## Decision Procedures and Verification

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## PROGRAM ANALYSIS

## Introduction

- Detection of software defects
  - Traditionally  $\rightarrow$  Testing (specific inputs)
- Software verification
  - Goal: to decide whether the specification is satisfied for all possible inputs
  - Specification: No division-by-0, x < y for program variables x and y, ...
- Reachability problem
  - Problem of checking whether a given program state occurs in any execution of the program

- Undecidable in general
  - Unbounded allocation of memory
  - Partial solutions exist

### Introduction

- Partial solutions
  - Work for a subset of programs
  - Testing declares program incorrect if an input is found that violates the specification.
  - Core of the solution = reasoning engine with decision procedure (SMT solver)
- dynamic program vs static decision procedure
  - simultaneous assignment of all variables satisfying given formula
- static single assignment (SSA) form
- Approximations:
  - Underapproximation considers a subset of possible paths
  - Overapproximation considers superset of possible paths

## Terminology

- An execution path is a sequence of program instructions executed during a run of a program.
  - Can be partial.
- An execution trace is a sequence of states that are observed along an execution path
  - Many traces along a single path are possible, corresponding to different inputs.
- Symbolic simulation technique using symbolic representation of traces
  - automatic test generation, detection of dead code, verification of properties
- Assertion is a program instruction that takes a condition as argument, and if the condition evaluates to false, it reports an error and aborts.
  - Verifying an assertion means proving that for all inputs the condition of the assertion evaluates to true.

```
void ReadBlocks(int data[], int
          cookie)
2
3
4
5
6
7
8
    {
       int i = 0:
       while (true)
         int next;
         next = data[i];
         if (!(i < next \&\& next < N))
                return:
9
         i = i + 1:
         for (; i < next; i = i + 1)
10
11
         {
12
           if (data[i] == cookie)
13
              i = i + 1;
14
           else
15
              Process(data[i]);
16
17
       }
18
```

- Artificial, but useful low-level example
- N denotes number of elements in the array
- Specification: no access out-of-bounds
- Consider single path (generalization later)
  - Run through for loop once, take the else branch.
  - Exit the while loop in the second iteration on Line 8.

- Consider the sequence of instructions corresponding to this execution
- Record the branching conditions corresponding to the branches taken
- Rewrite instructions and conditions into the static single assignment representation
  - timestamped versions of variables
  - new version of a variable for each write (assignment)
- ► Translate SSA into logical formula ⇒ *path constraint* 
  - Replace assignments with equalities and conjunct everything including branch conditions.

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Line	Kind	Instruction or condition
3	Assignment	i = 0;
7	Assignment	<pre>next = data[i];</pre>
8	Branch	i < next && next < N
9	Assignment	i = i + 1;
10	Branch	i < next;
11	Branch	<pre>data[i] != cookie;</pre>
14	Function call	<pre>Process(data[i]);</pre>
10	Assignment	i = i + 1
10	Branch	!(i < next)
7	Assignment	<pre>next = data[i];</pre>
8	Branch	!(i < next && next < N)

Sequence of statements along a path

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Line	Kind	Instruction or condition
3	Assignment	i <sub>1</sub> = 0;
7	Assignment	$next_1 = data_0[i_1];$
8	Branch	$i_1 < next_1 \&\& next_1 < N_0$
9	Assignment	$i_2 = i_1 + 1;$
10	Branch	$i_2 < next_1;$
11	Branch	<pre>data<sub>0</sub>[i<sub>2</sub>] != cookie<sub>0</sub>;</pre>
14	Function call	<pre>Process(data<sub>0</sub>[i<sub>2</sub>]);</pre>
10	Assignment	$i_3 = i_2 + 1$
10	Branch	$!(i_3 < next_1)$
7	Assignment	$next_2 = data_0[i_3];$
8	Branch	$!(i_3 < next_2 \&\& next_2 < N_0)$

SSA form of the trace

All evaluations of inputs data<sub>0</sub> and cookie<sub>0</sub> satisfying this formula correspond to a trace for the chosen path

## Assertion checking

- 1. Consider path leading the an assertion.
- 2. Take the path constraint of that path.
- 3. Add *negation* of the assertion to the path constraint.
- Satisfying assignment correspond to trace leading to assertion with its condition violated.

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Problem of verifying corectness of a path in a program is reduced to checking the satisfiability of a formula.

## Checking Feasibility of All Paths in a Bounded Program

- Number of paths can grow exponentially in the number of branches.
- Approach described previously would need to solve exponential number of decision problems.
- ▶ Better approach ⇒ generate SSA for *bounded* program with branches as a whole.
- SSA is converted to a formula that encodes *all* possible paths.

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#### Checking Feasibility of All Paths in a Bounded Program SSA for the whole program

- 1. Unfold loops pre-specified number of times.
- 2. Assign the condition of each if statement to a new variable.
  - $\gamma$  (for guard)
- 3. Identify points where control-flow reconverges.
- 4. Add  $\phi$ -instructions setting the correct values of variables.
  - For variables that has been changed in either branch.
- 5. Translate to formula as before.
  - $\blacktriangleright$  If-then-else operator to represent  $\phi$  instructions
- 6. Satisfying assignment corresponds to one trace (of one path).
  - Assignment of guard variables determines the branches taken.
- Example: for-loop from ReadBlocks unrolled 2 times

## Checking Feasibility of All Paths in a Bounded Program Example of SSA

```
if (i < next){</pre>
                                         1 \gamma_1 = (i_0 < next_0);
1
       if (data[i] == cookie)
                                         _2 \gamma_2 = (data_0[i_0] == cookie_0);
2
      i = i + 1;
                                         3 i_1 = i_0 + 1;
3
     else
4
                                         4
      Process(data[i]);
5
                                         6 i_2 = \gamma_2 ? i_1 : i_0; //\phi
6
      i = i + 1;
                                         7 i_3 = i_2 + 1;
7
8
                                         8
       if (i < next) {</pre>
                                            \gamma_3 = (i_3 < next_0);
9
                                         9
         if (data[i] == cookie) 10
                                            \gamma_4 = (data_0[i_3] == cookie_0);
10
          i = i + 1;
                                        11 i_4 = i_3 + 1;
11
         else
12
                                        12
          Process(data[i]);
13
                                           i_5 = \gamma_4 ? i_4 : i_3; //\phi
                                        14
14
         i = i + 1;
                                        15 i_6 = i_5 + 1;
15
      }
                                        16 i_7 = \gamma_3? i_6: i_3; //\phi
16
                                        17 i_8 = \gamma_1 ? i_7 : i_0; //\phi
    }
17
```

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Under-approximation vs Over-approximation

- What we have seen:
  - Transformation to loop-freep program by unrolling loops
  - Under-approximation technique
    - Considers a *subset* of possible paths.
    - If it detects a bug, it is real.
    - Can declare program safe only up to given bound.
- What we will see:
  - Transformation to loop-free program using non-determinism
  - Over-approximation technique
    - Considers a *superset* of possible paths.
    - Detected bugs can be spurious
    - If the over-approximation is safe, the original program is safe.

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## Over-approximating transformation

- 1. For each loop and each program variable that is modified by the loop, add an assignment at the beginning of the loop that assigns a nondeterministic value to the variable.
- 2. After each loop, add an assumption that the negation of the loop condition holds.
  - An assumption is a program statement assume(c) that aborts any path that does not satisfy c.

3. Replace each while loop with an if statement using the condition of the loop as the condition of the if statement.

# Over-approximating transformation Example

```
Original program
 int i = 0;
1
  int j = 0;
2
3
  while(data[i] != '\n')
4
  Ł
5
    i++;
6
  j = i;
7
  }
8
  assert(i == j);
9
```

#### Transformed program

```
int i = 0;
1
  int j = 0;
2
3
4 if (data[i] != ' n')
5 {
6
  i = *;
7 j = *;
8 i++;
9 j = i;
10
   }
   assume(data[i] == '\n')
11
12
13 assert(i == j);
```

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## Checking over-approximating program

Transformation to SSA/formula as before

- Nondeterministic assignment modelled by incrementing variable counter.
- Assumption translated by conjoining its condition to the formula.
- Formula is unsatisfiable.
- Program is safe for any number of iterations.
- Abstraction worked, because the assertion does not depend on previous iterations of the loop.

▶ In other cases, the abstraction needs to be *refined*.

## Loop invariant

Key tool in any analysis of unbounded program.

#### Definition

A *loop invariant* is any predicate holds at the beginning of the body irrespective of how many times the loop iterates.

```
1 int i = 0;

2 while(i != 10){

3 ...

4 i++;

5 }

\Rightarrow 0 \le i < 10
```

Induction is used to prove that a given formula is an invariant.

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## Proving loop invariant by induction

- Assume program in the following form where code fragments A,B are loop-free and condition C and invariant I are without side-effects.
- Prove that I is invariant by induction:
  - 1. Base case: Prove I is satisfied when entering the loop for the first time.
  - 2. Step case: Prove that from a state satisfying I, by executing the loop body once, we get to a state satisfying I.

```
Loop
                                 Base case
                                                          Step case
   Α;
                         1 A;
                                          1 \quad \texttt{assume(C \& I);}
                         2 assert(C \Rightarrow I); 2 B;
2
   while(C){
3
                                                  3 assert(C \rightarrow I);
  assert(I);
4
   В;
5
   }
```

# Proving loop invariant by induction Example



By checking the base case program and step case program using techniques for loop-free programs, we verify that 0 ≤ i < 10 is an invariant of the loop.</p>

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## Refining abstraction with loop invariants

- Recall over-approximating transformation.
- Assume that for each loop / we have found a loop invariant I<sub>1</sub>. For each loop add the following steps to the transformation.
  - 4. Add an assertion that  $I_l$  holds before the nondeterministic assignments to the loop variables.
    - This establishes the base case.
  - 5. Add an assumption that  $I_l$  holds after the nondeterministic assignments to the loop variables.
    - This is the induction hypothesis.
  - 6. Add an assertion that  $C \Rightarrow I_l$  holds at the end of the loop body.

• This proves the induction step.

## Finding invariants

- The challenge is to find loop invariant that is strong enough to prove the property.
  - ► TRUE is always an invariant, but not very useful one.
- Finding loop invariants is an area of active research.
- Simple option: constructing candidates from predicates appearing in the code, or combining program variables with usual relational operators.
- Generalizing facts obtained from examining unrolling of the loop.

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