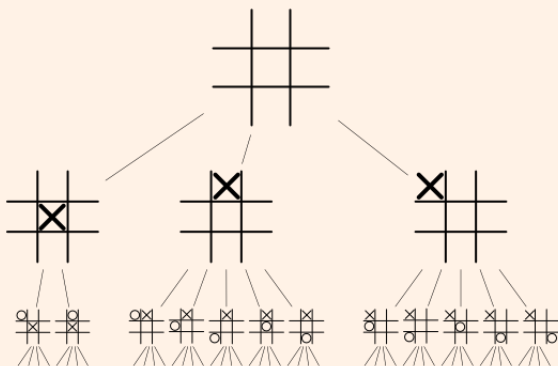


Simplifying Imperfect Recall Games

Hugo Gimbert LaBRI, CNRS, University of Bordeaux
Soumyajit Paul University of Liverpool
B. Srivathsan Chennai Mathematical Institute

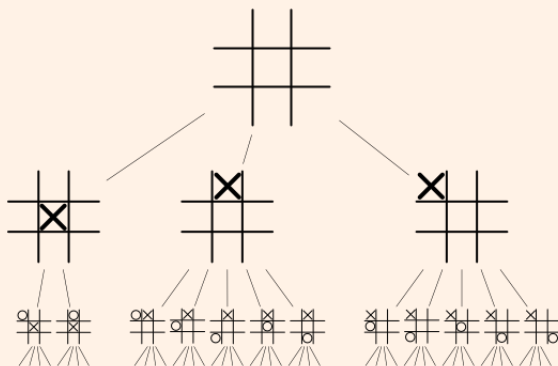


Perfect information games



State space of Tic Tac Toe

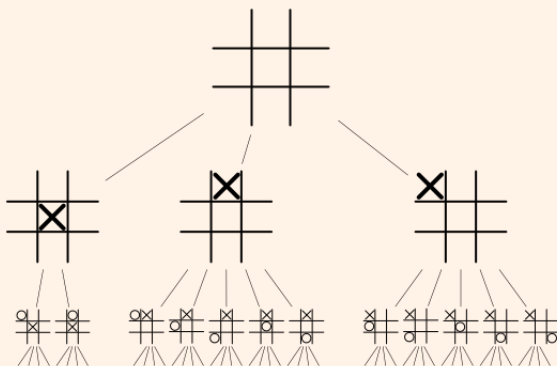
Perfect information games



State space of Tic Tac Toe

Players know their exact position in the state space

Perfect information games



State space of Tic Tac Toe

Players know their exact position in the state space

Perfect information games can be solved in PTIME using bottom-up traversal. [Zermelo'1913]

Few more perfect information games...



Chess

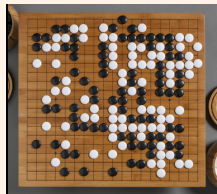


Go

Few more perfect information games...



Chess



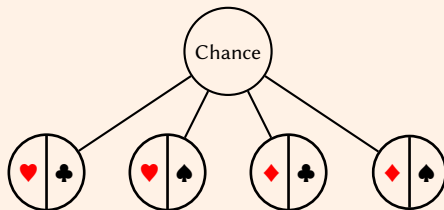
Go

Next : Games with imperfect information

Toy Card Game

Toy Card Game

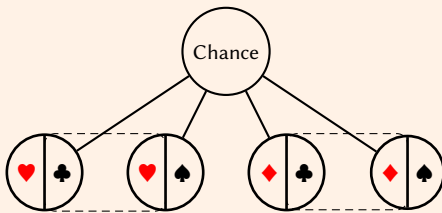
Players **Red** and **Black**, each gets a suit **privately** from ♥, ♣, ♦, ♠ matching player's color. **Red** plays first.



State space

Toy Card Game

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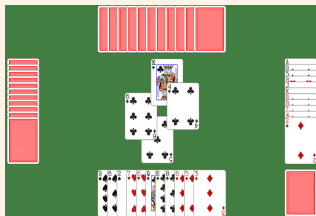
State space

Imperfect information : same knowledge in some states

Some games with imperfect information...



Poker

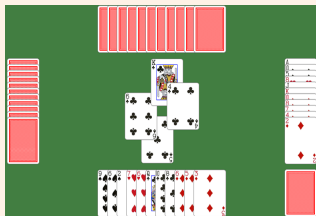


Bridge

Some games with imperfect information...



Poker



Bridge

Can we solve imperfect information games efficiently?

Solving imperfect information games is NP-hard [Koller, Megiddo'92]

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Our contributions in this work

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Our contributions in this work

♠ New PTIME solvable class of imperfect information games by transformation to equivalent simpler games

Solving imperfect information games is NP-hard [Koller, Megiddo'92]

There are “simple” classes of imperfect information games solvable in PTIME

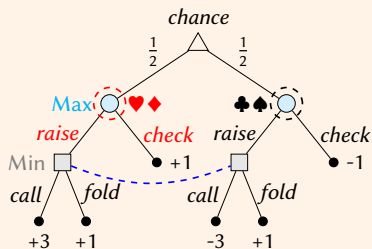
Our contributions in this work

- ♠ New PTIME solvable class of imperfect information games by transformation to equivalent simpler games
- ♠ Generalize transformation technique to broader class of games

Games in Extensive form

Player nodes : Max  and Min 

Random node : Chance 

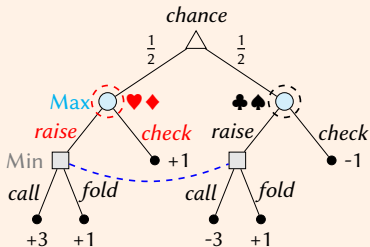


Games in Extensive form

Player nodes : Max  and Min 

Random node : Chance 

Toy Poker : A random suit from , , ,  is privately dealt to Max

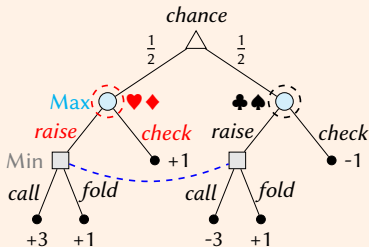


Games in Extensive form

Player nodes : **Max**  and **Min** 

Random node : Chance 

Toy Poker : A random suit from , , ,  is privately dealt to **Max**



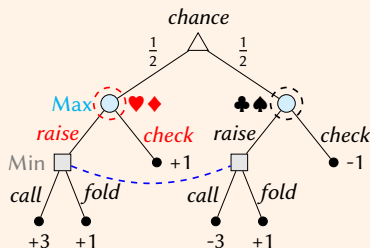
Actions : $A_{\text{Max}} = \{\text{raise, check, raise, check}\}$, $A_{\text{Min}} = \{\text{call, fold}\}$

Games in Extensive form

Player nodes : **Max**  and **Min** 

Random node : Chance 

Toy Poker : A random suit from , , ,  is privately dealt to **Max**



Actions : $A_{\text{Max}} = \{\text{raise, check, raise, check}\}$, $A_{\text{Min}} = \{\text{call, fold}\}$

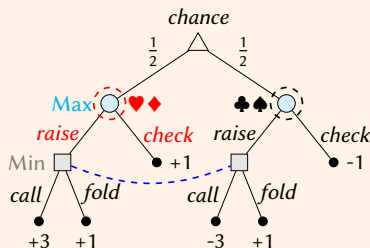
Information sets : $\mathcal{I}_{\text{Max}} = \{\text{--}, \text{--}\}$, $\mathcal{I}_{\text{Min}} = \{\text{--}\}$

Games in Extensive form

Player nodes : **Max**  and **Min** 

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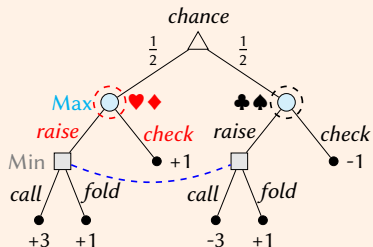
Actions : $A_{\text{Max}} = \{\text{raise, check, raise, check}\}$, $A_{\text{Min}} = \{\text{call, fold}\}$

Information sets : $\mathcal{I}_{\text{Max}} = \{\text{--}, \text{--}\}$, $\mathcal{I}_{\text{Min}} = \{\text{--}\}$

Zero-sum : Min pays **Max** at leaves ●

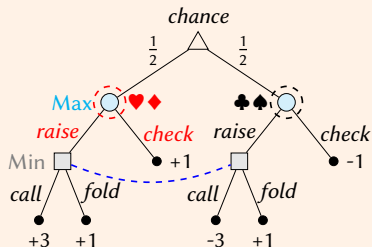
Strategies

Strategies



Behavioral Strategies : Choose actions randomly at information set.
 $\mathcal{I} \mapsto \Delta(A)$

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 $\mathcal{I} \mapsto \Delta(A)$

σ : Max raises and checks with probability $\frac{1}{2}$ at $\heartsuit \diamondsuit$ and always raises at $\clubsuit \spadesuit$

τ : Min always folds

Expected Payoff : $E(\sigma, \tau)$

Optimal Solution

Optimal Solution

Maxmin value

$$\mathbf{maxmin} = \max_{\sigma} \min_{\tau} E(\sigma, \tau)$$

Optimal Solution

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Decision Problem

Optimal Solution

Maxmin value

$$\mathbf{maxmin} = \max_{\sigma} \min_{\tau} E(\sigma, \tau)$$

Decision Problem

Two-player : Given a **two-player** game and threshold λ , is the maxmin value over **behavioral strategies** at least λ ?

One-player : Given a **one-player** game and threshold λ , is the maximum value over **behavioral strategies** at least λ ?

Optimal Solution

Maxmin value

$$\mathbf{maxmin} = \max_{\sigma} \min_{\tau} E(\sigma, \tau)$$

Decision Problem

Two-player : Given a **two-player** game and threshold λ , is the maxmin value over **behavioral strategies** at least λ ?

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Complexity depends on player's **recall**.

Perfect recall

Perfect recall

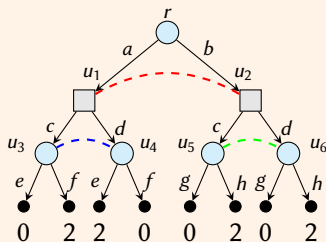
Player remembers his own past history of actions

$$inf(u) = inf(v) \implies hist_{Max}(u) = hist_{Max}(v)$$

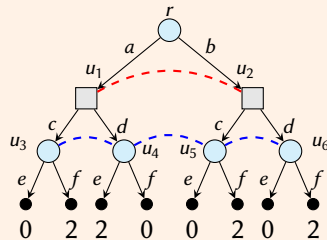
Perfect recall

Player remembers his **own** past history of actions

$$inf(u) = inf(v) \implies hist_{Max}(u) = hist_{Max}(v)$$



Perfect recall



Imperfect recall

No information set across distinct action sub-trees

Action-loss recall

Action-loss recall

Loss of perfect recall \rightarrow distinct histories split at some past info set with distinct actions

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Loss of perfect recall \rightarrow distinct histories split at some past info set with distinct actions

$$\text{inf}(u) = \text{inf}(v) \implies$$

$$\text{hist}_{\text{Max}}(u) = \text{hist}_{\text{Max}}(v)$$

or

$$\text{hist}_{\text{Max}}(u) = sa_1s_1, \text{hist}_{\text{Max}}(v) = sa_2s_2 \text{ where } a_1, a_2 \text{ action at same info set}$$

Action-loss recall

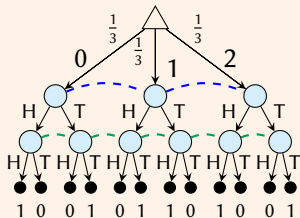
Loss of perfect recall \rightarrow distinct histories split at some past info set with distinct actions

$$\text{inf}(u) = \text{inf}(v) \implies$$

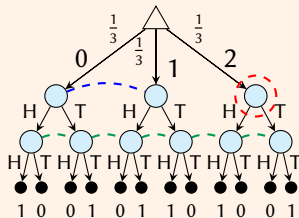
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A-loss recall



Not A-loss recall

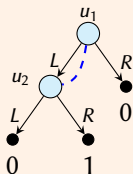
No information set across sub-trees rooted at nodes with distinct information but same history

Absentmindedness

Absentmindedness

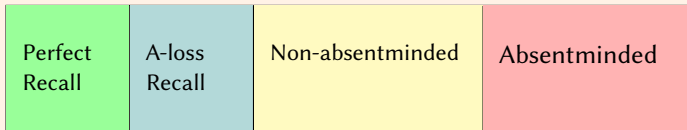
Forgets if the same decision point was seen before

$$\exists u, v, \inf(u) = \inf(v) \text{ and } \text{hist}_{\text{Max}}(u) <_{\text{prefix}} \text{hist}_{\text{Max}}(v)$$

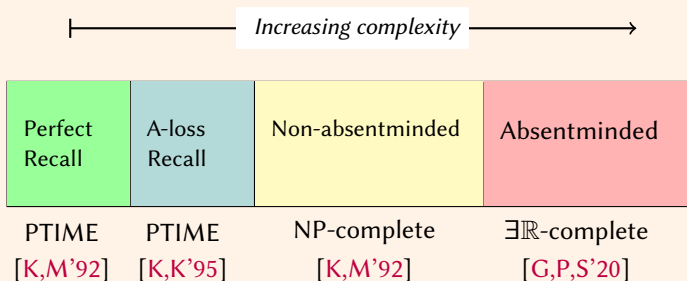


Absentminded

Previous Complexity Picture

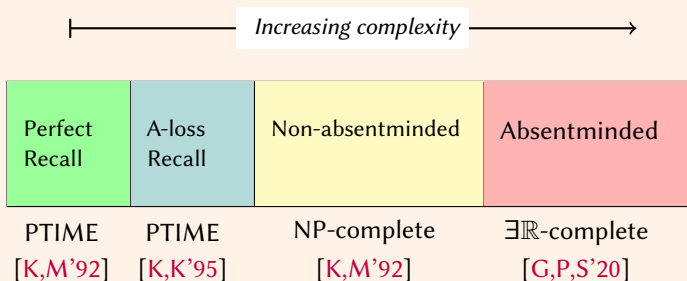


Previous Complexity Picture




Complexity of one-player games

Previous Complexity Picture



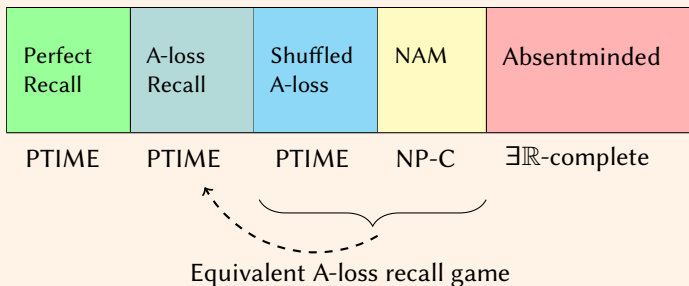
Complexity of one-player games

Our work : Finer complexity picture for non-absentminded games 

Our contribution

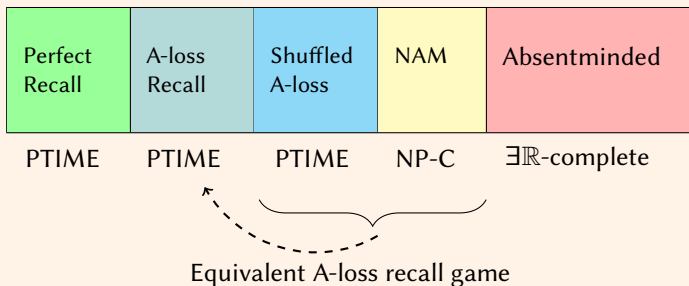
Perfect Recall	A-loss Recall	Shuffled A-loss	NAM	Absentminded
PTIME	PTIME	PTIME	NP-C	$\exists\mathbb{R}$ -complete

Our contribution



Every **non-absentminded** game can be transformed into **equivalent** A-loss recall game.

Our contribution



Every **non-absentminded** game can be transformed into **equivalent** A-loss recall game.

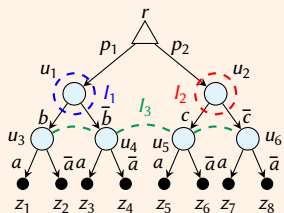
Caveat : Exponential blow-up in size

Core idea

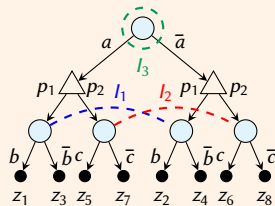
Assigning variables to actions for a behavioral strategy gives
symbolic payoff polynomial

Games are equivalent if symbolic polynomials are same

Shuffled A-loss Recall



No A-loss recall



A-loss recall

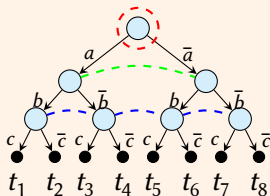
Actions in histories are permuted

A-loss recall span

A-loss recall span

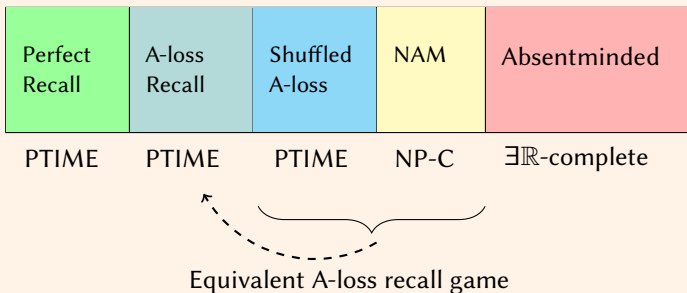
Leaf polynomials of input game are **linear combinations** of leaf polynomials of transformed game

Set of polynomials $\{x_a, 1 - x_a\} \times \{x_b, 1 - x_b\} \times \{x_c, 1 - x_c\}$ forms basis of vector space of all multilinear polynomials over $\{x_a, x_b, x_c\}$



Add suitable payoffs t_i to construct equivalent game

Summary



Also extends to two-player games where **Max** has perfect recall and **Min** is non-absentminded

Future directions

- ♠ Implications on practice
- ♠ Complexity of computing minimal A-loss recall Span



Thank You