot Game





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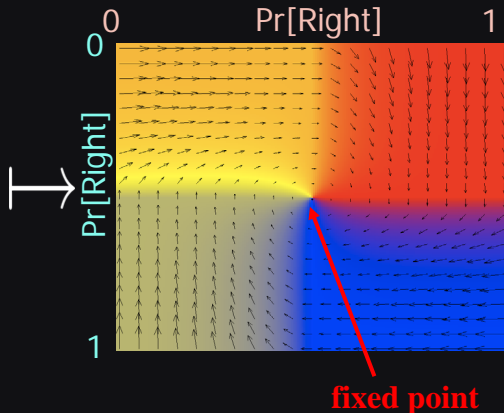
Nash



Brouwer

		$\frac{1}{2}$	$\frac{1}{2}$
	Kick	Left	Right
Dive			
$\frac{1}{2}$	Left	1, -1	-1, 1
$\frac{1}{2}$	Right	-1, 1	1, -1

Penalty Shot Game



Nash's Theorem " $\Rightarrow$ " NASH  $\in$  PPAD

**REAL PROOF**

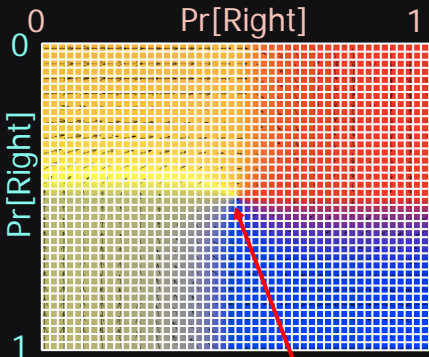
Nash



Brouwer

		$\frac{1}{2}$	$\frac{1}{2}$
	Kick	Left	Right
$\frac{1}{2}$	Dive		
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Penalty Shot Game



$\epsilon$ -fixed point

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# PPAD-Hardness of NASH [DGP '05]

Nash



Brouwer

game whose Nash equilibria are close to the fixed points of  $f$



$f: [0,1]^3 \rightarrow [0,1]^3$ ,  
continuous & p.w.linear

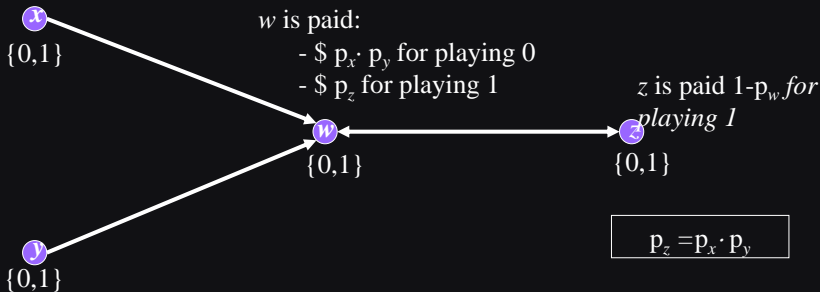
- *Game-gadgets*: games acting as arithmetic gates

# Games that do real arithmetic

e.g. multiplication game (*similarly addition, subtraction*)

two strategies per player, say  $\{0,1\}$ ;

➔ Mixed strategy  $\equiv$  a number in  $[0,1]$   
(probability of playing 1)



# Games that do real arithmetic

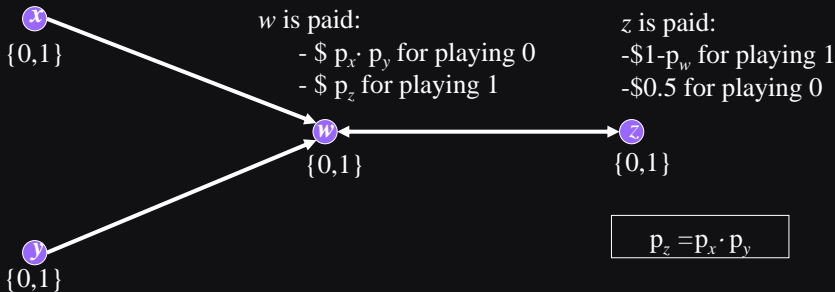
*w's payoff*

*for playing 0*

	y plays 0	y plays 1
x plays 0	0	0
x plays 1	0	1

*for playing 1*

z plays 0	0
z plays 1	1

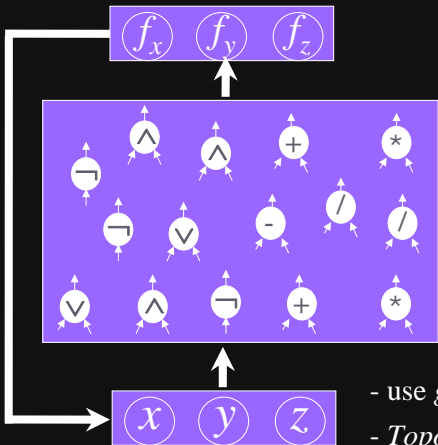


# PPAD-Hardness of NASH [DGP '05]

Nash



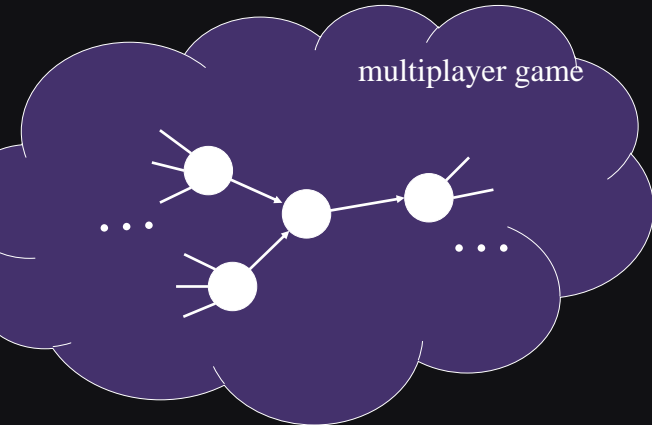
Brouwer



$f: [0,1]^3 \rightarrow [0,1]^3$ ,  
continuous & p.w.linear

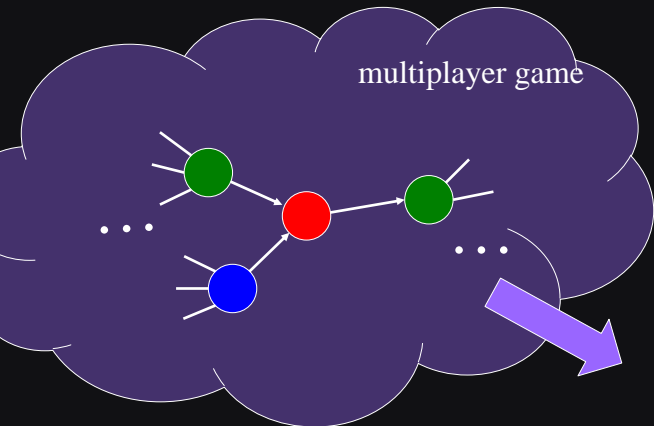
- use *game-gadgets* to simulate  $f$  with a game
- *Topology*: noise reduction

# Reduction to 3 players [Das, Pap '05]

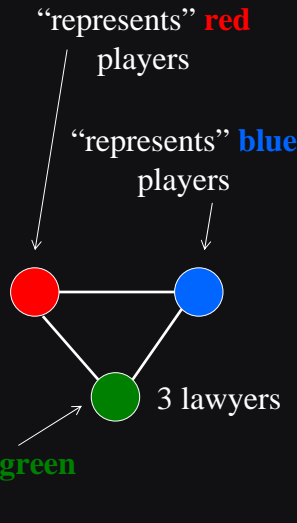




# Reduction to 3 players [Das, Pap '05]



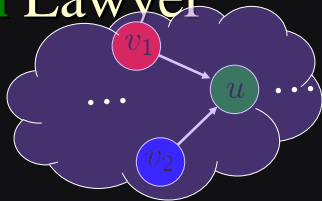
**Coloring:** no two nodes affecting one another, or affecting the same third player use the same color;



# Payoffs of the **Green Lawyer**



	$v_2 : 0$	$v_2 : 1$	$\neq v_2$
$v_1 : 0$	copy of the payoff table of node $u$		0
$v_1 : 1$	copy of the payoff table of node $u$		0
$\neq v_1$	0	0	0




payoffs of the **green** lawyer for representing node  $u$

*wishful thinking:* The Nash equilibrium of the lawyer-game, gives a Nash equilibrium of the original multiplayer game, after marginalizing with respect to individual nodes.

But why would a lawyer represent every node equally?

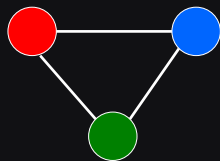
# Enforcing Fairness



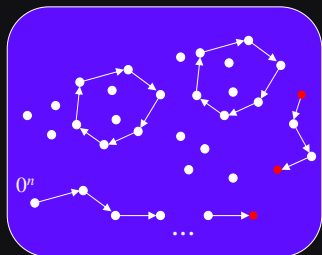
	$v_2 : 0$	$v_2 : 1$	$\neq v_2$	
$v_1 : 0$	copy of the payoff table of node $u$			0
$v_1 : 1$				0
$\neq v_1$	0	0	0	

lawyers play on the side a high-stakes game over the nodes they represent

+



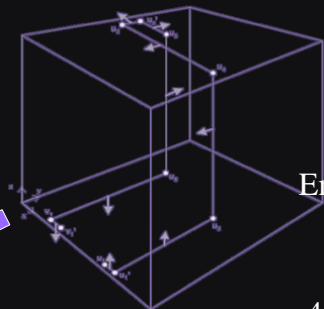
# PPAD-hardness of NASH



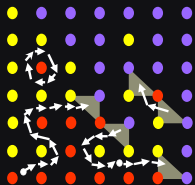
Generic PPAD

[DGP '05]

[Pap '94]  
[DGP '05]



Embedded  
PPAD



SPERNER

[DGP '05]



p.w. linear  
BROUWER

[DGP '05]



multi-player  
NASH

[DGP '05]

4-player  
NASH

[DP '05]  
[CD '05]

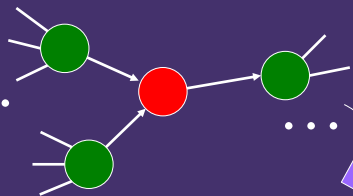
3-player  
NASH

[CD '05]

2-player  
NASH

# Reducing to 2 players [Chen, Deng '05]

multiplayer game



Based on the following simple, but crucial observation:

- the expected payoff of each lawyer is additive w.r.t. the nodes that another lawyer represents;
- hence, if two nodes affect the same third node, they don't need to have different colors.

**Coloring:** no two nodes affecting one another, ~~or affecting the same third player~~ use the same color;

two colors suffice to color the multiplayer game in the [DGP 05] construction

