

# Multi-Core Partial-Order Reduction for LTL Model Checking

Alfons Laarman  
alfons@laarman.com

joint work with Anton Wijs (Eindhoven University of Technology)



Formal Methods in Systems Engineering  
Vienna University of Technology

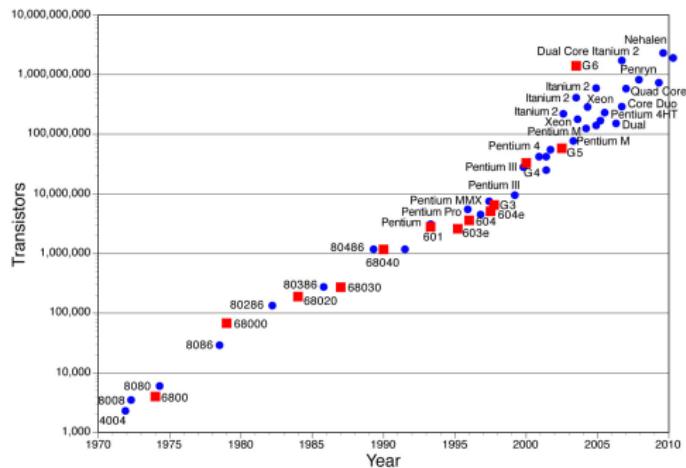


May 5, 2015

# Goals

Combine:

- Parallel model checking (exponential gains)
- Partial-Order Reduction (POR) (exponential gains)

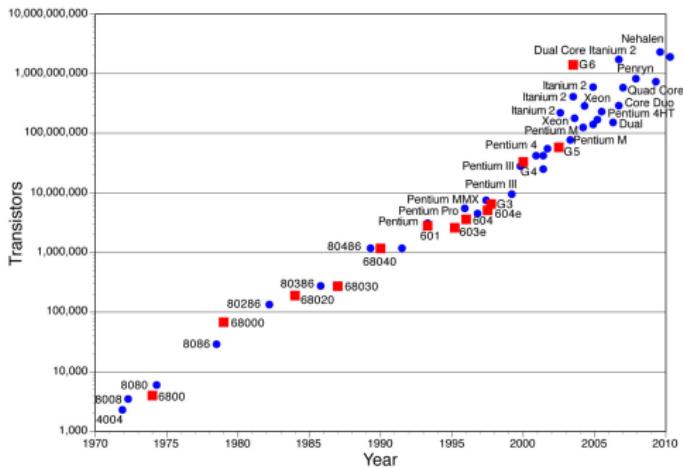
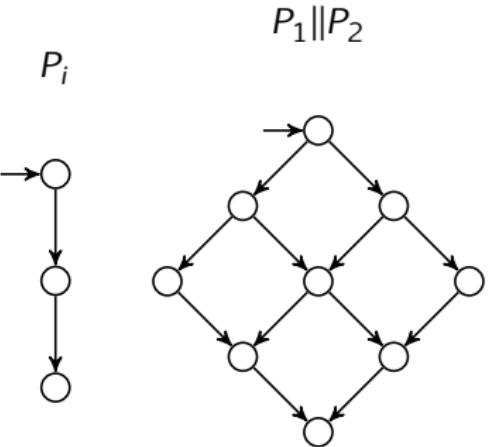


# Goals

Combine:

- Parallel model checking
- Partial-Order Reduction (POR)

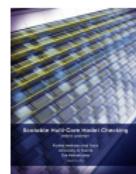
(exponential gains)  
(exponential gains)


 $P_i$ 


# Scalable Multi-Core Model Checking

## Research questions

- Can model checking scale on modern multi-cores?
- Retain compatibility with different optimizations?



# Scalable Multi-Core Model Checking

## Research questions

- Can model checking scale on modern multi-cores?
- Retain compatibility with different optimizations?



- On-the-fly
- Partial-order reduction
- State compression
- OR Symbolic with BDDs  
[van Dijk, L, van de Pol, 2013]

# Scalable Multi-Core Model Checking

## Research questions

- Can model checking scale on modern multi-cores?
- Retain compatibility with different optimizations?



- On-the-fly
- Partial-order reduction
- State compression
- OR Symbolic with BDDs  
[van Dijk, L, van de Pol, 2013]

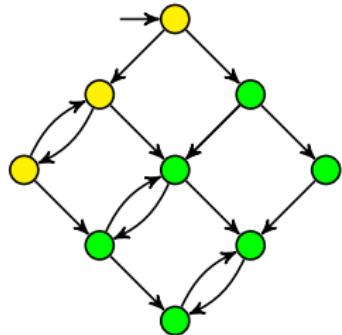
Formalism	Property	Explicit state + Compression	On-the-fly + POR	Symbolic
Plain	Reachability	✓	✓	✓
	Liveness	✓	✓	?
Timed	Reachability	✓	✓	✓
	Liveness	✓	✓	?

- Shared hash table approach (as opposed to distributed algorithms)
- Lockless data structures
- Parallel algorithms (Multi-Core Nested-DFS)

# Partial-Order Reduction for LTL

State-space graph:  $\mathcal{G} = (\mathcal{S}, T, s_0, AP)$

On-the-fly exploration:  $en: \mathcal{S} \rightarrow \mathcal{S}$

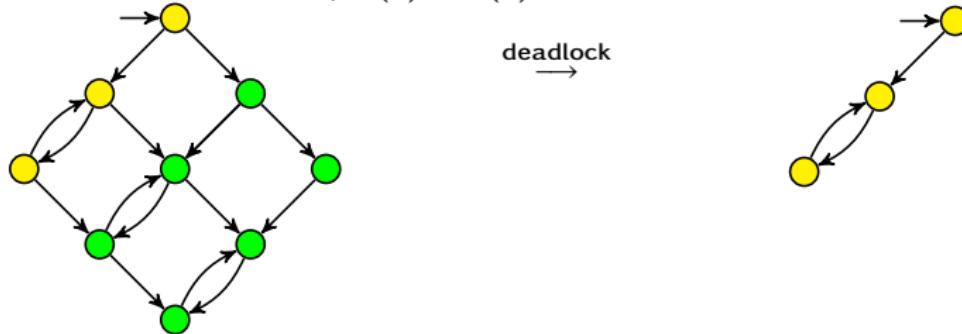


# Partial-Order Reduction for LTL

State-space graph:  $\mathcal{G} = (\mathcal{S}, T, s_0, AP)$

On-the-fly exploration:  $en: \mathcal{S} \rightarrow \mathcal{S}$

Reduce successor function:  $por(s) \subseteq en(s)$ .

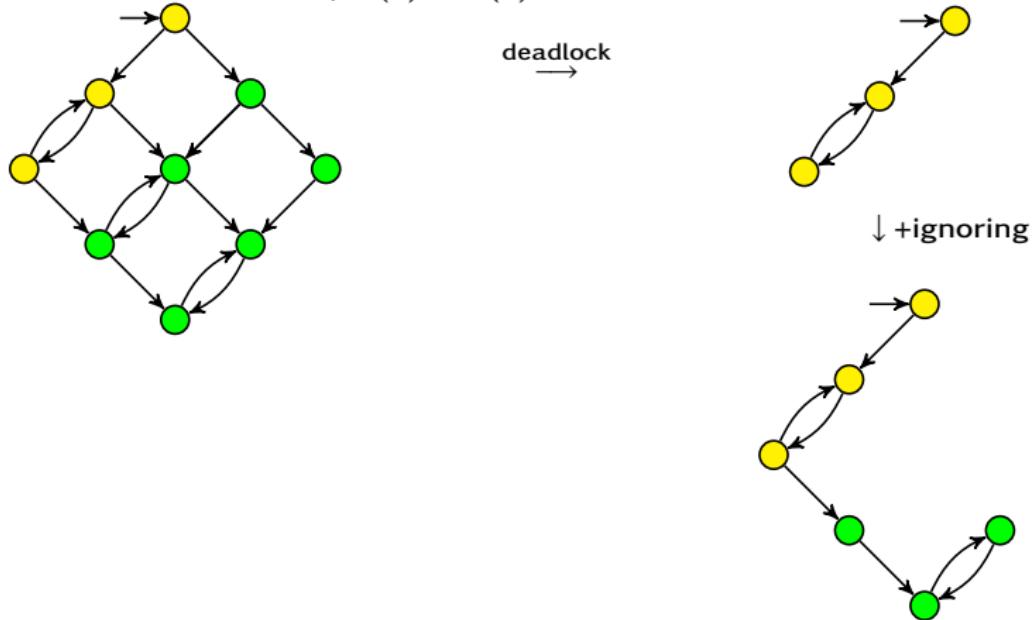


# Partial-Order Reduction for LTL

State-space graph:  $\mathcal{G} = (\mathcal{S}, T, s_0, AP)$

On-the-fly exploration:  $en: \mathcal{S} \rightarrow \mathcal{S}$

Reduce successor function:  $por(s) \subseteq en(s)$ .

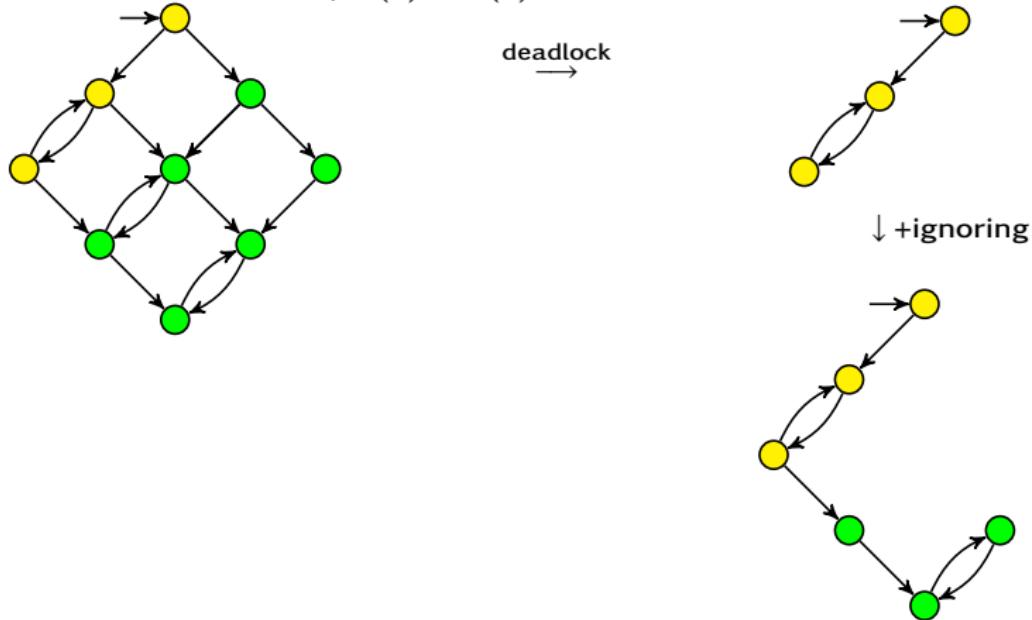


# Partial-Order Reduction for LTL

State-space graph:  $\mathcal{G} = (\mathcal{S}, \mathcal{T}, s_0, AP)$

On-the-fly exploration:  $en: \mathcal{S} \rightarrow \mathcal{S}$

Reduce successor function:  $por(s) \subseteq en(s)$ .



Smaller reduced set  $por()$  leads to smaller state space.

# DFS Stack Proviso

```
procedure DFS(s)
  for all s' in por(s) do
    if s' is not on stack and not visited then
      DFS(s')
    if successor of s is on the stack then
      explore s fully ( por(s) := en(s) )
  mark s visited
```

# DFS Stack Proviso

```

procedure DFS(s)
  for all s' in por(s) do
    if s' is not on stack and not visited then
      DFS(s')
    if successor of s is on the stack then
      explore s fully ( por(s) := en(s) )
  mark s visited

```



# DFS Stack Proviso

```

procedure DFS(s)
  for all s' in por(s) do
    if s' is not on stack and not visited then
      DFS(s')
    if successor of s is on the stack then
      explore s fully ( por(s) := en(s) )
  mark s visited

```



Why not anything else?

- (Minimal) feedback vertex set (FVS) → NP-complete
- Stack proviso is the best we can do **on-the-fly** and in **linear time**

# DFS Stack Proviso

```

procedure DFS(s)
  for all s' in por(s) do
    if s' is not on stack and not visited then
      DFS(s')
    if successor of s is on the stack then
      explore s fully ( por(s) := en(s) )
  mark s visited

```



Why not anything else?

- (Minimal) feedback vertex set (FVS) → NP-complete
- Stack proviso is the best we can do **on-the-fly** and in **linear time**

DFS is P-complete ⇒ inherently sequential (assuming P ≠ NC)

# Related Work (Parallel LTL + POR)

Algorithm/Proviso	Reduction	Scalability
NDFS/Stack	++	
TwoPhase [Gopalakrishnan et al.]	+- ??	
Topological sort [Barnat et al.]	+- +	
Sticky transitions [Peled et al]	- +	

# Related Work (Parallel LTL + POR)

Algorithm/Proviso	Reduction	Scalability
NDFS/Stack	++	
TwoPhase [Gopalakrishnan et al.]	+- ??	
Topological sort [Barnat et al.]	+- +	
Sticky transitions [Peled et al]	- +	
MC-NDFS/n/a	n/a	++

Challenge: do as good as DFS stack proviso in the parallel setting

# Nested Depth-First Search for LTL

[COURCOUBETIS'93]

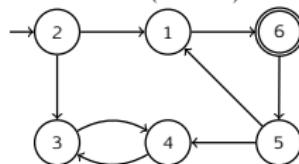
Büchi graph:  $\mathcal{G} = (\mathcal{S}, \mathcal{F}, T, s_0, AP)$   
On-the-fly exploration:  $en: \mathcal{S} \rightarrow \mathcal{S}$   
[Vardi et al, 1996]

# Nested Depth-First Search for LTL

[COURCOUBETIS'93]

Büchi graph:  $\mathcal{G} = (\mathcal{S}, \mathcal{F}, T, s_0, AP)$   
On-the-fly exploration:  $en: \mathcal{S} \rightarrow \mathcal{S}$   
[Vardi et al, 1996]

Accepting cycle detection in Büchi automaton ( $6 \in \mathcal{F}$ ):

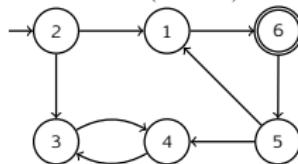


# Nested Depth-First Search for LTL

[COURCOUBETIS'93]

Büchi graph:  $\mathcal{G} = (\mathcal{S}, \mathcal{F}, T, s_0, AP)$   
On-the-fly exploration:  $en: \mathcal{S} \rightarrow \mathcal{S}$   
[Vardi et al, 1996]

Accepting cycle detection in Büchi automaton ( $6 \in \mathcal{F}$ ):



accepting-cycles( $\mathcal{G}$ )  $\subseteq$  cycles( $\mathcal{G}$ )

# Nested Depth-First Search for LTL

[COURCOUBETIS'93]

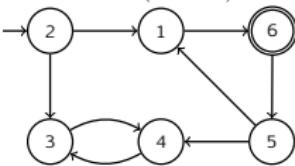
```

procedure DFSblue(s)
  s.cyan := true
  for all s' in en(s) do
    if  $\neg s'.blue \wedge \neg s'.cyan$  then
      DFSblue(s')
  if  $s \in \mathcal{F}$  then
    DFSSred(s)
    s.blue := true
    s.cyan := false
procedure DFSSred(s)
  s.red := true
  for all s' in en(s) do
    if  $s'.cyan$  then ExitCycle
    if  $\neg s'.red$  then DFSSred(s')

```

Büchi graph:  $\mathcal{G} = (\mathcal{S}, \mathcal{F}, T, s_0, AP)$   
 On-the-fly exploration:  $en: \mathcal{S} \rightarrow \mathcal{S}$   
 [Vardi et al, 1996]

Accepting cycle detection in Büchi automaton ( $6 \in \mathcal{F}$ ):



$\text{accepting-cycles}(\mathcal{G}) \subseteq \text{cycles}(\mathcal{G})$

Nested DFS (NDFS)

• Linear time

# Nested Depth-First Search for LTL

[COURCOUBETIS'93]

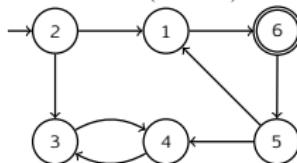
```

procedure DFSblue(s)
  s.cyan := true
  for all s' in en(s) do
    if  $\neg s'.blue \wedge \neg s'.cyan$  then
      DFSblue(s')
  if  $s \in \mathcal{F}$  then
    DFSred(s)
  s.blue := true
  s.cyan := false
procedure DFSred(s)
  s.red := true
  for all s' in en(s) do
    if  $s'.cyan$  then ExitCycle
    if  $\neg s'.red$  then DFSred(s')

```

Büchi graph:  $\mathcal{G} = (\mathcal{S}, \mathcal{F}, T, s_0, AP)$   
 On-the-fly exploration:  $en: \mathcal{S} \rightarrow \mathcal{S}$   
 [Vardi et al, 1996]

Accepting cycle detection in Büchi automaton ( $6 \in \mathcal{F}$ ):



accepting-cycles( $\mathcal{G}$ )  $\subseteq$  cycles( $\mathcal{G}$ )

## Nested DFS (NDFS)

- Linear time
- DFS itself is likely not parallelizable
- DFS order is P-complete

# Swarm Nested Depth-First Search

[HOLZMANN, 2010]

code for worker  $p$ :

```
procedure DFSblue(s, p)
    s.cyan[p] := true
    for all s' in shuffle(en(s)) do
        if  $\neg s'.blue[p] \wedge \neg t.cyan[p]$  then
            DFSblue(s', p)
    if  $s \in \mathcal{F}$  then
        DFSred(s, p)
    s.blue[p] := true
    s.cyan[p] := false
procedure DFSred(s, p)
    s.red[p] := true
    for all s' in shuffle(en(s)) do
        if  $s'.cyan[p]$  then ExitCycle
        if  $\neg s.red[p]$  then DFSred(s', p)
```

# Multi-core Nested Depth-First Search

[ATVA11], [PDMC11], [ATVA12]

*code for worker  $p$ :*

```
procedure DFSblue(s, p)
    s.cyan[p]:= true
    for all s' in shuffle(en(s)) do
        if  $\neg s'.blue \wedge \neg t.cyan[p]$  then
            DFSblue(s', p)
    if  $s \in \mathcal{F}$  then
         $R := \emptyset$ 
        DFSred(s, p)
```

**mark all in  $R$  red**

```
s.blue:= true
s.cyan[p]:= false
procedure DFSred(s, p)
     $R := R \cup \{s\}$ 
    for all s' in shuffle(en(s)) do
        if  $s'.cyan[p]$  then ExitCycle
        if  $s' \notin R \wedge \neg s.red$  then DFSred(s', p)
```

# Multi-core Nested Depth-First Search

[ATVA11], [PDMC11], [ATVA12]

code for worker  $p$ :

```
procedure DFSblue(s, p)
    s.cyan[p]:= true
    for all  $s' \in \text{shuffle}(\text{en}(s))$  do
        if  $\neg s'.\text{blue} \wedge \neg t.\text{cyan}[p]$  then
            DFSblue( $s'$ ,  $p$ )
```

```
if  $s \in \mathcal{F}$  then
```

```
 $R := \emptyset$ 
```

```
DFSred( $s$ ,  $p$ )
```

mark all in  $R$  red

```
 $s.\text{blue} := \text{true}$ 
```

```
 $s.\text{cyan}[p] := \text{false}$ 
```

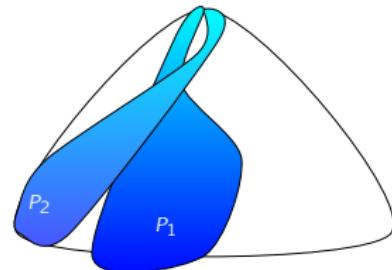
```
procedure DFSred( $s$ ,  $p$ )
```

```
 $R := R \cup \{s\}$ 
```

```
for all  $s' \in \text{shuffle}(\text{en}(s))$  do
```

```
    if  $s'.\text{cyan}[p]$  then ExitCycle
```

```
    if  $s' \notin R \wedge \neg s.\text{red}$  then DFSred( $s'$ ,  $p$ )
```



# Multi-core Nested Depth-First Search

[ATVA11], [PDMC11], [ATVA12]

code for worker  $p$ :

```
procedure DFSblue(s, p)
    s.cyan[p]:= true
    for all  $s' \in \text{shuffle}(\text{en}(s))$  do
        if  $\neg s'.\text{blue} \wedge \neg t.\text{cyan}[p]$  then
            DFSblue( $s'$ ,  $p$ )
    if  $s \in \mathcal{F}$  then
```

$R := \emptyset$

DFSred( $s$ ,  $p$ )

mark all in  $R$  red

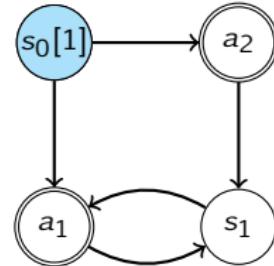
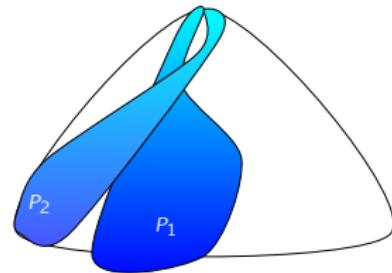
```
s.blue:= true
s.cyan[p]:= false
procedure DFSred(s, p)
```

$R := R \cup \{s\}$

for all  $s' \in \text{shuffle}(\text{en}(s))$  do

if  $s'.\text{cyan}[p]$  then ExitCycle

if  $s' \notin R \wedge \neg s.\text{red}$  then DFSred( $s'$ ,  $p$ )



# Multi-core Nested Depth-First Search

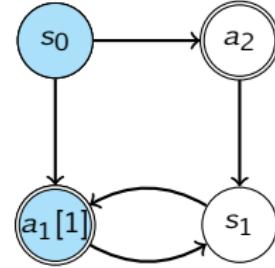
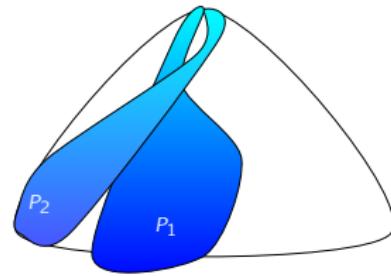
[ATVA11], [PDMC11], [ATVA12]

code for worker  $p$ :

```

procedure DFSblue(s, p)
    s.cyan[p]:= true
    for all s' in shuffle(en(s)) do
        if  $\neg s'.blue \wedge \neg t.cyan[p]$  then
            DFSblue(s', p)
    if  $s \in \mathcal{F}$  then
        R :=  $\emptyset$ 
        DFSred(s, p)

    mark all in R red
    s.blue := true
    s.cyan[p] := false
procedure DFSred(s, p)
    R :=  $R \cup \{s\}$ 
    for all s' in shuffle(en(s)) do
        if  $s'.cyan[p]$  then ExitCycle
        if  $s' \notin R \wedge \neg s.red$  then DFSred(s', p)
```



# Multi-core Nested Depth-First Search

[ATVA11], [PDMC11], [ATVA12]

code for worker  $p$ :

```
procedure DFSblue(s, p)
    s.cyan[p]:= true
    for all  $s' \in \text{shuffle}(\text{en}(s))$  do
        if  $\neg s'.\text{blue} \wedge \neg t.\text{cyan}[p]$  then
            DFSblue( $s'$ ,  $p$ )
```

if  $s \in \mathcal{F}$  then

$R := \emptyset$

DFSred( $s$ ,  $p$ )

mark all in  $R$  red

$s.\text{blue} := \text{true}$

$s.\text{cyan}[p] := \text{false}$

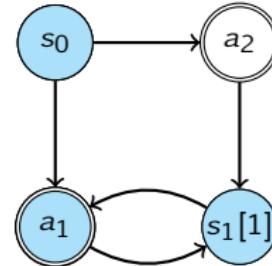
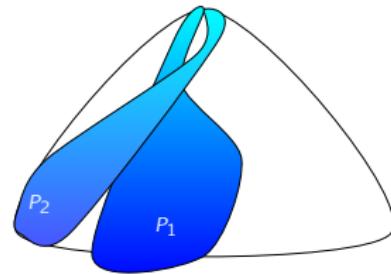
```
procedure DFSred(s, p)
```

$R := R \cup \{s\}$

for all  $s' \in \text{shuffle}(\text{en}(s))$  do

if  $s'.\text{cyan}[p]$  then ExitCycle

if  $s' \notin R \wedge \neg s.\text{red}$  then DFSred( $s'$ ,  $p$ )



# Multi-core Nested Depth-First Search

[ATVA11], [PDMC11], [ATVA12]

code for worker  $p$ :

```
procedure DFSblue(s, p)
    s.cyan[p]:= true
    for all  $s' \in \text{shuffle}(\text{en}(s))$  do
        if  $\neg s'.\text{blue} \wedge \neg t.\text{cyan}[p]$  then
            DFSblue( $s'$ ,  $p$ )
    if  $s \in \mathcal{F}$  then
```

$R := \emptyset$

DFSred( $s$ ,  $p$ )

mark all in  $R$  red

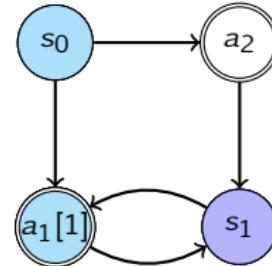
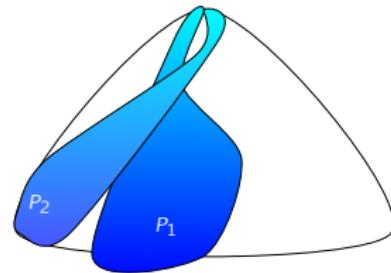
```
s.blue:= true
s.cyan[p]:= false
procedure DFSred(s, p)
```

$R := R \cup \{s\}$

for all  $s' \in \text{shuffle}(\text{en}(s))$  do

if  $s'.\text{cyan}[p]$  then ExitCycle

if  $s' \notin R \wedge \neg s.\text{red}$  then DFSred( $s'$ ,  $p$ )



# Multi-core Nested Depth-First Search

[ATVA11], [PDMC11], [ATVA12]

code for worker  $p$ :

```
procedure DFSblue(s, p)
    s.cyan[p]:= true
    for all  $s' \in \text{shuffle}(\text{en}(s))$  do
        if  $\neg s'.\text{blue} \wedge \neg t.\text{cyan}[p]$  then
            DFSblue( $s'$ ,  $p$ )
    if  $s \in \mathcal{F}$  then
```

$R := \emptyset$

DFSred( $s$ ,  $p$ )

mark all in  $R$  red

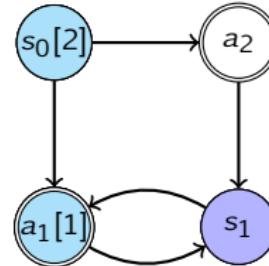
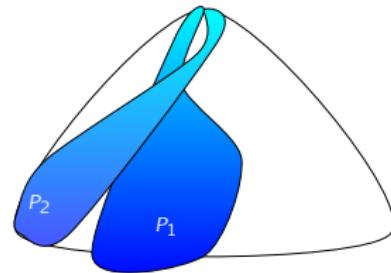
```
s.blue:= true
s.cyan[p]:= false
procedure DFSred(s, p)
```

$R := R \cup \{s\}$

for all  $s' \in \text{shuffle}(\text{en}(s))$  do

if  $s'.\text{cyan}[p]$  then ExitCycle

if  $s' \notin R \wedge \neg s.\text{red}$  then DFSred( $s'$ ,  $p$ )



# Multi-core Nested Depth-First Search

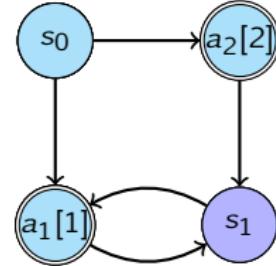
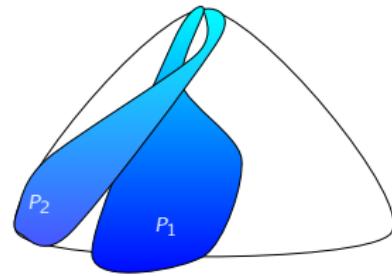
[ATVA11], [PDMC11], [ATVA12]

code for worker  $p$ :

```
procedure DFSblue(s, p)
    s.cyan[p]:= true
    for all  $s' \in \text{shuffle}(\text{en}(s))$  do
        if  $\neg s'.\text{blue} \wedge \neg t.\text{cyan}[p]$  then
            DFSblue( $s'$ ,  $p$ )
    if  $s \in \mathcal{F}$  then
         $R := \emptyset$ 
        DFSred( $s$ ,  $p$ )
```

mark all in  $R$  red

```
s.blue:= true
s.cyan[p]:= false
procedure DFSred(s, p)
     $R := R \cup \{s\}$ 
    for all  $s' \in \text{shuffle}(\text{en}(s))$  do
        if  $s'.\text{cyan}[p]$  then ExitCycle
        if  $s' \notin R \wedge \neg s.\text{red}$  then DFSred( $s'$ ,  $p$ )
```



# Multi-core Nested Depth-First Search

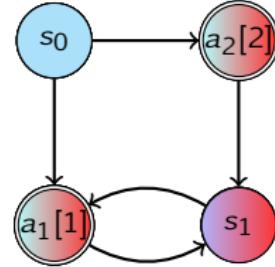
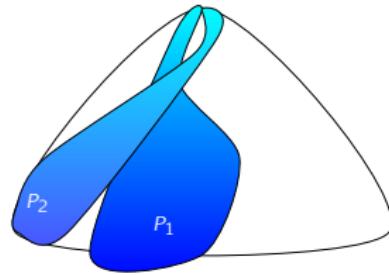
[ATVA11], [PDMC11], [ATVA12]

code for worker  $p$ :

```
procedure DFSblue(s, p)
    s.cyan[p]:= true
    for all  $s' \in \text{shuffle}(\text{en}(s))$  do
        if  $\neg s'.\text{blue} \wedge \neg t.\text{cyan}[p]$  then
            DFSblue( $s'$ ,  $p$ )
    if  $s \in \mathcal{F}$  then
         $R := \emptyset$ 
        DFSred( $s$ ,  $p$ )
```

mark all in  $R$  red

```
s.blue:= true
s.cyan[p]:= false
procedure DFSred(s, p)
     $R := R \cup \{s\}$ 
    for all  $s' \in \text{shuffle}(\text{en}(s))$  do
        if  $s'.\text{cyan}[p]$  then ExitCycle
        if  $s' \notin R \wedge \neg s.\text{red}$  then DFSred( $s'$ ,  $p$ )
```



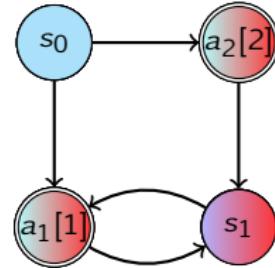
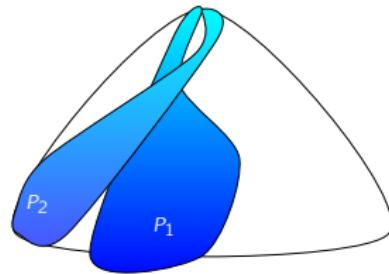
# Multi-core Nested Depth-First Search

[ATVA11], [PDMC11], [ATVA12]

code for worker  $p$ :

```

procedure DFSblue(s, p)
    s.cyan[p]:= true
    for all s' in shuffle(en(s)) do
        if  $\neg s'.blue \wedge \neg t.cyan[p]$  then
            DFSblue(s', p)
    if  $s \in \mathcal{F}$  then
        R :=  $\emptyset$ 
        DFSred(s, p)
        await all accepting in  $R \setminus \{s\}$  are red
        mark all in R red
    s.blue := true
    s.cyan[p]:= false
procedure DFSred(s, p)
    R :=  $R \cup \{s\}$ 
    for all s' in shuffle(en(s)) do
        if  $s'.cyan[p]$  then ExitCycle
        if  $s' \notin R \wedge \neg s.red$  then DFSred(s', p)
```



# Multi-core Nested Depth-First Search

[ATVA11], [PDMC11], [ATVA12]

code for worker  $p$ :

procedure DFSblue( $s, p$ )

$s.\text{cyan}[p] := \text{true}$

for all  $s' \in \text{shuffle}(\text{en}(s))$  do

if  $\neg s'.\text{cyan}[p]$  then

Conclusions

if  $s \in R$  then

- MC-NDFS scales in practice and uses DFS

$R := R \cup \{s\}$

- Does it preserve enough order to implement stack proviso?

DFSblue( $s, p$ )

await all accepting in  $R \setminus \{s\}$  are red

mark all in  $R$  red

$s.\text{blue} := \text{true}$

$s.\text{cyan}[p] := \text{false}$

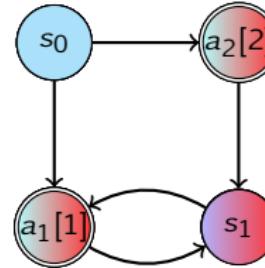
procedure DFSred( $s, p$ )

$R := R \cup \{s\}$

for all  $s' \in \text{shuffle}(\text{en}(s))$  do

if  $s'.\text{cyan}[p]$  then ExitCycle

if  $s' \notin R \wedge \neg s'.\text{red}$  then DFSred( $s', p$ )



# Stack Proviso in Parallel

```
procedure DFSblue(s, p)
    s.cyan[p]:=true
    for all s' in shuffle(por(s)) do
        if  $\neg s'.blue \wedge \neg t.cyan[p]$  then
            DFSblue(s', p)
    if  $s \in \mathcal{F}$  then
        R :=  $\emptyset$ 
        DFSred(s, p)
        await all accepting in  $R \setminus \{s\}$  are red
        mark all in R red
    if  $\exists s' \in por(s) : s'.cyan$  then
        explore s fully with DFSblue
    s.blue := true
    s.cyan[p] := false
```

# Stack Proviso in Parallel

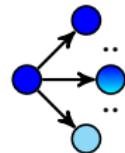
```

procedure DFSblue(s, p)
    s.cyan[p]:=true
    for all s' in shuffle(por(s)) do
        if  $\neg s'.blue \wedge \neg t.cyan[p]$  then
            DFSblue(s', p)
    if  $s \in \mathcal{F}$  then
        R :=  $\emptyset$ 
        DFSred(s, p)
        await all accepting in  $R \setminus \{s\}$  are red
        mark all in R red
    if  $\exists s' \in por(s) : s'.cyan$  then
        explore s fully with DFSblue
    s.blue := true
    s.cyan[p] := false

```

Soundness trivial  
Completeness

$$Blue \subseteq \square(Blue \cup \bigcup_p Cyan_p)$$



# Stack Proviso in Parallel

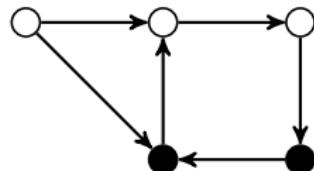
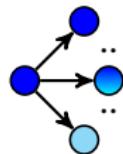
```

procedure DFSblue(s, p)
    s.cyan[p]:=true
    for all s' in shuffle(por(s)) do
        if  $\neg s'.blue \wedge \neg t.cyan[p]$  then
            DFSblue(s', p)
    if  $s \in \mathcal{F}$  then
        R :=  $\emptyset$ 
        DFSred(s, p)
        await all accepting in  $R \setminus \{s\}$  are red
        mark all in R red
    if  $\exists s' \in por(s) : s'.cyan$  then
        explore s fully with DFSblue
    s.blue := true
    s.cyan[p] := false

```

Soundness trivial  
Completeness

$$\text{Blue} \subseteq \square(\text{Blue} \cup \bigcup_p \text{Cyan}_p)$$



# Stack Proviso in Parallel

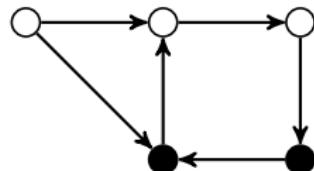
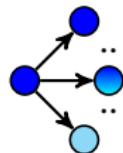
```

procedure DFSblue(s, p)
    s.cyan[p]:=true
    for all s' in shuffle(por(s)) do
        if  $\neg s'.blue \wedge \neg s.cyan[p]$  then
            DFSblue(s', p)
    if  $s \in \mathcal{F}$  then
        R :=  $\emptyset$ 
        DFSred(s, p)
        await all accepting in  $R \setminus \{s\}$  are red
        mark all in R red
    if  $\exists s' \in por(s) : s'.cyan$  then
        explore s fully with DFSblue
    s.blue := true
    s.cyan[p] := false
procedure DFSred(s, p)
    R :=  $R \cup \{s\}$ 
    for all s' in shuffle(por(s)) do
        if  $s'.cyan[p]$  then ExitCycle
        if  $s' \notin R \wedge \neg s.red$  then DFSred(s', p)
    if successor of s is on  $DFSred_p$  stack then
        explore s fully with DFSred

```

Soundness trivial  
Completeness

$$\text{Blue} \subseteq \square(\text{Blue} \cup \bigcup_p \text{Cyan}_p)$$



Re-visiting problem  
[Holzmann et al., 1996 –  
On nested depth-first search]

# Stack Proviso in Parallel

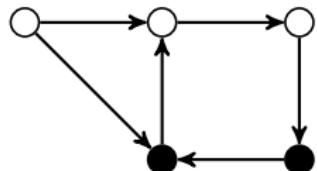
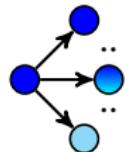
```

procedure DFSblue(s, p)
    s.cyan[p]:=true
    for all s' in shuffle(por(s)) do
        if  $\neg s'.blue \wedge \neg s.cyan[p]$  then
            DFSblue(s', p)
    if  $s \in \mathcal{F}$  then
        R :=  $\emptyset$ 
        DFSred(s, p)
        await all accepting in  $R \setminus \{s\}$  are red
        mark all in R red
    if  $\exists s' \in por(s) : s'.cyan$  then
        explore s fully with DFSblue
    s.blue := true
    s.cyan[p] := false
procedure DFSred(s, p)
    R :=  $R \cup \{s\}$ 
    for all s' in shuffle(por(s)) do
        if  $s'.cyan[p]$  then ExitCycle
        if  $s' \notin R \wedge \neg s.red$  then DFSred(s', p)
    if successor of s is on  $DFSred_p$  stack then
        explore s fully with DFSred

```

Soundness trivial  
Completeness

$$\text{Blue} \subseteq \square(\text{Blue} \cup \bigcup_p \text{Cyan}_p)$$



Re-visiting problem  
[Holzmann et al., 1996 –  
On nested depth-first search]

No termination!

# The Parallel Cycle Proviso



```
procedure dfsBlue(s, p)
  ...
  prov := successor of s is on the local DFSblue stack
  compare_and_swap (s.proviso, ?, prov)
  if s.proviso then
    explore s fully with dfsRed
  ...
procedure dfsRed(s, p)
  ...
  prov := successor of s is on the local DFSred stack
  compare_and_swap (s.proviso, ?, prov)
  if s.proviso then
    explore s fully with dfsRed
  ...
```

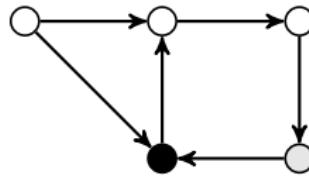
# The Parallel Cycle Proviso



```

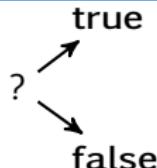
procedure dfsBlue(s, p)
...
prov := successor of s is on the local DFSblue stack
compare_and_swap (s.proviso, ?, prov)
if s.proviso then
  explore s fully with dfsRed
...
procedure dfsRed(s, p)
...
prov := successor of s is on the local DFSred stack
compare_and_swap (s.proviso, ?, prov)
if s.proviso then
  explore s fully with dfsRed
...
  
```

## Performance



# The Parallel Cycle Proviso

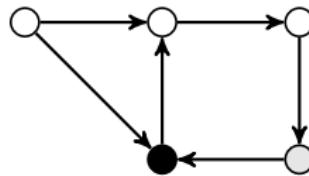
Add a state proviso flag:



```

procedure dfsBlue(s, p)
...
prov := successor of s is on the local DFSblue stack
compare_and_swap (s.proviso, ?, prov)
if s.proviso then
    explore s fully with dfsRed
...
procedure dfsRed(s, p)
...
prov := successor of s is on the local DFSred stack
compare_and_swap (s.proviso, ?, prov)
if s.proviso then
    explore s fully with dfsRed
...
  
```

## Performance



## Correctness

Backtracked states (blue and red):  
 $F = \{s \mid s.\text{proviso} \neq ?\}$   
 $V = \{s \mid s.\text{proviso} = \text{false}\}$

**Lemma 6.** Backtracked states have a proviso set:  $(B \cup R) \subseteq F$ .

**Lemma 8.** Successors of  $V$  states are backtracked:  $V \subseteq \square(B \cup R)$ .

# Conclusions

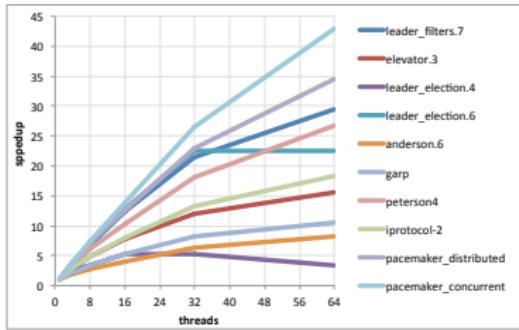
Parallel cycle proviso (% reduction)

Model	Threads	
	1	64
leader_filters.7	2.35	2.35
elevator.3	94.20	94.96
leader_election.4	3.02	3.02
leader_election.6	0.70	0.70
anderson.6	48.43	51.71
garp	18.69	20.79
peterson4	15.52	15.67
iprotocol-2	34.80	37.91
pacemaker_distributed	47.81	48.26
pacemaker_concurrent	45.90	46.00

# Conclusions

Parallel cycle proviso (% reduction)

Model	Threads	
	1	64
leader_filters.7	2.35	2.35
elevator.3	94.20	94.96
leader_election.4	3.02	3.02
leader_election.6	0.70	0.70
anderson.6	48.43	51.71
garp	18.69	20.79
peterson4	15.52	15.67
iprotocol-2	34.80	37.91
pacemaker_distributed	47.81	48.26
pacemaker_concurrent	45.90	46.00

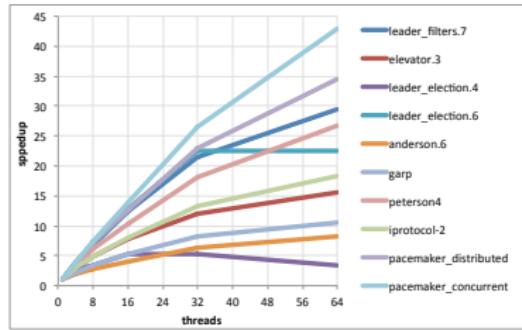


- DFS-proviso's reduction power is preserved
- Speedups maintained

# Conclusions

Parallel cycle proviso (% reduction)

Model	Threads	
	1	64
leader_filters.7	2.35	2.35
elevator.3	94.20	94.96
leader_election.4	3.02	3.02
leader_election.6	0.70	0.70
anderson.6	48.43	51.71
garp	18.69	20.79
peterson4	15.52	15.67
iprotocol-2	34.80	37.91
pacemaker_distributed	47.81	48.26
pacemaker_concurrent	45.90	46.00

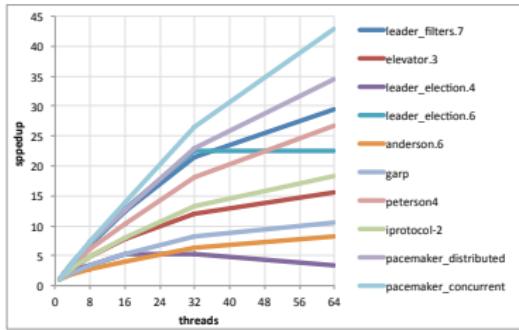


- DFS-proviso's reduction power is preserved
- Speedups maintained
- Demonstrates the strength of parallel DFS-based algorithms

# Conclusions

Parallel cycle proviso (% reduction)

Model	Threads	
	1	64
leader_filters.7	2.35	2.35
elevator.3	94.20	94.96
leader_election.4	3.02	3.02
leader_election.6	0.70	0.70
anderson.6	48.43	51.71
garp	18.69	20.79
peterson4	15.52	15.67
iprotocol-2	34.80	37.91
pacemaker_distributed	47.81	48.26
pacemaker_concurrent	45.90	46.00



- ➊ DFS-proviso's reduction power is preserved
- ➋ Speedups maintained
- ➌ Demonstrates the strength of parallel DFS-based algorithms
- ➍ How much of the DFS order is preserved?
- ➎ On which type of graphs does CNDFS scale?