### The Hunt for a Quantum Algorithm for Graph Isomorphism

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#### The Hidden Subgroup Problem

- Given a function f(x), find the y such that f(x + y) = f(x)for all x.
- Given a function f on a group G, find the subgroup H consisting of h such that

f(gh) = f(g)

for all g.

#### The Hidden Subgroup Problem

- This captures many quantum algorithms: indeed, most algorithms which give an exponential speedup.
  - $\mathbb{Z}_2^n$  : Simon's problem
  - $\mathbb{Z}_n^*$ : factoring, discrete log (Shor)
  - $\mathbb{Z}$  : Pell's equation (Hallgren)
- What can the non-Abelian HSP do?

#### Graph Isomorphism



Define a function f on S<sub>2n</sub>. If both graphs are rigid, then either f is 1–1 and H = {1}, or f is 2–1 and H = {1, m} for some involution m (of a particular type).

#### Standard Method: Coset States

• Start with a uniform superposition,  $\frac{1}{\sqrt{|G|}} \sum_{g \in G} |g\rangle$ 



• Measuring f gives a random coset of H:  $|cH\rangle = \frac{1}{\sqrt{|H|}} \sum_{h \in H} |ch\rangle$ 

or, if you prefer, a mixed state:  $\rho = \frac{1}{|G|} \sum_{c \in G} |cH\rangle \langle cH|$ 

#### The Fourier Transform

# • We now perform a basis change. In $\mathbb{Z}_n$ , $|k\rangle = \frac{1}{\sqrt{n}} \sum_x e^{2\pi i k x/n}$ and in $\mathbb{Z}_2^n$ , $|k\rangle = \frac{1}{\sqrt{2^n}} \sum_x (-1)^{k \cdot x}$

Why? Because these are homomorphisms from G to C. These form a basis for C[G] with many properties (e.g. convolution)

#### Group Representations

#### • Homomorphisms from groups to matrices: $\sigma: G \to U(V)$

- For instance, consider this three-dimensional representation of A<sub>5</sub>.
- Any representation can be decomposed into a direct sum of *irreducible* representations.



#### Heartbreaking Beauty



Given a "name" ρ and a row and column *i*, *j*,

$$|\sigma, i, j\rangle = \sqrt{\frac{d_{\sigma}}{|G|}} \sum_{g} \sigma(g)_{ij}$$

• Miraculously, these form an orthogonal basis for  $\mathbb{C}[G]$ :

$$\sum_{\sigma \in \widehat{G}} d_{\sigma}^2 = |G|$$

#### Group Actions

• Given a state in  $\mathbb{C}[G]$  and a group element g, we can apply various group actions:

$$|x\rangle \to |xg\rangle$$
 or  $|g^{-1}x\rangle$  or  $|g^{-1}xg\rangle$ 

- We can think of  $\mathbb{C}[G]$  as a representation of G under any of these actions.
- Under (left or right) multiplication, the *regular* representation contains  $d_{\sigma}$  copies of each  $\sigma \in \widehat{G}$ .

#### Levels of Measurement

- For most group families, the QFT can be carried out efficiently, in polylog(IGI) steps [Beals 1997; Høyer 1997; M., Rockmore, Russell 2004]
- Weak sampling: just the name  $\sigma$
- Strong sampling: name, row and column σ, i, j
   in a basis of our choice (some bases may be
   much more informative than others)
- Intermediate: strong, but with a random basis

#### Fourier Sampling is Optimal

#### • The mixed state over (left) cosets

$$\rho = \frac{1}{|G|} \sum_{c \in G} |cH\rangle \langle cH$$

is left G-invariant, hence block-diagonal.

- Measuring the irrep name (weak sampling) loses no coherence.
- Strong sampling is the only thing left to do!

#### **Projections and Probabilities**

# • For each irrep $\sigma$ , we have a projection operator $\pi_{H}^{\sigma} = \frac{1}{|H|} \sum_{h \in H} \sigma(h)$ • The probability we observe $\sigma$ is $\frac{d_{\sigma}|H| \operatorname{rk} \pi_{H}^{\sigma}}{|G|}$ $\frac{d_{\sigma}^2}{|G|}$

• Compare with the Plancherel distribution  $(H = \{1\}, \text{ the completely mixed state})$ 

#### Weak Sampling Fails

• If 
$$H = \{1, m\}$$
, we have  $(\chi_{\sigma}(g) = \operatorname{tr} \sigma(g))$   
 $\operatorname{rk} \pi_{H}^{\sigma} = \frac{d_{\sigma}}{2} \left(1 + \frac{\chi_{\sigma}(m)}{d_{\sigma}}\right)$ 

• In  $S_n$ ,  $\chi_{\sigma}(m)/d_{\sigma}$  is exponentially small, so the observed distribution is very close to Plancherel

- Weak sampling fails [Hallgren, Russell, Ta-Shma 2000]
- Random basis fails [Grigni, Schulman, Vazirani, Vazirani 2001]
- But, strong is stronger for some G... [MRRS 2004]

#### Now for Strong Sampling

• But what about a basis of our choice? Given  $\sigma$ , we observe a basis vector **b** with probability

 $\frac{\left\|\pi_H \mathbf{b}\right\|^2}{\operatorname{rk} \pi_H}$ 

Here we have ||π<sub>H</sub>b||<sup>2</sup> = <sup>1</sup>/<sub>2</sub>(1 + (b, mb))
How much does (b, mb) vary with m?

#### Controlling the Variance

• Expectation of an irrep  $\sigma$  over *m*'s conjugates is  $\operatorname{Exp}_{m}\sigma(m) = \frac{\chi_{\sigma}(m)}{d_{\sigma}}\mathbb{1}$ so  $\operatorname{Exp}_{m}\langle \mathbf{b}, m\mathbf{b} \rangle = \frac{\chi_{\sigma}(m)}{d_{\sigma}}$ 

• To turn the second moment into a first moment,  $|\langle \mathbf{b}, m\mathbf{b} \rangle|^2 = \langle \mathbf{b} \otimes \mathbf{b}^*, m(\mathbf{b} \otimes \mathbf{b}^*) \rangle$ 

#### Controlling the Variance

#### • Decompose $\sigma \otimes \sigma^*$ into irreducibles:

$$\sigma \otimes \sigma^* \cong \bigoplus_{\tau \in \widehat{G}} a_\tau \tau$$

Then

$$\operatorname{Var}_{m} \left\| \pi_{H} \mathbf{b} \right\|^{2} \leq \frac{1}{4} \sum_{\tau \in \widehat{G}} \frac{\chi_{\tau}(m)}{d_{\tau}} \left\| \Pi_{\tau}^{\sigma \otimes \sigma^{*}} (\mathbf{b} \otimes \mathbf{b}^{*}) \right\|^{2}$$

• How much of  $\mathbf{b} \otimes \mathbf{b}^*$  lies in low-dimensional  $\tau$ ?

#### Strong Sampling Fails

- Using simple counting arguments, we show that almost all of  $\mathbf{b} \otimes \mathbf{b}^*$  lies in high-dimensional subspaces  $\tau$  of  $\sigma \otimes \sigma^*$ .
- Since  $\chi_{\tau}(m)/d_{\tau}$  is exponentially small, the observed distribution on b for *any* basis is exponentially close to uniform.
- No subexponential set of experiments on coset states can solve Graph Isomorphism.
   [M., Russell, Schulman 2005]

#### Entangled Measurements

• For any group, there exists a measurement on the tensor product of coset states

$$\underbrace{\rho\otimes \cdots \otimes \rho}_{k}$$

with  $k = poly(\log |G|)$  [Ettinger, Høyer, Knill 1999]

• What can we prove about entangled measurements?

#### Bounds on Multiregister Sampling

• Weak sample each register, observing

 $\boldsymbol{\sigma} = \sigma_1 \otimes \cdots \otimes \sigma_k$ 

• Given a subset *I* of the *k* registers, decompose that part of the tensor product:

$$\bigotimes_{i\in I}\sigma_i\cong\bigoplus_{\tau\in\widehat{G}}a_\tau^I\tau$$

• This group action multiplies these registers by g and leaves the others fixed.

#### Bounds on Multiregister Sampling

• Second moment: analogous to one register, consider  $\sigma \otimes \sigma^*$ . Given subsets *I* and *J*, define

$$E^{I,J}(\mathbf{b}) = \sum_{\tau \in \widehat{G}} \frac{\chi_{\tau}(m)}{d_{\tau}} \left\| \Pi_{\tau}^{I,J}(\mathbf{b} \otimes \mathbf{b}^*) \right\|^2$$

• For an arbitrary entangled basis, [M., Russell 2005]  $V_{\text{OR}} = \frac{||\Pi|}{||\Pi|} \frac{1}{||I|} \frac{1}{||I|} \sum_{i=1}^{N} \frac{\Gamma_{i}I_{i}J_{i}(\mathbf{h})}{|I|}$ 

$$\operatorname{Var}_{m} \|\Pi_{H} \mathbf{b}\|^{2} \leq \frac{-}{4^{k}} \sum_{I,J \subseteq [k]:I,J \neq \emptyset} E^{I,J}(\mathbf{b})$$

#### Bounds on Multiregister Sampling

- With some additional work, this general bound can be used to show that  $\Omega(n \log n)$  registers are necessary for  $S_n$  [Hallgren, Rötteler, Sen; M., Russell]
- But what form might this measurement take?
- Note that each subset of the registers contributes some information...

#### Subset Sum and the Dihedral Group

- The HSP in the dihedral group  $D_n$  reduces to random cases of Subset Sum [Regev 2002]
- Leads to a  $2^{O(\sqrt{\log n})}$ -time and -register algorithm [Kuperberg 2003]
- Subset Sum gives the *optimal* multiregister measurement [Bacon, Childs, van Dam 2005]

#### More Abstractly...

• If  $H = \{1, m\}$ , there is a missing harmonic:  $\sum_{h \in H} \pi(h) = 0$ 

- Weak sampling gives random two-dimensional irreps  $\sigma_j$ ; think of these as integers  $\pm j$ .
- Tensor products:  $\sigma_j \otimes \sigma_k \cong \sigma_{j+k} \oplus \sigma_{j-k}$
- Find subset that gives  $\sigma_0 \cong \mathbb{1} \oplus \pi$ .

#### Subsets in General

- Suppose H has a missing harmonic  $\tau$ .
- For each subset *I*, consider the subspace W<sup>I</sup><sub>τ</sub> resulting from applying the group action to *I*. (In D<sub>n</sub>, this flips the integers *j* in this subset.)
- If the hidden subgroup is a conjugate of H, then the state is perpendicular to  $W_{\tau}^{I}$  for all I.
- How much of  $\mathbb{C}[G^k]$  does this leave? What fraction is spanned by the  $W^I_{\tau}$ ?

#### Independent Subspaces

• Say that two subspaces V, W of a space U are *independent* if, just as for random vectors in U,  $\operatorname{Exp}_{v\in V} \|\Pi_W v\|^2 = \frac{\dim W}{\dim U}$ or equivalently  $\operatorname{tr} \Pi_V \Pi_W \quad \operatorname{tr} \Pi_V \operatorname{tr} \Pi_W$  $\dim U \quad \dim U \dim U$ 

• Being in V or W are "independent events."

#### Each Subset Contributes

For I ≠ J, W<sup>I</sup><sub>τ</sub> and W<sup>J</sup><sub>τ</sub> are independent.
Therefore, W<sub>τ</sub> = span<sub>I</sub>W<sup>I</sup><sub>τ</sub> is large:

$$\frac{\dim W_{\tau}}{\dim \mathbb{C}[G^k]} \ge 1 - \frac{1}{1 + 2^k/|G|}$$

 If k ≥ log<sub>2</sub> |G|, probability of "some subset being in τ" is ≥ 1/2 if the hidden subgroup is trivial, but is zero if it is a conjugate of H.
 [M., Russell 2005]

#### Find An Informative Subset!

- Divide C[G<sup>k</sup>] into subspaces; for each one, find a subset I for a large fraction of the completely mixed state is in W<sup>I</sup><sub>τ</sub>: e.g. σ<sub>0</sub> ≃ 1 ⊕ π in D<sub>n</sub>.
- "Pretty Good Measurement" (i.e., Subset Sum for  $D_n$ ) is optimal for Gel'fand pairs... [MR 2005]
- ...but it is not optimal for  $S_n$  [Childs]. What is? And, is it related to Subset Something?

#### The Hunt Continues

VS.



Beauty and Truth

ALAULT.

The Adversary

## Acknowledgments

