

A-III

③ - Period finding pb and Shor's factoring algorithm

* factoring pb :

Given a positive composite integer N ,
what prime numbers, when multiplied
together are equal to it ?

here : $N = p q$

Best randomized classical algo :

$$O(\exp(c \cdot n^{1/3} (\log n)^{2/3}))$$

where n = length of the bit string
representing N .

Shor's quantum algorithm (1994) :

$$O(n^2 \log n \log \log n) = \Theta(n^2)$$

\Rightarrow in principle, a QC can factor numbers
exponentially faster than classical computer.

→ Why is Shor's factoring algo so imp't?

* first example of a pb $\in \text{BFS}$, while believed not to be in BPP -

* anticipated implications for cryptography.
(\Rightarrow could impact computer security, privacy ---)



Aside : Public key cryptography and the RSA (Rivest - Shamir - Adleman) system.

Cryptography = art of enabling two parties to communicate privately.

(e.g. credit card payment)

To achieve privacy a "cryptosystem" is used.

An effective cryptosystem should make it easy for the 2 parties to communicate but should make it hard for a third party to "eavesdrop" -

ex: public key crypto systems

the idea is to avoid the exchange of secret key which could be intercepted and copied.

instead there is a public key accessible by anyone wants to send a msg to the receiver.
(This public key is used to encrypt the msg)

and a private key needed to decrypt the msg, which is possessed by receiver only.

most widely used public key cryptosyst is the RSA system, based on the (apparent) difficulty of factoring on a classical computer.

Ex : Suppose Alice & Bob want to communicate privately. In particular Alice wants to send a message to Bob.
Here is the procedure:

- 1) Bob selects two large prime numbers p & q and computes the product $N = pq$. (usually 1024 bits)
- 2) Bob computes the Euler function
$$\begin{aligned}\varphi(N) &= N - p - q + 1 \\ &= (p-1)(q-1)\end{aligned}$$

which is easy to compute if p, q are known, but hard otherwise.

($\varphi(N)$ = number of numbers $\leq N$
that are coprime with N)

- 3) Bob chooses randomly $e < \varphi(N)$
such that e is coprime with $\varphi(N)$

$$\hookrightarrow \text{GCD}(e, \varphi(N)) = 1$$

- 4) Bob computes

$$d = e^{-1} \pmod{\varphi(N)}$$

(which can be done efficiently (Euclidean algo) if $\varphi(N)$ is known - hard otherwise)

- 5) Bob announces the public key = { N, e }
and retains the private key = d

- 6) Now Alice wants to send a message
 M (number $M \leq N$)

She encrypts it using the public key

$$M \mapsto b = f(M) = M^e \pmod{N}$$

(can be done efficiently with repeated squaring)

7) Bob decrypts it by :

$$\begin{aligned} b &\mapsto b^d \pmod{N} \\ &= M^{ed} \pmod{N} \\ ed &= 1 \pmod{\varphi(N)} \quad \leftarrow = M \cdot (M^{\varphi(N)})^{\text{integer}} \pmod{N} \\ M^{\varphi(N)} &= 1 \pmod{N} \quad \leftarrow = M \pmod{N} \\ (\text{Euler thm}) \end{aligned}$$

Now if another party ("Eve") can factor N
i.e. if Eve can determine p, q from N

\Rightarrow Eve can then efficiently determine
 $\varphi(N)$ and $d = e^{-1} \pmod{\varphi(N)}$

\Rightarrow thus if Eve intercepts the message
 b , she can break RSA and decrypt b .

\Rightarrow the RSA system is based on
the fact that factoring is hard to do
on a classical computer.

and the Shor's (quantum) factoring algo
could threaten the foundation of computer
security -

Probably still a long time before this happens.

At the moment Shor's algo was used

to factor the number 15 (in 2001)

and 21 (in 2012)

and the number 35 recently. Recent status can be found in: Willsch et al, arXiv:2410.14397 (2024)

But at some point will have to develop quantum cryptographic syst which would be safe against quantum attacks.



- * Formulation of factoring as a period-finding (or "order-finding") pb :

We want to find the factors p, q of the composite number $N > 1$.

(note: N should be odd, not prime, not prime power)

(1) We randomly choose an integer

$a \in \{2, \dots, N-1\}$ which is coprime to N .

means that

$$\text{GCD}(a, N) = 1$$

"

greatest common divisor
(largest positive integer that divides both a and N)

(if $\text{GCD}(a, n) = c \neq 1 \Rightarrow N = c \times \text{integer}$
and we have solved the pb)

(2) Consider the fact $f_{n,a}(x) = a^x \pmod{N}$
with $x = 0, 1, 2 \dots$

This fact is a sequence :

$$a^0 \pmod{N}, a^1 \pmod{N}, a^2 \pmod{N} \dots$$

||
|

and this sequence will cycle after a while:

(this is because the numbers $a < N$ coprime with N form a finite group under multiplication $\pmod{N} \rightarrow \mathbb{Z}_N^*$)

$\exists 0 < r \leq N$ such that

$$a^r \equiv 1 \pmod{N}$$

r is the period of the fact $f_{n,a}(x)$
(aka the order of the element a
of the multiplicative group \mathbb{Z}_N^*)

r is the smallest \downarrow integer that satisfies
 $a^r \equiv 1 \pmod{N}$.

\rightarrow find r .

(3) if r is even :

$$\text{define } X \equiv a^{r/2} \pmod{N}$$

N divides $(X+1)(X-1)$

$$a^r \equiv 1 \pmod{N}$$

$$\Leftrightarrow \underbrace{(a^{r/2})^2}_{X^2} \equiv 1 \pmod{N}$$

$$\Leftrightarrow (X+1)(X-1) \equiv 0 \pmod{N}$$

$$\Leftrightarrow (X+1)(X-1) = \text{integer} \times N.$$

We know that N does not divide $(X-1)$

if it did we would have $X-1 \equiv 0 \pmod{N}$

$$\begin{aligned} X &\equiv 1 \pmod{N} \\ &\\ a^{r/2} &\end{aligned}$$

i.e. the period (order of a) would be $r/2$ (at most).

and we suppose that N also does not divide $(X+1)$. ($X \not\equiv -1 \pmod{N}$)

In that case N must have a non trivial factor common with $(X+1)$ and a non trivial factor common with $(X-1)$.

$\Rightarrow p$ and/or q will be contained in $\{ \text{GCD}(X+1, N); \text{GCD}(X-1, N) \}$

\Rightarrow The overall protocol for factoring N into two prime numbers $N = pq$ is:

(1) pick $a < N$, coprime with N

(2) find the order r of a

(aka the period of $f_{a,N}(x) = a^x \pmod{N}$)

(3) if r is even

$$x \equiv a^{r/2} \pmod{N}$$

if $x+1 \not\equiv 0 \pmod{N}$

\Rightarrow compute $p, q = \text{GCD}(x \pm 1, N)$

else : try another a .

Note: finding the GCD of 2 integers x, y ($x > y$) is easy, using $\text{GCD}(x, y) = \text{GCD}(x - y, y)$ or $\text{GCD}(x, y) = \text{GCD}(x \bmod y, y)$ (Euclidean algo.)

Example : factorization of $N=15$

(1) pick $a = 13$

(2) find the period of the sequence

13^0	13^1	13^2	13^3	13^4	13^5	...
"	"	"	"	"	"	
1	13	169	2197	28561		
		"	"	"	"	
		$4 \pmod{15}$	$7 \pmod{15}$	<u>$1 \pmod{15}$</u>		

$$\Rightarrow \underline{\underline{r = 4}}$$

$$(3) \quad X = a^{\frac{r}{2} \pmod{15}} = 13^2 \pmod{15} \\ = 169 \pmod{15} \\ = 4 \pmod{15}$$

$$GCD(x+1, N) = GCD(5, 15) = 5$$

$$GCD(x-1, N) = GCD(3, 15) = 3.$$

$$\Rightarrow p = 5, q = 3.$$

\Rightarrow Thus the pb of factoring reduces to finding the period r of the function given by the modular exponentiation

$$f_{a,N}(x) = a^x \pmod{N}$$

Note :

In general the period-finding pb is the following -

We are given some fct f

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

such that $f(y) = f(x)$ iff $y = x + j \cdot r$
 $\qquad\qquad\qquad$ j integer
 $\qquad\qquad\qquad$ ie $y = x \pmod{r}$

and the goal is to find the period r .

Classically this is believed to be a hard pb.

Even if one can efficiently compute $f(x)$,
 the period could be exponential in n
 and thus it would take an exponential
 number of queries to find r .

However it can be done efficiently with a quantum circuit using QFT.

In the case where f is the modular exponentiation (factoring pb)

$$f_{a,N}(x) = a^x \pmod{N}$$

we will now see that the quantum circuit is just the circuit for QPE with the unitary operator U chosen such that

$$U_a|x\rangle = |a^x \pmod{N}\rangle$$

where $|x\rangle$ = L-qubit computational state, $L = \log(N)$

Note: the period-finding pb for $f_{a,N}(x) = a^x \pmod{N}$ is called "order-finding pb".

$$\begin{aligned} \text{if the order of } a \text{ is } r \Rightarrow a^r &= 1 \pmod{N} \\ \Rightarrow (U_a)^r |x\rangle &= |a^r x \pmod{N}\rangle \\ &= |x\rangle \\ \Rightarrow (U_a)^r &= I \end{aligned}$$

Thus all eigenvalues of U_a are r -th roots of unity :

$$\lambda_k = e^{2i\pi k/r} \quad k = \{0, 1, \dots, r-1\}$$

The corresponding eigenstates are :

$$|\Psi_k\rangle = \frac{1}{\sqrt{r}} \sum_{j=0}^{r-1} e^{-(2i\pi) k j / r} |a^j \pmod{N}\rangle$$

check:

$$\begin{aligned}
 U_a |\Psi_k\rangle &= \frac{1}{\sqrt{r}} \sum_{j=0}^{r-1} e^{-(2i\pi) k j / r} \underbrace{U_a |a^j \pmod{N}\rangle}_{\text{"}} \\
 &\stackrel{j'=j+1}{=} \frac{1}{\sqrt{r}} \sum_{j'=1}^r e^{-(2i\pi) k (j'-1) / r} |a^{j'} \pmod{N}\rangle \\
 &\stackrel{j'=0}{=} \frac{1}{\sqrt{r}} \sum_{j'=0}^{r-1} e^{-(2i\pi) k j' / r} e^{2\pi i k / r} |a^{j'} \pmod{N}\rangle \\
 &= e^{2\pi i k / r} |\Psi_k\rangle
 \end{aligned}$$

used the fact that the term ($j'=r$) is :

$$e^{-(2i\pi) k (r-1) / r} |a^r \pmod{N}\rangle$$

$$\underbrace{e^{-(2\pi i)k}}_1 e^{+(2\pi i)k/r} |a^{\circ} \pmod{N}\rangle \\
 = \text{term } (j'=0) \quad \begin{aligned}
 &\text{because } a^r \equiv 1 \pmod{N} \\
 &= a^{\circ} \pmod{N}
 \end{aligned}$$

Thus, the Quantum Phase Estimation procedure allows us to obtain $\Theta \approx \frac{k}{r}$, to high accuracy.

Shor's factoring algorithm (continued)

There are two requirements to be able to apply QPE:

1) we must be able to implement efficiently the controlled- U^{2^j} operation, for any integer j .

A priori since 2^j is exponential in j we might think that this cannot be done in polynomial time.

But in fact calculating $a^{2^j} \pmod{N}$ efficiently is possible via the (classical) "repeated squaring method":

$$a^{2^j} \pmod{N} = (a^{2^{j-1}})^2 \pmod{N}$$

since $j = 0, \dots, t-1 \Rightarrow$ we only need t multiplications
to compute all the α^{2^j} and each require
 $\sim (\log N)^2 = L^2$ elementary operations.

we will choose $t = (2L+1) + \log(2 + \frac{1}{2\epsilon})$
(see further why) $\Rightarrow O(L^3)$ operations in total.

2) we must be able to prepare an eigenstate $|\Psi_k\rangle$ of U_a , or at least a superposition of such eigenstates.

$|\Psi_k\rangle$ would require to know $r \rightarrow$ impossible.

But we have:

$$\begin{aligned}
 & \frac{1}{\sqrt{r}} \sum_{k=0}^{r-1} |\Psi_k\rangle \\
 &= \frac{1}{\sqrt{r}} \sum_{k=0}^{r-1} \frac{1}{\sqrt{r}} \sum_{j=0}^{r-1} e^{-(2i\pi)kj/r} |a^j \pmod{N}\rangle \\
 &= \sum_{j=0}^{r-1} \underbrace{\left(\frac{1}{\sqrt{r}} \sum_{k=0}^{r-1} e^{-2i\pi kj/r} \right)}_{S_{j,0}} |a^j \pmod{N}\rangle \\
 &= |\alpha^0 \pmod{N}\rangle = |1\rangle
 \end{aligned}$$

which is trivial to construct.

If we use $t = 2L+1 + \log(2 + \frac{1}{2\epsilon})$

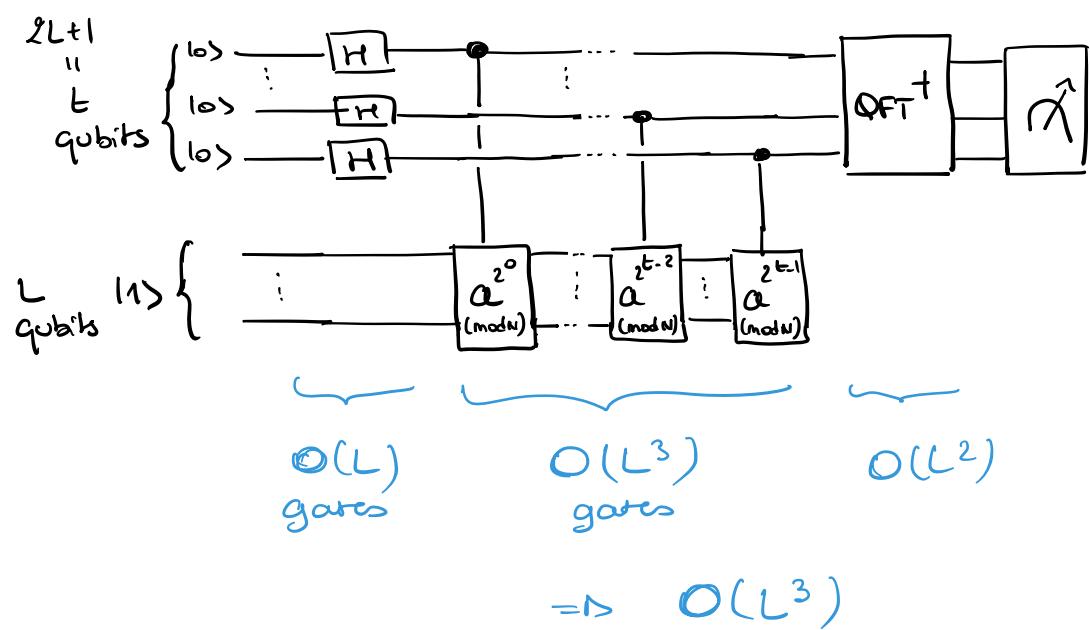
qubits in the top register, and prepare
the bottom register in state $|1\rangle$

\Rightarrow we will obtain an estimate $\hat{\Theta}_k$
of k/r accurate to $2L+1$ bits

with proba at least $\frac{1-\epsilon}{r}$ -

(according to previous lecture).

\Rightarrow Circuit for order finding:



The QPE circuit above provide $\Theta_k \approx k/r$ from which we can obtain the order r with a little bit more work.

Explanations of how it is done can be found in the Nielsen and Chuang -

In brief : There is a theorem stating that

$$\text{if } k/r \text{ is rational and } \left| \frac{k}{r} - \Theta_k \right| \leq \frac{1}{2r^2}$$

then one can find r using the continued fraction algorithm in $O(L^3)$ operat°.

(appendix 4 - Nielsen & Chuang)

$$\text{here we have } \left| \frac{k}{r} - \Theta_k \right| \leq 2^{-2L-1} \leq \frac{1}{2r^2}$$

because $r \leq N \leq 2^L$ - And $\frac{k}{r}$ is a non-rational (ratio of 2 bounded integers) -

\Rightarrow the theorem applies.

The idea of the continued fraction algo
is to describe real numbers in terms of integers
using expressions of the form

$$a_0 + \cfrac{1}{a_1 + \cfrac{1}{a_2 + \cfrac{1}{a_3 + \cfrac{1}{\dots + \cfrac{1}{a_n}}}}}$$

where the a_i 's are positive integers.

The continued fraction expression of a rational
number terminates at some pt.

Note : it might happen that l and r
have a common factor , in which case
the continued fraction algo could return
 r' a multiple of r , instead of r itself.

But there are ways around this issue
(see Nielsen Chuang p 229 - 231)
ensuring proba of success of order 1.