

# Efficient Convex Zone Merging in Parametric Timed Automata

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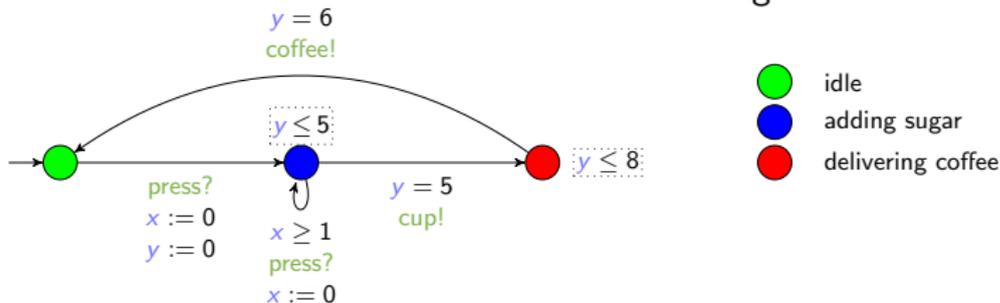
<sup>3</sup> Aarhus University, Aarhus, Denmark

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and CNRS-INS2I project TrAVAIL.

# Timed Automaton ( TA)

- ▶ Finite state automaton (sets of **locations** and **actions**) augmented with
  - ▶ a set  $X$  of **clocks** [AD94]
    - ▶ Real-valued variables evolving linearly **at the same rate**
    - ▶ Can be compared to integer constants in invariants and guards
- ▶ Features
  - ▶ Location **invariant**: property to be verified to stay at a location
  - ▶ Transition **guard**: property to be verified to enable a transition
  - ▶ Clock **reset**: some clocks can be **set to 0** along transitions

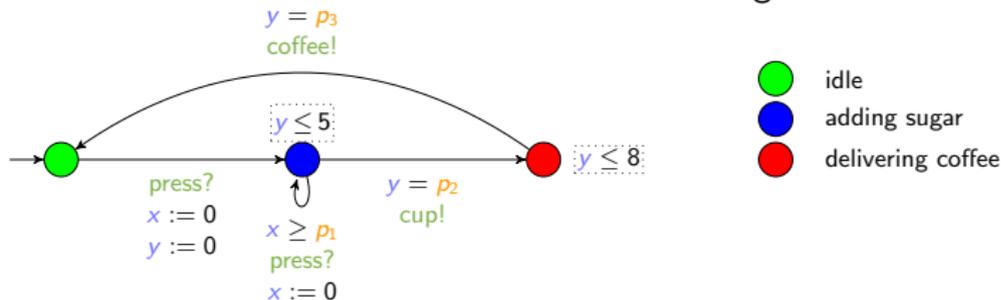


[AD94] Rajeev Alur and David L. Dill. "A theory of timed automata". In: *Theoretical Computer Science* 126.2 (Apr. 1994), pp. 183–235. ISSN: 0304-3975. DOI: 10.1016/0304-3975(94)90010-8

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# Parametric Timed Automaton (PTA)

- ▶ Finite state automaton (sets of **locations** and **actions**) augmented with
  - ▶ a set  $X$  of **clocks** [AD94]
    - ▶ Real-valued variables evolving linearly **at the same rate**
    - ▶ Can be compared to integer constants in invariants and guards
  - ▶ a set  $P$  of **parameters** (**unknown constants**) [AHV93]
- ▶ Features
  - ▶ Location **invariant**: property to be verified to stay at a location
  - ▶ Transition **guard**: property to be verified to enable a transition
  - ▶ Clock **reset**: some clocks can be **set to 0** along transitions



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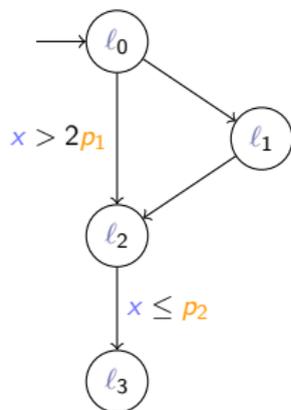
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- ▶ **Symbolic state**: a pair with a location and an attached parametric zone (constraint)
- ▶ **Parametric zone**: a set of valuations defined by conjunctions of constraints on clocks and parameters

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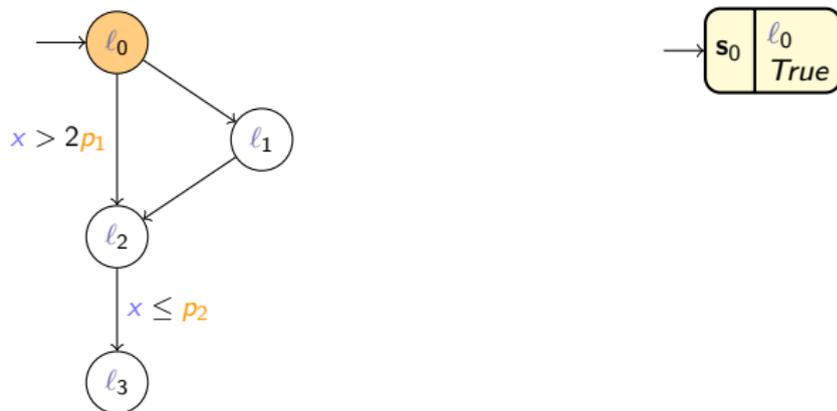
[HT15]

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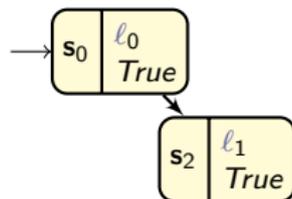
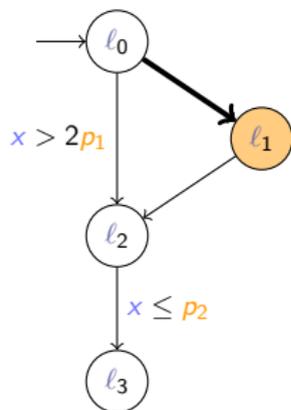
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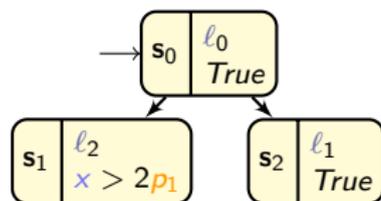
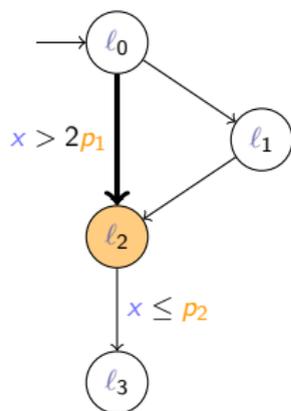
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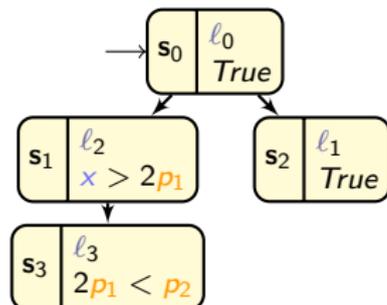
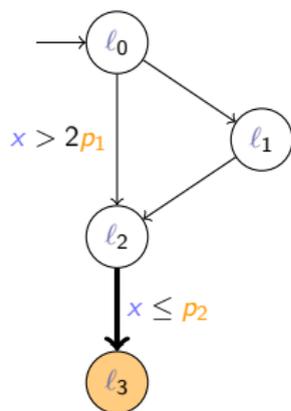
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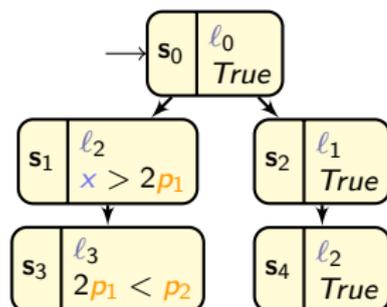
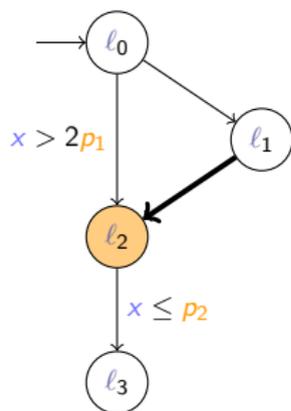
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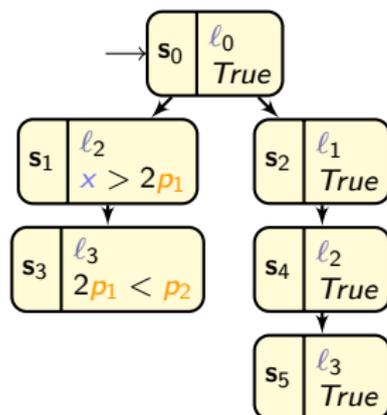
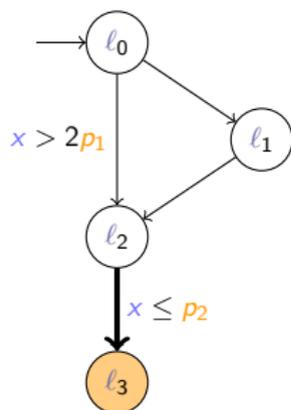
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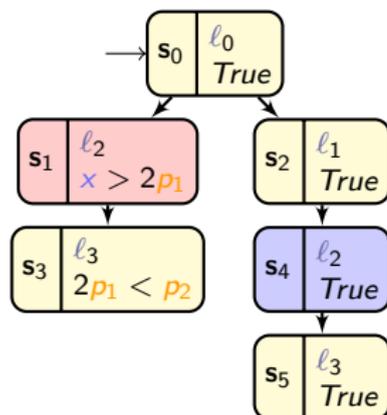
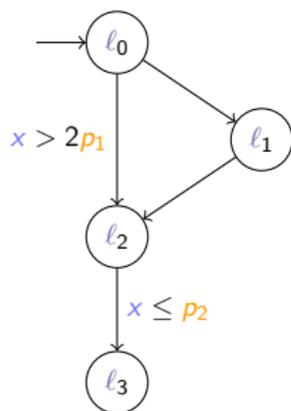
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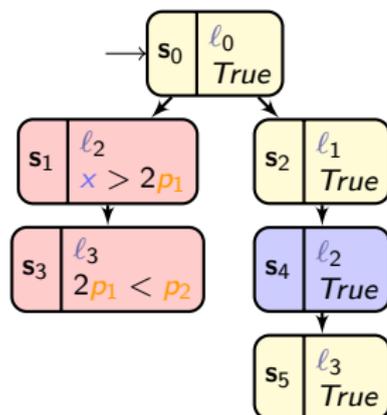
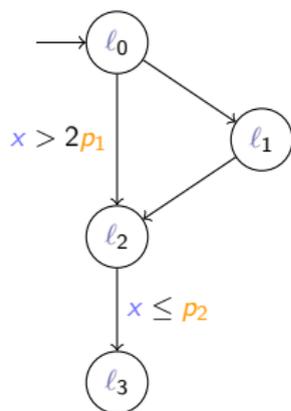
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# Merging states

## Definition

Two states  $(\bullet, \mathbf{C}_1)$  and  $(\bullet, \mathbf{C}_2)$  are **mergeable** if:

▶  $\bullet = \bullet$

▶  $\mathbf{C}_1 \cup \mathbf{C}_2$  is convex

Their merging is defined by  $(\bullet, \mathbf{C}_1 \cup \mathbf{C}_2)$

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State merging techniques were introduced:

- ▶ in TA [Dav05]
- ▶ in PTA for Inverse Method [AFS13]

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## Merging preserves reachability

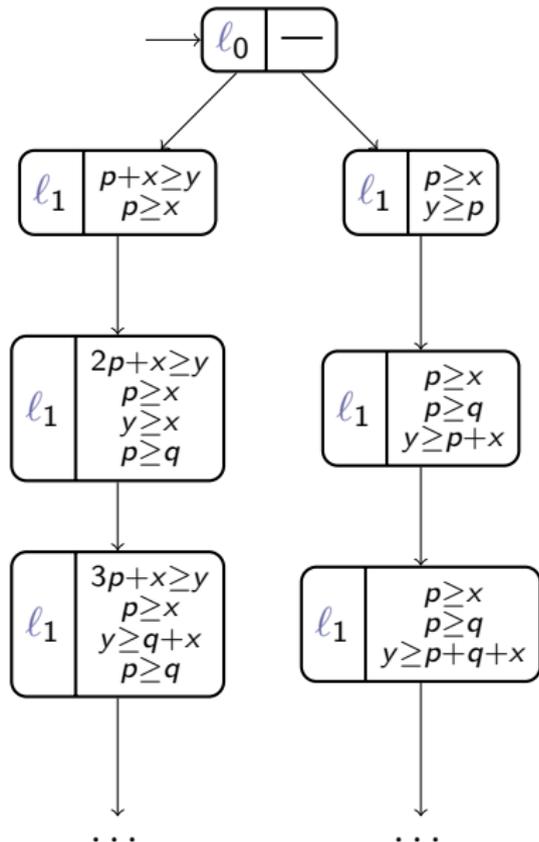
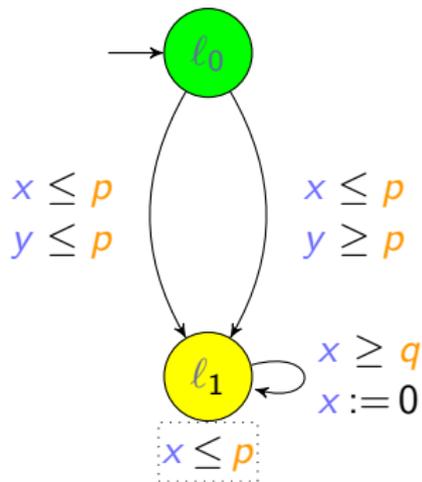
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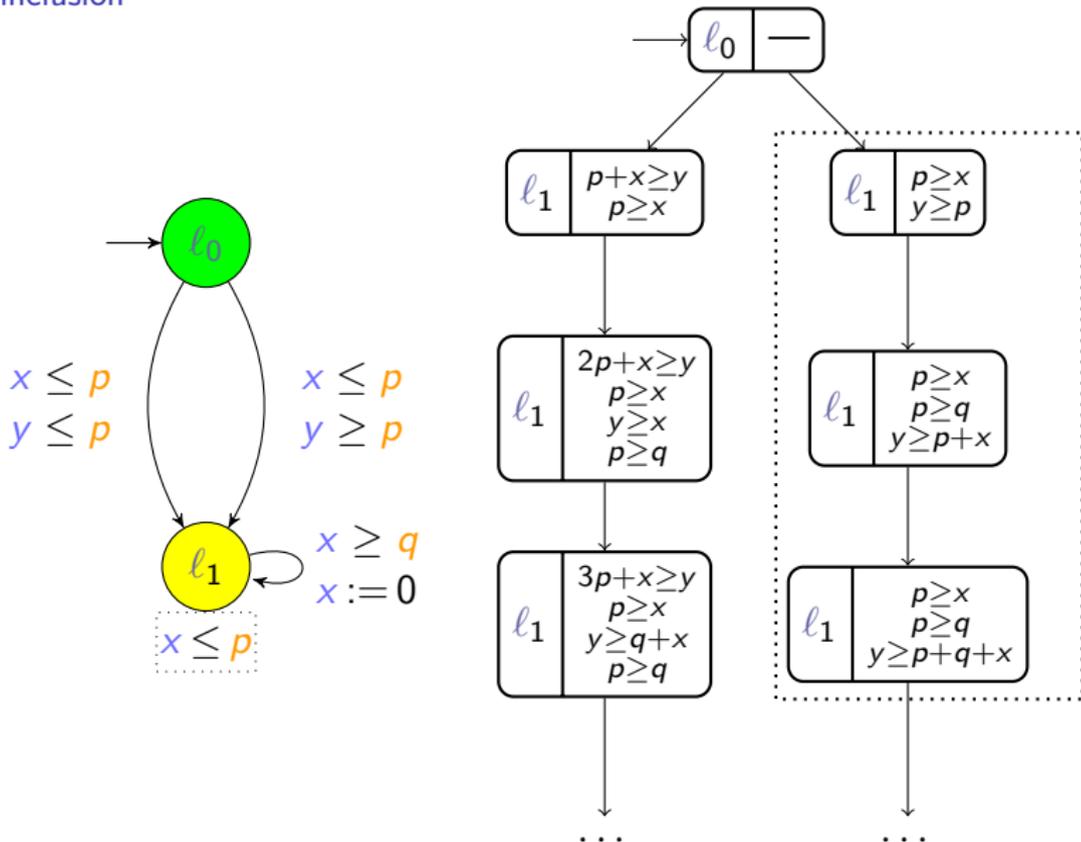
# Merging can make difference for termination!

PZG without any heuristic



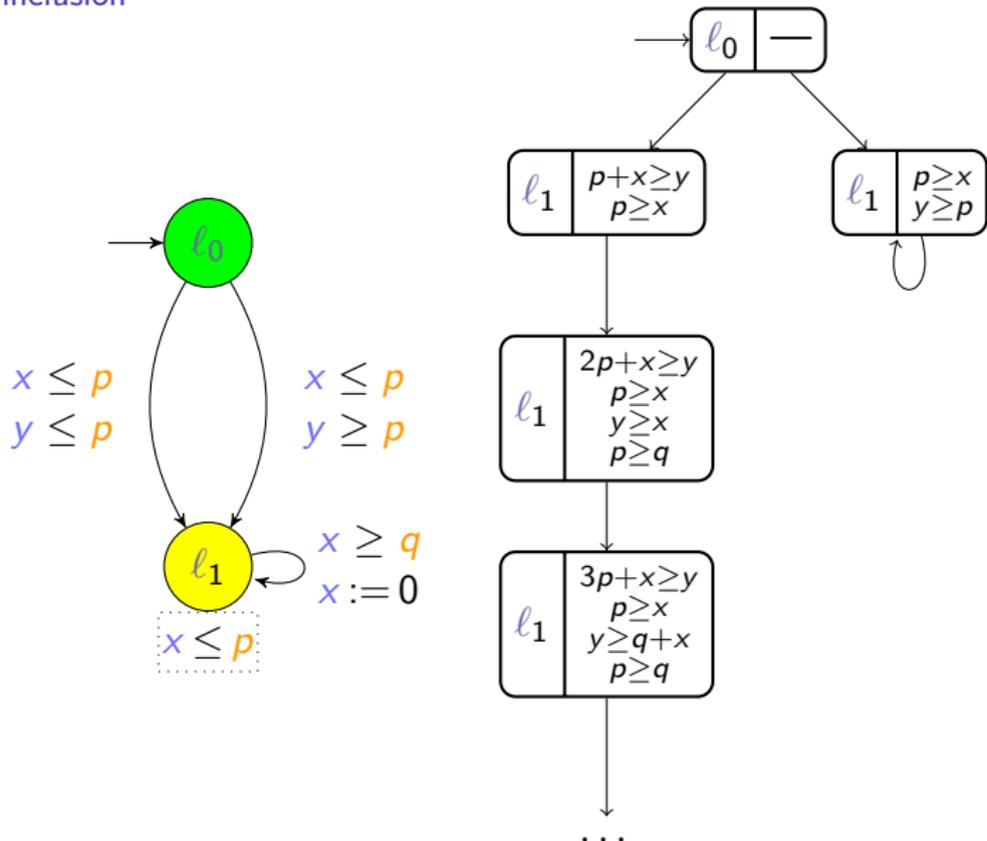
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PZG with inclusion



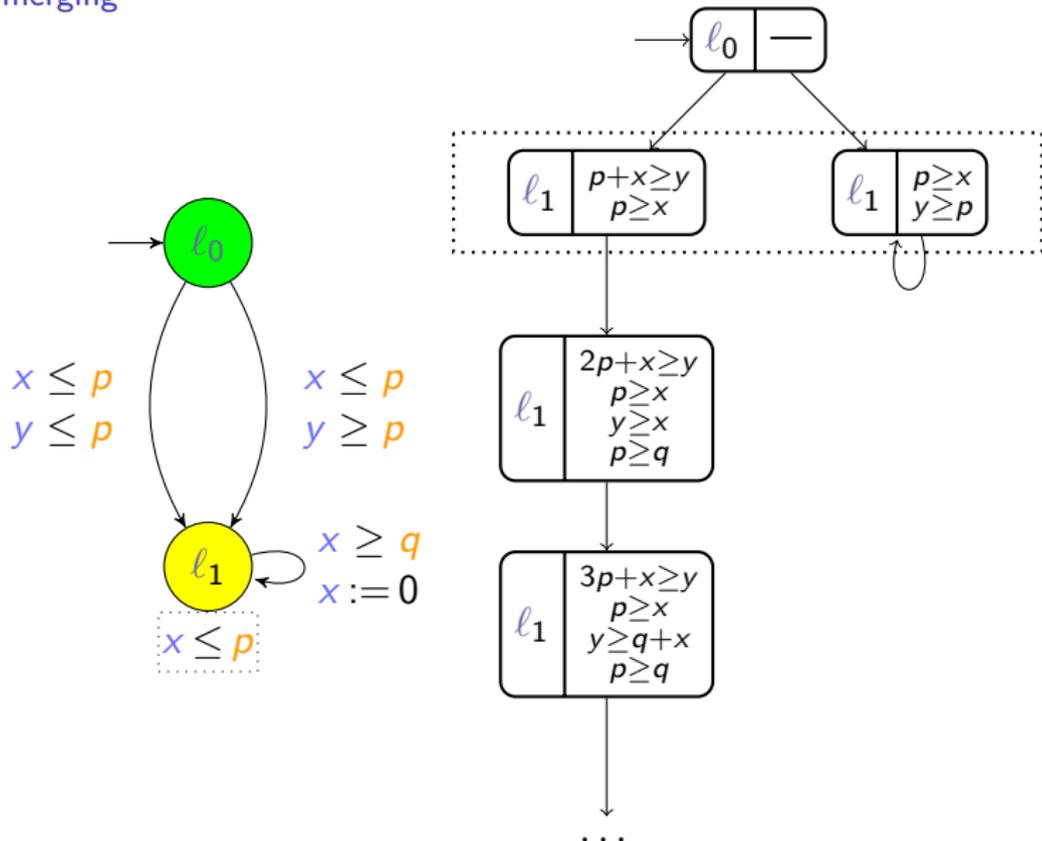
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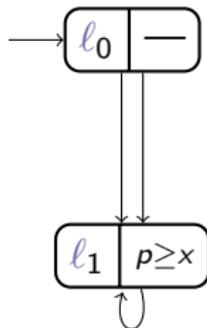
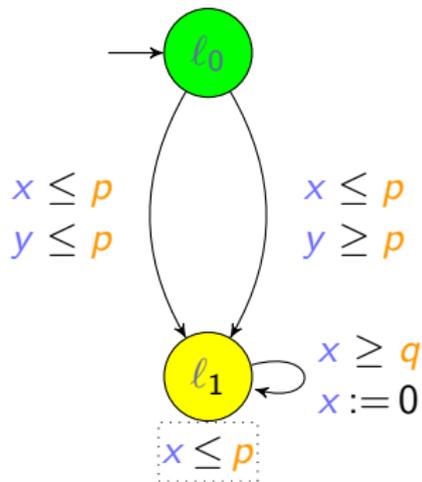
# Merging can make difference for termination!

PZG with merging



# Merging can make difference for termination!

PZG with merging



# The construction of the PZG

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**Algorithm 1:** BFS by layer  $\text{layerBFS}(\mathcal{A})$ 

---

```
1 Visited  $\leftarrow \{s_0\}$ 
2 Queue  $\leftarrow \{s_0\}$ 
3  $\Rightarrow \leftarrow \emptyset$ 
4 while Queue  $\neq \emptyset$  do
5   Qnew  $\leftarrow \emptyset$ 
6   foreach s  $\in$  Queue do
7     foreach  $(e, s') \in \text{SuccE}(s)$  do
8       Qnew  $\leftarrow \mathbf{Q}_{new} \cup (\{s'\} \setminus \mathbf{Visited})$ 
9        $\Rightarrow \leftarrow \Rightarrow \cup \{(s, e, s')\}$ 
10  Visited, Queue  $\leftarrow \text{mergeSets}(\mathbf{PZG}, \mathbf{Visited}, \mathbf{Q}_{new})$ 
```

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# Heuristics for merging

What to merge with what? Queue, Visited, Ordered  
Restart after merge?

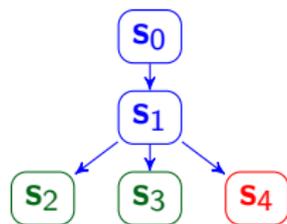
When to update the state space?

- ▶ After each merge
- ▶ After exploring the candidates list
- ▶ After exploring a BFS level

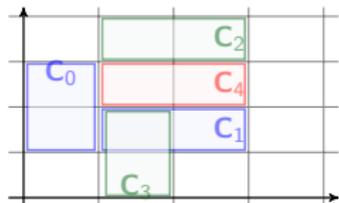
How to update the state space?

- ▶ Reconstruction of the state-space
- ▶ *In situ*

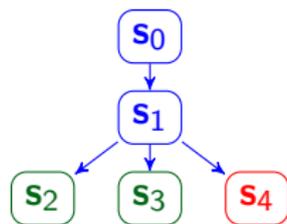
# Illustration of the merging options



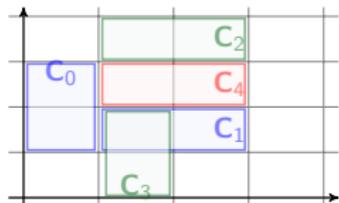
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- in the queue
- being processed
- after merge



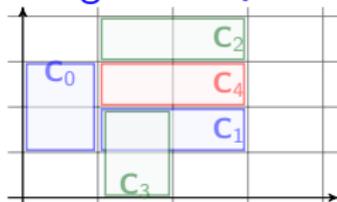
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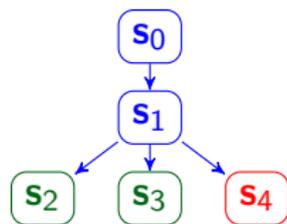
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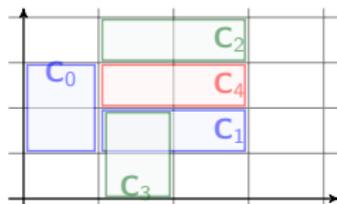
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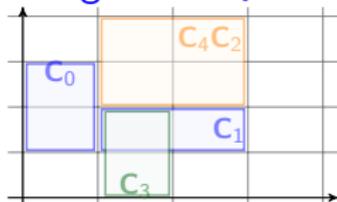
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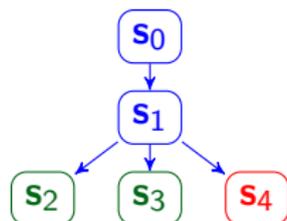
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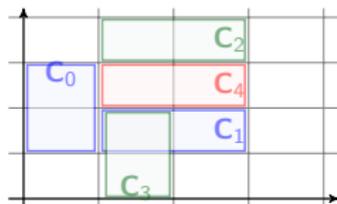
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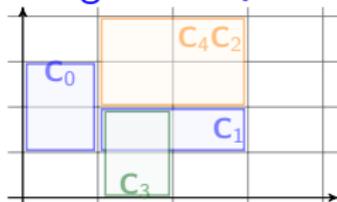
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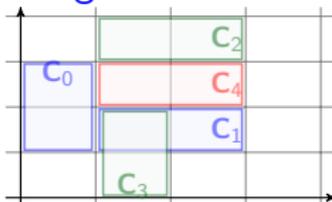
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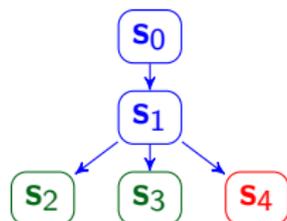
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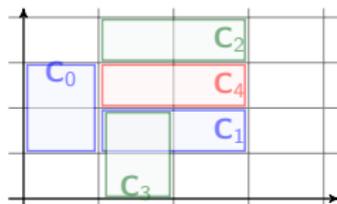
## Merge with Visited



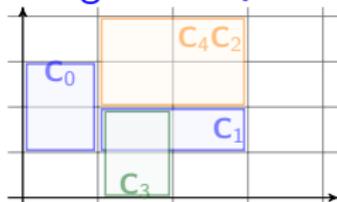
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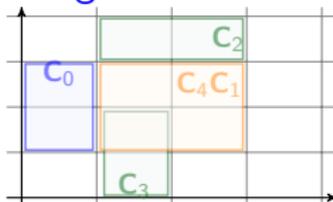
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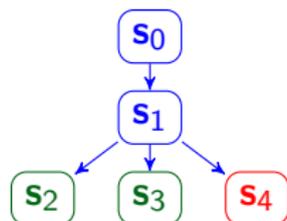
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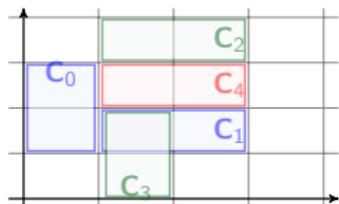
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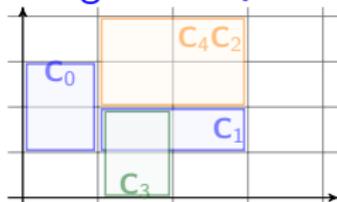
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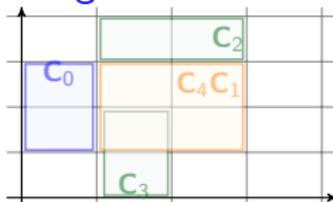
- visited
- in the queue
- being processed
- after merge



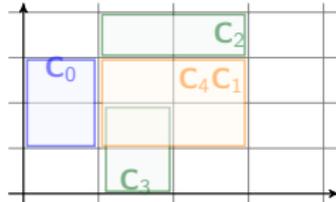
Merge with Queue



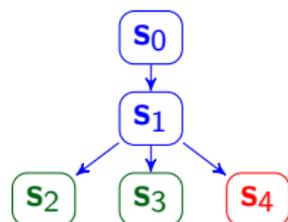
Merge with Visited



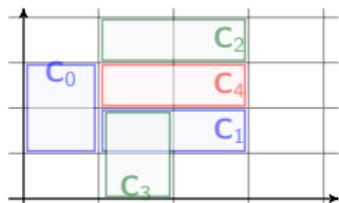
and Restart



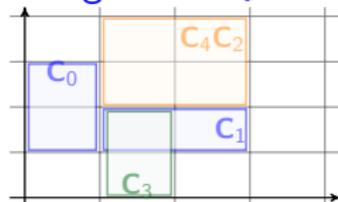
# Illustration of the merging options



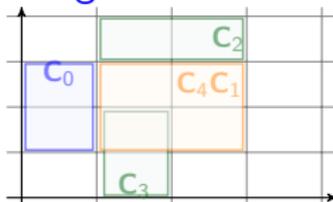
- visited
- in the queue
- being processed
- after merge



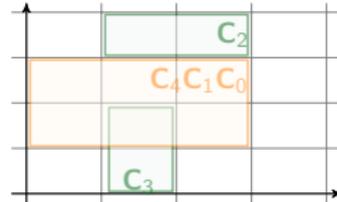
Merge with Queue



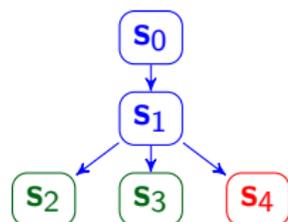
Merge with Visited



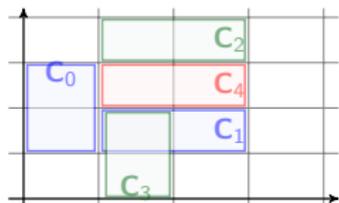
and Restart



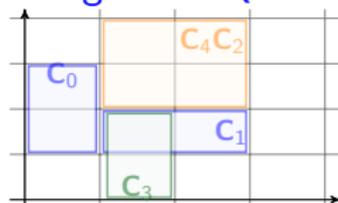
# Illustration of the merging options



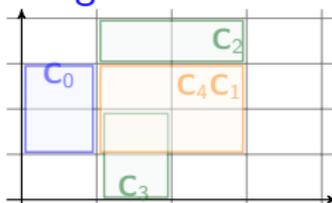
- visited
- in the queue
- being processed
- after merge



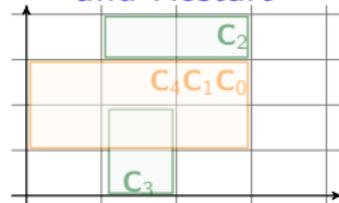
Merge with Queue



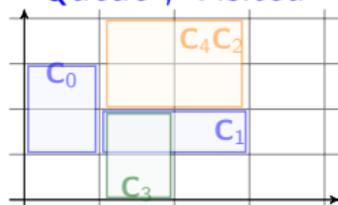
Merge with Visited



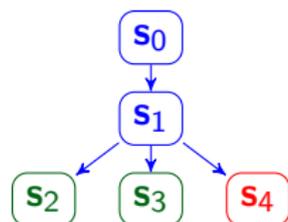
and Restart



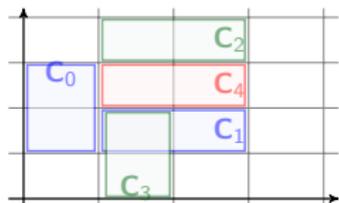
Queue ; Visited



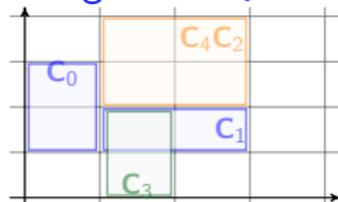
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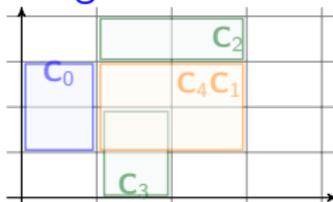
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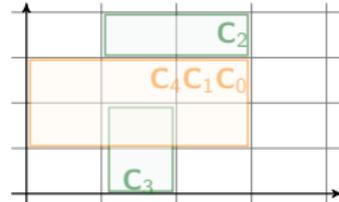
Merge with Queue



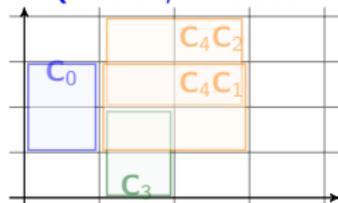
Merge with Visited



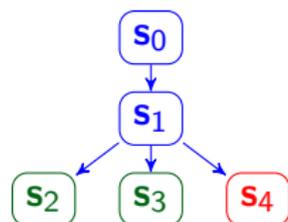
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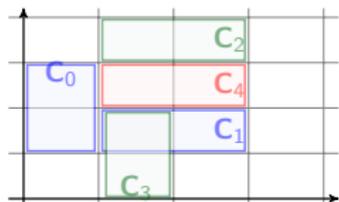
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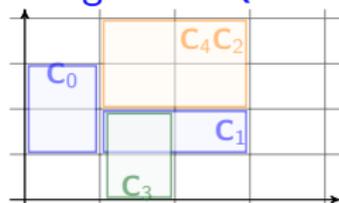
# Illustration of the merging options



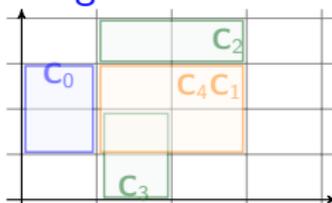
- visited
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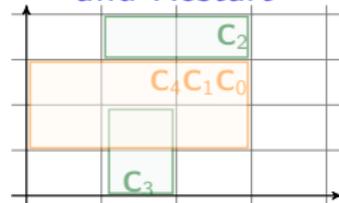
Merge with Queue



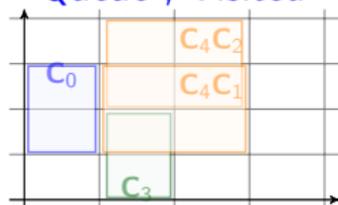
Merge with Visited



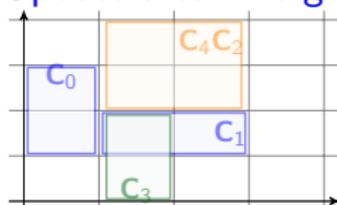
and Restart



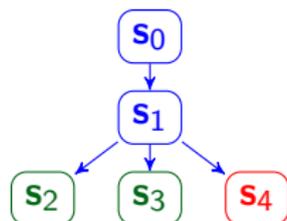
Queue ; Visited



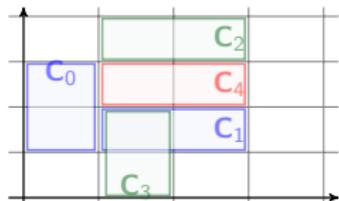
Update after Merge



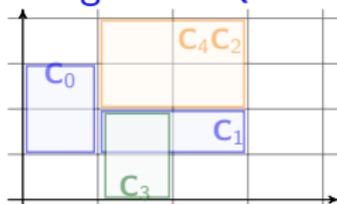
# Illustration of the merging options



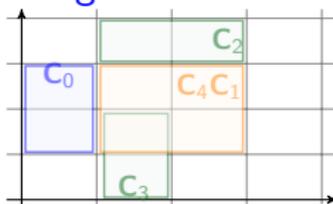
- visited
- in the queue
- being processed
- after merge



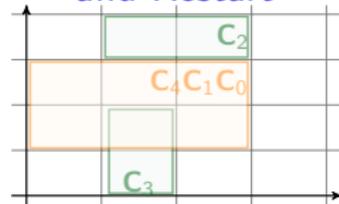
Merge with Queue



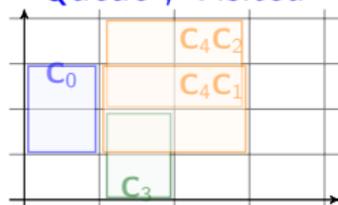
Merge with Visited



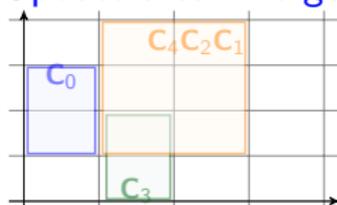
and Restart



Queue ; Visited



Update after Merge



# Experiments

- ▶ Comparison of all the combinations of heuristics
- ▶ Use of the IMITATOR library, restricted to reachability-based properties [AMP21]:
  - ▶ 124 executions (model, reachability property)
  - ▶ 42 executions perform at least one merge

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[AMP21] Étienne André, Dylan Marinho, and Jaco van de Pol. “A Benchmarks Library for Extended Timed Automata”. In: *TAP* (June 21–25, 2021). Ed. by Frédéric Loulergue and Franz Wotawa. Vol. 12740. LNCS. virtual: Springer, 2021, pp. 39–50. DOI: 10.1007/978-3-030-79379-1\_3

# Results

		Nomerge	M2.12	RVMr	OQM
Time	# wins	24	20	22	<b>42</b>
	Avg (s)	10.0	5.47	4.56	<b>3.77</b>
	Avg (merge) (s)	18.8	7.83	5.57	<b>3.63</b>
	Avg (no merge) (s)	3.83	<b>3.82</b>	3.85	3.88
	Median (s)	1.39	1.2	1.14	<b>1.12</b>
	Norm. avg	1.0	0.91	0.91	<b>0.87</b>
	Norm. avg (merge)	1.0	0.75	0.74	<b>0.64</b>
	Norm. avg (no merge)	<b>1.0</b>	1.02	1.03	1.03
States	# wins	0	19	<b>37</b>	16
	Avg	11443.08	11096.54	<b>11064.37</b>	11120.79
	Avg (merge)	1512.02	670.43	<b>592.31</b>	729.33
	Median	2389.5	703.5	<b>604.5</b>	905.0
	Norm. avg	1.0	0.86	<b>0.84</b>	0.88

## Conclusion and Perspectives

- ▶ investigated the merge operation for reachability analysis in PTAs
- ▶ proposed several heuristics
- ▶ shown they are sound
- ▶ extensive experiments to compare these approaches

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- ▶ investigated the merge operation for reachability analysis in PTAs
  - ▶ proposed several heuristics
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  - ▶ extensive experiments to compare these approaches
- 
- ▶ tackle the handling of merged states:
    - ▶ pruning away
    - ▶ separate collection of potential mergers
  - ▶ merge more than 2 states
  - ▶ canonical merge representatives
  - ▶ compatibility of merging and liveness properties

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