

(guest lecture by Costis Daskalakis)

PPAD: definition later – start with motivation

## Motivation 1: Economic Game Theory

### Game:

- n players 1, 2, ..., n
- for each player p: set  $S_p$  of strategies
- payoff for each player p:  
 $U_p: S_1 \times S_2 \times \dots \times S_n \rightarrow \mathbb{R}$
- e.g. Penalty Shot Game

Nash Equilibrium = locally optimal product distribution of strategies for the players such that no one player can (by changing just their strategy) improve their expected payoff

i.e.  $x_1, x_2, \dots, x_n$  such that  $\forall p$ :

$$E[U_p(x_1, \dots, x_p, \dots, x_n)] \geq E[U_p(x_1, \dots, x'_p, \dots, x_n)] \quad \forall x'_p \in D(S_p)$$

- e.g. 1/2 - 1/2 strategies in Penalty Shot Game
- exist in 2-player zero-sum games [von Neumann 1928]
  - via linear programming
- exist in n-player games [Nash 1950]
  - still no poly-time algorithm to find them

## Motivation 2: Brouwer's Fixed-Point Theorem

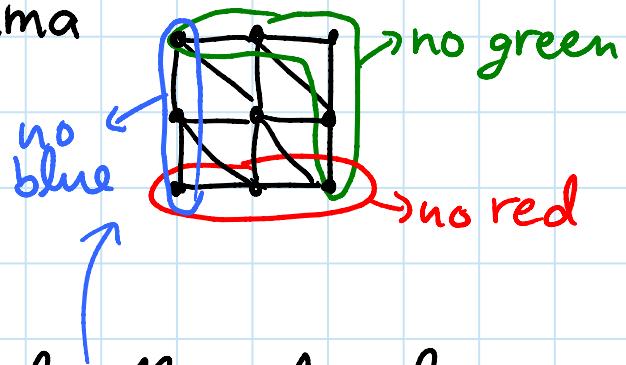
for any convex, closed, bounded set  $S$ ,  
any continuous map  $f: S \rightarrow S$  has a  
fixed point  $p \in S : f(p) = p$  [Brouwer 1910]

## Nash's proof via Brouwer's Theorem

- $f: [0,1]^n \rightarrow [0,1]^n$  is essentially a vector field indicating how each player can improve their mixed strategy (distribution)
- fixed point of  $f$  = Nash equilibrium

## Motivation 3: Sperner's Lemma

- square grid graph + backslash diagonals
- assign vertices 3 colors



2D version: if boundary is legally colored  
then there are an odd number ( $\Rightarrow \geq 1$ )  
of trichromatic  $\Delta$

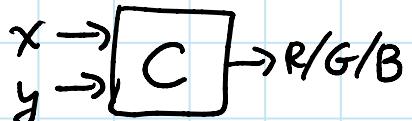
d-dimensional version too (not covered here)

## Proof of Brouwer via Sperner:

- for all  $\epsilon$ , show approximate fixed point:  
 $|f(x) - x| < \epsilon$  via Sperner's Lemma
  - color points according to direction of  $f(x) - x$   
(which of 3 boundaries)
- use compactness to take limit  $\epsilon \rightarrow 0$   
(may not preserve oddness of solution count)

## Computational version of Sperner:

- grid of size  $2^n \times 2^n$
- internal vertex colors given by circuit  $C$
- boundary in canonical legal coloring
- goal: find trichromatic  $\Delta$



## Computational version of Nash:

- given # players  $n$ , enumeration of strategy set  $S_p$  & utility function  $u_p: S \rightarrow \mathbb{R}$  of every player  $p$ .
- goal:  $\epsilon$ -Nash equilibrium
  - expected payoff can't improve by more than  $+\epsilon$
- avoids representation issue for irrational equilibria (required for e.g.  $n=3$  game)

*as in L15*

Search problem defined by relation  $R \subseteq \{0,1\}^* \times \{0,1\}^*$   
where  $(x,y) \in R$  means  $y$  is solution to  $x$

Total if  $\forall x \exists y : (x,y) \in R$  i.e. always  $\exists \geq 1$  solution

- e.g. Sperner & Nash & Brouwer

FNP = {NP search problems}

FNP-complete =  $\in \text{FNP}$  &  $\exists$  one-call (Karp) reduction  
from every problem  $\in \text{FNP}$

- impossible for total problems  
reducing from nontotal problem e.g. SAT

Complexity theory for total problems: (TFNP)

- identify combinatorial argument for existence proof
- define complexity class
- check tightness via completeness result

Proof of Sperner's Lemma:

- add artificial trichromatic  $\Delta$  at boundary
- define directed walk from that  $\Delta$ :  
keep crossing bichromatic edges with same 2 colors  
with same orientation (else find trichromatic  $\Delta$ )
- can't exit square by valid boundary coloring
- can't form a cycle (uncolorable)
- for odd number theorem: can walk from every  
other trichromatic  $\Delta$  to another  $\Rightarrow$  even #  
except for one from boundary

## Directed parity argument:

- vertices of graph represent  $\Delta$ s
- all vertices have in & out degrees  $\leq 1$
- $\Rightarrow$  graph = disjoint union of directed paths, cycles, & isolated vertices
- degree-1 vertex = trichromatic  $\Delta$
- degree-2 vertex = walkable (2 bichromatic edges with right orientation)
- degree-0 vertex = rest

Nonconstructive step: if there's an unbalanced vertex then there's another  $\text{in-deg.} \neq \text{out-deg.}$

## End of the Line:

- each vertex  $v$  has candidate incoming & outgoing edge  $P(v)$  &  $N(v)$ 
  - given as circuit:  $V \rightarrow V$   $\xrightarrow{\text{size } 2^n}$
- actual edge  $(v,w) \Leftrightarrow$  both ends agree:  
 $N(v)=w \wedge P(w)=v$
- goal: if  $0^n$  is unbalanced, find another unbalanced node  $\xrightarrow{\text{checkable in } O(n) \text{ time}} \text{(4 circuit evaluations)}$
- EFNP: certificate = another unbalanced node

PPAD = { search problems  $\in$  FNP reducible to  
End of the Line } [Papadimitriou 1994]

So: Nash  $\rightarrow$  Brouwer  $\rightarrow$  Sperner  $\rightarrow$  PPAD

In fact: Nash  $\leftarrow$  Brouwer  $\leftarrow$  Sperner  $\leftarrow$  PPAD

i.e. Nash, Brouwer, Sperner are PPAD-complete

[Papadimitriou 1994]

↳ [Daskalakis, Goldberg, Papadimitriou 2006]

- even for 2-player Nash [Chen & Deng 2006]

Proof sketch: generic PPAD

- embed graph in  $[0..1]^3$
- 3D Sperner
- Arithmetic Circuit SAT
- Nash

## Arithmetic Circuit SAT:

- input: variable nodes  $x_1, \dots, x_n \leftarrow$  in degree 1  
gate nodes  $\rightarrow := \rightarrow + \rightarrow \dots \leftarrow$  etc. in degree  $\in \{0, 1, 2\}$   
 cycles allowed

arbitrary out degrees

- goal: assignment of values  $\in [0, 1]$  to  $x_1, \dots, x_n$   
 satisfying all gate constraints:

$$- \textcircled{x} \rightarrow := \rightarrow \textcircled{y} \Rightarrow y = x$$

$$- \begin{matrix} \textcircled{x} \\ \textcircled{y} \end{matrix} \rightarrow + \rightarrow \textcircled{z} \Rightarrow z = x + y$$

$$\begin{matrix} \textcircled{x} \\ \textcircled{y} \end{matrix} \rightarrow - \rightarrow \textcircled{z}$$

ditto

$$- \textcircled{c} \rightarrow \textcircled{x} \Rightarrow x = c \quad \} \text{ for constant}$$

$$- \textcircled{x} \rightarrow \times c \rightarrow \textcircled{y} \Rightarrow y = c \cdot x \quad \} c \in [0, 1]$$

$$- \begin{matrix} \textcircled{x} \\ \textcircled{y} \end{matrix} \rightarrow > \rightarrow \textcircled{z} \Rightarrow z = \begin{cases} 0 & \text{if } x < y \\ 1 & \text{if } x > y \\ \text{arbitrary} & \text{if } x = y \end{cases}$$

↑ weird but necessary

- total: always a satisfying assignment  $\exists$

- PPAD-complete

not obvious

- improvement from exponential noise tolerance  
 $\rightarrow$  polynomial noise tolerance [Chen, Deng, Teng 2006]  
 $\hookrightarrow n^{-c}$  "Approximate Arith. Circuit SAT"

$\nearrow 2^{-cn}$

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## 6.890 Algorithmic Lower Bounds: Fun with Hardness Proofs

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