# Quantum complexity of clique homology

With Tamara Kohler

https://arxiv.org/pdf/2311.17234

#### Quantum structure in homology

Homology = holes in spaces

Homology has quantum mechanical structure.

Given discrete space *G* and dimension *k*, decide if:

- (YES) *G* has a *k*-dimensional hole.
- (NO) G is far from having a k-dimensional hole.

... inside QMA and QMA1-hard.



#### Quantum algs for topological data analysis

#### ARTICLE

Received 17 Sep 2014 | Accepted 9 Nov 2015 | Published 25 Jan 2016

DOI: 10.1038/ncomms10138 OPEN

# Quantum algorithms for topological and geometric analysis of data

Seth Lloyd<sup>1</sup>, Silvano Garnerone<sup>2</sup> & Paolo Zanardi<sup>3</sup>

#### Analyzing Prospects for Quantum Advantage in Topological Data Analysis

Dominic W. Berry,<sup>1,\*</sup> Yuan Su,<sup>2</sup> Casper Gyurik,<sup>3</sup> Robbie King,<sup>2,4</sup> Joao Basso,<sup>2</sup> Alexander Del Toro Barba<sup>®</sup>,<sup>2</sup> Abhishek Rajput<sup>®</sup>,<sup>5</sup> Nathan Wiebe,<sup>5,6</sup> Vedran Dunjko,<sup>3</sup> and Ryan Babbush<sup>®</sup><sup>2,†</sup>

 <sup>1</sup> School of Mathematical and Physical Sciences, Macquarie University, Sydney, NSW 2109, Australia <sup>2</sup> Google Quantum AI, Venice, California 90291, USA <sup>3</sup> applied Quantum algorithms (aQa), Leiden University, Leiden 2300 RA, Netherlands
 <sup>4</sup> Department of Computing and Mathematical Sciences, Caltech, Pasadena, California 91125, USA <sup>5</sup> Department of Computer Science, University of Toronto, Ontario M5S 2E4, Canada <sup>6</sup> Pacific Northwest National Laboratory, Richland, Washington 99354, USA

#### A streamlined quantum algorithm for topological data analysis with exponentially fewer qubits

Sam McArdle,<sup>1,2</sup> András Gilyén,<sup>3</sup> and Mario Berta<sup>1,2,4</sup>

 <sup>1</sup>AWS Center for Quantum Computing, Pasadena, CA 91125, USA
 <sup>2</sup>Institute for Quantum Information and Matter, California Institute of Technology, Pasadena, USA
 <sup>3</sup>Alfréd Rényi Institute of Mathematics, Budapest, Hungary
 <sup>4</sup>Department of Computing, Imperial College London, London, UK (Dated: September 27, 2022)

#### ...quantum advantage?

#### Quantum structure in classical problems

- Hidden subgroup problem 🖙 quantum Fourier transform
- Jones polynomial  $\Leftrightarrow$  topological quantum field theory
- Homology \Leftharpoonup supersymmetry?

#### Topological data analysis



• k-simplices = k + 1-cliques

#### Homology

Chain-space:  $C_k = \text{complex span of } k$ -simplices

$$\cdots \longrightarrow C_{k+1} \xrightarrow{\partial_{k+1}} C_k \xrightarrow{\partial_k} C_{k-1} \longrightarrow$$

$$\stackrel{\partial_2}{\underbrace{\left( \begin{array}{c} & & \\ & &$$

 $H_k := \operatorname{Ker} \partial_k / \operatorname{Im} \partial_{k+1}$ 



2 3

## Complexity of homology?

Given graph, decide if:

- (YES) *G* has a *k*-dimensional hole.
- (NO) G has no k-dimensional hole.

Computational complexity?





#### Homology $\cong$ Quantum Mechanics



- Groundspace of  $\Delta_k$  = homology.
- Laplacian is exponential-dimensional sparse matrix encoded succinctly by graph.
- Homology becomes Hamiltonian problem on  $\Delta_k$ .

#### Laplacian operator



**Definitions:** 

$$\Delta_{k} = \partial_{k}^{\dagger} \partial_{k} + \partial_{k+1} \partial_{k+1}^{\dagger}$$
$$H_{k} \coloneqq \operatorname{Ker} \partial_{k} / \operatorname{Im} \partial_{k+1}$$

Theorem: Ker  $\Delta_k \cong H_k$ Proof:  $\langle \psi | \Delta_k | \psi \rangle = ||\partial_k | \psi \rangle ||^2 + ||\partial_{k+1}^{\dagger} | \psi \rangle ||^2$ 

## Quantum complexity of homology

Gapped Clique Homology (GCH):

Given vertex-weighted graph *G* and dimension *k*, decide if:

- (YES) *G* has a *k*-dimensional hole.
- (NO) G has no k-dimensional hole, and min eigenvalue of Laplacian is at least 1/poly(n).

 $GCH \in QMA$ 

Our result: GCH is QMA1-hard

#### Supersymmetry



### **Dequantizing TDA?**

- Quantum algorithms exploit Hamiltonian simulation and phase estimation of the Laplacian  $\Delta_k$
- Minimum eigenvalue of  $\Delta_k$  is QMA1-hard
- $\rightarrow \Delta_k$  possesses no exploitable structure
- → quantum TDA algorithms *cannot* be dequantized.

#### Hardness construction overview

#### Reduce from local Hamiltonian problem

$$H = \sum_{i} |\phi_i\rangle \langle \phi_i|$$

- (YES) Ground energy = 0
- (NO) Ground energy  $\geq 1/\text{poly}(n)$



Graph *G*, dimension *k* 

- (YES) *G* has a *k*-dimensional hole.
- (NO) G has no k-dimensional hole, and  $\lambda_{\min}(\Delta_k) \ge 1/\text{poly}(n)$ .

#### Hardness construction: 1 qubit



$$H_1(G_1)\cong \mathbb{C}^2$$

1-qubit graph  $G_1$ 

#### Hardness construction: 1 qubit



# Hardness construction: $|-\rangle\langle -|$



#### Hardness construction: tensor products

• Join: connect graphs all-to-all



 $\mathcal{K} * \mathcal{L}$ 

- *n*-qubit graph  $G_n = G_1 * \cdots * G_1$  (*n* times)
- *G*<sub>2</sub>:



## Weighting

- Weight vertices of graph
- Topology unchanged
- Affects Laplacian  $\Delta_k$
- Qubit vertices weight = 1
- Gadget vertices weight =  $\lambda$   $\lambda = 1/\text{poly}(n)$

**Definitions:**  $\Delta_k = \partial_k^{\dagger} \partial_k + \partial_{k+1} \partial_{k+1}^{\dagger}$ 

#### Spectral sequences



• Want **perturbative** expansion of **Laplacian** groundspace.

#### $E_{j}^{k} = \{ |\psi\rangle \in C_{k} :$ $\exists |\psi_{\lambda}\rangle = |\psi\rangle + \lambda |\psi_{1}\rangle + \lambda^{2} |\psi_{2}\rangle + \dots$ s.t. $\langle \psi_{\lambda} | \Delta_{k} | \psi_{\lambda} \rangle = \mathcal{O}(\lambda^{2j}) \}$

- Spectral sequences give sequence of spaces  $e_i^k$
- Theorem [Forman 1995]:  $e_j^k \cong E_j^k$

Spectral sequences

- Difficult topology/analysis becomes easy algebra
- Replaces role of **perturbation theory** in perturbative gadgets



## Conclusion

Laplacian  $\Delta_k$ :

- Sparse matrix
- Encodes topology
- Efficient access from graph input
- Supersymmetric Hamiltonian
  - Locality = degree of complement graph, **not** constant for us...
- Towards PCPs: Discrete graph problem gadgets for gapamplification?