

# Quantum Computation

(Lecture QC-3: Quantum Algorithms B)

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## Quantum Computing

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# Quantum algorithms

## Principles (review)

- Keep **separate input-output registers** (standard practice from reversible classic computation)
- **Fix initial setting** (preparation): typically the qubits in the initial classical state are put into a superposition of many states;
- **Transform**, through unitary operators applied to the superposed state;
- **Measure**, i.e. project onto a basis vector associated with a measurement tool.

# Quantum algorithms

$U_f$  is specified as a reversible (classical) transformation taking typically computational-basis states into computational-basis states. Its extension to arbitrary complex superpositions of computational-basis states is necessarily unitary.

$$U_f(|x\rangle_n |y\rangle_m) = (|x\rangle_n |y \oplus f(x)\rangle_m)$$

yielding, for  $y = 0$

$$U_f(|x\rangle_n |0\rangle_m) = (|x\rangle_n |f(x)\rangle_m)$$

# Quantum algorithms

## Build a superposition

$$\begin{aligned}
 (H \otimes H)(|0\rangle \otimes |0\rangle) &= \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle) \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle) \\
 &= \frac{1}{2}(|00\rangle + |01\rangle + |10\rangle + |11\rangle) \\
 &= \frac{1}{2}(|0\rangle + |1\rangle + |2\rangle + |3\rangle)
 \end{aligned}$$

which generalises to

$$H^{\otimes n}|0\rangle_n = \frac{1}{\sqrt{2^{n/2}}} \sum_{0 \leq x \leq 2^n} |x\rangle_n$$

# Quantum algorithms

## Quantum 'parallelism'

$$\begin{aligned}U_f(H^{\otimes n} \otimes I_m)(|x\rangle_n|0\rangle_m) &= \frac{1}{2^{n/2}} \sum_{0 \leq x \leq 2^n} U_f(|x\rangle_n|0\rangle_m) \\ &= \frac{1}{2^{n/2}} \sum_{0 \leq x \leq 2^n} |x\rangle_n|f(x)\rangle_m\end{aligned}$$

The 'quantum parallelism' miracle is, to a great extent, only apparent. Actually, the result of the calculation is not  $2^n$  evaluations of  $f$ : **those evaluations characterize the form of the state that describes the output of the computation.**

# Quantum algorithms

## What works indeed?

- What remains is the fact that the random selection of the  $x$ , for which  $f(x)$  can be learned, being made only **after** the computation has been carried out.
- Note that asserting that the selection was made **before** the computation corresponds to look at a superposition as merely a probabilistic phenomenon (i.e. the qubit described by a superposition is actually in one or the other of the basis states).
- Further computation makes possible to **extract useful information about relations** between the values of  $x$  for several different values of  $x$ , which a classical computer could get only by making several independent evaluations.

# Quantum algorithms

## What works indeed?

- The price to be paid is the loss of the possibility of learning the actual value  $f(x)$  for any individual  $x$  — cf Heisenberg **uncertainty** principle.
- cf the mistaken view that the quantum state encodes a property inherent in the qubits: it rather encodes only the **possibilities available for the extraction of information from them.**

# The Bernstein-Vazirani algorithm

## The problem

Let  $w$  be an unknown non-negative integer less than  $2^n$  and consider a function  $f(x) = w \cdot x$ , where

$$w \cdot x = w_0x_0 \oplus w_1x_1 \oplus w_2x_2 \oplus \dots$$

How many times one has to call  $f$  to determine the value of the integer  $w$ ?

- Classically,  $n$  times: the  $n$  values  $w \cdot 2^m$ , for  $0 \leq m < n$ .
- In a quantum computer a single invocation is enough, regardless of the number  $n$  of bits.



# The Bernstein-Vazirani algorithm

- Prepare the single qubit output register as  $H|1\rangle$  since oracle  $U_f$  applied to  $|x\rangle_n|y\rangle_1$  flips the value  $y$  of the output register iff  $f(x) = 1$ . Thus,

$$U_f |x\rangle_n \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) = (-1)^{f(x)} |x\rangle_n \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle)$$

converting a bit flip to an overall change of sign.

# The Bernstein-Vazirani algorithm

- Superposition

$$\begin{aligned}
 H^{\otimes n}|x\rangle_n &= \frac{1}{2^{n/2}} \sum_{y_{n-1}=0}^1 \cdots \sum_{y_0=0}^1 (-1)^{\sum_{j=0}^{n-1} x_j y_j} |y_{n-1}\rangle \cdots |y_0\rangle \\
 &= \frac{1}{2^{n/2}} \sum_{y=0}^{2^n-1} (-1)^{x \cdot y} |y\rangle_n
 \end{aligned}$$

cf

$$H|x\rangle_1 = \frac{1}{\sqrt{2}}(|0\rangle + (-1)^x|1\rangle) = \frac{1}{\sqrt{2}} \sum_{y=0}^1 (-1)^{xy} |y\rangle$$

# The Bernstein-Vazirani algorithm

Putting everything together,

$$\begin{aligned}
 & (H^{\otimes n} \otimes I) U_f (H^{\otimes n} \otimes H) |0\rangle_n |1\rangle_1 \\
 &= (H^{\otimes n} \otimes I) U_f \left( \frac{1}{2^{n/2}} \sum_{0 \leq x \leq 2^n - 1} |x\rangle \right) \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) \\
 &= \frac{1}{2^{n/2}} \left( H^{\otimes n} \sum_{x=0}^{2^n - 1} (-1)^{f(x)} |x\rangle \right) \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) \\
 &= \frac{1}{2^n} \sum_{x=0}^{2^n - 1} \sum_{y=0}^{2^n - 1} (-1)^{f(x) + x \cdot y} |y\rangle \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) \\
 &= |w\rangle_n |1\rangle_1
 \end{aligned}$$

because

$$\sum_{x=0}^{2^n - 1} (-1)^{w \cdot x} (-1)^{y \cdot x} = \prod_{j=1}^n \sum_{x_j=0}^1 (-1)^{(w_j + y_j) x_j}$$

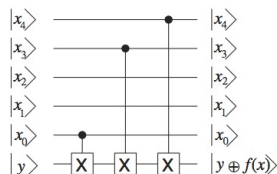
# The Bernstein-Vazirani algorithm: another explanation

Some oracles can be implemented by simple circuits.

- In this case the action of  $U_f$  on the computational basis is to flip the 1 qubit output register once, whenever a bit of  $x$  and the corresponding bit of  $w$  are both 1.
- Put one cNOT for each nonzero bit of  $w$ , controlled by the qubit representing the corresponding bit of  $x$ .
- Their combined effect on every computational basis state is precisely that of  $U_f$ .

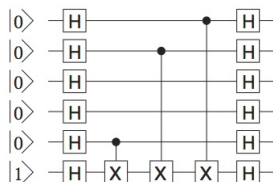
# The Bernstein-Vazirani algorithm: another explanation

Example of the encoding for  $w = 11001$



# The Bernstein-Vazirani algorithm: another explanation

Envelop  $U_f$  into the algorithm



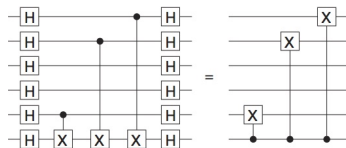
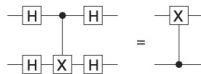
The effect is to convert every cNOTgate in the equivalent representation of  $U_f$  from  $C_{ij}$  to

$$C_{ji} = (H_i H_j) C_{ij} (H_i H_j)$$

reversing the target and control qubits.

# The Bernstein-Vazirani algorithm: another explanation

Because: Law and its application



# The Bernstein-Vazirani algorithm: another explanation

Thus

- After the reversal, the output register controls every one of the cNOT gates, and since the state of the output register is  $|1\rangle$ , every one of the NOT operators acts.
- That action flips just those qubits of the input register for which the corresponding bit of  $w$  is 1.
- Since the input register starts in the state  $|0\rangle_n$ , this changes the state of each qubit of the input to  $|1\rangle$ , iff it corresponds to a nonzero bit of  $w$ .
- Thus, in the end, the state of the input register changes from  $|0\rangle_n$  to  $|w\rangle_n$ .



# Simon's algorithm

## The problem

Determine the period  $z$  of a function  $f$  from  $n$  to  $n - 1$  bits periodic under  $\oplus$ :

$$f(x \oplus z) = f(x)$$

## Simon's algorithm, classically

- Compute  $f$  for sequence of values until finding a value  $x_j$  such that  $f(x_j) = f(x_i)$  for a previous  $x_i$ . Then

$$z = x_j \oplus x_i$$

- At any previous stage, if this procedure has picked  $m$  different values of  $x$ , then one concludes that  $z \neq x_j \oplus x_i$  for all such values.
- Thus, at most

$$\frac{1}{2}m(m-1)$$

possible values for  $z$  have been discarded (vs  $2^n - 1$  possible values for  $z$ ).

- The procedure is unlike to succeed until  $m$  becomes of the order of  $2^{n/2}$  — the execution time grows exponentially with the number of bits  $n$ .

## Simon's algorithm, going quantum

- Transform the state of the input register into the uniformly weighted superposition of all possible inputs by the application of the usual recipe ( $H^{\otimes n}$ );
- Apply  $U_f$  obtaining

$$\frac{1}{2^{n/2}} \sum_{0 \leq x \leq 2^n - 1} |x\rangle |f(x)\rangle$$

- Measure the output register. Since  $f$  appears in two terms in the expression above that have the same amplitudes, by the generalized Born rule, the input register will be left in the state

$$\frac{1}{\sqrt{2}} (|x_0\rangle + |x_0 \oplus z\rangle)$$

for that value of  $x_0$  for which  $f(x_0)$  agrees with the random value of  $f$  given by the measurement.

## Recall: the generalized Born rule

... applies on measuring a single one of  $n + 1$  qubits.

The joint state can be taken as

$$|\Psi\rangle = \alpha_0|0\rangle|\phi_0\rangle_n + \alpha_1|1\rangle|\phi_1\rangle_n$$

with  $|\alpha_0|^2 + |\alpha_1|^2 = 1$ , following from the general fom

$$|\Psi\rangle_{n+1} = \sum_{x=0}^{2^{n+1}-1} \gamma(x)|x\rangle_{n+1}$$

## Recall: the generalized Born rule

Thus,

$$|\Psi_0\rangle_n = \frac{1}{\alpha_0} \sum_{x=0}^{2^n-1} \gamma(x)|x\rangle_n \quad |\Psi_1\rangle_n = \frac{1}{\alpha_1} \sum_{x=0}^{2^n-1} \gamma(2^n + x)|x\rangle_n$$

$$\alpha_0^2 = \sum_{x=0}^{2^n-1} |\gamma(x)|^2 \quad \alpha_1^2 = \sum_{x=0}^{2^n-1} |\gamma(2^n + x)|^2$$

i.e., if one measures only the single qubit whose state symbol is explicitly separated out from the others in  $n + 1$  qubits state, then this single measurement gate will indicate  $x$  (0 or 1) with probability  $|\alpha_x|^2$ , after which the  $n + 1$  qubits state can be taken to be the product state

$$|x\rangle|\Psi_x\rangle_n$$

## Simon's algorithm, going quantum

- A superposition of two computational-basis states, associated with two  $n$ -bit integers, that differ by  $z$  was computed. But we are not able to know those two integers ...
- ... it also does not help to run the algorithm many times, which is likely to get states of a similar form for different random values of  $x_0$ ...
- A direct measurement will just produce a random number (cf  $x_0$  or  $x_0 \oplus z$ ): however the number  $z$  one is interested in **appears only in the relation between those two random numbers, only one of which one can learn.**

## Simon's algorithm, going quantum

How to extract this relation (i.e. number  $z$ )?

Recall  $H^{\otimes n}|x\rangle_n$ , from the Bernstein-Vazirani algorithm. Thus,

$$\begin{aligned} H^{\otimes n} \frac{1}{\sqrt{2}} (|x_0\rangle + |x_0 \oplus z\rangle) &= \frac{1}{2^{(n+1)/2}} \sum_{y=0}^{2^n-1} ((-1)^{x_0 \cdot y} + (-1)^{(x_0 \oplus z) \cdot y}) |y\rangle \\ &= \frac{1}{2^{(n-1)/2}} \sum_{z \cdot y = 0} (-1)^{(x_0 \oplus y) \cdot y} |y\rangle \end{aligned}$$

because, since  $(-1)^{(x_0 \oplus z) \cdot y} = (-1)^{x_0 \cdot y} = (-1)^{z \cdot y}$ , the coefficient of  $|y\rangle$  above becomes:

$$\begin{cases} 0 & \Leftarrow z \cdot y = 1 \\ 2(-1)^{x_0 \cdot y} & \Leftarrow z \cdot y = 0 \end{cases}$$

## Simon's algorithm, going quantum

How to extract this relation (i.e. number  $z$ )?

The sum in the **red** expression

$$\begin{aligned} H^{\otimes n} \frac{1}{\sqrt{2}} (|x_0\rangle + |x_0 \oplus z\rangle) &= \frac{1}{2^{(n+1)/2}} \sum_{y=0}^{2^n-1} ((-1)^{x_0 \cdot y} + (-1)^{(x_0 \oplus z) \cdot y}) |y\rangle \\ &= \frac{1}{2^{(n-1)/2}} \sum_{z \cdot y = 0} (-1)^{(x_0 \oplus y) \cdot y} |y\rangle \end{aligned}$$

is restricted to those  $y$  for which  $z \cdot y = 0$ .

Thus, measuring the input register, yields, with equal probability, any of the values of  $y$  for which  $z \cdot y = 0$ , i.e. for which

$$\sum_{i=0}^{n-1} y_i z_i = 0 \pmod{2}$$



# Simon's algorithm, going quantum

## Are we done?

Each invocation of  $U_f$  yields a random  $y$  satisfying  $z \cdot y = 0$ , which allows one to determine  $z$  with high probability with **not many more than  $n$  iterations**.

# Simon's algorithm, going quantum

## Are we done?

- A single invocation of  $U_f$  gives one such  $y$  and thus a nontrivial subset of the  $n$  bits of  $z$  whose modulo-2 sum vanishes.
- One of those bits is entirely determined by the others in the subset, which cuts the number of possible choices for  $z$  in half: from  $2^n - 1$  to  $2^{n-1} - 1$  (the  $-1$  comes from assumption  $z \neq 0$ ).
- This assertion above is probabilistic: there is a very small probability,  $\frac{1}{2^{n-1}}$ , that  $y = 0 \dots$
- Repeating the process there is a very high probability the getting a new value  $y$ , different from 0 and the ones already found, therefore yielding a new nontrivial relation among the bits of  $z$  which reduces again the number of candidates by a factor of 2.

## Simon's algorithm, going quantum

It can be shown that with  $n + d$  iterations, the probability of acquiring enough information to determine  $z$  is given by

$$\left(1 - \frac{1}{2^{n+d}}\right) \left(1 - \frac{1}{2^{n+d-1}}\right) \cdots \left(1 - \frac{1}{2^{d+2}}\right) < 1 - \frac{1}{2^{d+1}}$$

### Conclusion

With a **relatively small**  $d$ , period  $z$  is found with **very high probability**, no matter how large  $n$  may be.

## Going further: Shor and beyond

The essence of Simon's algorithm, common to many other quantum algorithms resides in combining

- Playing with **interference** and **superposition** to acquire fundamental information to solve the problem,
- with **specific mathematical arguments** to confirm that the output of the quantum procedure does indeed provide the needed information and to fix the (probabilistically relevant) number of iterations.

# Going further: Shor and beyond

## Shor algorithm (1994)

Factoring

$$N = p \cdot q$$

for  $p, q$  very big primes, is closely tied to the ability to find the period of

$$n^x \bmod N$$

for integers  $n$  that do not share factors with  $N$ .

Combines [efficient period-finding](#) quantum procedures with non trivial results in [number theory](#).

(cf details on [Assis Azevedo talk on Q-Days](#))

## Going further: Shor and beyond

- Very **hard** problem: dealing with functions on the integers whose values within a period are virtually random from one integer to the next, and therefore give no hint of the value of the period itself.
- **Major** speed-up (scales slightly above  $n^3$ , if  $n$  is the number of bits in the binary representation of the period).
- **Huge** impact  
(cf **JMValena talk on Q-Days** on post-quantum crypto).

# Which problems a Quantum Computer can solve?

## No magic ...

- One can **store** and **manipulate** a huge amount of information in the states of a relatively small number of qubits,
- ... but **measurement** will pick up just **one** of the computed solutions and **collapse** the whole (quantum) state

## ... but engineering:

As amplitudes **interfere**, a suitably engineered algorithm will ensure that computational paths leading to a wrong answer would **cancel out**, and the ones leading to a correct answer would **reinforce**, thus boosting the probability of finding them when the state is measured at the end.

# Complexity classes

## P

Problems that can be solved efficiently, in polynomial time.

**Example:** *Given a road map showing  $n$  towns, can you get from any town to every other town?*

## NP

Problems whose solutions, once found, can be recognized as correct in polynomial time — even though the solution itself might be hard to find.

**Example:** *Given a map with thousands of islands and bridges, find a tour that visits each island once*

## NP complete

Problems that if an efficient solution to one of them existed, it would provide an efficient solution to all NP problems.

**Example:** *Given a map, can you color it using only three colours so that no neighboring countries are the same colour?*

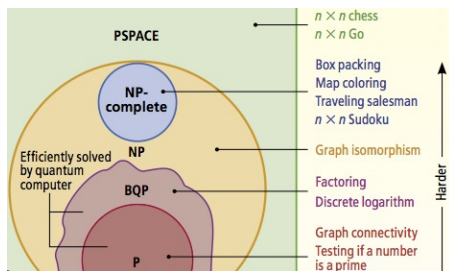


# The BQP class

**Bounded-error Quantum Polynomial time:** contains all the decision problems that quantum computers can solve efficiently.

$$P \subseteq BQP$$

Quantum computers can solve all the problems that classical computers can solve (Bernstein and Vazirani, 1993).

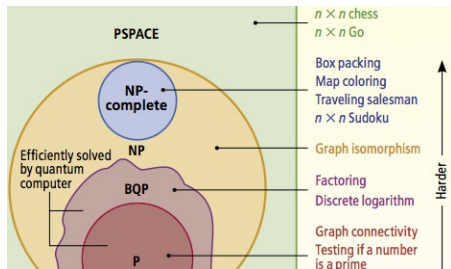


# The BQP class

BQP cannot extend outside PSPACE, which also contains all the NP problems.

## PSPACE

PSPACE problems are those that a conventional computer can solve using only a polynomial amount of memory but possibly requiring an exponential number of steps.



# Which problems a Quantum Computer can solve?

- 1994: **Peter Shor's factorization algorithm** (exponential speed-up),
- 1996: **Grover's unstructured search** (modest, quadratic speed-up, most relevant in practice),
- 2018: Advances in **hash collision search**, i.e finding two items identical in a long list — serious threat to the basic building blocks of secure electronic commerce.
- 2019: **Announced first BQP algorithm with no classical solution** (based on oracle estimation)
- ...
- ... but no quantum algorithm is known to solve a **NP-complete problem**.

An efficient algorithm for an NP-complete problem would mean **NP = P**.

## What we (think we) know?

- A quantum algorithm capable of solving NP-complete problems efficiently would, similarly to what happens in Simon's or Shor's algorithms, have to **resort and exploit the problems' structure**,
- Achieve an exponential speedup by treating the problems as **structureless black boxes**, consisting of an exponential number of solutions to be tested in parallel, is an **illusion**.
- Recently research has shown that **modest, but often relevant speedups** are the limit for many problems such as searching a list, counting ballots in an election, finding the shortest route on a map, and playing games of strategy such as chess or Go.
- If quantum computers ever become a reality, the killer app for them will be on **simulating quantum physics** — key for chemistry, nanotechnology, etc.