# What have I learned about SAT? or Tales of an NP-complete but useful problem

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- Modern SAT
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  - Simplification and Rewriting
- SAT with proofs
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- Why?

## **CSAT**

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The Circuit Satisfiability problem CSAT is: given a directed acyclic circuit (with, say, and/or/not gates), with one output, does there exist a combination of inputs which cause it to output high?

If you believe that all problems in **NP** can be checked by a circuit connected in a clocked cycle to registers, then **CSAT** is **NP**-complete.

## SAT

**SAT** (also called CNF-SAT) specialises **CSAT** to problems in **CNF**: conjunctive normal form or clausal normal form.

The ciruit is a collection of clauses that are all true (conjoined), and each of which is a disjunction of (possibly negated) variables.

E.g.  $x_1 \lor x_2 \lor \neg x_3$ ,  $x_2 \lor \neg x_4$ ,  $x_3 \lor x_4$ .

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The DPLL algorithm (Davis, Putnam, Logemann, Loveland) is a complete algorithm for deciding satisfiability. It's based on branching and backtracking when necessary.

(time for an aside)

## **DPLL**

In case you didn't get it, the DPLL algorithm:

- Propagate obvious information:

  - $x_1 + (x_1 \lor x_4) \Rightarrow$  nothing.
  - ▶ This is called **unit propagation**.
- If you run out of clauses, the unit clauses you have are a satisfying assignment sat.
- If you learn the empty clause (from  $x_1, \neg x_1$ ), the problem is unsatisfiable **unsat**.
- If you can't propagate, pick a variable and consider both cases  $x_1, \neg x_1$ .
  - If sat found on branch, done.
  - If unsat on branch, backtrack to other case.
  - If unsat on both branches, unsat.



# What's the big deal about SAT?

Why is SAT a big deal?

- can encode a lot of interesting problems.
- can solve huge problems.

After the discovery of the **CDCL** approach in the 90s, realistic problem sizes shot up from thousands to millions of variables.

That's big enough to reason about CPUs.

## **CDCL**

Conflict driven clause learning improves on backtracking in DPLL. The trick is:

- Remember why you know everything.
  - starting clauses.
  - branching choices  $x_1$  or  $\neg x_1$ .
  - derived clauses (unit propagation).
- If we learn the empty clause, look at its parents.
  - choices were  $x_1, \neg x_2, x_{12}$ .
  - ▶ learn new conflict clause  $\neg x_1 \lor x_2 \lor \neg x_{12}$ .

This optimisation hugely decreases the cost of backtracking.

#### Modern SAT

What I've managed to learn about the state of the art:

- **Competitions**: the SAT competition has dozens of entrants in any given year, and the pace of progress is impressive.
- **Fast propagation**: modern SAT solvers are built on fancy clause propagation implementations.
- Locality: solvers try to make decisions 'near' previous decisions.
- **Phases**: solvers alternate between sat-focused and unsat-focused phases. Phase-saving and rapid restarts are apparently important.
- **Pruning**: clause propagation time grows with the clause database. Pruning the database speeds things up.
- **Glue**: pruning to "glue" clauses, which have a linear blocks distance of 2, works well. Whatever that means.
- **Rewriting**: preprocessing the problem into an equisatisfiable problem. Valuable especially as a first step.

WARNING: this may be wildly inaccurate.



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The SAT competition comes with a proofs category. Solvers augment unsat judgements with some kind of guidance for a checker.

Some solvers produce full resolution proofs.

The RUP format (reverse unit propagation) of a proof is a series of clauses that can be learned by unit propagation only. The conflict clauses of a CDCL solver in the order they are learned form a RUP proof.

The DRUP format adds clause deletion, to speed up unit propagation.

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What if we put more steps between the checker and solver?

# Why

Why have I subjected you all to this rambling?

I have some SMT proofs I'd dearly like to replay in Isabelle/HOL or HOL4. This can be thought of as a generalisation of replaying SAT with rewriting only:

- the rewriting step is bigger and more complicated.
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That is all.