



软件分析

动态符号执行和抽象解释

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提醒

- 下周上课前为课程项目组队截止日期



复习：符号执行

- 请列举符号执行不能得到精确结果的场景
- 有循环的情况
- 分支太多，在有限时间内探索不完的情况
- 约束求解失败的情况



约束求解失败的情况

- 形成了复杂条件
 - $x^5 + 3x^3 == y$
 - `p->next->value == x`
- 调用了系统调用
 - `if (file.read()==x)`
- 动态符号执行
 - 混合程序的真实执行和符号执行
 - 在约束求解无法进行的时候，用真实值代替符号值
 - 如果真实值 $x=10$ ，则 $x^5 + 3x^3 == y$ 变为 $103000==y$ ，可满足



动态符号执行

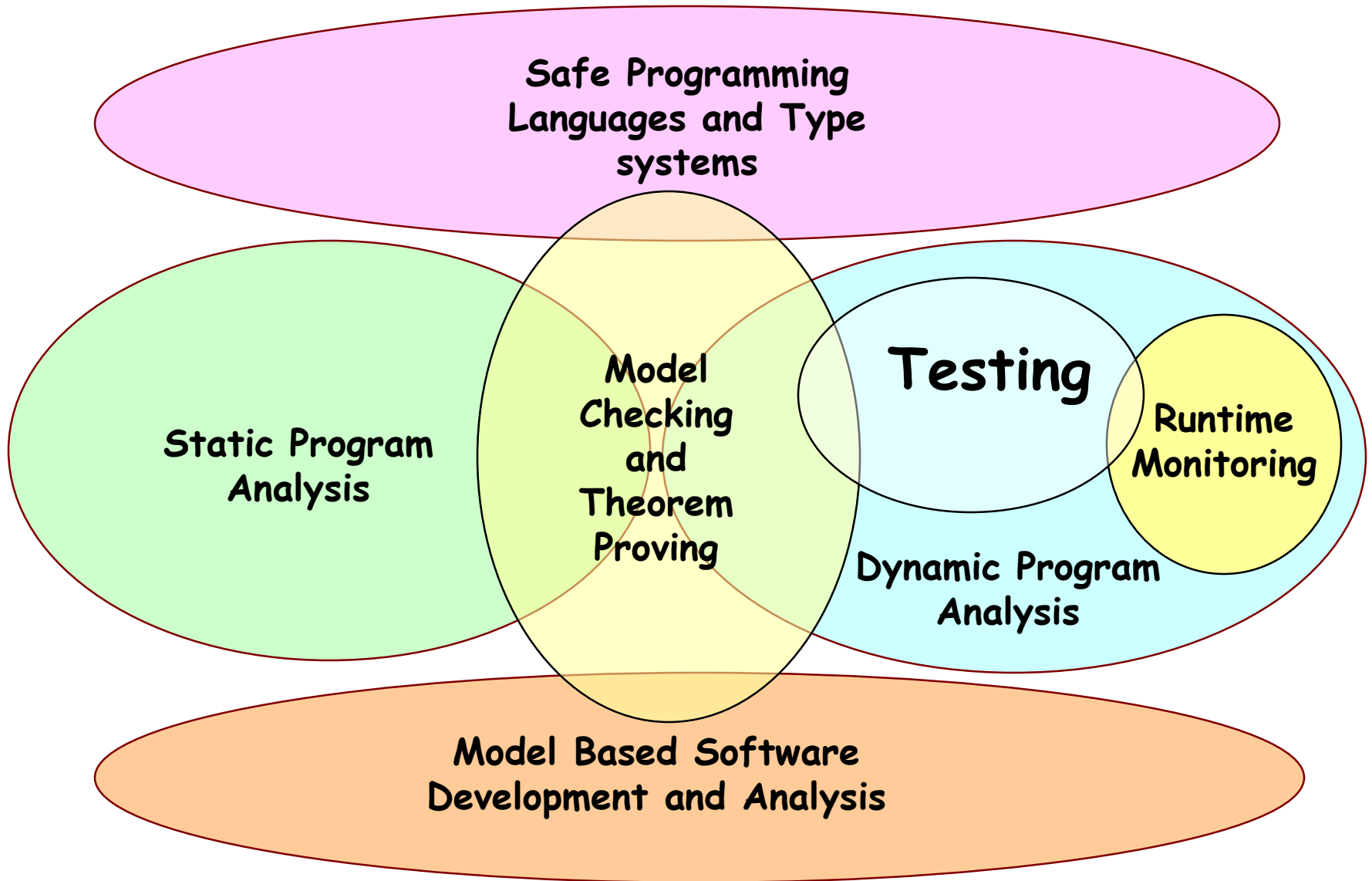
- 动态符号执行主要用于生成测试输入
- 代表性工作：
 - Concolic Testing, Koushik Sen
 - 主要工具: CUTE
 - Execution-Generated Testing, Cristian Cadar
 - 主要工具: KLEE

DART and CUTE: Concolic Testing

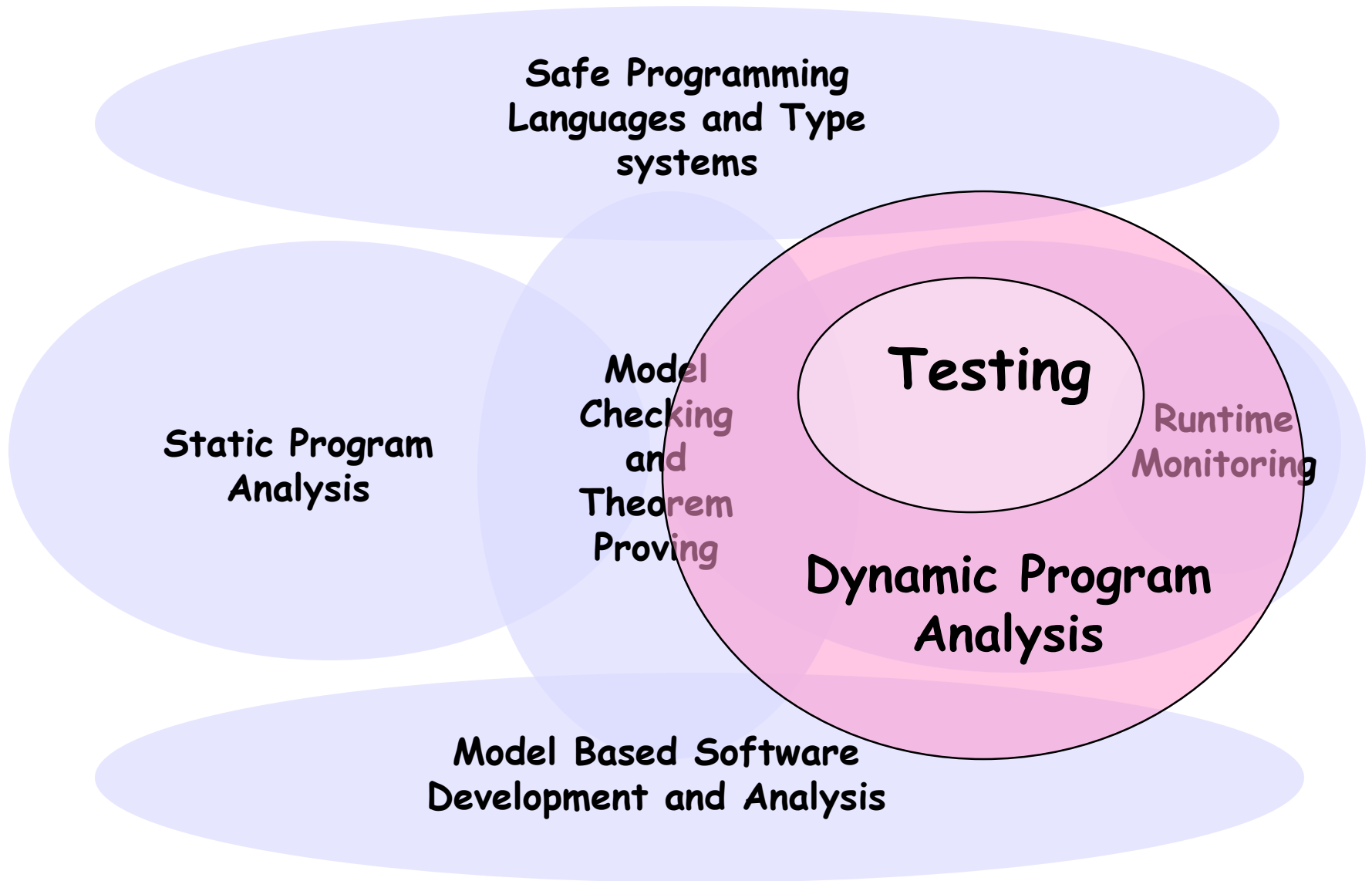
Koushik Sen
University of California, Berkeley

Joint work with Gul Agha, Patrice Godefroid, Nils Klarlund,
Rupak Majumdar, Darko Marinov

Big Picture



Big Picture



A Familiar Program: QuickSort

```
void quicksort (int[] a, int lo, int hi) {
    int i=lo, j=hi, h;
    int x=a[(lo+hi)/2];

    // partition
    do {
        while (a[i]<x) i++;
        while (a[j]>x) j--; if (i<=j) {
            h=a[i];
            a[i]=a[j];
            a[j]=h;
            i++;
            j--;
        }
    } while (i<=j);

    // recursion
    if (lo<j) quicksort(a, lo, j);
    if (i<hi) quicksort(a, i, hi);
}
```

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        }
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    // recursion
    if (lo<j) quicksort(a, lo, j);
    if (i<hi) quicksort(a, i, hi);
}
```

- Test QuickSort
 - Create an array
 - Initialize the elements of the array
 - Execute the program on this array
- How much confidence do I have in this testing method?
- Is my test suite *Complete*?
- Can someone generate a small and *Complete* test suite for me?

Automated Test Generation

- Studied since 70's
 - King 76, Myers 79
- 30 years have passed, and yet no effective solution
- **What Happened???**

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 - Program-analysis techniques were expensive
 - Automated theorem proving and constraint solving techniques were not efficient

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- In the recent years we have seen remarkable progress in static program-analysis and constraint solving
 - SLAM, BLAST, ESP, Bandera, Saturn, MAGIC

Automated Test Generation

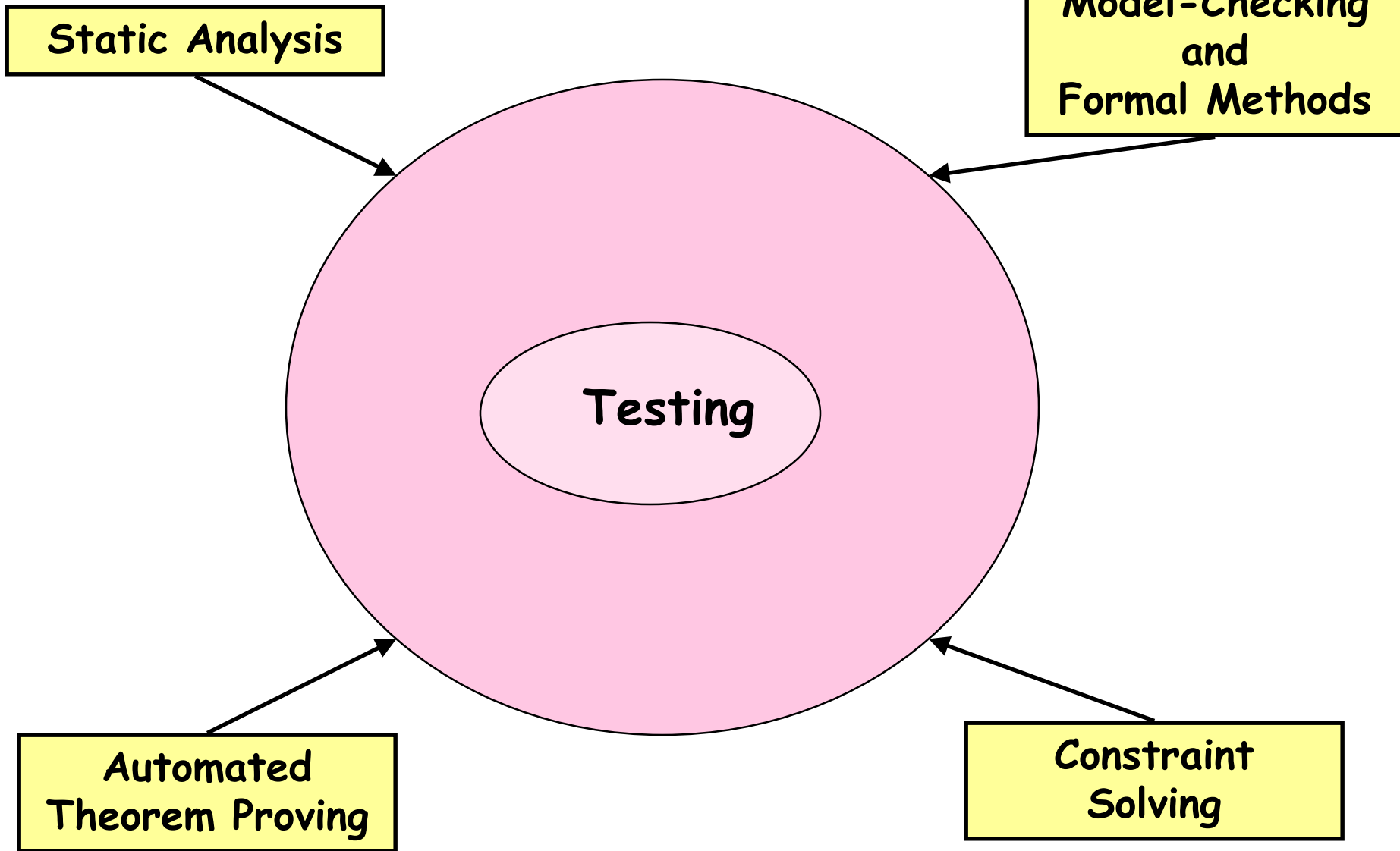
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King 76 Myers 70

Question: Can we use similar techniques in Automated Testing?

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Systematic Automated Testing



CUTE and DART

- Combine **random testing** (concrete execution) and **symbolic testing** (symbolic execution)

[PLDI'05, FSE'05, FASE'06, CAV'06, ISSTA'07, ICSE'07]

Concrete + Symbolic = Concolic

Goal

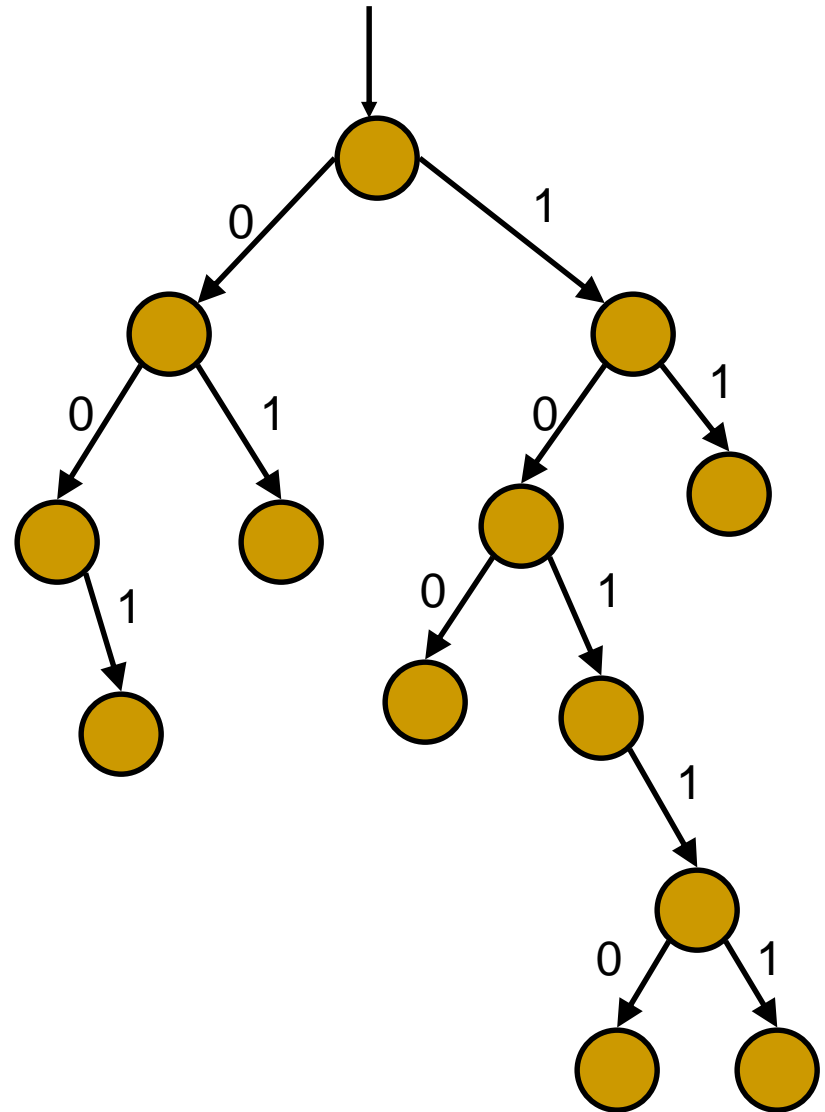
- Automated Unit Testing of real-world C and Java Programs
 - Generate test inputs
 - Execute unit under test on generated test inputs
 - so that all reachable statements are executed
 - Any assertion violation gets caught

Goal

- Automated Unit Testing of real-world C and Java Programs
 - Generate test inputs
 - Execute unit under test on generated test inputs
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 - 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

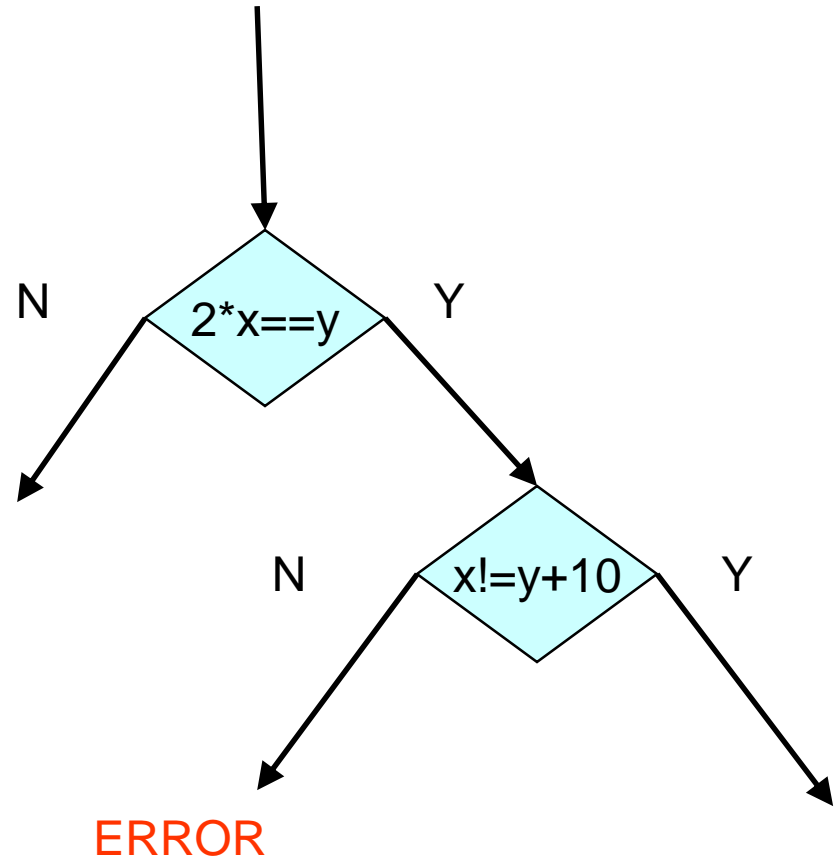
Execution Paths of a Program

- 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;  
    }  
  }  
}
```



Concolic Testing: Finding Security and Safety Bugs

Divide by 0 Error

$x = 3 / i;$

Buffer Overflow

$a[i] = 4;$

Concolic Testing: Finding Security and Safety Bugs

**Key: Add Checks Automatically and
Perform Concolic Testing**

Divide by 0 Error

```
if (i != 0)
    x = 3 / i;
else
    ERROR;
```

Buffer Overflow

```
if (0 <= i && i < a.length)
    a[i] = 4;
else
    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

Existing Approach II

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 - use symbolic values for input variables
 - execute the program symbolically on symbolic input values
 - collect symbolic path constraints
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- **Does not scale** for large programs

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test_me(int x){  
    if(bbox(x)!=17){  
        ERROR;  
    } else {  
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```

Symbolic execution will say both branches are reachable:

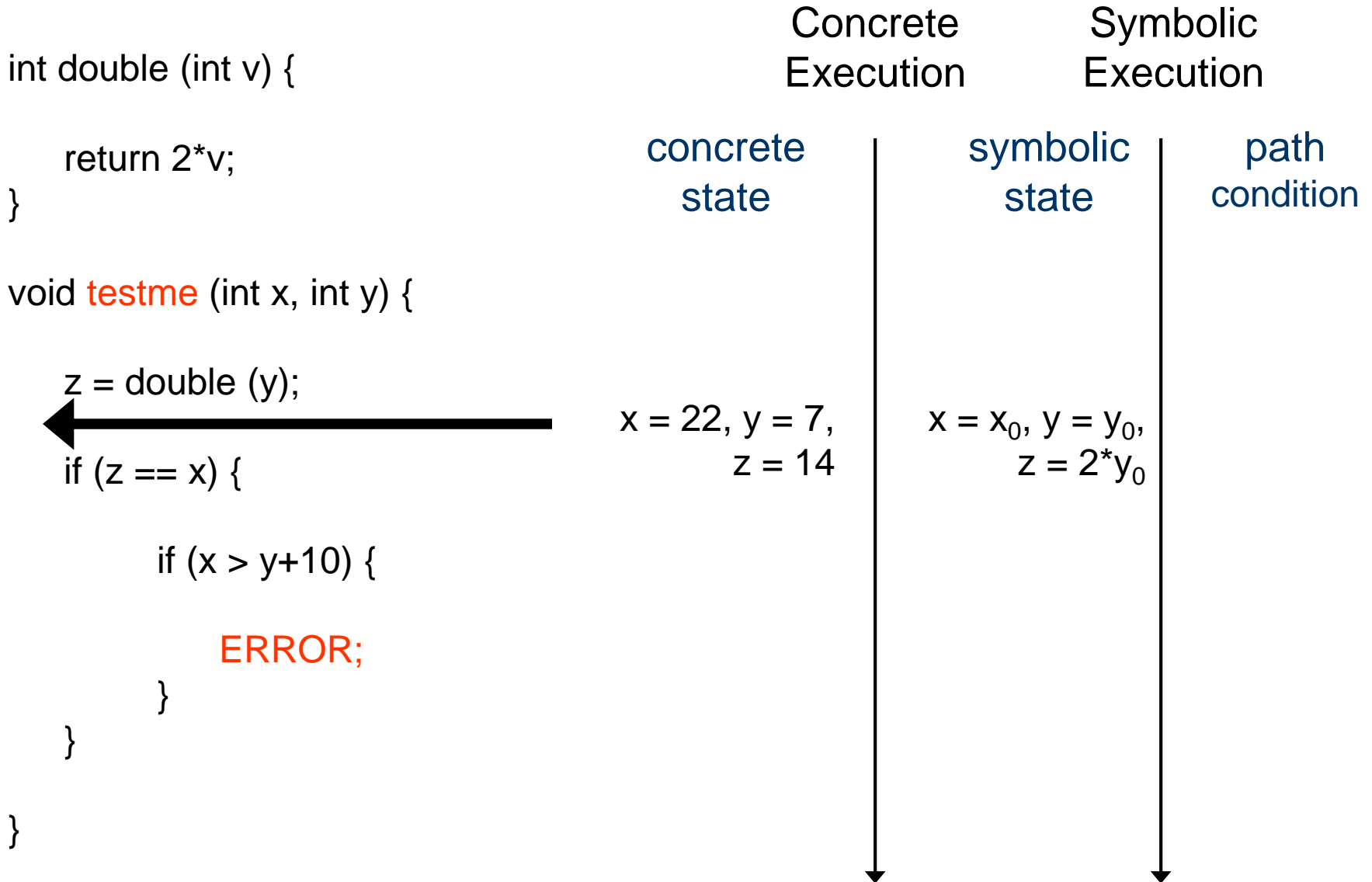
False positive

Concolic Testing Approach

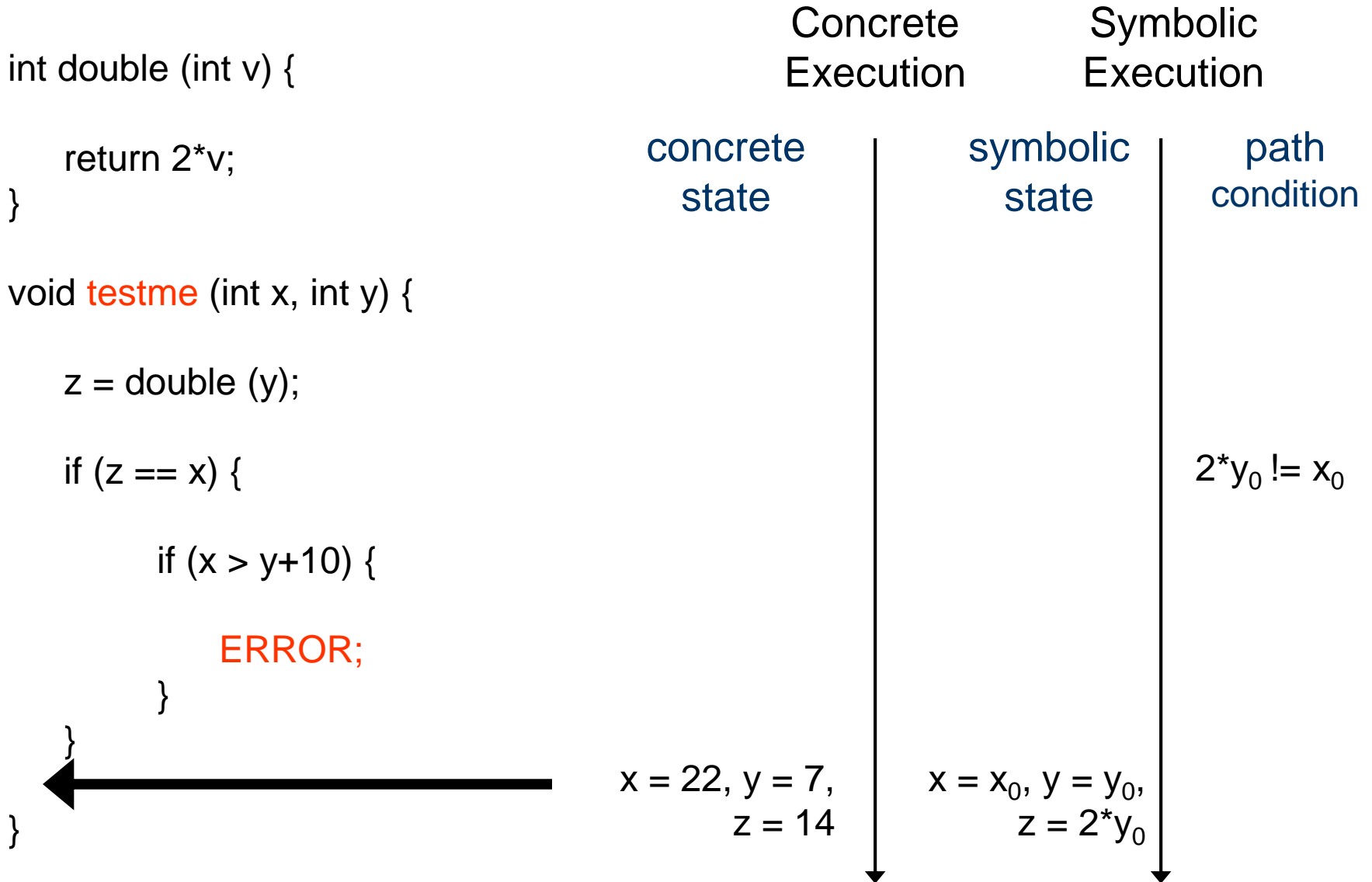
```
int double (int v) {  
    return 2*v;  
}  
  
void testme (int x, int y) {  
    z = double (y);  
    if (z == x) {  
        if (x > y+10) {  
            ERROR;  
        }  
    }  
}
```

- Random Test Driver:
 - random value for x and y
- Probability of reaching **ERROR** is extremely low

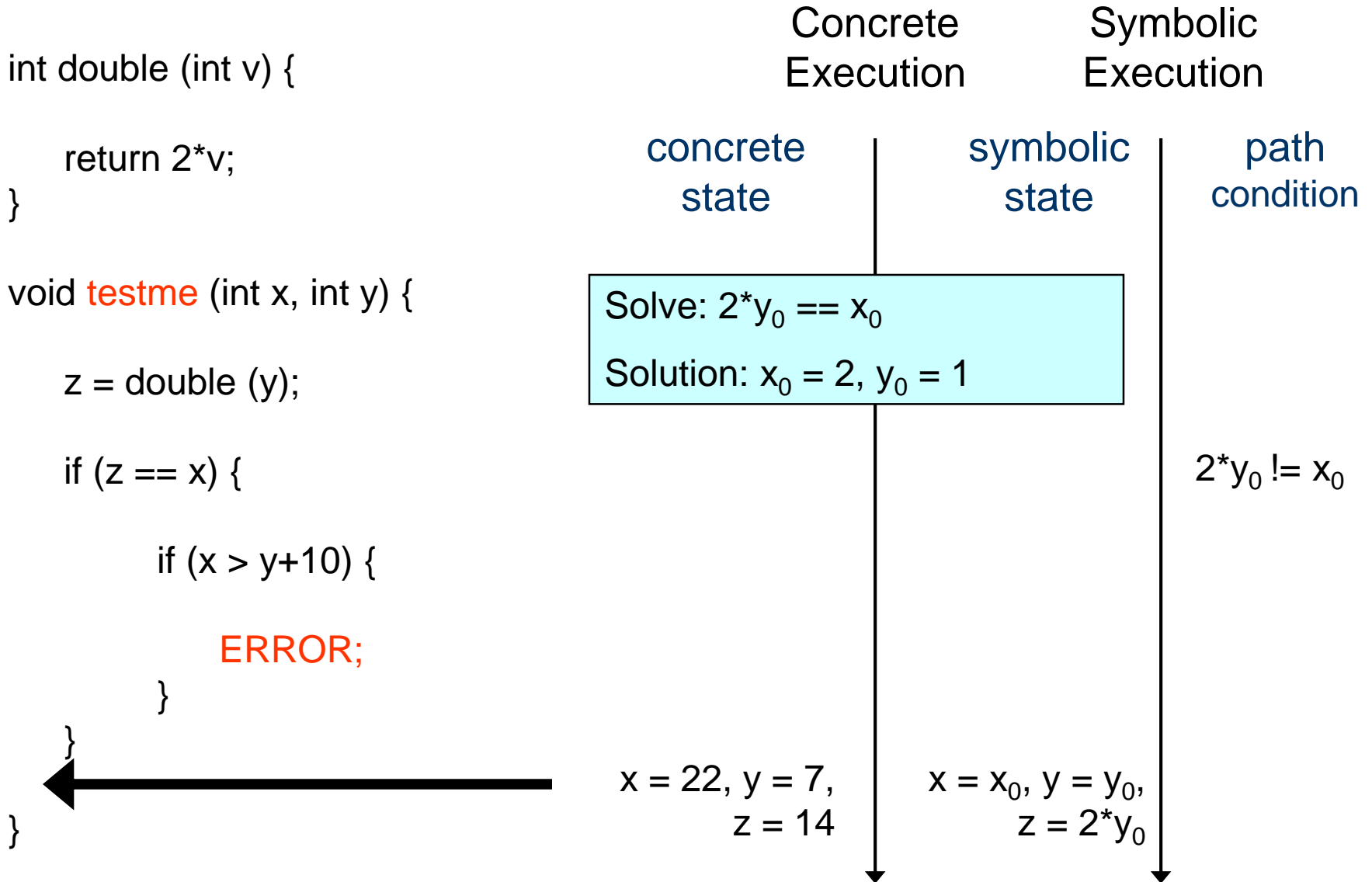
Concolic Testing Approach



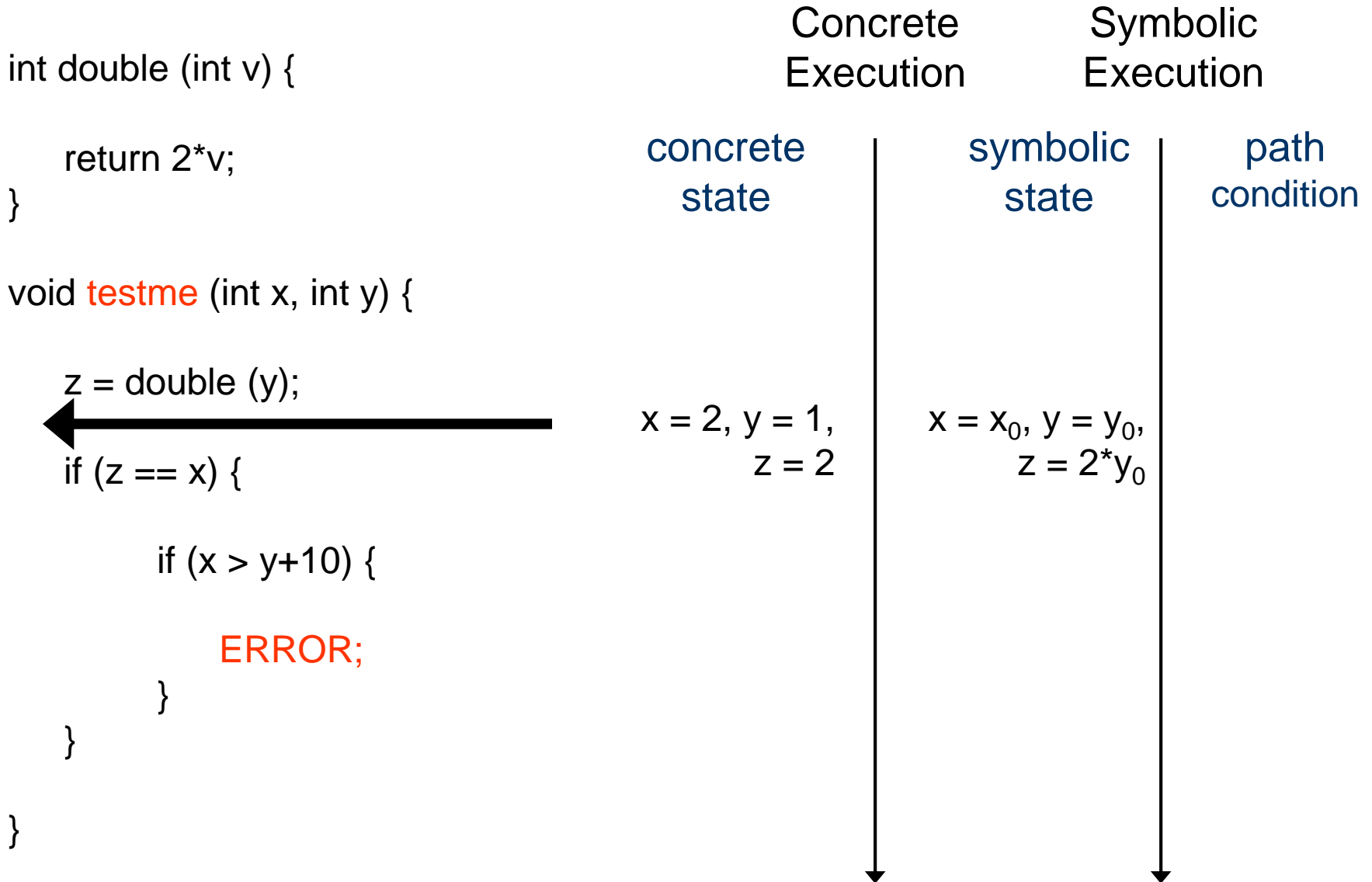
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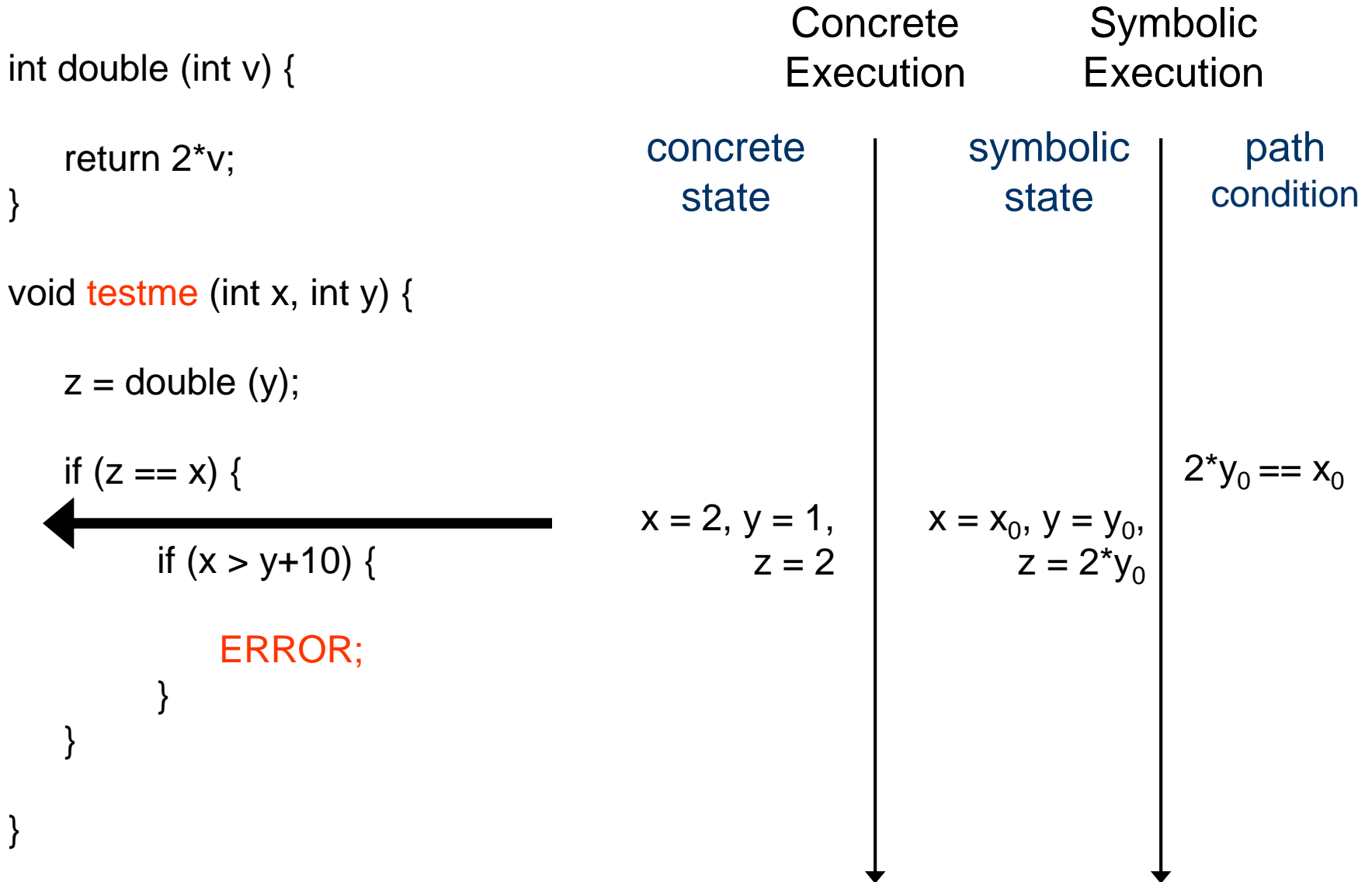
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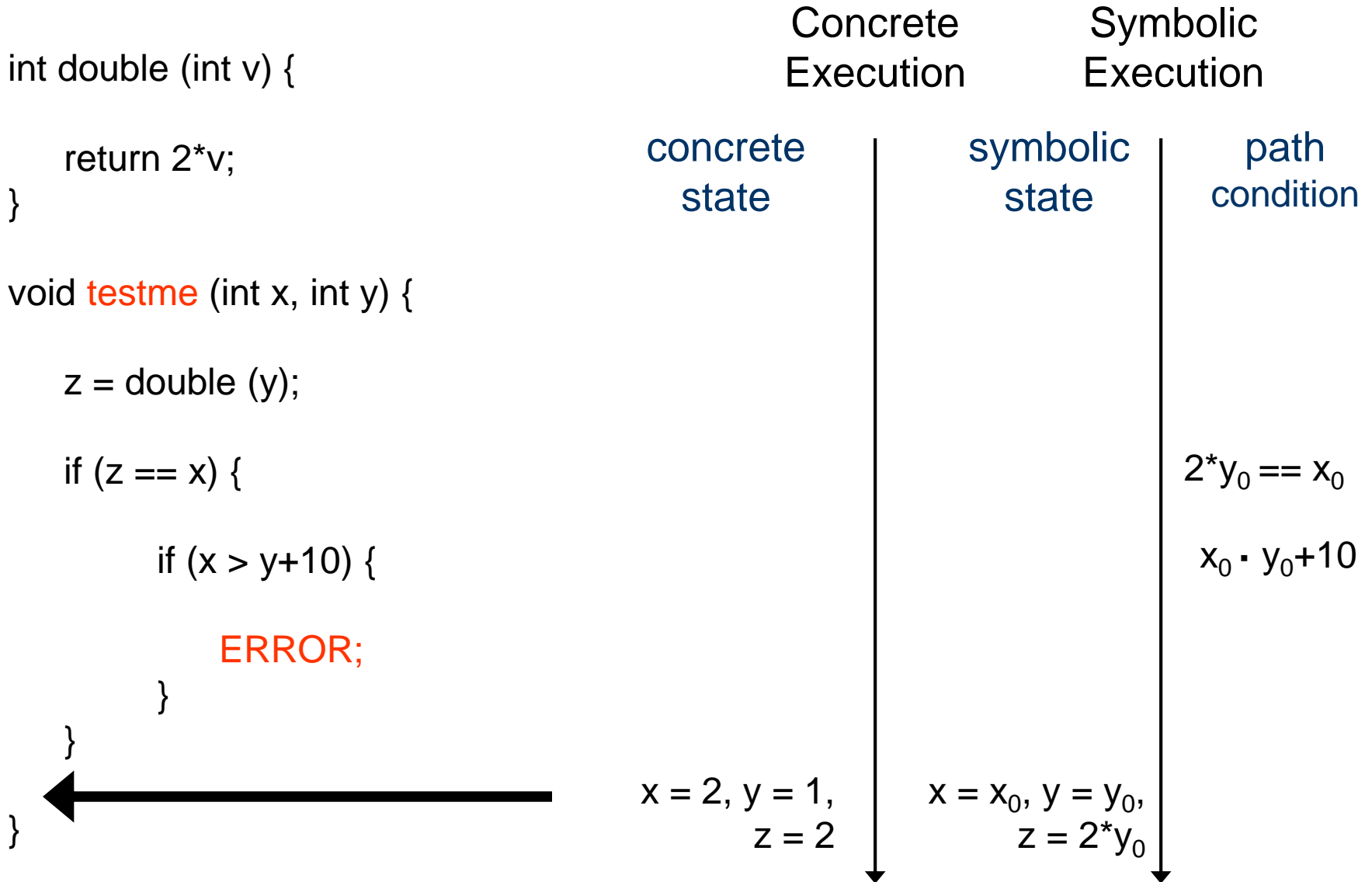
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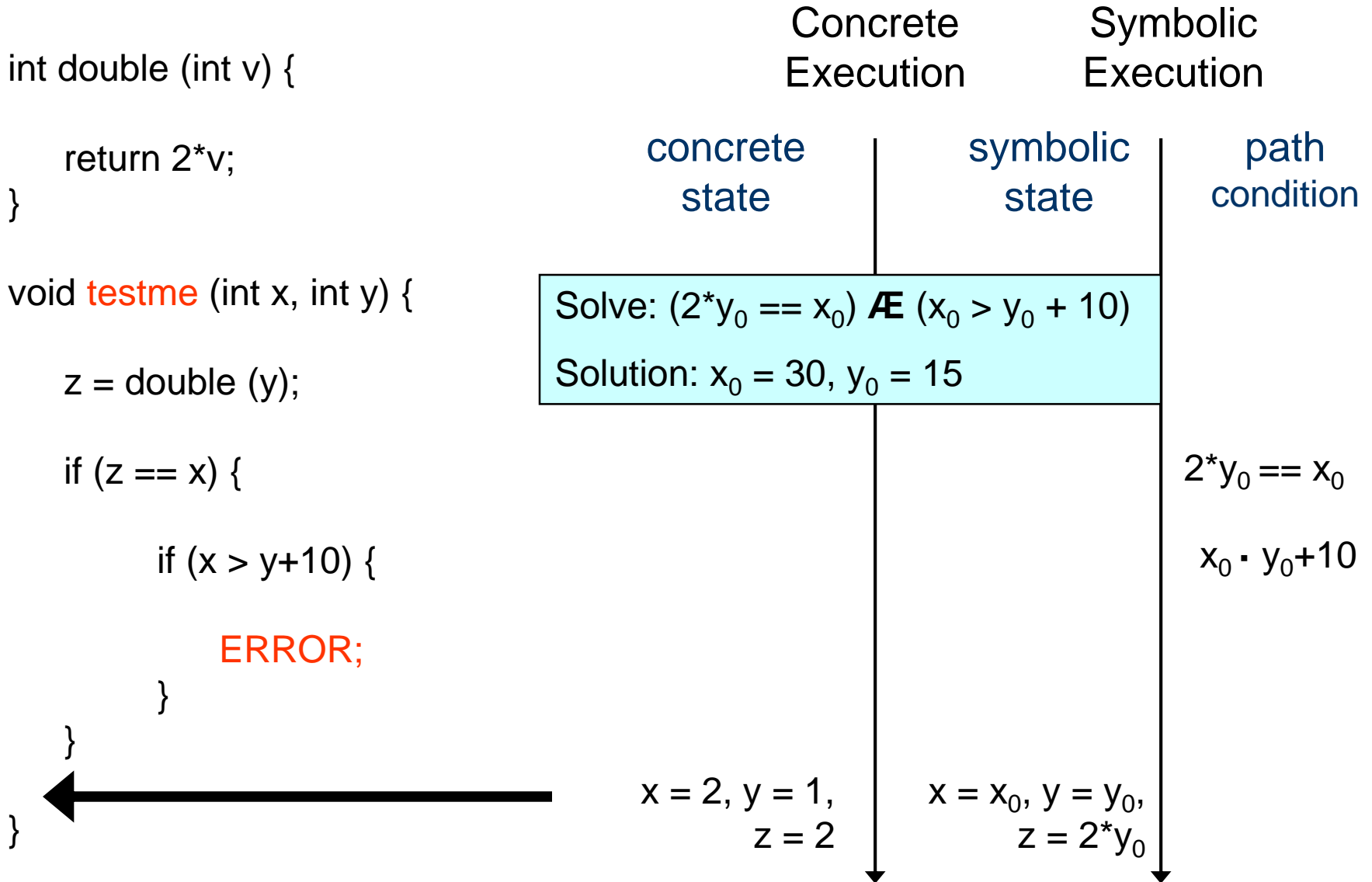
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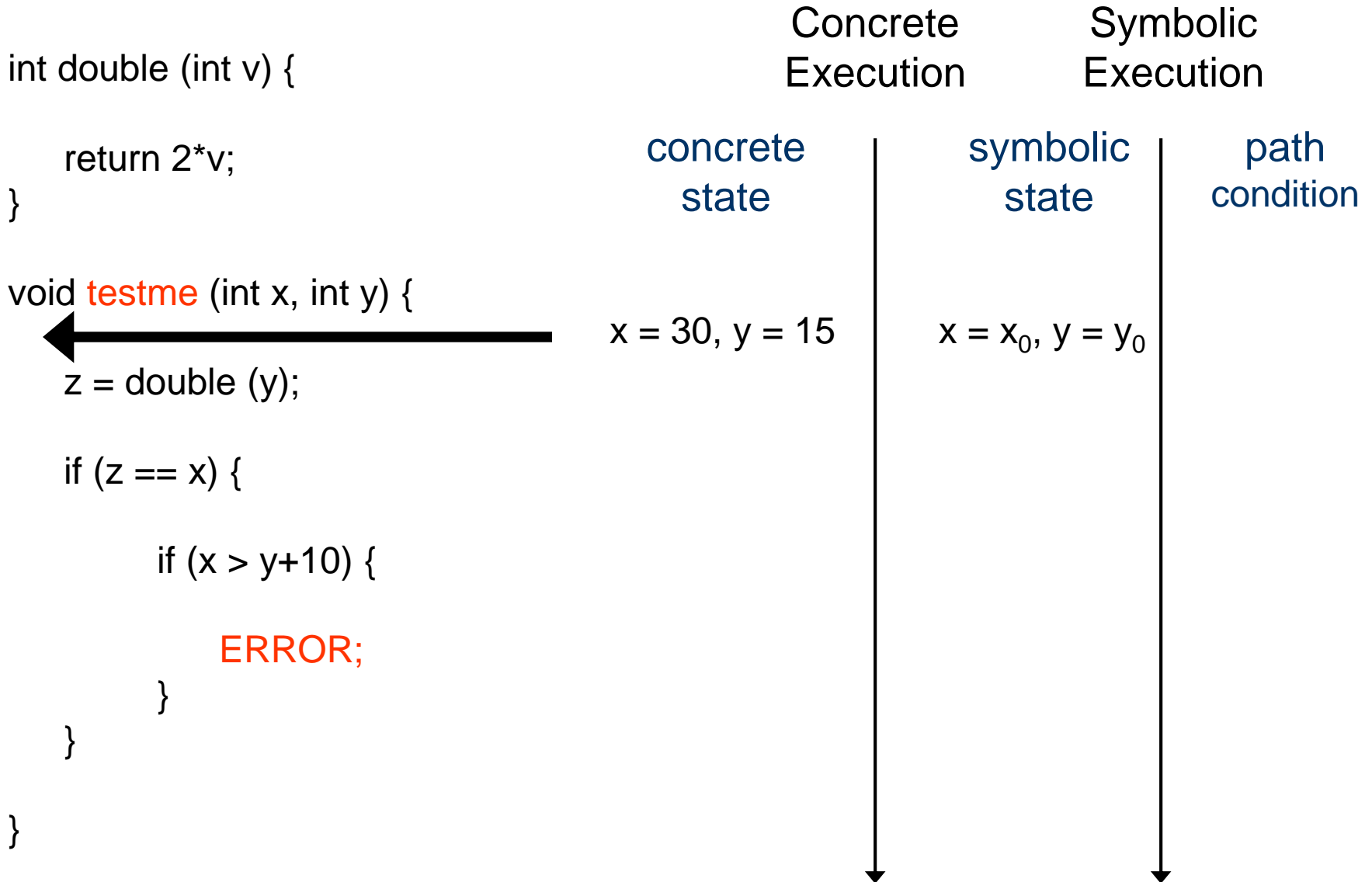
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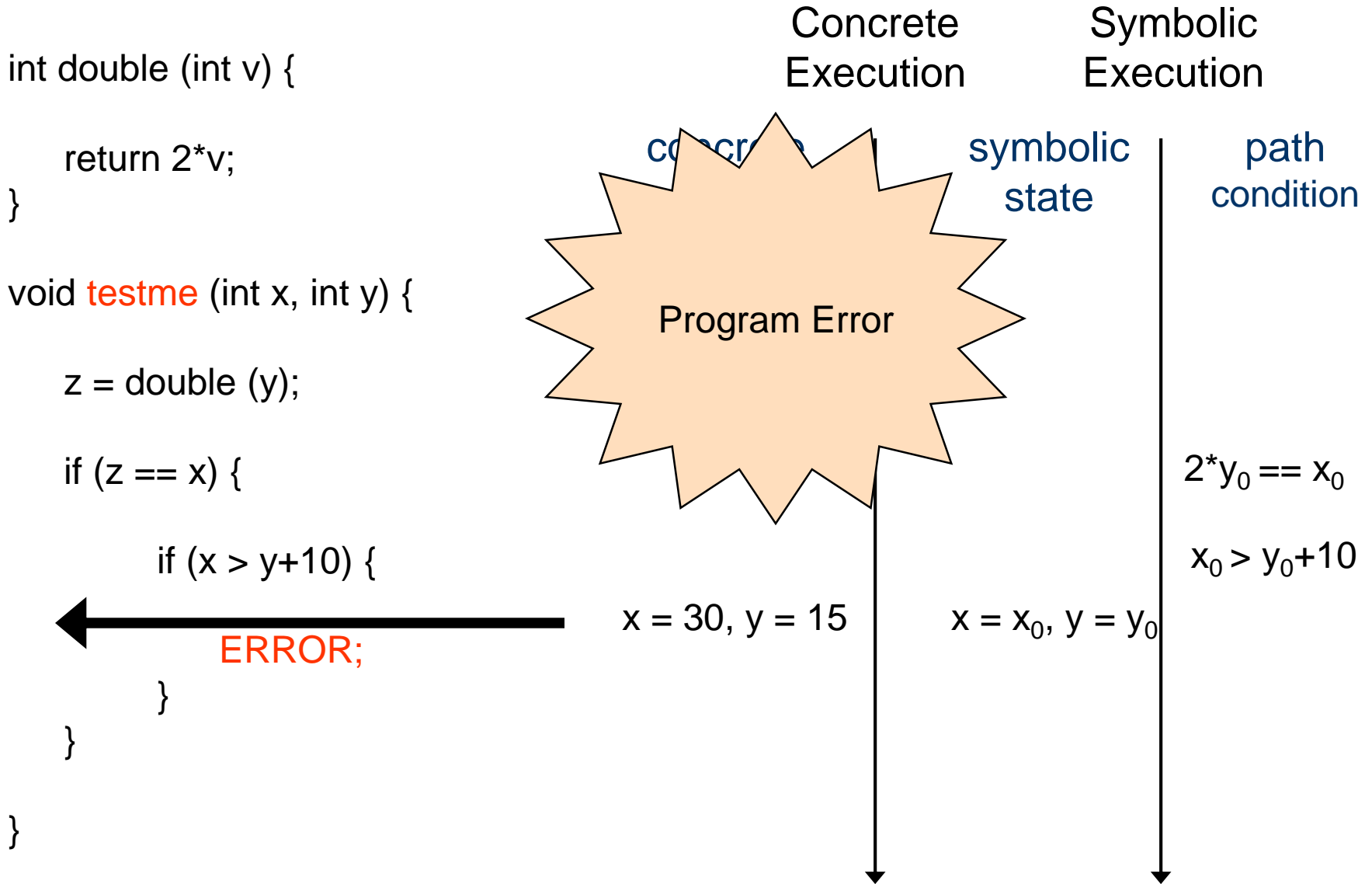
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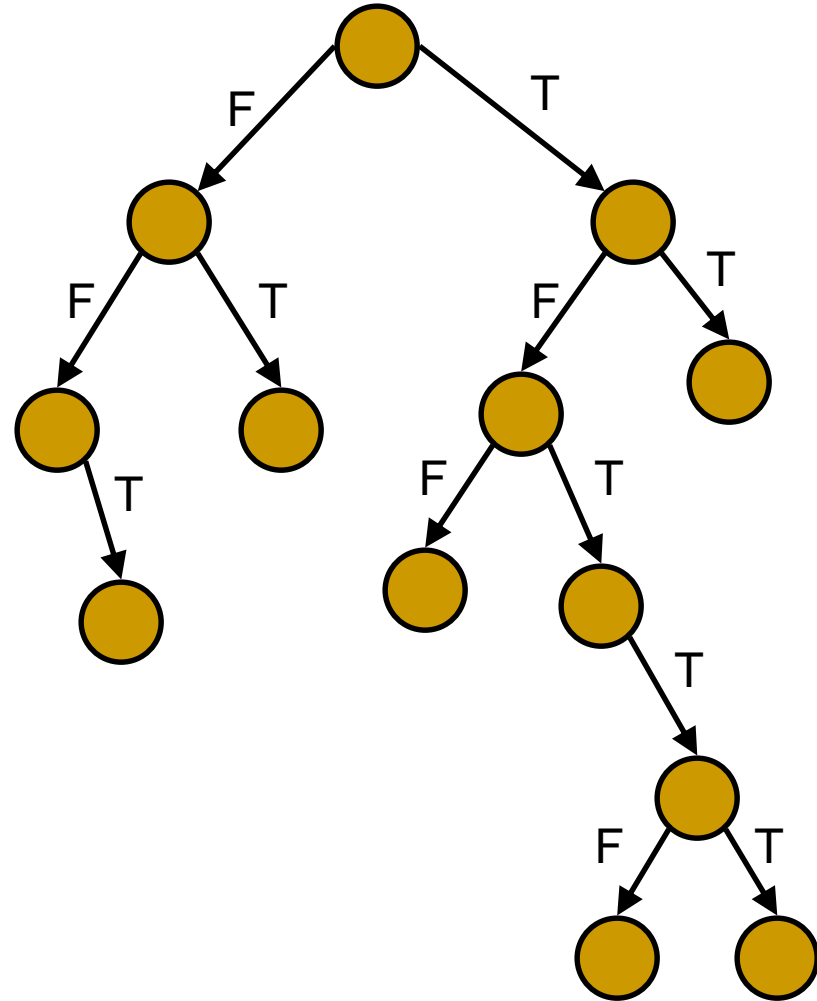


Concolic Testing Approach



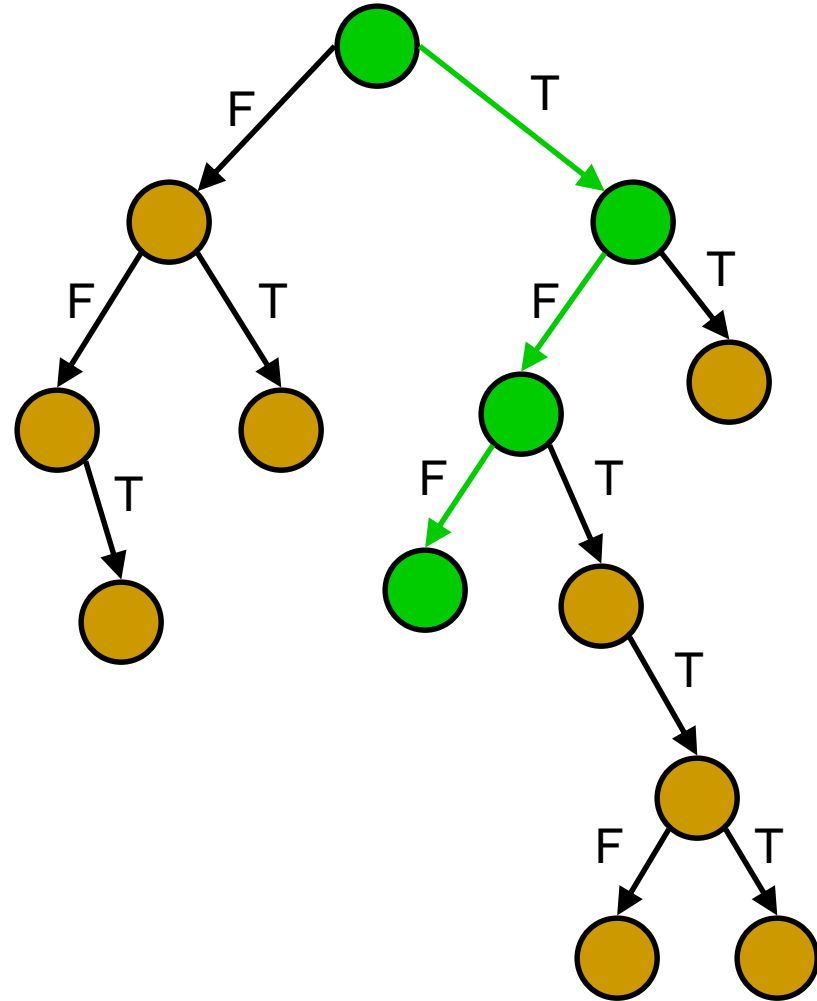
Explicit Path (not State) Model Checking

- Traverse all execution paths one by one to detect errors
 - assertion violations
 - program crash
 - uncaught exceptions
- combine with `valgrind` to discover **memory errors**



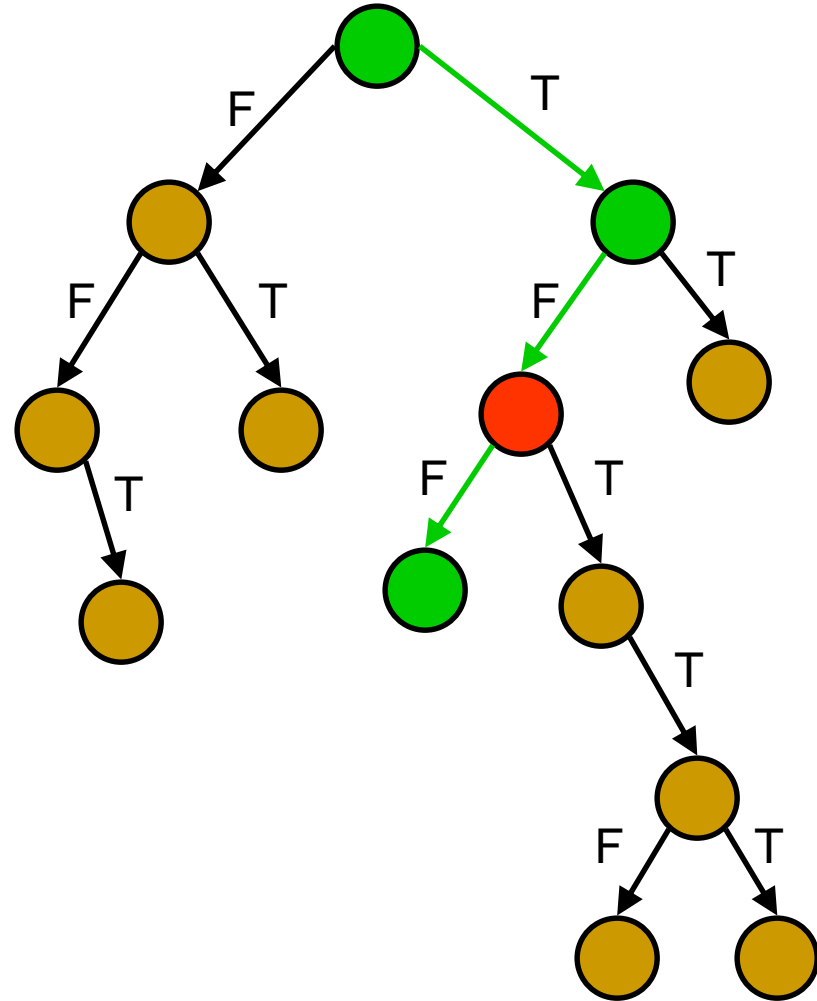
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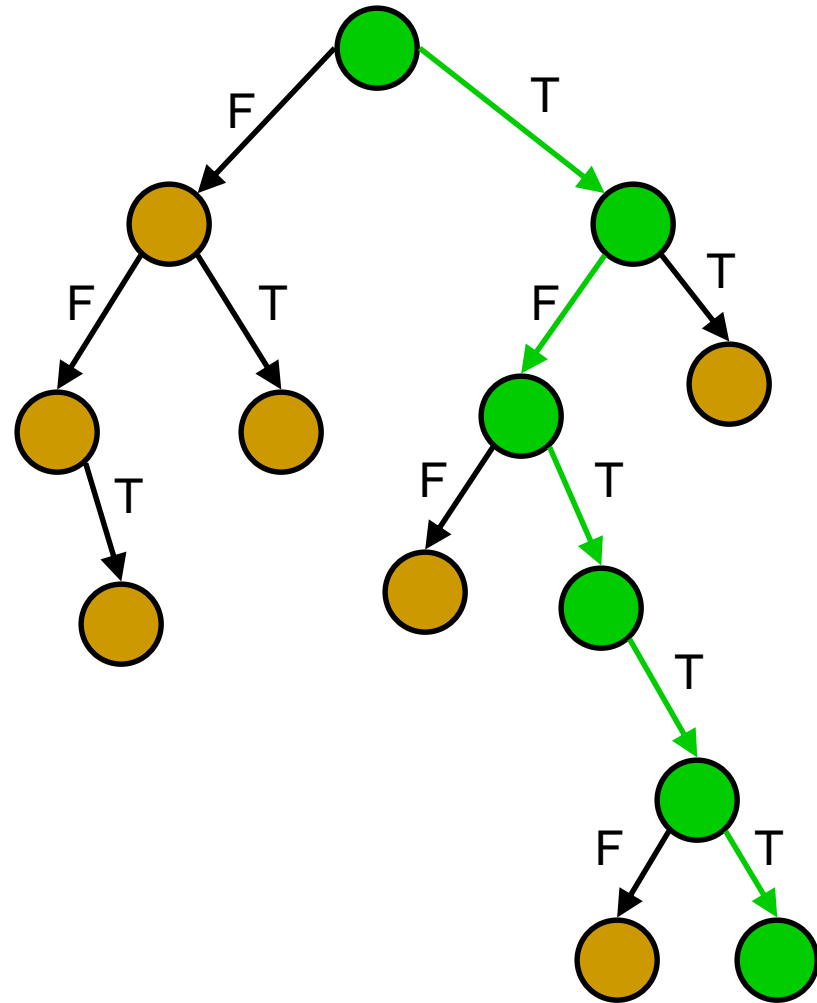
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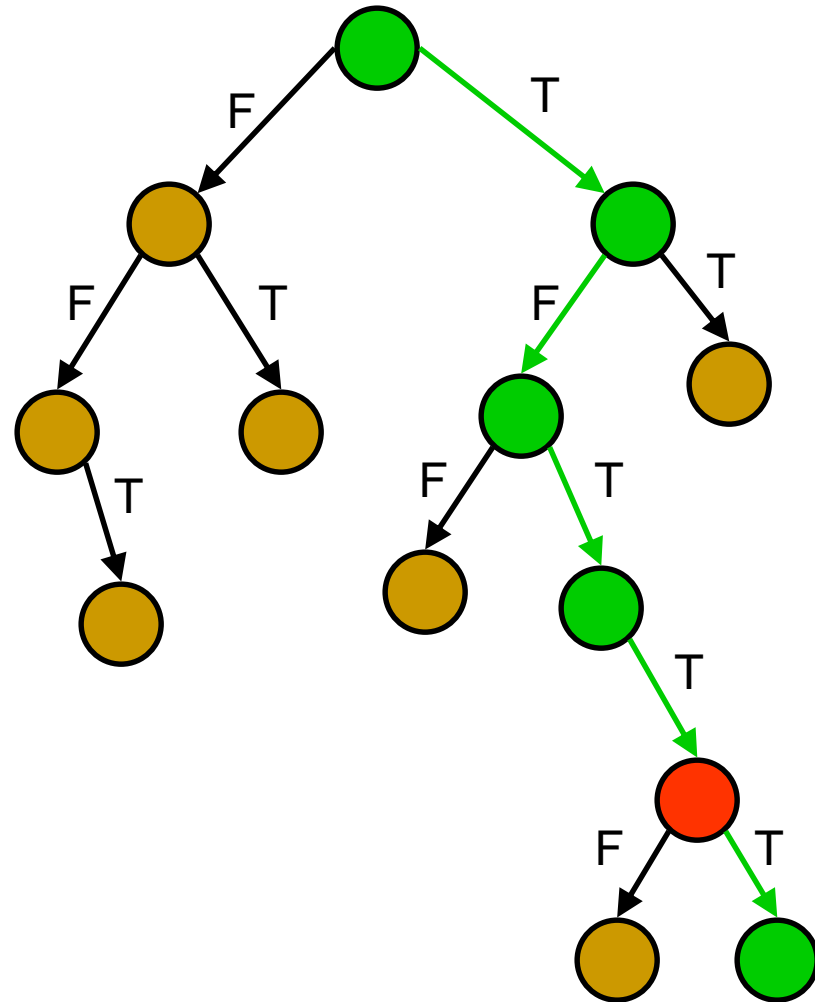
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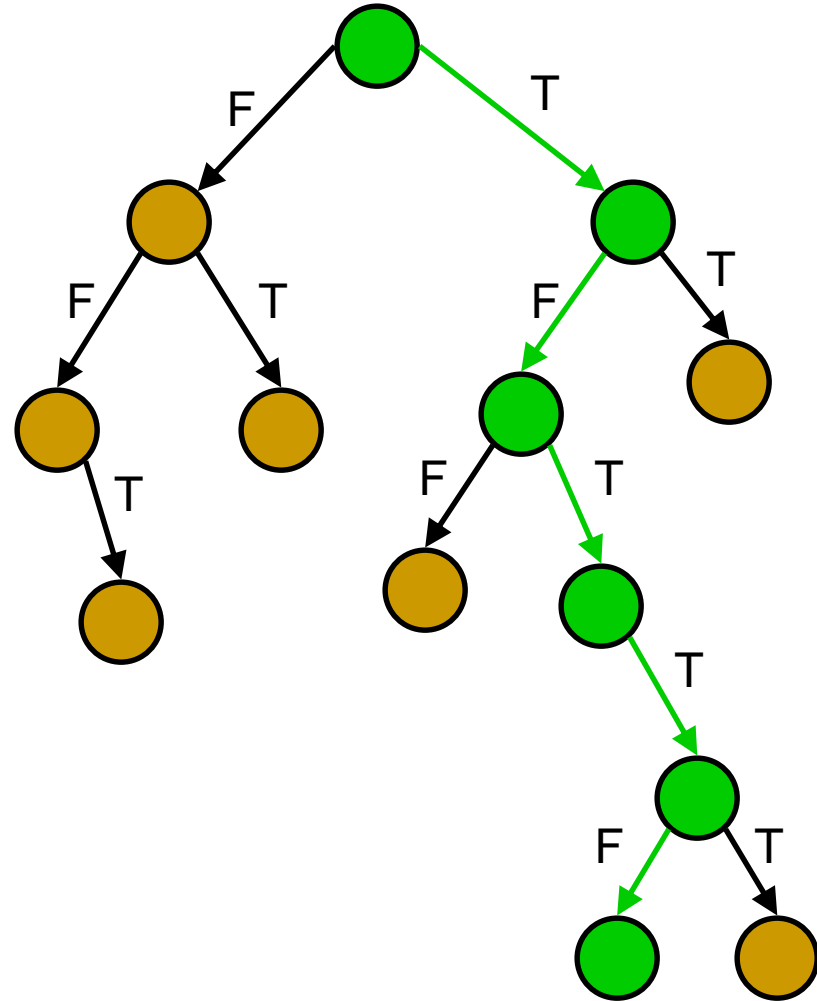
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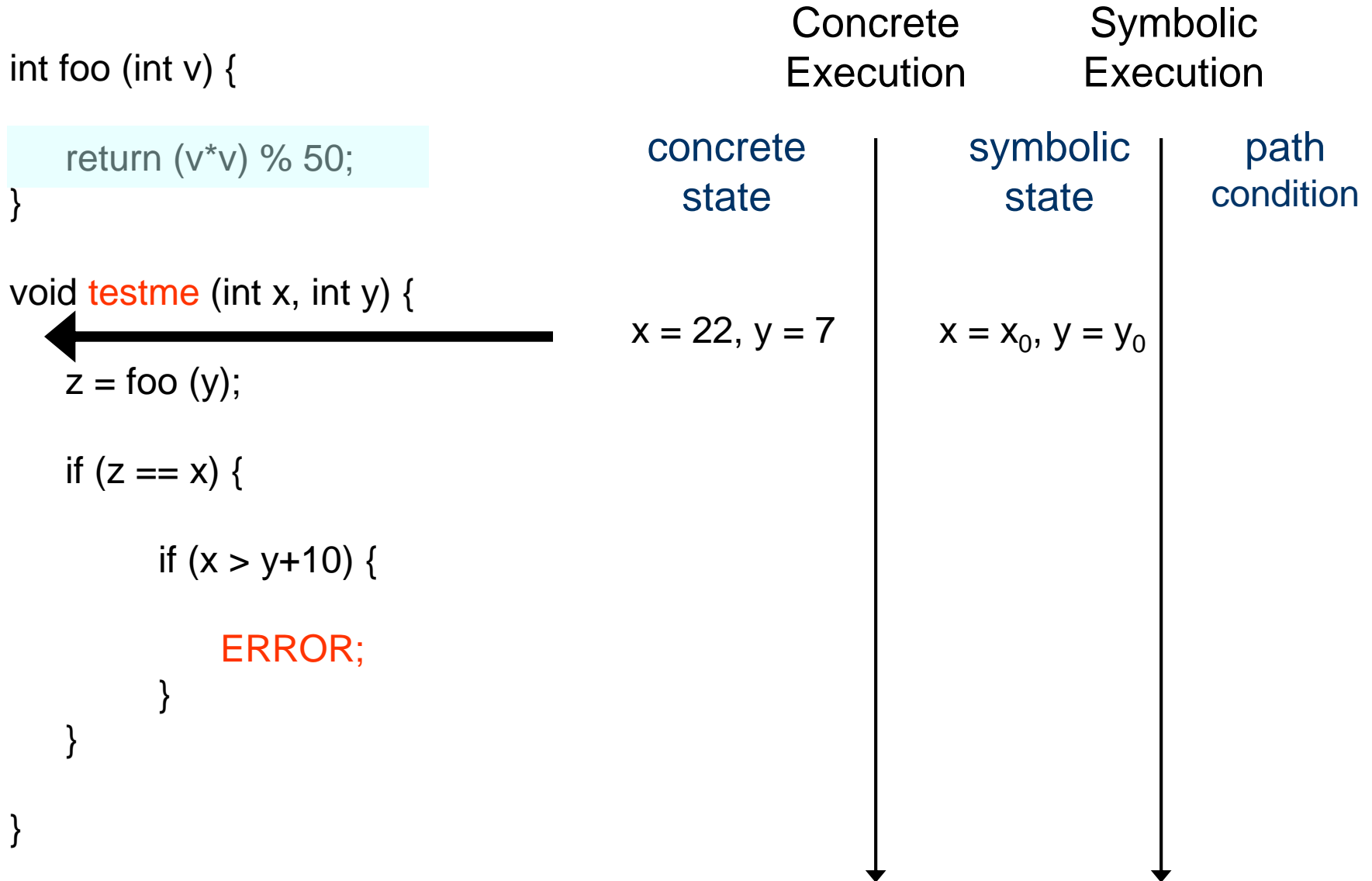


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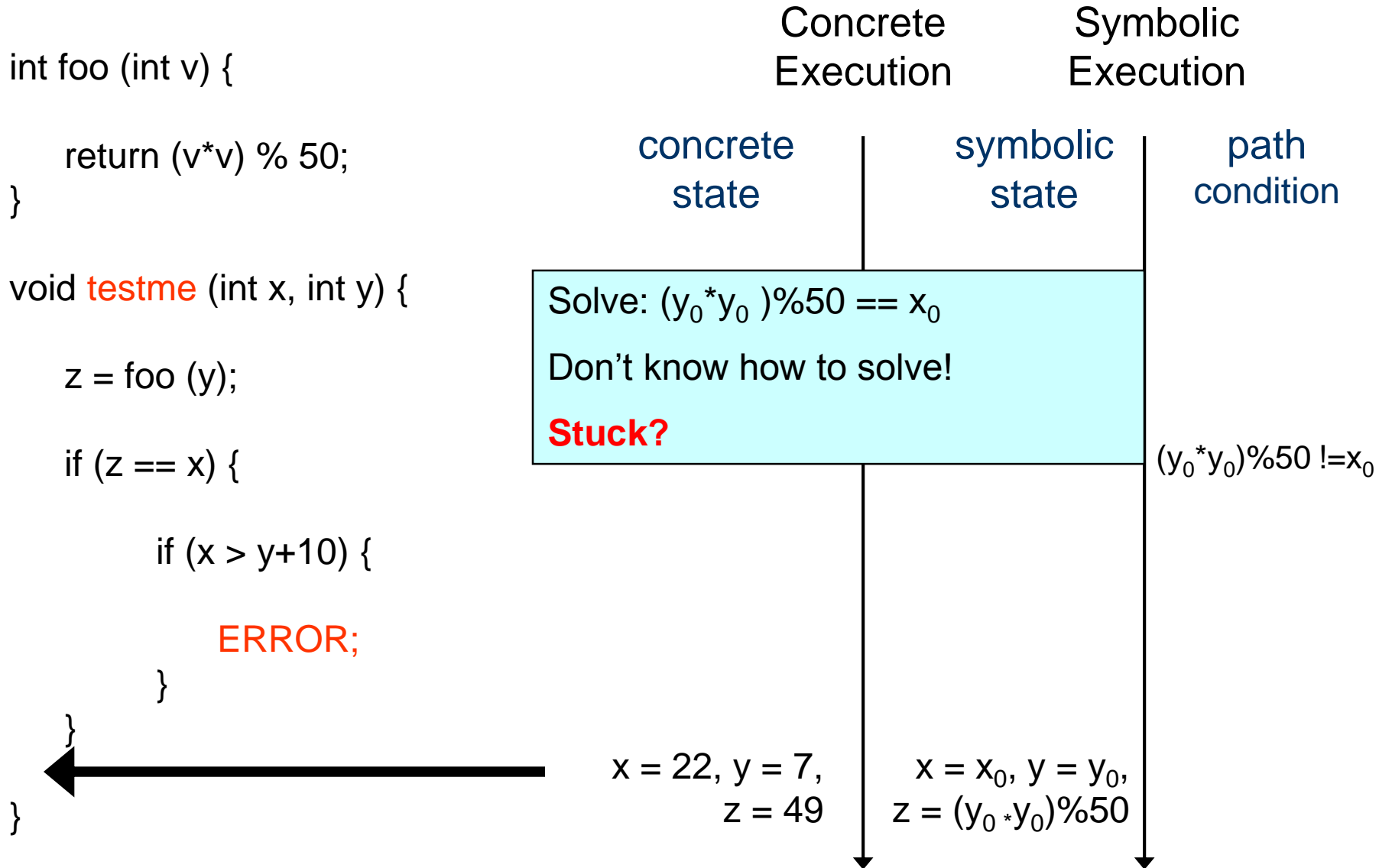
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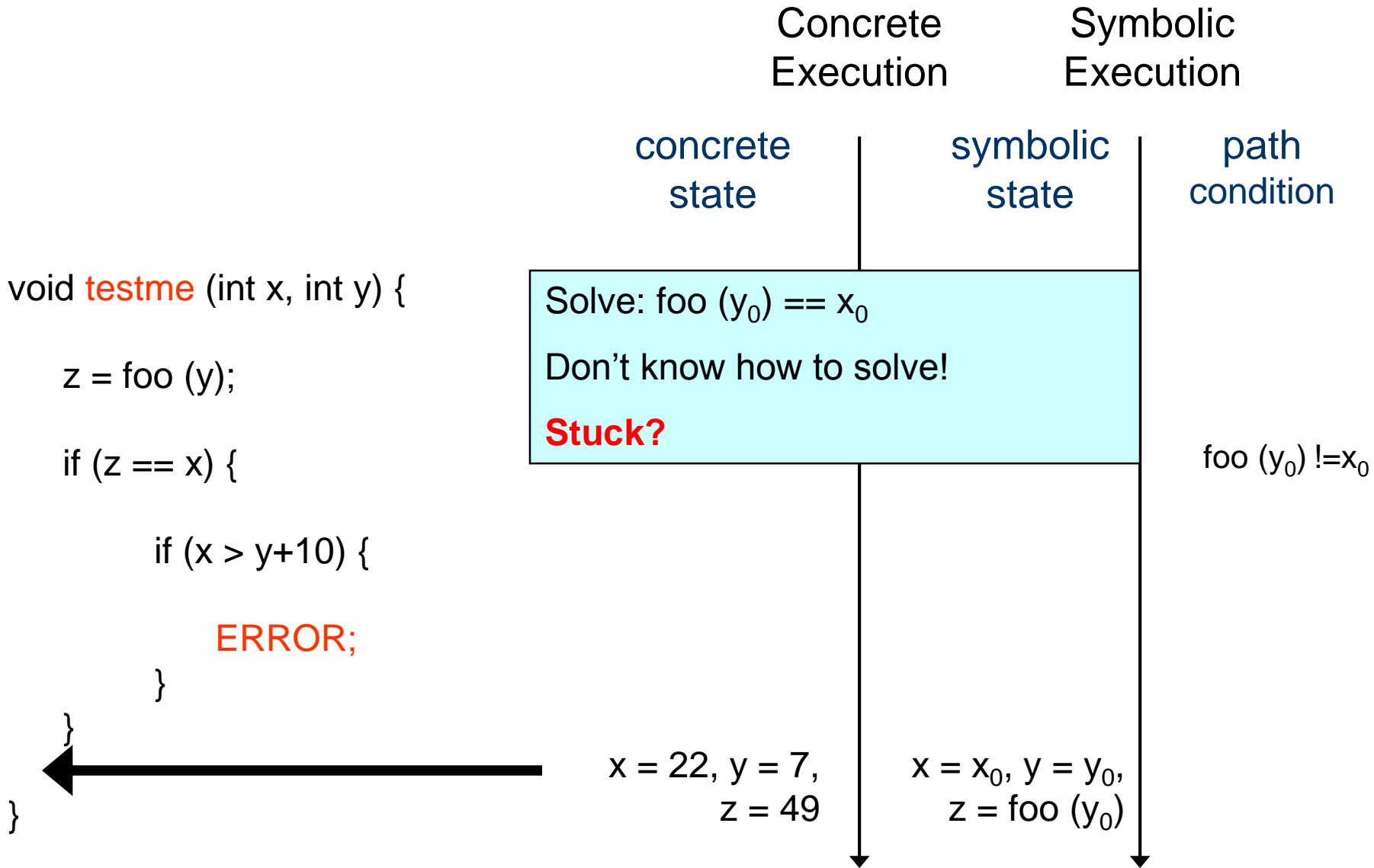
Novelty : Simultaneous Concrete and Symbolic Execution



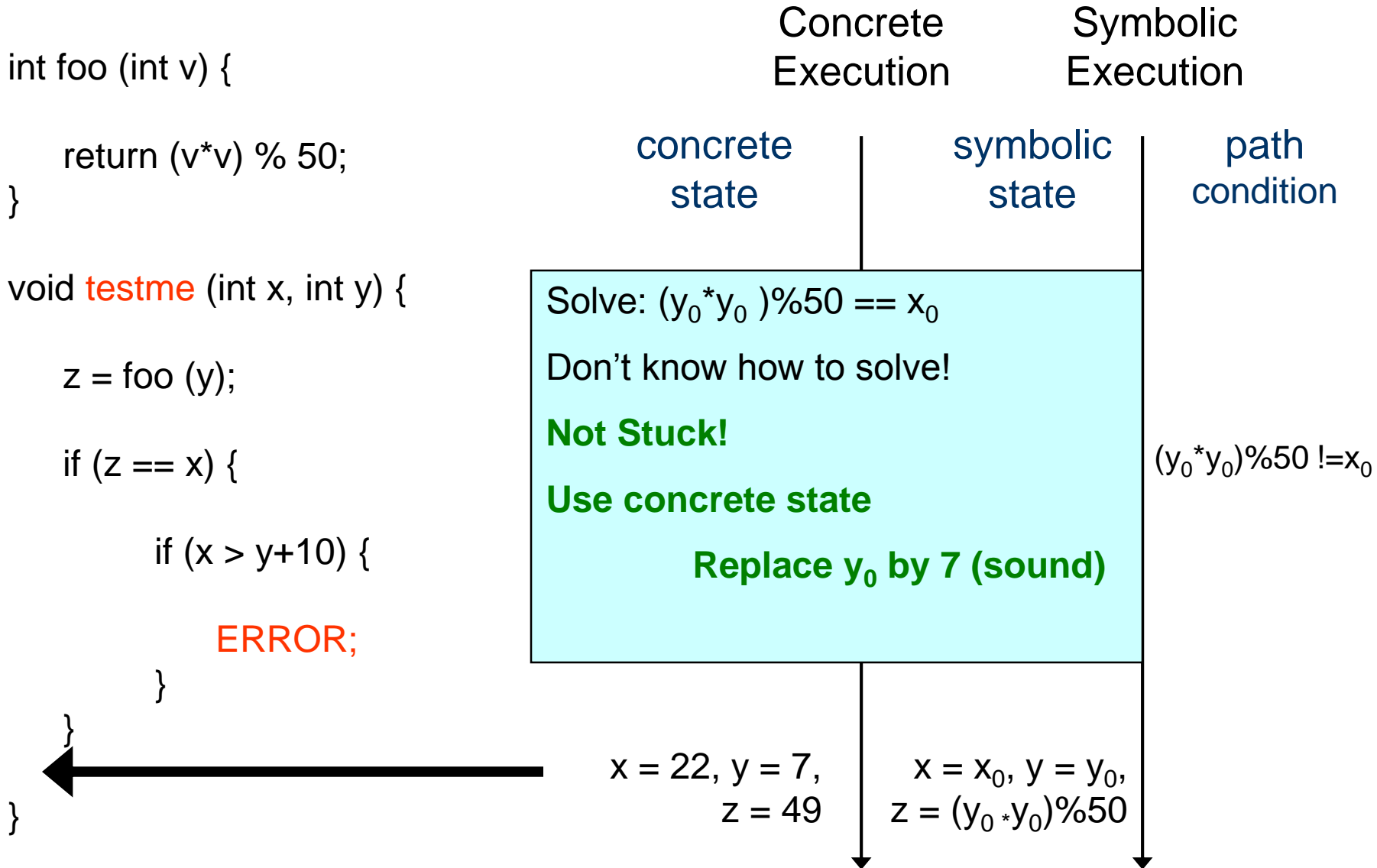
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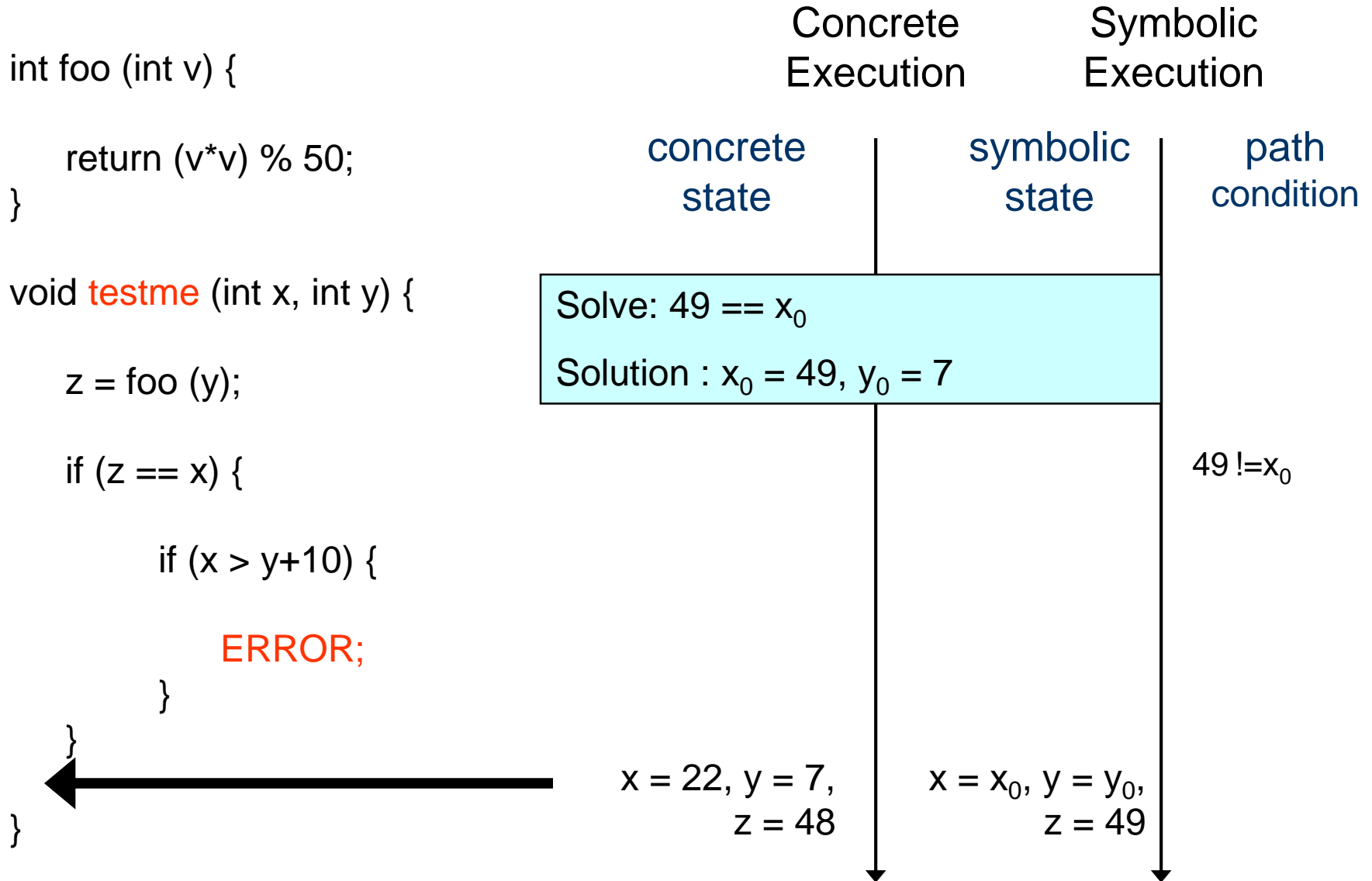
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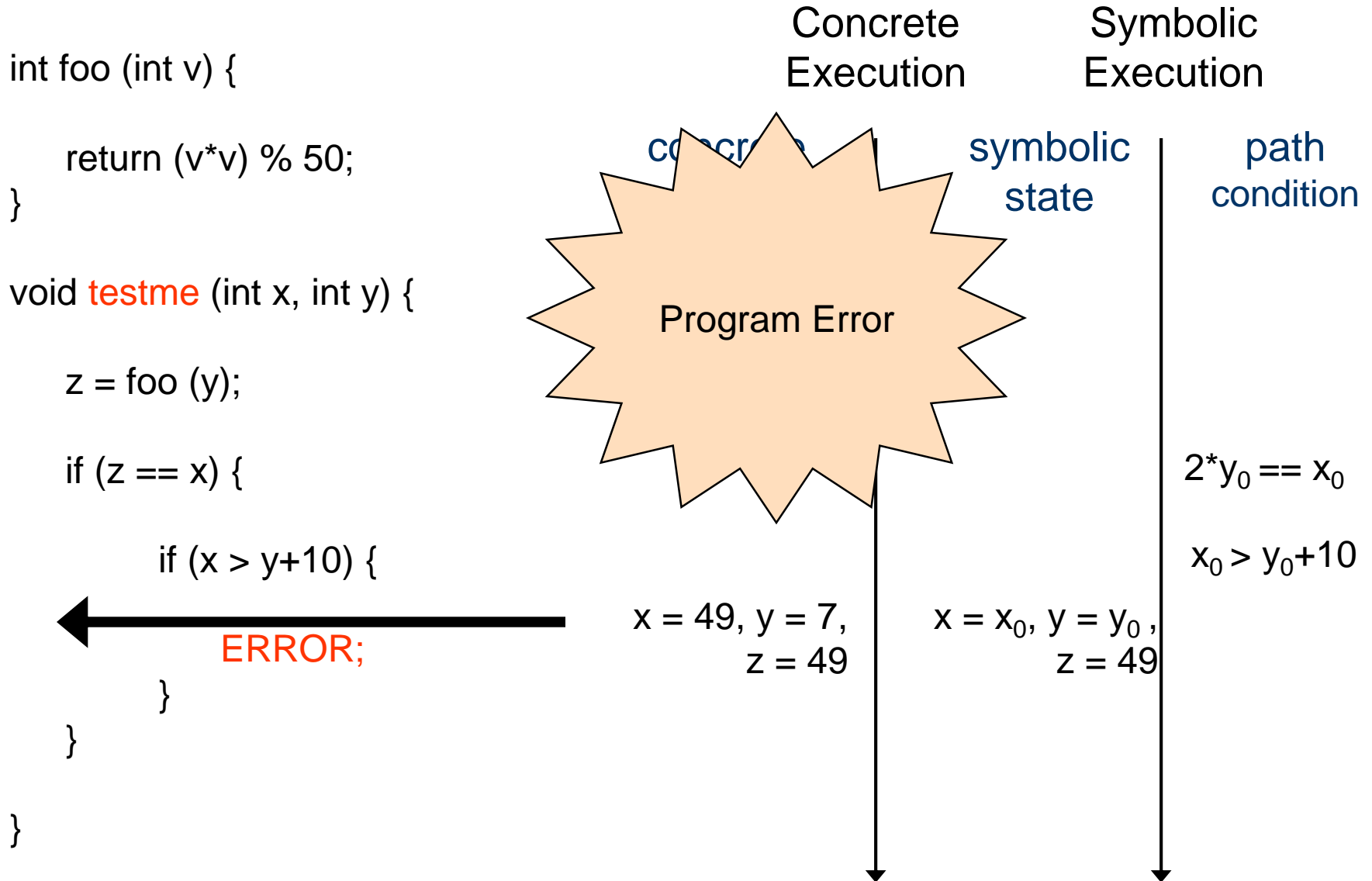
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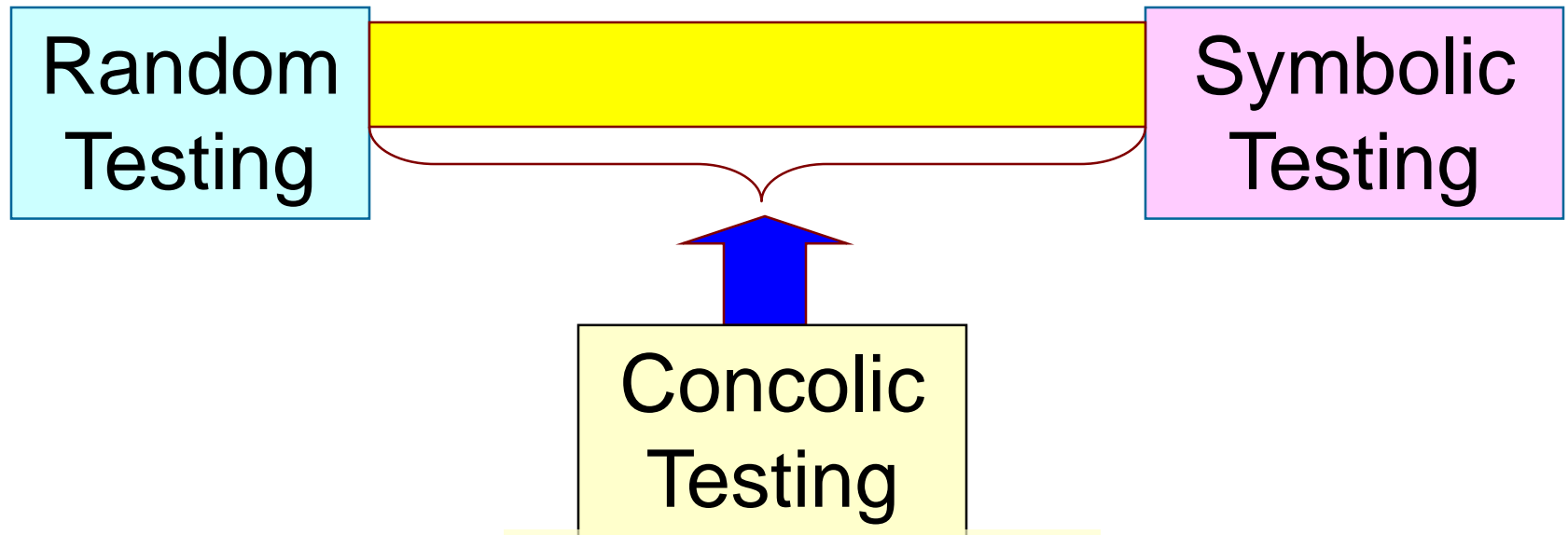
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Novelty : Simultaneous Concrete and Symbolic Execution



Concolic Testing: A Middle Approach



- + Complex programs
- + Efficient
- **Less coverage**
- + No false positive

- + Complex programs
- +/- Somewhat efficient
- + High coverage
- + No false positive

- **Simple programs**
- **Not efficient**
- + High coverage
- **False positive**

Implementations

- DART and CUTE for C programs
- jCUTE for Java programs
 - Goto <http://srl.cs.berkeley.edu/~ksen/> for CUTE and jCUTE binaries
- MSR has four implementations
 - SAGE, PEX, YOGI, Vigilante
- Similar tool: EXE at Stanford
- Easiest way to use and to develop on top of CUTE
 - Implement concolic testing yourself

Testing Data Structures

(joint work with Darko Marinov and
Gul Agha)

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

```
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    return 0;  
}
```


Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

constraints

 p
↓
NULL, x=236

p=p₀, x=x₀



CUTE Approach

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

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int f(int v) {  
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$p=p_0, x=x_0$

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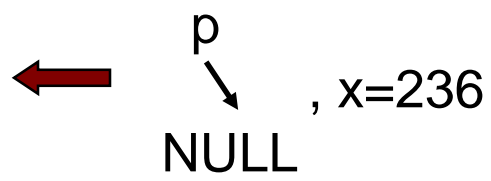
Concrete Execution

Symbolic Execution

concrete state

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$p=p_0, x=x_0$

$x_0 > 0$

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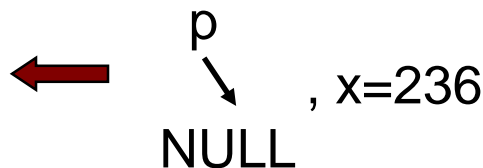
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$p=p_0, x=x_0$

$x_0 > 0$
 $!(p_0 \neq \text{NULL})$

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Concrete Execution

Symbolic Execution


concrete

symbolic

constraints

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

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

 p
NULL, $x=236$

$p=p_0, x=x_0$

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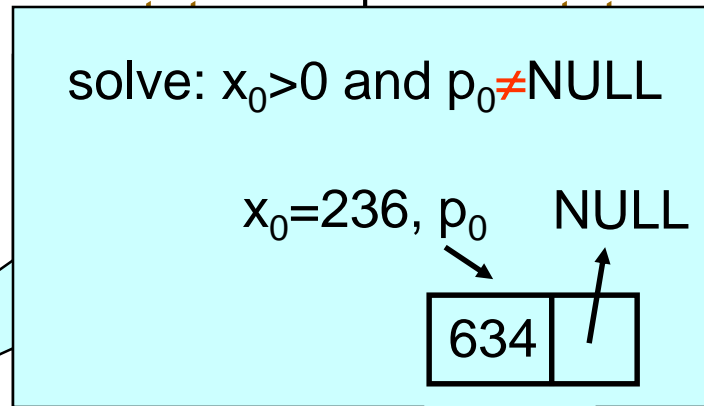
Concrete Execution

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p →
NULL, $x = 236$

$p = p_0$, $x = x_0$

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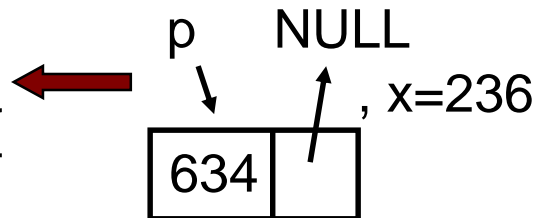
Concrete Execution

Symbolic Execution

concrete state

symbolic state

constraints



$p=p_0, x=x_0,$
 $p \rightarrow v = v_0,$
 $p \rightarrow next = n_0$

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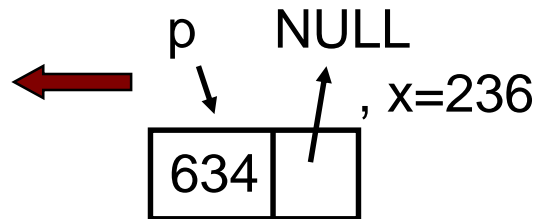
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$x_0 > 0$

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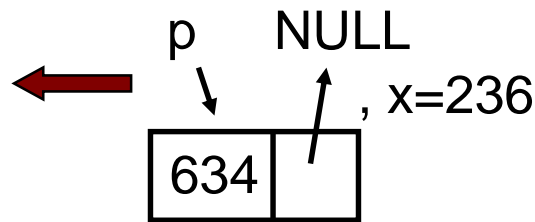
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$p=p_0, x=x_0,$
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$x_0 > 0$
 $p_0 \neq NULL$

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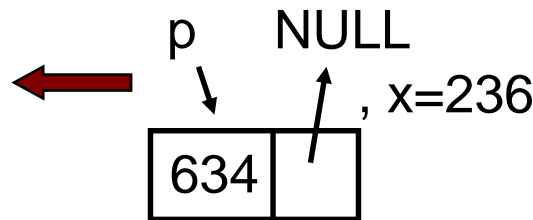
Concrete Execution

Symbolic Execution

concrete state

symbolic state

constraints



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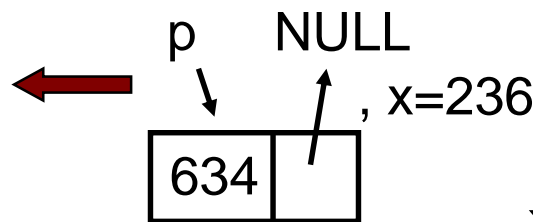
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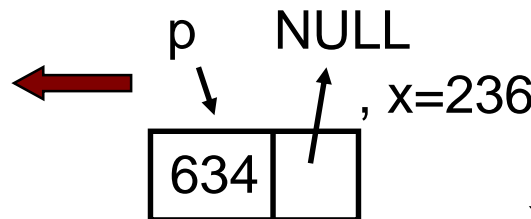
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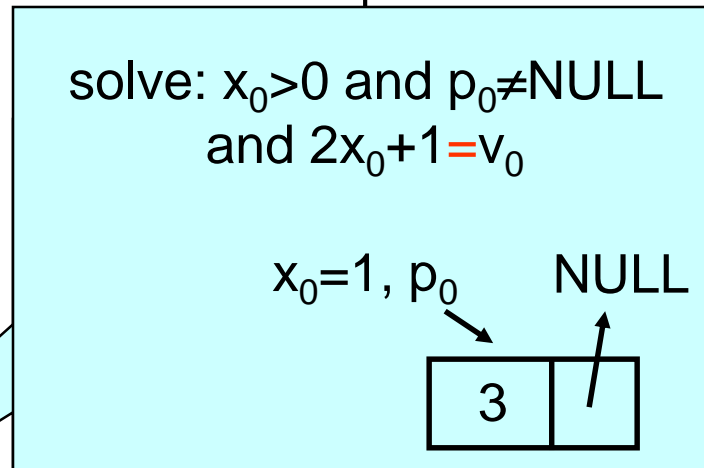
Concrete Execution

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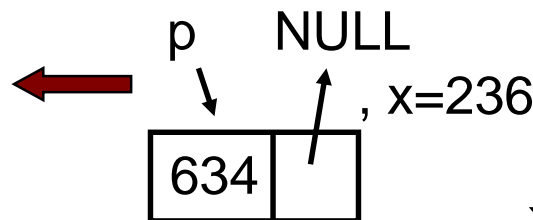
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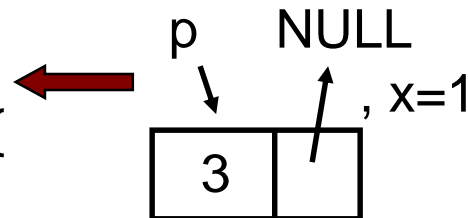
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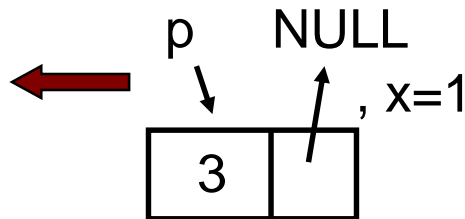
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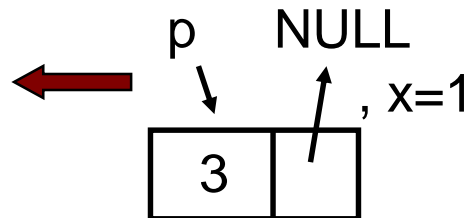
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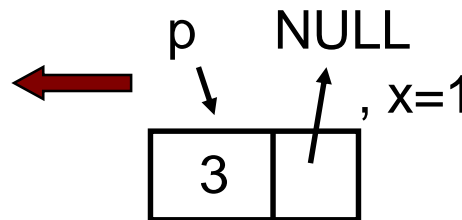
Concrete Execution

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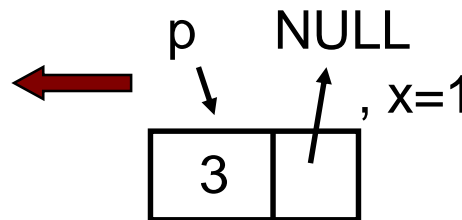
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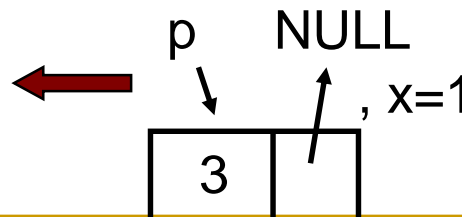
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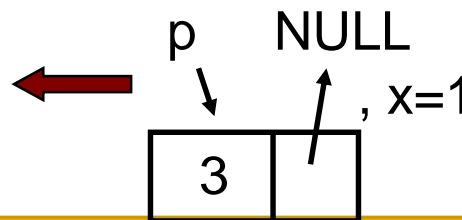
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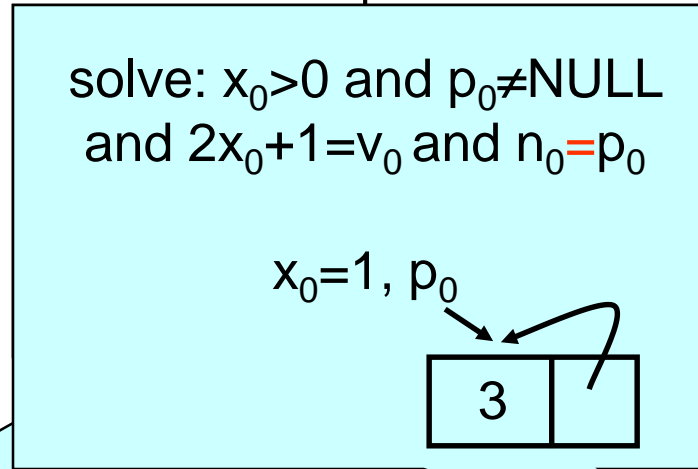
Concrete Execution

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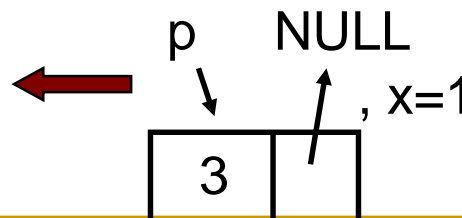
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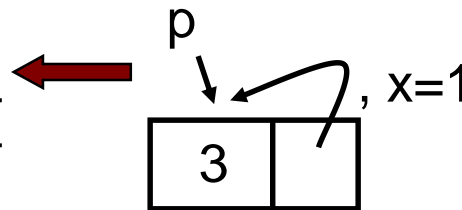
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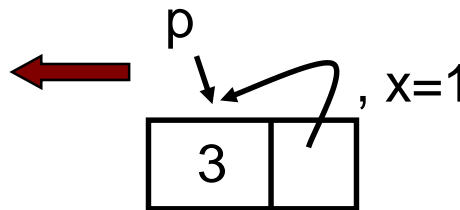
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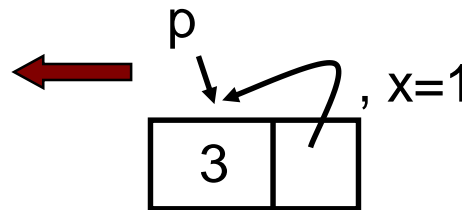
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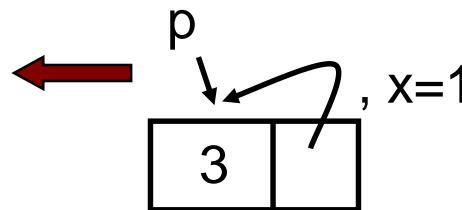
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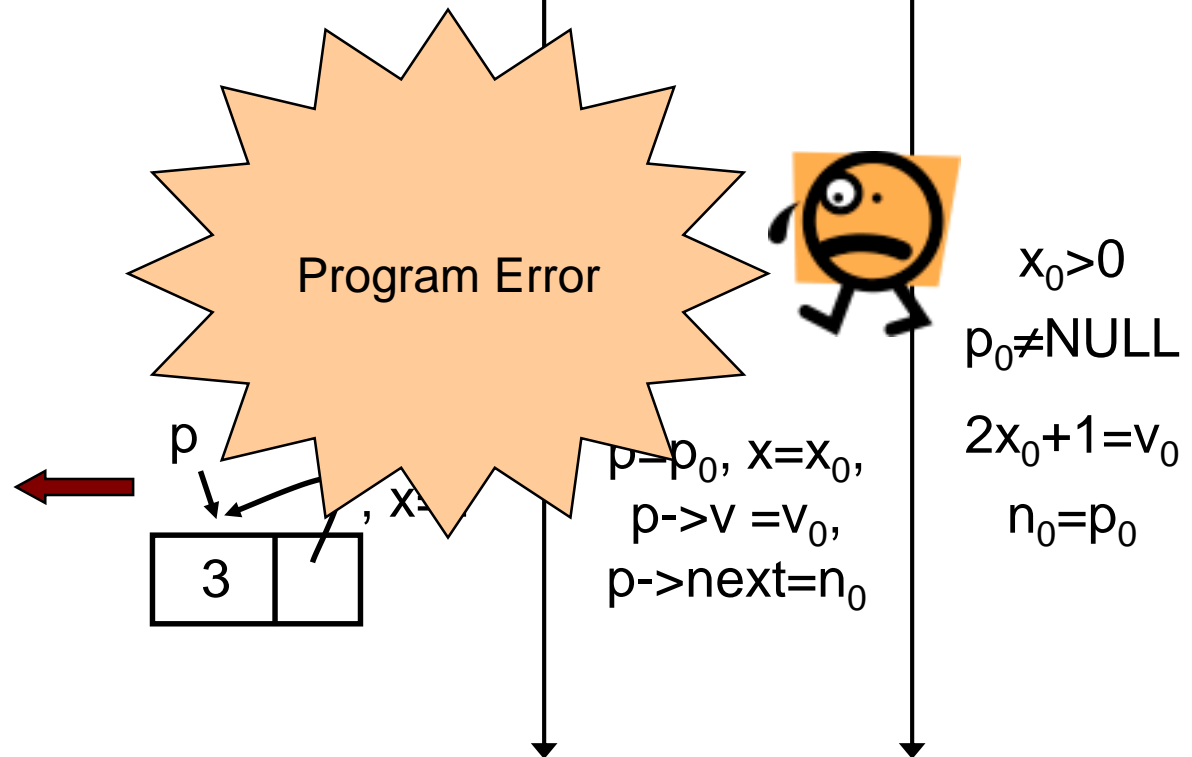
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 - handle arrays naturally
 - symbolic execution **helps to generate** concrete input for next execution
 - increases coverage

Data-structure Testing

Solving Data-structure Invariants

```
int isSortedSlist(slist * head) {
    slist * cur, *tmp;
    int i,j;
    if (head == 0) return 1;
    i=j=0;
    for (cur = head; cur!=0; cur = cur->next){
        i++;
        j=1;
        for (tmp = head; j<i; tmp = tmp->next){
            j++;
            if(cur==tmp) return 0;
        }
    }
    for (cur = head; cur->next!=0; cur = cur-
        >next){
        if(cur->i > cur->_next->i) return 0;
    }
    return 1;
}
```

```
testme(slist *L,slist *e){
    CUTE_assume(isSortedSlist(L));
    sglib_slist_add(&L,e);
    CUTE_assert(isSortedSlist(L));
}
```

Data-structure Testing

Generating Call Sequence

```
for (i=1; i<10; i++) {  
    CU_input(toss);  
    CU_input(e);  
    switch(toss){  
case 2:        sglib_hashed_ilst_add_if_not_member(htab,e,&m);  
    break;  
case 3:        sglib_hashed_ilst_delete_if_member(htab,e,&m);  
    break;  
case 4:        sglib_hashed_ilst_delete(htab,e); break;  
case 5:        sglib_hashed_ilst_is_member(htab,e); break;  
case 6:        sglib_hashed_ilst_find_member(htab,e); break;  
    }  
}
```



抽象解释



抽象解释

- 用于论证抽象正确性的理论
- 相当数量的文献采用抽象解释来论证正确性

- 转向使用Alex Aiken的课程胶片



课后作业

- 简答：如果用抽象解释理论论证数据流分析的安全性，抽象域、具体域和 σ 、 μ 、 α 、 γ 分别是什么？符号执行呢？
 - 简述概念即可，不需要写出形式定义