



软件分析

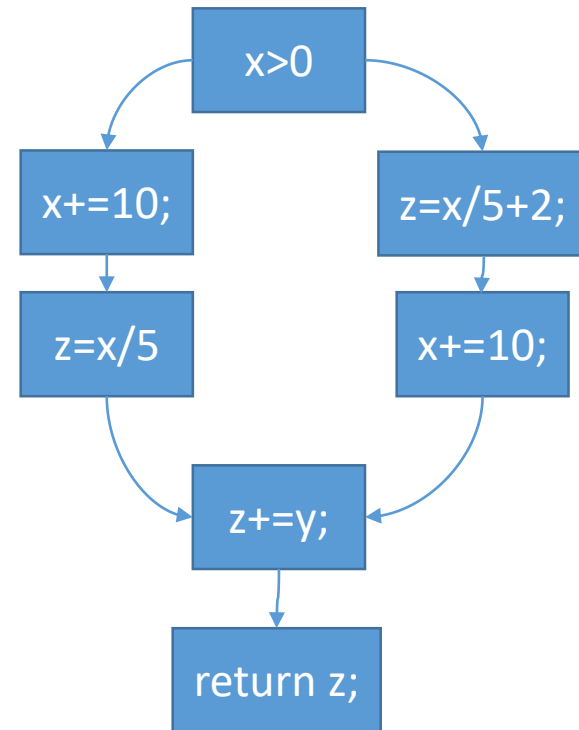
符号执行

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2018



符号执行

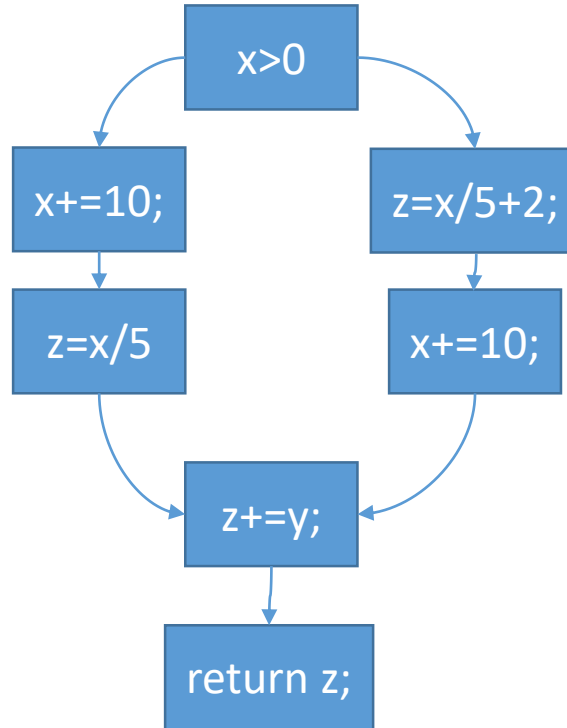
- `int main(x,y) {`
- `if (x>0) {`
- `x+=10;`
- `z=x/5;`
- `}`
- `else {`
- `z=x/5+2;`
- `x+=10;`
- `}`
- `z+=y;`
- `return z;`
- `}`





符号执行

- `int main(x,y) {`
- `if (x>0) {`
- `x+=10;`
- `z=x/5;`
- `}`
- `else {`
- `z=x/5+2;`
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- `}`
- `z+=y;`
- `return z;`
- `}`

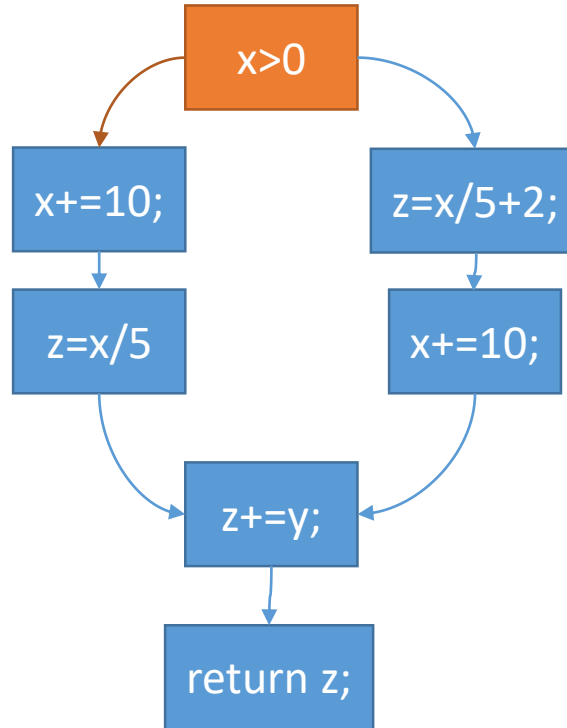


`x=a`
`y=b`
`z=?`



符号执行

- `int main(x,y) {`
- `if (x>0) {`
- `x+=10;`
- `z=x/5;`
- `}`
- `else {`
- `z=x/5+2;`
- `x+=10;`
- `}`
- `z+=y;`
- `return z;`
- `}`

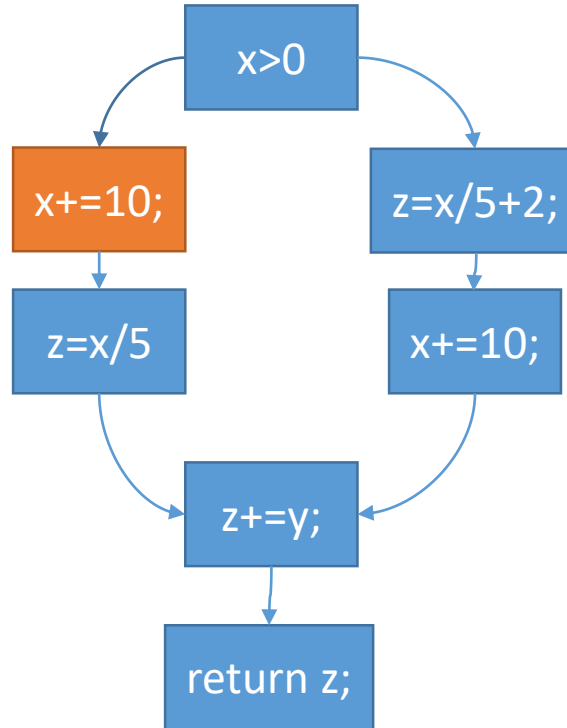


`x=a`
`y=b`
`z=?`
`a>0`



符号执行

- `int main(x,y) {`
- `if (x>0) {`
- `x+=10;`
- `z=x/5;`
- `}`
- `else {`
- `z=x/5+2;`
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- `}`
- `z+=y;`
- `return z;`
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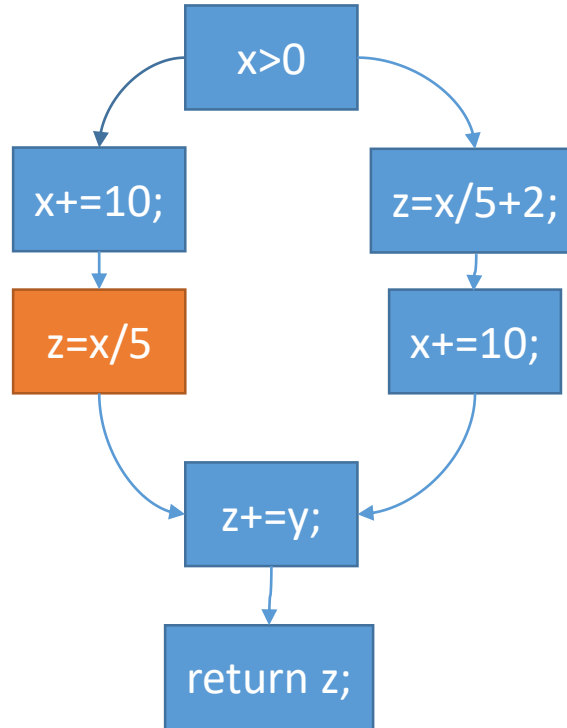


`x=a+10`
`y=b`
`z=?`
`a>0`



符号执行

- `int main(x,y) {`
- `if (x>0) {`
- `x+=10;`
- `z=x/5;`
- `}`
- `else {`
- `z=x/5+2;`
- `x+=10;`
- `}`
- `z+=y;`
- `return z;`
- `}`

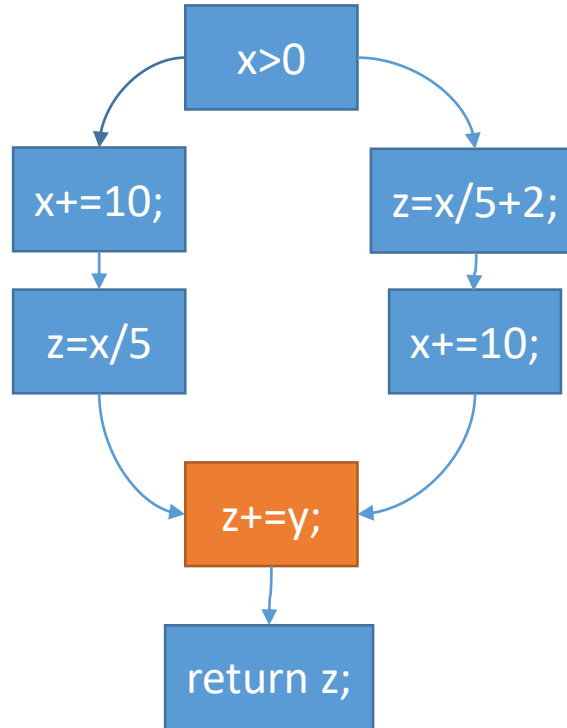


`x=a+10`
`y=b`
`z=(a+10)/5`
`a>0`



符号执行

- `int main(x,y) {`
- `if (x>0) {`
- `x+=10;`
- `z=x/5;`
- `}`
- `else {`
- `z=x/5+2;`
- `x+=10;`
- `}`
- `z+=y;`
- `return z;`
- `}`

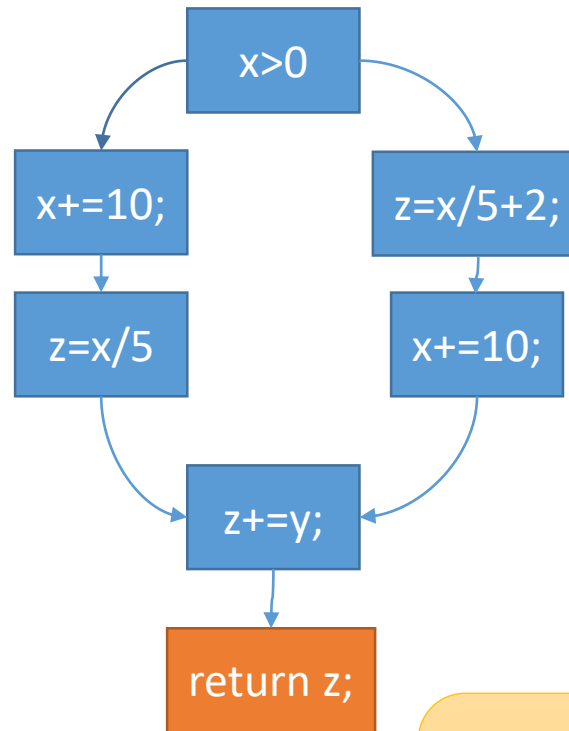


`x=a+10`
`y=b`
`z=(a+10)/5+b`
`a>0`



符号执行

- `int main(x,y) {`
- `if (x>0) {`
- `x+=10;`
- `z=x/5;`
- `}`
- `else {`
- `z=x/5+2;`
- `x+=10;`
- `}`
- `z+=y;`
- `return z;`
- `}`



$x = a + 10$
 $y = b$
 $z = (a + 10) / 5 + b$
 $a > 0$

返回值为 $(a + 10) / 5 + b$
且 $a > 0$



符号执行

- 程序的规约通常表示为前条件和后条件
 - 前条件: $a > 0, b > 0$
 - 后条件: $\text{return} > 0$
- 形成命题:
 - $a > 0 \wedge b > 0 \Rightarrow (a+10)/5 + b > 0$
 - 命题成立=逆命题不可满足
 - 用SMT Solver可求解
- 规约被违反=任意路径对应的命题不成立
- 规范被满足=所有路径对应的命题都成立
 - 通常做不到
 - 对于循环, 遍历有限次



符号执行举例

- 用符号执行发现缓冲区溢出
 -
 - $a[i] = 4;$
 - 判断后条件 $0 \leq i \&\& i < a.length$ 是否总是成立
- 用符号执行发现除0错误
 -
 - $x = 3 / i;$
 - 判断后条件 $i \neq 0$ 是否总是成立
- 用符号执行发现路径可行性
 - 判断给定路径上的路径约束是否可满足



基于霍尔逻辑的符号 执行



霍尔逻辑

- 霍尔三元组
 - $\{\text{前条件}\} \text{语句} \{\text{后条件}\}$
- 霍尔逻辑表示三者之间的推导关系
- 又称为公理语义



While语言

Statement ::=

| skip

| while (Expr) Statement

| if (Expr) Statement else Statement

| Statement; Statement

| Var = Expr



霍尔逻辑规则

$$\text{SKIP} \frac{}{\{P\} \text{ skip } \{P\}}$$

$$\text{ASSIGN} \frac{}{\{P[a/x]\} x := a \{P\}}$$

$$\text{SEQ} \frac{\{P\} c_1 \{R\} \quad \{R\} c_2 \{Q\}}{\{P\} c_1; c_2 \{Q\}}$$

$$\text{IF} \frac{\{P \wedge b\} c_1 \{Q\} \quad \{P \wedge \neg b\} c_2 \{Q\}}{\{P\} \text{ if } b \text{ then } c_1 \text{ else } c_2 \{Q\}}$$

$$\text{CONSEQUENCE} \frac{\models (P \Rightarrow P') \quad \{P'\} c \{Q'\} \quad \models (Q' \Rightarrow Q)}{\{P\} c \{Q\}}$$

$$\text{WHILE} \frac{\{P \wedge b\} c \{P\}}{\{P\} \text{ while } b \text{ do } c \{P \wedge \neg b\}}$$



用霍尔逻辑证明举例

- $\text{if } (x > 0) \ x \ += \ 10; \text{ else } x = 20;$
 - 该程序执行结束后, x 是否一定大于0?
- 根据Assign, 可得
 - $\{x+10>0\} \ x+=10 \ \{x > 0\}$
 - $\{\text{True}\} \ x=20 \ \{x > 0\}$
- 因为 $x>0 \Rightarrow x+10 > 0$ 且 $\neg x>0 \Rightarrow \text{True}$, 根据Consequence, 可得
 - $\{x>0\} \ x+=10 \ \{x > 0\}$
 - $\{\neg x>0\} \ x+=10 \ \{x > 0\}$
- 根据If, 可得
 - $\{\text{True}\} \ \text{if } (x > 0) \ x \ += \ 10; \text{ else } x = 20; \{x>0\}$



用霍尔逻辑证明练习

- `while (x < 10) x += 1;`
 - 该程序执行结束后, `x`是否一定大于0?
- 根据Assign, 可得
 - $\{True\} x+=1 \{True\}$
- 根据Consequence, 可得
 - $\{x<10 \wedge True\} x+=10 \{True\}$
- 根据While, 可得
 - $\{True\} \text{while } (x < 10) x += 1; \{x \geq 10\}$
- 根据Consequence, 可得
 - $\{True\} \text{while } (x < 10) x += 1; \{x > 0\}$



谓词转换计算

- 最弱前条件计算：给定后条件和语句，求能形成霍尔三元组的最弱前条件
- 最强后条件计算：给定前条件和语句，求能形成霍尔三元组的最强后条件
- 基于谓词转换的符号执行
 - 给定输入需要满足的条件 P ，代码 c ，输出需要满足的条件 Q
 - 前向符号执行：基于 P 和 c 计算最强后条件 Q' ，验证 $Q' \rightarrow Q$ 是否恒成立
 - 后向符号执行：基于 Q 和 c 计算最弱后条件 P' ，验证 $P \rightarrow P'$ 是否恒成立



最弱前条件计算

- $wp(skip, Q) = Q$

$$\text{SKIP} \frac{}{\{P\} \text{ skip } \{P\}}$$

- $wp(x := a, Q) = Q[a/x]$

$$\text{ASSIGN} \frac{}{\{P[a/x]\} x := a \{P\}}$$

- $wp(c_1; c_2, Q) =$
 $wp(c_1, wp(c_2, Q))$

$$\text{SEQ} \frac{\{P\} c_1 \{R\} \quad \{R\} c_2 \{Q\}}{\{P\} c_1; c_2 \{Q\}}$$

- $wp(\text{if } b \text{ then } c_1 \text{ else } c_2, Q) =$
 $(b \rightarrow wp(c_1, Q))$
 $\wedge (\neg b \rightarrow wp(c_2, Q))$

$$\text{IF} \frac{\{P \wedge b\} c_1 \{Q\} \quad \{P \wedge \neg b\} c_2 \{Q\}}{\{P\} \text{ if } b \text{ then } c_1 \text{ else } c_2 \{Q\}}$$



最弱前条件： 举例

- $\text{wp}(\text{if } (x > 0) \ x \ += \ 10; \text{ else } \ x = 20, \ x > 0)$
 - $= (x > 0 \rightarrow \text{wp}(x \ += \ 10, \ x > 0)) \wedge (x \leq 0 \rightarrow \text{wp}(x = 20, \ x > 0))$
 - $= (x > 0 \rightarrow x + 10 > 0) \wedge (x \leq 0 \rightarrow 20 > 0)$
 - $= \text{True}$



最弱前条件计算：循环

- $wp(\text{while } b \text{ do } c, Q) = \exists i \in \text{Nat}. L_i(Q)$

- where

- $L_0(Q) = \text{false}$

- $L_{i+1}(Q) = (\neg b \Rightarrow Q) \wedge (b \Rightarrow wp(c, L_i(Q)))$

- 解释： i 表示将循环展开几次

- $\text{skip};$

$i=1$

- $\text{if}(b) \text{ then } c \text{ else skip};$

$i=2$

- $\text{if}(b) \text{ then } (c; \text{if}(b) \text{ then } c \text{ else skip}) \text{ else skip}$

$i=3$

- ...

$$\text{WHILE} \frac{\{P \wedge b\} c \{P\}}{\{P\} \text{ while } b \text{ do } c \{P \wedge \neg b\}}$$



最弱前条件计算：循环

- 因为存在量词求解困难，有时使用全程量词的更强版本
- $wp'(while\ b\ do\ c, Q) = \forall i \in Nat. L_i(Q)$
 - where
 - $L_0(Q) = false$
 - $L_{i+1}(Q) = (\neg b \Rightarrow Q) \wedge (b \Rightarrow wp'(c, L_i(Q)))$



最强后条件计算

- $sp(P, skip) = P$
- $sp(P, x := a) = \exists n. x = a[n/x] \wedge P[n/x]$
- $sp(P, c_1; c_2) = sp(sp(P, c_1), c_2)$
- $sp(P, if\ b\ then\ c_1\ else\ c_2) = sp(b \wedge P, c_1) \vee sp(\neg b \wedge P, c_2)$
- $sp(P, while\ b\ do\ c) = \neg b \wedge \exists i. L_i(P)$
 - where
 - $L_0(P) = P$
 - $L_{i+1}(P) = sp(b \wedge L_i(P), c)$

因为约束更复杂，实际使用较少



符号执行和谓词转换

- 在没有循环的情况下，最弱前条件和符号执行等价
- 例：If ($y > 0$) $x+=1$; else $x+=2$; assert($x<3$)
- 符号执行
 - 令 $x=a$, $y=b$, 计算得到
 - $(b > 0 \wedge a + 1 < 3) \vee (\neg b > 0 \wedge a + 2 < 3)$
- 最弱前条件
 - $wp(x += 1, x < 3) = x + 1 < 3$
 - $wp(x += 2, x < 3) = x + 2 < 3$
 - $wp(\text{原程序}, x < 3) = (y > 0 \rightarrow x + 1 < 3) \wedge (\neg y > 0 \rightarrow$



动态符号执行



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

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;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

concrete
state

$x = 22, y = 7$

Symbolic
Execution

symbolic
state

$x = x_0, y = y_0$

path
condition

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;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

path
condition

x = 22, y = 7, z = 14

$x = x_0, y = y_0, z = 2 * y_0$

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;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

path
condition

$2*y_0 \neq x_0$

$x = 22, y = 7, z = 14$

$x = x_0, y = y_0, z = 2*y_0$

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;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

path
condition

Solve: $2*y_0 == x_0$

Solution: $x_0 = 2, y_0 = 1$

$2*y_0 != x_0$

$x = 22, y = 7, z = 14$

$x = x_0, y = y_0, z = 2*y_0$

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;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

concrete
state

$x = 2, y = 1$

Symbolic
Execution

symbolic
state

$x = x_0, y = y_0$

path
condition

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;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

path
condition

$x = 2, y = 1, z = 2$

$x = x_0, y = y_0, z = 2*y_0$

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;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

concrete
state

$x = 2, y = 1, z = 2$

Symbolic
Execution

symbolic
state

$x = x_0, y = y_0, z = 2*y_0$

path
condition

$2*y_0 == x_0$

Concolic Testing Approach



```
int double (int v) {
```

```
    return 2*v;
}
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```
void testme (int x, int y) {
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```
    z = double (y);
```

```
    if (z == x) {
```

```
        if (x > y+10) {
```

```
            ERROR;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

path
condition

$x = 2, y = 1,$

$z = 2$

$x = x_0, y = y_0, z = 2*y_0$

$2*y_0 == x_0$

$x_0 > y_0 + 10$

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;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

path
condition

Solve: $(2 * y_0 == x_0) \wedge (x_0 > y_0 + 10)$

Solution: $x_0 = 30, y_0 = 15$

$2 * y_0 == x_0$

$x_0 > y_0 + 10$

$x = 2, y = 1, z = 2$

$x = x_0, y = y_0, z = 2 * y_0$

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;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

concrete
state

$x = 30, y = 15$

Symbolic
Execution

symbolic
state

$x = x_0, y = y_0$

path
condition

Concolic Testing Approach



```
int double (int v) {
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```
    return 2*v;  
}
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```
void testme (int x, int y) {
```

```
    z = double (y);
```

```
    if (z == x) {
```

```
        if (x > y+10) {
```

```
            ERROR;
```

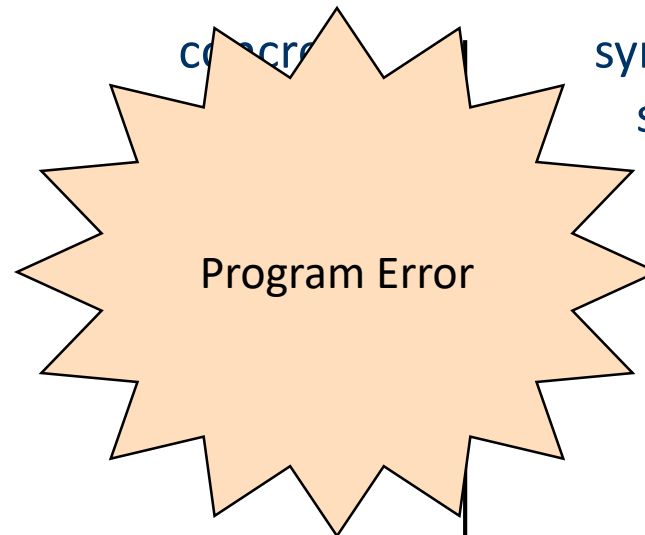
```
        }
```

```
    }
```

```
}
```

Concrete
Execution

Symbolic
Execution



$x = 30, y = 15$

$x = x_0, y = y_0$

symbolic
state

path
condition

$2 * y_0 == x_0$

$x_0 > y_0 + 10$

Novelty : Simultaneous Concrete and Symbolic Execution



```
int foo (int v) {
```

```
    return (v*v) % 50;
}
```

```
void testme (int x, int y) {
```

```
    z = foo (y);
```

```
    if (z == x) {
```

```
        if (x > y+10) {
```

```
            ERROR;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

Symbolic
Execution

concrete
state

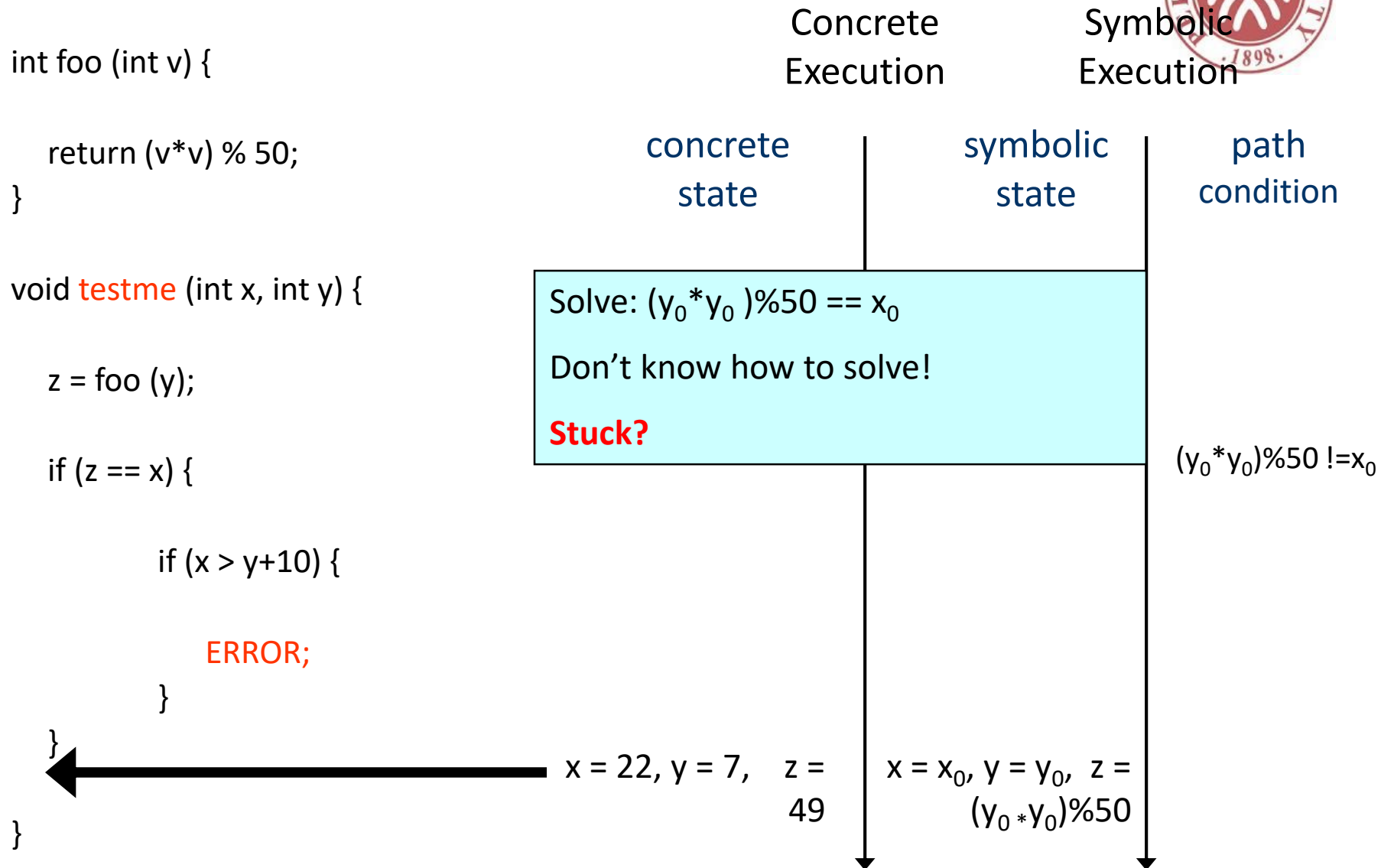
$x = 22, y = 7$

symbolic
state

$x = x_0, y = y_0$

path
condition

Novelty : Simultaneous Concrete and Symbolic Execution



Novelty : Simultaneous Concrete and Symbolic Execution



Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

path
condition

```
void testme (int x, int y) {
```

```
    z = foo (y);
```

```
    if (z == x) {
```

```
        if (x > y+10) {
```

```
            ERROR;
```

```
        }
```

```
    }
```

```
}
```

Solve: $\text{foo}(y_0) == x_0$

Don't know how to solve!

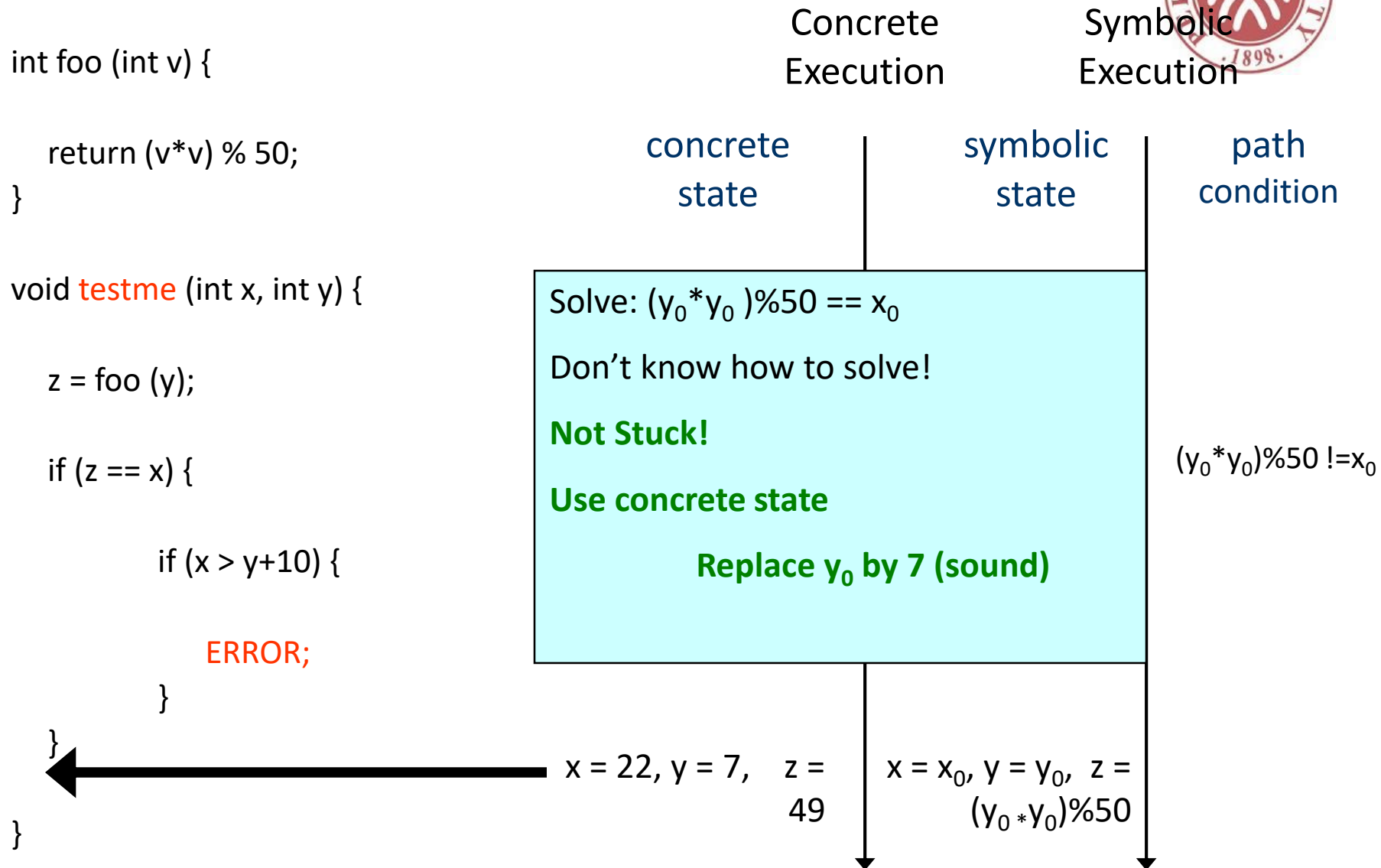
Stuck?

$\text{foo}(y_0) \neq x_0$

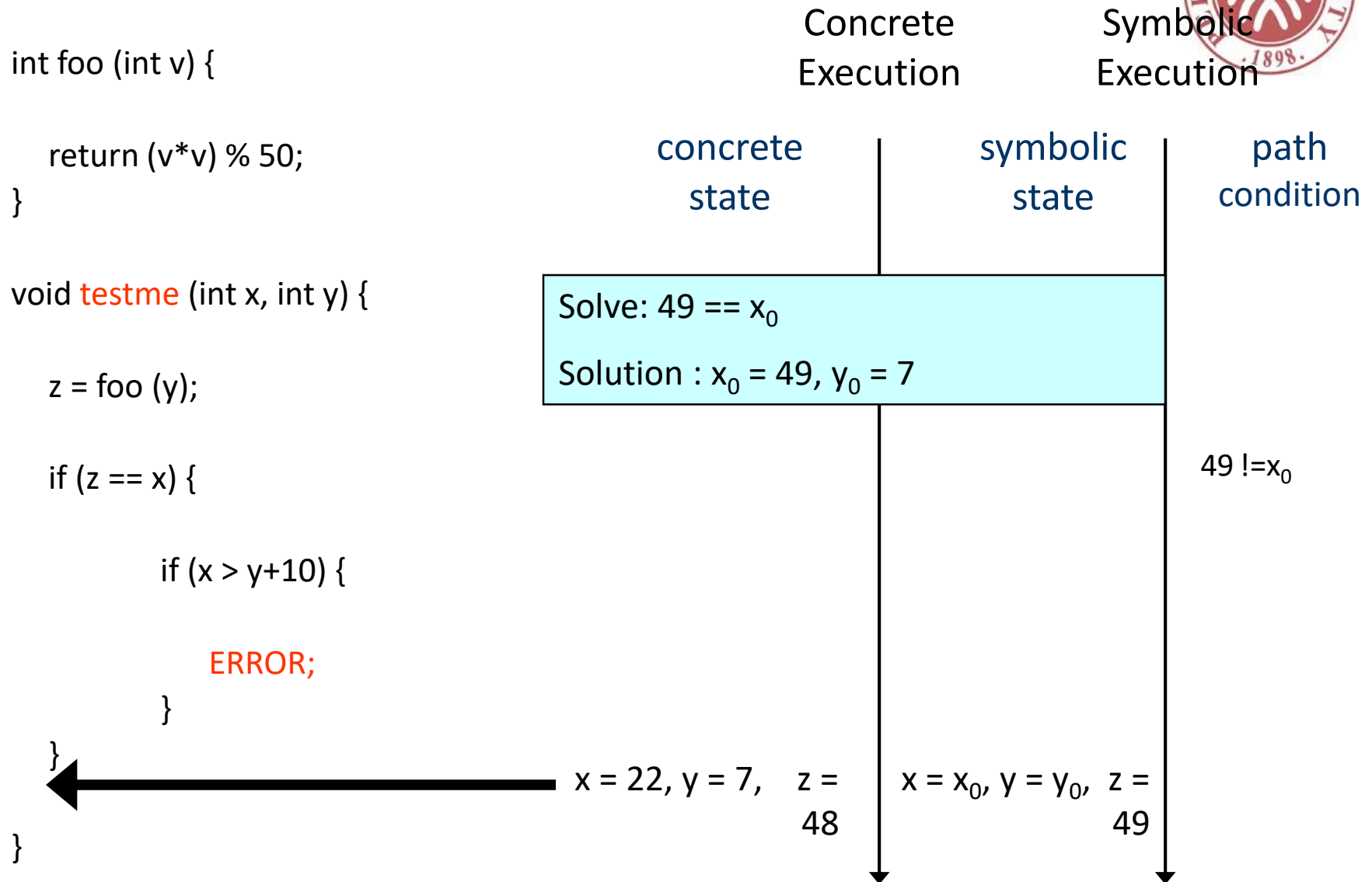
$x = 22, y = 7, z = 49$

$x = x_0, y = y_0, z = \text{foo}(y_0)$

Novelty : Simultaneous Concrete and Symbolic Execution



Novelty : Simultaneous Concrete and Symbolic Execution



Novelty : Simultaneous Concrete and Symbolic Execution



```
int foo (int v) {
```

```
    return (v*v) % 50;
}
```

```
void testme (int x, int y) {
```

```
    z = foo (y);
```

```
    if (z == x) {
```

```
        if (x > y+10) {
```

```
            ERROR;
```

```
        }
```

```
    }
```

```
}
```

Concrete
Execution

Symbolic
Execution

concrete
state

symbolic
state

path
condition

$x = 49, y = 7$

$x = x_0, y = y_0$

Novelty : Simultaneous Concrete and Symbolic Execution



```
int foo (int v) {
```

```
    return (v*v) % 50;
}
```

```
void testme (int x, int y) {
```

```
    z = foo (y);
```

```
    if (z == x) {
```

```
        if (x > y+10) {
```

```
            ERROR;
```

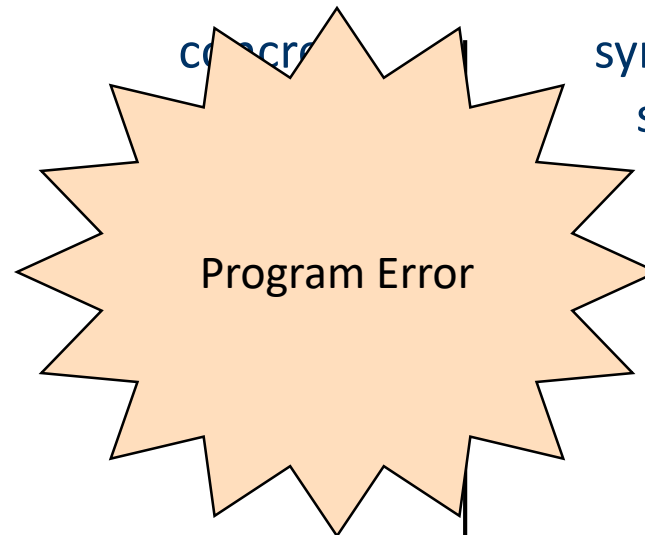
```
        }
```

```
    }
```

```
}
```

Concrete
Execution

Symbolic
Execution



$x = 49, y = 7, z = 49$

$x = x_0, y = y_0, z = 49$

symbolic
state

path
condition

$2 * y_0 == x_0$

$x_0 > y_0 + 10$



常见符号执行工具

- C语言: KLEE
- Java语言: SymbolicPathFinder



参考资料

- 《程序设计语言的形式语义》 Glynn Winskel著
- Symbolic execution for software testing: three decades later. C Cadar, K Sen. Communication of ACM. 2013