

# Great Ideas in Computing

University of Toronto CSC196  
Fall 2023

Week 10: November 20 - November 24 (2023)

# Week 10 slides

## Announcements:

- Assignment 3 was due today (11 AM; moved to 4PM).
- The second and final quiz will take this place Friday, November 24 during the tutorial class.
- I will comment on the nature of the quiz
- Next Monday, November 27, Kyros Kutalagos, will lead a discussion on computational vision.
- The first three question of Assignment 4 have been posted. I plan one more additional question, on either social networks, or social choice (e.g. fair allocations, voting). A4 is due Friday, December 1 at 9AM.
- The final question for A4 will depend on what topic we do after this week. The two topics I think will be of interest are social networks (in particular, mathematical and computational aspects) and computational social choice. **Is there a preference?**

## This weeks agenda

- Can randomization help?
- Complexity based cryptography

## Can randomization help?

We should note that there are many other fundamental questions in complexity theory (in addition to the  $P$  vs  $NP$  question). One such question is [can randomization help](#).

Consider the following problem: We are *implicitly given* two multivariate polynomials  $p(x_1, \dots, x_n)$  and  $q(x_1, \dots, x_n)$ . For example, the polynomials might be the result of a polynomial time computation using the arithmetic operations  $+$ ,  $-$ ,  $*$ . Or  $p$  and  $q$  might be the determinants of  $n \times n$  matrices with entries that are linear functions of the  $\{x_i\}$ .

The *polynomial equivalence question* whether or not  $p \equiv q$  as polynomials; that is, does  $p(x_1, \dots, x_n) = q(x_1, \dots, x_n)$  for all values of the  $\{x_i\}$ . Lets say that the  $x_i$  are all integers or rationals.

Note that this is the same as asking whether or not  $p - q \equiv \mathbf{0}$  where  $\mathbf{0}$  is the zero polynomial.

How would you solve the *identically zero* question for a univariate polynomial (again given implicitly)?

## Polynomial equivalence problem continued

**Fact:** A non zero univariate polynomial  $p(x)$  of degree  $d$  has at most  $d$  distinct zeros. This means that if we evaluate  $p(x)$  at say  $t > d$  random points  $r_1, \dots, r_t$ , the probability that  $p(r_i) = 0$  is at most  $\frac{d}{t}$ .

Schwartz-Zippel Lemma: This lemma extends the above fact to multivariate polynomials. That is,

If  $p(x_1, \dots, x_n)$  is a non zero polynomial of total degree  $d$  (with coefficients in a ring or field  $F$  like the integers or rationals) then

$\text{Prob}[p(r_1, \dots, r_n) = 0] \leq \frac{d}{|S|}$  when the  $r_i$  are chosen randomly in a finite subset  $S \subseteq F$ .

## Polynomial equivalence and the class $RP$

So to test if  $p$  is identically zero, we take  $|S|$  sufficiently large (or do repeated independent trials with say  $|S| = 2d$ ), and see if the evaluation returns a non-zero value. If  $p(r_1, \dots, r_n) = 0$ , we will claim that  $p \equiv \mathbf{0}$ . The error in this claim will be at most  $\frac{d}{|S|}$  and we will only make an error if  $p \neq \mathbf{0}$ .

This is an example of a polynomial time randomized algorithm with 1-sided error (with say error at most  $\frac{1}{2}$ ) and  $RP$  is the class of languages that have such an algorithm.

In fact the error can be as big as  $1 - \frac{1}{n^k}$  for any fixed  $k$  as we can do polynomially many repeated trials to reduce the error probability using the fact that  $(1 - 1/t)^t \rightarrow \frac{1}{e}$  as  $t \rightarrow \infty$ .

Open question: Is  $RP = P$ ? As a specific example, is the polynomial equivalence problem in  $P$ ?

## *RP and BP*

Surprisingly, some prominent complexity theorists (but not everyone) believe  $P = RP$ . More generally, they believe  $BPP = P$  where  $BPP$  is the class of languages that can be solved by a polynomial time randomized algorithm with 2-sided error (with probability of error at most  $\frac{1}{2} - \frac{1}{n^k}$ ).

Like  $RP$ , we can amplify the probability of a correct answer by running a polynomial number of trials and taking the “majority vote” amongst the outcomes of the individual trials.

A language in  $RP$  can be formulated so that there are many certificates and hence  $RP \subseteq NP$ .

One final comment about the conjecture  $P \neq NP$ . While we strongly believe  $P \neq NP$ , all is not lost if  $P \neq NP$ . For example, for an optimization problem, while it may be  $NP$ -hard to compute an *optimal solution*, for many  $NP$ -hard problems there are efficient *approximately optimal* algorithms. And many natural problems have efficient algorithms when considering restricted classes of (or distributions over) instances that tend to occur naturally.

# Complexity based cryptography and Public key encryption

In our discussion of cryptography, I am relying on CSC2426F graduate course notes by Charles Rackoff. See

<http://www.cs.toronto.edu/~rackoff/2426f20/Cryptonotes.html>

I may also be using web page notes by Paul Johnson. See

<http://pajhome.org.uk/crypt/index.html>

What is *complexity based cryptography*?

We are going to explore a counter-intuitive idea: Namely, the ability to use assumptions about what *cannot* be computed efficiently (i.e., negative results) to establish positive results for applications such as pseudo-random number generators, public key cryptography, digital signatures, secret sharing, and more. These applications all fall under the general topic of complexity based cryptography. Our focus will be on pseudo-random number generators (PRNG) and public key cryptography (PKC).

# Randomization is necessary

Before we begin, we should note that *randomization* is almost always necessary for cryptography. This is not the first time we have encountered the need for randomization.

When have we used randomization before?

For various problems (say within  $NP$ ), it seems that randomization is helpful but so far we do not have any proofs. That is, we do not know if  $RP$  and  $BPP$  are different from  $P$  or  $NP$ . And if say  $RP = P$ , it still might be very helpful (in speeding up the computation or being conceptually simpler).

But there are applications where randomization is necessary



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- Simulating stochastic events
- Hashing

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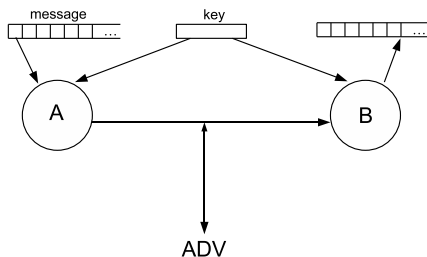
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But there are applications where randomization is necessary

- Simulating stochastic events
- Hashing
- And we can add cryptography to this list

## A secure shared secret key session

In this setting, two people called  $A$  and  $B$  (sometimes referred to as Alice and Bob) have been able to share *secret key* (e.g., a secret string of bits) and will use that secret key to communicate over an insecure channel. This insecure channel can be observed or perhaps even modified by an adversary.



**Figure:** One-way communication. Figure taken from Rackoff notes

**Figure:** One-way communication. Figure taken from Rackoff notes

## Shared-secret key session continued

An important consideration is how powerful is the adversary. To do things reasonably carefully, we would probably need a full graduate course on cryptography. It is difficult enough to develop the main ideas even assuming that the adversary can only eavesdrop so let's make that assumption.

In a one-way session,  $A$  has an  $m$  bit message  $M = M_1 M_2 \dots M_m \in \{0, 1\}^m$ . (For simplicity, we are assuming that the message and the secret key have been represented as a binary strings but this is not essential.) The message is called the *plain text*.

In the shared secret key setting we are assuming the  $A$  and  $B$  have agreed upon a secret key  $n$  bit key  $K = K_1 K_2 \dots K_n \in \{0, 1\}^n$ .

$A$  will encode his message by a function  $ENC : \{0, 1\}^m \times \{0, 1\}^n \rightarrow \{0, 1\}^*$ . Here we are using the  $*$  to suggest that the encoded message length can depend on the plain text message. The encoded message is called *the cypher text*.

## Shared-secret key session continued

$B$  will decode the cypher text by a function

$$DEC : \{0, 1\}^* \times \{0, 1\}^n \rightarrow \{0, 1\}^m.$$

What properties do we want from the exchange?

## Shared-secret key session continued

$B$  will decode the cypher text by a function

$$DEC : \{0, 1\}^* \times \{0, 1\}^n \rightarrow \{0, 1\}^m.$$

What properties do we want from the exchange?

- **Privacy:** The adversary should not learn anything “significant” about the plain text. What does the adversary know in advance about the plain text?
- **Correctness:**  $B$  should be able to correctly decode the message. That is  $DEC(ENC(M, K), K) = M$  for all  $M$  and  $K$ .

We might ask what is *perfectly secure session*? In the Rackoff notes #0, there are three equivalent definitions. Let's just use the first one. For a given plain text message  $M$ , a uniformly random key  $K$  induces a distribution  $D_M$  on the cypher texts. The session is perfectly private if the distribution  $D_M$  does not depend on  $M$ .

Is a perfectly secure session attainable?

# When is a perfectly secure session attainable?

Fact: A Perfectly secure session is attainable if and only if  $|M| \leq |K|$ .

When  $|M| \leq |K|$ , a *one-time pad* provides a one-time (i.e. single use) perfectly secure session. A one-time pad is defined as follows:

$ENC(M, K) = E_1 E_2 \dots E_m$  where  $E_i = M_i \oplus K_i$  for  $1 \leq i \leq m$  and  
 $DEC(E, K) = E_1 \oplus K_1, \dots, E_m \oplus K_m$ .

Note that  $\oplus$ , the exclusive OR, flips a bit.

**Warning:** Never use an old key for a new purpose. For example, we cannot securely send two  $m$  bit messages with the same  $m$  bit key.

So how are we going to continually generate random private keys (or long keys that can be partitioned into session keys) for different people to communicate? We cannot assume people can get together physically and even so how can they generate truly random strings of bits?

## Complexity based assumptions; public key cryptography

The one-time pad does not need any assumptions and an adversary can have unlimited computational power and still cannot gain any information from a one-time pad. But as we noted, a one-time pad is not a very practical solution especially for frequent transactions in e-commerce.

The major application of *public key cryptography* is to enable key exchange. For public key cryptography (and almost all cryptographic applications) we will need complexity assumptions stronger than  $P \neq NP$  (but still these assumptions are widely accepted). To make public key systems practical we will also need some sort of trusted public key infrastructure.

We will just discuss one well known public key system, *RSA*, which is based on the assumption that factoring large integers is hard even in some average sense (rather than worst case sense). This is a much stronger assumption than  $P = NP$  since  $P = NP$  would allow us to factor integers in polynomial time.



## End of Monday, November 20 class

We will continue on Wednesday, defining the setting of public key cryptography and then presenting the RSA public key system.

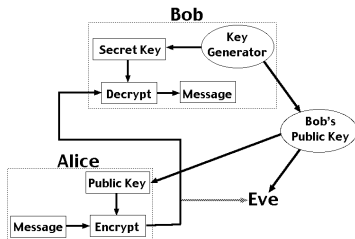
**Note:** I will not be available for office hours today. Please ask any questions on piazza.

**Note:** Double participation marks for anyone who has not been actively participating. So ask questions, make comments, speak up!

# The basic idea of public key encryption

Public key encryption was introduced by Diffie and Hellman, and a particular method (RSA) was created by Rivest, Shamir and Adelman.

The basic idea is that in order for Alice (or anyone) to send Bob a message, Bob is going to create two related keys, a public key allowing Alice to send an encrypted message to Bob, and a private key that allows Bob to decrypt Alice's message.



**Figure:** Diagram of public key encryption. Figure taken from Paul Johnston notes

## The RSA method

Bob wants to generate two keys, a public key  $e, N$  and a private key  $d$ . The claim is that it is hard on average to find  $d$  given  $e$  and  $N$ . Bob chooses  $N = p \cdot q$  for two large primes  $p, q$  (which for defining “on average” may satisfy some constraint).

Bob will choose the public  $e$  such that  $\gcd(e, \phi(N)) = 1$  where  $\phi(N) = \phi(pq) = (p-1)(q-1)$ .  $\phi(N)$  is called the Euler totient function which is equal to the number integers less than  $N$  that are relatively prime to  $N$ .  $\gcd(a, b) = 1$  means that  $a$  and  $b$  are relatively prime (i.e. have no common proper factors).

Alice encodes a message  $M$  by computing  $M^e \bmod N$ .

Hiding some mathematics, BOB can compute a  $d$  such that  $de = 1 \bmod (p-1)(q-1)$  since Bob knows  $p$  and  $q$ . But without knowing  $p, q$ , finding  $d$  becomes computationally difficult.

Hiding some more mathematics, it will follow that  $M^{de} = M \pmod{N}$  for any message  $M$ . That is, Bob decrypts a cypher text  $C$  by the function  $C^d \bmod N$ .

# What mathematical facts do we need to know.

The main mathematical facts are :

- 1 There are sufficiently many prime numbers in any range so one can just randomly try different numbers and test if they are prime.
- 2  $a^{\phi(N)} = 1 \bmod N$  for any  $a$  such that  $\gcd(a, N) = 1$  As a special case,  $a^{p-1} = 1 \bmod p$  for any prime  $p$  and  $a$  not a multiple of  $p$ . So we have  $M^{(p-1)(q-1)} = 1 \bmod N$ .
- 3 If  $\gcd(a, b) = 1$  then there exists  $s$  and  $t$  such that  $sa + tb = 1$ . In the RSA algorithm, we can let  $a = e$  and  $b = (p-1)(q-1)$ . Then  $s$  will become the  $d$  we need for decryption. That is  $de + t(p-1)(q-1) = 1$ .
- 4 It follows then that  $M^{de} = M^{1-t(p-1)(q-1)} = M \cdot M^{-t(p-1)(q-1)} = M \bmod N$ .

## What computational facts do we need to know?

- 1 The extended Euclidean algorithm can efficiently compute an  $s$  and  $t$  such that  $sa + tb = \gcd(a, b)$
- 2  $a^k \bmod N$  can be computed efficiently for any  $a, k, N$ .
- 3 We can efficiently determine if a number  $p$  is prime.

In practice, public keys  $e$  are chosen to be reasonably small so that encryption can be made more efficient.

Note that we have been assuming that an adversary EVE is just eavesdropping) and not changing messages. That is, EVE just wants to learn the message or something about the message. If EVE could change messages then EVE could pretend to be BOB. So one needs some sort of a public key infrastructure or a way to sign a message.

Note that if EVE knows that the message  $M$  was one a few possibilities, then EVE can try each of the possibilities; that is compute  $M^e \bmod N$  for each possible  $M$  to see what message was being sent. So here is where randomness can be used. We can pad or interspers random bits in the plain text  $M$  so that the message being sent becomes some one of many random messages  $M'$ .

## WARNING: Real world cryptography is sophisticated

Complexity based cryptography requires careful consideration of the definitions and what precise assumptions are being made.

Complexity based cryptography has led to many important practical protocols and there are a number of theorems. Fortunately, many complexity assumptions turn out to be equivalent.

In the Rackoff notes, the following theorem is stated as the fundamental theorem of cryptography. (To make this result precise, one needs precise definitions which we are omitting.)

**Theorem:** The following are equivalent:

- It is possible to do “computationally secure sessions”
- There exists pseudo-random generators; that is, create strings that computationally look random)
- There exist one way functions  $f$ ; that is functions such that  $f(x)$  is easy to compute but given  $f(x)$  it is hard to find a  $z$  such that  $f(z) = f(x)$
- There exist computationally secure digital signature schemes.

# The discrete log function

RSA is based on the assume difficulty of factoring. Another assumption that is widely used in cryptography is the discrete log function. Again, we need some facts from number theory. Let  $p$  be a large prime.

- $\mathbb{Z}_p^*$  denotes the set of integers  $\{1, 2, \dots, p-1\}$  under the operations of  $+$ ,  $-$ ,  $\cdot \pmod p$  is a *field*. In particular, for every  $a \in \mathbb{Z}_p^*$ , there exists a  $b \in \mathbb{Z}_p^*$  such that  $a \cdot b = 1$ ; i.e.,  $b = a^{-1} \pmod p$ .
- Moreover,  $\mathbb{Z}_p^*$  is *cyclic*. That is, there exists a  $g \in \mathbb{Z}_p^*$  such that  $\{1, g, g^2, g^3, \dots, g^{p-2}\} \pmod p = \mathbb{Z}_p^*$ . Recall, as a special case of the Euler totient function,  $a^{p-1} = 1 \pmod p$ .

The assumption is that given  $(g, p, g^x \pmod p)$ , it is computationally difficult to find  $x$ . This is another example (factoring can also be an example) of a *one-way function*.

# A pseudo random generator

We started off our discussion of complexity based cryptography by noting that randomness is essential. We have also noted that it is not clear (or at what cost) one can obtain strings that “look like” truly random strings.

A pseudo random generator  $G$  is a *deterministic* function  $G : \{0, 1\}^k \rightarrow \{0, 1\}^\ell$  for  $\ell > k$ . When  $\ell$  is exponential in  $k$ ,  $G$  is called a pseudo random function generator. For now, let's even see how to be able to have  $\ell = k + 1$ .

The random input string  $s \in \{0, 1\}^k$  is called the seed and the goal is that  $r = G(s)$  should be “computationally indistinguishable” from a truly random string in  $t = \{0, 1\}^\ell$ . This means that no polynomial time algorithm can distinguish between  $r$  and  $t$  with probability better than  $\frac{1}{2} + \epsilon$  for any  $\epsilon > 0$ . (Here I am being sloppy about the quantification but hopefully the idea is clear.)



## A pseudo random generator continued

On the previous slide there was a claim that having a pseudo random generator is equivalent to having a one-way function.

How can we use (for example, the assumption that the discrete log function is a one-way function) to construct a pseudo random generator with  $\ell = k + 1$ .

**The Blum-Micali** generator. Assuming the discrete log function is a one-way function then the following is a pseudo random generator:

Let  $x_0$  be a random seed in  $\mathbb{Z}_p^*$  by interpreting  $(s_1, \dots, s_k)_2$  as a binary number mod  $p$ . Let  $x_{k+1} = g^{x_k} \bmod p$ . Define  $s_{k+1} = 1$  if  $x_k \leq \frac{p-1}{2}$ .

Manuel Blum won the Turing award for his contributions to cryptography. Silvio Micali and Shafi Goldwasser won the Turing award for *interactive zero knowledge proofs*.