

Quantum Computing

A Tutorial at the
2006 Genetic and Evolutionary Computation Conference
(GECCO-2006)

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What is quantum computation?

Computation with coherent atomic-scale dynamics.

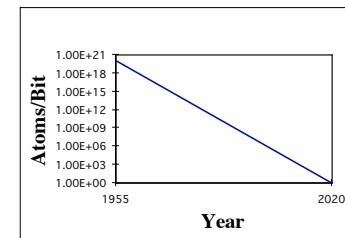


The behavior of a quantum computer is governed
by the laws of quantum mechanics.

Overview

- ◆ What is quantum computation?
- ◆ Why might it be important?
- ◆ How does/might it work?
- ◆ Simulating a quantum computer.
- ◆ Some quantum algorithms.
- ◆ Evolution of new quantum algorithms.
- ◆ Sources for more information.

Why bother with quantum computation?



- ◆ Moore's Law: the amount of information storable on a given amount of silicon has roughly doubled every 18 months. We hit the quantum level 2010 ~ 2020.
- ◆ Quantum computation is more powerful than classical computation. More can be computed in less time—the complexity classes are different!

The power of quantum computation

- ◆ In quantum systems *possibilities count*, even if they never happen!
- ◆ Each of exponentially many *possibilities* can be used to perform a part of a computation *at the same time*.

Absurd but taken seriously

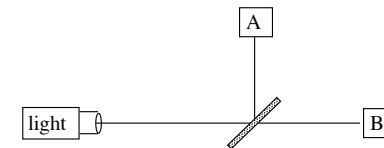
(not just quantum mechanics but also quantum computation)

- ◆ Under active investigation by many of the top physics labs around the world (including CalTech, MIT, AT&T, Stanford, Los Alamos, UCLA, Oxford, l'Université de Montréal, University of Innsbruck, IBM Research...)
- ◆ In the mass media (including *The New York Times*, *The Economist*, *American Scientist*, *Scientific American*, ...)
- ◆ Here.

Nobody understands quantum mechanics

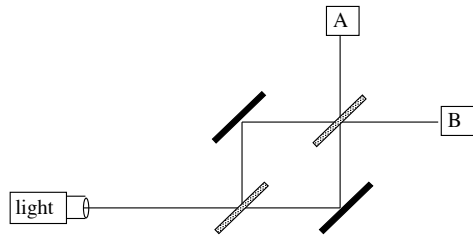
- ◆ “Anybody who is not shocked by quantum mechanics hasn’t understood it.” —Niels Bohr
- ◆ “No, you’re not going to be able to understand it. ... You see, my physics students don’t understand it either. That is because **I** don’t understand it. Nobody does. ... The theory of quantum electrodynamics describes Nature as absurd from the point of view of common sense. And it agrees fully with experiment. So I hope you can accept Nature as She is—absurd.” —Richard Feynman

A beam splitter



Half of the photons leaving the light source arrive at detector A; the other half arrive at detector B.

An interferometer



- ◆ Equal path lengths, rigid mirrors.
- ◆ Only one photon in the apparatus at a time.
- ◆ All of the photons leaving the light source arrive at detector B. WHY?

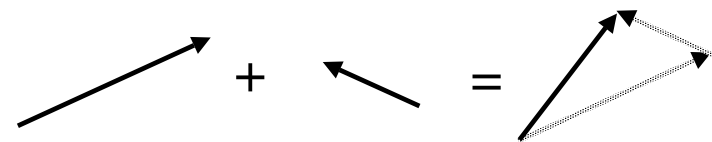
Calculating interference

- ◆ “You will have to brace yourselves for this—not because it is difficult to understand, but because it is absolutely ridiculous: All we do is draw little arrows on a piece of paper—that’s all!” —Richard Feynman
- ◆ Arrows for each possibility.
- ◆ Arrows rotate; speed depends on frequency.
- ◆ Arrows flip 180° at mirrors, rotate 90° counter-clockwise when reflected from beam splitters.
- ◆ Add arrows and square the length of the result to determine the probability for any possibility.

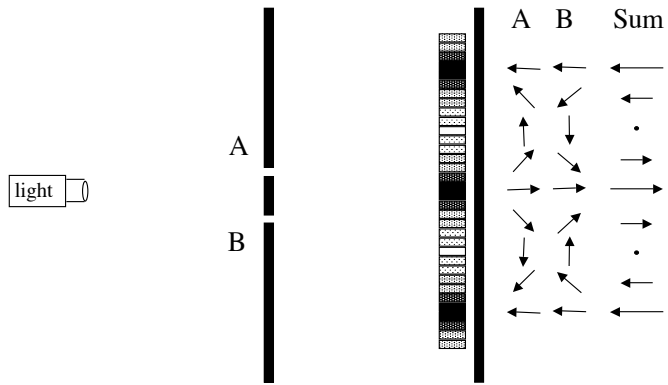
Possibilities count

- ◆ There is an “amplitude” for each possible path that a photon can take.
- ◆ The amplitudes can interfere constructively and destructively, even though each photon takes only one path.
- ◆ The amplitudes at detector A interfere destructively; those at detector B interfere constructively.

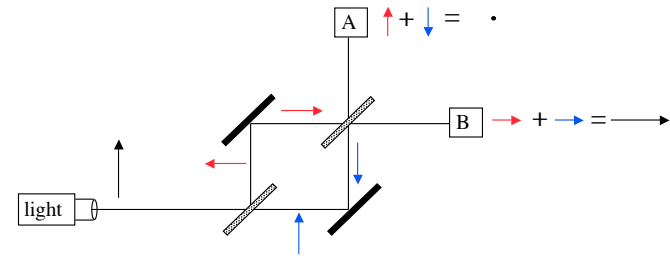
Adding arrows



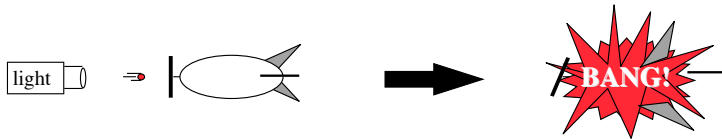
Double slit interference



Interference in the interferometer

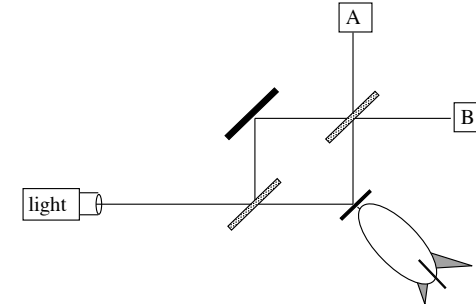


A photon-triggered bomb



- ◆ A mirror is mounted on a plunger on the bomb's nose.
- ◆ A single photon hitting the mirror depresses the plunger and explodes the bomb.
- ◆ Some plungers are stuck, producing duds.
- ◆ How can you find a good, unexploded bomb?

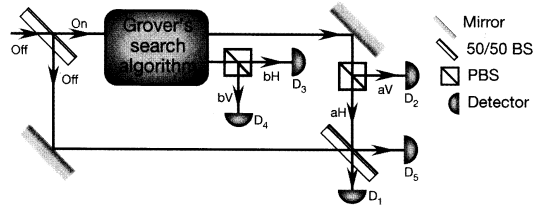
Elitzur-Vaidman bomb testing



- ◆ Possibilities count!
- ◆ Experimentally verified
- ◆ Can be enhanced to reduce or eliminate bomb loss
[Kwiat, Weinfurter and Kasevich]

Counterfactual quantum computation

- ◆ Hosten et al. used optical counterfactual computation to conduct a search without running the search algorithm (*Nature* **439**, 23 Feb 2006).
- ◆ They also used a “chained Zeno effect”—a sequence of interferometers—to boost the inference probability to unity.



(Image scanned from the *Nature* article.)

Reminder:

exponential savings is **very** good!

Factor a 5,000 digit number:

- Classical computer (1ns/instr, ~today's best alg)
 - » **over 5 trillion years**
(the universe is ~ 10–16 billion years old).
- Quantum computer (1ns/instr, ~Shor's alg)
 - » just over 2 minutes

Two interesting speedups

- ◆ Grover's quantum database search algorithm finds an item in an unsorted list of n items in $O(\sqrt{n})$ steps; classical algorithms require $O(n)$.
- ◆ Shor's quantum algorithm finds the prime factors of an n -digit number in time $O(n^3)$; the best known classical factoring algorithms require at least time $O(2^{n^{1/3}} \log(n)^{2/3})$.

Quantum computing and the human brain

- ◆ Penrose's argument
 - Brains do X (for X uncomputable)
 - Classical computers can't do X
 - \therefore Brains aren't classical computers
- First premise is false for all proposed X . For example, brains don't have knowably sound procedures for mathematical proof.
- Would imply brains more powerful than quantum computers; new physics.

Quantum consciousness?

- ◆ Relation to consciousness etc. is much discussed, unclear at best. (Bohm, Penrose, Hameroff, others)
- ◆ “[Penrose’s] argument seemed to be that consciousness is a mystery and quantum gravity is another mystery so they must be related.” (Hawking)

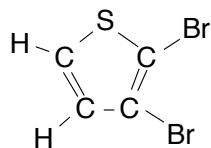
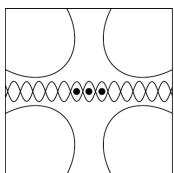
Quantum information theory

- ◆ Quantum cryptography: secure key distribution
- ◆ Quantum teleportation
- ◆ Quantum data compression
- ◆ Quantum error correction

Good introductions to these topics can be found in (Steane, 1998).

Physical implementation

- ◆ Ion traps
- ◆ Nuclear spins in NMR devices
- ◆ Optical systems
- ◆ So far: few qubits, impractical
- ◆ A lot of current research



Languages and notations

- ◆ Wave equations
- ◆ Wave diagrams
- ◆ Matrix mechanics
- ◆ Dirac’s bra-ket notation ($\langle\phi|\psi\rangle$)
- ◆ Particle diagrams
- ◆ Amplitude diagrams
- ◆ Phasor diagrams
- ◆ QGAME programs

Qubits

- ◆ The smallest unit of information in a quantum computer is called a “qubit”.
- ◆ A qubit may be in the “on” (1) state or in the “off” (0) state or in any superposition of the two!

Entanglement

- ◆ Qubits in a multi-qubit system are not independent—they can become “entangled.” (We’ll see some examples.)
- ◆ To represent the state of n qubits one usually uses 2^n complex number amplitudes.

State representation, 1 qubit

- ◆ The state of a qubit can be represented as:

$$\alpha_0|0\rangle + \alpha_1|1\rangle$$

α_0 and α_1 are complex numbers that specify the *probability amplitudes* of the corresponding states.

- ◆ $|\alpha_0|^2$ gives the probability that you will find the qubit in the “off” (0) state; $|\alpha_1|^2$ gives the probability that you will find the qubit in the “on” (1) state.

State representation, 2 qubits

- ◆ The state of a two-qubit system can be represented as:

$$\alpha_0|00\rangle + \alpha_1|01\rangle + \alpha_2|10\rangle + \alpha_3|11\rangle$$

$$\sum |\alpha|^2 = 1$$

- ◆ Measurement will always find the system in some (one) discrete state.

Measurement at the end of a computation

- ◆ $\sum |\alpha|^2$, for amplitudes of all states matching the output bit-pattern in question.
- ◆ This gives the probability that the particular output will be read upon measurement.
- ◆ Example:

$$0.316|00\rangle + 0.447|01\rangle + 0.548|10\rangle + 0.632|11\rangle$$

The probability to read the rightmost bit as 0 is $|0.316|^2 + |0.548|^2 = 0.4$

Partial measurement during a computation

- ◆ One-qubit measurement gates.
- ◆ Measurement changes the system.
- ◆ In simulation, branch computation for each possible measurement.

Classical computation in matrix form

A state transition in a 4-bit system:

$$\begin{array}{cccccccccccccccc}
 [0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_0 \right] \\
 [1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_1 \right] \\
 [0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_2 \right] \\
 [0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_3 \right] \\
 [0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_4 \right] \\
 [0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_5 \right] \\
 [0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_6 \right] \\
 [0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_7 \right] \\
 [0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_8 \right] \\
 [0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_9 \right] \\
 [0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0] & \left[\alpha_{10} \right] \\
 [0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0] & \left[\alpha_{11} \right] \\
 [0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0] & \left[\alpha_{12} \right] \\
 [0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0] & \left[\alpha_{13} \right] \\
 [0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0] & \left[\alpha_{14} \right] \\
 [0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1] & \left[\alpha_{15} \right]
 \end{array}$$

A quantum NOT gate

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

Applied to a qubit:

$$\begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix} * \begin{pmatrix} \alpha_0 \\ \alpha_1 \end{pmatrix} = \begin{pmatrix} \alpha_1 \\ \alpha_0 \end{pmatrix}$$

$$\alpha_0|0\rangle + \alpha_1|1\rangle \rightarrow \alpha_1|0\rangle + \alpha_0|1\rangle$$

Explicit matrix expansion

To expand gate matrix G for application to an n -qubit system:

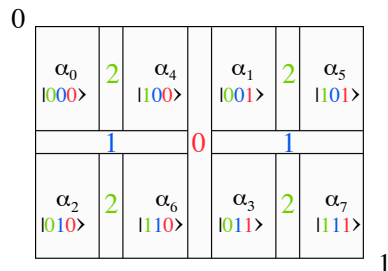
- Create a $2^n \times 2^n$ matrix M .
- Let Q be the set of qubits to which the operator is being applied, and Q' be the set of the remaining qubits.
- $M_{ij} = 0$ if i and j differ in positions in Q' .
- Otherwise concatenate bits from i in positions Q to produce i^* , and bits from j to produce j^* . $M_{ij} = G_{i^*j^*}$.

Implicit matrix expansion

To apply gate matrix G to an n -qubit system:

- Let Q be the set of qubits to which the operator is being applied, and Q' be the set of the remaining qubits.
- For every combination C of 1 and 0 for qubits in Q' :
 - » Extract the column A of amplitudes that results from holding C constant and varying all qubits in Q .
 - » $A' = G \times A$.
 - » Install A' in place of A in the array of amplitudes.

Amplitude diagrams



- ◆ Help to visualize amplitude distributions
- ◆ Scalable, hierarchical
- ◆ Can be shuffled to prioritize any qubits

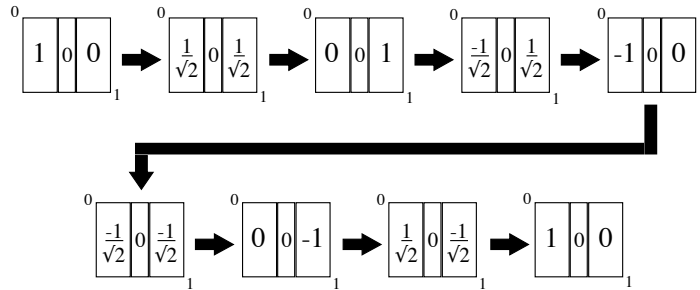
A square-root-of-NOT (SRN) gate

$$\begin{pmatrix} \frac{1}{\sqrt{2}} & -\frac{1}{\sqrt{2}} \\ \frac{1}{\sqrt{2}} & \frac{1}{\sqrt{2}} \end{pmatrix}$$

- ◆ Applied once to a classical state, this ~randomizes the value of the qubit.
- ◆ Applied twice in a row, this is ~equivalent to NOT:

$$\begin{pmatrix} \frac{1}{\sqrt{2}} & -\frac{1}{\sqrt{2}} \\ \frac{1}{\sqrt{2}} & \frac{1}{\sqrt{2}} \end{pmatrix} * \begin{pmatrix} \frac{1}{\sqrt{2}} & -\frac{1}{\sqrt{2}} \\ \frac{1}{\sqrt{2}} & \frac{1}{\sqrt{2}} \end{pmatrix} = \begin{pmatrix} 0 & -1 \\ 1 & 0 \end{pmatrix}$$

SRN amplitude diagrams



Other quantum gates

◆ Rotation ($U\theta$):
$$\begin{bmatrix} \cos(\theta) & \sin(\theta) \\ -\sin(\theta) & \cos(\theta) \end{bmatrix}$$

◆ Hadamard (H):
$$\frac{1}{\sqrt{2}} \begin{bmatrix} 1 & 1 \\ 1 & -1 \end{bmatrix}$$

◆ Controlled NOT ($CNOT$):
$$\begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{bmatrix}$$

There are many small “complete” sets of gates [Barenco et al.].

More quantum gates

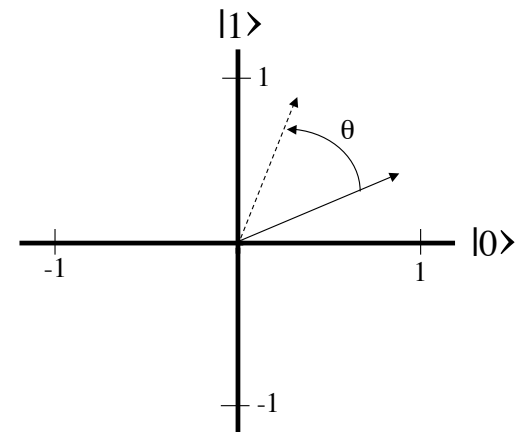
◆ Conditional phase:
$$\begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & e^{i\alpha} \end{bmatrix}$$

◆ $U2$:
$$\begin{bmatrix} e^{-i\phi} & 0 \\ 0 & e^{i\phi} \end{bmatrix} \times \begin{bmatrix} \cos(\theta) & \sin(-\theta) \\ \sin(\theta) & \cos(\theta) \end{bmatrix} \times \begin{bmatrix} e^{-i\psi} & 0 \\ 0 & e^{i\psi} \end{bmatrix} \times \begin{bmatrix} e^{i\alpha} & 0 \\ 0 & e^{i\alpha} \end{bmatrix}$$

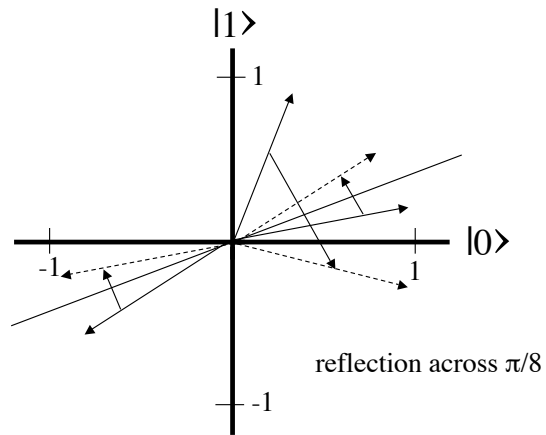
All gates must be unitary: $U^\dagger U = U U^\dagger = I$,

where U^\dagger is the Hermitean adjoint of U , obtained by taking the complex conjugate of each element of U and then transposing the matrix.

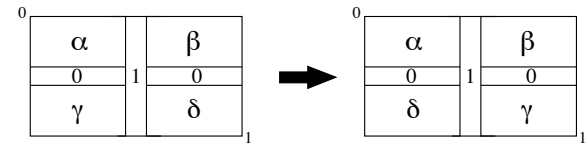
Rotation polar plot for real vectors



Hadamard polar plot for real vectors



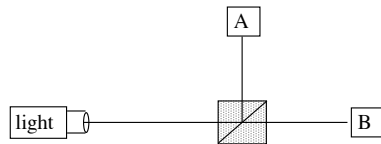
CNOT amplitude diagrams



CNOT(0 [control], 1 [target])

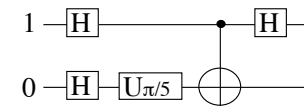
Polarizing beam-splitter CNOT gate

[Cerf, Adami, and Kwiat]



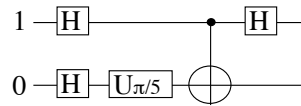
- ◆ Two qubits encoded in one photon, one in momentum (direction) and one in polarization.
- ◆ Polarization controls change in momentum.
- ◆ Cannot be scaled up directly, but demonstrates an implementation of a 2-qubit gate.

Gate array diagrams

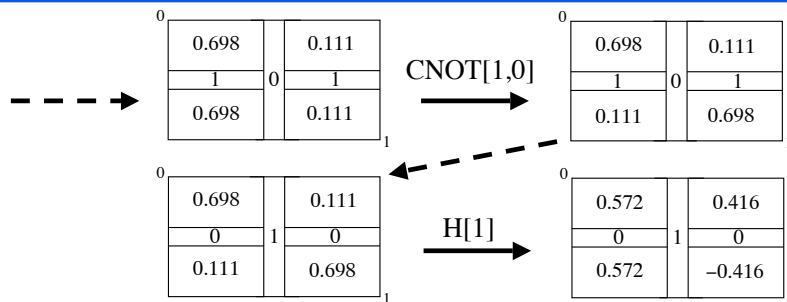


Example execution trace

Hadamard qubit:0
Hadamard qubit:1
U-theta qubit:0 theta:pi/5
Controlled-not control:1 target:0
Hadamard qubit:1

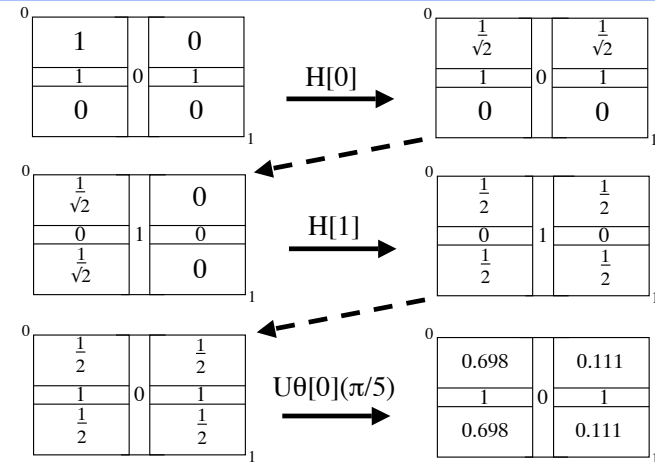


Trace, cont.



| state | probability |
|-------|-------------|
| 00> | 0.33 |
| 01> | 0.33 |
| 10> | 0.17 |
| 11> | 0.17 |

Trace, cont.



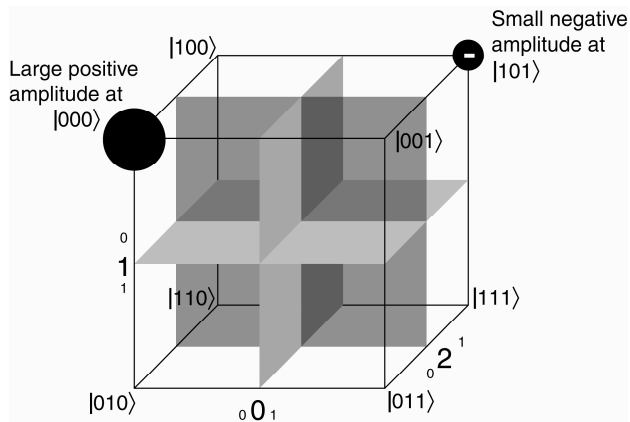
The database search problem

- ◆ Given an unsorted database containing n items but only one “marked” item, find the address of the marked item with a minimal number of database calls.
- ◆ Lov Grover’s algorithm uses $O(\sqrt{n})$ calls in general, and only one call for a 4-item database.

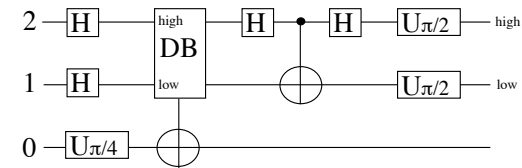
Oracle problems

- ◆ The database search problem is an example of an “oracle problem.”
- ◆ We are given a “black box” or “oracle” function (in this case the database access function) and asked to find out if it has some particular property.
- ◆ Many other known quantum algorithms are for oracle problems.
- ◆ Often the oracle is “hard” to implement, so complexity is figured from the number of oracle calls.

Cube diagram for a 3-qubit system

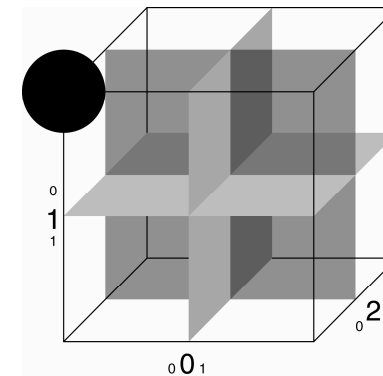


Grover's algorithm for a 4-item database



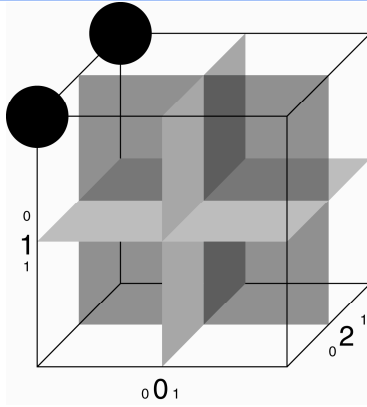
- ◆ Start in the state $|000\rangle$.
- ◆ Read answer from qubits 2 and 1.

(0) Grover's algorithm, item at 0,0



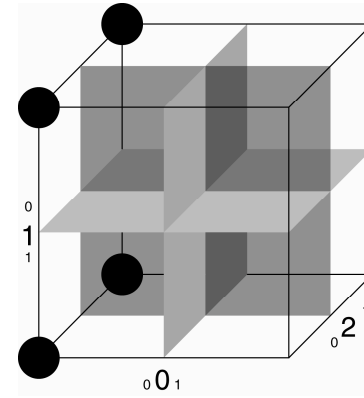
Initial State, $|000\rangle$

(1) Grover's algorithm, item at 0,0



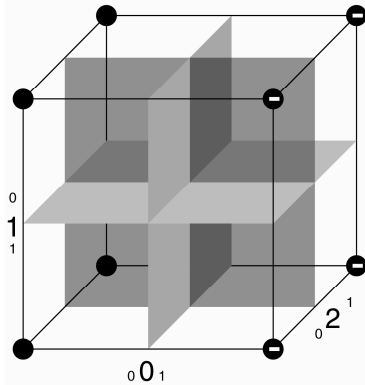
After Hadamard[2]

(2) Grover's algorithm, item at 0,0



After Hadamard[1]

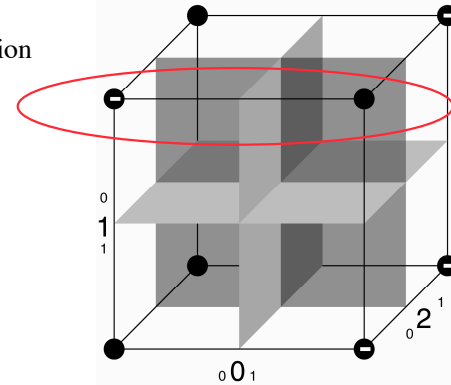
(3) Grover's algorithm, item at 0,0



After $U_{\theta}[0](\pi/4)$

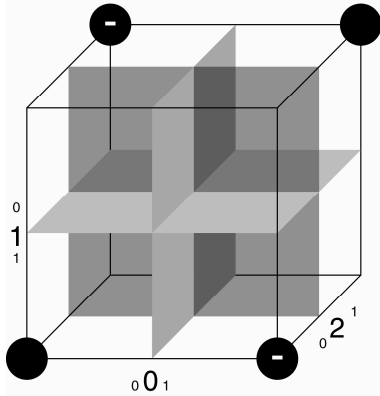
(4) Grover's algorithm, item at 0,0

Note position of DB call effect.



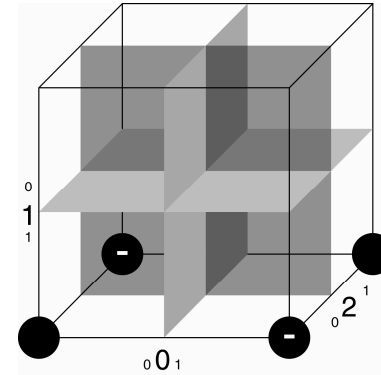
After Database Call [in: 2,1; out:0]

(5) Grover's algorithm, item at 0,0



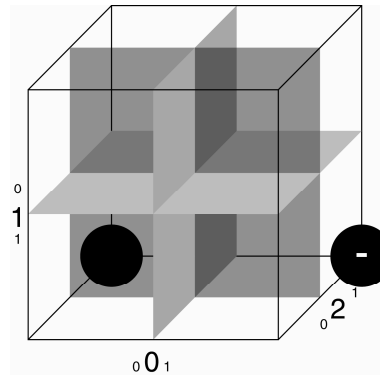
After Hadamard[2]

(6) Grover's algorithm, item at 0,0



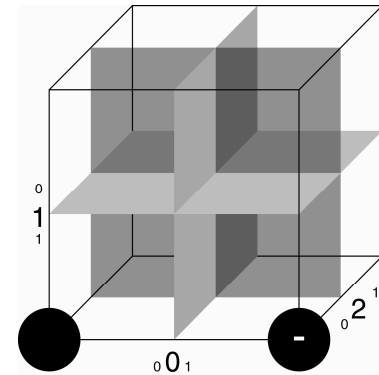
After CNOT [control: 2; target: 1]

(7) Grover's algorithm, item at 0,0



After Hadamard[2]

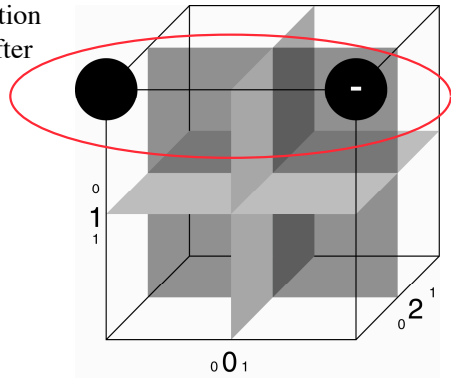
(8) Grover's algorithm, item at 0,0



After $U_{\theta}[2](\pi/2)$

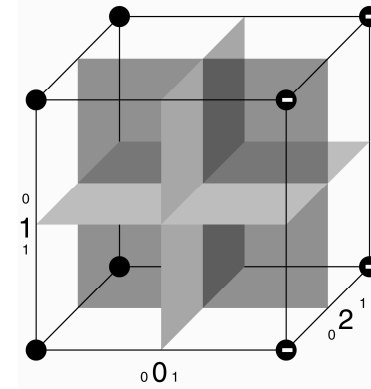
(9) Grover's algorithm, item at 0,0

Note relation
to state after
DB call.



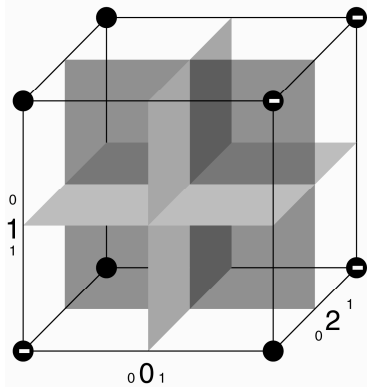
After $U\theta[1](\pi/2)$, Read output from qubits 2 (high) and 1(low)

(3) Grover's algorithm, item at 0,1



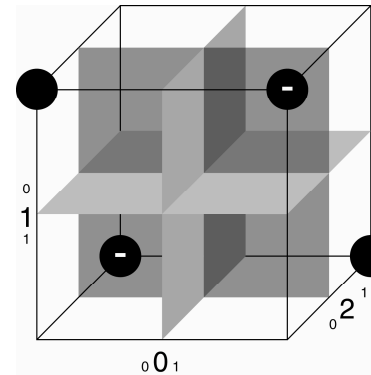
After $U\theta[0](\pi/4)$

(4) Grover's algorithm, item at 0,1



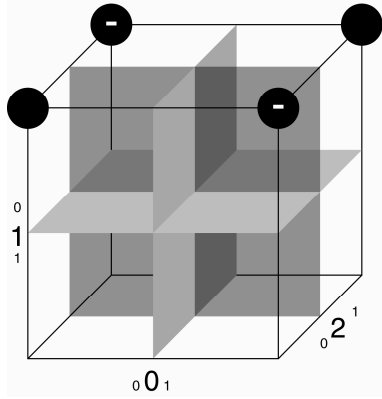
After Database Call [in: 2,1; out:0]

(5) Grover's algorithm, item at 0,1



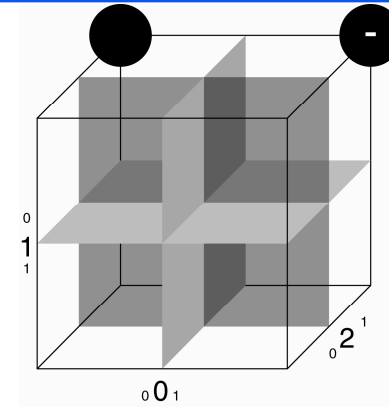
After Hadamard[2]

(6) Grover's algorithm, item at 0,1



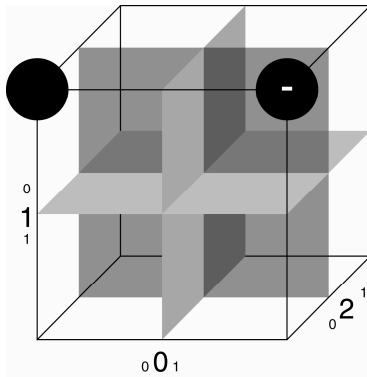
After CNOT [control: 2; target: 1]

(7) Grover's algorithm, item at 0,1



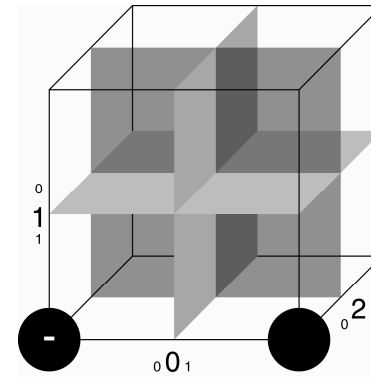
After Hadamard[2]

(8) Grover's algorithm, item at 0,1



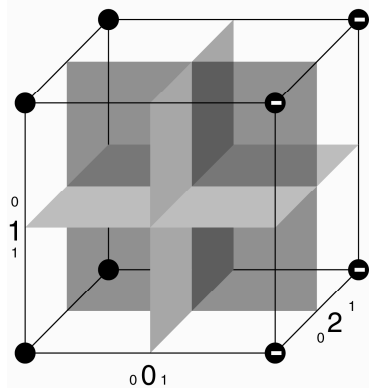
After $U\theta[2](\pi/2)$

(9) Grover's algorithm, item at 0,1



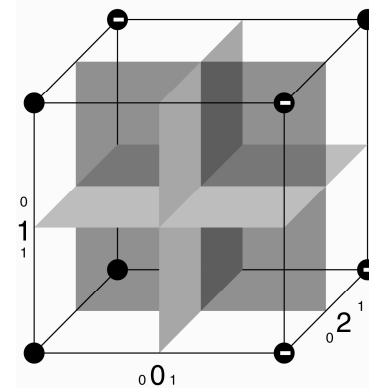
After $U\theta[1](\pi/2)$, Read output from qubits 2 (high) and 1(low)

(3) Grover's algorithm, item at 1,0



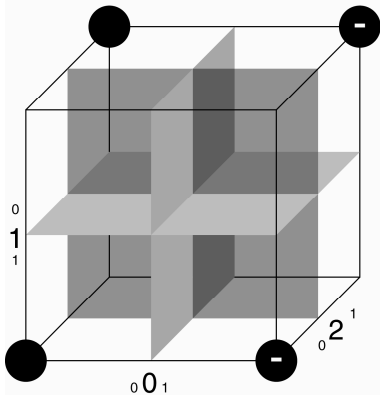
After $U\theta[0](\pi/4)$

(4) Grover's algorithm, item at 1,0



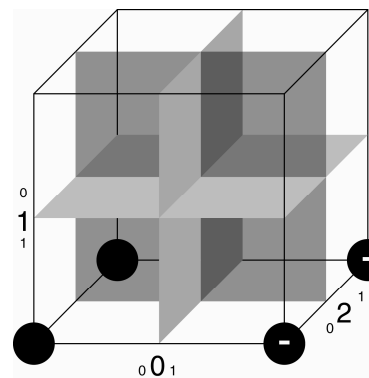
After Database Call [in: 2,1; out:0]

(5) Grover's algorithm, item at 1,0



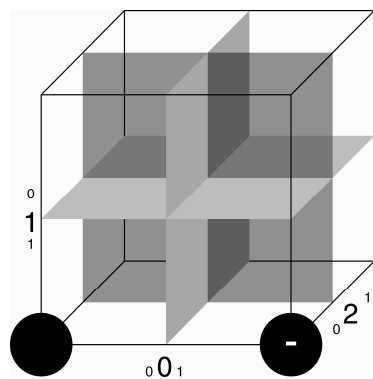
After Hadamard[2]

(6) Grover's algorithm, item at 1,0



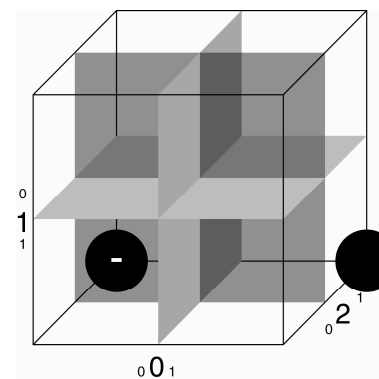
After CNOT [control: 2; target: 1]

(7) Grover's algorithm, item at 1,0



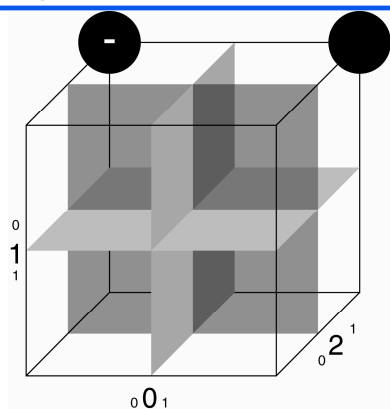
After Hadamard[2]

(8) Grover's algorithm, item at 1,0



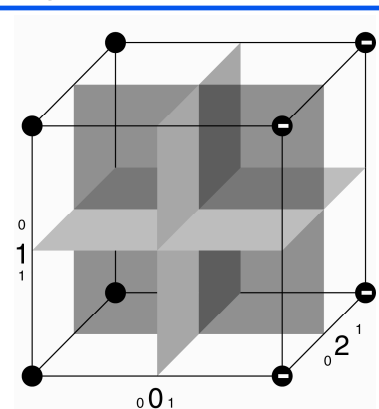
After $U\theta[2](\pi/2)$

(9) Grover's algorithm, item at 1,0



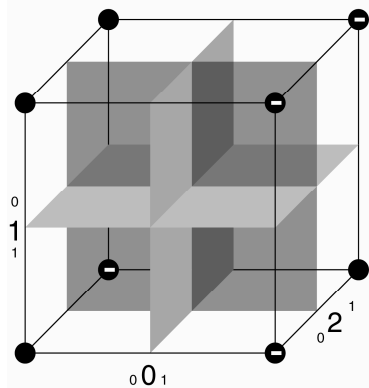
After $U\theta[1](\pi/2)$, Read output from qubits 2 (high) and 1(low)

(3) Grover's algorithm, item at 1,1



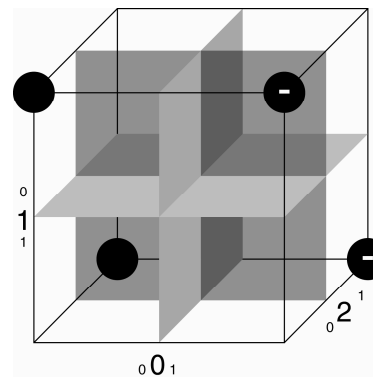
After $U\theta[0](\pi/4)$

(4) Grover's algorithm, item at 1,1



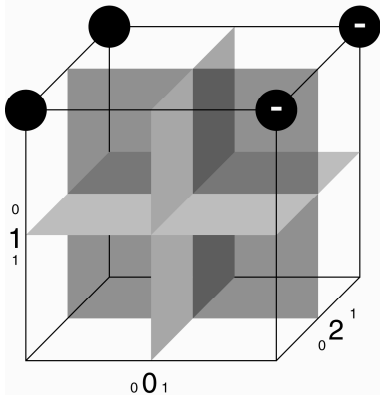
After Database Call [in: 2,1; out:0]

(5) Grover's algorithm, item at 1,1



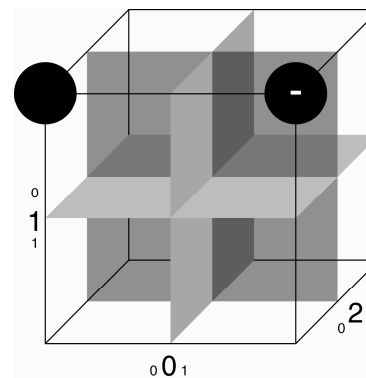
After Hadamard[2]

(6) Grover's algorithm, item at 1,1



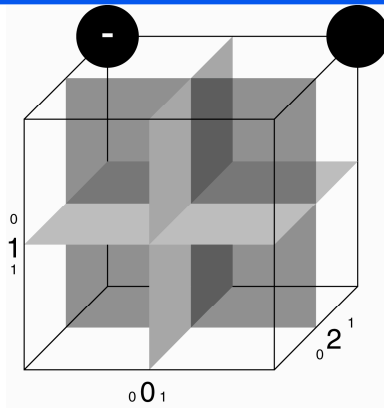
After CNOT [control: 2; target: 1]

(7) Grover's algorithm, item at 1,1



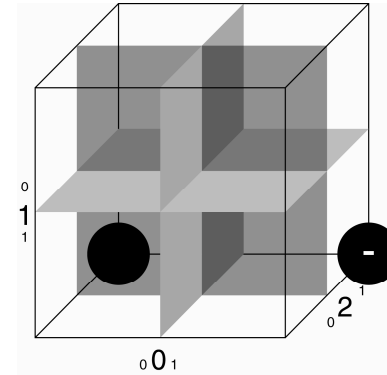
After Hadamard[2]

(8) Grover's algorithm, item at 1,1



After $U\theta[2](\pi/2)$

(9) Grover's algorithm, item at 1,1

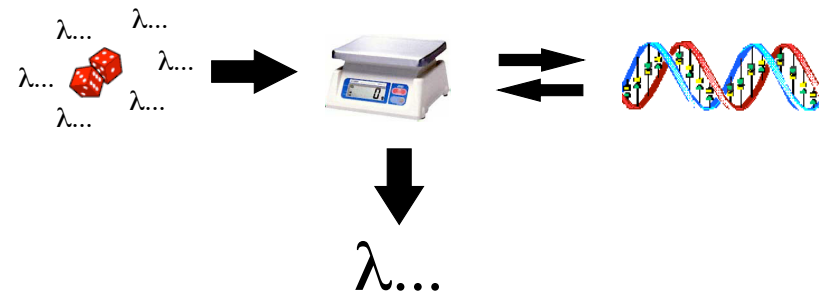


After $U\theta[1](\pi/2)$, Read output from qubits 2 (high) and 1(low)

Shor's algorithm

- ◆ hybrid algorithm to factor numbers
- ◆ quantum component helps to find the period r of a sequence $a_1, a_2, \dots, a_i, \dots$, given an oracle function that maps i to a_i
- ◆ skeleton of the algorithm:
 - create a superposition of all oracle inputs
 - call the oracle function
 - apply a quantum Fourier transform to the input qubits
 - read the input qubits to obtain a random multiple of $1/r$
 - repeat a small number of times to infer r

Genetic Programming (GP)

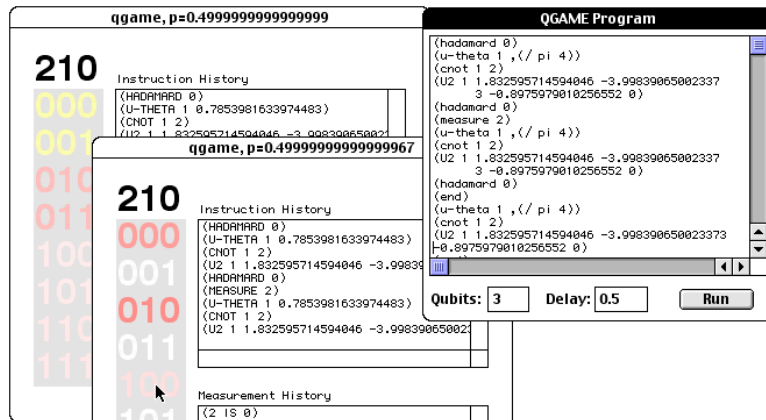


GP for quantum computation

- ◆ Evolve:
 - gate arrays
 - programs that produce gate arrays
 - hybrid classical/quantum algorithms
 - input states or parameters
- ◆ Genome representation:
 - QGAME program
 - program (in any language) that generates a QGAME program
 - array of numbers

QGAME Quantum Gate and Measurement Emulator

<http://hampshire.edu/lspector/qgame.html>



Fitness

- ◆ Assessing the composite matrix
 - the trouble with oracles
- ◆ Assessing the results of simulation runs
- ◆ Criteria:
 - Error
 - Hits
 - Oracle calls
 - Number of gates

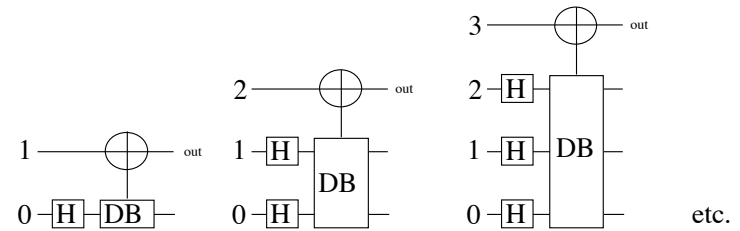
Primitives; gate-array-producing programs

- ◆ Gates: H , U_{θ} , $CNOT$, $ORACLE$, ...
- ◆ Qubit indices
- ◆ Gate parameters (angles)
- ◆ Arithmetic operators
- ◆ Constants indicating problem size (num-qubits, num-input-qubits, num-output-qubits)
- ◆ Iteration structures, recursion, data structures, ...

The scaling majority-on problem

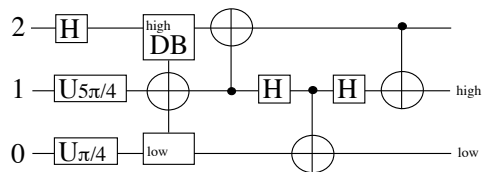
- ◆ Does the oracle answer “1” for a majority of inputs?
- ◆ Seek program that produces a gate array for any oracle size.

Evolved scaling majority-on gate arrays

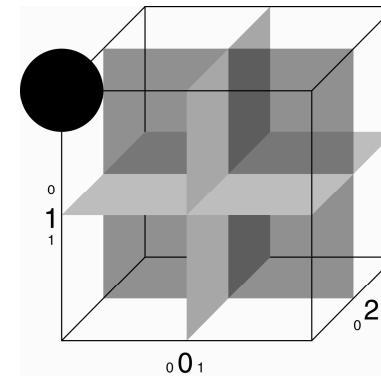


Not better than classical.

Evolved database search gate array

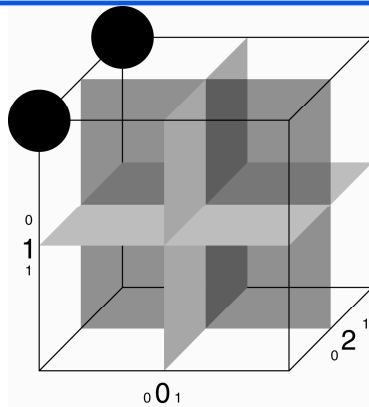


(0) Evolved quantum database algorithm, item at 0,0



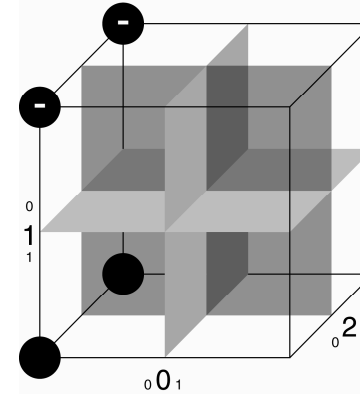
Initial State, $|000\rangle$

(1) Evolved quantum database algorithm,
item at 0,0



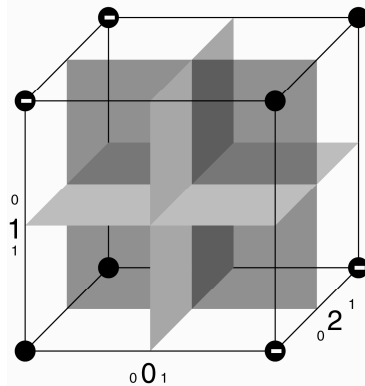
After Hadamard [2]

(2) Evolved quantum database algorithm,
item at 0,0



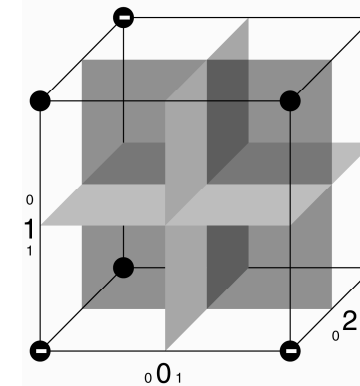
After $U\theta$ [1] ($5\pi/4$)

(3) Evolved quantum database algorithm,
item at 0,0



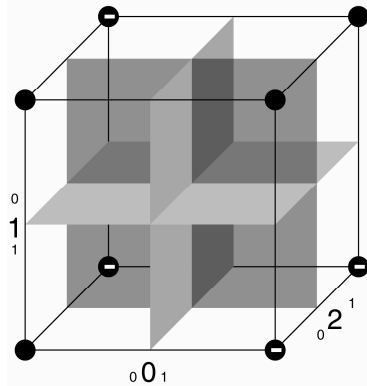
After $U\theta$ [0] ($\pi/4$)

(4) Evolved quantum database algorithm,
item at 0,0



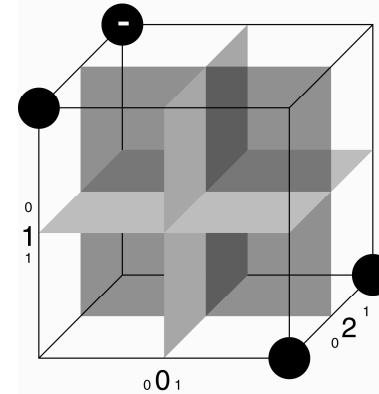
After DB [in:2,0; out:1](item in 0,0)

(5) Evolved quantum database algorithm,
item at 0,0



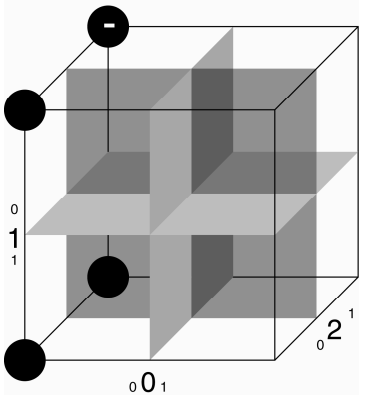
After CNOT [control: 1, target: 2]

(6) Evolved quantum database algorithm,
item at 0,0



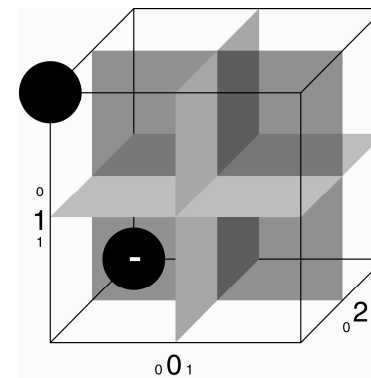
After Hadamard [1]

(7) Evolved quantum database algorithm,
item at 0,0



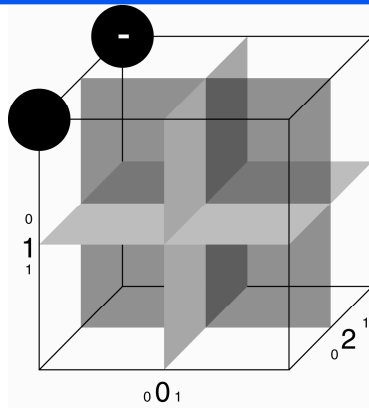
After CNOT [control: 1, target: 0]

(8) Evolved quantum database algorithm,
item at 0,0



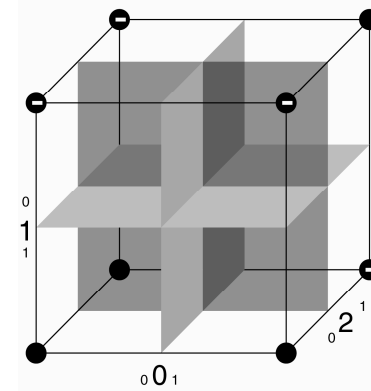
After Hadamard [1]

(9) Evolved quantum database algorithm,
item at 0,0



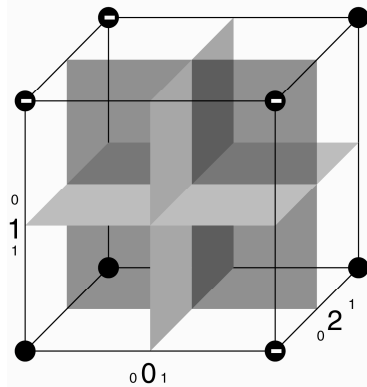
After CNOT [control: 2, target: 1]
Read output from qubits 1 (high) and 0(low)

(4) Evolved quantum database algorithm,
item at 0,1



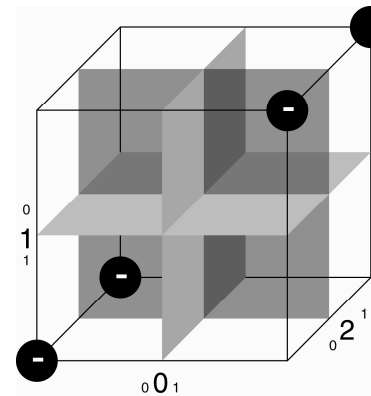
After DB [in:2,0; out:1](item in 0,1)

(5) Evolved quantum database algorithm,
item at 0,1



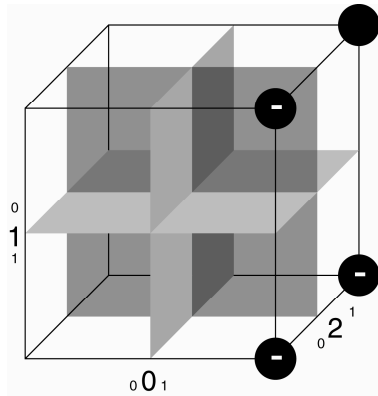
After CNOT [control: 1, target: 2]

(6) Evolved quantum database algorithm,
item at 0,1



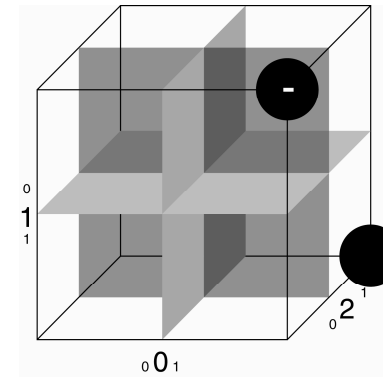
After Hadamard [1]

(7) Evolved quantum database algorithm,
item at 0,1



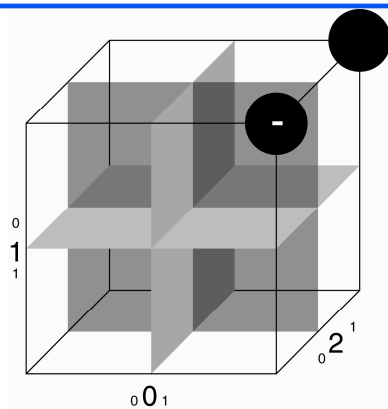
After CNOT [control: 1, target: 0]

(8) Evolved quantum database algorithm,
item at 0,1



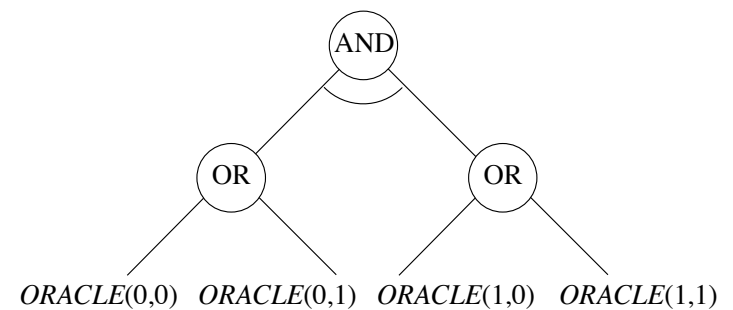
After Hadamard [1]

(9) Evolved quantum database algorithm,
item at 0,1

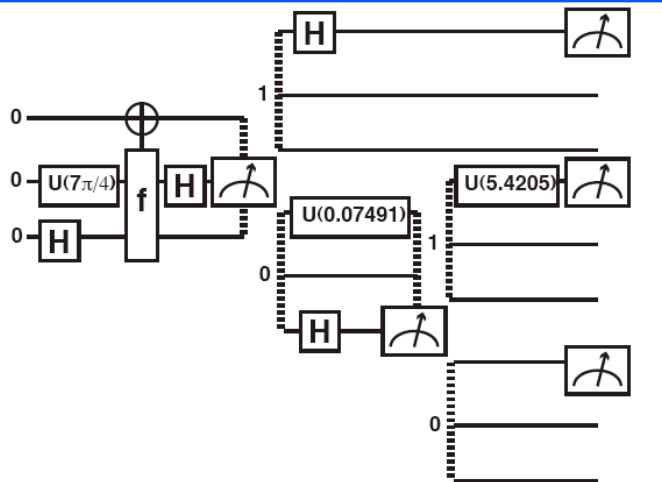


After CNOT [control: 2, target: 1]
Read output from qubits 1 (high) and 0(low)

The and-or tree problem



Evolved and-or gate array



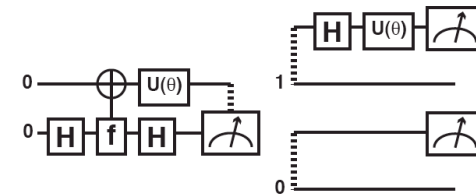
Error/complexity measures

- ◆ *Las Vegas* \equiv always correct, but may answer “don’t know” with some probability
- ◆ *Monte Carlo* \equiv may err, with some probability
- ◆ $p_{max}^e \equiv$ worst case probability of error
- ◆ $q_{max}^e \equiv$ worst case expected queries
- ◆ *Exact* $\equiv p_{max}^e = 0$

Complexity of 2-bit AND/OR

- ◆ Classical Las Vegas: $q_{max}^e = 3$
– derived from [Saks and Wigderson 1986]
- ◆ Classical Monte Carlo: for $q_{max}^e = 1, p_{max}^e \geq 1/3$
– derived from [Santha 1991]
- ◆ Evolved Quantum Monte Carlo: $p_{max}^e = 0.28732$

Derived better-than-classical OR



$\theta = 5.96143477$

- ◆ Classical Monte Carlo: for $q_{max}^e = 1, p_{max}^e \geq 1/6$ [Jozsa 1991, Beals 1998]
- ◆ Evolved algorithm $q_{max}^e = 1, p_{max}^e = 1/10$

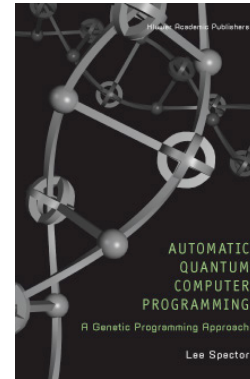
GP/QC research directions

- ◆ Application to additional problems with incompletely understood quantum complexity
- ◆ Exploration of communication capacity of quantum gates
- ◆ Evolution of hybrid quantum/classical algorithms.
- ◆ Evolution guided by ease of physical implementation.
- ◆ QC applications in AI
 - general AI search?
 - and-or trees and Prolog: quantum logic machine?
 - Bayesian networks?
- ◆ Genetic programming *on* quantum computers.

Sources: selected articles

- ◆ A. Steane, 1998. "Quantum Computing," *Reports on Progress in Physics*, vol. 61, pp. 117-173. <http://xxx.lanl.gov/abs/quant-ph/9708022>
- ◆ P. Shor, 1998. "Quantum Computing," *Documenta Mathematica*, vol. Extra Volume ICM, pp. 467-486. <http://east.camel.math.ca/EMIS/journals/DMJDMV/xvol-icm/00/Shor.MAN.ps.gz>
- ◆ J. Preskill, 1997. "Quantum Computing: Pro and Con," Tech. Rep. CALT-68-2113, California Institute of Technology. <http://xxx.lanl.gov/abs/quant-ph/9705032>
- ◆ A. Barenco, C. H. Bennett, R. Cleve, D. P. DiVincenzo, N. Margolus, P. Shor, T. Sleator, J. Smolin, H. Weinfurter, 1995. "Elementary Gates for Quantum Computation," submitted to *Physical Review A*. <http://xxx.lanl.gov/abs/quant-ph/9503016>
- ◆ N.J. Cerf, C. Adami, P.G. Kwiat, 1998. "Optical Simulation of Quantum Logic," *Phys. Rev. A* 57, 1477. <http://xxx.lanl.gov/abs/quant-ph/9706022>
- ◆ L. Spector and H.J. Bernstein. 2003. "Communication Capacities of Some Quantum Gates, Discovered in Part through Genetic Programming," in *Proc. of the Sixth Intl. Conf. on Quantum Communication, Measurement, and Computing*, edited by J.H. Shapiro and O. Hirota. Princeton, NJ: Rinton Press, Inc. pp. 500-503. <http://hampshire.edu/lspector/pubs/spector-QCMC-prepress.pdf>
- ◆ H. Barnum, H.J. Bernstein, and L. Spector. 2000. Quantum circuits for OR and AND of ORs. *Journal of Physics A: Mathematical and General*, Vol. 33 No. 45 (17 November 2000), pp. 8047-8057. <http://hampshire.edu/lspector/pubs/jpa.pdf>
- ◆ L. Spector, H. Barnum, H.J. Bernstein, N. Swamy, 1999. "Quantum Computing Applications of Genetic Programming," in *Advances in Genetic Programming* 3, pp. 135-160, MIT Press.
- ◆ L. Spector, H. Barnum, H.J. Bernstein, N. Swamy, 1999. "Finding a Better-Than-Classical Quantum AND/OR Algorithm Using Genetic Programming," in *Proc. 1999 Congress on Evolutionary Computation*, IEEE Press.
- ◆ L. Spector, H. Barnum, H.J. Bernstein, 1998. "Genetic Programming for Quantum Computers," in *Genetic Programming 1998: Proceedings of the Third Annual Conference*, pp. 365-374, Morgan Kaufmann.

Book



Automatic Quantum Computer Programming: A Genetic Programming Approach

Lee Spector. 2004.

Boston: Kluwer Academic Publishers.
ISBN 1-4020-7894-3.

<http://hampshire.edu/lspector/aqcp/>

Sources: selected books

- ◆ *Automatic Quantum Computer Programming: A Genetic Programming Approach*. By Lee Spector. Kluwer Academic Publishers. 2004.
- ◆ *Quantum Computation and Quantum Information*. By Michael A. Nielsen and Isaac L. Chuang. Cambridge University Press. 2000.
- ◆ *Schrödinger's Machines: The Quantum Technology Reshaping Everyday Life*. By Gerard J. Milburn. W.H. Freeman and Company. 1997.
- ◆ *Explorations in Quantum Computing*. By Colin P. Williams and Scott H. Clearwater. Springer-Verlag/Telos. 1997.
- ◆ *The Fabric of Reality*. By David Deutsch. Penguin Books. 1997.
- ◆ *The Large, the Small and the Human Mind*. By Roger Penrose, with Abner Shimony, Nancy Cartwright, and Stephen Hawking. Cambridge University Press. 1997.
- ◆ *QED: The Strange Theory of Light and Matter*. By Richard P. Feynman. Princeton University Press. 1985.

Sources: selected WWW sites

- ◆ Oxford's Center for Quantum Computation: <http://www.qubit.org/>
- ◆ Stanford-Berkeley-MIT-IBM NMR Quantum Computation Project: <http://sqint.stanford.edu/>
- ◆ Quantum Information and Computation (Caltech - MIT - USC): <http://theory.caltech.edu/~quic/index.html>
- ◆ Quantum Computation at ISI/USC: http://www.isi.edu/acal/quantum/quantum_intro.html
- ◆ Los Alamos National Laboratory quantum physics e-print archive: <http://xxx.lanl.gov/form/quant-ph>
- ◆ John Preskill's Physics 229 course web page (many good links): <http://www.theory.caltech.edu/people/preskill/ph229/>
- ◆ Samuel L. Braunstein's on-line tutorial: <http://www.sees.bangor.ac.uk/~schmuel/comp/comp.html>
- ◆ NIST Ion Storage Group: <http://www.bldrdoc.gov/timefreq/ion/index.htm>
- ◆ QGAME, Quantum Gate And Measurement Emulator: <http://hampshire.edu/lspector/qgame.html>