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# Polynomial-Time Under-Approximation of Winning Regions in Parity Games 

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#### Abstract

We propose a pattern for designing algorithms that run in polynomial time by construction and underapproximate the winning regions of both players in parity games. This approximation is achieved by the interaction of finitely many aspects governed by a common ranking function, where the choice of aspects and ranking function instantiates the design pattern. Each aspect attempts to improve the under-approximation of winning regions or decrease the rank function by simplifying the structure of the parity game. Our design pattern is incremental as aspects may operate on the residual game of yet undecided nodes. We present several aspects and one higher-order transformation of our algorithms - based on efficient, static analyses - and illustrate the benefit of their interaction as well as their relative precision within pattern instantiations. Instantiations of our design pattern can be applied for local model checking and as preprocessors for algorithms whose worst-case running time is exponential. This design pattern and its aspects have already been implemented in [16].


Keywords: parity games, abstraction, computational complexity, algorithms

## 1 Introduction

A parity game $G$ (e.g. [7]) specifies sets of finite or infinite plays between two players 0 and 1 on directed graphs ( $V, E$ ) with non-empty, finite ${ }^{5}$ set of nodes $V$ and edge relation $E \subseteq V \times V$. Each node $v \in V$ is labeled with a priority $\chi(v)$, a value in the set $\{0,1, \ldots, d-1\}$ where $d \geq 0$ is the index of parity game $G$. Furthermore, the set of nodes $V$ is partitioned into $V_{0}$, the set of nodes owned by player 0 , and

[^0]$V_{1}$, those nodes owned by player $1 .{ }^{6}$ Plays $\pi=v_{0} v_{1} \ldots$ in game $G$ are sequences of configurations (which are simply nodes) and may start at any node $v_{0} \in V$ :

- The player who owns $v_{0}$ needs to choose some $v_{1}$ with $\left(v_{0}, v_{1}\right) \in E$ as the next configuration. If no such $v_{1}$ exists, we then call $v_{0}$ a dead end, the player who owns $v_{0}$ loses that play.
- From configuration $v_{1}$ the play proceeds as in the previous item with $v_{1}$ now taking the role of $v_{0}$, resulting either in an infinite play, or a finite play if one player gets stuck in a dead end and loses the play.

The winning conditions for an infinite play $\pi=v_{0} v_{1} \ldots$ are derived from the priorities it accumulates. Let $\operatorname{lnf}(\pi)$ be the set of those priorities that occur infinitely often in the sequence $\chi\left(v_{0}\right) \chi\left(v_{1}\right) \ldots$. Then play $\pi$ is won by player 0 if $\max \operatorname{lnf}(\pi)$ is even. Play $\pi$ is won by player 1 if $\max \operatorname{lnf}(\pi)$ is odd.

Example 1.1 Consider the parity game in Fig. 1. A possible infinite play $\pi$ is $v_{7} v_{0} v_{7} v_{0} \cdots=\left(v_{7} v_{0}\right)^{\omega}$ with $\operatorname{lnf}(\pi)=\{0,1\}$. Thus $\pi$ is won by player 1 as the largest priority that occurs infinitely often in that play is 1 and therefore odd.

As customary, we write $\sigma$ to denote any of the players or values 0 and 1 and set $\bar{\sigma}=1-\sigma$. Memoryless strategies for player $\sigma$ are partial functions $f: W \cap V_{\sigma} \rightarrow V$ for some subset $W$ of nodes where $f(v)$ is defined iff $v \in W \cap V_{\sigma}$ is not a dead end; in which case $(v, f(v)) \in E$. Such a strategy is winning for $W$ if all plays starting in $W$ are won by player $\sigma$ if played according to that strategy: at any configuration $v \in W \cap V_{\sigma}$ that is not a dead end, player $\sigma$ chooses $f(v)$ as the next configuration.

Parity games are determined [6]: each player $\sigma$ has a winning region $\mathrm{Win}_{\sigma}(G)$ of nodes in $G$ for which she has a memoryless winning strategy, and these two regions $\mathrm{Win}_{0}(G)$ and $\mathrm{Win}_{1}(G)$ form a partition of the set of nodes in $G$.

Example 1.2 Reconsider the parity game in Fig. 1. The winning region for player 0 is $\left\{v_{4}, v_{5}, v_{6}\right\}$, and the winning region for player 1 is $\left\{v_{0}, v_{1}, v_{2}, v_{3}, v_{7}\right\}$; both sets partition $V$. A memoryless winning strategy for player 0 consists of "If at node $v_{6}$ or at node $v_{4}$, move to node $v_{5}$." Note that player 0 's behavior at nodes $v_{0}$ and $v_{2}$ is irrelevant as these nodes are within the winning region of player 1.

Designing algorithms for the computation of winning regions in parity games is an important theoretical problem as the corresponding decision problem "is a node won by player 0?" is in UP and coUP [12] but not known to be in P. Designing such algorithms is also important for applications since determining winning regions in parity games is equivalent, in polynomial time, to other important problems - we mention model checking formulas of the modal mu-calculus [9,7].

Traditional approaches design algorithms that compute the exact winning regions of parity games, see e.g. the survey in [8]. These algorithms are then either revealed not to be in P - by constructing defeating, worst-case input games - or it is presently not known whether they are in P . In this paper we take a comple-

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Fig. 1. A parity game, taken from [10]. Circled (resp. squared) nodes are owned by player 0 (resp. 1). Directed edges indicate possible game moves. Priorities of nodes are provided within nodes, e.g. $\chi\left(v_{6}\right)=1$.
mentary approach. Instead of designing an algorithm that computes exact winning regions but has complexity that is unknown or known not to be in P , we present a design pattern for algorithms that are in P by construction but compute only subsets of winning regions by partitioning the set of nodes into three regions:

- known wins of player 0: a set $W_{0}$ contained in $\operatorname{Win}_{0}(G)$
- known wins of player 1: a set $W_{1}$ contained in $\operatorname{Win}_{1}(G)$
- and nodes whose winning status is unknown: the set $V \backslash\left(W_{0} \cup W_{1}\right)$.

That is to say, we mean to under-approximate both winning regions $\mathrm{Win}_{0}(G)$ and $\operatorname{Win}_{1}(G)$, and propose to do so through efficient and sound static analyses.

Our approach has practical relevance for at least two reasons.
(i) In local model checking [15] one is only interested in whether a particular state satisfies a formula. This corresponds to determining which player wins a particular node, something our algorithms may well achieve.
(ii) Our algorithms can be used as efficient pre-processors for existing algorithms: due to the invariants satisfied by $W_{\sigma}$ (detailed in Sec. 3), existing algorithms can run directly on the residual parity game induced by $V \backslash\left(W_{0} \cup W_{1}\right)$.
Related to the last point, our invariants guarantee that our design pattern can operate in a completely incremental way by ignoring $W_{0} \cup W_{1}$ in the continuation of computation. We refer to $[7,17]$ for more background material on parity games but strive to make this article self-contained.

## Outline of paper.

In Section 2 we recall some basic concepts for parity games. Our design pattern, its invariants, and correctness are discussed in Section 3. Three aspects, with which our design pattern can be instantiated, are presented and proved to be correct in Section 4. In Section 5, the beneficial interaction of aspects are investigated and a
precision-enhancing transformation for our algorithms are proposed. Related work is featured in Section 6. Plans for future work are revealed in Section 7, and we conclude in Section 8.

## 2 Basic concepts

A set $Y \subseteq V$ of nodes determines its $\sigma$-attractor in $G$, denoted by $\operatorname{Attr}_{\sigma}(G, Y)$, the set of those nodes $v \in V$ for which player $\sigma$ has a memoryless strategy ensuring that all plays started at $v$ either reach a node in $Y$ or a dead end for player $\bar{\sigma}$. In particular, $Y \subseteq \operatorname{Attr}_{\sigma}(G, Y)$. We call $Y$ a $\sigma$-attractor in $G$ iff $Y=\operatorname{Attr}_{\sigma}(G, Y)$. Such $\sigma$-attractors $Y$ satisfy the following, characterizing, closure properties: if $v \in V_{\sigma}$ and $\left(v, v^{\prime}\right) \in E$ for some $v^{\prime} \in Y$, then $v \in Y$. Dually, if $v \in V_{\bar{\sigma}}$ and for all $\left(v, v^{\prime}\right) \in E$ we have $v^{\prime} \in V$, then $v \in Y$.

Example 2.1 The attractor $\operatorname{Attr}_{\sigma}(G,\{ \})$ consists of those nodes $v$ from which player $\sigma$ can ensure that a dead end for player $\bar{\sigma}$ is reached. These attractors are empty for the parity game in Fig. 1 as no dead ends are present. In that parity game, we have $\operatorname{Attr}_{0}\left(G,\left\{v_{4}, v_{5}\right\}\right)=\left\{v_{4}, v_{5}, v_{6}\right\}$.

A set of nodes $T \subseteq V$ is called a $\sigma$-trap in $G$ iff for all nodes $v \in T \cap V_{\sigma}$ and all $\left(v, v^{\prime}\right) \in E$ we have $v^{\prime} \in T$; and for all nodes $w \in T \cap V_{\bar{\sigma}}$ we have some $\left(w, w^{\prime}\right) \in E$ with $w^{\prime} \in T$. It is easy to establish that, for a $\sigma$-attractor $Y$, the complement $V \backslash Y$ is a $\sigma$-trap in $G$.

Example 2.2 For $G$ in Fig. 1, the set $\left\{v_{4}, v_{5}, v_{6}\right\}$ is a 1-trap but $\left\{v_{4}, v_{5}, v_{6}, v_{7}\right\}$ is not: player 1 can escape that set through $\left(v_{7}, v_{0}\right) \in E$ as $v_{7} \in V_{1}$.

A set of nodes $P \subseteq V$ is called a $\sigma$-paradise in $G$ iff $P$ is a $\bar{\sigma}$-trap in $G$ and player $\sigma$ has a memoryless strategy $f: P \cap V_{\sigma} \rightarrow V$ such that she wins all plays beginning in any node in $P$ if played according to strategy $f$. It is not hard to see that $\operatorname{Attr}_{\sigma}(G, P)$ is a $\sigma$-paradise in $G$ whenever this is so for $P$. The union of $\sigma$-paradises is a $\sigma$-paradise so $\operatorname{Win}_{\sigma}(G)$ is the largest $\sigma$-paradise in $G$.

Example 2.3 Sets $\left\},\left\{v_{5}, v_{6}\right\}\right.$, and $\left\{v_{4}, v_{5}, v_{6}\right\}$ are 0-paradises for $G$ in Fig. 1.
For a set of nodes $W \subseteq V$, the parity game $G[W]$ has $W$ as set of nodes, $(W \times W) \cap E$ as edges, and $\chi$ restricted to domain $W$ as priority function. We say that $G[W]$ is a sub-game of $G$ iff all $w \in W$ that are dead ends in $G[W]$ are also dead ends in $G$. It is easy to see that $G[W]$ is a sub-game in $G$ whenever $W$ is a $\sigma$-trap in $G$, for any player $\sigma$.

Example 2.4 For $G$ from Fig. $1, G\left[\left\{v_{4}, v_{5}, v_{6}\right\}\right]$ is a sub-game in $G$ but $G\left[\left\{v_{0}, v_{1}\right\}\right]$ is not: $v_{1}$ is a dead end for player 1 in $G\left[\left\{v_{0}, v_{1}\right\}\right]$ but not in $G$.

A cycle in a directed graph $(V, E)$ is a finite word $v_{0} v_{1} \ldots v_{n}$ over $V$ with $n \geq 1$ such that $v_{0}=v_{n}$ and, for all $i=0, \ldots, n-1$, we have $\left(v_{i}, v_{i+1}\right) \in E$. In particular, self-loops at $v$ - which are edges $(v, v) \in E$ - determine a cycle $v v$.

The work reported in this paper benefits from an explicit representation of redundancies in parity games. This leads to the notion of lax parity games.

Definition 2.5 A lax parity game with index $d$ is a parity game $G$ with index $d$, with two adjustments and one requirement:

- The function $\chi$ maps nodes $v$ to elements of $\{0,1, \ldots, d-1\} \cup\{X\}$, where $X$ is a priority expressing "don't care".
- For an infinite play $\pi=v_{0} v_{1} \ldots$ in $G$, the set $\operatorname{lnf}(\pi)$ is defined as all those priorities other than $X$ that occur in $\chi\left(v_{0}\right) \chi\left(v_{1}\right) \ldots$ infinitely often.
- We then require that $\operatorname{lnf}(\pi)$ is non-empty for all infinite plays $\pi$ in $G$.

Example 2.6 Fig. 6 and 7 depict lax parity games. The parity game in Fig. 10 can be turned into an equivalent lax parity game by changing the priorities of nodes $v_{0}$ and $v_{2}$ to $X$. No further $X$ labels are then allowed as otherwise there will be infinite plays $\pi$ with empty set $\operatorname{lnf}(\pi)$.

All notions discussed for parity games, in particular strategies and winning regions, apply verbatim to lax parity games. Clearly, every parity game is a lax parity game where $X$ is not in the image of $\chi$. Conversely, for any lax parity game $G_{l}$ we can construct, in linear time and logarithmic space, an equivalent parity game $G$ that is simply $G_{l}$ except that all nodes that were labeled with priority $X$ are now labeled with 0 . It is easy to see that $G$ and $G_{l}$ have the same winning regions. In particular, lax parity games are determined. By abuse of language we will refer to lax parity games as parity games subsequently, unless there is a specific need to highlight laxness. The evaluation of maxima and sums containing $X$, e.g. $\max \{0,3, X\}=3$ and $0+2+1+X+3=6$, treats $X$ as being 0 .

Using standard techniques we can transform, in logarithmic space and linear time, a parity game $G$ with node set $V$ into a parity game $G^{\prime}$ with node set $V^{\prime}$ containing $V$ such that $G$ has no dead ends, no self-loops, and $\operatorname{Win}_{\sigma}(G)=V \cap$ $\mathrm{Win}_{\sigma}\left(G^{\prime}\right)$; see Sec. A of the appendix. Due to their simplicity, these transformations won't increase the computational burden on our algorithms. Thus we have:

## Assumption of paper.

Without loss of generality parity games have no dead ends and no self-loops.

## 3 Design pattern

Our design pattern is depicted in Fig. 2. The design pattern first initializes $W_{0}$ and $W_{1}$ to $\}$. Next a cache for the rank function of the parity game is set to be 0 . The while-statement that follows employs a standard termination pattern for the rank function. Its body iterates the execution of $k>0$ many aspects A\#i that run in polynomial time and potentially increase the sets $W_{\sigma}$, or decrease the rank of $G$ in other ways. When that while-statement terminates (when no aspect decreases the rank), the final value of $W_{\sigma}$ represents those nodes that are known to be won by player $\sigma$, whereas $V \backslash\left(W_{0} \cup W_{1}\right)$ contains those nodes whose winning status

```
W_0 = W_1 = {};
cache = 0;
while (rank(G) != cache) {
    cache = rank(G);
    for (i=1; i++; i <= k) { A#i; }
}
return (W0,W1);
```

Fig. 2. Design pattern for algorithms that under-approximate winning regions of parity games in polynomial time. Instantiations of this pattern require a rank function that is polynomial in $|E|,|V|$, and $d$ - where we write $|Y|$ for the cardinality of set $Y$ - and $k \geq 0$ many aspects A\#i that run in polynomial time and may soundly increment sets $W_{\sigma}$ or decrease rank(G).
the (instantiation of the) design pattern cannot classify. See Fig. 3 for illustration. This pattern is inspired by Zielonka's constructive proof of determinacy for parity games [17], except that our pattern is symmetric and non-recursive.

Definition 3.1 Subsequently we write $U$ for the set $V \backslash\left(W_{0} \cup W_{1}\right)$ of nodes whose winning status is yet undecided, and $E_{U}$ for the edge relation $E$ intersected with $U \times U$. Also, $\chi^{U}=\{\chi(v) \mid v \in U\} \backslash\{X\}$ is the set of priorities other than $X$ that occur in set $U$. All these notions have state in our design pattern.

We list the basic invariants for this pattern, which all instantiations need to honor before and after any iteration of the for-statement. If these iterations change state we use primes to denote state after an iteration. The four invariants for our design pattern are:
(P) $W_{\sigma}$ is a $\sigma$-paradise in $G$, and so a $\bar{\sigma}$-trap in $G$
(A) $W_{\sigma}$ is a $\sigma$-attractor in $G$ and $W_{0}$ and $W_{1}$ are disjoint ${ }^{7}$
(L) $G[U]$ is lax (i.e. there are no cycles labeled with $X$ only) and contains neither self-loops nor dead ends for either player
(F) $\operatorname{Win}_{\sigma}(G)=\operatorname{Win}_{\sigma}\left(G^{\prime}\right)$

Invariant (P), for "Paradise", states that $W_{\sigma}$ is a $\sigma$-paradise in $G$ and therefore must be contained in $\operatorname{Win}_{\sigma}(G)$, the largest $\sigma$-paradise in $G$; and a $\sigma$-paradise is a $\bar{\sigma}$-trap by definition. Invariant (A), for "Attractor", states that $W_{\sigma}$ is a $\sigma$-attractor in G. Invariant (L), for "Loops", "Liveness", and "Laxness", states that the subgraph of yet undecided nodes has no node that is a dead end or contains a self-loop, and that the sub-game for these undecided nodes is lax. Invariant (F), for "Frame Condition", states that the winning regions of parity game $G$ don't change. This frame condition is a non-trivial constraint as the aspects A\#i may change structure of $G$; e.g. add/remove edges or nodes, modify the priority function $\chi$, etc. The initialization $W_{\sigma}=\{ \}$ in our design pattern clearly secures all invariants.

Invariants (A) and (P) together guarantee that our design pattern can operate in a completely incremental manner: aspects can effectively ignore set $W_{0} \cup W_{1}$ and its incoming and outgoing edges and execute on the residual game $G[U]$. Invariants $(\mathrm{P})$, (A), and (F) refer to game $G$ not to the incremental game $G[U]$ so our correctness

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Fig. 3. Computing safe winning regions of parity games: the set $V$ of nodes is partitioned into regions $W_{0}$, $W_{1}$, and the complement of their union. That partition satisfies invariants (P), (A), (L), and (F).
proofs will not always be incremental themselves. The next lemma establishes the facts needed for realizing such incrementality in our algorithms.

Lemma 3.2 Let $G$ satisfy invariant ( $A$ ). Then $G[U]$ is a sub-game in $G$ and

$$
\begin{equation*}
\operatorname{Attr}_{\sigma}\left(G, W_{\sigma} \cup Z\right)=W_{\sigma} \cup \operatorname{Attr}_{\sigma}(G[U], Z) \quad \forall Z \subseteq U \tag{1}
\end{equation*}
$$

If, additionally, $G$ satisfies invariant $(P)$, then

$$
\begin{equation*}
\operatorname{Win}_{\sigma}(G[U])=U \cap \operatorname{Win}_{\sigma}(G) \tag{2}
\end{equation*}
$$

Proof. First, we show that $G[U]$ is a sub-game in $G$. Let $v \in U \cap V_{\sigma}$ such that there is no $\left(v, v^{\prime}\right) \in E$ with $v^{\prime} \in U$. We need to show that there is no $\left(v, v^{\prime}\right) \in E$ at all.

- Proof by contradiction: Assume that there is some $v^{\prime} \in V$ with $\left(v, v^{\prime}\right) \in E$. Since $v$ is a dead end in $G[U]$ we have $v^{\prime} \in W_{\sigma} \cup W_{\bar{\sigma}}$. We show that $v^{\prime}$ is in $W_{\bar{\sigma}}$.
- Proof by contradiction: Assume $v^{\prime} \in W_{\sigma}$. Then $v \in V_{\sigma}$ and $\left(v, v^{\prime}\right) \in E$ imply $v \in \operatorname{Attr}_{\sigma}\left(G, W_{\sigma}\right)=W_{\sigma}$ by invariant (A). This contradicts $v \in U$.
Therefore all $v^{\prime}$ with $\left(v, v^{\prime}\right) \in E$ have to be in $W_{\bar{\sigma}}$. But then $v \in \operatorname{Attr}_{\sigma}\left(G, W_{\bar{\sigma}}\right)$ follows, and the latter set is $W_{\bar{\sigma}}$ by invariant (A). This contradicts $v \in U$.

Second, we show (1). Let $Z \subseteq U$.

- Let $v \in \operatorname{Attr}_{\sigma}\left(G, W_{\sigma} \cup Z\right)$. We need to show that $v \in W_{\sigma} \cup \operatorname{Attr}_{\sigma}(G[U], Z)$. If $v \in W_{\sigma}$, this is the case. But $v$ cannot be in $W_{\bar{\sigma}}$ as this is a $\sigma$-trap disjoint from $W_{\sigma} \cup Z$ by invariant (A). So the case $v \in U$ remains to be considered. By
assumption, player $\sigma$ has a memoryless winning strategy $f$, in $G$, such that all plays from $v$ in $G$ that are played according to $f$ either reach a dead end for player $\bar{\sigma}$ or a node in $W_{\sigma} \cup Z$.

Now consider any play in $G[U]$ from node $v$ where player $\sigma$ plays according to $f$. That such plays are played according to $f$ is indeed possible since any node $w$ that is reachable from $v$ in $G[U]$ in such a play (including possibly $v$ itself) and is in $V_{\sigma}$ must satisfy that $f(v)$ is defined (as $f$ is winning) and not in $W_{\sigma}$ (as that set is a $\sigma$-attractor and $w \in U)$. But then any such play in $G[U]$ looks to player $\sigma$ like a play in $G$ played according to $f$. Therefore any such play either reaches a dead end for player $\bar{\sigma}$ or a node in $W_{\sigma} \cup Z$. But since these plays are in $G[U]$, they never reach node set $W_{\sigma}$. This shows $v \in \operatorname{Attr}_{\sigma}(G[U], Z)$ as desired.

- Let $v \in W_{\sigma} \cup \operatorname{Attr}_{\sigma}(G[U], Z)$. We need to show $v \in \operatorname{Attr}_{\sigma}\left(G, W_{\sigma} \cup Z\right)$. If $v \in W_{\sigma}$, we are done as $Y \subseteq \operatorname{Attr}_{\sigma}(G, Y)$ for all $Y \subseteq V$. It remains to consider the case when $v \in \operatorname{Attr}_{\sigma}(G[U], Z)$. Then player $\sigma$ can force, in $G[U]$, all plays from $v$ to either reach a dead end for player $\bar{\sigma}$ or a node in $Z$. But then player $\sigma$ can force, for all plays from $v$ in the larger game $G$, to either reach a dead end for player $\bar{\sigma}$ or a node in $W_{\sigma} \cup Z$. This is so since
- $W_{\bar{\sigma}}$ is a $\bar{\sigma}$-attractor in $G$ by invariant (A) so no node in $U \cap V_{\bar{\sigma}}$ has an edge into $W_{\bar{\sigma}}$
and so player $\bar{\sigma}$ can avoid both, a dead end for him and node set $Z$, only by either player choosing an edge into $W_{\sigma}$.
This shows $v \in \operatorname{Attr}_{\sigma}\left(G, W_{\sigma} \cup Z\right)$.
Third, we show (2). Since $\sigma$ is 0 or 1 and since parity games are determined it suffices to show that $\operatorname{Win}_{\sigma}(G[U]) \subseteq \operatorname{Win}_{\sigma}(G)$. Let $v \in \operatorname{Win}_{\sigma}(G[U])$. Then $v \in U$. Consider any play $\pi=v_{0} v_{1} \ldots$ obtained when player $\sigma$ plays a winning strategy for $v \in \operatorname{Win}_{\sigma}(G[U])$ in $G[U]$ (until and if $\pi$ reaches $W_{0} \cup W_{1}$ when player $\sigma$ plays her winning strategy in $W_{\sigma}$ and whichever way in $W_{\bar{\sigma}}$ ) and player $\bar{\sigma}$ plays any strategy in $G$. Then $\pi$ cannot reach the set $W_{0} \cup W_{1}$ unless $\pi$ is won by player $\sigma$, as can be seen by a case analysis of the ownership of any node $v_{n}$ reached in that play:
- If $v_{n}$ is owned by player $\sigma$, then his winning strategy in $G[U]$ will pick some $v_{n+1} \in U$ with $\left(v_{n}, v_{n+1}\right) \in E$.
- If $v_{n}$ is owned by player $\bar{\sigma}$, he also needs to pick some $v_{n+1}$ with $\left(v_{n}, v_{n+1}\right) \in E$. If that chosen $v_{n+1}$ is in $W_{\sigma}$, then $\pi$ is won by player $\sigma$ as she will trap $\pi$ in its $\sigma$-paradise $W_{\sigma}$ in $G$ by invariant $(\mathrm{P})$. On the other hand, $v_{n+1}$ cannot be chosen from $W_{\bar{\sigma}}$ as this contradicts that $W_{\bar{\sigma}}$ is a $\bar{\sigma}$-attractor in $G$ and $v_{n} \in U \cap V_{\bar{\sigma}}$.

In conclusion, $\pi$ is won by player $\sigma$ in $U$ or in $W_{\sigma}$.

The lemma above means that it suffices to analyze the winning status of yet undecided nodes $v \in U$ by performing these analyses in the sub-game $G[U]$, effectively ignoring the sets $W_{\sigma}$ and their incoming and outgoing transitions. In particular, aspects that can increase $W_{\sigma}$ maintain invariants (A) and (P) in a completely incremental manner by computing the right-hand side of (1) as new value of $W_{\sigma}$ whenever $Z \subseteq U$ has been revealed as a $\sigma$-paradise in $G[U]$. We will follow this incremental
approach in aspect $A_{3}$ discussed below. This incremental approach will also allow an incremental computation and storage of memoryless winning strategies in our design pattern which, for sake of brevity, we will not discuss in this paper. Adding such functionality is a routine matter.

## 4 Aspects

Aspects only have to maintain the invariants (P), (A), (L), and (F) and ensure that their instantiations in our design pattern run in polynomial time. In this paper we explore a few salient aspects, based on efficient static analyses, which have one or more of the following features:

- An aspect may abstract away the role of players by exploiting the cyclic structure in the directed graph $\left(U, E_{U}\right)$ labeled by $\chi$ in order to change and simplify $\chi$.
- An aspect may abstract, soundly for wins of one player, sets of priority values into a single priority value in order to increase $W_{\sigma}$.
- An aspect may be deterministic or contain non-deterministic choices. In the latter case, a scheduler is needed to resolve such non-determinism.


## Aspect $A_{1}$

Aspect $A_{1}$ ignores the role of players and exploits cycles in the directed graph $\left(U, E_{U}\right)$ to modify the priority function $\chi$. It checks, for each node $v \in U$ with $2 \leq \chi(v) \neq X$, whether no cycle in $\left(U, E_{U}\right)$ through $v$ contains some node $w$ with $\chi(w)=\chi(v)-1$. If there is indeed no such cycle, it decrements $\chi(v)$ to $\chi(v)-2$. This aspect gets rid of "gaps" in $\chi^{U}$. For example, $\chi^{U}=\{0,1,3\}$, which may occur on-the-fly, would change eventually to $\{0,1\}$.

Example 4.1 - For $G$ in Fig. 1 with $W_{\sigma}=\{ \}$ there are only two nodes $v_{4}$ and $v_{5}$ with priorities larger than 1. But their priority is 2 and each of these nodes has a cycle on which priority 1 occurs. Thus aspect $A_{1}$ has no effect on $G$.

- Consider the parity game $G$ in Fig. 4. Only node $v_{1}$ has priority strictly larger than 1 , namely 3 . Since there is no node with priority 2 , aspect $A_{1}$ re-sets $\chi\left(v_{1}\right)$ to 1 on empty $W_{\sigma}$, reducing the index of $G$.

We prove the correctness of aspect $A_{1}$.
Theorem 4.2 Let $G$ satisfy invariants ( $P$ ), (A), (L), and (F). Any decrement of $\chi$ according to aspect $A_{1}$ maintains these invariants.

Proof. Let $G$ satisfy the invariants (P), (A), (L), and (F). Let $v$ be a node in $U$ such that no cycle in $\left(U, E_{U}\right)$ through $v$ contains a node with priority $\chi(v)-1$. Let $G^{\prime}$ be the game resulting from $G$ by assigning priority $\chi(v)-2$ to $v$ and leaving $G$ unchanged in all other regards. We have to prove that the invariants still hold.

For invariant $(\mathrm{P})$, since the game graph of $G^{\prime}$ is that of $G$ and since $\chi$ did not change within $W_{\sigma}$ we infer that $W_{\sigma}$ is (still) a $\sigma$-paradise in $G$ and in $G^{\prime}$. A similar reasoning applies to invariants (A) and (L). (For example, $G^{\prime}[U]$ is a lax parity game


Fig. 4. A parity game $G$ for which aspect $A_{1}$ re-sets $\chi\left(v_{1}\right)$ from 3 to 1 , thereby decreasing the index of $G$.
since $G[U]$ is, the game graph of $G^{\prime}[U]$ is that of $G[U]$, and the inverse image of $X$ is the same for $\chi$ and $\chi^{\prime}$.)

It remains to show invariant (F), i.e. $\operatorname{Win}_{\sigma}\left(G^{\prime}\right)=\operatorname{Win}_{\sigma}(G)$. Since invariant (P) holds for $G^{\prime}$, it suffices to show that $\operatorname{Win}_{\sigma}\left(G^{\prime}[U]\right)=\operatorname{Win}_{\sigma}(G[U])$ by (2). Let $p_{v}=\chi(v) \bmod 2$. Since aspect $A_{1}$ only made $\chi(v)$ smaller by 2 , any node $z$ that is won by player $\overline{p_{v}}$ in $G[U]$ is certainly still won by that player in $G[U]^{\prime}$. Since parity games are determined it therefore suffices to show that any node $z$ that is won by player $p_{v}$ in $G[U]$ is still won by player $p_{v}$ in game $G^{\prime}[U]$.

Proof by contradiction: Let $z$ be won by player $\overline{p_{v}}$ in game $G^{\prime}[U]$ and let $\pi$ be the play starting in $z$ and obtained when player $p_{v}$ plays her strategy for winning $z$ in $G[U]$, and player $\overline{p_{v}}$ plays his strategy for winning $z$ in $G^{\prime}[U]$. Since the only change from $G[U]$ to $G^{\prime}[U]$ is a decrement of $\chi$ by 2 at node $v$, this therefore means that $\chi(v)-1$ has to be in $\operatorname{lnf}(\pi)$ in $G[U]$; otherwise player $\overline{p_{v}}$ could not win $\pi$ in $G^{\prime}[U]$. But then $\chi(v)-1$ is the maximal parity in $\operatorname{lnf}(\pi)$ in $G^{\prime}[U]$ and so the maximal parity in $\operatorname{lnf}(\pi)$ in $G[U]$ has to be $\chi(v)$ and occurs only since $v$ occurs infinitely often in $\pi$; otherwise player $p_{v}$ would not win $\pi$ in $G[U]$ and player $\overline{p_{v}}$ could not win $\pi$ in $G^{\prime}[U]$. To summarize, there is an infinite play $\pi$ in $U$ from $z$ such that $v$ occurs infinitely often in $\pi$ and $\chi(v)-1$ is $\operatorname{in} \operatorname{lnf}(\pi)$. This implies that there is a cycle $C$ in $\left(U, E_{U}\right)$ through $v$ containing a node $w_{C}$ satisfying $\chi\left(w_{C}\right)=\chi(v)-1$, a contradiction to the application criterion for aspect $A_{1}$ at node $v$ in $G$.

We remark that aspect $A_{1}$ can be implemented to run in polynomial time. For each $v \in V$ with $2 \leq \chi(v) \neq X$, consider the set

$$
T=\{w \in U \mid \chi(w)=\chi(v)-1\}
$$

We then have to check, in $\left(U, E_{U}\right)$, whether there is some $t \in T$ that is reachable from $v$; and from which $v$ is in turn reachable in $\left(U, E_{U}\right)$. If there is no such $t \in T$, we can decrement the priority of $v$ by 2 .

## Aspect $A_{2}$

Aspect $A_{2}$ asks whether, for any $v \in U$ with $\chi(v) \neq X$, all cycles $C$ in $\left(U, E_{U}\right)$ through $v$ have some $w_{C} \neq v$ in $C$ with $\chi(v) \leq \chi\left(w_{C}\right) \neq X$. If so, aspect $A_{2}$ re-sets


Fig. 5. A parity game for which aspect $A_{2}$ has non-deterministic choices that result in different lax parity games upon the scheduling of execution for this aspect.


Fig. 6. A lax parity game computed by aspect $A_{2}$ when it prefers to change the priority at $v_{2}$ over changing that of $v_{1}$. Changing one preempts any subsequent change of the other.
$\chi(v)$ to $X .{ }^{8}$
Example 4.3 - Reconsider the parity game $G$ in Fig. 4. Since all cycles in the game graph of $G$ have to pass through $v_{1}$, aspect $A_{2}$ computes the same lax parity game $G^{\prime}$ regardless of the order in which priorities are re-set to $X$. In $G^{\prime}$ all states except $v_{1}$ have priority $X$. (Since $\chi\left(v_{1}\right) \bmod 2=1$, this means $V=\operatorname{Win}_{1}(G)$.)

- Non-determinism of aspect $A_{2}$ is not always confluent. Applying aspect $A_{2}$ to the parity game in Fig. 5 results in the parity games depicted in Fig. 6 and 7.

We prove the correctness of aspect $A_{2}$.
Theorem 4.4 Let $G$ satisfy invariants ( $P$ ), (A), (L), and (F). Any change of $\chi$ in aspect $A_{2}$ maintains these invariants.

Proof. Let $G$ satisfy the invariants (P), (A), (L), and (F). Let $v$ be a node in $U$ with $\chi(v) \neq X$ such that all cycles $C$ in $\left(U, E_{U}\right)$ through $v$ contain some node $w_{C} \neq v$ with $\chi(v) \leq \chi\left(w_{C}\right) \neq X$. Let $G^{\prime}$ be the game resulting from $G$ by assigning priority $X$ to $v$ and leaving $G$ unchanged in all other regards. We have to prove

[^3]

Fig. 7. A lax parity game, different from the one in Fig. 6, computed by aspect $A_{2}$ when it prefers to change the priority at $v_{1}$ over changing that of $v_{2}$.
that the invariants still hold. For invariant (P) and (A), and for the dead-end and self-loop part of invariant (L) we reason in the same manner as for aspect $A_{1}$.

For the remaining part of invariant ( L ), the laxness of $G[U]$, consider any infinite play $\pi$ in $G[U]$. If $v$ does not occur infinitely often in $\pi$, then $\operatorname{lnf}(\pi)$ is the same set for $G[U]$ and for $G^{\prime}[U]$ and so non-empty as $G[U]$ is lax. If $v$ does occur infinitely often in $\pi$, then by assumption on the applicability of aspect $A_{2}$ at $v$ there is a cycle $C$ through $v$ contained in $\pi$ that has some $w_{C} \neq v$ in $C$ with $\chi(v) \leq \chi\left(w_{C}\right) \neq X$ in $G$. So $\chi\left(w_{C}\right)$ is in $\operatorname{Inf}(\pi)$ in $G[U]$ and in $G^{\prime}[U]$.

For invariant (F), we reason as for aspect $A_{1}$ and so it suffices, by (2), to show that $\operatorname{Win}_{\sigma}\left(G^{\prime}[U]\right)=\operatorname{Win}_{\sigma}(G[U])$. Let $z \in \operatorname{Win}_{\sigma}(G[U])$. Since $\sigma \in\{0,1\}$ and since parity games are determined it remains to show $z \in \operatorname{Win}_{\sigma}\left(G^{\prime}[U]\right)$. Consider $\pi$, the play starting in $z$ and obtained when player $\sigma$ plays her strategy for winning $z$ in $G[U]$, and player $\bar{\sigma}$ plays any strategy. It remains to show that $\pi$ is won by player $\sigma$ in $G^{\prime}[U]$. By invariant ( L ) for $G^{\prime}[U]$, the play $\pi$ is infinite and in $U$. Since the change from $G$ to $G^{\prime}$ concerns only the priority of node $v$, we are done if $v$ does not occur infinitely often in $\pi$. Otherwise $v$ occurs infinitely often in $\pi$. But then, since $\pi$ is in $U$, there is a cycle $C$ through $v$ in $\left(U, E_{U}\right)$ such that all of its nodes are on $\pi$. By the application criterion for aspect $A_{2}$ at $v$ there is some $w_{C} \neq v$ in $C$ with $\chi(v) \leq \chi\left(w_{C}\right) \neq X$. But then $\chi(v)$ and $\chi\left(w_{C}\right)$ are in $\operatorname{lnf}(\pi)$ in $G[U]$ and so setting the priority of $v$ to $X$ does not affect the winning condition for $\pi$ in $G^{\prime}[U]$ as $v \neq w_{C}$ and the priority value of $v$ in $G[U]$ has $\chi\left(w_{C}\right)$ as an upper bound in $G[U]$. $\square$

Aspect $A_{2}$ can be implemented to run in polynomial time by checking, for $v \in U$, the negation of this aspect's applicability criterion: that there is a cycle $C$ in $\left(U, E_{U}\right)$ through $v$ such that all nodes $w \neq v$ in $C$ satisfy " $\chi(w)=X$ or $\chi(w)<\chi(v)$ ". By invariant (L) the edge $(v, v)$ is not in $E$ so this can be reduced to a reachability analysis that checks whether there is a cycle through $v$ in the full subgraph of ( $U, E_{U}$ ) for node set

$$
\{v\} \cup\{w \in U \mid \chi(w)=X \text { or } \chi(w)<\chi(v)\}
$$

```
n := max { chi(v) | v in U };
s := n mod 2;
for (k = 0; k++; 2*k <= n) {
    Z_s = checkInfFin({n,n-2,\ldots.,n-2*k}, {n-1,n-3,\ldots, n-2*k+1}, s);
    if (Z_s != {}) { W_s := W_s + Attr_s(G[U], Z_s); }
    Z_{1-s} = checkInfFin({n-1,n-3,\ldots,n-2*k-1}, {n,n-2, ...,n-2*k}, 1-s);
    if (Z_{1-s} != {}) { W_{1-s} := W_{1-s} + Attr_{1-s}(G[U], Z__ {1-s}); }
```

Fig. 8. Pseudo-code for aspect $A_{3}$. It computes maximal priority $n$ occurring in $U$ and its parity $s$. Then it has $\lfloor n / 2\rfloor$ iterations in which intervals of odd (resp. even) priorities are abstracted into a single odd (resp. even) priority and fed to a parity game checkInfFin over $U$ with index 3 , of which only the non-empty winning region for its argument player $\sigma(=\mathbf{s})$ is added to $W_{\sigma}$ and closed under $\sigma$-attraction in $G$.

## Aspect $A_{3}$

Aspects $A_{1}$ and $A_{2}$ may simplify $\chi$ but won't change $W_{\sigma}$ themselves. In an attempt to increase $W_{\sigma}$, aspect $A_{3}$ retains the role of players in the game graph ( $U, E_{U}$ ) but abstracts intervals of odd (resp. even) priorities into an odd (resp. even) priority and solves, in polynomial time, a game for each such abstraction. Its pseudo-code is given in Fig. 8 where + denotes set union, $\{x, \ldots, y\}$ is interpreted as $\}$ whenever $x<y$, and the method checkInfFin(I,F,p) returns those nodes in $U$ for which player $p \in\{0,1\}$ can win all plays in the game graph $\left(U, E_{U}\right)$ of sub-game $G[U]$ with the new winning condition

## "priorities set I is met infinitely often, and priorities set $F$ only finitely often"

for all infinite plays. This can be expressed as a parity game of index 3 over that game graph $\left(U, E_{U}\right) .{ }^{9}$ Note the incremental computation of $W_{\sigma}$ in aspect $A_{3}$ as $W_{\sigma} \cup \operatorname{Attr}_{\sigma}\left(G[U], Z_{\sigma}\right)$, which is sound due to (1).

Example 4.5 For $G$ in Fig. 1 let $U=V$ and $W_{\sigma}=\{ \}$ initially. We execute the pseudo-code for aspect $A_{3}$. The maximal priority in $U$ is $n=2$ and its parity $s=0$. The for-statement has two iterations. For $k=0$, two games are being played:

- In game checkInfFin $(\{2\},\{ \}, 0)$ the set $Z_{0}$ gets assigned those nodes in $U$ from which player 0 can force priority 2 to occur infinitely often in the game graph of $G[U]=G$. Then $Z_{0}=\left\{v_{4}, v_{5}, v_{6}\right\}$ follows and $W_{0}$ is the union of $\}$ and $\operatorname{Attr}_{0}\left(G[U],\left\{v_{4}, v_{5}, v_{6}\right\}\right)$, which is $\left\{v_{4}, v_{5}, v_{6}\right\}$ and equals $\operatorname{Win}_{0}(G)$.
- In game checkInfFin $(\{1\},\{2\}, 1)$ the set $Z_{1}$ is comprised of those nodes where player 1 can force 1 to occur infinitely often while, at the same time, ensuring that 2 only occurs finitely often in the sub-game $G[U]$ which now equals $G[V \backslash$ $\left.\left\{v_{4}, v_{5}, v_{6}\right\}\right]=G\left[\left\{v_{0}, v_{1}, v_{2}, v_{3}, v_{7}\right\}\right]$. Since priority 2 does not occur in $G[U]$, and since $1 \in \operatorname{lnf}(\pi)$ for all plays $\pi$ is $G[U]$, we get $Z_{1}=\left\{v_{0}, v_{1}, v_{2}, v_{3}, v_{7}\right\}$ and so $W_{1}$ computes to $\left\{v_{0}, v_{1}, v_{2}, v_{3}, v_{7}\right\}=\operatorname{Win}_{1}(G)$.
Therefore further iterations won't add anything. ${ }^{10}$

[^4]Note that it is sound not to re-compute n and s in, or in between, iterations with aspect $A_{3}$ when $U$ has become smaller, as seen in Example 4.5. We illustrate aspect $A_{3}$ with a more complex example.

Example 4.6 The algorithm in [13] is among the most efficient ones known for solving parity games. Jurdziński demonstrated in loc. cit. that this algorithm has exponential running time in the worst case. Fig. 9 shows an instance of his parameterized family of worst-case input games (in our paper presented with a maximum parity acceptance condition), the parity game $H_{3,4}$ of loc. cit. The maximal priority occurring in the initial $U=V$ is $n=7$. Its parity is $s=1$.

- First iteration, $k=0$ :
- In game checkInfFin $(\{7\},\{ \}, 1)$ player 1 cannot win any nodes in $U$ as player 0 can simply move to the right from any node $v_{4}, v_{6}$, and $v_{8}$.
- In game checkInfFin $(\{6\},\{7\}, 0)$ player 0 wins nodes $v_{0}, \ldots, v_{9}$ as player 0 can simply move to the right from any node $v_{4}, v_{6}$, and $v_{8}$. Thus $W_{0}$ becomes $\left\} \cup \operatorname{Attr}_{0}\left(G[V],\left\{v_{0}, \ldots, v_{9}\right\}\right)=\left\{v_{0}, \ldots, v_{9}\right\}\right.$.
- Second iteration, $k=1$ :
- In game checkInfFin $(\{7,5\},\{6\}, 1)$ player 1 cannot win any nodes in $U=$ $\left\{v_{10}, \ldots, v_{36}\right\}$ as player 0 can simply move to the right from any node $v_{21}, v_{23}$, and $v_{25}$.
- In game checkInfFin $(\{6,4\},\{7,5\}, 0)$ player 0 wins nodes $v_{20}, \ldots, v_{26}$ in $U$ as player 0 can simply move to the right from any node $v_{21}, v_{23}$, and $v_{25}$. Thus $W_{0}$ becomes $\left\{v_{0}, \ldots, v_{9}\right\} \cup\left\{v_{20}, \ldots, v_{26}\right\}$.
- Third iteration, $k=2$ :
- In game checkInfFin $(\{7,5,3\},\{6,4\}, 1)$ player 1 cannot win any nodes in $U=\left\{v_{10}, \ldots, v_{19}\right\} \cup\left\{v_{27}, \ldots, v_{36}\right\}$ as player 0 can simply move to the right from any node $v_{31}, v_{33}$, and $v_{35}$.
- In game checkInfFin $(\{6,4,2\},\{7,5,3\}, 0)$ player 0 wins nodes $v_{30}, \ldots, v_{36}$ in $U$ as player 0 can simply move to the right from any node $v_{31}, v_{33}$, and $v_{35}$. Thus $W_{0}$ becomes $V \backslash\left\{v_{10}, \ldots, v_{16}\right\}$ and $U$ becomes $\left\{v_{10}, \ldots, v_{16}\right\}$.
- Fourth iteration, $k=3$ :
- In game checkInfFin $(\{7,5,3,1\},\{6,4,2\}, 1)$ player 1 wins all nodes in $U=$ $\left\{v_{10}, \ldots, v_{16}\right\}$ as player 1 can simply move to the right from any node $v_{11}, v_{13}$, and $v_{15}$. So $W_{1}$ becomes $\left\{v_{10}, \ldots, v_{16}\right\}$ and $U$ becomes $\}$, meaning that aspect $A_{3}$ cannot compute anything further and solves that game completely.

We show the correctness of aspect $A_{3}$.
Theorem 4.7 Let $G$ satisfy the invariants $(P),(A),(L)$, and $(F)$. Then the execution of aspect $A_{3}$ maintains all of these invariants.

Proof. Let $G$ satisfy the invariants (P), (A), (L), and (F) and let $G^{\prime}$ be the result of executing aspect $A_{3}$ on $G$.

For invariant (P), by Lemma 3.2 it suffices to show that all sets $Z_{\sigma}$ computed in $A_{3}$ are $\sigma$-paradises in $G[U]$. This is so since $W_{\sigma}$ satisfies ( P ) and since $\sigma$-paradises


Fig. 9. A parity game $H_{3,4}$ for which the algorithm in [13] has exponential running time, as shown in loc. cit.. Nodes with priority values 3,5 , and 7 omit ownership of players as $\operatorname{Win}_{\sigma}\left(H_{3,4}\right)$ isn't impacted by this.
in $G$ are closed under unions and $\sigma$-attractors in $G$. Let $0 \leq 2 k \leq n$.

- Let $v \in Z_{s}$ for the $Z_{s}$ computed for that value of $k$. Then player $s$ has a memoryless strategy for which all plays $\pi$ in $G[U]$ beginning at $v$ and following that strategy satisfy $\operatorname{lnf}(\pi) \cap\{n, n-2, \ldots, n-2 k\} \neq\{ \}, \operatorname{lnf}(\pi) \cap\{n-1, n-3, n-2 k+1\}=\{ \}$, and trap player $\bar{s}$ in set $Z_{s}$. Therefore, all these plays are won by player $s$ in $G[U]$.
- A similar reasoning applies to $v \in Z_{\bar{s}}$ to show that $Z_{\bar{s}}$ is contained in $\operatorname{Win}_{\bar{s}}(G[U])$.

Invariant (A) is enforced by appealing to (1). Invariants (L) and (F) hold as the game graph and priority function of $G$ won't change.

Note that aspect $A_{3}$ has a straightforward implementation in polynomial time as it involves at most $n$ games checkInfFin - parity games of bounded index 3 - and $n$ computations of $\sigma$-attractors in $G[U]$.

## 5 Interaction

By abuse of notation, we write $A_{i_{1}} A_{i_{2}} \ldots A_{i_{k}}$ for the algorithm that instantiates our design pattern with each A\#i being $A_{i_{k}}$. In particular, A\#i may equal A\#j if $i \neq j$. We write $\left\{A_{i_{1}} A_{i_{2}} \ldots A_{i_{k}}\right\}$ if we mean any of the $k$ ! algorithms obtained by permutations of these aspects $A_{i_{j}}$.

Fundamental questions are whether the interaction of these aspects commutes, whether swapping two aspects is in some sense confluent, and whether certain aspects can't aid the progress of certain others. These questions are similar to the "phase ordering problem" in the design of optimizing compilers, and won't be addressed further in this paper due to space limitations.

For each instantiation, a suitable rank function has to be determined. A rank


Fig. 10. A parity game for which the instantiation $A_{3}$ of our design pattern returns $W_{\sigma}=\{ \}$ but for which the instantiations $\left\{A_{2} A_{3}\right\}$ solve the game completely.


Fig. 11. A parity game of index 3 for which $\left\{A_{1} A_{2} A_{3}\right\}$ returns $W_{\sigma}=\{ \}$.
function for $A_{3}$ is

$$
\operatorname{rank}(G)=|U|
$$

A rank function for $\left\{A_{1} A_{3}\right\},\left\{A_{2} A_{3}\right\}$, and $\left\{A_{1} A_{2} A_{3}\right\}$ is ${ }^{11}$

$$
\operatorname{rank}(G)=|U|+\sum_{v \in U} \chi(v)
$$

The interaction of aspects can improve the precision of algorithms derived from our design pattern. We illustrate this point by means of a simple example.

Example 5.1 For the parity game $G$ in Fig. 10, the instantiation $A_{3}$ of our design pattern computes empty sets $W_{\sigma}$, whereas $\left\{A_{2} A_{3}\right\}$ completely solves this parity game: aspect $A_{2}$ re-sets $\chi\left(v_{2}\right)$ from 2 to $X$ and then checkInfFin $(\{3,1\},\{2\}, 1)$ easily determines within aspect $A_{3}$ that player 1 wins all nodes.

We now show the incompleteness of $\left\{A_{1} A_{2} A_{3}\right\}$, even for parity games of index 3. This illustrates a potential weakness of our design pattern when all its aspects limit the role of players to a bounded scope of alternation.

[^5]Example 5.2 Parity game $G$ in Fig. 11 has index 3. Aspect $A_{1}$ has no effect as any cycle through $v_{0}$ passes through $v_{1}$. Aspect $A_{3}$ won't increase any $W_{\sigma}$ in the game checkInfFin $(\{2\},\{ \}, 0)$ (since player 1 may move from $v_{2}$ to $v_{3}$ ), game check $\operatorname{InfFin}(\{1\},\{2\}, 1)$ (since player 0 may move from $v_{1}$ to $v_{0}$ ), game checkInfFin $(\{2,0\},\{1\}, 0)$ (since player 1 may move from $v_{2}$ to $v_{1}$ ), and game checkInfFin $(\{1\},\{2,0\}, 1)$ (since player 0 may move from $v_{1}$ to $v_{0}$ ). The only applications for aspect $A_{2}$ are at nodes $v_{2}$ and $v_{3}$. But changing the priority to $X$ at any of these nodes prevents a change at the other, and the resulting game has no applications of $A_{2}$, and none for $A_{1}$ and $A_{3}$ for the same reasons as given before.

In Fig. 12 we suggest a transformation $A \mapsto \operatorname{probe}(A)$ of any instantiation $A=A_{i_{1}} A_{i_{2}} \ldots A_{i_{k}}$ of our algorithm that can be used to increase its precision. The method probe has as input a method $A$ that, if called on a parity game $G$, returns a pair $(\operatorname{first}(A(G)), \operatorname{second}(A(G)))$ such that $\operatorname{first}(A(G)) \subseteq \operatorname{Win}_{G}(0)$ and second $(A(G)) \subseteq \operatorname{Win}_{G}(1)$. Moreover, it is not hard to see (but won't be needed in this paper) that the parity game and regions $W_{0}=\operatorname{first}(\operatorname{probe}(A)(G))$ and $W_{1}=\operatorname{second}(\operatorname{probe}(A)(G))$ computed by probe $(A)$ satisfy our four invariants if those computed by $A$ do.

Method probe uses method $A$ to probe whether the winning status of additional nodes can be recognized. A call to probe ( $A$ ) attempts to increase $W_{\sigma}$ in different stages. For sake of brevity we only present two of the four stages we discovered:

- Stage (1): It assumes that an undecided node $v$ is not won by the player who owns $v$, and uses method A to then derive a contradiction (as the winning regions of $G$ won't change if all edges but a single one out of $v$ are being removed). If a contradiction is found, $v$ is then known to be won by the player who owns $v$. If no contradiction is found, nothing is known about the winning status of $v$. So stage (1) fixes a node $v$ and computes winning regions for derived games in an attempt of making inferences about node $v$ only.
- Stage (2): It makes no assumptions about the winning status of any undecided node but, for such an undecided node $v$, it computes the winning regions underapproximated by A for those games on which only one outgoing edge of $v$ remains. If a node $z$ is thus determined to be won by a particular player $\sigma$, regardless of which edge out of $v$ remained, we know that, irrespective of who owns $v$ or $z$, node $z$ is indeed won by player $\sigma$ in the original game. So stage (2) fixes a node $v$ and computes sets of under-approximated winning regions for derived games and then decides the winning status of nodes in the intersection of these computed regions. In particular, it decides the winning status of node $v$ only if $v$ occurs in said intersection.
We now give a more detailed account of these stages and their soundness.
In stage (1), the hypothesis is that nodes are won by those players that own them. So let $v \in V_{\sigma}$ and let

$$
S=\{w \in V \mid(v, w) \in E\}
$$

be the set of nodes that can be reached from $v$ via a single edge. By invariant (L) we may assume that $S$ is non-empty. If $S$ is a singleton, then $v$ is a deterministic node and won't be tested by probe under this hypothesis. So let $|S| \geq 2$. The analysis attempts to use proof by contradiction: Assume that $v \in \operatorname{Win}_{\bar{\sigma}}(G)$.

- Then it won't matter which edge $(v, w)$ player $\sigma$ chooses as player $\bar{\sigma}$ can trap any play through $v$ in $\operatorname{Win}_{\bar{\sigma}}(G)$. In particular, if for $w \in S$ we write $G_{(v, w)}$ for the parity game that is $G$ except that $(v, w)$ is now the only outgoing edge from $v$, then $G$ and $G_{(v, w)}$ have the same winning regions. Now let $w_{1} \neq w_{2}$ in $S$. If there is some $z \in \operatorname{first}\left(A\left(G_{\left(v, w_{1}\right)}\right)\right) \cap \operatorname{second}\left(A\left(G_{\left(v, w_{2}\right)}\right)\right)$ we know that $z$ is in $\operatorname{first}\left(A\left(G_{\left(v, w_{1}\right)}\right)\right) \subseteq \operatorname{Win}_{0}\left(G_{\left(v, w_{1}\right)}\right)=\mathrm{Win}_{0}(G)$ as method $A$ under-approximates winning regions of $G$ and since $v$ is assumed to be in $\operatorname{Win}_{\bar{\sigma}}(G)$. Similarly, we know $z \in \operatorname{second}\left(A\left(G_{\left(v, w_{2}\right)}\right)\right) \subseteq \operatorname{Win}_{1}\left(G_{\left(v, w_{2}\right)}\right)=\operatorname{Win}_{1}(G)$. But then $z \in \operatorname{Win}_{0}(G) \cap$ $\mathrm{Win}_{1}(G)$ contradicts the determinacy of parity game $G$. Therefore $v \notin \mathrm{Win}_{\bar{\sigma}}(G)$, i.e. $v \in \mathrm{Win}_{\sigma}(G)$, follows.
- A similar argument for proving $v \in \mathrm{Win}_{\sigma}(G)$ can be made if the intersection $\operatorname{second}\left(A\left(G_{\left(v, w_{1}\right)}\right)\right) \cap \operatorname{first}\left(A\left(G_{\left(v, w_{2}\right)}\right)\right)$ is non-empty.
This reasoning principle is implemented in the for-statement forall w1 != w2 in S of the pseudo-code in Fig. 12. Note that these arguments only work if at least one of these intersections is non-empty. For example, if $v$ has exactly two outgoing edges $(v, w)$ and $\left(v, w^{\prime}\right)$, no new wins will be determined iff the sets $\operatorname{first}\left(A\left(G_{(v, w)}\right)\right)$, $\operatorname{first}\left(A\left(G_{\left(v, w^{\prime}\right)}\right)\right)$, $\operatorname{second}\left(A\left(G_{(v, w)}\right)\right)$, and $\operatorname{second}\left(A\left(G_{\left(v, w^{\prime}\right)}\right)\right)$ are pairwise disjoint.

In stage (2), method probe employs a second analysis, in which nothing is being assumed about the winning status of any undecided node. The for-statement forall w in S , for a fixed node $v$, collects in Z_0 those nodes $z$ that are known to be won by player 0 in all games $G_{(v, w)}$ with $(v, w) \in E$ an outgoing edge of $v$. Let $v \in V_{\sigma}$. We claim that $z \in \operatorname{Win}_{0}(G)$ and do a case analysis on who wins $v$ :

- Let $v \in \operatorname{Win}_{\sigma}(G)$. Then player $\sigma$ has some edge $(v, w) \in E$ as part of her memoryless winning strategy and so the winning regions of $G$ and $G_{(v, w)}$ are the same. In particular, $z \in \operatorname{Win}_{0}\left(G_{(v, w)}\right)=\mathrm{Win}_{0}(G)$ since $A$ under-approximates winning regions.
- Let $v \in \operatorname{Win}_{\bar{\sigma}}(G)$. Then player $\sigma$, who owns $v$, loses node $v$ and so the winning regions of $G$ and all $G_{(v, w)}$ are equal, from which $z \in \operatorname{Win}_{0}(G)$ follows as in the previous item.
Note that we need to form intersections in stage (2) since we don't know which player wins $v$, or which edge from $v$ is part of a memoryless winning strategy.

For the computation of Z_1 a similar argument for showing $z \in \mathrm{Win}_{1}(G)$ applies if $z$ is in $\operatorname{second}\left(A\left(G_{(v, w)}\right)\right)$ for all $w \in S$.

The remaining parts of the pseudo-code just provide the infrastructure for collecting nodes whose winning status has been discovered by one of these two stages, noting that probe (A) ensures invariant (A).

Example 5.3 • We illustrate the working of the first stage of probe (A) where A is simply $A_{3}$ and $G$ the parity game in Fig. 13. Assuming that $v_{1}$ is won by player

```
probe(A) {
W_0 = W_1 = {};
forall v in V {
    S = { w | (v,w) in E };
    % stage (1)
    forall w1 != w2 in S {
        if ((first(A(G_(v,w1))) & second(A(G_(v,w2)))) != {} ) ||
                    (second(A(G_(v,w1))) & first(A(G_(v,w2)))) != {} ) {
            if (v in V_O) { W_O = Attr_O(G, W_O + {v} ) ; }
            else { W_1 = Attr_1(G, W_1 + {v} ) ; }
        }
    }
    % stage (2)
    if (S = {}) { Z_0 = Z_1 = {}; }
    else { Z_0 = Z_1 = V; }
    forall w in S {
        Z_0 = Z_0 & first(A(G_(v,w)));
        Z_1 = Z_1 & second(A(G_(v,w)));
    }
    % postprocessing: secure invariant (A)
    W_O = Attr_O( G, W_O + Z_O );
    W_1 = Attr_1( G, W_1 + Z_1 );
}
return (W_0,W_1);
```

Fig. 12. Pseudo-code for method probe. Its input is a method A that computes under-approximations of winning regions. In probe (A) one uses method A on versions of $G$ that commit to specific edges from nodes and then analyses the collection of results to detect winning nodes for $G$. The combinatorics of these analyses rely on the fact that winning strategies are memoryless and that nodes that are not won by the player who owns them satisfy a non-interference property: committing to an edge from that node won't change winning regions. Expressions first(A(G)) and second(A(G)) denote the under-approximations computed by method A for $\mathrm{Win}_{0}(G)$ and $\mathrm{Win}_{1}(G)$, respectively. We write $\mathrm{G}_{-}(\mathrm{v}, \mathrm{w})$ for the parity game that is G except that ( $\mathrm{v}, \mathrm{w}$ ) is the only outgoing edge for v . We use \& to denote the intersection of sets.

1, who does not own $v_{1}$, it must be the case that games $G_{\left(v_{1}, v_{3}\right)}$ and $G_{\left(v_{1}, v_{2}\right)}$ have the same winning regions. But aspect $A_{3}$ then recognizes that node $v_{0}$ is won by player 1 in game $G_{\left(v_{1}, v_{3}\right)}$, and by player 0 in game $G_{\left(v_{1}, v_{2}\right)}$. Therefore, probe ( $A_{3}$ ) recognizes in its first stage that $v_{1}$ is won by player 1 in $G$.

- We illustrate the utility of the second stage in probe where $G$ is the parity game from Fig. 11 and A is $A_{1} A_{2} A_{3}$. Recall that this A returns a pair of empty sets for this $G$. Let v be $v_{2}$. Then S equals $\left\{v_{1}, v_{3}\right\}$. Consider the for-statement forall w in S for this choice of v . Then $\mathrm{Z}_{-} 0=\mathrm{Z}_{-} 1$ initially.
- In $G_{\left(v_{2}, v_{1}\right)}$ edge $\left(v_{2}, v_{3}\right)$ is gone and $\operatorname{first}\left(A\left(G_{\left(v_{2}, v_{1}\right)}\right)\right)=V$ since $A_{3}$ realizes $V=\mathrm{Win}_{0}\left(G_{\left(v_{2}, v_{1}\right)}\right)$ by running checkInfFin $(\{2\},\{ \}, 0)$ on $G_{\left(v_{2}, v_{1}\right)}$.


Fig. 13. A parity game $G$ for which aspect probe $\left(A_{3}\right)$ can decide, in its first stage, that node $v_{1}$ is won by the player who does not own $v_{1}$ - which is player 1 .

- In $G_{\left(v_{2}, v_{3}\right)}$ edge $\left(v_{2}, v_{1}\right)$ is gone and $\operatorname{first}\left(A\left(G_{\left(v_{2}, v_{3}\right)}\right)\right)=V$ since $A_{3}$ realizes $V=\operatorname{Win}_{0}\left(G_{\left(v_{2}, v_{3}\right)}\right)$ by running checkInfFin $(\{2,0\},\{1\}, 0)$ on $G_{\left(v_{2}, v_{3}\right)}$.
This results in final states $V$ and $\}$ for Z_0 and Z_1, respectively. Therefore, probe (A) returns that pair $(V,\{ \})$ and solves $G$ completely.

Remark 5.4 The first stage of probe ( $A_{3}$ ) won't discover anything that aspect $A_{3}$ would not already have discovered. Suppose we have nodes $v$ and $z$ and that there are $w_{1} \neq w_{2}$ with $\left\{\left(v, w_{1}\right),\left(v, w_{2}\right)\right\} \in E$ such that
(i) aspect $A_{3}$ tells us that $z$ is won by player 0 in the reduced game $G_{\left(v, w_{1}\right)}$
(ii) aspect $A_{3}$ tells us that z is won by player 1 in the reduced game $G_{\left(v, w_{2}\right)}$

Let $v \in V_{\sigma}$. We let $\sigma=0$, the proof for $\sigma=1$ is symmetric and omitted. Then item (i) ensures that, under some interval abstraction of priorities, player $\sigma$ can force a win from node $z$ in the reduced game $G_{\left(v, w_{0}\right)}$. Let $f$ be the corresponding memoryless winning strategy. But only player $\sigma$ can move in configuration $v$, and so in the original game $G$, under the same interval abstraction from item (i), aspect $A_{3}$ will show that player $\sigma$ can force a win at $z$ (by choosing to go to $w_{1}$ from $v$, and otherwise playing $f$ as in item (i)). So aspect $A_{3}$ would already have added $z$ to the winning region $W_{\sigma}$. This can be seen at work in the first item of Example 5.3.

Nothing stops us from thinking of probe(A) as an input to probe and so we get higher-order analyses, e.g. the second-order one probe (probe(A)).

Since some aspects change $W_{\sigma}$ and some don't, we put the computation of $\sigma$ attractors for invariant (A) into the pseudo-code of those aspects that change $W_{\sigma}$ and not at the end of each iteration in the for-statement of our design pattern. In this paper, this only concerns aspect $A_{3}$ and probe(A).

The design pattern and all of its aspects have been implemented by Huaxin Wang in a framework [16]. That implementation lead to several empirical and theoretical insights, detailed in loc. cit. and not reported here.

## 6 Related work

This paper is based on preliminary work reported in the extended abstract [1]. In loc. cit., neither the aspect transformer nor proofs are given but the design pattern (without handling dead ends and self-loops) and weaker invariants are presented. That paper features four aspects, of which $A_{1}$ is as presented in this paper and $A_{3}$ is formulated in a non-incremental manner. Using the notion of lax parity games, we could and did merge aspects $A_{2}$ and $A_{4}$ of [1] into the single aspect $A_{2}$ of this paper.

We refer to [8] for references to extant algorithms for solving parity games whose worst-case time complexity is exponential.

Polynomial-time algorithms for solving parity games completely can be found in the literature but they only operate on certain parity games, typically by using a measure $\mu(G) \in\{0,1, \ldots\}$ on parity games and applying the algorithm only to those games whose measure is below a fixed, finite bound $k$. This is the case for the polynomial-time algorithm for solving parity games with bounded entanglement [2], and for the polynomial-time algorithm for solving parity games with bounded DAG-width [3]. It would be of interest to determine whether these algorithms have sound abstractions that can operate as aspects on arbitrary parity games.

In [11], the characterization of winning strategies through progress measures (as given in [13]) is exploited to reduce the problem of solving parity games to satisfiability checks in propositional logic, and first experimental results for this reduction are presented. This approach only decides the winning status of a chosen node and still has to be extended to global reasoning over parity games. Again, it would be of interest to study whether progress measures and their resulting reduction to satisfiability can be formulated as aspects within our framework.

Aspect $A_{3}$ and the under-approximation of winning regions in our design pattern use abstraction as a driving computational force. Abstraction is an established approach in game-based verification. We mention three-valued abstractions of 2player games [5], where winning strategies for either player transfer soundly from the abstract to the concrete game. Similar results on transfer of winning strategies, within the formal framework of abstract interpretation [4], are presented in [14], where abstract game nodes are also equipped with a partial order.

## 7 Future work

We want to explore additional aspects and rank functions. We plan to give a more systematic account of interaction of these aspects in the context of the aforementioned "phase ordering problem" in compilers, as applied to this setting; preliminary results in that direction can be found in [16] already. Connections of our approach to complexity measures in directed graphs are of interest; we mention DAG-Width [3] and Entanglement [2]; for the latter, initial results are reported in [16]. We also mean to compare our approach to that of reducing parity games to SAT [11].

## 8 Conclusions

In this paper we proposed a design pattern for under-approximating winning regions of parity games in polynomial time and in a completely incremental manner. Patterns are being instantiated with $k$ many aspects and a rank function suitable for that choice of aspects. We presented three aspects and a method for making our algorithms higher-order, all based on static analyses and the determinacy of parity games. We demonstrated that aspect interaction increases precision, due in part to an elimination of redundancies in parity games that lead to the consideration of lax parity games, which are as expressive as parity games. The utility of our approach has at least three sources. First, in local model checking [15] one is only interested in whether an initial state (read: designated node) satisfies a formula (read: is won by player 0), something our algorithms may well be able to decide. Second, our algorithms can be seen as pre-processors to existing algorithms since they can be applied directly to the residual sub-game induced by those nodes whose winning status is yet undecided, courtesy of invariants (A) and (P) for our design pattern. Third, the results of this paper and the implementation of that framework in [16] provide a workbench for designing and exploring algorithms for solving parity games, noting that the framework does not insist on aspects to run in polynomial time.

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## A Eliminating dead ends and self-loops

Eight local transformations, four for each player, efficiently add nodes and edges to a parity game such that the winning status of old nodes won't change but no dead ends or self-loops remain. The eight transformations are given in Fig. A.1. All transformations for node $v$ preserve all incoming edges and outgoing edges other than $(v, v)$ of $v$ (those edges that are not self-loops are not shown below; in particular, the fifth and sixth rule won't produce dead ends). All transformations for node $v$, except for the fifth and sixth, create two new nodes and three new edges each. Since these new nodes exhibit only two different patterns, sharing of these patterns means that only four new nodes in total are needed.

Example A. 1 We illustrate this elimination process by means of an example. The parity game $G$ in Fig. A. 2 has $\operatorname{Win}_{0}(G)=\left\{v_{2}, v_{3}, v_{4}, v_{6}\right\}$ and $\operatorname{Win}_{1}(G)=\left\{v_{0}, v_{1}, v_{5}\right\}$. It turns into the parity game without dead ends and self-loops in Fig. A. 3 such that the winning regions are the same for the original nodes. The two new nodes with priority 1, and all their incoming nodes are won by player 1. Dually, the two new nodes with priority 0 and all its incoming nodes are won by player 0 .


Fig. A.1. Eight transformation rules for converting parity games into equivalent ones without any dead ends or self-loops. Those edges that are not self-loops are not shown; in particular, the fifth and sixth rule won't produce dead ends.


Fig. A.2. A parity game with dead end and self-loops.


Fig. A.3. The parity game obtained from the one in Fig. A. 2 by applying the rewrite rules in Fig. A.1.


[^0]:    ${ }^{1}$ We acknowledge the kind support of this work by the UK Engineering and Physical Sciences Research Council under grants EP/D50595X/1 Efficient Specification Pattern Library for Model Validation and EP/E028985/1 Complete and Efficient Checks for Branching-Time Abstractions
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    ${ }^{3}$ Email: nac103@doc.imperial.ac.uk
    ${ }^{4}$ Email: M.Huth@doc.imperial.ac.uk
    5 We restrict our attention to finite parity games in this paper, although our ideas should transfer to computable settings for infinite parity games.

[^1]:    ${ }^{6}$ In this paper a partition of a non-empty set $Y$ is a set of pairwise disjoint sets $\left\{P_{i} \mid i \in I\right\}$ such that $Y$ is the union of all $P_{i}$ but where some $P_{i}$ may be empty.

[^2]:    7 This disjointness holds if invariant (P) is true, but some of our arguments only rely on invariant (A).

[^3]:    8 This aspect has a strict version $A_{2}^{<}$based on $\chi(v)<\chi\left(w_{C}\right) \neq X$ instead of $\chi(v) \leq \chi\left(w_{C}\right) \neq X$ but defined like $A_{2}$ in all other regards. We will not discuss $A_{2}^{<}$further in this paper.

[^4]:    ${ }^{9}$ The choice of index 3 is somewhat ad-hoc as similar versions of aspect $A_{3}$ for any fixed and finite index $i>3$ can be designed. Alternatively, one can "tune up" $A_{3}$ with probe of Sec. 5.
    ${ }^{10}$ This paper will not discuss any optimizations of algorithms as this is best left for future work on implementation and experimentation with this design pattern. For example, aspect $A_{3}$ may check itself whether cache equals rank(G) and, if so, terminate global execution.

[^5]:    ${ }^{11}$ Although this rank function is sound, an implementation may want to note that turning some $\chi(v)$ from 0 to $X$ decreases the rank, which the function as stated does not do.

