

CUTE: A Concolic Unit Testing Engine for C

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Goal

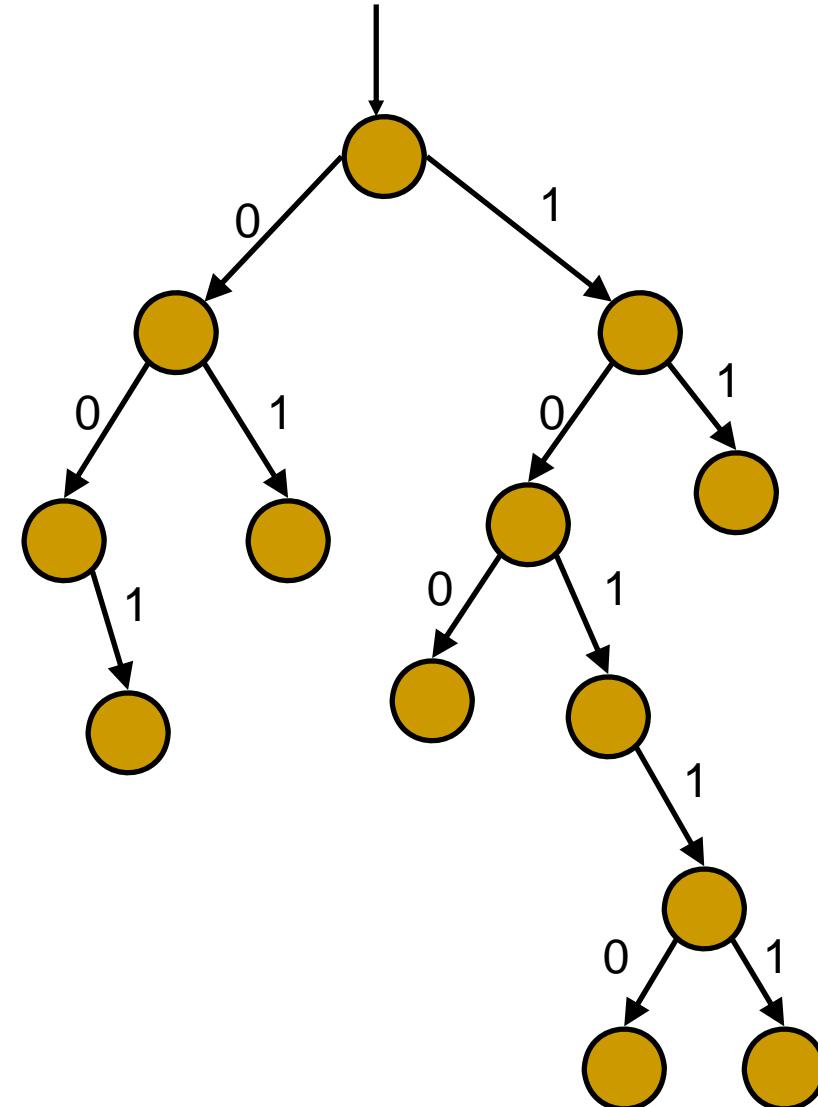
- Automated Scalable Unit Testing of real-world C Programs
 - Generate test inputs
 - Execute unit under test on generated test inputs
 - so that all reachable statements are executed
 - Any assertion violation gets caught

Goal

- Automated **Scalable** Unit Testing of real-world C Programs
 - Generate test inputs
 - Execute unit under test on generated test inputs
 - so that all reachable statements are executed
 - Any assertion violation gets caught
- Our Approach:
 - Explore all execution paths of an Unit for all possible inputs
 - Exploring all execution paths ensure that all reachable statements are executed

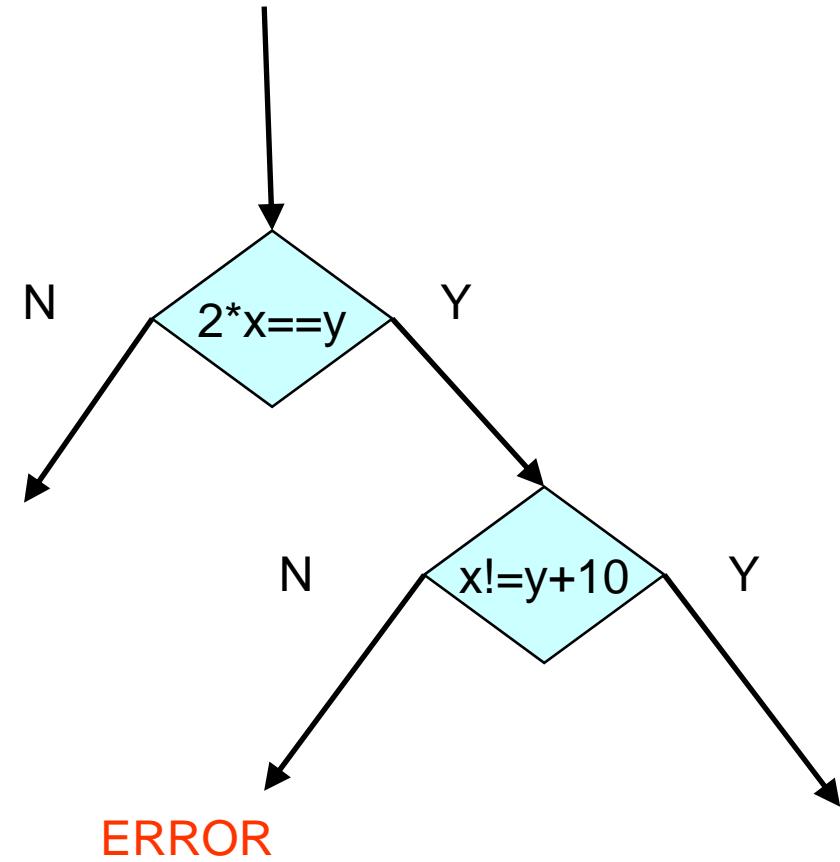
Execution Paths of a Program

- Can be seen as a **binary tree** with possibly infinite depth
 - Computation tree
- Each **node** represents the execution of a “**if then else**” statement
- Each **edge** represents the execution of a sequence of non-conditional statements
- Each path in the tree represents an equivalence class of inputs



Example of Computation Tree

```
void test_me(int x, int y) {  
    if(2*x==y){  
        if(x != y+10){  
            printf("I am fine here");  
        } else {  
            printf("I should not reach here");  
            ERROR;  
        }  
    }  
}
```



Existing Approach I

- Random testing
 - generate random inputs
 - execute the program on generated inputs
- Probability of reaching an error can be astronomically less

```
test_me(int x){  
    if(x==94389){  
        ERROR;  
    }  
}
```

Probability of hitting
ERROR = $1/2^{32}$

Existing Approach II

- **Symbolic Execution**
 - use symbolic values for input variables
 - execute the program symbolically on symbolic input values
 - collect symbolic path constraints
 - use theorem prover to check if a branch can be taken
- **Does not scale** for large programs

```
test_me(int x){  
    if((x%10)*4!=17){  
        ERROR;  
    } else {  
        ERROR;  
    }  
}
```

Symbolic execution will say both branches are reachable:

False positive

Approach

- Combine concrete and symbolic execution for unit testing
 - **Concrete + Symbolic = Concolic**
- In a nutshell
 - Use concrete execution over a concrete input to guide symbolic execution
 - Concrete execution helps Symbolic execution to simplify complex and unmanageable symbolic expressions
 - by replacing symbolic values by concrete values
- Achieves Scalability
 - Higher branch coverage than random testing
 - No false positives or scalability issue like in symbolic execution based testing

Example

```
typedef struct cell {  
    int v;  
    struct cell *next;  
} cell;
```

```
int f(int v) {  
    return 2*v + 1;  
}
```

```
int testme(cell *p, int x) {  
    if (x > 0)  
        if (p != NULL)  
            if (f(x) == p->v)  
                if (p->next == p)  
                    abort();  
    return 0;  
}
```

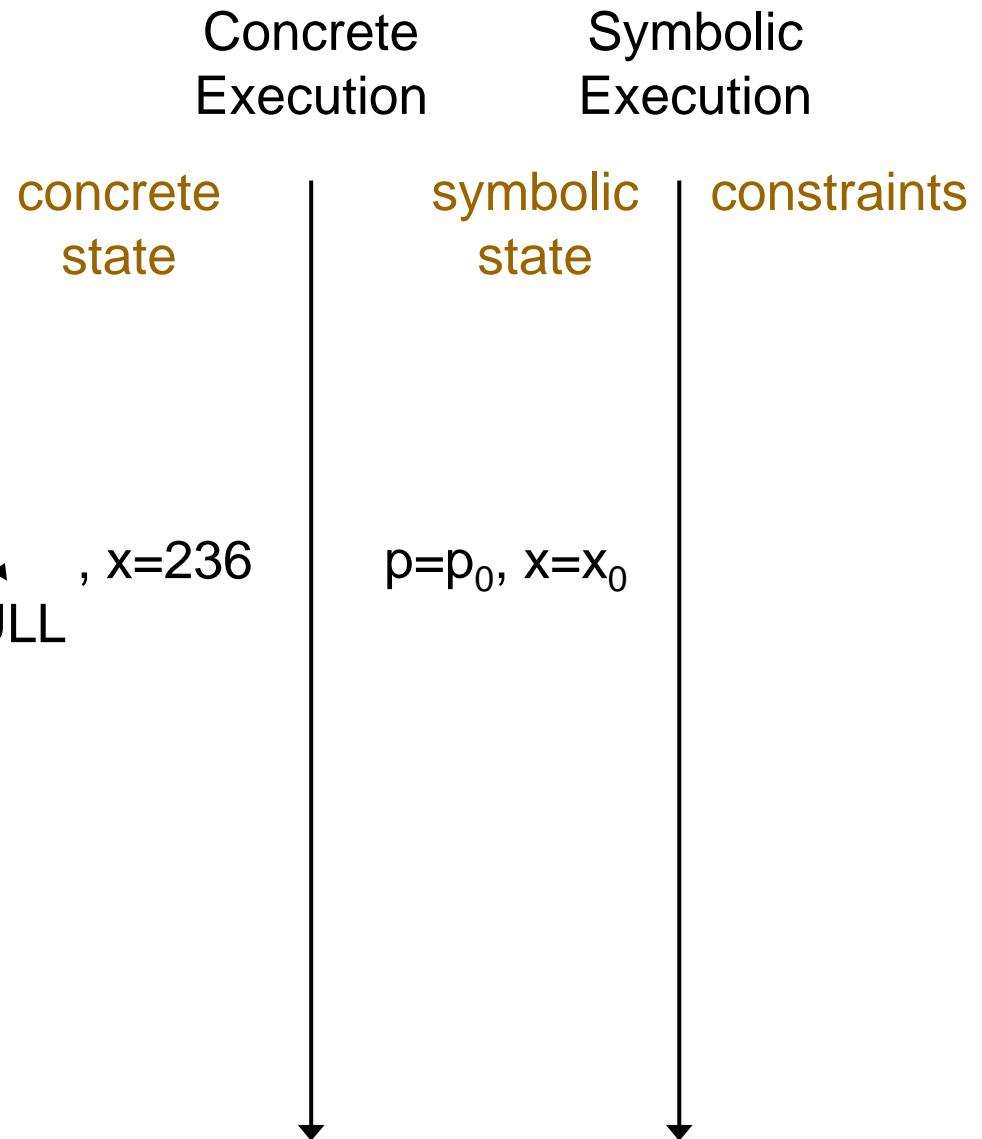
- Random Test Driver:
 - random memory graph reachable from p
 - random value for x
- Probability of reaching `abort()` is extremely low

CUTE Approach

```
typedef struct cell {  
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} cell;
```

```
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}
```

Concrete
Execution

concrete
state

Symbolic
Execution

symbolic
state

constraints



$p=p_0, x=x_0$

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}
```

Concrete
Execution

concrete
state

Symbolic
Execution

symbolic
state

constraints

p
NULL , x=236

p=p₀, x=x₀

x₀>0

CUTE Approach

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```

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Concrete
Execution

concrete
state

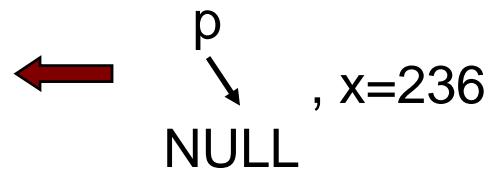
Symbolic
Execution

symbolic
state

constraints

$x_0 > 0$

$!(p_0 \neq \text{NULL})$



CUTE Approach

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Concrete
Execution

Symbolic
Execution

concrete

symbolic

constraints

solve: $x_0 > 0$ and $p_0 \neq \text{NULL}$

$x_0 > 0$
 $p_0 = \text{NULL}$

\leftarrow
 p
NULL , $x=236$

$p=p_0, x=x_0$

CUTE Approach

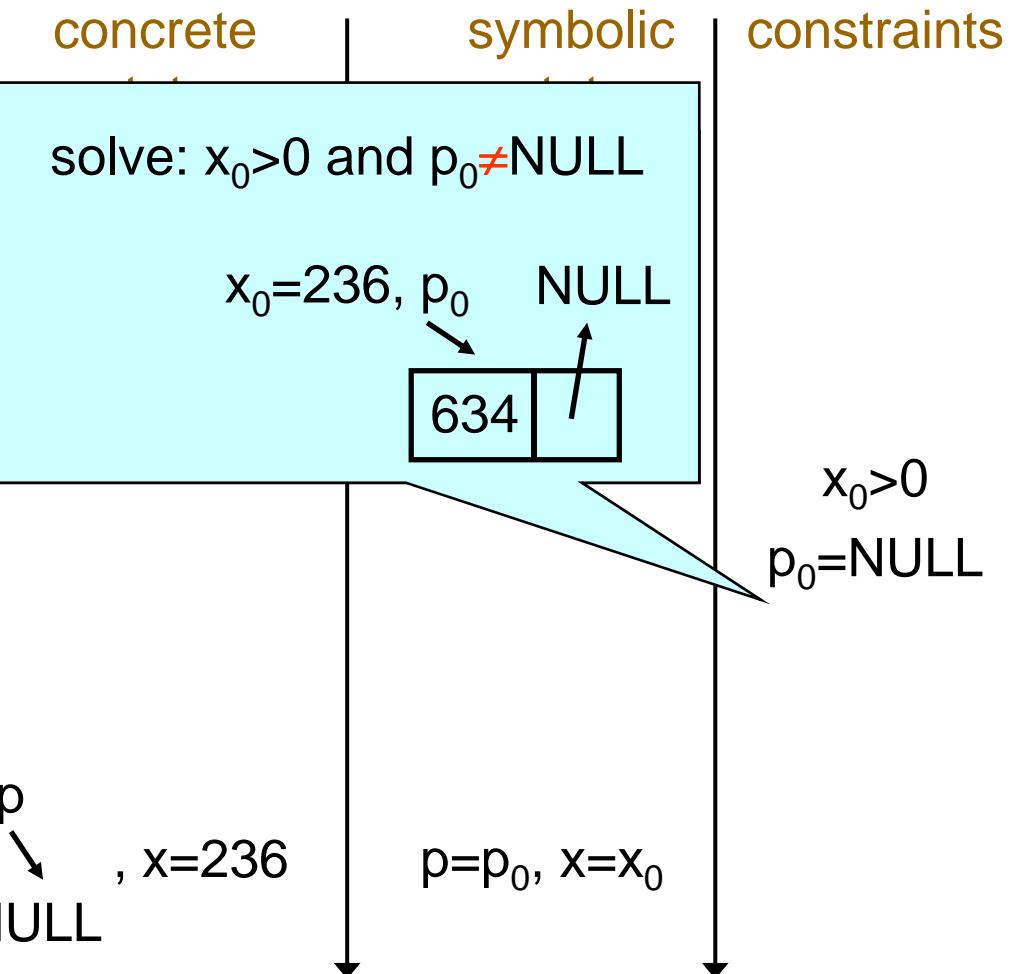
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Concrete
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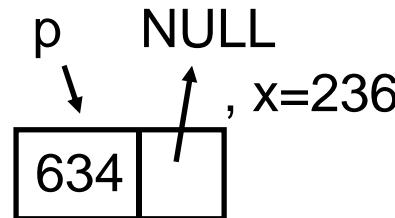
Concrete
Execution

Symbolic
Execution

concrete
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symbolic
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constraints



$p=p_0, x=x_0,$
 $p->v=v_0,$
 $p->next=n_0$

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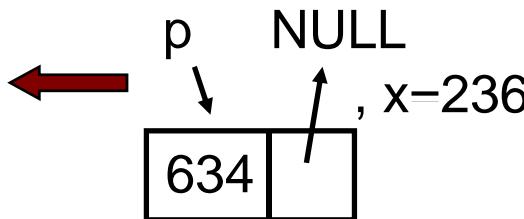
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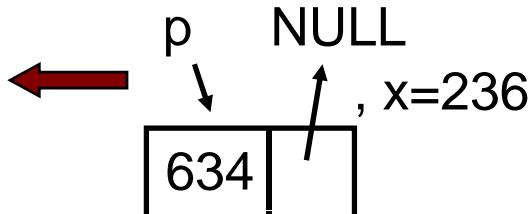
Concrete
Execution

Symbolic
Execution

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state

symbolic
state

constraints



$p=p_0, x=x_0,$
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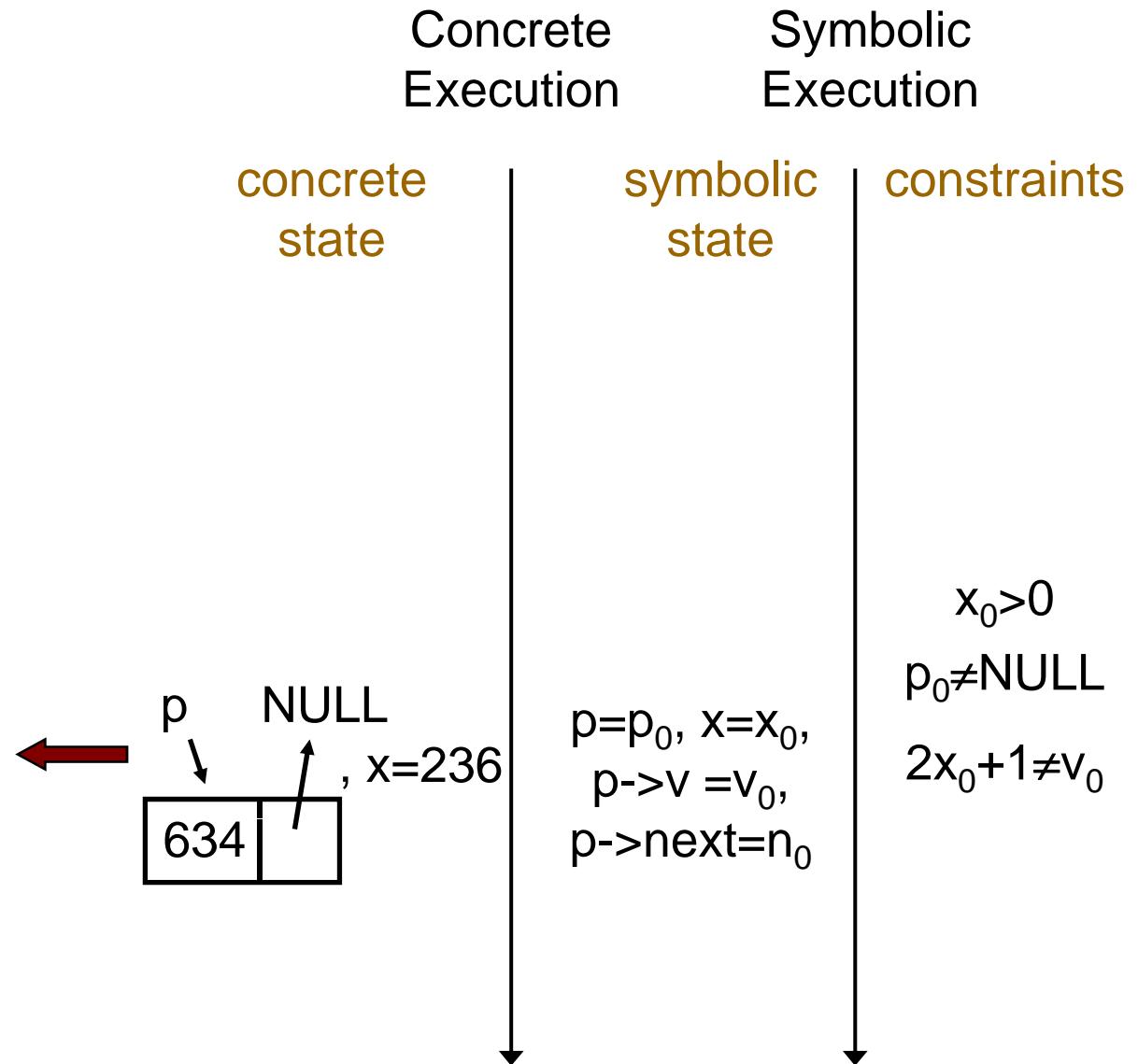
$x_0 > 0$
 $p_0 \neq \text{NULL}$

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Concrete
Execution

Symbolic
Execution

concrete
state

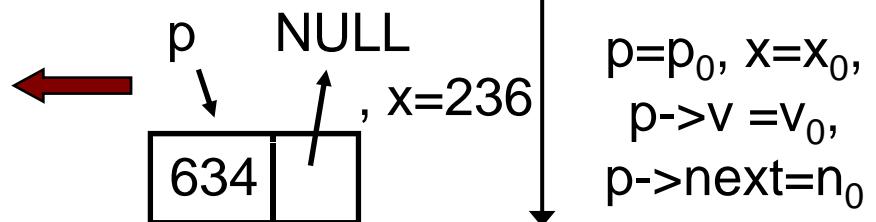
symbolic
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$$x_0 > 0$$

$$p_0 \neq \text{NULL}$$

$$2x_0 + 1 \neq v_0$$



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Concrete
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Symbolic
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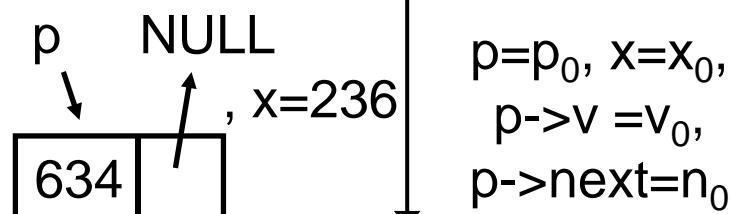
concrete

symbolic

constraints

solve: $x_0 > 0$ and $p_0 \neq \text{NULL}$
and $2x_0 + 1 = v_0$

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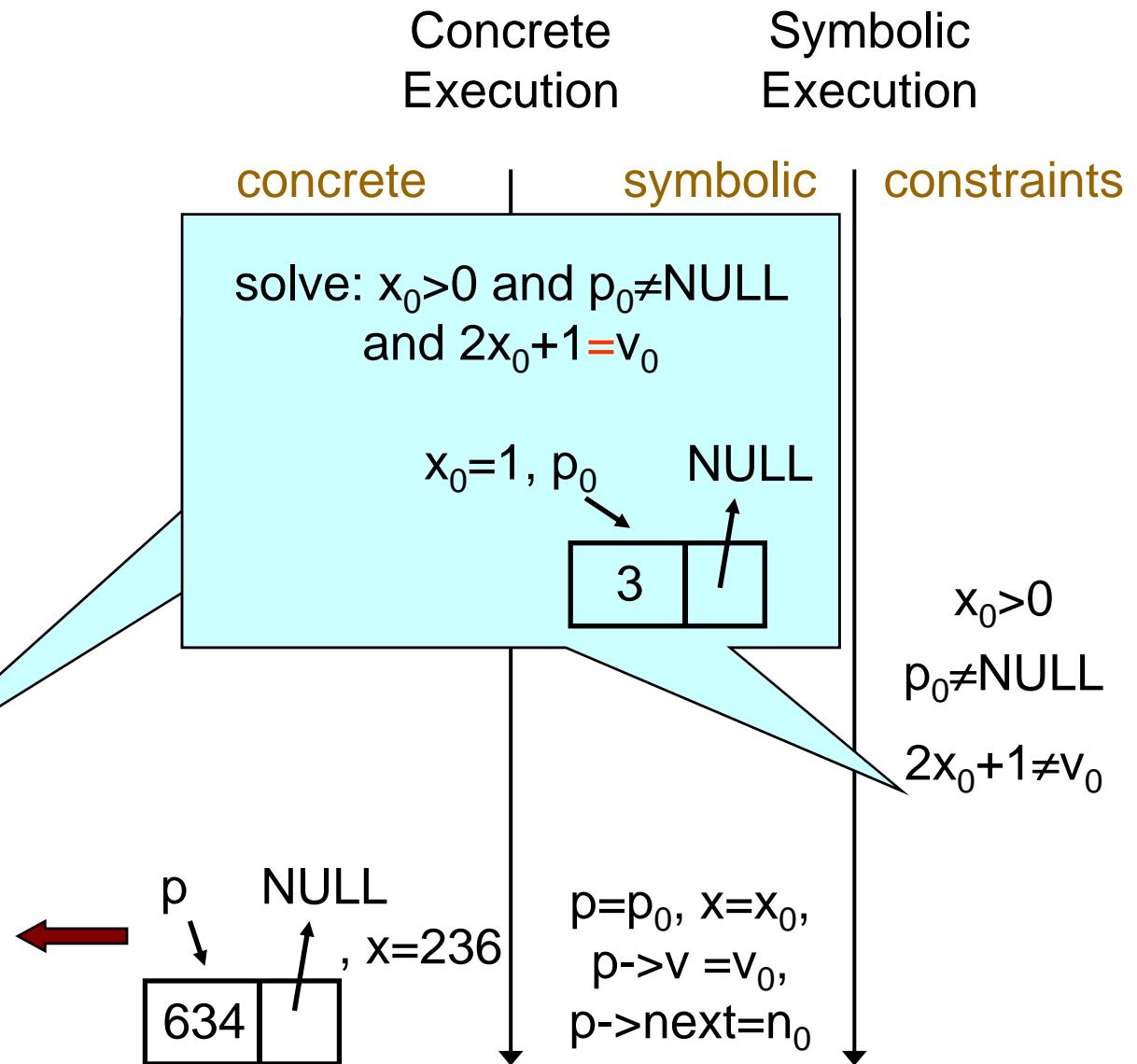


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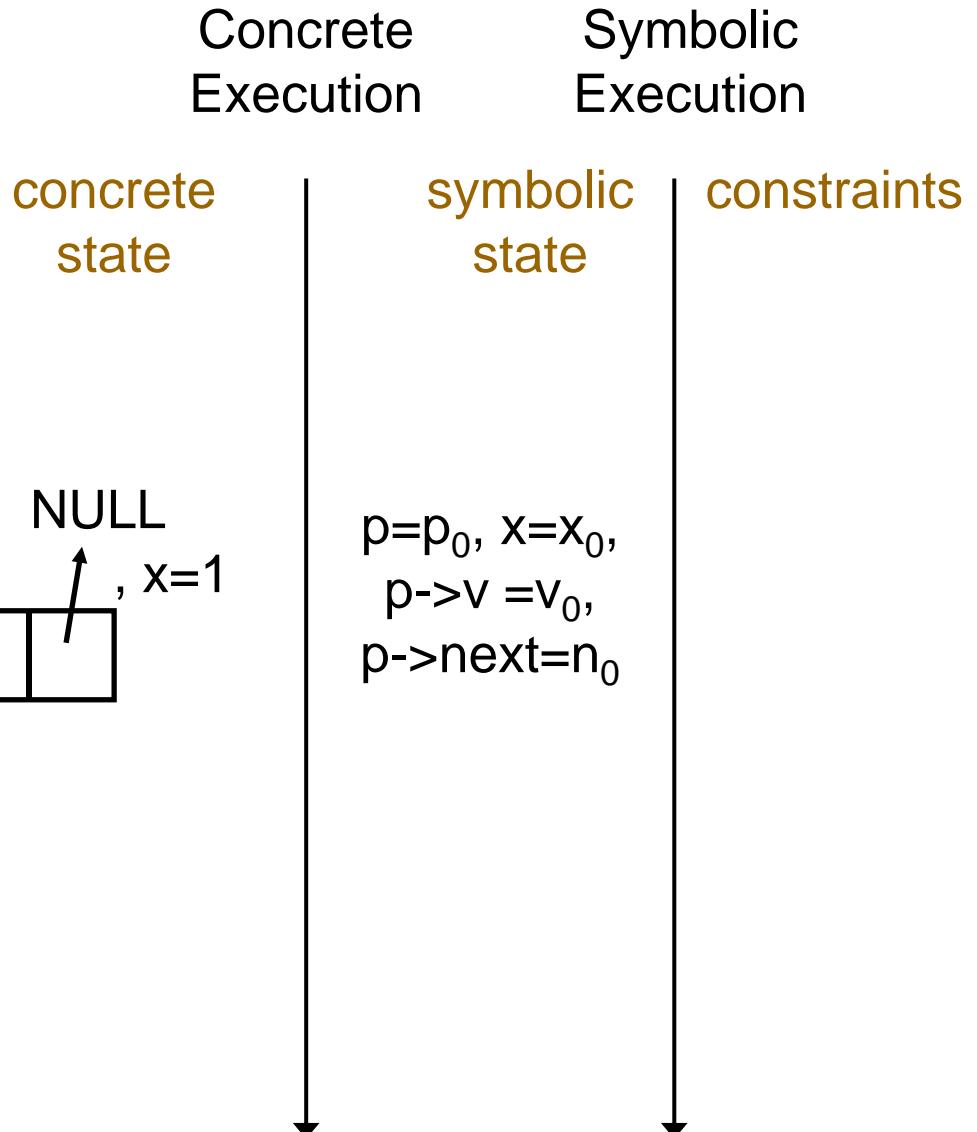


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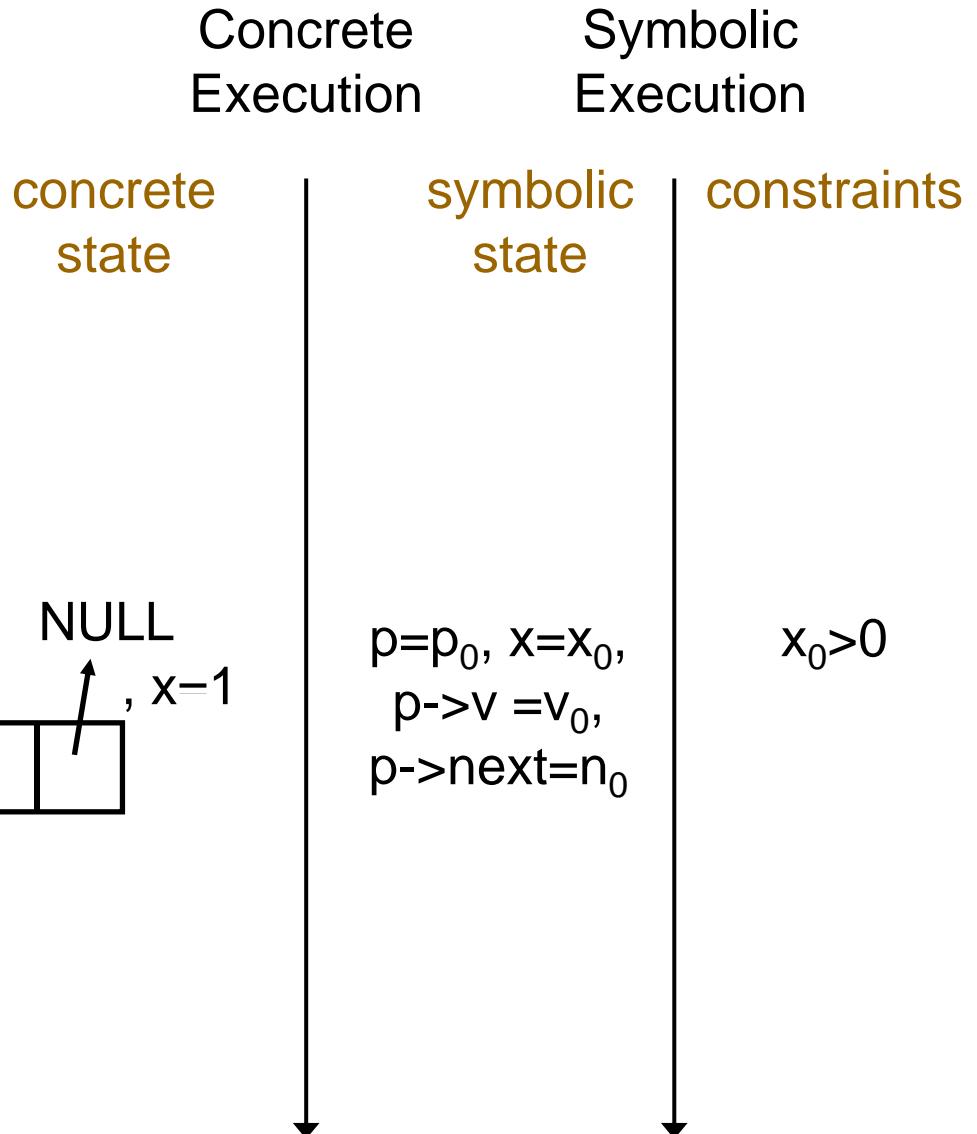


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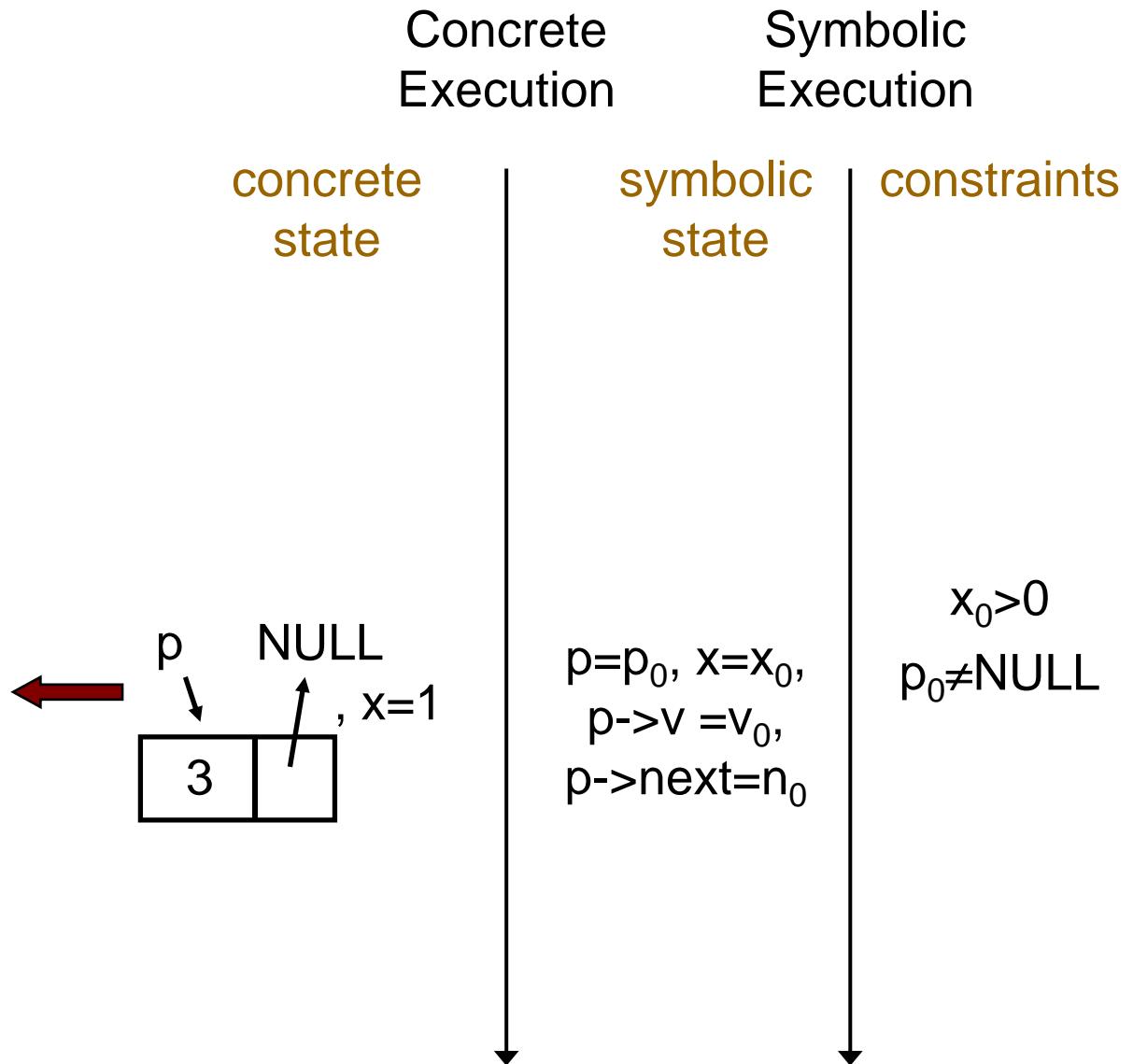


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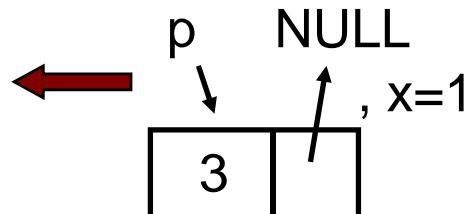
Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

constraints



$p=p_0, x=x_0,$
 $p->v=v_0,$
 $p->next=n_0$

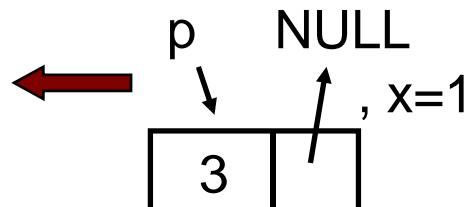
$x_0 > 0$
 $p_0 \neq \text{NULL}$
 $2x_0 + 1 = v_0$

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```



Concrete Execution	Symbolic Execution	constraints
concrete state	symbolic state	
		$x_0 > 0$
		$p_0 \neq \text{NULL}$
		$2x_0 + 1 = v_0$
		$n_0 \neq p_0$

The table illustrates the state transition between concrete and symbolic execution. The columns represent "Concrete Execution" and "Symbolic Execution". The rows represent the "concrete state", "symbolic state", and "constraints". The constraints column lists the conditions derived from the concrete state: $x_0 > 0$, $p_0 \neq \text{NULL}$, $2x_0 + 1 = v_0$, and $n_0 \neq p_0$.

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Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

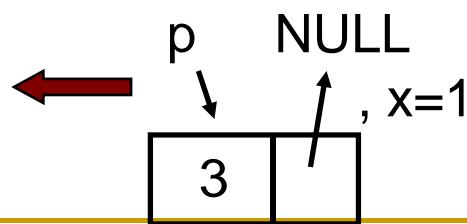
constraints

$$x_0 > 0$$

$$p_0 \neq \text{NULL}$$

$$2x_0 + 1 = v_0$$

$$n_0 \neq p_0$$



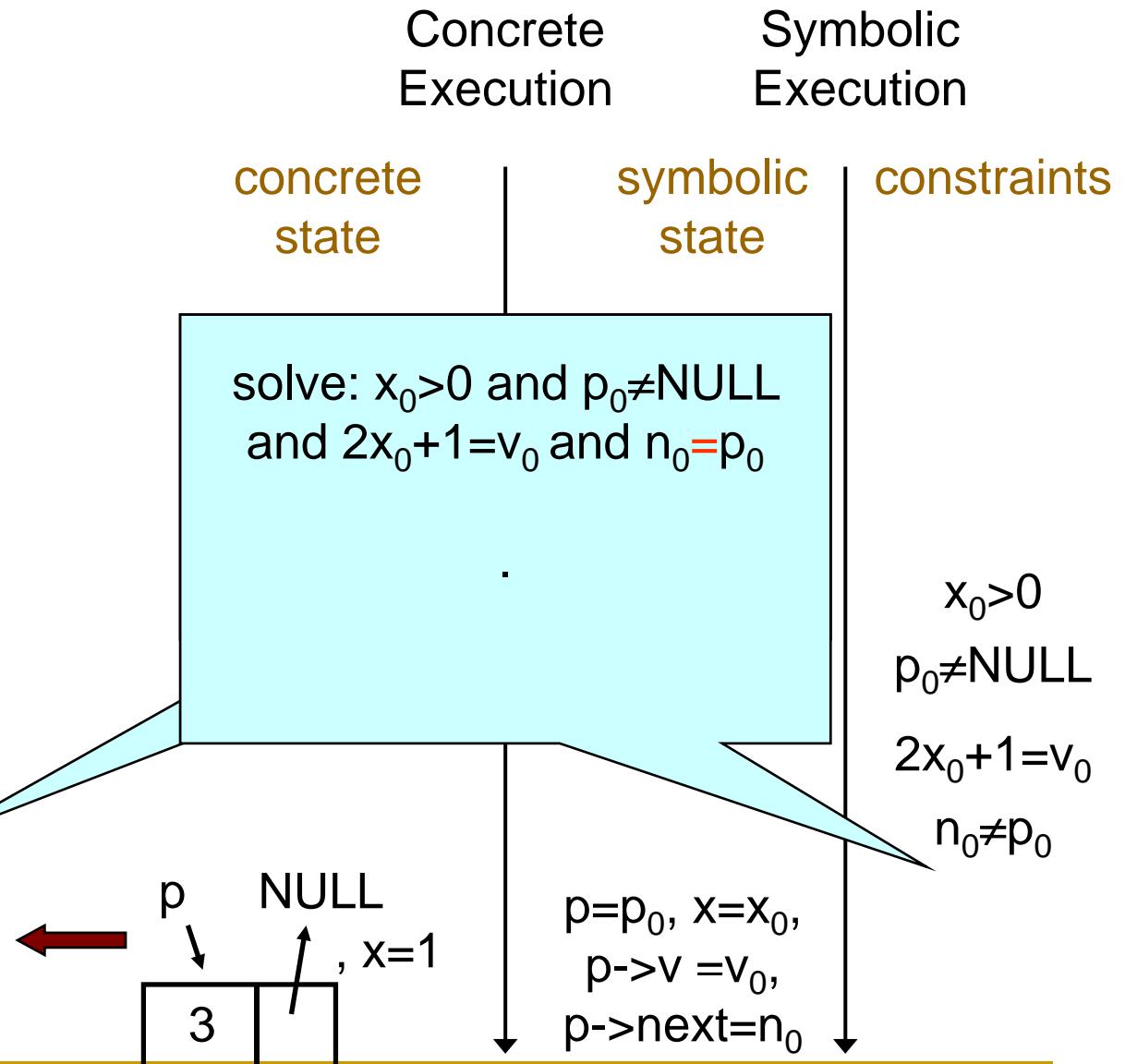
$$\begin{aligned} p &= p_0, \\ p \rightarrow v &= v_0, \\ p \rightarrow \text{next} &= n_0 \end{aligned}$$

CUTE Approach

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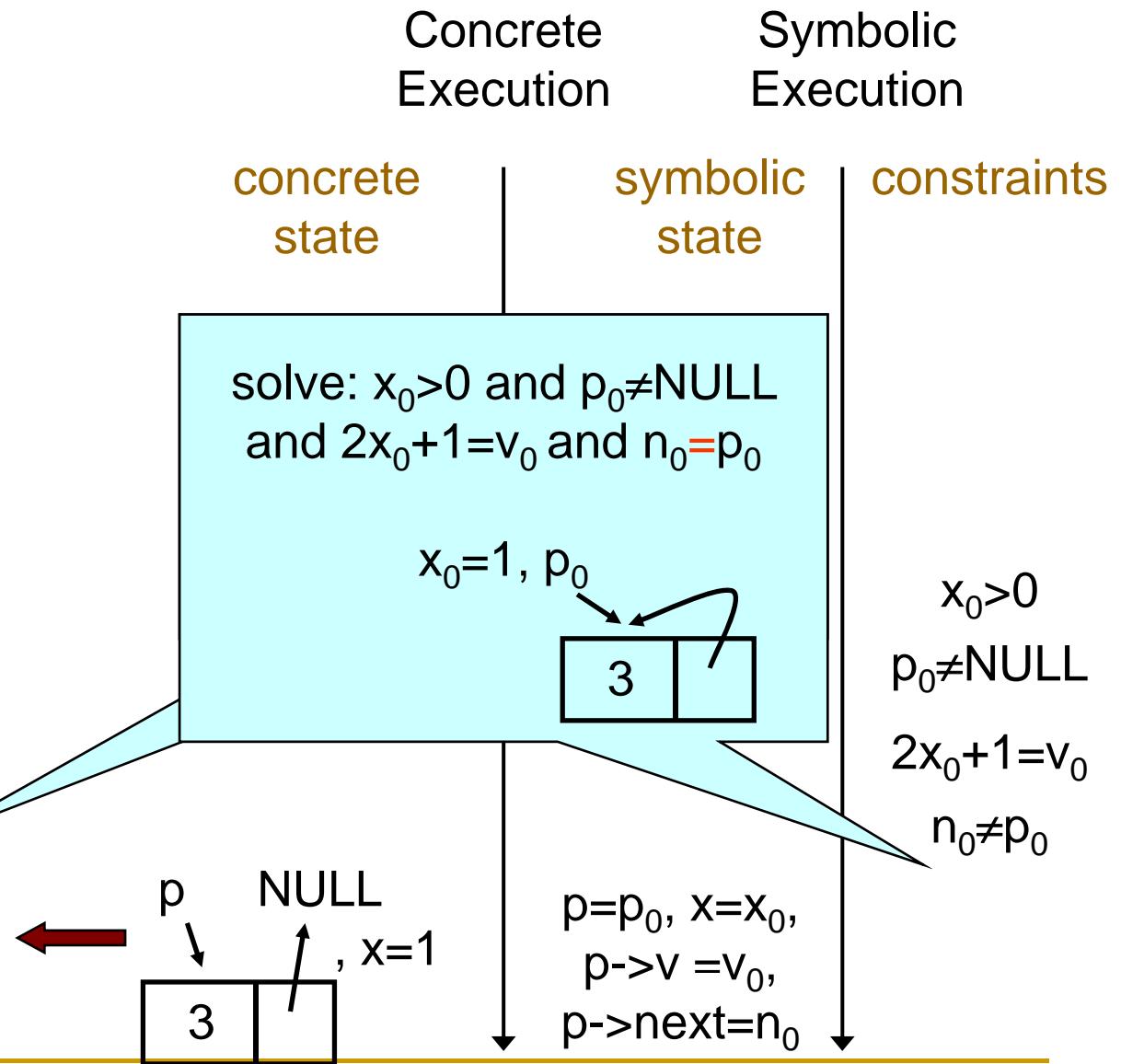


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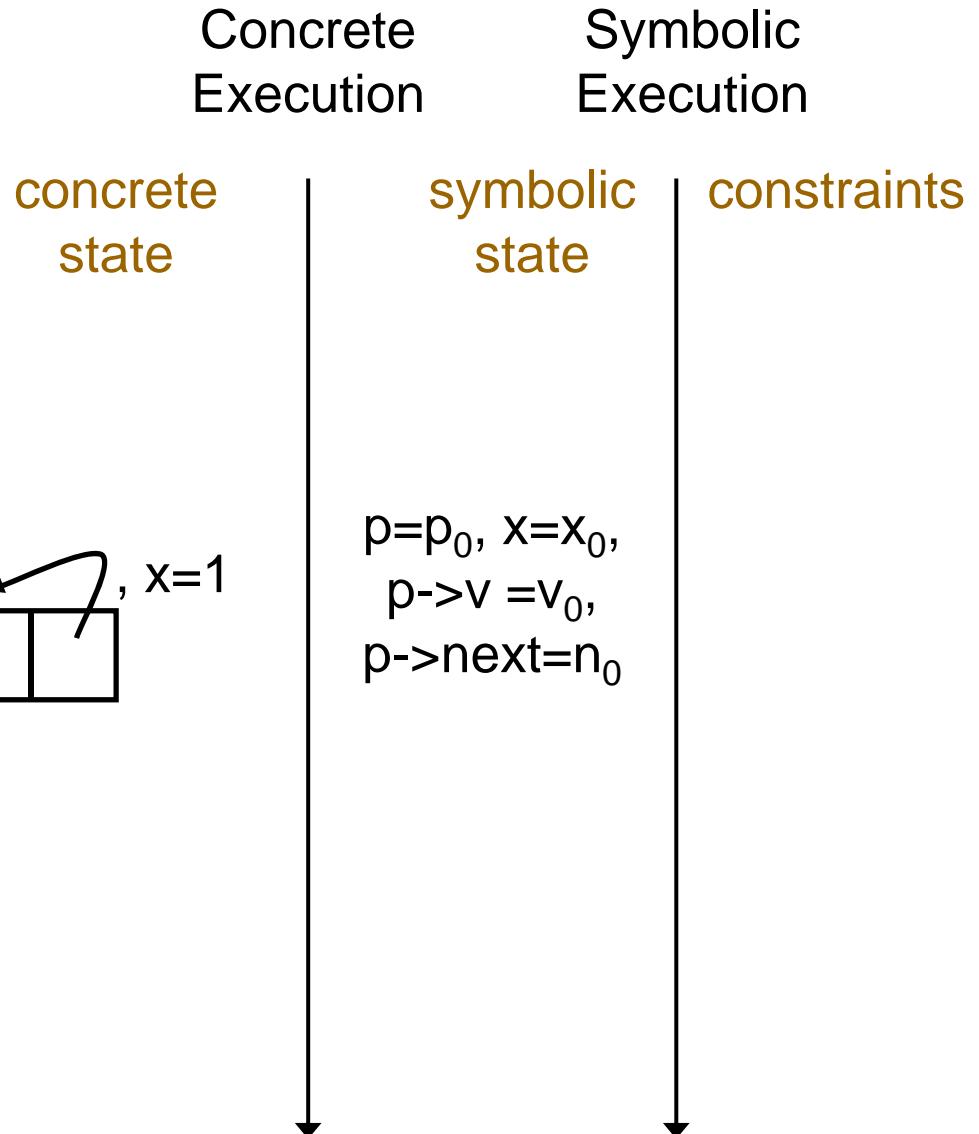


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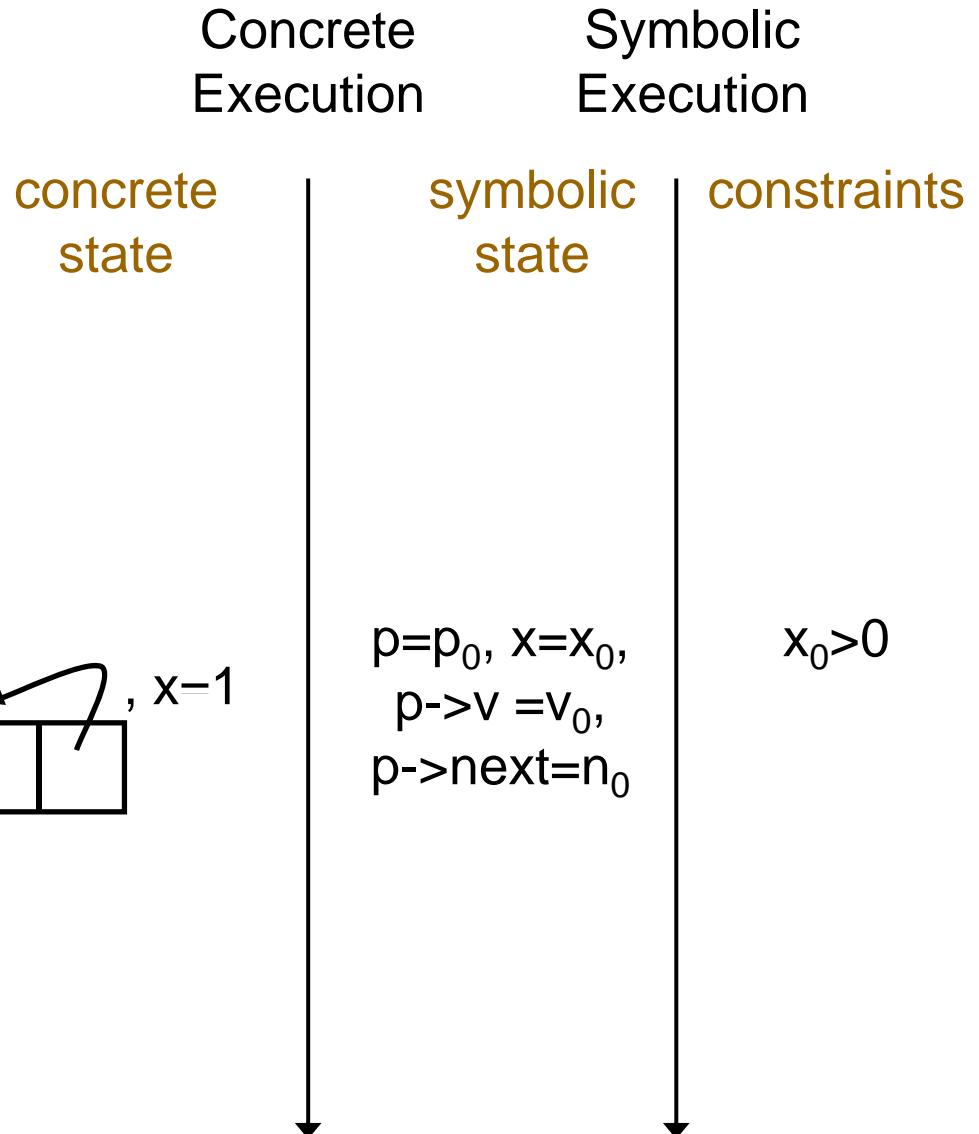


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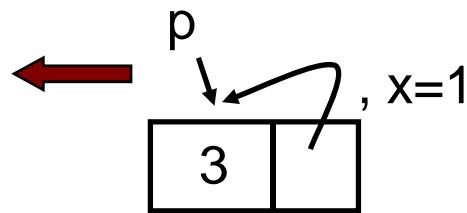


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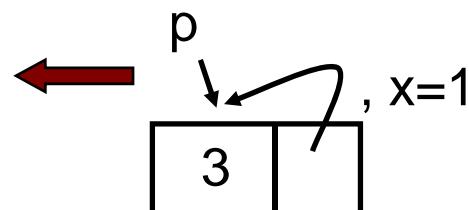
Concrete Execution	Symbolic Execution	constraints
concrete state	symbolic state	$x_0 > 0$ $p_0 \neq \text{NULL}$
	$p=p_0, x=x_0,$ $p->v=v_0,$ $p->\text{next}=n_0$	

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Concrete
Execution

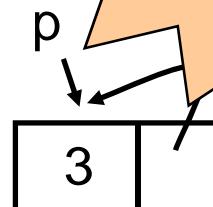
Symbolic
Execution

concrete
state

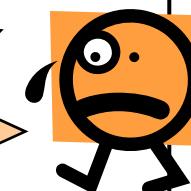
symbolic
state

constraints

Program Error



$p=p_0, x=x_0,$
 $p->v=v_0,$
 $p->next=n_0$



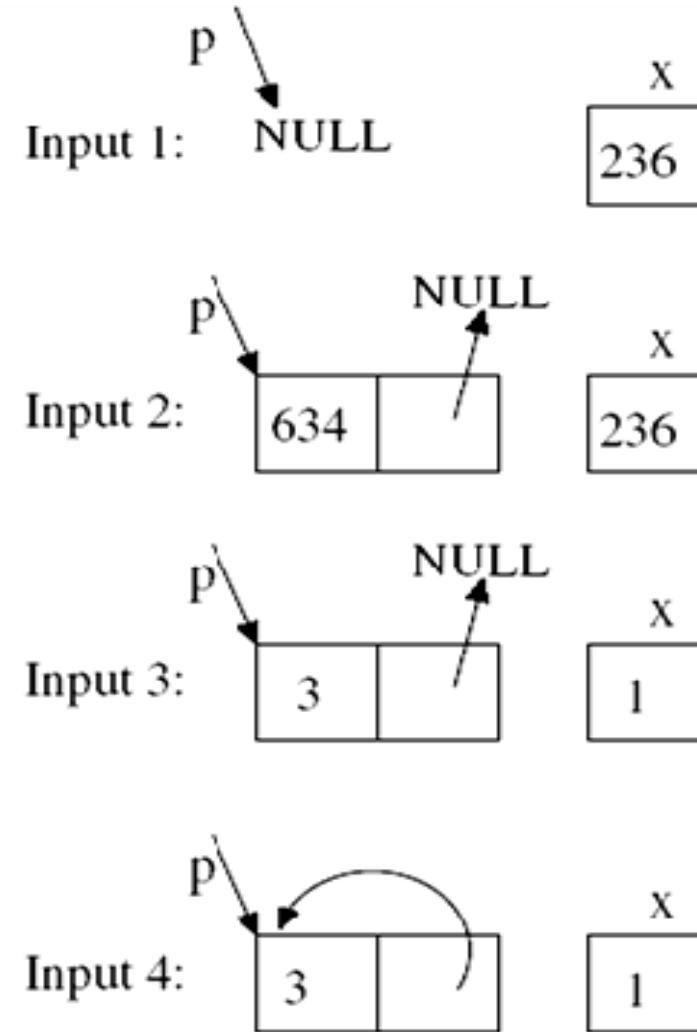
$x_0 > 0$
 $p_0 \neq \text{NULL}$
 $2x_0 + 1 = v_0$
 $n_0 = p_0$

Pointer Inputs: Input Graph

```
typedef struct cell {  
    int v;  
    struct cell *next;  
} cell;
```

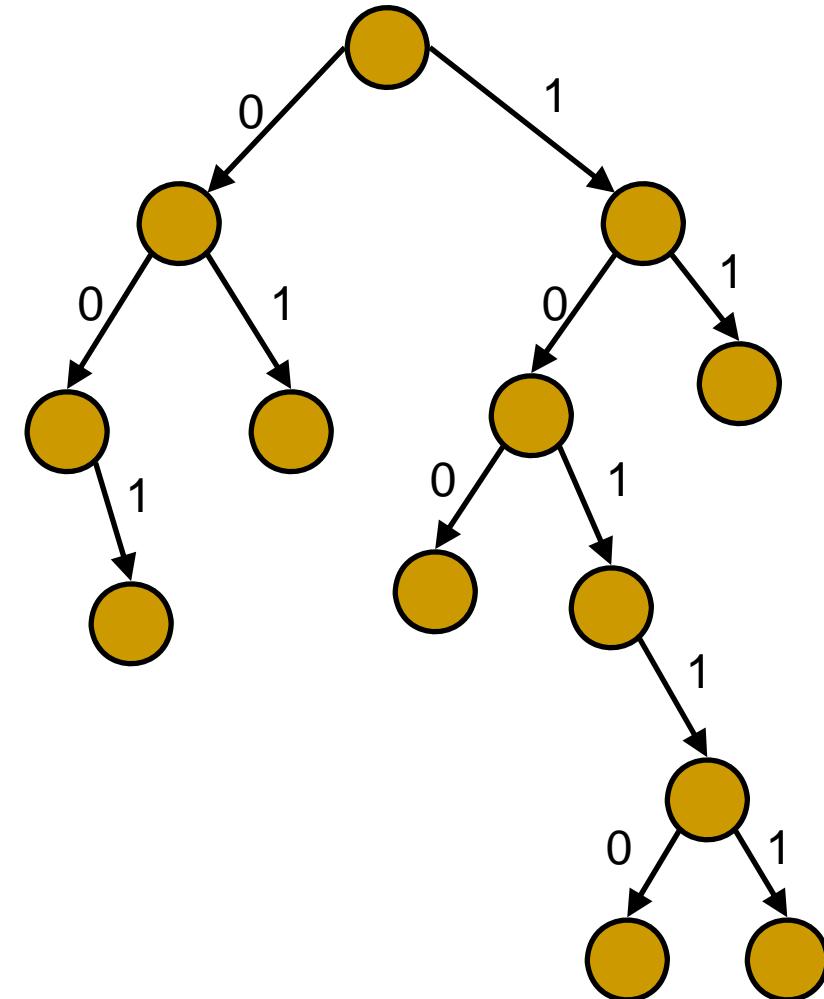
```
int f(int v) {  
    return 2*v + 1;  
}
```

```
int testme(cell *p, int x) {  
    if (x > 0)  
        if (p != NULL)  
            if (f(x) == p->v)  
                if (p->next == p)  
                    abort();  
    return 0;  
}
```



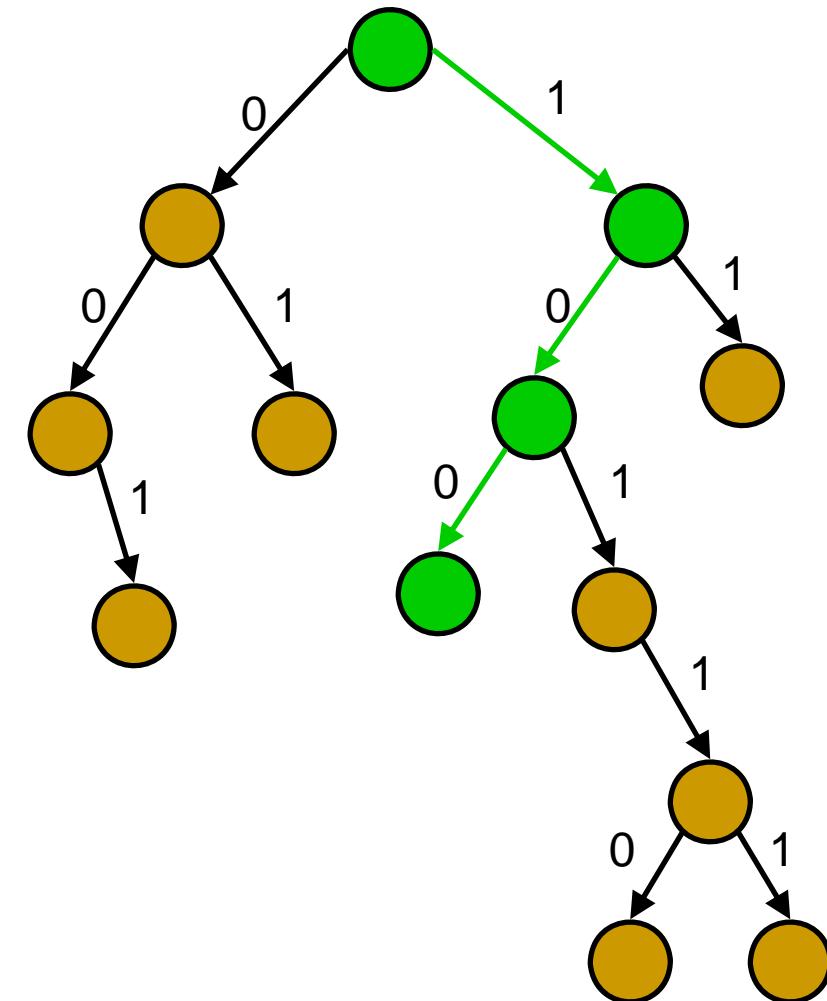
Explicit Path (not State) Model Checking

- Traverse all execution paths one by one to detect errors
 - check for assertion violations
 - check for program crash
 - combine with valgrind to discover memory leaks
 - detect invariants



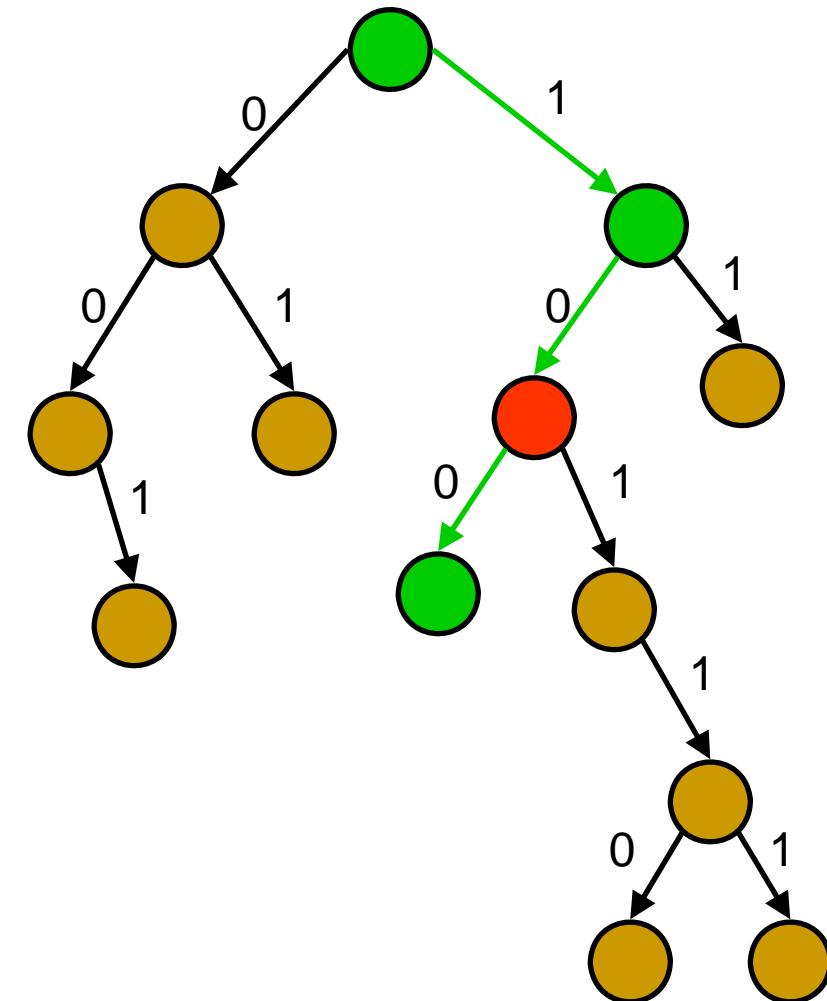
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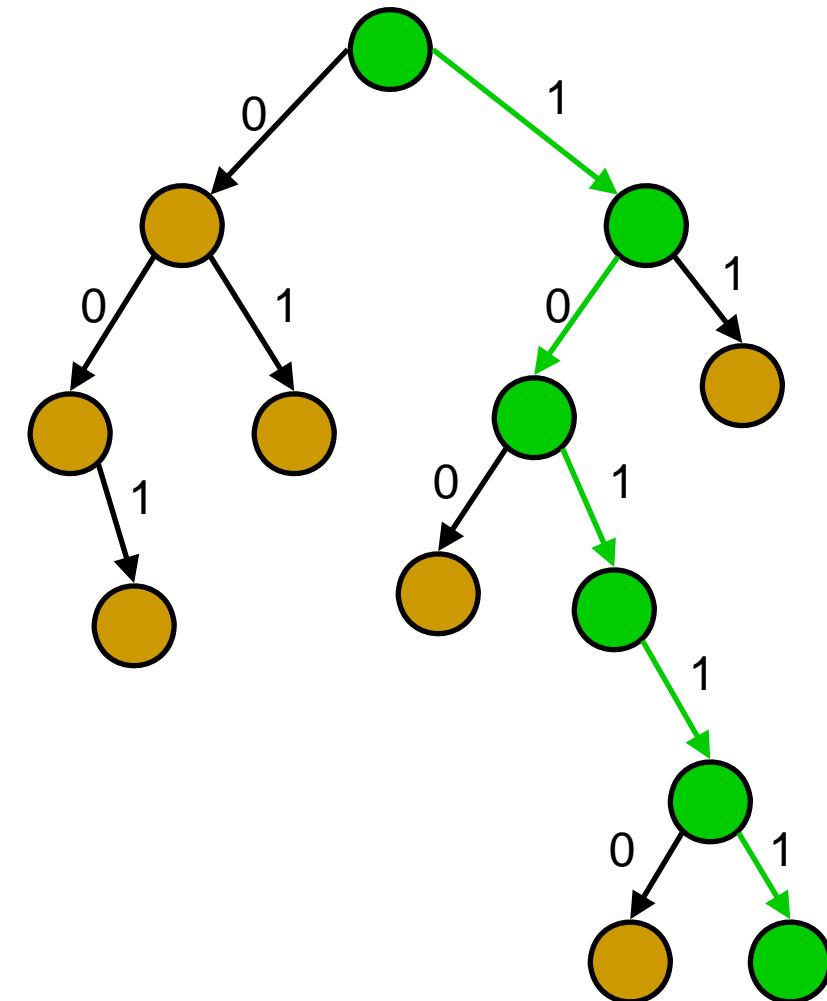
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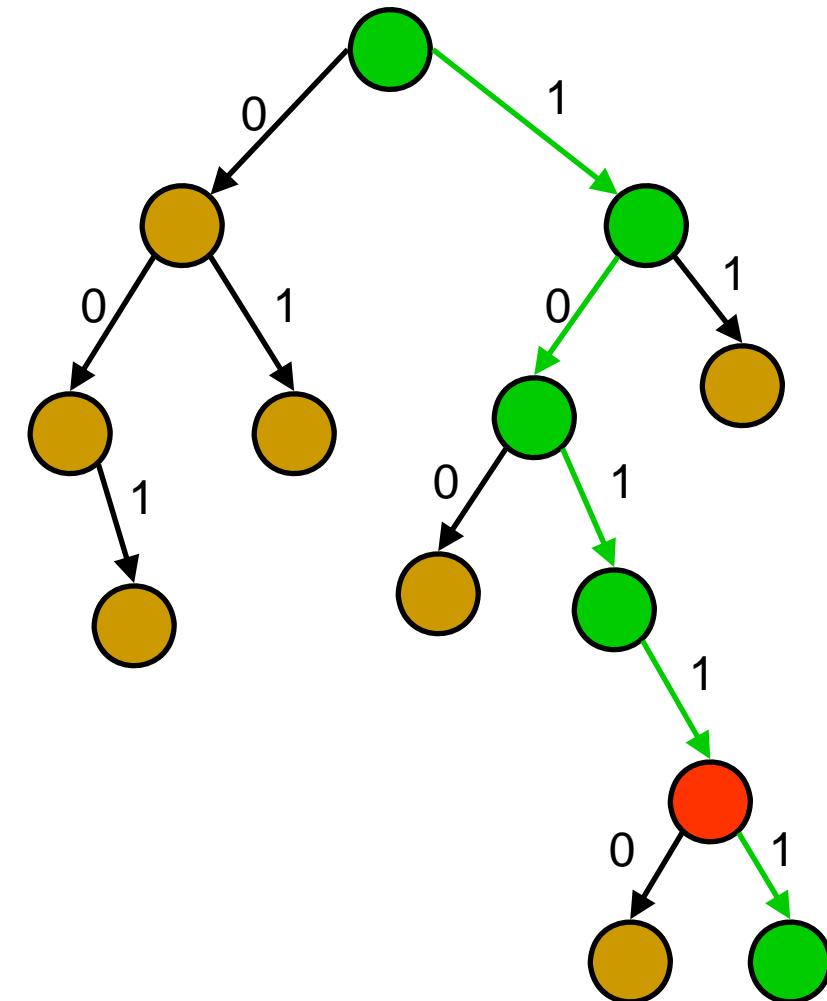
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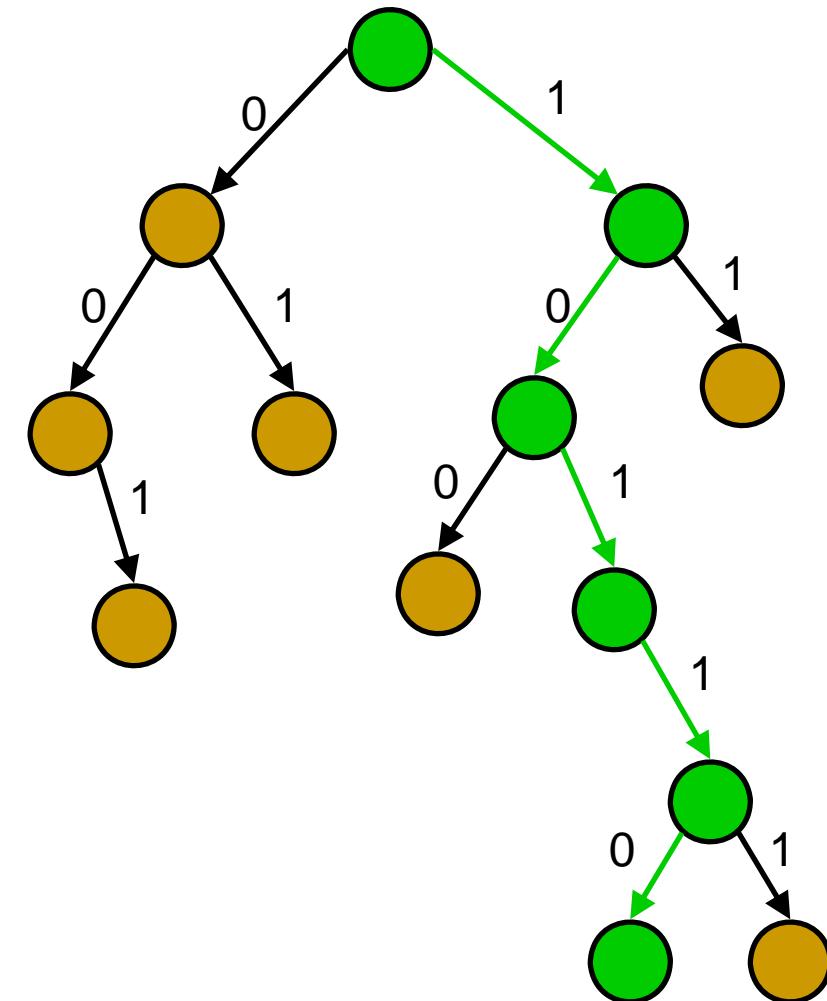
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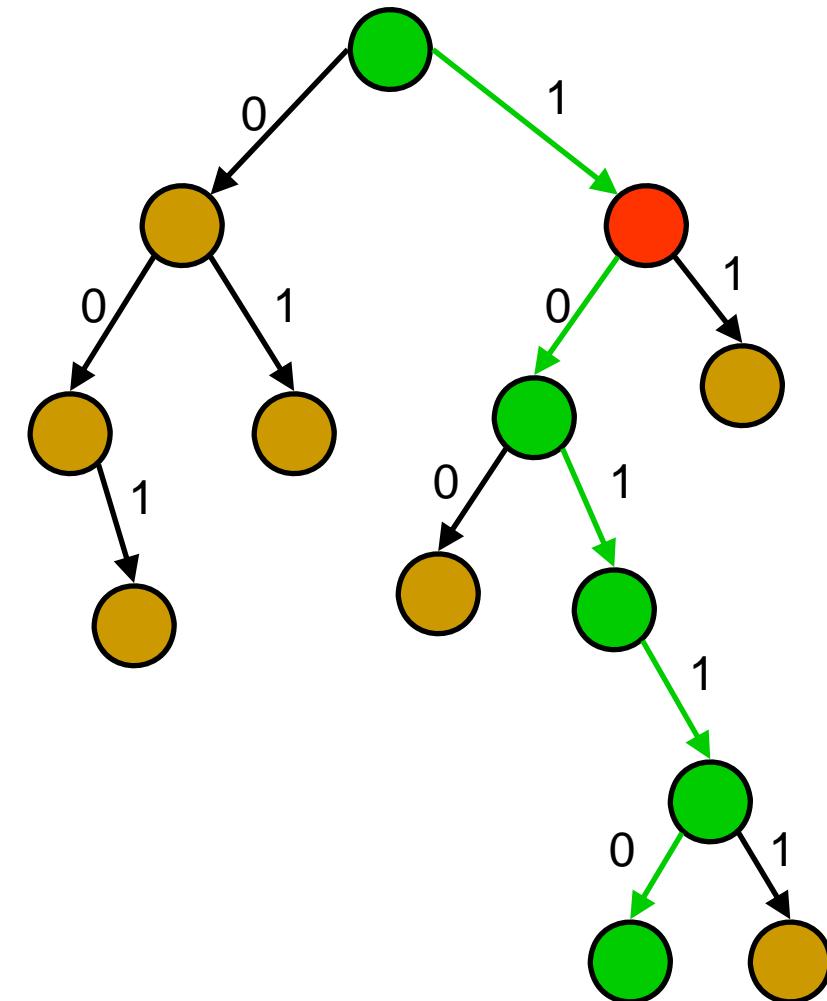
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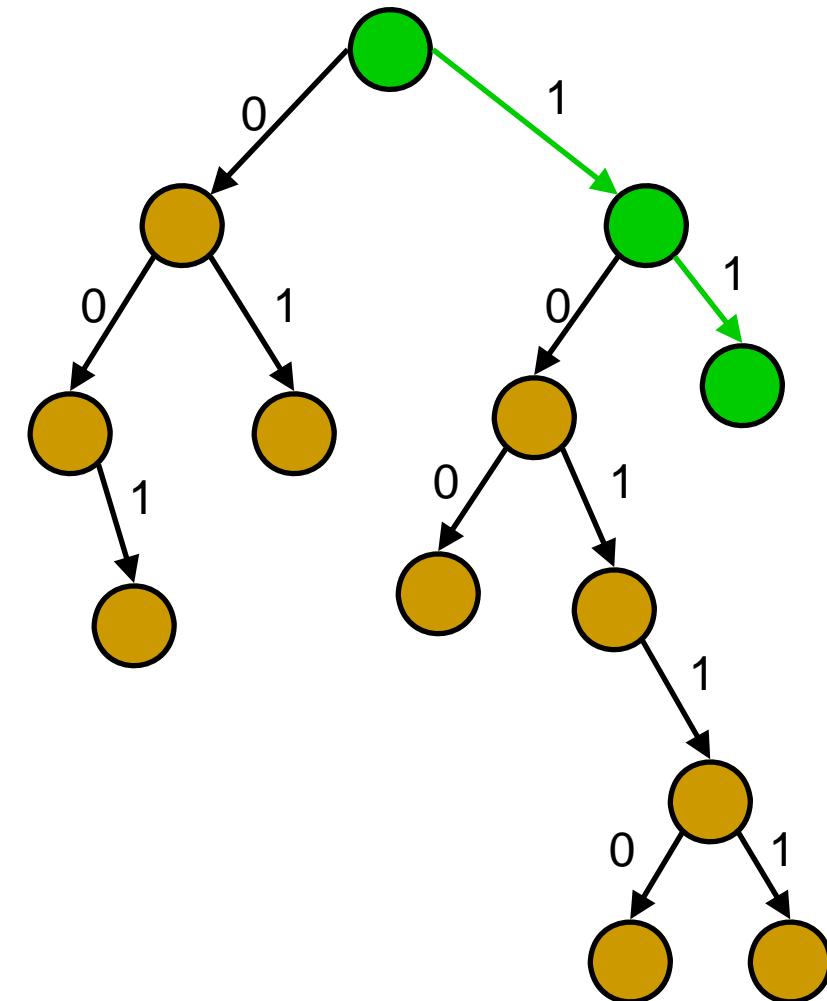
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 - resolve aliases for pointer using concrete values
 - handle arrays naturally
 - symbolic execution **helps to generate** concrete input for next execution
 - increases coverage

Testing Data-structures of CUTE itself

- Unit tested several non-standard data-structures implemented for the CUTE tool
 - cu_depend (used to determine dependency during constraint solving using graph algorithm)
 - cu_linear (linear symbolic expressions)
 - cu_pointer (pointer symbolic expressions)
- Discovered a few memory leaks and a couple of segmentation faults
 - these errors did not show up in other uses of CUTE
 - for memory leaks we used CUTE in conjunction with Valgrind

SGLIB: popular library for C data-structures

- Used in Xrefactory a commercial tool for refactoring C/C++ programs
- Found **two bugs** in sglib 1.0.1
 - reported them to authors
 - fixed in sglib 1.0.2
- Bug 1:
 - doubly-linked list library
 - segmentation fault occurs when a non-zero length list is concatenated with a zero-length list
 - discovered in 140 iterations (< 1second)
- Bug 2:
 - hash-table
 - an infinite loop in hash table is member function
 - 193 iterations (1 second)

Simultaneous Symbolic & Concrete Execution

```
void again_test_me(int x,int y){    ■ Let initially x = -3 and y = 7  
    z = x*x*x + 3*x*x + 9;  
    generated by random test-  
    if(z != y){  
        driver  
        printf("Good branch");  
    } else {  
        printf("Bad branch");  
        abort();  
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- take then branch with constraint $x*x*x+ 3*x*x+9 \neq y$

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- solve $x*x*x+ 3*x*x+9 = y$ to take else branch
- Don't know how to solve !!
 - **Stuck ?**

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- solve $x*x*x+ 3*x*x+9 = y$ to take else branch
- Don't know how to solve !!
 - Stuck ?
 - NO : CUTE handles this smartly

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 - cannot handle symbolic value of z

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 - cannot handle symbolic value of z
 - make symbolic $z = 9$ and proceed

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- take then branch with constraint $9 \neq y$

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- solve $9 = y$ to take else branch
- execute next run with $x = -3$ and $y= 9$
 - got error (reaches abort)

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```

Replace symbolic expression by concrete value when symbolic expression becomes unmanageable (i.e. non-linear)

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 - cannot handle symbolic value of z
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    if(z != y){  
        printf("Good branch");  
    } else {  
        printf("Bad branch");  
        abort();  
    }  
}  
  
z = black_box_fun(x);  
if(z != y){  
    printf("Good branch");  
} else {  
    printf("Bad branch");  
    abort();  
}
```

Related Work

- “DART: Directed Automated Random Testing” by Patrice Godefroid, Nils Klarlund, and Koushik Sen (PLDI’05)
 - handles only arithmetic constraints
- CUTE
 - Supports C with
 - **pointers, data-structures**
 - Highly efficient constraint solver
 - **100 -1000 times faster**
 - arithmetic, pointers
 - Provides Bounded Depth-First Search and Random Search strategies
 - Publicly available tool that works on ALL C programs

Discussion

- CUTE is
 - light-weight
 - dynamic analysis (compare with static analysis)
 - ensures no false alarms
 - concrete execution and symbolic execution run simultaneously
 - symbolic execution consults concrete execution whenever dynamic analysis becomes intractable
 - real tool that works on all C programs
 - completely automatic
- Requires actual code that can be fully compiled
- Can sometime reduce to Random Testing
- Complementary to Static Analysis Tools

Current Work

Concurrency Support

- ❑ dynamic pruning to avoid exploring equivalent interleaving
- Application to find Dolev-Yao attacks in security protocols