

Verifying the DPLL Algorithm in Dafny

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Timișoara

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Outline

The Propositional Satisfiability Problem

The DPLL and CDCL Algorithms

The Dafny System

Implementing DPLL in Dafny

Conclusion

The SAT Problem

Input: a propositional formula ϕ (usually in CNF)

Output: is ϕ satisfiable? (+ witness)

Example input: $\phi = (x_1 \vee x_2 \vee x_3) \wedge (\neg x_3 \vee \neg x_2) \wedge (\neg x_1 \vee \neg x_3)$

Output: yes ($x_1 = 1, x_3 = 0, x_2 = ?$)

The SAT Problem

- ▶ canonical NP-complete problem;
- ▶ used in software and hardware verification:
 - ▶ bounded model checking,
 - ▶ functional equivalence,
 - ▶ SMT solving,
 - ▶ many others;
- ▶ combinatorial optimization, encoding of other (NP-complete) problems.

Relatively recently: very fast SAT solvers capable of solving in reasonable time instances with millions of variables/clauses.

Also: yearly SAT competition with many competitors and several tracks.

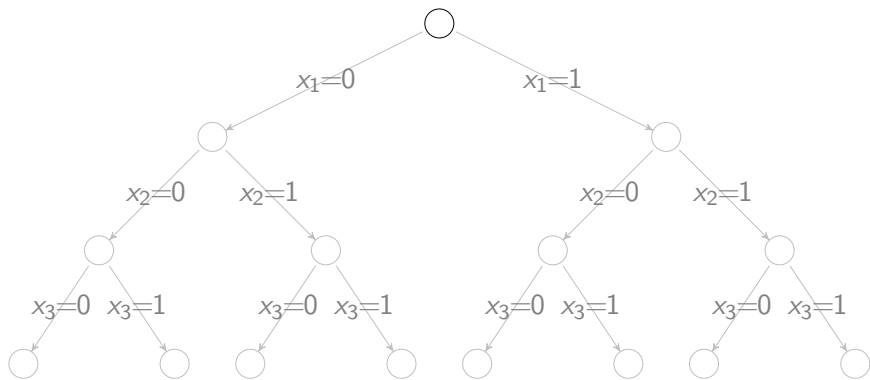
Fact: All state-of-the-art SAT solvers are based on CDCL (which is itself a refinement of DPLL, which is a refinement of backtracking).

$x_1 = ?$

$x_2 = ?$

$x_3 = ?$

$$(x_1 \vee x_2 \vee x_3) \wedge (x_3 \vee \neg x_2) \wedge (x_1 \vee \neg x_3)$$

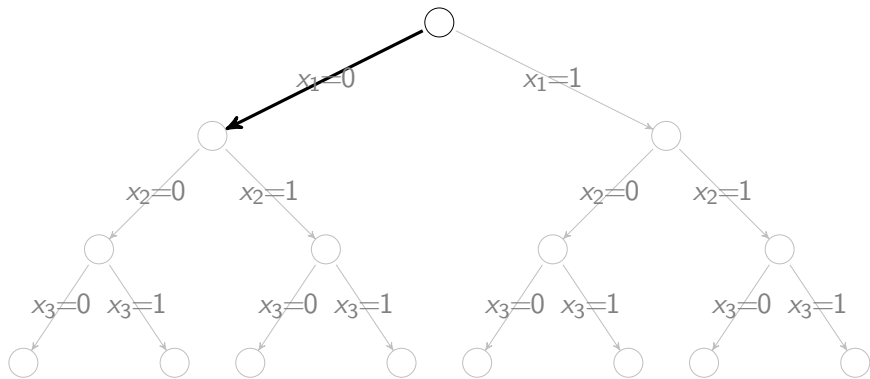


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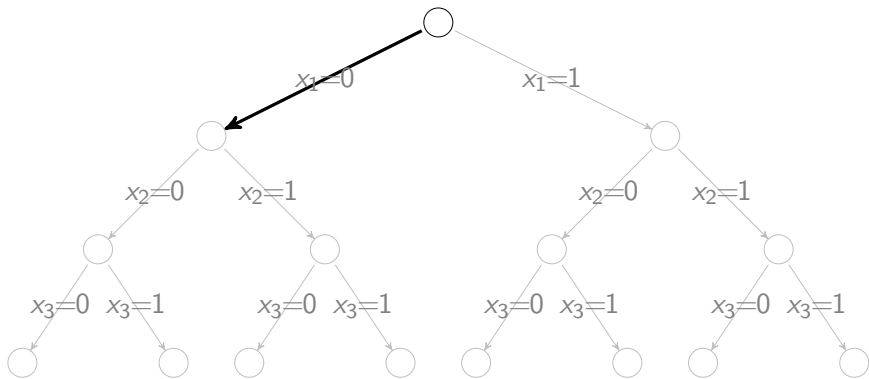


$x_1 = 0$

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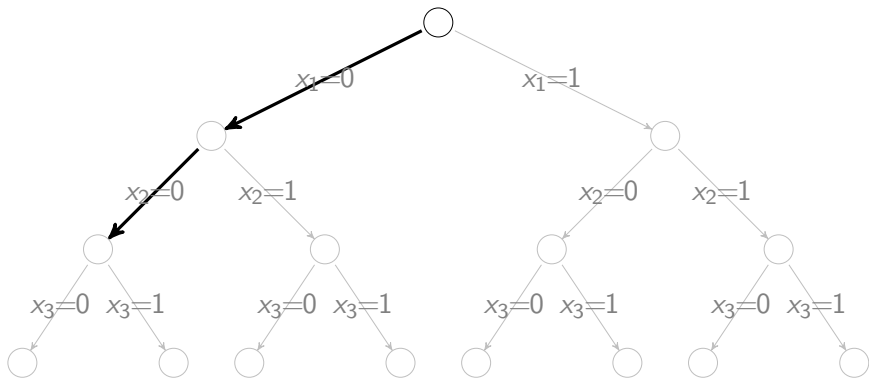


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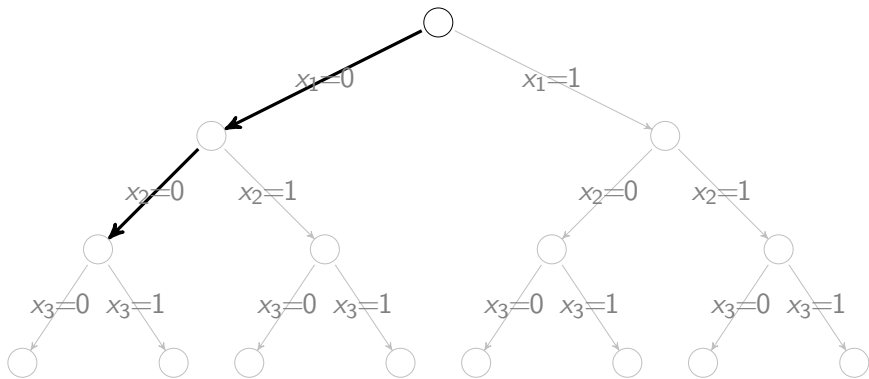


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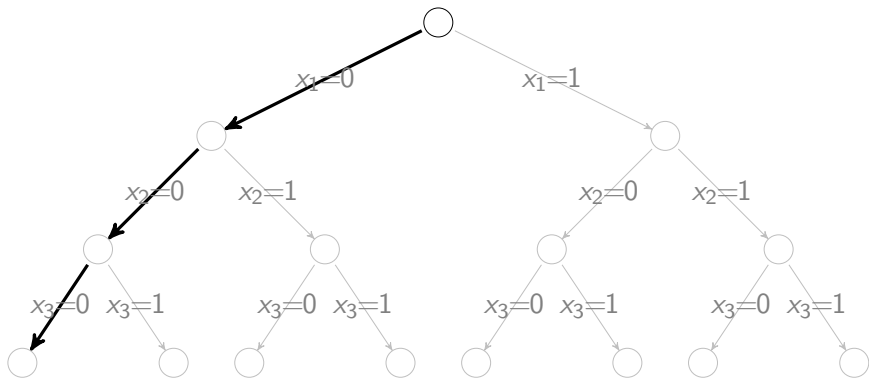


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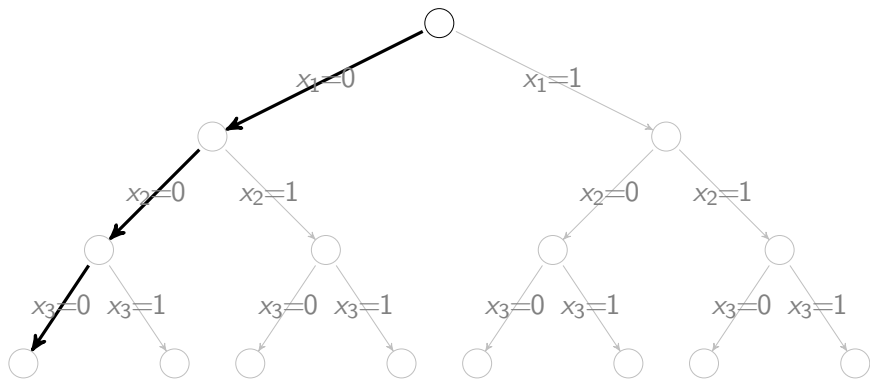


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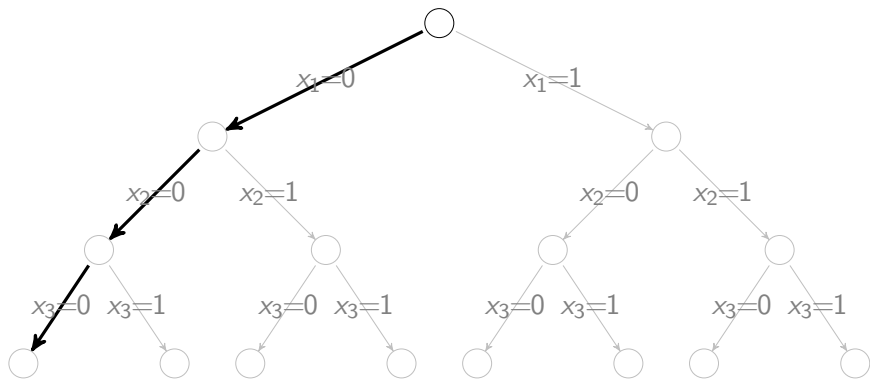
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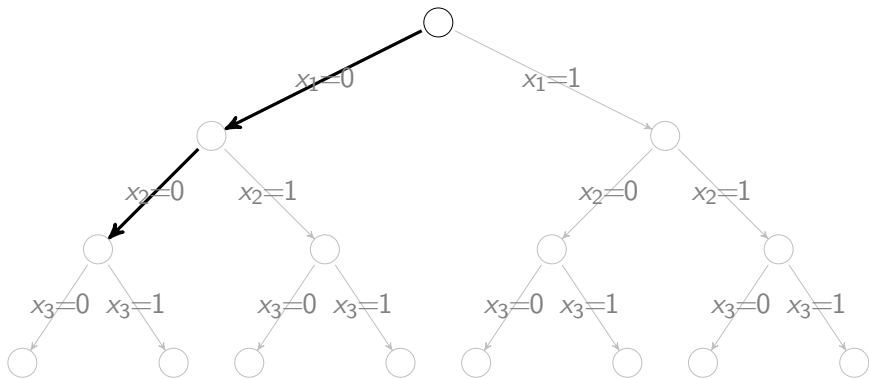


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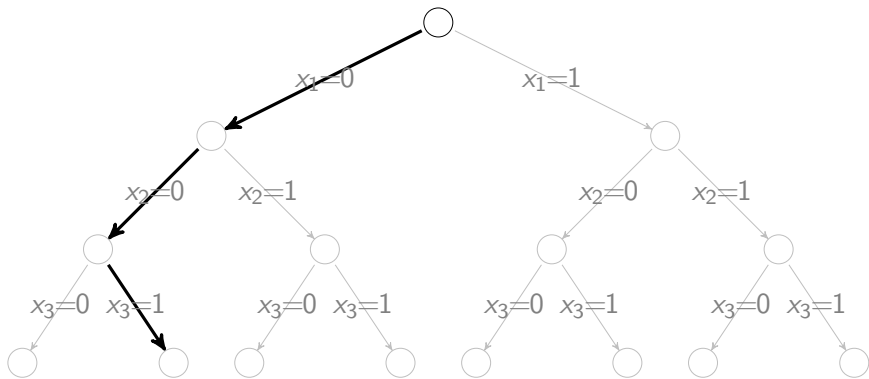


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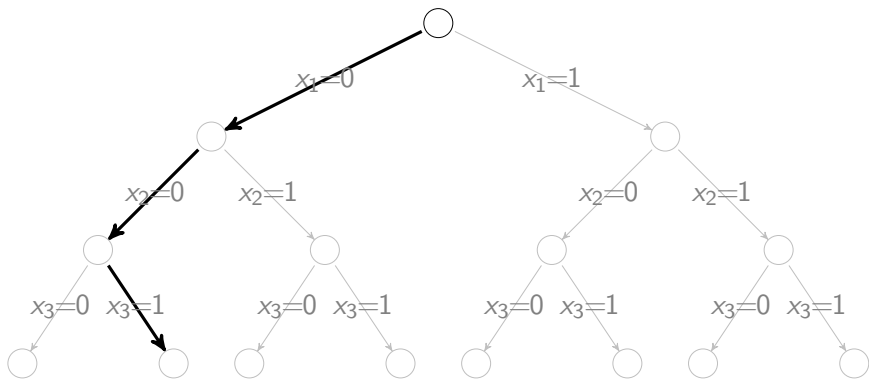


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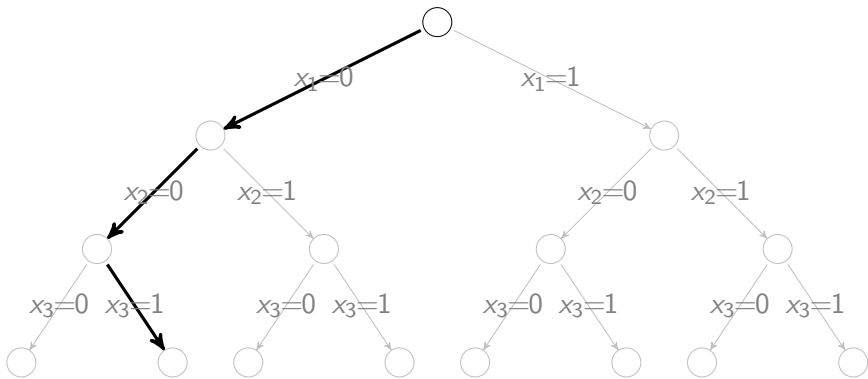
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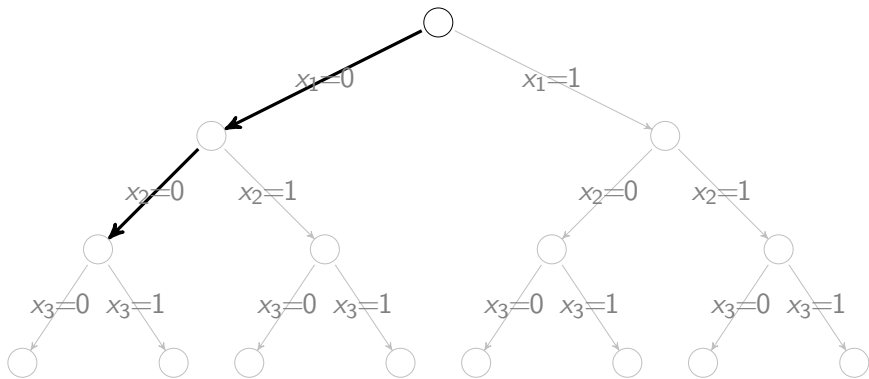


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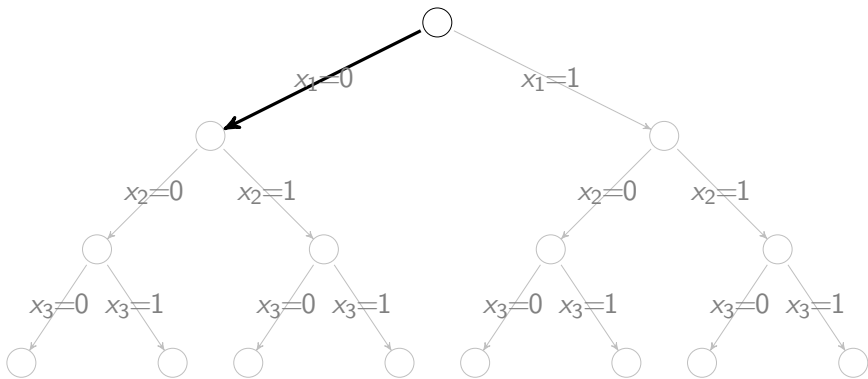


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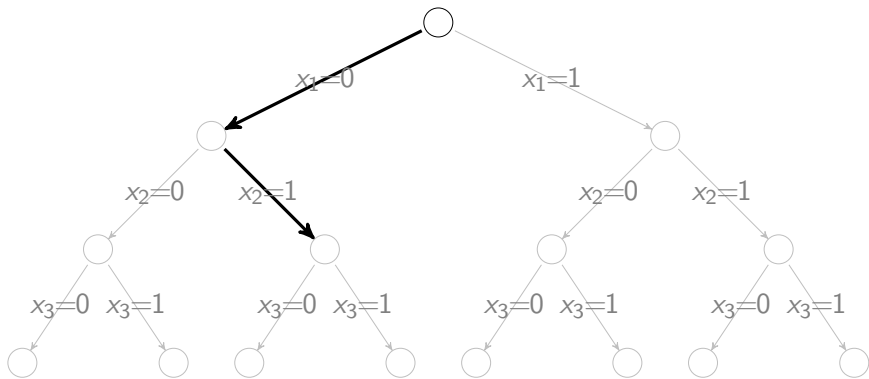


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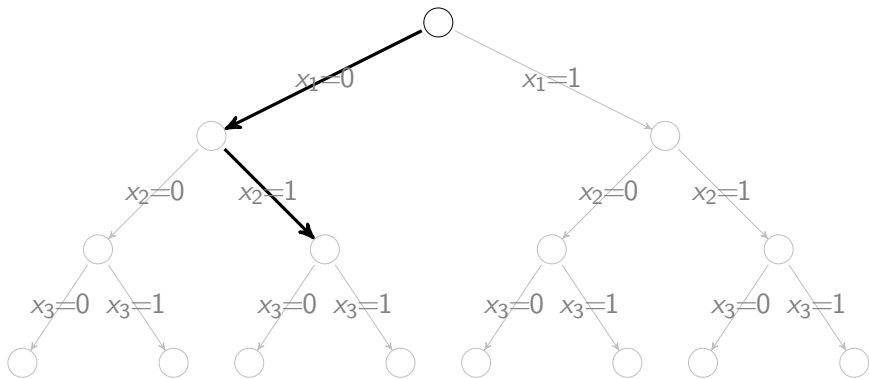


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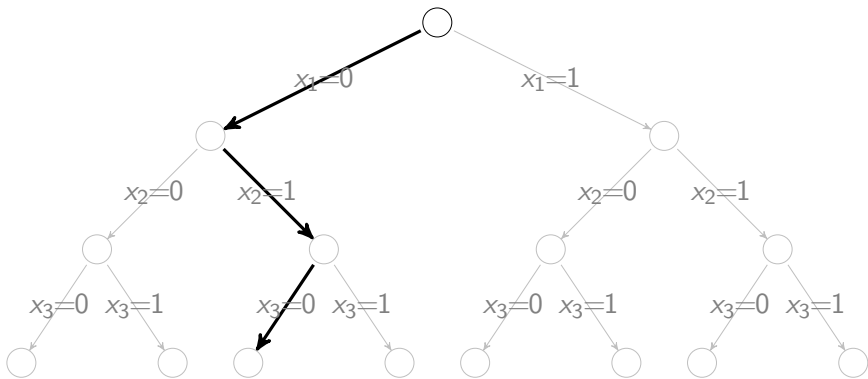


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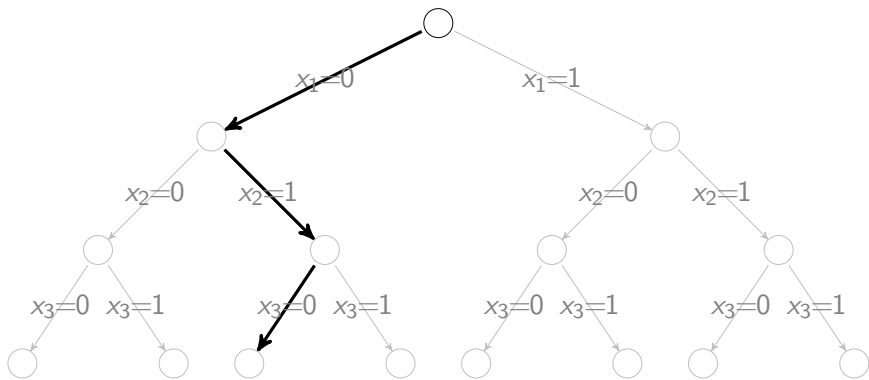


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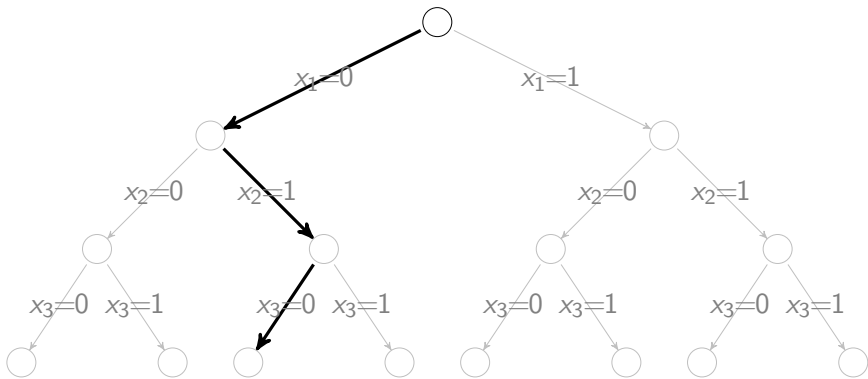
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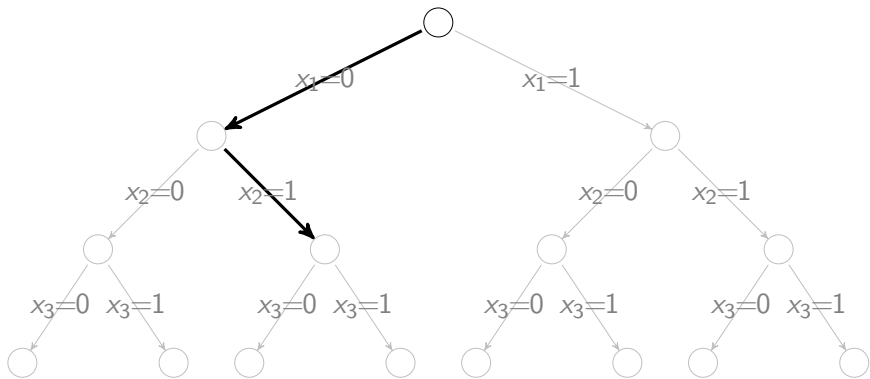


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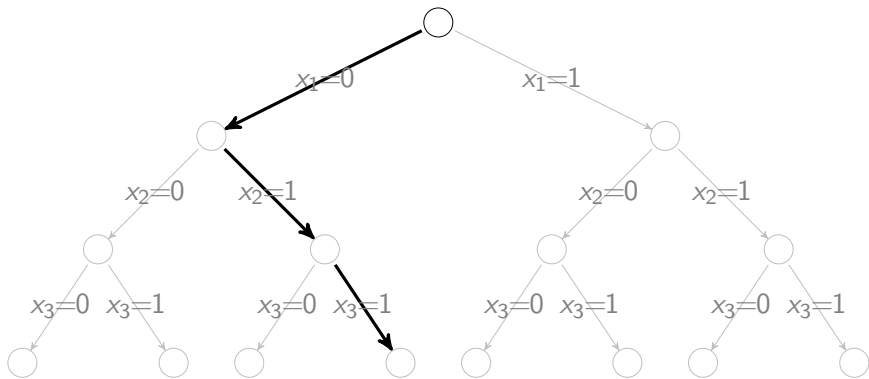


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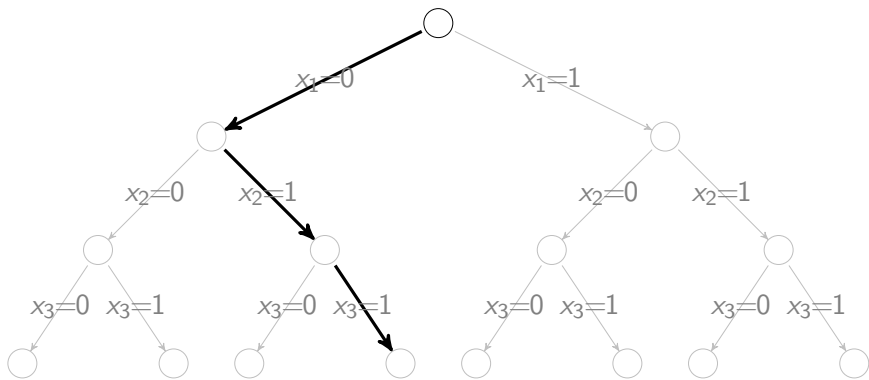


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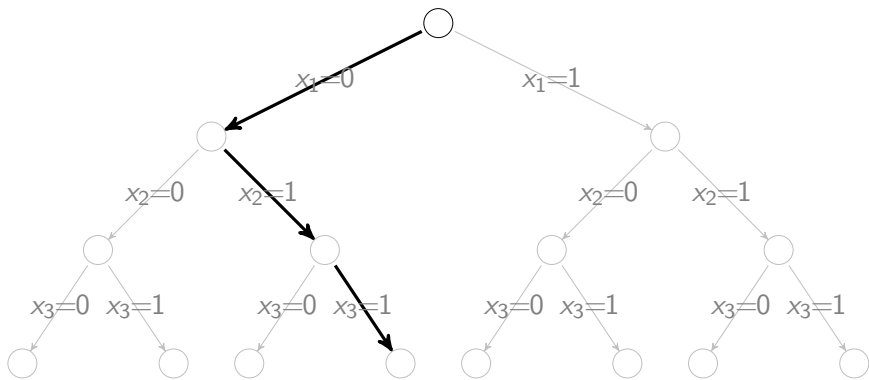
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X

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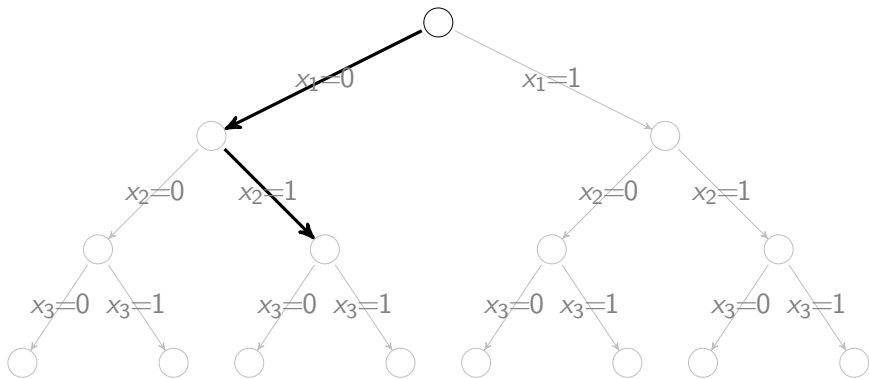


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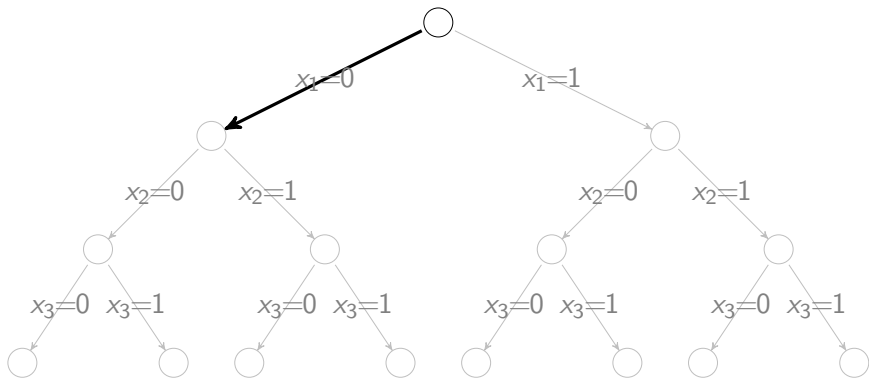


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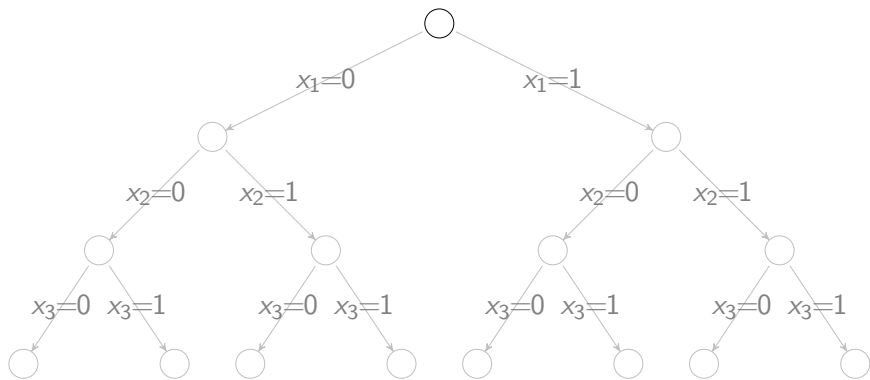


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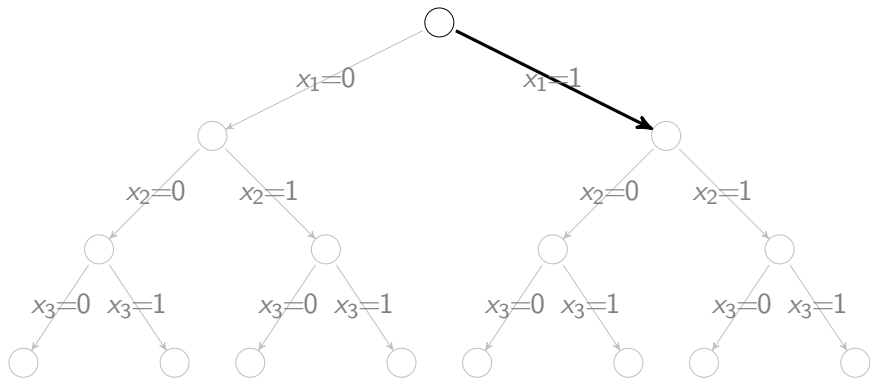


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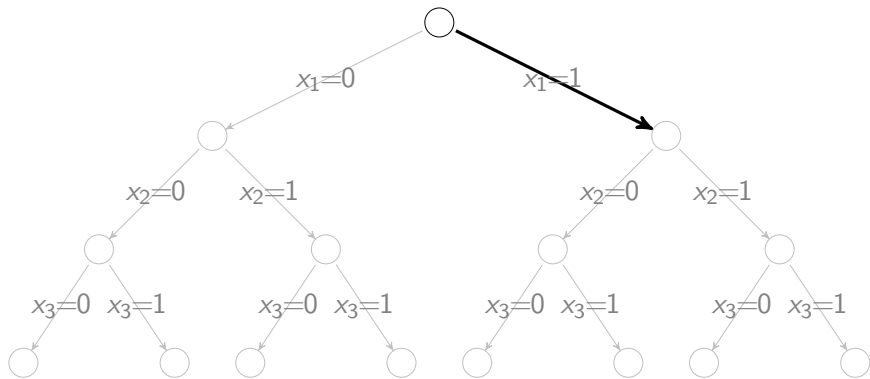


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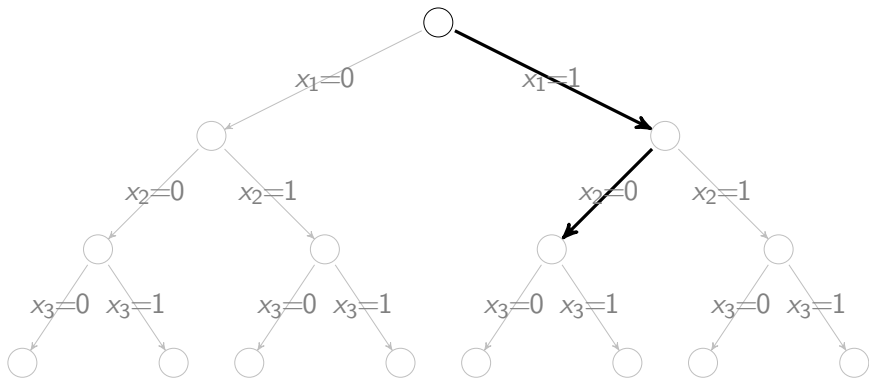


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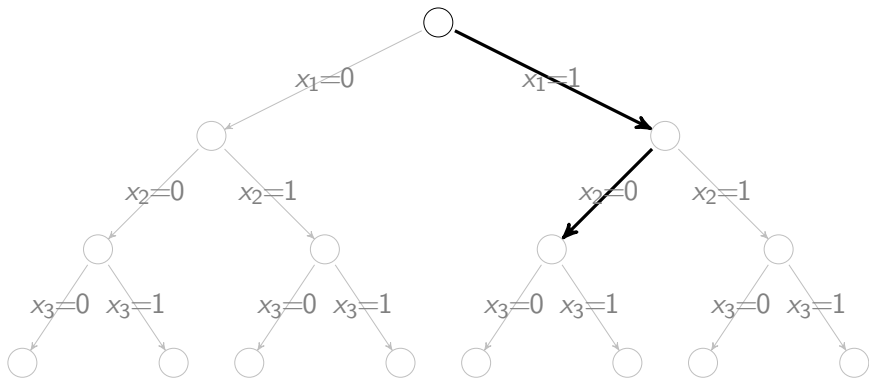


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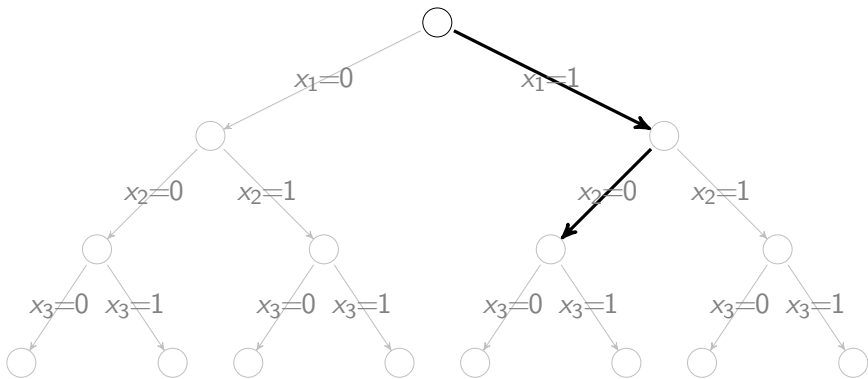


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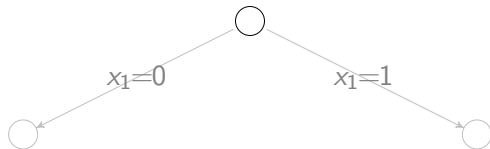
DPLL \simeq backtracking + unit propagation

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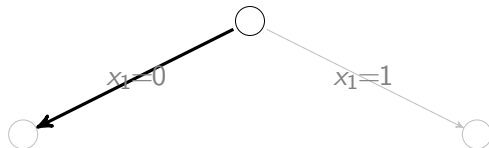
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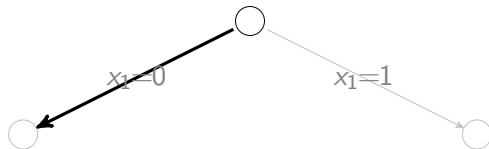
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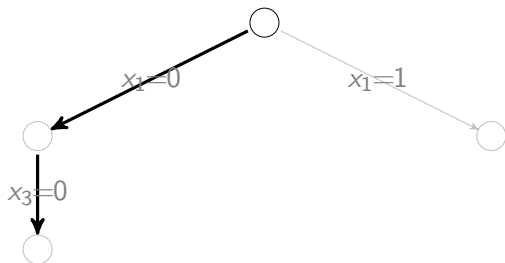
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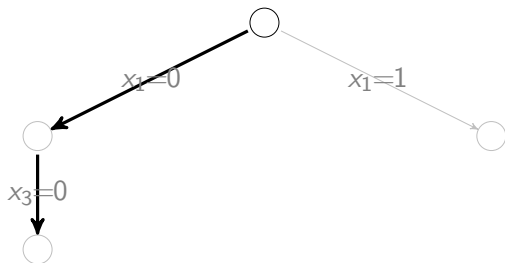
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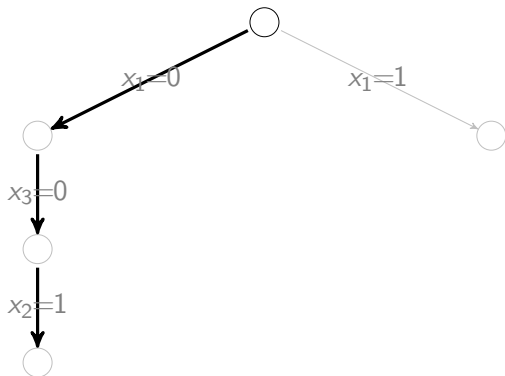
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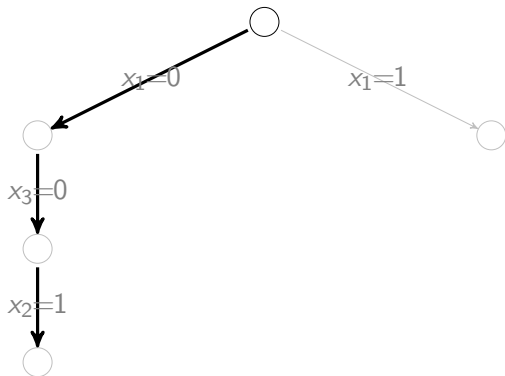
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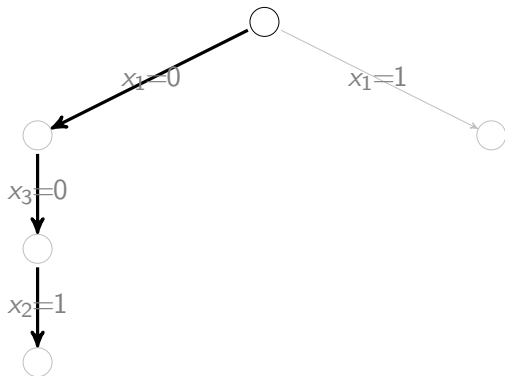
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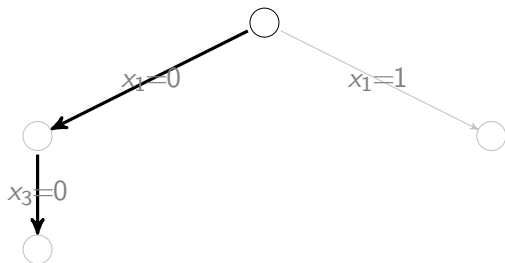
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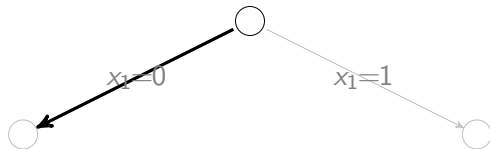
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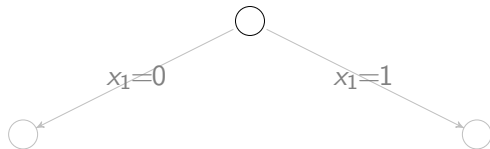
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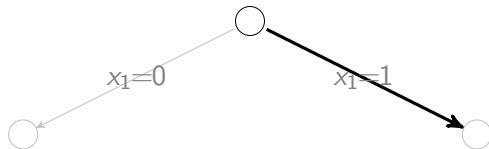
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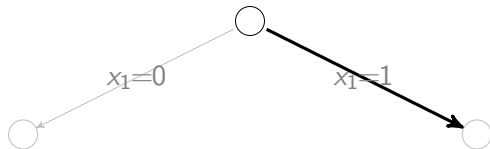
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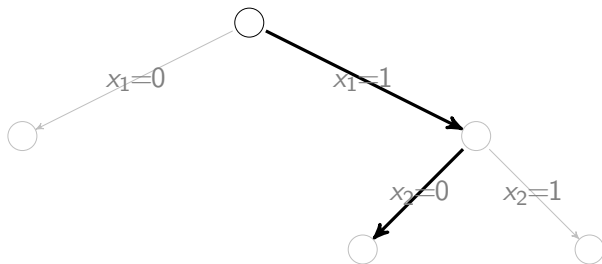
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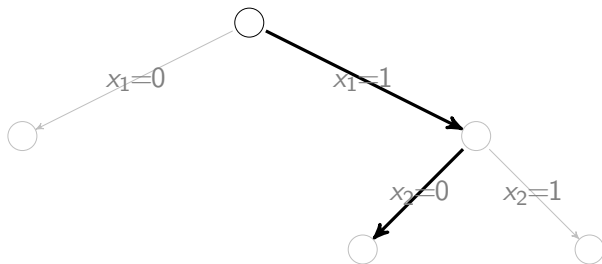
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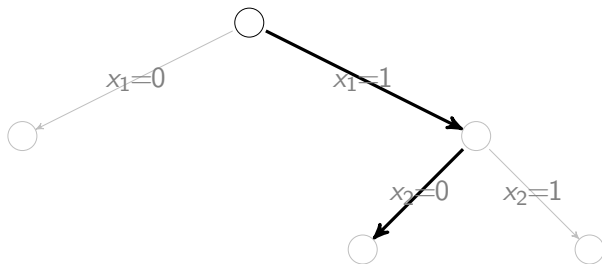
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DPLL \simeq backtracking + unit propagation

- ▶ Key implementation issue: fast data structures to identify conflicts/unit clauses;
 - ▶ for each variable: in which clauses does it appear
 - ▶ positively;
 - ▶ negatively;
 - ▶ for each clause: how many
 - ▶ true literals;
 - ▶ false literals;
 - ▶ history of decision literals (together with unit propagations);
- ▶ Make sure updates preserve invariants.

CDCL = DPLL +

- ▶ variable ordering;
- ▶ backjumping;
- ▶ clause learning (and forgetting);
 - ▶ high-performance solvers use even trickier data structures (two-watched literals);
- ▶ random restarts.

Key takeaway: the data structures are complicated. Even DPLL can be tricky to get right!

Possible Issues

- ▶ SAT solvers go wrong!
 - ▶ See Brummayer et al. (SAT 2010).
 - ▶ MiniSAT has > 5.000 lines of C++ code.
- ▶ The SAT Competition now requires UNSAT certificates;
 - ▶ exponential in the worst case.
- ▶ Is there a better way to ensure a higher degree of confidence?

Idea: develop an efficient, provably correct SAT solver.

Dafny

- ▶ An object-oriented programming language;
- ▶ Developed by Microsoft Research;
- ▶ Code can be annotated with preconditions, postconditions and loop invariants;
- ▶ Code will fail to compile unless postconditions are provable;
- ▶ Uses Boogie and Z3 in the backend;
- ▶ Can emit C# code.

Dafny

```
method binarySearch(a: array<int>, key : int) returns (r : int)
  requires  $\forall j, k \bullet 0 \leq j < k < a.Length \implies a[j] \leq a[k]$ ;
  ensures  $r \geq 0 \implies 0 \leq r < a.Length \wedge a[r] = key$ ;
  ensures  $r < 0 \implies \forall k \bullet 0 \leq k < a.Length - 1 \implies a[k] \neq key$ ;
{
  var left : int := 0;
  var right : int := a.Length - 1;
  while (left  $\leq$  right)
    invariant  $0 \leq left \leq a.Length$ ;
    invariant  $-1 \leq right < a.Length$ ;
    invariant  $\forall k \bullet 0 \leq k < left \implies a[k] < key$ ;
    invariant  $\forall k \bullet right < k < a.Length \implies a[k] > key$ ;
  {
    var mid : int := (left + right) / 2;
    if (key < a[mid]) {
      right := mid - 1;
    } else if (key > a[mid]) {
      left := mid + 1;
    } else {
      return mid;
    }
  }
}
return -1;
}
```


Dafny

```
method binarySearch(a: array<int>, key : int) returns (r : int)
  requires  $\forall j \bullet 0 \leq j < a.Length - 1 \implies a[j] \leq a[j + 1]$ ;
  ensures  $r \geq 0 \implies 0 \leq r < a.Length \wedge a[r] = key$ ;
  ensures  $r < 0 \implies \forall k \bullet 0 \leq k < a.Length - 1 \implies a[k] \neq key$ ;
{
  var left : int := 0;
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  while (left  $\leq$  right)
    invariant  $0 \leq left \leq a.Length$ ;
    invariant  $-1 \leq right < a.Length$ ;
    invariant  $\forall k \bullet 0 \leq k < left \implies a[k] < key$ ;
    invariant  $\forall k \bullet right < k < a.Length \implies a[k] > key$ ;
  {
    var mid : int := (left + right) / 2;
    if (key < a[mid]) {
      right := mid - 1;
    } else if (key > a[mid]) {
      left := mid + 1;
    } else {
      return mid;
    }
  }
}
return -1;
}
```

Dafny

```
lemma plusOne(a : array<int>)
  requires  $\forall j \bullet 0 \leq j < a.Length - 1 \implies a[j] \leq a[j + 1]$ ;
  ensures  $\forall j, k \bullet 0 \leq j < k < a.Length \implies a[j] \leq a[k]$ ;
{
   $\forall j$ 
  |  $0 \leq j < a.Length$ 
  ensures  $\forall k \bullet j < k < a.Length \implies a[j] \leq a[k]$ ;
  {
    var kp := j + 1;
    while (kp < a.Length)
      invariant j < kp  $\leq$  a.Length;
      invariant  $\forall kpp \bullet j < kpp < kp \implies a[j] \leq a[kpp]$ ;
      {
        assert a[j]  $\leq$  a[kp - 1];
        kp := kp + 1;
      }
    }
}

method binarySearch(a: array<int>, key : int) returns (r : int)
  requires  $\forall j \bullet 0 \leq j < a.Length - 1 \implies a[j] \leq a[j + 1]$ ;
  ensures  $r \geq 0 \implies 0 \leq r < a.Length \wedge a[r] = key$ ;
  ensures  $r < 0 \implies \forall k \bullet 0 \leq k < a.Length - 1 \implies a[k] \neq key$ ;
{
  plusOne(a);
  var left : int := 0;
```

DPLL in Dafny

- ▶ Around 3.200 lines of Dafny code (has gotten shorter), 22 methods, 29 helper lemmas, 324 preconditions, 149 postconditions, 136 invariants, 38 *reads* annotations;
- ▶ Organized as five files:
 - ▶ `data_structures.dfy` - Core data structures;
 - ▶ `stack.dfy` - History of decision points;
 - ▶ `formula.dfy` - Init data structures, create decision points;
 - ▶ `solver.dfy` - Entry point;
 - ▶ `utils.dfy` - Various helper functions.

Function / Method / Lemma	Verification Time (s)
Formula.setLiteral(ℓ , $value$)	630.59
SATSolver.solve()	332.01
Formula.setVariable(v , $value$)	294.54
Formula.undoLayerOnStack()	249.16
SATSolver.step()	233.25
Formula.constructor(vC , $clauses$)	91.14
Others	< 3

What We Prove

```
datatype SAT_UNSAT = SAT(tau:seq<int>) | UNSAT
...
method solve() returns (result : SAT_UNSAT)
    requires formula.valid();
...
ensures result.SAT?  $\implies$ 
    formula.isSatisfiableExtend(formula.truthAssignment[..]);
ensures result.UNSAT?  $\implies$ 
     $\neg$ formula.isSatisfiableExtend(formula.truthAssignment[..]);
...
{
...
}
```

Core Data Structures

```
trait DataStructures {  
  var variablesCount : int;  
  var clauses : seq<seq<int> >;  
  
  var stack : Stack;  
  var truthAssignment : array<int>; // from 0 to variablesCount - 1,  
  
  var trueLiteralsCount : array<int>; // from 0 to |clauses| - 1  
  var falseLiteralsCount : array<int>; // from 0 to |clauses| - 1  
  
  var positiveLiteralsToClauses : array<seq<int> >; // from 0 to variablesCount - 1  
  var negativeLiteralsToClauses : array<seq<int> >; // from 0 to variablesCount - 1  
  ...  
}
```

Core Data Structures Invariant

```
trait DataStructures {
...
  predicate validNegativeLiteralsToClause(variable : int, s :
seq<int>)
    reads this; requires validVariablesCount();
    requires validClauses(); requires  $0 \leq \text{variable} < \text{variablesCount}$ ;
    {
      SeqPredicates.valuesBoundedBy(s, 0, |clauses|)  $\wedge$ 
      SeqPredicates.orderedAsc(s)  $\wedge$ 
      ( $\forall$  clauseIndex • clauseIndex in s  $\implies$   $-\text{variable}-1$  in clauses[clauseIndex])  $\wedge$ 
      ( $\forall$  clauseIndex •  $0 \leq \text{clauseIndex} < |\text{clauses}| \wedge \text{clauseIndex} \notin \text{s} \implies -\text{variable}-1 \notin \text{clauses}[\text{clauseIndex}]$ )
    }
...
  predicate valid()
    reads this, stack, stack.stack, truthAssignment, trueLiteralsCount, falseLiteralsCount, positiveLiteralsToClauses, negativeLiteralsToClauses;
    {
      validReferences()  $\wedge$  validVariablesCount()  $\wedge$ 
      validClauses()  $\wedge$  validStack()  $\wedge$  validTruthAssignment()  $\wedge$ 
      validTrueLiteralsCount(truthAssignment[..])  $\wedge$ 
      validFalseLiteralsCount(truthAssignment[..])  $\wedge$ 
      validPositiveLiteralsToClauses()  $\wedge$ 
      validNegativeLiteralsToClauses()
    }
}
```

Main Unit Propagation Method

```
method setLiteral(literal : int, value : bool)
  requires valid();
...
  ensures (
    ghost var tau := old(truthAssignment[..]);
    ghost var (variable, val) := convertLVtoVI(literal, value);
    ghost var tau' := tau[variable := val];

    isSatisfiableExtend(tau')  $\iff$ 
      isSatisfiableExtend(truthAssignment[..])
  );
...
  {
...
  while (k < |negativelyImpactedClauses|)
...
  {
...
    if (trueLiteralsCount[clauseIndex] = 0  $\wedge$ 
        falseLiteralsCount[clauseIndex] + 1 = |clauses[clauseIndex]|)
...
      setLiteral(literal, true);
...
    k := k + 1;
  }
...
}
```

Final Remarks

- ▶ Written by the first author in the course of one year (working part-time; also learned Dafny during this time).
- ▶ Some issues found (and fixed) during verification for edge cases (e.g., when the same literal occurs twice in a clause).
- ▶ Guarantees:
 - ▶ Soundness,
 - ▶ Completeness and
 - ▶ Termination.
- ▶ Performance:

Test (vars, clauses)	Our solver	MiniSat
Hole6 (42, 133)	UNSAT / 3.21s	UNSAT / 0.02s
Zebra (155, 1135)	SAT / 1.09s	SAT / 0.00s
Hanoi4 (718, 4934)	timed out	SAT / 0.03s
Queens16 (256, 6336)	SAT / 4.64s	SAT / 0.00s

Conclusion and Future Work

- ▶ It is possible to validate a SAT solver using the Dafny system;
- ▶ The resulting code is (currently) far from efficient, but there is good hope..
- ▶ Large verification time is the main issue and difficulty:
 - ▶ Split large functions into smaller functions;
 - ▶ Verify only a single function/lemma at a time;
 - ▶ Imperative features
 - ▶ make verification annoying and time consuming: e.g., must convince Dafny that certain data structures do not change;
 - ▶ make the solver **fast**;
- ▶ Future work:
 - ▶ improve verification and runtime performance;
 - ▶ implement CDCL;
 - ▶ apply know-how to C code (e.g., with Frama-C).

Thank you!