

# Algorithms for Model Checking (2IW55)

## Lecture 7: Recursively Solving Parity Games

Background material:

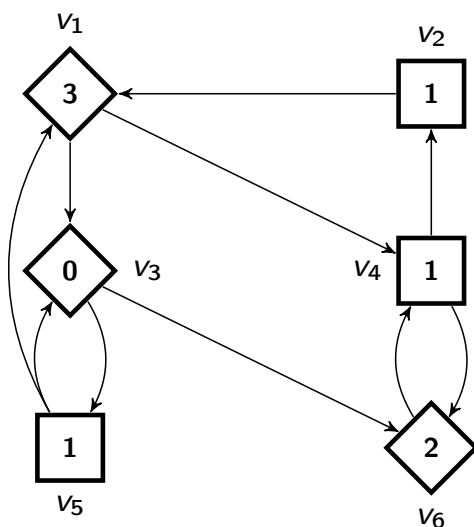
O. Friedmann, *Recursive Solving of Parity Games Requires Exponential Time*

M. Gazda and T.A.C. Willemse, *Zielonka's Recursive Algorithm:  
dull, weak and solitaire games and tighter bounds*

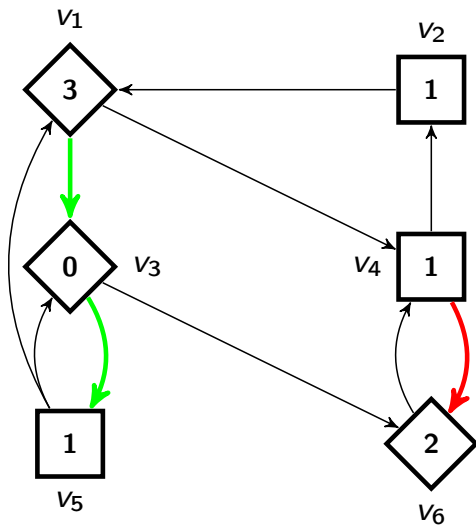
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MF 6.073

## Parity games—recap

2/32



- ▶ two players:  $\diamond$  (Even) and  $\square$  (Odd)
- ▶ every node has an owner ( $V = V_{\diamond} \cup V_{\square}$ )
- ▶ moving token indefinitely;  
node owner chooses the next vertex
- ▶ play = infinite path through the game
- ▶ vertices labelled with natural numbers  
(priorities)
- ▶ winner of a play: determined by the parity of  
the minimal priority occurring infinitely often  
( $\diamond$  wins even parity,  $\square$  wins odd parity)



- ▶ strategy
  - winning strategy
  - memoryless strategy
- ▶ winning partition

## Objective

Parity game  $G = (V, E, p, (V_\diamond, V_\square))$ .

**Determinacy** implies there is a **unique** partition  $(W_\diamond, W_\square)$  of  $V$  such that:

- ▶  $\diamond$  has winning strategy  $\varrho_\diamond$  from  $W_\diamond$ , and
- ▶  $\square$  has winning strategy  $\varrho_\square$  from  $W_\square$ .

### Objective of parity game algorithms

**Compute** partition  $(W_\diamond, W_\square)$  with strategies  $\varrho_\diamond$  and  $\varrho_\square$  of  $V$  such that:

- ▶  $\varrho_\diamond$  is winning for player  $\diamond$  from  $W_\diamond$
- ▶  $\varrho_\square$  is winning for player  $\square$  from  $W_\square$ .

## Deterministic algorithms for solving parity games

- ▶ Recursive (*this lecture*) ..... McNaughton '93, Zielonka '98
- ▶ Local algorithm ..... Stevens & Stirling '98
- ▶ Small progress measures (*next lecture*) ..... Jurdziński, '00
- ▶ Strategy improvement ..... Vöge & Jurziński '00
- ▶ (Deterministic) Subexponential ..... Jurdziński, Paterson & Zwick '06
- ▶ Bigstep ..... Schewe '07

# Concepts

Parity game  $G = (V, E, p, (V_\diamond, V_\square))$ .

Notation:

- ▶  $\circ$  is the 'arbitrary' player .....  $\circ \in \{\diamond, \square\}$
- ▶  $\bar{\circ}$  is the opponent .....  $\bar{\diamond} = \square$  and  $\bar{\square} = \diamond$

### Definition (Arena restriction)

The game  $G \setminus U = (V', E', p', (V'_\diamond, V'_\square))$ , for  $U \subseteq V$ , is the game confined to  $V \setminus U$ :

- ▶  $V' = V \setminus U$  and  $E' = E \cap (V' \times V')$ ,
- ▶  $p'(v) = p(v)$  for  $v \in V \setminus U$ ,
- ▶  $V'_\diamond = V_\diamond \setminus U$ , and  $V'_\square = V_\square \setminus U$

Parity game  $G = (V, E, p, (V_\diamond, V_\square))$ .

### Definition (Closed strategies)

Strategy  $\varrho_\diamond: V_\diamond \rightarrow V$  is **closed** on  $W \subseteq V$  if for all  $v \in W$ , we have:

- ▶  $v \in V_\diamond$  implies  $\varrho_\diamond(v) \in W$ , and
- ▶  $v \in V_\square$  implies that  $w \in W$  for all  $(v, w) \in E$

For  $\varrho_\diamond$  **closed** on  $W$ , plays consistent with  $\varrho_\diamond$  and starting in  $W$  **stay within  $W$**

### Definition (Closed sets)

Set  $W \subseteq V$  is  **$\diamond$ -closed** if  $\diamond$  has a strategy closed on  $W$ . Likewise for  $\square$ -closed.

Parity game  $G = (V, E, p, (V_\diamond, V_\square))$ .

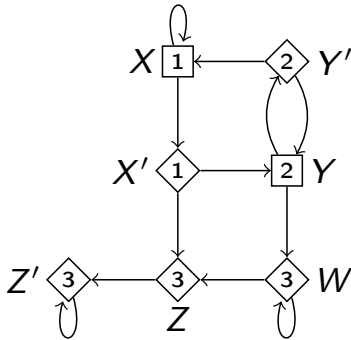
### Definition (Dominion)

$D \subseteq W \subseteq W_\circ$  is a **dominion** of  $\circ$ , if she has a memoryless strategy  $\varrho$  that is:

- ▶ winning for  $\circ$  from all  $v \in D$
- ▶ closed on  $D$

Example (Dominions)

Consider parity game  $G$ :



- ▶  $\{X\}, \{Z', Z, W\}$  are  $\square$ -dominions
- ▶ Note that  $\{Z, W\}$  and  $\{Y, Y'\}$  are no dominions (why?)

Parity game  $G = (V, E, p, (V_\diamond, V_\square))$ .

Definition (Attractor sets)

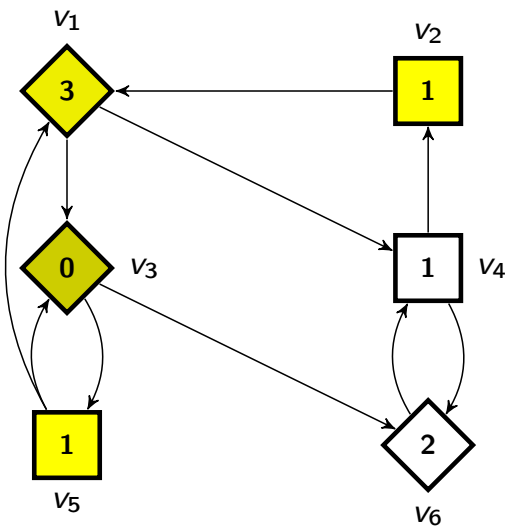
The **attractor** set to  $U \subseteq V$  for  $\circ$  (denoted  $\circ\text{-Attr}(G, U)$ ) is the **least set** of vertices:

- ▶ containing  $U$
- ▶ such that  $\circ$  can **force** any play to reach  $U$ .

Inductively:  $\circ\text{-Attr}(G, U) = \bigcup_{k \in \mathbb{N}} \circ\text{-Attr}^k(G, U)$  where

$$\begin{aligned} \circ\text{-Attr}^0(G, U) &= U \\ \circ\text{-Attr}^{k+1}(G, U) &= \circ\text{-Attr}^k(G, U) \cup \\ &\quad \{v \in V_\circ \mid \exists v' \in V : (v, v') \in E \wedge v' \in \circ\text{-Attr}^k(G, U)\} \cup \\ &\quad \{v \in V_\square \mid \forall v' \in V : (v, v') \in E \implies v' \in \circ\text{-Attr}^k(G, U)\} \end{aligned}$$

Example (Attractor sets)



$\circ$ -Attr( $G, U$ ): vertices from which  $\circ$  can force the play to reach set  $U$

Consider  $\diamond$ -Attr( $G, \{v_3\}$ )

$$\begin{aligned} \diamond\text{-Attr}^0(G, \{v_3\}) &= \{v_3\} \\ \diamond\text{-Attr}^1(G, \{v_3\}) &= \{v_1, v_3\} \\ \diamond\text{-Attr}^2(G, \{v_3\}) &= \{v_1, v_2, v_3, v_5\} \end{aligned}$$

Time to compute attractor:  $\mathcal{O}(|V| + |E|)$

Parity game  $G = (V, E, p, (V_\diamond, V_\square))$ .

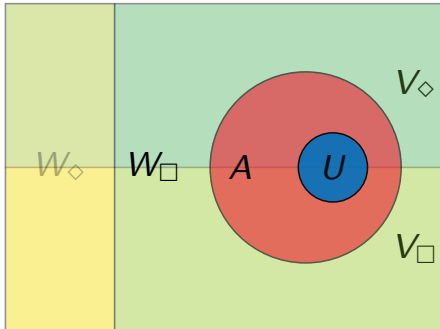
If  $U$  is a  $\diamond$ -dominion (dually for  $\square$ -dominion) in  $G$  then (by definition)

- ▶ there is a strategy  $\rho$  such that  $\diamond$  wins  $U$
- ▶  $\diamond$  can always choose to stay in  $U$
- ▶  $\square$  cannot leave  $U$  (it is a **trap**)

...but also:

- ▶  $A = \diamond\text{-Attr}(G, U)$  is an  $\diamond$ -dominion;
- ▶  $\diamond$  cannot leave  $V \setminus A$
- ▶ If  $(W_\diamond, W_\square)$  is solution of  $G \setminus A$ , then  $(W_\diamond \cup A, W_\square)$  is solution of  $G$ .

Visually:



- ▶  $U$  is a  $\diamond$ -dominion
- ▶  $A = -Attr^\diamond(G, U)$
- ▶  $A$  is a  $\diamond$ -dominion
- ▶  $(W_\diamond, W_\square)$  winning sets  $G \setminus A$
- ▶  $(W_\diamond \cup A, W_\square)$  winning sets  $G \setminus A$
- ▶  $\square$  cannot leave  $A$
- ▶  $\diamond$  can stay in  $A$
- ▶  $\diamond$  cannot leave  $V \setminus A$
- ▶  $\square$  can avoid  $A$  from  $V \setminus A$

## Recursively solving parity games

Divide and conquer

- ▶ Base: trivial games with at most one priority
- ▶ Step:
  - Compute dominion
  - Solve remaining subgame
  - Assemble winning sets/strategies from winning sets/strategies of subgames
  - Attractor strategy for one of players reaching set of nodes with minimal priority in the game

Parity game  $G = (V, E, p, (V_\diamond, V_\square))$ .

$Recursive(G)$ : recursively solve parity game  $G$

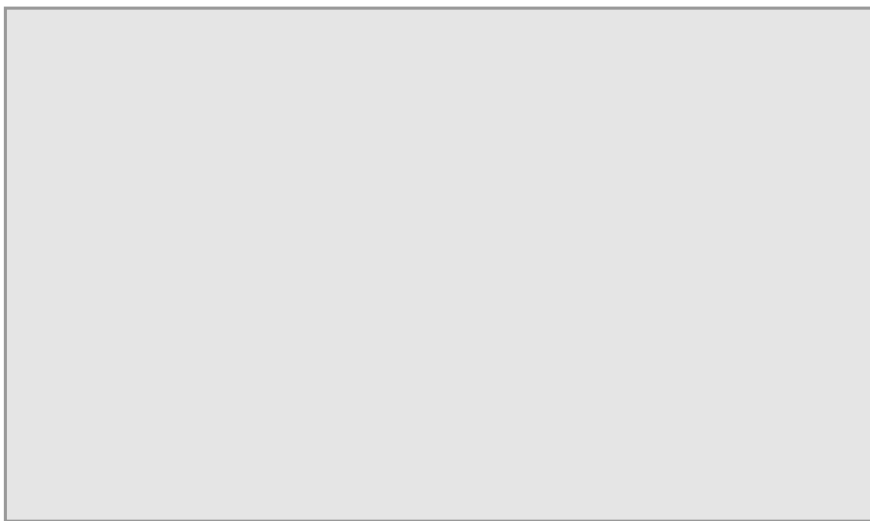
Return: partitioning  $(W_\diamond, W_\square)$  where  $\diamond$  wins from  $W_\diamond$ , and  $\square$  wins from  $W_\square$

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1:  $m \leftarrow \min\{p(v) \mid v \in V\}$ 
2:  $h \leftarrow \max\{p(v) \mid v \in V\}$ 
3: if  $h = m$  or  $V = \emptyset$  then
4:   if  $m$  is even or  $V = \emptyset$  then
5:     return  $(V, \emptyset)$ 
6:   else
7:     return  $(\emptyset, V)$ 
8:   end if
9: end if
10:  $\circ \leftarrow \diamond$  if  $m$  is even and  $\square$  otherwise
11:  $U \leftarrow \{v \in V \mid p(v) = m\}$ 
12:  $A \leftarrow \circ\text{-Attr}(G, U)$ 
13:  $(W'_\diamond, W'_\square) \leftarrow Recursive(G \setminus A)$ 
14: if  $W'_\circ = \emptyset$  then
15:    $W_\circ \leftarrow A \cup W'_\circ$ 
16:    $W_{\bar{\circ}} \leftarrow \emptyset$ 
17: else
18:    $B \leftarrow \bar{\circ}\text{-Attr}(G, W'_\circ)$ 
19:    $(W_\diamond, W_\square) \leftarrow Recursive(G \setminus B)$ 
20:    $W_{\bar{\circ}} \leftarrow W'_\circ \cup B$ 
21: end if
22: return  $(W_\diamond, W_\square)$ 

```

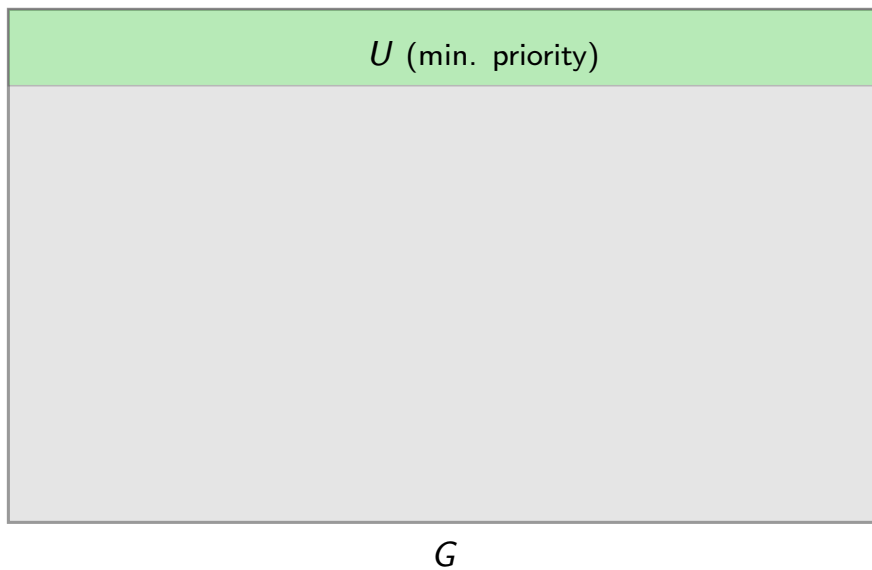
Assume that the minimal priority in  $G$  is even



$G$

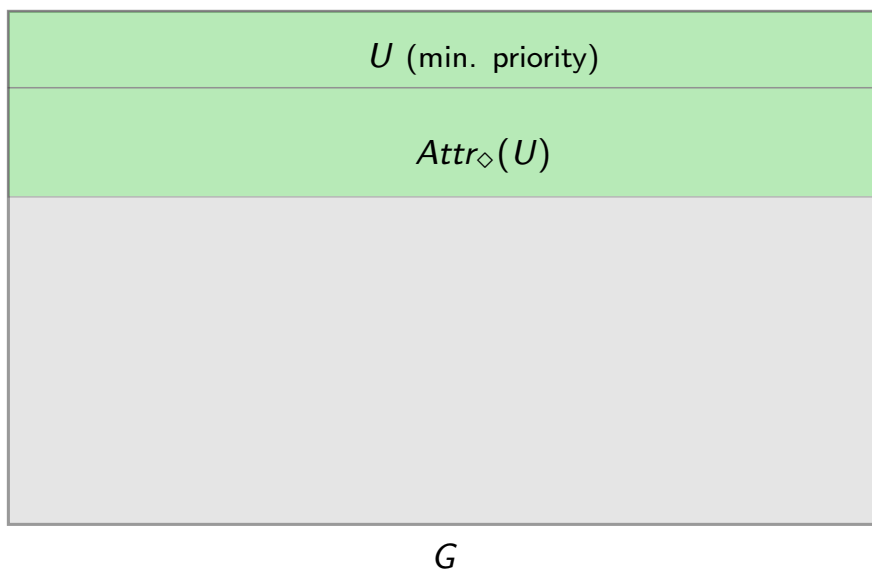


Assume that the minimal priority in  $G$  is even



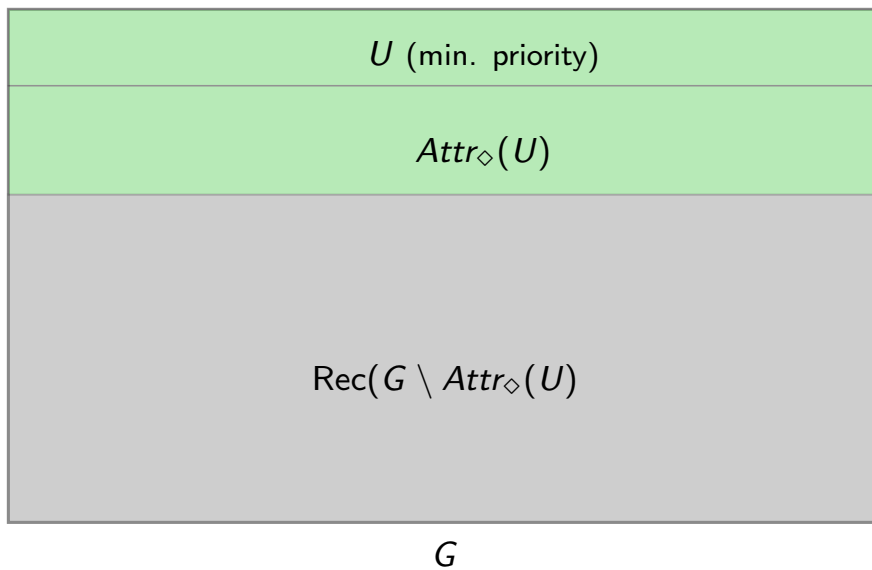
line 11

Assume that the minimal priority in  $G$  is even



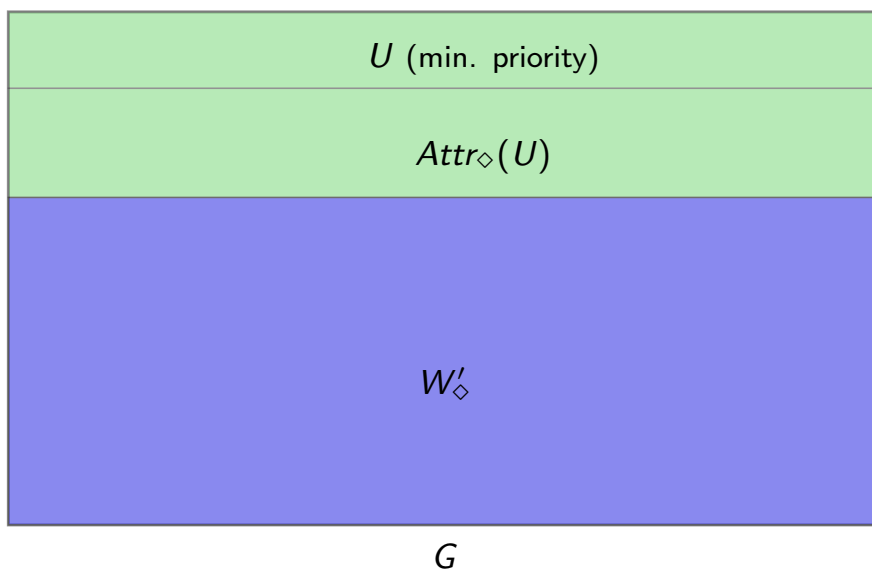
line 12

Assume that the minimal priority in  $G$  is even



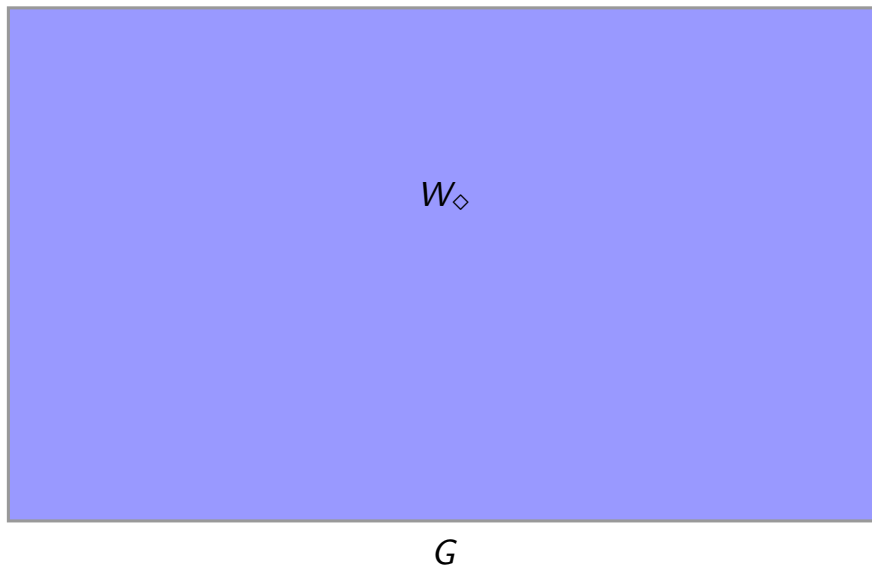
line 13

Assume that the minimal priority in  $G$  is even



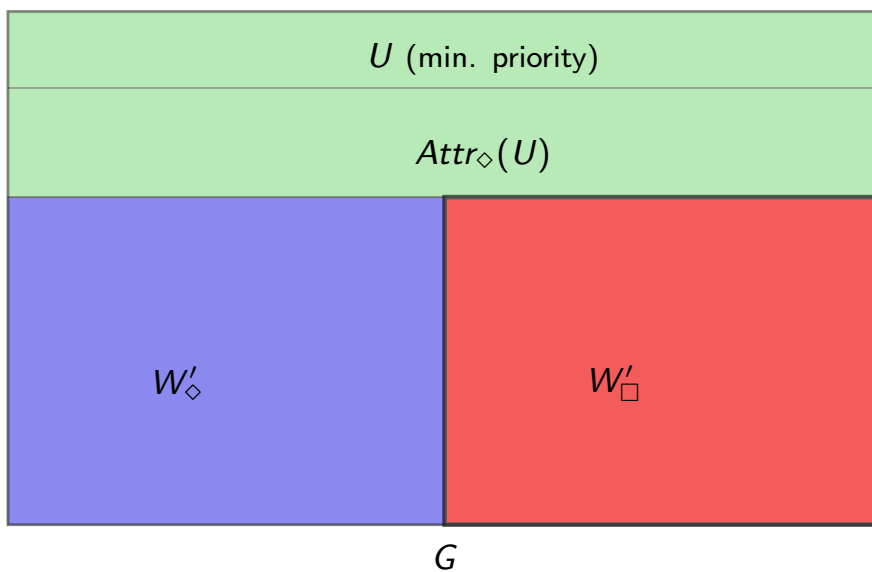
line 14 (case  $W'_{\square} = \emptyset$ )

Assume that the minimal priority in  $G$  is even



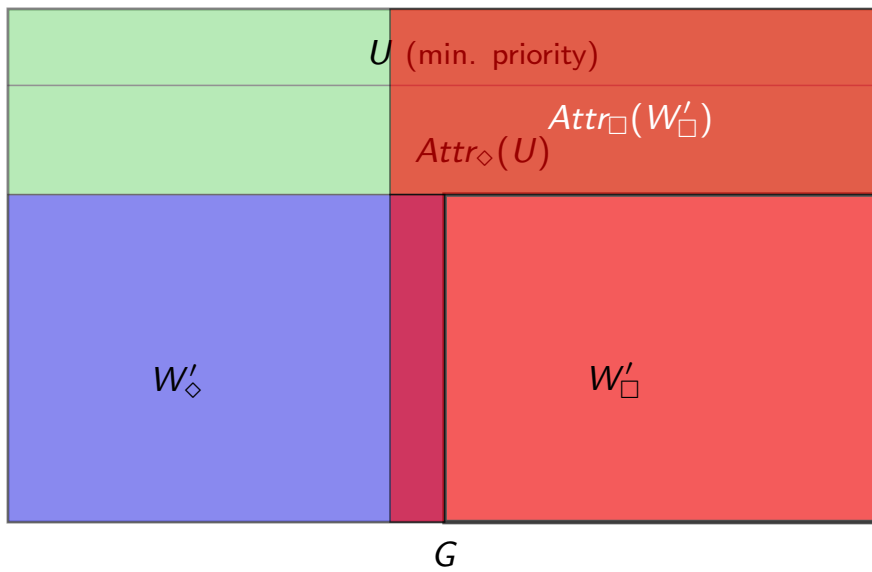
line 15, 16 & 22 (case  $W'_{\square} = \emptyset$ )

Assume that the minimal priority in  $G$  is even



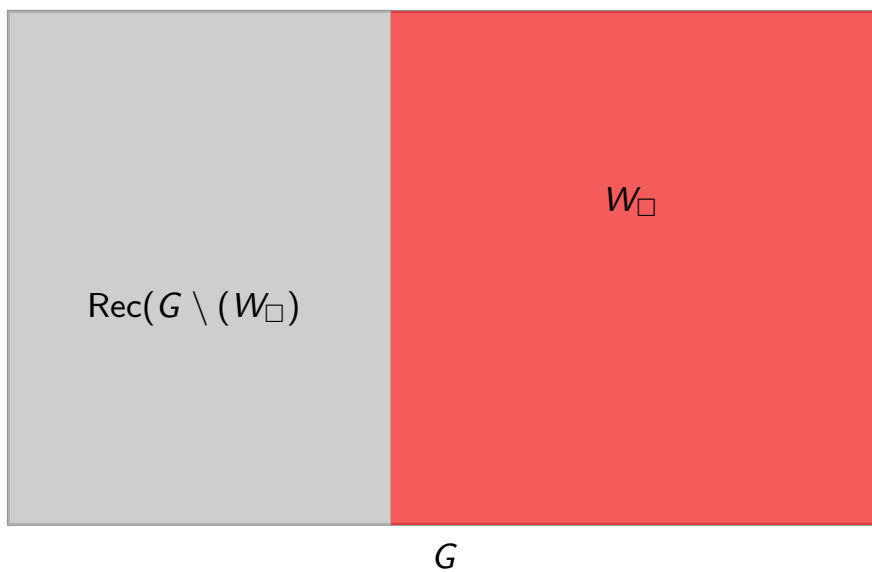
line 17 (case  $W'_{\square} \neq \emptyset$ )

Assume that the minimal priority in  $G$  is even



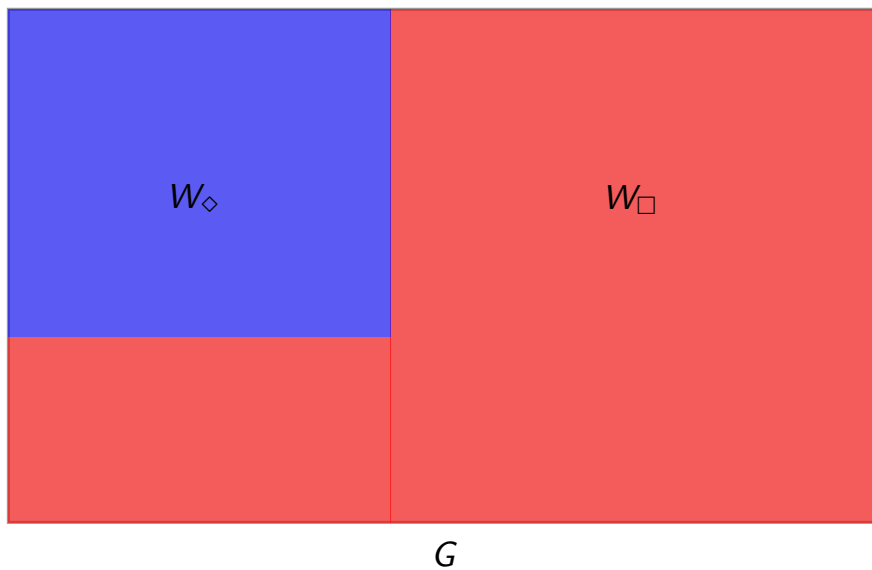
line 18

Assume that the minimal priority in  $G$  is even



line 19

Assume that the minimal priority in  $G$  is even

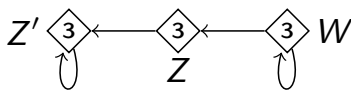


line 22

## Observations

- ▶ Lines 1-9: base case, straightforward.
- ▶ Lines 10-13: try to establish a dominion. Two cases:
  - Lines 12-15: ( $\circ$  wins all):  $\circ$  wins in  $G \setminus A$ , then  $\circ$  wins all of  $G$ , since if  $\bar{\circ}$  visits  $A$ , then  $\circ$  plays towards  $U$  using attractor, visiting  $A$  infinitely often, hence  $m$  infinitely often. If  $A$  not visited, game stays in  $G \setminus A$ .
  - Lines 16-20: ( $\bar{\circ}$ -dominion found):  $W'_{\bar{\circ}}$  is a  $\bar{\circ}$ -dominion in  $G \setminus A$ . Since  $\circ$  cannot leave  $G \setminus A$  also  $W'_{\bar{\circ}}$  is  $\bar{\circ}$ -dominion in  $G$ . Then solve remaining game recursively and fix solution, compose strategies.

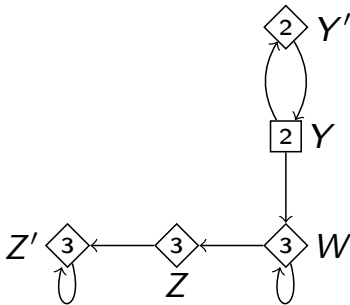
Apply the recursive algorithm to the following parity game  $G$



```

m ← 3
h ← 3
return (∅, {W, Z, Z'})
    
```

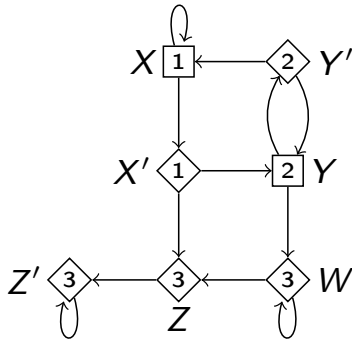
Apply the recursive algorithm to the following parity game  $G$



```

1: m ← 2
2: h ← 3
3: ...
10: ∅ ← ∅
11: U ← {v ∈ V | p(v) = 2} = {Y, Y'}
12: A ← -Attr◇(G, U) = {Y, Y'}
13: (W◇, W□) ← Recursive(G \ {Y, Y'}) = (∅, {Z, Z', W})
14: if W□ = ∅ then
15:   ...
17: else
18:   B ← -Attr□(G, W□) = {Y, Y', Z, Z', W}
19:   (W◇, W□) ← Recursive(G \ B) = (∅, ∅)
20:   W□ ← W□ ∪ B = B = {Y, Y', Z, Z', W}
21: end if
22: return (W◇, W□) = (∅, {Y, Y', Z, Z', W})
    
```

Consider parity game  $G$ :



```

1:  $m \leftarrow 1$ 
2:  $h \leftarrow 3$ 
3: ...
10:  $\diamond \leftarrow \square$ 
11:  $U \leftarrow \{v \in V \mid p(v) = 1\} = \{X, X'\}$ 
12:  $A \leftarrow \text{-Attr}^\square(G, U) = \{X, X'\}$ 
13:  $(W_\diamond, W_\square) \leftarrow \text{Recursive}(G \setminus \{X, X'\}) = (\emptyset, \{Y, Y', Z, Z', W\})$ 
14: if  $W'_\diamond = \emptyset$  then
15:    $W_\square \leftarrow A \cup W'_\square = \{X, X', Y, Y', Z, Z', W\}$ 
16:    $W_\diamond \leftarrow \emptyset$ 
17: else
18:   ...
21: end if
22: return  $(W_\diamond, W_\square) = (\emptyset, \{X, X', Y, Y', Z, Z', W\})$ 

```

So, player  $\square$  wins from **all** vertices!

## Complexity

Parity game  $G = (V, E, p, (V_\diamond, V_\square))$ .

$n = |V|, m = |E|, d = |\{p(v) \mid v \in V\}|$ .

- ▶ Worst-case running time complexity .....  $\mathcal{O}(m \cdot n^d)$
- ▶ Lowerbound on worst-case (Gazda&Willemse '13) .....  $\Omega(2^{n/3})$

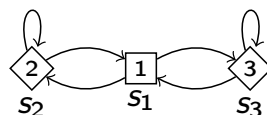
Special cases (Gazda&Willemse '13):

- ▶ Basic algorithm:
  - weak games (Gazda&Willemse '13) .....  $\mathcal{O}(d \cdot (n + m))$
  - (nested) solitaire games .....  $\Omega(2^{n/3})$
  - dull games .....  $\Omega(2^{n/3})$
- ▶ Optimised with SCC decomposition
  - (nested) solitaire games .....  $\mathcal{O}(n \cdot (n + m))$
  - dull games .....  $\mathcal{O}(n \cdot (n + m))$

- ▶ Recursive algorithm:
  - Divide and conquer
  - Dominions
  - Attractor sets
  - $\mathcal{O}(m \cdot n^d)$
  - Exponential examples available
- ▶ Other algorithms:
  - Iterative (e.g. small progress measures)
  - Variations of recursive: start with other dominions

# Exercise

Consider the following parity game:



- ▶ Compute the winning sets  $W_{\diamond}$ ,  $W_{\square}$  for players  $\diamond$  and  $\square$  in this parity game using the recursive algorithm.
- ▶ Translate this parity game to BES and solve the BES using Gauss elimination.