

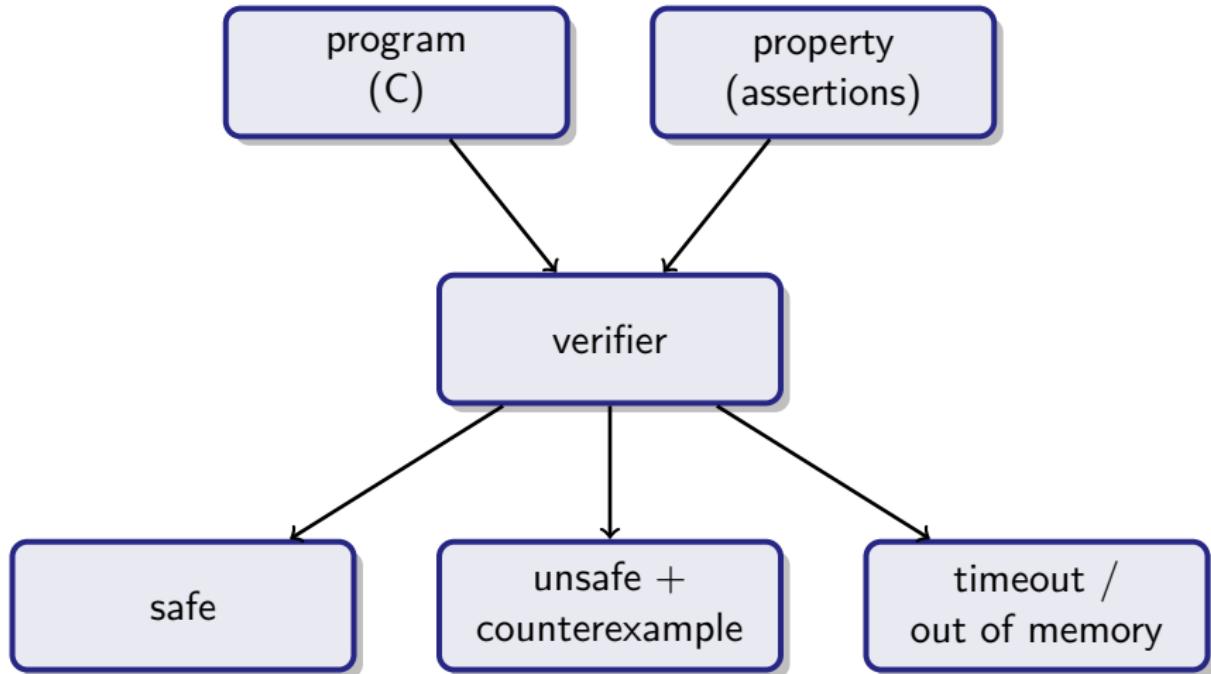
# Generalisation Methods for Control-Flow Oriented IC3 Algorithms

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September 23, 2016 / Master's Thesis Presentation

## Model Checking Process



# Outline

1 Preliminaries

2 IC3CFA

3 Experimental Results

4 Conclusion

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## Definitions

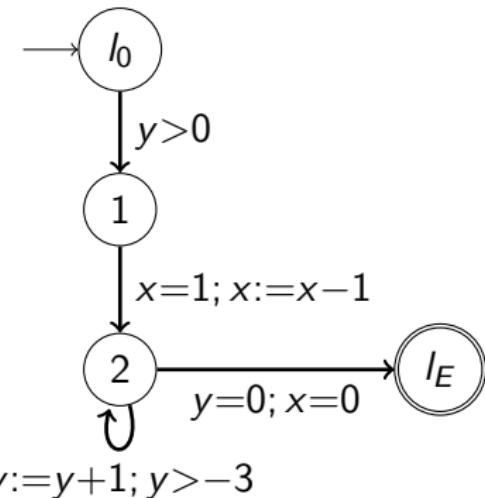
- a **literal**  $p$  is an atomic first-order formula
- a **cube**  $c$  is a conjunction of literals, i.e.  $c = \bigwedge\{p_1, \dots, p_n\}$

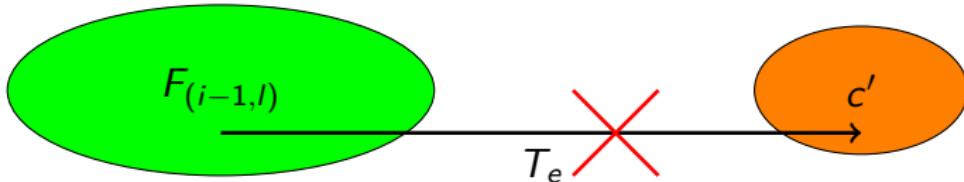
# Literals / Cubes / CFA

## Definitions

- a **literal**  $p$  is an atomic first-order formula
- a **cube**  $c$  is a conjunction of literals, i.e.  $c = \bigwedge\{p_1, \dots, p_n\}$
- a **control-flow automaton** is a tuple  $(L, G, l_0, l_E)$

```
1: procedure MAIN( $x, y$ )
2:   assume( $y > 0$ )
3:   assume( $x = 1$ )
4:    $x \leftarrow x - 1$ 
5:   while true do
6:     assert( $\neg(y = 0 \wedge x = 0)$ )
7:      $y \leftarrow y + 1$ 
8:     assume( $y > -3$ )
9:   end while
10: end procedure
```



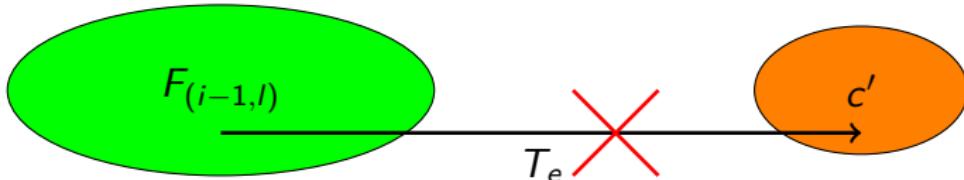


## Relative Inductiveness

- block cube  $c$  with respect to edge  $e$ ,  
if  $c$  is **relative inductive** with respect to  $F_{(i-1,l)}$  and  $e$ , i.e.

$$(l \neq l') \quad \text{rellnd}(F_{(i-1,l)}, e, c) \Leftrightarrow \quad \text{UNSAT}(F_{(i-1,l)} \wedge T_e \wedge c')$$

$$(l = l') \quad \text{rellnd}(F_{(i-1,l)}, e, c) \Leftrightarrow \quad \text{UNSAT}(F_{(i-1,l)} \wedge \neg c \wedge T_e \wedge c')$$



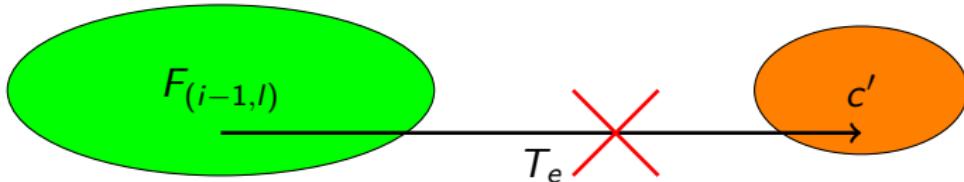
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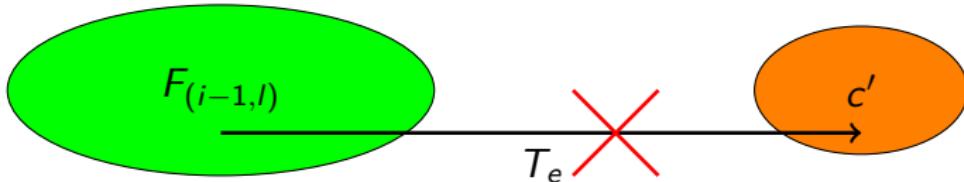
$$(l = l') \quad \text{rellnd}(F_{(i-1,l)}, e, c) \Leftrightarrow \quad \text{UNSAT}(F_{(i-1,l)} \wedge \neg c \wedge T_e \wedge c')$$

- compute **generalisation**  $\text{gen}_{(i,l')}(c, e)$  of cube  $c$



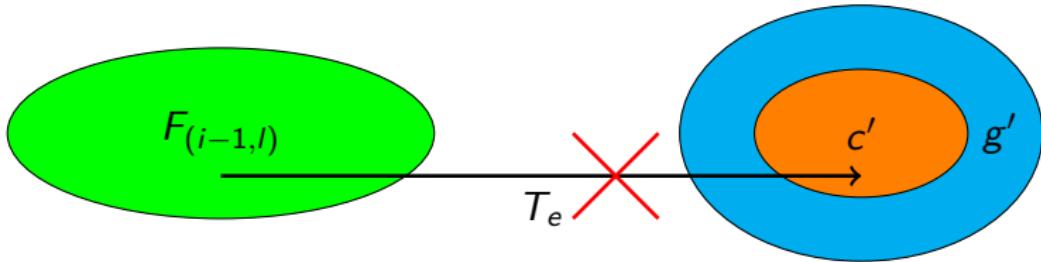
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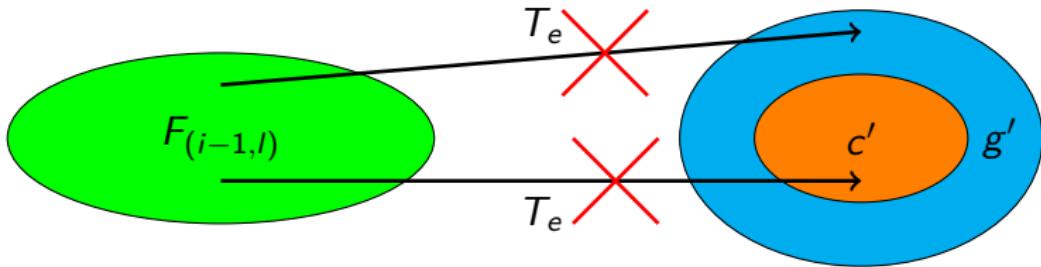
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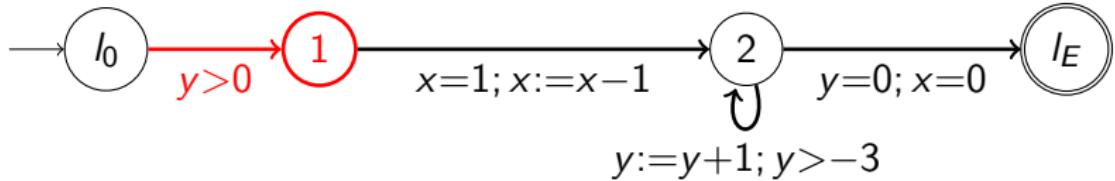


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- $gen_{(i,l')}(c, e)$  is **syntactical subset** of cube  $c$ , i.e.  $gen_{(i,l')}(c, e) \subseteq c$
- $gen_{(i,l')}(c, e)$  is **relative inductive** with respect to edge  $e$ , i.e.

$$rellInd(F_{(i-1,l)}, e, c) \Rightarrow rellInd(F_{(i-1,l)}, e, g)$$

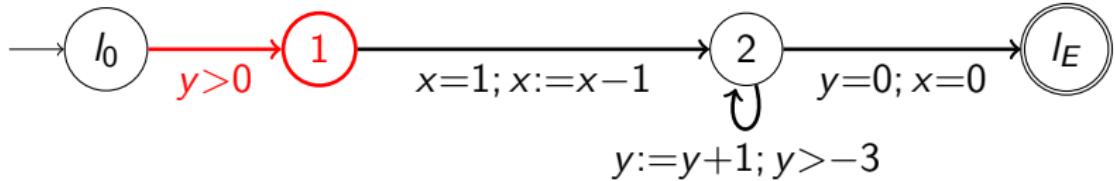
# IC3CFA Generalisation II



## Example

- block cube  $c = \{y=0, x=1\}$  at location 1  
with respect to edge  $e_{l_0 \rightarrow 1}$

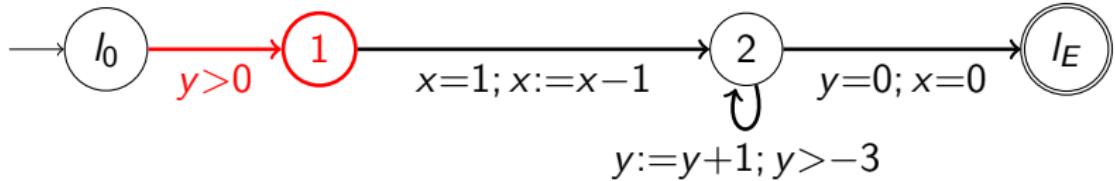
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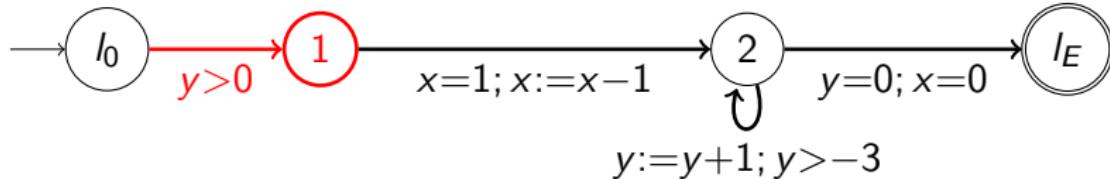
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## Example

- block cube  $c = \{y=0, x=1\}$  at location 1  
with respect to edge  $e_{I_0 \rightarrow 1}$
- compute **generalisation**  $\text{gen}_{(i,1)}(\{y=0, x=1\}, e_{I_0 \rightarrow 1}) \subseteq \{y = 0, x = 1\}$
- drop literal  $p \in c$ , if  $\text{rellnd}(F_{(i-1,I)}, e_{I_0 \rightarrow 1}, c \setminus \{p\}) = \text{true}$  (IC3)

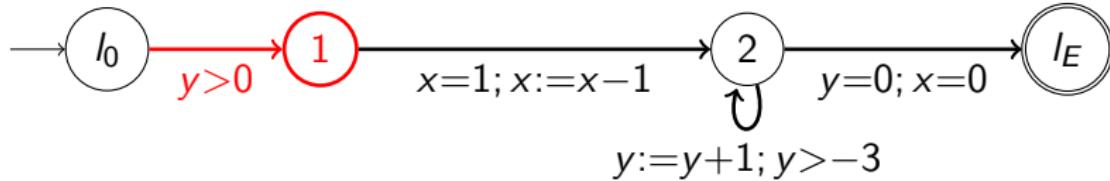
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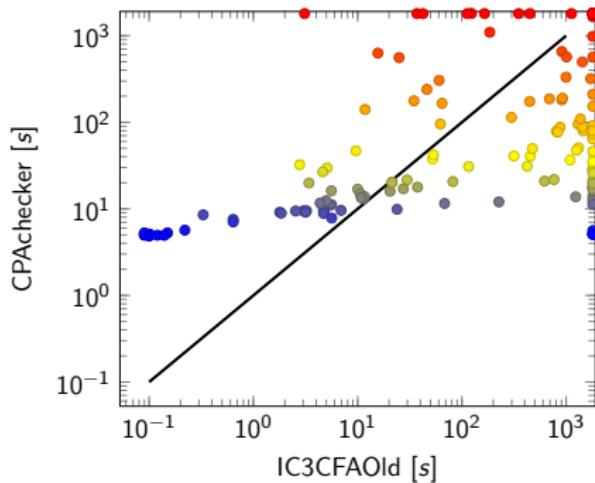
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## Example

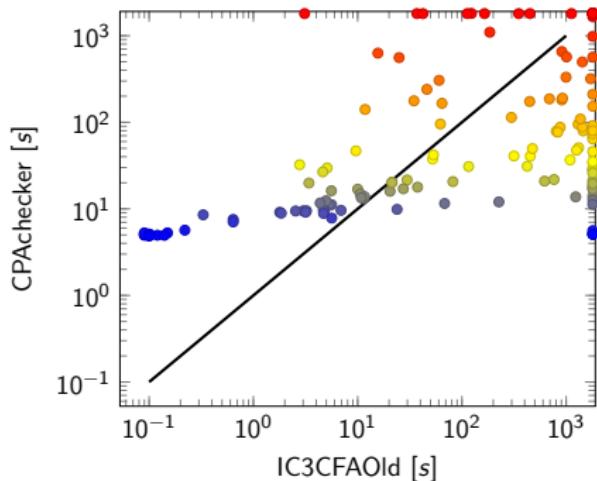
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- e.g. drop literal  $x=1$ , since  $rellnd(\text{true}, e_{I_0 \rightarrow 1}, \{y=0\}) = \text{true}$ , cannot drop remaining literal  $y=0$ , since  $rellnd(\text{true}, e_{I_0 \rightarrow 1}, \emptyset) = \text{false}$
- in consequence,  $gen_{(i,1)}(\{y=0, x=1\}, e_{I_0 \rightarrow 1}) = \{y=0\}$

# Motivation II



Algorithm	# solved	t solved	score	memory
IC3CFAOld	101 / 150	29,200 s	165	30,820 MB
CPAchecker	120 / 150	12,680 s	193	44,000 MB

# Motivation II



## Idea

- IC3CFAOld spends 61% of time in SMT solver
- replace SMT calls by **syntactical checks**

# Outline

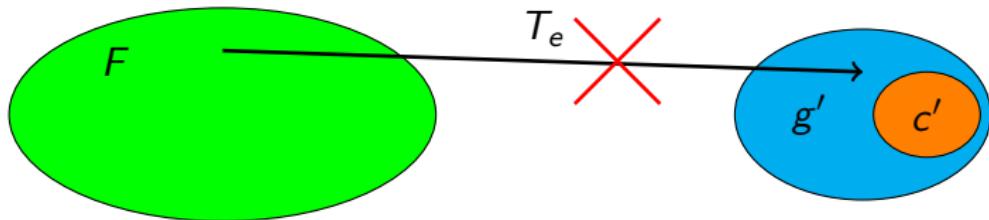
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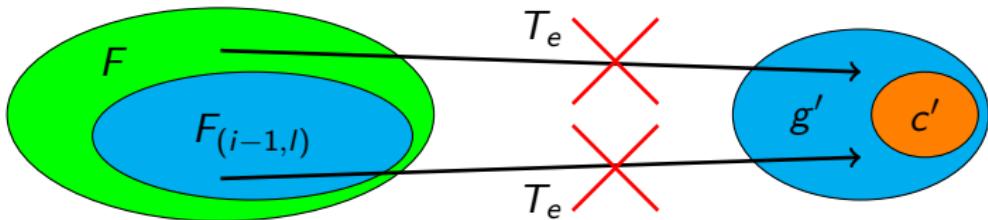
# New Generalisation Context I



## Generalisation Context

- let  $g \subseteq c$  be a syntactic generalisation of cube  $c$  with respect to frame  $F$  and edge  $e$
- cache generalisation  $g$  as **generalisation context**  $(c, F, e, g)$

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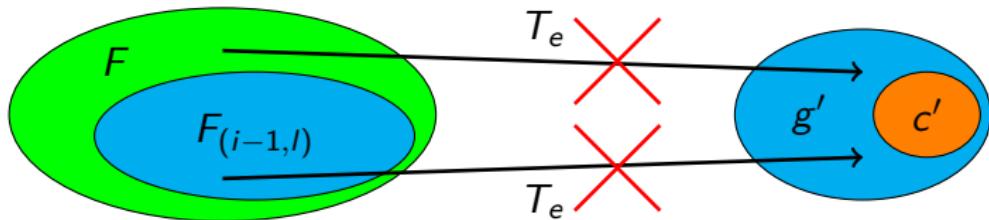


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- cache generalisation  $g$  as **generalisation context**  $(c, F, e, g)$
- frame relation  $F_1 \sqsubseteq F_2 \Leftrightarrow F_1 \supseteq F_2$
- if we encounter cube  $c$  at frame  $F_{(i-1,l)}$  and edge  $e$  again, then

$$F_{(i-1,l)} \sqsubseteq F \quad \Rightarrow \quad \text{gen}_{(i,l')}(c, e) = g$$

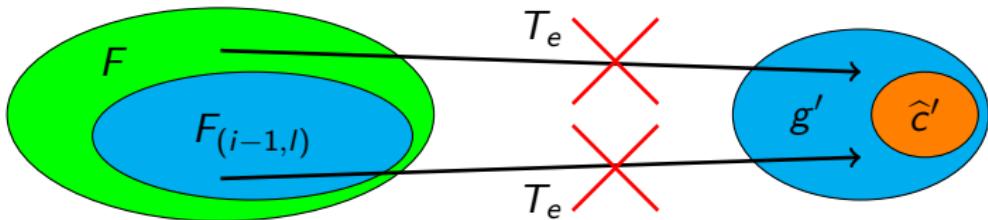
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- cache generalisation  $g$  as **generalisation context** ( $c, F, e, g$ )
- so far, we have to encounter exactly the same cube  $c$  again

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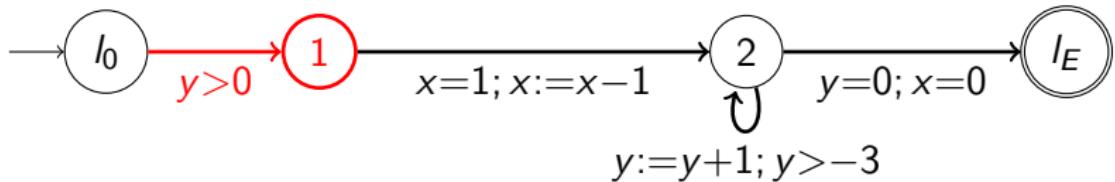


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- cache generalisation  $g$  as **generalisation context**  $(c, F, e, g)$
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- if we encounter **another cube**  $\hat{c}$  at frame  $F_{(i-1,l)}$  and edge  $e$ , then

$$F_{(i-1,l)} \sqsubseteq F \wedge g \subseteq \hat{c} \quad \Rightarrow \quad \text{gen}_{(i,l')}( \hat{c}, e ) = g$$

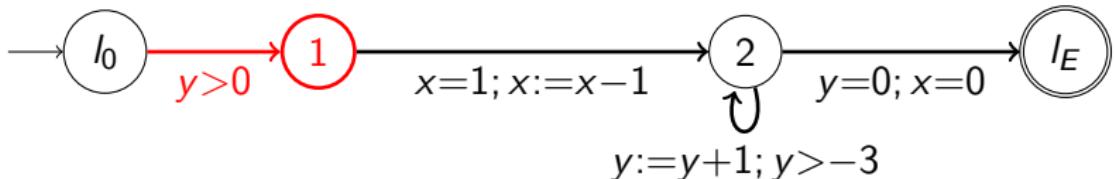
## New Generalisation Context II



### Example

- block cube  $\hat{c} = \{y=0, x=1\}$  at location 1  
with respect to edge  $e_{l_0 \rightarrow 1}$
- generalisation context  $(c, \text{true}, e_{l_0 \rightarrow 1}, \{y=0\})$ ,  
where  $c$  is an **arbitrary** cube

## New Generalisation Context II

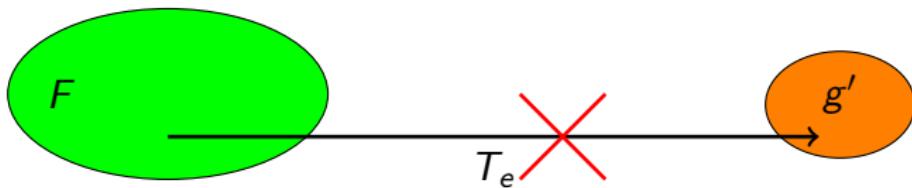


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- generalisation context  $(c, \text{true}, e_{l_0 \rightarrow 1}, \{y=0\})$ , where  $c$  is an **arbitrary** cube
- since  $F_{(i-1, l_0)} \sqsubseteq \text{true}$  for every frame  $F_{(i-1, l_0)}$ , we get

$$\text{gen}_{(i, 1)}(\{y=0, x=1\}, e_{l_0 \rightarrow 1}) = \{y=0\}$$

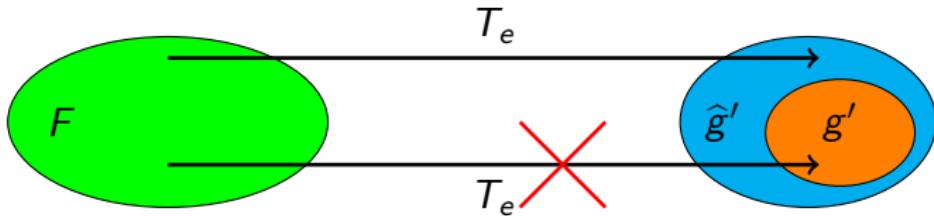
# Minimal Generalisation I



## Idea

- assume that syntactic generalisation  $g \subseteq c$  is cached as generalisation context  $(c, F, e, g)$

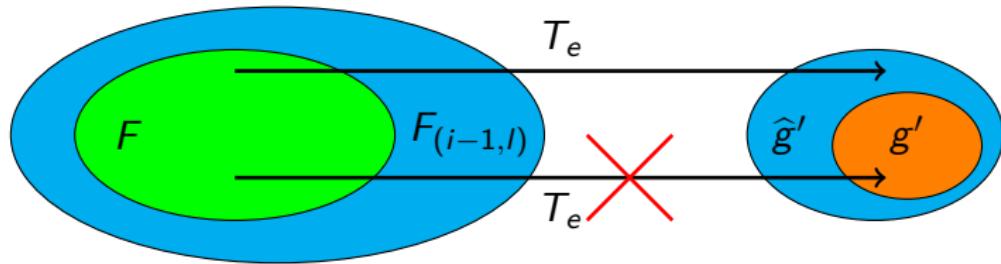
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- assume that syntactic generalisation  $g \subseteq c$  is cached as generalisation context  $(c, F, e, g)$
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 $\forall \hat{g} \subset g. \hat{g}$  is not relative inductive with respect to  $F$

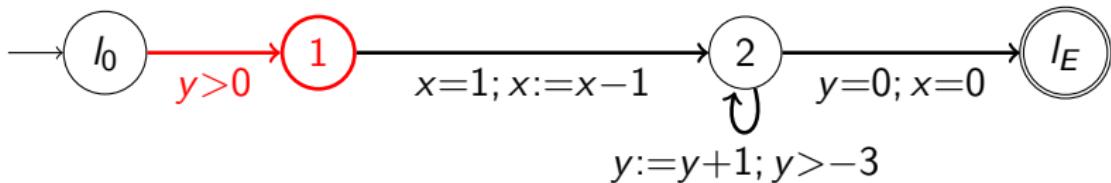
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- if we encounter cube  $c$  at frame  $F_{(i-1,l)}$  and edge  $e$  again, then  
$$F \sqsubseteq F_{(i-1,l)} \Rightarrow g \subseteq \text{gen}_{(i,l')}(c, e) \subseteq c$$

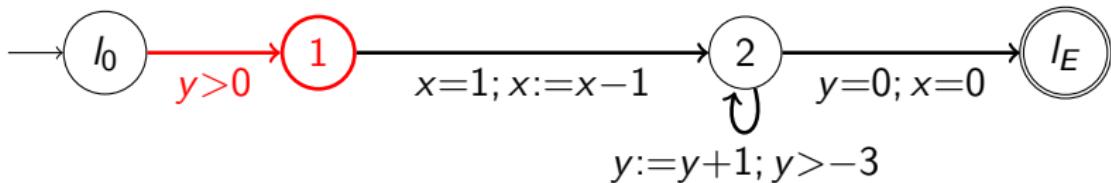
## Minimal Generalisation II



### Example

- block cube  $c = \{y = 0, x = 1\}$  at location 1  
with respect to edge  $e_{l_0 \rightarrow 1}$

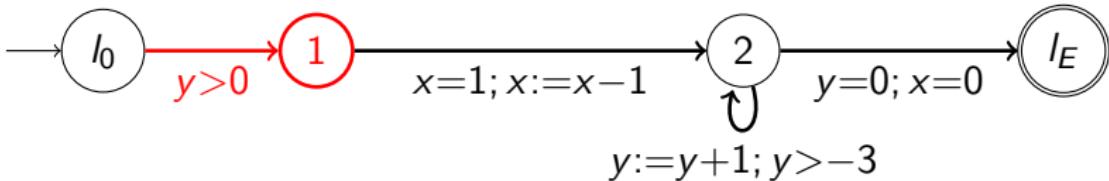
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## Example

- block cube  $c = \{y = 0, x = 1\}$  at location 1 with respect to edge  $e_{l_0 \rightarrow 1}$
- generalisation context  $(c, \text{true}, e_{l_0 \rightarrow 1}, \{y=0\})$
- assume that  $F_{(i-1, l_0)} = \text{true}$ , such that  $\text{true} \sqsubseteq F_{(i-1, l_0)}$

# Minimal Generalisation II



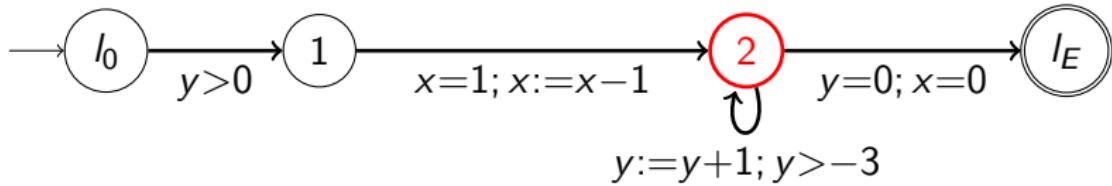
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- assume that  $F_{(i-1, l_0)} = \text{true}$ , such that  $\text{true} \sqsubseteq F_{(i-1, l_0)}$
- we get

$$\{y = 0\} \subseteq \text{gen}_{(i, 1)}(\{y=0, x=1\}, e_{l_0 \rightarrow 1}) \subseteq \{y = 0, x = 1\}$$

i.e.  $\text{gen}_{(i, 1)}(\{y=0, x=1\}, e_{l_0 \rightarrow 1}) = \emptyset \equiv \text{true}$  is **not possible**

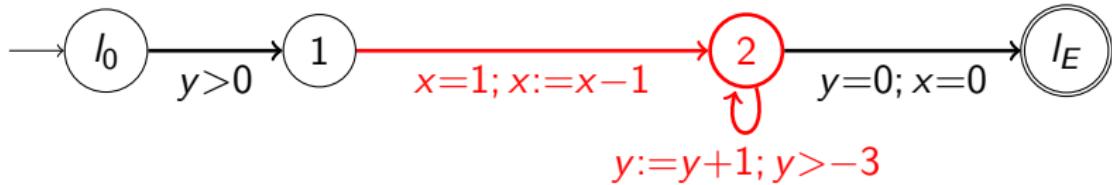
# Multiple Predecessors I



## Example

- generalise cube  $c = \{y=0, x=0\}$  at location 2

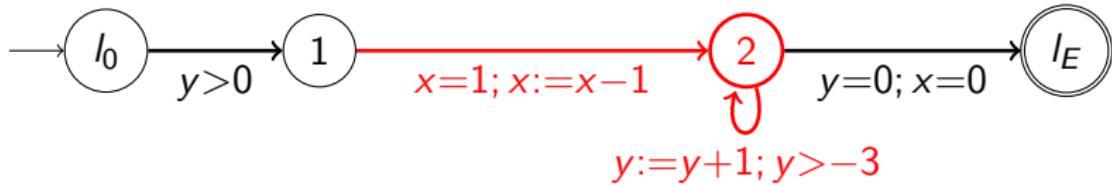
# Multiple Predecessors I



## Example

- generalise cube  $c = \{y=0, x=0\}$  at location 2
- compute edge-based generalisations with respect to  $e_{1 \rightarrow 2}$  and  $e_{2 \rightarrow 2}$

# Multiple Predecessors I



## Example

- generalise cube  $c = \{y=0, x=0\}$  at location 2
- compute edge-based generalisations with respect to  $e_{1 \rightarrow 2}$  and  $e_{2 \rightarrow 2}$

## Observation

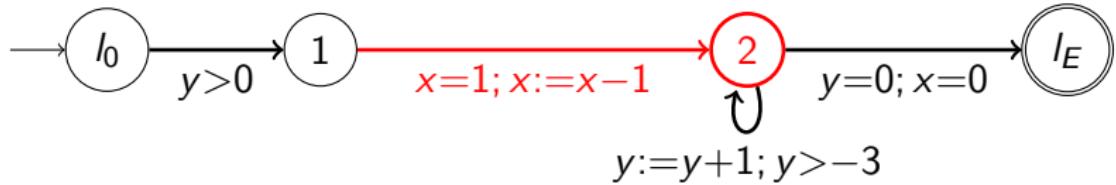
It holds that

$$gen_{(i,2)}(c) = \bigcup_{e \in G} gen_{(i,2)}(c, e)$$

such that

$$\forall e \in G. \quad gen_{(i,2)}(c, e) \subseteq gen_{(i,2)}(c) \subseteq c$$

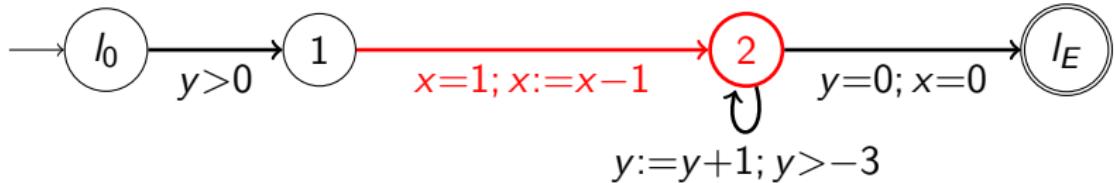
# Multiple Predecessors II



## First Edge

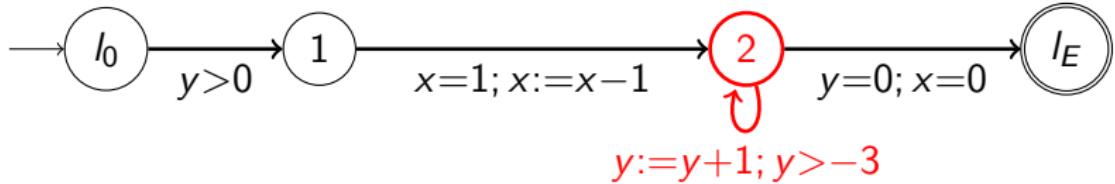
- assume that  $\text{gen}_{(i,2)}(\{y=0, x=0\}, e_{1 \rightarrow 2}) = \{y=0\}$

# Multiple Predecessors II



## First Edge

- assume that  $\text{gen}_{(i,2)}(\{y=0, x=0\}, e_{1 \rightarrow 2}) = \{y=0\}$



## Second Edge

- in consequence, we get

$$\{y=0\} \subseteq \text{gen}_{(i,2)}(\{y=0, x=0\}, e_{2 \rightarrow 2}) \subseteq \{y=0, x=0\}$$

# Ordering

## Observation

- given three cubes to be blocked, e.g.  
 $c_1 = \{p_1, p_2\}$ ,  $c_2 = \{p_1, p_3, p_4\}$ ,  $c_3 = \{p_1, p_3, p_5\}$
- assume that there exists generalisation  $g = \{p_1\}$   
blocking all cubes  $c_1, c_2, c_3$

# Ordering

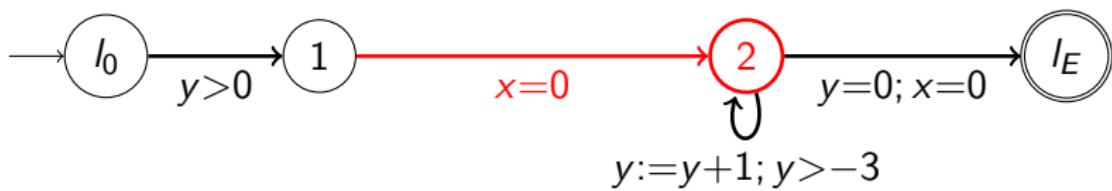
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- assume that there exists generalisation  $g = \{p_1\}$  blocking all cubes  $c_1, c_2, c_3$
- generalisation of  $c_1$  requires only 2 SMT calls (2 literals), while the one of  $c_2, c_3$  requires 3 SMT calls (3 literals)

## Ordering

experimental results: ordering in ascending order according to cube size

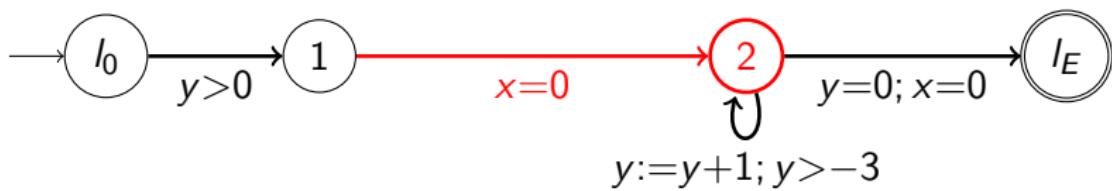
# Guaranteed Literals



## Observation

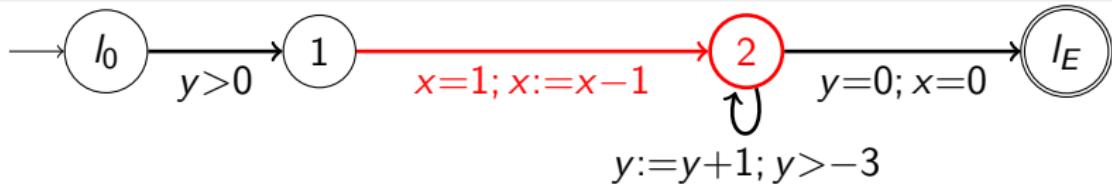
- so far, drop literals **syntactically** guaranteed by transition  $T_e$
- e.g.  $gen_{(i,2)}(\{y = 0, x = 0\}, e_{1 \rightarrow 2}) = \{y = 0\}$

# Guaranteed Literals



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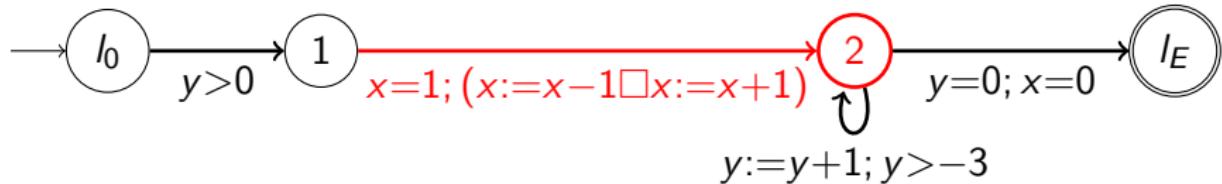
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- e.g.  $\text{gen}_{(i,2)}(\{y = 0, x = 0\}, e_{1 \rightarrow 2}) = \{y = 0\}$



## Idea

- drop literals **semantically** guaranteed by transition  $T_e$
- e.g.  $\text{gen}_{(i,2)}(\{y = 0, x = 0\}, e_{1 \rightarrow 2}) = \{y = 0\}$

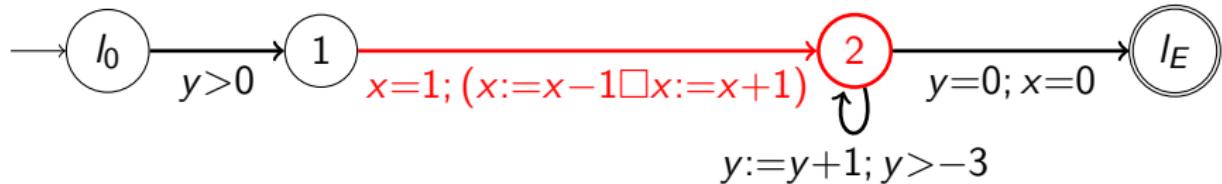
# Predecessor Computation I



## Observation

- consider cube  $c = \{y=0, x=0\}$  at location 2  
and block predecessor cubes with respect to edge  $e_{1 \rightarrow 2}$

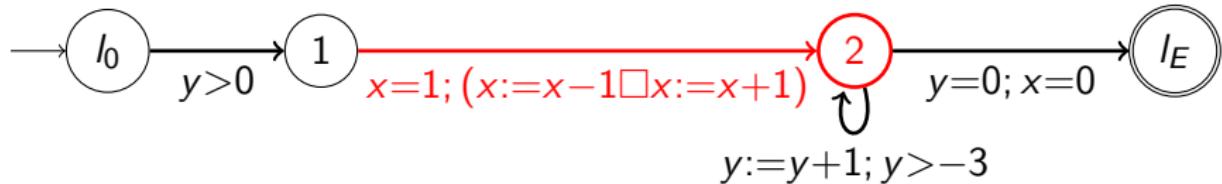
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- $wep(e_{1 \rightarrow 2}, c) = (x=1 \wedge ((y=0 \wedge x-1=0) \vee (y=0 \wedge x+1=0)))$

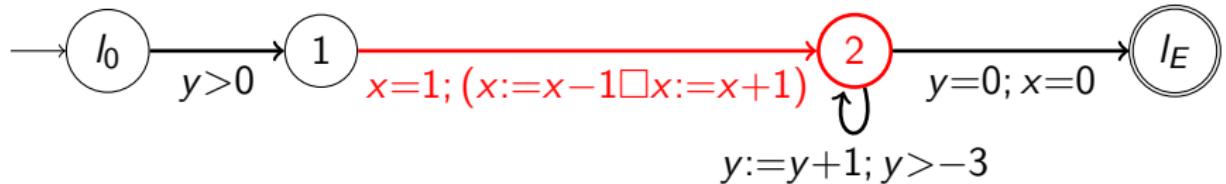
# Predecessor Computation I



## Observation

- consider cube  $c = \{y=0, x=0\}$  at location 2 and block predecessor cubes with respect to edge  $e_{1 \rightarrow 2}$
- $wep(e_{1 \rightarrow 2}, c) = (x=1 \wedge ((y=0 \wedge x-1=0) \vee (y=0 \wedge x+1=0)))$
- so far, compute DNF to get predecessor cubes  
 $dnf(wep(e_{1 \rightarrow 2}, c)) = \{\{x=1, y=0, x-1=0\}, \{x=1, y=0, x+1=0\}\}$

# Predecessor Computation I



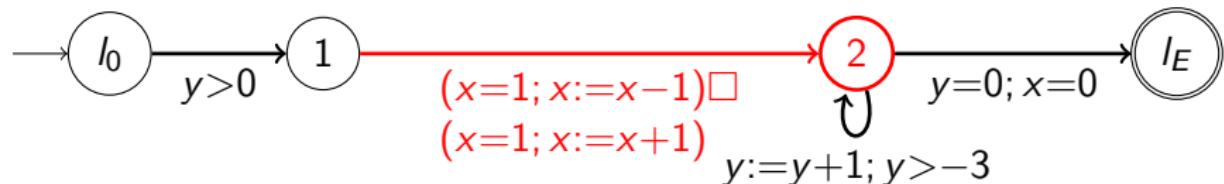
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## Idea

- avoid expensive DNF computation, derive DNF by command structure
- split command into sequential parts (constant for edge, cached)

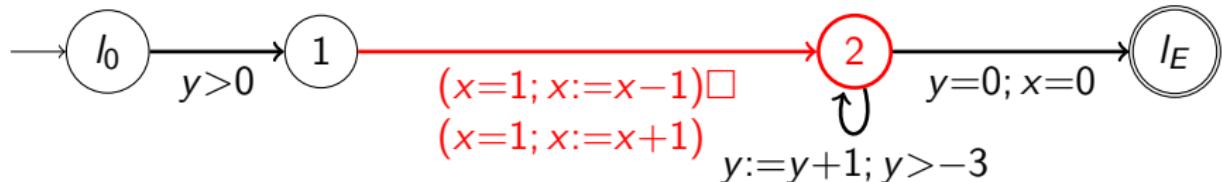
## Predecessor Computation II



### Idea

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# Predecessor Computation II



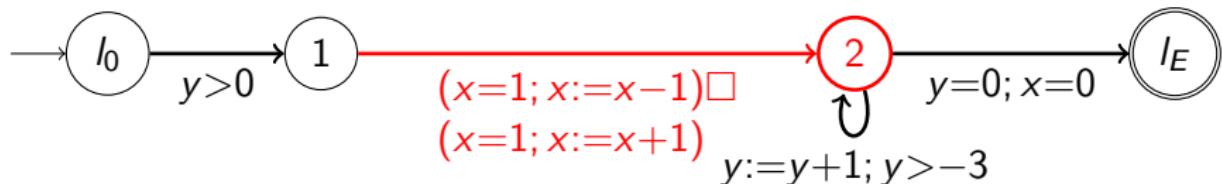
## Idea

- avoid expensive DNF computation, derive DNF by command structure
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- compute WEP for every sequential part

$$wep(e'_{1 \rightarrow 2}, c) = \{x=1, y=0, x-1=0\}$$

$$wep(e''_{1 \rightarrow 2}, c) = \{x=1, y=0, x+1=0\}$$

# Predecessor Computation II



## Idea

- avoid expensive DNF computation, derive DNF by command structure
- divide command into **sequential parts** (constant for edge, cached)
- compute WEP for every sequential part
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- each computed WEP yields exactly **one predecessor cube**
- DNF computation not necessary any more

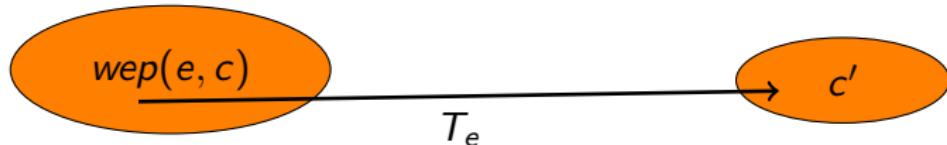
# Predecessor Cubes I



## Idea

- generalise cube  $c$  with respect to edge  $e$ ,  
derive generalisation  $gen_{(i, l')}(e, c)$  from predecessor cubes

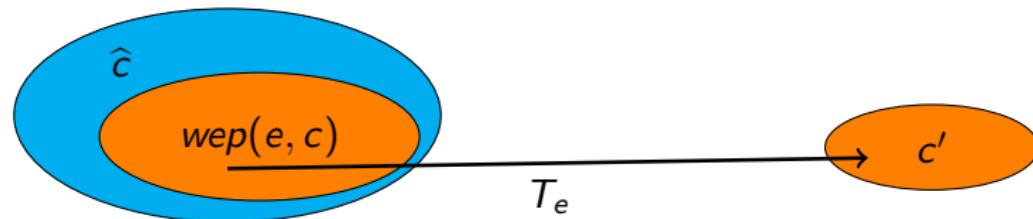
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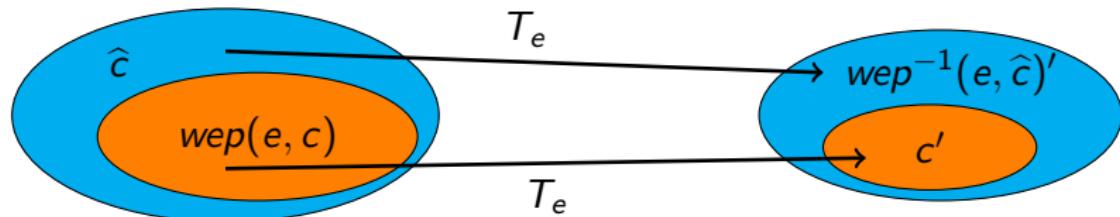
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i.e.  $\hat{c} \supseteq wep(e, c)$

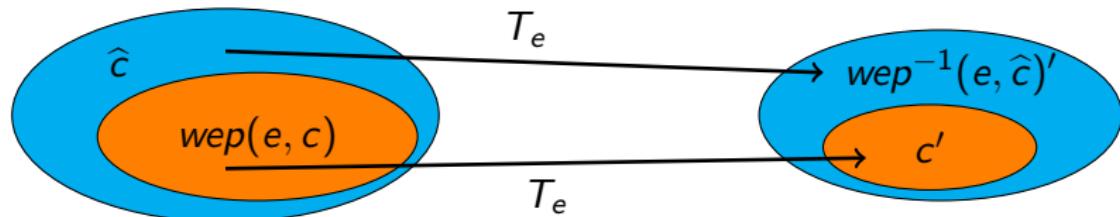
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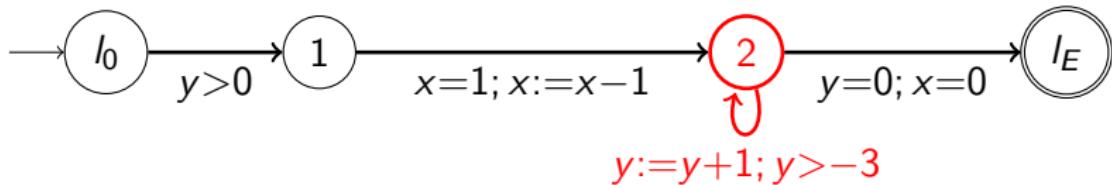
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i.e.  $gen_{(i,l')}(e, c) = wep^{-1}(e, \hat{c})$
- in fact, create mapping to compute  $wep^{-1}(e, \hat{c})$

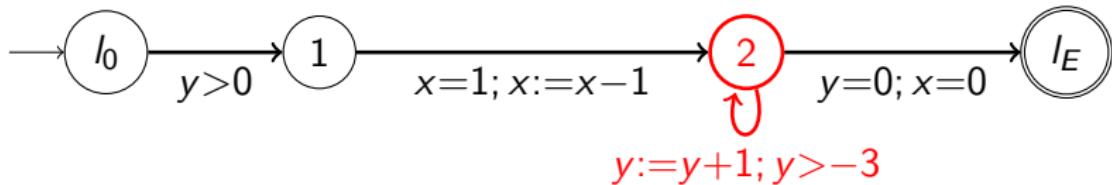
## Predecessor Cubes II



### Example

- generalise cube  $c = \{y=0, x=0\}$  with respect to edge  $e_{2 \rightarrow 2}$

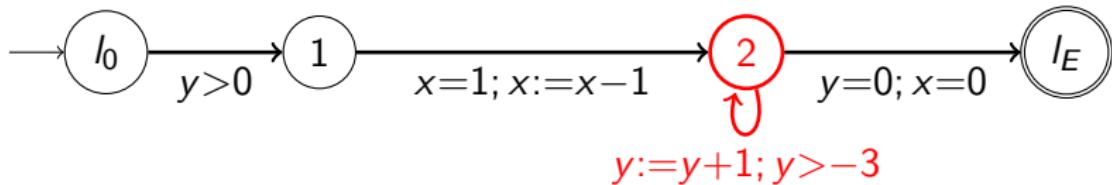
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## Example

- generalise cube  $c = \{y=0, x=0\}$  with respect to edge  $e_{2 \rightarrow 2}$
- compute **predecessor**  $wep(\{y=0, x=0\}, e_{2 \rightarrow 2}) = \{y=-1, x=0\}$

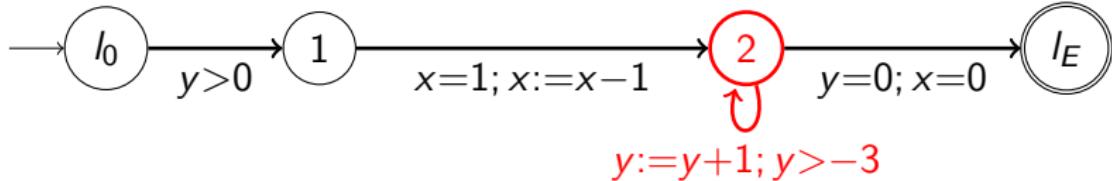
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# Predecessor Cubes II



## Example

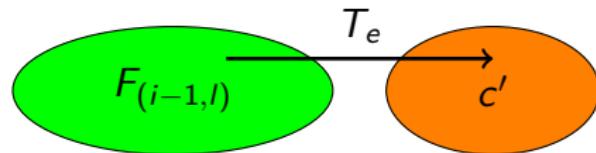
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- assume that there exists  $\{y=-1\} \subseteq \{y=-1, x=0\}$  in predecessor frame  $F_{(i-1,2)}$
- compute successor  $wep^{-1}(e_{2 \rightarrow 2}, \{y=-1\}) = \{y=0\}$  such that

$$gen_{(i,2)}(\{y=0, x=0\}, e_{2 \rightarrow 2}) = \{y=0\}$$

# Alternative Relative Inductiveness

## Relative Inductiveness

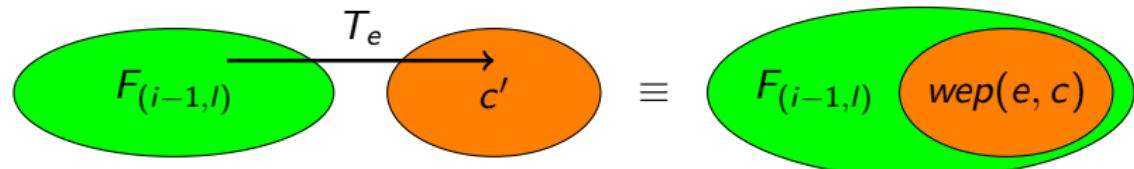
- so far, check  $SAT(F_{(i-1,l)} \wedge T_e \wedge c')$



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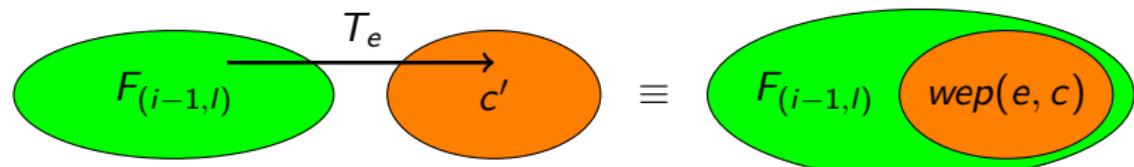
## Alternative Relative Inductiveness

- compute exact preimage of  $c$  with respect to edge  $e$ , i.e.  $wep(e, c)$
- check  $SAT(F_{(i-1,l)} \wedge wep(e, c)) \equiv SAT(F_{(i-1,l)} \wedge T_e \wedge c')$

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- check  $SAT(F_{(i-1,l)} \wedge wep(e, c)) \equiv SAT(F_{(i-1,l)} \wedge T_e \wedge c')$

## Experimental Results

- alternative relative inductiveness check performs significantly better
- $wep(e, c)$  already cached, smaller formula in SMT request, less variables, SMT solver with caching

# Interpolation I

## Idea

- so far, compute **syntactic** generalisation  $g \subseteq c$
- instead, compute **semantic** generalisation  $X$ , such that  $c \Rightarrow X$

# Interpolation I

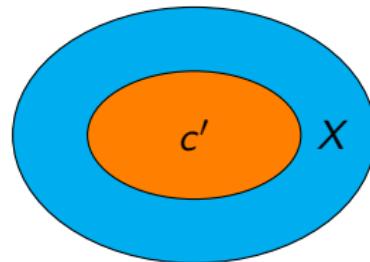
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Let  $(A \wedge B)$  be unsatisfiable. An interpolant  $X$  for  $A$  and  $B$  satisfies

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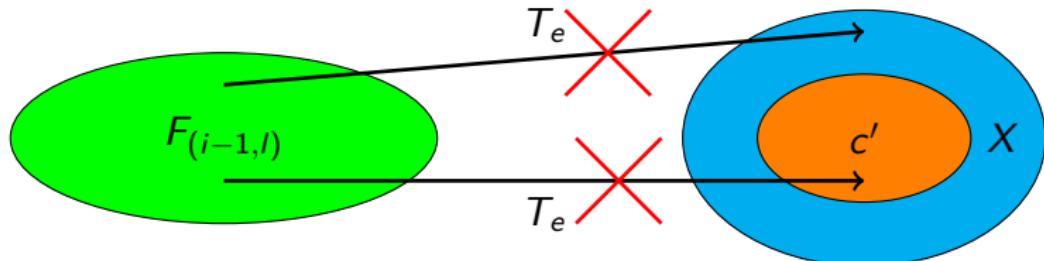
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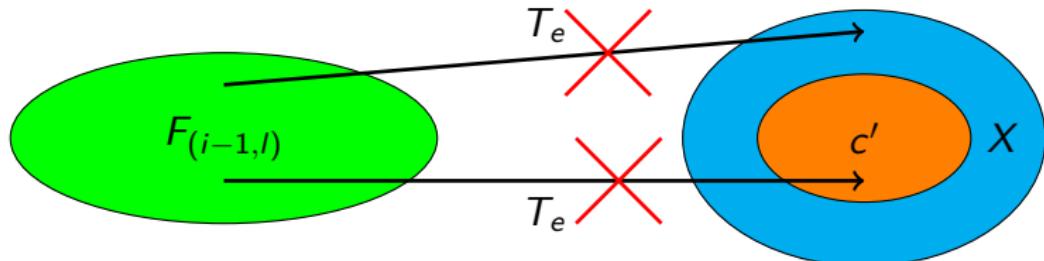
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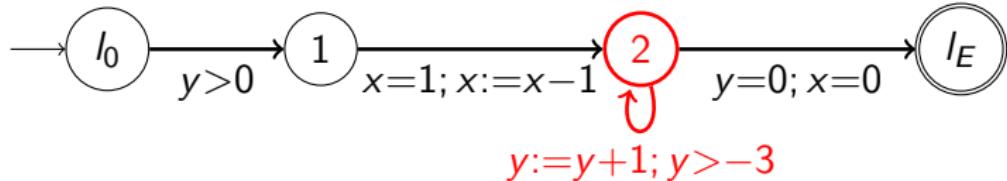
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- $\text{Var}(X) \subseteq \text{Var}(A) \cap \text{Var}(B)$



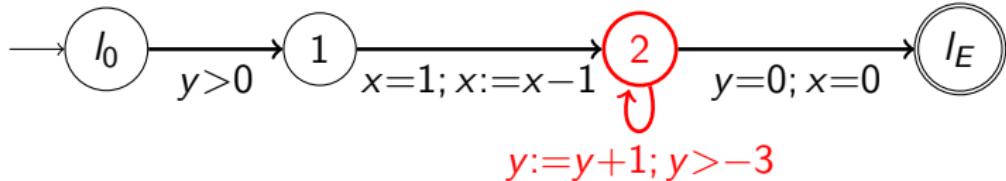
# Interpolation II



## Observation

- consider location 2 with self loop  $e_{2 \rightarrow 2}$
- IC3CFA derives proof obligations for  $(y = \hat{z} \wedge x = 0)$ , where  $\hat{z} \in \{-3, -2, -1, 0\}$

# Interpolation II



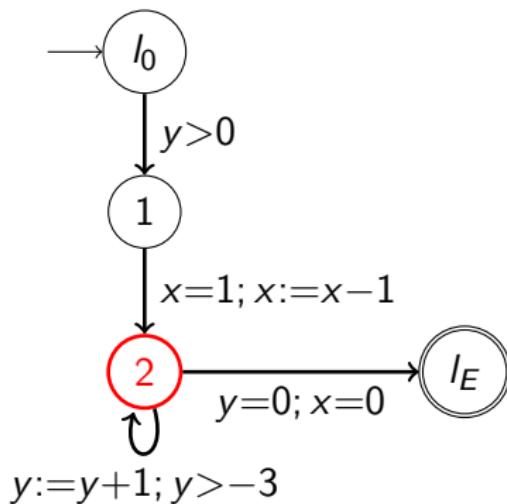
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## Interpolation

- apply IC3CFA with interpolation
- block CTI  $\{y = 0, x = 0\}$  at location 2
- computed interpolant  $X = \{y \leq 0\}$
- $X$  is semantic generalisation and blocks all possible values of  $y$

# Improved Initialisation

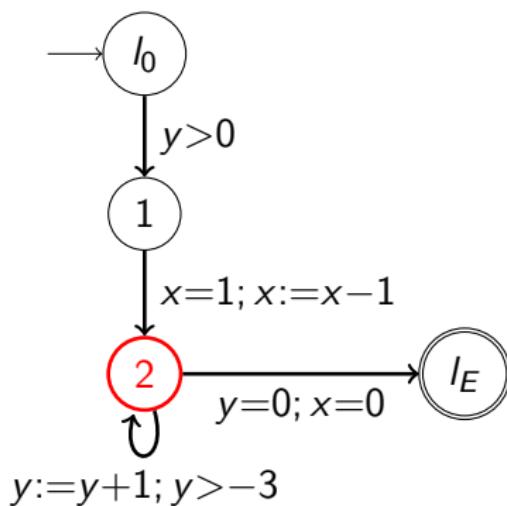


$i:$	$l:$	$I_0$	1	2
0	<i>true</i>	<i>false</i>	<i>false</i>	
1	...	...	...	...
2	...	...	...	...

## Idea

- location 2 only reachable with at least 2 steps
- *false* is **safe overapproximation** of reachable states  $R_{(1,2)}$

# Improved Initialisation



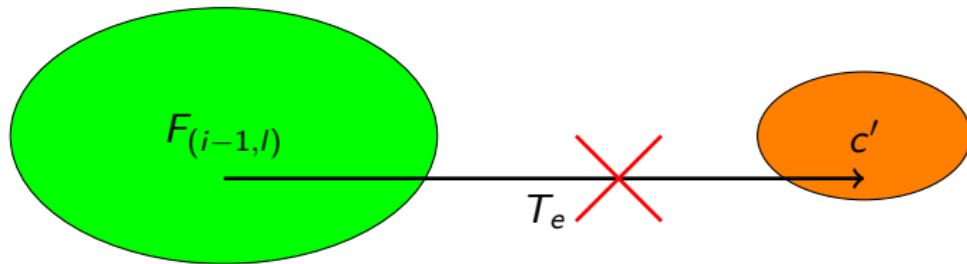
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2	...	...	...	

## Idea

- location 2 only reachable with at least 2 steps
- *false* is **safe overapproximation** of reachable states  $R_{(1,2)}$
- compute minimal distances by **graph analysis**
- initialise frame  $F_{(1,2)}$  with *false* to avoid computations

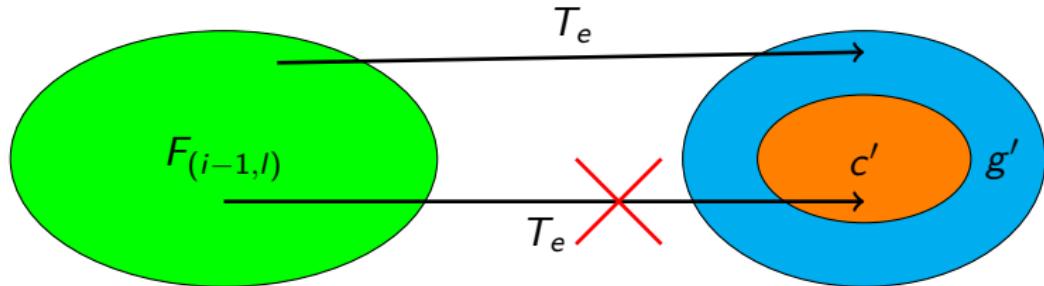
## Idea

- try to generalise cube  $c$



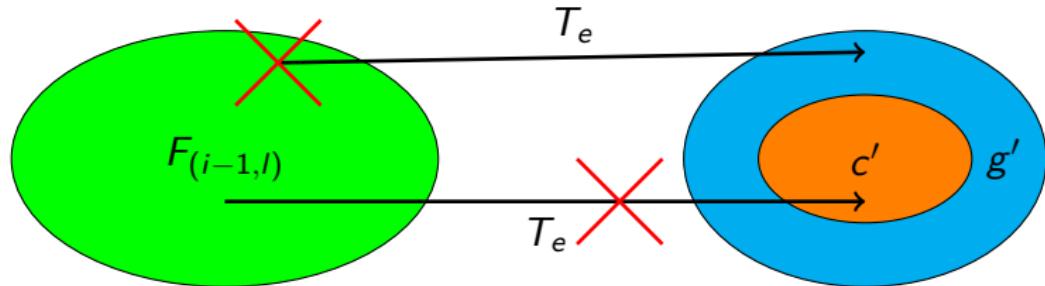
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- try to generalise cube  $c$
- possible generalisation  $g \subset c$  is not relative inductive



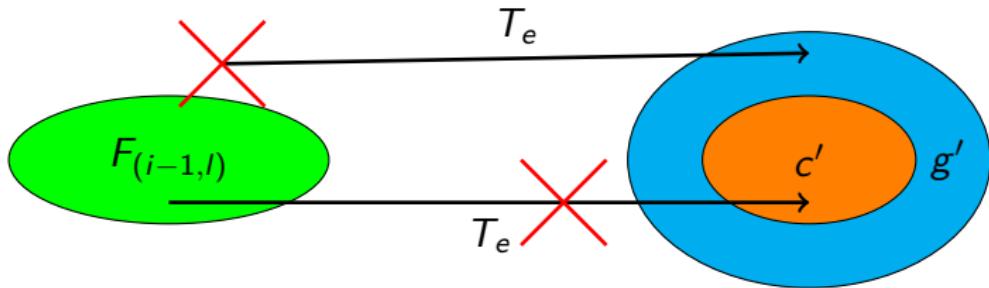
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- add proof obligations with **counterexamples to generalisation** (CTGs)



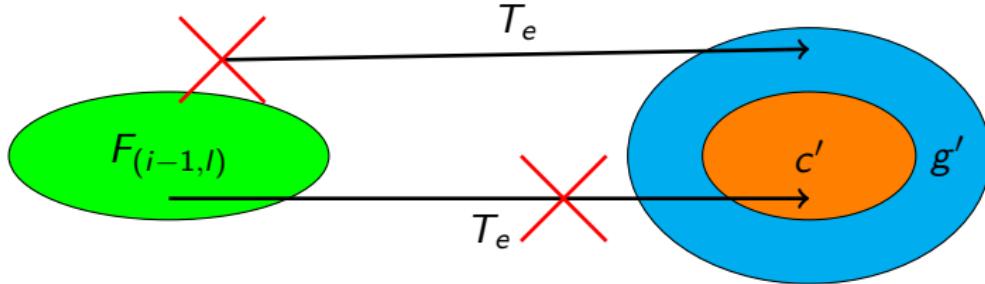
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- block all CTGs, such that we can generalise  $c$  to  $g$



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- try to generalise cube  $c$
- possible generalisation  $g \subset c$  is not relative inductive
- add proof obligations with **counterexamples to generalisation** (CTGs)
- block all CTGs, such that we can generalise  $c$  to  $g$
- however, additional computations are too expensive



# Outline

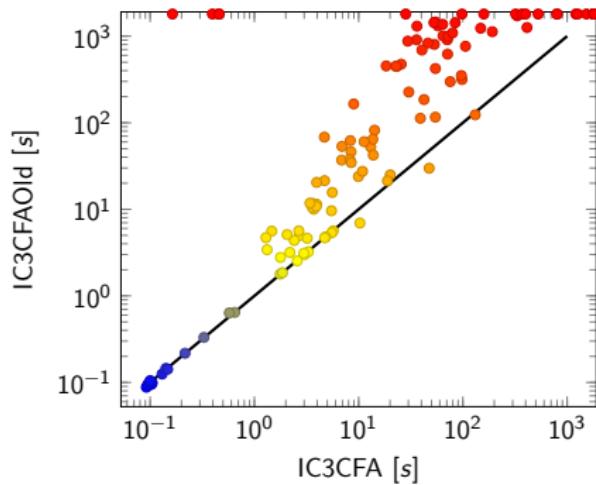
1 Preliminaries

2 IC3CFA

3 Experimental Results

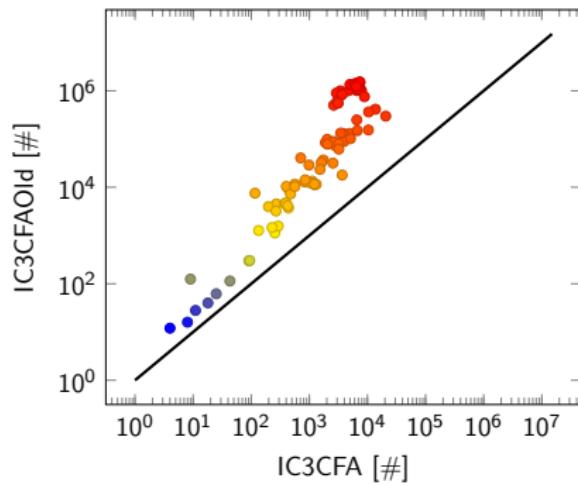
4 Conclusion

# Evaluation I



Algorithm	# solved	t solved	score	memory
IC3CFA	117 / 150	10,700 s	194	14,230 MB
IC3CFAOld	101 / 150	29,200 s	165	30,820 MB

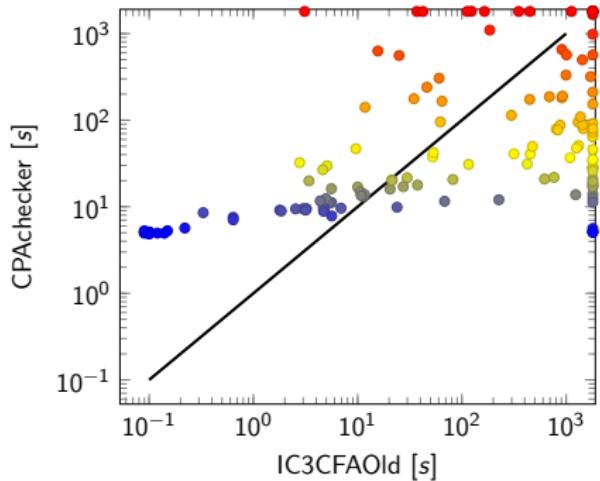
## Evaluation II



### Reduction of SMT calls

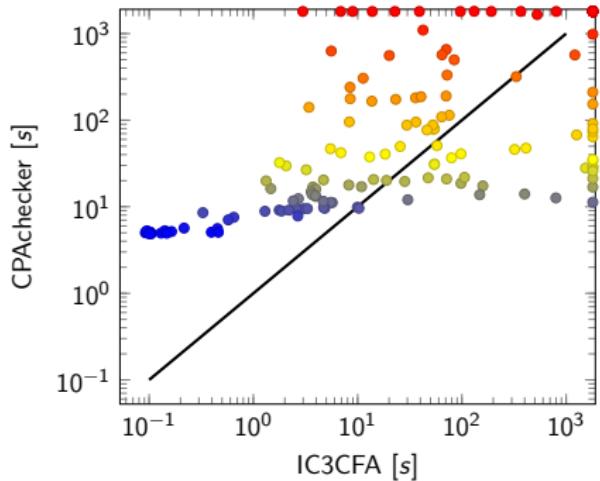
- best case: 895,207 → 2,924 (factor 306)
- overall: 24,700k → 249k (average factor 67)

# Evaluation III



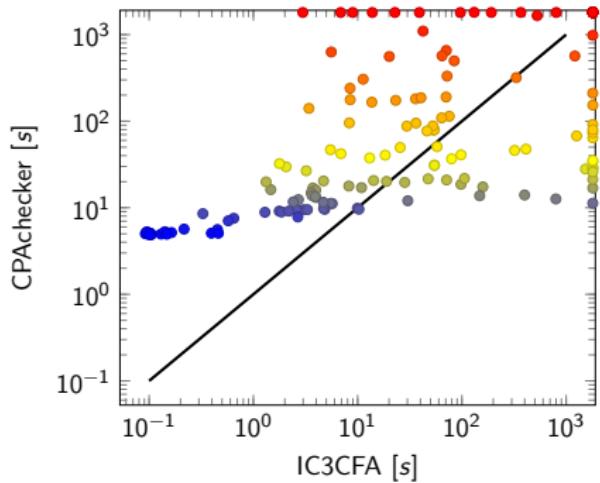
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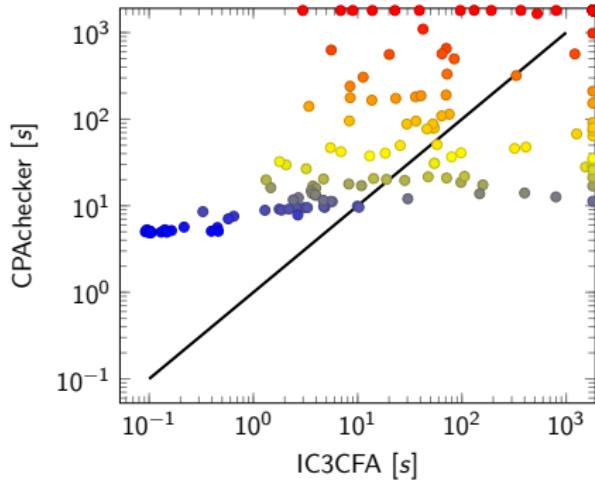
# Evaluation III



## Observation

- IC3CFA solves 11 programs exclusively (CPAchecker: 14)
- IC3CFA solves 83 programs faster (CPAchecker: 23)
- IC3CFA and CPAchecker are **orthogonal approaches**

# Evaluation III



## Future work

- IC3CFA and CPAchecker are orthogonal approaches
- only 18 programs are not solvable at all
- combine both approaches, i.e. integrate IC3CFA into CPA framework

# Outline

1 Preliminaries

2 IC3CFA

3 Experimental Results

4 Conclusion

## Contributions

- new generalisation context
- (concept of) minimal generalisation
- (heuristic for) multiple predecessors
- ordering (of multiple cubes)
- guaranteed literals
- predecessor computation (without DNF)
- (generalisation based on) predecessor cubes
- alternative relative inductiveness
- interpolation
- improved initialisation
- CTGs

# Summary II

## Contributions

- ...

## Implementation

- new IC3CFA generalisation algorithm
- prototypical implementation into existing framework
- about 800 lines of OCaml code

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## Implementation

- new IC3CFA generalisation algorithm
- prototypical implementation into existing framework
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## Evaluation

- new IC3CFA generalisation outperforms old one
- significant reduction of SMT calls
- competitive to other state-of-the-art model checkers
- IC3CFA and CPAchecker are orthogonal approaches

# Appendix

## Frames

- frame  $F_i$  overapproximates  $i$ -step reachable program states  $R_i$

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# IC3 I

## Frames

- frame  $F_i$  overapproximates  $i$ -step reachable program states  $R_i$
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## IC3 Invariants

- $I \Rightarrow F_0,$  (initial states  $I$ )

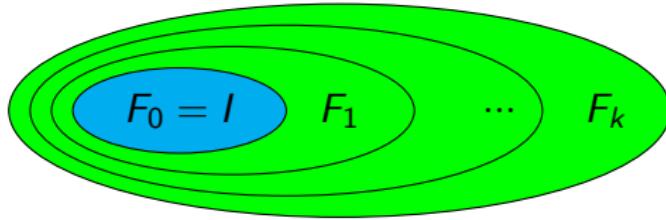
$$F_0 = I$$

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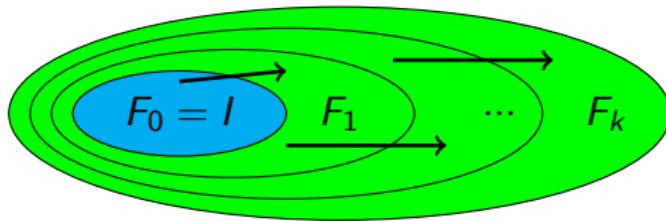


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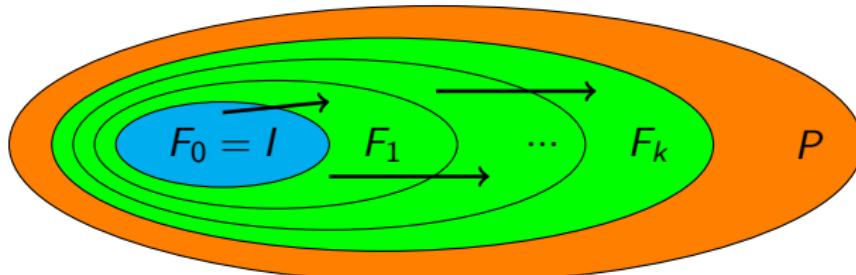


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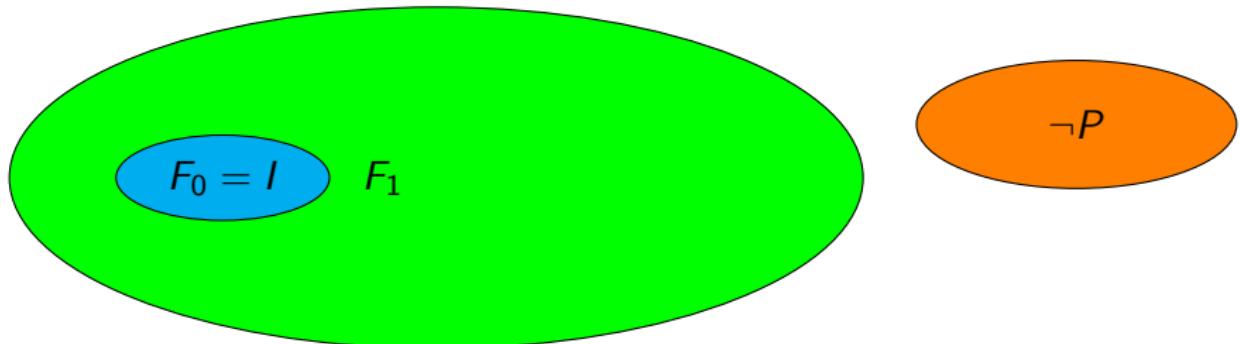
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- $\forall 0 \leq i \leq k. F_i \Rightarrow P$ . (desired property  $P$ )





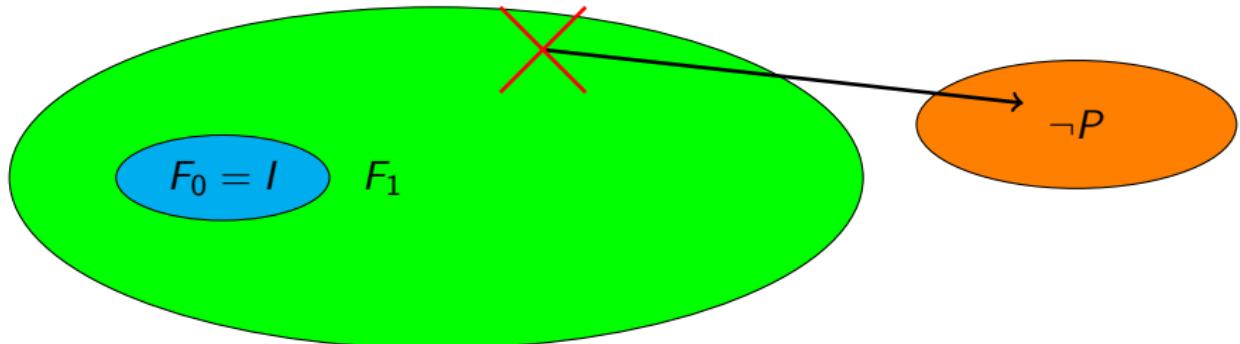
## IC3 Algorithm

- initialise  $F_0$  with  $I$ , check 0-/1-step counterexamples



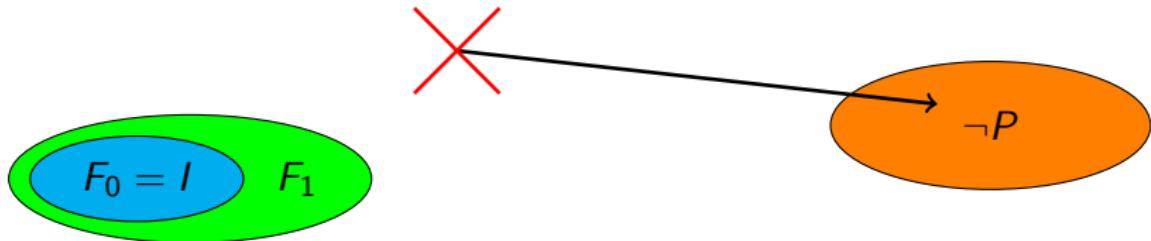
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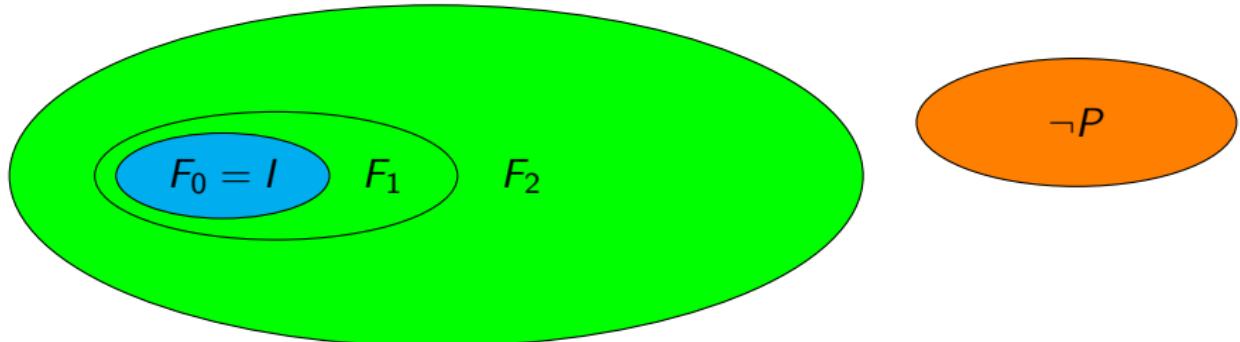
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- add proof obligations with counterexamples to induction (CTIs)



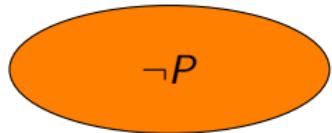
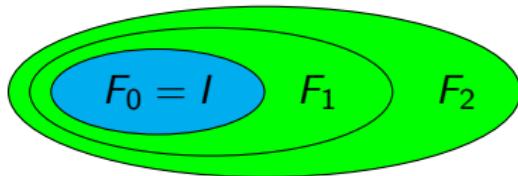
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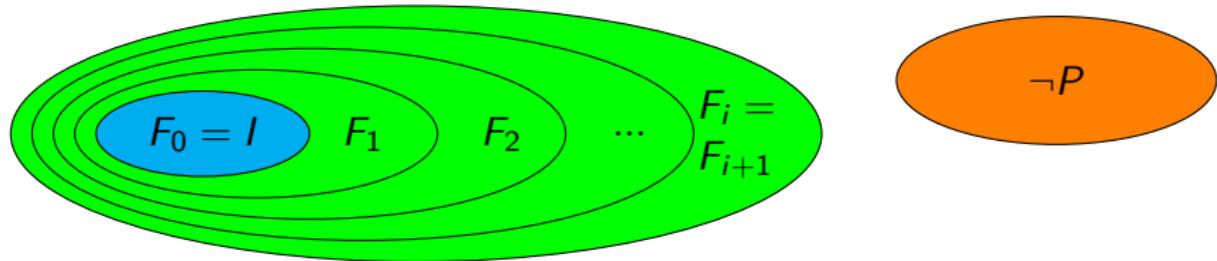
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- continue with frame  $F_2$
- fixpoint reached if  $F_{i+1} = F_i$

## IC3CFA

- based on original IC3 algorithm
- lifted to software model checking (SMT instead of SAT solving)
- adapted to incorporate CFA information, i.e.  $F_{(i,l)}$

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## IC3CFA Invariants

- $F_{(0,l_0)} = \text{true}$ ,  
 $\forall l \neq l_0. F_{(0,l)} = \text{false}$ , (initial location  $l_0$ )
- $\forall l \in L, 0 \leq i < k. F_{(i,l)} \Rightarrow F_{(i+1,l)}$ , (CFA locations  $L$ )
- $\forall l' \in L \setminus \{l_E\}, e_{l \rightarrow l'} \in G, 0 \leq i < k.$   
 $F_{(i,l)} \wedge T_{e_{l \rightarrow l'}} \Rightarrow F'_{(i+1,l')}$ , (CFA edges  $G$ )
- $\forall 0 \leq i \leq k. \neg \exists F_{(i,l_E)}$ . (error location  $l_E$ )