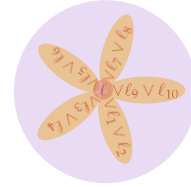


# MAJORITY-3SAT (and Related Problems) in Polynomial Time



---

... 1/4 1/2 1

 Ryan Williams

 Shyan Akmal

(appeared in FOCS'21)



# CNF-SAT

Given a CNF formula  $\phi$  over variables  $x_1, \dots, x_n$

**Question:** Is  $\phi$  satisfiable?

**Equivalent Question:** Is  $\Pr_{a \in \{0,1\}^n} [\phi(a) = 1] > 0$ ?

Is the fraction of satisfying assignments positive?

Complexity:  
NP-complete,  
even 3SAT

# #CNF-SAT

Given a CNF formula  $\phi$  over variables  $x_1, \dots, x_n$

**Question:** Compute number of SAT assigns to  $\phi$

**Equivalent Question:** Compute  $\Pr_{a \in \{0,1\}^n} [\phi(a) = 1]$

Determine the exact fraction of satisfying assignments

#P-complete,  
even #2SAT

# MAJ-SAT

Given a CNF formula  $\phi$  over variables  $x_1, \dots, x_n$

**Question:** Is  $\Pr_{a \in \{0,1\}^n} [\phi(a) = 1] \geq 1/2$ ?

**Equivalently:** Compute the most significant bit of the number of SAT assignments

**PP**-complete  
[Simon'75, Gill'77]  
 $P^{PP} = P^{\#P}$

# MAJ-kSAT

Given a  $k$ -CNF formula  $\phi$  over variables  $x_1, \dots, x_n$

**Question:** Compute MAJ-SAT for  $\phi$

**Complexity was still open!**

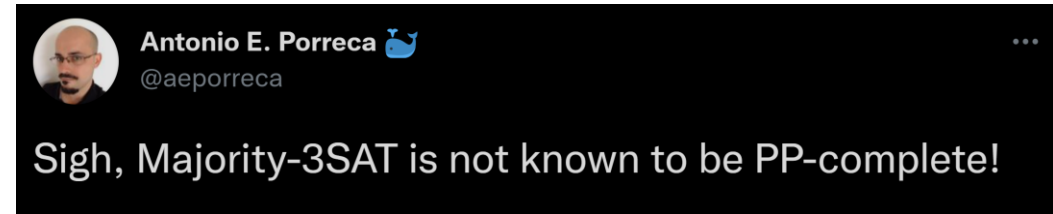
In some papers, the hardness of MAJ-3SAT and extensions was being *assumed* in order to show hardness for other problems...

[BDK'07] Computing if  $\#SAT(\phi) \geq 2^{n/2}$  is PP-complete for 3-CNF  $\phi$

It seems most people working in the area believed that MAJ-3SAT was PP-complete, and that we were just lacking a good reduction.

[PLMZ10]

Unfortunately, the resulting decision problem MAJORITY-3SAT is not known to be PP-complete. In particular, the standard reduction from SAT to 3SAT [5] is not applicable here, as it requires the addition of “dummy” variables, which increase the number of possible assignments without necessarily increasing the number of satisfying ones: this can decrease the ratio of satisfying assignments over total assignments from above  $1/2$  to a value less than or equal to this threshold.



[CM18]

restriction on  $k$ , we just write CNF). MAJSAT is PP-complete with respect to many-one reductions even if the input is restricted to be in CNF; however, it is not known whether MAJSAT is still PP-complete with respect to many-one reductions if the sentence  $\phi$  is in 3CNF. Hence we will resort in proofs to a slightly different decision problem, following results by Bailey et al. [7]. The problem

## Status of PP-completeness of MAJ<sub>3</sub>SAT

Asked 5 years, 8 months ago Modified 11 months ago Viewed 1k times



SHORT QUESTION: Is MAJ-3CNF a PP-complete problem under many-one reductions?

# It turns out MAJ-kSAT is actually easy...

## Theorem 1 (MAJ-3SAT is easy)

There is an algorithm which given a 3-CNF  $\varphi$  decides if  $\Pr[\varphi] \geq 1/2$  in linear time.

## Theorem 2 ( $\text{THR}_\rho$ -kSAT is easy)

Fix any positive integer  $k$  and rational  $\rho \in (0, 1)$  with constant denominator. There is an algorithm which given a  $k$ -CNF  $\varphi$  decides if  $\Pr[\varphi] \geq \rho$  in linear time.

# A Variant: Greater-Than-MAJ-SAT

## MAJ-SAT

Given a CNF formula  $\phi$ , is  $\Pr[\phi] \geq 1/2$ ?

PP-complete

## GtMAJ-SAT

Given a CNF formula  $\phi$ , is  $\Pr[\phi] > 1/2$ ?

PP-complete

## GtMAJ-3SAT

Given a 3-CNF  $\phi$ , is  $\Pr[\phi] > 1/2$ ?

**We prove:**

**P**

## GtMAJ-4SAT

Given a 4-CNF  $\phi$ , is  $\Pr[\phi] > 1/2$ ?

**NP-complete!**

# Greater-Than-MAJ-4SAT is NP-hard

Given a 3CNF  $\phi$  on variables  $x_1, \dots, x_n$ :  
introduce a new variable  $y$ , and add  $y$  to every clause of  $\phi$

The new formula has strictly more than  $\frac{1}{2}$  satisfying assignments if and only if  $\phi$  is satisfiable!

So **GtMAJ-4SAT** is NP-hard

It turns out there is also an NP verifier for this problem!

*There is a huge difference between MAJ-4SAT and GtMAJ-4SAT (assuming  $P \neq NP$ )*

# Exists-MAJ-SAT

## EMAJ-SAT

Given a CNF formula  $\phi(\vec{x}, \vec{y})$  on vars  $\vec{x}$  and  $\vec{y}$ ,  
is  $\exists a [\Pr_b [\phi(a, b)] \geq 1/2]$  true?

$NP^{PP}$ -complete

## EMAJ-kSAT

Given a  $k$ -CNF formula  $\phi(\vec{x}, \vec{y})$ ,  
is  $\exists a [\Pr_b [\phi(a, b)] \geq 1/2]$  true?

**We prove:**

**$P$  for  $k = 2$**

**$NP$ -complete for  $k \geq 3$**

**Many other results!**



# Outline for the Rest

- **Some Intuition**
- **MAJ-2SAT is Easy**
- **MAJ-3SAT is Easy**
- **Conclusion**

# Some Intuition...

## General CNFs

A single clause may have a high fraction of SAT assignments

$$\phi = (x_1 \vee \cdots \vee x_n) \qquad \Pr[\phi] = 1 - \frac{1}{2^n} \approx 1$$

## 2-CNFs

A single clause already restricts the fraction considerably

$$\phi = (x_a \vee x_b) \wedge \cdots \qquad \Pr[\phi] \leq \frac{3}{4}$$

Two “disjoint” clauses restrict the fraction further...

$$\phi = (x_a \vee x_b) \wedge (x_c \vee x_d) \wedge \cdots$$

$a, b, c, d$  are distinct indices

$$\Pr[\phi] \leq \left(\frac{3}{4}\right)^2 < 0.57$$

# Some Intuition...

## 2-CNFs

Three “disjoint” clauses already restrict the fraction below 1/2

$$\phi = (x_a \vee x_b) \wedge (x_c \vee x_d) \wedge (x_e \vee x_f) \wedge \dots \quad \Pr[\phi] \leq \left(\frac{3}{4}\right)^3 < 0.43$$

$a, b, c, d, e, f$  are distinct

**Completely analogous reasoning holds for  $k$ -CNFs!**

**If  $\phi$  contains a variable-disjoint set of  $t$  clauses of width  $k$ ,**

$$\Pr[\phi] \leq \left(1 - \frac{1}{2^k}\right)^t \leq e^{-\frac{t}{2^k}}$$

**So let's look for large sets of disjoint clauses!** But if we can't find them, we need to do something else...

# MAJ-2SAT Algorithm

**Idea:** Search For Variable-Disjoint Clause Sets

Given a 2-CNF  $\phi$ , is  $\Pr_{a \in \{0,1\}^n} [\phi(a) = 1] \geq 1/2$  ?

$\varphi = (x_1 \vee \neg x_2) \wedge$  } Satisfied at most  $3/4$  of the time  
 $(x_2 \vee \neg x_3) \wedge$       Implies that  $\Pr[\varphi] \leq 3/4$   
 $(x_4 \vee x_5) \wedge$  } An independent constraint  
 $(x_1 \vee \neg x_6) \wedge$       Implies that  $\Pr[\varphi] \leq (3/4)^2$   
⋮

# MAJ-2SAT Algorithm

## Greedy Algorithm for Disjoint Sets:

Initialize  $S := \emptyset$

Pass through the clauses one at a time

If clause  $C$  is variable-disjoint from all of  $S$ , add  $C$  to  $S$

Produces maximal disjoint set  $S$ :

*for all clauses  $C'$  not in  $S$ , there is a clause  $C$  in  $S$  such that  $C$  and  $C'$  share at least one variable*

$$\begin{aligned} \varphi = & (x_1 \vee \neg x_2) \wedge \\ & (x_2 \vee \neg x_3) \wedge \\ & (x_4 \vee x_5) \wedge \\ & (x_1 \vee \neg x_6) \wedge \\ & (x_4 \vee x_6) \wedge \\ & (x_7 \vee \neg x_2) \wedge \\ & (x_3 \vee x_7) \wedge \\ & (x_3 \vee x_4) \wedge \\ & \vdots \end{aligned}$$

# MAJ-2SAT Algorithm

Given a 2-CNF  $\varphi$  is  $\Pr[\varphi] \geq 1/2$  ?

1. Run greedy algorithm for disjoint sets, get back a clause set  $S$ .
2. Suppose  $|S| \geq 3$ .  
Implies  $\Pr[\varphi] \leq (3/4)^3 < 1/2$   
Return **NO** for MAJ-2SAT
3. Suppose  $|S| < 2$ ... *what to do, then?*

$$\begin{aligned} \varphi = & (x_1 \vee \neg x_2) \wedge \\ & (x_2 \vee \neg x_3) \wedge \\ & (x_4 \vee x_5) \wedge \\ & (x_1 \vee \neg x_6) \wedge \\ & (x_4 \vee x_6) \wedge \\ & (x_7 \vee \neg x_2) \wedge \\ & (x_3 \vee x_7) \wedge \\ & (x_3 \vee x_4) \wedge \\ & \vdots \end{aligned}$$

# MAJ-2SAT Algorithm: case of small $|S|$

Fact: If  $S$  is a **maximal disjoint set**, then the union of all variables in all clauses of  $S$  forms a **hitting set for all clauses in  $\phi$**

Hitting set  $H = \{x_1, x_2, x_4, x_5\}$

Consider any assignment  $\alpha : H \rightarrow \{0, 1\}$

This sets at least one variable in every clause, so the formula simplifies to a **1-CNF**

Example: If  $x_1, x_2, x_4 \mapsto 0$  and  $x_5 \mapsto 1$  ...

$$\phi = (x_1 \vee \neg x_2) \wedge$$

$$\varphi_\alpha = \neg x_3 \wedge$$

$$\neg x_6 \wedge$$

$$x_6 \wedge$$

$$x_7 \wedge$$

$$x_3 \wedge$$

$$\vdots$$

# MAJ-2SAT Algorithm: case of small $|S|$

It is easy to solve #SAT on 1-CNF!

If constraints are inconsistent:  $\Pr[\varphi_\alpha] = 0$

If constraints are consistent,  
and  $v$  distinct variables appear:  $\Pr[\varphi_\alpha] = 1/2^v$

$$\Pr[\varphi] = \sum_{\alpha: H \rightarrow \{0,1\}} \Pr[\varphi|\alpha]$$

Idea: Enumerate all assignments to  $H$  that satisfy the clauses they appear in, solve #1SAT on each subformula obtained.

We'll compute #SAT exactly in this case!

$$\begin{aligned} \varphi_\alpha = & \neg x_3 \wedge \\ & \neg x_6 \wedge \\ & x_8 \wedge \\ & x_7 \wedge \\ & x_9 \wedge \\ & \vdots \end{aligned}$$



# MAJ-2SAT Algorithm

Given a 2-CNF  $\varphi$  is  $\Pr[\varphi] \geq 1/2$  ?

1. Run greedy algorithm for disjoint sets, get back a clause set  $S$ .
2. Suppose  $|S| \geq 3$ .  
Implies  $\Pr[\varphi] \leq (3/4)^3 < 1/2$   
Return **NO** for MAJ-2SAT
3. Suppose  $|S| \leq 2$ .  
Try all SAT assignments to  $S$ , obtaining 1-CNFs. Solve #SAT on each of them to **determine #SAT** for the entire formula.

$$\begin{aligned} \varphi = & (x_1 \vee \neg x_2) \wedge \\ & (x_2 \vee \neg x_3) \wedge \\ & (x_4 \vee x_5) \wedge \\ & (x_1 \vee \neg x_6) \wedge \\ & (x_4 \vee x_6) \wedge \\ & (x_7 \vee \neg x_2) \wedge \\ & (x_3 \vee x_7) \wedge \end{aligned}$$

The same strategy works for *all* thresholds, not just  $\frac{1}{2}$

# Alternative Perspective: MAJ-2SAT

Every 2-CNF has one of two possible forms:

Random-Like

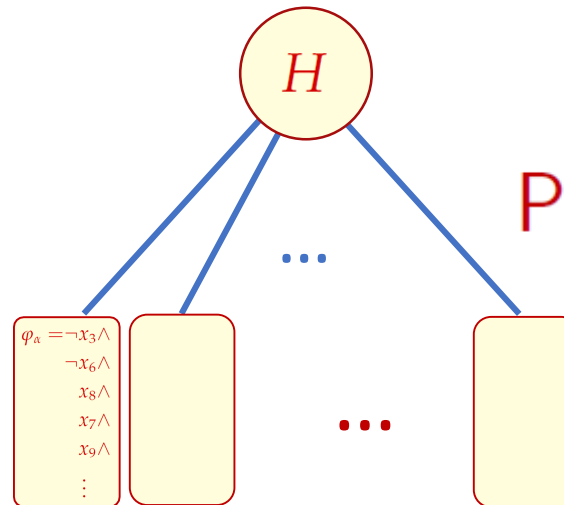
Structured

Has “Bad” Subformula

Small Sum of 1-CNFs

$\varphi = (x_1 \vee \neg x_2) \wedge$   
 $(x_2 \vee \neg x_3) \wedge$   
 $(x_4 \vee x_5) \wedge$   
 $(x_1 \vee \neg x_6) \wedge$   
 $(x_4 \vee x_6) \wedge$   
 $(x_7 \vee \neg x_2) \wedge$   
 $(x_3 \vee x_7) \wedge$   
 $(x_3 \vee x_4) \wedge$   
 $\vdots$

$\Pr[\varphi]$  is small



$\Pr[\varphi]$  is easy to compute

# MAJ-3SAT Algorithm

Given a 3-CNF  $\varphi$  is  $\Pr[\varphi] \geq 1/2$ ?

$$\varphi = (x_1 \vee \neg x_2 \vee x_7) \wedge$$

$$(x_2 \vee \neg x_3 \vee x_6) \wedge$$

$$(x_4 \vee x_5 \vee \neg x_8) \wedge$$

$$(x_1 \vee \neg x_6 \vee x_5) \wedge$$

⋮

⋮

} Satisfied at most  $7/8$  of the time

Implies that  $\Pr[\varphi] \leq 7/8$

If we find at least  $d$  disjoint clauses...

Implies that  $\Pr[\varphi] \leq (7/8)^d$

For  $d \geq 6$  we have  $\Pr[\varphi] \leq (7/8)^6 < 1/2$   
and we can report **NO**

What can we do when  $d < 6$ ?

# As before, we get a “small” hitting set

Hitting set

$$H = \{x_1, x_2, x_3, x_4, x_6, x_7\}$$

Any assignment  $\alpha : H \rightarrow \{0, 1\}$   
to  $\varphi$  induces a **2-CNF**  $\varphi_\alpha$

$$\Pr[\varphi] = \sum_{\alpha: H \rightarrow \{0,1\}} \Pr[\varphi_\alpha]$$

But now  $\Pr[\varphi_\alpha]$  is #P-hard to compute...

$$\begin{aligned} \varphi = & (x_1 \vee \neg x_2 \vee x_7) \wedge \\ & (x_3 \vee \neg x_4 \vee x_6) \wedge \\ & (x_1 \vee x_5 \vee \neg x_8) \wedge \\ & (x_5 \vee x_6 \vee \neg x_9) \wedge \\ & (x_6 \vee x_7 \vee x_8) \wedge \\ & \vdots \end{aligned}$$

# Search for Disjoint Sets... Again!

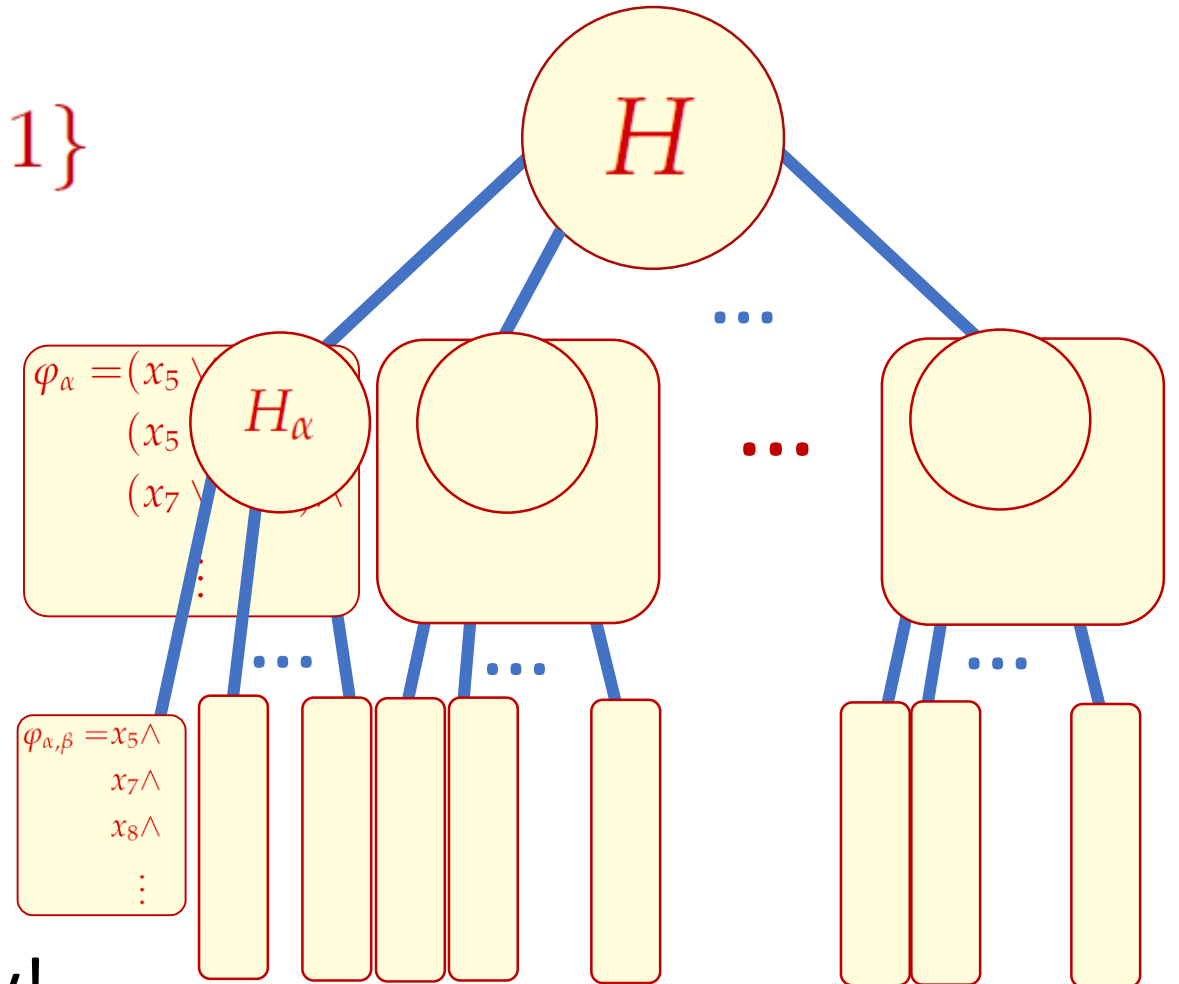
Try all assignments  $\alpha : H \rightarrow \{0,1\}$

For each 2-CNF  $\varphi_\alpha$ , look for **maximal disjoint set** in  $\varphi_\alpha$

**Either** (1) all these disjoint sets are “small”,  
**or** (2) a disjoint set is “large”

If all are small, obtain 1-CNFs

In case (1), compute  $\Pr[\varphi]$  exactly!



# Picking out a Sunflower

$$H = \{x_1, x_2, x_3, x_4, x_6, x_7\}$$

Suppose  $\varphi_\alpha$  has a disjoint set of size at least  $d$  ...

$$\begin{aligned}\varphi_\alpha = & (x_5 \vee \neg x_8) \wedge \\ & (x_9 \vee \neg x_{10}) \wedge \\ & (x_{11} \vee x_{12}) \wedge \\ & (x_{13} \vee \neg x_{14}) \wedge \\ & \vdots\end{aligned}$$

$$\begin{aligned}\varphi = & (\ell_1 \vee x_5 \vee \neg x_8) \wedge \\ & (\ell_2 \vee x_9 \vee \neg x_{10}) \wedge \\ & (\ell_3 \vee x_{11} \vee x_{12}) \wedge \\ & (\ell_4 \vee x_{13} \vee \neg x_{14}) \wedge \\ & \vdots\end{aligned}$$

# Picking out a Sunflower

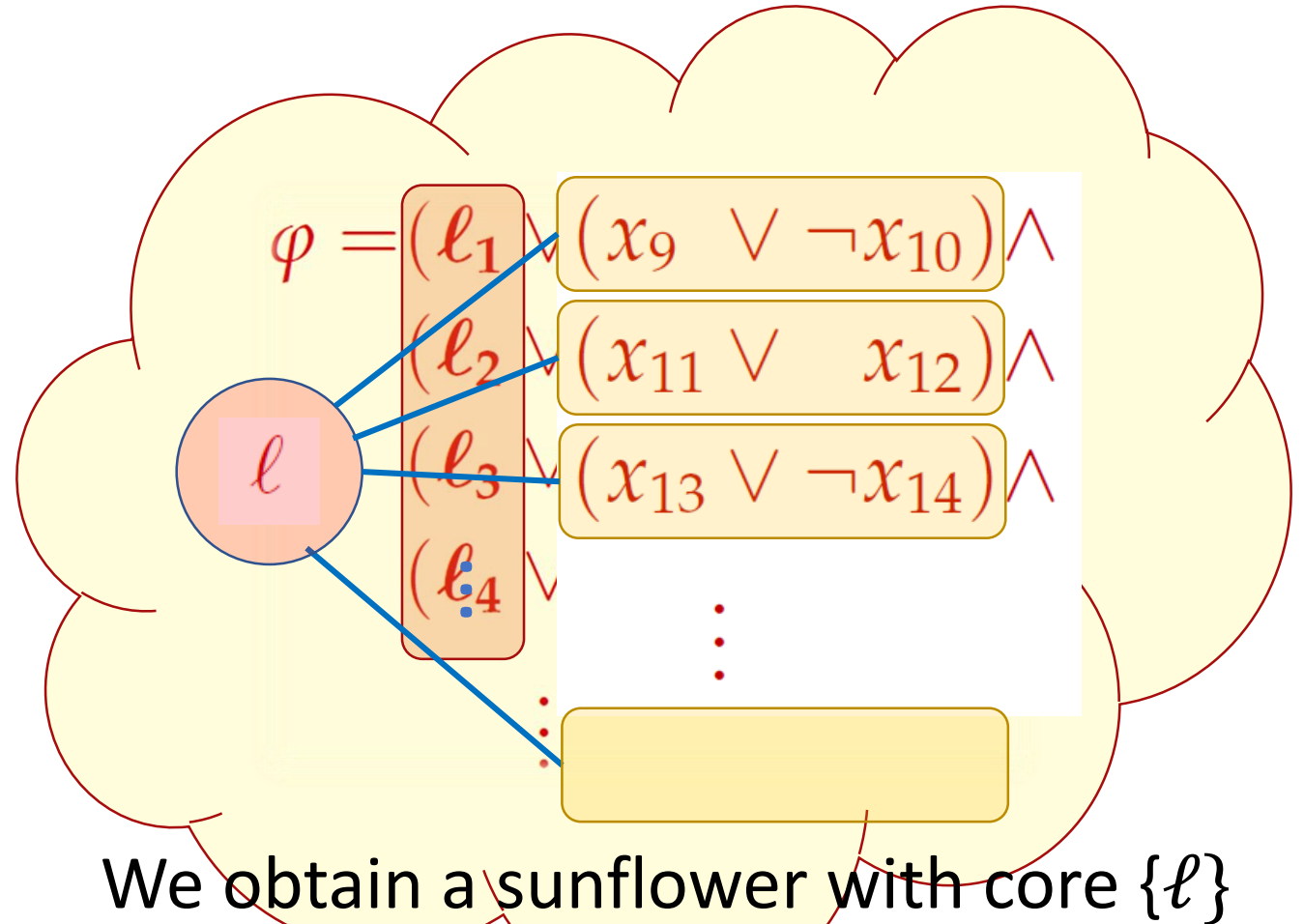
$$H = \{x_1, x_2, x_3, x_4, x_6, x_7\}$$

Suppose  $\varphi_\alpha$  has a disjoint set of size at least  $d$  ...

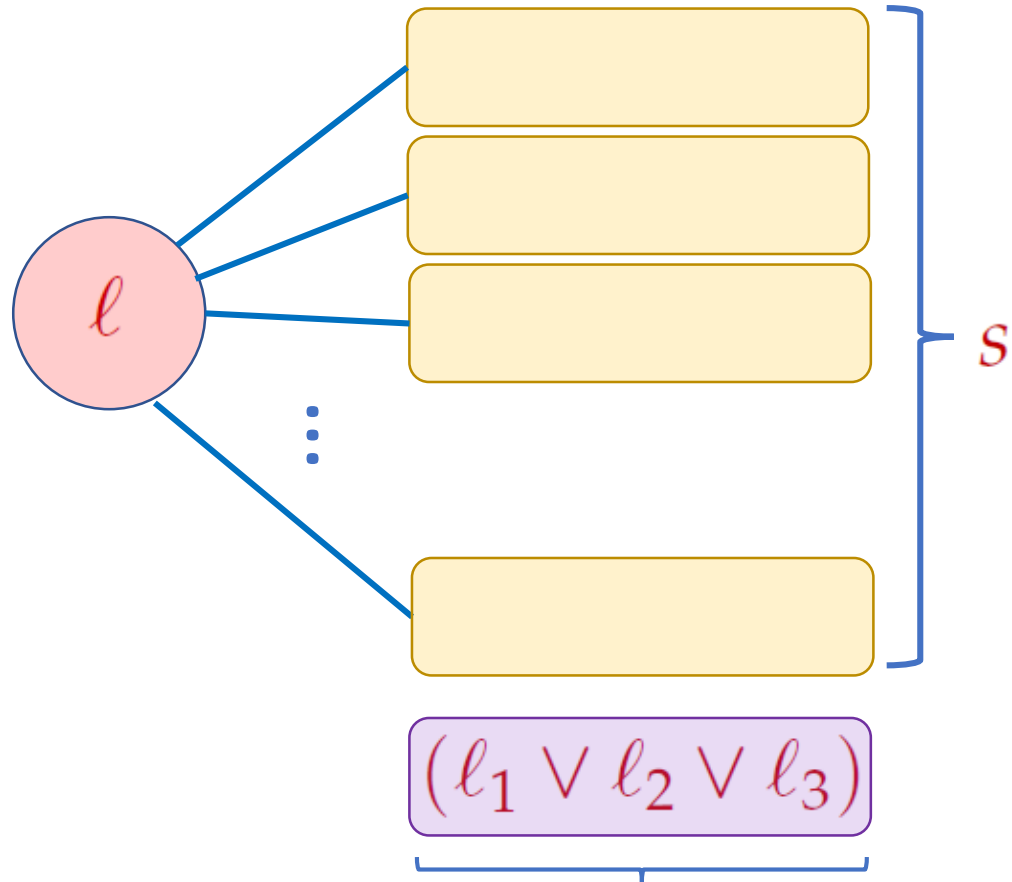
Some literal  $\ell$  from  $H$  must appear many times...

$$\geq d / (2|H|)$$

...by the pigeonhole principle



# How to use the sunflower



If  $l$  appears in **every** clause,  
then  $\Pr[\varphi] \geq 1/2$

Otherwise, for  $s \geq 8$ ,

$$\Pr[\varphi] \leq \underbrace{\frac{1}{2} \cdot \binom{7}{8}}_{l=1} + \underbrace{\frac{1}{2} \cdot \left(\frac{3}{4}\right)^s}_{l=0} < \frac{1}{2}$$

Different from  $l$

**MAJ-3SAT** resolved in either case!



# MAJ-3SAT Algorithm

1. Find a maximal disjoint set of clauses in  $\varphi$
2. If disjoint set has size  $\geq 6$ , return **NO** (same as MAJ-2SAT)
3. Otherwise, find a hitting set  $H$  of  $\leq 18$  variables for  $\varphi$
4. Try all SAT assignments to  $H$ , obtaining **2-CNFs**
5. For each **2-CNF**, find a maximal disjoint set
6. If all disjoint sets are  $\leq 7$ , obtain **1-CNFs** and **compute**  $\Pr[\varphi]$
7. Otherwise some disjoint set is  $\geq 8$ , yielding a “large” sunflower. If the sunflower core hits all clauses return **YES**, otherwise return **NO**

# High-Level Intuition for MAJ-3SAT Algorithm

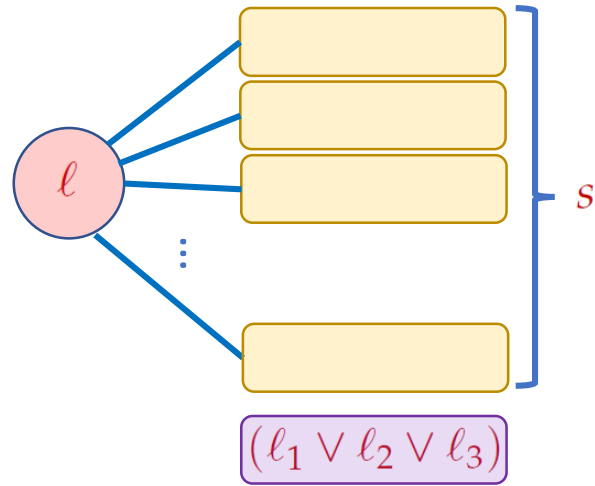
**“Bad” Subformula**

**Structured**

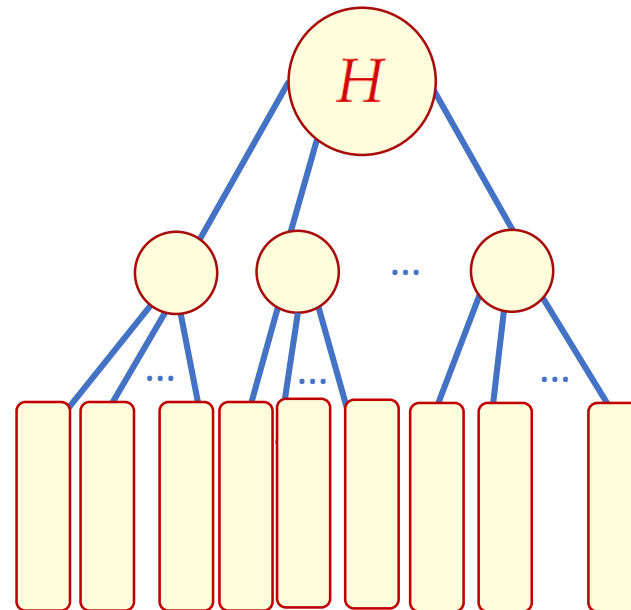
Big Disjoint Set

$$\varphi = \begin{aligned} & (x_1 \vee x_2 \vee x_7) \wedge \\ & (x_3 \vee x_4 \vee x_6) \wedge \\ & (x_5 \vee x_8 \vee x_9) \wedge \\ & (x_{10} \vee x_{13} \vee x_{14}) \wedge \\ & (x_{11} \vee x_{12} \vee x_{15}) \wedge \\ & (x_{16} \vee x_{17} \vee x_{18}) \wedge \\ & \vdots \end{aligned}$$

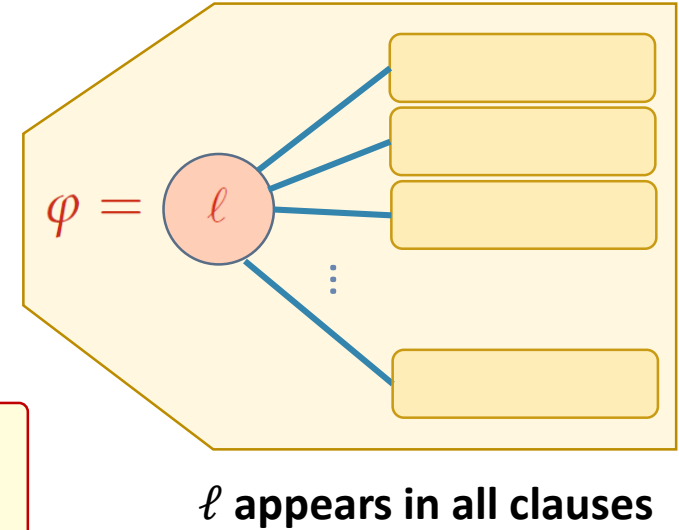
Sunflower + Extra



Sum of 1-CNFs



Just Sunflower



# Going Beyond MAJ-3SAT

MAJ-3SAT

3-CNF

$$\Pr[\varphi] \geq 1/2$$

MAJ- $k$ SAT

$k$ -CNF

$$\Pr[\varphi] \geq 1/2$$

THR $_{\rho}$ - $k$ SAT

3-CNF

$$\Pr[\varphi] \geq \rho$$

Extract More Disjoint Sets!

Extract More Sunflowers!

# Conclusion

Extract Disjoint Sets

Extract Sunflowers 

For 2-CNFs, either  $\Pr[\varphi]$  is either “easy” to compute, or *small*

For 3-CNFs, similar, but single literal may hit all clauses

In general: testing  $k$ -CNFs at any constant threshold is “easy”

## Some Future Directions:

What other problems have easy threshold versions?

Generalization to  $k$ -CSPs of domain  $d \geq 3$ ?

Better parameterized algorithms?

(Terrible running time dependence on  $k$ )

*Thank You!*