Short Course in Quantum Information Lecture 5

Quantum Algorithms



Prof. Andrew Landahl University of New Mexico



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Course Info

All materials downloadable @ website

http://info.phys.unm.edu/~deutschgroup/DeutschClasses.html

<u>Syllabus</u>

Lecture 1: Intro Lecture 2: Formal Structure of Quantum Mechanics Lecture 3: Entanglement Lecture 4: Qubits and Quantum Circuits Lecture 5: Algorithms Lecture 6: Error Correction Lecture 7: Physical Implementations Lecture 8: Quantum Cryptography





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Qubits:

$$|0\rangle = \begin{pmatrix} 1\\ 0 \end{pmatrix}$$
$$|1\rangle = \begin{pmatrix} 0\\ 1 \end{pmatrix}$$

$$|\psi\rangle = \alpha |0\rangle + \beta |1\rangle$$

 $|\alpha|^2 + |\beta|^2 = 1$



Rays in Hilbert space

Gates:

$$U = R_{\hat{n}}(\theta) = e^{-i\theta(\hat{n}\cdot\sigma)/2}$$
$$\hat{n}\cdot\sigma = n_x\sigma_x + n_y\sigma_y + n_z\sigma_z$$

Pauli matrices:
$$\sigma_x = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$$
 $\sigma_y = \begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix}$ $\sigma_z = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}$



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Quantum circuit notation:

$$-\underline{R_{\hat{n}}(\theta)} - = -R_x(2\pi) = \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix}$$

$$-\underline{X} = iR_x(\pi) \qquad -\underline{H} = R_y(\frac{\pi}{2}) = \frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 1 \\ 1 & -1 \end{pmatrix}$$

$$-\underline{Y} = iR_y(\pi) \qquad -\underline{P} = e^{i\pi/4}R_z(\frac{\pi}{2}) = \begin{pmatrix} 1 & 0 \\ 0 & i \end{pmatrix}$$

$$-\underline{Z} = iR_z(\pi) \qquad -\underline{T} = R_z(\frac{\pi}{4}) = \begin{pmatrix} e^{-i\pi/8} & 0 \\ 0 & e^{i\pi/8} \end{pmatrix}$$



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More gates:

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Controlled-U: $U = R_z(\alpha)R_y(\beta)R_z(\gamma)$



$$A = R_z(\alpha)R_y(\beta/2)$$

$$B = R_y(-\beta/2)R_z(-(\alpha + \gamma)/2)$$

$$C = R_z((\gamma - \alpha)/2)$$

ABC = I $AXBXC = R_z(\alpha)R_y(\beta)R_z(\gamma)$





Qubits and Quantum Gates

Universal gate bases:

Any $U \in SU(n)$ can be approximated to arbitrary precision by ε using $\mathcal{O}(f(n) \cdot 1/\varepsilon^c)$ gates from the basis.

Solovay-Kitaev Theorem proves that only $\mathcal{O}(f(n) \cdot \log^c 1/\varepsilon)$ gates are needed for this precision.

Examples:

 $\{CNOT, \{U\}_1, |0\rangle, \mathcal{M}\}$ S

 $\{CNOT, H, T, |0\rangle, \mathcal{M}\}$

Simple: Good for building quantum algorithms.

Discrete: Good for robust/computable implementations.

 $\{U_{2,\mathrm{generic}},|0
angle,\mathcal{M}\}$ Abstra

Abstract: Good for existence proofs.

Other interesting universal gate sets exist, e.g., measurement-and-state only sets. *Current research area!*





Approximate counting Bernstein-Vazarani problem Collision problem Deutsch-Jozsa problem **Discrete** logarithm Element distinctness Gauss sum approximation Gradient estimation Hidden shift problem Hidden subgroup problem Integer factoring Jones polynomial evaluation Matrix commutativity testing Matrix multiplication verification Maze solving Mean estimation Median estimation Mode estimation Order finding Ordered search Local Hamiltonian simulation Parity evaluation Pell's equation Period finding Phase estimation Shifted Legendre symbol problem Simon's problem Sparse Hamiltonian simulation Spatial search **Triangle finding** Unordered search

Why this field exists.

AB = C?

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Why this field exists.



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Approximate counting



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Why this field exists.



Feynman diagram for an interaction between quarks generated by a gluon.

Local Hamiltonian simulation Parity evaluation Pell's equation Period finding Phase estimation Shifted Legendre symbol problem Simon's problem Sparse Hamiltonian simulation Spatial search Triangle finding Unordered search

Approximate counting

Deutsch-Jozsa problem

Gauss sum approximation

Hidden subgroup problem

Jones polynomial evaluation Matrix commutativity testing Matrix multiplication verification

Collision problem

Discrete logarithm Element distinctness

Gradient estimation

Hidden shift problem

Integer factoring

Maze solving

Order finding Ordered search

Mean estimation

Mode estimation

Median estimation

Bernstein-Vazarani problem





Approximate counting Bernstein-Vazarani problem Collision problem Deutsch-Jozsa problem **Discrete** logarithm Element distinctness Gauss sum approximation Gradient estimation Hidden shift problem Hidden subgroup problem Integer factoring Jones polynomial evaluation Matrix commutativity testing Matrix multiplication verification Maze solving Mean estimation Median estimation Mode estimation Order finding Ordered search Local Hamiltonian simulation Parity evaluation Pell's equation Period finding Phase estimation Shifted Legendre symbol problem Simon's problem Sparse Hamiltonian simulation Spatial search **Triangle finding** Unordered search

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Why this field exists.

$91 = 7 \cdot 13$



(David) Deutsch's Problem









Question: Is f constant or balanced?









Example: Do the Deutsch's like the same kind of chile or not?

Problem: I only have time to query the function once.

Solution: Use a quantum black box!

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Deutsch's Problem

First attempt:
$$|x\rangle - U_f - |f(x)\rangle$$

 $f(0) = f(1) \Rightarrow$ Not unitary (noninvertible)

Second attempt:



Aha!





(David) Deutsch's Algorithm











$$= \begin{cases} |0\rangle \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) & \text{if } f(0) \oplus f(1) = 0\\ |1\rangle \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) & \text{if } f(0) \oplus f(1) = 1. \end{cases}$$

$$\mapsto \frac{1}{2^{3/2}} [(1 + (-1)^{f(0) \oplus f(1)}) | 0 \rangle + (1 - (-1)^{f(0) \oplus f(1)}) | 1 \rangle)] (| 0 \rangle - | 1 \rangle)$$

 $\frac{1}{2}(|0\rangle + (-1)^{f(0)\oplus f(1)}|1\rangle)(|0\rangle - |1\rangle)$



(David) Deutsch's Algorithm

Quantum transforms

What is the Hadamard transform doing? $H = \frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 1\\ 1 & -1 \end{pmatrix}$ $H|b\rangle = \frac{1}{\sqrt{2}} \sum_{z=0}^{1} (-1)^{bz} |z\rangle$ J. Hadamard $H^{\otimes n}|b_1,\ldots,b_n\rangle = \frac{1}{\sqrt{2^n}} \sum_{z_1,\ldots,z_n} (-1)^{b_1 z_1 + \cdots + b_n z_n} |z_1,\ldots,z_n\rangle$ $H^{\otimes n}|j\rangle = \frac{1}{\sqrt{2^n}} \sum_{k=0}^{2^n-1} (-1)^{j \cdot k}|k\rangle$ $\tilde{x}_{j} = \frac{1}{\sqrt{2^{n}}} \sum_{k=0}^{2^{n}-1} (-1)^{j \cdot k} x_{k}$ Walsh-Hadamard Transform (Equrier transform in square way (Fourier transform in square waves)

n steps: $2^n \times 2^n$ matrix transform



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(1865 - 1963)

Quantum transforms

Discrete Fourier transform:

$$\tilde{x}_j \mapsto \frac{1}{\sqrt{2^n}} \sum_{k=0}^{2^n - 1} e^{2\pi i jk/2^n} x_k$$

Naïve Fourier Transform:
$$\mathcal{O}(2^{2n})$$

Fast Fourier Transform: $\mathcal{O}(n2^n)$



http://jan.moesen.nu/media/images/fun/



$$|j\rangle \mapsto \frac{1}{\sqrt{2^n}} \sum_{k=0}^{2^n-1} e^{2\pi i jk/2^n} |k\rangle$$

Quantum Fourier Transform: $\mathcal{O}(n^2)$

Caveat: QFT is in the amplitudes.

J. Fourier (1768–1830)



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Fast Fourier transform

$$\tilde{x}_j \mapsto \frac{1}{\sqrt{2^n}} \sum_{k=0}^{2^n - 1} e^{2\pi i jk/2^n} x_k$$

Must multiply j by k for 2^n values of k.

Fast Fourier Transform:

 $j = j_{n-1} \dots j_0$ $k = k_{n-1} \dots k_0$ $\frac{jk}{2^n} = k_{n-1}(0.j_0) + k_{n-2}(0.j_1j_0) + \dots + k_0(0.j_{n-1}\dots j_0)$

n multiplications for 2^n terms in sum: $\mathcal{O}(n2^n)$

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Example:
$$n = 3$$
, $j = 2$, $k = 3$
 $\frac{2 \cdot 3}{2^3} = 0(0.1) + 1(0.10) + 1(0.010)$
 $= 0.11$
 $= 1/2 + 1/4$
 $= 3/4$



Quantum Fourier transform

$$\begin{aligned} |j\rangle &\mapsto \frac{1}{\sqrt{2^{n}}} \sum_{k=0}^{2^{n}-1} e^{2\pi i jk/2^{n}} |k\rangle \\ &= \frac{1}{\sqrt{2^{n}}} (|0\rangle + e^{2\pi i (0.j_{0})} |1\rangle) \cdots (|0\rangle + e^{2\pi i (0.j_{n-1}...j_{0})} |1\rangle) \end{aligned}$$

$$R_k \equiv e^{i\pi/2^{k+1}} R_z(\frac{\pi}{2^k}) = \begin{pmatrix} 1 & 0\\ 0 & e^{i\pi/2^k} \end{pmatrix}$$



N.B. It is possible to modify the circuit to use only single-qubit gates with adaptive computation.





Quantum Fourier transform

Complexity of QFT:

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Phase estimation "algorithm"

Given: Controlled- U^{2^k} gates, $C_{U^{2^k}}, k \in \{1, \dots, n\}$ Eigenstate $|\psi\rangle$ of U such that $U|\psi\rangle = e^{2\pi i\varphi}|\psi\rangle$.

Problem: Estimate φ to n bits of precision.

Solution: Phase 1

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A. Kitaev





Phase estimation "algorithm"

Given: Controlled- U^{2^k} gates, $C_{U^{2^k}}, k \in \{1, ..., n\}$ Eigenstate $|\psi\rangle$ of U such that $U|\psi\rangle = e^{2\pi i\varphi}|\psi\rangle$. Problem: Estimate φ to n bits of precision.



A. Kitaev









Phase estimation "algorithm": Analysis



Caveat: If φ is not exactly n bits, error analysis is subtle. For details see:



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Factoring

"The problem of distinguishing prime numbers from composite numbers and of *resolving the latter into their prime factors* is known to be one of the most important and useful in arithmetic. [...] Further, the *dignity of science itself* seems to demand that every possible means be explored for the solution of a problem so elegant and so celebrated."



—**Carl Friedrich Gauss** *Disquisitiones Arithmeticæ*, 1801 (translation: A.A. Clarke)



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Factoring Problem

Input: Positive integer N. Output: Positive integer p > 1 that divides N, if N is a composite number.

$$n \equiv \log N$$



Shor's factoring algorithm [Shor, 1994]

 $\mathcal{O}(n^3)$

N.B. Very parallelizable!

 $\mathcal{O}(n^5 \log^2 n)$ -sized circuit with $\mathcal{O}(\log n)$ depth. [Cleve & Watrous, 2000]





Factoring in Theory



Can verify YES or NO efficiently with a witness

[Agarwal, Kayal, Saxena, 2002]





Factoring in Practice

<u>File Edit View Go Bookmarks Tools Help</u>

General Purpose Factoring Records - Mozilla Firefox

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Getting Started Statest Headlines

General Purpose Factoring Records

Below is a chart of general purpose factoring records going back to 1990. By "general purpose", we mean a factoring algorithms whose running time is dependent upon only the size of the number being factored (i.e. not on the size of the prime factors or any particular form of the number).

Sieving is typically the dominant factorization run time in practice. All sieving times below are approximate. Early versions of factoring records estimated time in MIPS years, which is the number of years it would take a computer that operates at one million instructions per second to factor the number. More recently, almost everybody uses Pentiums or AMDs. Thus, we scale some timings to Pentium 1GHz CPU years: the number of years it would take a 1GHz Pentium (or AMD) to complete sieving.

number	digits	date completed	sieving time	algorithm
C116	116	1990	275 MIPS years	mpqs
<u>RSA-120</u>	120	June, 1993	830 MIPS years	mpqs
<u>RSA-129</u>	129	April, 1994	5000 MIPS years	mpqs
<u>RSA-130</u>	130	April, 1996	1000 MIPS years	gnfs
<u>RSA-140</u>	140	February, 1999	2000 MIPS years	gnfs
<u>RSA-155</u>	155	August, 1999	8000 MIPS years	gnfs
<u>C158</u>	158	January, 2002	3.4 Pentium 1GHz CPU years	gnfs
<u>RSA-160</u>	160	March, 2003	2.7 Pentium 1GHz CPU years	gnfs
<u>RSA-576</u>	174	December, 2003	13.2 Pentium 1GHz CPU years	gnfs
<u>C176</u>	176	May, 2005	48.6 Pentium 1GHz CPU years	gnfs
<u>RSA-200</u>	200	May, 2005	121 Pentium 1GHz CPU years [*]	gnfs



[*] In regard to RSA-200, Thorsten Kleinjung writes: we spend 25% of the total time for the matrix step. If one considers the total time we spent about 170 CPU years.

For more factorization results, please see the Factorization Announcements page or Paul Zimmermann's Factor Records page.

Done





Factoring algorithms

Difference-of-squares technique:

Random x, y such that

 $x^2 \equiv y^2 \mod N$

$$N$$
 divides $x^2 - y^2 = (x+y)(x-y)$

Hope that gcd(x - y, N) > 1.

Art: Choosing x, y wisely.







Factoring from order finding: Analysis

Only way to fail is if order is odd or an even order doesn't yield a nontrivial gcd.

$$N = p_1^{a_1} \cdots p_k^{a_k}$$

Pr[r is odd or r is even and $d = 1$] = $\left(\frac{1}{2}\right)^{k-1}$
$$\leq \frac{1}{2}$$

Proof: Uses Chinese Remainder theorem. See one of the below for details:



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Factoring from order finding: Example

 $N=15=3\cdot 5$ [Vandersypen *et al.*, 2001]

1. N even? No.

2. $N = m^k$? No.

3.
$$y = \gcd(x, N)$$
. $x \in \{2, \cancel{3}, 4, \cancel{5}, 6, 7, 8, \cancel{9}, \cancel{10}, 11, \cancel{12}, 13, 14\}$
 $x \in \{2, 4, 7, 8, 11, 13, 14\}$ have $y = 1$.

4.
$$x^r \equiv 1 \mod N$$
. $x^r = \{2^4, 4^2, 7^4, 8^4, 11^2, 13^4, 14^2\}$

All possible orders are even.

5. $d = \gcd(x^{r/2} - 1, N) = \{3, 3, 3, 3, 5, 3, 1\}.$

Every possibility but one yields a nontrivial factor of N.





Consider the unitary operator

$$U_{x,N}|y\rangle = |xy \mod N\rangle$$

Some of its eigenstates are of the form

$$|\psi_j\rangle = \frac{1}{\sqrt{r}} \sum_{k=0}^{r-1} e^{-2\pi i jk/r} |x^k \mod N\rangle,$$

where r is the order of x in \mathbb{Z}_N .

Why? Because

$$U_{x,N}|\psi_j\rangle = \frac{1}{\sqrt{r}} \sum_{k=0}^{r-1} e^{-2\pi i jk/r} |x^{k+1} \mod N\rangle$$
$$= e^{2\pi i j/r} |\psi_j\rangle$$





We can construct $C_{U_{x,N}^{2^k}}$ using the $\mathcal{O}(\lceil \log N \rceil^3)$ modular exponentiation algorithm. Given $|\psi_j\rangle$, we can then run the phase estimation algorithm to find $\varphi = j/r$ to $2n = 2\lceil \log N \rceil$ bits of precision:



Given this, we can use the $\mathcal{O}(n^3)$ continued fractions algorithm to obtain j/r in irreducible form exactly because j and r are bounded by N.

For details on the classical algorithms MEA and CFA, see:







Given j/r in irreducible form j'/r' for several values of j, we can find rwith high probability: $(r = lcm(r'_1, r'_2) \text{ if } j'_1 \text{ and } j'_2 \text{ are coprime.})$

Any prime p divides 1/p of all numbers.

- -----

 $\Rightarrow \Pr[p \text{ divides both } j'_1 \text{ and } j'_2] = 1/p^2$

 j'_1 and j'_2 are coprime iff there is no prime *p* that divides both.

$$\Rightarrow \Pr[j'_1 \text{ and } j'_2 \text{ are coprime}] = \prod_{\text{prime } p} \left(1 - \frac{1}{p^2}\right)$$
$$= \frac{1}{\zeta(2)}$$
$$= \frac{6}{\pi^2}$$
$$\cong 0.607$$



We're almost done. All we need is a way to generate eigenstates $|\psi_j\rangle$ at random and we can efficiently factor integers!

Using the identity

$$\sum_{k=0}^{r-1} e^{-2\pi i j k/r} = r \delta_{j0}$$
We know that

$$\frac{1}{\sqrt{r}} \sum_{k=0}^{r-1} |\psi_k\rangle = |1\rangle$$

$$[\psi_{i}\rangle = \frac{1}{\sqrt{r}} \sum_{k=0}^{r-1} |\psi_k\rangle = |1\rangle$$

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 $\sqrt{r} \sum_{k=0}^{\infty}$

We could measure $|1\rangle$ in the $|\psi_j\rangle$ basis and run the phase estimation algorithm, but since this measurement commutes with U^{2^k} , we can measure at the end of the circuit, and indeed, we can omit measuring altogether:







Factoring: Summary







Tune in next time...

- Nov. 16: No lecture, but....
 - Sankar das Sarma: Physics, Chemistry, & Nanosciences Colloquium
 - Topic: Spintronic quantum computing (9:15 a.m., building 897, Rms. 1010-1012).



• Nov. 23: Next lecture on Quantum Error Correction by Ivan Deutsch.



