

# Decomposition of Multi-Player Games

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Master Thesis

# Outline

- 1 Motivation
- 2 Subgame Detection
- 3 Impartial Games
- 4 General Partial Games
- 5 Parallel and Serial Games
- 6 Conclusion

# Outline

- 1 Motivation
  - The Problem That We Studied
  - The Games That We Studied
- 2 Subgame Detection
- 3 Impartial Games
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# General Game Playing

- Time constraints VS Very large games

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- Time constraints VS Very large games
- Games contain subgames
- Solve a game by solving its subgames?

# Previous Work

- *Decomposition of Single Player Games*,  
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- *Decomposition of Single Player Games*,  
M. Günther, S. Schiffel and M. Thielscher, 2007
- **What about multi-player games?**

# Properties of Multi-Player Games

- Alternating Move Games, e.g. Nim, Chess, TicTacToe
- Simultaneous Move Games, e.g. Rock-paper-scissors
- Impartial Games, e.g. Nim
- Partial Games, e.g. TicTacToe, Double-TicTacToe
- Parallel Games, e.g. Parallel-TicTacToe
- Serial Games, e.g. Serial-TicTacToe



# Outline

- 1 Motivation
- 2 Subgame Detection**
  - Basic Idea
  - Extension
- 3 Impartial Games
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# Basic Definitions

## Definition

(Game). A **game** is a tuple  $G = (F, A, I, R)$  where

- $F$  is a set of fluents,
- $A$  is a set of actions,
- $I$  is the initial state of the game, which is a set of **ground instances** of  $F$ ,
- $R$  is a set of roles.

## Definition

(State). A **state**  $S$  of a game  $G = (F, A, I, R)$  is a set of ground instances of  $F$ , and  $S$  can be reached from initial state  $I$  by playing  $G$ .

# Basic Definitions

## Definition

(Subgame). A game  $G = (F, A, I, R)$  is a **subgame** of  $G' = (F', A', I', R')$  iff  $F \subseteq F'$ ,  $A \subseteq A'$ ,  $I \subseteq I'$ ,  $R \subseteq R'$ , and  $F$ ,  $A$ ,  $I$  and  $R$  are not empty.

## Definition

(Subgame Independence). Two subgames  $G_s = (F_s, A_s, I_s, R_s)$  and  $G_{s'} = (F_{s'}, A_{s'}, I_{s'}, R_{s'})$  of game  $G$  are **independent** each other iff  $F_s \cap F_{s'} = \emptyset$  and  $A_s \cap A_{s'} = \emptyset$ .

# Subgame Detection

- Dependency relations between fluents and actions
  - Precondition
    - e.g. if action  $M$  is legal then fluent  $F$  must be true
  - Positive Effect
    - e.g. fluent  $F$  is true (not true in current state) in next state if a player takes move  $M$
  - Negative Effect
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  - Negative Effect
    - e.g. fluent  $F$  is not true (true in current state) in next state if a player takes move  $M$
- Independent subgames
  - **connected components** of fluents and actions with dependency relations

# Fluent and Action Instantiation

- Why
  - subgames **share** fluent and action names
- When
  - if the value of one argument of a fluent **does not change** in the whole game

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Example (*Nim with two heaps of size 1 and 2*):

$\{\{\text{heap}(X,N)\},\{\text{reduce}(X,M)\},\{\text{heap}(a,1),\text{heap}(b,2)\},\{\text{player1},\text{player2}\}\}$

*fluent/action instantiation*  $\Rightarrow$

$\{\{\text{heap}(a,N),\text{heap}(b,N)\},\{\text{reduce}(a,M),\text{reduce}(b,M)\},\dots\}$

*subgame detection*  $\Rightarrow$

$\{\{\text{heap}(a,N)\},\{\text{reduce}(a,M)\},\{\text{heap}(a,1)\},\{\text{player1},\text{player2}\}\},$

$\{\{\text{heap}(b,N)\},\{\text{reduce}(b,M)\},\{\text{heap}(b,2)\},\{\text{player1},\text{player2}\}\}$



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  - Impartial Property Checking
  - Decomposition Search
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# GDL Game Rule Analysis

An impartial game is an **alternating move game** and the **legal moves** of the game only depend on the **position (or state)** of the game.

- Legal rules
  - if, given any state of the game, the legal rules give the same moves for every player if he has control in that state
- Next rules
  - if, given any state of the game and a move, the next rules give the same next state for every player if he does this move

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Counter example (TicTacToe):

```
(<= (legal ?w (mark ?x ?y))
  (true (cell ?x ?y b))
  (true (control ?w)))
  (<= (next (cell ?m ?n x))
    (does xplayer (mark ?m ?n))
    (true (cell ?m ?n b)))
    (<= (next (cell ?m ?n o))
      (does oplayer (mark ?m ?n))
      (true (cell ?m ?n b)))
```

# Game Nim and Nimber

## Theorem

*(Sprague Grundy theorem). Every impartial game under the normal play convention is equivalent to a nimber.*

## Definition

A **nimber** is a special game denoted by  $*n$  for some integer  $n$  and  $n \geq 0$ . We define  $*0 = \{\}$ , and  $*(n+1) = *n \cup \{*n\}$ .

Given two nimbers  $G$  and  $H$ , nim addition

$$G \oplus H = \{G \oplus h \mid h \in H\} \cup \{g \oplus H \mid g \in G\}.$$

# Game Nim and Nimber

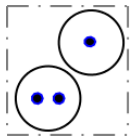
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Nim example:



$$*1 = *0 \cup \{*0\} = \{\} \cup \{\{\}\} = \{*\!0\},$$

$$*2 = *1 \cup \{*1\} = \{\{\}\} \cup \{\{\{\}\}\} = \{*\!0, *\!1\}$$

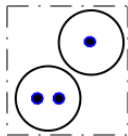
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$$*2 = *1 \cup \{*1\} = \{\{\}\} \cup \{\{\{\}\}\} = \{*\!0, *\!1\}$$

## Winning Conditions of Nim

- 1 the player to make the last move wins (normal play game)
- 2 the player to make the last move loses (misère game)

## Theorem

*A game is impartial iff its all subgames are impartial.*

## Decomposition Search

- Subgame search
  - calculate the **nimber** of each subgame
- Global game search
  - use **nim-addition** to find optimal strategies

# Experimental Results

For Nim with 4 heaps:

time cost(second) for finding the first optimal strategy

Time Cost(s)	Normal Play			Misère
	Heaps Size			
	1,5,4,2	2,2,10,10	11,12,15,25	12,12,20,20
Normal Search	0.4	3.5	6607	10797
Decomposition Search	0.01	0.01	0.07	0.06



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  - Additional Definitions for Decomposition Search
  - Decomposition Search
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# Local Concepts

## Definition

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## Example

```
(<= (goal xplayer 100) (line1 x) (line2 x))
```

there are two local goal concepts, *(line1 x)* and *(line2 x)*.

# Turn-Move Sequences

## Definition

A **turn-move sequence** is a tuple  $Seq = (Ts, Ms, Es)$  where

- $Ts$  is a list of player names, indicated by  $T_1 \circ T_2 \circ \dots \circ T_n$ ,
- $Ms$  is a list of moves, indicated by  $M_1 \circ M_2 \circ \dots \circ M_n$ ,
- $Es$  is a set of evaluations of local concepts, where  $n \geq 0$ .

## Definition

Turn-move sequence  $Seq_1 = (Ts_1, Ms_1, Es_1)$  is **evaluation dominated** by turn-move sequence  $Seq_2 = (Ts_2, Ms_2, Es_2)$  **under** a set of local concepts  $Cs$  iff

- $Ts_1 = Ts_2$ ,
- $\forall C \in Cs (Seq_1 \models C \Rightarrow Seq_2 \models C)$ .

# Decomposition Search II

## Subgame Search

For each subgame state,

- expand all **legal moves of all players**
- return all **simplified** turn-move sequences

## Global Game Search

Using normal search methods, for each global game state,

- choose legal moves from **turn-move sequences** returned from subgame search

# Experimental Results

## Subgame Search Results

<b>One Subgame of Double-Tictactoe</b>					
Search Depth	1	2	3	4	5
All Sequences	18	288	4032	47328	483840
Simplified Seqs	2	4	10	26	64
Time Cost(s)	0.17	2	10	28	55

<b>One Subgame of Double-Tictactoe</b>				
Search Depth	6	7	8	9
All Sequences	3870720	23224320	92897280	185794560
Simplified Seqs	148	324	674	912
Time Cost(s)	127	469	678	790

Decomposition Search

# Experimental Results

## Global Game Search Results

Time Cost(s)	Search Depth				
	1*2	2*2	3*2	4*2	5*2
Decomposition Search	0.36	4.36	24	80	179
Normal Search	< 1800			> 3600 * 4	

Time Cost(s)	Search Depth			
	6*2	7*2	8*2	9*2
Decomposition Search	301	1022	1530	1793
Normal Search	> 3600 * 4			

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# Additional Work for Subgame Detection

## Properties of Parallel Games:

- At least **two** independent subgames
- A player has to move in **all** subgames on his turn
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## Example

Parallel-TicTacToe has two tictactoe subgames, these two subgames share one move name *mark*, e.g. (mark ?x1 ?y1 ?x2 ?y2)

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**We have to find and split compound moves**

- by analyzing **next** and **legal** rules

# Compound Move Detection Example

## Next Rules :

- ```
(1).( <= (next (cell1 ?x1 ?y1 x))
        (does xplayer (mark ?x1 ?y1 ?x2 ?y2)))
(2).( <= (next (cell1 ?x1 ?y1 o))
        (does oplayer (mark ?x1 ?y1 ?x2 ?y2)))
(3).( <= (next (cell1 ?x ?y ?mark))
        (true (cell1 ?x ?y ?mark))
        (does xplayer (mark ?x1 ?y1 ?x2 ?y2))
        (distinctcell ?x ?y ?x1 ?y1))
(4).( <= (next (cell1 ?x ?y ?mark))
        (true (cell1 ?x ?y ?mark))
        (does oplayer (mark ?x1 ?y1 ?x2 ?y2))
        (distinctcell ?x ?y ?x1 ?y1))
```

## Legal Rules :

- ```
(<= (legal ?player (mark ?x1 ?y1 ?x2 ?y2))
    (true (control ?player))
    (true (cell1 ?x1 ?y1 b))
    (true (cell2 ?x2 ?y2 b)))
```

# Decomposition Search

- Subgame Search
  - normal alternating move or simultaneous move game search methods
- Global Game Search
  - make sure subgame search gets **equal length** plans in all subgames

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## Properties of Serial Games

- At least **two** independent subgames
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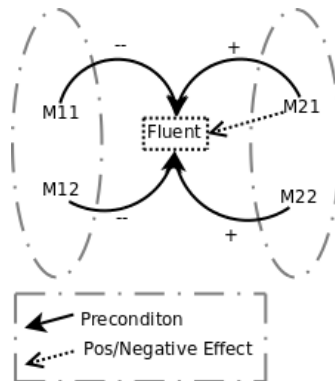
## Properties of Serial Games

- At least **two** independent subgames
- All subgames are **ordered** and played one after another
- Only **one** subgame is played in each turn

**We have to find the order between subgames**

- by analyzing **dependency relations** between actions and fluents

# Subgame Order Detection



# Decomposition Search

- Subgame Search
  - normal alternating move or simultaneous move game search methods
- Global Game Search
  - control subgame search in terms of the order

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# Done and ToDo

## What We Have Done:

- 1 subgame detection algorithm and
- 2 decomposition search algorithms for different classes of games

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## What We Have Done:

- 1 **subgame detection algorithm** and
- 2 **decomposition search algorithms** for different classes of games

## What Can be Improved:

- 1 **apply pruning techniques** in decomposition search of partial games, e.g. alpha-beta pruning
- 2 **use local concept evaluations** more efficiently in global game search

# Done and ToDo

**Thank You!!**

# For Further Reading I



John H. Conway

*On Numbers and Games.*

Academic Press, 1976.



Elwyn R. Berlekamp, John H. Conway, Richard K. Guy

*Winning Ways 2nd Edition.*

2001.



Martin Müller

Decomposition search: A combinatorial games approach to  
game tree search, with applications to solving Go  
endgames

1999.

# For Further Reading II



M. Günther, S. Schiffel and M. Thielscher  
Decomposition of Single Player Games  
2007.



Eric Schkufza  
Decomposition of Games for Efficient Reasoning  
2008.

# Time Complexity Comparison I

## Impartial and Partial Games

Assume that a game  $G$  has  $n$  subgames,  $G_1, G_2, \dots, G_n$  with  $V_1, V_2, \dots, V_n$  states respectively,

- normal search:  $O(V_1 * V_2 * \dots * V_n)$
- decomposition search:  $O(V_1 + V_2 + \dots + V_n)$

## Example

For double-tictactoe, the number of states is about  $18!$  (including revisited states), while the state for each subgame is about  $\prod_{n=1}^9 (2n)$  which is  $\prod_{n=1}^9 (2n - 1)$  times smaller than  $18!$

# Time Complexity Comparison II

## Parallel Games

Assume that a parallel game  $G$  has  $n$  subgames,  $G_1, G_2, \dots, G_n$  with  $V_1, V_2, \dots, V_n$  states respectively,

- normal search:  $O(V_1 * V_2 * \dots * V_n)$
- decomposition search:  $O(V_1 + V_2 + \dots + V_n)$

## Serial Games

Assume that a serial game  $G$  has  $n$  subgames, for subgame  $i$  there are  $V_i$  states and  $T_i$  terminal states

- normal search:  
 $O(V_1 + T_1 * V_2 + T_1 * T_2 * V_3 + \dots + T_1 * T_2 * \dots * T_{n-1} * V_n)$
- decomposition search:  $O(V_1 + V_2 + \dots + V_n)$