

# Using the intrinsic complexity of turn-based games to predict participants' decision times

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joint work with Ben Meijering and Rineke Verbrugge

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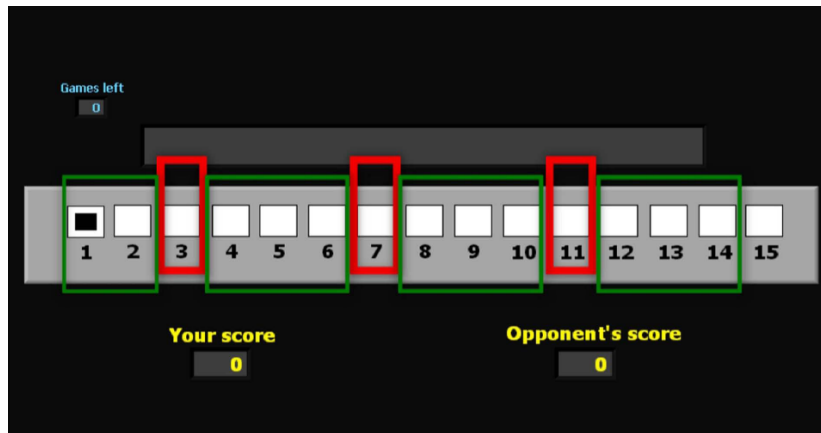
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4. Turn-based games have been extensively studied in psychology

# HIT-N Game



Gneezy et al. Experience and insight in the race game, 2010

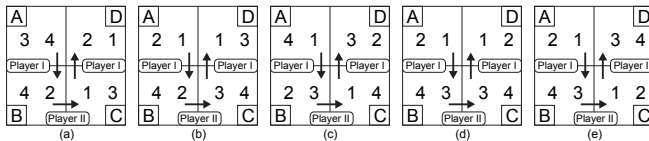


Hawes et al. Experience and abstract reasoning in learning backward induction, 2012

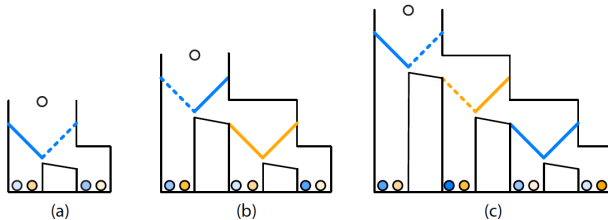
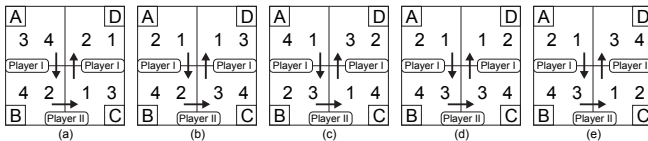
# Turn-based games



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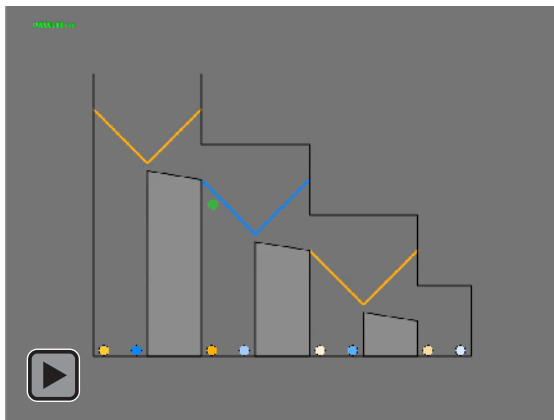


Hedden & Zhang What do you think I think you think?, 2002



Meijering et al., The facilitative effect of context on second-order social reasoning, 2010

# Subjects don't use BI

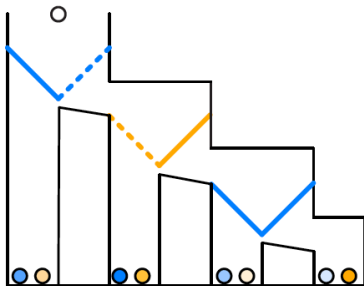


# Project

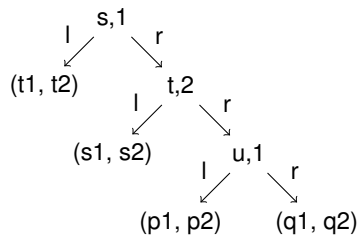
1. What is the complexity of the computational problem?
2. What makes certain trials harder than others?
3. What is the connection with logic?
4. What is the connection with game-theory?

↔ human reasoning strategies and bounded rationality

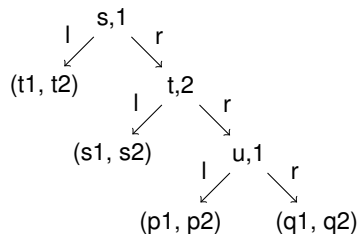
# Marble Drop Game



## Logical analysis: MDG decision trees



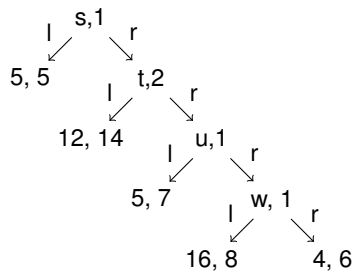
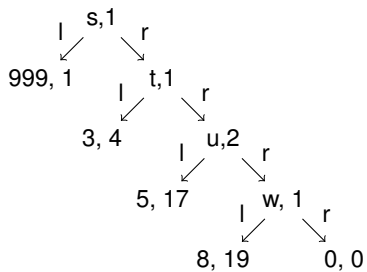
## Logical analysis: MDG decision trees



### Definition

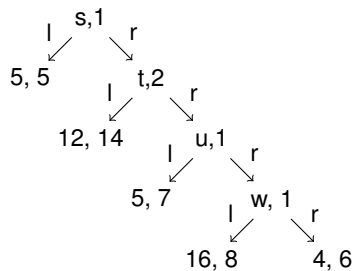
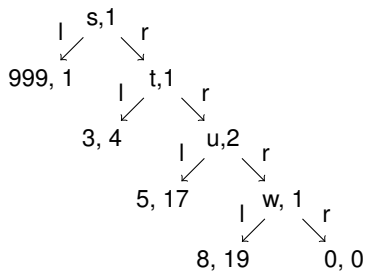
$G$  is generic, if for each player, distinct end nodes have different pay-offs.

# Pay-off structure



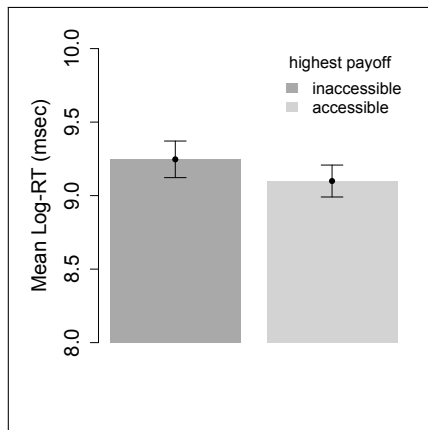


## Pay-off structure



Forward reasoning + backtracking is consistent with eye-tracking study.

## Forward Reasoning + Backtracking, FRB



## FRB is indeed rational

For an average random game with 3 decision points, the forward reasoning plus backtracking algorithm needs fewer computation steps to yield a correct solution than backward induction.

**Table :** Cross-table of payoff structures and the necessary number of steps when using forward reasoning with backtracking on all 576 possible experimental pay-off structures.

|                        |     |    |    |    |    |    |
|------------------------|-----|----|----|----|----|----|
| # of steps             | 1   | 2  | 4  | 5  | 6  | 8  |
| # of payoff structures | 288 | 72 | 48 | 56 | 16 | 96 |

On average: BI=6 and FRB=3

## Descriptive complexity: alternation type

### 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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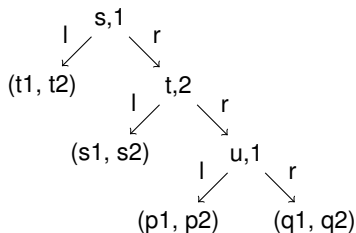


Figure :  $\Lambda_3^1$  -tree

Recall, ...

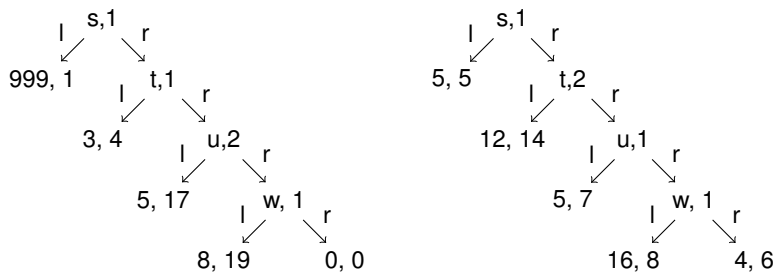


Figure : Two  $\Lambda_3^1$  trees.

# $T^-$ -example

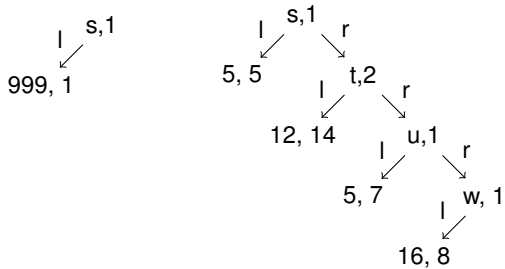


Figure :  $\Lambda_1^1$  tree and  $\Lambda_3^1$  tree

$T^-$

### Definition

If  $T$  is a generic game tree with the root node controlled by Player 1 (2) and  $n$  is the highest pay-off for Player 1 (2), then  $T^-$  is the minimal subtree of  $T$  containing the root node and the node with pay-off  $n$  for Player 1 (2).



# Conjecture

## Observation

*If  $T_1$  is accessible and  $T_2$  is inaccessible then  $T_1^- < T_2^-$ .*

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## Conjecture

*Let us take two MDG trials  $T_1$  and  $T_2$ .  $T_1$  is easier for participants than  $T_2$  if and only if  $T_1^-$  is lower in the tree alternation hierarchy than  $T_2^-$ .*

# FRB and structural complexity

## Hypothesis

*Let us take two MDG trials  $T_1$  and  $T_2$ . Forward reasoning plus backtracking yields a correct solution for  $T_1$  faster than  $T_2$  if and only if  $T_1^-$  is lower in the tree alternation hierarchy than  $T_2^-$ .*

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**Table :** Output of full-factorial linear mixed-effects model with factors Accessibility (A), Steps of forward reasoning with backtracking (FRB) applied to the subset of actually presented experimental games.

| Parameter     | Estimate  | St. Error | t-value | p-value |
|---------------|-----------|-----------|---------|---------|
| a) Accessible | -0.689147 | 0.271256  | -2.54   | .000    |
| b) FRB        | 0.008767  | 0.034930  | 0.25    | .418    |
| c) A:FRB      | 0.084336  | 0.037277  | 2.26    | .000    |

- ▶ FRB steps are a good predictor of RT.
- ▶ RT decreases for ‘accessible games’.
- ▶ No significant effect for ‘inaccessible games’.
- ▶ RT increases with each additional FRB step in ‘accessible games’.

## Summary of the results

- ▶ Structural properties responsible for the cognitive difficulty
- ▶ Results generalized to other turn-based games

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- ▶ Structural properties responsible for the cognitive difficulty
- ▶ Results generalized to other turn-based games
- ▶ FRB avoids higher-order reasoning
- ▶ FRB is computationally optimal

Thank you

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