Static Analysis and Verification

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Tomáš Vojnar

vojnar@fit.vutbr.cz

Brno University of Technology Faculty of Information Technology Božetěchova 2, 612 66 Brno

Some introductory notes

- These slides are intended for the course of Static Analysis and Verification at FIT BUT.
- Students are assumed to have a basic knowledge of (and, perhaps even more importantly, to like or, at least, not to be afraid of) theories of automata, graphs, logics, algebra, and modelling.
- Students are expected to themselves actively search and study further information available in recommended textbooks and on the Internet.
- ❖ Students are also strongly advised to experiment with available tools for static (formal) analysis and verification in order to get deeper understanding of the capabilities and limits of the presented techniques.
- ❖ Note that many of the presented subjects are relatively new, still under a very active research, they are rapidly developing, and also the terminology is not always completely uniform and stable.

References, Inspiration

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Basic Terminology

Analysis and Verification

- ❖ Verification is a process of checking whether a given system (a real system or a model) satisfies a given correctness specification (property).
 - For example, given a concurrent program, we ask whether it is deadlock-free.
 - A verification method provides (ideally) yes/no answers having the sense that the system is/is not correct wrt. the given specification.
 - The yes/no answer may be complemented by some diagnostic information (e.g., when a deadlock is possible, a run leading to some deadlock situation is provided, or a certificate/proof that no deadlock is possible is produced).

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- ❖ Analysis finds answers to more general questions about a given system—either questions which are not Boolean, or even if they are, they do not necessarily directly speak about correctness of the system.
 - For example, given a concurrent system, we ask whether there is some ordering over the shared resources in which they are always locked.
 - Answers provided by analysis may be an input for further reasoning leading to the verification of the system. However, they can also be used for completely different purposes, e.g., for optimisation, synthesis, code generation, etc.

Formal Methods

- Verification and analysis methods include:
 - "bug hunting": simulation, testing and dynamic analysis, some forms of static analysis, bounded model checking, ...
 - formal analysis and verification: model checking, some forms of static analysis, theorem proving, ...
- * Formal methods are naturally based on formal, mathematical roots—this does not imply that they are necessarily manual and not usable by ordinary users (!).
- Unlike other approaches, formal verification is (at least potentially) capable of proving correctness of a given system wrt. a given specification—and not just disprove the property based on some observed behaviour.
- Similarly, formal analysis is capable of providing answers universally (conservatively) covering all possible behaviours of a given system (not just giving existential answers—though perhaps extrapolated—based on some observed behaviours).

The Ideal of Formal Verification

- Full automation: no human help needed.
- ❖ Soundness: if a verification method claims that a system is correct wrt. a given specification, it is indeed correct.
- ❖ Completeness: if a verification method claims that a system is not correct, there is indeed an error in the system—i.e., no false alarms (false positives).

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Hard to achieve in general:

- the state explosion problem—i.e., an exponential growth of the number of reachable states wrt. the source description of a finite-state system:
 - int n; can have 2^{32} (or 2^{64} , 2^{128} , ...) possible values,
 - m such variables: $2^{m.32}$ (or $2^{m.64}$, $2^{m.128}$, ...) possible values,
 - n concurrent processes each with m states can generate m^n states,
- undecidability: it suffices to have two *unbounded* integer variables, operations ++ and --, and branching according to equality with zero.

Relaxing the Ideal

- ❖ A verification method needs not guarantee termination and/or can produce false alarms.
- Alternatively, a method is allowed to stop with a "don't know" answer and/or becomes not fully automated (i.e., some human help is required).
- Sometimes, even soundness is sacrificed to efficiency leading to an error detection method with formal verification roots.
 - For example, possible errors are ranked according to chances they are real, and only warnings of at least some rank are shown.
- ❖ Note that even if full formal verification of a system fails, it may still be useful as it can find some errors in the mean time.
- ❖ The errors found by formal methods can differ from those found by other methods due to other principles on which the methods work.
 - Hence, it is often a good idea to use as many different approaches as possible.

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Soundiness

- ❖ Introduced in [Livshits et al, CACM'15].
- Soundness not necessary for most modern analysis applications:
 - many clients can tolerate unsoundness.
- ❖ A soundy analysis aims to be as sound as possible without excessively compromising precision and/or scalability.
- One may distinguish
 - analyses that are soundy, i.e., mostly sound, with specific, well-identified unsound choices (e.g., reflection when analysing Java code),
 - analyses that do not concern themselves with soundness at all.

Systems and Properties To Be Checked

Systems To Be Checked

- Systems to be verified/analysed can be classified in many different ways:
 - Real systems (SW in common programming languages, HW in VHDL, Verilog, ...)
 and models (based on process algebras, Petri nets, specialised modelling and
 specification languages like SMV, Promela, Simulink, EARS, CLEAR, OPM ...).
 - Note: we may distinguish high-level specification of systems and specification of properties (next slide).
 - Finite-state and infinite-state systems—dealing with parameterisation, unbounded recursion (stacks), queues (channels), counters (integer variables), dynamic instantiation, continuous phenomena (time in real-time systems, ...), ...
 - Sequential and concurrent systems—in the latter case, asynchronous or synchronous, with interleaving or true concurrency, ...

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 - Sequential and concurrent systems—in the latter case, asynchronous or synchronous, with interleaving or true concurrency, ...
 - Control-intensive and data-intensive systems.
 - Transformational and reactive systems:
 - Transformational systems are designed to transform a certain input to a certain output (compilers, database queries, ...).
 - Reactive systems typically transform an infinite sequence of inputs to an infinite sequence of outputs (control systems, operating systems and their sub-systems, ...).

- Properties to be verified/analysed can again be classified in various ways:
 - The specification language:
 - the property may be fixed for a given method/tool/plugin,
 - a choice out of a list,
 - various kinds of labels/inscriptions (assertions, end-state labels, progress labels, invariants, ...),
 - automata (FSA, Büchi automata, ...), temporal logic formulae (LTL, CTL, CTL*, μ-calculus, ...),
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 - The form of counterexamples (finite or infinite):
 - safety vs. liveness (or their mixture).

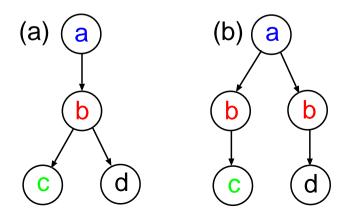
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 - The form of counterexamples (finite or infinite):
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 - A special kind of properties to be checked are various forms of equality/refinement/simulation of two system versions.

Notions of Time

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- Physical time allows one to measure how much time passed between two states/events.
- ❖ Linear time allows one to speak about particular linear traces of the state space of a given system only.
 - In all traces, b must happen immediately followed by c. (1)
 - In all traces, b must happen immediately followed by c or d. (2)
- ❖ Branching time allows one to quantify (existentially and universally) over the possible futures of a given state. We view the state space unfolded into an infinite tree.
 - b must happen, and immediately after, c may happen and d may happen. (3)



- (a) (b)
- (1) No No
- (2) Yes Yes
- (3) Yes No

Linear Time Safety and Liveness

- Safety properties require that something bad never happens.
 - Their violation always has a finite witness. In other words, if there is a counterexample, there is a finite counterexample.
 - Examples:
 - Processes mutually exclude each other when accessing a shared variable.
 - A program never returns a wrong result.

(partial correctness)

- No null pointer exception can arise.
- A signal s_1 never arrives before a signal s_2 .

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 - Examples:
 - Processes mutually exclude each other when accessing a shared variable.
 - A program never returns a wrong result. (partial correctness)
 - No null pointer exception can arise.
 - A signal s_1 never arrives before a signal s_2 .
- Liveness properties require that something good eventually happens.
 - Their violation can only have an infinite witness, or a finite but complete witness, i.e., a witness that cannot be extended any more.
 - Examples:
 - A program terminates for any input.

(total correctness)

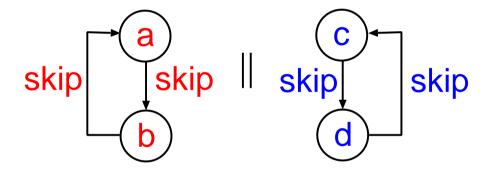
- A process can never starve.
- After a signal s_1 is received, a signal s_2 is eventually sent.
- Liveness is typically harder to verify than safety.
- General properties can mix (conjoin) safety and liveness.

Branching Time Safety and Liveness

- ❖ The situation is more complicated: a computation tree can be infinite and incomplete at the same time!
- ❖ One can distinguish [Manolios, Trefler LICS 2001]:
 - Universally safe properties: linear time safety over all computations.
 - Existentially safe properties: guarantee at least one safe computation.
 - Universally live properties: linear time liveness properties over all computations.
 - Existentially live properties: linear time liveness for at least one computation.
- General properties are intersections of some of the above kinds of properties.

Fairness

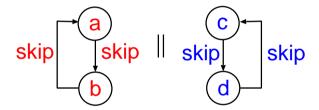
- In order to exclude practically infeasible, trivial counterexamples to liveness properties, one usually has to apply some fairness assumptions.
 - For example, assume that we have two concurrent, infinitely looping processes, not requesting anything from their environment.



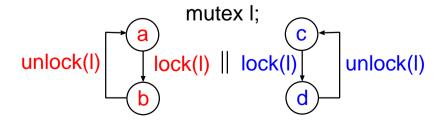
- We ask whether each of them will always eventually do a step.
- We somehow naturally expect the answer to be yes, but this is based on that we implicitly assume that the processes are scheduled by some fair scheduler.
- However, if we do not build the scheduler into the system, the answer will be no.
- Alternatively, we can perform the verification under a suitable fairness assumption—either expressed as a part of the property being checked or hard-wired into the verification algorithm.

Fairness

- * Fairness limits sources of non-determinism in a system (e.g., in the scheduling or in reading random data from the environment).
- Two most common kinds of fairness:
 - Weak fairness:
 - an action that is eventually always enabled must always eventually be taken,



- enough for non-synchronizing processes.
- Strong fairness:
 - an action that is always eventually enabled must always eventually be taken,
 - needed when dealing with fair resource allocation,



more complicated to handle.

Different Approaches to Formal Verification and Analysis

[Clarke, Emerson 81], [Quielle, Sifakis 81]

- ❖ An algorithmic approach of checking whether a given system satisfies a given property through a systematic exploration of the **state space** of the system.
 - The system may be a real system or a model.
 - Sometimes the use of models is stressed.
 - Usually, finite-state systems are considered.
 - Dealing with infinite-state systems is less common.
 - Properties classically specified using temporal logics (LTL, CTL, CTL*, ...);
 other forms of specification are also possible.

Advantages include:

- a (relatively) high degree of automation—fully automated up to the need of modelling the system, its parts, and/or its environment,
- (relatively) easy to use,
- quite general as for the systems and their properties that can be checked,
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Disadvantages:

- the state explosion problem (and dealing with infinite-state spaces),
- a need to model the environment of the checked (sub-)system.

- ❖ Dealing with the state explosion problem—just a brief overview, we will get back to (at least some of) the mentioned approaches later on:
 - Efficient storage of state spaces (hierarchical storage of states, BDDs, ...).
 - State space reductions (symmetries, partial-order reduction, ...).
 - Abstraction, counterexample-guided abstraction refinement (CEGAR).
 - Compositional methods, assume-guarantee reasoning.
 - [Bounded model checking: exploring the state space up to some bound only (sacrificing soundness), may leverage advances in SAT/SMT solving.]
- Especially suitable for reactive, concurrent, control-intensive systems.
- Supported by many tools, including industrial-strength tools:
 - Spin, Divine, Blast, CPAchecker, CBMC, JBMC, Ultimate Automizer, JPF (NASA), NuXMV, ABC, Incisive Formal Analysis (Cadence), Questa (Siemens), VC Formal (Synopsys), Uppaal, Prism, ...

- Collects some information about the behaviour of a system from its source code without actually executing it under its original semantics.
- This description is very general, it can include even model checking and theorem proving (at least in some of their forms), which is sometimes (but not usually) done.
- Static analyses range from simple syntactic checks to iterative fixpoint computations over an abstraction of the examined system (e.g., into a form of equations that need to be solved).
- Different forms of static analysis:
 - bug pattern (anti-pattern) searching,
 - dataflow analysis,
 - constraint-based analysis,
 - (extended) type analysis (type and effect systems),
 - abstract interpretation,
 - symbolic execution, ..., mixtures of the above.

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Disadvantages:

- can produce many false alarms
 - construction of more and more precise analyses leads to similar efficiency problems like in model checking,
 - often resolved by accepting unsoundness,
- various analyses are often specialised just for a certain specific task,
- can have in principle restricted applicability for some properties of interest (e.g., not everything can be simply expressed by a bug pattern).

- ❖ There exist many tools for static analysis too:
 - FindBugs/SpotBugs, Synopsys/Coverity, Klocwork, CodeSonar (GrammaTech),
 PolySpace, Code Analysis in VisualStudio, AbsInt/Astrée, Clang Static Analyser,
 gcc static analysis, Cppcheck, cppclean, Sparse, Meta/Facebook Infer, Facebook
 SPARTA, Frama-C, Predator, KLEE, Loopus, Cost, Symbiotic, ...

Theorem Proving

- ❖ Deductive verification often similar to the classical mathematical way of proving theorems starting with axioms and inferring further facts using rules of correct inference.
- Advantages and disadvantages:
 - Very general.
 - Usually semi-automated, requires a significant manual effort.
 - Problems with diagnostic information for incorrect systems.
- ❖ There exist many interactive theorem provers including:
 - PVS, Coq, Hol, Isabelle, ACL2, Forte, ...
- ❖ Used, e.g., by Intel, AMD to verify complex designs of various arithmetic units (sometimes combined with model checking). Ongoing attempts to arrive to formally verified operating system kernels (seL4), compilers (CompCert), ...

Theorem Proving

- ❖ Recently there has been a lot of progress on fully automated decision procedures for various decidable theories:
 - propositional logic (SAT solving),
 - various first-order theories (SMT solving)
 - uninterpreted functions,
 - linear integer/real arithmetic,
 - theories of arrays, bitvectors, ...
 - WS1S, WS2S, ...
- There exist many tools implementing various decision procedures:
 - SAT solvers: Kissat, CaDiCaL, MapleSAT, glucose, ...
 - SMT solvers: Z3, CVC5, MathSat, Yices2, Boolector, SMTinterpol, ...
 - WS1S/WS2S: Mona, Gaston, ...
- There exist fully automated theorem provers for undecidable logics as well: e.g. Vampire for predicate logic (no guarantee of termination).

Theorem Proving

- ❖ Decision procedures often serve as a back-end for other verification approaches, e.g.:
 - Predicate abstraction for model checking.
 - Deductive verification based on discharging verification conditions.
 - Code is annotated by loop invariants, pre-/post-conditions of the program and procedures, and/or various assumptions.
 - Annotations can be (partially) obtained automatically—e.g., from analysing runs of the system and generalising them, solving constraints describing loops, using LLMs, etc.
 - Annotations allow verification to concentrate on loop-free fragments.
 - Verification conditions: checking that when one starts under some precondition and executes a loop-free code fragment, the postcondition will be met.
 - Used, e.g., in attempts to verify operating system kernels—PikeOS,
 Microsoft's Hypervisor (see the tool VCC).
 - Symbolic execution iterating over longer and longer program paths possibly leading to an error, encoding them as formulae, checking satisfiability.
 - Klee, Symbiotic, SPF, Java Ranger, JDart, ...