

How do we trust the implementation of  
 SAT solver?

If solver says  $F$  is SAT & we have  $\sigma$ , then we can  
 verify it

But what if solver says  $F$  is UNSAT?

More SAT solver - kissat  
- cryptominisat  
→ ! } >20 k lines  
of code

there has been cases of SAME bug in more  
than one solver.

[taken from GANAK (model counter repo)] <https://github.com/meelgroup/ganak/issues/8>

↳ A instance with 87 variables & 25 clauses

GANAK, sharpSAT

967445862998626248587584

miniCD2 (Achet)

9674458629986261412085760

GANAK

↳ proposed & developed by dual degree cs  
IIT Kanpur student, 2020 batch

We ask SAT Solver to produce a proof  
for the UNSAT results

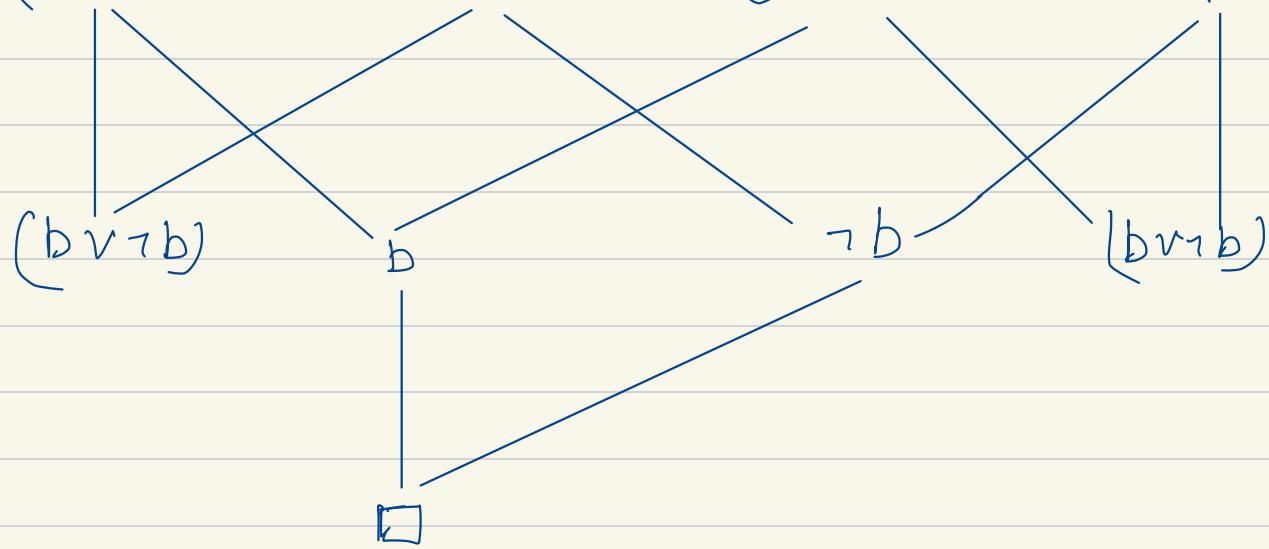
Say:

$$F = (a \vee b) \wedge (\neg a \vee \neg b) \wedge (\neg a \vee b)$$

$F$  is UNSAT, why?

How do we prove that there is no solution?

$$F = (a \vee b) \wedge (\neg a \vee \neg b) \wedge (\neg a \vee b) \wedge (a \vee \neg b)$$

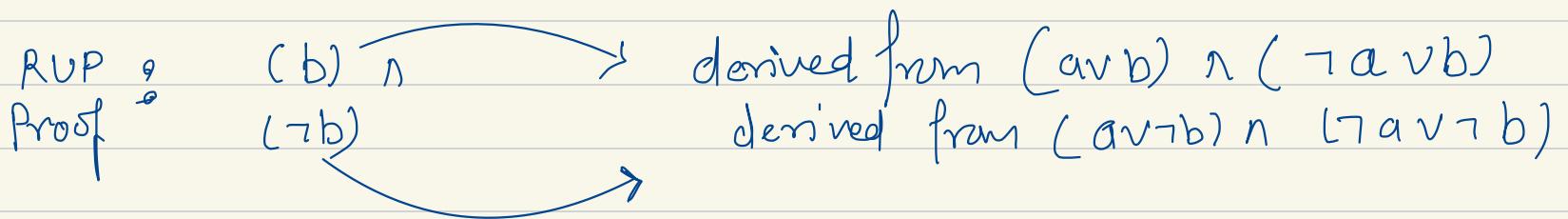


Using Resolution

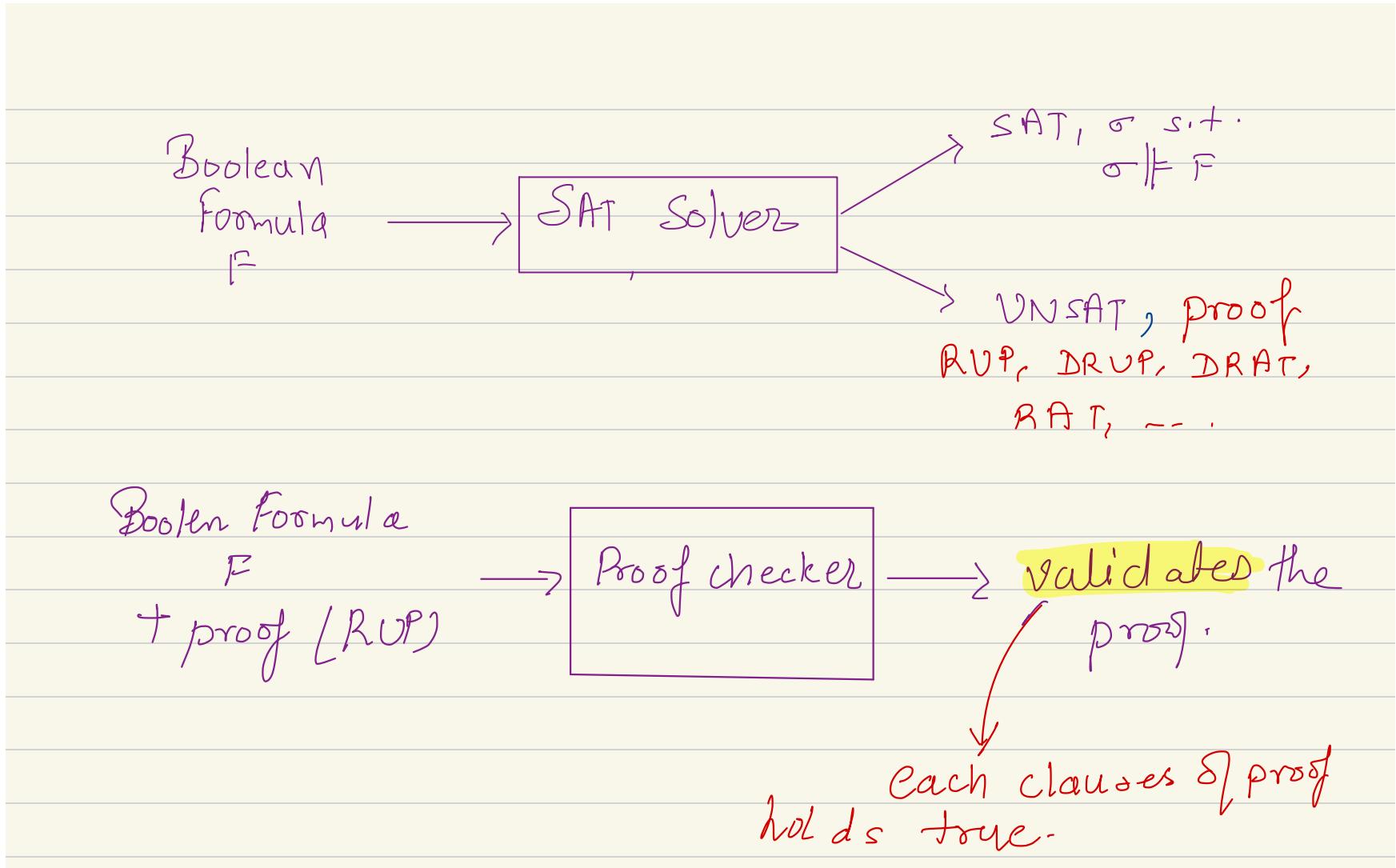
## RUP (Reverse Unit Propagation)

→ write each derived clauses one after the other.

$$F = (a \vee b) \wedge (\neg a \vee \neg b) \wedge (\neg a \vee b) \wedge (a \vee \neg b)$$



The idea is that the clauses in RUP proof must hold together leads to a conflict.



\* To validate given RUP proof , you need to prove that  $i^{th}$  clauses in RUP holds true under all clauses of formula  $\vdash$  upto  $(i-1)^{th}$  clauses of RUP.

how to proof that C must holds true:

$$\text{if } F \wedge \neg C \rightarrow \text{UNSAT}$$

then C must hold true.

\* RUP :- each line of the proof must be checkable by simple propagation.

## UNSAT CORE

Given an unsatisfiable Boolean formula in CNF from, a subset of clauses of  $P$  whose conjunction is still unsatisfiable is called UNSAT CORE of the formula  $P$ .

## Minimal Unsatisfiable Subset.

MUS: Consider  $M \subseteq C$ , where  $C$  is the set of all clauses of Formula  $F$ .  $M$  is a MUS of  $F$  if and only if  $M$  is unsatisfiable & all proper subsets of  $M$  is satisfiable.

$$F = (a \wedge \neg a) \wedge (b \wedge \neg b) \wedge (\neg a \vee \neg b)$$

Compute MUS

$$\begin{aligned} &\rightarrow \{\neg a, \neg b\} \\ &\rightarrow \{a, b\}, (\neg a \vee \neg b) \end{aligned}$$

A MUS is an unsatisfiable set that can't be reduced without causing it to become satisfiable.

## Minimal Correction Set

↙  
MCS : Consider  $M' \subseteq C$ , where  $C$  is the set of all clauses of Formula  $F$ .  $M'$  is called MCS if and only if  $C/M'$  is satisfiable &  $\forall m \in M'$ ,  $C \setminus \{m\}$  is unsatisfiable.

$$F = (a \wedge \neg a) \wedge (b) \wedge (\neg a \vee \neg b)$$

### Compute MCS

MCS is a minimal set of removals from  $F$  that causes  $F$  to become satisfiable.

What is the relation b/w MCS & MVS ?

## Hitting Set

A hitting set  $H$  of a collection of sets  $C$  is a set that "hits" every set in  $C$ , in the sense that it has non empty intersection with each such set:  $\forall c \in C, H \cap c \neq \emptyset$ .

  
collection of sets.  
hitting set.

Knowing this, now do you see the relation b/w mcs & MUS?

All MUSes : Set containing all MUSes of formula F

All MCSes : Set containing all MCSes of formula F.

→  $M \in \text{AllMUSes}$ , if and only if  $M$  is a minimal hitting set of All MCSes.

→ Dually,  $C \in \text{AllMCSes}$  if and only if  $C$  is a minimal hitting set of All MUSes.

$$F = (a \wedge \neg a) \wedge (b) \vee (\neg a \vee \neg b)$$

All MVSes:  $\{\{a\}, \{\neg a\}\}$ ,  $\{(a) \wedge (b) \wedge (\neg a \vee \neg b)\}$

All MCSes:  $\{\{a\}, \{\neg a\}, \{b\}\}$ ,  $\{\{\neg a\}, \{\neg a \vee \neg b\}\}$

Minimal hitting set of All MVSes:  $\{\{a\}, \{\neg a, b\}, \{\neg a, \neg a \vee \neg b\}\}$

Minimal hitting set of All MCSes:  $\{\{a\}, \{\neg a\}\}$ ,  $\{a, b, \neg a \vee \neg b\}$

let  $C$  be the collection of clauses, such that  $C \subseteq F$ .

$C$  is said to be **critical** for formula  $F$ , if:

→  $C$  must be contained in every MUS of  $F$ .

→  $C$  is an MCS of  $F$ .

↳ Removal of  $C$  from  $F$ , causes  $F$  to become satisfiable.

Note: every clause in an MUS is critical for it.

Can we come up with algorithm to  
find MUS?!

To compute MUS

Input : Unsatisfiable formula  $F$ , as set of clauses.

critical\_clauses  $\leftarrow \emptyset$

unknown\_status  $\leftarrow F$ .

choose one clauses from unknown-status,  
? check if that is a "critical" clause or not?  
\* if yes, add to critical-clauses  
if not, ignore?  
what else  
can be done?

Q: How do we check if a clause 'c' is "critical"?

let  $F' = \{F \setminus c\} \cup (\neg c)$

if  $F'$  is SAT



if  $F'$  is UNSAT



Q: How do we check if a clause 'c' is "critical"?

$$\text{let } F' = \{F \setminus c\} \wedge (\neg c)$$

if  $F'$  is SAT

    └ c is critical

if  $F'$  is UNSAT

    └ c is not critical; but we can  
        work with UNSAT CORE of  $F'$ .

## To compute MUS

Input : Unsatisfiable formula  $F$ , as set of clauses.

Critical\_clauses  $\leftarrow \emptyset$

Unknown\_status  $\leftarrow F$ .

while (unknown\_status  $\neq \emptyset$ ) do

{ c  $\leftarrow$  choose  $c \in$  unknown\_status.

unknown\_status  $\leftarrow$  unknown\_status \ c

(sat?,  $\sigma$ , UC)  $\leftarrow$  SATSolver(critical\_clauses  $\cup$  unknown\_status  $\cup \{ \neg c \}$ )  
if sat then

critical\_clauses  $\leftarrow$  critical\_clauses  $\cup \{ c \}$

else

if  $UC \subseteq$  critical\_clauses  $\cup$  unknown\_clauses.

then unknown\_clauses  $\leftarrow$  unknown\_clauses  $\cap$  UC.

}

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unknown\_status  $\leftarrow$  unknown\_status \ c

(sat?,  $\sigma$ , UC)  $\leftarrow$  SATSolver(critical\_clauses  $\cup$  unknown\_status  $\cup$  { $\neg c$ })

if sat then

critical\_clauses  $\leftarrow$  critical\_clauses  $\cup$  { $\neg c$ } [can we do better?]

else

if  $UC \subseteq$  critical\_clauses  $\cup$  unknown\_clauses.

then unknown\_clauses  $\leftarrow$  unknown\_clauses  $\cap$  UC.

}

## RECURSIVE MODEL ROTATION (RMR)

Let us try to understand this via an example

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

let  $C$  be  $(\neg x_1 \vee \neg x_2)$

To check if  $C$  is critical :-

$$F' = (F \setminus \{\neg x_1 \vee \neg x_2\}) \wedge x_1 \wedge x_2$$

$$\sigma = \langle x_1 \mapsto 1, x_2 \mapsto 1, x_3 \mapsto 1 \rangle, \sigma \models F'$$

so  $C$  is critical clause.

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To check if  $C$  is critical :-

$$F' = (F \setminus \{ \neg x_1 \vee \neg x_2 \}) \wedge x_1 \wedge \neg x_2$$

$$\sigma = \langle x_1 \mapsto 1, x_2 \mapsto 1, x_3 \mapsto 1 \rangle, \sigma \Vdash F'$$

so  $C$  is critical clause.

Question is given  $C$  &  $\sigma$ , can we find other critical clauses?

Note that  $\sigma \not\models C$ .

Let us consider another assignment  $\sigma'$ , such that

$$\sigma' = \overline{\sigma \setminus \{ x \}} \quad \text{where } x \in C$$

Now notice that :  $\sigma' \models C$ , but of course  $\sigma' \not\models F$   
there has to be at least one  $C' \in F \setminus C$  such that  
 $\sigma' \not\models C'$ .

In this example :  $(x_1 \vee \neg x_2)$

$\rightarrow$  this a critical clause

too.

To compute MUS (input unsatisfiable formula F)

critical\_clauses  $\leftarrow \emptyset$

unknown\_status  $\leftarrow F$ .

while (unknown\_status  $\neq \emptyset$ ) do

{ c  $\leftarrow$  choose  $c \in$  unknown\_status.

unknown\_status  $\leftarrow$  unknown\_status \ c

(sat?,  $\sigma$ , UC)  $\leftarrow$  SATSolver(critical\_clauses  $\cup$  unknown\_status  $\cup \{c\}$ )

if sat then

critical\_clauses  $\leftarrow$  critical\_clauses  $\cup \{c\}$

More\_critical\_cls  $\leftarrow$  RMR( $\sigma$ , c, critical\_clauses, unknown\_clauses).

critical\_clauses  $\leftarrow$  critical\_clauses  $\cup$  more\_critical\_cls.

unknown\_clauses  $\leftarrow$  unknown\_clauses \ more\_critical\_cls

else if UC  $\subseteq$  critical\_clauses  $\cup$  unknown\_clauses.

then unknown\_clauses  $\leftarrow$  unknown\_clauses  $\cap$  UC

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