

# *Practical Quantum Computing*

## Lecture 8

### Quantum Algorithms: Simon's and Grover

with slides from Dave Bacon <https://homes.cs.washington.edu/~dabacon/teaching/siena/>

# Context

The Deutsch-Jozsa problem showed an exponential quantum improvement over the *best deterministic* classical algorithms.

The Bernstein-Vazirani problem shows a polynomial improvement over the *best randomized* classical algorithms that have error probability  $\leq 1/3$ .

Combine these two features and see a problem where quantum computers are exponentially more efficient than bounded-error randomized algorithms.

# Simon's Problem

**Given:** A function with  $n$  bit strings as input and one bit as output

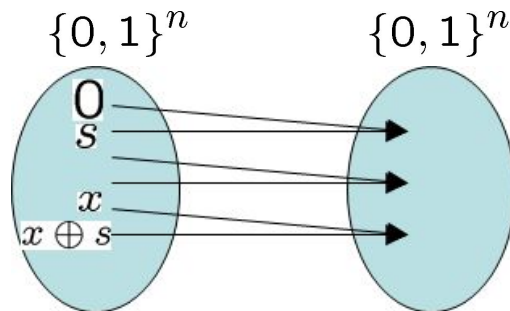
$$f : x \in \{0, 1\}^n \rightarrow \{0, 1\}^n$$

**Promise:** The function is guaranteed to satisfy

$$f(x) = f(y) \Leftrightarrow y = x \oplus s, s \neq 0$$

$$x \oplus s = (x_1 \oplus s_1, x_2 \oplus s_2, \dots, x_n \oplus s_n)$$

**Problem:** Find the  $n$  bit string  $s \neq 0$



# Classical Simon's Problem

**Promise:** The function is guaranteed to satisfy

Suppose we start querying the function and *build up a list of the pairs*  $(x_\alpha, f(x_\alpha))$

If we find  $x_\alpha \neq x_\beta$  such that  $f(x_\alpha) = f(x_\beta)$  then we solve the problem

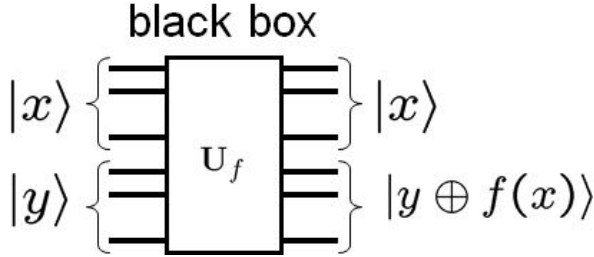
$$\begin{aligned} f(x_\alpha) = f(x_\beta) &\Rightarrow x_\alpha = s \oplus x_\beta \\ s &= x_\alpha \oplus x_\beta \end{aligned}$$

But suppose we start querying the function  $m$  times

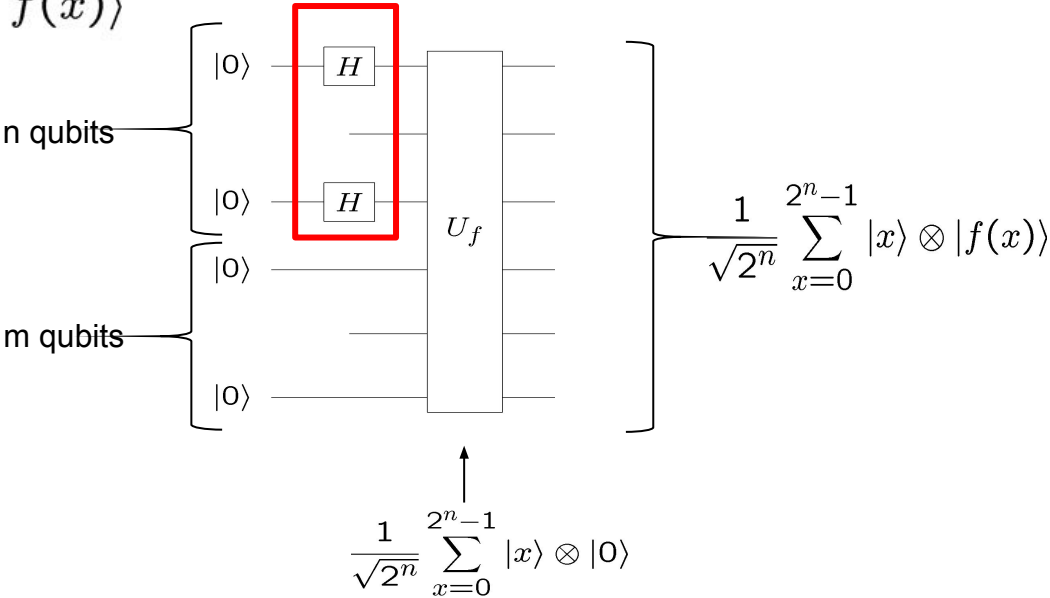
Probability of getting a matching pair:  $\approx \frac{\binom{m}{2}}{2^n} = \frac{m(m-1)}{2^{n+1}}$

Bounded error query complexity:  $m = O\left(2^{\frac{n}{2}}\right)$

# Quantum Simon's Problem



Unlike previous problems, we can't use the phase kickback trick because there is no structure in the function.



# Quantum Simon's Problem

Measure the second register

$$\frac{1}{\sqrt{2^n}} \sum_{x=0}^{2^n-1} |x\rangle \otimes |f(x)\rangle$$

Using the promise on the function

$$f(x) = f(y) \Leftrightarrow y = x \oplus s, s \neq 0$$

This implies that after we measure, we have the state

$$\frac{1}{\sqrt{2}}(|x\rangle + |x \oplus s\rangle) \otimes |f(x)\rangle$$

For random uniformly distributed  $x \in \{0, 1\}^n$

uniformly distributed = all strings equally probable.

measuring this state at this time does us no good ...

# Quantum Simon's Problem

$$\frac{1}{\sqrt{2}}(|x\rangle + |x \oplus s\rangle)$$

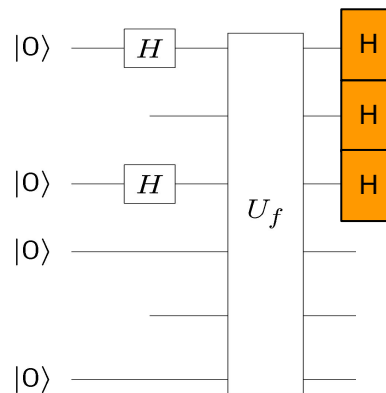
Measuring this state at this time in the **computational basis** does us no good....

For random uniformly distributed  $x \in \{0, 1\}^n$

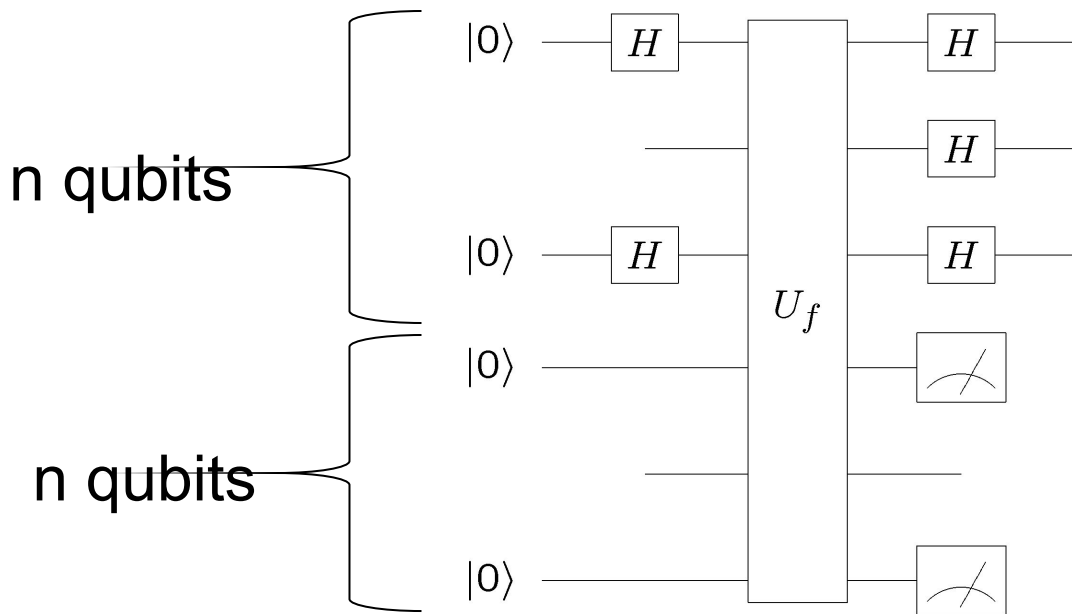
Measurement yields either  $|x\rangle$  or  $|x \oplus s\rangle$

But we don't know  $x$ , so we can't use this to find  $s$ .

Add Hadamard gates to the end register



# Quantum Simon's Problem



$$H^{\otimes n} \frac{1}{\sqrt{2}} (|x\rangle + |x \oplus s\rangle) = \frac{1}{\sqrt{2^{n+1}}} \sum_{y=0}^{2^n-1} ((-1)^{y \cdot x} + (-1)^{y \cdot (x \oplus s)}) |y\rangle$$



# Quantum Simon's Problem

$$H^{\otimes n} \frac{1}{\sqrt{2}} (|x\rangle + |x \oplus s\rangle) = \frac{1}{\sqrt{2^{n+1}}} \sum_{y=0}^{2^n-1} ((-1)^{y \cdot x} + (-1)^{y \cdot (x \oplus s)}) |y\rangle$$

$$y \cdot x = y_1 x_1 \oplus y_2 x_2 \oplus \dots \oplus y_n x_n$$

$$y \cdot (x \oplus s) = y_1 (x_1 \oplus s_1) \oplus y_2 (x_2 \oplus s_2) \oplus \dots \oplus y_n (x_n \oplus s_n) = (y \cdot x) \oplus (y \cdot s)$$

$$= \frac{1}{\sqrt{2^{n+1}}} \sum_{y=0}^{2^n-1} (-1)^{y \cdot x} (1 + (-1)^{y \cdot s}) |y\rangle$$

Measuring this state, we obtain uniformly distributed random values of  $y$  s.t.

$$y \cdot s = 0 \pmod{2}$$

If  $y \neq 0$  we have eliminated the possible values of  $s$  by half



# Quantum Simon's Problem

$$y \cdot s = 0 \pmod{2}$$

$$y \cdot s = y_1 s_1 \oplus y_2 s_2 \oplus \cdots \oplus y_n s_n = 0$$

On values of  $y_i$  which are 0, this doesn't restrict  $s_i$

On values of  $y_i$  which are 1, the corresponding  $s_i$  must XOR to 0.

This restricts the set of possible  $\mathcal{S}$ 's by half.

Example:  $n = 3$

$$y = 3_{10} = 011_2$$

$$(011) \cdot s = 0s_1 \oplus 1s_2 \oplus 1s_3 = 0$$

$$s_2 \oplus s_3 = 0$$

possible  $s$ 's: 000 011 100 111

# Quantum Simon's Problem

Think about the bit strings  $s$  as vectors in  $\mathbb{Z}_2^n$

- If we obtain  $n$  lin. indep. equations of this form, we win
- (Gaussian elimination)

$$\begin{aligned}y_0 \cdot s &= 0 \\y_1 \cdot s &= 0 \\&\vdots \\y_k \cdot s &= 0\end{aligned}$$

Suppose we have  $k$  linearly independent  $y_i$ 's. What is the probability

that  $y_{k+1}$  is linearly independent of previous  $y_i$ 's?

$$Pr = \frac{2^n - 2^k}{2^n} = 1 - 2^{k-n}$$

Note that if the  $j$ 's you have generated at some point span a space of size  $2^k$ , for some  $k < n - 1$ , then the probability that your next run of the algorithm produces a  $j$  that is linearly independent of the earlier ones, is  $(2^{n-1} - 2^k)/2^{n-1} \geq 1/2$ . Hence an expected number of  $O(n)$  runs of the algorithm suffices to find  $n - 1$  linearly independent  $j$ 's. Simon's algorithm thus finds  $s$  using an expected number of  $O(n)$   $x_i$ -queries and polynomially many other operations.

# Quantum Simon's Problem

What is the probability that our  $n-1$  equations are linearly independent?

$$\begin{aligned} Pr(succ) &= \left(1 - \frac{1}{2^n}\right) \left(1 - \frac{1}{2^{n-1}}\right) \cdots \left(1 - \frac{1}{4}\right) \\ &= \prod_{k=1}^n \left(1 - \frac{1}{2^k}\right) > \prod_{k=2}^{\infty} \left(1 - \frac{1}{2^k}\right) \approx 0.28879 \end{aligned}$$

With constant probability:

- we obtain linearly independence  $\rightarrow$  Gaussian elimination  $O(n^3)$
- solve Simon's problem



# Applications of Grover's Algorithm

Grover's algorithm is a framework

- It does not offer the exponential speedup like Shor's alg.
- Can be extended for different problems
  - cryptanalysis AES
  - combinatorial optimisation - e.g. travelling salesman

## Applying Grover's algorithm to AES: quantum resource estimates

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**Abstract.** We present quantum circuits to implement an exhaustive key search for the Advanced Encryption Standard (AES) and analyze the quantum resources required to carry out such an attack. We consider the overall circuit size, the number of qubits, and the circuit depth as measures for the cost of the presented quantum algorithms. Throughout, we focus on Clifford+ $T$  gates as the underlying fault-tolerant logical quantum gate set. In particular, for all three variants of AES (key size 128, 192, and 256 bit) that are standardized in FIPS-PUB 197, we establish precise bounds for the number of qubits and the number of elementary logical quantum gates that are needed to implement Grover's quantum algorithm to extract the key from a small number of AES plaintext-ciphertext pairs.

**Keywords:** quantum cryptanalysis, quantum circuits, Grover's algorithm, Advanced Encryption Standard

Implementing **Grover** oracles for quantum key search on **AES** and **LowMC**  
[S.Jagus](#), [M.Naehrig](#), [M.Roetteler](#), [F.Virdia](#) - ... International Conference on ... 2020 - Springer  
... Keywords: Quantum cryptanalysis **Grover's** algorithm **AES** **LowMC** Post-quantum cryptography Q# implementation ... Since the publication of [21], other works have studied quantum circuits for **AES**, the **AES Grover** oracle and its use in **Grover's** algorithm. Almazrooie et al ...

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[HTML] **Grover** on **SIMON** **SIMON**

[R.Anand](#), [A.Maitra](#), [S.Mukhopadhyay](#) - Quantum Information Processing, 2020 - Springer  
... However, this does not rule out the need of analyzing the cost of **Grover's** algorithm on symmetric ciphers. In this direction, subsequent efforts have been made to derive cost estimation for applying **Grover's** search algorithm on all variants of **AES** [7, 11, 17, 28] ...

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[K.Jang](#), [S.Choi](#), [H.Kwon](#), [H.Seo](#) - eprint.iacr.org  
... computing, pp. 212–219, 1996. 6. M. Grassl, B. Langenberg, M. Roetteler, and R. Steinwandt, "Applying **Grover's** algorithm to **AES**: quantum resource estimates," in Post-Quantum Cryptography, pp. 29–43, Springer, 2016. 7. B ...

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J.Zou, Y.Liu, C.Dong, W.Wu, L.Dong - IACR Cryptol. ePrint Arch., 2019 - eprint.iacr.org  
... [3] Markus Grassl, Brandon Langenberg, Martin Roetteler, and Rainer Steinwandt ... TimeCspace complexity of quantum search algorithms in symmetric cryptanalysis: applying to **AES** and **SHA-2**. Quantum Information ... 8] Brandon Langenberg, Hai Pham, and Rainer Steinwandt ...

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Quantum Resource Estimates of **Grover's** Key Search on **ARIA**

[AK.Chauhan](#), [SK.Sanadhya](#) - International Conference on Security, Privacy ..., 2020 - Springer  
... [10] studied the quantum circuits of **AES** and estimated the cost of quantum resources needed to apply **Grover's** algorithm to the **AES** oracle for key search. Almazrooie et al ... As a working example, they implemented the **AES Grover** oracle in Q# quantum programming language ...

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Solving Binary  $MQ$  with **Grover's** Algorithm

[P.Schwabe](#), [B.Westerbaan](#) - ... Conference on Security, Privacy, and Applied ..., 2016 - Springer  
... primitives. For example, in [GLRS16], Grassl, Langenberg, Roetteler, and Steinwandt describe how to attack **AES-128** with **Grover's** algorithm using a quantum computer with 2953 logical qubits in time about  $\sqrt{2^{187}}$ . We note ...

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Quantum **Grover** Attack on the Simplified-**AES**

M.Almazrooie, R.Abdullah, A.Samsudin... - Proceedings of the 2018 ... 2018 - dl.acm.org  
... This paper is organized as follows: Sections 2 and 3 review the Simplified-**AES** (**S-AES**) cryptosystem and the quantum **Grover's** algorithm, respectively ... Figure 8. Applying **Grover** attack on **S-AES**. Figure 8 illustrates the complete model of the **Grover** attack against **S-AES** ...

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# Quantum computers can search faster than a classical ones

- Assume the entries are indexed 0, 1, 2, 3, ....., N
- Use binary vectors
  - Of the form  $0 = 10\dots000$ ,  $1 = 01\dots000$ , ... ,  $N = 00\dots001$
  - The length of the vectors is N bits
  - A bit signals if an entry is found in the database
  - Practically, multiple entries can be sought and then multiple bits will be on
- E.g. the vector  $|3\rangle$  will have a 1 at the fourth index (zero-indexed)
- Search: “Is the entry with index F in the list 0,1,.....,N?”
- Simplify and assume that the search is always for  $F=N$  (relabel the database entries)

$$\begin{array}{l} |0\rangle \\ |1\rangle \\ |2\rangle \\ |3\rangle \end{array} \begin{pmatrix} 0 \\ 0 \\ 0 \\ 1 \end{pmatrix}$$

# Building block - Inner product

*The why: We will use this notation to determine the relative rotation (angle) between two vectors*

Example:  $a = (0, 0, 0, 1)$   $b = (1, 1, 1, 1)$   $\rightarrow ab = 0*1 + 0*1 + 0*1 + 1*1 = 1$

Can be written as the multiplication of a row vector with a column vector

$$(0, 0, 0, 1) \begin{pmatrix} 1 \\ 1 \\ 1 \\ 1 \end{pmatrix} = 0*1 + 0*1 + 0*1 + 1*1 = 1$$

Depending if the vector is **row** or **column** we can use special notation

**$\langle a|$  for row vector**

**$|a\rangle$  for column vector**

such that  $\langle a||b\rangle$  is the notation for the inner product

Shorthand notation  $\langle a|b\rangle = 1$



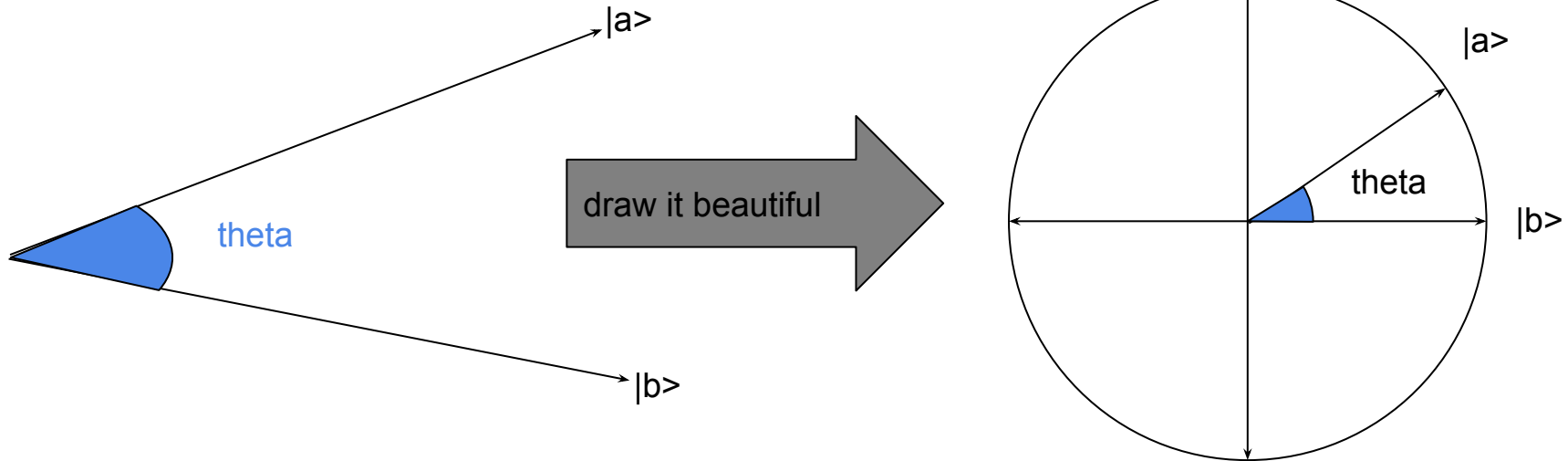
# Building block - Angle between vectors

*The why: Useful for building a method to rotate a third vector by knowing the angle between two other vectors*

In general,  $\langle a|b \rangle = |a||b|\cos(\theta)$

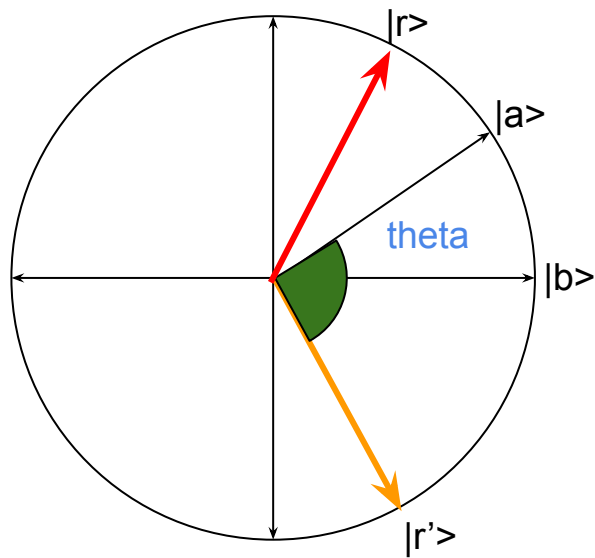
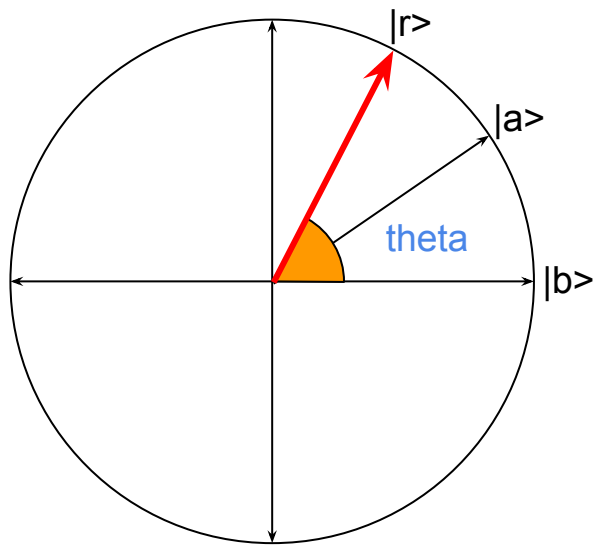
where  $|a|$  and  $|b|$  are the length of the vectors

Simplify and assume that all vectors have unit length, such that  $\langle a|b \rangle = \cos(\theta)$

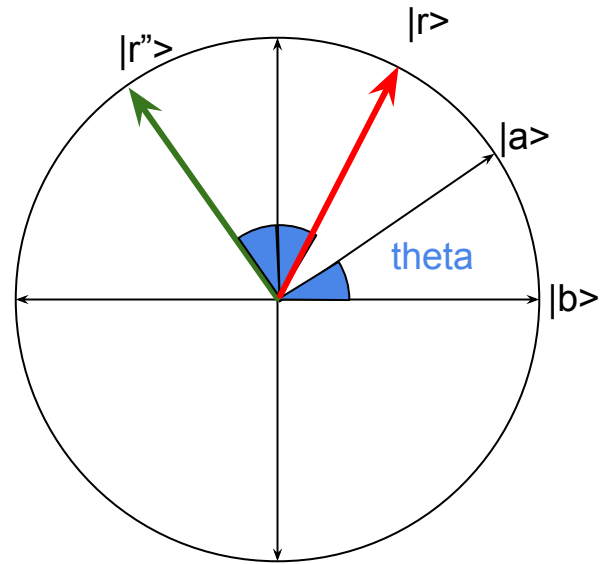


# Building block - rotate with twice the angle of theta

The why: Build a method to move  $|r\rangle$  such that it is orthogonal to  $|b\rangle$



after mirror against  $|b\rangle$



after mirror against  $|a\rangle$

# Building block - Number of mirror seq. to rotate $\pi/2$

The why: It indicates where the quantum speed-up is coming from!

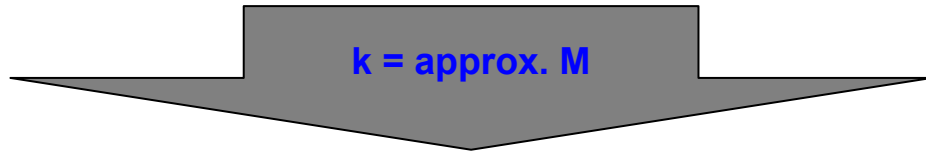
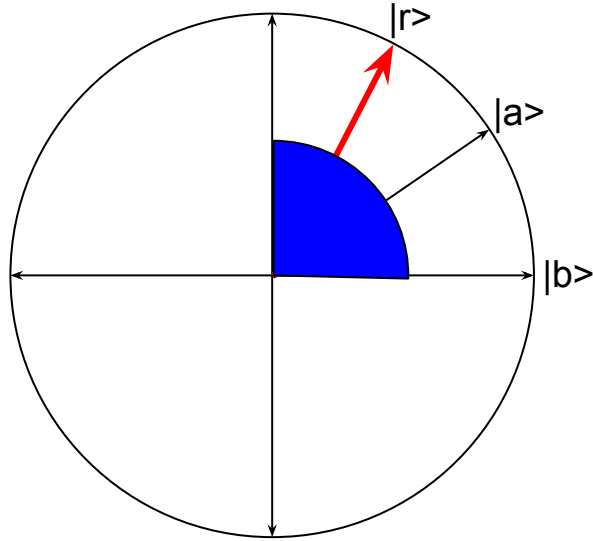
How many rotations ( $k=?$ ) are necessary to get to  $\pi/2$ ?

$$\theta + k \cdot 2\theta = \pi/2$$

$$2k = \pi/(2 \cdot \theta) - 1$$

$$k = \text{round}(\pi/(4 \cdot \theta) - 1/2)$$

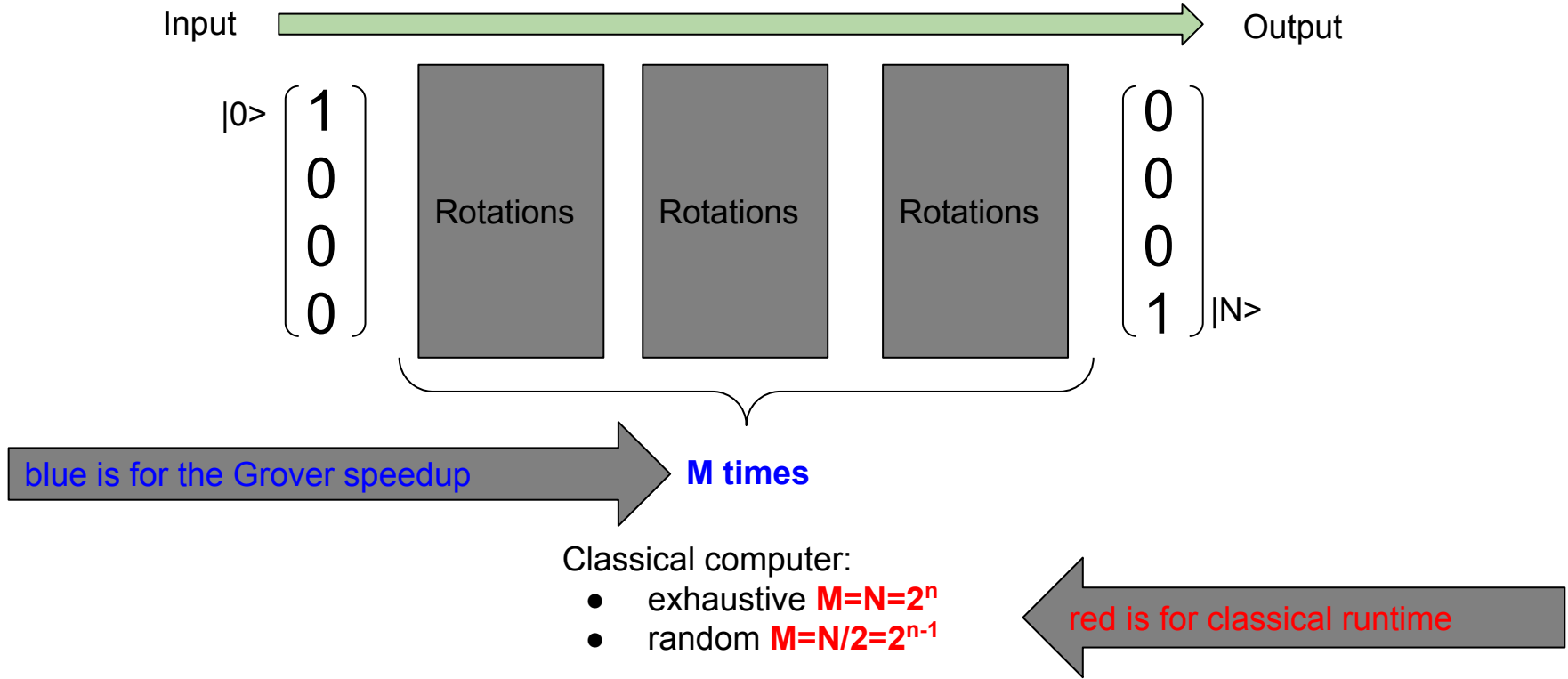
Use large values of  $M$  to create very small angles  $\theta = 1/M$   
Example:  $\sin(1/256) = 1/256$ ,  $\cos(1/256) = 1$



**The difference between classical and quantum is the value of  $M$ !**

# Input to Output

The why: This is a sketch of a quantum circuit looks like



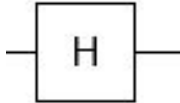
# Building rotations - Outer product - Rotations

The why: Mirroring against the two vectors has to be implemented mathematically

1) Transform  $|0\rangle$  to  $|1\rangle$  and  $|1\rangle$  to  $|0\rangle$  where  $|0\rangle = \begin{pmatrix} 1 \\ 0 \end{pmatrix}$  and  $|1\rangle = \begin{pmatrix} 0 \\ 1 \end{pmatrix}$

The bit flip matrix  $X = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix} = \begin{pmatrix} 0 & 1 \\ 0 & 0 \end{pmatrix} + \begin{pmatrix} 0 & 0 \\ 1 & 0 \end{pmatrix} = |0X1\rangle + |1X0\rangle$

2) Define a matrix that takes  $|0\rangle$  to  $|+\rangle = |0\rangle + |1\rangle$  and  $|1\rangle$  to  $|-\rangle = |0\rangle - |1\rangle$

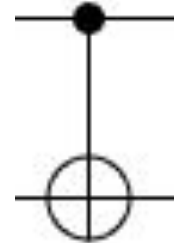
$$\left. \begin{array}{l} |0\rangle(\langle 0| + \langle 1|) = \begin{pmatrix} 1 & 1 \\ 0 & 0 \end{pmatrix} \\ |1\rangle(\langle 1| - \langle 0|) = \begin{pmatrix} 0 & 0 \\ 1 & -1 \end{pmatrix} \end{array} \right\} \begin{pmatrix} 1 & 1 \\ 1 & -1 \end{pmatrix} \text{ (almost) Hadamard matrix}$$


3) Define a matrix that applies the X matrix only if the state of another vector is  $|1\rangle$

$$|00X00\rangle + |01X01\rangle + |10X11\rangle + |11X10\rangle$$

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

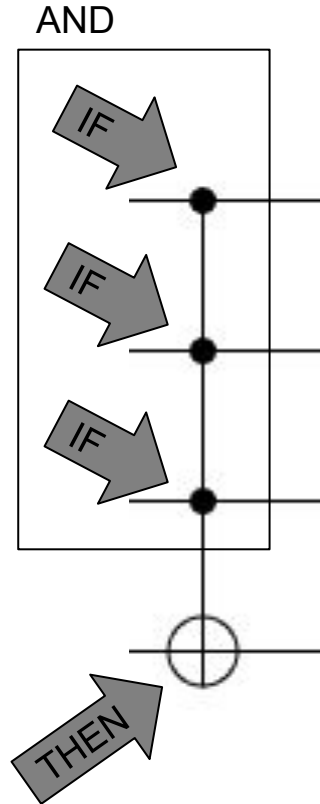
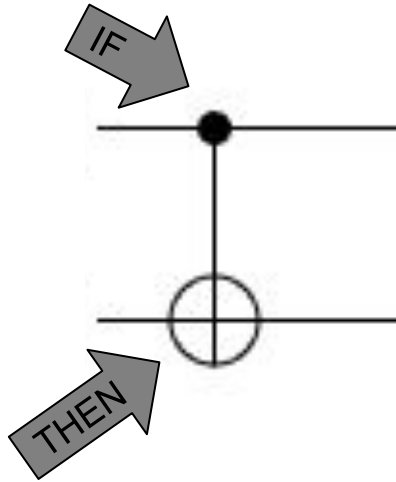
CNOT matrix



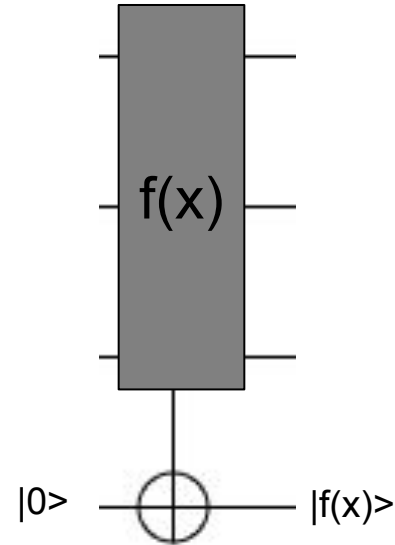
# Building rotations - Encoding conditions for rotations

The why: Recipe for building rotations depending on configurable criteria

Classical problems can be imported into a quantum algorithm



Boolean function



# The quantum state

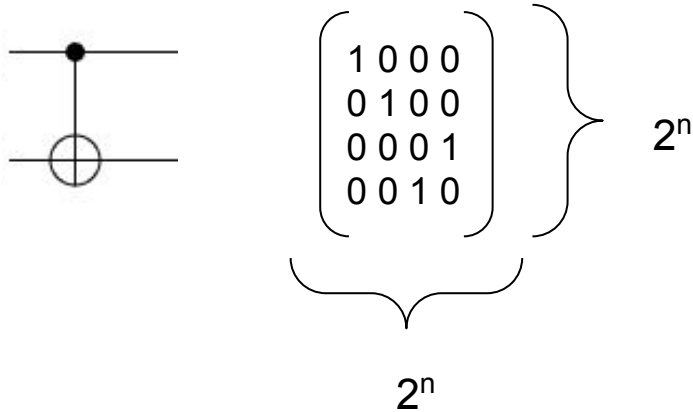
*The why: There is an exponential representational explosion that is often mentioned when quantum computations are discussed*

Previous statement: *All vectors have unit length*

A quantum state is a complex vector whose **L2 norm** is 1

- A qubit is a 2-dimensional complex vector. Examples  $|0\rangle$ ,  $|1\rangle$ ,  $|+\rangle$ ,  $|-\rangle$
- The state of a n-qubit circuit is a  $2^n$ -dimensional complex vector

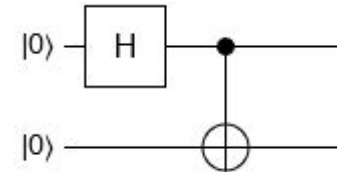
Example  $n=2$ , the state has four entries and the matrix has size  $4 \times 4$



A quantum circuit is a  $2^n \times 2^n$  matrix

Entries in a state vector can be different from zero

Bell state  $2^{-1/2}(|00\rangle + |11\rangle)$



# The superposition state

An n-qubit state has length  $2^n$

Define the **n-qubit** equal superposition  $|S\rangle$  with H gates

$$|S\rangle = 2^{-n/2} (|00\dots00\rangle + |00\dots01\rangle + \dots + |11\dots11\rangle)$$

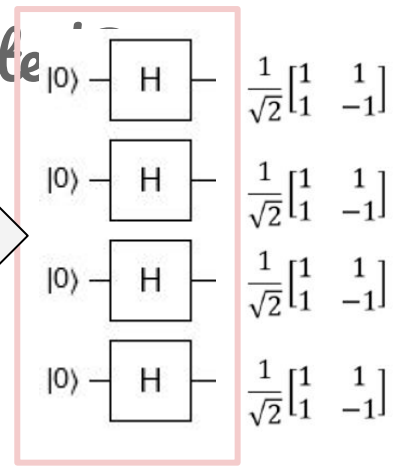
Assume that the sought element is  $|N\rangle = |11\dots11\rangle$

$$\langle F|S\rangle = 2^{-n/2} = 1/M$$

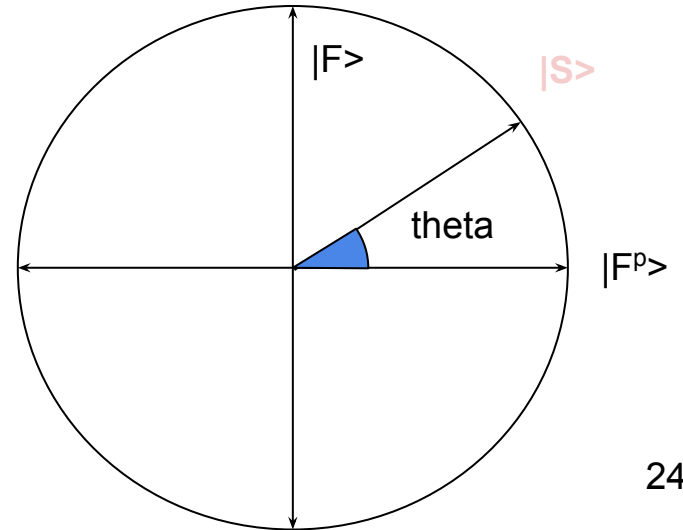
As a result,  $M = \text{sqrt}(2^n)$  rotations are needed

Each rotation (called Grover iteration) consists of

- 1) mirror around  $|F^p\rangle$
- 2) mirror around  $|S\rangle$

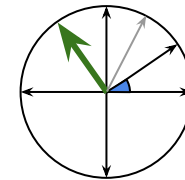
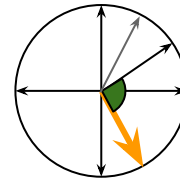
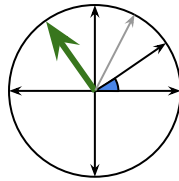
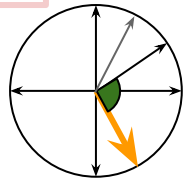
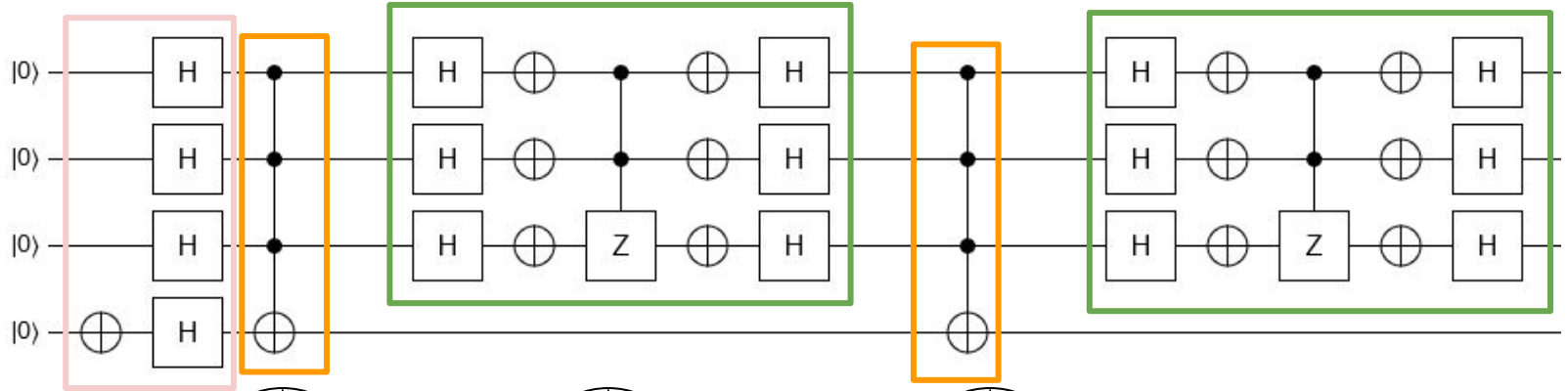


*The why: We create a small enough angle necessary to implement the sequence of rotations with the necessary speedup*





# The Grover search circuit for $n=3$ qubits



*superposition state*

Ora  
cle

Diffusion operator

Rotations

Ora  
cle

Diffusion operator

Rotations

~2 times

# Grover's Algorithm Summary

For  $N = 1000$  entries

- classical exhaustive search method needs 1000 steps
- Grover's algorithm needs approx. 32 steps

The key concepts presented:

- quantum qubit, gate, circuit
- how to import classical problems (Boolean logic) into quantum circuits

The key elements of the algorithm are:

- Mirroring operations
  - a known vector - the equal superposition state
  - a configurable vector - the search criteria
  - mirror operations are implemented with quantum gates
- The speed-up is from the L2 norm to calculate the distance between two qubit states

