

# Towards a theory of good SAT representations

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Exploring Computational Complexity

November 9, 2014

# Clause-sets

- Let  $\mathcal{VA}$  be the set of variables.
- Let  $\mathcal{LIT}$  be the set of literals, which are either variables or complemented variables, i.e.,  $\mathcal{LIT} = \mathcal{VA} \cup \overline{\mathcal{VA}}$ .
- A clause is a finite and complement-free subset of  $\mathcal{LIT}$ , the set of all clauses is  $\mathcal{CL}$ .
- Let  $\mathcal{CLS}$  be the set of clause-sets, finite subsets of  $\mathcal{CL}$ .

$$\perp := \emptyset \in \mathcal{CL}$$

$$\top := \emptyset \in \mathcal{CLS}.$$

# “Hardness”

$$\begin{aligned} \text{hd} &: \mathcal{CLS} \rightarrow \mathbb{N}_0 \\ \text{awid} &: \mathcal{CLS} \rightarrow \mathbb{N}_0. \end{aligned}$$

“Hardness” for historical reasons;  $\text{hd} = \text{thd}$ .

## Open Problem

*Develop a general framework for “hardness measures”.*

*Our approach:*

- ① **Precise**, not asymptotic: clause-sets have an intrinsic “hardness”, under a certain perspective; for example Horn clause-sets have hardness 1.
- ② **SAT** by worst-case from UNSAT.

Our “hardness” is “hardness for very simple, oblivious SAT algorithms”.

# What do you mean?

What does it mean that we have

$$\text{hd}(F) = k$$

resp.

$$\text{awid}(F) = k$$

where, just to emphasise,  $F \in \mathcal{CLS}$  is a (single, concrete) clause-set (no hidden parameters), and  $k \in \mathbb{N}_0$  is a natural number (again, no hidden parameters)?

From a complexity-theory perspective this looks suspicious?

The meaning is, roughly, that with a generic algorithm with time  $n^{O(k)}$  and space  $n^{O(1)}$  resp.  $n^{O(k)}$  all “implicit information” of  $F$  can be uncovered.

$k$  is a structural parameter of  $F$ , measuring at which maximal “level” we can extract prime implicates from  $F$ .

# Outline

- 1 Introduction
- 2 Hardness measures
- 3 Hierarchies
- 4 Separations
- 5 Monotone circuits
- 6 Conclusion

# From USAT to SAT

- Let  $USAT := \mathcal{CLS} \setminus \mathcal{SAT}$ .
- Let  $\mathcal{PASS}$  be the set of partial assignments.
- For  $\varphi \in \mathcal{PASS}$  and  $F \in \mathcal{CLS}$  let  $\varphi * F \in \mathcal{CLS}$  be the result of applying  $\varphi$  to  $F$ .

In [Beyersdorff and Kullmann \[4\]](#) the following approach was formally introduced:

Consider  $h_0 : USAT \rightarrow \mathbb{N}_0$ .

We extend to  $h : \mathcal{CLS} \rightarrow \mathbb{N}_0$  by

$$h(F) := \max\{h_0(\varphi * F) : \varphi \in \mathcal{PASS} \wedge \varphi * F \in USAT\}.$$

If we assume that applying partial assignments does not increase  $h_0$  (and this we always do), then this holds also for  $h$ .

# Game characterisations of hardness's I

We characterise  $\text{hd}(F)$  and  $\text{awid}(F)$ , indeed for arbitrary  $F \in \mathcal{CLS}$ , by a game according to [4], extending

- Pudlák and Impagliazzo [11]
- and Atserias and Dalmau [1].

# Game characterisations of hardness's II

The general structure of our games is:

- There is a global partial assignment  $\theta$ ; initially  $\theta$  is empty.
- There are two players, DELAYER and FINISHER, manipulating  $\theta$ .
- FINISHER seeks  $\theta * F = \top$  or  $\perp \in \theta * F$  — once established, the game ends (and it will end).
- DELAYER starts, and must never have  $\theta * F = \top$  or  $\perp \in \theta * F$ .
- A move of DELAYER is to extend  $\theta$  to  $\theta' \supseteq \theta$  with  $\theta' * F \neq \top$  and  $\perp \notin \theta * F$ .
- FINISHER can always extend  $\theta$  to any  $\theta' \supseteq \theta$  with  $\theta' * F = \top$ , and then DELAYER gets zero points.
- DELAYER maximises points, FINISHER minimises.

The variations concern the moves of FINISHER and the accounting of points when  $\perp$  has been created.

# The hardness game

The FINISHER extends  $\theta$  to  $\theta'$   
with exactly one more assignment,  
i.e.,  $n(\theta') = n(\theta) + 1$ .

The points DELAYER obtains is the number of rounds.

- 1 The optimal value of this game is  $\text{hd}(F)$ .
- 2 There are quite a few equivalent characterisations: see [7, 8, 9, 4].

# The asymmetric-width game

The FINISHER first restricts  $\theta$  to  $\theta' \subseteq \theta$ ,  
and then extends  $\theta'$  to  $\theta''$ , not contradicting  $\theta$ ,  
with  $n(\theta'') = n(\theta') + 1$ .

The points DELAYER obtains is the maximal  $n(\theta'')$  after moves of FINISHER.

- ① The optimal value of this game is  $\text{awid}(F)$ .
- ② Again, there are quite a few equivalent characterisations.

FINISHER might always remove precisely all assignments made by DELAYER, and in this way we can prove:

$$\forall F \in \mathcal{CLS} : \text{awid}(F) \leq \text{hd}(F).$$

# Relations to resolution complexity

For  $F \in \mathcal{USAT}$  holds:

$$2^{\text{hd}(F)} \leq \text{Comp}_R^*(F) \leq (n(F) + 1)^{\text{hd}(F)}$$

$$\exp\left(\frac{1}{8} \frac{\text{awid}(F)^2}{n(F)}\right) < \text{Comp}_R(F) < 6 \cdot n(F)^{\text{awid}(F)+2}$$

where

- $\text{Comp}_R^*(F)$  is the minimal number of leaves in a tree resolution refutation of  $F$ ;
- $\text{Comp}_R(F)$  is the minimal number of nodes in a dag resolution refutation of  $F$ .

# Hierarchies

For  $k \in \mathbb{N}_0$ :

$$\begin{aligned} \mathcal{UC}_k &:= \{F \in \mathcal{CLS} : \text{hd}(F) \leq k\} \\ \mathcal{WC}_k &:= \{F \in \mathcal{CLS} : \text{awid}(F) \leq k\}. \end{aligned}$$

We have  $F \in \mathcal{UC}_k$  resp.  $F \in \mathcal{WC}_k$  iff for all prime implicates  $C$  of  $F$  there is a tree/dag resolution derivation of  $C$  from  $F$  such that

from all nodes there exists a path to some leaf of length at most  $k$

resp.

after removal of the literals of  $C$  from the refutation,  
for every resolution step at least one of the parent clauses  
has length at most  $k$ .

# Basic relations

$$UC_0 \subset UC_1 \subset UC_2 \subset \dots$$

$$WC_0 \subset WC_1 \subset WC_2 \subset \dots$$

$$UC_0 = WC_0$$

$$UC_1 = WC_1$$

$$UC_k \subset WC_k \text{ for } k \geq 2$$

$$UC_{k+1} \not\subseteq WC_k \text{ for } k \geq 0$$

$$WC_3 \not\subseteq UC_k \text{ for } k \geq 0.$$

Open Problem

*For the last relation, can we use  $WC_2$  ?*

# Decision complexity

$UC_0 = WC_0$  is decidable in polynomial time.

All  $UC_k, WC_k$  for  $k \geq 1$  are coNP-complete.

# Generalising known classes

$WC_0 = UC_0$  is the class of clause-sets which contain all their prime implicates.

The class  $UC := UC_1 = WC_1$  showed up in two different contexts:

- ①  $UC$  was introduced in [del Val \[5\]](#) for the purpose of Knowledge Compilation (KC).
- ② In [7] we showed  $UC = SLUR$ , for the umbrella class  $SLUR$  for polytime SAT decision as introduced in [Schlipf, Annexstein, Franco, and Swaminathan \[12\]](#).

More generally we have  $UC_k = SLUR_k$  for  $k \geq 0$ .

# Strong separation

In Gwynne and Kullmann [6] we show:

## Theorem

*For all  $k \geq 0$  there are (sequences of) short clause-sets in  $\mathcal{UC}_{k+1}$ , where all (sequences of) equivalent clause-sets in  $\mathcal{WC}_k$  are of exponential size.*

## Conjecture

*This strong separation holds between classes  $\mathcal{C}, \mathcal{D} \in \{\mathcal{UC}_p, \mathcal{WC}_q\}$  iff it is not trivially false, i.e., iff  $\mathcal{C} \not\subseteq \mathcal{D}$ .*

# Allowing auxiliary variables

Consider  $F, G \in \mathcal{CLS}$  with  $\text{var}(F) \subseteq \text{var}(G)$ .

## Definition

$G$  **represents**  $F$  if the satisfying assignments of  $G$  projected to  $\text{var}(F)$  are precisely the satisfying assignments of  $F$ .

## Conjecture

For all  $k \geq 0$  there are (sequences of) short clause-sets in  $\mathcal{UC}_{k+1}$ , where all (sequences of) representing clause-sets in  $\mathcal{WC}_k$  are of exponential size.

More generally, such a separation holds between classes  $\mathcal{C}, \mathcal{D} \in \{\mathcal{UC}_p, \mathcal{WC}_q\}$  iff it is not trivially false.

# The “relative condition”

If  $G$  represents  $F$ , then the **absolute condition** for  $G$  is a requirement

- $G \in \mathcal{UC}_k$  or
- $G \in \mathcal{WC}_k$

for some suitable  $k$ .

So the requirements on prime implicants also concern  
prime implicants containing auxiliary variables  
(i.e., variables in  $G$  but not in  $F$ ).

Now the **relative condition** considers only prime implicants with variables from  $F$ .

We then speak of **relative hardness**.

This is, when using auxiliary variables, a weaker requirement.

# Collapse under the relative condition

In [10] we show:

## Theorem

*Allowing representations with auxiliary variables, under the relative condition all classes  $\mathcal{UC}_k$ ,  $\mathcal{WC}_k$  collapse in polynomial time to  $\mathcal{UC}_0$  or  $\mathcal{UC}_1$ .*

## Conjecture

*There are (sequences of) clause-sets which have short representations of relative hardness 1, but for each  $k$  have only (sequences of) superpolynomial / exponential size representations in  $\mathcal{WC}_k$ .*

# Monotonisation of boolean functions

Consider a boolean function  $f$ .

We want partial assignments to  $f$ ,  
handled by a boolean function  $\widehat{f}$ .

- Every variable is doubled.
- So we can encode “not assigned”.

Now

$\widehat{f} = 0$  iff  
the corresponding partial assignment  
makes  $f$  unsatisfiable.

Example: the monotonisation of the bijective  $\text{PHP}_m^m$  function is the matching function (essentially).

# Monotone circuits

## Theorem

*Consider a boolean function  $f$  and a representation  $F$  with relative hardness 1. From  $F$  we can compute in time  $O(\ell(F) \cdot n(F)^2)$  a monotone circuit computing  $\widehat{f}$ .*

## Corollary

*Boolean functions  $f_n$  have a CNF-representation  $F_n$  with relative hardness 1 and  $\ell(F_n) = n^{O(1)}$  if and only if  $\widehat{f}_n$  can be computed by monotone circuits of size polynomial in  $n$ .*

(The predecessor of these results is [Bessiere, Katsirelos, Narodytska, and Walsh \[3\]](#) (with  $\widehat{f}$  “hidden”, and a more complicated proof).)

# No polysize good representations for XOR's

Exploiting Babai, Gál, and Wigderson [2] (monotone span programs):

## Theorem

*The size of representations of systems of XOR-constraints with bounded relative asymmetric width is super-polynomial in the number of constraints.*

# Strongly forcing

## Theorem

*From a clause-set  $F$  and  $V \subseteq \text{var}(F)$ , such that the relative asymmetric width of  $F$  w.r.t.  $V$  is a constant  $k$ , we can compute in polynomial time a  $G \in \mathcal{CLS}$  with  $V \subseteq \text{var}(G)$  such that*

- *$G$  represents the same boolean function w.r.t.  $V$  as  $F$ .*
- *$G$  has relative hardness 1.*
- *More strongly, for every partial assignment  $\varphi$  with  $\text{var}(\varphi) \subseteq V$ , running unit-clause propagation on  $\varphi * G$  will find all forced assignments on variables from  $V$ .*
- *Moreover, for every  $\varphi$  with  $\text{var}(\varphi) = V$ , such that  $\varphi * G$  is satisfiable, running unit-clause propagation on  $\varphi * G$  yields  $\top$ .*

The terminology “strongly forcing” has been developed in collaboration with Donald Knuth (for his forthcoming fascicle on satisfiability).

# Summary and outlook

- I Hopefully a theory of “good SAT representations” will emerge.
- II The translation of XOR-systems is a good first test-case: Despite the bad news “no poly-size good representation”, there seem to be a lot of opportunities for good representations (under various circumstances).
- III The conjectures seem to require new techniques; inside monotone circuits there should be corresponding subclasses.

End

(references on the remaining slides).

For my papers see

<http://cs.swan.ac.uk/~csoliver/papers.html>.

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