# Model Checking Pushdown Systems

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## Today's Lecture

- · What are Pushdown Systems?
  - Formal model
- Model Checking Algorithms
  - Reachability Analysis
- Symbolic representation
- LTL Model Checking
- Details in a thesis posted on the webpage
- R. Jhala guest lecture: Application to Software Model Checking

## Beyond Finite-State Systems

```
void m() {
    if (?) {
        if (?) return;
        s(); right();
        if (?) m();
        if (?) m();
    }
} else {
        up(); m(); down();
        main() {
        s();
}
```

Need to handle procedure calls and recursion

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# Beyond Finite-State Systems

```
bool 1; /* global variable */
                                   bool g (bool x) {
                                        return !x;
void lock() {
   if (1) ERROR;
        1 := 1;
                                  void main() {
    ··· /* acquire a lock */
                                       bool a,b;
                                        1,a := 0,0;
void unlock() {
                                        lock();
    if (!1) ERROR;
                                      b := g(a);
    ··· /* release the lock */
                                       unlock();
        1 := 0;
```

Inlining procedure calls might work sometimes

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#### **Pushdown Automaton**

- Finite set of states plus one stack
  - Stack can grow unbounded
- Instead of states, we talk of configurations
  - Configuration = (State, Stack contents)
- (P,  $\Gamma$ ,  $\Delta$ ,  $c_0$ )
  - P → finite set of states (control locations)
  - $-\Gamma \rightarrow$  finite stack alphabet
    - $\epsilon$  denotes empty stack, other symbols:  $\gamma_1, \gamma_2, \dots$
  - $-\Delta \subseteq (P \times \Gamma) \times (P \times \Gamma^*) \rightarrow \text{transition relation}$
  - $-c_0$  ∈ P x  $\Gamma^*$  → initial configuration

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#### **Transition Relation**

- $\Delta \subseteq (P \times \Gamma) \times (P \times \Gamma^*)$ 
  - (Current state, top stack symbol) →
     (Next state, new top symbols)
  - In practice, we can think of  $\Delta$  comprising the following kinds of 'rules' / 'actions':
    - R1:  $(p, \gamma) \rightarrow (p', \varepsilon)$  [POP]
    - R2:  $(p, \gamma_1) \rightarrow (p', \gamma_2, \gamma_1)$  [PUSH]
    - R3:  $(p, \gamma_1) \rightarrow (p', \gamma_2)$  [SWAP or NOP]
    - R4:  $(p, \gamma_1) \rightarrow (p', \gamma_2 \gamma_3)$  [SWAP + PUSH]
  - In theory: The right hand side can have any finite number of stack symbols (but these are not needed in practice)

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## Programs as Pushdown Systems

- Given a single-threaded program with variables of finite datatypes (global and local) and procedure calls [no pointers/dynamic memory allocation]
- What are the states P? Stack alphabet  $\Gamma$ ?

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## Infinite-State Systems?

 Pushdown automata are said to be "infinite-state".

Why? Is this true in practice?

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## Model Checking

- Given a pushdown system, does it satisfy an LTL formula φ?
  - We will consider the simple case of reachability analysis
  - $\phi = G p$
  - Suppose we want to do explicit-state model checking. What's the challenge?

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## Representation Issues

- In finite state model checking, we needed to represent (finite sets of) states and transitions
- For pushdown model checking, we need to represent
  - Configurations
  - Transitions
  - (potentially infinite) Sets of them

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#### Need for Symbolic Repn.

- Pushdown model checking inherently needs to be symbolic
  - to be complete (i.e., find all bugs)
    - · Representing infinitely many configs.
- Observation: The part that's infinite is the stack
  - View the stack as a word in the language of some finite automaton
  - The set of possible stacks is the language (but we need to define the role of P, too)

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## Recap of Finite Automata

- A Finite Automaton is a 5-tuple
   M = (S, Σ, R, S<sub>0</sub>, F)
  - $-S \rightarrow set of states$
  - $-\Sigma \rightarrow$  finite alphabet
  - R ⊆ S x Σ x S → transition relation
  - $-S_0 \rightarrow$  set of initial states
  - F → set of accepting (final) states
- A word  $w \in \Sigma^*$  is accepted by M if there's a path  $s_0 \xrightarrow{w} f$  with  $s_0 \in S_0$  and  $f \in F$

## Symbolic Representation

- Given pushdown system (P, Γ, Δ, c<sub>0</sub>)
- A set of configurations is represented by a finite automaton (S, Σ, R, S<sub>0</sub>, F) where
  - $-S_0 = P$
  - $-S\supseteq P$
  - $-\Sigma = \Gamma$
  - Stack configuration (p, w) is represented as a path from initial state p to a final state f with edges labeled with the sequence of symbols in w

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## Reachability Analysis

- Start with (set of) initial / error state(s)
- Repeatedly compute set of next states, going either
  - Forward (next state operation = "post")
    - Post(S) = set of states reachable from S in one step of the transition relation
  - Backward (next state operation = "pre")
    - Pre(S) = set of states that can reach S in one step

## **Backward Reachability**

- C = set of configurations
  - Identified with its finite automaton repn.
- Pre(C) = set of configs that can reach C by applying one rule in transition relation R
- We want to compute Pre\*(C)
  - Iteratively compute Pre(C) until no new configurations added
  - Then check if the initial configuration is in Pre\*(C)
- Example: C = err config {p, lock() z\* lock() z\*}

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## Backward Reachability for Pushdown Systems

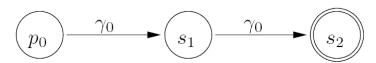
- One step of Pre(C):
  - Given
    - Rule  $(p, \gamma) \rightarrow (p', w)$
    - Path p' w q in C
  - Add an edge  $p \xrightarrow{\gamma} q$  to C
- Intuition:
  - If config  $c_1 = (p', ww')$  is in C, then given above rule,  $c_2 = (p, \gamma w')$  is  $c_1$ 's predecessor and should be in C

## Backward Reachability for Pushdown Systems

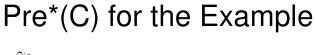
- One step of Pre(C):
  - Given
    - Rule  $(p, \gamma) \rightarrow (p', w)$
    - Path p' w q in C
  - Add an edge  $p \xrightarrow{\gamma} q$  to C
- Observe: no new states are added!
  - Apart from initial states which are states of the pushdown system (and possibly some other pre-existing states)

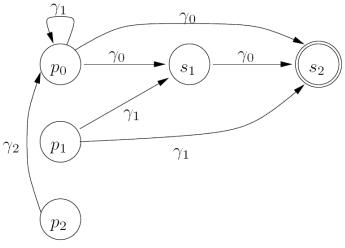
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# Example: $C = \{p_0, \gamma_0 \gamma_0 \}$



$$\Delta = \{r_1, r_2, r_3, r_4\} 
r_1 = \langle p_0, \gamma_0 \rangle \hookrightarrow \langle p_1, \gamma_1 \gamma_0 \rangle 
r_2 = \langle p_1, \gamma_1 \rangle \hookrightarrow \langle p_2, \gamma_2 \gamma_0 \rangle 
r_3 = \langle p_2, \gamma_2 \rangle \hookrightarrow \langle p_0, \gamma_1 \rangle 
r_4 = \langle p_0, \gamma_1 \rangle \hookrightarrow \langle p_0, \varepsilon \rangle$$





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## Rules in pre\* computation

- 3 kinds of rules:
  - $-(p, \gamma) \rightarrow (q, \varepsilon)$ 
    - Add edge (p,  $\gamma$ , q)
  - $-(p, \gamma) \rightarrow (q, \gamma')$ 
    - Add edge (p,  $\gamma,$  q') for each (q,  $\gamma',$  q')
  - $-(p, \gamma) \rightarrow (q, \gamma_1, \gamma_2)$ 
    - Add edge (p,  $\gamma,$  q'') for each {(q,  $\gamma_1,$  q'), (q',  $\gamma_2,$  q'')}
- How many times do we need to process each kind of rule?

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## Rules in pre\* computation

- 3 kinds of rules:
  - $-(p, \gamma) \rightarrow (q, \varepsilon)$  JUST ONCE
    - Add edge  $(p, \gamma, q)$
  - $-(p, \gamma) \rightarrow (q, \gamma')$  POSSIBLY MANY TIMES
    - Add edge (p, γ, q') for each (q, γ', q')
  - $-(p, \gamma) \rightarrow (q, \gamma_1, \gamma_2)$ 
    - Add edge (p,  $\gamma$ , q'') for each {(q,  $\gamma_1$ , q'), (q',  $\gamma_2$ , q'')}
- How many times do we need to process each kind of rule?

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## Complexity of Pre\*(C)

- N = number of states in C
- K = size of stack alphabet
- M = number of rules for pushdown system
- Assume we cycle through the rules on each iteration, adding edges if any match
- What's the asymptotic running time of the Pre\*(C) computation?

## Complexity of Pre\*

- Turns out we can do better if we iterate over edges rather than rules
- O( N<sup>2</sup> M )
- Key is to process each edge just once
  - Iterate through all rules that match that edge
  - Add new 1-symbol RHS rules that correspond to 2-symbol RHS rules matching that edge
  - Details in Schwoon's PhD thesis (posted online)

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## Schwoon's Pre\* Algorithm

```
Algorithm 1
Input: a pushdown system \mathcal{P} = (P, \Gamma, \Delta, c_0);
             a \mathcal{P}-Automaton \mathcal{A} = (\Gamma, Q, \rightarrow_0, P, F) without transitions into P
Output: the set of transitions of A_{pre^*}
 1 rel := \emptyset; trans := \rightarrow_0; \Delta' := \emptyset;
 2 for all \langle p, \gamma \rangle \hookrightarrow \langle p', \varepsilon \rangle \in \Delta do trans := trans \cup \{(p, \gamma, p')\};
 3 while trans \neq \emptyset do
         pop t = (q, \gamma, q') from trans;
          if t \notin rel then
               rel := rel \cup \{t\};
               for all \langle p_1, \gamma_1 \rangle \hookrightarrow \langle q, \gamma \rangle \in (\Delta \cup \Delta') do
 7
                  trans := trans \cup \{(p_1, \gamma_1, q')\};
               for all \langle p_1, \gamma_1 \rangle \hookrightarrow \langle q, \gamma \gamma_2 \rangle \in \Delta do
 9
10
                   \Delta' := \Delta' \cup \{ \langle p_1, \gamma_1 \rangle \hookrightarrow \langle q', \gamma_2 \rangle \};
                    for all (q', \gamma_2, q'') \in rel do
11
12
                       trans := trans \cup \{(p_1, \gamma_1, q'')\};
13 return rel
```

Figure 3.3: An algorithm for computing  $pre^*$ .

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## Forward Reachability Analysis

- Start with initial config ( $c_0$ ,  $\epsilon$ )
  - Single state finite automaton representation
- Post(C) = set of configs reached from C by applying one rule in transition relation R
- We want to compute Post\*(C)
  - Iteratively compute Post(C) until no new configurations added
  - Then check if the error configuration is in Post\*(C)

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## Computing Post\*(C)

- One step of Post(C):
  - Given
    - Rule  $(p, \gamma) \rightarrow (p', w)$
    - Path p  $\xrightarrow{\gamma}$  q in C (path because of  $\varepsilon$ -moves)
  - If  $w = \varepsilon$  add edge (p',  $\varepsilon$ , q)
  - If  $w = \gamma'$  add edge  $(p', \gamma', q)$
  - If  $\mathbf{w} = \gamma' \gamma''$ 
    - add a new state  $s_{p'\gamma}$
    - add (p',  $\gamma',\,s_{p'\gamma'})$  and  $(s_{p'\gamma'},\,\gamma'',q)$

## Computing Post\*(C)

- One step of Post(C):
  - Given
    - Rule  $(p, \gamma) \rightarrow (p', w)$
    - Path p  $\gamma$  q in C (path because of  $\epsilon$ -moves)
  - If  $w = \varepsilon$  add edge (p',  $\varepsilon$ , q)
  - If  $w = \gamma'$  add edge  $(p', \gamma', q)$
  - If  $w = \gamma' \gamma''$ 
    - add a new state spirit
    - add (p',  $\gamma'$ ,  $s_{p'\gamma'}$ ) and ( $s_{p'\gamma'}$ ,  $\gamma''$ ,q)
- How many new states might we add?

Exercise: Compute Post\*(C) for previous example

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## More Symbolic Representation

- Notice that the rules are "explicit-state"
- Typically these can be represented symbolically
  - $-p \in P$  is a pair (pc, g)
    - pc = prog counter, g global variables
  - $-\gamma \in \Gamma$  is a pair (proc, l)
    - proc procedure calls/returns, I local variables
  - Rule's behavior on global/local variables can be represented as a relation  $R(\langle g, l \rangle, \langle g', l' \rangle)$ by a Boolean function

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## More Symbolic Representation

- Rules can be represented symbolically
  - $-p \in P$  is a pair (pc, g)
  - $-\gamma \in \Gamma$  is a pair (proc, I)
  - Rule's behavior on global/local variables can be represented as a relation R(<g,l>,<g',l'>) by a Boolean function
- Set of configs encoded by a finite automaton with expanded alphabet
  - Edges are labeled with these Boolean functions (BDDs) representing next-state relations

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## Symbolically Computing Pre\*

If  $\langle p, \gamma \rangle \hookrightarrow \langle p', w \rangle$  and  $p' \xrightarrow{w} q$ , then add  $p \xrightarrow{\gamma} q$ .

- (i) If  $\langle p,\gamma\rangle \xleftarrow[R]} \langle p',\varepsilon\rangle,$  then add  $p\xrightarrow[[R]]{\gamma} p'.$
- (ii) If  $\langle p, \gamma \rangle \xrightarrow[[R]]{} \langle p', \gamma' \rangle$  and  $p' \xrightarrow[[R_1]]{} q$ , then add  $p \xrightarrow[[R']]{} q$  where  $R' = \{ (g, l, g_1) \mid \exists g_0, l_1 \colon (g, l, g_0, l_1) \in R \land (g_0, l_1, g_1) \in R_1 \}.$
- (iii) If  $\langle p, \gamma \rangle \xrightarrow[R]{} \langle p', \gamma' \gamma'' \rangle$  and  $p' \xrightarrow[R_1]{} q' \xrightarrow[R_2]{} q$ , then add  $p \xrightarrow[R']{} q$  where  $R' = \{ (g, l, g_2) \mid \exists g_0, l_1, g_1, l_2 \colon (g, l, g_0, l_1) \in R \\ \land (g_0, l_1, g_1) \in R_1 \land (g_1, l_2, g_2) \in R_2 \}.$

## LTL Model Checking

- Similar strategy to finite-state systems
- Convert negation of LTL formula into Buchi automaton
- Construct product of Pushdown system P and Buchi automaton B
  - Transitions of both are synchronized
  - Accepting state of product has control part of P's configuration as accepting state of B
    - · Check if such a config. occurs infinitely often
- Run-time: O(|P|<sup>2</sup> . |B|<sup>3</sup> . |Δ|)

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#### Next class

- Game Theory and Verification
  - Modeling open systems
  - Controller synthesis

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