# CS615: Formal Specification and Verification of Programs 2019

## Lecture 17: Model Checking

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Key issues with abstract interpretation

- Predefined precision may not be sufficient for the program at hand
- Verification data structure never blows up (may be a good thing?)
- Bug finding is not naturally integrated
  - If verification fails, no counterexample!!!!!
  - A very big problem
- Precision control is not flexible

# Model checking - a different approach

- explore states concrete/symbolic/abstract states
- Blows up the memory usage we have loads of it
- Needs only two operations depending on program semantics and abstraction domain
  - 1. post  $(sp/sp^{\#})$
  - 2. comparison ( $\sqsubseteq$ )
- ▶ No need of sophisticated join ⊔ and widening ⊽ operators.

# Let us explore model checking!



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# Topic 17.1

#### Concrete model checking - enumerate reachable states



## Isn't enumeration impossible?

- Explore the transition graph explicitly
- If edge labels are guarded commands then finding next values are trivial
   light weight machinery
- After resolving non-determinisms, concrete model checking reduces to program execution
- May be only finitely many states are reachable
- May be impossible to cover all states explicitly, but it may cover a portion of interest



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# Concrete model checking

Algorithm 17.1: Concrete model checking

Input: 
$$P = (V, L, \ell_0, \ell_e, E)$$
  
Output: SAFE if  $P$  is safe, UNSAFE otherwise  
reach  $:= \emptyset$ ;  
worklist  $:= \{(\ell_0, v) | v \in \mathbb{Z}^{|V|}\}$ ;  
while worklist  $\neq \emptyset$  do  
choose  $(\ell, v) \in$  worklist;  
the choice defines the  
nature of exploration  
worklist  $:=$  worklist  $\setminus \{(\ell, v)\}$ ;  
if  $(\ell, v) \notin$  reach then  
reach  $:=$  reach  $\cup \{(\ell, v)\}$ ;  
foreach  $(\ell, F(V, V'), \ell') \in E$  do  
worklist  $:=$  worklist  $\cup \{(\ell', v') | F(v, v')\}$ ;  
if  $(\ell_{e, -}) \in$  reach then  
return UNSAFE Exercise 17.1

Suggest improvements in the algorithm

else

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return  $\operatorname{SAFE}$ 

### Example: concrete model checking

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Example 17.1

Consider the following

0 < x < 9, i := x x > 4, x := x - 1, i := i - 1

 $x \leq 4 \land i \neq x$ 

Initialization: reach =  $\emptyset$ , worklist = { $(\ell_0, v) | v \in \mathbb{Z}^2$ }

Choose a state: Lets choose  $(\ell_0, [8, 0])$ 

 $\begin{array}{l} \textit{Update worklist:} \\ \textit{worklist} := \textit{worklist} \setminus \{(\ell_0, [8, 8])\} \end{array}$ 

Add successors in worklist if state not visited: worklist := worklist  $\cup \{(\ell_1, [8, 8])\}$ 

Let V = [x, i]

Add to reach, since there are no more successors:

 $reach := reach \cup \{(\ell_0, [8, 0])\}$ 

... go back to choosing a new state from worklist

# Search strategy : depth first search (DFS)

- search deeper states first
- worklist is a stack
- Often, the depth is bounded by threshold in tools.
  - If the search visits a state at the threshold depth, the state is moved from worklist to reach set without considering the successors of the state.
  - If the state is visited again via a shorter depth, the state needs to be explored again.

#### Exercise 17.2

- a. When would you like to use DFS?
- b. Modify the previous algorithm to write down the DFS version.



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Search strategy: breadth first search(BFS)

- search shallow states first
- ▶ If finite successors, no need to put any artificial bounds on breadth
- On time out, we may claim some guarantees of partial completeness

#### Exercise 17.3

- a. Suggest a data structure for worklist
- b. When do we have infinite successors?
- c. When would you like to use BFS?

### Directed search strategies

- ► The search is guided by the position of error states in the state space
- Assign an estimate of reaching error from each state
- Explore the state from wroklist that has least estimate
- ► The estimation function should have a low cost to compute.
- The estimation function should always underestimate the distance to error.(why?)
- In the area of artificial intelligence, there has been a few proposals to do directed search
  - ► A\*
  - IDA\*

#### Directed search strategies: $A^*$

Worklist is a priority queue,

Priority weight is assigned to a state in worklist based on sum of

- the cost of reaching the state and
- the estimate on cost of reaching error from the state
- Each time a new state is explored, we update estimates of the neighbours.

Exercise 17.4

Suggest an estimate function in the previous example

### Optimizations: exploiting structure

#### Symmetry reduction

- e.g. MAC address of client is irrelevant in a banking software.
- test one; test all.

Assume guarantee — for modular software

- Let us suppose a software consist of two components  $C_1$  and  $C_2$
- We define specification for each component  $(A_i, G_i)$
- The specification implies that we assume A<sub>i</sub> on inputs of C<sub>i</sub> and the component guarantees G<sub>i</sub> on outputs.
- For each component *i*, we assume  $A_i$  and  $G_{1-i}$  and model check if  $G_i$  holds.

This approach simplifies each verification task.

# Optimizations: exploiting structure II

Partial order reduction — for concurrent systems

If order of two operations is irrelevant, then explore only one of the order.

#### Example 17.2

Let us suppose one thread opens a file and another sends a message on network.

Since the activities have no dependence between them, we need not consider both the orders between them.



## Optimizations: reducing space

hashed states - reach set contains hash of states (not sound)

Stateless exploration - no reach set (redundant)

Trade-off among time, space, and soundness

#### Exercise 17.5

a. Write concrete model checking using hash tables

b. What is the standard hash function used in standard hash tables in C++ and Java?

c. Why stateless model checking is useful?

We may have binary of the program and access to internal state.

We drive the program via various inputs and keep the record of the input choices such as

explicit input

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scheduling of threads

# Proof and counterexample

#### Definition 17.1

A proof of a program is an object that allows <u>one</u> to check safety of the program using a low complexity (preferably linear) algorithm in the size of the object.

#### Example 17.3

In our concrete model checking algorithm, reach set is the proof. The checker needs to find that no more states can be reached from reach.

#### Definition 17.2

- A counterexample of a program is an execution that ends at  $\ell_e$ .
- A verification method may produce three possible outcomes for a program
  - proof

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- counterexample
- unknown or non-termination

## Enabling counterexample generation

**Algorithm 17.2:** Concrete model checking **Input:**  $P = (V, L, \ell_0, \ell_e, E)$ Exercise 17.6 **Output:** SAFE if *P* is safe, UNSAFE otherwise add data structure to reach :=  $\emptyset$ ; parents :=  $\lambda x$ .NAN; report counterexample *worklist* := { $(\ell_0, v) | v \in \mathbb{Z}^{|V|}$ }; while *worklist*  $\neq \emptyset$  do choose  $(\ell, v) \in worklist;$ worklist := worklist  $\setminus \{(\ell, v)\};$ if  $(\ell, v) \notin reach$  then reach := reach  $\cup$  {( $\ell$ , v)}; foreach v' s.t. F(v, v') is sat and  $(\ell, F(V, V'), \ell') \in E$  do worklist := worklist  $\cup$  { $(\ell', v')$ }; parents( $(\ell', v')$ ) :=  $(\ell, v)$ ;

if  $(\ell_e, v) \in reach$  then | return UNSAFE(traverseTolnit(parents,  $(\ell_e, v)$ )) else

return  $\operatorname{SAFE}$ 

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# Topic 17.2

### Symbolic methods

Why symbolic?

# To avoid, state explosion problem



### Symbolic methods

Now, we cover some methods that try/avoid to compute lfp

- Symbolic model checking
- Constraint based invariant generation

### Symbolic state

#### Definition 17.3

A symbolic state s of  $P = (V, L, \ell_0, \ell_e, E)$  is a pair  $(\ell, F)$ , where

- $\blacktriangleright \ell \in L$
- F is a formula over variables V in a given theory

# Symbolic model checking

Algorithm 17.3: Symbolic model checking

Input: 
$$P = (V, L, \ell_0, \ell_e, E)$$
  
Output: SAFE if  $P$  is safe, UNSAFE otherwise  
reach :  $L \to \Sigma(V) := \lambda x. \bot$ ;  
worklist := { $(\ell_0, \top)$ };  
while worklist  $\neq \emptyset$  do  
choose  $(\ell, F) \in$  worklist;  
worklist := worklist \ { $(\ell, F)$ };  
if  $\neg(F \Rightarrow reach(\ell))$  is sat then  
 $| reach := reach[\ell \mapsto reach(\ell) \lor F]$ ;  
foreach  $(\ell, \rho(V, V'), \ell') \in E$  do  
 $| worklist := worklist \cup { $(\ell', sp(F, \rho))$ };  
if  $reach(\ell_e) \neq \bot$  then  
return UNSAFE  
return UNSAFE  
Final Amount of the product o$ 

Give a condition for definite termination?

else

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return SAFE

# Example: symbolic model checking

Example 17.4 Consider the following example

$$0 < x < 9, i := x$$

$$x > 4,$$

$$x := x - 1, \quad \bigcirc \quad \ell_1$$

$$i := i - 1$$

$$x \le 4 \land i \ne x$$

$$\ell_e$$

*Init:* reach =  $\lambda x \perp$ , worklist = { $(\ell_0, \top)$ } Choose a state:  $(\ell_0, \top)$  (only choice) Update worklist: worklist :=  $\emptyset$ Add successors in worklist: Since  $\neg(\top \Rightarrow reach(\ell_0))$  is sat, *worklist* := *worklist*  $\cup$  {( $\ell_1, 0 < x = i < 9$ )}  $reach(\ell_0) := reach(\ell_0) \lor \top := \top$ Again choose a state:  $\{(\ell_1, 0 < x = i < 9)\}$ Update worklist: worklist :=  $\emptyset$ Add successors in worklist: Since  $\neg (0 < x = i < 9 \Rightarrow reach(\ell_1))$  is sat, worklist := worklist  $\cup \{(\ell_1, 3 < x = i < 9), (\ell_e, \bot)\}$  $reach(\ell_1) := reach(\ell_1) \lor 0 < x = i < 9$  $reach(\ell_{e}) := reach(\ell_{e}) \lor \bot$ 

Let V = [x, i]

### Exercise 17.8

#### complete the run of the algorithm

### Proof generation

If the symbolic model checker terminates with the answer  $S_{AFE}$ , then it must also report a proof of the safety, which is the *reach* map.

It has implicitly computed a Hoare style proof of  $P = (V, L, \ell_0, \ell_e, E)$ .

$$(\ell, \rho(V, V'), \ell') \in E \quad \{ reach(\ell) \} \rho(V, V') \{ reach(\ell') \}$$

If an LTS program has been obtained from a simple language program then one may generate a Hoare style proof system.

#### Exercise 17.9

Describe the construction for the above translation



# End of Lecture 17

