TRACKING MUSES AND STRICT INCONSISTENT COVERS

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Formal Methods in Computer Aided Design (FMCAD'2006)

- **1** MUSES & INCONSISTENT COVERS
 - Definitions and properties
 - Motivations
- (A)OMUS: A MUS EXTRACTOR
 - Deciding which clauses belong to a MUS
 - Taking the neighborhood of the current interpretation into account
 - Algorithm and Experimental Results
- **3** COMPUTING ONE STRICT INCONSISTENT COVER
 - Algorithm and Experimental Results
- **1** CONCLUSIONS AND FUTURE WORK

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DEFINITION: CNF formula

We call:

- * *literal*: propositional atom or its negation $(I, \neg I)$
- ★ *clause*: finite disjunction of literals $(I_1 \lor I_2 \lor ... \lor I_n)$
- ★ CNF formula: finite conjunction of clauses $(c_1 \land c_2 \land ... \land c_m)$

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DEFINITION: Interpretation

- \rightarrow Let ϕ be a CNF formula. An *interpretation* is an application from $Var(\phi)$ to $\{0,1\}$.
- \rightarrow A *model* of ϕ is an interpretation that satisfies ϕ .

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PROPERTY

If a CNF formula is unsatisfiable, then its exhibits at least one Minimal Unsatisfiable Subformula (MUS).

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A Minimal Unsatisfiable Subformula or MUS K of a CNF formula ϕ is a set of clauses s.t.

- \star $K \subseteq \phi$
- * K is unsatisfiable
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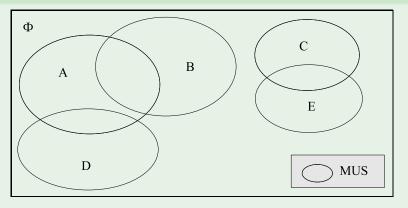
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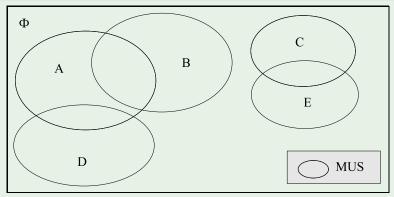
DEFINITION: Inconsistent cover

An inconsistent cover of a unsatisfiable CNF formula ϕ is a subset of KS_{ϕ} such that its removal restores the satisfiability of ϕ .

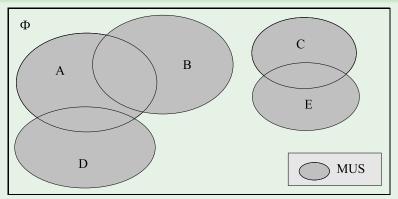
A strict insconsistent cover is composed of independent MUSes.



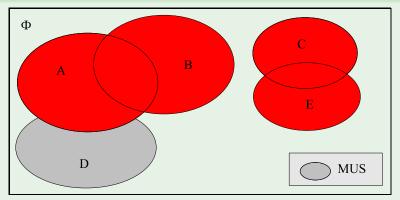
EXAMPLE



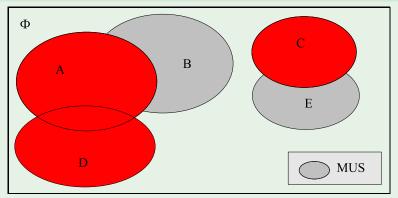
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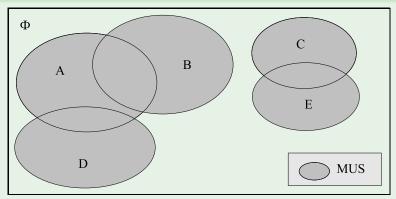
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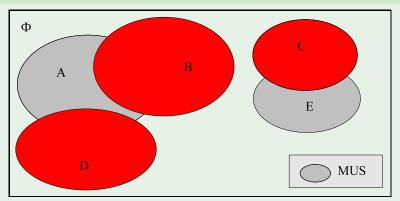
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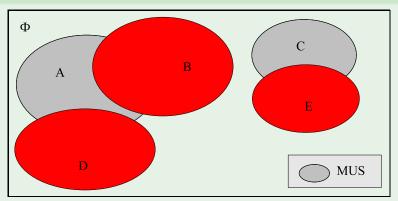
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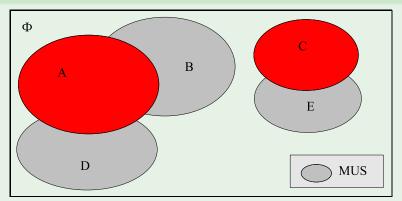
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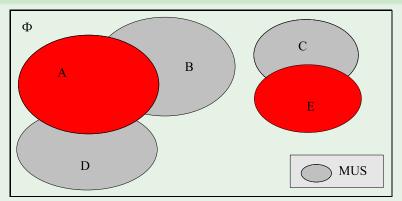
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RELATION BETWEEN MAXSAT AND MUSES

Let ω be an optimal interpretation for MaxSat, any falsified clause w.r.t. ω belongs to at least one MUS of the CNF formula.

- A MUS represents one smallest explanation for the inconsistency (certificate)
- It can help in finding new technics for SAT practical resolution
- It can provide a way to restore satisfiability
- Lots of potential applications (VLSI correctness checking, non-monotonic logics, etc.)

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COMPLEXITY

- Deciding whether a CNF formula is a MUS or not is **DP-complete** [Papadimitriou & Wolfe 85]
- Deciding whether a CNF formula belongs to the set of MUSes or not is in Σ_2^p

[Eiter & Gottlob 92]

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PROPERTY [MAZURE-SAIS-GRÉGOIRE 97]

Let ϕ be a CNF formula, K a MUS of ϕ , and c a clause. For all interpretations ω , $\exists c \in K$ s.t. $\omega \nvDash c$

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During a local search run, the most often falsified clauses belong to MUSes.

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Problem: Some clauses can be often falsified without belonging to MUSes.

⇒ A more discriminating criterion is needed to identify clauses of MUSes.

TAKING THE NEIGHBORHOOD OF THE CURRENT INTERPRETATION INTO ACCOUNT

Definition: once-satisfied clause

A clause c is said once-satisfied clause w.r.t. an interpretation ω iff ω satisfies exactly one literal of c.

Definition: critical clause

A clause c falsified w.r.t. an interpretation ω is said critical iff the opposite of each literal of c appears in at least one once-satisfied clause.

These once-satisfied clauses are said linked to the critical clause c

$$(a \lor b \lor c) \leftarrow \\ \land (\neg b \lor e) \\ \land (\neg a \lor b \lor c) \leftarrow \\ \land (\neg a \lor \neg b) \leftarrow \\ \land (a \lor d) \\ \land (b \lor \neg c) \leftarrow \\ \land (\neg d \lor e) \\ \land (a \lor \neg b) \leftarrow \\ \land (\neg e \lor \neg f)$$

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PROPERTY

Let c be a critical clause w.r.t. an interpretation ω .

Any flip on ω in order to satisfy c leads to falsify another clause previously satisfied w.r.t. ω .

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PROPOSED HEURISTIC

Performing a local search that counts for each clause the number of times it has been critical.

Let K be a MUS, and c be a clause s.t. $c \in K$

Let K be a MUS, and c be a clause s.t. $c \in K$ \Downarrow $K \setminus \{c\}$ is SAT. Let ω be a model of $K \setminus \{c\}$

Let K be a MUS, and c be a clause s.t. $c \in K$ \Downarrow $K \backslash \{c\}$ is SAT. Let ω be a model of $K \backslash \{c\}$ \Downarrow $\omega \nvDash c$

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Let ω be a model of $K \setminus \{c\}$ \Downarrow $\omega \nvDash c$ \Downarrow Let ω' s.t. $d_H(\omega, \omega') = 1$ and $\omega' \vDash c$

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Then, we have c is critical (w.r.t. ω)

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EXTENSION OF THE RELATIONSHIP BETWEEN MAXSAT AND MUSes

Let ω be an optimal interpretation for MaxSat, any falsified clause c w.r.t. ω :

- belongs to at least one MUS of the CNF formula
- is critical w.r.t. ω
- at least one once-satified clause linked to c belongs to the same MUS

(A) OMUS ALGORITHM

```
Function (A) OMUS (\phi: CNF formula) : CNF formula
       stack = \emptyset:
      While ((LS+score(\phi) does not find a model of \phi)) do
            push(\phi);
            \phi \leftarrow \phi - \phi_{\mathsf{LowestScore}};
      done
      Repeat
            \phi = pop();
      until (UNSAT(\phi))
       [For OMUS]
      Fine-Tune (\phi);
      Return \phi;
End
```

EXPERIMENTAL RESULTS

Instance	zCore [Zhang	[Lynce &	[Bruni 03] 1	AOMUS	AOMUS
	& Malik 03]	MSilva 04]		(falsified clauses)	
aim-50-2_0-no-2	30 (1,88)	30 (0,90)	31	30 (1,79)	30 (2,61)
aim-50-2_0-no-4	21 (1,29)	21 (3,49)	21	21 (2,97)	21 (2,85)
aim-100-1_6-no-1	47 (1,45)	47 (284)	47	47 (2,62)	47 (2,67)
aim-100-1_6-no-2	54 (1,12)	53 (224)	54	53 (2,37)	53 (2,82)
aim-100-1_6-no-3	57 (1,23)	time out	57	57 (1,87)	57 (3,20)
aim-100-1_6-no-4	48 (0,95)	48 (241)	48	48 (1,86)	48 (2,84)
aim-200-1_6-no-2	81 (1,52)	time out	82	80 (1,79)	80 (2,94)
jnh11	121 (2,46)	time out	129	225 (13)	167 (29)
jnh13	57 (1,90)	time out	106	90 (41)	66 (77)
jnh14	91 (1,85)	time out	124	111 (45)	90 (89)
jnh2	45 (1,95)	time out	60	117 (56)	74 (50)
jnh5	86 (1,79)	time out	125	143 (39)	114 (61)
jnh8	90 (2,28)	time out	91	118 (65)	76 (102)
fpga10_11_uns	561 (27)	time out	-	565 (15)	561 (26)
fpga10_12_uns	672 (65)	time out	-	568 (66)	561 (57)
homer10.shuffled	940 (624)	time out	-	518 (818)	415 (496)
homer11.shuffled	561 (25)	time out	-	564 (16)	561 (26)
homer14.shuffled	1065 (714)	time out	-	561 (536)	561 (449)
homer15.shuffled	time out	time out	-	677 (1299)	561 (1104)

¹extracted from [Bruni 03]

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- **Problem**: A *n*-clauses formula can exhibit $C_n^{n/2}$ MUSes in the worst case
- We need to compute independent causes of unsatisfiability ⇒ concept of Strict Inconsistent Cover

ICMUS ALGORITHM

```
Function ICMUS(\phi: CNF formula) : a strict Inconsistent Cover |C \leftarrow \emptyset|; While ((\Sigma is unsatisfiable)) do |MUS \leftarrow \text{OMUS}(\Sigma)|; |C \leftarrow C \cup MUS|; |\Sigma \leftarrow \Sigma \setminus MUS|; done return |C|; End
```

Algorithm 1: ICMUS algorithm

EXPERIMENTAL RESULTS

TABLE: Inconsistent covers for various classes of formulas

Instance	#var	#cla	Time	#MUS	Ses in the IC	_
dp02u01	213	376	1.19	1	(47,51)	
dp03u02	478	1007	362	1	(327,760)	
fpga10_11_uns_rcr	220	1122	56	2	(110,561) (110,561)	
fpga11_12_uns_rcr	264	1476	128	2	(132,738) (132,738)	
ca002	26	70	0.61	1	(20,39)	
ca004	60	168	1.11	1	(49,108)	
ca008	130	370	5.26	1	(110,255)	
term1_gr_rcs_w3	606	2518	6180	11	(12,22) (21,33)	
					(30,58) (12,22) (12,22)	
					(12,22) (12,22) (12,22)	
					(12,22) (24,39) (21,33)	
C220_FV_RZ_14	1728	4508	28	1	(10,14)	
C220_FV_RZ_13	1728	4508	46	1	(9,13)	
C170_FR_SZ_96	1659	4955	18	1	(81,233)	
C208_FA_SZ_121	1608	5278	21	1	(18,32)	
C168_FW_UT_851	1909	7491	83	1	(7,9)	
C202_FW_UT_2814	2038	11352	304	1	(15,18)	
jnh208	100	800	14	1	(76,119)	
jnh302	100	900	63	2	(27,28) (98,208)	
jnh310	100	900	184	2	(12,13) (90,188)	
3col40_5_3	80	346	4.64	1	(64,136)	
fphp-012-010	120	1212	57	1	(120,670)	

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CONTRIBUTIONS

Theoretical and practical applications of the new notion of critical clause

- **Theoretical:** For each clause belonging to a MUS, there exists an interpretation s.t. it can be critical.
- Practical: Exploitation of this property in order to extract:
 - An approximation or an exact MUS
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FUTURE WORK

- Specific treatment of long clauses
- Certificates for:
 - The smallest inconsistent cover(s)
 - The set of MUSes
- Apply this work for MaxSAT practical resolution.
- ...