# Quantum advantage with shallow circuits 

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In this talk I will describe a provable, non-oracular, quantum speedup which is attained by constant-depth quantum circuits in a 2 D architecture.
I. Overview

A depth-d quantum circuit consists of $d$ time steps.
Each time step contains one- and two-qubit gates acting on disjoint qubits.


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We are interested in constant-depth quantum circuits, for which $d=O(1)$.



Constant-time quantum computation
How much does parallelism buy us if we only have a fixed computation time?

Quantum algorithms for small quantum computers

Constant-depth quantum circuits

## Constant-time quantum

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## Structure/Simulation

 Cannot prepare codewords of good quantum codes [Eldar, Harrow 2015]Quantum algorithms for small quantum computers

Efficient classical simulation of depth-2 circuits
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General simulation algorithms (superpolynomial)
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Constant-depth quantum circuits

Beat poly-time classical computation?
Constant-depth unlikely to be classically simulable.
[Terhal, Divincenzo 02]

Beat the best classical computers for some task?
[Gao et al. 17]
[Bermejo-Vega et al. 17]
...uses IQP results...
[Bremner, Montanaro, Shepherd


This talk: Are constant-depth quantum circuits more powerful than constantdepth classical circuits?

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## Constant-depth classical circuits

A depth- $d$ classical circuit consists of $d$ layers (time steps) of gates.


We consider constant-depth circuits composed of bounded fan-in gates. This class of circuits is known as $N C^{0}$.
We also allow the circuit to be probabilistic (random input bits are provided).


## Our result:

We describe a computational problem that is solved with certainty by a constantdepth quantum circuit.

We prove that any classical circuit which solves the problem with high probability must have depth increasing logarithmically with input size.

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## The quantum speedup is unconditional

(does not rely on complexity-theoretic conjectures and is non-oracular)

# II. The 2D Hidden Linear Function Problem 

## Quadratic form on a grid

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Any choice of coefficients defines a quadratic form $q:\{0,1\}^{n} \rightarrow \mathbb{Z}_{4}$

$$
q(x)=\sum_{e=(v, w) \in E} 2 A_{e} x_{v} x_{w}-\sum_{v \in V} b_{v} x_{v}
$$

## The quadratic form hides a linear function

Define a set

$$
\mathcal{L}_{q}=\left\{x \in \mathbb{F}_{2}^{n}: \quad q(x \oplus y)=q(x)+q(y) \text { for all } y \in \mathbb{F}_{2}^{n}\right\}
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## Lemma

The set $\mathcal{L}_{q}$ is a linear subspace of $\mathbb{F}_{2}^{n}$. Furthermore, there is a "secret" bit string $z \in\{0,1\}^{n}$ such that

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Define a computational problem where the goal is to find a secret bit string...

## The 2D Hidden Linear Function Problem

Input: Coefficients $A \in\{0,1\}^{|\mathrm{E}|}$ and $b \in\{0,1\}^{|\mathrm{V}|}$.

Specifies a quadratic form $\boldsymbol{q}(\boldsymbol{x})$ and a subspace $\mathcal{L}_{q} \subseteq \mathbb{F}_{2}^{n}$

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Can be viewed as a non-oracular version of the Bernstein-Vazirani problem.
[Bernstein Vazirani 1993]
In general each instance of the 2D HLF has many valid solutions $Z$.

## Quantum algorithm



## Quantum algorithm



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Fact: The output $z$ is a uniformly random solution to the 2D HLF Problem.

## The algorithm can be implemented in constant-depth



Four layers of CCZ gates.
(even/odd vertical/horizontal edges)
Decompose CCZ gates into 1- and 2-qubit gates.
...it only requires classically controlled Clifford gates between nearest neighbor qubits on a 2 D grid.

Example:


Place a qubit at each vertex Place input bits on vertices and edges:
—: Edge with $\mathrm{A}_{\mathrm{e}}=1$
: Vertex with $b_{v}=1$
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The 2D HLF problem is solved by a constant-depth quantum circuit with gates acting locally in 2D.

Next we show that it cannot be solved by a constant-depth classical circuit...

# III. Classical lower bound 

Theorem: The following holds for all sufficiently large $N$. Let $\mathcal{C}_{N}$ be a classical probabilistic circuit composed of gates of fan-in $\leq K$ which solves size- $N$ instances of the 2D HLF Problem with probability greater than $7 / 8$. Then

$$
\operatorname{depth}\left(\mathcal{C}_{N}\right) \geq \frac{\log (N)}{8 \log (K)}
$$



## Proof Ideas

Locality in shallow classical circuits Each output bit can only depend on $O(1)$ input bits.


## Vs.

## Quantum nonlocality

Measurement statistics of entangled quantum states cannot be reproduced by local hidden variable models


## Locality in classical circuits



## output

The lightcone $L\left(z_{k}\right)$ of an output bit $z_{k}$ is the set of input bits $x_{i}$ that are causually connected to $Z_{k}$.

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## Locality in classical circuits


"Constant-depth locality": Lightcones of output bits have constant size

$$
\left|L\left(z_{k}\right)\right| \leq K^{d}
$$

We'll see that the 2D Hidden Linear Function problem cannot be solved by "constantdepth local" circuits. First consider simpler forms of locality...

## Quantum nonlocality beats completely local circuits

[Greenburger et al. 1990] [Mermin 1990]

$$
|G H Z\rangle=\frac{1}{\sqrt{2}}(|000\rangle+|111\rangle) \quad \text { satisfies: }
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$$
\begin{aligned}
& P|G H Z\rangle=|G H Z\rangle \\
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Choose bits $b_{1}, b_{2}, b_{3}$ and then measure each qubit of $\left.\mid \mathrm{GHZ}\right)$ in either the X basis (if $b_{j}=$ 0 ) or the Y basis (if $b_{j}=1$ ). Outcomes $z_{j} \in\{-1,+1\}$ satisfy:

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i^{b_{1}+b_{2}+b_{3}} z_{1} z_{2} z_{3}=1 \quad \text { whenever } \quad b_{1} \oplus b_{2} \oplus b_{3}=0
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The GHZ relation cannot be satisfied by a completely local classical probabilistic circuit where each output bit $\boldsymbol{Z}_{\boldsymbol{j}}$ is correlated with at most one of the input bits $\boldsymbol{b}_{\boldsymbol{k}}$.

## Quantum nonlocality beats geometrically local circuits

[Barrett et al. 2007]
Graph state on an $M$-cycle $(M$ even $):\left|\Phi_{M}\right\rangle=\left(\prod_{j=1}^{M} C Z_{j, j+1}\right) H^{\otimes M}\left|0^{M}\right\rangle$

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Measurement bases $\quad$\begin{tabular}{c}
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Measurement outcomes
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Fact: Input/output satisfy a "cycle relation" $R\left(b_{u}, b_{v}, b_{w}, z\right)=1$ similar to the GHZ relation.

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Fact: Input/output satisfy a "cycle relation" $R\left(b_{u}, b_{v}, b_{w}, z\right)=1$ similar to the GHZ relation.

Lemma: Suppose a classical circuit satisfies the cycle relation with probability $>7 / 8$. Then some output bit $z_{k}$ is correlated with a distant input bit $b_{u}, b_{v}$ or $b_{w}$. (this means it is not the nearest vertex of the triangle)
...How is this related to the 2D Hidden Linear Function Problem?
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Prepare graph state for graph with adjacency matrix $A$
...How is this related to the 2D Hidden Linear Function Problem?

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Choosing $\boldsymbol{A}$ to describe the adjacency matrix of a cycle and choosing $\boldsymbol{b}$ appropriately we infer (from Barrett et al.) a cycle relation satisfied by input/output.
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Choosing $\boldsymbol{A}$ to describe the adjacency matrix of a cycle and choosing $\boldsymbol{b}$ appropriately we infer (from Barrett et al.) a cycle relation satisfied by input/output.

A classical circuit which solves the 2D HLF problem must also satisfy all such cycle relations....

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Then we can find 3 vertices $u, v, w$ on the even sublattice of the $N \times N$ grid and a cycle $\Gamma$ which passes through them, such that input bits $\boldsymbol{b}_{\boldsymbol{u}}, \boldsymbol{b}_{\boldsymbol{v}}, \boldsymbol{b}_{\boldsymbol{w}}$ are not correlated with any distant output bits on $\Gamma$.


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It does not w.h.p solve instances of 2D HLF problem where $A$ is the adjacency matrix of $\Gamma$.

This provides our lower bound on the depth of any classical circuit which solves the 2D HLF problem with probability greater than 7/8.

## Open problems

Recursive HLF problems? The recursive version of Bernstein-Vazirani gives a superpolynomial speedup in query complexity.

Noisy constant-depth quantum circuits vs noiseless constant-depth classical circuits ?
Sampling problems? Can constant-depth quantum circuits sample from a distribution that can't be sampled by classical constant depth circuits? A recent characterization of distributions sampled by $N C^{0}$ circuits might be useful [Viola 2014].

Polynomial speed-up ? Constant-depth quantum algorithm solves the 2D HLF Problem in linear time. Best known classical algorithm takes time $O\left(n^{2}\right)$.

