Clique is hard on average for regular resolution

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Talk based on a joint work with:



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A graph G with n vertices we say that is k-Ramsey if it has no set of k vertices forming a clique or an independent set. If $k = \lfloor 2 \log_2 n \rfloor$ we just say that G is Ramsey. A graph G with n vertices we say that is k-Ramsey if it has no set of k vertices forming a clique or an independent set. If $k = \lfloor 2 \log_2 n \rfloor$ we just say that G is Ramsey.

Erdős-Rényi random graphs

A graph $G = (V, E) \sim \mathcal{G}(n, p)$ is such that |V| = n and each edge $\{u, v\} \in E$ independently with prob. $p \in [0, 1]$

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- if $p \ll n^{-2/(k-1)}$ then a.a.s. $G \sim \mathcal{G}(n,p)$ has no k-cliques
- A.a.s. $G \sim \mathcal{G}(n, \frac{1}{2})$ is Ramsey

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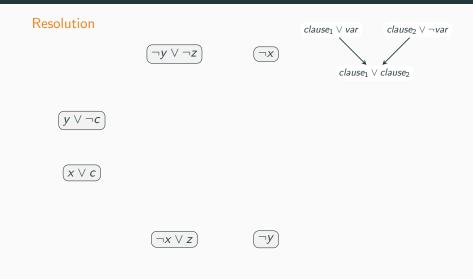
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and
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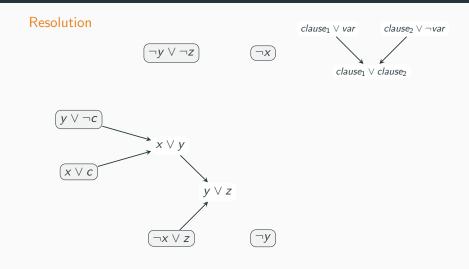


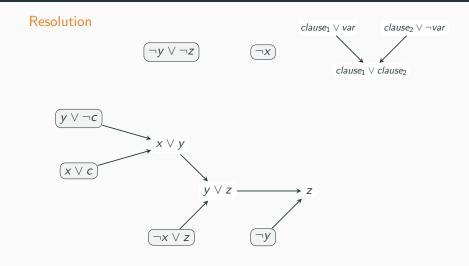
 $x \vee c$

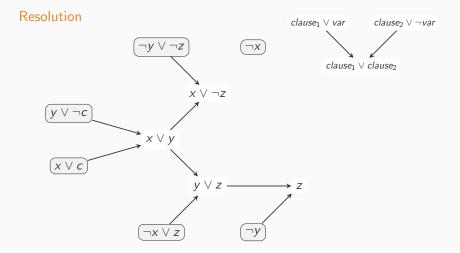


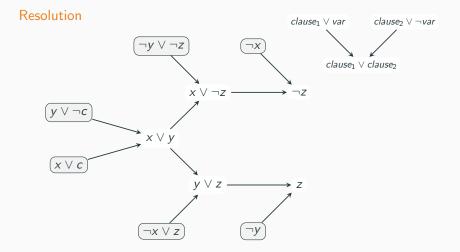


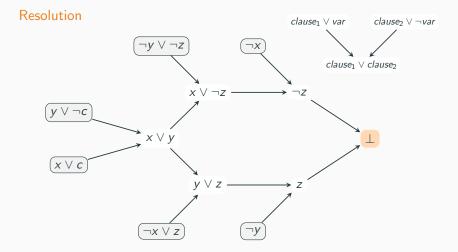


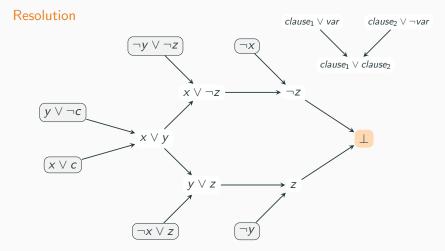




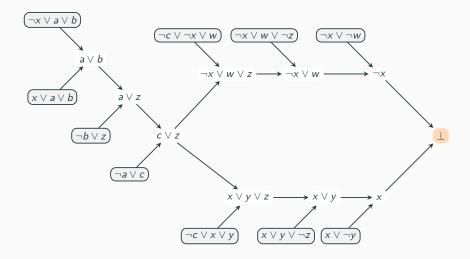




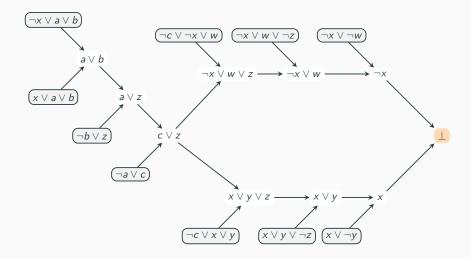




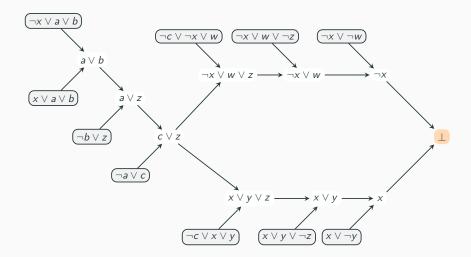
Tree-like = the proof DAG is a tree Regular = no variable resolved twice in any source-to-sink path Size = # of nodes in the proof DAG



Regular?



Regular? No.



Regular? No. And none of the shortest proofs is regular [HY87].

[HY87] Huang and Yu, 1987. A DNF without regular shortest consensus path.

What is Resolution good for?

- algorithms routinely used to solve NP-complete problems (hardware verification, ...) are *somewhat* formalizable in resolution
- the state-of-the-art algorithms to solve k-clique (Bron-Kerbosch, Östergård, Russian dolls algorithms, ...) are formalizable in *regular* resolution

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- [HKM16] All possible 2-colorings of {1,...,7825} have a monochromatic Pythagorean triple.

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[HKM16] M. Heule, O. Kullmann and V. Marek, 2016. *Solving and Verifying the Boolean Pythagorean Triples problem via Cube-and-Conquer* Let ϕ be an conjunction of clauses in N variables with $|\phi| = N^{\mathcal{O}(1)}$

 $S(\phi) =$ minimum size of a resolution refutation of ϕ $S_{tree}(\phi) =$ minimum size of a tree-like resolution refutation of ϕ $S_{reg}(\phi) =$ minimum size of a regular resolution refutation of ϕ Let ϕ be an conjunction of clauses in N variables with $|\phi| = N^{\mathcal{O}(1)}$

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 for every φ, S(φ) ≤ S_{reg}(φ) ≤ S_{tree}(φ) (and there are examples of exponential separations)

• for every
$$\phi$$
, $S_{tree}(\phi) = 2^{\mathcal{O}(N)}$

Theorem? (folklore)

 $\Psi_{G,k}$, whenever unsatisfiable, has $S_{tree}(\Psi_{G,k}) = n^{\mathcal{O}(k)}$

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Theorem [LPRT17]

If G is a Ramsey graph in n vertices and $k = \lceil 2 \log n \rceil$ then $S_{tree}(\Psi_{G,k}) = n^{\Omega(\log n)}.$

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Open Problem

Let G be a Ramsey graph in n vertices and let $k = \lceil 2 \log n \rceil$. Is it true that $S(\Psi_{G,k}) = n^{\Omega(\log n)}$?

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Construct a propositional formula $\Phi_{G,k}$ unsatisfiable if and only if "G does not contain a k-clique"

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lower bounds on $S(\Phi_{G,k})$ imply lower bounds on $S(\Psi_{G,k})$

[~**BGL13]** if G is
$$(k - 1)$$
-colorable then
 $S_{reg}(\Phi_{G,k}) \leq 2^k k^2 n^2$
[folklore] $\Phi_{G,k}$, whenever unsatisfiable, has
 $S_{tree}(\Phi_{G,k}) = n^{\mathcal{O}(k)}$

[[]BGL13] Beyersdorff, Galesi and Lauria 2013. *Parameterized complexity of DPLL search procedures.*

Overview of the literature: Lower Bounds

- **[BGL13]** If G is the complete (k 1)-partite graph, then $S_{tree}(\Phi_{G,k}) = n^{\Omega(k)}$. The same holds for $G \sim \mathcal{G}(n, p)$ with suitable edge density p.
- **[BIS07]** for $n^{5/6} \ll k < \frac{n}{3}$ and $G \sim \mathcal{G}(n, p)$ (with suitable edge density p), then $S(\Phi_{G,k}) \stackrel{\text{a.a.s.}}{=} 2^{n^{\Omega(1)}}$
- **[LPRT17]** if we encode k-clique using some other propositional encodings (e.g. in binary) we get $n^{\Omega(k)}$ size lower bounds for resolution

[BIS07] Beame, Impagliazzo and Sabharwal, 2007. The resolution complexity of independent sets and vertex covers in random graphs. **[LPRT17]** Lauria, Pudlák, Rödl, and Thapen, 2017. The complexity of proving that a graph is Ramsey.

Main Result (simplified versions)

Main Theorem (version 1)

Let $G \sim \mathcal{G}(n, p)$ be an Erdős-Rényi random graph with, for simplicity, $p = n^{-4/(k-1)}$ and let $k \leq n^{1/2-\epsilon}$ for some arbitrary small ϵ . Then, $S_{reg}(\Phi_{G,k}) \stackrel{\text{a.a.s.}}{=} n^{\Omega(k)}$.

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Main Theorem (version 2) Let $G \sim \mathcal{G}(n, \frac{1}{2})$, then

$$S_{reg}(\Phi_{G,k}) \stackrel{\text{a.a.s.}}{=} n^{\Omega(\log n)} \text{ for } k = \mathcal{O}(\log n)$$

and

$$S_{reg}(\Phi_{G,k}) \stackrel{\text{a.a.s.}}{=} n^{\omega(1)} \text{ for } k = o(\log^2 n).$$

Focus on proving the following.

Theorem

Let $k = \lceil 2 \log n \rceil$ and $G \sim \mathcal{G}(n, \frac{1}{2})$, then $S_{reg}(\Phi_{G,k}) \stackrel{\text{a.a.s.}}{=} n^{\Omega(\log n)}$

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Let $k = \lceil 2 \log n \rceil$. A.a.s. $G = (V, E) \sim \mathcal{G}(n, \frac{1}{2})$ satisfies the following:

(*) V is $(\frac{k}{50}, \Theta(n^{0.9}))$ -dense; and (**) For every $(\frac{k}{10000}, \Theta(n^{0.9}))$ -dense $W \subseteq V$ there exists $S \subseteq V$, $|S| \leq \sqrt{n}$ s.t. for every $R \subseteq V$, with $|R| \leq \frac{k}{50}$ and $|\widehat{N}_W(R)| < \widetilde{\Theta}(n^{0.6})$ it holds that $|R \cap S| \geq \frac{k}{10000}$. $\widehat{N}_W(R)$ is the set of common neighbors of R in WW is (r, q)-dense if for every subset $R \subseteq V$ of size $\leq r$, it holds $|\widehat{N}_W(R)| \geq q$

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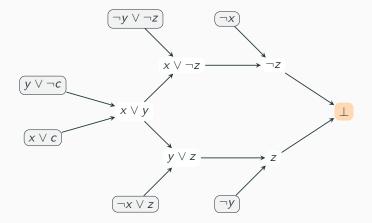
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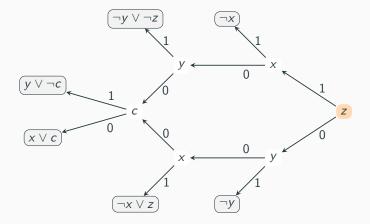
Theorem 2

Let $k = \lceil 2 \log n \rceil$. For every *G* satisfying properties (*) and (**), $S_{reg}(\Phi_{G,k}) = n^{\Omega(\log n)}$

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Haken bottleneck counting idea

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Given any **bottleneck** node *b* in the ROBP,

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Then, it is trivial to conclude:

 $1 = \Pr_{\gamma \sim \mathcal{D}} [\exists b \in ROBP \ b \ bottleneck \ and \ b \in \gamma]$ $\leq |ROBP| \cdot \max_{\substack{b \ bottleneck \\ in \ the \ ROBP}} \Pr_{\gamma \sim \mathcal{D}} [b \in \gamma]$ $\leq |ROBP| \cdot n^{-\Theta(k)}$

The real bottleneck counting

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The random path γ

- if j forgotten at c or
 β(c) ∪ {x_{v,j} = 1} falsifies a short clause of Φ_{G,k}
 then continue with x_{v,j} = 0
- otherwise toss a coin and with prob. Θ(n^{-0.6}) continue with x_{v,j} = 1

$$V_j^0(a) = \{ v \in V : eta(a)(x_{v,j}) = 0 \}$$

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- 2. there exists a $j^* \in [k]$ not-forgotten at b and such that $V_{j^*}^0(b) \smallsetminus V_{j^*}^0(a)$ is $(\frac{k}{10000}, \Theta(n^{0.9}))$ -dense.

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Lemma 2

For every pair of nodes (a, b) in the ROBP satisfying point (2) of Lemma 1,

$$\Pr_{\gamma}[\gamma \text{ touches } a, \text{ sets} \leqslant \left\lceil \frac{k}{200} \right\rceil$$
 vars to 1 and then touches $b] \leqslant n^{-\Theta(k)}$

Go to Conclusions

Let E= " γ touches a, sets $\leq \lceil k/200 \rceil$ vars to 1 and then touches b" and let $W = V_{j^*}^0(b) \smallsetminus V_{j^*}^0(a)$

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So $\Pr[E \land W$ has many coin tosses] $\leq n^{-\Theta(k)}$ again by a Markov chain argument as in **Case 1**.

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Case 2.2: $V^1(a)$ is not large and not many vertices in W are set to 0 by coin tosses. Then many of the 1s set by the random path γ between a and b must belong to a set of size at most \sqrt{n} , by the new combinatorial property (**).

So $\Pr[E \land W$ has not many coin tosses] $\leq n^{-\Theta(k)}$.

Conclusions

Open Problem: How hard is to prove that a graph is Ramsey? Let G be a Ramsey graph in n vertices and let $k = \lceil 2 \log n \rceil$. Is it true that $S(\Psi_{G,k}) = n^{\Omega(\log n)}$?

([LPRT17] proved this but for a binary encoding of "G is Ramsey")



Thanks!

full paper

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