# How Hard is Competition for Rank? 

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## Easy and hard problems

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To prove problem $P$ is hard, take a problem $H$ that is already believed to be hard, and "efficiently encode" instances of $H$ in terms of $P$ so that the answer to $P$ tells you the answer to $H \ldots$

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Given a graph $G$ of indegree/outdegree at most 1, and a vertex of degree 1 , find another vertex of degree 1 . The catch is, $G$ 's edges are represented by boolean circuits that take any pair of endpoints in $\{0,1\}^{n}$ and output whether an edge is present between them.

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## This talk

- Some intuition on the hardness of unrestricted NE
- A class of games that appears to be "realistic" for which we so far have some positive results


## The "Dragons' Den" Game

Two entrepreneurs, Alice and Bob, want to raise £100,000 from a venture capitalist. Each of them may decide to spend $£ 2,000$ on image consulting. Alice has a better business idea, and the only way Bob will receive the investment is if he buys the image consulting and Alice does not.

Question: which of them will buy the image consulting?

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Question: which of them will buy the image consulting?
look for mixed (randomised) strategies; the problem becomes: compute the
 probabilities


Numbers are multiples of $£ 5,000$; assume it is worth $£ 50,000$ to win the investment.

## "Incentive direction" of the players

## Bob

don't spend
spend

spend

## Alice

don't spend
"Incentive direction" of the players

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don't spend spend

Alice
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## Nash equilibrium

Brouwer's fixpoint theorem: continuous functions from a compact domain to itself, have fixpoints. A non-constructive proof.

L.E.J. Brouwer (1881-1966)

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always exists a solution, provided that players may randomize (any number of players, any number of actions).


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But, how to compute the probabilities? We would like an "efficient algorithm". Next: how search for NE relates to search on large graphs


John Forbes Nash

## Bob

don't spend
spend

## Alice

## don't spend

"Incentive direction", colour-coded
Bob

## don't spend <br> spend

## Alice

## don't spend



Now, pretend this triangle is high-dimension domain


Search for "trichromatic triangles" at higher resolution...


## ...converges to Brouwer fixpoint



The corresponding graph


The corresponding graph


## From graph search to NE computation

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- Daskalakis, G and Papadimitriou (2005-6) show that games can also represent/encode a class of Brouwer functions which themselves encode END OF LINE graph search. Basically, solving a game is equivalent to finding your way around a very large graph, one that allows efficient local exploration and consists of long paths.


## From graph search to NE computation

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- 2-players (Chen, Deng and Teng '06); 2-players, 0/1-valued payoffs (Abbott, Kane and Valiant '05)

How to make a hard case of the problem


## coming back to "Dragons' Den"

(Current work with colleagues at Liverpool)

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## coming back to "Dragons' Den"

(Current work with colleagues at Liverpool)
What if there are

- more than 2 competitors?
- many choices per competitor?
- more than one "prize" for winning?


Players compete for rank.

## Competition for rank



## Competition for rank

- Who's Top Ten for their Subject University League Table 2010 2010
- University League ${ }_{\text {Published April 30th } 2009}$ Table Methelogy \& Create your own customised ranking, see the device below the main table.
Notes Compare Clear
- Universities by region
- University League Table 2009
- University League Table 2008
Web


To compare 2 or more universities, select the box next to the name and click Compare.
To create your own ranking see below


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| :--- | :--- |
| Notes |

$G$Notes
Universities by region

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recognised in the recent kesearch Assessment Exercises. Following a Grade 5 rating in 2001, 75\% of the Department's research activity was judged as $3^{*}$ or $4^{*}$ in 2008, putting it among the top 10 Computer Science departments in the country. All three research groups also won a best paper prize at a major conference in 2008.
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## Competition for rank


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Six-figure scholars Membership of $£ 100 \mathrm{~K}$ club is growing 6

Cut and thrust
Mandelson steadfast at memorial conference 8

Tainted by Climategate Unfair suspicion falls on other UEA research 11

Critical dialogue How to cultivate the Socratic spirit 38


## Competition for rank

## Telegraph co.uk



```
HOME \(>\) FINANCE \(>\) PERSONAL FINANCE
```


## Britain's quality of life worse than former Communist countries

Britain's has fallen to 25 th position on a list of best places in the world to live.

## Some background on ranking games

> "Ranking games" (Brandt, Fisher, Harrenstein and Shoham) each combination of strategies results in a ranking of the players; every player has a monotonically decreasing function from rank to utility.

Problem: unrestricted ranking games are still hard: a 3-player ranking game can easily encode an unrestricted 2-player 0/1 game.
(as noted earlier, hard to solve)
Our idea: assume strategies are correlated with "competitiveness"


Each player has his own function from effort to performance.

The model
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If a player plays $a_{j}$ and wins the $k$-th prize, his overall utility is $u_{k}-c_{j}$.

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## Observation

We can concisely represent games with many players/strategies, in contrast with unrestricted ranking games.

## Some results

We can pre-process a $d$-player game so as to assume that $u_{1}=1$ , $u_{d}=0$; all costs $c_{j}^{i}$ lie in range $[0,1]$; costs and returns are strictly monotonic in $j$, else we would have dominated actions; each player's weakest action has cost 0 .

## Theorem

Suppose there is just one prize ( $u_{1}>1 ; u_{j}=0$ for $\left.j>1\right)$. Suppose ties are impossible (if all $r_{j}^{i}$-values are distinct, or equivalently there is a tie-breaking rule).
Then there is just one player who gets positive payoff (all others get zero); namely the player who has the strongest action.

## Some results

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- Finally, we found precisely one player who can get positive payoff.

What if the strongest action has cost 1 ? What about $>1$ prizes?

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(So, that's like 2-player normal-form games! Is that interesting?)

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- $d$-players, $n$ actions, where $d$ is constant: Approximate NE can be found in poly-in- $n$ time by brute-force approach.
- FPTAS for $d$ players, 1 prize (in the paper, done for just 2 players) Dynamic programming approach


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So, we have reduced the game to a zero-sum polymatrix game, which is known to be solvable in poly-time (Daskalakis and Papadimitriou '09).

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- focus on "natural" types of more tractable games
- For these games, continue by looking for decentralised algorithms (a solution is implausible if it needs to be found centrally and then handed out to the players).
- Another direction: weaken the objective - "approximate equilibria" replace "no incentive for a player to change" with "only a small incentive to change" - an interesting and challenging problem, both for centralised and decentralised algorithms!

