Explicit Abelian Lifts and Quantum LDPC Codes

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ITCS 2022

- Main goal is to explicitly build symmetric expanding graphs
- Let us see why and how!



Image credits - Hoory, Linial, Wigderson '06

OUTLINE

Introduction

Motivation and history

Our Results

2. Statement and an application



Conclusion

Summary and open Problems

Introduction

Here we go!

1



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- Q Given d, ε , can we construct infinite families of d-regular graphs $\{G_n\}$ with $n \to \infty$ such that $\lambda(G_n) \le \varepsilon d$?
 - Alon-Boppanna bound says that the best possible is $2\sqrt{d-1} o_n(1)$.



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- Eg If $H = \mathbb{Z}_6$, we have the cycle graph C_6 such that
 - $\mathbb{Z}_6 \subseteq \operatorname{Aut}(C_6) \text{ as } i : n \to n+i \mod 6.$











- Expansion
- Many explicit constructions of constant degree expander graphs known.



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Q - Can we have both ?



13 REASONS WHY
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 - $PSL_2(\mathbb{F}_q)$ [Panteleev, Kalachev'21], [Dinur, Evra, Livne, Lubotzky, Mozes'21].
- Property Testing Interesting work by [Goldreich-Wigderson'21] builds expander graphs with $Aut(X) = {id}$ and shows applications to property testing.

Q - For a given family of groups H_n , can we explicitly construct a family of expander graphs G_n such that $H_n \subseteq \operatorname{Aut}(G_n)$?

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- Group-based lifts (Covering maps) A generic technique introduced by Bilu, Linial'06 in context of graphs. A special case of the topological notion of covering maps.
 - Used extensively to construct expanders.

\boldsymbol{G}

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(H, ℓ) lift of a graph





Can this cycle graph be seen as a lift of a smaller graph?



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 $(\mathbb{Z}_2,2)$ -lift



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Properties of lifting

- Explicit characterization of the spectrum of lifted graph, G(s).
- Preserves degree.
- If H is abelian, it possesses symmetries of H i.e.,
 - $H \subseteq \operatorname{Aut}(G(s))$.
- If *G* is an expander and *s* is random, *G*(*s*) is known to be an expander*. Challenge is to explicitly construct such a signing *s*.

Quick history of lifting

Technique	Authors	Lift	$\lambda(G)$	Explicit
Discrepancy	[Bilu, Linial '06]	2-lift	$\sqrt{d} \log^{1.5} d$	Yes
	[Agrawal, Chandrashekharan, Kolla, Madan '16] $(\mathbb{Z}_{\ell}, \ell)$ $O(\sqrt{d})$		$O(\sqrt{d})$	No
Method of interlacing polynomials	[Marcus, Spielman, Srivastava '13] [Cohen '16]	2-lift	$2\sqrt{d-1}$	Yes
	[Hall, Puder, Sawin '15]	$\begin{array}{c} (H, \ell) \\ \text{for some} \\ \text{non-abelian} \end{array}$	$2\sqrt{a-1}$	No?
Trace Power Method	[Mohanty, O'Donnell, Paredes '20]	2-lift $2\sqrt{d-1} + \varepsilon$		Yes

Can we lift more?



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- [ACKM'16] showed that for \mathbb{Z}_{ℓ} , there exists good signings for $\ell \leq 2^{n/d^3}$.
 - They further show that for any abelian group H, no lift of size $\ell > \exp(nd)$ is expanding.
- The goal now is to construct $(\mathbb{Z}_{\ell}, \ell)$ lifts for $3 \leq \ell \leq 2^{nd}$.



Our Results

Yes, we do lift! And that too explicitly!

2.

Theorem - For any $d \ge 3$, large enough n and "nice" $\ell(n)$, we have an explicit family of d-regular expanding graphs $\{G_n\}$ such that G_n is a $(\mathbb{Z}_{\ell(n)}, \ell(n))$ -lift* of some base graph.

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Main Result

Technique	Authors	Lift	$\lambda(G)$	Explicit
Discrepancy	[BL06]	$(\mathbb{Z}_2,2)$	$ ilde{O}\left(\sqrt{d} ight)$	Yes
	[ACKM16]	$(\mathbb{Z}_{\ell}, \ell) \ \ell \leq \exp(n/d^3)$	$O\left(\sqrt{d}\right)$	No
	This work	$(\mathbb{Z}_{\ell}, \ell) \ \ell = \exp(\Theta(n))$	$ ilde{O}\left(\sqrt{d} ight)$	Yes
Trace Power Method	[MOP20]	$(\mathbb{Z}_2,2)$	$2\sqrt{d-1} + \varepsilon$	Yes
	This work	$(\mathbb{Z}_{\ell}, \ell) \ \ell \leq \exp(n^{\delta(d, \varepsilon)})$	$2\sqrt{d-1} + \varepsilon$	Yes
		$(\mathbb{Z}_{\ell}, \ell) \ \ell \leq \exp(n^{0.01})$	εd	

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• A good quasi-cyclic linear code with circulant size ℓ .

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• A good quasi-cyclic linear code with circulant size ℓ . • An $[[n\ell, n, \ell]]$ quantum LDPC code.

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• Quantum LDPC code with distance $\Omega(N^{1-\alpha})$ and dimension $\Theta(N^{\alpha})$ for every constant $0 < \alpha < 1$.

Key Contribution

3.

A better count of non-backtracking hikes

•
$$\frac{1}{2}\lambda_{max}(A_G)^{2k} \le \lambda_{max}(B)^{2k} \le \operatorname{tr}((B^*)^k B^k) \le \left| \text{ Hikes of length } 2k \right|$$



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- Trivial Count $\sim (d-1)^{2k}$ gives a trivial eigenvalue bound of d.
- Ideal Count $(d-1)^k$ would give the optimal bound of $2\sqrt{d-1}$.



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- For 2-lifts, bounding walks of length $O(\log n)$ suffices which is what [MOP20] does and gives a count close to the optimal one.
- We extend the near-optimal bound to walks of length $O(n^{\delta(d,\varepsilon)})$ and obtain a weaker bound all the way up to $k = O(n^{0.01})$.

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• Then, count the number of hikes corresponding to a given graph.



Conclusion

All good things come to an end

• We give explicit constructions of (H, ℓ) -lifted graphs for abelian H and a large range of lift sizes ℓ .

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- Main method of analysis is trace power method utilizing a careful count of special walks on a large girth graph.
- As an application, we get new explicit LDPC codes classical and quantum.

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- Can we give strongly explicit constructions?
- Generalize the result to new families of non-abelian groups.
Thank you!

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• Glad to hear your feedback/questions - tushant@uchicago.edu

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