

# Formal Methods and Specification (SS 2021)

## Lecture 11: Abstraction, Decision Procedures

Stefan Ratschan

Katedra číslicového návrhu  
Fakulta informačních technologií  
České vysoké učení technické v Praze



Evropský sociální fond Praha & EU: Investujeme do vaší budoucnosti

# Motivation

Methods already discussed need checks of

- ▶ verification conditions
- ▶ conditions for execution paths (symbolic execution)

Can, to a large extent, be done automatically.

Powerful solvers reason for success in recent years.

## Prelude: Validity vs. Satisfiability

For example: real numbers

$$\models x + 1 \geq x$$

or, equivalently

$$\neg(x + 1 \geq x) \text{ that is } x + 1 < x \text{ unsatisfiable}$$

and, in general:

$$\models \phi$$

*iff*

formula  $\neg\phi$  is unsatisfiable

Analogy:

Prove a formula  $\phi$

or, equivalently

assume  $\neg\phi$  and find a contradiction

Intuition: satisfiability = solvability

Potential confusion:

we want to prove  $\models \phi$ , but algorithms usually decide satisfiability.

## Example:

$Q \leftarrow \perp$

**if**  $200 + 314x \geq 2 \wedge \text{end\_of\_the\_world} > 2073$  **then**

$Q \leftarrow \top$

**if**  $[\neg[\text{end\_of\_the\_world} > 2073] \vee 200 + 314x < 2] \wedge Q$  **then**  
*explosion!*

Two catastrophic execution paths:

1. skipping first **if**
2. executing first **if**

Check whether executable (see symbolic execution formulas):

$$\neg Q \wedge \neg[200 + 314x \geq 2 \wedge \text{end\_of\_the\_world} > 2073] \wedge \\ [\neg[\text{end\_of\_the\_world} > 2073] \vee 200 + 314x < 2] \wedge Q$$

$$\neg Q \wedge 200 + 314x \geq 2 \wedge \text{end\_of\_the\_world} > 2073 \wedge Q_1 \wedge \\ [\neg[\text{end\_of\_the\_world} > 2073] \vee 200 + 314x < 2] \wedge Q_1$$

Everything **o.k.**, if both formulas **unsat**

# Unsat Proof of First Formula

$Q \leftarrow \perp$

**if**  $200 + 314x \geq 2 \wedge \text{end\_of\_the\_world} > 2073$  **then**

$Q \leftarrow \top$

**if**  $[\neg[\text{end\_of\_the\_world} > 2073] \vee 200 + 314x < 2] \wedge Q$  **then**

*explosion!*

To prove unsatisfiability of

$$\neg Q \wedge \neg[200 + 314x \geq 2 \wedge \text{end\_of\_the\_world} > 2073] \wedge \\ [\neg[\text{end\_of\_the\_world} > 2073] \vee 200 + 314x < 2] \wedge Q$$

we assume this formula, which immediately results in a contradiction.

We only used **Boolean constants**, **ignored** everything else.

# Unsat Proof of Second Formula

$Q \leftarrow \perp$

**if**  $200 + 314x \geq 2 \wedge \text{end\_of\_the\_world} > 2073$  **then**

$Q \leftarrow \top$

**if**  $[\neg[\text{end\_of\_the\_world} > 2073] \vee 200 + 314x < 2] \wedge Q$  **then**

*explosion!*

To prove unsatisfiability of

$$\neg Q \wedge 200 + 314x \geq 2 \wedge \text{end\_of\_the\_world} > 2073 \wedge Q_1 \\ [\neg[\text{end\_of\_the\_world} > 2073] \vee 200 + 314x < 2] \wedge Q_1$$

we assume this formula, and try to arrive at a contradiction.

**No contradiction** from properties of Boolean constants alone.

## Unsat Proof of Second Formula

$$\neg Q \wedge 200 + 314x \geq 2 \wedge \text{end\_of\_the\_world} > 2073 \wedge Q_1 \wedge \\ [\neg[\text{end\_of\_the\_world} > 2073] \vee 200 + 314x < 2] \wedge Q_1$$

We ignore details, but consider the Boolean structure

$$\neg Q \wedge S \wedge R \wedge Q_1 \wedge [\neg R \vee T] \wedge Q_1$$

leads to a contradiction?

satisfiable, satisfied by

$$\{Q \mapsto \perp, S \mapsto \top, R \mapsto \top, Q_1 \mapsto \top, T \mapsto \top\}$$

$$200 + 314x \geq 2, \text{end\_of\_the\_world} > 2073, 200 + 314x < 2$$

$$\neg Q \wedge S \wedge R \wedge Q_1 \wedge [\neg R \vee \neg S] \wedge Q_1$$

# Unsat Proof of Second Formula

Assume  $\neg Q \wedge S \wedge R \wedge Q_1 \wedge [\neg R \vee \neg S] \wedge Q_1$

$\neg Q, S, R, Q_1, [\neg R \vee \neg S], Q_1$

Case 1:  $\neg Q, S, R, Q_1, \neg R, Q_1$  contradiction

Case 2:  $\neg Q, S, R, Q_1, \neg S, Q_1$  contradiction

We only used **Boolean structure**, ignored everything else.



# Summary

We started by ignoring details,  
and incrementally used more and more properties:

1. properties of Boolean constants
2. properties of Boolean operations
3.  $<$  is the negation of  $\geq$

Ignoring details that are not relevant for the given problem:

*abstraction*

If abstraction is **unsat** then **original formula** is unsat,  
but not the other way round

If abstraction is satisfiable, and we want to prove unsatisfiability,  
we have to add **additional properties**

The same holds analogically, if we want to prove that a formula **holds**

# Program Abstraction

Application of same principle directly to programs

```
Q ← ⊥  
if S ∧ R then  
    Q ← ⊤  
if [¬R ∨ T] ∧ Q then  
    explosion!
```

Every execution of original program, has a  
corresponding execution of the abstracted program  
but not the other way round

For example,  $\{S \mapsto \top, R \mapsto \top, T \mapsto \top\}$  leads to explosion.  
etc.

# Solvers for Propositional Logic

SAT: “satisfiability” (splnitelnost)

- ▶ Input: propositional logical formula, usually in conjunctive normal form
- ▶ Output:
  - ▶ **satisfying assignment**, if it exists,
  - ▶ **unsat**, if the formula is not satisfiable.

Example:  $[\neg P \vee Q \vee R] \wedge [\neg Q \vee R] \wedge [\neg Q \vee \neg R] \wedge [P \vee Q]$

Reminder:

We can prove a formula by showing unsatisfiability of its negation.

**NP-hard** problem, but huge efficiency improvements in recent years

Today's solvers can solve **huge formulas**

## Further Example

**if**  $x=1$  **then**

$y \leftarrow 1$

**if**  $\text{adfxg7}(x) \neq \text{adfxg7}(y)$  **then**

@  $\perp$

$x = 1 \wedge y = 1 \wedge \text{adfxg7}(x) \neq \text{adfxg7}(y)$  satisfiable?

Boolean abstraction?

$$P \wedge Q \wedge R$$

satisfied by

$$\{P \mapsto \top, Q \mapsto \top, R \mapsto \top\}$$

We have to use knowledge about **equality**,  
but we can abstract from the precise behavior of functions

## Example Continued

We want to check

$$x = 1 \wedge y = 1 \wedge \text{adfxg7}(x) \neq \text{adfxg7}(y)$$

After abstraction

$$a = c \wedge b = c \wedge f(a) \neq f(b)$$

This implies

$$f(c) \neq f(c)$$

which is in contradiction with the law of reflexivity.

So, using the law of reflexivity we can show that the abstraction is unsat

# Equality

What do we know about  $=$ ?

- ▶  $\forall x . x = x$  (reflexivity)
- ▶  $\forall x, y . x = y \Rightarrow y = x$  (symmetry)
- ▶  $\forall x, y, z . [x = y \wedge y = z] \Rightarrow x = z$  (transitivity)
- ▶ for every function symbol  $f$  of arity  $n$ ,  
$$\forall x_1, \dots, x_n . [x_1 = y_1, \dots, x_n = y_n] \Rightarrow f(x_1, \dots, x_n) = f(y_1, \dots, y_n)$$

first three axioms: equivalence relation

all axioms: congruence relation

result: *theory of free function symbols*

Example [Bradley and Manna, 2007]:

How to prove  $\neg[f(a, b) = a \wedge f(f(a, b), b) \neq a]$ ?

Show **unsatisfiability** of **negation**, that is, add

$$f(a, b) = a \wedge f(f(a, b), b) \neq a$$

to assumptions and find a **contradiction**.

# Congruence Closure Algorithm [Nelson and Oppen, 1980]

$$f(a, b) = a \wedge f(f(a, b), b) \neq a$$

= is an equivalence relation, it defines **equivalence classes** on **sub-terms**.

instead of individual equalities we work with whole equivalence classes

Initial assumption: every sub-term is in a separate class:

$$\{\{a\}, \{b\}, \{f(a, b)\}, \{f(f(a, b), b)\}\}$$

from  $f(a, b) = a$ :

$$\{\{a, f(a, b)\}, \{b\}, \{f(f(a, b), b)\}\}$$

congruence propagation: from  $\{a, f(a, b)\}$ :

$f(f(a, b), b)$  and  $f(a, b)$  in same class:

$$\{\{a, f(a, b), f(f(a, b), b)\}, \{b\}\}$$

**Contradiction** with disequality! This implies unsatisfiability.

# Congruence Closure Algorithm [Nelson and Oppen, 1980]

- ▶ Input: formula  $s_1 = t_1 \wedge \dots \wedge s_m = t_m \wedge s_{m+1} \neq t_{m+1} \wedge \dots \wedge s_n \neq t_n$
- ▶ Output: unsatisfiable, satisfiable  
(in the theory of free function symbols)

Let  $\tau$  be the set of sub-terms of

$$s_1 = t_1 \wedge \dots \wedge s_m = t_m \wedge s_{m+1} \neq t_{m+1} \wedge \dots \wedge s_n \neq t_n$$

$\sim \leftarrow$  equivalence relation on  $\tau$  s.t. for all  $u, v \in \tau$ ,  $u \neq v$  implies  $u \not\sim v$

**while** there is  $i \in \{1 \dots m\}$ ,  $u, v \in \tau$  s.t.  $u \not\sim v$ ,

$u[s_i \leftarrow t_i] = v$  or  $u[t_i \leftarrow s_i] = v$  **do**

merge equivalence classes of  $u$  and  $v$  in  $\sim$

**while** there is  $u, v \in \tau$ ,  $p, q \in \tau$ , s.t.  $u \not\sim v$ ,  $p \sim q$ ,

$u[p \leftarrow q] = v$  or  $u[q \leftarrow p] = v$  **do**

merge equivalence classes of  $u$  and  $v$  in  $\sim$

**if** there is an  $i \in \{m+1, \dots, n\}$  s.t.  $s_i \sim t_i$  **then**

**return** unsatisfiable

**else**

**return** satisfiable



## General Formulas: Disjunctions, Quantifiers

A formula  $\phi_1 \vee \dots \vee \phi_n$  is satisfiable iff  
one of the formulas  $\phi_1, \dots, \phi_n$  is satisfiable.

Example: To prove

$$a = a \wedge [a = b \Rightarrow f(a) = f(b)]$$

we show unsatisfiability of

$$\neg[a = a \wedge [a = b \Rightarrow f(a) = f(b)]]$$

that is, unsatisfiability of

$$a \neq a \vee [a = b \wedge f(a) \neq f(b)]$$

that is, unsatisfiability of both  $a \neq a$  and  $a = b \wedge f(a) \neq f(b)$ .

Hence: formulas with conjunctions and disjunctions:

**disjunctive normal form**

General case with **quantifiers**: **undecidable**

# Using the Theory of Free Function Symbols

Example: proving unsatisfiability of

$$a[x] = 0 \wedge x = y \wedge a[y] = 1$$

Abstracted formula:

$$f(a, x) = c \wedge x = y \wedge f(a, y) = d$$

Sub-terms:  $\{a, c, d, x, y, f(a, x), f(a, y)\}$

Result, **satisfiable**, equivalence classes:  $\{a\}, \{x, y\}, \{c, d, f(a, x), f(a, y)\}$

Refinement of abstraction:

$$f(a, x) = c \wedge x = y \wedge f(a, y) = d \wedge c \neq d$$

Further example: pointers

Application to **data structures**:

abstract from detailed properties,  
and try a proof just using equality

i.e., in the theory of free function symbols

# Generalization, Further Theories

Quantifiers, axiom of equality of arrays

[Bradley et al., 2006]

[Bradley and Manna, 2007]

General case: undecidable

Theory	Description	Full	QFF
$T_E$	equality	no	yes
$T_{PA}$	Peano arithmetic	no	no
$T_N$	Presburger arithmetic	yes	yes
$T_Z$	linear integers	yes	yes
$T_R$	reals (with $\cdot$ )	yes	yes
$T_Q$	rationals (without $\cdot$ )	yes	yes
$T_{RDS}$	recursive data structures	no	yes
$T_{RDS}^+$	acyclic recursive data structures	yes	yes
$T_A$	arrays	no	yes
$T_A^=$	arrays with extensionality	no	yes

Combination of theories [Nelson and Oppen, 1979]

# Witnesses and Their Usage

Decision procedures sometimes also return **satisfying assignments**  
(*a witness for satisfiability*)

For example, in the theory of integers:

Input:  $x + y \geq 0 \wedge x - 2y \leq 1$

Output: sat,  $\{x \mapsto -1, y \mapsto 1\}$

This allows **automatic execution** of I/O specifications:

Spec:

- ▶ Input:  $I(x)$
- ▶ Output:  $y$  s.t.  $O(x, y)$

For given input  $a$ , corresponding output:  
witness of satisfiability of  $I(a) \wedge O(a, y)$

How to ensure **efficiency** of automatic execution of specifications?

# Real Numbers

Real numbers:

- ▶ satisfiability of conjunctions of linear equations: Gaussian elimination
- ▶ satisfiability of conjunctions of linear equations and inequalities: simplex algorithm

Sometimes it is even possible to compute something in undecidable cases:

`http://rsolver.sourceforge.net`

# Summary

## Levels of abstraction:

- ▶ Boolean: SAT solvers
- ▶ equality between function symbols: congruence closure
- ▶ individual theories: decision procedures for arrays, real numbers etc.

In theory (decidability) level of individual theories would be enough

In practice, choice of level very important.

## SAT modulo theory (SMT): tight integration:

- ▶ SAT-solver
- ▶ solver for individual theories

Examples: CVC4, z3, openSAT

# Open Research Questions

Only 20-30 years ago: paper and pencil.



Today: speed, speed, speed, speed!

<https://smt-comp.github.io/>

# Conclusion

Basis for automatization of software verification: decision procedures

If one chooses the **right** level of **abstraction**,  
it is possible to prove properties of extremely **complex systems**.

Even the **source code** of a program is  
an **abstraction** of the resulting system:

The compiler may be incorrect, the operating system, or  
we might even have the end of the world



# Literature I

Aaron Bradley and Zohar Manna. *The calculus of computation*. Springer, 2007.

Aaron Bradley, Zohar Manna, and Henny Sipma. What's decidable about arrays? In *Verification, Model Checking, and Abstract Interpretation*, volume 3855 of *Lecture Notes in Computer Science*, pages 427–442. Springer Berlin / Heidelberg, 2006.

Greg Nelson and Derek C. Oppen. Simplification by cooperating decision procedures. *ACM Trans. Program. Lang. Syst.*, 1(2):245–257, 1979. ISSN 0164-0925. doi: <http://doi.acm.org/10.1145/357073.357079>.

Greg Nelson and Derek C. Oppen. Fast decision procedures based on congruence closure. *J. ACM*, 27(2):356–364, April 1980. doi: 10.1145/322186.322198.