# Safety First: A Two-Stage Algorithm for LTL Games

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#### FMCAD 2009



Safety First: A Two-Stage Algorithm for LTL Games

#### Motivation

- Recently, significant algorithmic advances in the game-theoretic approach to synthesis of reactive systems has renewed interest.
   Piterman 06, Piterman et al 06, Kupferman et al 06, Chatterjee et al 07, Bloem et al 07 are a few examples.
- Despite challenges in scalability, there is increasing hope that synthesis algorithms may be applied to the design and diagnosis of intricate, safety critical protocols.
- The focus will be on how to avoid some of these challenges without any compromises.

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- The focus will be on how to avoid some of these challenges without any compromises.

#### Outline

#### 1 Introduction

#### 2 Games

#### 3 Two Stage Synthesis

- The Challenge
- Algorithm
- Optimizations
- Implementation
- Caveats
- 4 Results

#### 5 Conclusions

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## LTL Synthesis - Pnueli and Rosner (POPL'89)

#### Automatically build design from specification

Input:

- Set of LTL formulae, e.g.  $G(req \rightarrow Fack), G(\neg req \rightarrow X(\neg ack))$
- Partition of the atomic propositions (input/output signals)
- Environment controls inputs and system controls outputs
- The set of LTL formulae are converted to a non-terminating game with system as protagonist and environment as antagonist.
- Output: Automatically created functionally correct finite-state machine from the winning strategy of the system.
  - If such strategy doesn't exist then the specification is unrealizable.

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- The system's intended behavior is described by combination of LTL formulae or as ω- regular automata.
- In a naive approach, all formulae and automata are reduced to one deterministic automaton, whose transition structure provides the game graph.
- The acceptance condition is taken as the winning condition.
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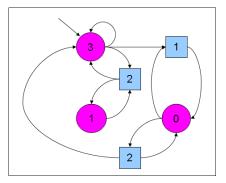
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Example: Game graph with a parity acceptance condition

 $player0 \rightarrow \Box$ wins if largest integer occuring infinitely often is even

 $player1 \rightarrow \bigcirc$ wins if largest integer occuring infinitely often is odd

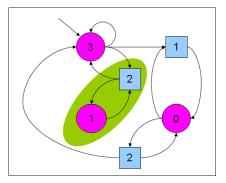


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## Game Graphs

- A game graph *G* = ((*S*, *E*), *S*<sub>0</sub>, *S*<sub>1</sub>) is a directed graph (*S*, *E*) with a finite state space *S*, a set of edges *E* and a partition (*S*<sub>0</sub>, *S*<sub>1</sub>) of the state space belonging to player 0 and 1 respectively. We assume that every state has an outgoing edge.
- The game is started by placing a token in one of the S<sub>init</sub> and then this token is moved along the edges, when the token is in a state s ∈ S<sub>1</sub>, player 1 selects one of its outgoing edges and vice-versa. The result is an infinite path in the game graph termed as a play.
- A strategy for a player is a recipe that specifies how to extend finite path. Formally strategy for player *i* is a function  $\sigma: S^*.S_i \rightarrow S$ .

## Parity Game

- For a game graph G = (Q, E) and a parity function π : Q → [k], a parity acceptance condition requires that the maximal π(s) occuring infinitely often is odd (even) for player1(0).
- A generalized parity game for a game graph G = (Q, E) and a set of parity functions  $\{\pi_i | \pi_i : Q \to [k_i]\}$  is played between the conjunctive and disjunctive player. The conjunctive player wins if it has a strategy to win all the parity acceptance conditions while the disjunctive player wins if it has a strategy for some parity acceptance condition.

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## Two Game Theoretic Approaches

The standard approach which is the focus of this talk, requires the determinization of word automata.

#### $LTL \rightarrow NBW \rightarrow DRW$

The Safraless Approach avoids determinization by working with Tree Automata.

 $LTL \rightarrow NGBW \rightarrow UGCW \rightarrow UGCT \rightarrow NBT$ 

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Specification of a simple 2-Client Arbiter

Initially there are no acknowledgments.

 $\neg ack_0 \land \neg ack_1$ 

• The acknowledgmnets are mutually exclusive.

 $G(\neg ack_0 \lor \neg ack_1)$ 

There are no spurious acknowledgmnets.

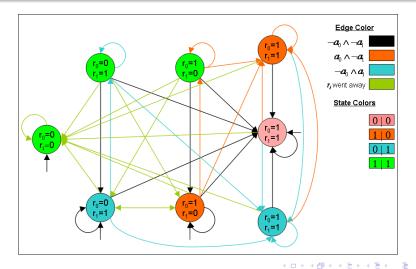
$$\forall i . \mathbf{G}(\neg req_i \rightarrow \mathbf{X}(\neg ack_i))$$

Every request will eventually be acknowledged

$$\forall i . \mathsf{G}(req_i \rightarrow \mathsf{F}ack_i)$$

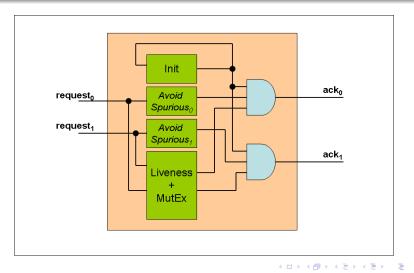
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#### Example: Game Graph and Synthesized Strategy



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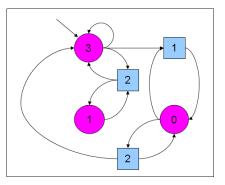
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## Example: Game play & Strategy Computation for Player 1

 $\bigcirc$  [Player 1] wins if the maximal  $\pi(s)$  occuring infinitely often is odd.

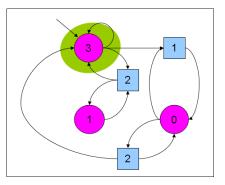


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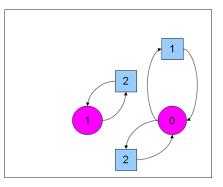


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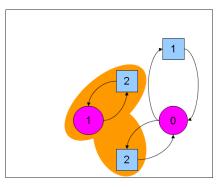


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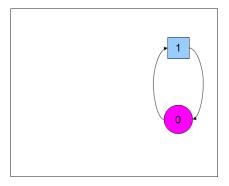


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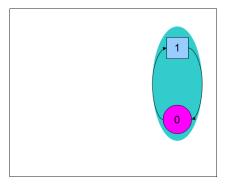


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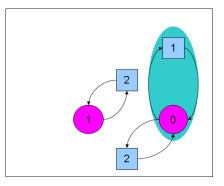
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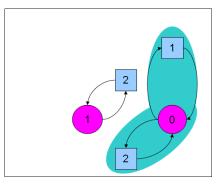
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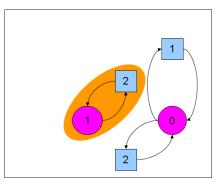
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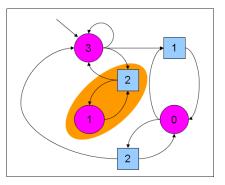
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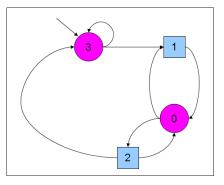
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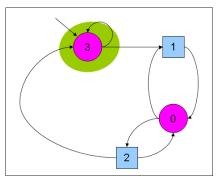


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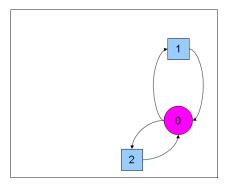


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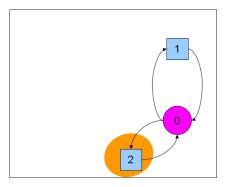
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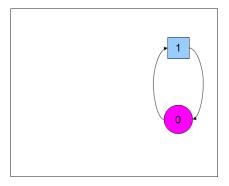


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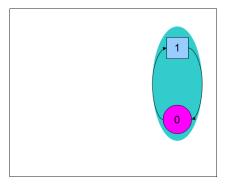


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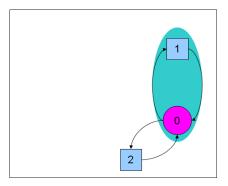


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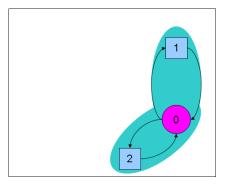


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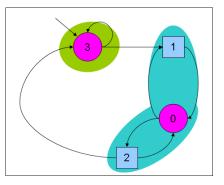


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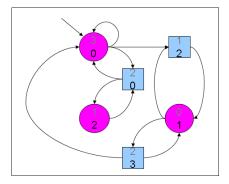
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#### ○ [Conjunctive Player]

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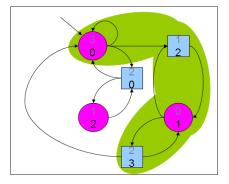
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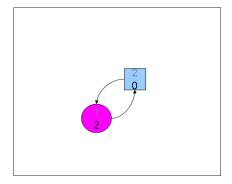
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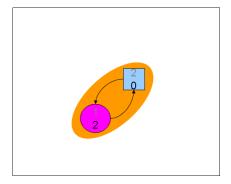
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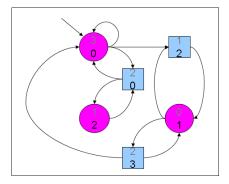
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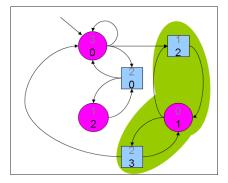
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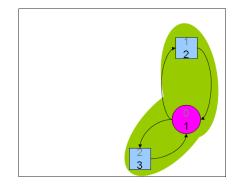
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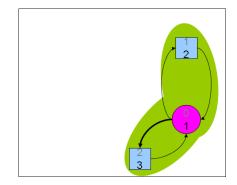
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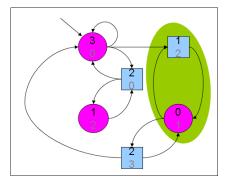
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The Challenge Algorithm Optimizations Implementation Caveats

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- Is there a simpler solution to the complex problem?
- Is there a way to deal with properties one at a time?

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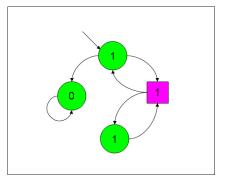
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The Challenge Algorithm Optimizations Implementation Caveats

# Safety Properties

A safety condition for a game graph G = (Q, E) is a function  $\pi : Q \to \{0, 1\}$  such that there is no transition  $(u, v) \in E$  such that  $\pi(u) = 0$  and  $\pi(v) = 1$ .

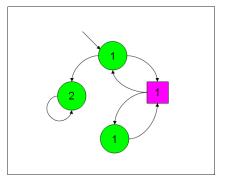


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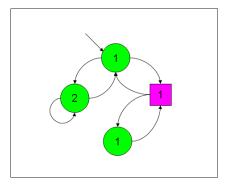


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# Persistence Properties

A persistence condition for a game graph G = (Q, E) is a function  $\pi : Q \rightarrow \{1, 2\}$ .



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The Challenge Algorithm Optimizations Implementation Caveats



#### • What is so unique about persistence properties?

- The winning states for persistence properties can be categorized into persistent and transient states.
- The computation of strategies is not necessary when we are only interested in determining the persistent and transient states.
- A transient state will stay a transient state for the subsequent games.

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- A transient state will stay a transient state for the subsequent games.

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The Challenge Algorithm Optimizations Implementation Caveats

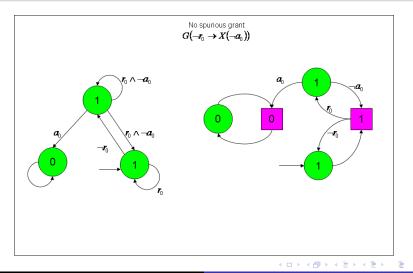
# The Claim

- What is so unique about persistence properties?
- The winning states for persistence properties can be categorized into persistent and transient states.
- The computation of strategies is not necessary when we are only interested in determining the persistent and transient states.
- A transient state will stay a transient state for the subsequent games.

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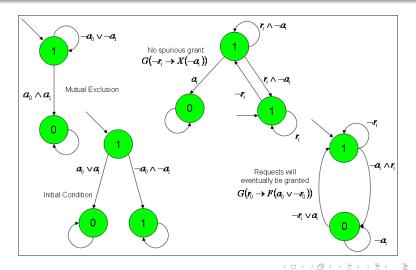
The Challenge Algorithm Optimizations Implementation Caveats

# Input/Output based game $\rightarrow$ State based game



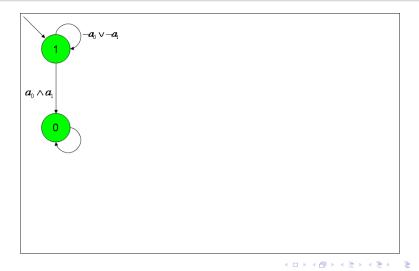
The Challenge Algorithm Optimizations Implementation Caveats

## Example: Simple Arbiter revisited



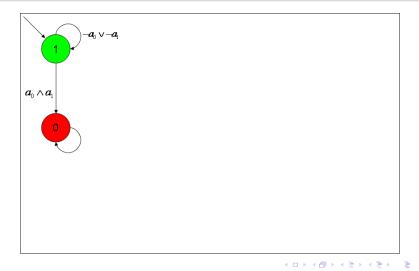
The Challenge Algorithm Optimizations Implementation Caveats

## Example: Simple Arbiter revisited



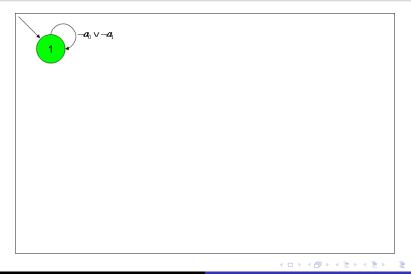
The Challenge Algorithm Optimizations Implementation Caveats

## Example: Simple Arbiter revisited



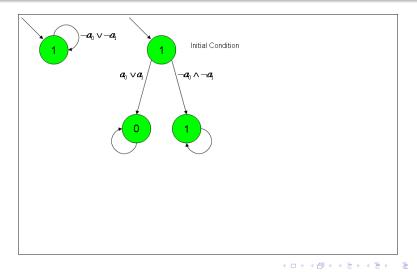
The Challenge Algorithm Optimizations Implementation Caveats

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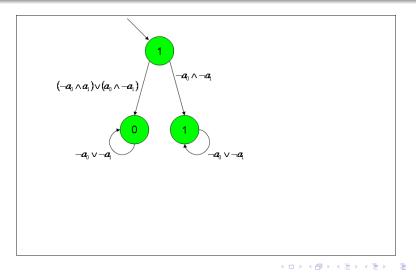
The Challenge Algorithm Optimizations Implementation Caveats

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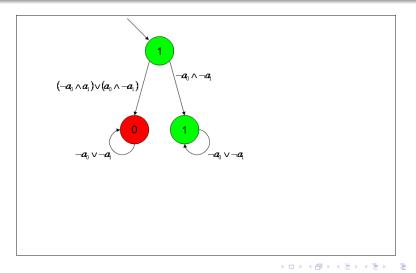
The Challenge Algorithm Optimizations Implementation Caveats

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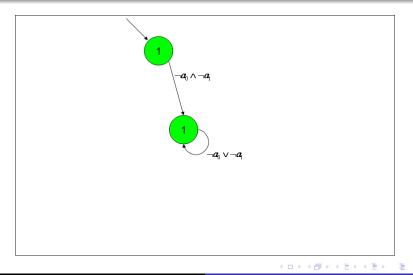
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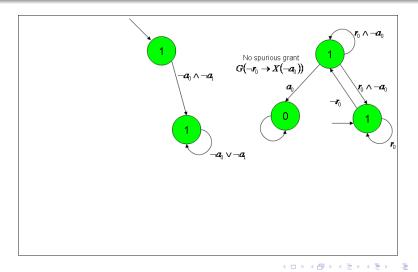
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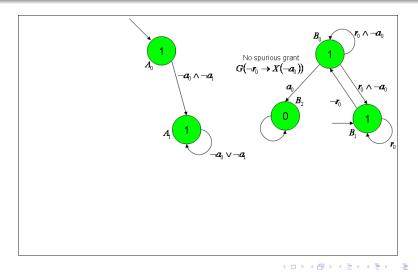
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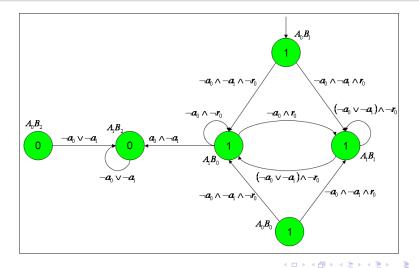
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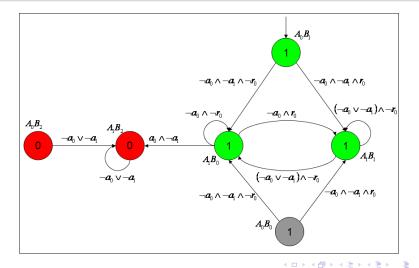
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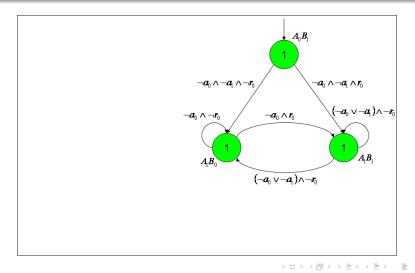
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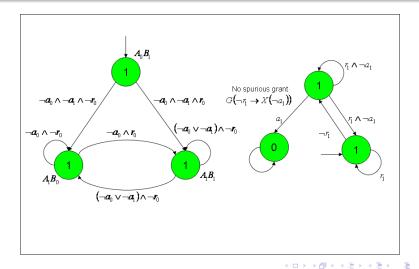
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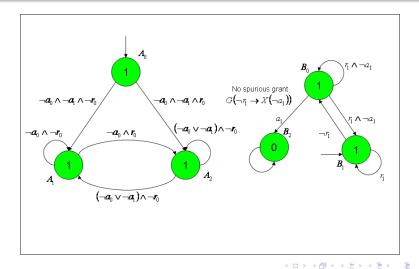
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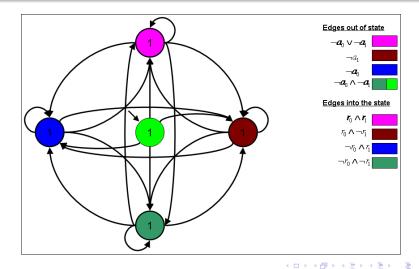
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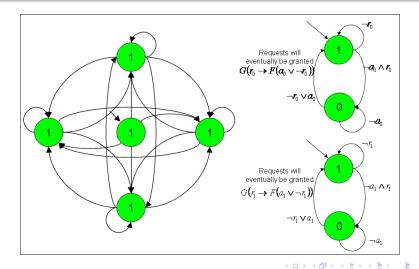
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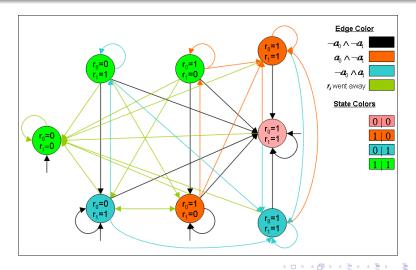
The Challenge Algorithm Optimizations Implementation Caveats

## Example: Simple Arbiter revisited



The Challenge Algorithm Optimizations Implementation Caveats

## Example: Simple Arbiter revisited



The Challenge Algorithm Optimizations Implementation Caveats

## How significant is the improvement?

The complexity of "classical" algorithm of (Chatterjee et al 07) is given by

$$O(m \cdot n^{2d}) \cdot \binom{d}{d_1, d_2, \dots, d_k},$$
$$d_i = \lceil k_i/2 \rceil$$

If  $\pi_k$  is a safety condition, solving the game in two stages leads to a better bound for the second stage,  $O(m \cdot n^{2d-2}) \cdot {d-1 \choose d_1, \dots, d_{k-1}}$ , while the first stage runs in  $O(m \cdot n^2)$ .

In practice, in the second stage, the number of transitions may decrease, and the removal of losing positions for  $\pi_1$  may reduce the number of colors in the remaining conditions.

The Challenge Algorithm Optimizations Implementation Caveats

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The Challenge Algorithm Optimizations Implementation Caveats

## Outline

### 1 Introduction

#### 2 Games

# 3 Two Stage Synthesis

The Challenge

### Algorithm

- Optimizations
- Implementation
- Caveats

### 4 Results

### 5 Conclusions

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The Challenge Algorithm Optimizations Implementation Caveats

# Methodology

### Identify the safety/persistent properties in the specification.

- Translate each property into a deterministic automaton.
- Compose the automaton with already existing game-graph and then playing the 2-player game on the relevant section of the graph.
- Determinize all the remaining non-safety/non-persistent properties and then compose with the game-graph and play the final generalized parity game on the relevant section of the graph.
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The Challenge Algorithm **Optimizations** Implementation Caveats

## Outline

### 1 Introduction

#### 2 Games

### 3 Two Stage Synthesis

- The Challenge
- Algorithm

### Optimizations

- Implementation
- Caveats

### 4 Results

### 5 Conclusions

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The Challenge Algorithm **Optimizations** Implementation Caveats

#### Restrict the state space with the reachable winning states.

- Remove the constant bits in the reachable winning state space.
- Find dependencies between state-variables and remove the dependant variables.
- (Efficiently re-encode the state space).

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The Challenge Algorithm Optimizations Implementation Caveats

## Implementation

- The LTL formula is determinized by the tool Wring using explicit state based translation. It is able to detect persistence properties and determinizes them using subset-construction otherwise uses Piterman's determinization procedure.
- Chatterjee's algorithm for generalized-parity games has been implemented in VIS which uses BDDs for internal representation and computation. The game-graph is represented as an input-based game but the algorithm virtually converts it into a turn-based game.

The Challenge Algorithm Optimizations Implementation Caveats

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The Challenge Algorithm Optimizations Implementation Caveats

## Outline

### 1 Introduction

#### 2 Games

### 3 Two Stage Synthesis

- The Challenge
- Algorithm
- Optimizations
- Implementation

### Caveats

- 4 Results
- 5 Conclusions

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The Challenge Algorithm Optimizations Implementation Caveats



- The game-theoretic approach in synthesizing the safety properties introduces more state variables compared to a manual implementation where the programmer can take advantage by combining internal signals.
- Aggressive dependency removal of state-variables has a negative impact on performance as it affects the early quantification schedule, dependencies up to 3 state variables results in enhanced performance times.

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#### Anzu (Bloem et al 07)

■ Why Safety-First?

• Full LTL.

No pre-synthesis

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#### Safety First: A Two-Stage Algorithm for LTL Games

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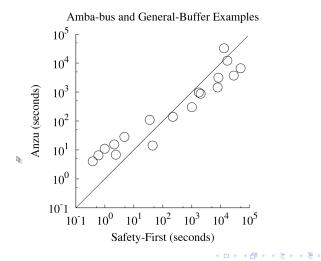
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#### Results



# Conclusions

#### In practice large chunk of the Specification is of safety type.

- Splitting the synthesis process in two stages has opened the door for optimizations which may not affect the worst-case complexity but are practically very significant.
- Without loss of generality in the LTL specification, Safety-First is already competitive.
- Incrementally compute a good BDD order.

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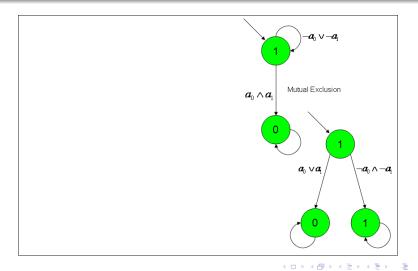
#### THANK YOU

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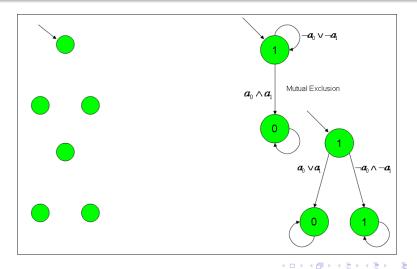
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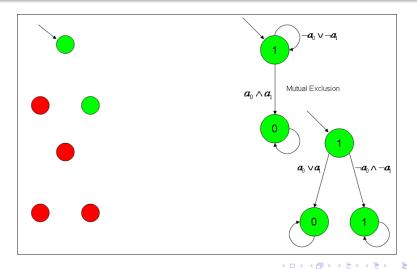
#### Example: Simple Arbiter revisited



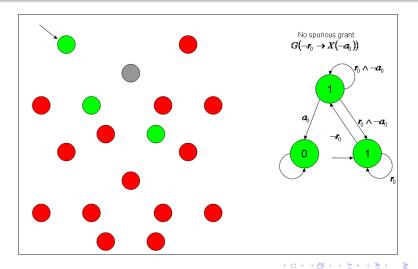
## Example: Simple Arbiter revisited



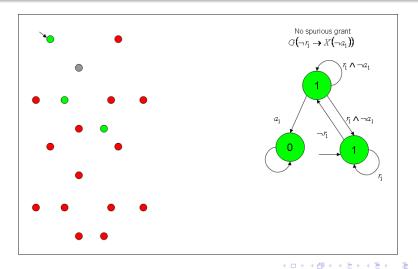
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