## **LEARNSAT**

#### User's Guide

#### Version 1.0.0

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## 1 Introduction

LEARNSAT is a program for learning about SAT solving. It implements the classic *Davis-Putnam-Logemann-Loveland (DPLL)* algorithm for SAT solving, together will modern extensions of the algorithm: *conflict-driven clause learning (CDCL)* and *non-chronological backtracking (NCB)*.

For a gentle introduction to SAT solvers, see [1, Chapter 6]. The comprehensive reference is the *Handbook of Satisfiability* [2]. The algorithms and notation of LEARNSAT follow [4].

The design of LEARNSAT is based on the following principles:

- A very detailed trace of the algorithm's execution can be displayed and the specific content of the trace can be set by the user.
- The PROLOG language is used so that the programs will be very concise and easy to understand. The source code includes extensive comments. Very little knowledge of PROLOG is needed just to run the program.
- The distribution includes test programs, including those taken from published descriptions of the algorithms.
- A utility is provided for converting between sets of clauses represented as PROLOG terms and those in DIMACS format. While the former are easier to read, existing examples in DIMACS format can be downloaded and converted.
- LEARNSAT is an open-source project.

# 2 Downloading

LEARNSAT can be downloaded from Google Code at:1

Download the zip archive learnsat-N.zip which has all the files in a single directory.

The programs were developed using SWI-PROLOG Version 6.0.0:

The source files use the extension pro instead of the more usual pl to avoid conflict with programs in Perl. During the installation of SWI-PROLOG, if you associate the extension pro with SWI-PROLOG, a program can be launched by double-clicking on its name in a file list.

<sup>&</sup>lt;sup>1</sup>This project contains an archive of PROLOG programs for the algorithms in my textbook *Mathematical Logic for Computer Science (Third Edition)* [1].

## 3 Running LEARNSAT

#### 3.1 Preparing a file to check satisfiability

To use LEARNSAT, prepare a PROLOG program that calls the predicate dpll with a set of clauses structured as a list of lists of literals. Here is an extract from the file pigeon.pro; it expresses the pigeon-hole problem for two holes and three pigeons, where pij means that pigeon i is in hole j:

```
:- ensure_loaded([negation,display,dpll]).
hole2 :-
dpll(
[
[p11, p12], [p21, p22], [p31, p32], % Each pigeon in hole 1 or 2
[~p11, ~p21], [~p11, ~p31], [~p21, ~p31], % No pair in hole 1
[~p12, ~p22], [~p12, ~p32], [~p22, ~p32], % No pair in hole 2
], _).
```

The first line requests that the modules of LEARNSAT be loaded; then, a predicate hole2 is defined. It calls dpll with the set of clauses. The result can be returned as the second argument, but we have left it anonymous since we are interested in the display of the execution trace.

## 3.2 Loading and running a file

Once this file has been loaded (by double-clicking or by entering [pigeon] at the PROLOG prompt), the predicate hole2 can be run. The output will be a trace of the DPLL algorithm:

```
1 ?- hole2.

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Decision assignment: p11=0@1

Propagate unit p12 derived from: 1. [p11,p12]

Propagate unit ~p22 derived from: 7. [~p12,~p22]

Propagate unit p21 derived from: 2. [p21,p22]

Propagate unit ~p31 derived from: 6. [~p21,~p31]

Propagate unit p32 derived from: 3. [p31,p32]

Conflict clause: 8. [~p12,~p32]

Decision assignment: p11=1@1

...

Unsatisfiable

Clauses=9, variables=6, units propagated=56, choices=12, conflicts=12

true.
```

All PROLOG queries must be terminated by a period and after the execution terminates with true you must press return to get a new prompt.

The trace output can be directed to a file:

```
hole2_file :- tell('hole2.txt'), hole2, told.
```

#### 3.3 Algorithmic mode

LEARNSAT can run in three modes:

- dpl1: DPLL algorithm (this is the default);
- cdc1: DPLL with conflict-directed clause learning;
- ncb: DPLL with CDCL and non-chronological backtracking.

Set the mode as follows:

```
?- set_mode(ncb).
```

The pigeon-hole program runs much more efficiently in cdcl mode:

```
Clauses=9, variables=6, units propagated=29, choices=12, conflicts=12
```

#### 3.4 Display options

You can control the content of the trace output of LEARNSAT with the predicates set\_display and clear\_display. The argument to these predicates can be all, default or a single option or a list of options taken from table in the Appendix.

#### 3.5 Online help

The predicate usage shows the commands, and the mode and display arguments.

The version, the default and current mode, and the default and current display options can be shown by running show\_config.

#### 3.6 Changing the defaults

If you need to change the mode and options frequently, you can write a predicate to do so:

```
init :-
  set_display(all),
  clear_display([graph,incremental,dot]),
  set_mode(ncb).
```

Alternatively, the defaults can be changed by editing the following lines in the file config.pro:

```
default_mode(dpl1).
default_display([backtrack, conflict, decision, learned, result, unit]).
```

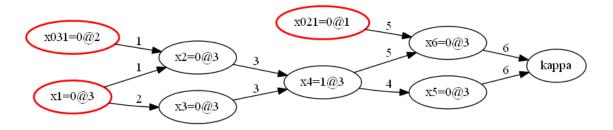


Figure 1: Implication graph

#### 3.7 Implication graphs

LEARNSAT constructs the implication graph when a conflict clause is encountered. The trace output can display a list of the nodes and edges of the final graph, as well as of the graphs that are built during each incremental stage of the construction.

Files with the implication graphs in DOT format can be written by LEARNSAT. The graphs can then be rendered using the DOT tool of GRAPHVIZ (http://www.graphviz.org/):

dot -Tpng examples-graph-0.dot > examples-graph-0.png

Figure 1 shows the graph that was generated from running LEARNSAT on the example from [4]; the clauses for this example are:

- 1.  $[x1,x031,^x2]$
- 2. [x1,~x3]
- 3. [x2,x3,x4]
- 4. [~x4,~x5]
- 5. [x021, "x4, "x6]
- 6. [x5,x6]

#### 3.8 Test programs

Several test program are included in the LEARNSAT archive.

- queens.pro contains the four-queens problem as given in [1, Section 6.4].
- tseitin.pro contains the Tseitin clauses for the graphs  $K_{2,2}$ ,  $K_{3,3}$  and the example from [1, Section 4.5]. The sets of clauses are unsatisfiable, but, for each set of clauses, a satisfiable variant is given; these were obtained by complementing one literal in the set.
- pigeon.pro contains the pigeon-hole problem for two and three holes [1, Exercise 6.4].
- examples.pro contains examples from papers on SAT solvers [3, 4, 5].

#### 3.9 DIMACS transformation

The predicates in the file dimacs.pro convert a set of clauses in PROLOG format (a list of lists of literals) to and from *simplified DIMACS cnf format* that is used by SAT solvers.

- to\_dimacs(File, Comment, Clauses) converts the PROLOG Clauses into DIMACS format and writes them to the File with the Comment.
- from\_dimacs(Predicate, InFile, OutFile) reads InFile in DIMACS format and converts the data into a program written on OutFile. Predicate is the name to be given to the predicate for running dpll:

```
Predicate :- dpll(List, _).
```

The test program dimacs-test.pro transforms the set of clauses for the four-queens problem from PROLOG clauses to DIMACS and back.

#### 4 Software documentation

#### 4.1 Module structure

The LEARNSAT software consists of the following source files:<sup>2</sup>

• negation.pro is a file that declares the negation operator:

```
:- op(610, fy, ^{\sim}).
```

- dpll.pro is the main module for the DPLL algorithms. It is described in more detail below.
- io.pro is a module that writes: (a) assignments in the format p1=0@3 used in [4]; (b) clauses together with their position numbers from the list of clauses input to the program; (c) implication graphs.
- counters.pro is the module that maintains and displays counters for units, choices and conflicts, as well as a counter for adding a number to the file names for implication graphs.
- display.pro is the module that maintains the mode and display options, and writes the data. The main predicate is display/2,3,4, whose first argument is a display option and whose additional arguments supply the data to be displayed. The dummy display option none is used to distinguish between the initial state (no options, so set the default options) and a state where all options have been cleared.
- config.pro is a module that facilitates changing the default options. It consists of just three facts: version, default\_mode and default\_display.

#### 4.2 The DPLL algorithm

The predicate dp11 implements the DPLL algorithm on a set of clauses represented as a list of lists of literals. It always succeeds, returning either a list of satisfying assignments or the empty list if the clauses are unsatisfiable. As part of its initialization, the set of variables in the clauses is obtained from the list.

The predicate dpll invokes dpll1 which is the main recursive predicate for performing the algorithm. If the set of variables is empty, the set of clauses is unsatisfiable. Otherwise, dpll1 tries to perform unit propagation by searching for a unit and then evaluating the set of clauses. When no more units remain, it chooses a decision assignment and evaluates the set of clauses.

The predicate ok\_or\_conflict is called with the result of the evaluation of unit propagation or the choice of an assignment. If the result is not a conflict clause, the variable chosen is deleted and dpll1 is called recursively. If there was a conflict clause, the implication graph is constructed and a learned clause is generated from the graph; then ok\_or\_conflict fails so that backtracking can try a new assignment.

<sup>&</sup>lt;sup>2</sup>The list does not including the test programs and the program for DIMACS conversion discussed above.

#### 4.3 Conflict-directed clause learning

See [4] for a detailed description of CDCL.

An *implication graph* represents the result of unit propagation that causes a conflict. Consider the graph in Figure 1: There are three source nodes, one for each of the decision assignments (to x021, x031, x1) that are sufficient to cause a conflict by unit propagation. The conflict is represented by the sink node kappa and the assignments that were forced by unit propagation are represented by nodes labeled with the assignments. The edges of the graph are labeled with (the numbers of) the clauses that are *antecedents* of each node; these are the unit clauses that forced the assignment labeling that node. There is an edge for each literal in the unit clause (except the one whose assignment is forced) and the sources of these edges are the assignments to those literals. For example, the decision assignments at levels 2 and 3 to x031 and x1 cause clause 1 ([x1, x031, ~x2]) to become a unit clause and force the assignment of 0 to x2.

In LEARNSAT, the implication graph is built incrementally. Whenever a unit clause is found, the predicate get\_graph is called with the unit clause, its number (to label the new edges), the assignment it forces (to create the new target of the edges) and the graph constructed so far. For each literal (except the one implied), a new edge is created and when the list of literals has been traversed, the new node is created. When a conflict is encountered, the kappa node and its incoming edges are added and the graph is passed to compute\_learned\_clause.

The predicate compute\_learned\_clause starts with the conflict clause (the antecedent clause of the kappa node) as the current clause and starts resolving. The second clause for each resolution step is one that clashes with the current clause on a literal that is assigned at the current level by unit propagation. For example, given the conflict clause [x5,x6] from Figure 1, both x5 and x6 were assigned by unit propagation at this level, so we can successively resolve with the antecedent clauses of the assignments [~x4,~x5] and [x021,~x4,~x6]. The resolution terminates when a unique implication point (UIP) is encountered; this is a clause where only one literal is assigned at the current level. This clause is the learned clause and is added to the list that is the argument of the single fact in the database learned. In the example, the learned clause is [x021,~x4].

When a learned clause has been obtained, the backtrack level for non-chronological backtracking is computed. This is the highest level of an assignment in the learned clause except for the current level. The level is stored in a dynamic database backtrack and is used when choosing an assignment to avoid choosing variables at a lower level than the backtrack level. In the example, the highest level is 1 where x021 was assigned.

#### 4.4 Auxiliary predicates

The following simple auxiliary predicates are used:

- evaluate a set of clauses; returns ok or conflict.
- evaluate\_clause returns one of satisfied, unsatisfied, unit, unresolved.
- choose\_assignment and choose\_value return an assignment. Backtracking is used to return subsequent choices.

The only delicate part is the use of the predicate  $Condition \rightarrow Action$  with an internal!, fail to implement non-chronological backtracing; see the comments and Section 4.7 of the SWI-PROLOG Reference Manual.

- is\_assigned checks if a literal is assigned a value; if so, the value of the literal (0 or 1) is returned.
- resolve performs resolution on two clauses.
- literals\_to\_variables takes a list of literals and returns a sorted set of the variables corresponding to the literals.
- to\_variable returns the variable of a literal and to\_complement returns the complement
  of a literal.
- to\_assignment and to\_literal convert to and from a literal and an assignment expressed as a term assign(Variable, Value, Level, Decision), where Level is the level at which the assignment was made and Decision is yes if the assignment was made as a decision and no if the assignment was the result of unit propagation.

#### References

- [1] M. Ben-Ari. *Mathematical Logic for Computer Science (Third Edition)*. Springer, 2012. (forthcoming).
- [2] A. Biere, M. Heule, H. Van Maaren, and T. Walsh, editors. *Handbook of Satisfiability*. Frontiers in Artificial Intelligence and Applications. IOS Press, 2009.
- [3] S. Malik and L. Zhang. Boolean satisfiability from theoretical hardness to practical success. *Commun. ACM*, 52(8):76–82, 2009.
- [4] J. P. Marques-Silva, I. Lynce, and S. Malik. *Conflict-Driven Clause Learning SAT Solvers*, chapter 4, pages 131–153. In Biere et al. [2], 2009.
- [5] J. P. Marques-Silva and K. A. Sakallah. Grasp—a new search algorithm for satisfiability. In *Proceedings of the 1996 IEEE/ACM International Conference on Computer-Aided Design*, ICCAD '96, pages 220–227, 1996.

# A Reference

Predicates	
dpll	Run the DPLL algorithm
usage	Show the predicates, modes and display options
show_config	Show the current mode and display options
set_display	Set display options
clear_display	Clear display options
set_mode	Set the algorithmic mode
to_dimacs	Convert from PROLOG term to DIMACS
from_dimacs	Convert from DIMACS to PROLOG term
Modes	
dpll	DPLL algorithm (default)
cdcl	DPLL with conflict-directed clause learning
ncb	DPLL with CDCL and non-chronological backtracking
Display options	
all	all of the options
default	default options (indicated by *)
assignments	assignments that caused a conflict
backtrack*	level of non-chronological backtracking
clauses	clauses to be checked for satisfiability
conflict*	conflict clauses
decision*	decision assignments
dot	implication graphs in dot format
graph	implication graphs
incremental	incremental build of the implication graphs
learned*	learned clauses
literal	literals found assigned during CDCL
resolvent	resolvents created during CDCL
result*	result of the algorithm
skipping	assignments skipped when backtracking
uip	unique implication points
unit*	unit clauses
variables	variables that are not assigned so far