

# Efficient Inclusion Checking on Explicit and Semi-Symbolic Tree Automata

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<sup>2</sup>Uppsala University, Sweden

<sup>3</sup>VERIMAG, UJF/CNRS/INPG, Gières, France

October 13, 2011

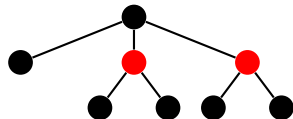
# Outline

- 1 Tree Automata
- 2 Downward Inclusion Checking
- 3 Semi-Symbolic Encoding of Non-Deterministic TA
- 4 Conclusion

# Trees

Very popular in computer science:

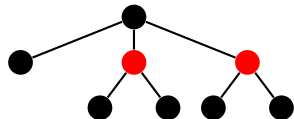
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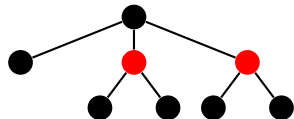
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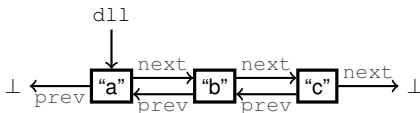
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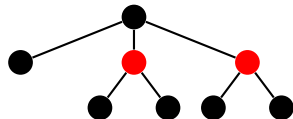
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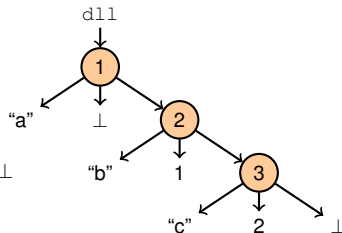
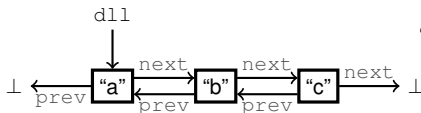
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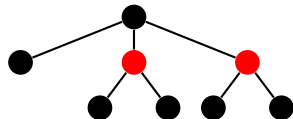
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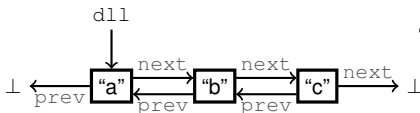
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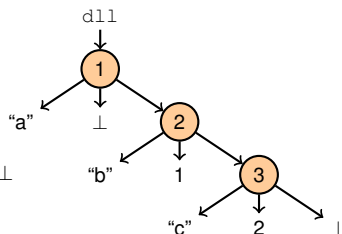


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■ extension of finite automaton to trees:

- $Q$  ... set of **states**,
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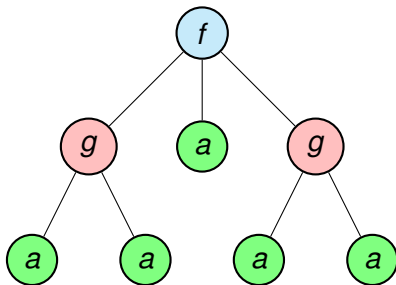
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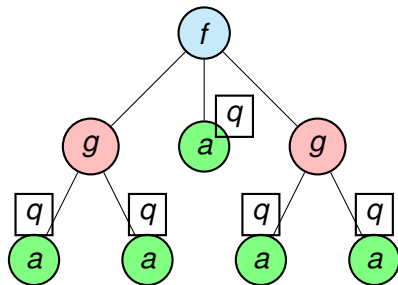
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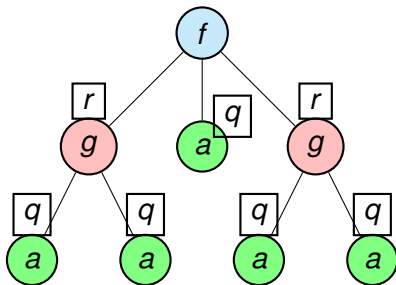
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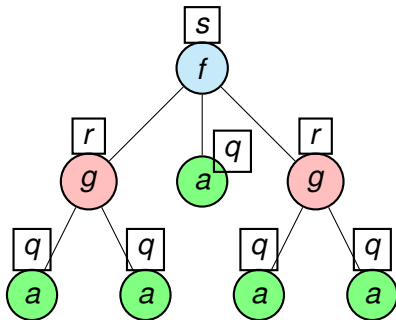
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- handling **large alphabets** (MSO, WSkS).

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- **downward simulation:**  $q \preceq_D r \implies$

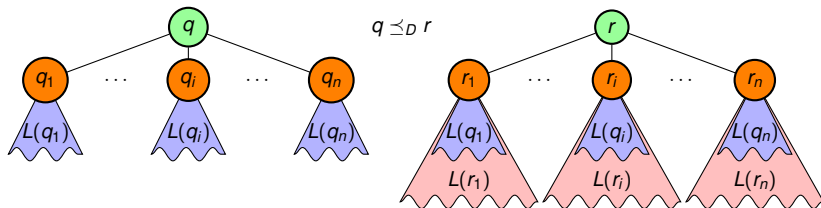
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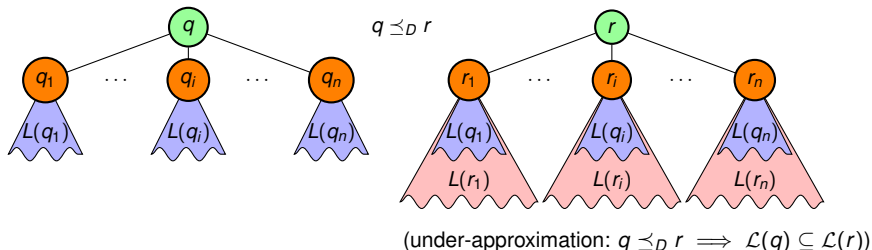


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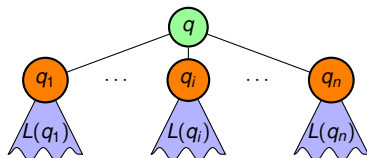


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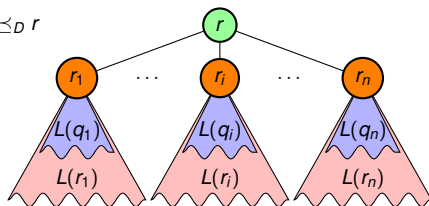
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$q \preceq_D r$



(under-approximation:  $q \preceq_D r \implies \mathcal{L}(q) \subseteq \mathcal{L}(r)$ )

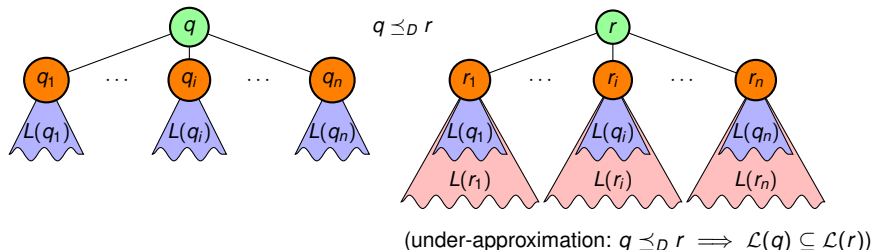
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- upward simulation
  - ▶ not compatible with language inclusion,
  - ▶ but can be used to speed up exact checking



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  - antichains combined with simulation<sup>2,3</sup>

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<sup>3</sup> P. Abdulla, Y.-F. Chen, L. Holík, R. Mayr, T. Vojnar. When Simulation Meets Antichains. TACAS'10.

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- 5 If you encounter  $(f, R)$ , where  $f \in F_S, R \cap F_B = \emptyset$ , return **false**.
- 6 If no new pairs are found, return **true**.



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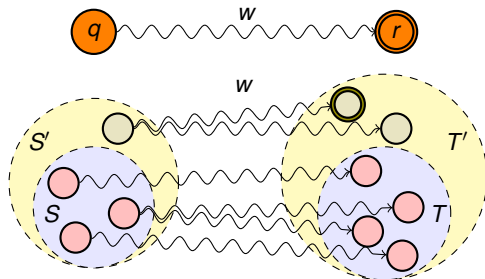
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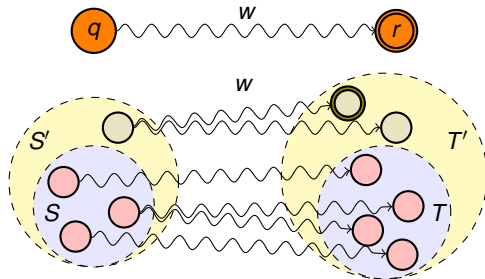
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- 2 use **simulation** to further prune the searched space.

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- The counterexample may be at root ... takes long to get there. 😞
- Upward simulation → hard to compute and too strong. 😞
- Not compatible with downward simulation (easy & rich). 😞

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- inspired by XML Schema containment checking<sup>4</sup>,

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- uses antichains and [downward simulation](#).

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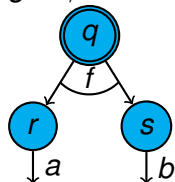
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$$r \xrightarrow{a}$$

$$s \xrightarrow{b}$$



$\mathcal{A}_B$

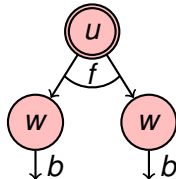
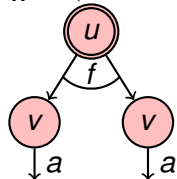
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$$v \xrightarrow{a}$$

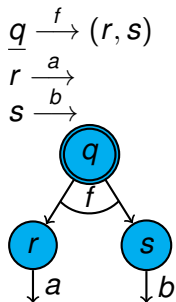
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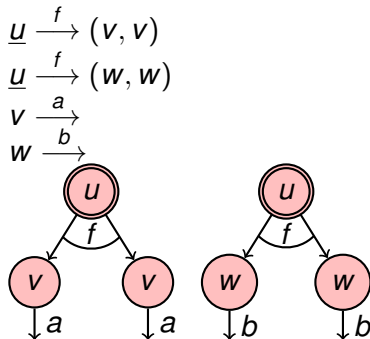


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$\mathcal{A}_B$



$\mathcal{L}(q) \subseteq \mathcal{L}(u)$  if and only if

$$\mathcal{L}(r) \times \mathcal{L}(s) \subseteq (\mathcal{L}(v) \times \mathcal{L}(v)) \cup (\mathcal{L}(w) \times \mathcal{L}(w))$$

(language inclusion of tuples!)

# Checking language inclusion of tuples

Note that in general

$$(\mathcal{L}(v_1) \times \mathcal{L}(v_2)) \cup (\mathcal{L}(w_1) \times \mathcal{L}(w_2)) \neq (\mathcal{L}(v_1) \cup \mathcal{L}(w_1)) \times (\mathcal{L}(v_2) \cup \mathcal{L}(w_2))$$

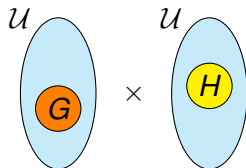
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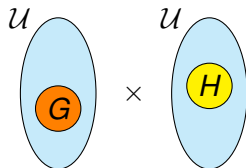
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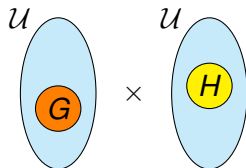
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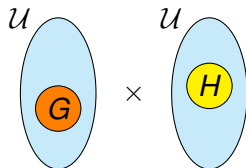
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Using distributive laws, this becomes

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- Sooner or later, the DFS either
  - reaches a leaf, or
  - reaches a pair  $(q_S, P_B)$  which is already in  $W$ .

# Optimised Downward Inclusion Checking Algorithm

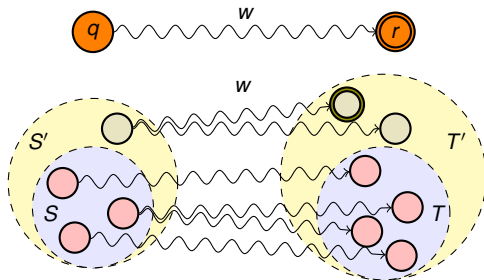
Optimisations:

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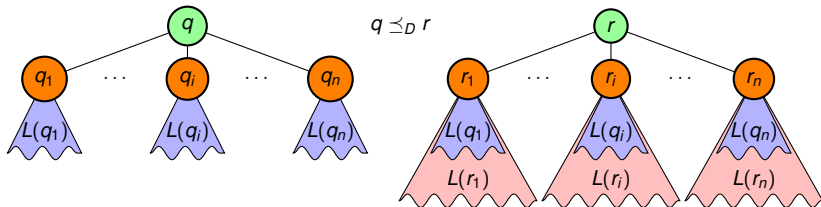
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# Experiments

Size	50–250	400–600
Pairs	323	64
Timeout	20 s	60 s
Up	31.21 %	9.38 %
Up+s	0.00 %	0.00 %
Down	53.50 %	39.06 %
Down+s	15.29 %	51.56 %
Avg up	1.71	0.34
Avg down	3.55	46.56

a)

Size	50–250	400–600
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Timeout	20 s	60 s
Up+s	81.82 %	20.31 %
Down+s	18.18 %	79.69 %
Avg up	1.33	9.92
Avg down	3.60	2116.29

b)

a) Comparison of methods (w/ simulation computation time).

b) Comparison of methods (w/o simulation computation time).

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- FV of programs with complex dynamic data structures,
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Current approach:

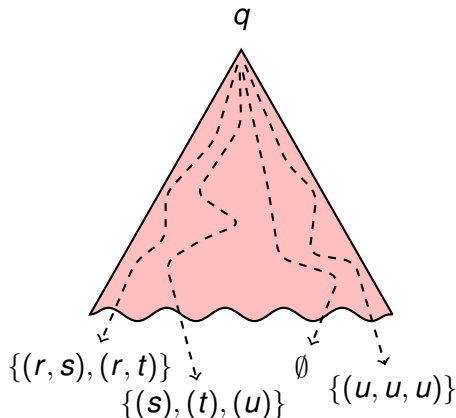
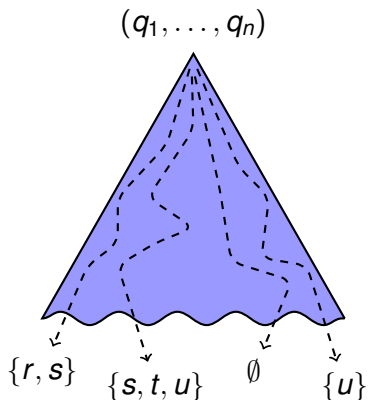
- use the MONA tree automata package (MTBDD-based)
- **But** only deterministic automata supported →
  - often runs out of reasonable memory or time.

# Dual representation

- Multi-terminal binary decision diagrams (MTBDDs)

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- Bottom-up:                      ■ Top-down:



**Bottom-up** : inspired by MONA, but has **sets of states** in leaves.

**Top-down** : **sets of state tuples** in leaves.

# Semi-Symbolic Encoding of Non-Deterministic TA

## Algorithms for

- union,
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- language inclusion checking (both upward and downward),
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- $\sim$  8500 times faster downward inclusion checking than explicit representation for tested automata with large alphabets.

# Conclusion

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- . . . that makes use of **antichains** and **downward simulation**.
- A new **symbolic encoding** of non-deterministic tree automata proposed.

- Optimise the downward inclusion to also cache pairs  $(q, S)$ , such that  $\mathcal{L}(q) \subseteq \mathcal{L}(S)$ .

# Future work

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- Improve the symbolic downward simulation algorithm.
- Create a tree automata package replacing MONA.

Thank you for your attention.

Questions?