Model Checking: An Introduction

Meetings 2-4, CSCI 5535, Fall 2023



Week 1

- Homework O ("Preliminaries") out, due next Friday
- Today
 - Skim an application motivating CSCI 5535
- Next Week
 - Begin foundations

Course Summary

Course At-A-Glance

- Part I: Language Specification and Design
 - Semantics = Describing programs
 - Evaluation strategies, imperative languages
 - Textbooks:
 - Robert Harper. *Practical Foundations of Programming Languages.*
 - Glynn Winskel. The Formal Semantics of Programming Languages.
- Part II: Applications

Core Topics

- Semantics
 - Operational semantics and types
 - rules for execution on an abstract machine
 - useful for implementing a compiler or interpreter
 - Axiomatic semantics
 - logical rules for reasoning about the behavior of a program
 - useful for proving program correctness
 - Abstract interpretation
 - application: program analysis

But first ...

First Topic: Model Checking

- Verify properties or find bugs in software
- Take an important program (e.g., a device driver)
- Merge it with a property (e.g., no deadlocks)
- Transform the result into a boolean program
- Use a model checker to exhaustively explore the resulting state space
 - Result 1: program provably satisfies property
 - Result 2: program violates property "right here on line 92,376"!





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Who are we again?

- We're going to find critical bugs in important bits of software
 - using PL techniques!
- You'll be enthusiastic about this
 - and thus want to learn the gritty details



Bug Bash by Hans Bjordahl

Overarching Plan

Model Checking

- Transition systems (i.e., models)
- Temporal properties
- Temporal logics: LTL and CTL
- Explicit-state model checking
- Symbolic model checking

Counterexample Guided Abstraction Refinement

- Safety properties
- Predicate abstraction
- Software model checking
- Counterexample feasibility
- Abstraction refinement

weakest pre, thrm prv

Spoiler

This stuff really works!

- Symbolic model checking is a massive success in the model-checking field
- SLAM took the PL world by storm
 - Spawned multiple copycat projects
 - Launched Microsoft's Static Driver Verifier (released in the Windows DDK)

\M/ind

Model Checking

There are complete courses in model checking (see ECEN 5139, Prof. Somenzi).

Model Checking by Edmund M. Clarke, Orna
 Grumberg, and Doron A. Peled.
 Symbolic Model Checking by Ken McMillan.

We will skim.

What is Model Checking? Keywords?

What is Model Checking?

Keywords

Model checking is an automated technique Model checking verifies transition systems Model checking verifies temporal properties Model checking falsifies by generating counterexamples

A model checker is a program that checks if a (transition) system satisfies a (temporal) property

Verification vs. Falsification

- What is verification?
 proof that a property holds on a system
 (all executions) on error
 absent of that error
- What is falsification?
 pool flut a populy dogs + hold
 () a wither that an error is possible

Verification vs. Falsification

- An automated verification tool
 - can report that the system is verified (with a proof);
 - or that the system was not verified.
- When the system was not verified, it would be helpful to explain why.
 - Model checkers can output an error counterexample: a concrete execution scenario that demonstrates the error.
- Can view a model checker as a falsification tool
 - The main goal is to find bugs
- So what can we verify or falsify?

Temporal Properties

Temporal Property

A property with time-related operators such as "invariant" or "eventually"

Invariant(p)

is true in a state if property *p* is true in **every** state on all execution paths starting at that state

 G, AG, \Box ("globally" or "box" or "forall")

Eventually(p)

is true in a state if property p is true at some state on every execution path starting from that state

F, AF, \diamond ("future" or "diamond" or "exists")

An Example Concurrent Program

- A simple concurrent mutual exclusion program
- Two processes execute asynchronously
- There is a shared variable turn
- Two processes use the shared variable to ensure that they are not in the critical section at the same time
- Can be viewed as a "fundamental" program: any bigger concurrent one would include this one

```
10: while (true) {
11: wait(turn == 0);
     // critical section
12: work(); turn = 1;
13: }
|| // concurrently with
20: while (true) {
21: wait(turn == 1);
     // critical section
22: work(); turn = 0;
23: }
```



Analyzed System is a Transition System

- Labeled transition system
 T = (S, I, R, L)
- Also called a Kripke Structure

// standard FSM

- S = Set of states
- $I \subseteq S$ = Set of initial states // standard FSM
- $R \subseteq S \times S$ = Transition relation // standard FSM
- L: $S \rightarrow 2^{AP}$ = Labeling function // this is new!
- AP: Set of <u>atomic propositions</u> (e.g., "x=5"∈AP)
 - Atomic propositions capture basic properties
 - For software, atomic props depend on variable values
 - The labeling function labels each state with the set of propositions true in that state

Example Properties of the Program

- "In all the reachable states (configurations) of the system, the two processes are never in the critical section at the same time"
 - "pc1=12", "pc2=22" are atomic properties for being in the critical section

• "Eventually the first process enters the critical section"

Temporal Logics

There are four basic temporal operators:

- X p Next p, p holds in the next state
- G p
 <u>G</u>lobally p, p holds in every state, p is an invariant
- F p
 <u>Future p, p will hold in a future state, p holds eventually</u>
- p U q
 p Until q, assertion p will hold until q holds
- Precise meaning of these temporal operators are defined on execution paths

Execution Paths

 A <u>path</u> in a transition system is an infinite sequence of states

($s_0, s_1, s_2, ...$), such that $\forall i \ge 0$. (s_i, s_{i+1}) $\in R$

- A path ($s_0, s_1, s_2, ...$) is an <u>execution path</u> if $s_0 \in I$
- Given a path $h = (s_0, s_1, s_2, ...)$
 - h_i denotes the ith state: s_i
 - h^i denotes the ith suffix: ($s_i, s_{i+1}, s_{i+2}, ...$)
- In some temporal logics one can quantify paths starting from a state using <u>path quantifiers</u>
 - A : for all paths (e.g., A h.)
 - E: there exists a path (e.g., E h. ...)

Paths and Predicates

- We write h ⊨ p
 - "the path h makes the predicate p true"
 - h is a path in a transition system
 - p is a temporal logic predicate
- Example:

A h. h ⊨ G (¬(pc1=12 ∧ pc2=22))

Linear Time Logic (LTL)

- LTL properties are constructed from atomic propositions in AP; logical operators ^, >, , -, and temporal operators X, G, F, U.
- The semantics of LTL is defined on paths.

Given a path h:

h ⊨ p

Linear Time Logic (LTL)

h_i denotes the ith state: s_i **h**ⁱ denotes the ith suffix: $(s_i, s_{i+1}, s_{i+2}, ...)$

Given a path h:

- $h \models ap$ iff $L(h_0, ap)$
- $h \models X p$ iff $h^1 \models p$
- $h \models F p$ iff
- h⊨Gp iff
- $h \models p \cup q$ iff

atomic prop next

Satisfying Linear Time Logic

 Given a transition system T = (S, I, R, L) and an LTL property p, <u>T satisfies p</u> if all paths starting from all initial states I satisfy p

Computation Tree Logic (CTL)

- In CTL temporal properties use <u>path</u>
 <u>quantifiers</u>: A : for all paths, E : there exists a path
- The semantics of CTL is defined on states:
 Given a state s
- $s \models ap$ iff L(s, ap)
- $s_0 \models EX p$ iff $\exists a \text{ path} (s_0, s_1, s_2, ...) \mid s_1 \models p$
- $s_0 \models AX p$ iff $\forall paths (s_0, s_1, s_2, ...). s_1 \models p$
 - iff $\exists a \text{ path } (s_0, s_1, s_2, ...). \forall i \ge 0. s_i \models p$
 - iff \forall paths (s₀, s₁, s₂, ...). $\forall i \ge 0$. s_i \models p

 $s_0 \models EG p$

 $\mathbf{s}_0 \models \mathbf{A}\mathbf{G}\mathbf{p}$

Linear vs. Branching Time

- LTL is a <u>linear time logic</u>
 - When determining if a path satisfies an LTL formula we are only concerned with a single path
- CTL is a <u>branching time logic</u>
 - When determining if a state satisfies a CTL formula we are concerned with multiple paths
 - In CTL the computation is instead viewed as a <u>computation tree</u> which contains all the paths

The expressive powers of CTL and LTL are incomparable (LTL \subseteq CTL*, CTL \subseteq CTL*)

- Basic temporal properties can be expressed in both logics
- Not in this lecture, sorry! (Take a class on Modal Logics)

Recall the Example



Linear vs. Branching Time



LTL Satisfiability Examples



On this path: Holds Does Not Hold Fp P XXP Gp XP

LTL Satisfiability Examples



CTL Satisfiability Examples

p does not hold p holds



CTL Satisfiability Examples

p does not holdp holds



Model Checking Complexity

- Given a transition system T = (S, I, R, L) and a CTL formula f
 - One can check if a state of the transition system satisfies the formula f in

 $O(|f| \times (|S| + |R|))$ time

- Multiple depth first searches (one for each temporal operator)
 - explicit-state model checking
State Space Explosion

- The complexity of model checking increases linearly with respect to the size of the transition system (|S| + |R|)
- However, the size of the transition system (|S| + |R|) is exponential in the number of variables and number of concurrent processes
- This exponential increase in the state space is called the <u>state space explosion</u>
 - Dealing with it is one of the major
 challenges in model checking research 42

Algorithm: Temporal Properties = Fixpoints

- States that satisfy AG(p) are all the states which are not in EF(¬p) (= the states that can reach ¬p)
- Compute EF(¬p) as the fixed point of Func: $2^{s} \rightarrow 2^{s}$
- Given $Z \subseteq S$,
 - Func(Z) = $\neg p \cup reach-in-one-step(Z)$
- Actually, EF(¬p) is the *least*-fixed point of Func
 - smallest set Z such that Z = Func(Z)
 - to compute the least fixed point, start the iteration from $Z=\emptyset$, and apply the Func until you reach a fixed point
 - This can be computed (unlike most other fixed points)

Pictorial Backward Fixed Point



This fixed point computation can be used for:

- verification of $EF(\neg p)$
- or falsification of AG(p)

... and similar fixed points handle the other cases

Symbolic Model Checking

- <u>Symbolic model checking</u> represent state sets and the transition relation as Boolean logic formulas
 - Fixed point computations manipulate sets of states rather than individual states
 - Recall: we needed to compute reach-in-one-step(Z), but $Z \subseteq S$
- Fixed points can be computed by iteratively manipulating these formulas
- Use an efficient data structure for manipulation of Boolean logic formulas

- Binary Decision Diagrams (BDDs)

 SMV (Symbolic Model Verifier) was the first CTL model checker to use BDDs

Building Up To Software Model Checking via Counterexample Guided Abstraction Refinement

There are easily dozens of papers.

We will skim.

Key Terms

- Counterexample guided abstraction refinement (CEGAR)
 - A successful software model-checking approach. Sometimes called "Iterative Abstraction Refinement".
- SLAM = The first CEGAR project/tool.
 - Developed at MSR
- Lazy Abstraction = CEGAR optimization
 - Used in the BLAST tool from Berkeley.

What *is* Counterexample Guided Abstraction Refinement (CEGAR)?

Verification by ...

Model Checking?

Theorem Proving?

Dataflow Analysis or Program Analysis?

Verification

```
Example () {
1: do {
      lock();
      old = new;
      q = q - next;
   if (q != NULL) {
2:
3:
        q->data = new;
         unlock();
         new ++;
4: } while (new != old);
5: unlock();
   return;
```

Is this program correct?

What does correct mean?

How do we determine if a program is correct?

Verification by Model Checking

```
Example () {
1: do{
      lock();
      old = new;
      q = q - next;
   if (q != NULL) {
2:
3:
         q->data = new;
         unlock();
         new ++;
4: } while(new != old);
5: unlock();
   return;
```

- (Finite State) Program
 State Transition Graph
 Reachability
- Program \rightarrow Finite state model
- State explosion
- + State exploration
- + Counterexamples

Precise [SPIN, SMV, Bandera, JPF]

Verification by Theorem Proving

```
Example () {
1: do{
      lock();
      old = new;
     q = q - next;
   if (q != NULL) {
2:
3:
      q->data = new;
         unlock();
         new ++;
4: } while(new != old);
5: unlock();
   return;
```

Loop Invariants
 Logical Formulas
 Check Validity

Invariant: lock ∧ new = old ∨ ¬lock ∧ new ≠ old

Verification by Theorem Proving

```
Example () {
1: do{
      lock();
      old = new;
      q = q - next;
2:
   if (q != NULL) {
3:
         q - data = new;
         unlock();
         new ++;
4: } while(new != old);
5: unlock();
   return;
```

Loop Invariants
 Logical Formulas
 Check Validity

- Loop invariants
- Multithreaded programs
- + Behaviors encoded in logic
- + Decision procedures

Precise [ESC, PCC]

Verification by Program Analysis



- Dataflow Facts
 Constraint System
 Solve Constraints
- Imprecision: fixed facts
- + Abstraction
- + Type/Flow analyses

Scalable [Cqual, ESP]

Combining Strengths

Theorem Proving

Need loop invariants
(will find automatically)
Behaviors encoded in logic
(used to refine abstraction)
Theorem provers
(used to compute successors, refine abstraction)

SLAM

Program Analysis

Imprecise
(will be precise)
Abstraction
(will shrink the state space we must explore)

Model Checking

- Finite-state model, state explosion

(will find small good model)

+ State space exploration

(used to get a path sensitive analysis)

+ Counterexamples

(used to find relevant facts, refine abstraction) 55

Software Model Checking via Counterexample Guided Abstraction Refinement

There are easily dozens of papers.

We will skim.

SLAM Overview

- Input: Program and Specification
 - Standard C Program (pointers, procedures)
 - Specification = Partial Correctness
 - Given as a finite state machine (typestate)
 - "I use locks correctly", not "I am a webserver"
- <u>Output</u>: Verified or Counterexample
 - Verified = program does not violate spec
 - Can come with proof!
 - Counterexample = concrete bug instance
 - A path through the program that violates the spec

Take-Home Message

- SLAM is a software model checker. It abstracts C programs to boolean programs and model-checks the boolean programs.
- No errors in the boolean program implies no errors in the original.
- An error in the boolean program may be a real bug. Or SLAM may refine the abstraction and start again.

Property 1: Double Locking



"An attempt to re-acquire an acquired lock or release a released lock will cause a deadlock."

Calls to lock and unlock must alternate.

Property 2: Drop Root Privilege



[Chen-Wagner-Dean '02] User applications must not run with root"

privilege" When execv is called, must have suid $\neq 0$ ⁶²

Property 3 : IRP Handler



Example SLAM Input

Example () { **1**: do { lock(); old = new;q = q - next;2: if (q != NULL) { 3: q->data = new;unlock(); new ++; 4: } while(new != old); 5: unlock(); return;



SLAM in a Nutshell

```
SLAM(Program p, Spec s) =
Program g = incorporate_spec(p,s);
                                                 // slic
PredicateSet abs = { };
while true do
  BooleanProgram b = abstract(q,abs);
                                                 // c2bp
  match model_check(b) with
                                                 // bebop
  | No_Error \rightarrow print("no bug"); exit(0)
  | Counterexample(c) \rightarrow
     if is_valid_path(c, p) then
                                                 // newton
      print("real bug"); exit(1)
     else
                                                 // newton
      abs \leftarrow abs \cup new_preds(c)
done
```

Incorporating Specs





Ideas?

Incorporating Specs

```
Example ( ) {
    1: do{
        lock();
        old = new;
        q = q->next;
2: if (q != NULL) {
    3: q->data = new;
        unlock();
        new ++;
        }
    4: } while(new != old);
5: unlock();
    return;
}
```



```
Example () {
1: do {
      if L=1 goto ERR;
      else L=1;
      old = new;
      q = q - \operatorname{next};
      if (q != NULL) {
2:
3:
          q - data = new;
          if L=0 goto ERR;
          else L=0;
          new ++;
4: } while (new != old);
5: if L=0 goto ERR.
   else L=0; Original program
   return;
                 violates spec iff
ERR: abort();
                  new program
                  reaches ERR
```

Program As Labeled Transition System





```
Example ( ) {
1: do{
    lock();
    old = new;
    q = q->next;
2: if (q != NULL){
3:    q->data = new;
    unlock();
    new ++;
    }
4: } while(new != old);
5: unlock();
    return;
}
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```

The Safety Verification Problem



Is there a path from an initial to an error state? Problem? Infinite state graph (old=1, old=2, old=...) Solution? Set of states \simeq logical formula

Representing [Sets of States] as Formulas

[F] states satisfying $F \{s s \models F\}$	F FO formula over program vars
[<i>F</i> ₁] ∩ [<i>F</i> ₂]	$F_1 \wedge F_2$
[<i>F</i> ₁] ∪ [<i>F</i> ₂]	
[/]	
[<i>F</i> ₁] ⊆ [<i>F</i> ₂]	
	i.e. $F_1 \land \neg F_2$ unsatisfiable

Idea 1: Predicate Abstraction



- Predicates on program state:
 lock (i.e., lock=true)
 old = new
- States satisfying same predicates are equivalent
 - Merged into one abstract state



- Num of abstract states is finite
 - Thus model-checking the abstraction will be feasible!

Abstract States and Transitions



Abstraction



Existential Lifting (i.e., $A_1 \rightarrow A_2$ iff $\exists c_1 \in A_1$. $\exists c_2 \in A_2$. $c_1 \rightarrow c_2$)

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Abstraction





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¬ old=new

- lock

Analyze Abstraction



Analyze finite graph Over Approximate Safe \Rightarrow System Safe No false negatives

Problem

Spurious

co false positives

Idea 2: Counterexample-Guided Refinement



Solution

Use spurious counterexamples to refine abstraction!

Idea 2: Counterexample-Guided Refinement



Solution

Use spurious counterexamples

to refine abstraction!

- 1. Add predicates to distinguish states across cut
- 2. Build refined abstraction

Imprecision due to merge

Iterative Abstraction-Refinement



[Kurshan et al 93] [Clarke et al 00] [Ball-Rajamani 01]

Solution

Use spurious counterexamples

to refine abstraction!

- 1. Add predicates to distinguish states across cut
- 2. Build refined abstraction
 - eliminates counterexample
- 3. Repeat search

until real counterexample or system proved safe 79

Problem: Abstraction is Expensive - Why?





Reachable

Problem

#abstract states = 2^{#predicates} Exponential Thm. Prover gueries

Observe

Fraction of state space reachable #Preds ~ 100's, #States ~ 2¹⁰⁰, #Reach ~ 1000's

Solution1: Only Abstract Reachable States







Problem

#abstract states = 2^{#predicates} Exponential Thm. Prover gueries

Solution

Build abstraction during search
Solution2: Don't Refine Error-Free Regions



Problem

#abstract states = 2^{#predicates}

Exponential Thm. Prover queries

Solution

Don't refine error-free regions

Key Idea for Solutions?



Unroll Abstraction

- 1. Pick tree-node (=abs. state)
- 2. Add children (=abs. successors)
- 3. On re-visiting abs. state, cut-off

Find min infeasible suffix

- Learn new predicates
- Rebuild subtree with new preds.



Error Free

Unroll Abstraction

- 1. Pick tree-node (=abs. state)
- 2. Add children (=abs. successors)
- 3. On re-visiting abs. state, cut-off

Find min infeasible suffix

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Unroll Abstraction

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Error Free



S1: Only Abstract Reachable States
S2: Don't refine error-free regions 87







Reachability Tree 88







Reachability Tree 89







Predicates: LOCK







Predicates: LOCK





Predicates: LOCK





Reachability Tree 93

Analyze Counterexample





lock() old = newq=q->next LOCK [q!=NULL] 3 LOCK q->data = new unlock() new++ 4 [new==old] 5 unlock()

Reachability Tree 94

Analyze Counterexample





old = newLOCK 3 LOCK new++ 4 [new==old] 5 Inconsistent new == old **Reachability Tree** 95







Reachability Tree 96







Reachability Tree 97





Predicates: LOCK, new == old



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Unroll Abstraction

- 1. Pick tree-node (=abs. state)
- 2. Add children (=abs. successors)
- 3. On re-visiting abs. state, cut-off

Find min infeasible suffix

- Learn new predicates
- Rebuild subtree with new preds.

Error Free



S1: Only Abstract Reachable States
S2: Don't refine error-free regions 102

Two Handwaves



Two Handwaves



Weakest Preconditions

WP(P,OP) Weakest formula P's.t. if P'is true <u>before</u> OP then P is true <u>after</u> OP



Weakest Preconditions < More on this later in the semester!

WP(P,OP) Weakest formula P's.t. if P'is true <u>before</u> OP then P is true <u>after</u> OP



How to compute successor?

```
Example ( ) {
    1: do{
        lock();
        old = new;
        q = q->next;
2: if (q != NULL) {
    3: q->data = new;
        unlock();
        new ++;
    }
4:}while(new != old);
5:unlock();
}
```

LOCK, new==old $\begin{bmatrix} 3 & F \\ OP \\ - LOCK, - new == old \\ \end{bmatrix}$

For each *p*

Check if *p* is true (or false) after *OP*

Q: When is p true after OP ?

- If WP(p, OP) is true before OP!
- We know *F* is true <u>before</u> *OP*
- Thm. Pvr. Query: $F \Rightarrow WP(p, OP)$

How to compute successor?

```
Example ( ) {
    1: do{
        lock();
        old = new;
        q = q->next;
2: if (q != NULL) {
    3: q->data = new;
        unlock();
        new ++;
    }
4:}while(new != old);
5:unlock();
}
```

LOCK, new==old $\begin{bmatrix} 3 \\ - \\ 4 \end{bmatrix}$ $\begin{bmatrix} F \\ OP \\ - \\ 2 \end{bmatrix}$

For each *p*

• Check if *p* is true (or false) after *OP*

Q: When is *p* false <u>after</u> *OP* ?

- If WP(¬p, OP) is true before OP!
- We know *F* is true <u>before</u> *OP*
- Thm. Pvr. Query: $F \Rightarrow WP(\neg p, OP)$

How to compute successor?

LOCK, new==old $\begin{bmatrix} 3 & F \\ OP \\ \neg LOCK, \neg new == old \end{bmatrix}$

For each *p*

• Check if *p* is true (or false) after *OP*

Q: When is *p* false <u>after</u> *OP* ?

- If WP(¬p, OP) is true before OP!
- We know F is true before OP
- Thm. Pvr. Query: $F \Rightarrow WP(\neg p, OP)$

Predicate: new == old

True? (LOCK, new==old) \Rightarrow (new + 1 = old) NO

False? (LOCK, new==old) \Rightarrow (new + 1 \neq old) YES

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Advanced SLAM/BLAST

Too Many Predicates - Use Predicates Locally Counter-Examples - Craig Interpolants Procedures - Summaries

Concurrency

- Thread-Context Reasoning

SLAM Summary

- 1) Instrument Program With Safety Policy
- 2) Predicates = { }
- 3) Abstract Program With Predicates
 - Use Weakest Preconditions and Theorem Prover Calls
- 4) Model-Check Resulting Boolean Program
 - Use Symbolic Model Checking
- 5) Error State Not Reachable?
 - Original Program Has No Errors: Done!
- 6) Check Counterexample Feasibility
 - Use Symbolic Execution
- 7) Counterexample Is Feasible?
 - Real Bug: Done!
- 8) Counterexample Is Not Feasible?
 - 1) Find New Predicates (Refine Abstraction)
 - 2) Goto Line 3

Bonus: SLAM/BLAST Weakness

- 1: $F() \{$
- 2: int x=0;
- 3: lock();
- 4: x++;
- 5: while $(x \neq 88)$;
- 6: if (x < 77)
- 7: lock();
- 8: }

- Preds = {}, Path = 234567
- [x=0, ¬x+1≠88, x+1<77]
- Preds = {x=0}, Path = 234567
- [x=0, ¬x+1≠88, x+1<77]
- Preds = {x=0, x+1=88}
- Path = 23454567
- [x=0, ¬x+2≠88, x+2<77]
- Preds = $\{x=0, x+1=88, x+2=88\}$
- Path = 2345454567
- .
- Result: the predicates "count" the loop iterations₁₂