#### Constructive Proof of the Lovász Local Lemma

Ferienakademie im Sarntal — Course 1 Moderne Suchmethoden der Informatik: Trends und Potenzial

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#### Notation and Basic Definitions

- The *conjunctive normal form* (CNF) is a special notation form for boolean formulas.
- Example:

 $\underbrace{(x_1 \lor x_2 \lor x_3)}_{\text{clause}} \land \underbrace{(x_1}_{x_1} \lor x_3 \lor \overline{x_4}) \land (\overline{x_1} \lor \overline{x_2} \lor x_4) \land (x_2 \lor \overline{x_3} \lor x_4)}_{\text{literal}}$ This would be a 3-CNF formula with 4 clauses over the variables  $\{x_1, x_2, x_3, x_4\}$ . Variables in a clause do not repeat.

- In general: a k-CNF formula (k ∈ N) is a CNF formula where every clause contains exactly k literals
- An assignment α over variable set V is a mapping α : V → {0,1} that extends to V via α(x) := 1 − α(x) for x ∈ V

#### Notation and Basic Definitions

 $(x_1 \lor x_2 \lor x_3) \land (x_1 \lor x_3 \lor \overline{x_4}) \land (\overline{x_1} \lor \overline{x_2} \lor x_4) \land (x_2 \lor \overline{x_3} \lor x_4)$ 

- A formula is called *satisfiable* if there is a true-false assignment to the variables so that every clause has at least one literal that evaluates to true, in this case the assignment could be
   (x<sub>1</sub>, x<sub>2</sub>, x<sub>3</sub>, x<sub>4</sub>) → (true, true, false, true)
- vbl(C) is the set of variables that occur in a clause C
- $vbl(F) := \bigcup_{C \in F} vbl(C)$  for F a CNF formula

#### Simple probabilistic argument

It takes at least  $2^k$  clauses to construct an unsatisfiable k-CNF formula.

Justification: Suppose some k-CNF formula with fewer than  $2^k$  clauses.

An assignment sampled uniformly at random violates each clause with probability  $2^{-k}$ .

 $\Rightarrow$  By linearity of expectation: The expected total number of violated clauses is smaller than 1.

 $\Rightarrow$  Some of the assignments have to satisfy the whole formula.

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#### Local constraints

The constraint on the formula size needs not only to be satisfied globally but even locally.

The neighbourhood  $\Gamma(C) = \Gamma_F(C) := \{D \in F | vbl(D) \cap vbl(C) \neq \emptyset\}$ of a clause C is the set of clauses that share variables with C.

If we can change values in a clause C without causing too much damage in its neighbourhood, and if this property holds everywhere, then maybe we can find a globally satisfying assignment by just moving around violation issues.

If every clause in a k-CNF formula,  $k \ge 1$ , has a neighbourhood of size at most  $2^k/e - 1$ , then the whole formula admits a satisfying assignment.

Lovász Local Lemma, 1975

Other variant:

"In an unsatisfiable CNF formula clauses have to interleave - the larger the clauses, the more interleaving is required."

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#### **Useful Definitions**

- The conflict-neighbourhood Γ'(C) = Γ'<sub>F</sub>(C) := {D ∈ F | C ∩ D ≠ ∅} of a clause C is the set of clauses which share variables with C, at least one with opposite sign.
- *lopsided Local Lemma* shows the condition for neighbourhoods holds actually for conflict-neighbourhoods
- The degree of x is the number of occurrences of a variable x (with either sign) in a CNF formula,
   deg(x) = deg<sub>F</sub>(x) := |{C ∈ F | x ∈ vbl(C)}|

Claim If every variable in a k-CNF formula,  $k \ge 1$ , has degree at most  $2^k/(ek)$ , then the formula is satisfiable.

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#### **Useful Definitions**

For observing the quality of interleaving we define:

• A *linear CNF formula* is a CNF formula where any two clauses share at most one variable.

Example:  $(\overline{y_1} \lor \overline{y_2}) \land (y_1 \lor x) \land (y_2 \lor x) \land (z_1 \lor \overline{x}) \land (z_2 \lor \overline{x}) \land (\overline{z_1} \lor \overline{z_2})$ This is a smallest unsatisfiable linear 2-CNF formula.

Claim Any linear k-CNF formula with at most  $4^k/(4e^2k^3)$  clauses is satisfiable.

## Algorithms

- Whenever the easily checkable conditions formulated above are satisfied, then the algorithmic problem of deciding satisfiability becomes trivial.
- The actual construction of a satisfying assignment is by no means obvious.

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- Define f(k), k ∈ N, as the largest integer so that every k-CNF formula with no variable of degree exceeding f(k) is satisfiable.
- $f(k) = \Theta(2^k/k)$
- For k-CNF formulas (k ≥ 3) with max-degree at most f(k) + 1 the satisfiability problem becomes NP-complete.
- l(k) is defined as the largest integer d such that every k-CNF formula F for which  $|\Gamma_F(C)| \le d$ , for all  $C \in F$ , is satisfiable.
- lc(k) is defined analogously, but with  $|\Gamma'_F(C)| \le d$ .

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## Hypergraphs

- A hypergraph H is a pair (V, E) with V a finite set and  $E \subseteq 2^V$ .
- It is k-uniform if |e| = k for all  $e \in E$ .
- *H* is called *2-colourable* if there is a colouring of the vertices in *V* by two colors red and green so that no hyperedge in *E* is monochromatic.

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#### Introduction

 Relation to satisfiability of CNF formulas: H = (V, E) is 2-colourable iff the CNF formula E ∪ {ē|e ∈ E}, with V now considered as set of boolean variables, is satisfiable.



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#### Local Lemma in Terms of SAT - Proof and Algorithm

**Theorem 1** Let  $k \in \mathbb{N}$  and let F be a k-CNF formula. If  $|\Gamma(C)| \leq 2^k/e - 1$  for all  $C \in F$ , then F is satisfiable. P. Erdős, L. Lovász: Problems and results on 3-chromatic hypergraphs and some related questions.

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## History of Theorem 1

1975 "existential" proof : short but non-constructive

- 1991 Beck proved the existence of a polynomial-time algorithm to find a satisfying assignment for all  $C \in F$ , F a k-CNF formula  $\Gamma(C) \leq 2^{k/48}$ .
- 1991 Alan simplified Beck's algorithm by randomness, and presented an algorithm that works for neighbourhoods of size up to  $2^{k/8}$ .
- 2000 Czumaj and Scheideler demonstrated that a variant of the method can be made to work for the case where clauses sizes vary.
- 2008 Srinivasan improved the time to essentially  $2^{k/4}$ .
- 2008 Moser published an polynomial-time algorithm for neighbourhood sizes up to  $O(2^{k/2})$ , later for  $2^{k-5}$  neighbours.
- 2009 Moser and Tardos published a fully constructive proof.

k = 1	р
Ø	1
x <sub>1</sub>	$\frac{1}{2}$
$x_1 \wedge x_2$	$\frac{1}{4}$
$x_1 \wedge x_2 \wedge x_3$	$\frac{1}{8}$
$x_1 \wedge x_2 \wedge x_3 \wedge x_4$	$\frac{1}{16}$

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k = 2	р
Ø	1
$(x_1 \lor x_2)$	$\frac{3}{4}$
$(x_1 \lor x_2) \land (x_3 \lor x_4)$	$\frac{9}{16}$
$(x_1 \lor x_2) \land (x_3 \lor x_4) \land (x_5 \lor x_6)$	$\frac{27}{64}$

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#### First Proof of Local Lemma - Existence

- F k-CNF formula, neighbourhood size at most  $d := \frac{2^k}{e} 1$
- If the probability of a random assignment  $\alpha$  to satisfy F is positive, F is satisfiable.
- $F' \subset F$  subformula of F with one fewer clause,  $C \in F \setminus F'$  one of the clauses removed
- $\alpha$  has probability Pr(F') of satisfying F'
- We want to compute the drop in probability when adding back C. Claim: the factor is bounded by  $(1 - e2^{-k})$ , which means  $Pr(F' \wedge C) \ge (1 - e2^{-k})Pr(F')$ .
- If the factor is positive, the claim is proved.

#### Induction

- Suppose the latter claim has been proved for all subformulas F' up to a given size.
- trivial special case: If C is independent from F', the probability decreases by a factor of exactly  $(1 2^{-k})$ .
- Otherwise we remove all clauses of F' neighbouring C and get  $F'' := F' \setminus \Gamma(C)$

• 
$$\Rightarrow \Pr(F'' \land \neg C) = 2^{-k}\Pr(F'')$$

• By adding back all clauses one by one to F'' to get F' we obtain  $Pr(F') \ge (1 - e2^{-k})^d Pr(F'') \ge e^{-1}Pr(F'')$  $Pr(F' \land \neg C) \le Pr(F'' \land \neg C) = 2^{-k}Pr(F'')$ 

$$\Rightarrow \frac{\Pr(F' \land \neg C)}{\Pr(F')} \leq \frac{2^{-k}}{e^{-1}}$$

#### Second Proof of Local Lemma - Algorithm

- Algorithm: We repeatedly select any of the violated clauses and just select new uniformly random variables occurring in that clause until a satisfying assignment is obtained. Analysis:
- We record a log of corrections with the mapping  $L: \mathbb{N}_0 \to F$
- Let N : F → N<sub>0</sub> ∪ {∞} be random variables that count the number of times a given clause occurs in the log.
- We prove now that for each clause  $C \in F$  the expected value E[N(C)] is upper bounded by a constant.
- To continue we introduce witness trees. A witness tree is an unordered, rooted tree *T* along with a labelling *σ* : *V*(*T*) → *F* of its vertices *V*(*T*) by clauses from *F*.
- We label the root vertex  $r \sigma(r) := L(t)$ .
- Now we traverse the log backwards and for each time step

s = t - 1, t - 2, ..., 0, check if the clause L(s) has any variables that it shares with any of the labels in the tree built so far.

• If *L*(*s*) is independent from all clauses currently serving as labels, discard it.

Otherwise select any deepest of the nodes the tree has in common with L(s) and create a new child node of it, labelling that new child L(s)

- When arriving at *s* = 0 we have built a witness tree *T*(*t*) that justifies correction step *t*.
- By traversing T(t) in a breadth-first-search that starts at the root we obtain a sequence of clauses that is a subsegment of the execution log.
- The way we defined T(t) assures two things:
  (a) The ordering in which the corrections have taken place is similar to the ordering in which we traverse the nodes.
  (b) When we traverse some node v representing correction step t, then all correction steps t' < t that relate to step t do occur in the tree and have therefore been traversed before.</li>

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 $\Rightarrow$  The number of times some variable x has occurred so far in labelling clauses corresponds to the number of times x has been reassigned new values before the corresponding correction step.

- What about when you have given a fixed witness tree *T*?
- We can reconstruct k of the random bits the algorithm has used.
- If the tree has *n* vertices, we can reconstruct *nk* bits in total.
- The probability that T can be constructed is exactly  $2^{-nk}$ .
- For a fixed clause *C* ∈ *F*, number *n* we want the number of witness trees of order *n* which have *C* as the label of their root vertex.
- We embed each witness tree rooted at label *C* into an infinite tree that just enumerates neighbouring nodes.
- Consider an infinite tree with its root labelled C and such that each node v labelled σ(v) has |Γ(σ(v))| children labelled Γ(σ(v)).

- An infinite rooted (≤ d)-ary tree has at most (ed)<sup>n</sup> subtrees of size n.
   ⇒ There are at most (ed)<sup>n</sup> witness trees of order n that have C as their root label.
- The expected number of witness trees of size n that can occur is bounded by (ed2<sup>-k</sup>)<sup>n</sup>.
- Summing over all possible sizes *n* ≥ 1 this becomes a geometric series that converges to a constant.

 $\Rightarrow$  There is at most a constant expected number of valid witness trees rooted at *C*.

- For each of the *N*(*C*) times a clause *C* occurs in the execution log we can ask for a corresponding witness tree to justify that correction step.
- *N*(*C*) is at most as large as the number of valid witness trees rooted at *C*, which is bounded by a constant in expectation. □

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#### A Stronger Variant - Conflicts

**Theorem 3** Let  $k \in \mathbb{N}$  and let F be a k-CNF formula. If  $|\Gamma'(C)| \leq 2^k/e - 1$  for all  $C \in F$ , then F is satisfiable.

• Berman, Karpinski and Scott have demonstrated using the lopsided Local Lemma, that every 6-, 7-, 8- or 9-CNF formula in which every variable occurs at most 7, 13, 23 or 41 times, respectively, is satisfiable.

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#### Bounded Variable Degree

- A *k*-CNF formula in which no variable occurs in more than *d* clauses is called a (*k*, *d*)-CNF formula.
- f(k) is now defined as the unique integer so that all (k, f(k))-CNF formulas are satisfiable.
- $0 \leq f(k) \leq 2^k$
- Tovey was the first to consider f(k) in 1984
- He showed f(k) ≥ k and conjectured that all (k, 2<sup>k-1</sup> − 1)-CNF formulas are satisfiable.
- k(d − 1) ≤ 2<sup>k</sup>/e − 1 implies that every (k, d)-CNF formula is satisfiable
- Kratochvíl, Savický and Tuza established 1993 that and the bounds of  $f(k) \ge \lfloor 2^k/(ek) \rfloor$  and  $f(k) \le 2^{k-1} 2^{k-4} 1$
- Savický and Sgall showed  $f(k) = O(k^{-0.26}2^k)$  (2000), Hoory and Szeider improved it to  $f(k) = O((2^k \log k)/k)$  (2006). Recently Gebauer settled  $f(k) = \Theta(2^k/k)$

**Theorem 4** For k a large enough integer,

 $\lfloor 2^k/ek \rfloor \leq f(k) < 2^{k+1}/k.$ 

If k is a sufficiently large power of 2 we have  $f(k) < 2^k/k$ .

- Proof of the upper bound with a Combinatorial game:
- Maker wants to completely occupy a hyperedge and Breaker tries to prevent this.
- The problem is to find the minimum d = d(k) such that there is a k-uniform hypergraph of maximum vertex degree d where Maker has a winning strategy.
- If the Maker uses a pairing strategy, this game is equivalent to unsatisfiability.

- A hypergraph *H*, pairing *P* can be interpreted as a CNF formula *F* where the hyperedges of *H* are clauses and two vertices of a pair of *P* are complementary literals.
- Maker wins the game on *H* using the pairing strategy according to *P* if and only if *F* is unsatisfiable.

If there is a k-uniform hypergraph of maximum vertex degree d with a winning pairing strategy for Maker, then there is an unsatisfiable (k, 2d) - CNF formula.

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#### Small Values

**Lemma** Let F be a minimal unsatisfiable CNF formula. Consider x and  $C \in F$  with  $x \in vbl(C)$ . Then there is a clause D with the property that x is the unique variable that appears in C and D with opposite signs.

*Proof.* F is minimal  $\Rightarrow F \setminus \{C\}$  has satisfying assignment  $\alpha$ .  $\alpha$  cannot satisfy C, because F is assumpted to be unsatisfiable. We switch the value of x to satisfy C. Now some other clause  $D \in F$  is violated.

 $\Rightarrow D$  serves the purpose

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Lemma 3 (1)  $f(k) \ge k$  for  $k \ge 1$  and (2)  $l(k) \ge lc(k) \ge k$  for  $k \ge 2$ 

- k ≥ 1, F a k-CNF formula over a variable set V, no variable occurring in more than k clauses.
- Consider the incidence graph between clauses and variables.
- Hall's condition for a matching covering all clause-vertices holds.
- An assignment is now defined by letting every variable x that is matched to a clause C map to the value so that it satisfies C.
- The matching property prevents conflicts and no matter how we complete the assignment for unmatched variables it will satisfy all clauses.  $\Rightarrow$  (1)

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(2)  $l(k) \ge lc(k) \ge k$  for  $k \ge 2$ 

- Let  $k \ge 2$ . We will actually prove  $lc(k) \ge \lceil (f(k)+1)/2 \rceil + k 2$ . This yields  $\lceil (3k-3)/2 \ge k \rceil$ .
- This means we have to show that every unsatisfiable k-CNF formula F contains a clause C with  $|\Gamma'(C)| \ge \lceil (f(k) + 1)/2 \rceil + k 1$ .
- Minimal unsatisfiable k-CNF formula G ⊆ F. G has variable x with deg<sub>G</sub>(x) ≥ f(k) + 1, w.l.o.g. we assume x̄ occurs at least [(f(k) + 1)/2] times.
- We choose  $C \in G$  with literal x.  $\Gamma'_G(C)$  contains all clauses with  $\overline{x}$ .
- ∀z ∈ C\{x}∃D<sub>z</sub> ∈ G: z is the unique variable that appears in C and D<sub>z</sub> with opposite signs.
- $\Rightarrow |\Gamma'_{\mathcal{G}}(\mathcal{C})| \ge \lceil (f(k)+1)/2 \rceil + k 1$
- With  $\Gamma'_F(C) \supseteq \Gamma'_G(C)$  this concludes the argument.

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- f(k) = k is known for  $k \le 4$ , the best known bounds for k = 5 are  $5 \le f(5) \le 7$ .
- k = 6 is the first value for which the bound in Lemma 3(1) is known not to be tight: 7 ≤ f(6) ≤ 11.

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#### Linear Formulas

- A CNF formula F is linear if  $|vbl(C) \cap vbl(D)| \le 1$ ,  $C, D \in F, C \ne D$
- A hypergraph H = (V, E) is linear if |e ∩ f| ≤ 1 for any two distinct edges e, f ∈ E.
- Given a k-uniform non-2-colorable hypergraph H with m hyperedges, we immediately obtain an unsatisfiable k-CNF formula F(H) with 2m clauses

#### Linear Formulas

Let f<sub>lin</sub>(k) be the largest integer so that every linear (k, f<sub>lin</sub>(k))-CNF formula is satisfiable. f<sub>lin</sub> ≥ f(k) ≥ ⌊2<sup>k</sup>/(ek)⌋

**Theorem 6** Any unsatisfiable linear k-CNF formula has at least

$$\frac{1}{k}(1+f_{lin}(k-1))^2 > \frac{4^k}{4e^2k^3}$$

clauses. There exists an unsatisfiable linear k-CNF formula with at most  $8k^34^k$  clauses.

Remark. 
$$\frac{1}{k}(1+f_{lin}(k-1)^2) \le 8k^34^k$$
 follows thus  $f_{lin}(k-1) \in O(k^22^k)$ .

*Proof.* Similar to the proof for the size of non-2-colourable linear *k*-uniform hypergraphs in "Problems and results on 3-chromatic hypergraphs and some related questions" (Erdős, Lovász).

**Lemma 5** Let F be a linear k-CNF formula. If there are at most  $f_{lin}(k-1)$  variables of degree exceeding  $f_{lin}(k-1)$ , then F is satisfiable.

Let X be the set of variables x with  $deg_F(x) > f_{lin}(k-1)$ . If F is unsatisfiable  $|X| > f_{lin}(k-1)$ . Therefore the lower bound follows from

$$|F| = \sum_{x \in vbl(F)} deg_F(x) \ge rac{1}{k} (1 + f_{lin}(k-1))|X| \ge rac{1}{k} (1 + f_{lin}(k-1))^2$$

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#### Proof of Lemma 5

- For a literal *u* let  $deg_F(u)$  be the degree of the variable underlying *u* in *F*.
- First we construct a linear (k 1)-CNF formula F' as follows:
- For every clause  $C \in F$ , let  $u_C$  be a literal of C that maximises  $deg_F(u_C)$ . We write  $C' := C \setminus \{u_C\}$ ,  $F' := \{C' | C \in F\}$
- We claim that  $deg_{F'}(x) \leq f_{lin}(k-1)$  for all variables x, thus F' and therefore F is satisfiable
- Consider a variable x. Clearly deg<sub>F</sub>(x) ≤ deg<sub>F</sub>(x) and so if deg<sub>F</sub>(x) ≤ f<sub>lin</sub>(k − 1) we are done.
- Otherwise let C'<sub>1</sub>,..., C'<sub>t</sub>, t = deg<sub>F'</sub>(x) be clauses in F' containing x or x̄. There are clauses C<sub>i</sub>,..., C<sub>t</sub> in F such that C'<sub>i</sub> = C<sub>i</sub> \{u<sub>C<sub>i</sub></sub>}, 1 ≤ i ≤ t.
- By choice of  $u_{C_i}$ ,  $deg_F(u_{C_i}) \ge deg_F(x) > f_{lin}(k-1)$ . Since F is linear, the  $u_{C_i}$ 's have to be distinct, thus  $t \le f_{lin}(k-1)$   $\Box$

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Proof of the upper bound: There exists an unsatisfiable linear k-CNF formula with at most  $8k^34^k$  clauses.

- Take a linear *k*-uniform hypergraph *H* = (*V*, *E*) with *n* vertices and *m* edges.
- We now replace each literal in each clause by its complement with probability  $\frac{1}{2}$ , independently on each clause. Let *F* denote the resulting (random) formula.
- Any fixed assignment α has a 1 − 2<sup>-k</sup> chance of satisfying a given clause of F, and thus: Pr[[]α satisfies F] = (1 − 2<sup>-k</sup>)<sup>m</sup> ≤ e<sup>-m2<sup>-k</sup></sup> There are 2<sup>n</sup> distinct assignments, hence by the union bound Pr[[]some α satisfies F] < 2<sup>n</sup>e<sup>-m2<sup>-k</sup></sup> = c<sup>ln(2)n-m2<sup>-k</sup></sup>
- If m/n ≥ ln(2)2<sup>k</sup>, the second expression is at most 1,
   ⇒ with positive probability no assignment satisfies F.

- We construct a linear k-uniform hypergraph with few hyperedges, but with a large hyperedge-vertex ratio. Let q ∈ {k,...,2k} be a prime power.
- Choose  $d \in \mathbb{N}$  such that  $q^2 \ln(2) 2^k \leq q^d < q^3 \ln(2) 2^k$  and set  $n := q^d$ .
- Consider the *d*-dimensional vector space  $\mathbb{F}_q^d$ . By choice of *d* we have  $nln(2)2^k \leq \frac{n^2}{q^2}$ , hence we can choose  $m := nln(2)2^k$  distinct lines in  $\mathbb{F}_q^d$ .
- Form each such line arbitrarily select *k* points and form a hyperedge.
- Let *E* be the set of all *m* hyperedges formed this way. Thus,  $H = (\mathbb{F}_q^d, E)$  is a *k*-uniform hypergraph. It is a linear hypergraph, since any pair of distinct lines intersect in at most one point.
- By construction,  $\frac{m}{n} = ln(2)2^k$ , and  $m = nln(2)2^k \le q^3 ln(2)^2 4^k \le ln(2)^2 8k^3 4^k$ , which proves the upper bound.  $\Box$

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#### A Sudden Jump in Complexity

- Tovey (1984): For 3-CNF formulas with maximum variable degree f(3) + 1 = 4 satisfiability is NP-complete.
- Kratochvíl, Savický and Tuza (1993) generalised this sudden jump: For every fixed k ≥ 3, satisfiability of (k, f(k) + 1)-CNF formulas is NP-complete.
- Berman, Karpinski and Scott (2003) showed that for (k, f(k) + 1)-CNF formulas it is even hard to approximate the maximum number of clauses that can be simultaneously satisfied

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#### **Theorem 9** Let $k \ge 3$ . Then,

(1) deciding satisfiability of k-CNF formulas with variable degrees at most f(k) + 1 is NP-complete
(2) deciding satisfiability of k-CNF formulas with clause neighbourhoods of size at most max{k + 3, l(k) + 2} is NP-complete
(3) deciding satisfiability of k-CNF formulas with clause conflict-neighbourhoods of size at most lc(k) + 1 is NP-complete

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# General contruction of $\hat{\mathsf{F}}$ for $\mathsf{F}$ so that $\hat{\mathsf{F}}$ is satisfiable iff $\mathsf{F}$ is satisfiable

• For a set of  $j \ge 2$  variables,  $U = \{x_0, x_1, \dots, x_{j-1}\}$ , the 2-CNF formula

$$\{\{x_0,\overline{x_1}\},\{x_1,\overline{x_2}\},\ldots,\{x_{j-2},\overline{x_{j-1}}\},\{x_{j-1},\overline{x_0}\}\}$$

is called an equaliser of U.

- Let F be a k-CNF formula, k ≥ 3. For each variable x ∈ vbl(F), we replace every occurrence by a new variable inheriting the sign of x in this occurrence.
- This yields a k-CNF formula F' with |F| clauses over a set of k|F| variables.
- For each x ∈ vbl(F) we add an equaliser for the set of variables that have replaced occurrences of x.
- This gives a set F'' of at most k|F| 2-clauses.
- $\hat{\mathsf{F}} := F' \cup F''$  is satisfiable iff F is satisfiable.

- every variable of vbl( $\hat{F})$  occurs at most 3 times in  $\hat{F}$
- each k-clause in F' does not share variables with any other clause in F' and the number of its neighbouring 2-clauses in F" is at most 2k; at most k of the 2-clauses are in the conflict-neighbourhood
- each 2-clause in F" neighbours two k-clauses in F' and at most two 2-clauses in F"

Proof of (1) (variable degrees)

- Let k ≥ 3 and fix some minimal unsatisfiable (k, f(k) + 1)-CNF formula G.
- Choose some clause C in G and replace one of its literals by x̄ for a new variable x to get G(x).
- G(x) is satisfiable, every satisfying assignment has to set x to 0, all variables have degree at most f(k) + 1 and  $deg_{G(x)}(x) = 1$
- Given a k-CNF formula F we first generate F̂. Then we augment each 2-clause in F̂ by (k − 2) positive literals of new variables so that it becomes a k-clause.
- For each new variable x we add a copy of G(x) to our formula. By renaming variables in G these copies are chosen so that their variable sets are pairwise disjoint.
- The new formula is satisfiable iff  $\hat{\mathsf{F}}$  is satisfiable.
- The maximum variable degree is  $max\{3, f(k) + 1\}$ , which is f(k) + 1
- This constitutes a polynomial reduction of satisfiability of general k-CNF formulas to satisfiability of k-CNF formulas with maximum variable degree f(k) + 1.

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#### Proof of (2) (neighbourhoods)

- Let  $k \ge 3$ . Fix some minimal unsatisfiable k CNF formula G where all neighbourhoods have size at most l(k) + 1.
- We choose some clause C and replace one of its lieterals by  $\overline{x}$  for a new variable x, resulting in a k-CNF formula G(x) that forces x to 0 in every satisfying assignment.
- Starting from a 3-CNF formula *F* we proceed as before:
- We produce  $\hat{F}$  consisting of 3- and 2-clauses, we augment all clauses to *k*-clauses with disjoint copies of G(x) for each new variable *x*.
- A 3-clause in F' had 6 neighbours in  $\hat{F}$  and gained k 3 new neighbours, so there are at most k + 3.
- A 2-clause had 4 neighbours and gets an extra neighbour for each of the k - 2 new literals, which makes k + 2 neighbours.
- In a copy G(x) all clauses stay with a neighbourhood of size at most l(k) + 1 except for the special clause C where we have planted the new literal x̄. This clause may now have l(k) + 2 neighbours.
- ⇒ bound of max{k + 3, l(k) + 2} and the polynomial reduction from satisfiability of general 3-CNF formulas is completed.

• Given a variable set  $U = \{x_0, x_1, \dots, x_{j-1}\}, j \ge 2$ , let  $W = \{z_0, z_1, \dots, z_{j-1}\}$  be a set of variables disjoint from U. The  $(U \cup W)$ -equaliser  $\{\{x_0, \overline{z_0}\}, \{z_0, \overline{x_1}\}, \{x_1, \overline{z_1}\}, \{z_1, \overline{x_2}\}, \dots, \{z_{j-2}, \overline{x_{j-1}}\}, \{x_{j-1}, \overline{z_{j-1}}\}, \{z_{j-1}, \overline{x_0}\}\}$ 

is called a stretched equaliser of U.

• the 2-clauses in stretched equalisers have a conflict with two other 2-clauses but to at most one of the k-clauses in F'

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Proof of (3) (conflict-neighbourhoods)

- k ≥ 3, fix minimal unsatisfiable k-CNF formula G with conflict-neighbourhood size at most lc(k) + 1
- Recall from Lemma 4: G must have a pair of clauses C and D which share a unique variable, say y, in a conflicting manner.
- Choose a new variable x and replace y in C by  $\overline{x}$ . This the building block G(x) forcing x to be 0. The clause C' containing  $\overline{x}$  has a conflict-neighbourhood of size at most lc(k).
- Given F, a k-CNF formula, we move on to F and then expand 2-clauses with the help of new variables that are forced to 0 by disjoint copies of G(x).
- In the final product k-clauses in F' have at most k conflict-neighbours, k-clauses obtained from augmenting 2-clauses have at most 3 + (k 2) = k + 1 conflict-neighbours, and clauses in copies of G(x) have conflict-neighbourhoods of size at most lc(k + 1).
- The maximum size of a conflict neighbourhood is max{k+1, lc(k)+1} which equals lc(k)+1. □

#### **Open Problems**

**Open Problem 1.** Is it possible to improve any of the known lower bounds on f(k), l(k), and lc(k) by a constant factor?

**Open Problem 2.** Is there a constant  $c_0 > 1$  with  $f(k) \ge c_0 l(k)/k$  for k large enough?

**Open Problem 3.** Is there a constant  $c_1 > 1$  such that  $l(k) \ge c_1 lc(k)$  for k large enough?

**Open Problem 4.** Are the functions f(k), l(k) and lc(k) computable?



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