Title: Limits on efficient computation in the physics world

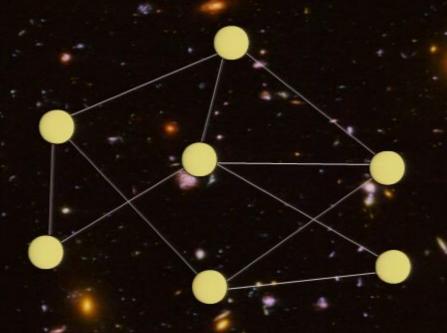
Date: Mar 15, 2006 04:00 PM

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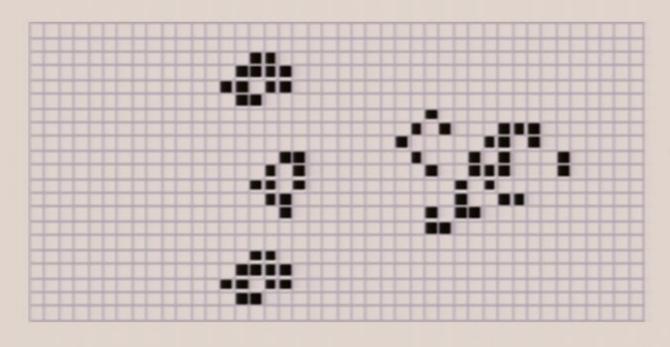
Abstract:

Pirsa: 06030013

Limits on Efficient Computation in the Physical World

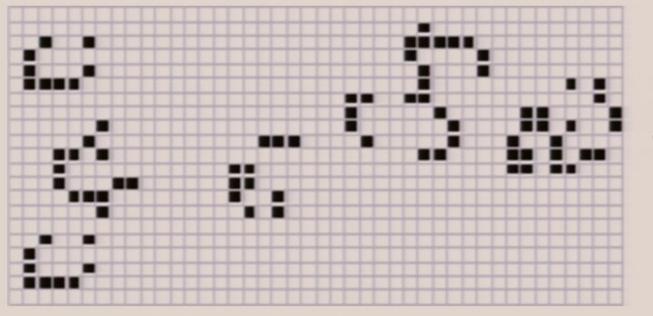


Scott Aaronson
University of Waterloo



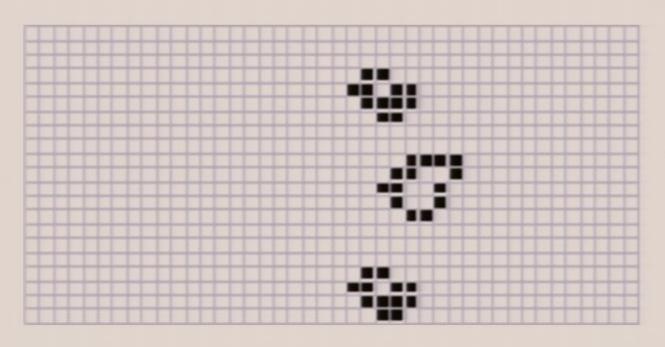
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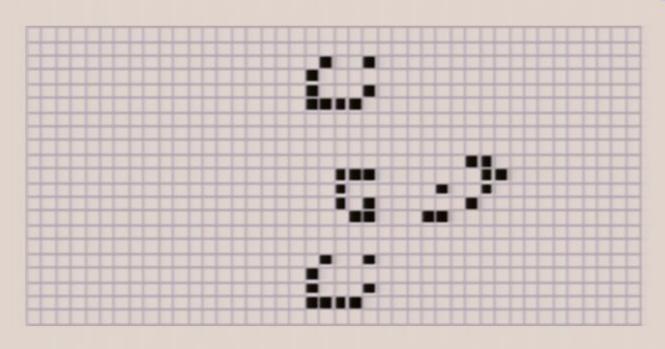
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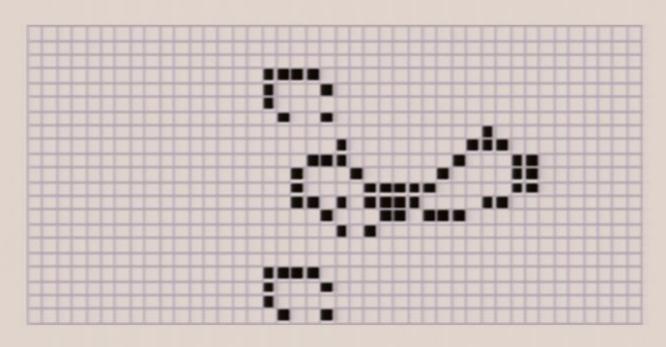
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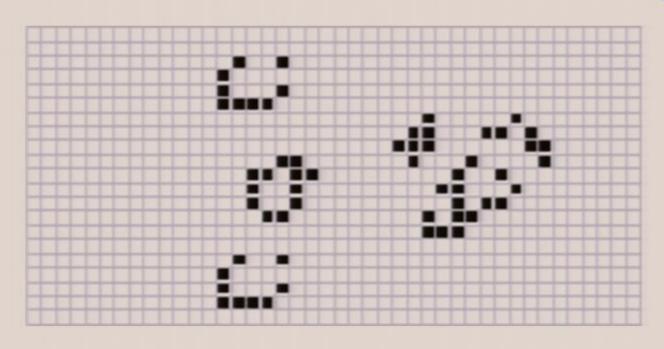
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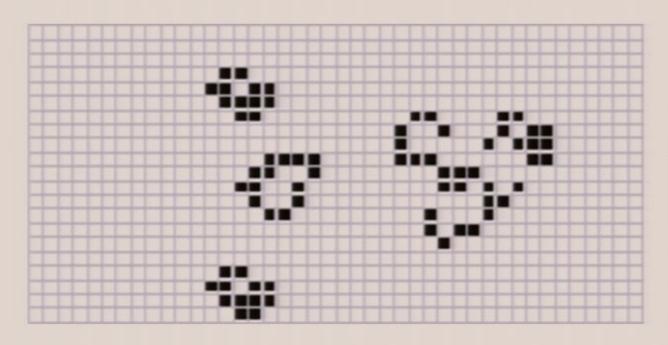
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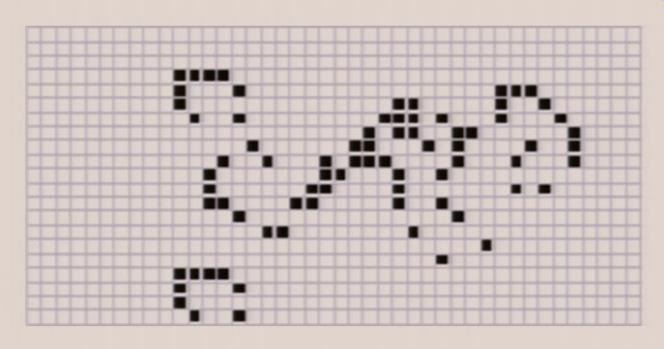
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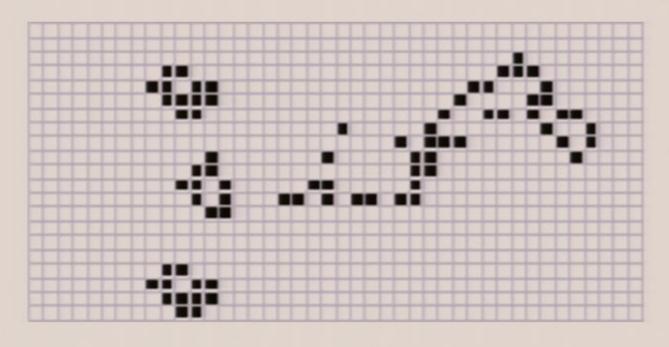
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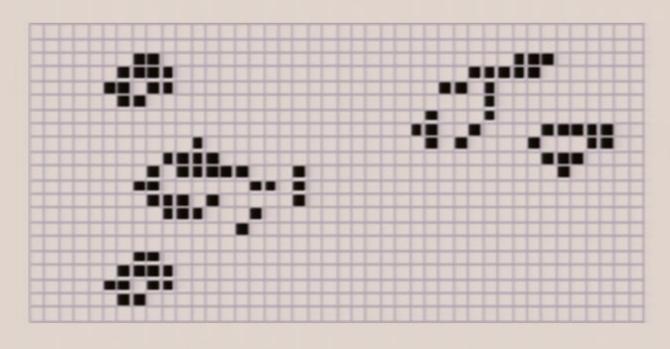
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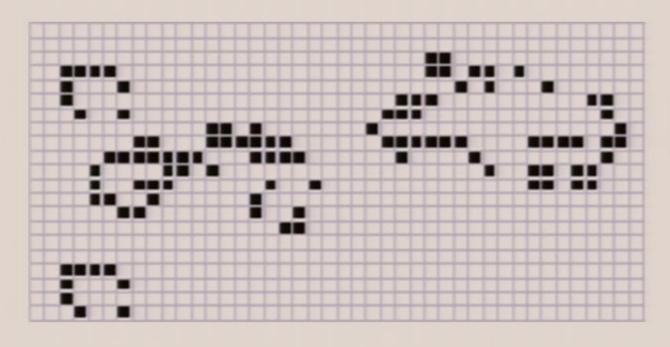
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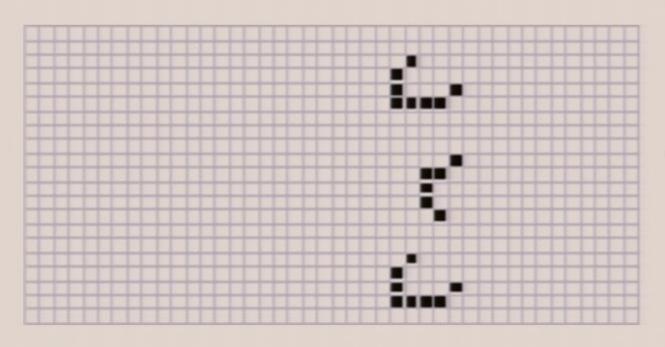
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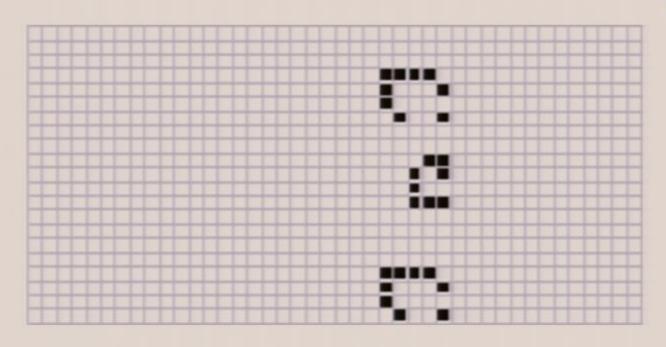
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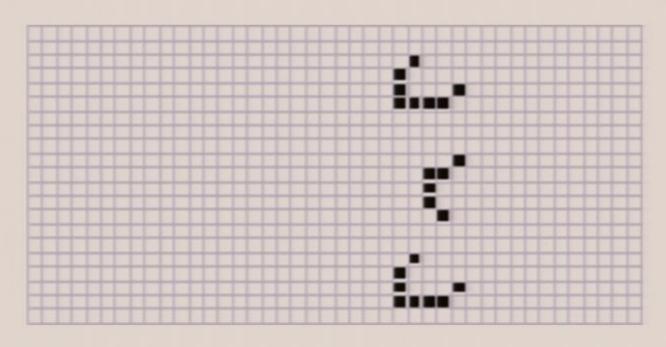
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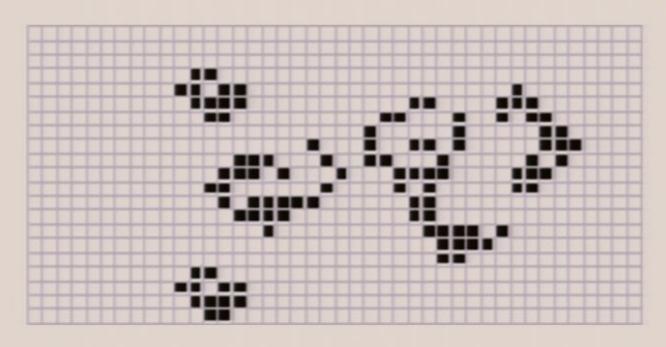
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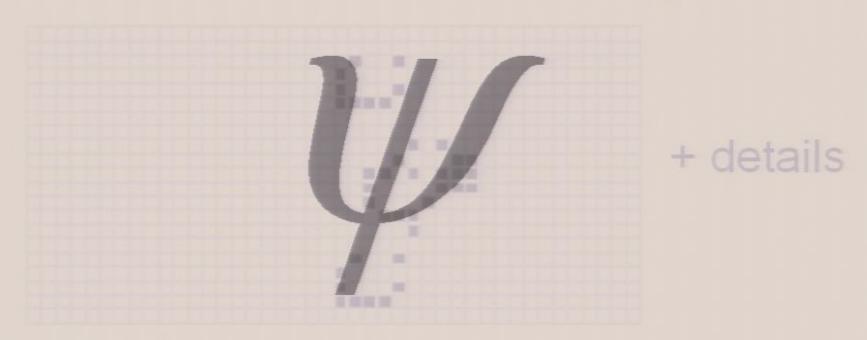
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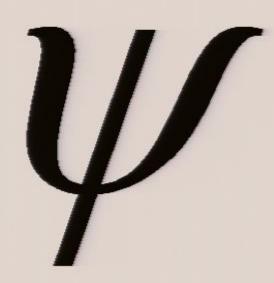


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Quantum computing challenges this picture

That's why everyone should care about it, whether or not quantum factoring machines

Pirsa: 06000018 ever built



Quantum computing challenges this picture

That's why everyone should care about it, whether or not quantum factoring machines

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PLAN OF TALK

Background
The gospel according to Shor

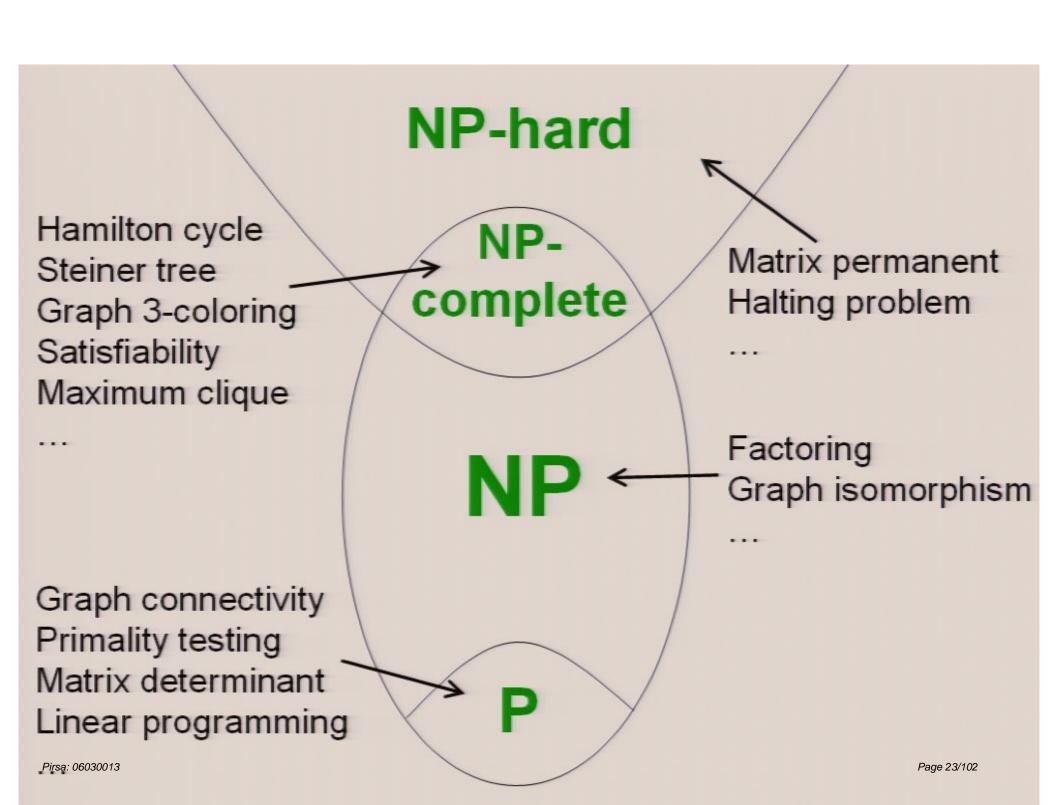
Part I: Limitations of Quantum Computers A lower bound extravaganza

Part II: Models and Reality ls the quantum computing model too powerful? Or not powerful enough?

Background The gospel according to Shor

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Quantum Computing

A quantum state of n "qubits" takes 2ⁿ complex numbers to describe:

$$\sum_{x \in \{0,1\}^n} \alpha_x |x\rangle$$

The goal of quantum computing is to exploit this exponentiality in Nature.

BQP: Bounded-Error Quantum Polynomial-Time

Class of problems solvable efficiently using a

Pirsa: 06000111 antum computer



Bernstein-Vazirani 1993:

$$P \subseteq BQP \subseteq PSPACE$$

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Bernstein-Vazirani 1993:

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Interesting



Shor 1994: Factoring is in BQP

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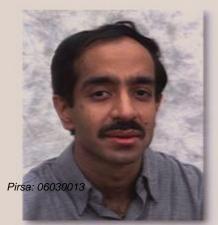
Bernstein-Vazirani 1993:

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Interesting



Shor 1994: Factoring is in BQP



Grover 1996: Quantum algorithm to search an N-element array in √N steps

Part I: Limitations of Quantum Computers A lower bound extravaganza

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The Quantum Black Box Model

I do believe it Against an oracle.

-Shakespeare, The Tempest

We count only the number of queries to an oracle, not the number of computational steps

Example: Given a function $f:\{0,1\}^n \rightarrow \{0,1\}$, decide if there's an x such that f(x)=1

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We count only the number of queries to an oracle, not the number of computational steps

Example: Given a function $f:\{0,1\}^n \rightarrow \{0,1\}$, decide if there's an x such that f(x)=1

- Like solving an NP-complete problem by brute force
- Classically, ~2ⁿ queries to f needed
- Grover's algorithm uses only ~2^{n/2}
- BBBV 1997: Grover is optimal

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Algorithm's state:

$$\sum_{x,w} \alpha_{x,w} | x, w \rangle$$

x: location to query

w: "workspace" qubits

After a query transformation:

$$\sum_{x,w} \alpha_{x,w} | x, w \oplus f(x) \rangle$$

Between two queries, we can apply an arbitrary unitary matrix that doesn't depend on f

Complexity = minimum number of queries needed to achieve $\sum_{x,w} |\alpha_{x,w}|^2 \ge \frac{2}{2} \quad \text{for all oracles f}$

|x,w | corresponding to right answer

Problem: Find 2 numbers that are the same (each number appears twice)

28 12 18 76 96 82 94 99 21 78 88 93 39 44 64 32 99 70 18 94 82 92 64 95 46 53 16 35 42 72 40 75 71 93 32 47 11 70 37 78 79 36 63 40 69 92 10 28 85 41 80 10 52 63 88 65 43 84 67 57 31 98 39 65 74 24 90 26 83 60 91 27 96 35 20 26 52 95 57 66 97 54 30 62 79 33 84 50 38 49 17 47 24 54 48 98 23 41 16 66 75 38 13 58 56 86 34 73 61 73 21 44 62 34 14 51 74 76 83 37 90 58 13 71 25 29 25 56 68 12 11 51 23 77 68 72 43 69 46 87 97 45 59 14 30 19 81 60 85 80 50 61 59 89 67 89 29 86 48 22 15 17 Pirsa: 06030013 36 27 42 55 77 19 45 15 53 22 91 87 2 Page 33/1023

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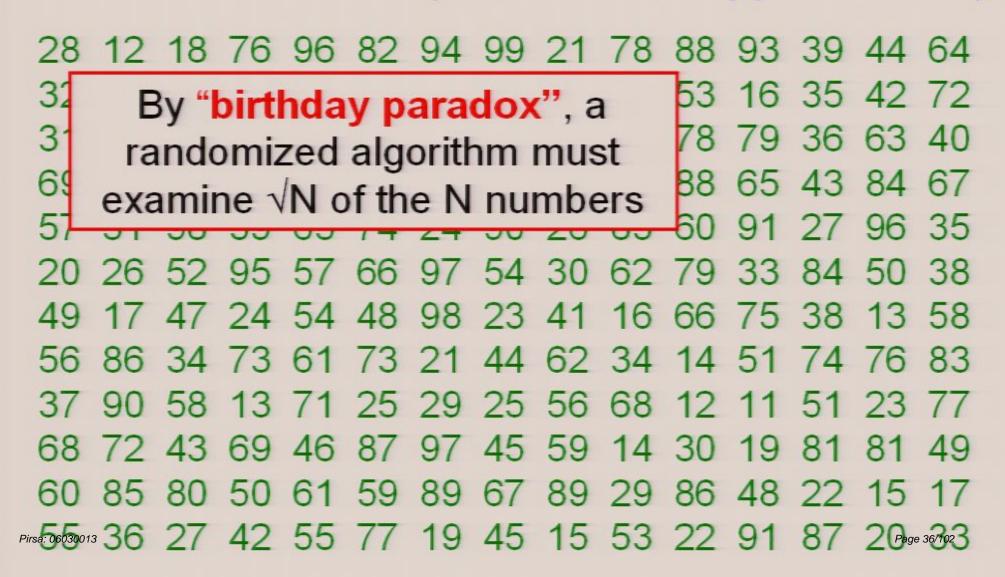
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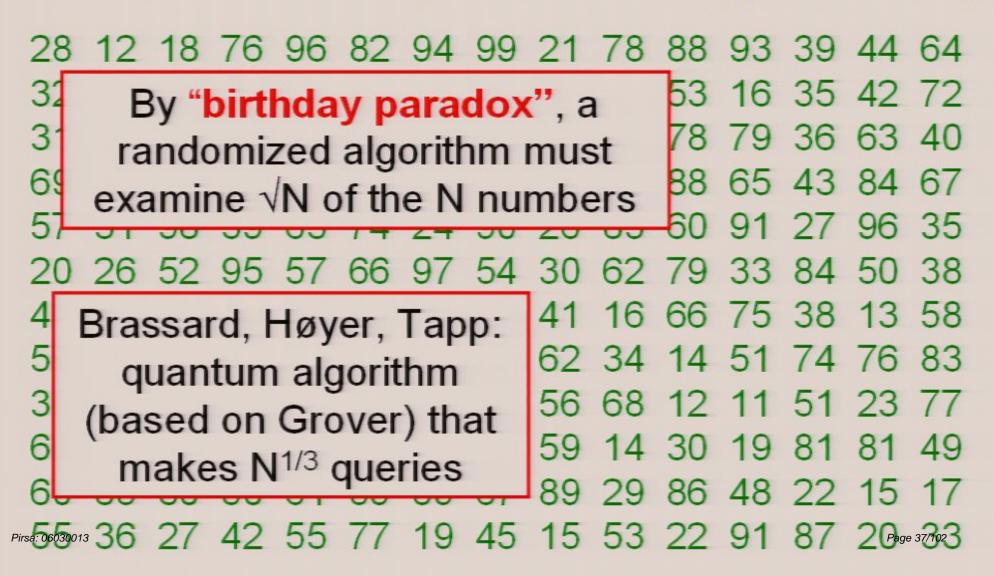
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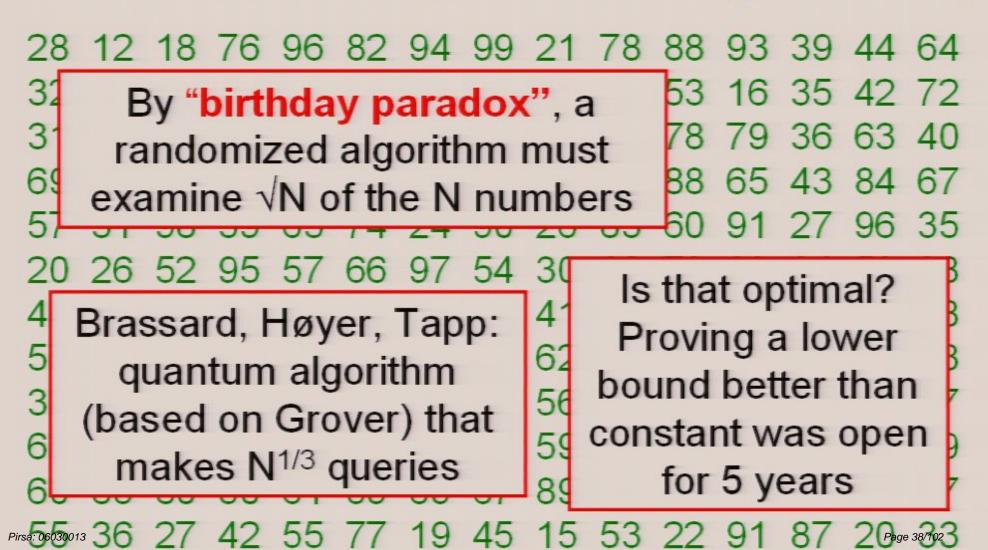
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Problem: Find 2 numbers that are the same (each number appears twice)

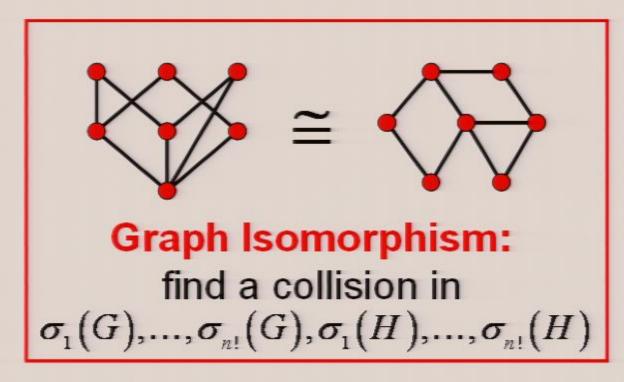


Problem: Find 2 numbers that are the same (each number appears twice)



Motivation for the Collision Problem

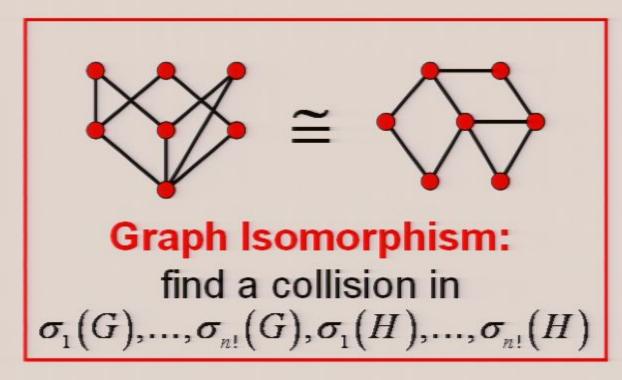




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Motivation for the Collision Problem





What makes proving a lower bound hard is that a quantum computer can almost find a collision in 1 query:

register

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A. 2002: N^{1/5} lower bound on quantum query complexity of the collision problem

Improved to N^{1/3} and generalized by Shi, Kutin, Ambainis, and Midrijanis

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T-query quantum algorithm that finds collisions in 2-to-1 functions

T-query algorithm that distinguishes 1-to-1 from 2-to-1 functions

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T-query quantum algorithm that finds collisions in 2-to-1 functions

T-query algorithm that distinguishes 1-to-1 from 2-to-1 functions

 $p(X) \in [0, 1/3]$ if X is 1-to-1

 $p(X) \in [2/3, 1]$ if X is 2-to-1

Key insight: $p(X) \in [0,1]$ even if X is 3-to-1, 4-to-1, etc.

Beals et al. 1998:

Multilinear polynomial p of degree ≤ 2T, such that p(X) = probability algorithm says X is 2-to-1

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T-query quantum algorithm that finds collisions in 2-to-1 functions

T-query algorithm that distinguishes 1-to-1 from 2-to-1 functions

 $p(X) \in [0, 1/3]$ if X is 1-to-1

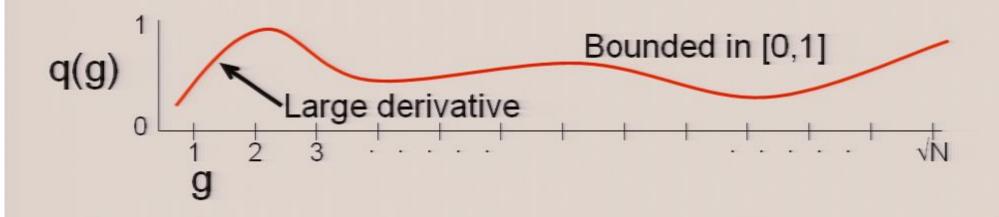
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Beals et al. 1998:

Multilinear polynomial p of degree ≤ 2T, such that p(X) = probability algorithm says X is 2-to-1

Univariate polynomial q such that $deg(q) \le deg(p)$, and q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions Q(g) over all g-to-1 functions <math>Q(g) = average of p(X) over all g-to-1 functions Q(g) over all g-to-1 functions Q(g)



Markov's Inequality implies such a polynomial must have large degree

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Direct Product Theorem for Quantum Search

N items, K of them marked

A. 2004: With few ($\ll \sqrt{N}$) queries, the probability of finding all K marked items is $2^{-\Omega(K)}$

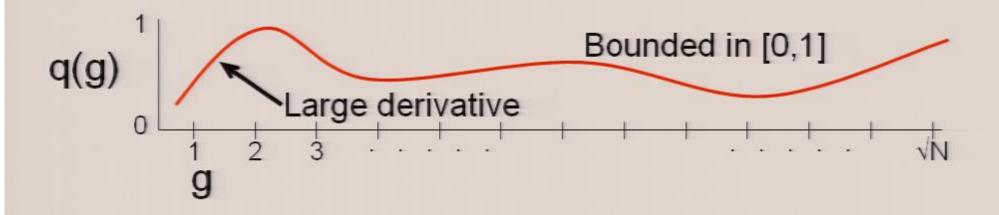
Proof uses polynomial method

Corollary 1: Exists oracle relative to which NP ⊄ BQP/qpoly

(BQP/qpoly = BQP with polynomial-size "quantum advice")

Corollary 2: Fixes flawed result of Klauck on Pirsa: 06030013 quantum time-space tradeoffs for sorting

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Markov's Inequality implies such a polynomial must have large degree

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Direct Product Theorem for Quantum Search

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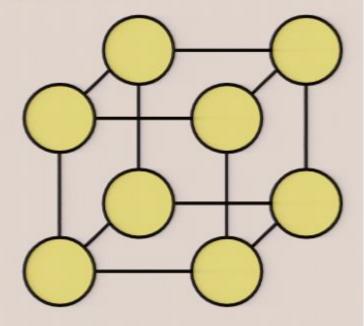
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Quantum Generosity ... Giving back because we care TM Examples: Kerenidis & de Wolf 2003, Aharonov & Regev 2004

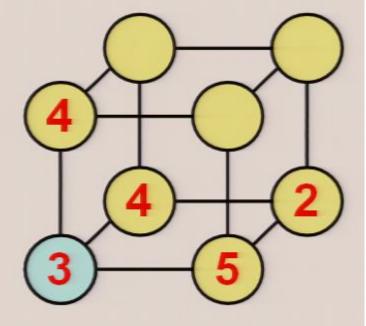
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Local Search: Given oracle access to $f:\{0,1\}^n \rightarrow \mathbb{Z}$, find a local minimum of f using as few queries as possible



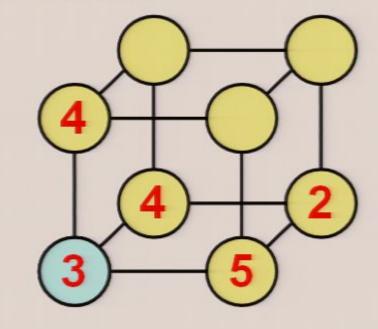
Pirsa: 06030013

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Local Search: Given oracle access to $f:\{0,1\}^n \rightarrow \mathbb{Z}$, find a local minimum of f using as few queries as possible



Aldous 1983: Randomized algorithm needs 2^{n/2-o(n)} queries

A. 2004: Quantum algorithm needs 2^{n/4}/n queries

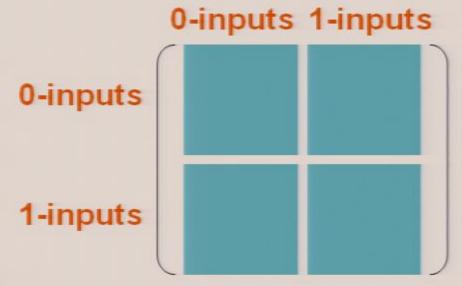
⇒ PLS (Polynomial Local Search) is hard for BQP relative to oracle

Upper bounds:

2^{n/2}√n randomized, 2^{n/3}n^{1/6} quantum

Proof technique based on Ambainis' quantum adversary method

Each query only separates 0-inputs from 1-inputs by so much



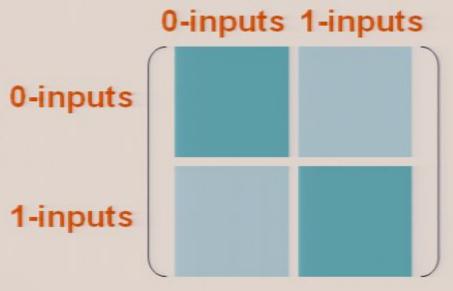
Technique also yields

- 2n/2/n² randomized lower bound
- First lower bounds (randomized or quantum)

Pirsa: 0603 for constant-dimensional grid graphs

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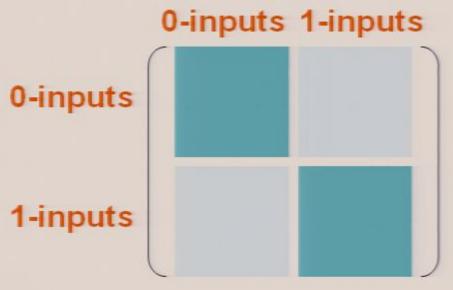
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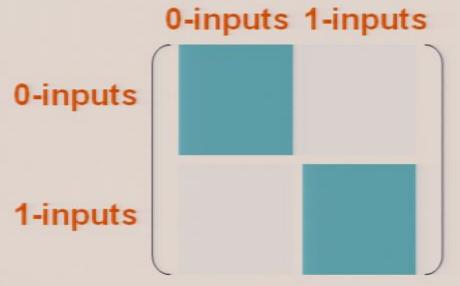
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Each query only separates 0-inputs from 1 inputs by so

0-inputs

0-inputs 1-inputs

Techn

2n/2/r

Results generalized to all graphs by Santha & Szegedy 2004, and tightened by Zhang 2006

First lower bounds (randomized or quantum)

Pirsa: 0603 fror constant-dimensional grid graphs

Summary

- The Art of the Quantum Lower Bound
 - –Polynomials and adversaries—the dynamic duo
 - -Techniques even applied classically

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Summary

- The Art of the Quantum Lower Bound
 - -Polynomials and adversaries—the dynamic duo
 - -Techniques even applied classically
- Quantum computing is not a panacea
 - –Many problems still intractable: NP, collisionfinding, local search...
 - -Even with quantum advice

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Summary

- The Art of the Quantum Lower Bound
 - -Polynomials and adversaries—the dynamic duo
 - -Techniques even applied classically
- Quantum computing is not a panacea
 - –Many problems still intractable: NP, collisionfinding, local search...
 - -Even with quantum advice
- Quantum computing ≠ exponential parallelism
 - -Popular articles get this wrong
- -Because of linearity, one "parallel universe" can't shout above the others

Background

The gospel according to Shor

Part I: Limitations of Quantum Computers A lower bound extravaganza

Part II: Models and Reality ls the quantum computing model too powerful? Or not powerful enough?

Is quantum computing just obvious baloney?



Leonid Levin:

"We have never seen a physical law valid to over a dozen decimals"



Oded Goldreich:

Exponentially long vectors ⇒ exponential time to manipulate

Sure/Shor separators

My response: What criterion separates the quantum states that suffice for factoring from the states we've already seen?









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Sure/Shor separators

My response: What criterion separates the quantum states that suffice for factoring from the states we've already seen?

Not exponentially small amplitudes or thousands of coherent qubits

$$\left(\frac{\left|0\right\rangle + \left|1\right\rangle}{\sqrt{2}}\right)^{\otimes 10000}$$

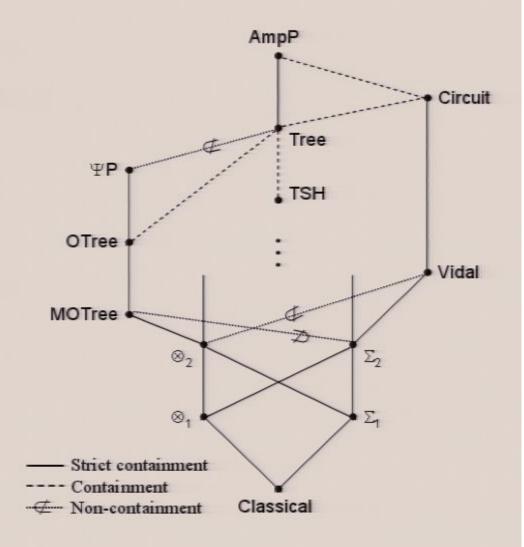
$$\frac{\left|0\right\rangle^{\otimes 10000} + \left|1\right\rangle^{\otimes 10000}}{\sqrt{2}}$$

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A. 2004 proposes a complexity classification of quantum states to help answer this question

Main result: States arising in quantum error-correction take n^{Ω(log n)} additions and tensor products to express

Proof applies Ran Raz's breakthrough lower bound on multilinear formula size

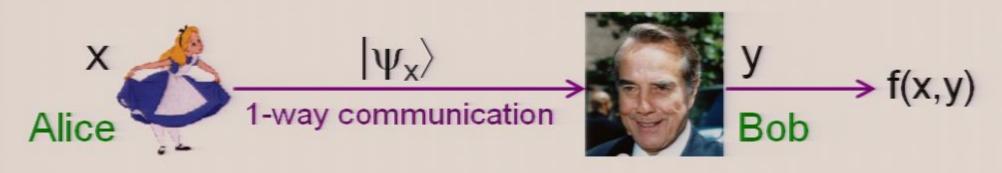


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Are quantum states really "exponential-sized objects"?

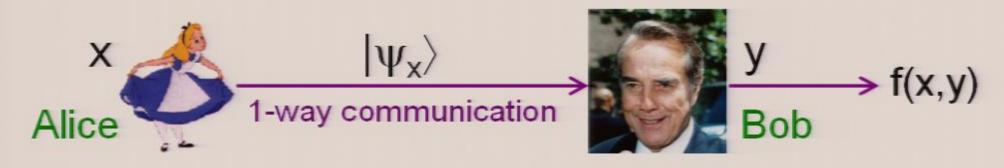
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Are quantum states really "exponential-sized objects"?



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Are quantum states really "exponential-sized objects"?



A., CCC'04: Given f: $\{0,1\}^n \times \{0,1\}^m \to \{0,1\}$ (partial or total), $D^1(f) = O(m Q^1(f) logQ^1(f))$

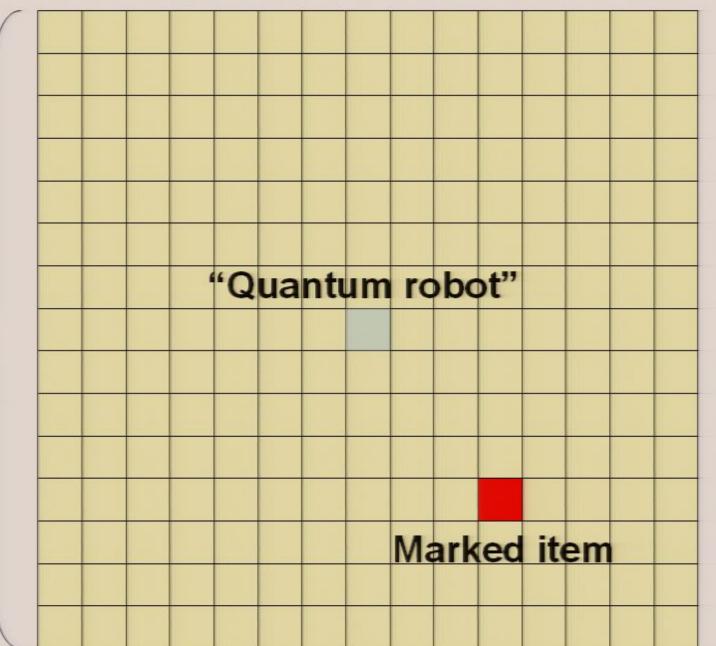
D1(f) = deterministic 1-way communication complexity

Q1(f) = bounded-error quantum 1-way complexity

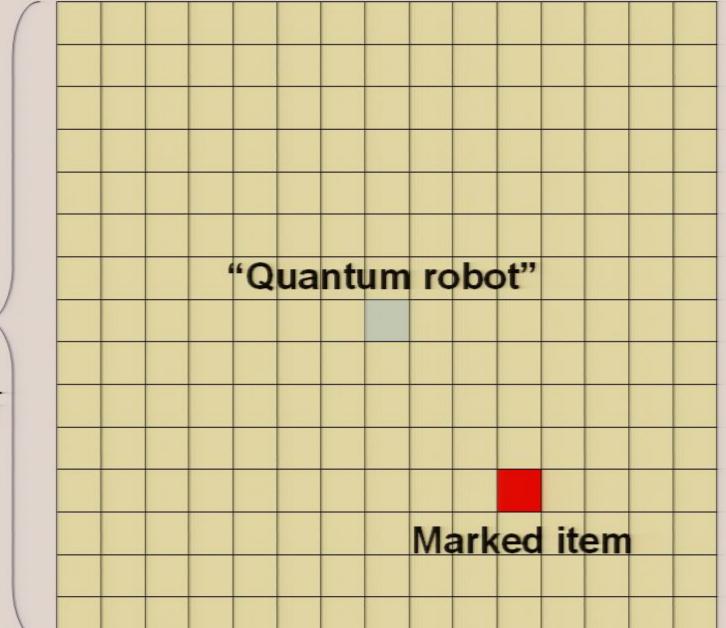
Corollary: BQP/qpoly ⊆ PostBQP/poly

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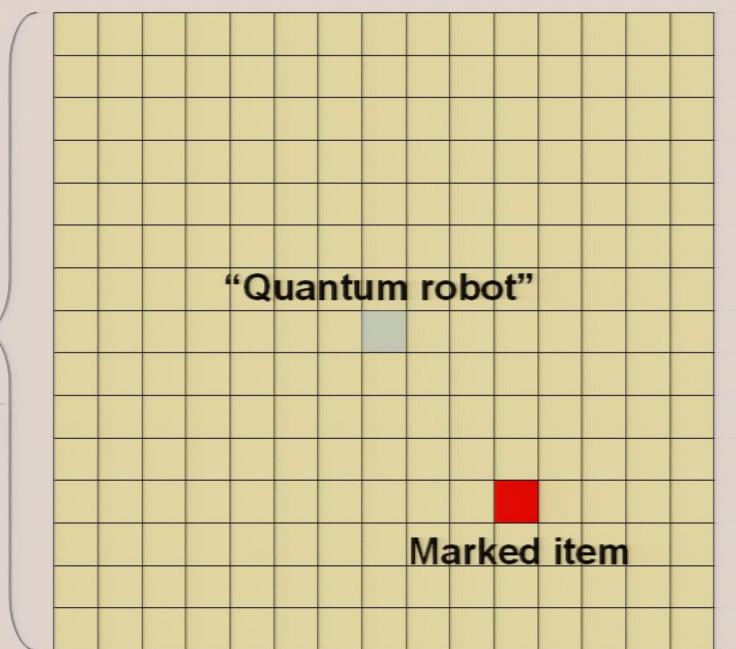
Grover Search of a Physical Region



Grover Search of a Physical Region



Grover Search of a Physical Region



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Grover Search of a Physical Region

Benioff 2001: Each of the √N Grover iterations takes √N time, just to move the robot across the grid. So no improvement over classical

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Grover Search of a Physical Region

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A. and Ambainis 2003: Sadly, no lower bound... Using divide-and-conquer, can search d-dimensional cube in √N log^{3/2}N time for d=2, or √N for d≥3

Corollary: O(√N)-qubit disjointness protocol

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Grover Search of a Physical Region

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Corollary: O(√N)-qubit disjointness protocol

My motivation: What computational limitations are imposed by the speed of light being finite?

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Guess a random solution by measuring electron spins. If solution is wrong, kill yourself

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|00000 |00001 |00010 |00011 |01000 |01010 |01110 |01111 | |10000 |10010 |**10100** |10110 |11000 |11010 |11110 |11111

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Guess a random solution by measuring electron spins. If solution is wrong, kill yourself

Let PostBQP (Postselected Bounded-Error Quantum Polynomial-Time) be class of problems solvable this way

A. 2004: PostBQP = PP

Corollary: Numerous "small" changes to quantum mechanics would let us solve PP-complete problems—nonunitary matrices, $|\alpha|^p$ for $p\neq 2, ...$

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Guess a random so spins. If solution is

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Let PostBQP be cla

A. 2004:

mechanics problems Immediately implies

Beigel-ReingoldSpielman Theorem from
classical CS:

PP is closed under intersection

ntum

lime)





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Stochastic Hidden-Variable Theories

Time

$$\alpha_1^{(1)} |1\rangle + \alpha_2^{(1)} |2\rangle + \alpha_3^{(1)} |3\rangle + \alpha_4^{(1)} |4\rangle + \alpha_5^{(1)} |5\rangle$$

$$\alpha_1^{(2)} | \alpha_2^{(2)} | 2 \rangle + \alpha_3^{(2)} | 3 \rangle + \alpha_4^{(2)} | 4 \rangle + \alpha_5^{(2)} | 5 \rangle$$

$$\alpha_1^{(3)} |1\rangle + \alpha_2^{(3)} |2\rangle + \alpha_3^{(3)} |3\rangle + \alpha_4^{(3)} |4\rangle + \alpha_5^{(3)} |5\rangle$$

$$\alpha_1^{(4)} |1\rangle + \alpha_2^{(4)} |2\rangle + \alpha_3^{(4)} |3\rangle + \alpha_4^{(4)} |4\rangle + \alpha_5^{(4)} |5\rangle$$

$$\alpha_1^{(5)} |1\rangle + \alpha_2^{(5)} |2\rangle + \alpha_3^{(5)} |3\rangle + \alpha_4^{(5)} |4\rangle + \alpha_5^{(5)} |5\rangle$$

Quantum state of the universe

Stochastic Hidden-Variable Theories

Time $\alpha_1^{(1)} |1\rangle + \alpha_2^{(1)} |2\rangle + \alpha_3^{(1)} |3\rangle + \alpha_4^{(1)} |4\rangle + \alpha_5^{(1)} |5\rangle$

$$\alpha_1^{(2)} |1\rangle + \alpha_2^{(2)} |2\rangle + \alpha_3^{(2)} |3\rangle + \alpha_4^{(2)} |4\rangle + \alpha_5^{(2)} |5\rangle$$

$$\alpha_1^{(3)} |1\rangle + \alpha_2^{(3)} |2\rangle + \alpha_3^{(3)} |3\rangle + \alpha_4^{(3)} |4\rangle + \alpha_5^{(3)} |5\rangle$$

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Quantum state of the universe

Suppose your whole life history flashed before you in an instant

Let DQP (Dynamical Quantum Polynomial-Time) be the class of problems you could then solve efficiently (assuming transition probabilities satisfy two reasonable axioms—symmetry and locality)

A. 2002: DQP contains Graph Isomorphism (indeed all of Statistical Zero Knowledge)

$$\frac{1}{\sqrt{2}}(|\sigma\rangle + |\tau\rangle)|\sigma(G)\rangle$$

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Together with collision lower bound, strong evidence that BQP ⊂ DQP

QMA: Quantum version of NP

QCMA: Same as QMA, but with quantum verification of *classical* proofs

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Does QMA = QCMA?

A. and Kuperberg 2006: "Quantum oracle separation" between QMA and QCMA

A. 2006: QMA/qpoly ⊆ PSPACE/poly

Contrasts with result of Raz that QIP/qpoly=ALL

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Current Work

 Quantum copy-protection and quantum software obfuscation

- BQP with closed timelike curves = PSPACE (with John Watrous)

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- The Ogre of Intractability:
 - Not even quantum computers escape

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- The Ogre of Intractability:
 - Not even quantum computers escape
- Lower bound techniques "unreasonably effective"

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- The Ogre of Intractability:
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- Lower bound techniques "unreasonably effective"
- Challenge for quantum computing skeptics
 - Give us a better picture of the world

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- The Ogre of Intractability:
 - Not even quantum computers escape
- Lower bound techniques "unreasonably effective"
- Challenge for quantum computing skeptics
 - Give us a better picture of the world
- Computer science and fundamental physics: a match made in Hilbert space
 - New perspective forces us to take QM seriously
 - Insights into hidden variables, postselection, holographic entropy bound, ...
 - Computational input to quantum gravity?
- Pirsa: 06030013 Intractability as a physical axiom?

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