

# Control-Flow Refinement via Partial Evaluation

**Jesús J. Doménech<sup>1</sup>**

Samir Genaim<sup>1</sup> and John P. Gallagher<sup>2</sup>

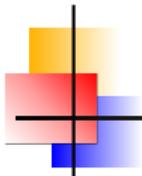
<sup>1</sup>Complutense University of Madrid (Spain)

<sup>2</sup>Roskilde University (Denmark)

<sup>2</sup>IMDEA Software Institute (Spain)

**International Workshop on Termination**

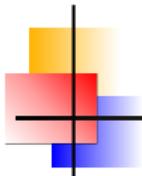
Oxford. July, 2018



# CONTROL-FLOW REFINEMENT VIA PARTIAL EVALUATION

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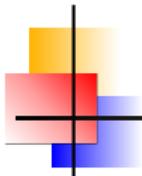
1. Control-flow Refinement
2. Partial Evaluation
3. Examples
4. Experiments
5. Conclusions and future work



## CONTROL-FLOW REFINEMENT

---

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0 // int x, y, z;  
1 while(x > 0)  
2     if (y < z)  
3         y++;  
4     else  
5         x--;
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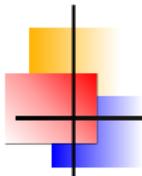


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- ▶ Two hidden stages.

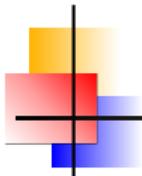


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- ▶ No Linear Ranking Function.

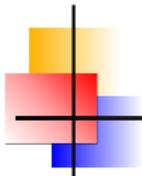


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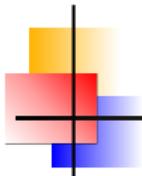


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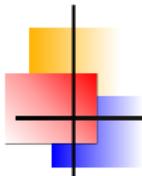


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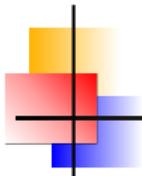


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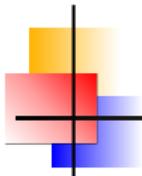


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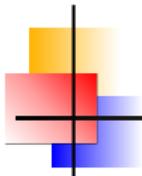


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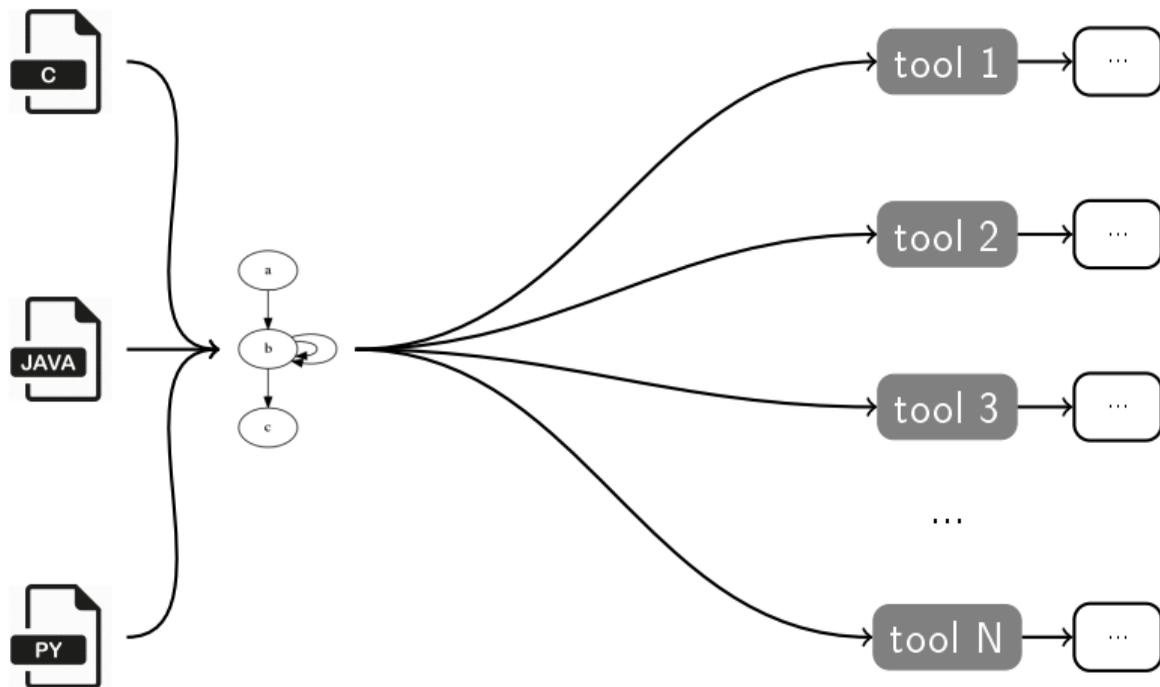
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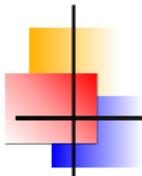
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- ▶ S. Gulwani et al. Control-flow refinement and progress invariants for bound analysis.
- ▶ A. Flores-Montoya. Cost Analysis of Programs Based on the Refinement of Cost Relations. Ph.D. thesis

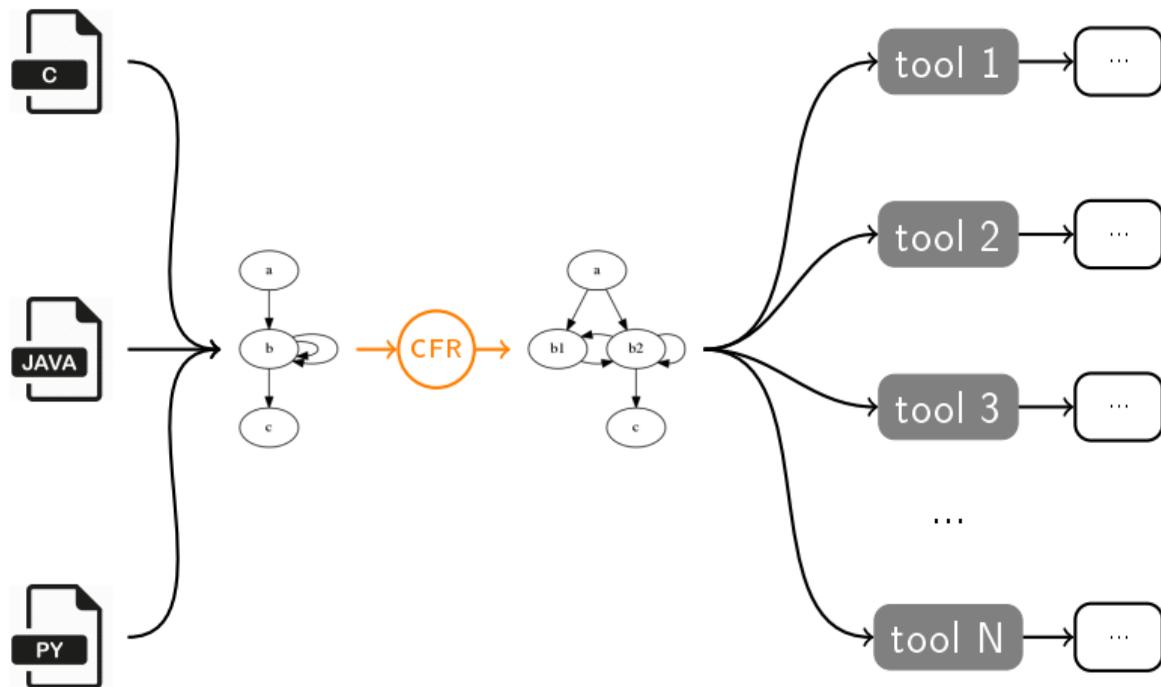


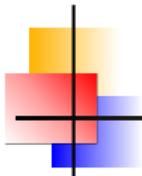
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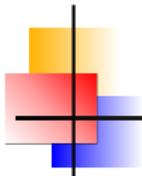




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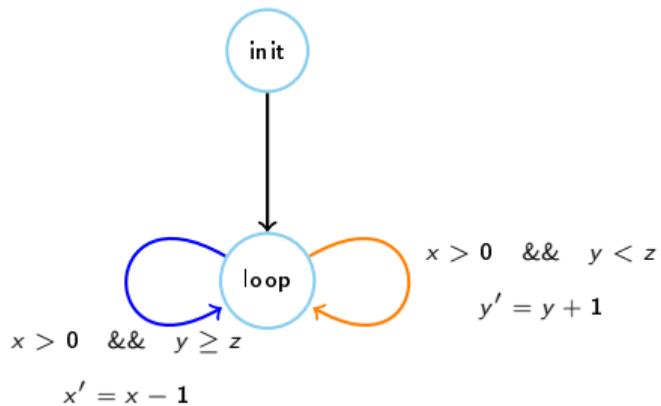
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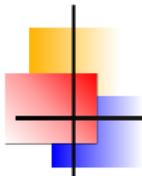
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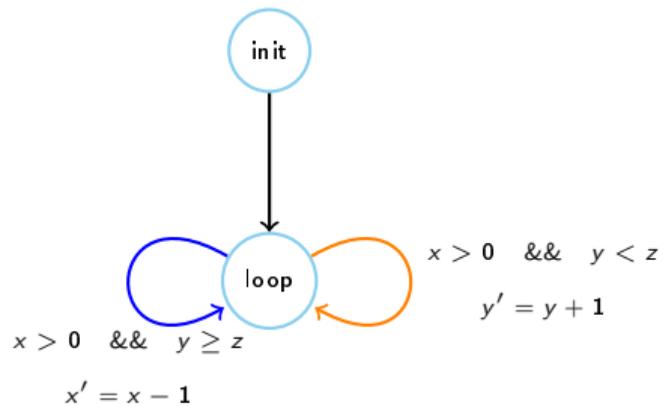
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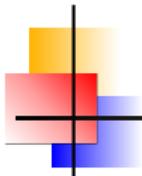




# CONTROL-FLOW REFINEMENT

$y = 1, z = 3$

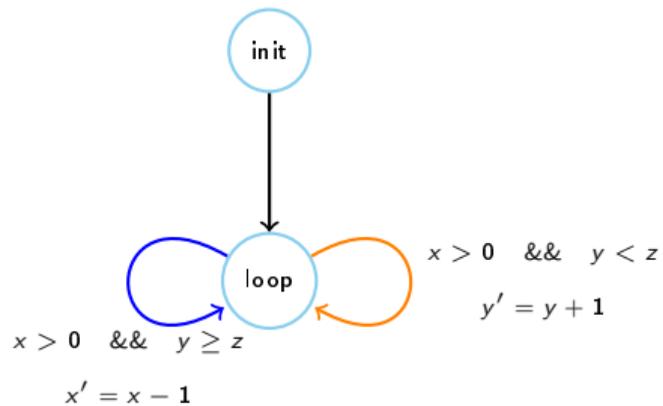


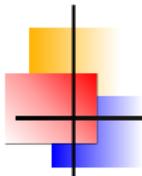


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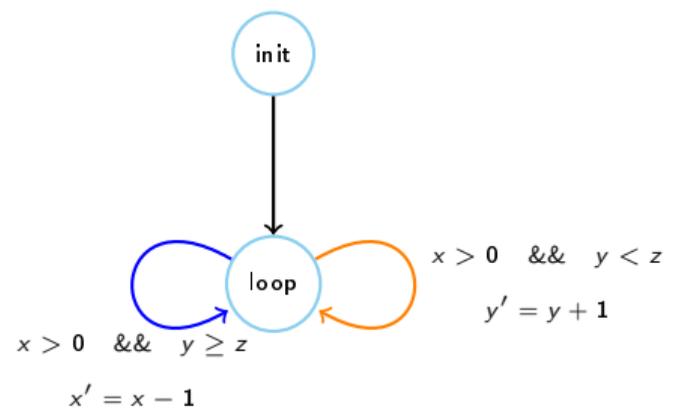
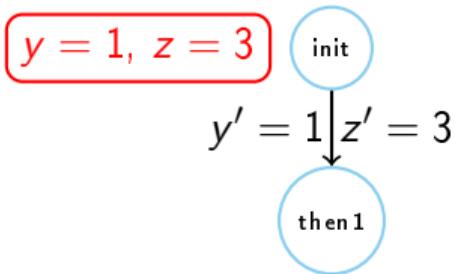
$y = 1, z = 3$

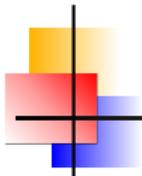
init



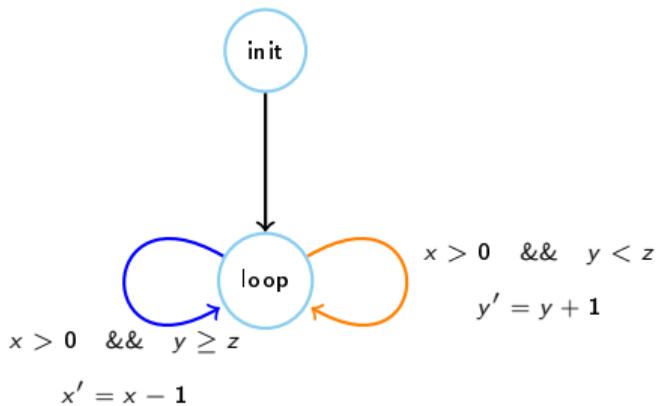
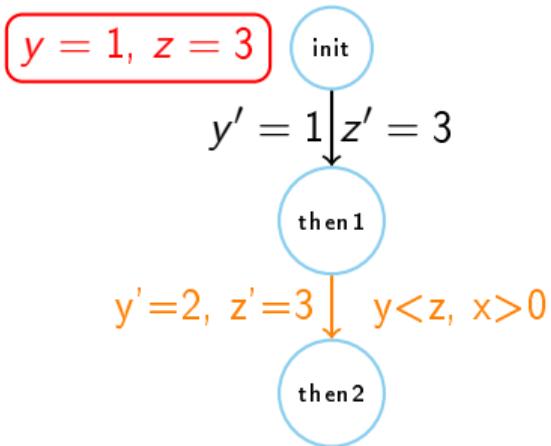


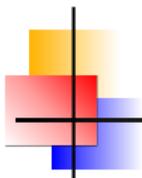
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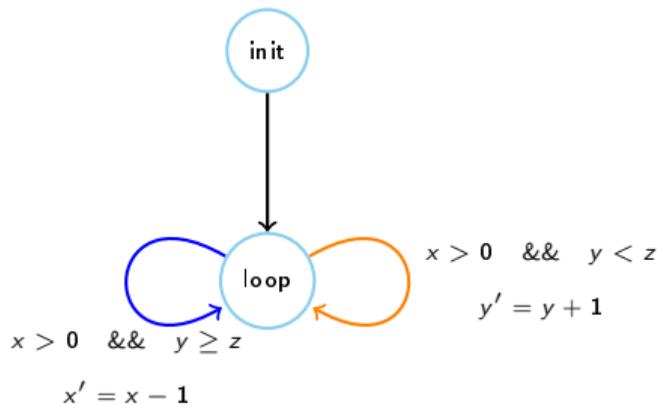
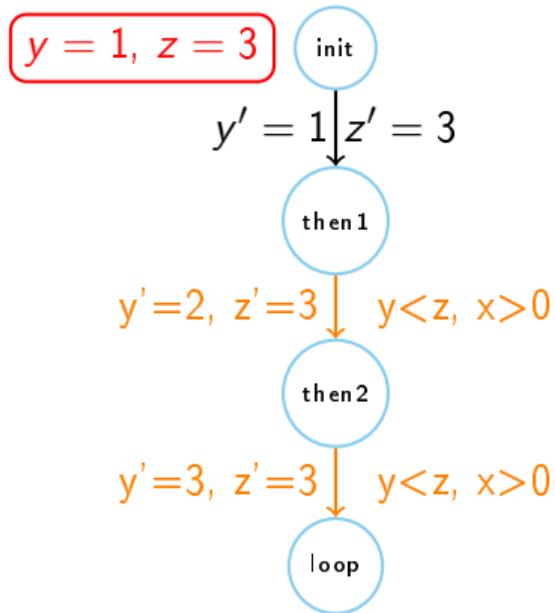


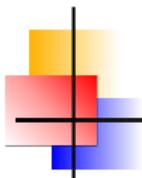
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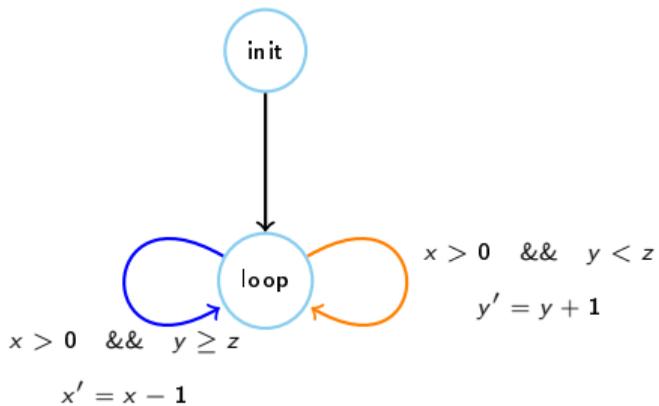
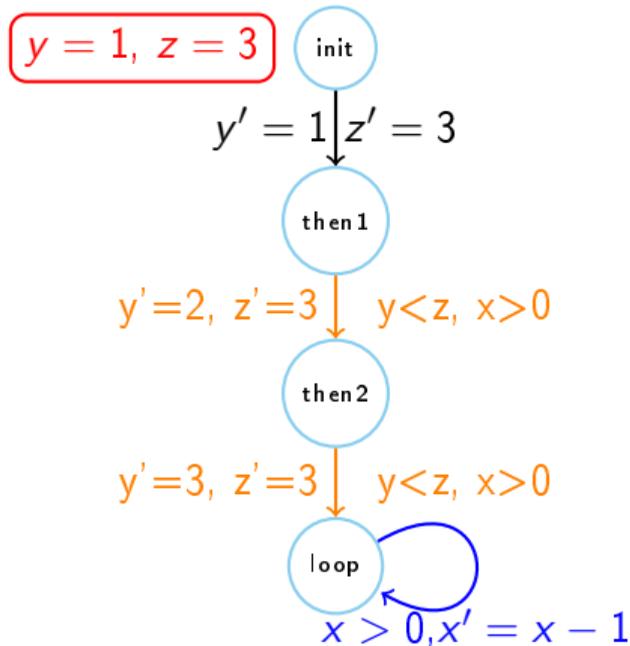


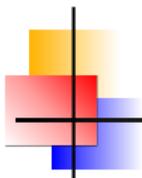
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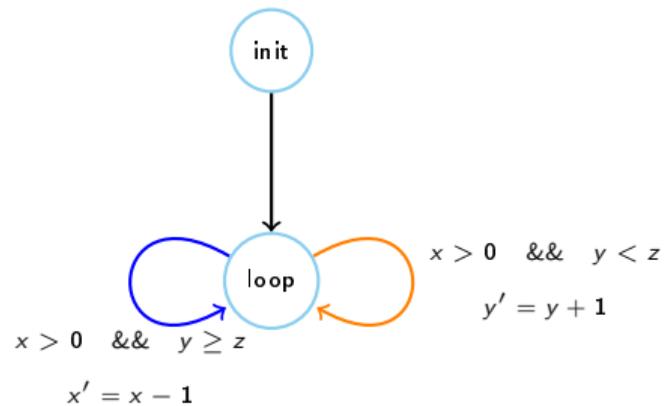
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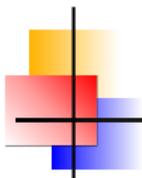




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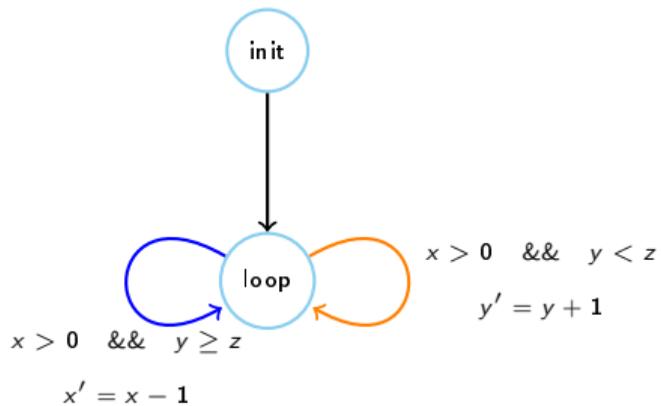
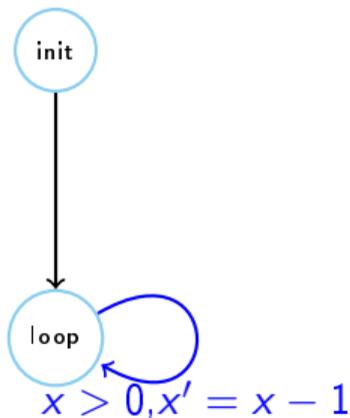
$y = 3, z = 1$

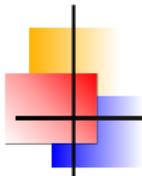




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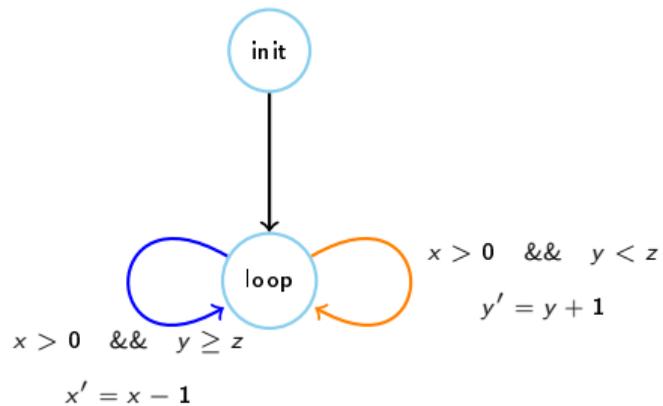
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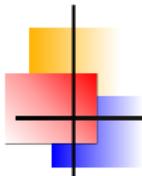




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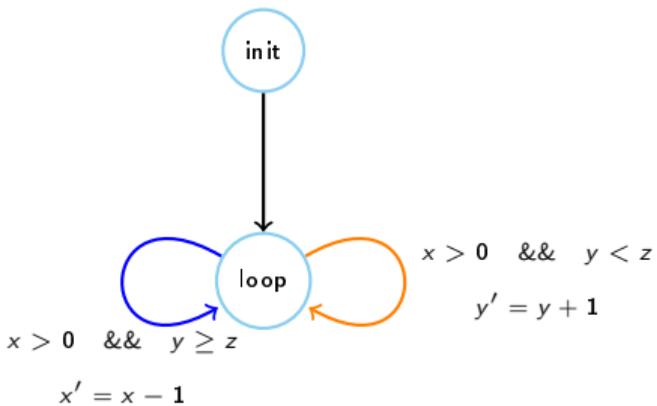
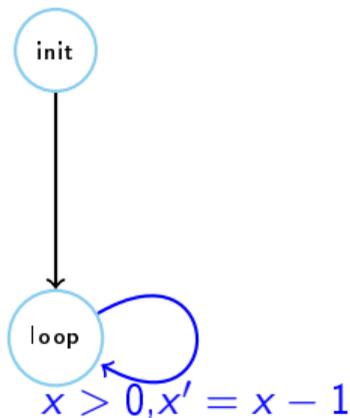
$y \geq z$

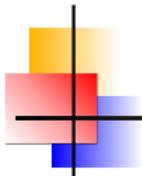




# CONTROL-FLOW REFINEMENT

$y \geq z$





## PARTIAL EVALUATION

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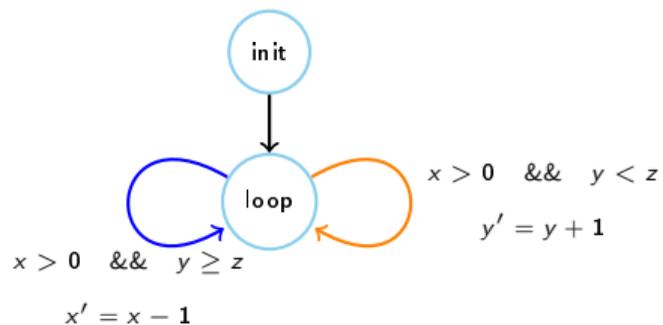
Partial Evaluation (PE) is a program transformation that specializes a program by restricting its meaning in some way.

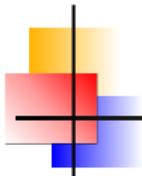
The PE algorithm used is an instantiation of the described in 1993 by John P. Gallagher. Which has two basic operations:

- ▶ **unFold**: extracts one iteration from a loop.
- ▶ **abstract**: performs a property-based abstraction with a set of properties. So that, each clause is generalized with the subset of properties implied from the clause.

## PARTIAL EVALUATION: EXAMPLE

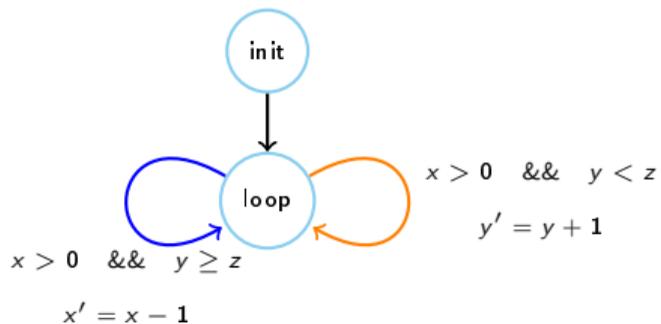
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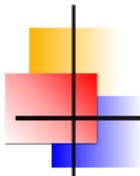


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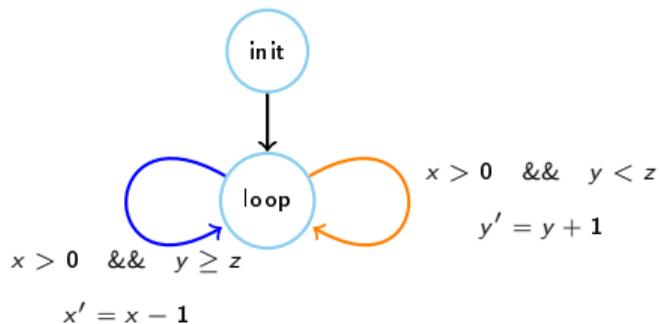


- Properties: any combination of loop conditions, other conditions, body updates...



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loop:

$\phi_1 = Y \geq Z \ \&\& \ X > 0$

$\phi_2 = Y \geq Z$

$\phi_3 = X > 0$

$\phi_4 = Y \geq Z \ \&\& \ X > -1$

$\phi_5 = X > -1$

$\phi_6 = Y < Z \ \&\& \ X > 0$

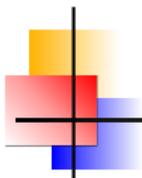
$\phi_7 = Y < Z$

$\phi_8 = Y + 1 < Z \ \&\& \ X > 0$

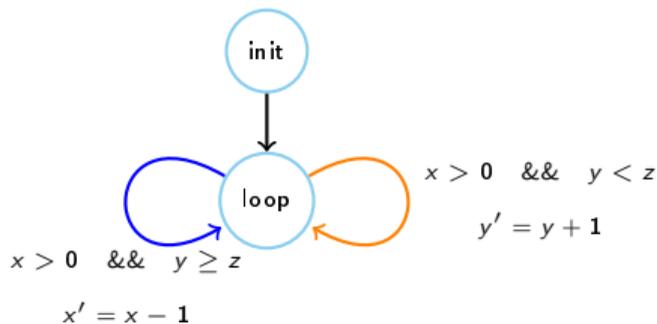
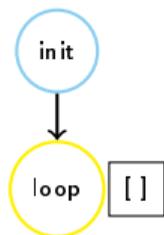
$\phi_9 = Y + 1 < Z$

invariant of loop

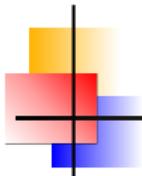
invariant of body



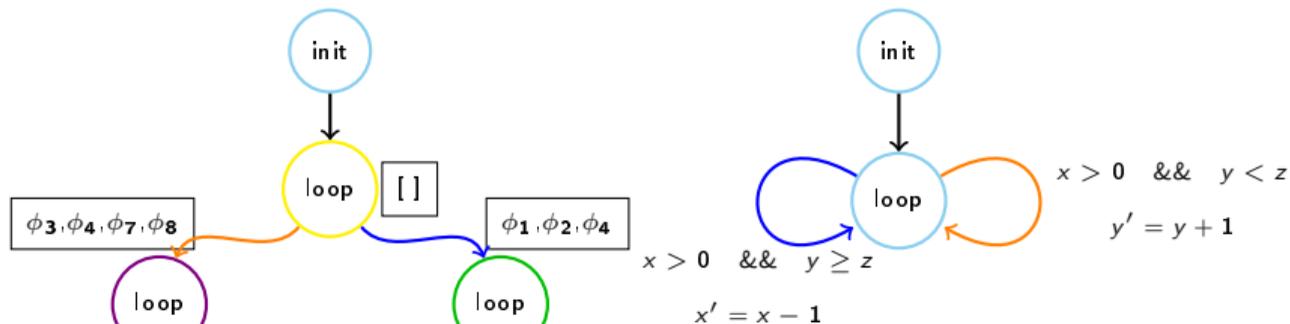
## PARTIAL EVALUATION: EXAMPLE



- ✦ Properties: any combination of loop conditions, other conditions, body updates...
- ✦ **unFold** all transitions of each leaf node.
- ✦ **abstract** nodes with same set of properties (colours) holding.
- ✦  $2^{\#properties}$  possible versions (colours) of each node.



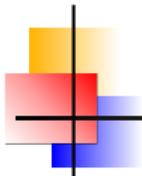
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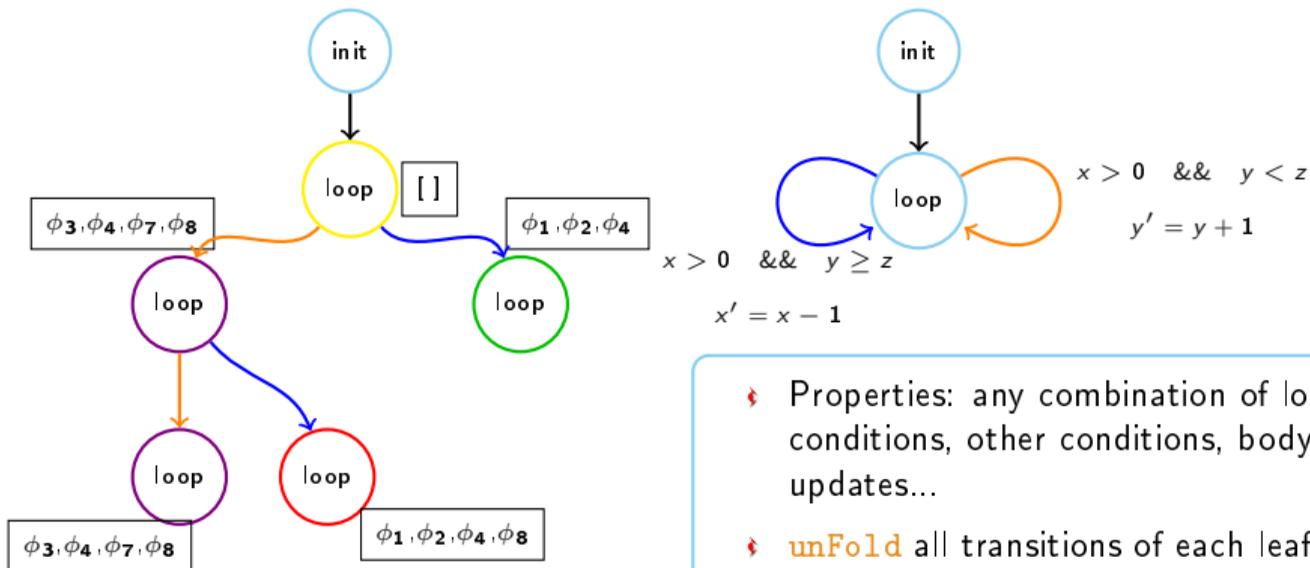
```

loop:
  phi_1 = Y >= Z && X > 0
  phi_2 = Y >= Z
  phi_3 = X > 0
  phi_4 = Y >= Z && X > -1
  phi_5 = X > -1
  phi_6 = Y < Z && X > 0
  phi_7 = Y < Z
  phi_8 = Y + 1 < Z && X > 0
  phi_9 = Y + 1 < Z
  
```

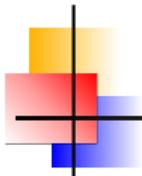
...n of loop  
 ...s, body  
 ...ch leaf node.  
 ... set of  
 ...  
 ... (colours) of



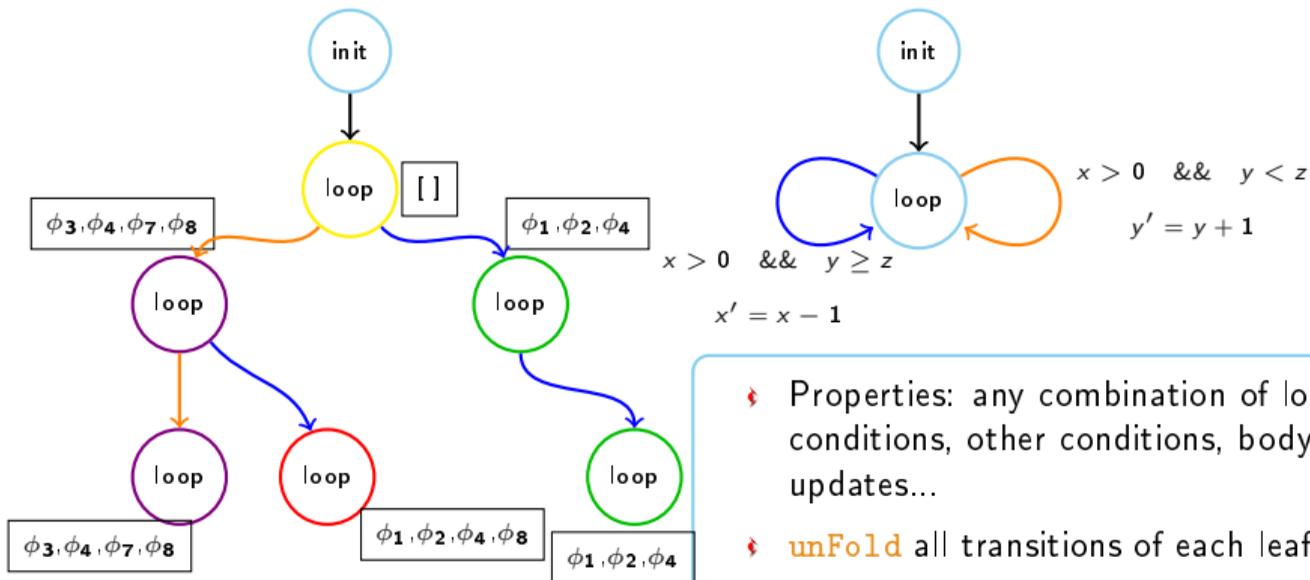
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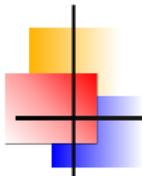
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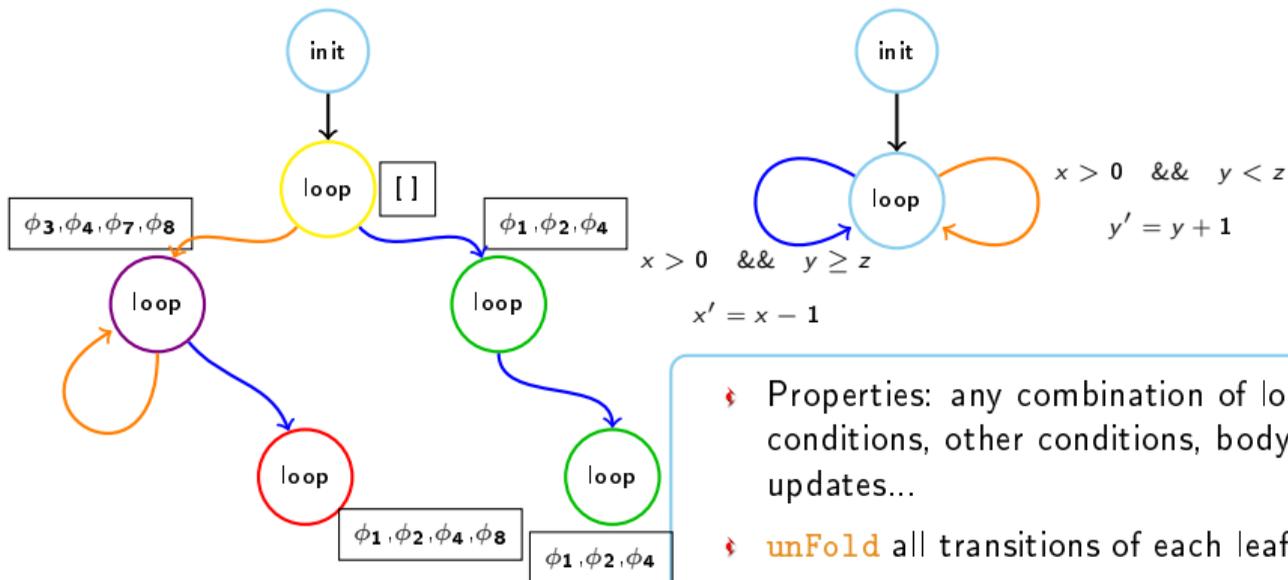
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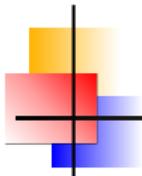
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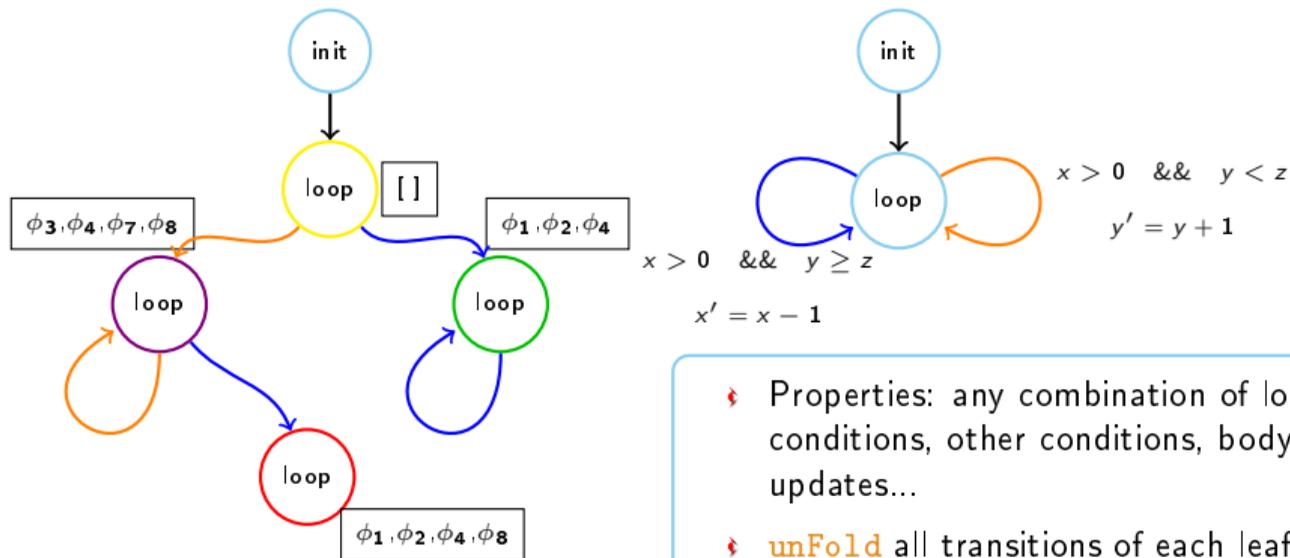
## PARTIAL EVALUATION: EXAMPLE



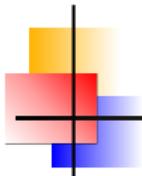
- ✦ Properties: any combination of loop conditions, other conditions, body updates...
- ✦ **unFold** all transitions of each leaf node.
- ✦ **abstract** nodes with same set of properties (colours) holding.
- ✦  $2^{\#properties}$  possible versions (colours) of each node.



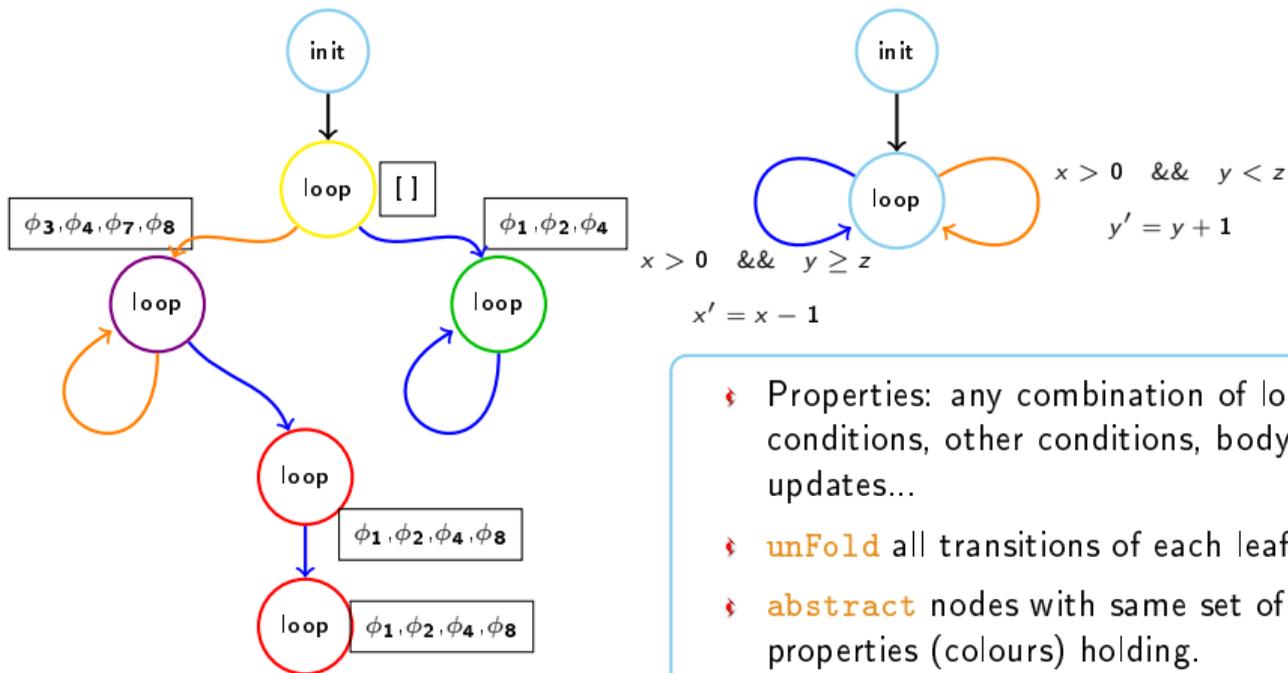
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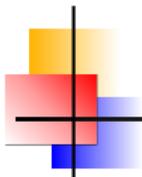
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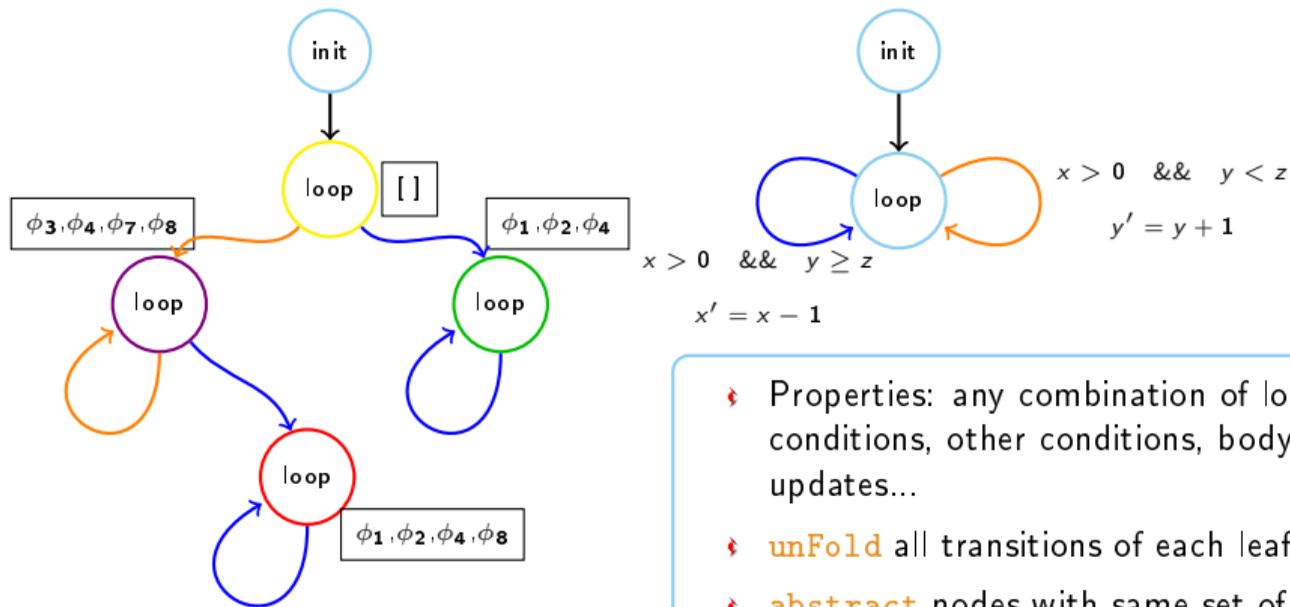
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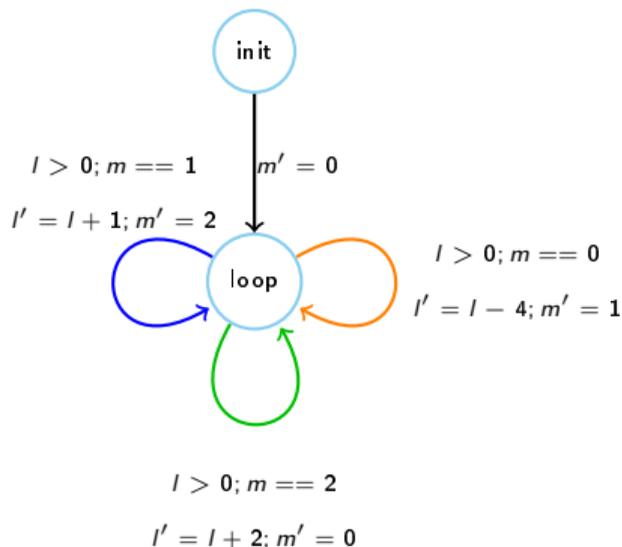
## PARTIAL EVALUATION: EXAMPLE

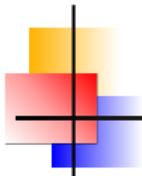


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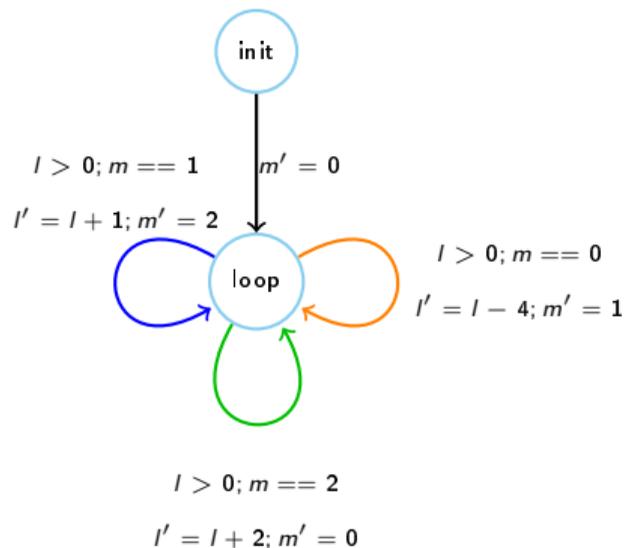
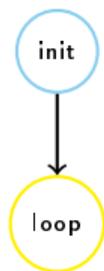
## EXAMPLE: ALTERNATINGGROWREDUCE

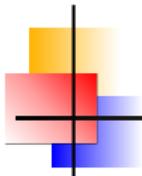
```
AlternatingGrowReduce
0 // uint m, l;
1 m=0;
2 while (l > 0){
3   if (m == 0){
4     l = l - 4;
5     m = 1;
6   } else if (m == 1){
7     l = l + 1;
8     m = 2;
9   } else if (m == 2){
10    l = l + 2;
11    m = 0;
12  }
13}
```



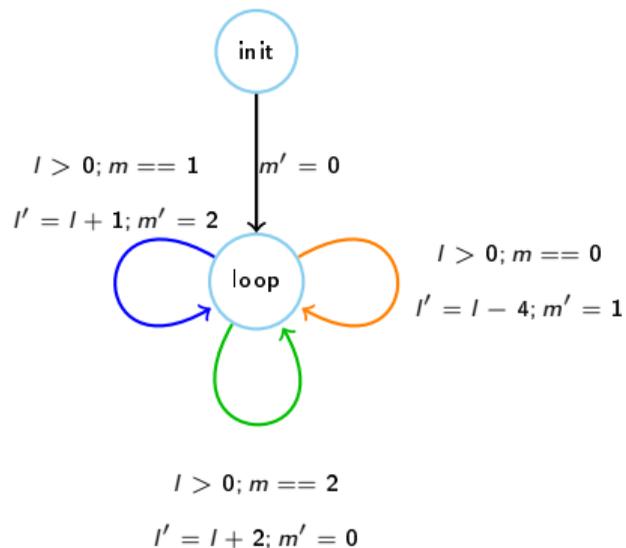


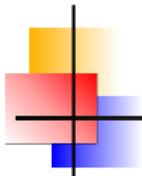
## EXAMPLE: ALTERNATINGGROWREDUCE



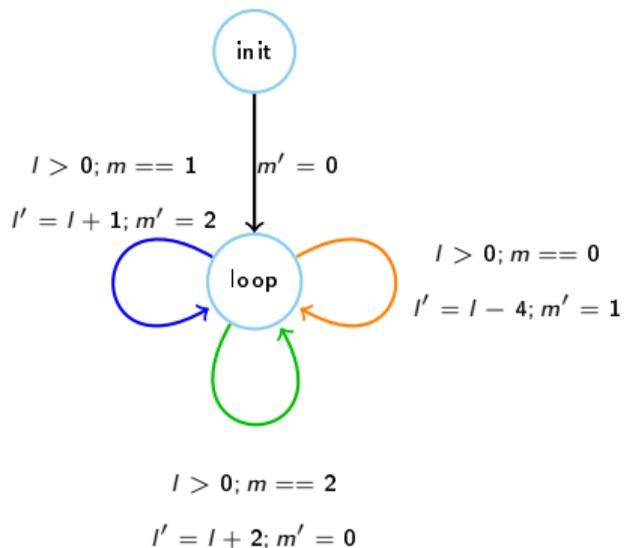
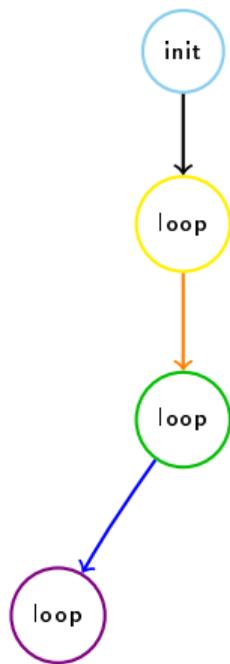


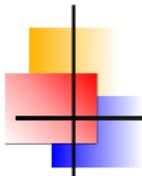
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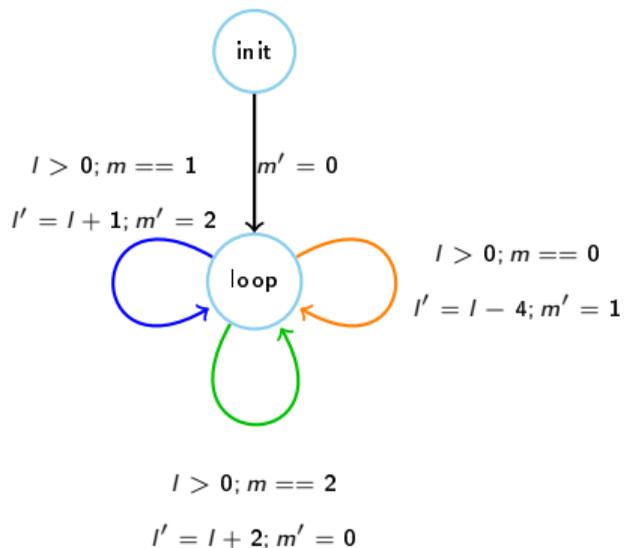
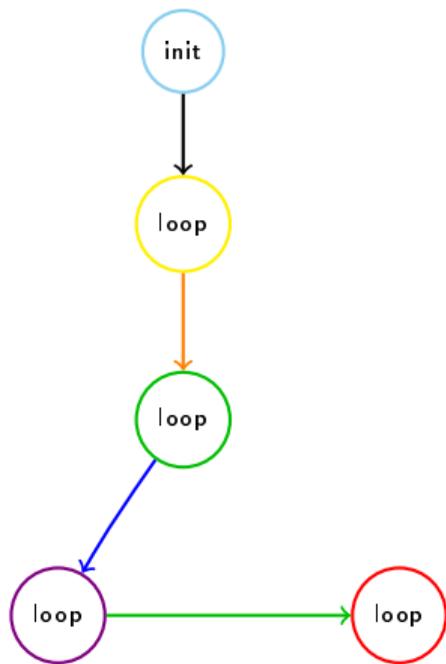


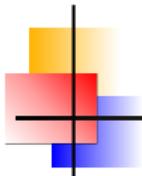
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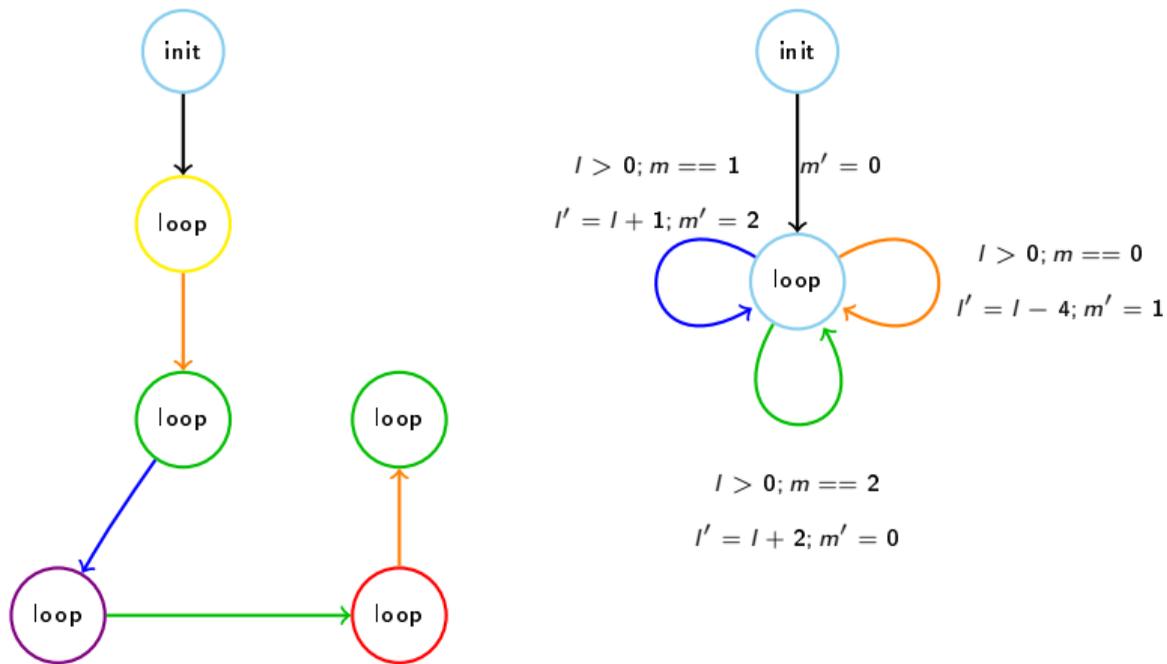


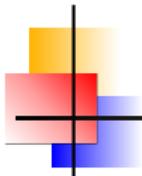
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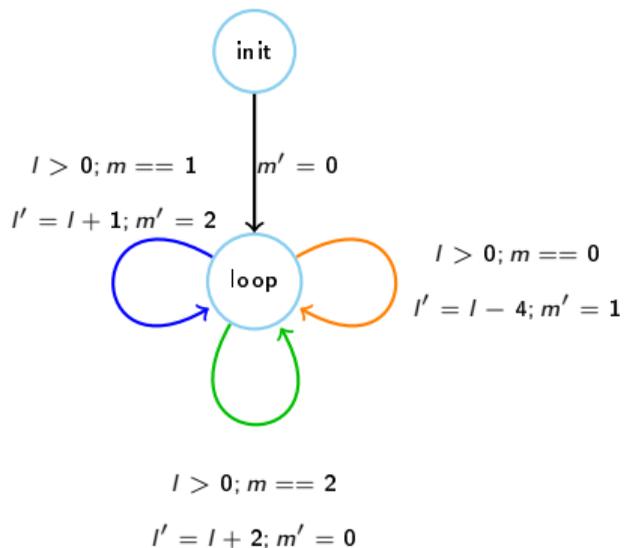
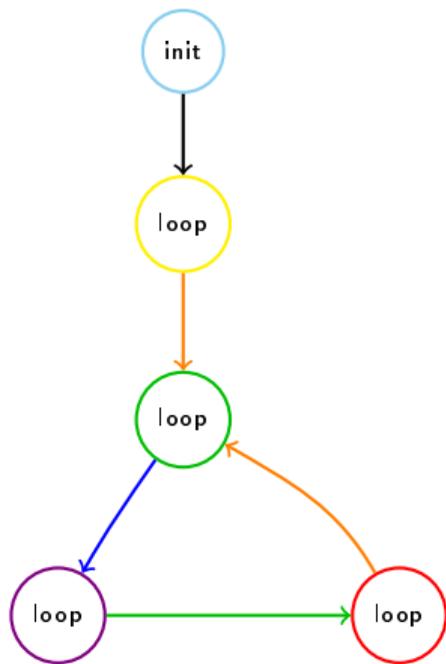


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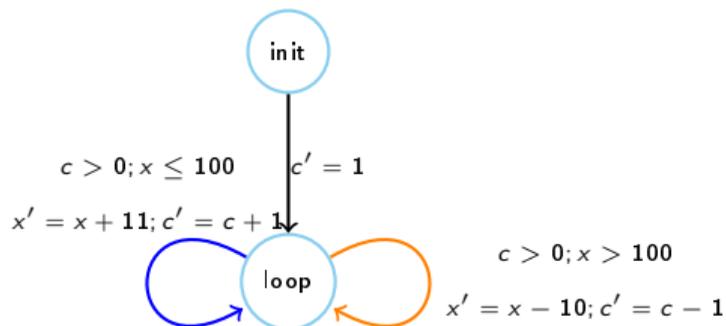


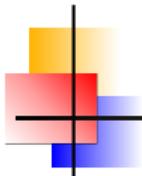
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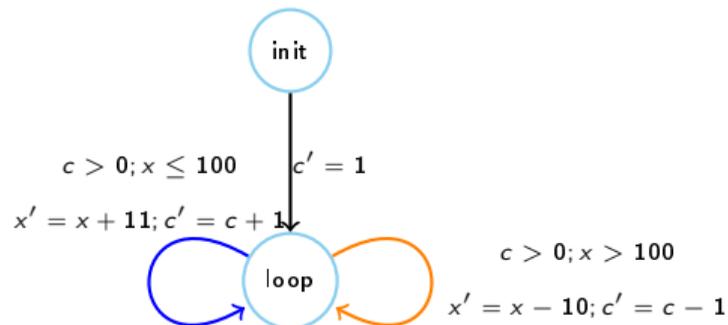
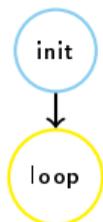
## EXAMPLE: MCCARTHY91

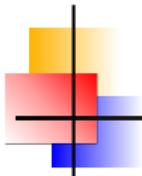
```
McCarthy 91
0 // uint x, c;
1 c = 1;
2 while (c > 0) {
3   if (x > 100) {
4     x = x - 10;
5     c--;
6   } else {
7     x = x + 11;
8     c++;
9   }
10 }
```



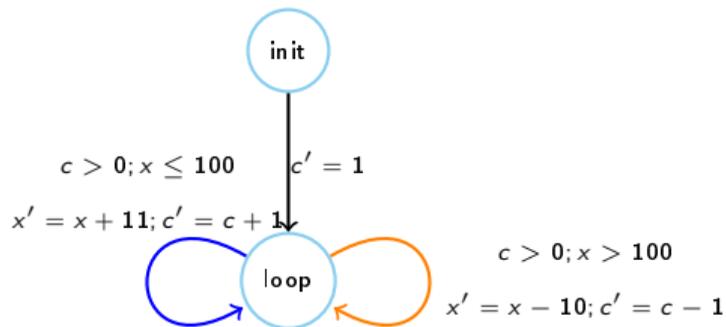
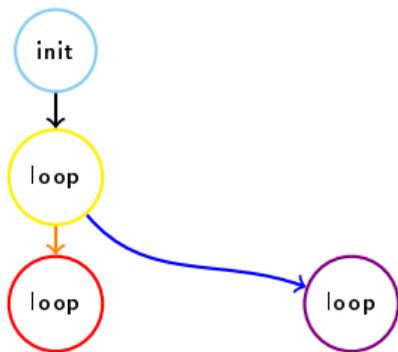


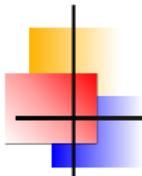
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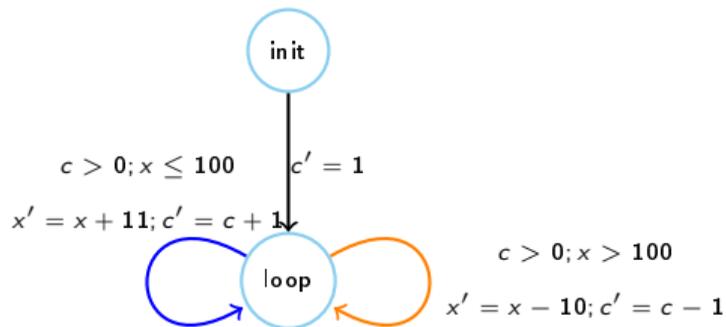
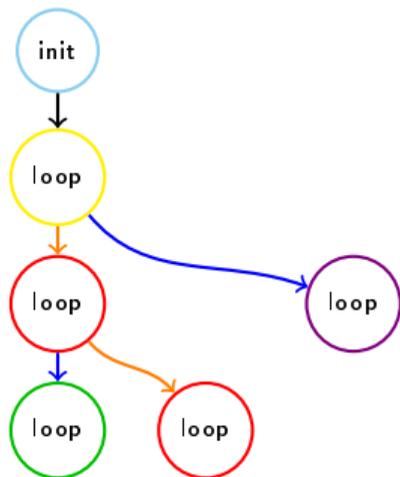


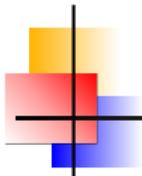
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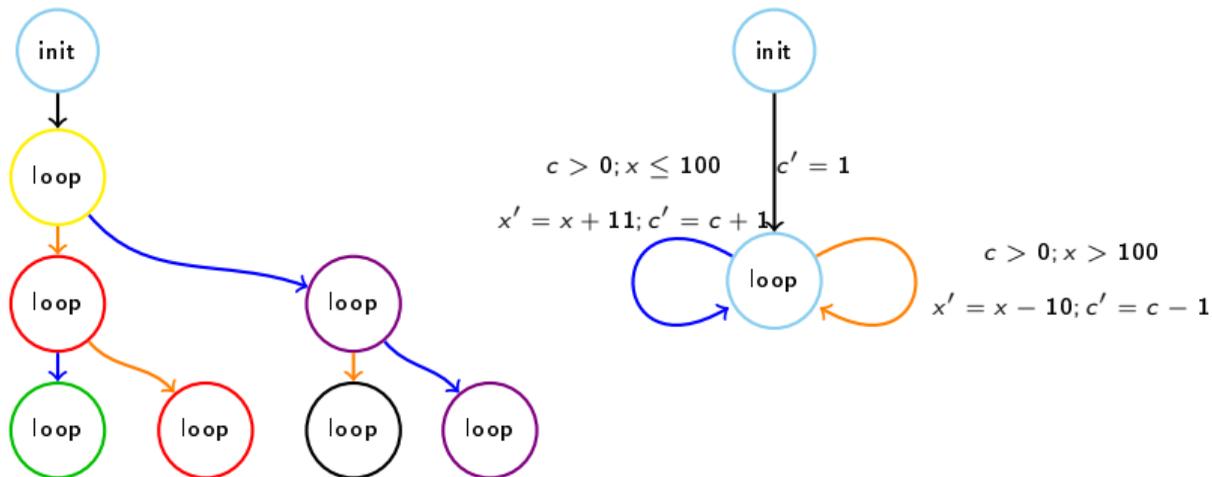


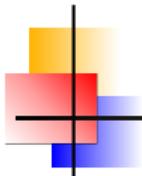
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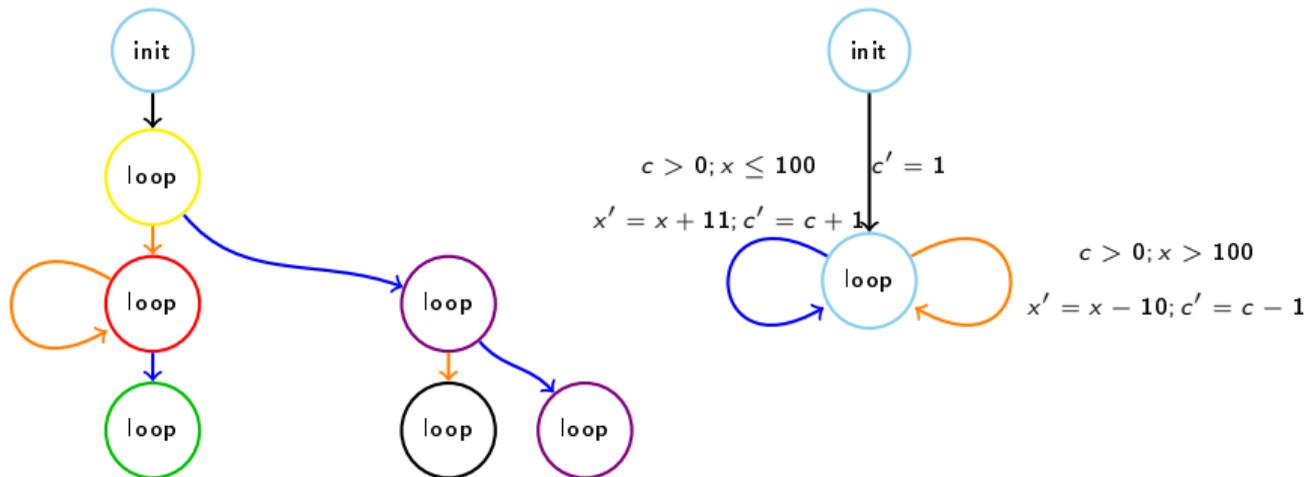


## EXAMPLE: MCCARTHY91





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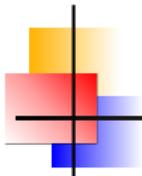




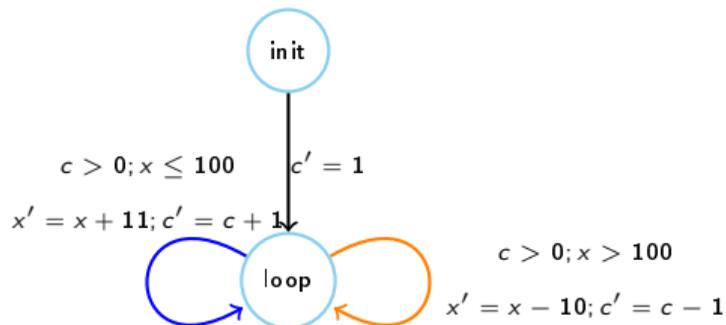
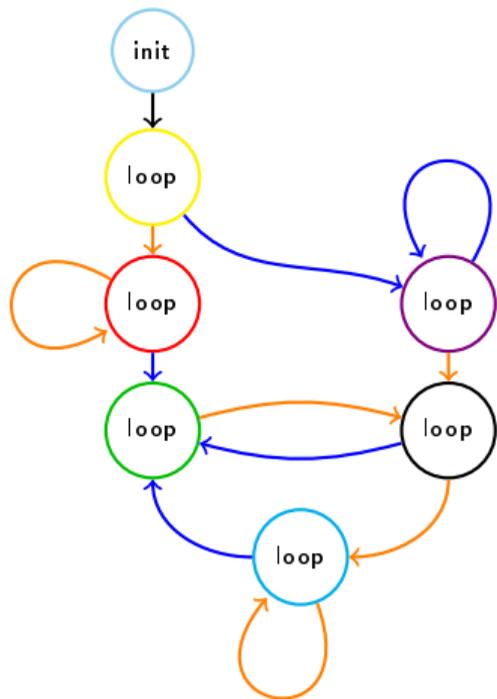


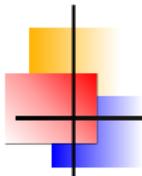






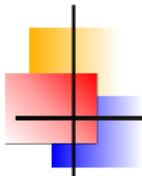
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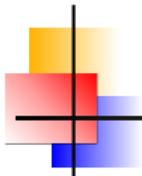
We have compared the result of two tools for different purposes with and without refining the program with Partial Evaluation.

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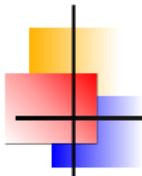
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1. Koat: Cost analysis tool for integer transition systems. Marc Brockschmidt et al. *“Analyzing runtime and size complexity of integer programs”*.
2. iRankFinder: Our termination analysis tool based on ranking functions as termination arguments.

Both tools don't use any control-flow refinement technique.

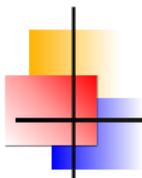


### Termination (iRankFinder)

	Unknown to Termination	Lexicografic to Linear	Timeouts with PE	Linear to Lexicografic
<b>TPDB<sup>a</sup></b>	<b>12</b>	<b>24</b>	<b>9</b>	<b>5</b>
<b>Cofloco<sup>b</sup></b>	<b>8</b>	<b>13</b>	<b>1</b>	<b>2</b>

<sup>a</sup>Termination Problem Database (416 problems)

<sup>b</sup>Cofloco Test Set (188 problems)



## EXPERIMENTS: RESULTS

### Termination (iRankFinder)

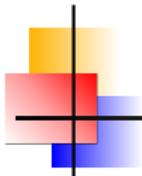
	Unknown to Termination	Lexicographic to Linear	Timeouts with PE	Linear to Lexicographic
<b>TPDB<sup>a</sup></b>	<b>12</b>	<b>24</b>	9	5
<b>Cofloco<sup>b</sup></b>	<b>8</b>	<b>13</b>	1	2

### Cost (Koat)

	Unknown to Bounded	Better Complexity Class	Timeouts with PE	Worse Complexity Class
<b>TPDB<sup>a</sup></b>	<b>4</b>	<b>0</b>	2	3
<b>Cofloco<sup>b</sup></b>	<b>10</b>	<b>10</b>	3	3

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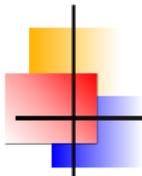
<sup>b</sup>Cofloco Test Set (188 problems)



## CONCLUSIONS

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- ▶ We have explored the use of PE as a control-flow refinement technique in the context of termination and cost analysis.
- ▶ Preliminary experiments show that PE improves both analyses.
- ▶ iRankFinder with PE integrated is available at:  
<http://irankfinder.loopkiller.com>



## FUTURE WORK

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- ▶ To study several cases where the results are worse:
  - ▶ identifying the source for this imprecision.
- ▶ To specialize the PE tool we use to the context of termination and cost analysis.
- ▶ To measure the effect of using PE on performance:
  - ▶ exploring the possibility of applying PE only on parts of the CFG.
- ▶ To measure the effect of using PE on other termination and cost analysis tools.
- ▶ To explore the use of PE for inferring lower-bounds.