The computational power of quantum walk

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Why quantum computing?







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163473364580925384844313388386509 085984178367003309231218111085238 9333100104508151212118167511579 ×

190087128166482211312685157393541 397547189678996851549366663853908 8027103802104498957191261465571

- Computing discrete logarithms
- Decomposing Abelian groups
- Computations in number fields
- Approximating Gauss sums
- Shifted Legendre symbol
- Counting points on algebraic curves
- Approximating the Jones polynomial (and other topological invariants)
- Simulating quantum systems
- Linear systems
- Computing effective resistance
- ..



- Formula evaluation
- Collision finding (k-distinctness, k-sum, etc.)
- Minimum spanning tree, connectivity, shortest paths, bipartiteness of graphs
- Network flows, maximal matchings
- Finding subgraphs
- Minor-closed graph properties
- Property testing (distance between distributions, bipartiteness/expansion of graphs, etc.)
- Checking matrix multiplication
- Group commutativity
- Subset sum
- ..

Post-quantum cryptography

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Another reaction: Try to understand what quantum computers are good at so we can design cryptosystems they can't break

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Main goal of my research: Understand the advantages of quantum over classical computation

Interference between computational paths



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Arrange so that

- paths to the solution interfere constructively
- paths to non-solutions interfere destructively

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Quantum mechanics gives an efficient representation of complex interference phenomena



Quantum walk

Quantum analog of a random walk on a graph.

Idea: Replace probabilities by quantum amplitudes. Interference can produce radically different behavior!





[Childs, Cleve, Deotto, Farhi, Gutmann, Spielman, STOC 2003]





$$A = \begin{pmatrix} 0 & 1 & 1 & 0 & 0 \\ 1 & 0 & 0 & 1 & 1 \\ 1 & 0 & 0 & 1 & 0 \\ 0 & 1 & 1 & 0 & 1 \\ 0 & 1 & 0 & 1 & 0 \end{pmatrix}$$

adjacency matrix



A =	$\begin{pmatrix} 0\\1\\1\\0\\0 \end{pmatrix}$	$ \begin{array}{c} 1 \\ 0 \\ 0 \\ 1 \\ 1 \end{array} $	$ \begin{array}{c} 1 \\ 0 \\ 0 \\ 1 \\ 0 \end{array} $	$0\\1\\1\\0\\1$	$\begin{pmatrix} 0 \\ 1 \\ 0 \\ 1 \\ 0 \end{pmatrix}$	L =	$\begin{pmatrix} 2\\ -1\\ -1\\ 0\\ 0 \end{pmatrix}$	$-1 \\ 3 \\ 0 \\ -1 \\ -1$	$-1 \\ 0 \\ 2 \\ -1 \\ 0$	$0 \\ -1 \\ -1 \\ 3 \\ -1$	$\begin{pmatrix} 0 \\ -1 \\ 0 \\ -1 \\ 2 \end{pmatrix}$
adjacency matrix						Laplacian					2]



Random walk on G

State: Probability $p_v(t)$ of being at vertex v at time tDynamics: $\frac{d}{dt}\vec{p} = L\vec{p}$



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State: Probability $p_v(t)$ of being at vertex v at time tDynamics: $\frac{d}{dt}\vec{p} = L\vec{p}$

Quantum walk on G

State: Amplitude $a_v(t)$ to be at vertex v at time tDynamics: $i \frac{d}{dt} \vec{a} = L \vec{a}$



Formula evaluation



Quantum simulation

$$i \frac{\mathrm{d}}{\mathrm{d}t} \psi(t) = H \psi(t)$$

Universal computation



Formula evaluation

 Ambainis, Childs, Reichardt, Špalek, and Zhang, FOCS 2007, pp. 363–372; SIAM Journal on Computing 39, 2513–2530 (2010)

Query complexity of formula evaluation

Query model: given a black box for a string $x \in \{0,1\}^n$

$$i - x - x_i$$

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Classical complexity: $\Theta(n)$



Classical complexity: $\Theta(n)$ Quantum algorithm [Grover 1996]: $O(\sqrt{n})$



Classical complexity: $\Theta(n)$ Quantum algorithm [Grover 1996]: $O(\sqrt{n})$ Quantum lower bound [BBBV 1996]: $\Omega(\sqrt{n})$

Balanced binary AND-OR trees



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Classical complexity [Snir 85; Saks, Wigderson 86; Santha 95]: $\Theta(n^{0.753})$

Quantum lower bound [Barnum, Saks 02]: $\Omega(\sqrt{n})$ (holds for arbitrary AND-OR formulas)

[Farhi, Goldstone, Gutmann 07]











Claim: For small k, the wave is transmitted if the formula (translated into NAND gates) evaluates to 0, and reflected if it evaluates to 1.

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To get a general algorithm:

- Rewrite the formula to be "approximately balanced"
- Assign weights to the edges of the tree
- Show that eigenvectors are related to the function value

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The quantum query complexity of evaluating any AND-OR formula is $O(n^{\frac{1}{2}+\epsilon})$ (subsequently improved to $O(\sqrt{n})$ [Reichardt 10])

Quantum simulation

- Childs, Communications in Mathematical Physics 294, 581–603 (2010)
- Berry and Childs, Quantum Information and Computation 12, 29–62 (2012)



"... nature isn't classical, dammit, and if you want to make a simulation of nature, you'd better make it quantum mechanical, and by golly it's a wonderful problem, because it doesn't look so easy."

Richard Feynman Simulating physics with computers (1981)

Why simulate quantum mechanics?

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- chemical reactions
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Implementation of quantum algorithms

- continuous-time quantum walk
- adiabatic quantum computation
- linear equations

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A classical computer cannot even represent the state efficiently

By performing measurements on the final state, a quantum computer can efficiently answer questions that (apparently) a classical computer cannot

Sparse Hamiltonians

At most d nonzero entries per row (here d = 4)



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Simulation via product formulas

Original approach to sparse Hamiltonian simulation:

- Decompose $H = \sum_{j} H_{j}$ where each H_{j} is 1-sparse (distributed edge coloring)
- Recombine terms

(product formulas, e.g., $e^{-i(A+B)t} \approx (e^{-iAt/r}e^{-iBt/r})^r$)

[AT 03, CCDFGS 03, BACS 07, CK 10]

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Running time of the best approach of this kind:

- \bullet Superlinear in evolution time t
- \bullet Cubic in sparsity d

[AT 03, CCDFGS 03, BACS 07, CK 10]

Discrete-time quantum walk

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This gives a quantum analog of the Markov chain ${\cal P}$

Hamiltonian simulation by quantum walk

- I. Define an analog of Szegedy's walk for any Hamiltonian H (in place of the stochastic matrix P)
- 2. Show how to perform steps of this walk using queries to the sparse Hamiltonian
- 3. Relate the spectrum of the walk to the spectrum of ${\cal H}$
- 4. Infer information about the spectrum of the walk (and hence of H) using quantum phase estimation
- 5. Introduce the appropriate phase $e^{-i\phi t}$ for each eigenstate of H with eigenvalue ϕ

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Theorem: This running time of this approach is O(dt).

This algorithm is optimal with respect to either d or t alone

Universal computation

• Childs, Physical Review Letters 102, 180501 (2009)

• Childs, Gosset, and Webb, Science 339, 791–794 (2013)

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More generally, attach any number of semi-infinite paths. The scattering behavior is described a unitary matrix called the S-matrix.















To perform a gate, design a graph whose S-matrix implements the desired transformation U at the momentum used for the encoding.



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$$S(k) = \begin{pmatrix} 0 & V \\ U & 0 \end{pmatrix}$$

Universal set of single-qubit gates







momentum for logical states: $k = \pi/4$

Universality construction

With an appropriate encoding of *n*-qubit states, two-qubit gates are trivial.

Implement sequences of gates by concatenation.

Result: Any n-qubit circuit can be simulated by some graph.



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Quantum walks are computationally powerful!

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... but not a new architecture (the graph is necessarily exponentially large).

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- Quantum walks with many interacting walkers (on small graphs) are also computationally powerful
- New architecture for a quantum computer (with no time-dependent control)
- Simulating the dynamics of interacting many-body systems is BQPhard (e.g., the "Bose-Hubbard model" on a sparse, unweighted, planar graph)

Universal computation with many walkers

Main new idea: a gadget that implements a two-qubit interaction via momentum-dependent routing



(+ extensive analysis to show the strategy works on a finite graph with small error)



Quantum walk is a powerful algorithmic tool.

Formula evaluation



Quantum simulation

$$i \frac{\mathrm{d}}{\mathrm{d}t} \psi(t) = H \psi(t)$$





When will we have large-scale quantum computers?



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We can (and should!) address many crucial questions now:

• How can we design cryptosystems that resist quantum attacks?

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- What other tools are useful for building quantum algorithms?

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- How can we design cryptosystems that resist quantum attacks?
- How efficiently can quantum computers simulate quantum systems?
- What other problems have fast quantum algorithms?
- What other tools are useful for building quantum algorithms?
- What problems are hard even for quantum computers?