

# Using Logic to Escape the Jungle of Data-aware Process Verification

Sarah Winkler

Free University of Bozen-Bolzano, Italy

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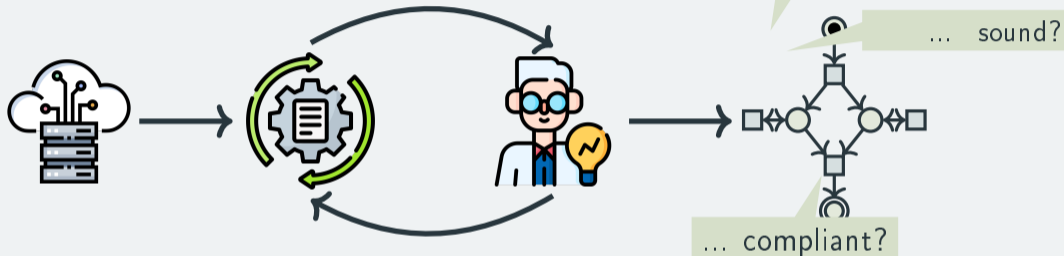
# Motivation

## Discovery and verification of BPM processes



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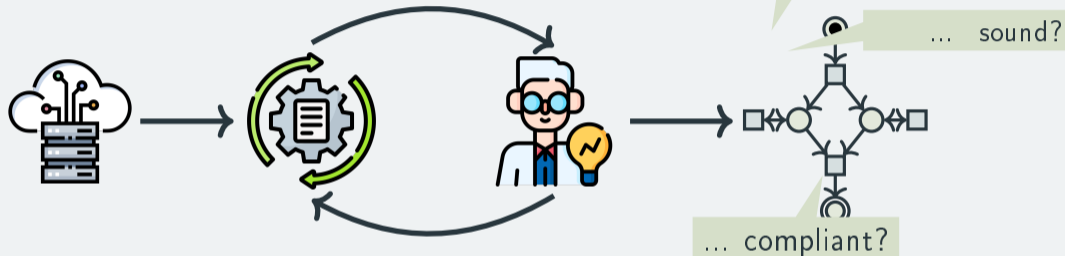
Discovery and verification of BPM processes ... equivalent to other model?



e.g. every order is eventually shipped

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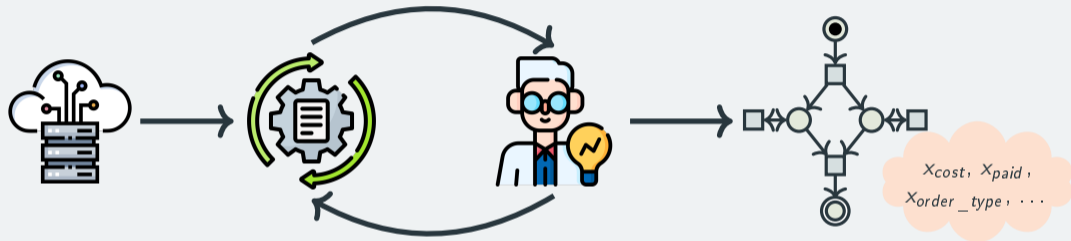
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in Petri nets for typical BPM processes, verification tasks can be effectively decided

# Motivation

Discovery and verification of **data-aware** BPM processes

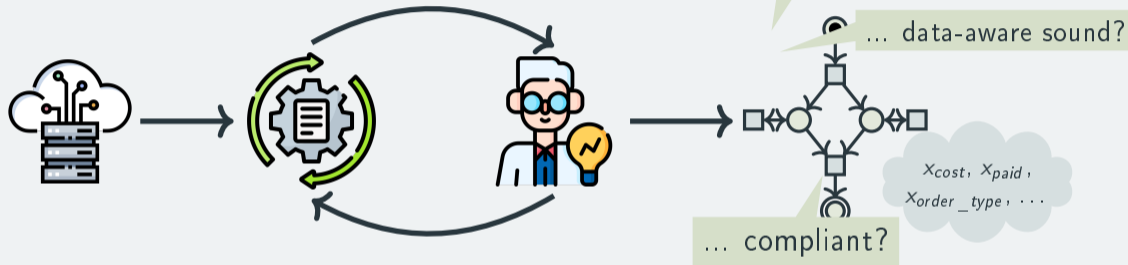


## Assumption

**data** is represented by **numeric variables**, can be read and written by transitions

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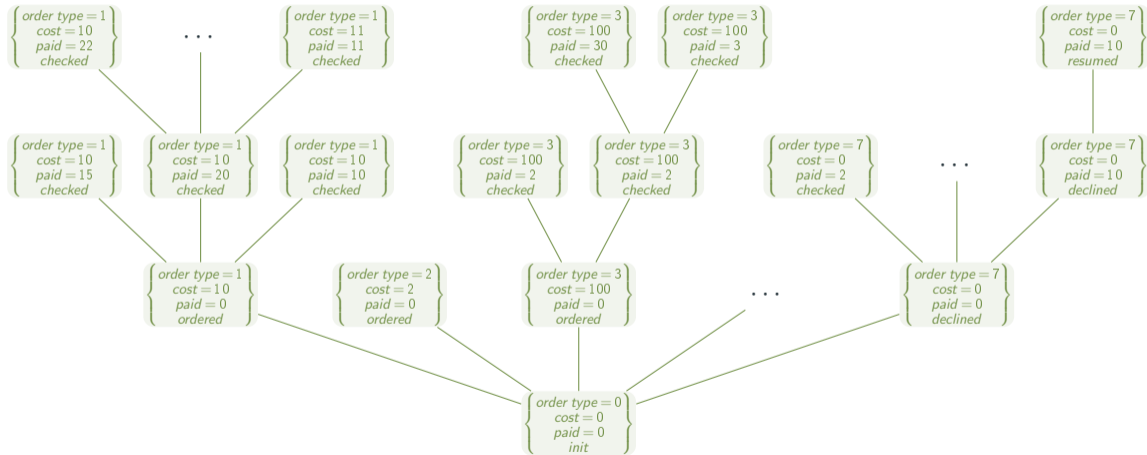
Discovery and verification of data-aware BPM ... equivalent to other model?



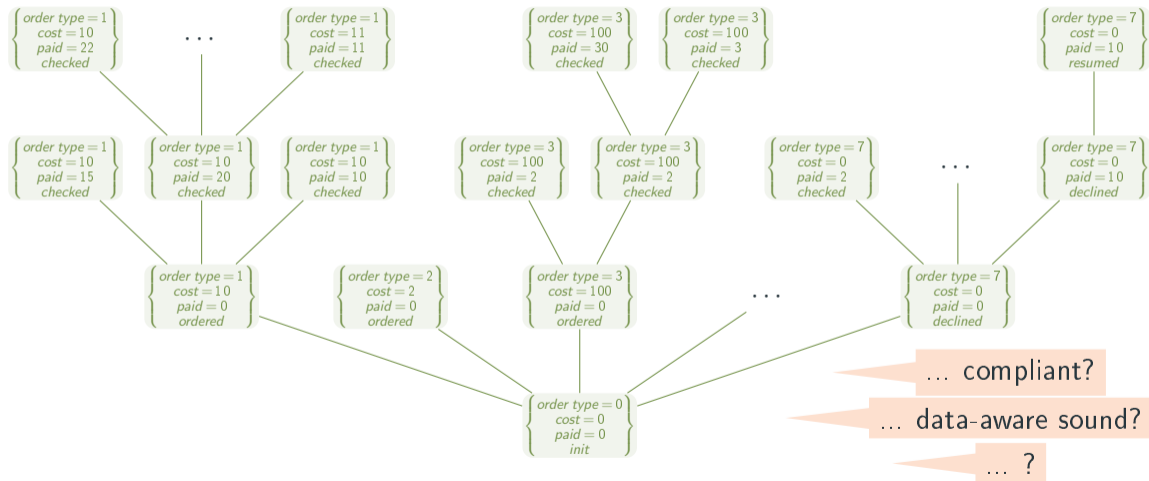
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# The Infinite State Space Jungle

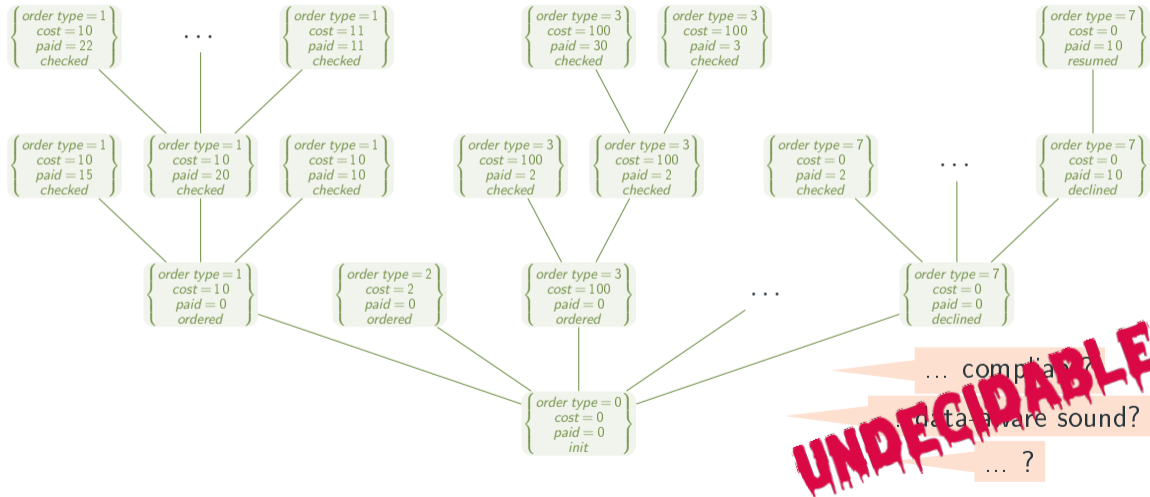


# The Infinite State Space Jungle





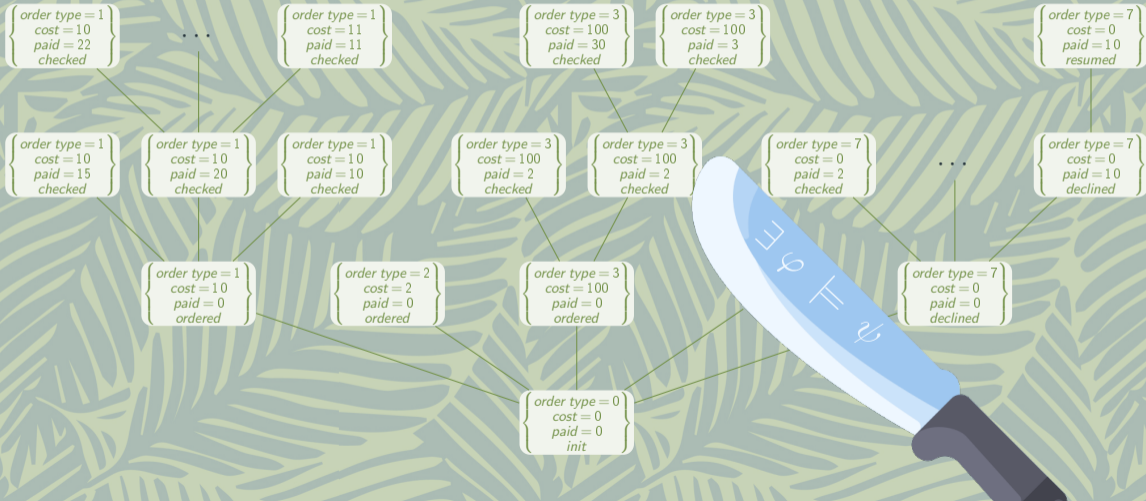
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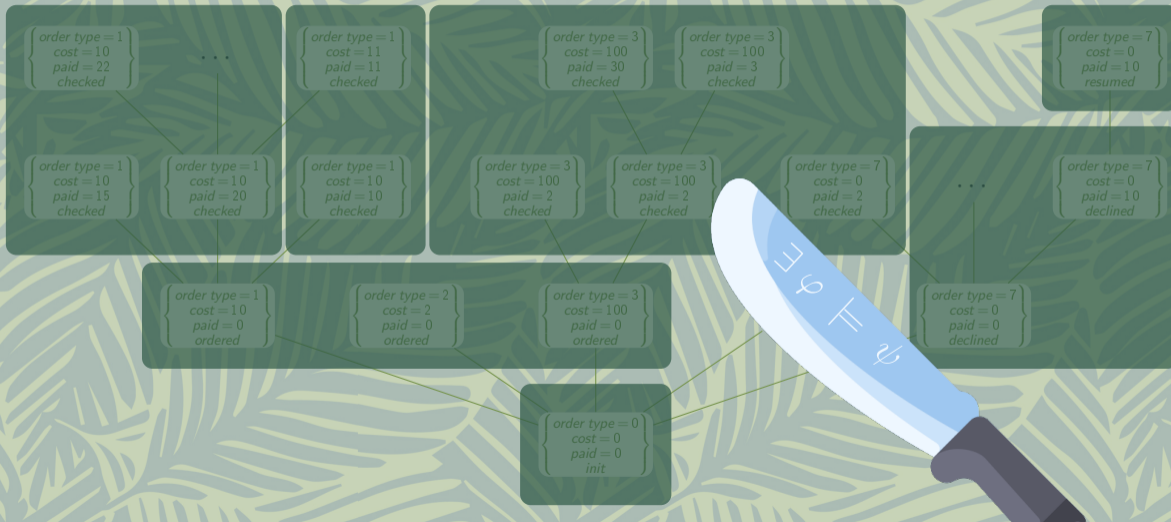
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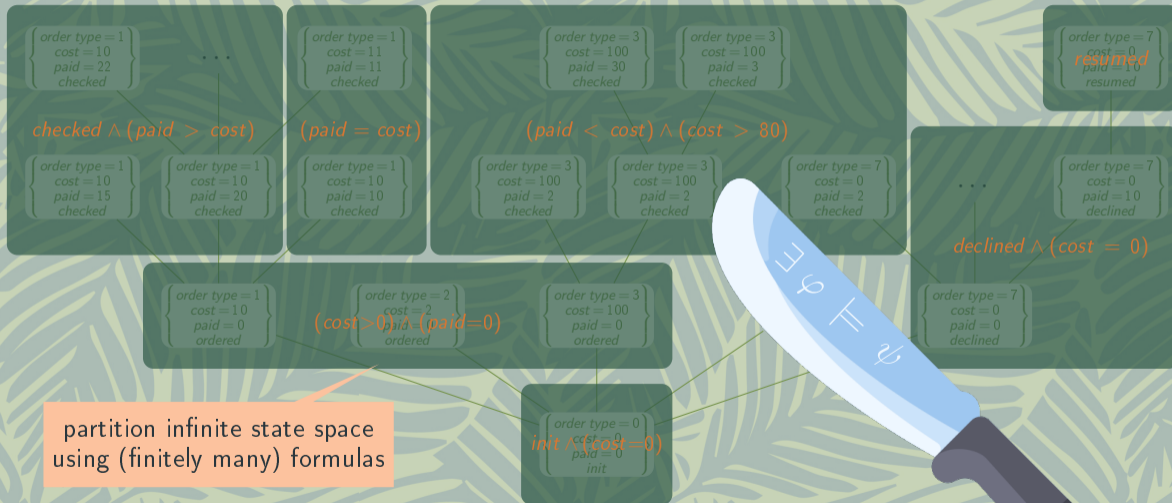
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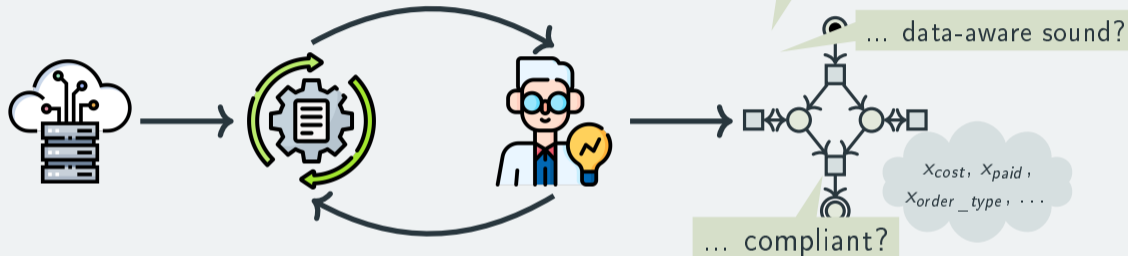


# The Infinite State Space Jungle



# Motivation

Discovery and verification of data-aware BPM ... equivalent to other model?



## This talk

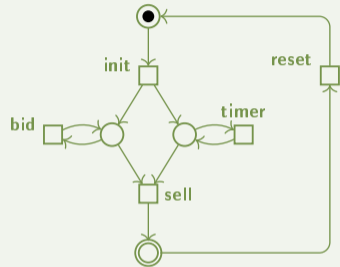
identify classes of data-aware models where verification tasks are decidable



## Data Petri net (DPN)

- ▶ based on **Petri net**
- ▶ initial and final markings  $M_I$  and  $M_F$

## Example (Auction model)

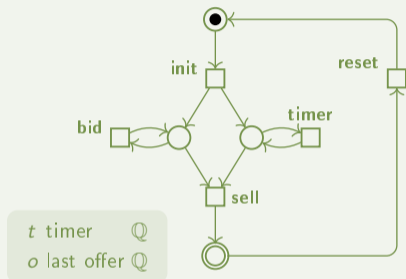




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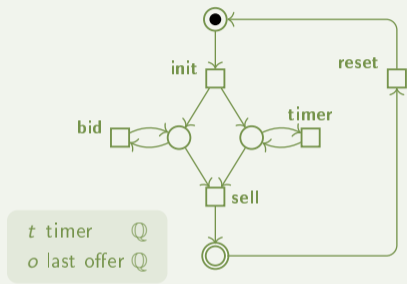
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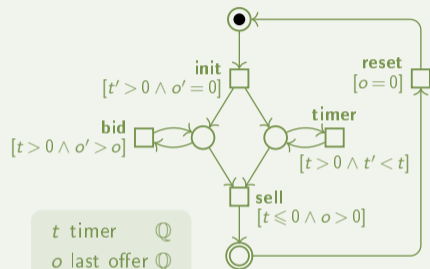
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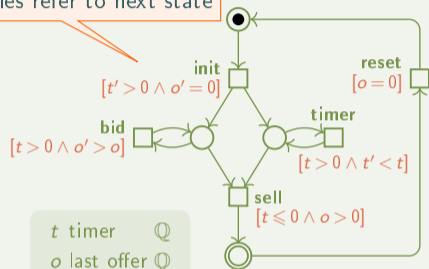


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primed variables refer to next state

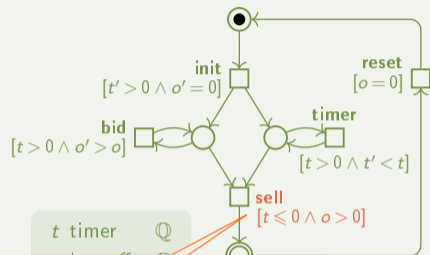
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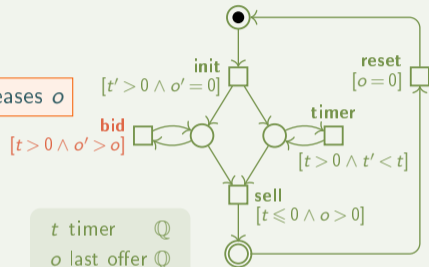


requires that  $t \leq 0$  and  $o$  positive

## Data Petri net (DPN)

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- ▶ data: set of “global” variables requires that  $t$  positive, increases  $o$  with numeric domain ( $\mathbb{Q}$  or  $\mathbb{Z}$ )
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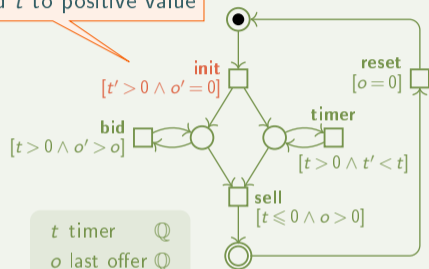


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set  $o$  to 0 and  $t$  to positive value

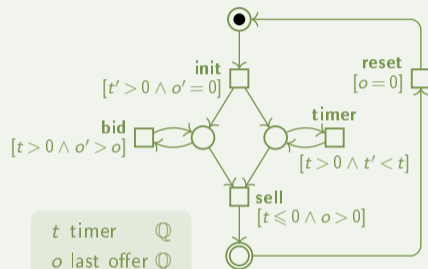
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## Background logic

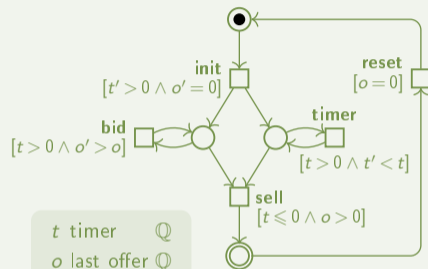
- ▶ propositional logic + theory of linear arithmetic over integers and rationals
- ▶ satisfiability is decidable (SMT solvers), quantifiers can be eliminated



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## Example (Auction model)



## Remark

- ▶ DPNs can be mined automatically from data
- ▶ used to model BPM processes from various domains

[Mannhardt et al 2016, de Leoni 2013]

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## Observation

if underlying Petri net is **bounded**, DPN has finite set of markings: can be **unfolded**

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## Data-aware Dynamic System with Arithmetic (DDSA)

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- ▶ labeled transition system
  - ▶ **control states:** markings of DPN
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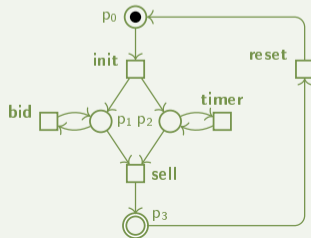
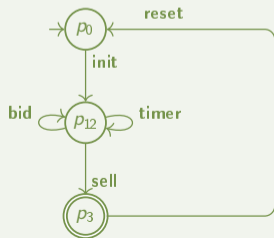
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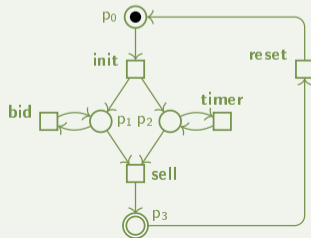
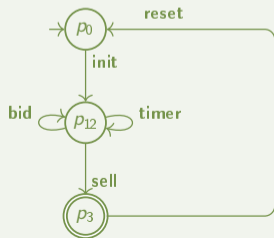
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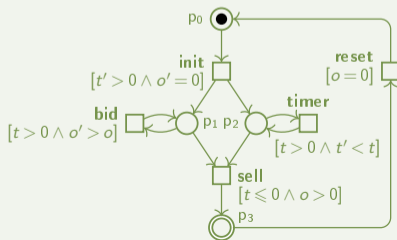
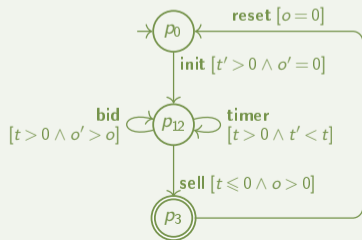
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## Data-aware Dynamic System with Arithmetic (DDSA)

- ▶ labeled transition system
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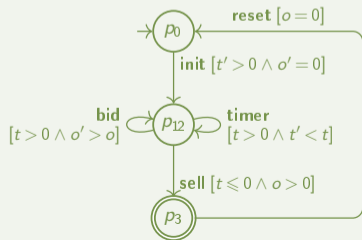
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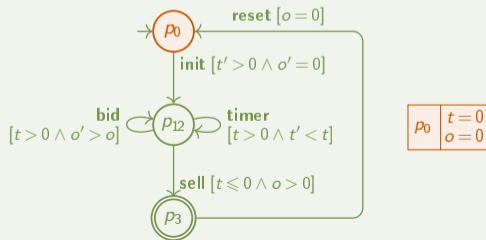
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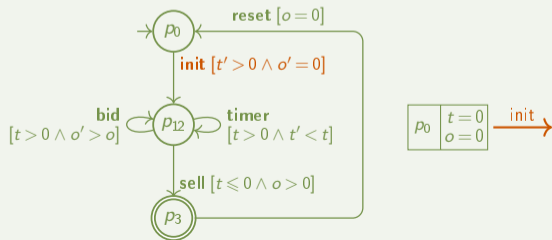
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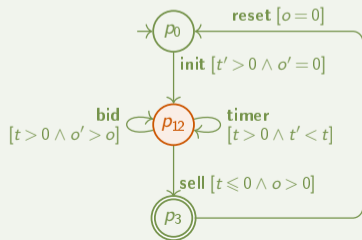
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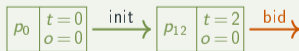
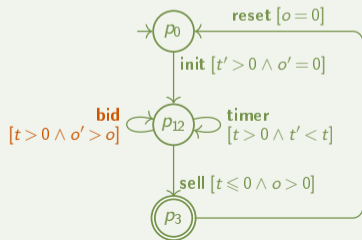
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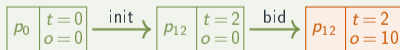
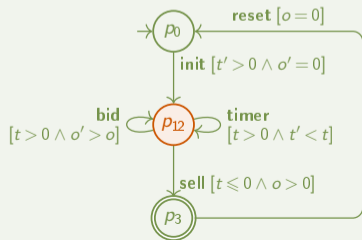
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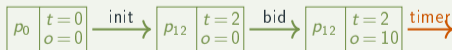
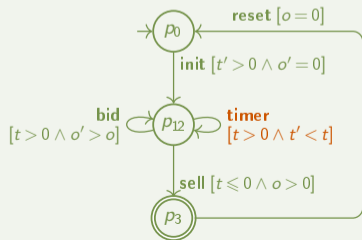
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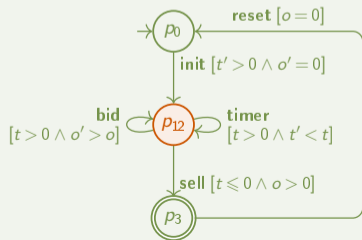
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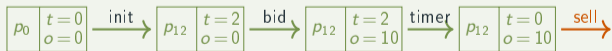
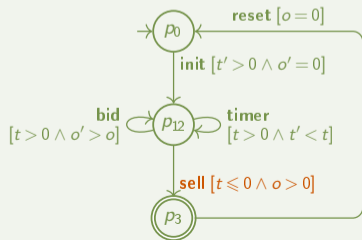
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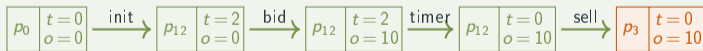
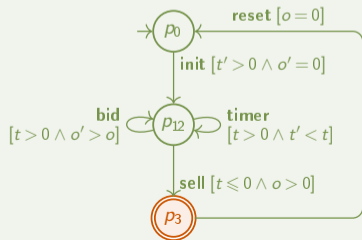
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# State Space Abstraction

## Definitions

- ▶ **state** of DDSA is tuple  $(s, \alpha)$  of control state  $s$  and assignment  $\alpha$  to data variables  $V$

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$p_{12}$	$t = 2$
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$(p_{12}, \varphi)$

$$\varphi = (o = 0) \wedge (t > 0)$$

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⋮  
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## Example

- ▶ state

$p_{12}$	$t = 2$
	$o = 0$

$\xrightarrow[\text{bid}]{t > 0 \wedge o' > o}$

$p_{12}$	$t = 2$
	$o = 10$

matches  
⋮  
↙

- ▶ abstract state

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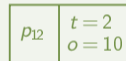
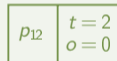
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## Example

- ▶ state



matches  
⋮  
∨

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⋮  
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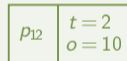
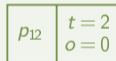
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$\varphi' = ?$

## Definition (Update)

for formula  $\varphi$  and transition  $a$  in DDSA

$$\text{update}(\varphi, a) =$$

describes how formula  $\varphi$  changes after transition  $a$

## Definition (Update)

for formula  $\varphi$  and transition  $a$  i

rename variables in formula to auxiliary  $\hat{V} = \{\hat{v} \mid v \in V\}$

$$\text{update}(\varphi, a) = \varphi(\hat{V})$$

## Definition (Update)

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guard must hold, propagate variables that are not written

## Definition (Update)

$\exists$  quantification to get formula with free variables  $V$

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## Definition (Update)

for formula  $\varphi$  and transition  $a$  in DDSA can get equivalent quantifier-free formula by **quantifier elimination**

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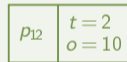
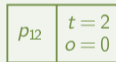
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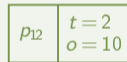
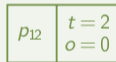
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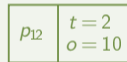
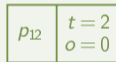
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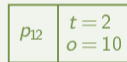
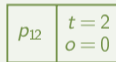
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## Example

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$p_{12}$	$t = 2$
	$o = 0$

$$\xrightarrow[t > 0 \wedge o' > o]{\text{bid}}$$

$p_{12}$	$t = 2$
	$o = 10$

matches  
⋮  
↓

- ▶ abstract state

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$$\xrightarrow[t > 0 \wedge o' > o]{\text{bid}}$$

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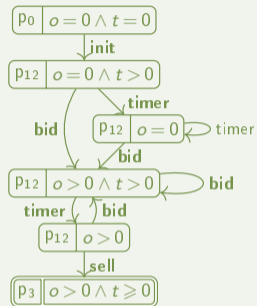
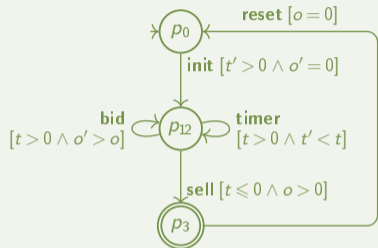
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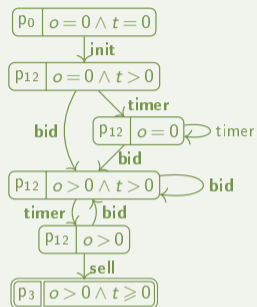
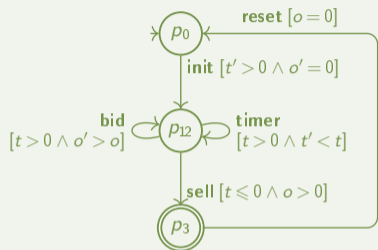
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- ▶  $(s, \dots) \in N$  is **final** if  $s$  is final in DDSA

## Example (Constraint graph for auction model)



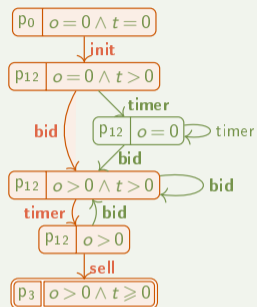
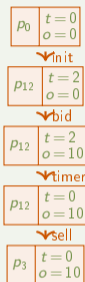
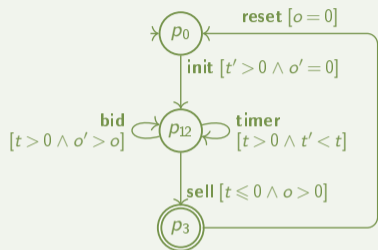
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## Key Lemma

$\exists$  **DDSA run**  $(s_0, \alpha_0) \xrightarrow{*} (s, \alpha)$   $\iff$   $\exists$  **path in CG**  $(s_0, \varphi_0) \xrightarrow{*} (s, \varphi)$  with  $\alpha \models \varphi$

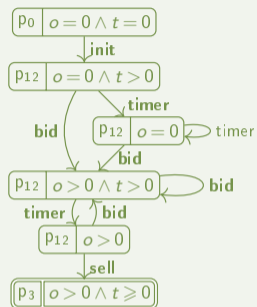
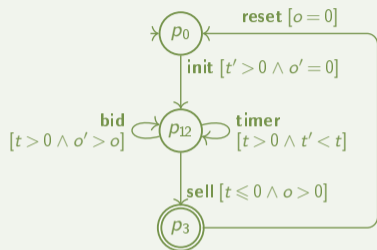
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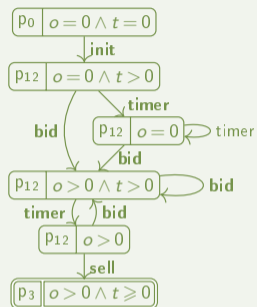
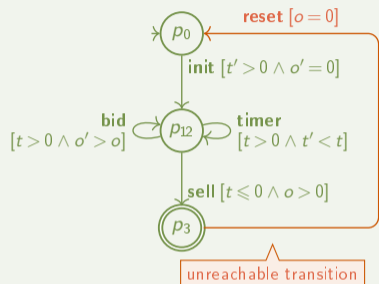
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control state or transition of DDSA are **reachable** iff they appear in the constraint graph



## Example (Constraint graph for auction model)



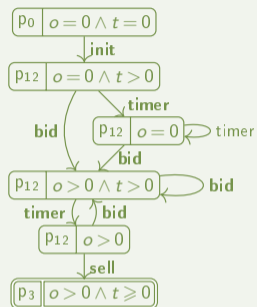
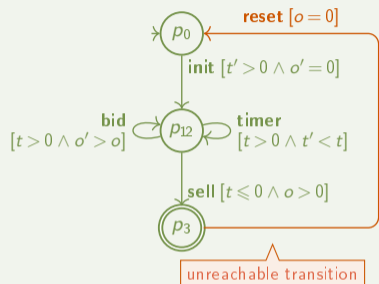
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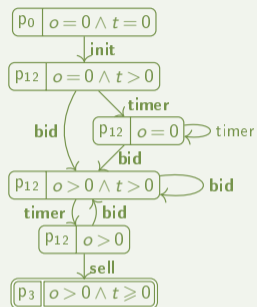
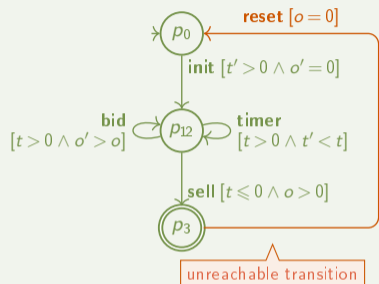
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control state or transition of DDSA are reachable iff they appear in the constraint graph

if CG is finite, reachability is decidable

## Example (Constraint graph for auction model)



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## Caveat

constraint graph can be infinite

# Decidability Conditions

formulas in CG are **history constraints**:  
 $\exists \dots \exists$  (conjunctions of renamed transition guards)

## Definition (Finite summary)

DDSA has **finite summary** if set of history constraints is finite

# Decidability Conditions

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abstract decidability condition

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## Concrete instances of finite summary

[Felli, Montali & W, AAI 2022]

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▶ restrict shape of transition guards:

▶ **variable-to-variable/constant** comparisons over  $\mathbb{Q}$ :  $x < y$ ,  $x \geq \frac{1}{2}$ ,  $y = 0$  [Demri & de Souza 2006]

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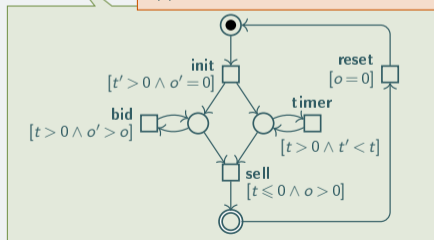
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applies to all DPNs mined according to [Mannhardt et al 2016]





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  - ▶ **integer periodicity constraints** over  $\mathbb{Z}$ :  $x = y$ ,  $x < 3$ ,  $y \equiv_5 3$  [Demri 2006, Gascon 2009]

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  - ▶ **bounded memory**

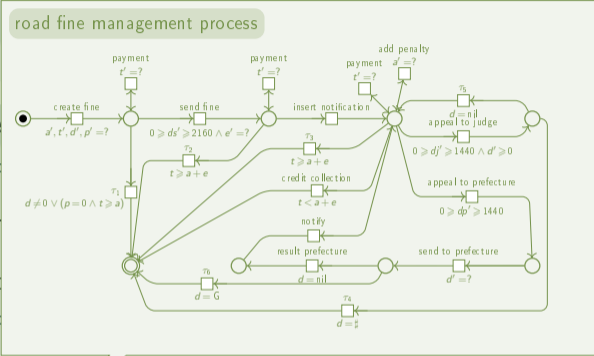
idea: behaviour depends on bounded number of past steps

# Decidability Conditions

Definition (Finite DDSA has finite sum

Concrete instance

- ▶ restrict shape of
- ▶ variable-to-
- ▶ integer per
- ▶ gap-order c
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- ▶ bounded memory



idea: behaviour depends on bounded number of past steps

[Felli, Montali & W, AAI 2022]

$y = 0$  [Demri & de Souza 2006]

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# Decidability Conditions

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DDSA has finite summary if set of history constraints is finite

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- ▶ restrict shape of transition guards:
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# Decidability Conditions

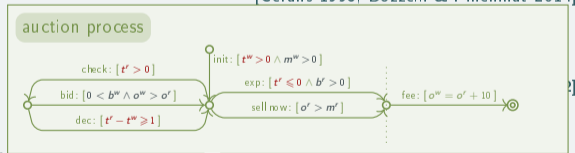
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capture wide range of DPNs from literature

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# Linear-Time Model Checking

## Verification problem: Compliance

given DDSA and  $LTL_f$  formula  $\psi$  with arithmetic constraints:

*constraint* | *control state* |  $\psi \wedge \psi$  |  $\psi \vee \psi$  |  $\langle action \rangle \psi$  |  $X \psi$  |  $F \psi$  |  $G \psi$  |  $\psi U \psi$

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# Linear-Time Model Checking

evaluated over finite traces

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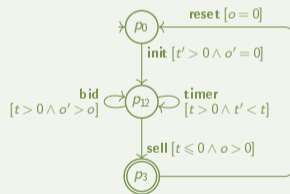
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## Example



- ▶  $F((o = 100) \wedge G(p_3 \rightarrow o \neq 100))$ :  
it is possible that bid of 100€ does not win

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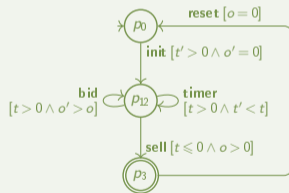
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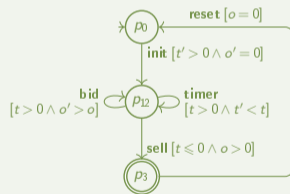
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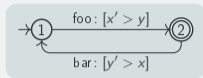


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## Fact

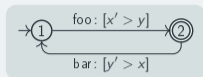
can construct finite automaton (NFA) accepting exactly those runs that satisfy  $LTL_f$  property

## Model checking approach



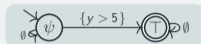
DDSA

## Model checking approach



DDSA

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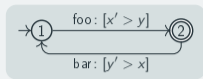


NFA for  $\psi$

check F ( $y > 5$ )

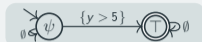


# Model checking approach



DDSA

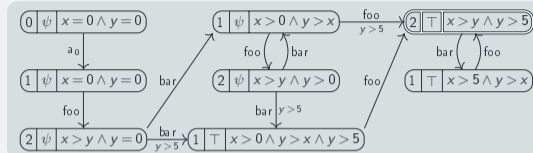
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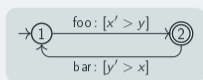
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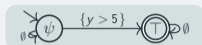
product automaton  $\mathcal{N}$

## Model checking approach



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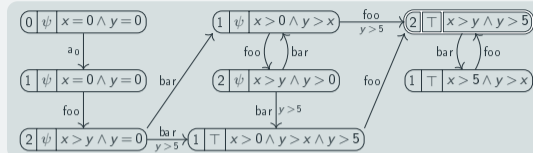
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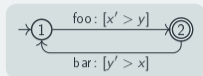


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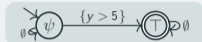
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## Model checking approach



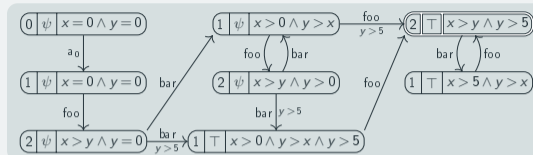
DDSAs

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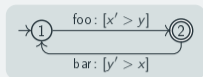


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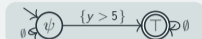
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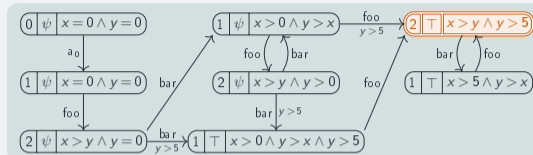
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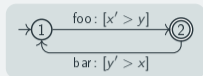


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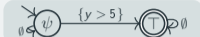
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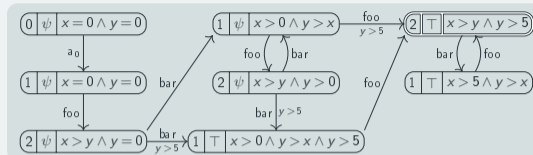
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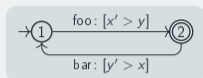
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- ▶ *product automaton has final node* iff *DDSAs admits witness* for  $\psi$

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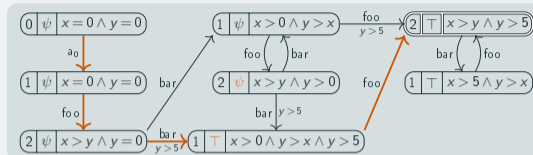
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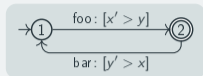
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can use SMT solver to **extract witness** from accepting path

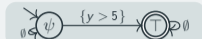
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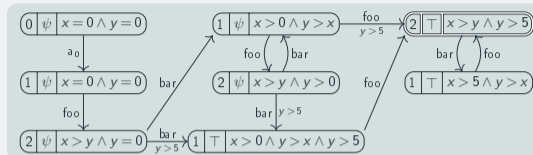
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- ▶ *product automaton has final node* iff *DDSAs admits witness for  $\psi$*
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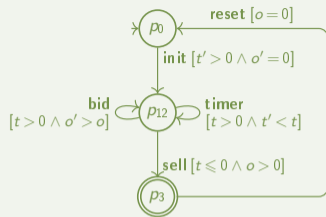
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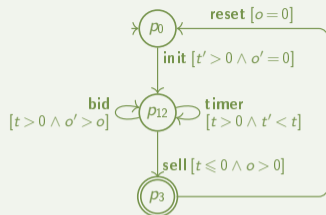
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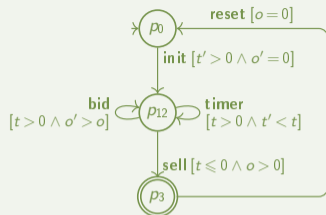
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not data-aware sound because

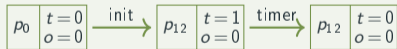
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[Felli, Montali & W, CAiSE 2022]

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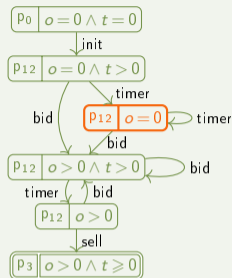
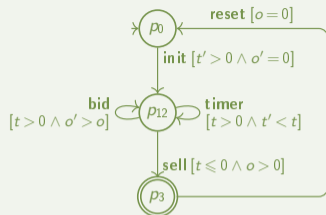
▶ can check 2 and 3 directly on CG

if DDSA has finite summary, data-aware soundness is decidable

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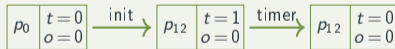
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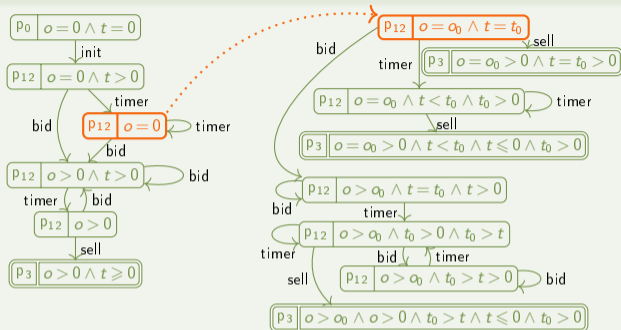
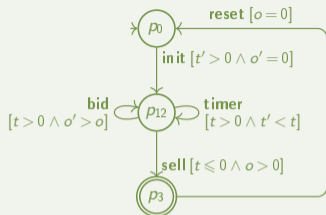


not data-aware sound because

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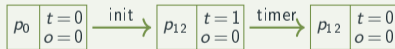


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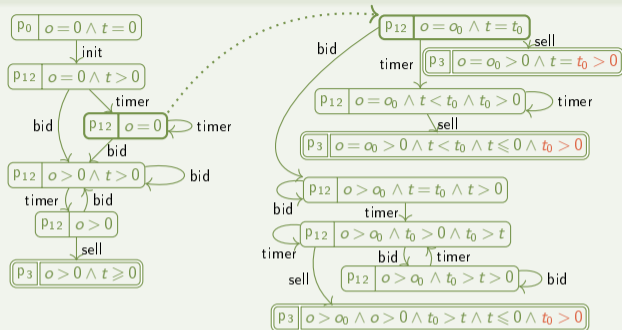
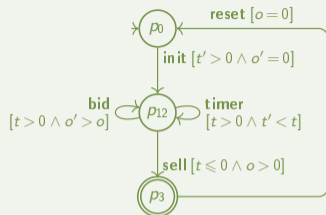


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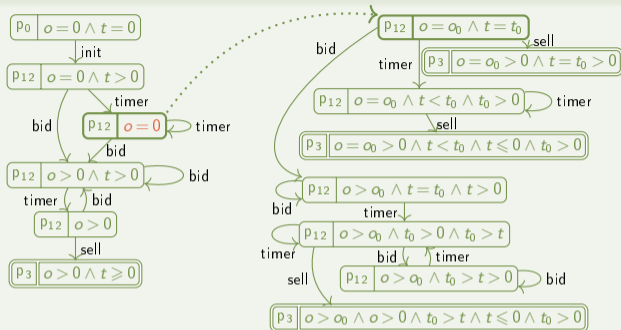
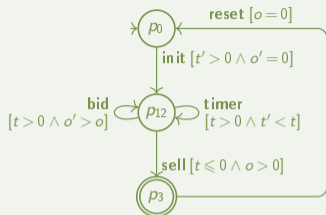
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have  $\text{reach\_final}(p_{12}) = (t > 0)$



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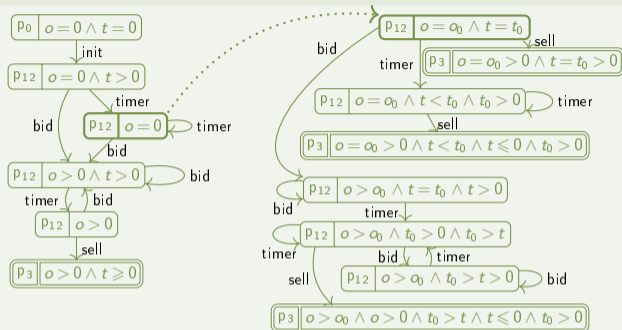
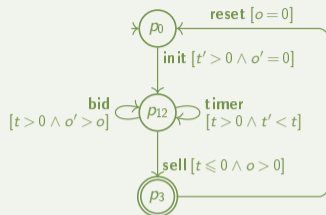
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- ▶ deadlocks exist, e.g. after  $p_0 \begin{matrix} t=0 \\ o=0 \end{matrix} \xrightarrow{\text{init}} p_{12} \begin{matrix} t=1 \\ o=0 \end{matrix} \xrightarrow{\text{timer}} p_{12} \begin{matrix} t=0 \\ o=0 \end{matrix}$

have  $reach\_final(p_{12}) = (t > 0)$ , and  $(o = 0) \not\models (t > 0)$

## Example (Auction)



not data-aware sound because

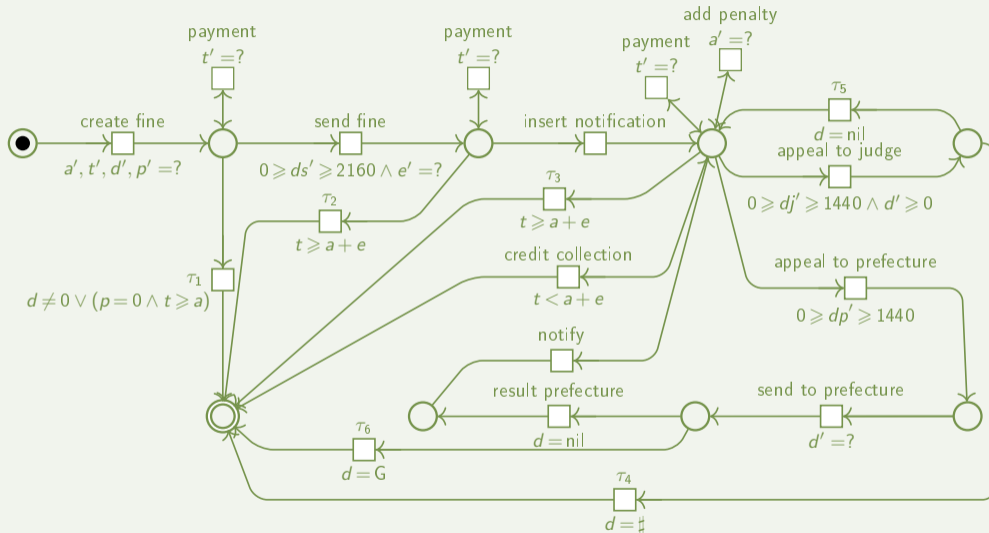
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## Branching-time model checking

use similar approach to obtain CTL\* model checking procedure

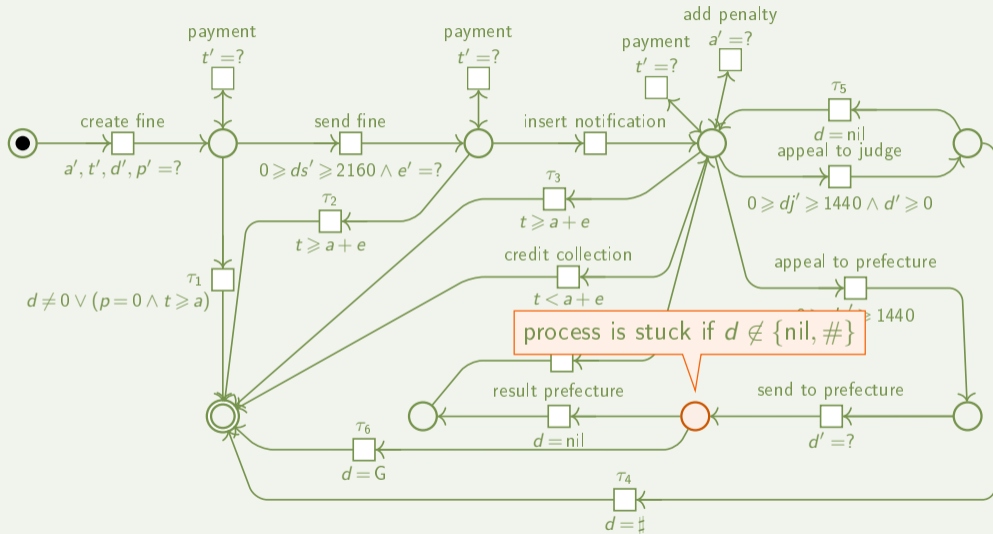
# Example (Road fine management process)



[Mannhardt et al 2016]

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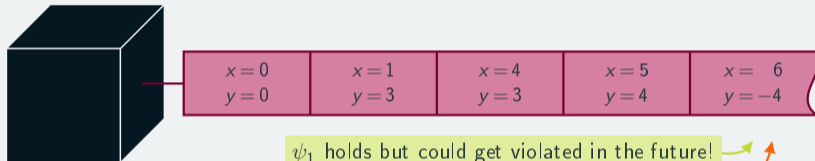
# Monitoring Arithmetic Temporal Properties

given a trace of values, check current and possible future satisfaction of  $LTL_f$  properties like

▶  $\psi_1 = (y \geq 0) \cup (x > y \wedge G(x > y))$

▶  $\psi_2 = G(x' > x) \wedge F(x = 2)$

$x'$  is value of  $x$  looking one trace instant ahead



$\psi_1$  holds but could get violated in the future!

$\psi_2$  does not hold and will never hold in the future!

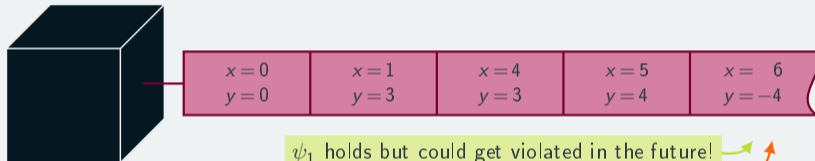
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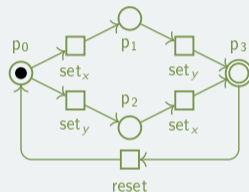
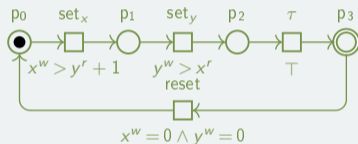
## Results

- ▶ developed monitoring procedure
- ▶ use **finite summary** approach to identify classes of properties where problem is **decidable**

# Process Equivalence


## Verification problem

given two DPNs, do they have the same sets of configurations, and/or the same language?



## Results

- ▶ can be determined using **constraint graphs**
- ▶ **decidable** for finite summary systems

talk at  workshop at BPM next week!

# Implementation

## Arithmetic DDS Analyzer (ada)

- ▶ input DPN (+  $LTL_f$  or  $CTL_f^*$  property)
- ▶ checks for decidability conditions, visualizes CG/product automaton
- ▶ performs  $LTL_f$ ,  $CTL_f^*$  model checking, soundness checking, and monitoring
- ▶ computes witness/counterexample
- ▶ written in Python, using Z3/Yices/CVC5 for SMT solving and quantifier elimination  
<https://ltl.adatool.dev> <https://soundness.adatool.dev>  
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## Experiments

- ▶ about 60 DPNs (20 from literature, 40 artificial)
- ▶ all DPNs from literature are in some decidable class for  $LTL_f$  (but not  $CTL_f^*$ ) model checking

# Implementatio

## Arithmetic DD

- ▶ input DPN
- ▶ checks for d
- ▶ performs LT
- ▶ computes w
- ▶ written in P

## Experiments

- ▶ about 60 DF
- ▶ all DPNs fro

process	property	sat	time	checks	$ \mathcal{B} $	$ \mathcal{N}_{\mathcal{B},b}^\psi $
road fines (1)	no deadlock	✗	7.0s	8161	9	2052
	$AG(p_7 \rightarrow E F \text{end})$	✓	7.6s	7655		
road fines (2)	no deadlock	✓	15m27s	247563	9	4927
	$AG(p_7 \rightarrow E F \text{end})$	✓	16m7s	246813		
road fines (3)	no deadlock	✗	9s	9179	9	1985
	$AG(p_7 \rightarrow E F \text{end})$	✓	6.6s	6382		
	$EF(dS \geq 2160)$	✗	11.5s	17680		
hospital billing	no deadlock	✓	20m59s	1234928	17	23147
	$EF(p16 \wedge \neg \text{closed})$	✓	10m20s	669379		
sepsis (1)	no deadlock	✓	1m36s	139	301	44939
	$AG(\text{sink} \rightarrow t_{tr} < t_{ab})$	✗	30.1s	170		
	$AG(\text{sink} \rightarrow t_{tr} + 60 \geq t_{ab})$	✓	32s	153		
sepsis (2)	no deadlock	✓	7m24	4524	301	161242
	$A(\neg \text{lacticAcid} \cup \langle \text{diagnostic} \rangle \top)$	✓	3m53s	5734		
board: register	no deadlock	✓	1.4s	12	7	27
board: transfer	no deadlock	✓	1.4s	27	7	51
board: discharge	no deadlock	✓	1.5s	25	6	67
	$AG(p_2 \wedge o_1=207 \rightarrow AG o_1=207)$	✓	1.5s	94		
	$AG(EF \langle \text{tra} \rangle \top \wedge EF \langle \text{his} \rangle \top)$	✓	1.5s	27		
	$\neg E(F \langle \text{tra} \rangle \top \wedge F \langle \text{his} \rangle \top)$	✓	1.4s	56		
credit approval	no deadlock	✓	1.7s	470	6	230
	$AG(\langle \text{openLoan} \rangle \top \rightarrow ver \wedge dec)$	✓	13.2s	14156		
package handling	$A(F(ver \wedge dec) \rightarrow F(\text{openLoan}) \top)$	✗	3.7s	3128	16	316
	no deadlock	✓	2.7ss	1025		
	no deadlock ( $\tau_1$ )	✓	2.5s	1079		
	$\psi_{k1} = EF \langle \text{fetch} \rangle \top$	✗	2.6s	850		
	$\psi_{k2} = EF \langle \tau_6 \rangle \top$	✗	2.4s	875		
auction	no deadlock	✗	10.8s	1683	5	186
	$EF(\text{sold} \wedge d > 0 \wedge o \leq t)$	✗	6.4s	1180		
	$EF(b = 1 \wedge o > t \wedge F(\text{sold} \wedge b > 1))$	✓	26.5s	4000		

## Summary

- ▶ for Data Petri nets with arithmetic constraints:  
verification procedures for  $LTL_f$ ,  $CTL_f^*$ , data-aware soundness
- ▶ decision procedure if DPN satisfies finite summary property: new decidability results
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## Take-home message

- ▶ finite constraint graphs are powerful tool for verification
- ▶ many relevant verification tasks are decidable for “practical” Data Petri nets

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## Take-home message

- ▶ finite constraint graphs are powerful tool for verification
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## Future work

- ▶ further SMT theories, e.g. allow guards to refer to database
- ▶ discover more expressive transition guards for DPNs :)

... all of this is the result of a fun collaboration with



Marco Montali








Paolo Felli



Fabio Patrizi

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