

(guest lecture by Costis Daskalakis)

Recall:

- existence theorems: Nash, Brouwer, Sperner
- total NP search problems
- Parity Arguments in Directed graphs (PAD)
- PPAD = class of Problems reducible to:
- End of the Line
  - circuits P & N: maps on n-bit node ids
  - edge  $(v, w) \Leftrightarrow N(v) = w \wedge P(w) = v$
  - if given vertex is degree 1, find another
- Arithmetic Circuit SAT
  - circuit with cycles, no inputs, arbitrary fanout
  - total & PPAD-complete

Graphical games: [Kearns, Littman, Singh 2001]

- motivation: geographic/otherwise limited interaction
- players = nodes in a graph
- payoff depends only on your own & neighbors' strats.

Polymatrix games: [Janovskaya 1968]

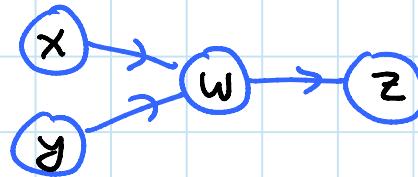
- graphical games with edge-wise separable utility functions:

$$U_{w,v}(x_v, x_w) = \mathbb{E}_{\substack{s_v \sim x_v \\ s_w \sim x_w}} U_{w,v}(s_v, s_w) = \sum_{s_v, s_w} U_{w,v}(s_v, s_w) \cdot x_v(s_v) \cdot x_w(s_w)$$

mixed strategies ↗

## PPAD-completeness of Nash: [Daskalakis, Goldberg]

- reduction from Arithmetic Circuit SAT Papadimitriou 2006]
- each player's strategy  $\in \{0, 1\}$
- $\Rightarrow$  mixed strategy  $\in [0, 1]$
- addition gadget:



- w paid expected
 
$$\begin{cases} \$ \Pr\{x:1\} + \Pr\{y:1\} & \text{if plays 0} \\ \$ \Pr\{z:1\} & \text{if plays 1} \end{cases}$$

via matrix

w:0	y:0	y:1	w:1	z:0	z:1
x:0	0	1		0	1
x:1	1	2			

- z is paid to play opposite of w:

$$u(z:0) = 0.5 \quad u(z:1) = 1 - \Pr\{w:1\}$$

$\Rightarrow$  in any Nash equilibrium:

$$\Pr\{z:1\} = \min \{ \Pr[x:1] + \Pr[y:1], 1 \}$$

$$-\Pr\{z:1\} < \min \{ \Pr[x:1] + \Pr[y:1], 1 \}$$

$$\Rightarrow \Pr[w:0] = 1$$

$$\Rightarrow \Pr[z:1] = 1 \quad \text{X contradiction}$$

$$-\Pr[z:1] > \Pr[x:1] + \Pr[y:1]$$

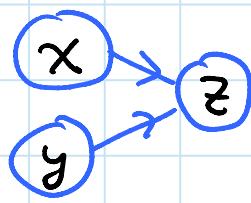
$$\Rightarrow \Pr[w:1] = 0$$

$$\Rightarrow \Pr[z:1] = 0 \quad \text{X contradiction}$$

- subtraction gadget: just change:

	y:0	y:1
x:0	0	-1
y:1	1	0

- comparison gadget:



$x:0$	$y:1$
0	1
$x:0$	$x:1$

$x:0$	$y:1$
0	1
$z:1$	

- $\Pr[x:1] > \Pr[y:1] \Rightarrow \Pr[z:1] = 1$
- etc.  $\rightarrow$  polymatrix game

$\Rightarrow$  Arithmetic Circuit SAT is total (via Nash theorem) with rational polynomial solution complexity solution

Polymatrix game  $\rightarrow$  2-player game: [Chen & Deng 2006]  
(almost in DGP 2006)

- make previous game bipartite
- one player ("lawyer") per color class
- strategies = union of vertices' strategies  
↳ pure

- payoffs only along edges of directed graphs
- hope: Nash equilibrium of lawyer game  
 $\Rightarrow$  marginal distributions are Nash equilibrium of polymatrix game
- but lawyers prefer to represent lucrative clients
- fix: additional high-stakes game
  - if red lawyer plays strategy for red vertex  $i$  & blue lawyer plays strategy for blue vertex  $j$  then - if  $i \neq j$  then both get \$0  $\xrightarrow{2n \cdot u_{\max}}$
  - if  $i = j$  then red gets  $+\infty$  & blue gets  $-\infty$
- $\Rightarrow$  lawyers uniformly choose which vertex to rep.

- game = sum of two games
- in any Nash equilibrium:
  - close to uniform on vertices:  $\forall u, v$
  - $x_u = \frac{1}{n}(1 \pm \frac{2u_{\max} n^2}{\infty})$ . ditto for  $y_v$
  - within vertex, payoff difference for red lawyer between  $u:i$  &  $u:j$  is  $\sum_v \sum_l (A_{i:l}^{(u,v)} - A_{j:l}^{(u,v)})$  (no  $\infty$ )
- $\Rightarrow$  if  $x_{u:i} > 0$  then  $\forall j: \sum_u \sum_l (A_{i:l}^{(u,v)} - A_{j:l}^{(u,v)}) \geq 0$
- define marginals  $\hat{x}_u(i) = \frac{x_{u:i}}{x_u}$  &  $\hat{y}_v(j) = \frac{y_{v:j}}{y_v}$
- get approximate Nash equilibrium  
(would be exact if uniform on players)
- set  $\infty$  large
- all these problems were hard to  $\epsilon$ -approximate

Easy 2-player Nash: payoff matrices R & C

- zero sum  $\Leftrightarrow R + C = \emptyset$
- polynomial time via LP
- rank r  $\Leftrightarrow R + C$  has rank r
- rank 1  $\Rightarrow$  poly. time
- rank 3  $\Rightarrow$  PPAD-complete [Mehta 2014]

OPEN:  $\epsilon$ -Nash:  $\leq$  additive  $\epsilon$  incentive for player to change

- no FPTAS
- quasi PTAS:  $n^{O(\frac{\log n}{\epsilon^2})}$  time

Not covered (but in slides): more PPAD reductions

- PPA: "if a graph has a node of odd degree then it must have another" (Handshaking Lemma)
- undirected version of PPAD
  - Odd Degree Node:
    - one circuit  $C: V \rightarrow$  sets of 2 vertices
    - edge  $(u, v) \Leftrightarrow v \in C(u) \wedge u \in C(v)$
    - $\Rightarrow$  max. degree 2
    - if given node has odd degree, find another one
    - PPA-complete
  - crucial here & in PPAD that we ask for some other vertex, not other end of same path  $\sim$  else not in FNP
  - Smith: given Hamiltonian cycle in 3-regular graph find another one
    - $\in$  PPA
    - $\rightarrow$  explicit
    - $\downarrow$  always exists [Smith]
    - [Thomason 1978]
  - OPEN: PPAD-complete?

PLS: "every directed acyclic graph has a sink"  
 [Johnson, Papadimitriou, Yannakakis 1989]

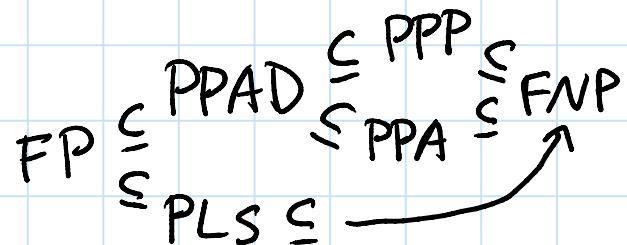
- FindSink:  $\rightarrow n\text{-bit node ids.}$ 
  - circuit  $C: V \rightarrow 2^V \rightarrow$  sets of vertices
  - circuit  $F: V \rightarrow \mathbb{R}$
  - edge  $(u, v) \Leftrightarrow v \in C(u) \wedge F(v) > F(u) \rightarrow$  DAG
  - goal: find a sink ( $x$  s.t.  $F(x) > F(v) \forall v$ )
- $\text{PLS} = \{\text{FNP problems reducible to FindSink}\}$
- Local Max Cut:
  - given a weighted graph
  - find a partition  $V = V_1 \cup V_2$  such that  
 can't move any one vertex  $V_1 \leftrightarrow V_2$   
 to increase size of cut  $E \cap (V_1 \times V_2)$
  - PLS-complete [Schaffer & Yannakakis 1991]
  - easy for unit/small weights

PPP: "if a function maps  $n$  elements to  $n-1$  slots,  
 then there is a collision" (Pigeonhole Principle)

$= \{\text{FNP problems reducible to Collision}\}$

- Collision: given circuit  $C: V \rightarrow V$ , find
  - ①  $x$  s.t.  $C(x) = 0^n$  OR ② find  $x \neq y$  s.t.  $C(x) = C(y)$

Relationships:



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Fall 2014

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