

# CMPT 476 Lecture 19

## Shor's algorithm

(Not actually  
Shor, probably)



Hm I'm Shor.  
This is my  
algorithm.

(Actually I met Shor in an elevator  
once. True story.)

Last class we learned about Simon's algorithm which, while offering an exponential speed-up over any classical (black box) algorithm, was mostly ignored because of the black box model and relatively pointless problem. However, it served as the inspiration for the perhaps most celebrated and famous quantum algorithm — Peter Shor's 1994 algorithm for factorizing integers in polynomial time. Today we start working up to Shor's algorithm, which involves many different pieces. Our first piece is the relationship to Simon's algorithm and the classical reduction of integer factorization to period finding.

### Pieces of Shor

Integer factorization: reducing an integer into its prime components.

Modular  
exponentiation  
oracle

Classical  
reduction to  
period finding

Quantum  
Fourier  
transform

Continued  
fractions

Discrete log  
and  
Abelian HSP

## (Periodic functions)

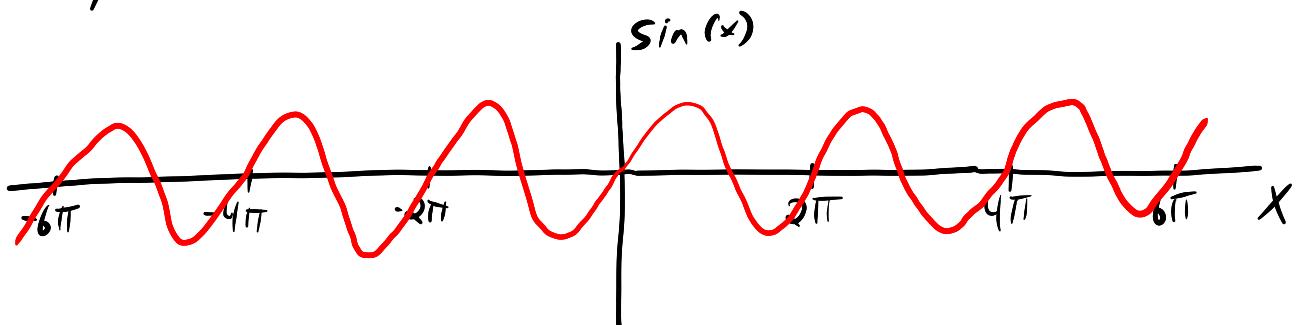
A function  $f: A \rightarrow B$  is periodic if

$$f(x) = f(x+r) \quad \forall x \in A$$

for some  $r \in A$  called the period of  $f$ .

Ex.

A classic periodic function is  $\sin: \mathbb{R} \rightarrow \mathbb{R}$  with period  $2\pi$ . As a function from  $\mathbb{R}$  to  $\mathbb{R}$ , it's easy to visualize the period via a graph:

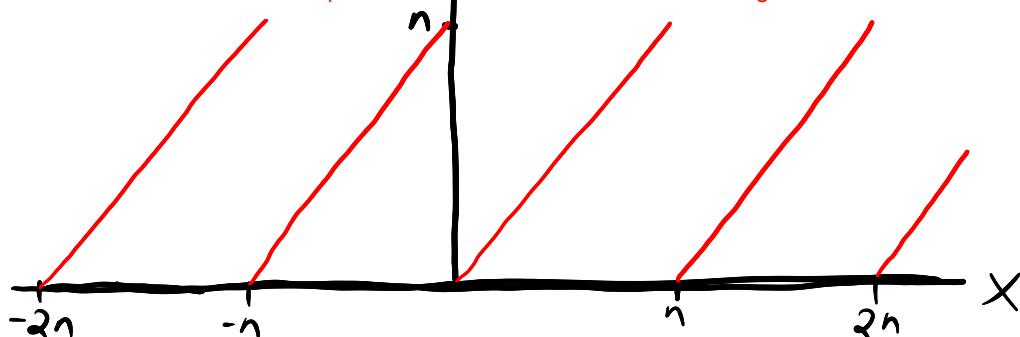


Another periodic function is  $f: \mathbb{R} \rightarrow \mathbb{R}$  where  $f(x) = x \bmod n$

Recall that  $x \equiv y \pmod n$  if  $x = y + kn$  for  $k \in \mathbb{Z}$ . When we say  $f(x) = x \bmod n$ , we mean reduce  $x \bmod n$  to  $y \in [0, n)$

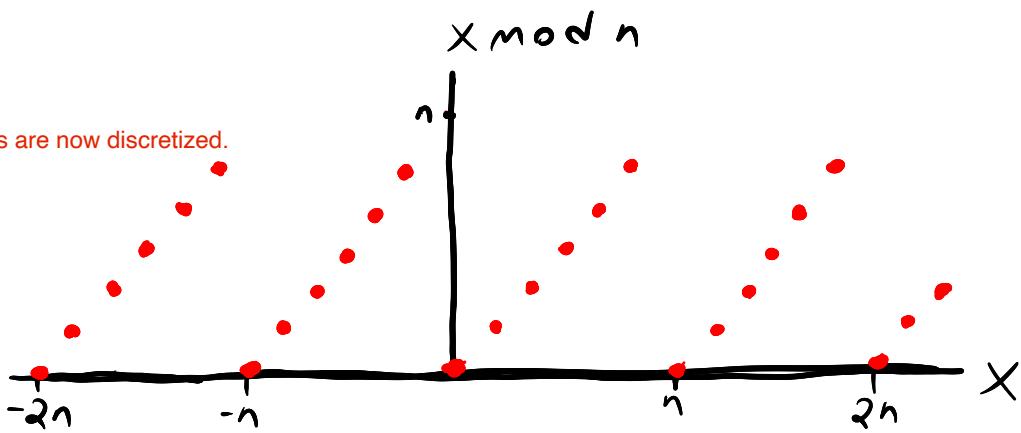
The graph of  $f$  is discontinuous unlike  $\sin$ , but still conveys the intuition of repetition  $x \bmod n$

Simon's algorithm solved the search of the period of the function in a different setting.



If we restrict  $f$  to  $f: \mathbb{Z} \rightarrow \mathbb{Z}$ , we still have a periodic function, but it's less obvious visually

The points are now discretized.



Recall that  $\mathbb{Z}_2 = \{0, 1\}$  are the integers mod 2 and  $x \oplus y = x + y \bmod 2$  for  $x, y \in \mathbb{Z}_2$ . We can also add vectors over  $\mathbb{Z}_2^n = \{0, 1\}^n$  in the obvious way:

$$\begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} \oplus \begin{bmatrix} y_1 \\ y_2 \\ y_3 \end{bmatrix} = \begin{bmatrix} x_1 \oplus y_1 \\ x_2 \oplus y_2 \\ x_3 \oplus y_3 \end{bmatrix}$$

We say that  $(\mathbb{Z}_2^n, \oplus)$  — the set  $\mathbb{Z}_2^n$  equipped with the binary operator  $\oplus: \mathbb{Z}_2^n \times \mathbb{Z}_2^n \rightarrow \mathbb{Z}_2^n$  — is a group because

1.  $\oplus$  is associative —  $a \oplus (b \oplus c) = (a \oplus b) \oplus c$

2.  $0 = \begin{bmatrix} 0 \\ \vdots \\ 0 \end{bmatrix}$  is neutral —  $a \oplus 0 = a = 0 \oplus a$

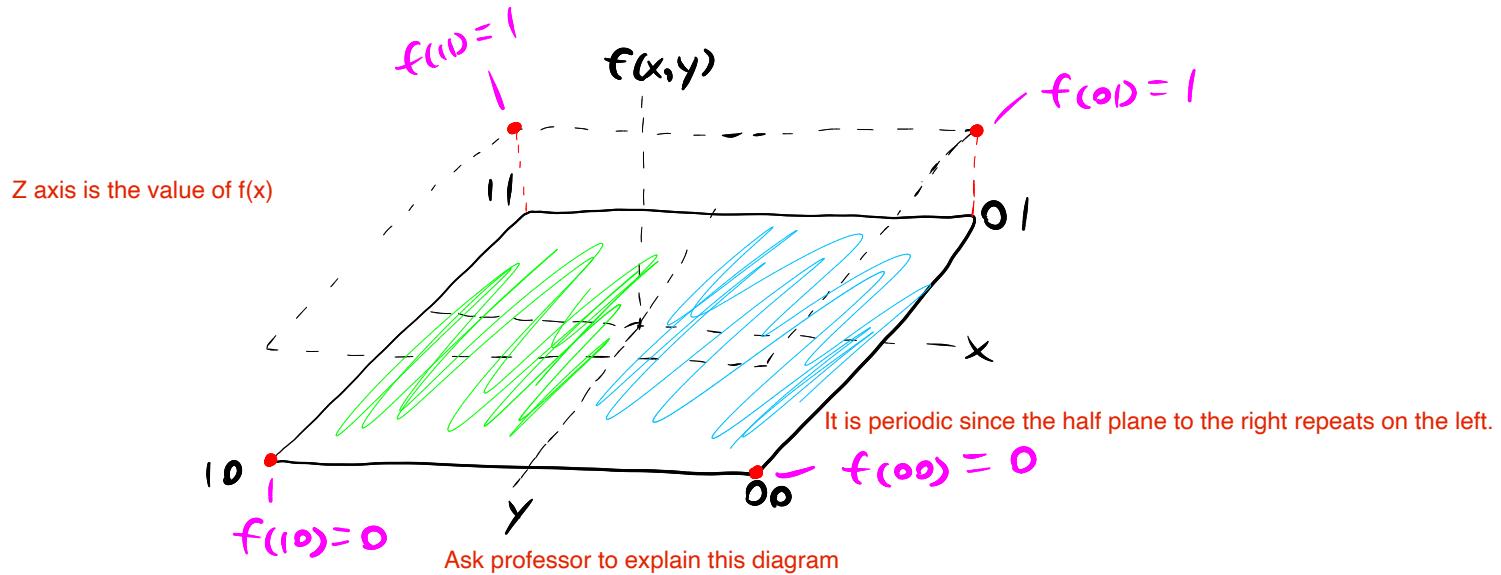
3. Each  $a$  has an inverse  $a^{-1} = a$  —  $a \oplus a^{-1} = 0 = a^{-1} \oplus a$

What is a periodic function on  $\mathbb{Z}_2^n$ ?

$\rightarrow f(x) = f(x \oplus s)$  where  $s \in \mathbb{Z}_2^n$

This should be familiar: Simon's problem was to find  $s$  (the period) given  $f$  as above. So Simon's algorithm can be rephrased as period finding over  $(\mathbb{Z}_2^n, \oplus)$ !

Note that we mostly lose the intuitive visual notion of a periodic function here, except in simple cases like  $f: \{0, 1\}^2 \rightarrow \{0, 1\}$  with period  $s=10$



period  $s=10 \rightarrow$  blue half-plane is repeated in the green half-plane

Simon's algorithm does a fourier transform

Now,  $\oplus$  isn't the only addition we can define on  $\mathbb{Z}_2^n$  — we can also interpret  $a \in \mathbb{Z}_2^n$  as an  $n$ -bit integer  $[a] \in \{0, 1, \dots, 2^n - 1\} = \mathbb{Z}_{2^n}$  and define  $+$  on  $\mathbb{Z}_2^n$  as integer addition mod  $2^n$ !

$$[a+b] = [a] + [b] \bmod 2^n$$

The resulting structure  $(\mathbb{Z}_2^\times, +) \cong (\mathbb{Z}_2^\times, +)$   
 is also a group.

## What is the fourier theory?

## First quantum speedup

Simon's algorithm consisted of two components:

- An oracle for a periodic (on  $(\mathbb{Z}_2^n, \oplus)$ ) function, and
  - The discrete Fourier transform (DFT) on  $(\mathbb{Z}_2^n, \oplus)$

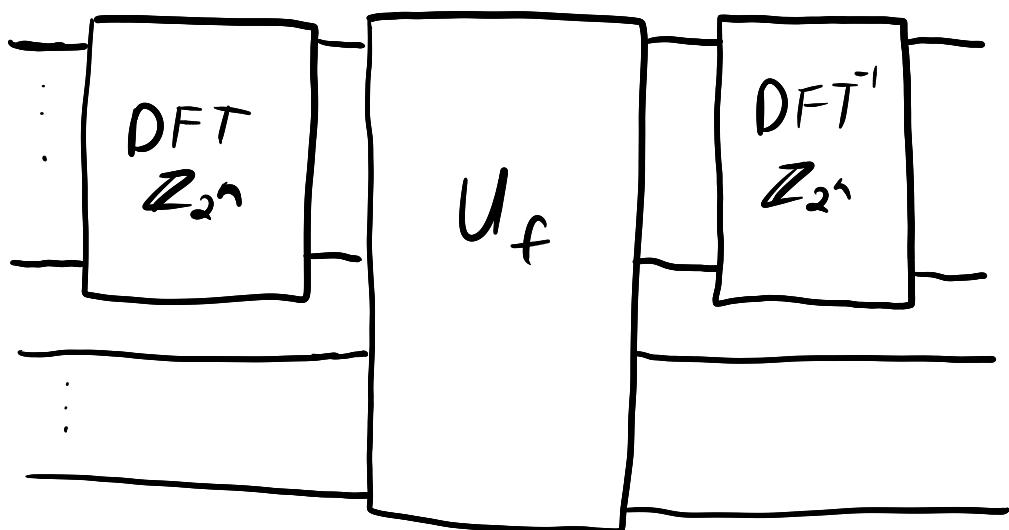
THIS IS THE HADAMARD GATE  $H^{\otimes n}$

## What is an abelian group?

Shor took this idea and asked:

Can quantum computers be used to compute the period of a function  $f: \mathbb{Z}_{2^n} \rightarrow \mathbb{Z}_{2^n}$  (i.e.  $\mathbb{Z}_2^n$  but with integer addition) instead?

The basic idea is to replace the DFT on  $\mathbb{Z}_2$  with the DFT on  $\mathbb{Z}_{2^n}$  and now we get the period of a function  $f: \mathbb{Z}_{2^n} \rightarrow \mathbb{Z}_{2^n}$ !



Easy, right?

First, let's back up and think about why we (or Peter Shor) would want to do such a thing...

### (Integer factorization & RSA)

The internet is built on **secure communication** — you wouldn't want someone else to gain access to your DM's, Amazon purchase history, or CC information. To keep this information **secret**, it's usually **encrypted** so that if a third party gains access, they can't read your **secrets**. **Public key cryptography** allows others to send you secure communications **asymmetrically** by using your **public key** to encrypt the message, which can then only be **decrypted** with your **private key** which you (figuratively) keep under your mattress for safety.



Public key encryption is based on problems which are NP intermediate.

Public key cryptosystems are built around problems which are **easy** to compute, but **hard** to invert, called a **one-way function**. RSA (Rivest, Shamir, Adleman) is one of the most widely used publickey systems, based on the **assumption** that for two large primes  $p, q$ , we can always represent a string as a binary integer.

Computing  $M = p \cdot q$  is **easy**, but **factoring**  $M$  into  $p$  and  $q$  is **hard**. In particular, Alice picks  $p$  &  $q$ , then publishes  $M = p \cdot q$  and  $e \in \mathbb{Z}$  as her public key, keeping  $p, q$ , and  $d \in \mathbb{Z}$  such that

In public, we raise it to  $e$  and take the modulus. A  $\rightarrow A^e \text{ mod } M$  (public,  $e, M$ ). Bob will raise  $A^e \text{ mod } M$  to the power of  $d$ , which is its multiplicative inverse, and obtain  $A \text{ mod } M$ .

$$(A^e)^d \equiv A \text{ mod } M, \quad A \in \mathbb{Z}$$

Bobs private key contains  $d$  and  $M$ .

So this expression lies in the range 0 to  $M - 1$ ?

private. Bob can then send a message  $A \in \mathbb{Z}$  to Alice like so, which requires  $p, q$ , or  $d$  to decrypt.

is hard to compute since  $M$  is hard to break down into its factors.

$$\text{Encrypt: } A \rightarrow A^e \text{ mod } M$$

$$\text{decrypt: } A^e \text{ mod } M \rightarrow (A^e)^d \text{ mod } M = A$$

How do we get  $A$  out of this?

The popular **SSH** protocol uses (among other publickey systems) RSA to establish secure communication — so by breaking RSA I could steal your schoolwork 😊

By the way, **SSH** until recently mostly used crypto based on the **assumed hardness** of computing

**Discrete logarithms** —  $\log_b a$  in some group  $G$  — like Diffie-Hellman, which Shor's algorithm also breaks!

Peter Shor knew a secret (not actually secret):

An efficient algorithm for period finding

(over  $\mathbb{Z}_{2^n}$ ) would allow factorizing integers

1. Shor reduced the integer factorization to period finding over  $\mathbb{Z}$  or  $\mathbb{Z}_{\{2^n\}}$
2. Quantum algorithm for period finding over  $\mathbb{Z}_{\{2^n\}}$
3. The algorithm does a Fourier transform on  $\mathbb{Z}_{\{2^n\}}$
- ii. Modular exponentiation

- 2iii. Use of continued fractions to sample the periods

Before we tackle period finding, let's see how it can help factorize integers and break RSA.

Shor's algorithm does not only give a speedup in terms of query complexity, but in terms of runtime.

## (Integer factorization)

The problem of integer factorization is easy to state with only basic mathematics, but tackling it will require some basic group theory and number theory.

Ask professor about this: the period helps you find the group.

### Integer factorization problem

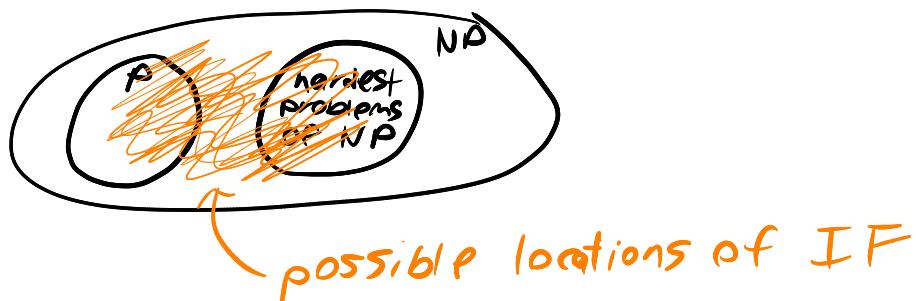
Input: a positive integer  $N$  represented in binary

Goal: Compute the unique prime factorization

$$N = p_1^{r_1} p_2^{r_2} \cdots p_k^{r_k}$$

where each  $p_i$  is prime and  $r_i \in \mathbb{Z}^+$  positive integers

First, what is the classical (including probabilistic) complexity of integer factorization? As of now, it is not known whether IF (integer factorization) is in P or NP-hard. Classically speaking, it is unknown the position of integer factorization.



Let  $n = \log_2 N$  be the number of bits in  $N$ . The current best-known algorithm for IF — the Number field sieve — runs in time  $\approx O(2^{\sqrt[3]{n}})$

So how does period finding relate?

The key lies in Euler's theorem

(Euler's theorem)

Let  $a$  and  $N$  be coprime. Then

$$a^{\varphi(N)} \equiv 1 \pmod{N}$$

This means  $\text{l}(N) = 0$  since that is the only way we can obtain 1?

where  $\varphi(N)$  is the number of numbers in  $[0, N-1]$  coprime to  $N$ .

The period is  $(p-1)(q-1)$ ,  
Ask professor what else the period represents.

Now, given a number  $N$  which we want to factor, the function  
 $a$ , not 0  
modular exponentiation.

$$f(x) = a^x \pmod{N} \quad (x \text{ an integer})$$

is periodic if  $a$  is coprime to  $N$ , since

$$f(x + \varphi(N)) = a^x a^{\varphi(N)} \equiv a^x \pmod{N}$$

so knowing the period  $r$  of  $f$  tells us something about  $N$ ,  
namely that

If  $r$  is even, then multiplying the two expressions below

where other conditions ( $a^{\lfloor r/2 \rfloor} + 1$  and  $a^{\lfloor r/2 \rfloor} - 1$  are not  $k$  or  $n$ ), this means we have found non trivial factors of  $N$ .

After that, you take the GCD of the factors and  $N$ .

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

Now, observe that  $a^r - 1 \equiv 0 \pmod{N}$ , or  $a^r - 1 = kN$ ,  $k \in \mathbb{Z}$

Then  $(\sqrt{a^r} + 1)(\sqrt{a^r} - 1) = kN$  which almost makes progress towards factorizing  $N$ , but we have a few problems:

1. If  $r$  is odd then  $\sqrt{a^r}$  is not an integer
2. If  $\sqrt{a^r} + 1$  or  $\sqrt{a^r} - 1$  is a multiple of  $N$ , we factorized  $k$ , not  $N$  Why?
3. If neither of the above cases hold, then one of  $(\sqrt{a^r} + 1)$  or  $(\sqrt{a^r} - 1)$  is only guaranteed to share a non-trivial factor with  $N$

Let's ignore 1 & 2 for now and focus on 3. Given two integers  $a$  &  $b$  that share a factor i.e.

$$a = MN, \quad b = LN$$

how do we find  $N$ ? That's the greatest common divisor of  $a$  &  $b$ ,  $\text{GCD}(a, b)$ !

### (Euclid's algorithm)

Let  $a > b$  be integers. Then

$$\text{GCD}(a, b) = \text{GCD}(b, r)$$

where  $r$  is the remainder of  $a/b$ , i.e.

$$a = qb + r, \quad \text{where } r < b$$

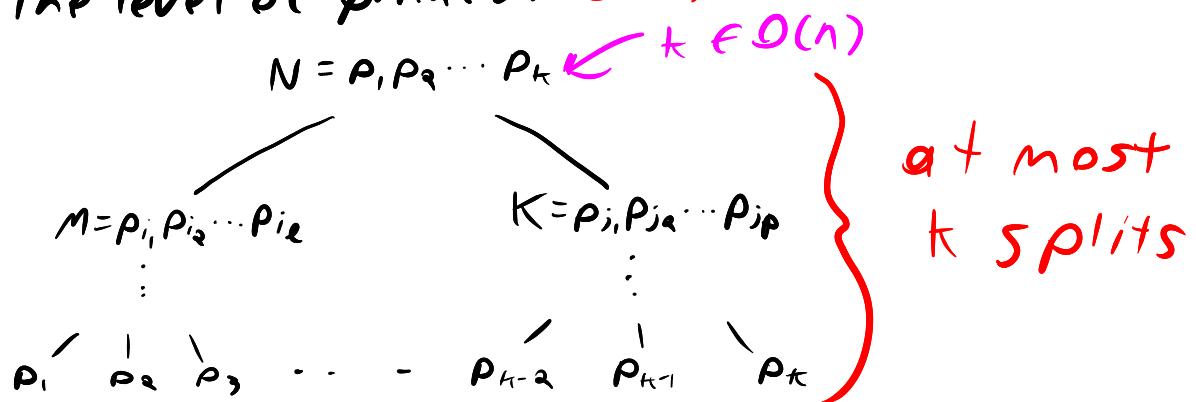
Euclid's algorithm finds the GCD in time  $O(n^2)$  for  $n$ -bit numbers.

Why is the  $O(n^2)$

SD

- (1) If we know some  $a$  which is coprime to  $N$ ,  
(2) and the period  $r$  (or order) of  $a \pmod N$  is even ( $r=2s$ )  
(3) and neither  $a^s + 1$  nor  $a^s - 1$  is a multiple of  $N$ ,  
then we can (in poly-time) Compute a non-trivial factor  $M$  such that  $N = MK$ .

Setting aside the assumptions, if we repeat with  $M$  and  $K$ , how many of these factorizations do we need to get to the level of primes?  $O(n)!$



We've shown that we can factorize in poly-time if our assumptions hold, but they're Big assumptions. For complicated number theory reasons, If  $N$  is

- (4) • odd, and
- (5) • not a prime power, i.e.  $N = p^m$  for prime  $p$ , then for any  $a$  coprime to  $N$ , the probability (2) and (3) are satisfied is at least  $\frac{1}{2}$ .

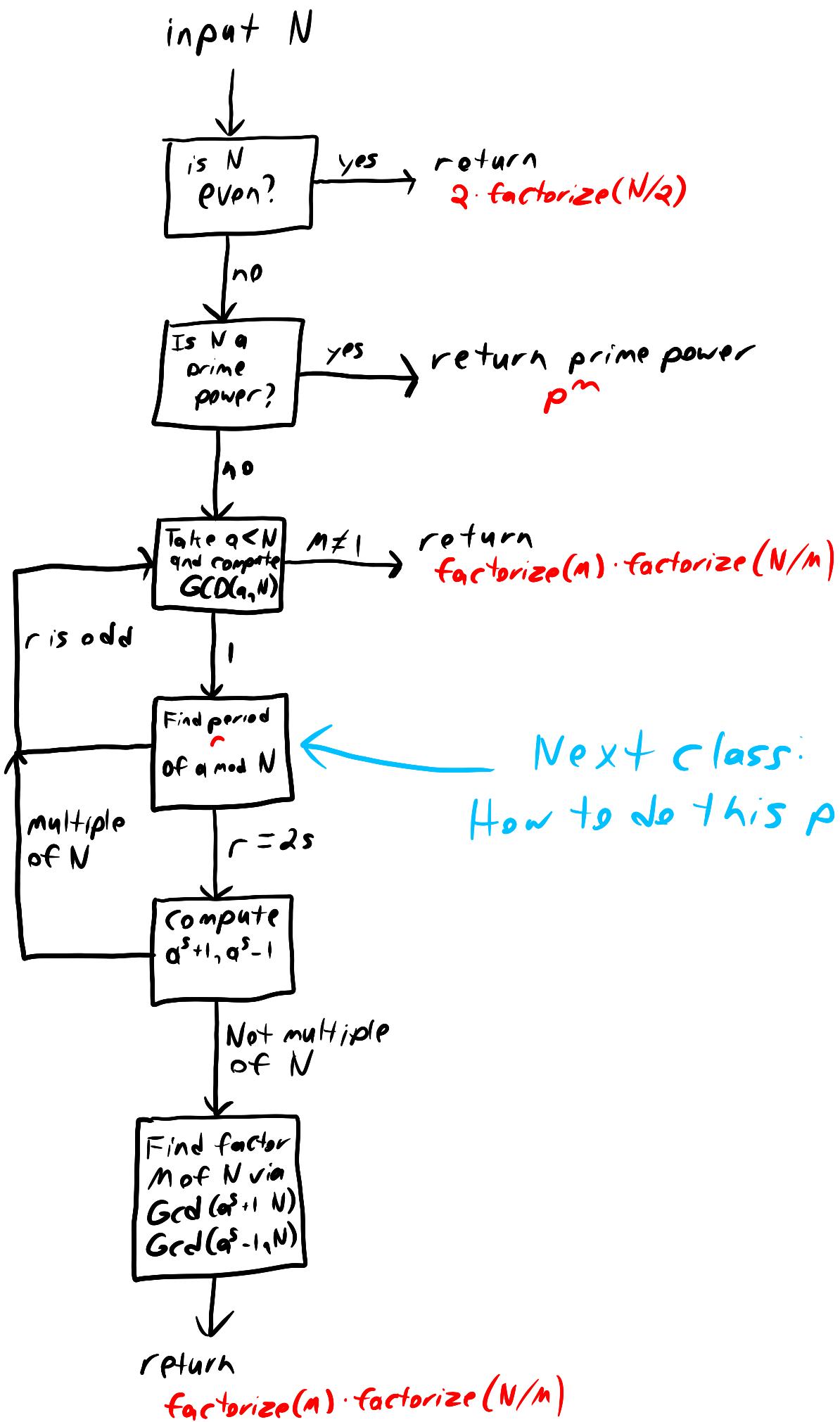
Now to deal with (4), keep dividing  $N$  (at most  $O(n)$  times) by 2 until it's odd. To deal with (5), it suffices to observe that prime powers can be factored in polynomial time (Assignment question).

Our final (non-quantum) piece is to find multiple integers  $a$  coprime with  $N$ . Note that  $a \& N$  are coprime if and only if  $\text{GCD}(a, N) = 1$ . So, an algorithm to find or factor  $N$  is:

— pick a random number  $a \in [0, N-1]$ .  
If  $\text{GCD}(a, N) = 1$ , then return  $a$ ,  
else return  $\text{GCD}(a, N)$  which is a non-trivial factor of  $N$ . —

That was complicated. Let's recap.

# (Classical algorithm reducing IF to period finding)



Modular exponentiation:

$f: \mathbb{Z} \rightarrow \mathbb{Z}$

$f(x) = a^x \bmod m$

If

The hadamard transform is the fourier transform on 0 and 1.

The fourier transfrom on a collection of groups is the product of the fourier transform on each group.