#### Program verification introduction, bounded-model checking, SAT, symbolic model checking

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## Safe software ?

- safety-critical software (control of vehicles e.g. airplanes and cars, surgical robots, radiation therapy...)
- less critical software (flight management systems, financial transactions, unmanned spacecraft...)
- general-purpose software?
- (hot topic) software facing the Internet, newer security and privacy issues (e.g. 0-day vulnerabilities sold to intelligence services; are lives at stake ?)



# Software engineering

Considers the means of production of software:

- documentation imperatives
- organization of software development teams
- good programming practices
- use of appropriate programming languages
- software development environments

Try to reduce the number of errors at the source.

"Software metrics" Use of lint-like tools or more advanced

#### Not covered in this course



## Proving properties of software

- Basic idea: software has mathematically defined behaviour
- Possible to do mathematical proofs on software
- Possible to automate these proofs



Proving that software truly does what it is meant to do. behaviours  $\subseteq$  acceptable behaviours

- What does software do?
- What is it meant to do?
- What is a proof?



#### Semantics

A **precise definition** of what a program does — given for all programs within a programming language.

Very difficult for a full industrial language e.g. C++

VS

A definition in  $\pm$  vague **natural language** (e.g. ISO C and C++ standards, programming language manuals...)

Imprecise, fuzzy, sometimes contradictory definitions. Language lawyers. Endless discussions on what a program should or should not be doing, on what a compiler has the right to do or not.



## Specification

What software should do

- informal definition in natural language
- formal mathematical definition

Is the specification consistent?

Difficulties in writing specifications:

- Are all requirements taken into account?
- Redundancy with implementation



## Specification example: sort

Unix command sort

(Without the options) Simple informal specification: "sort the lines in a file"

In more detail: complicated - e.g

- what is the sorting order wrt non-ASCII characters?
- how are equivalent lines sorted (e.g. numeric ordering)

Mathematical definition possible, but long.



## Difficulty

 $behaviours \subseteq acceptable \ behaviours$ 

#### Both sets are not well defined in general.

May need to fix

- language definition
- target compilation environment (evaluation order, size of basic types, alignment...)
- precise specification

How about proofs?



## The Halting Problem

Simple language: integers ( $\mathbb{Z}$ ), tests, loops

# There is no algorithm that says, given a program, whether this program halts. (Turing)



## The Halting Problem, proof

Suppose we have a "magical analyzer" A: answer A(P, X) = 1"program P terminates eventually on input X" A(P, X) = 0otherwise

```
int B(Program x) {
    if (A(x,x)==0) {
        return 1;
    } else {
        while(true) {}
    }
}
```

What is B(B)? (*B* applied to its own source code)



## The Halting Problem, contradiction

```
int B(Program x) {
    if (A(x,x)==0) {
        return 1;
    } else {
        while(true) {}
    }
}
```

If B(B) = 1 then A(B, B) = 0 "program *B* does not terminate on input *B*". Absurd!

If B(B) loops then A(B, B) = 1 "program B terminates on input B". Absurd!

#### There is no magical static analyser.



## Workarounds

What is impossible is to check reachability

- 1. automatically
- 2. without false positives
- 3. without false negatives
- 4. on systems of unbounded state
- 5. with unbounded execution time

Lifting restrictions opens possibilities!



#### Starting states + transitions

State of the program / of the machine = values of variables, registers, memories...within  $\Sigma.$ 

Par exemple :

- if system state = 17 Booleans, then  $\Sigma = \{0, 1\}^{17}$ ;
- if system state = 3 unbounded integers, then  $\Sigma = \mathbb{Z}^3$ ;
- if finite automaton,  $\Sigma$  is the set of states;
- If stack automaton, state = pair (automaton state, stack contents), so Σ = Σ<sub>S</sub> × Σ<sub>P</sub><sup>\*</sup>.

**Transition relation**  $\rightarrow$  :  $x \rightarrow y =$  "if I'm at x I can go to y at the next step"



(A more general definition exists. Consider the simplest case.)

Show that a program cannot reach a "bad state" (crash, out-of-specification). Set *W* of bad states.

Show that there is no  $n \ge 0$  and  $\sigma_0 \to \sigma_1 \to \dots \sigma_n$ ,  $\sigma_0$  initial state (= reset),  $\sigma_n \in W$  (trace of *n* steps leading to a bad state).

Otherwise said:  $\sigma_0 \rightarrow^* \sigma_n \in W$ .  $\rightarrow^*$  reflexive transitive closure of  $\rightarrow$ .



#### **Reachable states**

# Let $\Sigma_0 \subseteq \Sigma$ be the initial states. The set *A* of **reachable states** is the set of states $\sigma$ such that TODO

$$\exists \sigma_0 \in \Sigma_0 \; \sigma_0 \to^* \sigma \tag{1}$$

On veut montrer que  $A \cap W = \emptyset$ .



## Bounding the state space

Restrict to a finite number of variables of a finite type.

Finite state space  $\implies$  "it's just a big finite automaton!"

**Everything is decidable!** 



## Explicit-state model checking

Given a transition relation  $\tau$ 

- Set R := {initialstate}
- For each state x in R, add all x' such that  $(x, x') \models \tau$
- Do it until R is saturated (no new states are added)
- ► Then *R* is the set of **reachable states**.

Then test whether R contains undesirable states.



## Implementation issues

If state = n Boolean variables,  $2^n$  possible states.

Memory usage linear in number of reachable states.

Store states in hash table. Store states in distributed hash table.

Tool example: CADP (INRIA Grenoble)



## Explicit state model checking, a weakness

Representation expensive even if the set of reachable states is "simple".

e.g.  $\{0,1\}^n$  "everything reachable" needs  $\Theta(2^n)$  memory

Try to compress sets of states by **symbolic** representation.



#### Reachable states as a limit

 $X_n$  is the set of states reachable within n steps of  $\rightarrow$ :  $X_0 = \Sigma_0$ ,  $X_1 = \Sigma_0 \cup R(\Sigma_0), X_2 = \Sigma_0 \cup R(\Sigma_0) \cup R(R(\Sigma_0))$ , etc. with  $R(X) = \{y \in \Sigma \mid \exists x \in X \ x \to y\}$ .

 $X_k$  grows wrt  $\subseteq$ . Its limit (= union of all terms) is the set of reachable states.



#### Iterative computation

Remark  $X_{n+1} = \Sigma_0 \cup R(X_n)$ .

Intuition: to reach in at most n + 1 steps

- either in 0 steps = initial states  $\Sigma_0$
- ► either in 0 < k ≤ n + 1 steps, thus in at most n steps (X<sub>n</sub>) followed by another step

But how to efficiently represent the  $X_n$  and compute over them?



## The problem

Representing compactly sets of Boolean states

A set of vector *n* Booleans = a function from  $\{0, 1\}^n$  into  $\{0, 1\}$ .

Example:  $\{(0, 0, 0), (1, 1, 0)\}$  represented by  $(0, 0, 0) \mapsto 1$ ,  $(1, 1, 0) \mapsto 1$  and 0 elsewhere.



#### Expanded BDD

Binary decision diagrams

Given ordered Boolean variables (a, b, c), represent  $(a \land c) \lor (b \land c)$ :



## Removing useless nodes

Silly to keep two identical subtrees:



identiques

# Compression





## Reduced BDD



Idea: turn the original tree into a DAG with **maximal sharing**.

Two different but isomorphic subtrees are never created. **Canonicity:** a given example is always encoded by the same DAG.

## Implementation: hash-consing

Important: implementation technique that you may use in other contexts

"Consing" from "constructor" (cf Lisp : cons).

Keep a hash table of all nodes created, with hashcode H(x) computed quickly.

If node =  $(v, b_0, b_1)$  compute *H* from *v* and unique identifiers of  $b_0$  and  $b_1$ 

Unique identifier = address (if unmovable) or serial number

If an object matching  $(v, b_0, b_1)$  already exists in the table, return it

How to collect garbage nodes? (unreachable)



## Garbage collection in hash consing

Needs **weak pointers**: the pointer from the hash table should be ignored by the GC when it computes reachable objects

- Java WeakHashMap
- OCaml Weak



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(Other use of weak pointers: caching recent computations.)



# Hash-consing is magical

Ensures:

- ► maximal sharing: never two identical objects in two ≠ locations in memory
- ultra-fast equality test: sufficient to compare pointers (or unique identifiers)

And once we have it, BDDs are easy.



Once a variable ordering is chosen:

- Create BDD false, true(1-node constants).
- Create BDD for *v*, for *v* any variable.
- Operations  $\land$ ,  $\lor$ , etc.



## **Binary BDD operations**

Operations  $\land$ ,  $\lor$ : recursive descent on both subtrees, with **dynamic programming**:

- store values of f(a, b) already computed in a hash table
- index the table by the unique identifiers of *a* and *b*

Complexity with and without dynamic programming?



## **Binary BDD operations**

Operations  $\land$ ,  $\lor$ : recursive descent on both subtrees, with **dynamic programming**:

- store values of f(a, b) already computed in a hash table
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Complexity with and without dynamic programming?

- without dynamic programming: unfolds DAG into tree
   ⇒ exponential
- ► with dynamic programming O(|a|.|b|) where |x| the size of DAG x



## Quantifiers

BDD for formula *F* over variables *x*, *y*, *z*. Want a BDD for formula  $\exists x F$  over variables *y* et *z*.  $[\exists x F](y, z) \equiv F(0, y, z) \lor F(1, y, z)$ : compute  $F[0/x] \lor F[1/x]$ (F[b/x] is *F* where *x* has been replaced by *b*).

Same for  $\forall$  but with  $\land$ .

Otherwise said quantifier elimination.



#### Back to transition systems

- The set  $\Sigma_0$  of initial states is defined by a formula over  $x_1, \ldots, x_n \Rightarrow$  a BDD over *n* variables.
- ► The transition relation *T* over Boolean variables x<sub>1</sub>,..., x<sub>n</sub>, x'<sub>1</sub>,..., x'<sub>n</sub> (x' = updated x) ⇒ a BDD over 2n variables.

Recall  $\phi(X) = \Sigma_0 \cup R(X)$ , in formulas:

$$\phi(\mathbf{X}) = \Sigma_0 \lor (\exists \mathbf{x}_1, \dots, \mathbf{x}_n(\mathbf{X} \land \mathbf{T})) [\mathbf{x}'_1 / \mathbf{x}_1, \dots, \mathbf{x}'_n / \mathbf{x}_n]$$
(2)

#### All operations doable on BDDs!



#### Iterative computations over BDDs

Compute sequence  $X_0, \ldots$  with  $X_0 = \Sigma_0$  and  $X_{n+1} = \phi(X_n)$ , stop when  $X_n = X_{n+1}$  (recall: ultra-fast equality test!)

(Or stop when  $X_i$  intersects bad states.)

Sounds very simple but many possible optimizations and variants (e.g. **signed BDDs**), much work needed

In practice, need other operators (e.g. "constrain", "restrict"...)



## Backward analysis

TODO

- Forward: compute reachable states by → from initial states Σ<sub>0</sub>, test intersection with bad states W
- Backward: compute co-reachable states from W, test intersection with initial states Σ<sub>0</sub>



## A glimpse into the next weeks

The set *X* of reachable states satisfies  $X = \phi(X)$ . It is the least set wrt  $\subseteq$  that satisfies  $\phi(X) \subseteq X$  $\phi(X)$  = "next states from *X* and add initial states"

Search for *X* satisfying  $\phi(X) \subseteq X$  (**inductive invariant**).

If **any** inductive invariant does not intersect *W*, *W* unreachable.



### Industrial use: hardware

Clocked hardware  $\simeq$  reset state + transition relation

Checking properties of circuits during conception (building prototypes is very expensive)

Tools such as Cadence-SMV



## Bounded model checking

#### BDDs are too costly (worst-case exponential time and space)

# Unbounded reachability in Boolean circuits is PSPACE-complete

Idea: limit search to n steps, "only" NP-complete

