

Class CS 6903, Lecture n. 4

- Welcome to Lecture 4!
- In Lectures 1-3 we studied:
 - ◆ Classical cryptography, encryption with perfect secrecy
 - ◆ Background on algorithms, complexity theory. Modern cryptography: principles, primitives, and a public-key cryptosystem
 - ◆ Algorithmic number theory, number theory and cryptographic assumptions, reductions, proofs by reductions, number theory candidates for cryptographic primitives and schemes

Summary of Lecture 4

- Randomness and pseudo-randomness
- Pseudo-random generators
- Pseudo-random functions
- Pseudo-random permutations

Randomness

- Can one generate random bits?
- Using sources generated using physical processes; e.g.:
 - ◆ coins, dices
 - ◆ clock drift
 - ◆ quantum processes
 - ◆ computer memory state
- Two main problems:
 - ◆ Bias (e.g.: $\text{prob}[0] = 0.49$)
 - ◆ Correlation (e.g.: 3rd bit = 1st bit)
- Dealing with bias: Von Neumann's pairing trick to remove bias:
 - Draw 2 bits from the source
 - If "00" or "11", ignore
 - If "01", return: "0"
 - If "10", return: "1"
- Dealing with Correlation: Assume source has some type of correlation; process source output using deterministic functions (e.g., inner products) to obtain almost uncorrelated randomness,

In cryptography we assume that there exists a source of random bits with no bias and no correlation, but acknowledge that this source is expensive and thus try to minimize its use

Pseudo-randomness

Expanding short random string (seed) into much longer (pseudo-random) string

Before Modern Cryptography

- Classical notion: string is pseudo-random if it passes certain statistical tests (e.g., frequency, hypothesis testing, etc.)
- Main application: Monte-Carlo simulation
- Ex.1: Linear Congruential generators
 - ◆ Given random $a, b, m, x(0)$, return $x(1), \dots, x(n)$, where $x(i) = a * x(i-1) + b \bmod m$
- Ex.2: Linear Feedback Shift Registers
 - ◆ Given n bits $x(1), \dots, x(n)$, return $x(n+1) = \text{xor}$ of some bits among $x(1), \dots, x(n)$

Modern Cryptography:

- Following principles of modern cryptography
- Two definitional approaches
- 1) String is pseudo-random if it passes all statistical tests against an efficient (poly-time) adversary
- 2) String is pseudo-random if no efficient (poly-time) adversary can predict the next returned bit from previous ones
- Solutions (to generate pseudo-randomness) are based on cryptographic problems, primitives and assumptions about those

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- Randomness and pseudo-randomness
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Computational indistinguishability

- We will use the notion of **indistinguishability** to define pseudo-randomness and security properties of cryptographic primitives and protocols
- How can we say that two entities are indistinguishable? We model that after the Turing Test (for AI)! See <https://www.youtube.com/watch?v=sXx-PpEBR7k>
- Given random variables X, Y , we say that X and Y are **computationally indistinguishable** if for any efficient algorithm A , it holds that the difference $|p(X) - p(Y)|$ is negligible, where
 - ◆ $p(X) = \text{Prob}[x \leftarrow X : A(x) = 1]$
 - ◆ $p(Y) = \text{Prob}[y \leftarrow Y : A(y) = 1]$
- Note:
 - ◆ Random variables \sim distributions
 - ◆ Single – sample computational indistinguishability
- Given random variables X, Y , we say that X and Y are **multiple-sample computationally indistinguishable** if for any efficient algorithm A , for any polynomials a, b , it holds that $|p(X) - p(Y)|$ is negligible, where, for any Z ,
 - ◆ $p(Z) = \text{Prob}[z(1), \dots, z(a(n)) \leftarrow Z : A(z(1), \dots, z(b(n))) = 1]$
- **Theorem:** Two random variables are computationally indistinguishable if and only if they are multiple-sample computationally indistinguishable

Pseudo-random Generators

Generator: stretching function (from $\{0,1\}^n$ to $\{0,1\}^m$, $m \geq n+1$)

Next-bit test

- Informally: A test that tries to predict $(q+1)$ -th bit given the first q ones
- Formally: generator $G:\{0,1\}^n \rightarrow \{0,1\}^m$ passes all **next bit tests** if
 - G is efficiently computable
 - For any efficient A , the probability that $r = r(m)$ is $\leq \frac{1}{2} + \text{negligible}$, where
 - $\text{seed} \leftarrow \{0,1\}^n$;
 - $(r(1), \dots, r(m)) \leftarrow G(\text{seed})$;
 - $r \leftarrow A(r(1), \dots, r(m-1))$

Statistical test

- Informally: A test trying to distinguish random from pseudo-random strings
- Formally: generator $G:\{0,1\}^n \rightarrow \{0,1\}^m$ passes all **statistical tests** if
 - G is efficiently computable
 - Distributions $D(G)$ and $U(m)$ are **computationally indistinguishable**, where
 - $D(G)$ is the distribution over $\{0,1\}^m$ obtained by randomly choosing s in $\{0,1\}^n$ and returning $G(s)$
 - $U(m)$ is uniform distr. over $\{0,1\}^m$
 - (See previous slide for definition of computational indistinguishability)

- **Theorem:** A generator passes all next-bit tests if and only if it passes all statistical tests
- **Note:** both linear congruential generators and linear feedback shift registers do not satisfy any of these two definitions (due to a Gaussian elimination attack)

From Pseudo-randomness to Hardness

- Hardness (of inverting one-way functions)
- Pseudo-randomness (of output of pseudo-random generators)
- **Theorem:** If there exists a pseudo-random generator then there exists a one-way function
- **Sketch of proof:** we define function F using G ; i.e., $F(x)=G(x)$ for all x in $\{0,1\}^n$ (if we prove that F is one-way we are done)
- Assume, towards contradiction, that F is not one-way; i.e., there exists an efficient algorithm A that can invert F with not negligible probability
 - ◆ On input y , A returns x' s.t. $f(x')=y$ with not negligible probability
- By definition of F , A inverts G with not negligible probability
- A can be used to construct a statistical test T that G fails or alternatively, an algorithm B (i.e., the test) that distinguishes whether a string y is random or pseudo-random with not negligible probability
 - ◆ Test: return “random” if $A(y)$ does not return a valid seed or else “pseudo-random”
- This contradicts the fact that G is a pseudo-random generator

From Hardness to Pseudo-randomness

Theorem: If there exists a one-way function then there exists a pseudo-random generator

- Only consider **particular cases** here:
 - ◆ F is a one-way permutations
 - ◆ G only stretches input by 1 bit
- **Note:** in general we want an arbitrary function F and a G that stretches input by a polynomial number of bits
- **Construction** (based on hard-core predicate HC for F):
 - ◆ $G(s) = F(s) \parallel HC(s)$
- **Intuition:**
 - ◆ $F(s)$ is pseudo-random (in fact, random) as s is random and F is a permutation
 - ◆ $HC(s)$ is pseudo-random as it is unpredictable given $F(s)$
- **Proof sketch: (hybrid technique)**

Define 3 distributions, returning:

 - ◆ $G(s) = F(s) \parallel HC(s)$
 - ◆ Hybrid = $F(s) \parallel b$, b random bit
 - ◆ $R = r \parallel b$, r random n -bit string
- If G is not pseudo-random, there exists an efficient algorithm A distinguishing $G(s)$ from R with not negligible probability; then A either does the same for $G(s)$ and Hybrid or for Hybrid and R
- In the first case, it violates HC properties; the second case cannot happen as Hybrid and R are the same

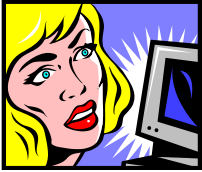
Expanding Pseudo-randomness

Theorem: If there exists a pseudo-random generator $G: \{0,1\}^n \rightarrow \{0,1\}^{n+1}$ then there exists a pseudo-random generator $H: \{0,1\}^n \rightarrow \{0,1\}^m$ for any $m = \text{poly}(n)$

- **Idea:** cascading $m-n$ applications of G , each generating one new pseudo-random bit
- **Construction of H :**
 - ◆ $s(0) = \text{seed}$
 - ◆ For $i=1, \dots, m-n$,
 - ★ $u(i) = G(s(i-1))$
 - ★ Write $u(i)$ as the concatenation of n -bit string $s(i)$ and bit $b(i)$
 - ◆ Return: $(s(m-n) \parallel b(1) \parallel \dots \parallel b(m-n))$
- **Intuition:**
 - ◆ Since seed is random, $s(0)$ is pseudorandom
 - ◆ $s(i)$ pseudo-random \rightarrow so is $s(i+1)$
- **Proof sketch:** Define distributions:
 - ◆ output of H on input random s
 - ◆ $i=1, \dots, m-n$: Hybrid(i) = on input s , return H 's output where first i values $u(i)$ are randomly chosen
 - ◆ m -bit random string R
- H not pseudo-random, \rightarrow there exists efficient algorithm A distinguishing $H(s)$ from R with not negligible probability $\rightarrow A$ must distinguish
 - ◆ $H(s)$ from Hybrid(1),
 - ◆ Hybrid(i) from Hybrid($i+1$) or
 - ◆ Hybrid($m-n$) from R
- In all cases, A violates G 's pseudo-randomness

Using PRGs for Private-Key Encryption

Alice



Private key: k

Sets $c = G(k) \text{ xor } m$



Adversary

c

Bob



Private key: k

Computes: $m' = G(k) \text{ xor } c$

- **One-time pad definition:** $\text{Enc}(k, m) = k \text{ xor } m$, $\text{Dec}(k, c) = k \text{ xor } c$
- **Properties:** perfect secrecy (+), key length = message length (-)
- Using **pseudo-random generator** G :
 - ◆ $\text{Enc}(k, m) = G(k) \text{ xor } m$
 - ◆ $\text{Dec}(k, c) = c \text{ xor } G(k)$
- **Properties:** key length \ll message length (+), computational secrecy (-)
- This “computational secrecy” notion put forward in modern cryptography is a very **acceptable compromise** in practice

Question set 10

- Let $G:\{0,1\}^n \rightarrow \{0,1\}^m$ be a pseudo-random generator. Which distribution is G computationally indistinguishable from?
- Let G be a pseudo-random generator. Is G a one-way function?
- Let F be a one-way function. Is F a pseudo-random generator?
- Fill a 3x3 table whose entries indicate which of the statements
“if there exists A then there exists B ”
is **true** or **unknown** or **false**, where A and B are taken from set
{one-way functions, one-way permutations, pseudo-random generators}

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Pseudo-random functions

Random Functions

- **Definition:** function takes as input x and returns uniformly and independently distributed value $r=r(x)$
- **Note:**
 - ◆ It is a function: when called twice on the same input x , returns the same output
 - ◆ Could be a great tool when randomness is necessary
 - ◆ Does **not** have short description

Pseudo-random functions:

- **Goal:** achieve effect similar to random functions with respect to polynomial time observers
- **Input:** short random key k + additional input x
- **Output:** value y that “looks” pseudo-random (assuming k is random and remains secret)
- Adversary should be allowed to see polynomially many values y 's for different x 's but same, secret k
- PRFs are defined as functions that are “multiple-sample computationally indistinguishable” from a random function by any efficient “oracle adversary”

Pseudo-random Function: definition

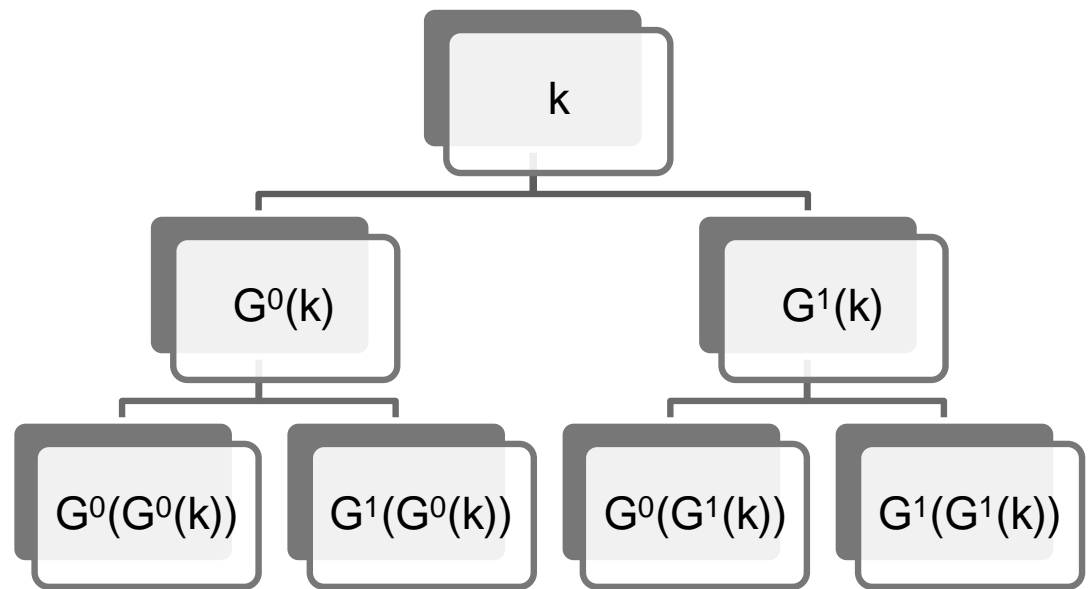
- The adversary attacking PRFs will have access to a function, called **oracle**, $O:\{0,1\}^n \rightarrow \{0,1\}^n$ used as a black-box fashion.
- An efficient algorithm A is an **oracle adversary** if it is given access to oracle O and can repeat the following for polynomially many times:
 - ◆ On input $x(1), y(1), \dots, x(i), y(i)$, compute $x(i+1)$
 - ◆ Call oracle O on input $x(i+1)$
 - ◆ Set $y(i+1)$ be the response obtained from O
- Adversary A given access to oracle O is also denoted A^O
- For any n , let R be the set of all functions $r : \{0,1\}^n \rightarrow \{0,1\}^n$, and let $f : \{0,1\}^n * \{0,1\}^n \rightarrow \{0,1\}^n$ be a function. Consider the following probabilistic experiment INIT:
 - ◆ Uniformly choose r from R
 - ◆ Uniformly choose s from $\{0,1\}^n$ for each n
 - ◆ Set $f=f(s,.)$
- f is a **pseudo-random function** if for any efficient oracle adversary, the difference $|p(\text{real}) - p(\text{rand})|$ is negligible, where
 - ◆ $p(\text{real}) = \text{prob}[\text{INIT}; O \leftarrow f(s,.) : A^O = 1]$
 - ◆ $p(\text{rand}) = \text{prob}[\text{INIT}; O \leftarrow r : A^O = 1]$

PRFs and PRGs: comparisons and theorem

- PRFs more powerful than PRGs:
 - ◆ PRGs return a polynomially long pseudo-random string
 - ◆ PRFs return an exponentially long string with
 - ★ efficient direct access (through input x)
 - ★ pseudo-randomness for each polynomially long substring
- PRGs more efficient and easier to construct than PRFs
- **Theorem:** A pseudo-random function exists if and only if a pseudo-random generator exists
- **Corollary:** A pseudo-random function exists if and only if a one-way function exists
- **Corollary:** Pseudo-random generators and functions exists if
 - ◆ Factoring is hard
 - ◆ The RSA problem is hard
- **PRGs from PRFs, proof sketch:** note that G defined as $G(s) = F(s,0) \parallel F(s,1) \parallel \dots$ is a pseudo-random generator (that is, set any distinct values for the input x until the total output is longer than $|s|$)

PRFs from PRGs

- Extending any generator stretching its seed into a **polynomially-longer** pseudo-random string to a function returning an **exponentially-long** pseudo-random string with efficient direct access (via input x)
- **Construction:** Tree-based applications of $2n$ -bit stretching pseudo-random generator, and left/right choices according to 0/1 value of bits in x
- Let $G:\{0,1\}^n \rightarrow \{0,1\}^{2n}$ be a pseudo-random generator
 - ◆ Let G^0 be function returning **first n bits** returned by G
 - ◆ Let G^1 be function returning **second n bits** returned by G
- Define function $f(s,x) = y$, where
 - ◆ seed s is the key for f ,
 - ◆ $y = (G^{x(n)}(\dots(G^{x(2)}(G^{x(1)}(s)))\dots))$,
 - ◆ $x = x(1), \dots, x(n)$ and each $x(i)$ is a bit



Construction example for x such that $|x|=2$

Every input value x is associated with a path from the root to a unique leaf, whose value is used as the function's output on input x

PRFs from PRGs: proof sketch

- **Intuition:** an appropriate generalization of the proof for the PRG output expansion theorem
- **Define distributions:**
 - ◆ Answer A's queries using output of **function $f(k, \cdot)$**
 - ◆ $i=1, \dots, |x|$: answer A's queries using output of **Hybrid(i)** function, defined as function $f(k, \cdot)$, with the difference that $G^{x(1)}, \dots, G^{x(i)}$ functions are now computed as random functions
 - ◆ Answer A's queries using output of a **single random function R**
- If $f(k, \cdot)$ is not a pseudo-random function, there exists an efficient oracle algorithm A distinguishing $f(k, \cdot)$ from R with not negligible probability; then A must distinguish with not negligible probability at least one of the following:
 - ◆ $f(k, \cdot)$ from Hybrid(1)
 - ◆ Hybrid(i) from Hybrid(i+1) for some i in $\{1, \dots, |x| - 1\}$
 - ◆ Hybrid(n) from R
- In all cases (but last one), it violates G's pseudo-randomness
- Last case is not possible as two functions are identical

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Pseudo-random Permutations

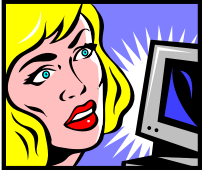
- Defined like pseudo-random functions, with the difference that all functions involved are permutations
 - ◆ A crucial difference in applications like encryption
- **Theorem:** A pseudo-random permutation exists if and only if a pseudo-random function exists
 - ◆ **Note:** similar theorem is not known for one-way functions
- **Corollary:** A pseudo-random permutation exists if and only if a one-way function exists
- **Corollary:** A pseudo-random permutation exists if
 - ◆ factoring is hard, or
 - ◆ the RSA problem is hard

PRPs from PRFs: construction

- **Construction:** 3-round application of Feistel transform
- **Feistel transform:** given a pseudo-random function f , on input (L,R) the transform returns (L',R') , where
 - ◆ $L'=R$ and $R'=L \text{ xor } f(k, R)$
- **3-round Feistel transform:** cascading Feistel transform 3 times; that is, on input $(L(0),R(0))$ returns $(L(3),R(3))$, where
 - ◆ $L(1)=R(0), R(1)=L(0) \text{ xor } f(k, R(0))$
 - ◆ $L(2)=R(1), R(2)=L(1) \text{ xor } f(k, R(1))$
 - ◆ $L(3)=R(2), R(3)=L(2) \text{ xor } f(k, R(2))$
- **Results:**
 - ◆ Feistel transform is a permutation: $R=L'$ and $L= R' \text{ xor } f(k, R)$
 - ◆ 3-round transform is pseudo-random (proof by hybrid argument)
 - ◆ 1-round and 2-round versions are **not** pseudo-random
 - ◆ 4-round version is (super-)pseudo-random, that is, pseudo-random even if adversary A is allowed to query both O and O 's inverse

Applications of PRFs and PRPs to Private-Key Encryption

Alice



Private key: k

Bob



Private key: k



Adversary



$c = (c_1, c_2)$

Sets $c = (r, F(k) \text{ xor } m)$



Computes: $m' = F(k, c_1) \text{ xor } c_2$

- **One-time pad definition:** $\text{Enc}(k, m) = k \text{ xor } m$, $\text{Dec}(k, c) = k \text{ xor } c$
- **Properties:** perfect secrecy (+), key length = message length (-)
- Using **pseudo-random functions** F :
 - ◆ $\text{Enc}(k, m) = (r, F(k, r) \text{ xor } m)$, where r is a random string
 - ◆ $\text{Dec}(k, (c_1, c_2)) = F(k, c_1) \text{ xor } c_2$
- **Properties:** key length \ll message length (+), computational secrecy (-), higher security than pseudo-random generator construction (+)
 - ◆ Ex.: can securely encrypt $m(1)$, $m(2)$ using the same k

Applications and Practical Considerations

- Certain applications (e.g., in finance) do not need **cryptographically secure** PRGs
 - ◆ Linear congruential generators (and various improved ones) are still used
- In cryptography PRGs are useful in any protocol where parties use random bits
 - ◆ Essentially all protocols
- In addition to PRGs based on number-theoretic assumptions, there are other classes of constructions, such as block cipher based and heuristic constructions
 - ◆ The latter ones have less or no provable guarantees but are typically faster
- Many heuristic PRGs have been standardized
 - ◆ See Wikipedia (Cryptographically secure pseudo-random generators → Designs, Standards)
- PRFs and PRPs also have more efficient but heuristically secure constructions (typically based on block ciphers or hash functions, which we will study later)
 - ◆ See, for instance, <http://csrc.nist.gov/publications/nistpubs/800-90A/SP800-90A.pdf>
 - ◆ See also the Mersenne twister at https://en.wikipedia.org/wiki/Mersenne_Twister

Question set 11

- Let $F:\{0,1\}^k \times \{0,1\}^n \rightarrow \{0,1\}^n$ be a pseudo-random function. Which distribution is $(F(k,1), F(k,2), F(k,3), \dots)$ computationally indistinguishable from, for a random k ?
- Let $P:\{0,1\}^k \times \{0,1\}^n \rightarrow \{0,1\}^n$ be a pseudo-random permutation. Which distribution is $(P(k,1), P(k,2), \dots)$ computationally indistinguishable from, for a random k ?
- Let F be a pseudo-random function. Is $F(k, \cdot)$ a one-way function?
- Let P be a pseudo-random permutation. Is $P(k, \cdot)$ a one-way permutation?
- Let F be a one-way function. Is F a pseudo-random function?
- Let P be a one-way permutation. Is P a pseudo-random permutation?
- Fill a 4x4 table whose entries indicate which of the statements
“if there exists A then there exists B ”
is **true** or **unknown** or **false**, where A and B are taken from set {one-way functions, one-way permutations, pseudo-random functions, pseudo-random permutations}

Class CS 6903, End of Lecture n. 4

Reference → Topic ↓	[KL]	[MOV]	[FSK]
Randomness, Pseudo-randomness before cryptography, Turing test	http://en.wikipedia.org/wiki/Random_number_generation http://en.wikipedia.org/wiki/Monte_Carlo_method https://www.youtube.com/watch?v=sXx-PpEBR7k		
		5.1-5.4	9
Pseudo-random generators	3.3, 7.4, 7.8 (1 st edition: 3.3, 6.4, 6.8)	5.5	
Pseudo-random functions	6.5 (1 st edition: 6.5)	2.3	
Pseudo-random permutations	6.6 (1 st edition: 6.6)		
Applications, practical considerations	Lecture Notes, http://en.wikipedia.org/wiki/Cryptographically_secure_pseudorandom_number_generator http://csrc.nist.gov/publications/nistpubs/800-90A/SP800-90A.pdf		