

UNIVERSITY OF TWENTE.

Formal Methods & Tools.

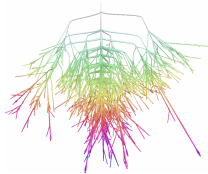
## Multi-Core Model Checking

Alfons Laarman

November 14, 2013



# State Space Explosion

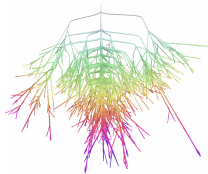


(LaQuSo project)

## An exponential problem

- ▶ system data
- ▶ system components
- ▶ property size

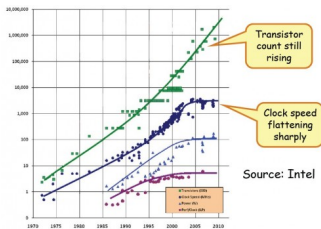
# State Space Explosion



(LaQuSo project)

## An exponential problem

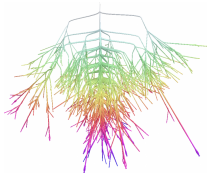
- ▶ system data
- ▶ system components
- ▶ property size



## Approach

- ▶ multi-core model checking

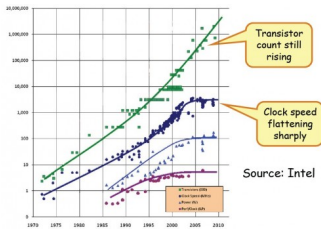
# State Space Explosion



(LaQuSo project)

## An exponential problem

- ▶ system data
- ▶ system components
- ▶ property size



## Approach

- ▶ multi-core model checking
- ▶ Confluence / partial-order reduction
- ▶ Symbolic techniques (BDD-based and SAT-based)
- ▶ On-the-fly techniques
- ▶ Compression techniques

# Multi-Core Model Checking

## Research questions

- ▶ Can model checking scale (linearly, ideally) on modern multi-cores?

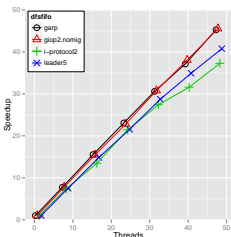
Speedup:

$$S_P = T_{seq} / T_P$$

Ideal:  $S_P = P$

Linear:

$$S_P = P/c$$



# Multi-Core Model Checking

## Research questions

- ▶ Can model checking scale (linearly, ideally) on modern multi-cores?
  - ▶ Formalisms: plain, timed, stochastic, etc
  - ▶ Properties: Reachability, LTL, CTL, etc

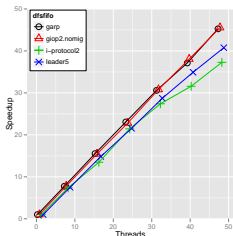
Speedup:

$$S_p = T_{seq}/T_p$$

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Linear:

$$S_p = P/c$$



# Multi-Core Model Checking

## Research questions

- ▶ Can model checking scale (linearly, ideally) on modern multi-cores?
  - ▶ Formalisms: plain, timed, stochastic, etc
  - ▶ Properties: Reachability, LTL, CTL, etc
- ▶ Are our parallel solutions compatible with other techniques?

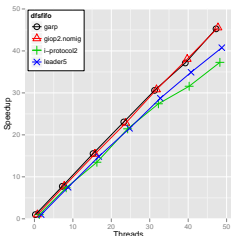
Speedup:

$$S_p = T_{seq}/T_p$$

Ideal:  $S_p = P$

Linear:

$$S_p = P/c$$



+

- ▶ Partial-order reduction (POR)
- ▶ Symbolic exploration
- ▶ On-the-fly techniques
- ▶ Compression techniques

# Challenges

## Difficulties of parallelism

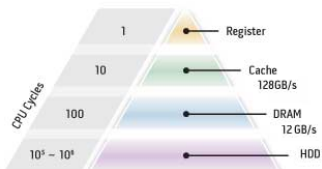
- ▶ Correctness of data structures and algorithms



# Challenges

## Difficulties of parallelism

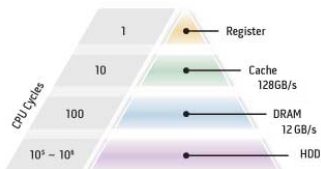
- ▶ Correctness of data structures and algorithms
- ▶ Steep memory hierarchies



# Challenges

## Difficulties of parallelism

- ▶ Correctness of data structures and algorithms
- ▶ Steep memory hierarchies
- ▶ Cache coherence protocol



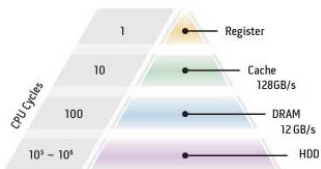
```
#define B (1024*1024*1024)
```

```
int main (void) {
    int result = 0;
    for (int i = 0; i < B; i++)
        result++;
    return result;
}
```

# Challenges

## Difficulties of parallelism

- ▶ Correctness of data structures and algorithms
- ▶ Steep memory hierarchies
- ▶ Cache coherence protocol



```
#define B (1024*1024*1024)
```

```
int main (void) {
    int result = 0;
    for (int i = 0; i < B; i++)
        result++;
    return result;
}
```

```
#define P 16
```

```
static void count (void *arg) {
    int *counter = (int *) arg;
    for (int i = 0; i < B / P; i++) (*counter)++;
}

int main (void) {
    pthread_t thread[P];
    int counters[P] = 0;

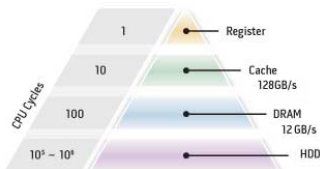
    for (int i = 0; i < P; i++)
        pthread_create (&thread[i], NULL, count, &counters[i]);

    int result = 0;
    for (int i = 0; i < P; i++) {
        pthread_join (thread[i], NULL);
        result += counters[i];
    }
    return result;
}
```

# Challenges

## Difficulties of parallelism

- ▶ Correctness of data structures and algorithms
- ▶ Steep memory hierarchies
- ▶ Cache coherence protocol



```
#define B (1024*1024*1024)   $T = 27$ 
```

```
int main (void) {
  int result = 0;
  for (int i = 0; i < B; i++)
    result++;
  return result;
}
```

```
#define P 16
```

```
static void count (void *arg) {
  int *counter = (int *) arg;
  for (int i = 0; i < B / P; i++) (*counter)++;
}
```

```
int main (void) {
  pthread_t thread[P];
  int counters[P] = 0;
```

```
  for (int i = 0; i < P; i++)
    pthread_create (&thread[i], NULL, count, &counters[i]);
```

```
  int result = 0;
  for (int i = 0; i < P; i++) {
    pthread_join (thread[i], NULL);
    result += counters[i];
  }
```

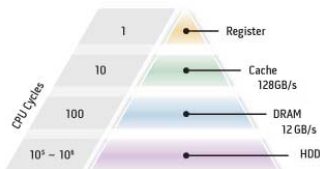
```
  return result;
}
```

 $T_{16} = 32$

# Challenges

## Difficulties of parallelism

- ▶ Correctness of data structures and algorithms
- ▶ Steep memory hierarchies
- ▶ Cache coherence protocol (false sharing)



```
#define B (1024*1024*1024)  T = 27
```

```
int main (void) {
    int result = 0;
    for (int i = 0; i < B; i++)
        result++;
    return result;
}
```

```
#define P 16
```

```
static void count (void *arg) {
    int *counter = (int *) arg;
    for (int i = 0; i < B / P; i++) (*counter)++;
}

int main (void) {
    pthread_t thread[P];
    int ...attribute... ((aligned(64))) counters[P] = 0;

    for (int i = 0; i < P; i++)
        pthread_create (&thread[i], NULL, count, &counters[i]);

    int result = 0;
    for (int i = 0; i < P; i++) {
        pthread_join (thread[i], NULL);
        result += counters[i];
    }
    return result;
}
```

$$T_{16} = 32$$

$$T_{16} = 1.8$$

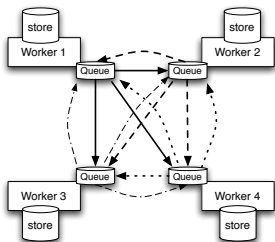
## (Explicit-state) reachability

Problem:

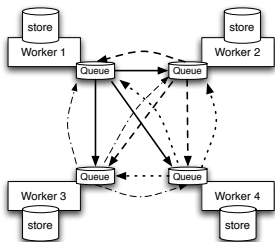
find all reachable states from  $s_0 \in S$  using a next-state  
function:  $post(S) \rightarrow 2^S$

A state  $s \in S$  is a (fixed)  $K$ -sized vector:  $\langle v_1, \dots, v_K \rangle$

# Static partitioning or shared hash table



# Static partitioning or shared hash table

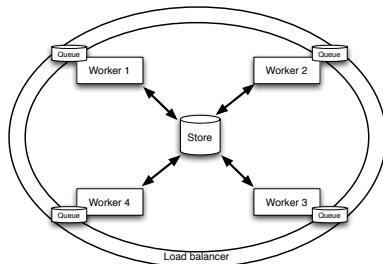
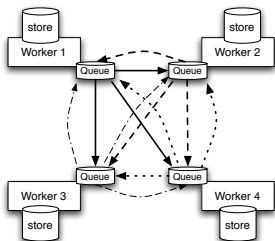


## Static partitioning

- ✗ On-the-fly (BFS)
- ± Scalability (communication on queues)



# Static partitioning or shared hash table



## Static partitioning

- ✗ On-the-fly (BFS)
- ± Scalability (communication on queues)

## Shared hash table

- ✓ On-the-fly: (pseudo) DFS & BFS
- ? Scalability

# Lockless Hash Table: Design

LAARMAN, VAN DE POL, WEBER [FMCAD10]

## Main bottlenecks

- ▶ State store: concurrent access
- ▶ Graph traversal: Random memory access (bandwidth)

# Lockless Hash Table: Design

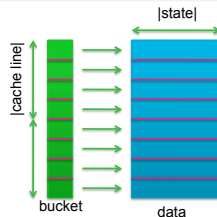
LAARMAN, VAN DE POL, WEBER [FMCAD10]

## Main bottlenecks

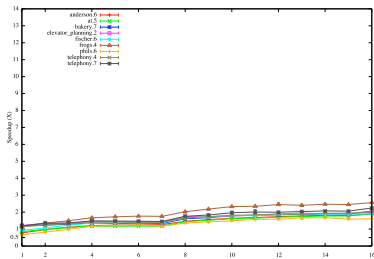
- ▶ State store: concurrent access
- ▶ Graph traversal: Random memory access (bandwidth)

## Design

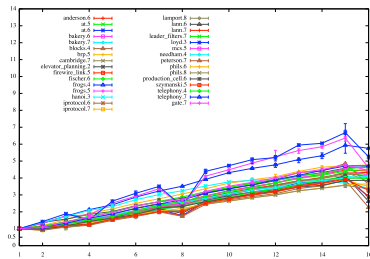
- ▶ Hash memoization
- ▶ **Walking the Line**
- ▶ In-situ locking



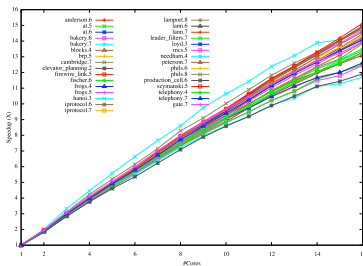
# Experiments from 2010 (BEEM database)



SPIN 5.2.4 (NASA/JPL)



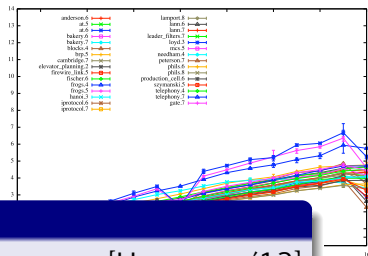
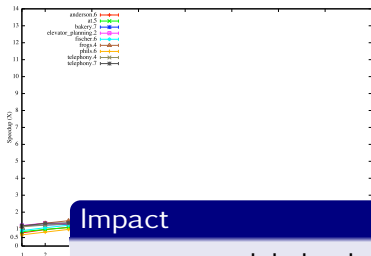
DiVinE 2.2 (Brno,CZ)



LTSmin

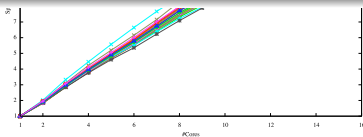
(shared hash table)

# Experiments from 2010 (BEEM database)



## Impact

- ▶ SPIN model checker ..... [HOLZMANN'12]
- ▶ GPU model checking ..... [SULEWSKI ET AL '11,12]
- ▶ Parallel BDDs ..... VAN DIJK, LAARMAN, VAN DE POL [AVOCS12][PDMC12]



LTSmin

(shared hash table)

# Reachability

- ▶ Scalability comes from limiting bandwidth usage
- ▶ Correctness established with model checker

		<i>Explicit state</i>	<i>+ Compression</i>	<i>+ POR</i>	<i>+ On-the-fly</i>
Reachability	✓	?	?	✓	

# Reachability

- ▶ Scalability comes from limiting bandwidth usage
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		<i>Explicit state</i>		
		+ <i>Compression</i>		
		+ <i>POR</i>		
		+ <i>On-the-fly</i>		
Reachability		✓	?	✓

- ▶ Partial-order reduction can be computed (state) locally

# Reachability

- ▶ Scalability comes from limiting bandwidth usage
- ▶ Correctness established with model checker

	Explicit state	+ Compression	+ POR	+ On-the-fly
Reachability	✓	✗	✓	✓

- ▶ Partial-order reduction can be computed (state) locally
- ▶ No compression, but states are often very similar due to **locality**

$\langle 3, 5, 5, 4, 1, 3 \rangle \rightarrow \langle 3, 5, 9, 3, 1, 3 \rangle$

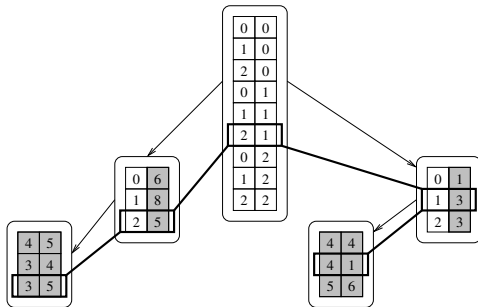


# Recursive indexing

[HOLZMANN 97][BLOM ET AL. 08]

4	5	6	4	4	1
3	4	8	4	4	1
3	5	5	4	4	1
4	5	6	4	1	3
3	4	8	4	1	3
3	5	5	4	1	3
4	5	6	5	6	3
3	4	8	5	6	3
3	5	5	5	6	3

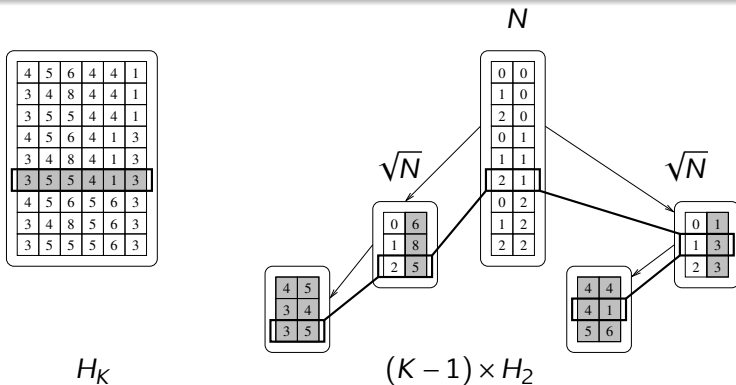
$H_K$



$(K-1) \times H_2$

# Recursive indexing

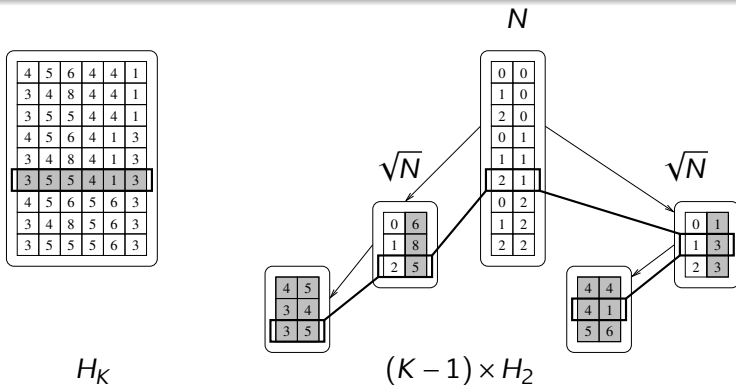
[HOLZMANN 97][BLOM ET AL. 08]



- ✓ Combinatorial  $\implies$  balanced tree  $(N + 2\sqrt{N} + 4\sqrt[4]{N}) \dots \approx N$   
Compresses states of length  $K$  to almost  $2!$

# Recursive indexing

[HOLZMANN 97][BLOM ET AL. 08]



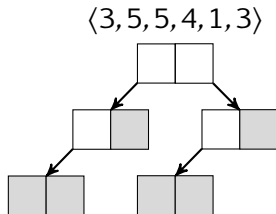
- ✓ Combinatorial  $\implies$  balanced tree  $(N + 2\sqrt{N} + 4\sqrt[4]{N}) \dots \approx N$   
Compresses states of length  $K$  to almost  $2!$
- ✗ Hard to parallelize (flatliners)

# Parallel Tree Compression

LAARMAN, VAN DE POL, WEBER [SPIN11]

## Solution

- ▶ Temporary binary tree structure on stack

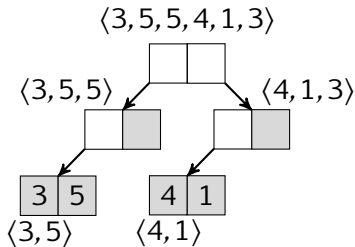


# Parallel Tree Compression

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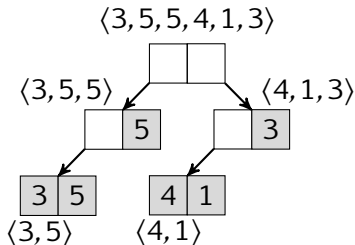
# Parallel Tree Compression

LAARMAN, VAN DE POL, WEBER [SPIN11]

## Solution

- ▶ Temporary binary tree structure on stack
- ▶ Reuse lockless hash table (merge tables)

4	1
3	5

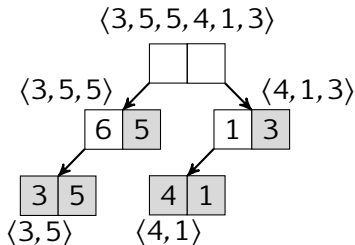
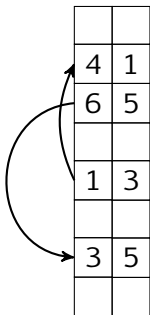


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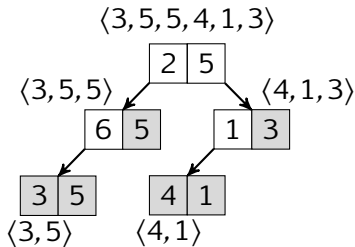
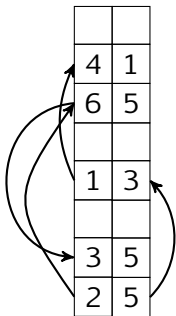


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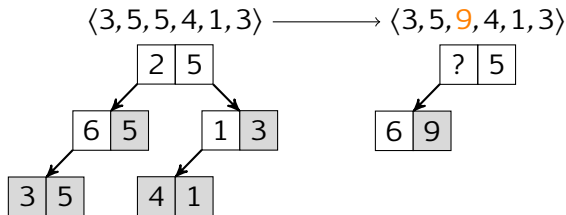
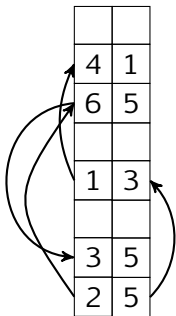


# Parallel Tree Compression

LAARMAN, VAN DE POL, WEBER [SPIN11]

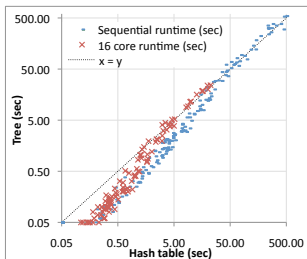
## Solution

- ▶ Temporary binary tree structure on stack
- ▶ Reuse lockless hash table (merge tables)
- ▶ Incremental updates:  $(K - 1) \rightarrow \log_2(K - 1)$  lookups



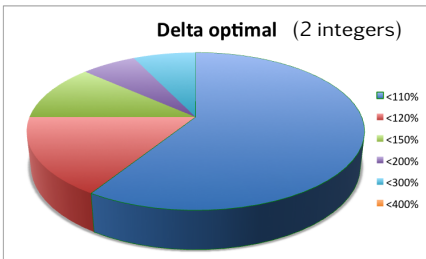
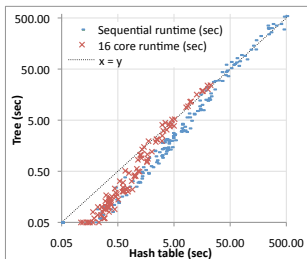
# Experiments from 2011 [BEEM database]

LAARMAN, VAN DE POL, WEBER [SPIN11]



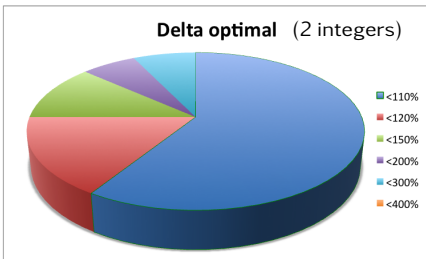
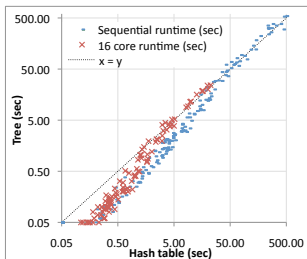
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LAARMAN, VAN DE POL, WEBER [SPIN11]



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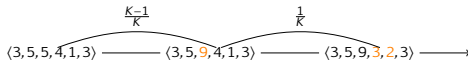
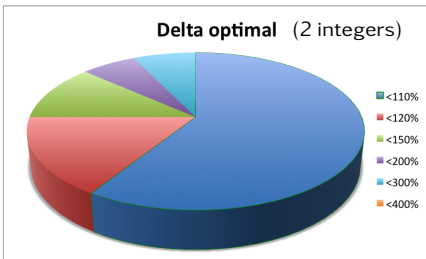
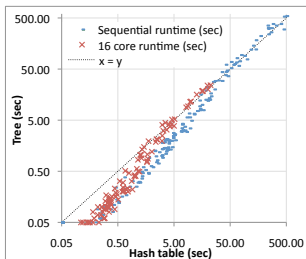
$\langle 3, 5, 5, 4, 1, 3 \rangle \longrightarrow \langle 3, 5, 9, 4, 1, 3 \rangle \longrightarrow \langle 3, 5, 9, 3, 2, 3 \rangle \longrightarrow$

## Information theoretical *lower bound*?

- ▶ View states as stream of variables:  $\langle v_1^1, \dots, v_K^1 \rangle, \langle v_1^2, \dots, v_K^2 \rangle, \dots$  with  $|v_j^i| = 2^{32}$

# Experiments from 2011 [BEEM database]

LAARMAN, VAN DE POL, WEBER [SPIN11]

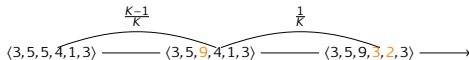
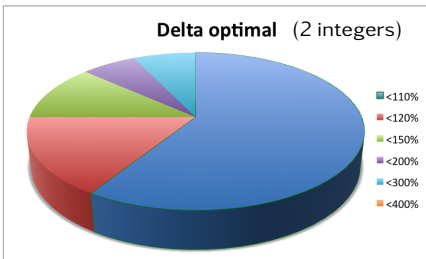
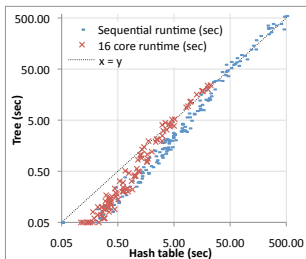


## Information theoretical *lower bound*?

- ▶ View states as stream of variables:  $\langle v_1^1, \dots, v_K^1 \rangle, \langle v_1^2, \dots, v_K^2 \rangle, \dots$  with  $|v_j^i| = 2^{32}$
- ▶  $p(v_j^i = v_j^{i-1}) = \frac{K-1}{K}$  and  $p(v_j^i \neq v_j^{i-1}) = \frac{1}{K}$  (under-estimation)

# Experiments from 2011 [BEEM database]

LAARMAN, VAN DE POL, WEBER [SPIN11]

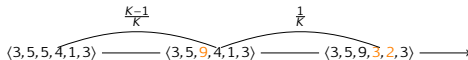
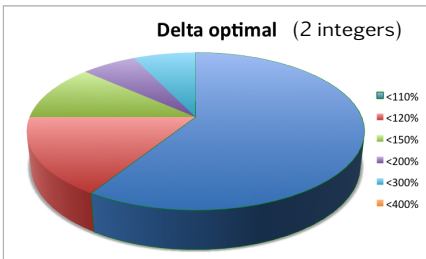
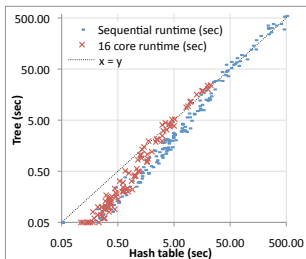


## Information theoretical lower bound?

- ▶ View states as stream of variables:  $\langle v_1^1, \dots, v_K^1 \rangle, \langle v_1^2, \dots, v_K^2 \rangle, \dots$  with  $|v_j^i| = 2^{32}$
- ▶  $p(v_j^i = v_j^{i-1}) = \frac{K-1}{K}$  and  $p(v_j^i \neq v_j^{i-1}) = \frac{1}{K}$  (under-estimation)
- ▶ Entropy per state:  $K \times H(s_j^i) \approx \log_2(2^{32}) + \log_2(K)$  bits  $\approx 1 + \epsilon$  integer

# Experiments from 2011 [BEEM database]

LAARMAN, VAN DE POL, WEBER [SPIN11]



## Information theoretical lower bound?

- ▶ View states as stream of variables:  $\langle v_1^1, \dots, v_K^1 \rangle, \langle v_1^2, \dots, v_K^2 \rangle, \dots$  with  $|v_j^i| = 2^{32}$
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- ▶ Entropy per state:  $K \times H(s_j^i) \approx \log_2(2^{32}) + \log_2(K)$  bits  $\approx 1 + \epsilon$  integer
- ▶ Halve the root table with *Cleary compact hash table* [MEMICS11]

# Reachability

- ▶ Scalability from merging tables & incremental updates
- ▶ Correctness proved by hand
  - ▶ The recursive tree function is an injection [SPIN11]

	<i>Explicit state</i>
	<i>+ Compression</i>
	<i>+ POR</i>
	<i>+ On-the-fly</i>
Reachability	✓
	✓
	✓
	✓



# Reachability

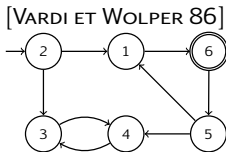
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	Explicit state	+ Compression	+ POR	+ On-the-fly
Reachability	✓	✓	✓	✓
LTL	?	?	?	?

Still only safety...

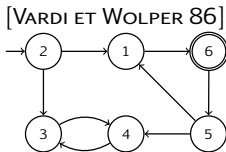
## LTL

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*“It is as yet an open problem how a liveness verification algorithm could be generalized to the use of more than two processing cores while retaining a low search complexity.”*

[HOLZMANN '07]

*“One of the most important open problems of parallel LTL model checking is to design an on-the-fly scalable parallel algorithm with linear time complexity.”*

[BRIM, BARNAT ET ROČKAJ '11]

# Nested Depth-First Search for LTL

[COURCOUBETIS'93]

```
procedure DFSblue(s)
  s.cyan := true
  for all s' in post(s) do
    if  $\neg t.\text{blue} \wedge \neg t.\text{cyan}$  then
      DFSblue(s')
  if accepting(s) then
    DFSred(s)
  s.blue := true
  s.cyan := false
procedure DFSred(s)
  s.red := true
  for all s'  $\in$  post(s) do
    if t.cyan then ExitCycle
    if  $\neg t.\text{red}$  then DFSred(s')
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## Nested DFS (NDFS)

- ▶ Linear time

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```

## Nested DFS (NDFS)

- ▶ Linear time
- ▶ DFS itself is likely not parallelizable
  - ▶ DFS order is a P-complete problem
  - ▶ We assume:  $P \neq NC$

# Multi-core Nested Depth-First Search (Principle)

[ATVA11], [PDMC11], [ATVA12]

*code for worker  $p$ :*

```
procedure DFSblue(s,p)
  s.cyan[p] := true
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    if  $\neg$ t.red[p] then DFSred(s',p)
```

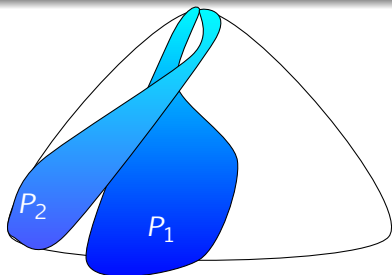
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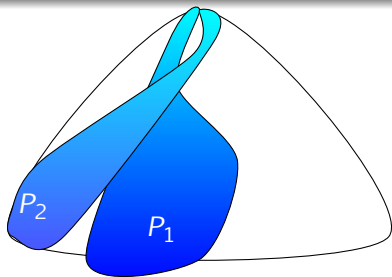
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- ▶ In reality more **synchronization**!
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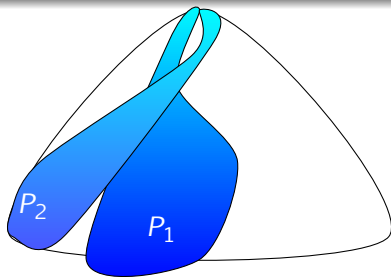
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LAARMAN ET VAN DE POL [PDMC11]  
EVANGELISTA, LAARMAN ET AL. [ATVA12]
- ▶ **Lemma 4:** Blue states have blue or cyan successors:  
 $Blue \subseteq \bigcup_p \square (Blue \cup Cyan_p)$ .

# LTL and Partial-Order Reduction

- ▶ Scalability due to hash/tree table (**linear-time**)
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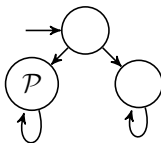
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# LTL and Partial-Order Reduction

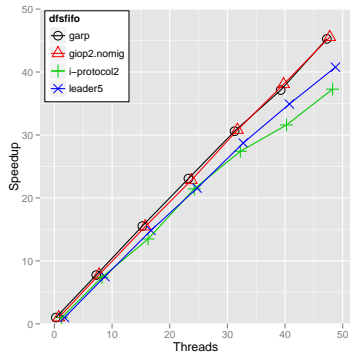
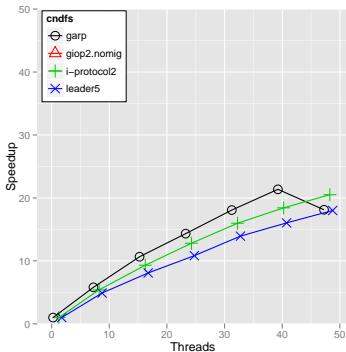
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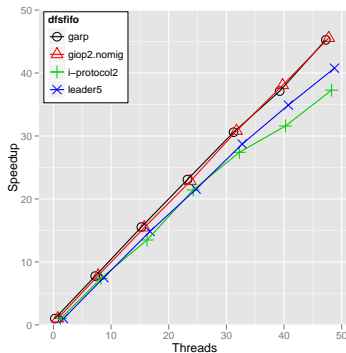
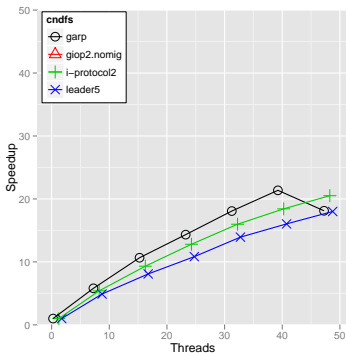
- ▶ For **livelocks** ( $\supset$  LTL), any unfair cycle is a counter example!
- ▶ Parallel DFS<sub>FIFO</sub> LAARMAN ET FARAGÓ [NFM13]



# Experiments: LTL with Partial-Order Reduction



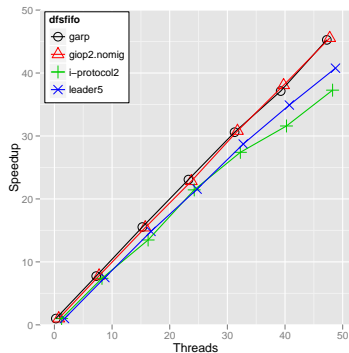
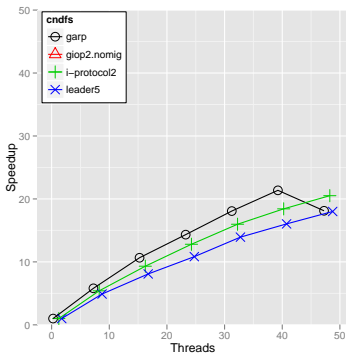
# Experiments: LTL with Partial-Order Reduction



Partial-order reductions:

	LTSMIN DFS <sub>FIFO</sub>	SPIN NDFS
leader	0.49%	1.15%
garp	2.18%	12.73%
giop	1.86%	2.42%
i-prot	31.83%	41.37%

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i-prot	31.83%	41.37%

Max. model size explored in 30 min.

cores	LTSMIN DFS <sub>FIFO</sub>	DiViNE OWCTY
1	12	9
48	15	11

DFS<sub>FIFO</sub> VS OWCTY + POR [BRIM ET AL '10]

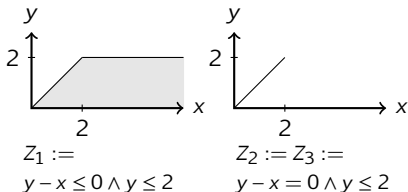
Formalism	Property	Explicit state	+ Compression	+ POR	+ On-the-fly
Plain	Reachability	✓	✓	✓	✓
	LTL	✓	✓	✗	✓
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Timed	Reachability	?	?	?	?
	LTL	?	?	?	?

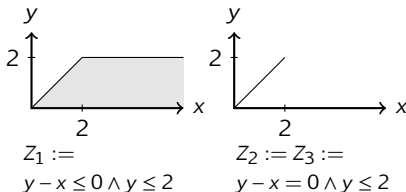
## Timed Automata

States are semi-symbolic:  $s = \langle d, \sigma \rangle$  (finite continuous-time abstraction)



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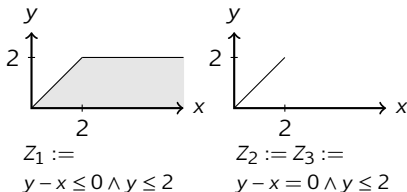
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Subsumption is a simulation relation which allows another, dynamic abstraction

# Timed Automata

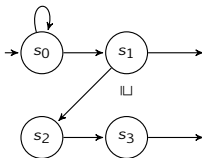
DALSGAARD, LAARMAN, OLESEN, LARSEN, VAN DE POL [FORMATS12]

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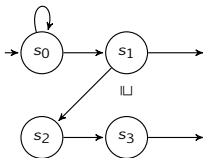
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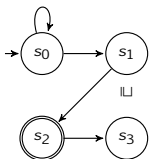
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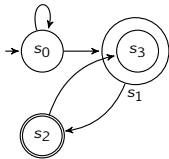
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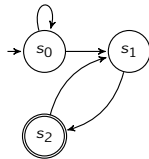
- ✗ Subsumption does not preserve Büchi emptiness! [TRIPAKIS'09]



Timed abstraction



$s_3 \sqsubseteq s_1$



subsumption

# Analysis of accepting cycles/spirals with subsumption

LAARMAN, OLESEN, DALSGAARD, LARSEN, VAN DE POL [CAV13]

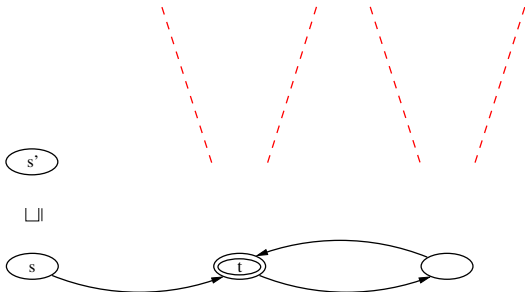
**Lemma:** If  $s$  has an accepting cycle then any  $s' \sqsupseteq s$  has it as well



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Preservation of accepting cycles

Proof Sketch

$s'$

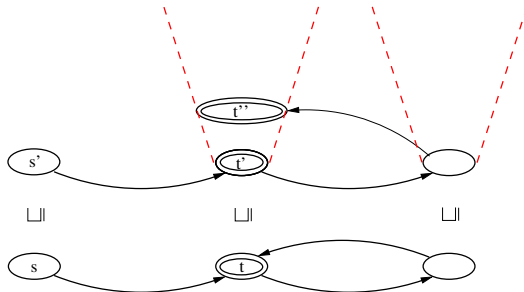
$\sqsupseteq$

$s \rightarrow^* t \rightarrow^+ t$

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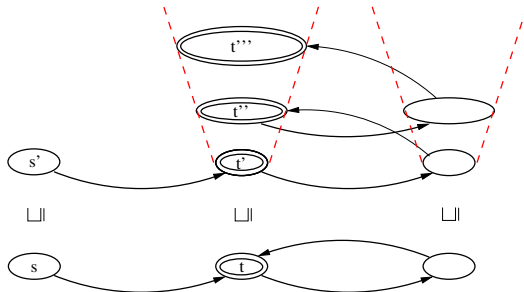
Proof Sketch

$s'$	$\rightarrow^*$	$t'$	$\rightarrow^+$	$t''$
$\sqcup$		$\sqcup$		$\sqcup$
$s$	$\rightarrow^*$	$t$	$\rightarrow^+$	$t$

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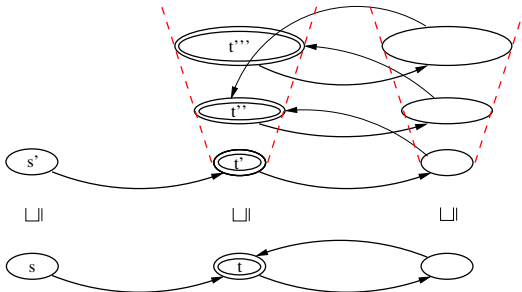
Proof Sketch

$s'$	$\rightarrow^*$	$t'$	$\rightarrow^+$	$t''$	$\rightarrow^+$	$\dots\dots$	$\rightarrow^+$	$t'''$
$\sqcup$		$\sqcup$		$\sqcup$				$\sqcup$
$s$	$\rightarrow^*$	$t$	$\rightarrow^+$	$t$	$\rightarrow^+$	$\dots\dots$	$\rightarrow^+$	$t$

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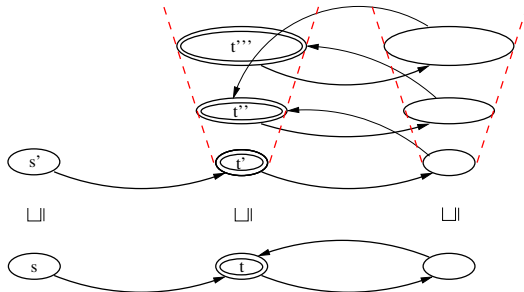
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$\sqcup$		$\sqcup$		$\sqcup$				$\sqcup$		$\sqcup$
$s$	$\rightarrow^*$	$t$	$\rightarrow^+$	$t$	$\rightarrow^+$	$\dots \dots$	$\rightarrow^+$	$t$	$\rightarrow^+$	$t$

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$\sqcup \sqcup$		$\sqcup \sqcup$		$\sqcup \sqcup$				$\sqcup \sqcup$		$\sqcup \sqcup$
$s$	$\rightarrow^*$	$t$	$\rightarrow^+$	$t$	$\rightarrow^+$	$\dots \dots$	$\rightarrow^+$	$t$	$\rightarrow^+$	$t$

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# Results with Parallel Timed Reachability / LTL

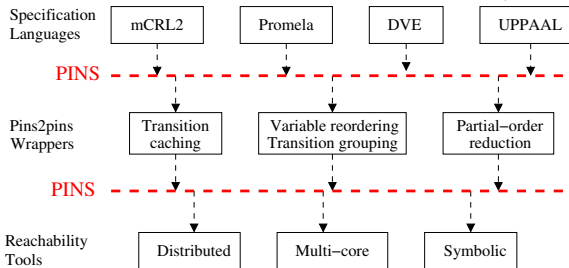
LAARMAN, OLESEN, DALSGAARD, LARSEN, VAN DE POL [CAV13][FORMATS2012]

- ▶ Add full LTL to timed automata
- ▶ Runtimes 60x faster than UPPAAL on 48 cores
- ▶ Up to 70x reductions due to subsumption
- ▶ Tree compression for large discrete states

# LTSmin

LTSMIN BLOM, VAN DE POL, WEBER [CAV09]

<http://fmt.cs.utwente.nl/tools/ltsmin/> (open source)



## Other work

- ▶ Guard-based POR . . . . . PATER, LAARMAN, VAN DE POL [SPIN13]
- ▶ PROMELA formalism . . . . . VAN DER BERG ET LAARMAN [PDMC12]
- ▶ LTSMIN tool . . . . . LAARMAN, WEBER, VAN DE POL [NFM11]

# Contributions

Formalism	Property	Explicit state + Compression + POR + On-the-fly	publications
Plain	Reachability	✓ ✓ ✓ ✓	[FMCAD10][SPIN11][MEMICS11]
	LTL	✓ ✓ 1/2 ✓	[ATVA11][PDMC11][ATVA12]
	... Livelocks	✓ ✓ ✓ ✓	[SPIN13][NFM13]
Timed	Reachability	✓ ✓ - ✓	[FORMATS12]
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- ▶ Multi-core BDDs ..... VAN DIJK, LAARMAN, VAN DE POL [PDMC12]
- ▶ One-Way-Catch-Them Young (LTL).....[BARNAT,BRIM,ROČKAÍ'01]
- ▶ Topological sort proviso (POR).....[BARNAT,BRIM,ROČKAÍ'10]
- ▶ CTL ..... [SAAD ET AL'12]

# Future work

Formalism	Property	Explicit state	+ Compression	+ POR	+ On-the-fly
Plain	Reachability	✓	✓	✓	✓
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	LTL	✓	✓	-	✓

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	CTL	?	?	?	?
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	LTL	✓	✓	-	✓
	CTL	?	?	?	?

# Future work

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Plain	Reachability	✓	✓	✓	✓	✓	?
	LTL	✓	✓	1/2	✓	?	?
	CTL	?	?	?	?	?	?
Timed	Reachability	✓	✓	–	✓	?	?
	LTL	✓	✓	–	✓	?	?
	CTL	?	?	?	?	?	?

# Future work

Formalism	Property	Explicit state	+ Compression	+ POR	+ On-the-fly	Symbolic	Distributed
Plain	Reachability	✓	✓	✓	✓	✓	?
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	CTL	?	?	?	?	?	?
Timed	Reachability	✓	✓	-	✓	?	?
	LTL	✓	✓	-	✓	?	?
	CTL	?	?	?	?	?	?
Stoch.	Reachability	?	?	?	?	?	?
	LTL	?	?	?	?	?	?
	CTL	?	?	?	?	?	?

# Future work

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

## Other questions

- ▶ Can our parallel DFS-based solutions be generalized?
  - ▶ (Bottom-)SCC detection
  - ▶ Emptiness of {Tree, Rabin, Streett} automata, etc.
  - ▶ What search-order property is preserved?

Stoch.	Reachability	?	?	?	?	?	?
	LTL	?	?	?	?	?	?
	CTL	?	?	?	?	?	?

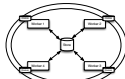
### Static partitioning or shared hash table

[FMCAO10]



#### Static partitioning

- ✗ On-the-fly (BFS)
- ± Scalability (communication on queues)



#### Shared hash table

- ✓ On-the-fly: (pseudo) DFS & BFS
- ✓ Scalability

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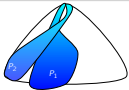
### Multi-core Nested Depth-First Search (Principle)

[ATVA11][FMCA11][ATVA12]

```
code for worker w:
procedure DFSblue(s,p)
  s.cyan[p] := true
  for all s' in shuffle(post(s)) do
    if ~s'.blue ∧ ~t.cyan[p] then
      DFSblue(s',p)
  if accepting(s) then
    DFSred(s,p)
  s.blue := true
  s.cyan[p] := false
procedure DFSred(s,p)
  s.red[p] := true
  for all s' ∈ post(s) do
    if t.cyan[p] then ExitCycle
    if ~t.red[p] then DFSred(s',p)
```

#### Multi-core NDFS

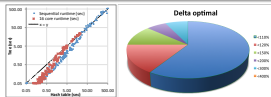
- ▶ States in shared tree/table
- ▶ Independent forward search
- ▶ Share blue color
- ▶ repair DFS order (not shown)



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### Experiments from 2011 [BEEM database]

[SPW11]



#### Information theoretical optimum?

- ▶ View states as  $K$ -periodic stream of  $2^{32}$ -valued variables
- ▶ Information entropy per state:  $\log_2(2^{32}) + \log_2(K)$  bits  $\approx 1 + \epsilon$  integer
- ▶ Halve root table with compact hash table [MEMCS11]

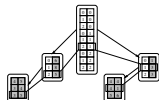
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### Recursive indexing

[HOLZMANN 97][BLOM ET AL. 08]



$H_K$



$(K-1) \times H_2$

- ✓ Combinatorial  $\implies$  balanced tree  $(N + 2\sqrt{N} + 4\sqrt[4]{N}) \dots \approx N$
- Compresses states of length  $K$  to almost  $2^1$
- ✗ Hard to parallelize (flatliners)

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### Contributions

Formalism	Property	Explicit state + Compression + POR + On-the-fly Symbolic	publications
Plain	Reachability	✓ 1/2 ✓ ✓	[FMCAO10][SPW11][MEMCS11]
	LTL	✓ 1/2 ✓ ?	[ATVA11][FMCA11][ATVA12]
	... Liveness	✓ ✓ ✓ ?	[SPW13][NFM13]
Timed	Reachability	✓ ✓ - ?	[FORMATS12]
	LTL	✓ ✓ - ?	[CAV13]

#### Related work

- ▶ Multi-core BDDs ..... [FMCA13][1]
- ▶ One-Way-Catch-Them-Young (LTL) ..... [BENSAÏD, BENAÏD, ROUÏCHA '01]
- ▶ Topological sort provisos (POR) ..... [BENSAÏD, BENAÏD, ROUÏCHA '10]
- ▶ CTL ..... [SAAD ET AL. 12]

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