

Hardness of Approximate Coloring

Girish Varma

Advisor : Prof. Prahladh Harsha

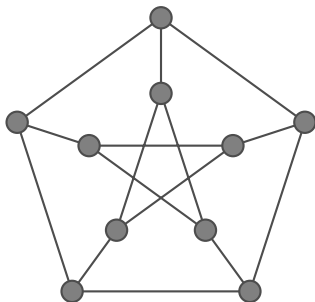
PhD Defence

Tata Institute of Fundamental Research, Mumbai

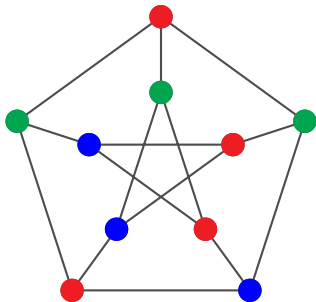
January 9, 2016

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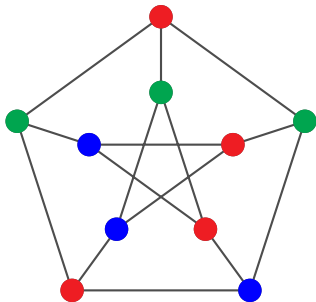
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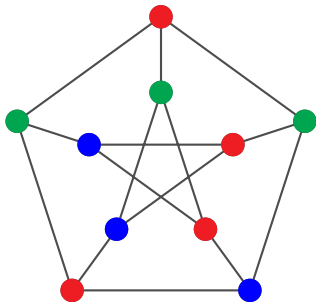


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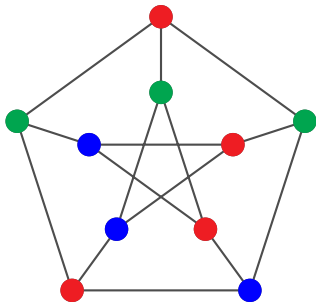
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Dream Goal

$\exists \delta > 0 :$

hard to efficiently color 3-colorable graphs with n^δ colors
assuming $P \neq NP$.

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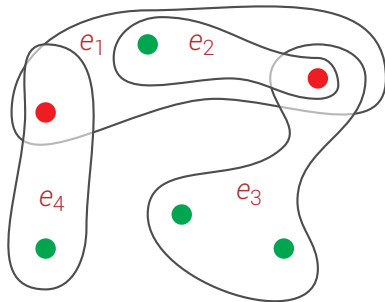
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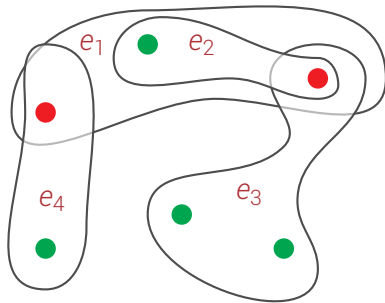
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hard to find a n^δ -coloring.

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Given a 2-colorable k -uniform hypergraph,
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Assuming NP doesn't have $2^{\log^r n}$ -time algorithms for some $r > 0$:

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Given a k -uniform hypergraph $G = (V, E)$, find assignment to vertices $f: V \rightarrow \{0, 1\}$ such that $\forall e \in E, f|_e \in P$.

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Given a k -uniform hypergraph $G = (V, E)$ and literal function

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G is 2-colorable iff

the CSP instance with $P = \text{NOT ALL EQUAL}$ is satisfiable.

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Definition (Covering Number)

Smallest number c such that there exists c assignments that together satisfies all edges.

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For odd predicates, covering number ≤ 2 .

Any assignment and its complement covers all the edges.

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- ▶ **Some sufficient conditions** on predicate P such that given a **2**-coverable instance, it is **hard to find a $\log \log n$ -covering**.

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- ▶ Some sufficient conditions on predicate P such that given a 2-coverable instance, it is hard to find a $\log \log n$ -covering.
- ▶ For the 4-LIN predicate, given a 2-coverable instance, it is hard to find an independent set of relative size $1/\log n$.

Techniques

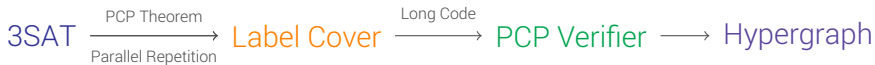
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Reduction (Circa 1998)

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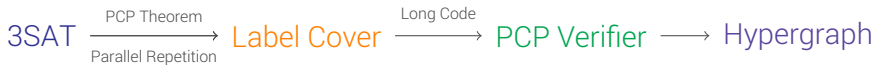
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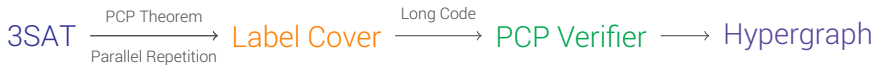


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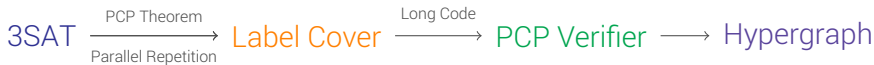
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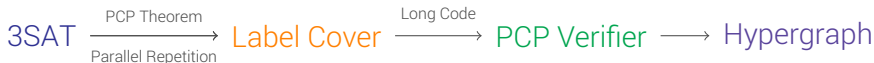
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$$\text{OPT}(\text{LC}) \leq \delta$$

\forall proofs over Q ,
 $\Pr[\text{accept}] < 1 - \delta^{cQ}$.

\mathcal{G} has no
independent set
of size $|\mathcal{V}|/Q$.

Long Code: From Label Cover to PCP Verifier

Long Code [Bellare Goldreich Sudan '95]

The long code of $a \in [L]$ is $A : \{0, 1\}^L \rightarrow \{0, 1\}$ such that $A(f) = f_a$.

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- ▶ **Soundness** : If test passes with high probability then A can be explained by a short list of long codes.

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- ▶ PCP proof consists of long code encoding of labels of vertices in Label Cover instance.
- ▶ Due to parallel repetition $L = \text{poly}(1/\delta)$ and $|V| = n^{\log(1/\delta)}$.

Proof size is $2^{\text{poly}(1/\delta)}$. Cannot go beyond $\delta = O(1/\text{poly log } n)$.

A Shorter Code?

Suppose $L = \{0, 1\}^\ell = \mathbb{F}_2^\ell$, and $A : \{0, 1\}^L \rightarrow \{0, 1\}$.

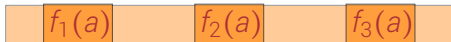
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$$A : \mathbb{F}_2^{\mathbb{F}_2^\ell} \rightarrow \mathbb{F}_2$$

$$\text{length} = 2^L$$

Long Code for $a \in \mathbb{F}_2^\ell$.



For every $f : \mathbb{F}_2^\ell \rightarrow \mathbb{F}_2$

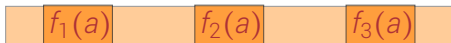
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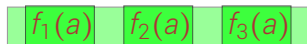
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For every f of degree $\leq d$.

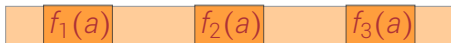
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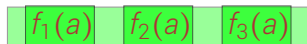
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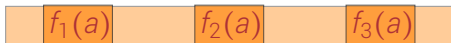
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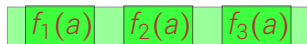
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Test for Low Degree Long Codes

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- ▶ increasing the number of queries to 8, or
- ▶ increasing the alphabet to $\mathbb{F}_2 \times \mathbb{F}_2$.

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- ▶ Combining [Khot Saket '14] label cover with our tests yields:
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Subsequently

- ▶ [Khot Saket '14]

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Main Lemma

in Soundness Analysis of Low Degree Long Code Test

[Dinur Guruswami '13]

If $\alpha : \mathbb{F}_2^\ell \rightarrow \mathbb{F}_2$ such that $\text{dist}(\alpha, P_{\ell-d-1}) > 2^d$ then

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Techniques

Result - 1 : Hardness of Graph Coloring

Graph Product

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Definition

Given a graph $G = (V, E)$, the n -wise product graph $G^n := (V^n, E^n)$ where

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Alon, Dinur, Friedgut, Sudakov 2004, Dinur, Mossel, Regev '07 & Dinur Shinkar '10

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A subset of $\{0, 1, 2\}^n$ which fixes some coordinate x_i to $a \in \{0, 1, 2\}$.

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4. A is explained by a set of dictators of size $1/\text{poly}(\delta)$.

Our Result

There exists a subgraph $G' = (V', E')$ of $V(K_3^n)$ of size $3^{\text{poly}(\log n)}$ such that

Definition (Dictator)

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Let A be an independent set in G' of relative size δ . Then,

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For any i , $f(i) - g(i) = h(i)^2 + 1 \in \{1, 2\}$.

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That is A is close to a function with only degree 1 Fourier terms.

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Theorem (FKN '04 & ADFS '04)

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Pseudorandom generator for Polynomial Threshold Functions.

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If $|\alpha| > 3^d$ and $h \in_U P_{d/2}$ then

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Publications : Conference

- ▶ Venkat Guruswami, Prahladh Harsha, Johan Håstad, Srikanth Srinivasan, & Girish Varma. *Super-polylogarithmic hypergraph coloring hardness via low-degree long codes*. *Symp. on Theory of Computing (STOC)*, 2014.
- ▶ Irit Dinur, Prahladh Harsha, Srikanth Srinivasan, & Girish Varma. *Derandomized graph product results using the low degree long code*. *Symp. on Theoretical Aspects of Computer Science (STACS)*, 2015.
- ▶ Amey Bhangale, Prahladh Harsha, & Girish Varma. *A characterization of hard-to-cover CSPs*. *Computational Complexity Conference (CCC)*, 2015.

Publications : Manuscript

- ▶ Girish Varma. *Reducing uniformity in Khot-Saket hypergraph coloring hardness reductions*. CoRR.

That's all Folks!

Thank You