
The Barcelogic Research Group: Research Interests

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Overview of the talk

📍 Who are we?



Overview of the talk

- Who are we?
- Introduction to SAT and SMT



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- Introduction to SAT and SMT
- Research interests



Who are we?

- Research group of **Universitat Politècnica de Catalunya**
(at Barcelona, Spain)
- Some of its members:



Robert Nieuwenhuis



Albert Oliveras



Albert Rubio



Javier Larrosa

Enric Rodríguez-Carbonell

...

Introduction to SAT and SMT . 1

- **Historically**, automated reasoning \equiv **uniform** proof-search procedures for **FO logic**
- **Not a big success**: is FO logic the best **compromise** between **expressivity** and **efficiency**?
- **Current trend** is to gain efficiency by:
 - addressing only (expressive enough) **decidable fragments** of a certain logic
 - incorporate **domain-specific** reasoning, e.g:
 - arithmetic reasoning
 - equality
 - data structures (arrays, lists, stacks, ...)

Introduction to SAT and SMT . 2

Examples of this recent trend:

- **SAT**: use **propositional logic** as the formalization language
 - + high degree of efficiency
 - expressive (all NP-complete) but not natural encodings
- **SMT**: propositional logic + **domain-specific** reasoning
 - + improves the expressivity
 - specific techniques need to be designed for each domain



Introduction to SAT

Problem definition:

- **INPUT:** propositional formula F
- **OUTPUT:** is F **SAT**isfiable?

Example:

- $(p \vee q) \wedge (\bar{p} \vee q) \wedge (r \vee \bar{q})$ is **SAT** with model $\{q, p, r\}$
- $(p \vee q) \wedge (\bar{p} \vee q) \wedge (r \vee \bar{q}) \wedge (\bar{r} \vee \bar{q})$ is **UNSAT**

Simple but **MANY** applications:

- System verification
- Planning
- Scheduling
- ...

State of the art in SAT

- Main procedure: Davis-Putnam-Logemann-Loveland (DPLL) is depth-first search with backtracking
- Original procedure [DP'60, DLL'62] extended in the late 90's with:
 - **conceptual** improvements: backjumping, learning, ...
 - **implementation** techniques: 2-watched literals, cache-aware data structures, ...
- SAT solvers current capabilities: industrial instances with **thousands** of variables and **millions** of clauses

Introduction to SMT

- Some problems are more naturally expressed in other logics than propositional logic, e.g, in software verification
- **SMT** consists of deciding the satisfiability of a (**ground**) FO formula with respect to a background theory:

- **Equality with Uninterpreted Functions (EUF):**

$$g(a) = c \quad \wedge \quad (f(g(a)) \neq f(c) \vee g(a) = d) \quad \wedge \quad c \neq d$$

- **(Integer/Real) Difference Logic:**

$$(x - y \leq 1 \vee y - z \leq 0) \quad \wedge \quad x - z < 0$$

- **Linear (Integer/Real) Arithmetic:**

$$(x + y \leq 1 \wedge y - 2z \geq 0) \quad \vee \quad x + y + z > 4$$

- **Arrays:** $A = \text{write}(B, a, 4) \wedge (\text{read}(A, b) = 2 \vee A \neq B)$

- ...

- **Combinations:**

$$A = \text{write}(B, a+1, 4) \wedge (\text{read}(A, b+3) = 2 \vee f(a-1) \neq f(b+1))$$

State of the art in SMT: lazy approach . 1

Example: consider EUF and

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Why “lazy”? Theory information used lazily when checking T -consistency of propositional models

State of the art in SMT: lazy approach . 2

Several *optimizations* for enhancing *efficiency*:

- Check T -consistency only of full propositional models



State of the art in SMT: lazy approach . 2

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- ~~Check T consistency only of full propositional models~~
- Check T -consistency of **partial** assignments



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- Given a T -inconsistent assignment M , identify a T -inconsistent **subset** $M_0 \subseteq M$ and add $\neg M_0$ as a clause

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- Boolean engine decides to set which variable to which value

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- Upon a T -inconsistency, **backtrack** to some point where the assignment was still T -consistent
- ~~● Boolean engine decides to set which variable to which value~~
- Let the theory guide the search by looking for **T-consequences**

State of the art in SMT: lazy approach . 3

$$\text{DPLL}(\mathbf{T}) = \text{DPLL}(\mathbf{X}) \text{ engine} + \mathbf{T}\text{-Solver}$$

where T -Solver has the following functionalities:

- Determine the T -consistency of a set of literals M
- If M is T -inconsistent, identify a (small) subset $M_0 \subseteq M$ also T -inconsistent [smallest, irredundant]
- **Incrementality**: if M is augmented with l , checking T -consistency of $M l$ must be faster than reprocessing the whole sequence from scratch
- **Backtrack**: due to DPLL(X) backtrack, solver must support it
- **Theory propagation**: determine input T -consequences of M
- If $M \models_T l$, identify a (small) explanation $M_0 \subseteq M$ such that also $M_0 \models_T l$ [smallest, irredundant]. Needed for backjump.

Research interests: SAT/SMT solvers

- **Barcelogic** is our SMT solver: see results in SMT-COMP'05...'09
- DPLL(X) **engine** is a state-of-the-art competitive SAT solver: see **3rd** place in SAT-RACE'08 (**1st** place for UNSAT instances)
- Theory solvers for:
 - EUF
 - (Integer/Real) Difference Logic
 - Linear (Integer/Real) Arithmetic
 - Arrays and combinations
 - **Non-linear Integer Arithmetic**
- **1st place** in Non-linear Integer Arithmetic in SMT-COMP'09
- **DEVELOPMENT OF EFFICIENT SAT/SMT SOLVERS**



Research interests: bitvectors

- Theory of fixed-size bitvectors:
 $(x \# y)[31 : 16] = (z \# z)[15 : 0] \quad \wedge \quad (x+1 = y \ll 2 \quad \vee \quad x = y \& z)$
- Important applications in verification
 - Hardware
 - Software: device drivers, ...
- Can be reduced to **modular arithmetic**
 - + behaves well with arithmetic
 - performs poorly if stream/bitwise part is significant
- Current state-of-the-art tools **bit-blast** and reduce to SAT: complementary situation
- **DESIGN OF THEORY SOLVER TAKING BEST OF BOTH**

Research interests: optimization

- We focus on SAT and SMT problems where models M are sought such that a given **cost function** $f(M)$ is **minimized**
- Applications:
 - Min/Max-Ones
 - Max-SAT
- Max-SAT particularly interesting:
 - **INPUT:** set of pairs $\{(C_1, w_1), \dots, (C_m, w_m)\}$ where each pair is a clause C_i with its weight w_i .
 - **OUTPUT:** model M that minimizes the sum of the weights of the clauses false in M
- **DESIGN OF AN EFFICIENT SAT/SMT OPTIMIZER**

Thank you!

