



# Software Verification

Is a software program free from bugs?

- **What kind of bugs?**

- **Lint checking – Divide by zero, Variable values going out of range**
- **User specified bugs – Assertions**

Challenges:

- **Real valued variables**

- **Huge state space if we have to consider all values**

- **Size of the program is much smaller than the number of paths to be explored**

- **Branchings, Loops**

We need to extract an abstract state machine from a program

# Abstraction: Sound versus Complete

- Sound Abstraction

If the abstraction shows no bugs, then the original program also doesn't have bugs

- Complete Abstraction

If the abstraction shows a bug, then the original program has a bug

Due to undecidability of static analysis problems, we cant have a general procedure that is both sound and complete.

# Techniques

## Abstract Static Analysis

- Abstract interpretation
- Numerical abstract domains

## Software Model Checking

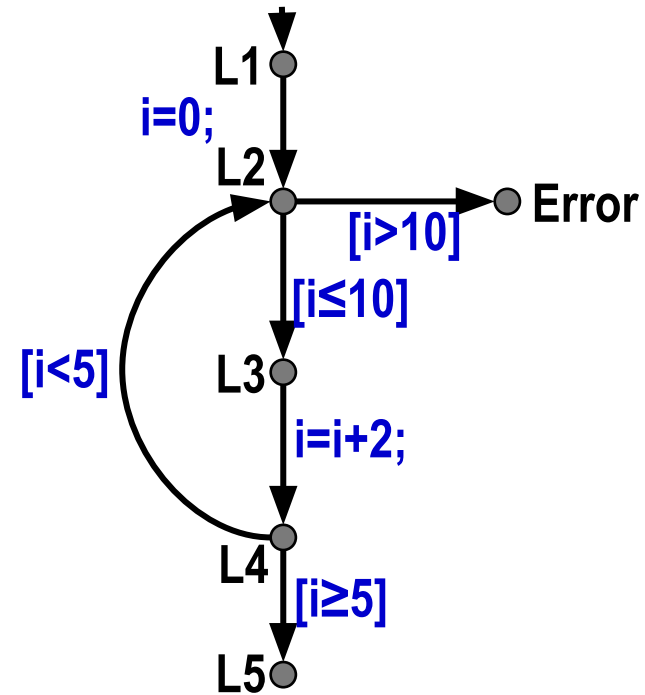
- Explicit and symbolic model checking
- Predicate abstraction and abstraction refinement

# Example

## Sample program:

```
int i=0
do {
    assert( i <= 10);
    i = i+2;
} while (i < 5);
```

## Control Flow Graph (CFG):



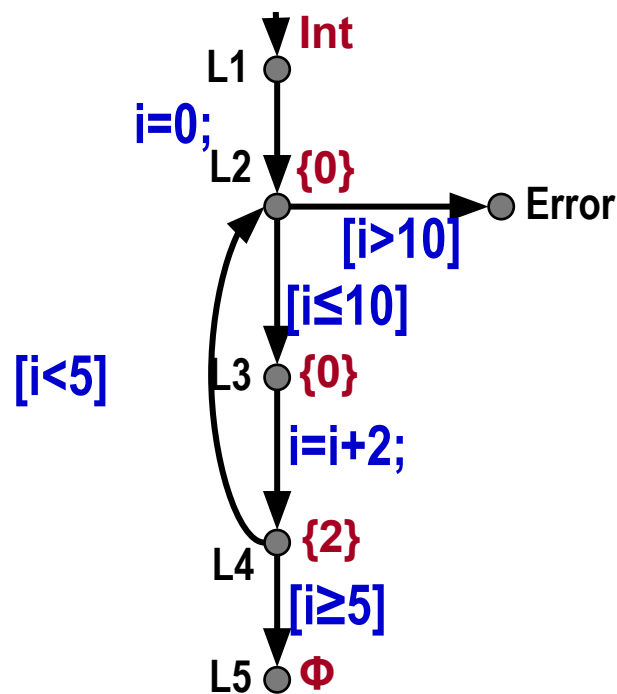
# Concrete Interpretation

## Philosophy:

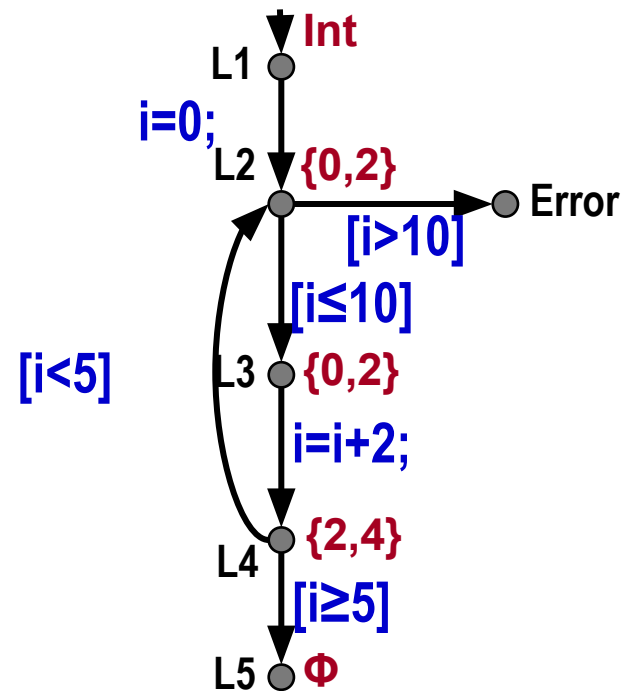
Collect the set of possible values of  $i$  until a fixed point is reached

## Sample program:

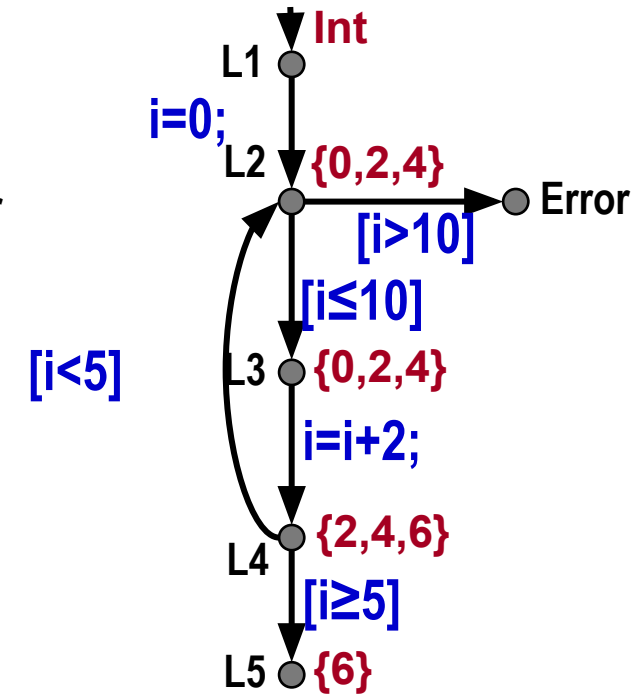
```
int i=0
do {
    assert( i <= 10);
    i = i+2;
} while ( i < 5);
```



Iteration-1



Iteration-2



Iteration-3

# Abstract Interpretation

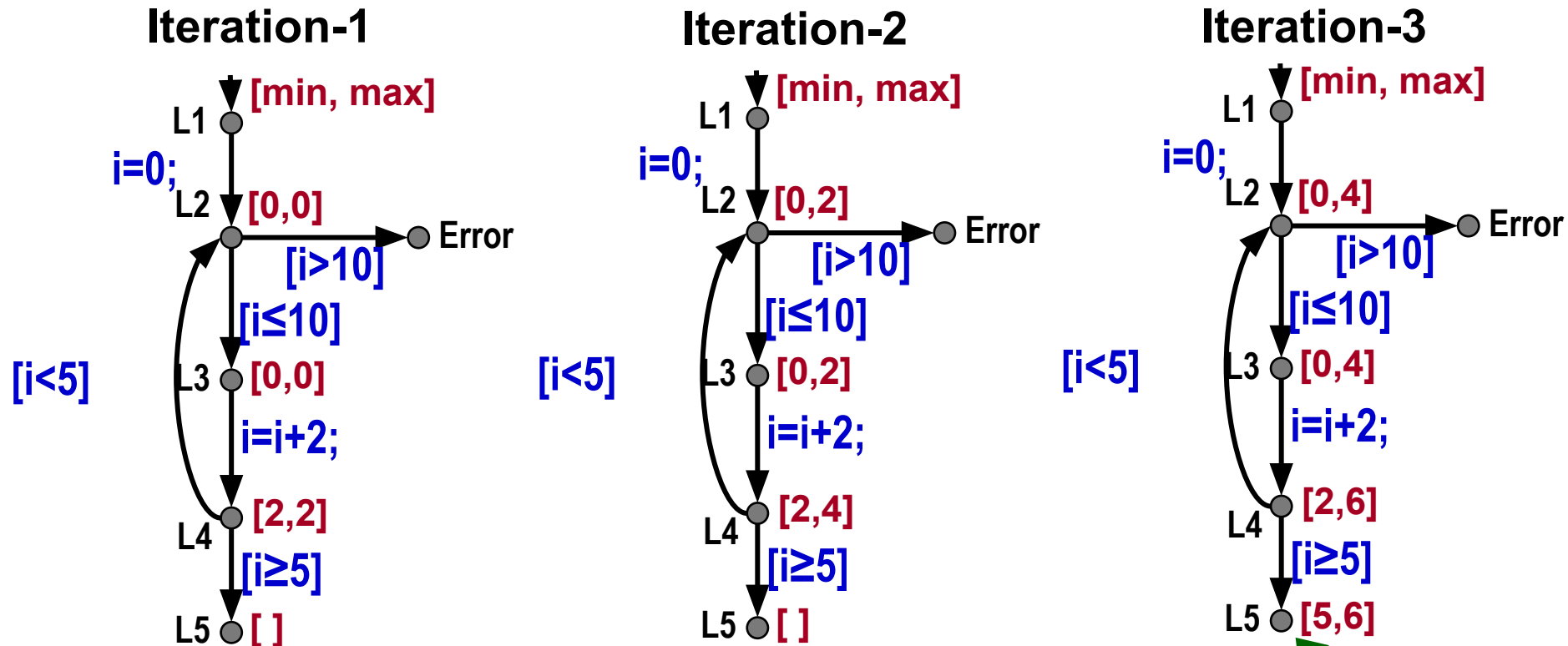
## Philosophy:

Use an abstract domain instead of value sets

Example: We may use value intervals instead of value sets

## Sample program:

```
int i=0
do {
    assert( i <= 10);
    i = i+2;
} while ( i < 5);
```



Actually, the value 5 is not possible here

# Numerical Abstract Domains

The class of invariants that can be computed, and hence the properties that can be proved, varies with the expressive power of a domain

- An abstract domain can be more *precise* than another
- The information loss between different domains may be incomparable

Examples:

- The domain of *Signs* has three values: {Pos, Neg, Zero}
- *Intervals* are more expressive than signs. Signs can be modeled as [min,0], [0,0], and [0,max]
- The domain of *Parities* abstracts values as Even and Odd
- *Signs* or *Intervals* cannot be compared with *Parities*.



# Predicate Abstraction

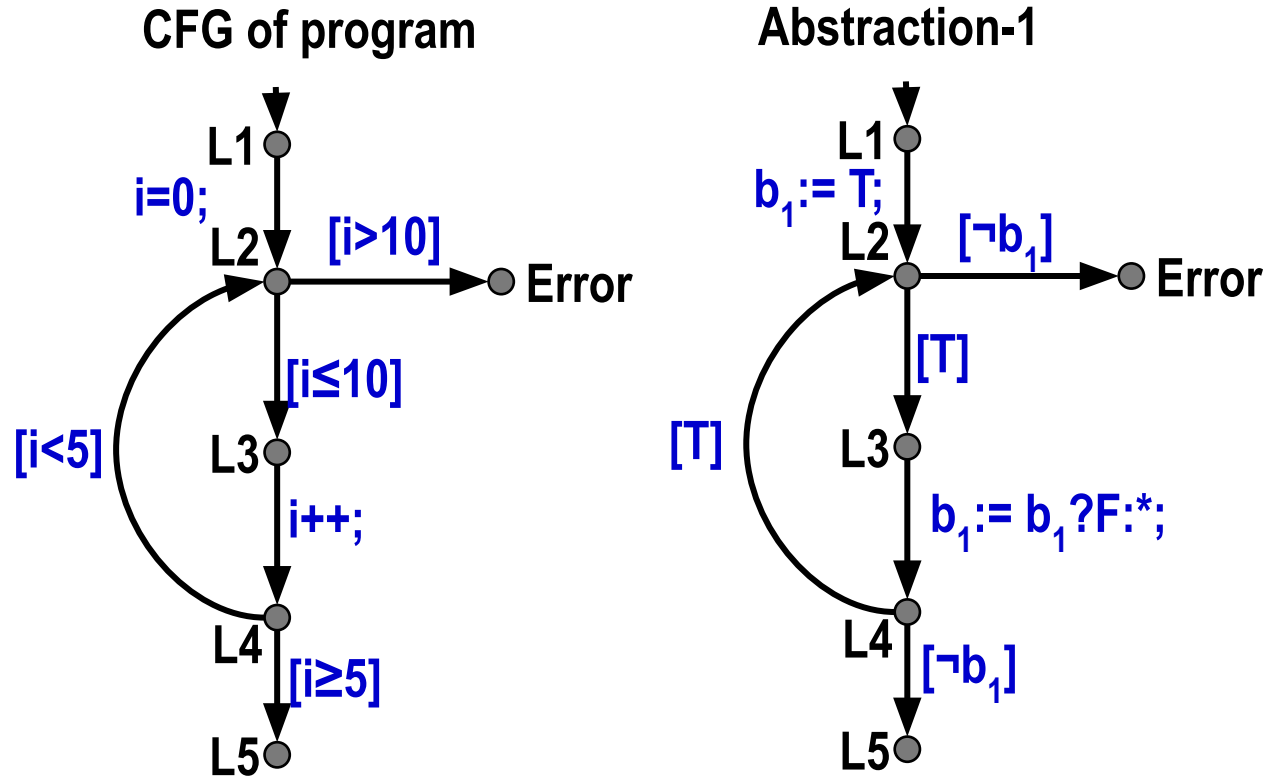
- A sound approximation  $R'$  of the transition relation  $R$  is constructed using predicates over program variables
- A predicate  $P$  partitions the states of a program into two classes: one in which  $P$  evaluates to true and one in which it evaluates to false
  - Each class is an *abstract state*
  - Let  $A$  and  $B$  be abstract states. A transition is defined from  $A$  to  $B$  if there is a state in  $A$  with a transition to a state in  $B$
  - This construction yields an existential abstraction of a program, which is sound for reachability properties
  - The abstract program corresponding to  $R'$  is represented by a *Boolean program*, one with only Boolean data types, and the same control flow constructs as  $C$  programs

# Predicate Abstraction

Abstraction-1 uses the predicate  $(i=0)$   
(represented by the variable  $b_1$ )

Sample program:

```
int i=0
do {
    assert( i <= 10);
    i++;
} while (i < 5);
```



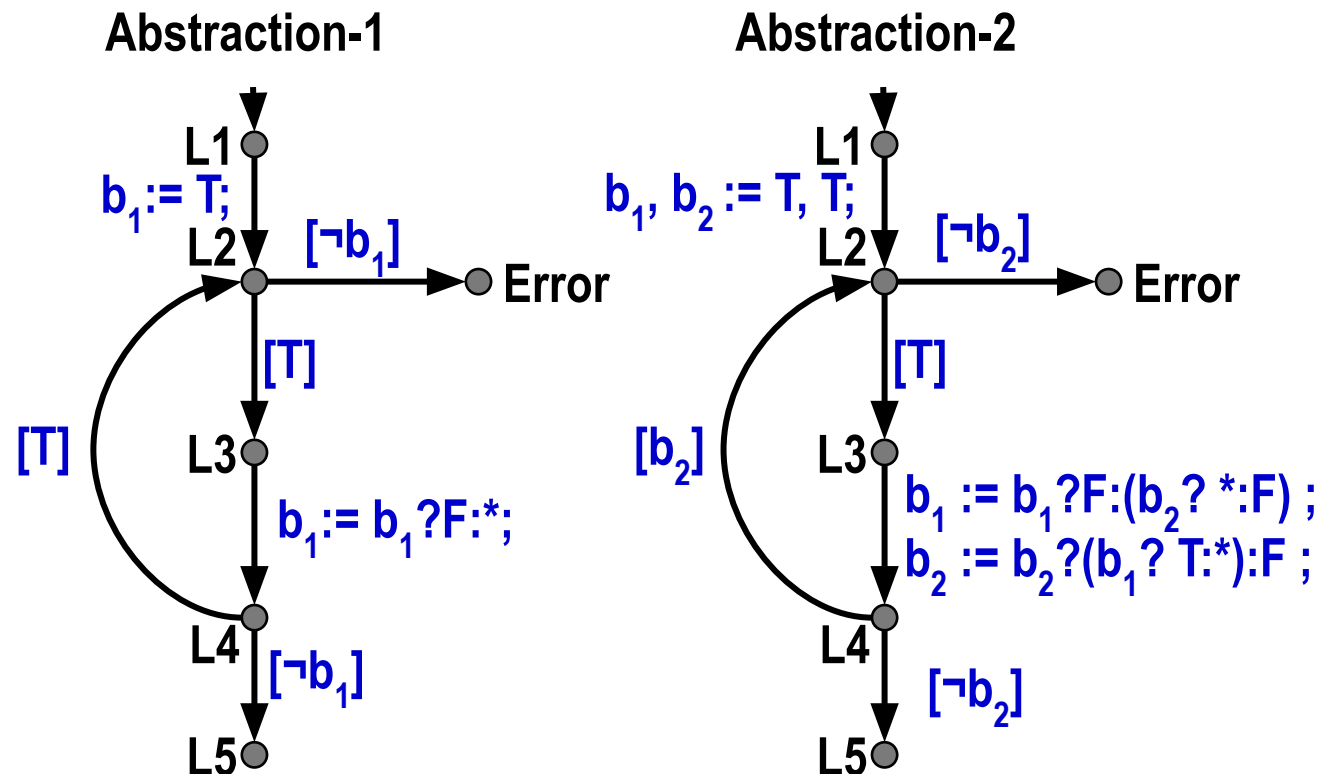
In Abstraction-1 the Error location is reachable, but the counter-example cant be reconstructed in the real program

# Predicate Abstraction

Abstraction-2 refines Abstraction-1 using the additional predicate ( $i < 5$ ) (represented by the variable  $b_2$ )

## Sample program:

```
int i=0
do {
    assert( i <= 10);
    i++;
} while (i < 5);
```



In Abstraction-2 the location L2 is reached with  $b_2$  every time. Hence the Error location is unreachable.

# Model Checking with Predicate Abstraction

- A **heavy-weight** formal analysis technique
- Recent successes in software verification, e.g., SLAM at Microsoft
- The abstraction reduces the size of the model by **removing irrelevant details**
- The abstract model is then **small enough** for an analysis with a BDD-based Model Checker
- Idea: **only track predicates on data**, and remove data variables from model
- Mostly works with control-flow dominated properties

Source of these slides: D. Kroening: SSFT12 – Predicate Abstraction: A Tutorial

# Outline

- **Introduction Existential Abstraction**
- **Predicate Abstraction for Software**
- **Counterexample Guided Abstraction Refinement**
- **Computing Existential Abstractions of Programs**
- **Checking the Abstract Model**
- **Simulating the Counterexample Refining the Abstraction**

# Predicate Abstraction as Abstract Domain

- We are given a set of predicates over  $S$ , denoted by  $\Pi_1, \dots, \Pi_n$ .

- An abstract state is a valuation of the predicates:

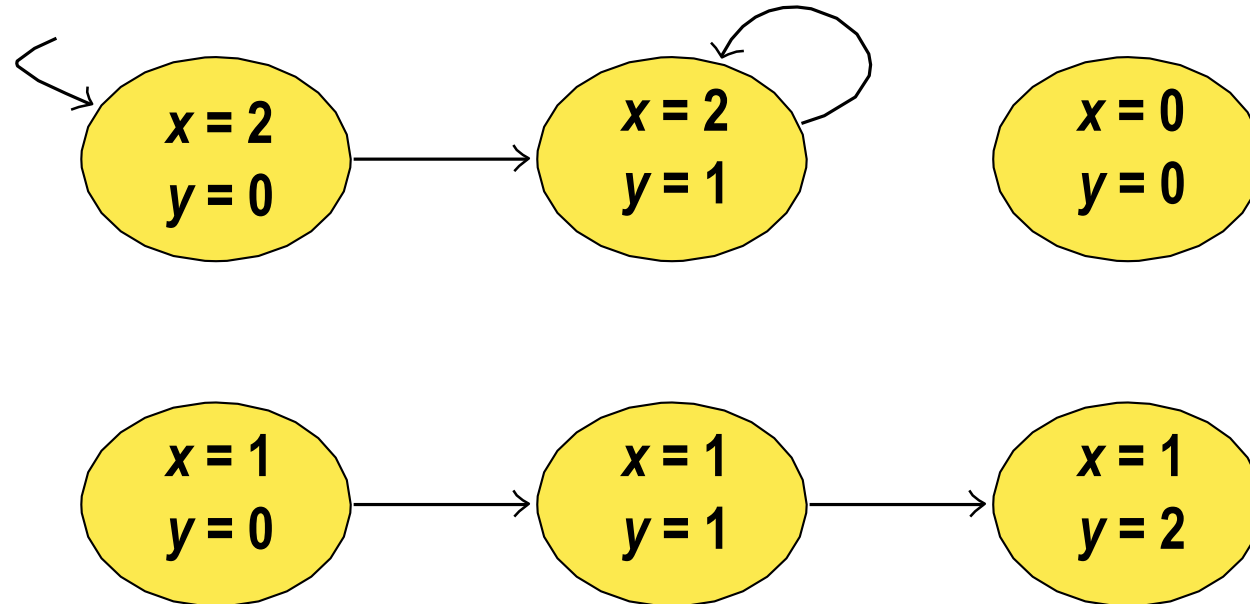
$$\hat{S} = B^n$$

- The abstraction function:

$$\alpha(s) = (\Pi_1(s), \dots, \Pi_n(s))$$

# Predicate Abstraction: the Basic Idea

Concrete states over variables  $x, y$ :



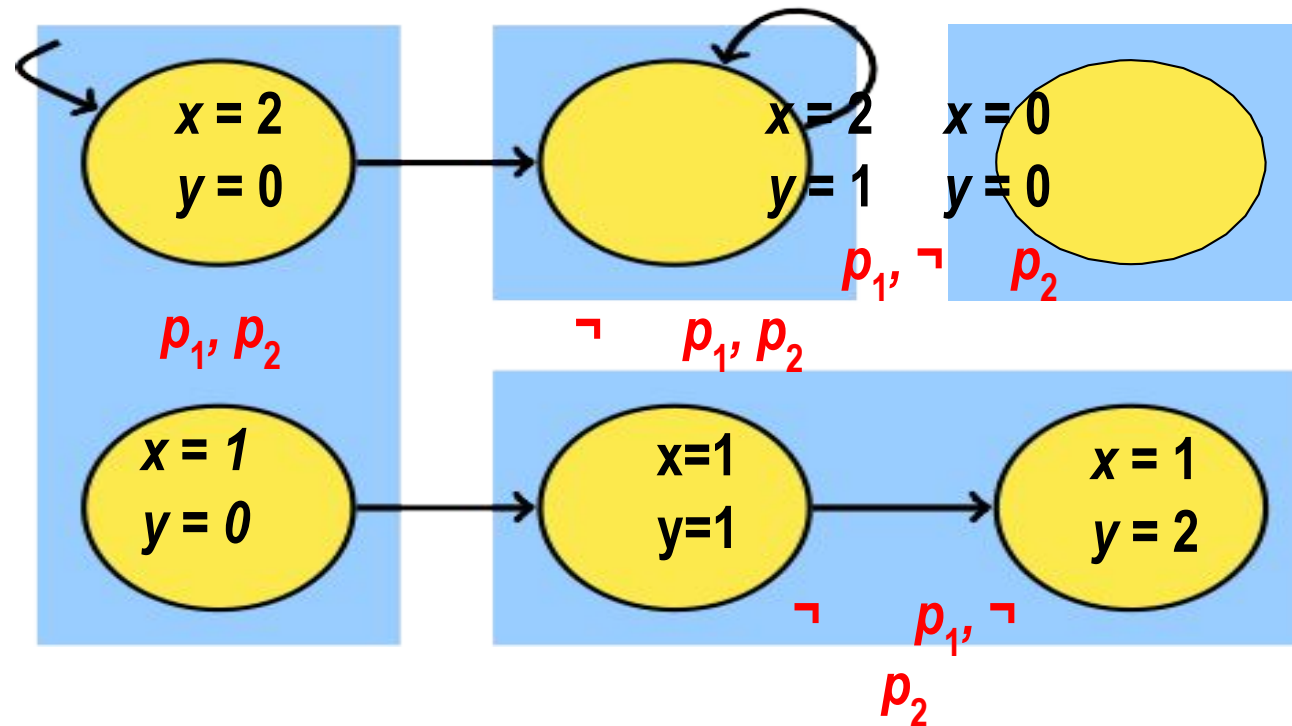
Predicates:

$$p1 \iff x > y$$

$$p2 \iff y = 0$$

# Predicate Abstraction: The Basic Idea

Concrete states over variables  $x, y$ :



Predicates:

$$p_1 \iff x > y$$

$$p_2 \iff y = 0$$

Abstract Transitions?



# Existential Abstraction<sup>1</sup>

## Definition (Existential Abstraction)

A model  $\hat{M} = (\hat{S}, \hat{S}_0, \hat{T})$  is an *existential abstraction* of

$M = (S, S_0, T)$  with respect to  $\alpha: \hat{S} \rightarrow S$  iff

- $\forall s \in S_0. \alpha(s) \in \hat{S}_0$  and
- $\exists (s, s^t) \in T. \alpha(s) = \hat{s} \wedge \alpha(s^t) = \hat{s}^t \Rightarrow (\hat{s}, \hat{s}^t) \in \hat{T}.$

---

<sup>1</sup>Clarke, Grumberg, Long: *Model Checking and Abstraction*, ACM TOPLAS, 1994

# Minimal Existential Abstractions

There are obviously many choices for an existential abstraction for a given  $\alpha$ .

## Definition (Minimal Existential Abstraction)

A model  $\hat{M} = (\hat{S}, \hat{S}_0, \hat{T})$  is the *minimal existential abstraction* of

$M = (S, S_0, T)$  with respect to  $\alpha: S \rightarrow \hat{S}$  iff

- $\exists (s, s^t) \in T. \alpha(s) = \hat{s} \wedge \alpha(s^t) = \hat{s}^t \iff (\hat{s}, \hat{s}^t) \in \hat{T}.$

This is the most precise existential abstraction.

# Existential Abstraction

We write  $\alpha(\pi)$  for the abstraction of a path  $\pi = s_0, s_1, \dots$ :

$$\alpha(\pi) = \alpha(s_0), \alpha(s_1), \dots$$

# Existential Abstraction

We write  $\alpha(\pi)$  for the abstraction of a path  $\pi = s_0, s_1, \dots$ :

$$\alpha(\pi) = \alpha(s_0), \alpha(s_1), \dots$$

## Lemma

*Let  $\hat{M}$  be an existential abstraction of  $M$ . The abstraction of every path (trace)  $\pi$  in  $M$  is a path (trace) in  $\hat{M}$ .*

$$\pi \in M \Rightarrow \alpha(\pi) \in \hat{M}$$

Proof by induction.

# Abstracting Properties

Reminder: we are using

- a set of **atomic propositions** (predicates)  $A$ , and
- a **state-labelling function**  $L : S \rightarrow P(A)$

in order to define the meaning of propositions in our properties.

# Abstracting Properties

We define an abstract version of it as follows:

- First of all, the negations are pushed into the atomic propositions.

E.g., we will have

$$x = 0 \in A \text{ and } x \neq 0 \in A$$

# Abstracting Properties

- An abstract state  $s^\wedge$  is labelled with  $a \in A$  iff **all** of the corresponding concrete states are labelled with  $a$ .

$$a \in L(s^\wedge) \Leftrightarrow \forall s \mid \alpha(s) = s^\wedge. a \in L(s)$$

- This also means that an abstract state may have neither the label  $x = 0$  nor the label  $x \neq 0$  – this may happen if it concretizes to concrete states with different labels!

# Conservative Abstraction

The keystone is that existential abstraction is **conservative** for certain properties:

Theorem (Clarke/Grumberg/Long 1994)

*Let  $\varphi$  be a  $\forall$  CTL\* formula where all negations are pushed into the atomic propositions, and let  $\hat{M}$  be an existential abstraction of  $M$ . If  $\varphi$  holds on  $\hat{M}$ , then it also holds on  $M$ .*

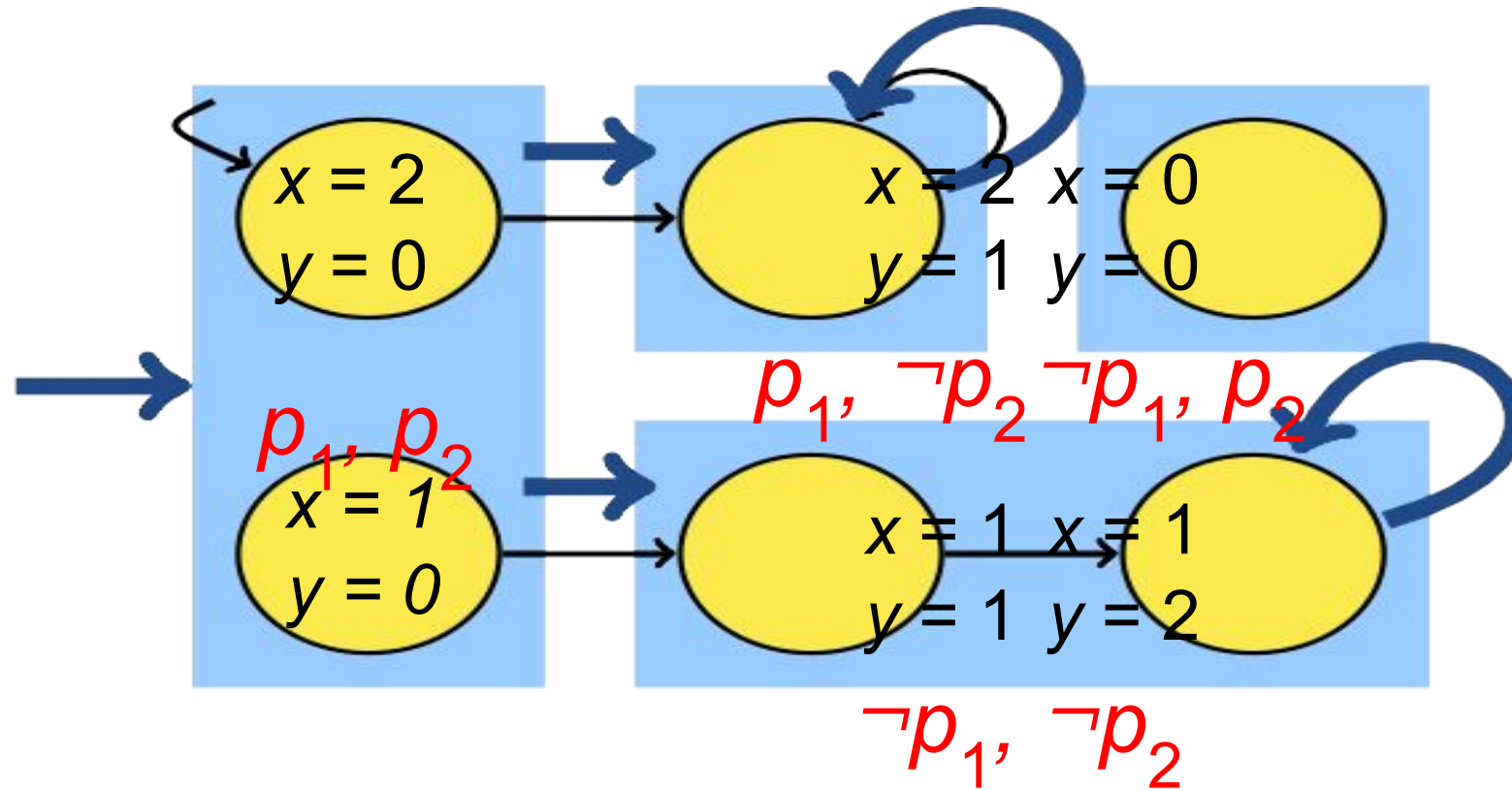
$\hat{M} \models \varphi \implies M \models \varphi$

We say that an existential abstraction is conservative for  $\forall$  CTL\* properties. The same result can be obtained for LTL properties.

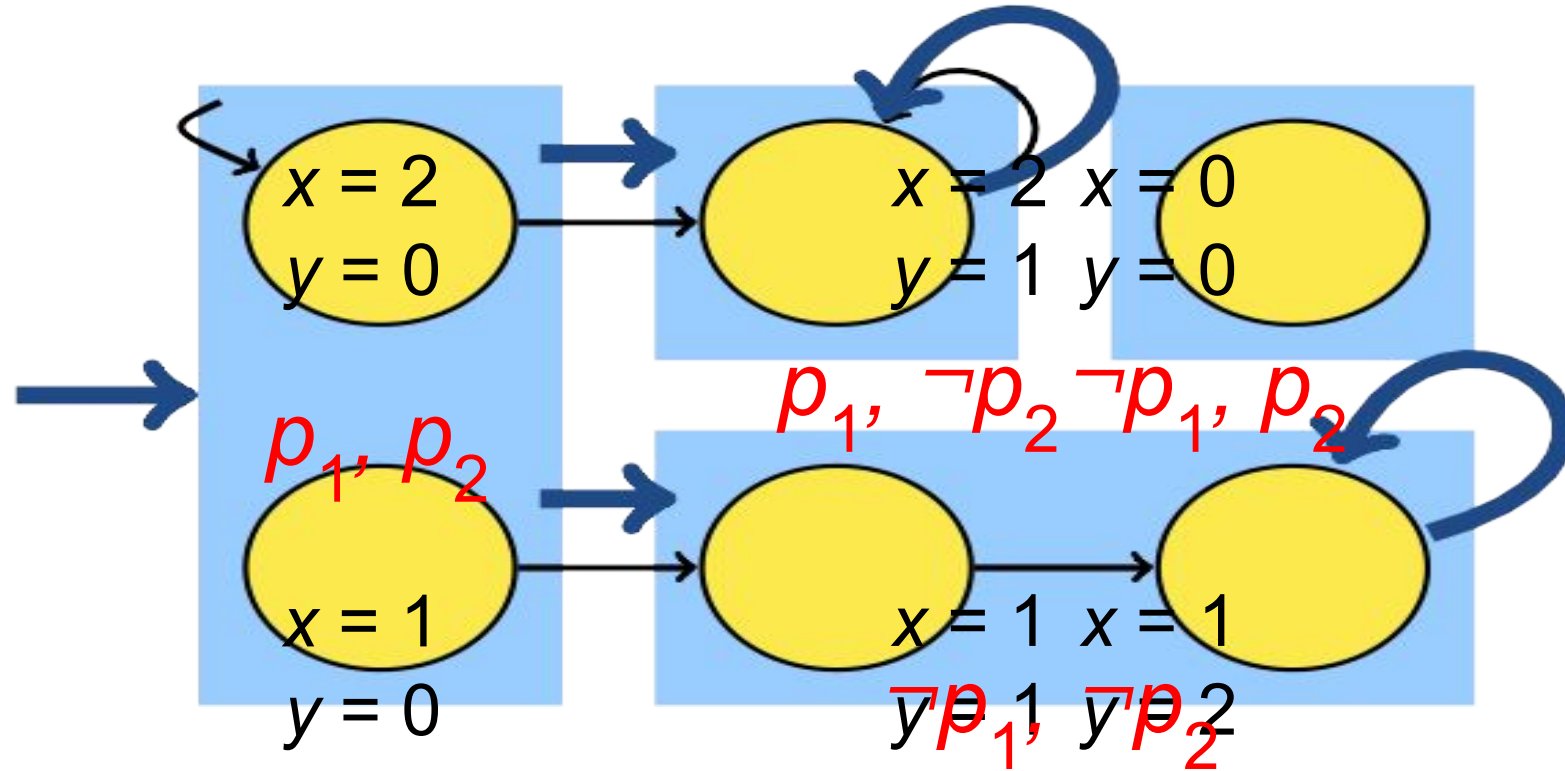
The proof uses the lemma and is by induction on the structure of  $\varphi$ . The converse usually does not hold.



# Back to the Example



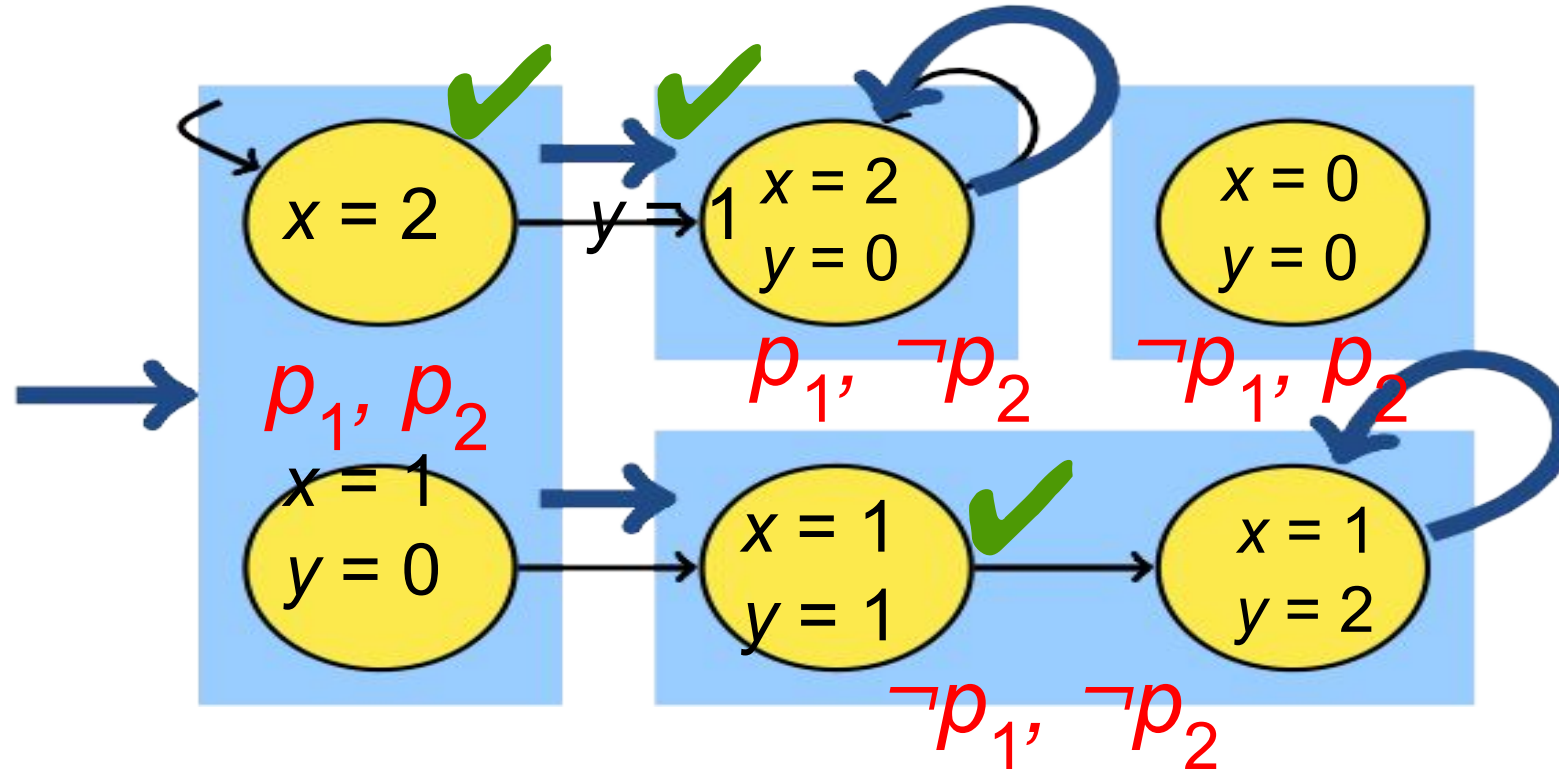
# Let's try a Property



Property:

$$x > y \vee y \neq 0 \iff p_1 \vee \neg p_2$$

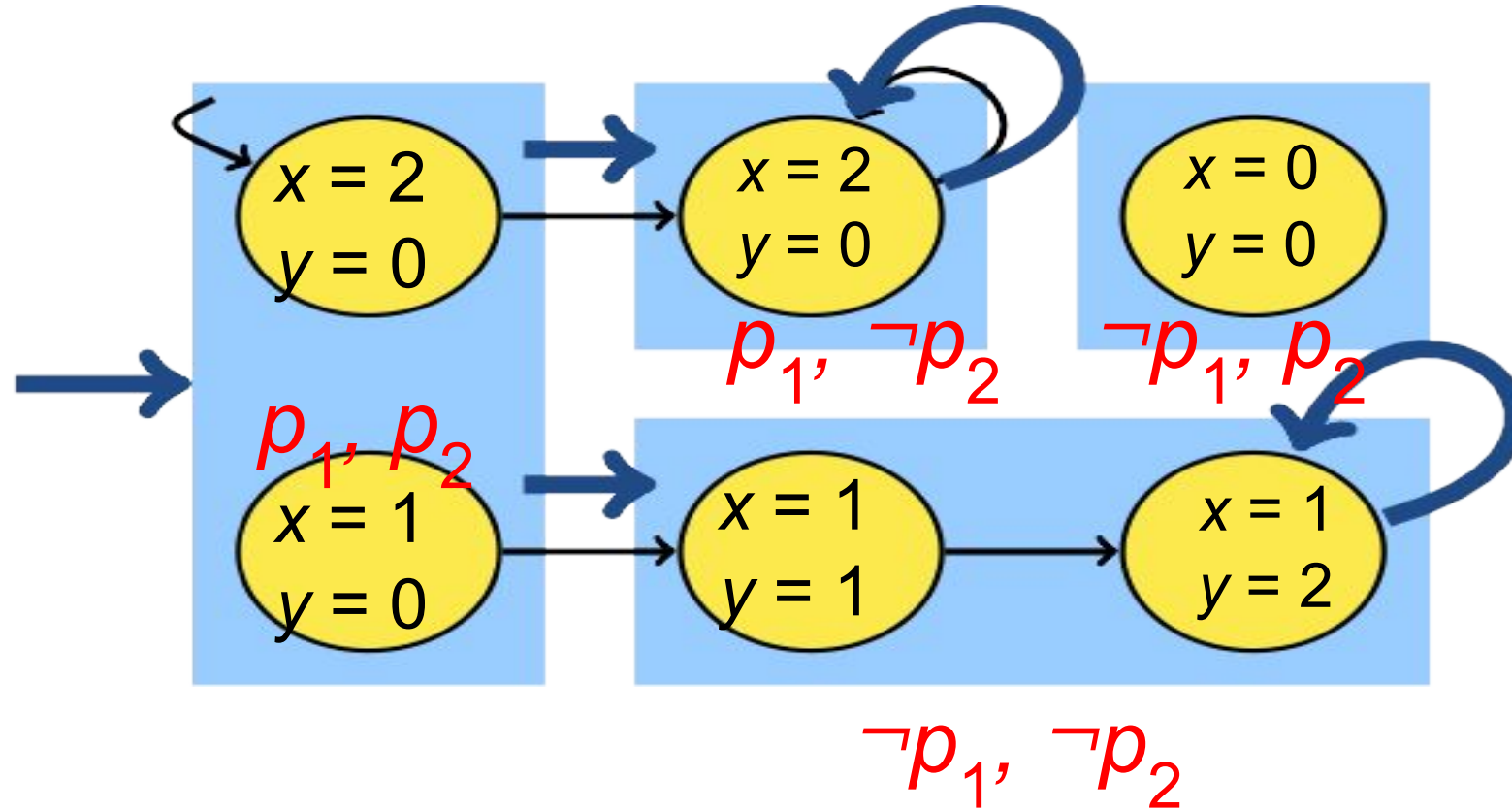
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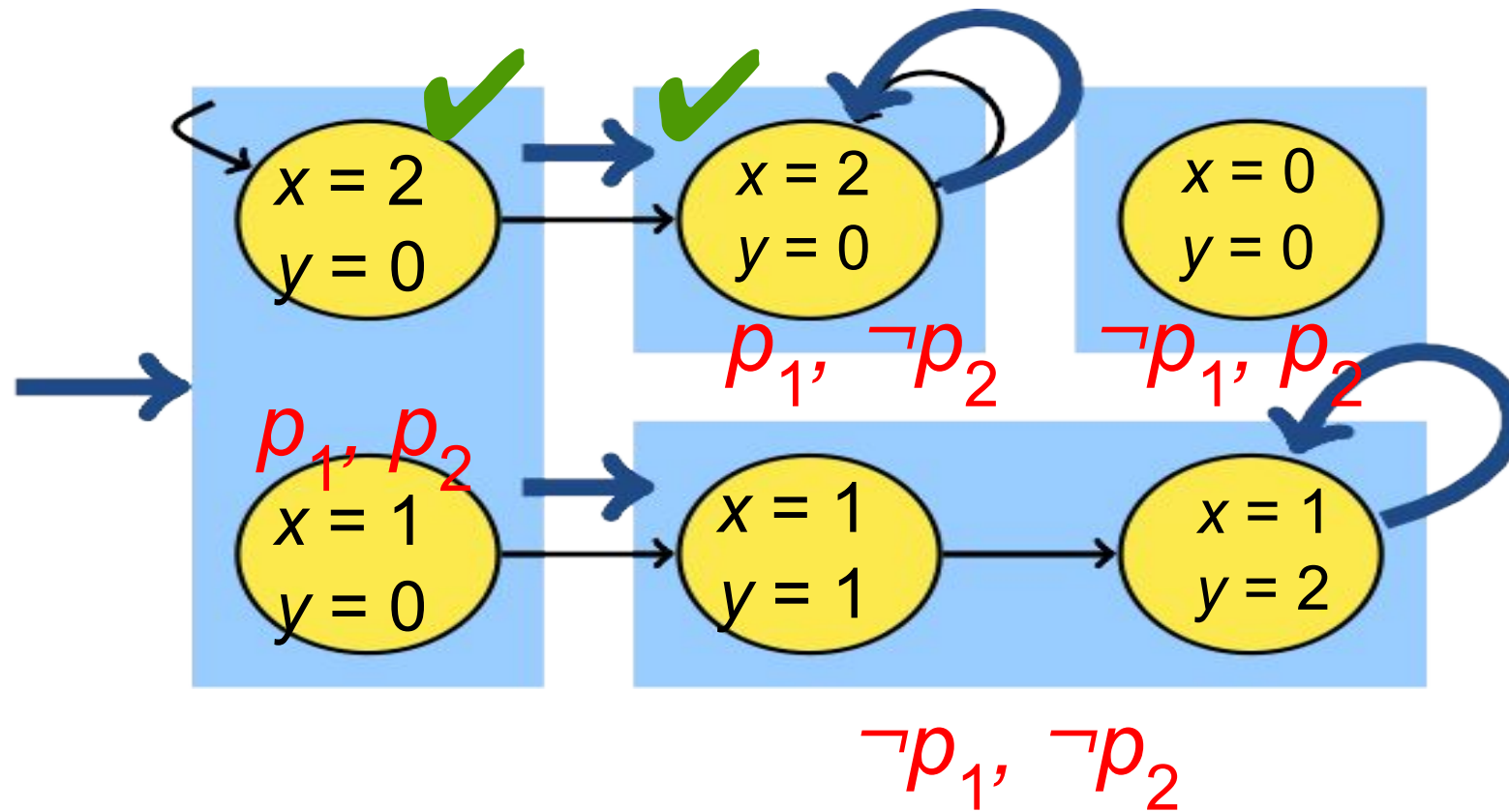
# Another Property



Property:

$$x > y \iff p_1$$

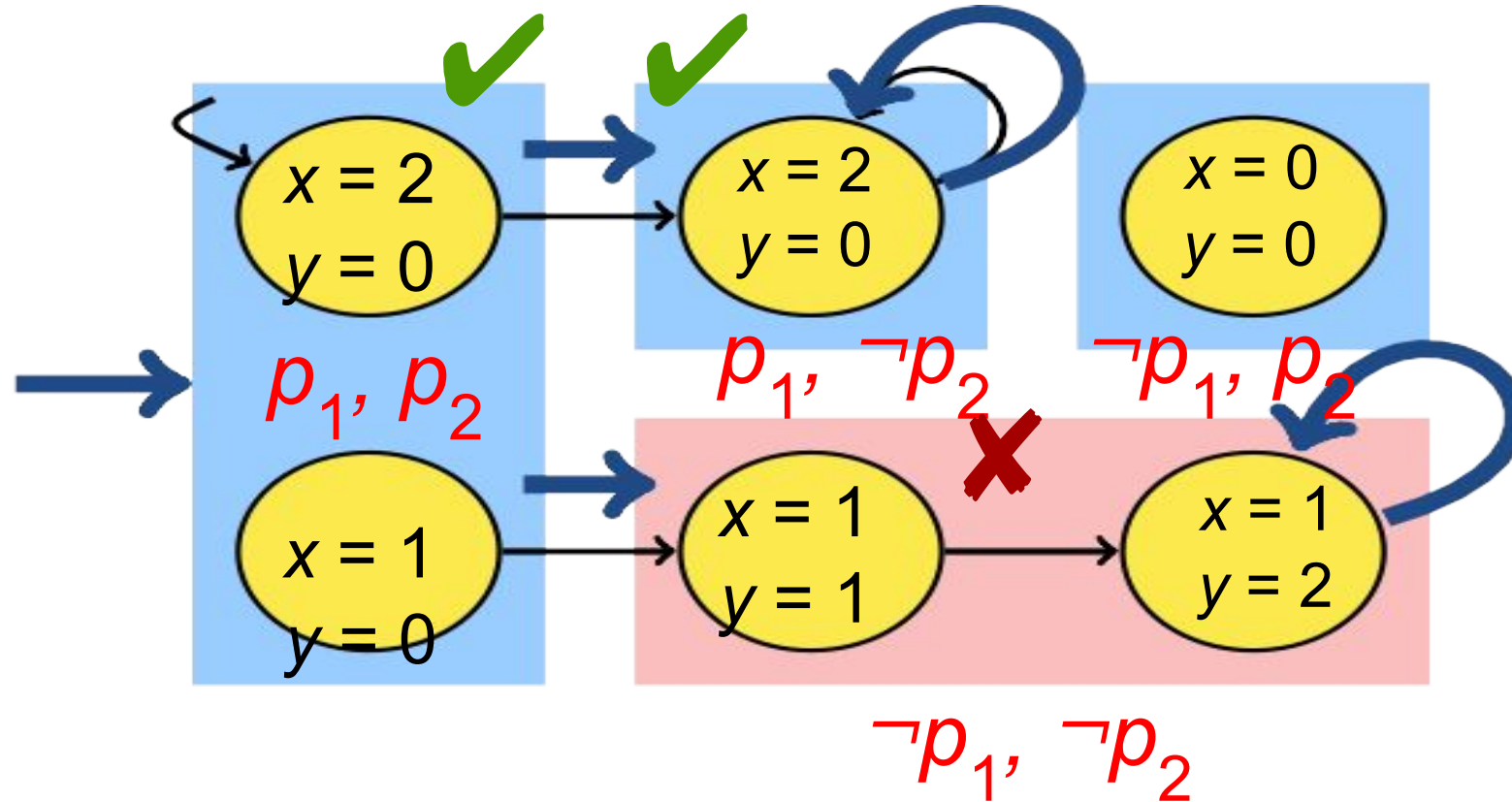
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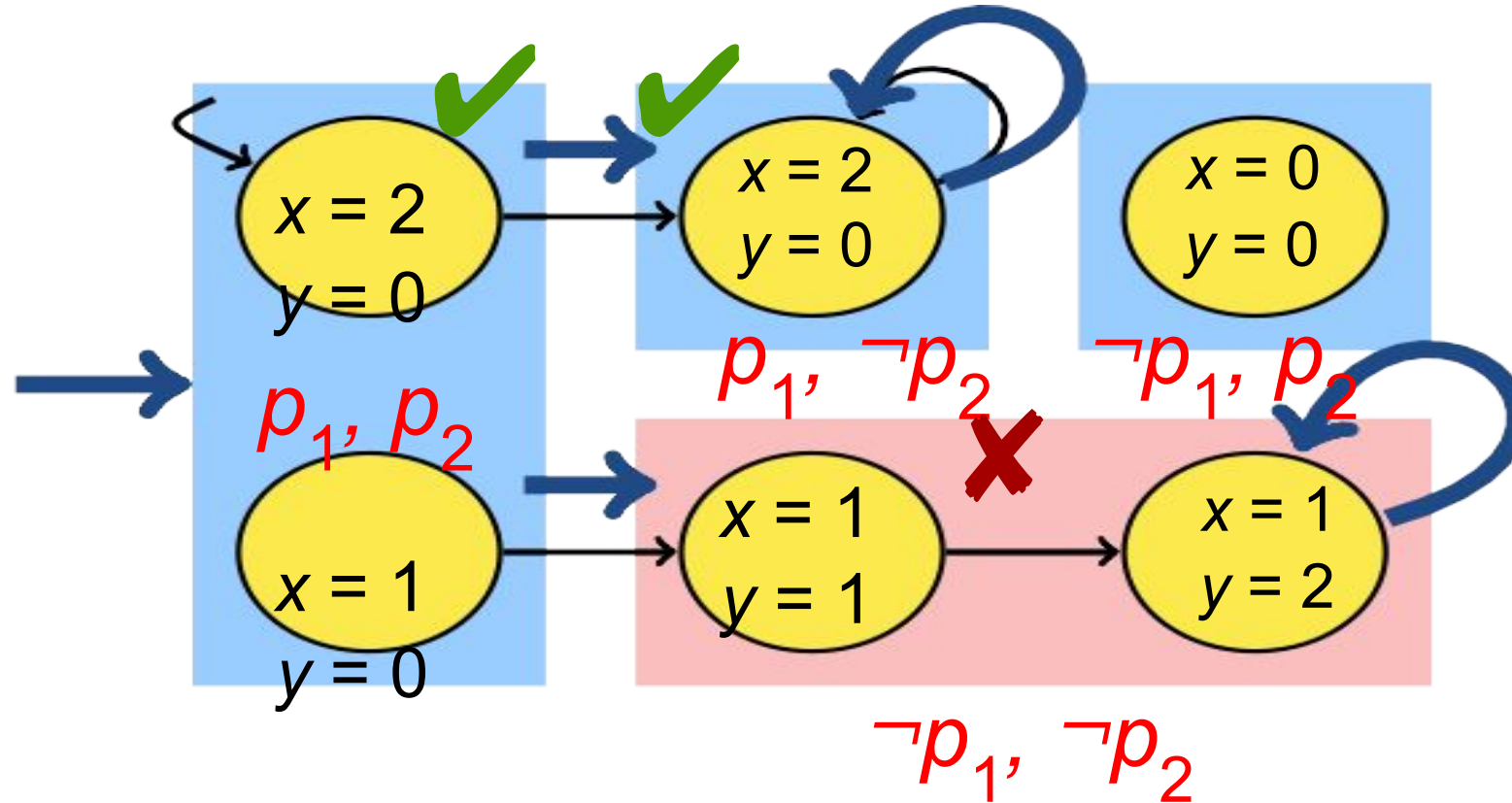
# Another Property



Property:

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## Another Property



Property:  
 $x > y \iff p_1$

But: the counterexample is **spurious**

# SLAM

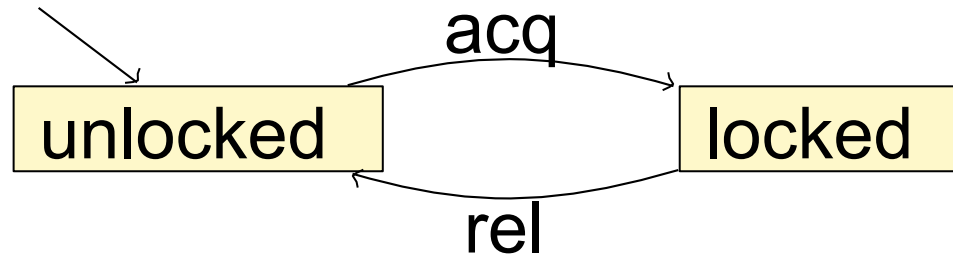
- Microsoft blames most Windows crashes on **third party device drivers**
- The Windows device driver API is quite complicated
- Drivers are low level C code
- **SLAM**: Tool to automatically check device drivers for certain errors
- **SLAM** is shipped with Device Driver Development Kit
- Full detail available at <http://research.microsoft.com/slam/>



# SLIC

- **Finite state language** for defining properties
  - Monitors behavior of C code
  - Temporal safety properties (security automata)
  - familiar C syntax
- **Suitable for expressing control-dominated properties**
  - e.g., proper sequence of events
  - can track data values

# SLIC Example

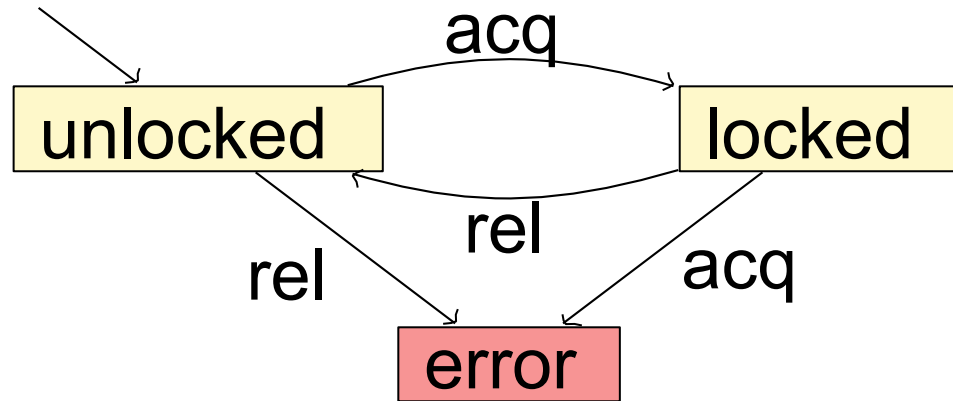


```
state {  
    enum { Locked , Unlocked }  
    s = Unlocked ;  
}
```

```
KeAcquireSpinLock . entry {  
    if ( s==Locked ) abort ;  
    else s = Locked ;  
}
```

```
KeReleaseSpinLock . entry {  
    if ( s==Unlocked ) abort ;  
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}
```

# SLIC Example



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# Refinement Example

```
do {  
    KeAcquireSpinLock ();  
  
    nPacketsOld = nPackets;  
  
    if (request) {  
        request = request->Next;  
        KeReleaseSpinLock ();  
        nPackets++;  
    }  
  
} while(nPackets != nPacketsOld);  
  
KeReleaseSpinLock ();
```

# Refinement Example

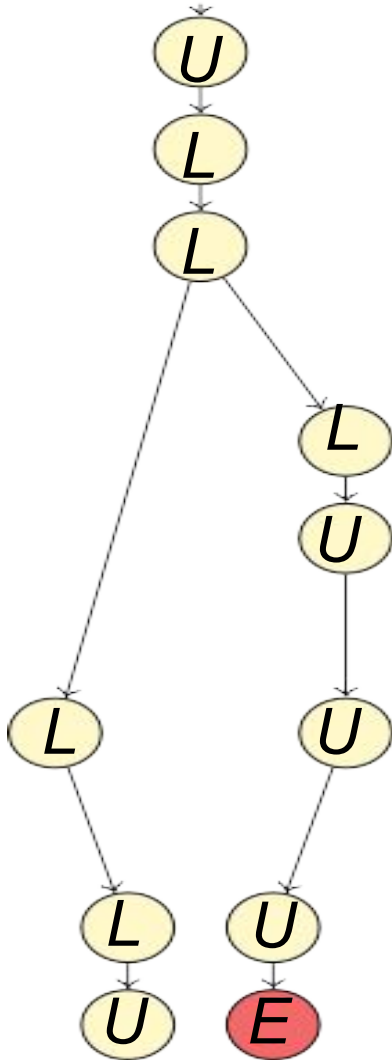
Does this code obey the locking rule?

```
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    KeAcquireSpinLock ();  
  
    nPacketsOld = nPackets;  
  
    if (request) {  
        request = request->Next;  
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    }  
  
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KeReleaseSpinLock ();
```

# Refinement Example

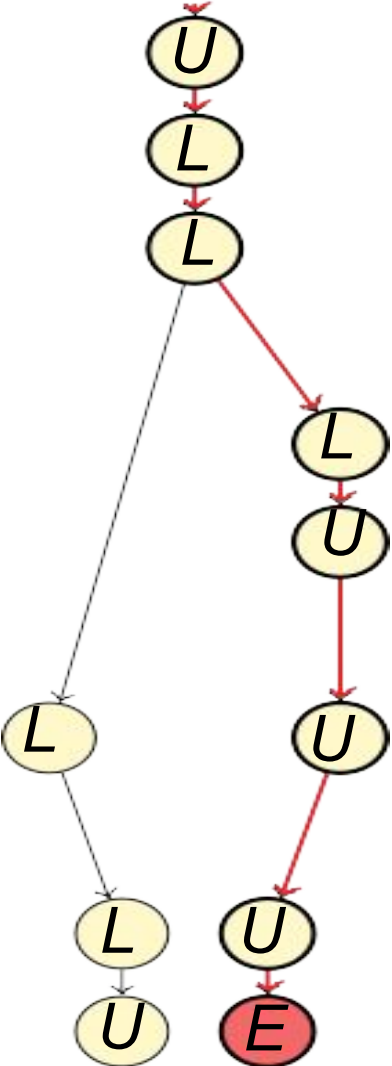
```
do {  
    KeAcquireSpinLock ();  
  
    if (*) {  
  
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} while(*);  
  
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# Refinement Example



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```

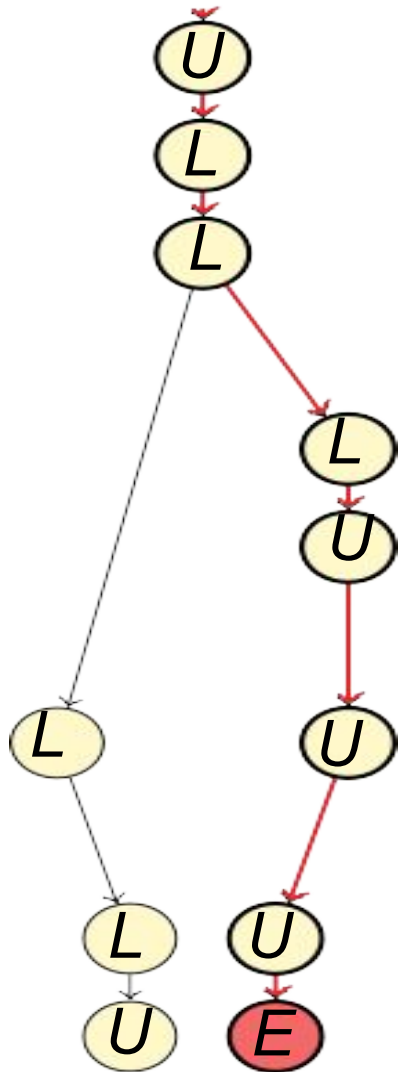
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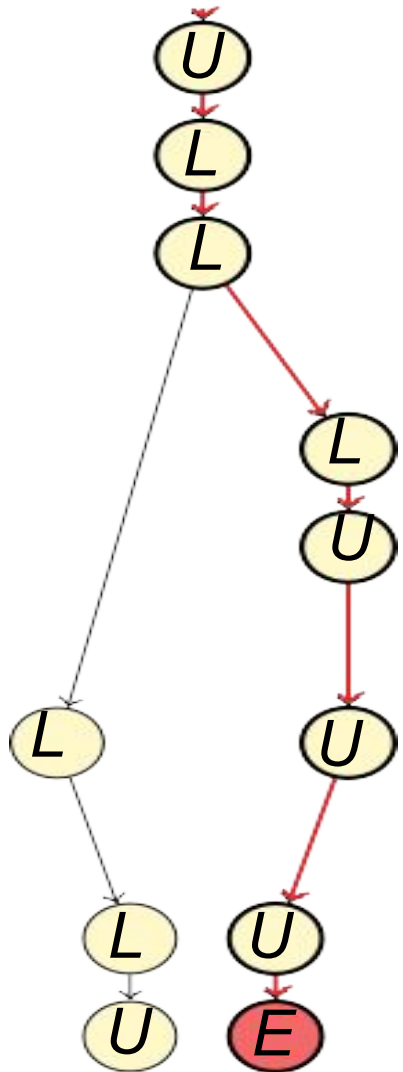
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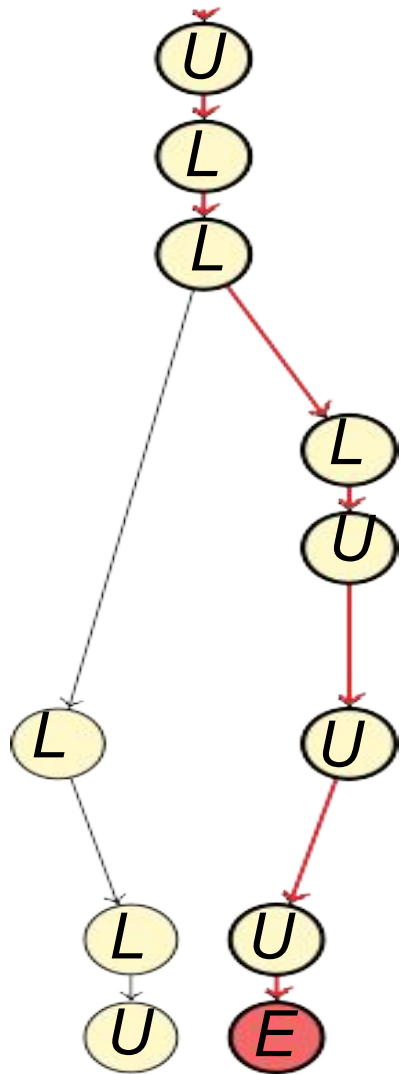
Is this path  
concretizable?

# Refinement Example



```
do {  
    KeAcquireSpinLock ();  
  
    nPacketsOld = nPackets;  
  
    if (request) {  
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    }  
} while(nPackets != nPacketsOld);  
  
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```

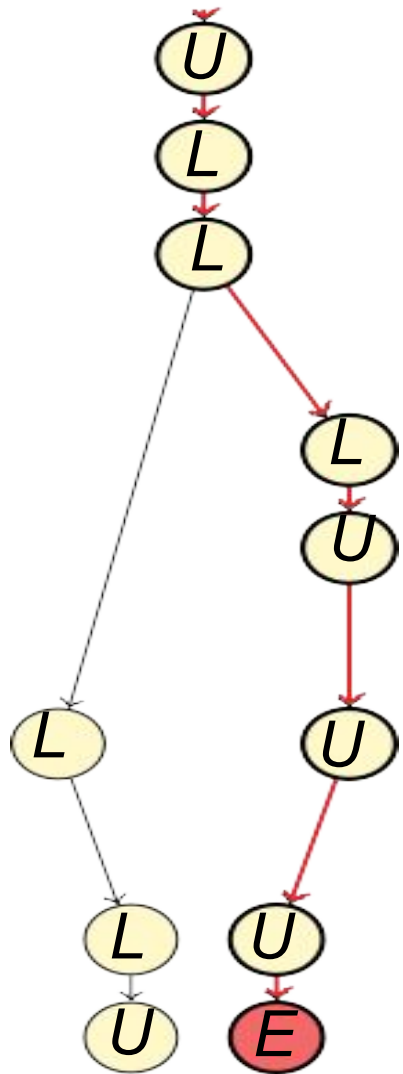
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```

This path is  
**spurious!**

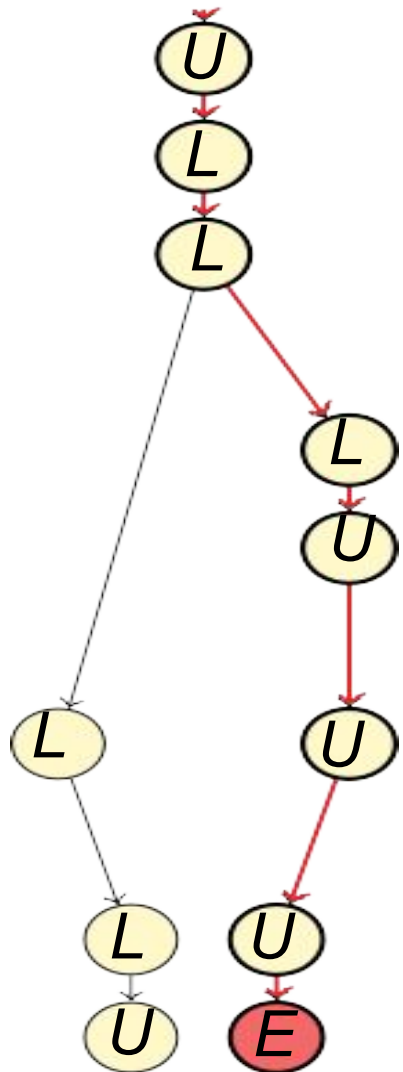
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```

Let's add the predicate  
 $nPacketsOld == nPackets$

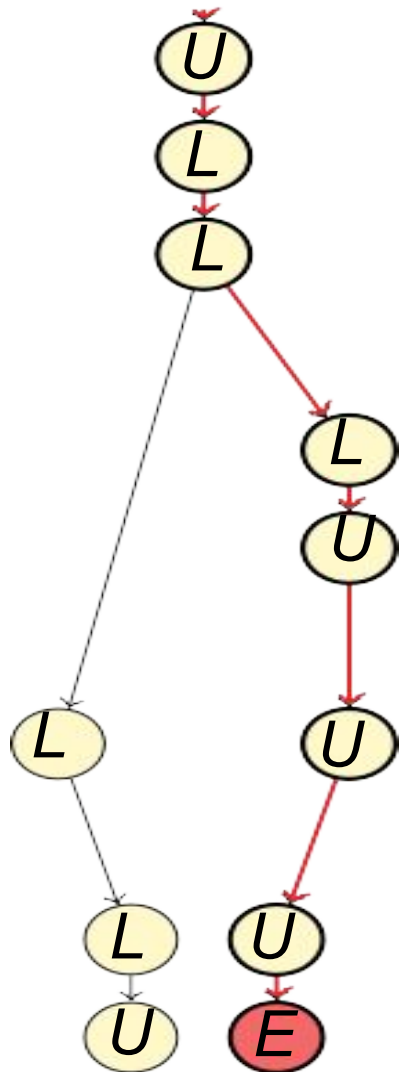
# Refinement Example



```
do {  
  KeAcquireSpinLock ();  
  
  nPacketsOld = nPackets; b=true;  
  
  if (request) {  
    request = request->Next;  
    KeReleaseSpinLock (); nPackets++;  
  }  
} while(nPackets != nPacketsOld);  
  
KeReleaseSpinLock ();
```

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# Refinement Example



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do {  
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  nPacketsOld = nPackets;  
  
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} while(nPackets != nPacketsOld);  
  
KeReleaseSpinLock ();
```

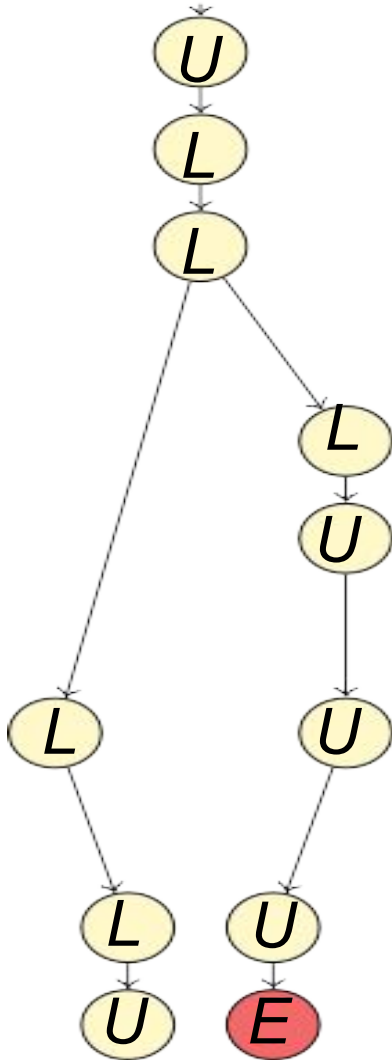
b=true;

b=b?false:\*;

!b

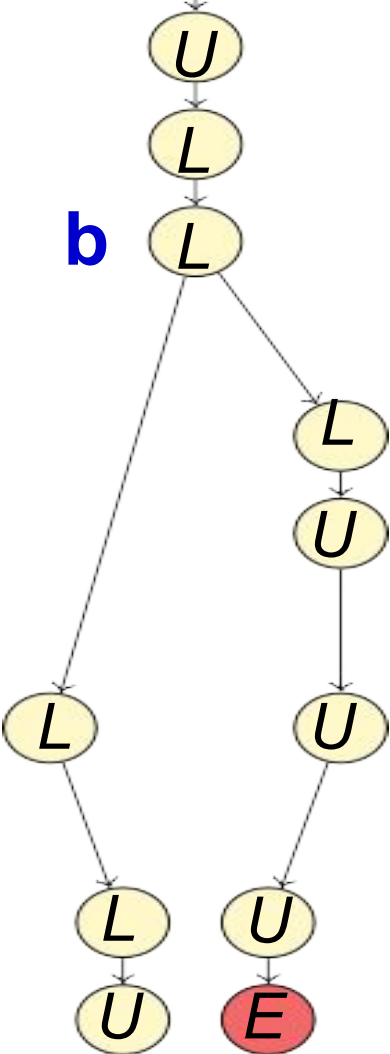
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# Refinement Example



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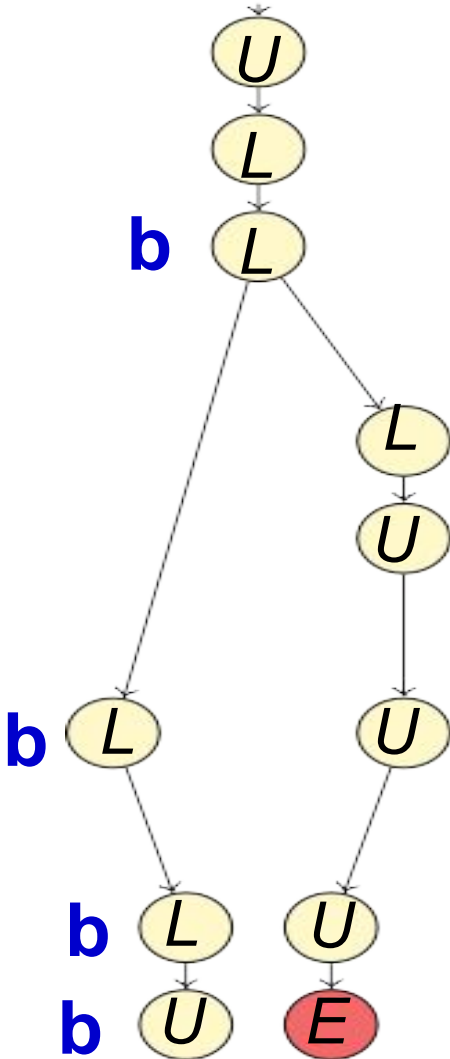
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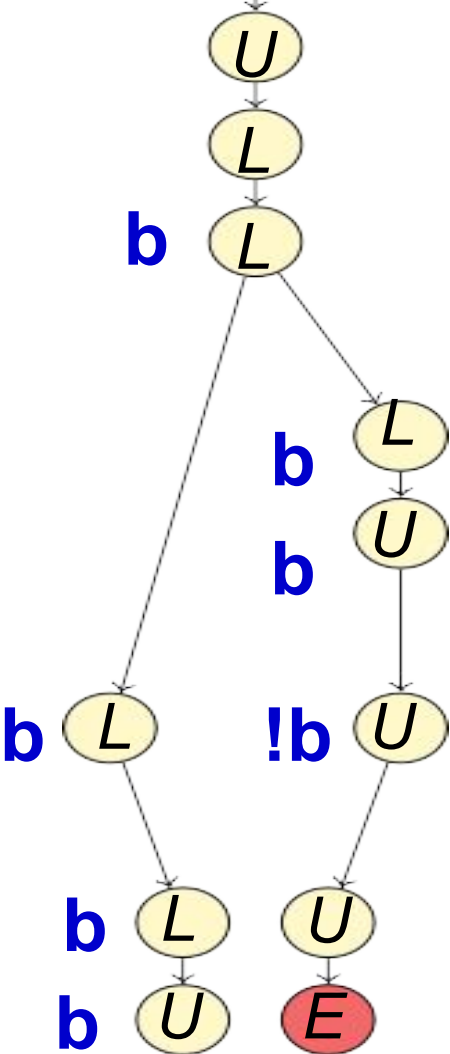


# Refinement Example



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    }  
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KeReleaseSpinLock ();
```

# Refinement Example



```

do {
    KeAcquireSpinLock ();
    b=true;

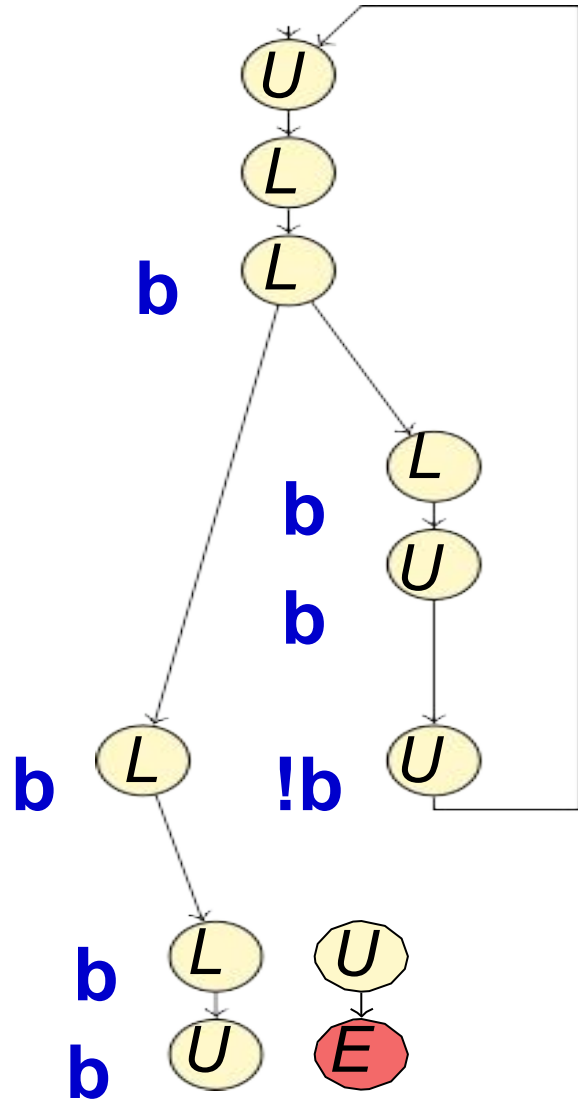
    if (*) {
        KeReleaseSpinLock ();
        b=b?false:*;
    }
} while( !b );

KeReleaseSpinLock ();

```



# Refinement Example



```
do {
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    b=true;

    if (*) {
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        b=b?false:*;
    }
} while( !b );

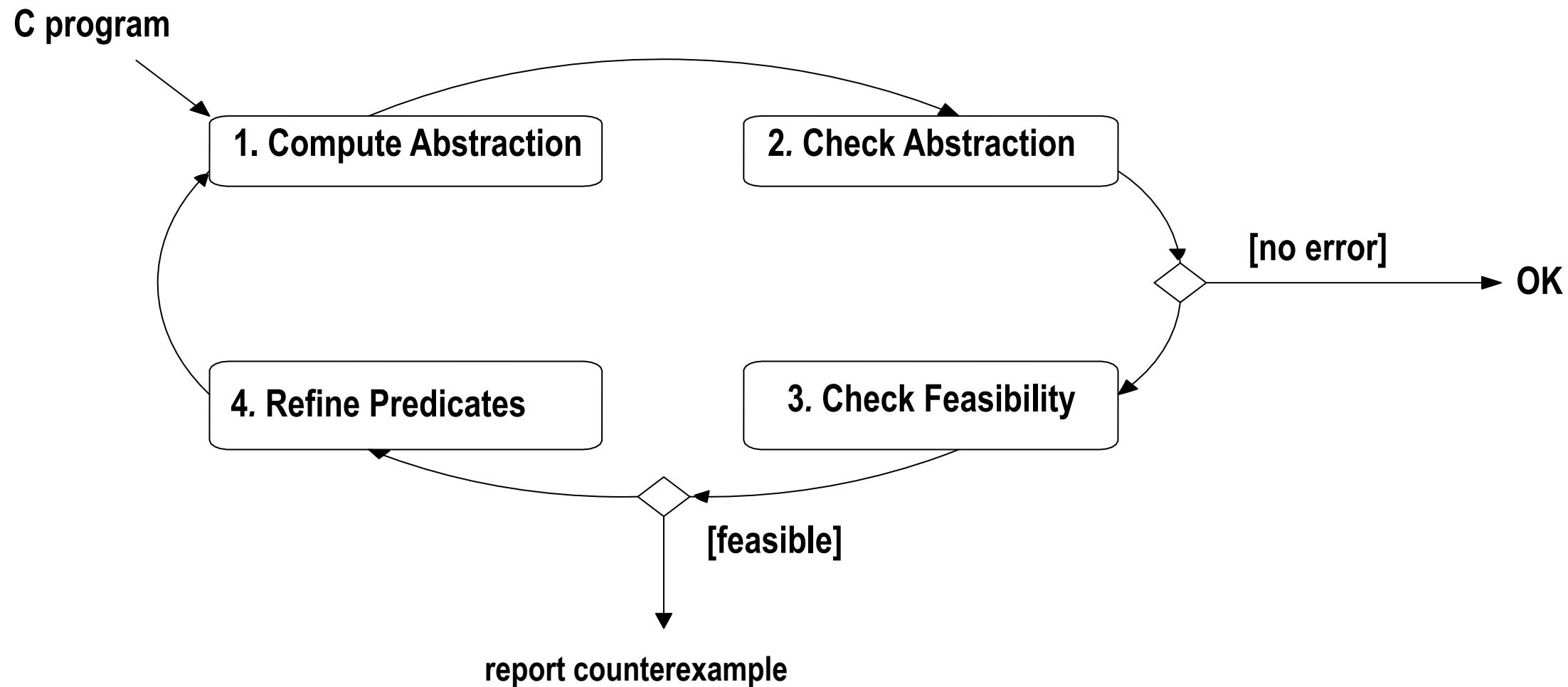
KeReleaseSpinLock ();
```

The property holds!

# Counterexample-guided Abstraction Refinement

- **“CEGAR”**
- **An iterative method to compute a sufficiently precise abstraction**
- **Initially applied in the context of hardware [Kurshan]**

# CEGAR Overview

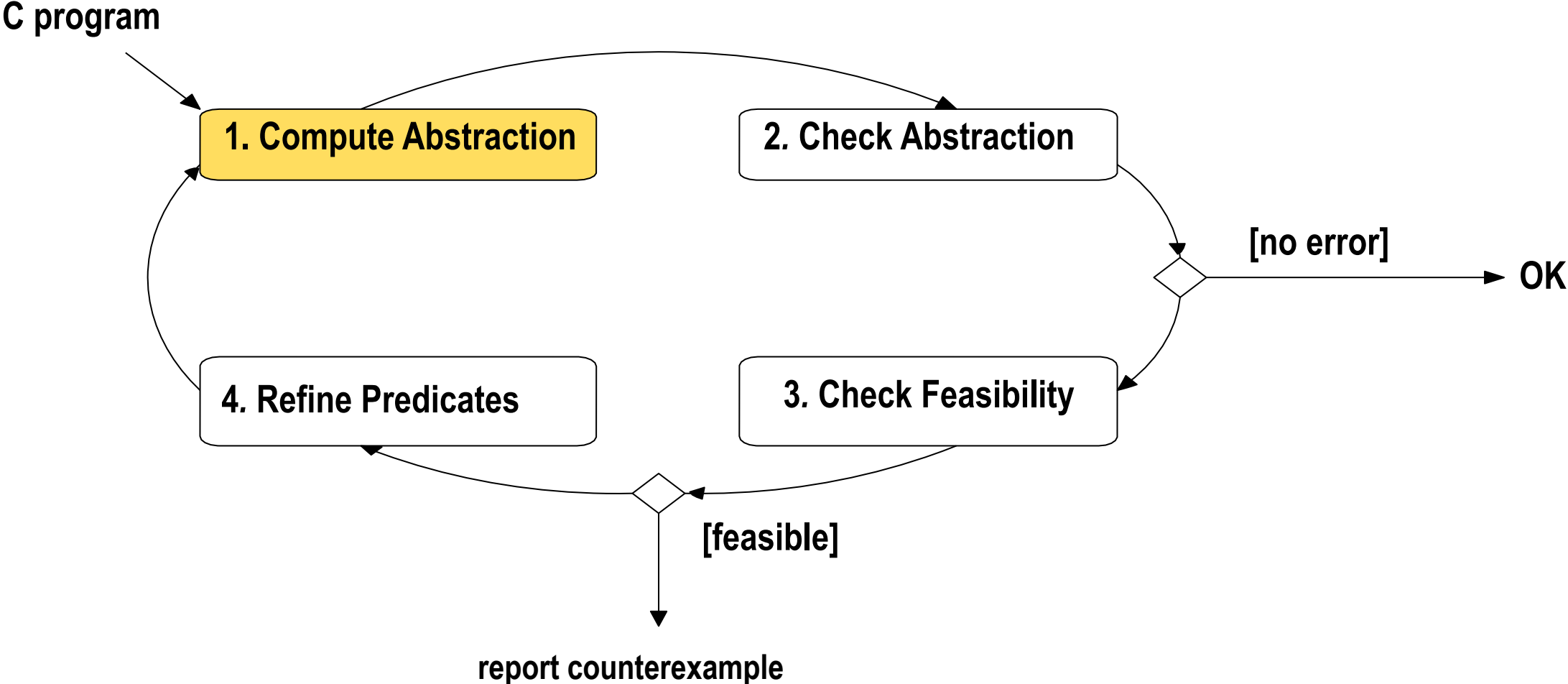


# Counterexample-guided Abstraction Refinement

## Claims:

1. This never returns a false error.
2. This never returns a false proof.
3. This is complete for finite-state models.
4. But: no termination guarantee in case of infinite-state systems

# CEGAR Overview





# Computing Existential Abstractions of Programs

```
int main ( ) {  
  int i ;  
  
  i = 0 ;  
  
  while ( even ( i ) )  
    i+ + ;  
}
```

C Program

+

$p_1 \Leftrightarrow i=0$   
 $p_2 \Leftrightarrow \text{even}(i)$

Predicates



```
void main ( ) {  
  bool p1 , p2 ;  
  
  p1=TRUE ;  
  p2=TRUE ;  
  
  while ( p2 ) {  
    p1 = p1 ? FALSE : * ;  
    p2= !p2 ;  
  }  
}
```

Boolean Program

Minimal?

# Predicate Images

Reminder:

$$Image(X) = \{s' \in S \mid \exists s \in X. T(s, s')\}$$

We need:

$$\widehat{Image}(\hat{X}) = \{\hat{s}' \in \hat{S} \mid \exists \hat{s} \in \hat{X}. \hat{T}(\hat{s}, \hat{s}')\}$$

$\widehat{Image}(\hat{X})$  is equivalent to:

$$\{\hat{s}, \hat{s}' \in \hat{S}^2 \mid \exists s, s' \in S^2. \alpha(s) = \hat{s} \wedge \alpha(s') = \hat{s}' \wedge T(s, s')\}$$

This is called the **predicate image** of  $T$ .

# Enumeration

- Let's take existential abstraction seriously
- Basic idea: with  $n$  predicates, there are  $2^n \cdot 2^n$  possible abstract transitions
- Let's just check them!

# Enumeration: Example

Predicates

$p_1 \iff i = 1$   
 $p_2 \iff i = 2$   
 $p_3 \iff \text{even}(i)$

Basic Block

$i ++;$



$T$

$i' = i + 1$

$p_1$	$p_2$	$p_3$		$p'_1$	$p'_2$	$p'_3$
0	0	0	$\xrightarrow{\text{?}} \text{X}$	0	0	0
0	0	1		0	0	1
0	1	0		0	1	0
0	1	1		0	1	1
1	0	0		1	0	0
1	0	1		1	0	1
1	1	0		1	1	0
1	1	1		1	1	1

Query to Solver

$i \neq 1 \wedge i \neq 2 \wedge \overline{\text{even}(i)} \wedge$   
 $i' = i + 1 \wedge$   
 $i' \neq 1 \wedge i' \neq 2 \wedge \overline{\text{even}(i')}$

# Enumeration: Example

Predicates

$p_1 \iff i = 1$   
 $p_2 \iff i = 2$   
 $p_3 \iff \text{even}(i)$

Basic Block

```
i ++;
```



T

```
i' = i + 1
```

$p_1$	$p_2$	$p_3$
0	0	0
0	0	1
0	1	0
0	1	1
1	0	0
1	0	1
1	1	0
1	1	1



$p'_1$	$p'_2$	$p'_3$
0	0	0
0	0	1
0	1	0
0	1	1
1	0	0
1	0	1
1	1	0
1	1	1

Query to Solver

$$i \neq 1 \wedge i \neq 2 \wedge \overline{\text{even}(i)} \wedge i' = i + 1 \wedge i' \neq 1 \wedge i' \neq 2 \wedge \text{even}(i')$$

# Enumeration: Example

Predicates

$p_1 \iff i = 1$   
 $p_2 \iff i = 2$   
 $p_3 \iff \text{even}(i)$

Basic Block

```
i ++;
```



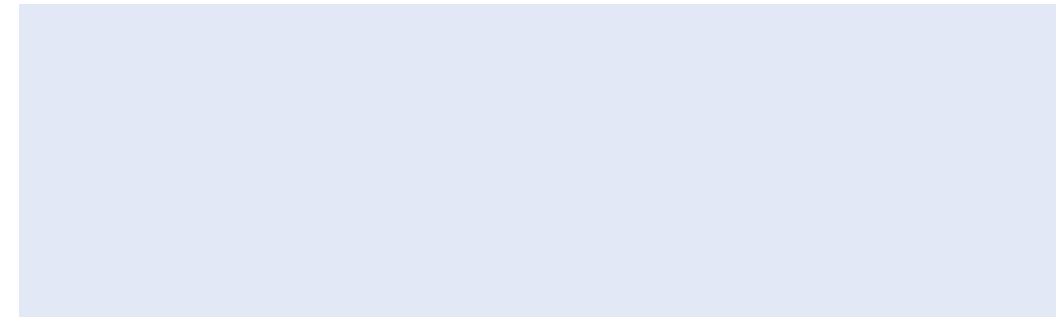
$T$

```
i' = i + 1
```

$p_1$	$p_2$	$p_3$
0	0	0
0	0	1
0	1	0
0	1	1
1	0	0
1	0	1
1	1	0
1	1	1

$p'_1$	$p'_2$	$p'_3$
0	0	0
0	0	1
0	1	0
0	1	1
1	0	0
1	0	1
1	1	0
1	1	1

Query to Solver



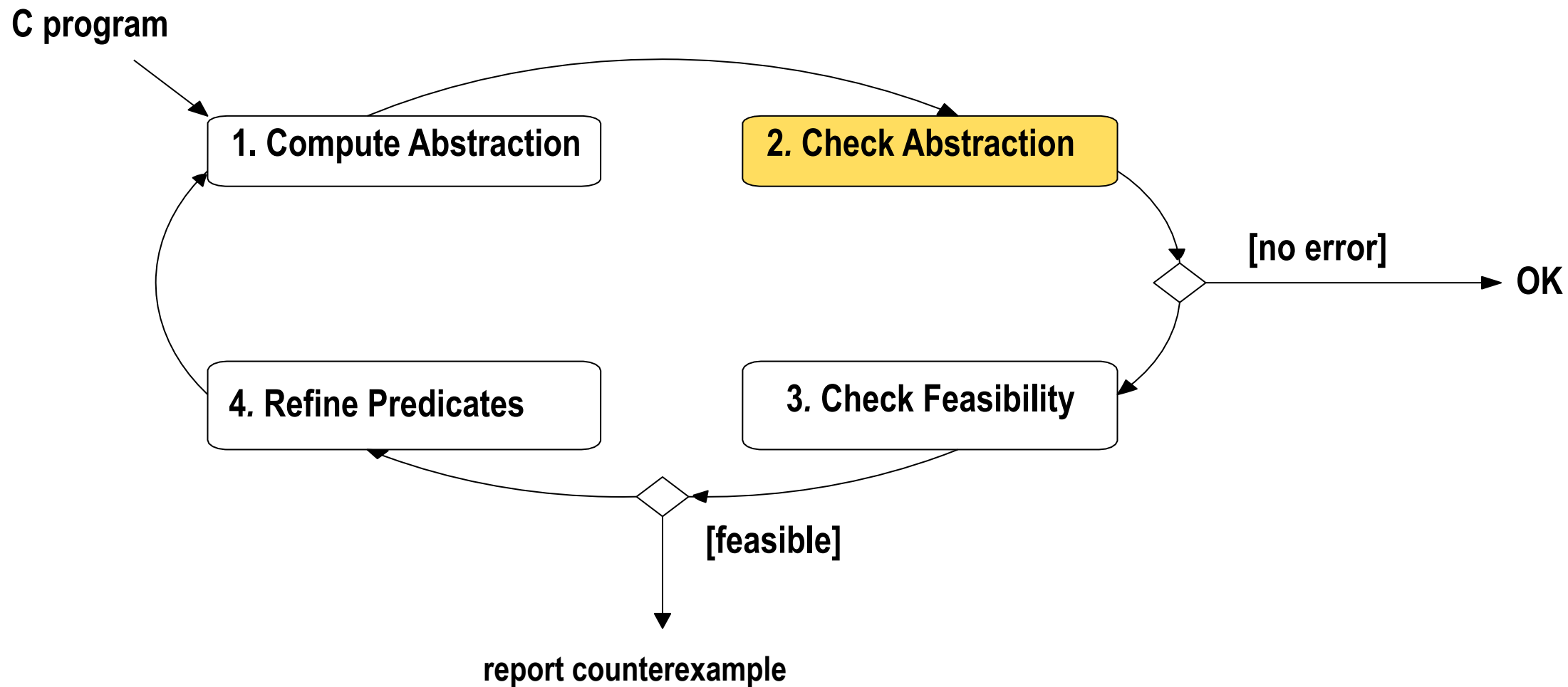
... and so on ...

# Predicate Images

Computing the minimal existential abstraction can be way too slow

- Use an over-approximation instead
  - ✓ Fast(er) to compute
  - ✗ But has additional transitions
- Examples:
  - Cartesian approximation (SLAM)
  - FastAbs (SLAM)
  - Lazy abstraction (Blast)
  - Predicate partitioning (VCEGAR)

# CEGAR Overview





# Finite-State Model Checkers: SMV

## Variables

```
VAR b0_argc_ge_1 : boolean ;      -- argc >= 1
VAR b1_argc_le_2147483646 : boolean ;  -- argc <= 2147483646
VAR b2 : boolean ;                -- argv[argc] == NULL
VAR b3_nmemb_ge_r : boolean ;        -- nmemb >= r
VAR b4 : boolean ;                -- p1 == &array[0]
VAR b5_i_ge_8 : boolean ;          -- i >= 8
VAR b6_i_ge_s : boolean ;         -- i >= s
VAR b7 : boolean ;                -- 1 + i >= 8
VAR b8 : boolean ;                -- 1 + i >= s
VAR b9_s_gt_0 : boolean ;         -- s > 0
VAR b10_s_gt_1 : boolean ;       -- s > 1
```

...

# Finite-State Model Checkers: SMV

## Control

-- program counter : 56 is the "terminating" PC

**VAR** PC : 0 .. 56 ;

**ASSIGN** init (PC) := 0 ; -- initial PC

**ASSIGN** next (PC) := **case**

PC = 0 : 1 ; -- other

PC = 1 : 2 ; -- other

...

PC=19: **case** -- **goto** ( with guard )

guard19 : 26 ;

1 : 20 ;

**esac** ;

. . .

# Finite-State Model Checkers: SMV

## ③ Data

```
TRANS (PC=0) -> next ( b0_argc_ge_1 ) = b0_argc_ge_1
                & next ( b1_argc_le_213646 ) = b1_argc_le_21646
                & next ( b2 ) = b2
                & ( ! b30 | b36 ) | b42 )
                & ( ! b17 | ! b30 | b48 )
                & ( ! b30 | ! b42 | ! b42 | b54 )
                & ( ! b17 | ! b30
                & ( ! b54 | b60 )
```

```
TRANS (PC=1) -> next ( b0_argc_ge_1 ) = b0_argc_ge_1
                & next ( b1_argc_le_214646 ) = b1_argc_le_214746
                & next ( b2 ) = b2
                & next ( b3_nmemb_ge_r ) = b3_nmemb_ge_r
                & next ( b4 ) = b4
                & next ( b5_ige_8 ) = b5_ige_8
                & next ( b6_ige_s ) = b6_ige_s
```

# Finite-State Model Checkers: SMV

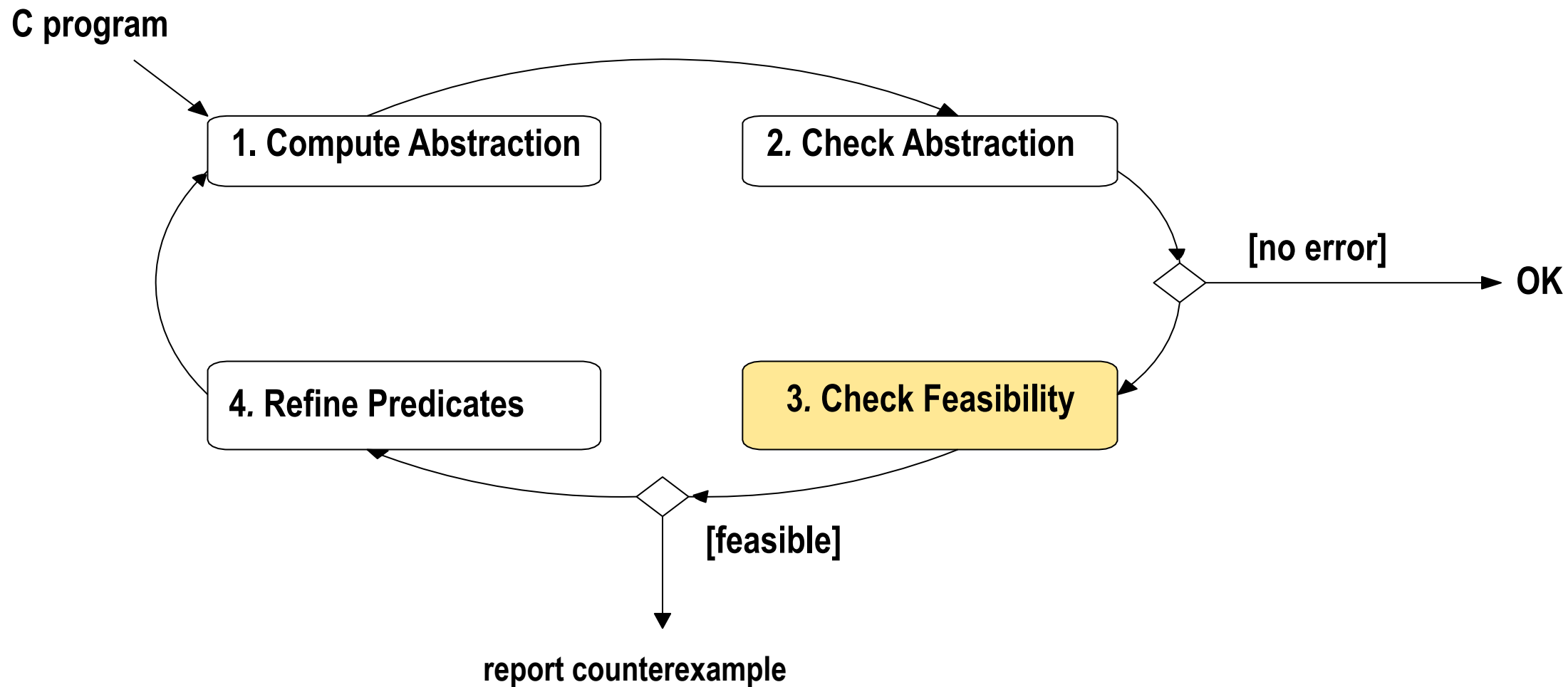
Property  
-- ④ the specification

-- file main.c line 20 column 12  
-- function c :: very buggy function  
**SPEC AG** ( ( PC=51 ) -> ! b23 )

# Finite-State Model Checkers: SMV

- If the property holds, we can terminate
- If the property fails, SMV generates a **counterexample** with an assignment for all variables, including the PC

# CEGAR Overview



# Lazy Abstraction

- The progress guarantee is only valid if the minimal existential abstraction is used.
- Thus, distinguish **spurious transitions** from **spurious prefixes**.
- Refine spurious transitions separately to obtain minimal existential abstraction
- SLAM: Constrain

# Lazy Abstraction

- One more observation:  
Each iteration only **causes only minor changes** in the abstract model
- Thus, use “incremental Model Checker”, which **retains the set of reachable states between iterations** (BLAST)

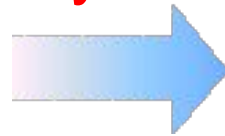


# Example Simulation

```
int main() {  
    int x, y;  
    y=1;  
    x=1;  
    if (y>x)  
        y—;  
    else  
        y++;  
    assert(y>x);  
}
```

Predicate:

$y > x$



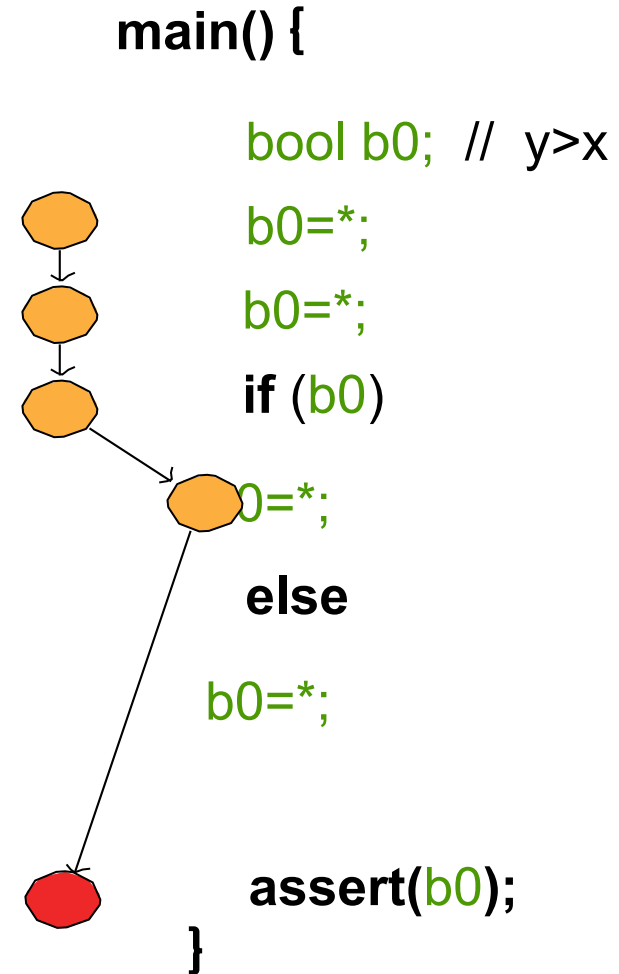
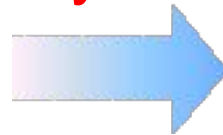
```
main() {  
    bool b0; // y>x  
    b0=*;  
    b0=*;  
    if (b0)  
        b0=*;  
    else  
        b0=*;  
    assert(b0);  
}
```

# Example Simulation

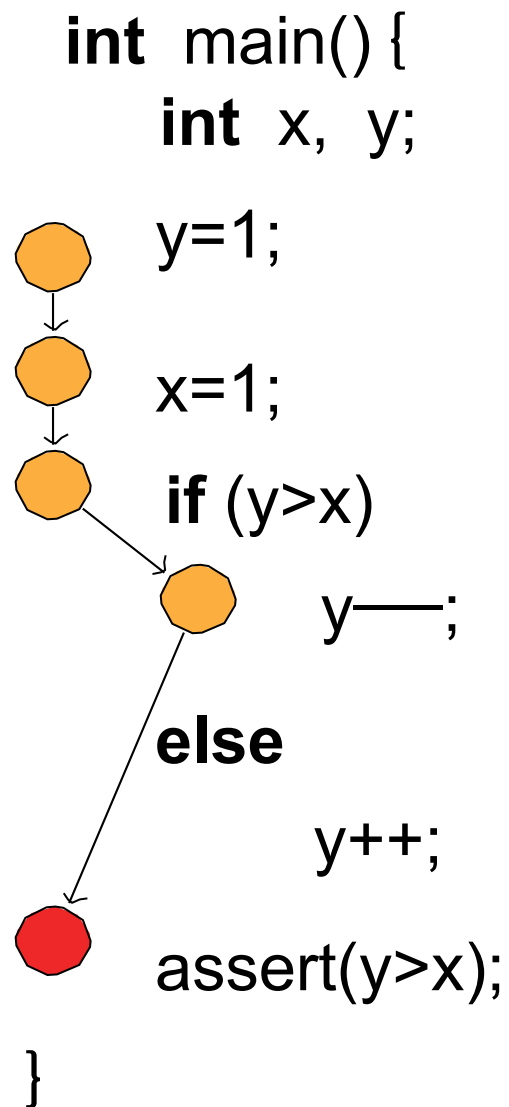
```
int main() {  
    int x, y;  
  
    y=1;  
  
    x=1;  
  
    if (y>x)  
        y—;  
  
    else  
        y++;  
  
    assert(y>x);  
  
}
```

Predicate:

$y > x$



# Example Simulation



We now do a path test, so convert to Static Single Assignment (SSA).

# Example Simulation

```
int main() {  
    int x, y;  
    y1 = 1;  
    x1 = 1;  
    if (y1 > x1)  
        y2 = y1 - 1;  
    else  
        y++;  
    assert(y2 > x1);  
}
```

$$y_1 = 1 \quad \wedge$$

$$x_1 = 1 \quad \wedge$$

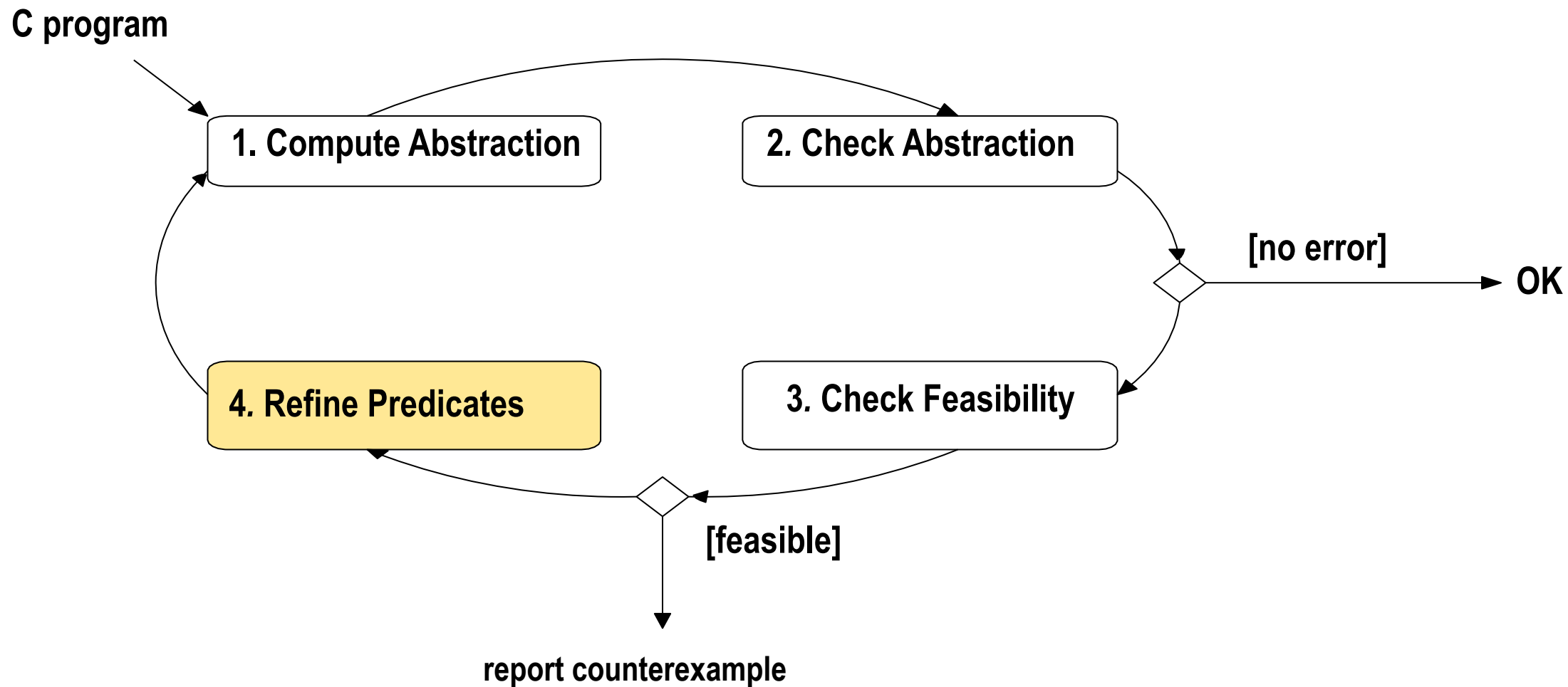
$$y_1 > x_1 \quad \wedge$$

$$y_2 = y_1 - 1 \quad \wedge$$

$$\neg(y_2 > x_1)$$

This is UNSAT, so  $\hat{\pi}$  is spurious.

# CEGAR Overview



# Manual Proof!

```
int main() {  
    int x, y;  
    y=1;  
    {y = 1}  
    x=1;  
    {x = 1 ∧ y =  
1}  
    if (y>x)  
        y--;  
    else  
        {x = 1 ∧ y = 1 ∧ ¬y >  
x}  
        y++;  
        {x = 1 ∧ y = 2 ∧ y >  
x}  
    assert(y>x);  
}
```

This proof uses  
**strongest**  
**post-conditions**

# An Alternative Proof

```
int main() {  
    int x, y;  
    y=1;  
    { $\neg y > 1 \Rightarrow y + 1 > 1$ }  
    x=1;  
    { $\neg y > x \Rightarrow y + 1 > x$ }  
    if (y>x)  
        y--;  
    else  
        { $y + 1 > x$ }  
        y++;  
    { $y > x$ }  
    assert(y>x);  
}
```

We are using weakest pre-conditions here

$$wp(x := E, P) = P[x/E]$$

$$wp(S; T, Q) = wp(S, wp(T, Q))$$

$$wp(\text{if}(C) A \text{ else } B, P) = \\ (C \Rightarrow wp(A, P)) \wedge \\ (\neg C \Rightarrow wp(B, P))$$

The proof for the "true" branch is missing

# Refinement Algorithms

## Using WP

1. Start with failed guard  $G$
2. Compute  $wp(G)$  along the path

## Using SP

3. Start at the beginning
  4. Compute  $sp(\dots)$  along the path
- Both methods eliminate the trace
  - Advantages / Disadvantages?



# Approximating Loop Invariants: SP

```
int x, y;  
x=y = 0;  
while ( x != 10 ) {  
    x ++;  
    y ++;  
}  
assert ( y ==  
10 );
```

The SP refinement results in

$$sp(x=y=0, true) = x = 0 \wedge y = 0$$

$$sp(x++; y++, \dots) = x = 1 \wedge y =$$

$$^1 sp(x++; y++, \dots) = x = 2 \wedge y =$$

$$^2 sp(x++; y++, \dots) = x = 3 \wedge y =$$

$$^3 \dots$$

- ✓ 10 iterations required to prove the property.
- ✓ It won't work if we replace 10 by  $n$ .

# Approximating Loop Invariants: WP

```
int x, y;
```

```
x=y = 0;
```

```
while ( x != 10 ) {
```

```
    x ++;
```

```
    y ++;
```

```
}
```

```
assert ( y == 10 );
```

The WP refinement results in

$$wp(x==10, y \neq 10) = y \neq 10 \wedge x = 10$$

$$wp(x++; y++, \dots) = y \neq 9 \wedge x = 9$$

$$wp(x++; y++, \dots) = y \neq 8 \wedge x = 8$$

$$wp(x++; y++, \dots) = y \neq 7 \wedge x = 7$$

...

- ✓ Also requires 10 iterations.
- ✓ It won't work if we replace 10 by  $n$ .

# What do we really need?

```
int x, y;
```

```
x=y = 0;
```

```
while ( x != 10 ) {
```

```
    x ++;
```

```
    y ++;
```

```
}
```

```
assert ( y == 10 );
```

Consider an SSA-unwinding with 3 loop iterations:

	1st It.	2nd It.	3rd It.	Assertion
$x_1 = 0$	$x_1 \neq 10$	$x_2 \neq 10$	$x_3 \neq 10$	$x_4 = 10$
$y_1 = 0$	$x_2 = x_1 + 1$	$x_3 = x_2 + 1$	$x_4 = x_3 + 1$	$y_4 \neq 10$
	$y_2 = y_1 + 1$	$y_3 = y_2 + 1$	$y_4 = y_3 + 1$	
$x_1 = 0$	$x_2 = 1$	$x_3 = 2$	$x_4 = 3$	
$y_1 = 0$	$y_2 = 1$	$y_3 = 2$	$y_4 = 3$	

**✗** This proof will produce the same predicates as SP.

# What do we really need?

Suppose we add a restriction = “no new constants”:

```
int x, y;
```

```
x=y = 0;
```

```
while ( x != 10 ) {
```

```
    x ++;
```

```
    y ++;
```

```
}
```

```
assert ( y == 10 );
```

	1st It.	2nd It.	3rd It.	Assertion
$x_1 = 0$	$x_1 \neq 10$	$x_2 \neq 10$	$x_3 \neq 10$	$x_4 = 10$
$y_1 = 0$	$x_2 = x_1 + 1$	$x_3 = x_2 + 1$	$x_4 = x_3 + 1$	$y_4 \neq 10$
	$y_2 = y_1 + 1$	$y_3 = y_2 + 1$	$y_4 = y_3 + 1$	
$x_1 = 0$	$x_2 = 1$	<del><math>x_3 = 2</math></del>	$x_4 = y_4$	
$y_1 = 0$	$y_2 = 1$	<del><math>y_3 = 2</math></del>	(loop invariant)	
		$x_3 = y_3$	(loop invariant)	

✓ The language restriction forces the solver to generalize!