

# Formal Methods in Software Development

## Overview

Mădălina Eraşcu

West University of Timișoara  
Faculty of Mathematics and Informatics

Based on slides of the lecture Satisfiability Checking (Erika Ábrahám), RTWH Aachen

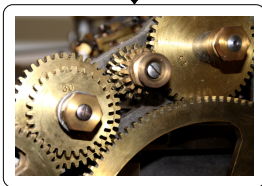
September 27, 2018

See `https://merascu.github.io`

# What is this lecture about?



Quantifier-free  
logical  
formula

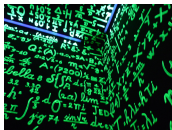


Solver

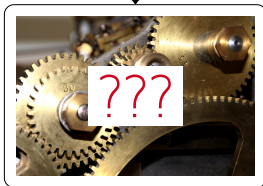


Satisfiability of the  
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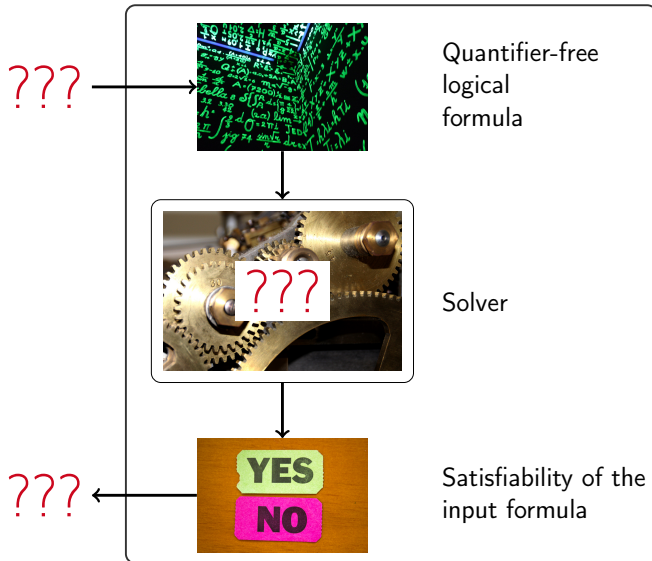


Solver



Satisfiability of the  
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# What is this lecture about?



# The Boolean satisfiability problem...

## Satisfiability problem for propositional logic

Given a **formula** combining some **atomic propositions** using the **Boolean operators** “and” ( $\wedge$ ), “or” ( $\vee$ ) and “not” ( $\neg$ ), decide whether we can substitute truth values for the propositions such that the **formula evaluates to true**.

### Example

Formula:  $(a \vee \neg b) \wedge (\neg a \vee b \vee c)$

Satisfying assignment:  $a = \text{true}, b = \text{false}, c = \text{true}$

It is the perhaps most well-known NP-complete problem [Cook, 1971] [Levin, 1973].

## ...and its extension to theories

### Satisfiability modulo theories problem (informal)

Given a Boolean combination of **constraints from some theories**, decide whether we can substitute (type-correct) values for the (theory) variables such that the formula evaluates to true.

### A non-linear real arithmetic example

Formula:  $\exists_x (x^2 + 1 \geq 0 \wedge x < 0)$

Satisfying assignment:  $x = -1$

Hard problems... non-linear integer arithmetic is even undecidable.

# What is formal logic?

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- Important properties of logical systems:
  - **consistency**
  - **soundness**
  - **completeness**

# Historical view on logic

Historical development goes from

**informal** logic (natural language arguments) to

**formal** logic (formal language arguments)

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Historical development goes from

**informal** logic (natural language arguments) to  
**formal** logic (formal language arguments)

- Philosophical logic
  - 500 BC to 19th century
- Symbolic logic
  - Mid to late 19th century
- Mathematical logic
  - Late 19th to mid 20th century
- **Logic in computer science**

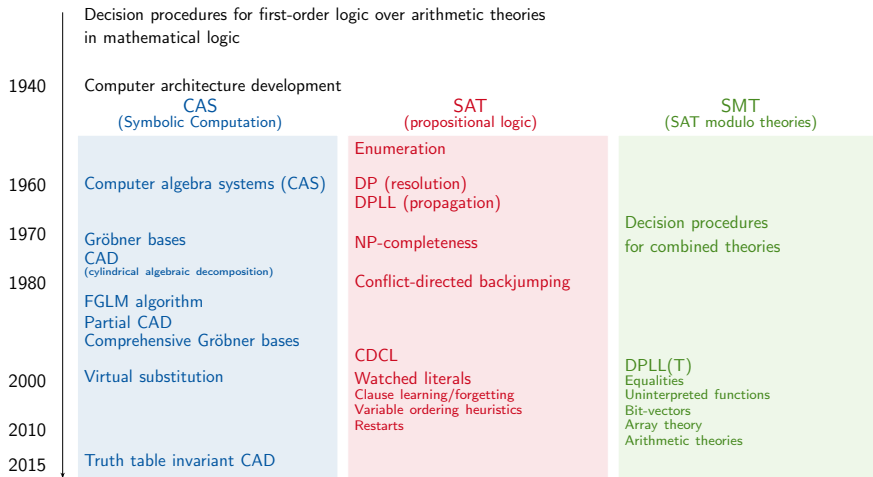
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- Propositional logic - the foundation of computers and circuits
- Databases - Query languages
- Programming languages (e.g. Prolog)
- Specification and verification
- ...

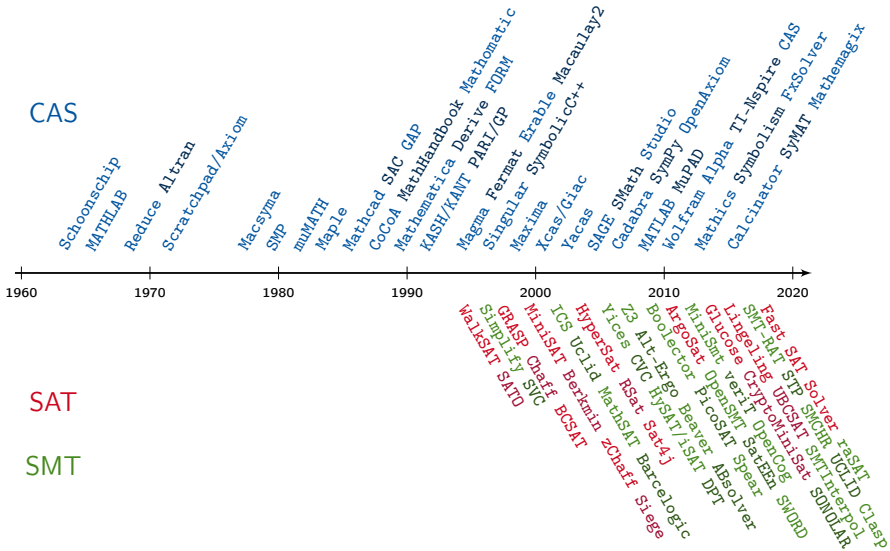
- Propositional logic
- First order logic
- Higher order logic
- Temporal logic
- ...

# Satisfiability checking: Some milestones





## Satisfiability checking: Tool development (not exhaustive)



# Satisfiability checking for propositional logic

Success story: SAT-solving

- Practical problems with millions of variables are solvable.
- Frequently used in different research areas for, e.g., analysis, synthesis and optimisation.
- Also massively used in industry for, e.g., digital circuit design and verification.

# Satisfiability checking for propositional logic

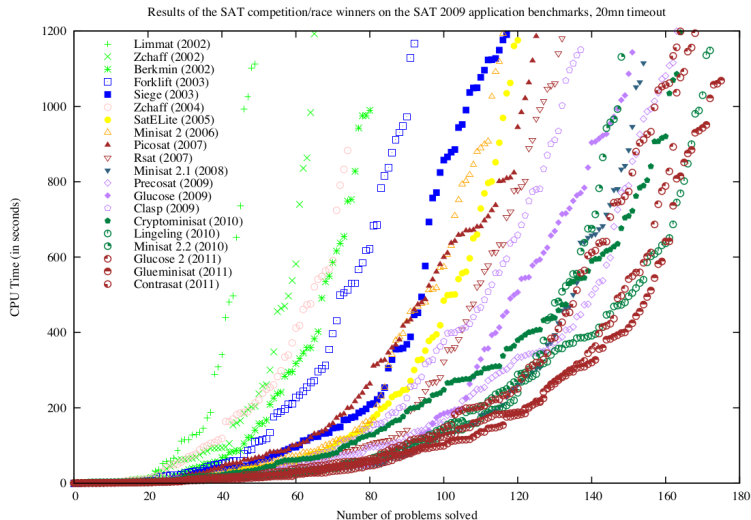
Success story: SAT-solving

- Practical problems with millions of variables are solvable.
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Community support:

- Standardised input language, lots of benchmarks available.
- Competitions since 2002.  
2016 SAT Competition: 6 tracks, 29 solvers in the main track.  
SAT Live! forum as community platform, dedicated conferences, journals, etc.

# An impression of the SAT solver development



Source: Jarvisalo, Le Berre, Roussel, Simon. *The International SAT Solver Competitions*. AI Magazine, 2012.

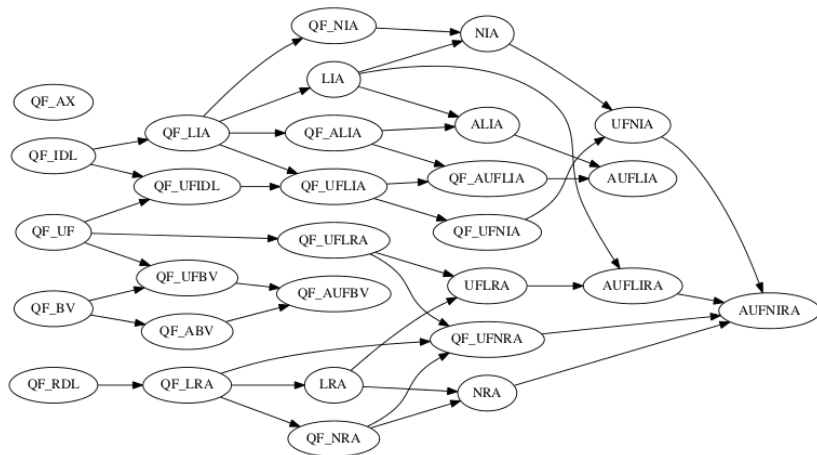
# Satisfiability modulo theories solving

- Propositional logic is sometimes too weak for modelling.
- We need more expressive **logics** and **decision procedures** for them.
- Logics:
  - quantifier-free fragments of first-order logic over various theories.
- Our focus: **SAT-modulo-theories (SMT) solving**.

# Satisfiability modulo theories solving

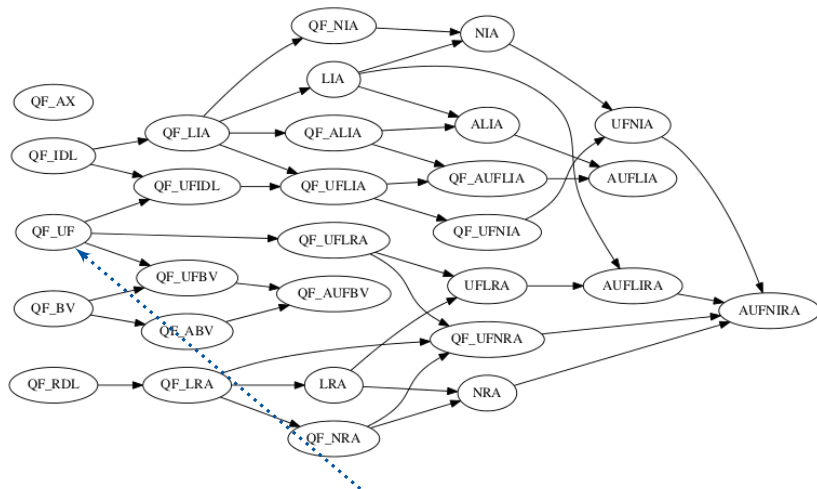
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- **SMT-LIB as standard input language** since 2004.
- **Competitions** since 2005.
- **SMT-COMP 2016** competition:
  - 4 tracks, 41 logical categories.
  - **QF linear real arithmetic**: 7 + 2 solvers, 1626 benchmarks.
  - **QF linear integer arithmetic**: 6 + 2 solvers, 5839 benchmarks.
  - **QF non-linear real arithmetic**: 5 + 1 solvers, 10245 benchmarks.
  - **QF non-linear integer arithmetic**: 7 + 1 solvers, 8593 benchmarks.

# SMT-LIB theories



Source: <http://smtlib.cs.uiowa.edu/logics.shtml>

# SMT-LIB theories



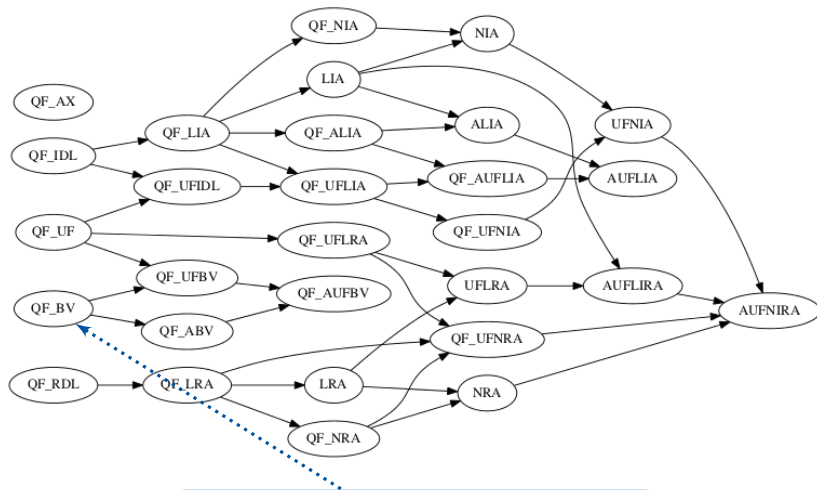
Quantifier-free equality logic with uninterpreted functions

$$(a = c \wedge b = d) \rightarrow f(a, b) = f(c, d)$$

Source: <http://smtlib.cs.uiowa.edu/logics.shtml>



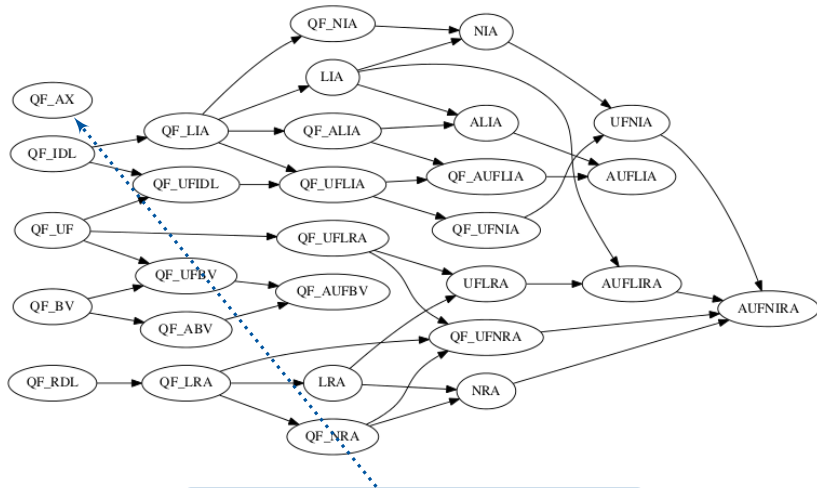
# SMT-LIB theories



Quantifier-free bit-vector arithmetic  
 $a + b \geq 0 \wedge (a|b) \leq (a \& b)$

Source: <http://smtlib.cs.uiowa.edu/logics.shtml>

## SMT-LIB theories

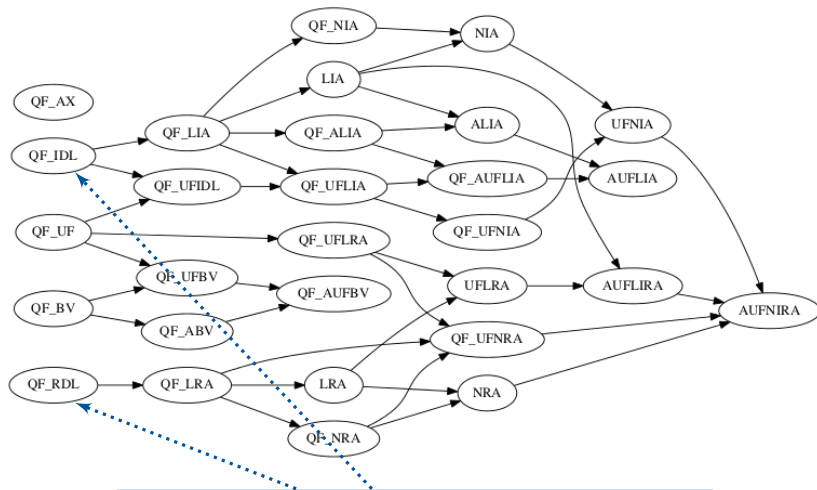


Quantifier-free array theory

$$i = j \rightarrow \text{read}(\text{write}(a, i, v), j) = v$$

Source: <http://smtlib.cs.uiowa.edu/logics.shtml>

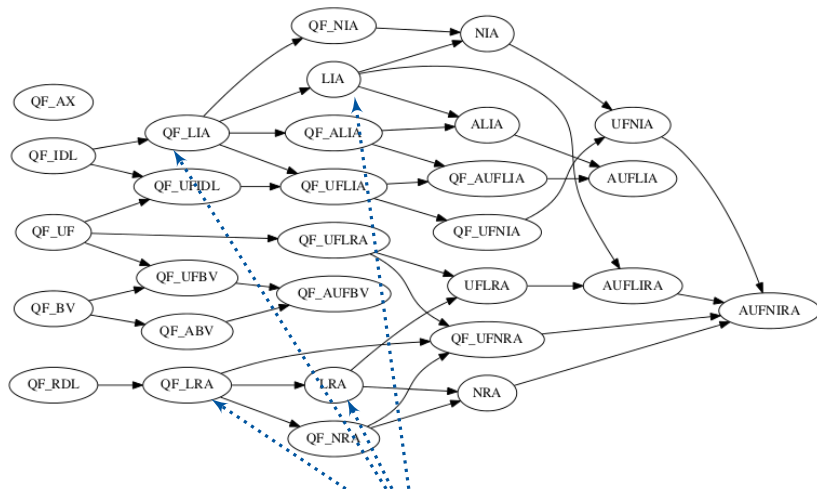
# SMT-LIB theories



Quantifier-free integer/rational difference logic  
 $x - y \geq 0 \vee x - z < 0$

Source: <http://smtlib.cs.uiowa.edu/logics.shtml>

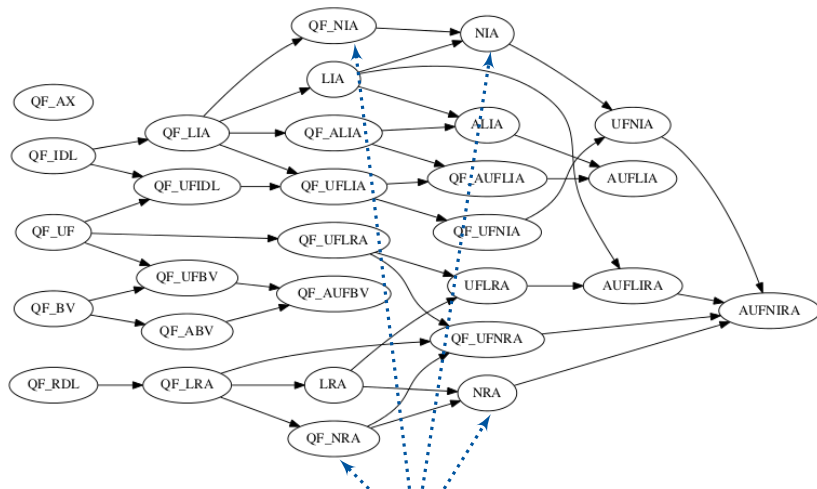
# SMT-LIB theories



(Quantifier-free) real/integer linear arithmetic  
 $4x + 7y = 8 \wedge (y = 0 \vee x > y)$

Source: <http://smtlib.cs.uiowa.edu/logics.shtml>

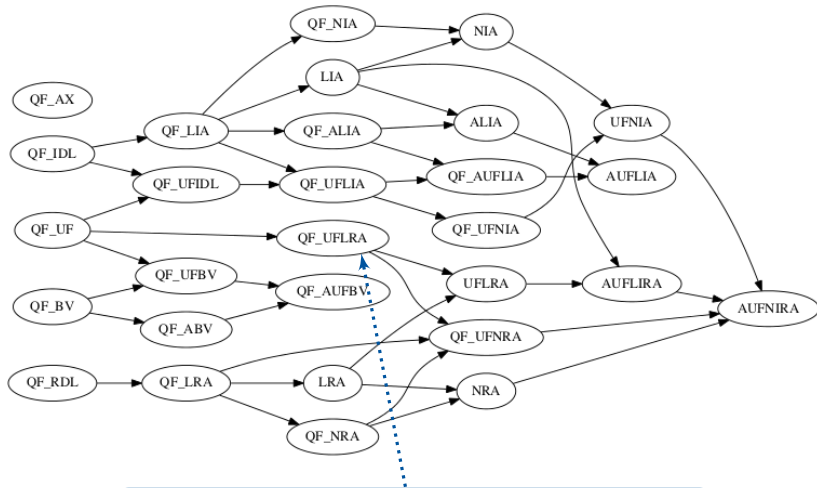
# SMT-LIB theories



(Quantifier-free) real/integer non-linear arithmetic  
$$x^2 + 2xy + y^2 > 0 \vee (x \geq 1 \wedge xz + yz^2 = 0)$$

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## SMT-LIB theories

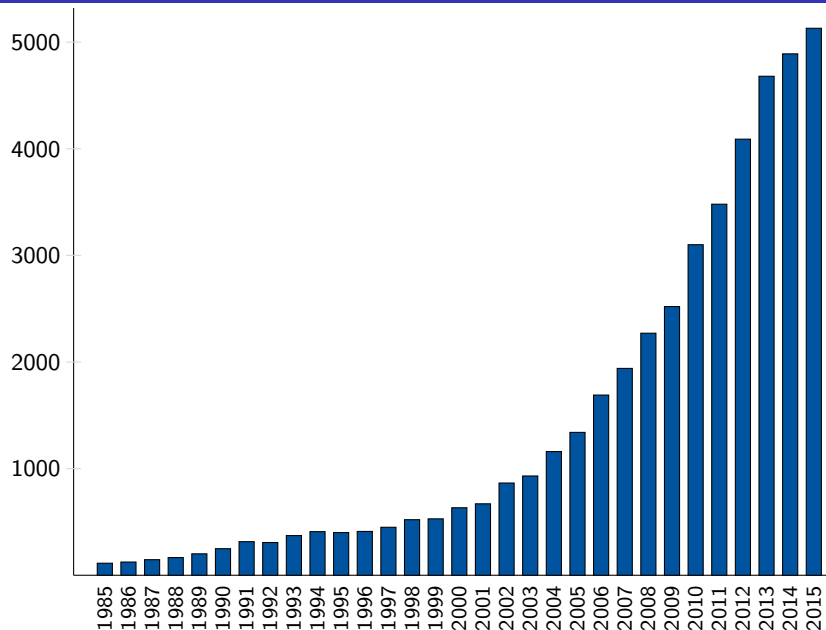


## Combined theories

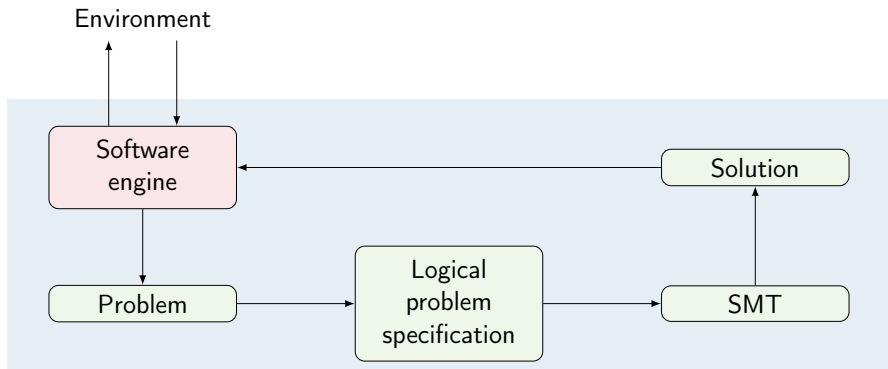
$$2f(x) + 5y > 0 \wedge \neg(f(x) = y \vee x + 2y = 0)$$

Source: <http://smtlib.cs.uiowa.edu/logics.shtml>

# Google Scholar search for “SAT modulo theories”

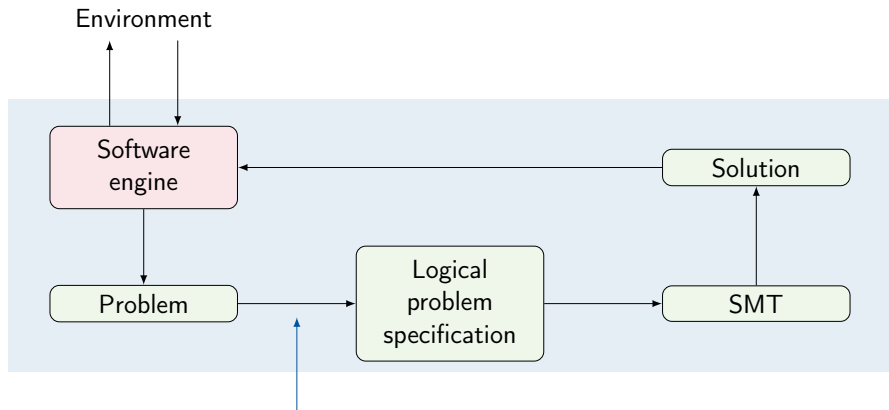


# SAT/SMT embedding structure



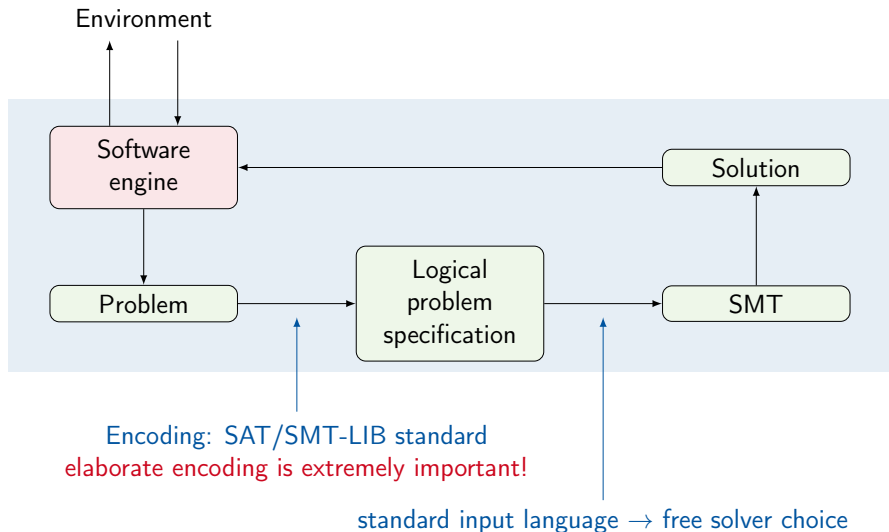


# SAT/SMT embedding structure



Encoding: SAT/SMT-LIB standard  
elaborate encoding is extremely important!

# SAT/SMT embedding structure



# Application example: Hardware verification

**Problem 1:** Given two circuits, are they equivalent?

**Problem 2:** Given a circuit and a property specification, does the circuit fulfill the specification?

**Problem 3:** Given a partially specified circuit with a black-box component (at early design stage) and a property specification, is the partial circuit realisable, i.e., is there an implementation of the black box such that the circuit fulfills the property?

Many hardware producers develop and use own SAT solvers for these tasks.

# Application example: Symbolic execution

**Program 1.2.1** A recursion-free program with bounded loops and an SSA unfolding.

```
int Main(int x, int y)
{
    if (x < y)
        x = x + y;
    for (int i = 0; i < 3; ++i) {
        y = x + Next(y);
    }
    return x + y;
}

int Next(int x) {
    return x + 1;
}
```

```
int Main(int x0, int y0)
{
    int x1;
    if (x0 < y0)
        x1 = x0 + y0;
    else
        x1 = x0;
    int y1 = x1 + y0 + 1;
    int y2 = x1 + y1 + 1;
    int y3 = x1 + y2 + 1;
    return x1 + y3;
}
```

$$\exists x_1, y_1, y_2, y_3 \left( (x_0 < y_0 \implies x_1 = x_0 + y_0) \wedge (\neg(x_0 < y_0) \implies x_1 = x_0) \wedge \right. \\ \left. y_1 = x_1 + y_0 + 1 \wedge y_2 = x_1 + y_1 + 1 \wedge y_3 = x_1 + y_2 + 1 \wedge \right. \\ \left. result = x_1 + y_3 \right)$$

Source: Nikolaj Bjørner and Leonardo de Moura. *Applications of SMT solvers to Program Verification*.

Rough notes for SSFT 2014.

# Application example: Bounded model checking

**Problem:** Given a program (automaton, circuit, term rewrite system, etc.), find an execution path of length at most  $k$  which leads to a state with a certain property (used for detecting, e.g., division by zero, violating functional requirements, etc.).

# Application example: Bounded model checking for C/C++



Bounded Model Checking  
for Software



## CBMC About CBMC

CBMC is a Bounded Model Checker for C and C++ programs. It supports C89, C99, most of C11 and most compiler extensions provided by gcc and Visual Studio. It also supports [SystemC](#) using [Soot](#). We have recently added experimental support for Java Bytecode.

CBMC verifies array bounds (buffer overflows), pointer safety, exceptions and user-specified assertions. Furthermore, it can check C and C++ for consistency with other languages, such as Verilog. The verification is performed by unwinding the loops in the program and passing the resulting equation to a decision procedure.



While CBMC is aimed for embedded software, it also supports dynamic memory allocation using `malloc` and `new`. For questions about CBMC, contact [Daniel Kroening](#).

CBMC is available for most flavours of Linux (pre-packaged on Debian, Ubuntu and Fedora), Solaris 11, Windows and MacOS X. You should also read the [CBMC license](#).

CBMC comes with a built-in solver for bit-vector formulas that is based on MiniSat. As an alternative, CBMC has featured support for external SMT solvers since version 3.3. The solvers we recommend are (in no particular order) [Boolector](#), [MathSAT](#), [Yices 2](#) and [Z3](#). Note that these solvers need to be installed separately and have different licensing conditions.

Source: D. Kroening. **CBMC home page**. <http://www.cprover.org/cbmc/>

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Logical encoding of finite unsafe paths



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Encoding idea:  $Init(s_0) \wedge Trans(s_0, s_1) \wedge \dots \wedge Trans(s_{k-1}, s_k) \wedge Bad(s_0, \dots, s_k)$

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Application examples:

Error localisation and explanation

Equivalence checking

Test case generation

Worst-case execution time

location

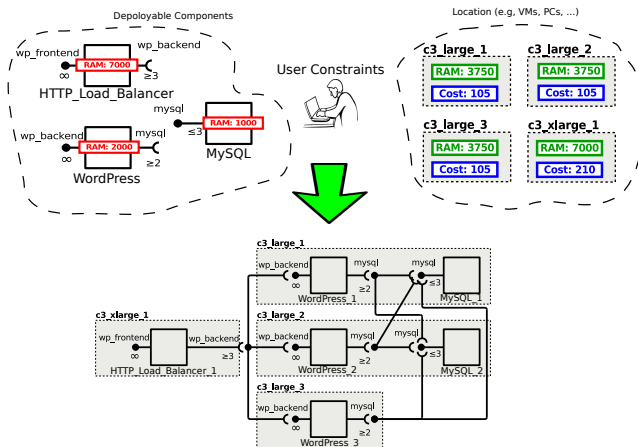
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Source: D. Kroening. **CBMC home page**. <http://www.cprover.org/cbmc/>

# Application example: Deployment optimisation on the cloud



Source: E. Ábrahám, F. Corzilius, E. Broch Johnsen, G. Kremer, J. Mauro.

**Zephyrus2: On the fly deployment optimization using SMT and CP technologies.**

Submitted to SETTA'16.