

# Exploring complexity of social interactions

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# Motivations

models  $\longrightarrow$  **computations**  $\longrightarrow$  cognition

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Problem:

- ▶ taking computations more seriously
- ▶ underlying computations are often non-feasible

$\hookrightarrow$  e.g., DEL planning

Response:

- ▶ map the feasibility borders
- ▶ identify responsible parameters
- ▶ shifting focus to concrete epistemic tasks
- ▶ from agents' perspective

$\hookrightarrow$  cf. Van Ditmarsch

# Outline

Equilibria and Bounded Rationality

Manipulating Information

Epistemic Representations

Logical Omniscience

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## Finite Iterated Prisoners' Dilemma

	<i>Defect</i> <sub>2</sub>	<i>Cooperate</i> <sub>2</sub>
<i>Defect</i> <sub>1</sub>	1, 1	4, 0
<i>Cooperate</i> <sub>1</sub>	0, 4	3, 3

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*If players have sufficiently small memory then cooperate!*

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- ↔ c.c. considerations can vanquish some counterintuitive conclusions
- ↔ by modeling resource-bounded rationality
- ↔ linking to cognitive modeling

## Question

*Can c.c. provide new insights by linking economy with CogSci?*



Neyman. *Bounded complexity justifies cooperation in the finitely repeated prisoners' dilemma*, Economics Letters, 1985

# General Complexity of Finding Equilibria

## Theorem

*For general two-player game finding a Nash equilibrium is hard.*

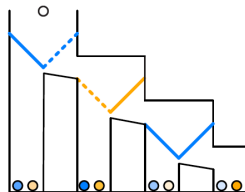
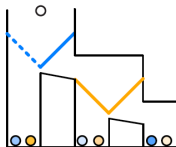
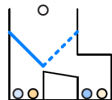
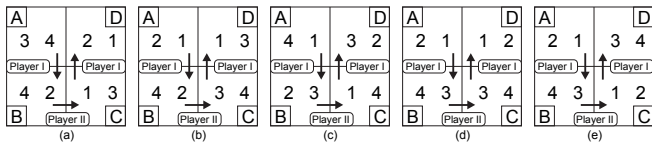
## Question

- ▶ *What about interesting games?*
- ▶ *What are the factors responsible for the complexity?*

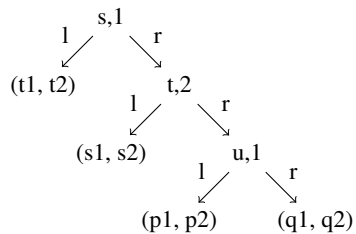


Daskalakis, Goldberg, Papadimitriou. *The complexity of computing a Nash equilibrium*, Communication ACM, 2009

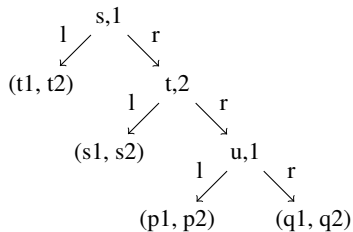
# Backward Induction and Higher-order Reasoning



## Logical analysis: MDG decision trees



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### Definition

$G$  is generic, if for each player, distinct end nodes have different pay-offs.



# What's the computational complexity?

## Definition

Let  $T$  be a two-player game. We define the backward induction accessibility relation on  $T$ . Let  $P_{bi}^T(x, y)$  be the smallest relation on vertices of  $T$  such that:

1.  $P_{bi}^T(x, x)$
2. Take  $i = 1, 2$ . Assume that  $x \in V_i$  and  $P_{bi}^T(z, y)$ . If the following two conditions hold, then also  $P_{bi}^T(x, y)$  holds:
  - 2.1  $E(x, z)$ ;
  - 2.2 there is no  $w, v$  such that  $E(x, w)$ ,  $P_{bi}^T(w, v)$ , and  $f_i(v) > f_i(y)$ .

$$\mathbb{BI} = \{T \mid P_{bi}^T(s, t)\}$$

## Theorem

$\mathbb{BI}$  is *PTIME-complete* via *first-order reductions*.



# What are the factors influencing complexity?

## Definition

Let's assume that the players strictly alternate in the game. Then:

1. In a  $\Lambda_1^i$  tree all the nodes are controlled by Player  $i$ .
2. In a  $\Lambda_k^i$  tree,  $k$ -alternations, starts with an  $i$ th Player node.

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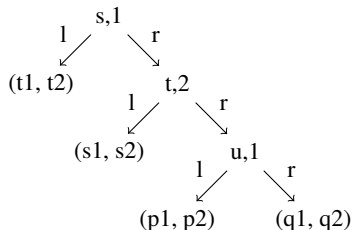


Figure :  $\Lambda_3^1$ -tree

## Conjecture

*For every  $i, j \in \{1, 2\}$ , the computational complexity of solving  $\Lambda_{k+1}^i$  graphs is greater than for all  $\Lambda_k^j$  graphs, and all  $\Lambda_k^i$  graphs are of the same complexity?*

- ↔ how higher-order reasoning links to computations?
- ↔ can c.c. analysis inform cognitive models?
- ↔ can c.c. help to identify rationality-obstacles?



van Benthem and Gheerbrant. Game solution, epistemic dynamics, and fixed-point logics, *Fundamenta Informaticae*, 2010



Szymanik, Meijering, Verbrugge. Using intrinsic complexity of turn-taking games to predict participants' reaction times, 35th *CogSci*, 2013

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## Reasoning about information



$$\Rightarrow \mathbf{M} = \langle W, (R_i)_{i \in N}, V \rangle$$

Case study to inquire how the complexity of various reasoning tasks is influenced by:

- ▶ choice of similarity notion for information states,
- ▶ choice of information structures,

# Information Similarity

Is everyone in the same state of mind in both situations?



## Theorem

1. *Kripke model isomorphism is 'hard'.*
2. *Multi-agent epistemic S5 model bisimilarity is P-complete*

# Inducing Information Similarity

Is it possible to give Lucy info that she's in the same state of mind as Schroeder?



## Theorem

1. For arbitrary Kripke models: NP-hard.
2. For S5: in linear time.



van Ditmarsch & French. Simulation and Information: Quantifying over epistemic events, KRAMAS, 2008



# Classification Problem

Problem	Tractable?	Comments
Kripke model isomorphism	unknown	in GI
Epistemic model bisimilarity	Yes	?? P-hard for $\geq 2$ agents
Flipped horizon bisimilarity	Yes	P-complete for arbitrary models
Kripke submodel bisimulation	No	NP-complete for arbitrary models; in linear time for S5
Local S5 submodel bisimulation	1 agent: Yes	unknown
Total S5 submodel bisimulation	1 agent: Yes	?? NP-complete for $\geq 2$ agents
Kripke submod. simulation (equiv.)	No	?? in P for single agent S5

?? indicates a conjecture



Dégremont, Kurzen, Szymanik Exploring the Tractability Border in Epistemic Tasks , Synthese, 2012

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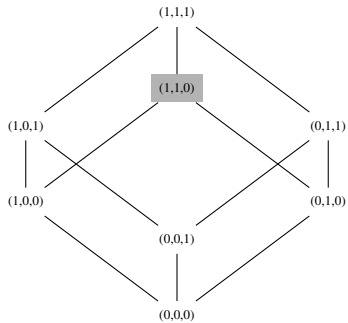
**Epistemic Representations**

Logical Omniscience

## Muddy Children

You are visiting a relative, who has three children. While you are having coffee in the living-room, the kids are playing outside. When they come back home, their father says: (1) 'At least one of you has mud on your forehead'. Then, he asks the children: (I) 'Can you tell for sure whether you have mud on your forehead? If yes, announce your status'. Children know that their father never lies and that they are all perfect logical reasoners. Each child can see the mud on others but cannot see his or her own forehead. Nothing happens. But after the father repeats the question for the second time suddenly all muddy children know that they have mud on their forehead. How is that possible?

# Epistemic Logic Representation



## More Succinct Representations

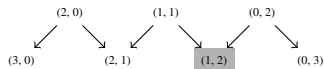
### Observation

*The scenario has two types of agents. Every clean child's observation is quantitatively equivalent to the observation of all other clean children. Similarly, every muddy child observes the same as all other muddy children.*

# More Succinct Representations

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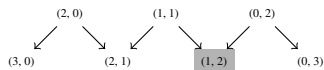
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↪ concise modeling of concrete epistemic scenarios

↪ agent's internal representation



Gierasimczuk & Szymanik. *A note on a generalization of the Muddy Children Puzzle*, TARK 2011



Wang. *Epistemic Modelling and Protocol Dynamics*, PhD ILLC 2010

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## Question

*Can we give some formal account of 'knowledge' able to accommodate people learning new things without leaving their armchairs?—Hintikka[1962]*

## Knowing Prime Numbers

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$$p' = \text{The first prime larger than } 2^{57885161} - 1$$

Why not? I'd say as we don't know any efficient algorithm that outputs  $p'$ .

## Procedural Knowledge

Internal algorithm by which you can **efficiently** answer a large (infinite?) set of **questions** in some form

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## Example

1. Do you know Dutch?
2. Do you know Texas Hold'em?
3. Do you know calculus?



Aaronson. *Why Philosophers Should Care About Computational Complexity*, 2012



# How does it help with logical omniscience?

## Question

*Can we give axiomatics for 'knowing how to compute efficiently'?*

## Example

If you know how to efficiently compute  $f$  and  $g$ , then you also efficiently know  $f + g$

# Cobham Axioms for FP

## Theorem

FP is the smallest class satisfying:

1. Every constant  $f$ . and every  $f$ . that is nonzero only finitely many times is in FP
2. If  $f(x), g(x) \in \text{FP}$  then  $\langle f(x), g(x) \rangle \in \text{FP}$
3. If  $f(x), g(x) \in \text{FP}$  then  $f(g(x)) \in \text{FP}$
4.  $+, \times \in \text{FP}$
5.  $|x|, \Pi_1, \Pi_2, \text{bit}(\langle x, i \rangle), \text{diff}(\langle x, i \rangle) \in \text{FP}$
6.  $2^{|x|^2}$
7. If  $f(x) \in \text{FP}$ , and for all  $x \in \mathbb{N}$ ,  $|f(x)| \leq |x|$ , then the function

$$g(\langle x, k \rangle) = \begin{cases} f(g(\langle x, \lfloor k/2 \rfloor \rangle)) & \text{if } k > 1 \\ x & \text{if } k = 1. \end{cases} \in \text{FP}$$

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## Theorem (Leivant 1994)

$f \in \text{FP}$  iff  $f$  is computed by a program that can be proved correct in SO with comprehension restricted to positive quantifier-free formulas.

## Knowing *How* and Knowing *That*

### Example

Do you know answer to the following questions:

1. Is  $1591 = 43 \times 37$ ?
2. What are the prime factors of 1591?

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- ↪ knowledge := agents' question answering capacities
- ↪ for infinite sets of related questions
- ↪ linking to procedural perspective in NL semantics, and
- ↪ learnability take on 'knowledge'



Stalnaker. *The problem of logical omniscience, I and II*, 1999

## Summing up

Complexity considerations may bring our models closer to cognition

# False-belief task and logic

*Mini workshop on formal modeling, December, 5, Amsterdam, 2013.*

<http://jakubszymanik.com/false-belief/>