

# **Techniques and Examples for Propositional Data**

For propositional sentences there are some special techniques - e.g. Davis Putnam, simple model generation (use clausal form) OBDDs

## A few notations for ground clauses (no guantifiers):

- the *language* L names the atoms that may occur in any clause;
- a ground clause is a disjunction of ground literals;
- a ground literal is a ground atom or negated ground atom;
- a singleton clause is called a fact or unit clause;
- a clause C in which literals X and ¬ X occur is a *tautology* (always true):

## Examples

Let the language be {A, B, C, D} A and  $\neg B$  are *literals*  $A \lor \neg B \lor \neg D$  is a clause. So is C. C is a fact, also called a *unit* clause. [] is the empty clause, (an empty disjunction) which is always False.  $A \lor \neg B \lor \neg A$  is a *tautology*, which is always true. Note:  $A \lor B \lor C$  may be written as, and identified with, {A, B, C} (or ABC);

if X and Y are sets of clauses their union may be written X + Y.

# Interpretations for Propositional Data

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- an interpretation over L assigns True(T) or False(F) to every atom in L;
- an interpretation over L assigns T/F to literal  $\neg X$  if it assigns F/T to atom X;
- an interpretation over L satisfies clause C if it assigns T to ≥1 literal X in C;
- an interpretation over L is a model of a set of clauses S written in L iff it satisfies all clauses in S. S is satisfiable if it has a model;
- let S be a set of clauses and G be a clause in L. Then S  $\models$  G iff for all interpretations M over L, if M is a model of S, then M is a model of G;
- S+{ $\neg$  G} has no models (is *unsatisfiable*) iff S  $\models$  G:
- clause X subsumes clause Y if  $X \subseteq Y$ . Note X  $\mid = Y$ ; Why?

# Examples:

### Given the clauses $A \lor B$ , $\neg A \lor C \lor \neg D$ , $\neg C$ The interpretation A=B=C=D= False is **not** a model. Why? The interpretation A=B=True: C=D= False is a model. Whv? The given clauses are therefore satisfiable

The clauses  $A \lor B$ ,  $\neg A$ ,  $\neg B$  are *unsatisfiable*. Why?  $A \lor B$ ,  $\neg A \models B$  since every model of  $A \lor B$  and  $\neg A$  is a model of B.

 $\neg A \lor \neg D$  subsumes  $\neg A \lor C \lor \neg D$ . Note  $\neg A \lor \neg D \models \neg A \lor C \lor \neg D$ ; Why?

Davis Putnam Method	1b
The <b>Davis Putnam</b> decision procedure is used to decide whether ground clauses S are satisfiable or unsatisfiable.	
Basically it attempts to show S has no models, by investigating whether simpler sets of clauses derived from S have no models. <i>Either</i> no model exists and false is returned, <i>or</i> a model can be found and true is returned together with a model.	
DP is called with 2-arguments: Arg1 is a partial model of clauses processed so far, and Arg2 is the list of clauses still to process. Initial call is DP([],S). Since no clauses processed so far, Arg1 is empty and Arg2 =given clauses	s.
It is usual to first remove tautologies and <i>merge</i> identical literals in a clause (e.g. $A \lor A \lor B$ becomes $A \lor B$ ), then call DP([], S)	е,
The algorithm is on 1bii and an example is on 1biii.	

1ai





### **Davis Putnam Procedure:**

When computed by hand the sets of clauses that are arguments to calls of DP can be maintained in a tree. For the initial clauses  $S = \{LK, \neg L\neg K, \neg LM, \neg MK, MR\}$  we might get the tree shown on Slide 1biii. (There are others, it depends on the choice of literals in steps 4 and 7.) The initial node contains the initial set S and an empty partial model.

1biv

R is pure, so remove MR (Step 4). The tree is extended by a node containing the set {LK,  $\neg L\neg K$ ,  $\neg LM$ ,  $\neg MK$ } and R is added to the partial model. Next use (Step 7) and choose M (note: for illustration this is a different choice than shown on Slide 1biii, but the final answer will be the same); the tree is extended by 2 branches, one getting model {R,M} and reduced clauses {LK,  $\neg L\neg K$ , K} and the other getting model {R, $\neg M$ } and {LK,  $\neg L\neg K$ ,  $\neg L$ }. From {LK,  $\neg L\neg K$ , K} use (Step 5) for K and get a new node below it with model {R,M,K} and reduced clauses { $\neg L$ } and from {LK,  $\neg L\neg K$ ,  $\neg L$ } use (Step 6) for  $\neg L$  and get a new node beneath it with model {R, $\neg M, \neg L$ } and reduced clauses are satisfiable.

The first branch returns the (partial) model  $\{R,M,K,\neg L\}$  and the second branch returns the (partial) model  $\{R,\neg M,\neg L, K\}$ . You can check these both satisfy the initial clauses.

Note for example, that if we had included  $L\neg K$  in the initial set of clauses, then we would have got  $\{\neg L, L\}$  and/or  $\{K, \neg K\}$  in the last nodes. Both return false showing the set of clauses  $\{LK, \neg L\neg K, \neg LM, \neg MK, MR, L\neg K\}$  is unsatisfiable.

### Various properties can be proved for DP:

As the Davis Putnam procedure progresses, the first argument M is maintained as a partial model of clauses already processed. If the procedure ends with an empty set of clauses then M will be a partial model of the initial set of clauses S. It may have to be extended to the whole signature if it doesn't include assignments for all atoms. The second argument is simplified at each step.

The following two properties are proved on Slides 1ciii and 1civ.

(1) At each step any literal that appears in M will not occur in S. This is clearly true at the start.

(2a) At each single branching step  $M \cup S$  is satisfiable iff  $M' \cup S'$  is satisfiable.

(2b) At each branching step  $M \cup S$  is satisfiable iff  $M' \cup S'$  is satisfiable or  $M'' \cup S''$  is satisfiable.

If it is required to know only whether a set of clauses S is satisfiable or not, there is no need for the argument that maintains the model. 1bv



Why Does it Work? (2)	1cii
EG Step 4 – P is pure: delete clauses including P from S to give S'	
<ul> <li>(1) S satisfiable ==&gt; S' is satisfiable:</li> <li>Let I be a model of S.</li> <li>S' is smaller than S so I must be a model of S'.</li> </ul>	
(2) S' satisfiable ==> S is satisfiable: Suppose I is a model of S' In order to make S true I must also satisfy the deleted clauses like C = Since P is pure ¬P does not occur in any clause in S' So I does not have to assign to P to satisfy S' Hence we can arbitrarily assign true to P in I and make true all clauses Hence the property holds for step 4.	⊧P∨D s like C
For the branching step 7, the (simplified) invariant is a bit more compli	ated:
S is satisfiable iff S' is satisfiable or S" is satisfiable ≡ S is unsatisfiable iff S' is unsatisfiable and S" is unsatisfiable	

### **Proof of Correctness of DP:**

It is quite easy to show the simplified invariant property. For each step you must show that the clauses before the step are satisfiable iff the clauses after the step are satisfiable. For example, the case for (Step 4) is given on Slide 1cii. *The other cases are left as exercises.* 

Using the invariant you can then show DP(S)=False iff S is unsatisfiable by induction on the number of occurrences of atoms (positive literals) in S. If S has no atoms, then S is either empty, hence satisfiable and result = True by (Step 1) is correct, or S contains only negative literals. In that case (Step 4) can be applied to remove all clauses from S until S is empty. If S contains one atom and (Step 4) is not possible, then  $S = \{L\} + \{\neg L\}$  (two clauses) and is unsatisfiable so result = False by (Step 2) is correct. (Note that if tautologies abe initially removed they will never appear in the argument S, so S cannot be the *clause* L $\lor$ -L). Suppose S has k>1 atoms. The induction hypothesis (IH) states that if S has <k atoms then DP(S) returns the correct result (i.e. False when S is unsatisfiable, otherwise True). For cases 3-6 S'/S" has fewer atoms than S and so by (IH) DP(S')/DP(S") returns the correct result, which is also the correct result for S' and S". The disjunction will be false when both are false, i.e. when S' and S" are both unsatisfiable. By the invariant S is unsatisfiable and S on the disjunction gives the correct result (false) for S. The argument when the disjunct is true is left to you.

Next we show the invariant property for the full procedure that returns a model. The induction part is similar to the proof just given and will be omitted. First we show that the property on Slide 1biv holds: if a literal is in M then neither it nor its complement occurs in S. Assume this is true for a call DP(M,S). If any literal is added to M then all occurrences are removed from the clauses in S' and no literals are added to S' that were not in S. Hence the property still holds. It clearly holds for the initial call DP( $\{$   $\}$ , S).

## **Proof of Correctness of DP continued:**

1ciii

To show the invariant property you must show for each step that  $M \cup S$  is satisfiable iff  $M' \cup S'$  is satisfiable. For example, the case for (Step 4) is as follows. Assume P is pure, then the procedure adds P to M to give M'. We assume that literals in M do not occur in S, which implies P is not in M. First we show  $M \cup S$  is satisfiable ==>  $M' \cup S'$  is satisfiable. Let I be a model of M and of S. If I makes P true then I satisfies  $M'=M \cup \{P\}$ . If I makes P false, let  $C = P \lor D$  be a clause in S (P occurs only is such clauses). I makes D true, hence can reassign P t true in I. P is not in M or S', so I will still satisfy  $M \cup \{P\} \cup S'$  since  $S \supseteq S'$ . Next we show that  $M' \cup S'$  is satisfiable ==>  $M \cup S$  is satisfiable. Suppose I is a model of M' and S'. Since P is in M' I makes P true and hence makes S true as it satisfies the deleted clauses like  $C = P \lor D$ . I makes M true since M'  $\supseteq M$ . Hence the property holds for step 4.

For (Step 7) assume atom L is chosen. Let I be a model of  $M \cup S$ . If I makes L true then we show I satisfies S' and M'= $M \cup \{L\}$ . The analogous case for when I makes L false using S" is similar. I clearly makes M' true. (Remember that L is in S and so by assumption L does not occur in M.) Consider the exemplifying clause  $\neg L \lor B \lor C$  in S. Since L is true in L,  $B \lor C$  is forced to be true in I as required to satisfy S'. Clauses in S' not including  $\neg L$  are unaffected and still true. On the other hand, if M'  $\cup$ S' has a model I, then I satisfies L and hence all the clauses deleted from S to form S'. I still satisfies M and clauses in S such as  $\neg L \lor B \lor C$  since I satisfies  $B \lor C$  which is in S'. Similarly if M"  $\cup$ S" has a model.

The other cases are left as exercises.

1civ

"The three little girls" problem 1di	Solution to "The three little girls" by DP 1dii
The data (1) $C(d) \lor C(e) \lor C(f)$ One of the three girls was the culprit (2) $C(x) \rightarrow H(x)$ { $C(d) \rightarrow H(d), C(e) \rightarrow H(e), C(f) \rightarrow H(f)$ } To convert into propsitional form (3) $\neg(C(d) \land C(e))$ (4) $\neg(C(d) \land C(f))$ (5) $\neg(C(f) \land C(e))$ (6) $C(d) \lor H(d) \lor \neg C(e)$ (Dolly's statement negated) (7) $C(e) \lor C(f) \lor \neg(C(e) \rightarrow (C(d) \lor H(d)))$ (Ellen's negated) (8) $C(f) \lor \neg H(d) \lor \neg C(d) \land C(d) \rightarrow C(e)$ (Frances's negated)	$ \begin{array}{llllllllllllllllllllllllllllllllllll$
<ul> <li>Either include a negated conclusion ¬C(f) and look for False, or look for True with C(f) in the model. Here we add ¬C(f).</li> <li>Convert to clauses and remove any tautologies or subsumed clauses at the start. Also merge identical literals.</li> <li>Next week we'll see a systematic algorithm for conversion to clauses. For now we do it by hand.</li> </ul>	Apply (Step 5) on C(e) and then apply (Step 3) as $\neg$ H(d) subsumes { $\neg$ H(d),C(d)}; call DP([H(e), $\neg$ C(f), C(e)], [2a, $\neg$ C(d), H(d) $\lor$ C(d), $\neg$ H(d)]); Apply (Step 6) on $\neg$ C(d); call DP([H(e), $\neg$ C(f), C(e), $\neg$ C(d)], [H(d), $\neg$ H(d)]); Apply (Step 2) on H(d) - terminate and return False.

Theorems for DP	1ei
DP([ ],S) halts with <i>false</i> if S has no models DP([ ], S) halts with <i>true</i> and returns at least one model M if S is satisfiable	
In fact, M is a partial model Atoms A s.t. neither A nor $\neg A$ occur in M can be either true or false	
EG: DP([], $[A \lor B]$ ) will return either the model {A} or the model {B}. The model {A} can be extended to the model {A,B} or to {A, ¬B} as both satisfy the clause A∨B. Analogously for the model {B}.	
Arguments of calls to DP(M,S) satisfy the <i>invariant</i> : M +S has a model iff either M' + S' has a model, (in single call cases), or at least one of M' + S' or M" + S" has a model (in otherwise case). Also, if literal L(or ¬L) occurs in M then neither L nor ¬L occurs in S.	
For the non-clausal case (see Slide 1eii) similar properties hold. e.g. try DP([], S), for the tautology ((A -> B) -> A) -> A.	

The Davis Putnam procedure can be generalised to apply to arbitrary propositional sentences as outlined below. The same kind of argument as given for the clausal version shows it to be correct.

We say A is +ve/-ve in A/¬A if A is an atom. A is +ve/-ve in ¬C if A is -ve/+ve in C. A is +ve/-ve in C $\land$ D,C $\lor$ D, if A is +ve/-ve in C or in D. A is +ve/-ve in C $\rightarrow$ D if A is +ve/-ve in D or A is -ve/+ve in C. A is +ve and -ve in C<->D if A occurs in C or D.

Simplify(S) applies laws of logic for True/False to clauses in S. eg True $X \equiv X$ ; False $X \equiv X$ . The DP-procedure is amended as shown below. Note that the subsumption test is optional. Tautologies are only removed if they are obvious, and similarly for merging.

### procedure DP(M, S) : boolean;

- %M is a model so far and S are sentences to process
- 1. If S is empty print M and return false; %M is a partial model
- 2. If S contains literals X and  $\neg$ X return true; % S has no models
- (3. If C is a subsumed sentence in S return DP(M,S-C);)
- (4. If P is a pure literal in S (i.e. occurs only +ve or only -ve in S) return DP([P|M], S1),
- where S1 is as in Step 5)
- 5. If A is a fact in S return DP([A|M], S'),
- where S'=Simplify(S1) and  $\tilde{S}_{1} = \{\tilde{C} | C \text{ in } S \text{ and } A \text{ is replaced by True in } C \}$ 6. If  $\neg A$  is a fact in  $\tilde{S}$  return DP([ $\neg A | M$ ], S"),
- where S''=Simplify(S2) and  $S2=\{C|C \text{ in } S \text{ and } A \text{ is replaced by False in } C\};$
- 7. Otherwise select an atom A in S and form S' and S" as in Steps 5 and 6; return  $DP([A|M], S') \land DP([\neg A|M], S'')$

(Normal forms other than clauses are possible, and procedures analogous to DP devised.) 1eii

	Example: Implementing DP efficiently (2) 1fii
Implementing DP efficiently (1) <sup>1fi</sup>	
The DP algorithmwas invented in 1960. It is still widely used for proving unsatisfiability for propositional logic - eg in PVS, Otter, Prover9, etc.	
What kind of optimisations are possible if the number of atoms and/or clauses is very large? At least will need to find an efficient way to determine:	Current value of atom after last step:Clause deleted?Monitors $0 = atom not present$ $0 = not deleted$ $1 = pos atom present atom not set$ $n>0 = deleted at n$
<ul> <li>if a clause is a new unit clause (so can apply (Step 4) or (Step 5));</li> <li>if a clause is deleted by subsumption or empty (can ignore or finished);</li> <li>eliminate complements of singletons and choose atom for split in (Step 7)</li> </ul>	$2 = neg atom present atom not set3 = pos/neg atom setAlso record Step#, step type,literal selected; Initial step# = 0eg A1 \lor \neg A3 initially coded as [1,0,2]Iteral selected; Initial step# = 0$
In the system <b>Chaff (2001) Moskewicz et al</b> keep a pair of indices associated with every clause that indicate 2 literals in the clause that have not yet been	<b>Step 7</b> will update record with decision by altering all clause entries that are not in a deleted clause and for which atom is present.
eliminated. Also indicate which was last literal decision affecting clause and whether clause is deleted or not. This allows to detect non-singletons, singleton (only 1 literal indicated), empty	eg if step sets atom 5 to true then 5th entry is inspected in all undeleted clauses; if 1 clause deleted (at step#); otherwise 0>0; 2>3. If 5th entry is monitored and went from 2>3 then must get new monitor. If none, this will trigger step 5 (or 6) depending on the other monitor.
clauses (no literals indicated) and help with choice of selected literal. It also helps restore states when back-tracking to alternative branches.	<b>Step 5</b> will update record in a similar way to above. If a monitor pair in a non-deleted clause becomes empty then branch closed so backtrack. Entails undoing earlier steps until reach a Step 7 with a second branch to investigate. If all clauses deleted ==> model found. <b>Exercise:</b> How can it be read from state?

Implementing DP efficiently (3)	
<b>EG</b> : 1. AvB 2. ¬AvB 3. ¬BvC 4. ¬Bv¬C	
Code as: [1,1,0], [2,1,0], [0,2,1], [0,2,2] Monitors are AB, AB, BC, BC	
Initial Trace:1. Step 7 set A to true:(affects clauses 1, 2)(1) deleted at #12> $[3,1,0]$ Monitor B(2, 3, 4 left)2. Step 5 set B to true:(2) deleted at #23> $[0,3,1]$ Monitor C3. Step 6 set C to false:4> $[0,3,2]$ Monitor C (3, 4 left)(4) deleted at #33> $[0,3,3]$ No MonitorNo monitor to 3 so backtrack redo last Step 7	
1. Step 7 Set A to False: 1> [3,1,0] Monitor B       (affects clauses 1,2)       (2) deleted at #4         2. Step 5 set B to true: 3> [0,3,1]       (1,3,4 left)       (1) deleted at #5         3> [0,3,1]       Monitor C       (4> [0,3,2] Monitor C       (3, 4 left)         4. Step 5 set C to true:       (3) deleted at #6       4> [0,3,3] No Monitor No monitor for 4 and no more choices         Return no models.       (3) deleted at #6       (4> [0,3,3] No Monitor	
<ul><li>Exercise:</li><li>1.Check the backtracking can be made from the various state values.</li><li>2. A better choice at Step 1 is to select B. Try it!</li></ul>	

Summary of Slides 1	1gi
<b>1.</b> The Davis Putnam(DP) method for testing satisfiability of propositional was described. DP can be extended to arbitrary propositional sentences.	clauses
<b>2.</b> DP returns True for given set of clauses S if there are no models of S. returns False if there is at least one model of S and will in that case also remodel for S – i.e. an assignment of T/F to atoms in S that makes every class true. This assignment can be extended to all atoms by assigning T or F remaining unassigned atoms.	lt eturn a luse in to any
<b>3.</b> The state of DP can be represented as a tree, in which each node is lab by the current set S and current partial assignment. Each call (and subcall DP(M,S) maintains an invariant: M is a partial model of S iff M' is a partial of S', where the subcall is DP(M',S').	oelled s) of model
<b>4.</b> The correctness property of DP is proved by induction on the number occurrences in the current clause set.	of atom
5. DP was used to solve the "Three Little Girls" problem.	
<b>6.</b> Definitions of the terms ground atom, ground literal, assignment, ground clause, satisfiable, unsatisfiable, (ground) subsumes, tautology, merge, puliteral and logical implies ( $ =$ ) were given. If S $ =$ G then every model in the language of S and G that satisfies S also satisfies G and hence does not s $\neg$ G. Therefore there is no model of {S, $\neg$ G}.	d ire e satisfy
7. Some ideas for Implementation were discussed.	