# Introduction to 

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If $n$ qubits have state
$\left(a_{0}, a_{1}, \ldots, a_{2}{ }^{n}-1\right)$ then measuring the qubits produces an element of $\left\{0,1, \ldots, 2^{n}-1\right\}$ and destroys the state.
Measurement produces element $q$ with probability $\left|a_{q}\right|^{2} / \sum_{r}\left|a_{r}\right|^{2}$.

Some examples of 3-qubit states:
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" $|0\rangle$ " in standard notation.
Measurement produces 0 .

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$(0,0,0,0,0,0,-7 i, 0)=-7 i|6\rangle:$
Measurement produces 6 .
$(0,0,4,0,0,0,8,0)=4|2\rangle+8|6\rangle:$
Measurement produces
2 with probability $20 \%$,
6 with probability $80 \%$.

## Fast quantum operations, part 1

$\left(a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{6}, a_{7}\right) \mapsto$
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is complementing index bit 0 , hence "complementing quit 0 ".
$\left(a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{6}, a_{7}\right)$ is measured as $\left(q_{0}, q_{1}, q_{2}\right)$, representing $q=q_{0}+2 q_{1}+4 q_{2}$, with probability $\left|a_{q}\right|^{2} / \sum_{r}\left|a_{r}\right|^{2}$.
$\left(a_{1}, a_{0}, a_{3}, a_{2}, a_{5}, a_{4}, a_{7}, a_{6}\right)$ is measured as $\left(q_{0} \oplus 1, q_{1}, q_{2}\right)$, representing $q \oplus 1$, with probability $\left|a_{q}\right|^{2} / \sum_{r}\left|a_{r}\right|^{2}$.
$\left(a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{6}, a_{7}\right) \mapsto$
$\left(a_{4}, a_{5}, a_{6}, a_{7}, a_{0}, a_{1}, a_{2}, a_{3}\right)$
is "complementing qubit 2": $\left(q_{0}, q_{1}, q_{2}\right) \mapsto\left(q_{0}, q_{1}, q_{2} \oplus 1\right)$.
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is "swapping quits 0 and 2 ":
$\left(q_{0}, q_{1}, q_{2}\right) \mapsto\left(q_{2}, q_{1}, q_{0}\right)$.
$\left(a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{6}, a_{7}\right) \mapsto$
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$\left(q_{0}, q_{1}, q_{2}\right) \mapsto\left(q_{2}, q_{1}, q_{0}\right)$.
Complementing quit 2
$=$ swapping quits 0 and 2 - complementing quit 0 - swapping quits 0 and 2 .

Similarly: swapping quits $i, j$.
$\left(a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{6}, a_{7}\right) \mapsto$
$\left(a_{0}, a_{1}, a_{3}, a_{2}, a_{4}, a_{5}, a_{7}, a_{6}\right)$ is a "reversible XOR gate" = "controlled NOT gate":
$\left(q_{0}, q_{1}, q_{2}\right) \mapsto\left(q_{0} \oplus q_{1}, q_{1}, q_{2}\right)$.
Example with more quits:
$\left(a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{6}, a_{7}\right.$, $a_{8}, a_{9}, a_{10}, a_{11}, a_{12}, a_{13}, a_{14}, a_{15}$, $a_{16}, a_{17}, a_{18}, a_{19}, a_{20}, a_{21}, a_{22}, a_{23}$, $\left.a_{24}, a_{25}, a_{26}, a_{27}, a_{28}, a_{29}, a_{30}, a_{31}\right)$ $\mapsto\left(a_{0}, a_{1}, a_{3}, a_{2}, a_{4}, a_{5}, a_{7}, a_{6}\right.$, $a_{8}, a_{9}, a_{11}, a_{10}, a_{12}, a_{13}, a_{15}, a_{14}$, $a_{16}, a_{17}, a_{19}, a_{18}, a_{20}, a_{21}, a_{23}, a_{22}$, $\left.a_{24}, a_{25}, a_{27}, a_{26}, a_{28}, a_{29}, a_{31}, a_{30}\right)$.
$\left(a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{6}, a_{7}\right) \mapsto$
$\left(a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{7}, a_{6}\right)$
is a "Toffoli gate" =
"controlled controlled NOT gate":
$\left(q_{0}, q_{1}, q_{2}\right) \mapsto\left(q_{0} \oplus q_{1} q_{2}, q_{1}, q_{2}\right)$.
Example with more quits:
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## Reversible computation

Say $p$ is a permutation
of $\left\{0,1, \ldots, 2^{n}-1\right\}$.
General strategy to compose these fast quantum operations to obtain index permutation $\left(a_{p(0)}, a_{p(1)}, \ldots, a_{p\left(2^{n}-1\right)}\right)$
$\mapsto\left(a_{0}, a_{1}, \ldots, a_{2}{ }^{n}-1\right):$

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1. Build a traditional circuit to compute $j \mapsto p(j)$ using NOT/XOR/AND gates.
2. Convert into reversible gates: e.g., convert AND into Toffoli.

Example: Let's compute
$\left(a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{6}, a_{7}\right) \mapsto$
$\left(a_{7}, a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{6}\right)$;
permutation $q \mapsto q+1 \bmod 8$.

1. Build a traditional circuit to compute $q \mapsto q+1 \bmod 8$.

## $q_{0}$


$q_{0} \oplus 1$
$q_{1} \oplus q_{0}$
$q_{2} \oplus c_{1}$
2. Convert into reversible gates.

## Toffoli for $q_{2} \leftarrow q_{2} \oplus q_{1} q_{0}$ :

$\left(a_{0}, a_{1}, a_{2}, a_{3}, a_{4}, a_{5}, a_{6}, a_{7}\right) \mapsto$
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Controlled NOT for $q_{1} \leftarrow q_{1} \oplus q_{0}$ :
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For large $n$, most permutations $p$ need many operations $\Rightarrow$ slow. Really want fast circuits.

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For large $n$, most permutations $p$ need many operations $\Rightarrow$ slow. Really want fast circuits.

Also, it didn't need extra storage: circuit operated "in place" after computation $c_{1} \leftarrow q_{1} q_{0}$ was merged into $q_{2} \leftarrow q_{2} \oplus c_{1}$.

Typical circuits aren't in-place.

Start from any circuit:
inputs $b_{1}, b_{2}, \ldots, b_{i}$;
$b_{i+1}=1 \oplus b_{f(i+1)} b_{g(i+1)}$;
$b_{i+2}=1 \oplus b_{f(i+2)} b_{g(i+2)}$;
$b_{T}=1 \oplus b_{f(T)} b_{g(T)}$; specified outputs.

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$b_{T}=1 \oplus b_{f(T)} b_{g(T)}$;
specified outputs.
Reversible but dirty:
inputs $b_{1}, b_{2}, \ldots, b_{T}$;
$b_{i+1} \leftarrow 1 \oplus b_{i+1} \oplus b_{f(i+1)} b_{g(i+1)}$;
$b_{i+2} \leftarrow 1 \oplus b_{i+2} \oplus b_{f(i+2)} b_{g(i+2)} ;$
$b_{T} \leftarrow 1 \oplus b_{T} \oplus b_{f(T)} b_{g(T)}$.
Same outputs if all of
$b_{i+1}, \ldots, b_{T}$ started as 0 .

Reversible and clean:
after finishing dirty computation, set non-outputs back to 0 , by repeating same operations on non-outputs in reverse order.

Original computation:
(inputs) $\mapsto$
(inputs, dirt, outputs).
Dirty reversible computation:
(inputs, zeros, zeros) $\mapsto$
(inputs, dirt, outputs).
Clean reversible computation:
(inputs, zeros, zeros) $\mapsto$
(inputs, zeros, outputs).

Given fast circuit for $p$ and fast circuit for $p^{-1}$, build fast reversible circuit for ( $x$, zeros $) \mapsto(p(x)$, zeros $)$.

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Replace reversible bit operations with Toffoli gates etc.
permuting $\mathbf{C}^{2^{n+z}} \rightarrow \mathbf{C}^{2^{n+z}}$.
Permutation on first $2^{n}$ entries is
$\left(a_{p(0)}, a_{p(1)}, \ldots, a_{p\left(2^{n}-1\right)}\right)$
$\mapsto\left(a_{0}, a_{1}, \ldots, a_{2}^{n-1}\right)$.
Typically prepare vectors supported on first $2^{n}$ entries so don't care how permutation acts on last $2^{n+z}-2^{n}$ entries.

Warning: Number of qubits $\approx$ number of bit operations in original $p, p^{-1}$ circuits.

This can be much larger than number of bits stored in the original circuits.

Many useful techniques
to compress into fewer qubits,
but often these lose time. Many subtle tradeoffs.

Crude "poly-time" analyses don't care about this, but serious cryptanalysis is much more precise.

## Fast quantum operations, part 2

"Hadamard":

$$
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Same for quit 1:
$\left(a_{0}, a_{1}, a_{2}, a_{3}\right) \mapsto$
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Same for quit 1:
$\left(a_{0}, a_{1}, a_{2}, a_{3}\right) \mapsto$
$\left(a_{0}+a_{2}, a_{1}+a_{3}, a_{0}-a_{2}, a_{1}-a_{3}\right)$.
Quit 0 and then quit 1 :
$\left(a_{0}, a_{1}, a_{2}, a_{3}\right) \mapsto$
$\left(a_{0}+a_{1}, a_{0}-a_{1}, a_{2}+a_{3}, a_{2}-a_{3}\right) \mapsto$
$\left(a_{0}+a_{1}+a_{2}+a_{3}, a_{0}-a_{1}+a_{2}-a_{3}\right.$,
$\left.a_{0}+a_{1}-a_{2}-a_{3}, a_{0}-a_{1}-a_{2}+a_{3}\right)$.

Repeat $n$ times: e.g.,
$(1,0,0, \ldots, 0) \mapsto(1,1,1, \ldots, 1)$.
Measuring ( $1,0,0, \ldots, 0$ ) always produces 0 .

Measuring $(1,1,1, \ldots, 1)$ can produce any output: $\operatorname{Pr}[$ output $=q]=1 / 2^{n}$.

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can produce any output:
$\operatorname{Pr}[$ output $=q]=1 / 2^{n}$.
Aside from "normalization"
(irrelevant to measurement),
have Hadamard $=$ Hadamard $^{-1}$, so easily work backwards from "uniform superposition" $(1,1,1, \ldots, 1)$ to "pure state" $(1,0,0, \ldots, 0)$.

Simon's algorithm
Assume: nonzero $s \in\{0,1\}^{n}$ satisfies $f(x)=f(x \oplus s)$
for every $x \in\{0,1\}^{n}$.
Can we find this period $s$, given a fast circuit for $f$ ?

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We don't have enough data if $f$ has many periods.
Assume: only periods are $0, s$.
Traditional solution:
Compute $f$ for many inputs, sort, analyze collisions.
Success probability is very low until \#inputs approaches $2^{n / 2}$.

Simon's algorithm
is much, much, much faster.
Say $f$ maps $n$ bits to $m$ bits,
using $z$ "ancilla" bits
for reversibility.
Prepare $n+m+z$ qubits
in pure zero state:
vector ( $1,0,0, \ldots$ ).
Use $n$-fold Hadamard to move first $n$ qubits into uniform superposition:
$(1,1,1, \ldots, 1,0,0, \ldots)$
with $2^{n}$ entries 1 , others 0 .

Apply fast vector permutation for reversible $f$ computation: 1 in position $(q, 0,0)$ moves to position $(q, f(q), 0)$.

Note symmetry between 1 at $(q, f(q), 0)$ and 1 at $(q \oplus s, f(q), 0)$.

Apply $n$-fold Hadamard.
Measure. By symmetry, output is orthogonal to $s$.

Repeat $n+10$ times.
Use Gaussian elimination to (probably) find $s$.

## Grover's algorithm

Assume: unique $s \in\{0,1\}^{n}$ has $f(s)=0$.

Traditional algorithm to find $s$ : compute $f$ for many inputs, hope to find output 0 .
Success probability is very low until \#inputs approaches $2^{n}$.

Grover's algorithm takes only $2^{n / 2}$ reversible computations of $f$. Typically: reversibility overhead is small enough that this easily beats traditional algorithm.

Start from uniform superposition over all $n$-bit strings $q$.

Step 1: Set $a \leftarrow b$ where $b_{q}=-a_{q}$ if $f(q)=0$,
$b_{q}=a_{q}$ otherwise.
This is fast.
Step 2: "Grover diffusion".
Negate a around its average.
This is also fast.
Repeat steps 1 and 2 about $0.58 \cdot 2^{0.5 n}$ times.

Measure the $n$ quits.
With high probability this finds $s$.

Graph of $q \mapsto a_{q}$
for an example with $n=12$ after 0 steps:


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after Step 1:

| 1.0 |
| :--- |
| 0.5 |
|  |
| 0.0 |
| 0 |
| 0 |

Graph of $q \mapsto a_{q}$
for an example with $n=12$ after Step $1+$ Step 2:


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after Step $1+$ Step $2+$ Step 1 :

| 1.0 |
| :--- |
| 0.5 |
| 0 |
| 0.0 |
| 0 |

Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $2 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $3 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $4 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $5 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $6 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $7 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $8 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $9 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $10 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $11 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $12 \times$ (Step $1+$ Step 2 ):


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $13 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $14 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $15 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $16 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $17 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $18 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $19 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $20 \times$ (Step $1+$ Step 2):

| 1.0 |  |
| :---: | :---: |
| 0.5 |  |
| 0.0 |  |
| -0.5 |  |
| -1.0 |  |

Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $25 \times$ (Step $1+$ Step 2 ):


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $30 \times$ (Step $1+$ Step 2):


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $35 \times$ (Step $1+$ Step 2 ):


Good moment to stop, measure.

Graph of $q \mapsto a_{q}$

for an example with $n=12$ after $40 \times($ Step $1+$ Step 2$)$ : | 1.0 |  |
| :--- | :--- | :--- | :--- |
|  |  |
|  |  |
|  |  |
|  |  |
|  |  |
|  |  |
| -0.5 |  |
|  |  |

Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $45 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $50 \times($ Step $1+$ Step 2$)$ :


Traditional stopping point.

Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $60 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $70 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $80 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $90 \times($ Step $1+$ Step 2$)$ :


Graph of $q \mapsto a_{q}$
for an example with $n=12$ after $100 \times($ Step $1+$ Step 2$)$ :


Very bad stopping point.
$q \mapsto a_{q}$ is completely described by a vector of two numbers
(with fixed multiplicities):
(1) $a_{q}$ for roots $q$;
(2) $a_{q}$ for non-roots $q$.

Step $1+$ Step 2
act linearly on this vector.
Easily compute eigenvalues
and powers of this linear map
to understand evolution
of state of Grover's algorithm.
$\Rightarrow$ Probability is $\approx 1$
after $\approx(\pi / 4) 2^{0.5 n}$ iterations.

## Notes on provability

## Textbook algorithm analysis:

## Proof of correctness

## New algorithm

Proof of run time

Mislead students into thinking that best algorithm $=$ best proven algorithm.

Reality: state-of-the-art cryptanalytic algorithms are almost never proven.

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proofs probably do not exist for most of these algorithms.
So demanding proofs is silly.
Without proofs, how do we analyze correctness+speed?
Answer: Real algorithm analysis relies critically on heuristics and computer experiments.

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2. Faster algorithm-specific simulation? Yes, sometimes.
3. Fast trapdoor simulation. Simulator (like prover) knows more than the algorithm does. Tung Chou has implemented this, found errors in two publications.
