

# Using Abstract Acceleration in the Verification of Logico-Numerical Data-Flow Programs

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# Analysis of Numerical Programs

## Reachability analysis of numerical programs

- Abstract interpretation (Cousot and Cousot 1977)
  - ▶ Termination, but over-approximation
- Acceleration (Finkel and Leroux 2002)
  - ▶ Exact result, but no guarantee for termination

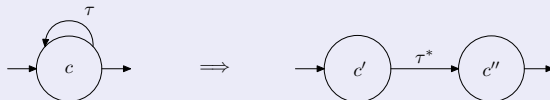
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## Acceleration

- Method for treating *loops* in numerical automata
- Replace a loop transition  $\tau$  by its *transitive closure*  $\tau^*$



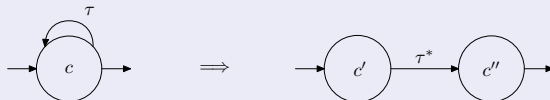
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## Abstract Acceleration (Gonnord and Halbwachs 2006)

- Computation of the convex hull  $\tau^{\otimes}$  of the exact result  $\tau^*$

# Application to Logico-Numerical Data-Flow Programs

Application to e.g. Lustre programs?

## Issues

- ➊ Input variables:
  - ▶ Boolean variables:
    - ★ Encoded as non-determinism in the control flow graph (CFG)
  - ▶ Numerical variables
- ➋ *Implicit* control flow → Discover a CFG w.r.t. Boolean variables
  - ➊ **Conventional approach:**
    - ➊ Reduction to numerical automaton by *enumeration* of Boolean states
    - ➋ → Combinatorial explosion
  - ➋ **Our approach:**
    - ➊ Symbolic handling of Boolean variables
    - ➋ Approximation method: **Decoupling**
    - ➌ **Controlled partitioning** using heuristics

# Outline

- 1 Introduction
- 2 Abstract Acceleration with Numerical Inputs
  - Abstract Acceleration
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  - Translations with Simple Guards
  - Translations with Resets and Simple Guards
  - General Guards
  - Comparison with Widening
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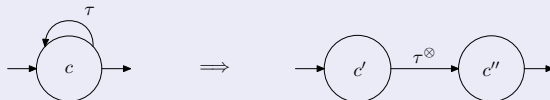
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- Computation of a convex polyhedron  $\tau^\otimes$  close to the exact result  $\tau^*$
- Acceleration of self-loops:  $\tau : \underbrace{\mathbf{Ax} \leq \mathbf{v}}_{\text{guard } G} \rightarrow \underbrace{\mathbf{x}' = \mathbf{Cx} + \mathbf{d}}_{\text{action}}$

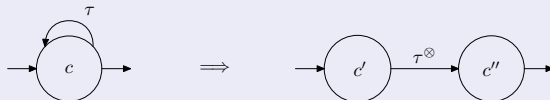




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## Accelerable Transitions

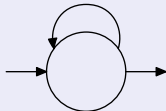
- Resets:  $G \rightarrow \mathbf{x} := \mathbf{d}$
- Translations:  $G \rightarrow \mathbf{x} := \mathbf{x} + \mathbf{d}$
- Translations with resets:  $G \rightarrow \mathbf{x} := \mathbf{Cx} + \mathbf{d}$  where  $\mathbf{C} = \text{diag}(\dots, c_i, \dots)$ ,  $c_i \in \{0, 1\}$
- Periodic affine transformations:  $G \rightarrow \mathbf{x} := \mathbf{Cx} + \mathbf{d}$  where  $\exists p > 0 : \mathbf{C}^p = \mathbf{C}^{2p}$

# Example

## Translations

- $\tau : G \rightarrow \mathbf{x}' = \mathbf{x} + \mathbf{d}$
- Accelerated transition:  $\tau^{\otimes}(X) = X \sqcup (((X \sqcap G) \nearrow \mathbf{d}) \sqcap G(\mathbf{x} - \mathbf{d}))$

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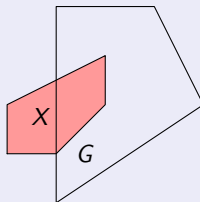
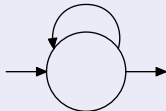


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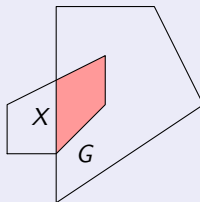
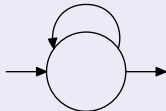


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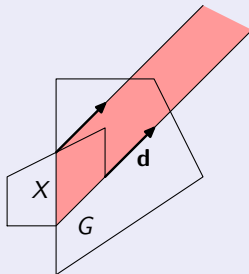
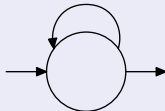


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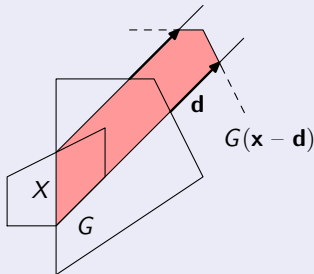
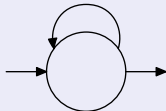


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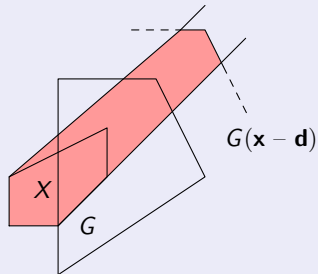
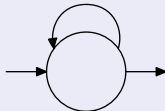
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# Abstract Acceleration with Numerical Inputs

- Extension to numerical inputs  $\xi$ :

$$\tau : \underbrace{\begin{pmatrix} \mathbf{A} & \mathbf{L} \\ 0 & \mathbf{J} \end{pmatrix} \begin{pmatrix} \mathbf{x} \\ \xi \end{pmatrix} \leq \begin{pmatrix} \mathbf{v} \\ \mathbf{k} \end{pmatrix}}_{\mathbf{Ax} + \mathbf{L}\xi \leq \mathbf{v} \wedge \mathbf{J}\xi \leq \mathbf{k}} \rightarrow \underbrace{\mathbf{x}' = (\mathbf{C} \quad \mathbf{T}) \begin{pmatrix} \mathbf{x} \\ \xi \end{pmatrix} + \mathbf{u}}_{\mathbf{x}' = \mathbf{Cx} + \mathbf{T}\xi + \mathbf{u}}$$

- $L = 0$  (“*simple guards*”):
  - ▶  $\rightarrow$  No interaction between inputs and state variables in the guard
  - ▶ Translations
  - ▶ Translations with resets
- $L \neq 0$  (“*general guards*”):
  - ▶ No more accelerable  $\rightarrow$  approximated solution

# Abstract Acceleration with Numerical Inputs

## Translations with Simple Guards

$$\bullet \tau : \underbrace{\mathbf{Ax} \leq \mathbf{v}}_G \wedge \mathbf{J}\xi \leq \mathbf{k} \rightarrow \mathbf{x}' = \mathbf{x} + \underbrace{\mathbf{T}\xi + \mathbf{u}}_D$$

$$\text{Example: } \tau(X) : \left| \begin{array}{l} x_1 + x_2 \leq 4 \\ 1 \leq \xi \leq 2 \end{array} \right. \rightarrow \left| \begin{array}{l} x'_1 = x_1 + 2\xi - 1 \\ x'_2 = x_2 + \xi \end{array} \right.$$

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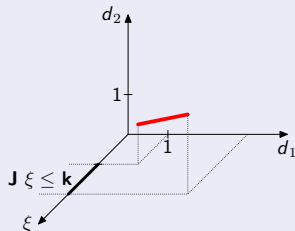
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$$\bullet \tau(X) = (X \sqcap G) + D$$

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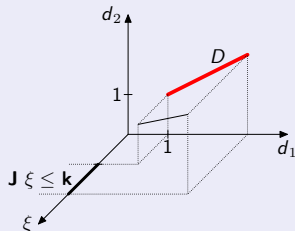
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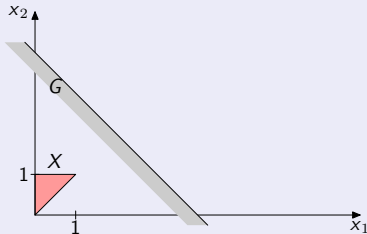
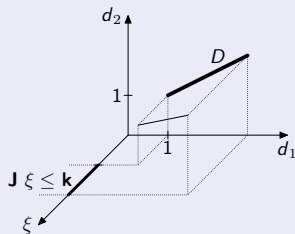
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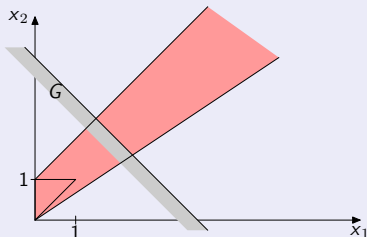
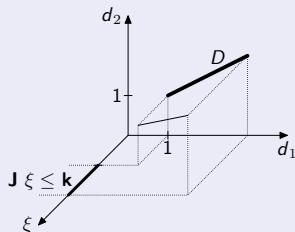
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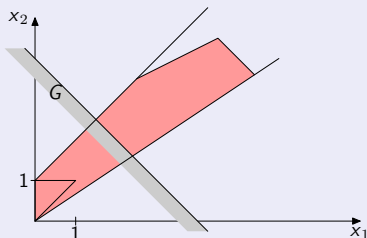
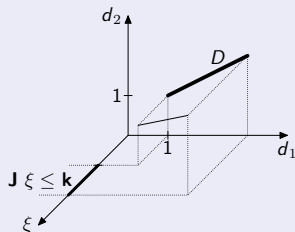
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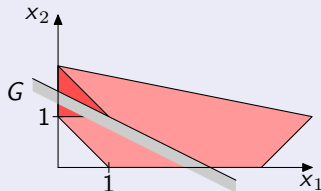
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# Abstract Acceleration with Numerical Inputs

## General Guards

- $\tau : \begin{pmatrix} \mathbf{A} & \mathbf{L} \\ 0 & \mathbf{J} \end{pmatrix} \begin{pmatrix} \mathbf{x} \\ \xi \end{pmatrix} \leq \begin{pmatrix} \mathbf{v} \\ \mathbf{k} \end{pmatrix} \rightarrow \mathbf{x}' = (\mathbf{C} \quad \mathbf{T}) \begin{pmatrix} \mathbf{x} \\ \xi \end{pmatrix} + \mathbf{u}$
- $L \neq 0 \implies$  can code a *general affine transformation* by a reset to input:
  - ▶  $(\mathbf{Ax} \leq \mathbf{v}) \rightarrow \mathbf{x}' = \mathbf{Cx} + \mathbf{d} \iff (\mathbf{Ax} \leq \mathbf{v} \wedge \xi = \mathbf{Cx} + \mathbf{d}) \rightarrow \mathbf{x}' = \xi$
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## Weakened Guards

- $\overline{G} = \underbrace{(\exists \xi : G)}_{\mathbf{A}'\mathbf{x} \leq \mathbf{v}'} \wedge \underbrace{(\exists \mathbf{x} : G)}_{\mathbf{J}'\xi \leq \mathbf{k}'}$
- Resort to methods for translation and translation/reset

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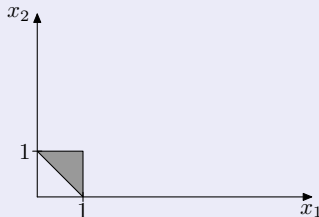
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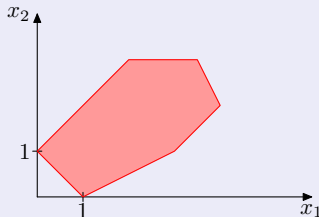
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- Convex hull of the exact result



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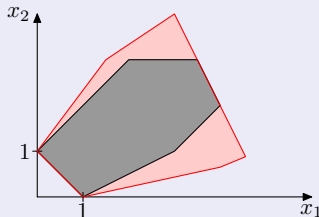
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$$\tau(X) : \left| \begin{array}{rcl} 2x_1 + x_2 + \xi & \leq & 6 \\ x_2 - \xi & \leq & 2 \\ 0 \leq \xi & \leq & 1 \end{array} \right. \rightarrow \left| \begin{array}{l} x'_1 = x_1 + \xi + 1 \\ x'_2 = x_2 + 1 \end{array} \right.$$

- Convex hull of the exact result
- Widening with delay  $N = 0$  and 3 descending iterations



# Comparison with Widening I

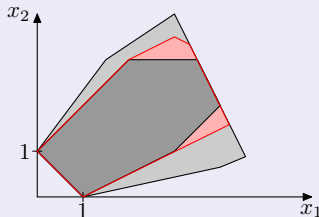
## Widening

- 1 Delayed by  $N$  iterations
- 2 Widening until convergence
- 3 Descending iterations

## Comparison: Translation with general guard

$$\tau(X) : \left| \begin{array}{rcl} 2x_1 + x_2 + \xi & \leq & 6 \\ x_2 - \xi & \leq & 2 \\ 0 \leq \xi & \leq & 1 \end{array} \right. \rightarrow \left| \begin{array}{l} x'_1 = x_1 + \xi + 1 \\ x'_2 = x_2 + 1 \end{array} \right.$$

- Convex hull of the exact result
- Widening with delay  $N = 0$  and 3 descending iterations
- **Abstract acceleration**



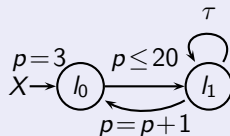
# Comparison with Widening II

## Comparison: Nested loops

$$\tau : \left| \begin{array}{rcl} 2x_1 + 2x_2 & \leq & p \\ 0 \leq \xi & \leq & 1 \end{array} \right. \rightarrow \left| \begin{array}{l} x'_1 = x_1 + \xi + 1 \\ x'_2 = \xi \\ p' = p \end{array} \right.$$

- **Widening** with delay  $N = 2$  and one descending iteration:

$$\{0 \leq x_1 \wedge 1 \leq x_1 + x_2 \wedge 3 \leq p\}$$

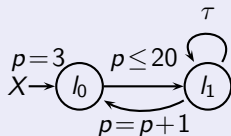


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- Widening with delay  $N = 2$  and one descending iteration:  
 $\{0 \leq x_1 \wedge 1 \leq x_1 + x_2 \wedge 3 \leq p\}$
- Inner loop **with abstract acceleration**.  
 Outer loop: widening with one descending iteration:  
 $\{0 \leq x_1 \leq 12 \wedge 0 \leq x_2 \leq 3 \wedge 3 \leq p \leq 20\}$   
 (over-approximated)



# Conclusion

Abstract acceleration with **numerical inputs**

## Acceleration vs. Widening

- Different principles:
  - ▶ *Acceleration* is based on the program structure, whereas
  - ▶ *widening* is based on the structure of the abstract domain.
- Approximations are more predictable:
  - ▶ Widening is not **monotonous** – acceleration is.
- Acceleration of inner loops facilitates widening in **nested loops** situations.
  - ▶ Acceleration also applied in descending iterations.
- Widening needed for
  - ▶ handling non-accelerable transitions
  - ▶ ensuring convergence in the case of multiple self-loops and nested loops

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- 1 Introduction
- 2 Abstract Acceleration with Numerical Inputs
  - Abstract Acceleration
  - Abstract Acceleration with Numerical Inputs
  - Translations with Simple Guards
  - Translations with Resets and Simple Guards
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  - Comparison with Widening
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  - Conventional Approach
  - Decoupling
  - Partitioning
  - Experimental Results
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# Application of Acceleration to Data-Flow Programs

Application to e.g. Lustre programs?

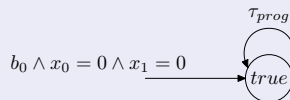
## Issues

- ❶ Input variables:
  - ▶ Boolean variables:
    - ★ Encoded as non-determinism in the control flow graph (CFG)
  - ▶ Numerical variables ✓
- ❷ *Implicit* control flow → Discover a CFG w.r.t. Boolean variables
  - ❶ **Conventional approach:**
    - ❶ Reduction to numerical automaton by *enumeration* of Boolean states
    - ❷ → Combinatorial explosion
  - ❷ **Our approach:**
    - ❶ Symbolic handling of Boolean variables
    - ❷ Approximation method: **Decoupling**
    - ❸ **Controlled partitioning** using heuristics



# Conventional Approach

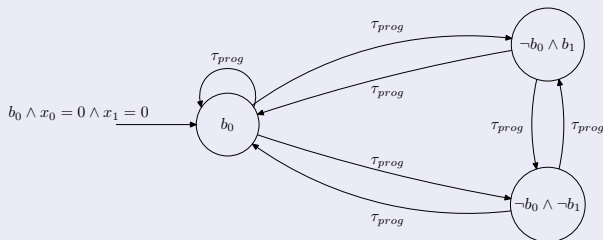
## Transformations



# Conventional Approach

## Transformations

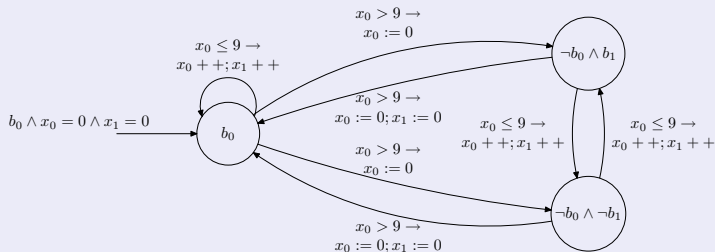
- Boolean state space **enumeration**



# Conventional Approach

## Transformations

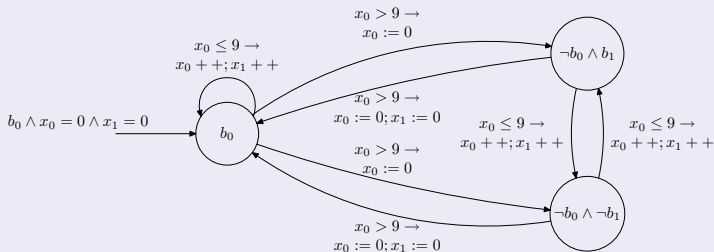
- 1 Boolean state space **enumeration**
- 2 Transition refinement by source and destination location



# Conventional Approach

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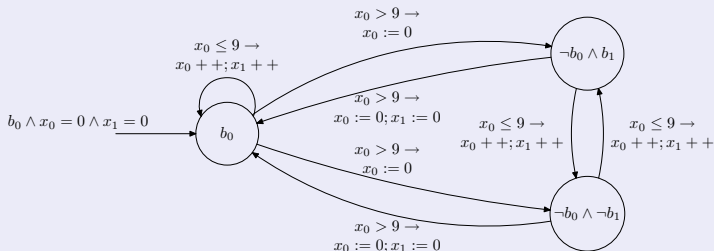
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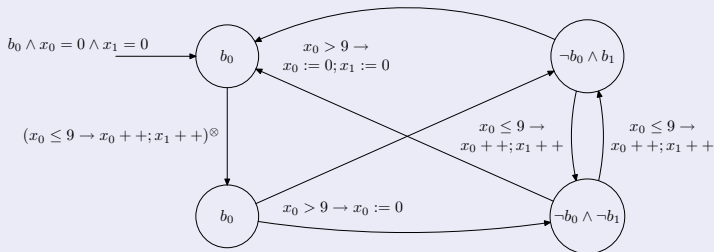
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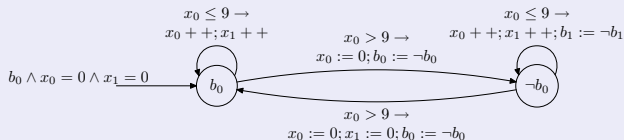
- 1 Boolean state space **enumeration**
- 2 Transition refinement by source and destination location
- 3 Elimination of Boolean input variables
- 4 Convexification of numerical guards
- 5 “Flattening” of accelerable self-loops



# Partitioning and Acceleration

## Intuition: Self-loops with Boolean Identity

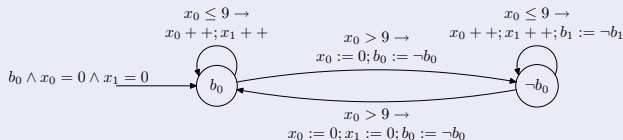
- Partition until we have a CFG where the **Boolean** part of the transition function is the **identity**.



# Partitioning and Acceleration

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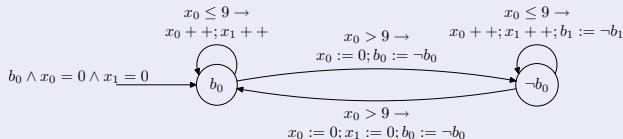
- Partitioning **not** necessary at all!!!



# Partitioning and Acceleration

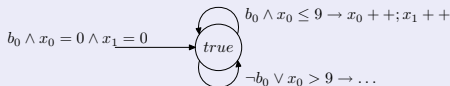
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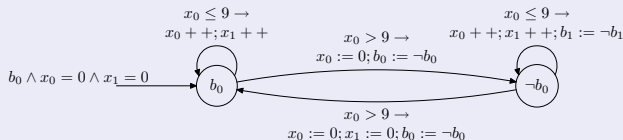
## Acceleration without Partitioning



# Partitioning and Acceleration

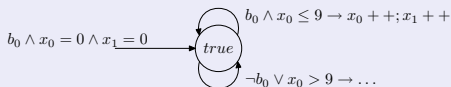
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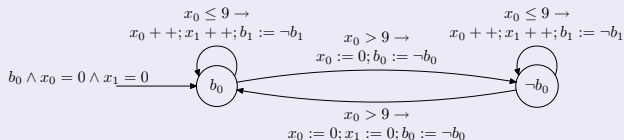
## Acceleration without Partitioning



- Partitioning and acceleration are **orthogonal**!

# Decoupling

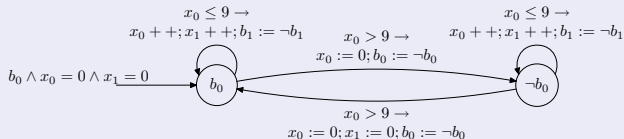
## Problem



- Boolean identity **too restrictive** → Rarely applicable

# Decoupling

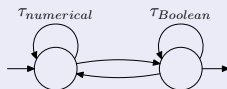
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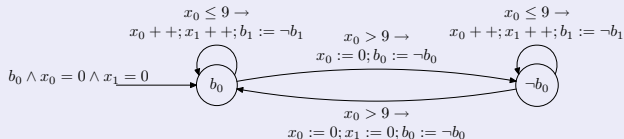
## Idea: Decoupling

- Decoupling** numerical and Boolean parts of the transition function → approximation



# Decoupling

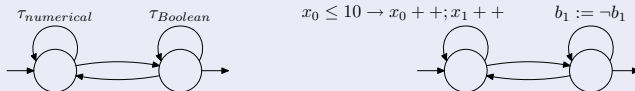
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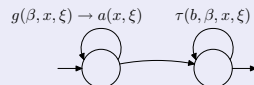
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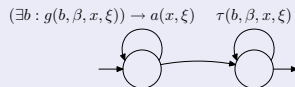
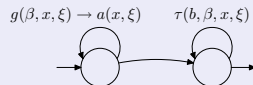
# Decoupling Variants

- Numerical equations **independent** of Boolean equations



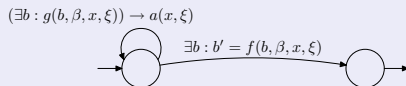
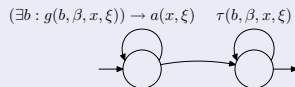
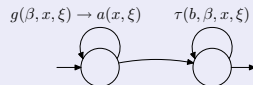
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# Decoupling Variants

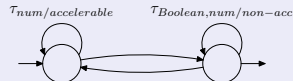
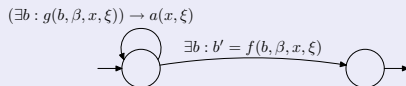
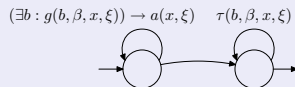
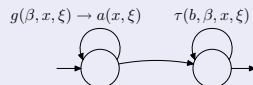
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- **Inputization** of unstable Boolean state variables in Boolean equations





# Decoupling Variants

- Numerical equations **independent** of Boolean equations
- Inputization** of Boolean state variables in Numerical equations
- Inputization** of unstable Boolean state variables in Boolean equations
- Decoupling accelerable and **non-accelerable** equations



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# Why partitioning?

## Gain in precision!

- ➊ More targeted application of *widening* (at loop heads only)
- ➋ Explicit *disjunctive* abstract domain  $\rightarrow$  Less precision loss in unions

# Why partitioning?

## Gain in precision!

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## But...

CFG size	1	...	$2^n$
partitioning	no	controlled	full
precision	bad		good
property	don't know		proved
tractability	yes		no
program	logico-numerical		numerical

goal

# Partitioning by Numerical Actions

## Idea: Equivalence classes w.r.t. numerical actions

- Intuition: Same set of actions executed in the same Boolean states.

$$b_1 \sim b_2 \Leftrightarrow \left\{ \begin{array}{l} \forall \beta, \mathcal{C} : \mathcal{A}(b_1, \beta, \mathcal{C}) \Rightarrow \mathcal{A}(b_2, \beta, \mathcal{C}) \wedge f^\times(b_1, \beta, \mathcal{C}) = f^\times(b_2, \beta, \mathcal{C}) \\ \text{and} \quad \text{vice versa} \end{array} \right.$$

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- Example:

$$x'_0 = \begin{cases} x_0 + 1 & \text{if } \neg b_0 \wedge \neg b_1 \wedge x_0 \leq 10 \wedge \beta \vee b_0 \wedge \neg b_1 \wedge x_0 \leq 20 \\ 0 & \text{if } \neg b_0 \wedge \neg b_1 \wedge x_0 > 10 \wedge x_1 > 10 \\ x_0 & \text{else} \end{cases}$$

$$x'_1 = \begin{cases} x_1 + 1 & \text{if } \neg b_0 \wedge \neg b_1 \wedge x_1 \leq 10 \wedge \neg \beta \\ x_1 & \text{else} \end{cases}$$

$$x'_2 = \begin{cases} x_2 + 1 & \text{if } \neg b_0 \wedge \neg b_1 \wedge (x_0 \leq 10 \wedge \beta \vee x_1 \leq 10 \wedge \neg \beta) \vee b_0 \wedge \neg b_1 \\ x_2 & \text{else} \end{cases}$$

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$$\begin{aligned} [\neg b_0 \wedge \neg b_1] \quad (x'_0, x'_1, x'_2) &= \begin{cases} (x_0 + 1, & x_1, & x_2 + 1) & \text{if } x_0 \leq 10 \wedge \beta \\ (x_0, & x_1 + 1, & x_2 + 1) & \text{if } x_1 \leq 10 \wedge \neg \beta \\ (0, & x_1, & x_2) & \text{if } x_0 > 10 \wedge x_1 > 10 \\ (x_0, & x_1, & x_2) & \text{else} \end{cases} \\ [b_0 \wedge \neg b_1] \quad (x'_0, x'_1, x'_2) &= \begin{cases} (x_0 + 1, & x_1, & x_2 + 1) & \text{if } x_0 \leq 20 \\ (x_0, & x_1, & x_2 + 1) & \text{if } x_0 > 20 \\ (x_0, & x_1, & x_2) & \text{else} \end{cases} \\ [b_0 \wedge b_1] \quad (x'_0, x'_1, x'_2) &= \begin{cases} (x_0, & x_1, & x_2) \end{cases} \end{aligned}$$

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- Nice property: Numerical equations **independent** of Boolean equations.
- Variants: Different quantifications
- **Refinement** by Boolean backward bisimulation

# Some Experimental Results

- Tool NBACCEL based on the abstract domain library BDDAPRON
- Small, but difficult benchmarks

	Boolean states	time NBACCEL	time NBAC
Escalator 1	9	0.54	–
Escalator 2	259	3.98	1.48
Gate 1	5	0.54	–
Traffic 1	13	0.45	3.52
Traffic 2	16	1.74	–

- Larger benchmarks

	Boolean states	time NBACCEL	time NBAC
LCM quest 0a	72	0.07	0.06
LCM quest 0b	541	0.20	0.31
LCM quest 0c	16432	0.32	0.49
LCM quest 1	32992	2.23	3.46
LCM quest 2	33013	5.22	15.14

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# Conclusion

Application of abstract acceleration to **logico-numerical** data-flow programs

## Decoupling and Partitioning

- Acceleration can be applied **independently** of partitioning.
- **Decoupling** enlarges the applicability of acceleration.
- **Partitioning** heuristics w.r.t. numerical actions

# Conclusion

Application of abstract acceleration to **logico-numerical** data-flow programs

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## Current and Future Work

- Combination with dynamic partitioning (also using numerical constraints)
- Backward acceleration
- Application to discretized hybrid systems
  - ▶ Non-standard semantics (Benveniste, Caillaud and Pouzet 2010)

# Using Abstract Acceleration in the Verification of Logico-Numerical Data-Flow Programs

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