

# Lecture 21

## Secure random number generation

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# Lecture 21— Contents

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# The need for random numbers in security

Good random sources are a most valuable resource in security. They are needed to provide

- ▶ key generation
- ▶ secrets for key agreement
- ▶ nonces in interactive protocols
- ▶ probabilistic mechanisms
- ▶ randomized algorithms
- ▶ ...

## Security of real world RNGs

The ideal counterpart of a real world RNG is (rather obviously) an ideal source of **independent and uniform**  $z_n$

### Secure pseudo RNG

Pseudo RNGs only have access to a finite entropy source (the **seed**) and aim to be **computationally indistinguishable** from the ideal random source

Typically, uniformity is easy; independence is impossible

### True RNG

True RNGs have access to a low entropy rate source of infinite randomness, some also have access to a finite entropy source (the **seed**) and aim to be **unconditionally indistinguishable** from the ideal random source

Typically, independence and uniformity can be obtained at the price of a low rate

Many practical tests exist for checking secure randomness (e.g., the NIST test suite), mainly designed for pseudo RNGs.

## The (insecure) linear congruential pseudo RNG

Let  $N$  be a large integer,  $M$  a small integer, and  $a, c \in \mathbb{Z}_N$  such that  $\gcd(a, N) = 1$

Then, a popular RNG can be constructed as follows

**state**  $s_n \in \mathcal{S} = \mathbb{Z}_N$

**output**  $z_n \in \mathcal{Z} = \mathbb{Z}_M$

**seed** the initial state  $v = s_0$

**equations**

$$\begin{cases} s_{n+1} = (as_n + c) \bmod N & \text{update} \\ z_n = s_n \bmod M & \text{output} \end{cases}$$

Typically,  $M = 2$  is chosen, so  $z_n$  is a single bit

This RNG is not very secure, as each  $z_n$  leaks information about the values of  $a$  and  $c$ .

It's ok for running your own (unbiased) simulations, not for security

# Blum-Blum-Shub RNG

Let  $p, q$  be two primes such that  $p = q = 3 \pmod{4}$ , and let  $N = pq$ .  
Then, a secure RNG can be constructed as follows

**state**  $s_n \in \mathcal{S} = \mathbb{Z}_N$

**output**  $z_n \in \mathcal{Z} = \{0, 1\}$

**seed** the initial state  $v = s_0$

**equations**

$$\begin{cases} s_{n+1} = s_n^2 \bmod N & \text{update} \\ z_n = s_n \bmod 2 & \text{output} \end{cases}$$

# RSA based RNG

Let  $p, q$  be two primes, and let  $N = pq$ , and  $\varphi = (p - 1)(q - 1)$ . Choose any  $e \in \mathbb{Z}_N$  such that  $\gcd(e, \varphi) = 1$

Then, a secure RNG can be constructed as follows

**state**  $s_n \in \mathcal{S} = \mathbb{Z}_N$

**output**  $z_n \in \mathcal{Z} = \{0, 1\}$

**seed** the initial state  $v = s_0$

**equations**

$$\begin{cases} s_{n+1} = s_n^e \bmod N & \text{update} \\ z_n = s_n \bmod 2 & \text{output} \end{cases}$$

## RNGs based on hash functions

Consider any secure cryptographic hash function  $h : \mathcal{M} \mapsto \mathcal{T}$ , with  $\mathcal{M} = \mathbb{Z}_N$ .  
Then, a secure RNG can be constructed as follows

**state**  $s_n \in \mathcal{S} = \mathbb{Z}_N$

**output**  $z_n \in \mathcal{T}$

**seed** the initial state  $v = s_0$

**equations**

$$\begin{cases} s_{n+1} = s_n + 1 & \text{update} \\ z_n = h(s_n) & \text{output} \end{cases}$$



## RNGs based on symmetric encryption

Consider any secure symmetric encryption mechanism  $E : \mathcal{K} \times \mathcal{M} \mapsto \mathcal{X}$ .  
Then, a secure RNG can be constructed as follows

**state**  $s_n \in \mathcal{S} = \mathcal{M} = \mathbb{Z}_N$

**output**  $z_n \in \mathcal{Z} = \mathcal{X}$

**seed** the key and initial state  $v = (k, s_0)$

**equations**

$$\begin{cases} s_{n+1} = s_n + 1 & \text{update} \\ z_n = E(k, s_n) & \text{output} \end{cases}$$

## RNGs based on HMAC

Consider the HMAC scheme tag computation function  $T : \mathcal{K} \times \mathcal{T} \mapsto \mathcal{T}$  where  $\mathcal{T} = \mathcal{A}^\ell$ ,  $\mathcal{K} = \mathcal{A}^\Delta$ , that makes use of a cryptographic hash function  $h : \mathcal{A}^{\ell+\Delta} \mapsto \mathcal{A}^\ell$ , and recall its definition as

$$\text{HMAC} : t = h([k + \beta_2, h[k + \beta_1, u]])$$

with  $\beta_1$  and  $\beta_2$  the input and output pad constants, respectively. Then, a secure RNG can be constructed as follows

**state**  $s_n \in \mathcal{S} = \mathcal{T}$

**output**  $z_n \in \mathcal{Z} = \mathcal{T}$

**seed** the key and initial state  $v = (k, s_0)$

**equations**

$$\begin{cases} s_{n+1} = T(k, s_n) & \text{update} \\ z_n = s_n & \text{output} \end{cases}$$

## Dual elliptic curve deterministic random bit generator

Consider an **elliptic curve**  $\mathcal{E}$  on a finite field  $\mathbb{F} = \mathbb{Z}_p$  with  $p$  prime  
denote by  $\circ$  the point operation on  $\mathcal{E}$

denote by  $c_1(P) \in \mathbb{F}$  the (integer) first coordinate of a point  $P$

Let  $s_n \in \mathbb{F}$  and  $z_n \in \mathcal{Z} = \{0, \dots, 2^r - 1\}$  be the state and the  $r$ -bit output of the RNG

Starting from two specific points  $P, Q \in \mathcal{E}$  the update and output equations are defined via the auxiliary variable  $y_n$  as

$$\begin{cases} y_n = c_1(P \circ^{s_n}) \\ s_{n+1} = c_1(P \circ^{y_n}) \\ z_n = c_1(Q \circ^{y_n}) \bmod 2^r \end{cases}$$

## Dual EC DRBG attack (1/2)

Suppose that **the attacker knows**  $q \in \mathbb{Z}_p$  such that  $Q \circ^q = P$  and that  $2^r \geq p$ , i.e. **no bits are discarded** from  $z_n$ .

Then, the attacker can

1. observe  $z_n$  and find the corresponding point  $R = (z_n, \cdot) \in \mathcal{E}$ .

Then, it must be  $R = Q \circ^{y_n}$

2. compute  $S = R \circ^q$ .

Observe that  $S = Q \circ^{qy_n} = P \circ^{y_n}$

3. extract  $s_{n+1} = c_1(S)$ .

Now the attacker knows the next state of the PRNG and can predict all outputs  $z_m$ ,  
 $\forall m > n$

## Dual EC DRBG attack (2/2)

Now, relax the assumption that no bits are discarded, and let  $I = \lceil p/2^r \rceil$ . Then,  
 $\forall i = 0, \dots, I - 1$

- ▶ let  $v_i = i \cdot 2^r + z_n$ , and find  $R_i = (v_i, \cdot) \in \mathcal{E}$
- ▶ repeat steps 1–3 above, extracting a guess  $\hat{s}_{n+1,i}$
- ▶ compute the corresponding output value  $\hat{z}_{n+1,i}$
- ▶ observe the actual output  $z_{n+1}$  and select the value of  $i$  for which  $\hat{z}_{n+1,i} = z_{n+1}$ . The corresponding  $\hat{s}_{n+1,i}$  is the PRNG state  $s_{n+1}$

The attack is still effective and efficient, provided the number of guesses  $I$  is not too large (i.e., few bits are discarded).

The assumption that the attacker knows  $q$  is necessary, and it is not feasible to compute  $q$  from  $P, Q$  (finite log).

However, the implementer who sets  $P$  and  $Q$  may choose  $Q$  and  $q$  and compute  $P$

## The history of Dual EC DRBG

**2002-03** NSA urges NIST to include Dual EC DRBG in the future standards for secure RNG, providing explicit values for  $\mathcal{E}$ ,  $P$  and  $Q$  and  $I = 2^{16}$ . Did they know  $q$  and compute  $P = Q \circ^q$  ?

**2004** RSA makes Dual EC DRBG the default PRNG in their product BSAFE

**2005** NIST standardizes Dual EC DRBG in *SP 800-90A*. The standard allows users to choose their own  $P$  and  $Q$ , but only implementations with the suggested  $P$  and  $Q$  from NSA can get FIPS validation

**2006-07** Several cryptographers and researchers point out the possible attack, observe that  $I$  is too small, and wonder if NSA inserted a backdoor into the standard on purpose

**2013** NSA documents leaked by Edward Snowden describe a program aimed “to covertly introduce weaknesses into the encryption standards” used worldwide.

**2013** RSA recommends its customers to stop using the Dual EC DRBG

**2014** NIST removes Dual EC DRBG from the new version of the standard

# True random sources

Sources for true randomness must rely on

- ▶ natural random phenomena, such as thermal currents in resistors, flickering in light sensors
- ▶ human activity, such as timing between keystrokes
- ▶ quantum measurements

Typically, the random processes describing these phenomena have memory (correlation, decreasing with time separation) and nonuniform distribution (but typically symmetric)

## Unconditional security

The unconditional security measure for a true RNG that outputs a block  $\mathbf{z} = (z_1, \dots, z_N)$ , is the variational distance between the actual and ideal output distribution

$$d_V(p_{\mathbf{z}}, p_{\mathbf{z}^*}) \leq \sqrt{\frac{1}{2} D(p_{\mathbf{z}} \| p_{\mathbf{z}^*})} \quad , \quad \text{by Pinsker inequality}$$

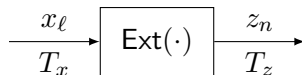
Observe that, since  $\mathbf{z}^* \sim \mathcal{U}(\mathcal{Z}^N)$

$$D(p_{\mathbf{z}} \| p_{\mathbf{z}^*}) = N \log_2 |\mathcal{Z}| - H(\mathbf{z}) = \underbrace{N(\log_2 |\mathcal{Z}| - H(\mathbf{z}))}_{\text{nonuniformity}} + \underbrace{NH(\mathbf{z}) - H(\mathbf{z})}_{\text{dependence}}$$



## Deterministic extractors

Deterministic extractors are transformations mapping long messages with low information efficiency to shorter messages with higher efficiency



Owing to the deterministic mapping it must be

$$\frac{1}{T_z} \log_2 M_z = \frac{H(z)}{T_z} = \frac{H_s(z)}{T_z} = R_z \leq R_x = \frac{H_s(x)}{T_x}$$

An optimal source encoder is a good deterministic randomness extractor.

Designing deterministic extractors requires knowledge of  $p_x$ . Otherwise, if  $p_x$  is only partially known, we must resort to seeded extractors

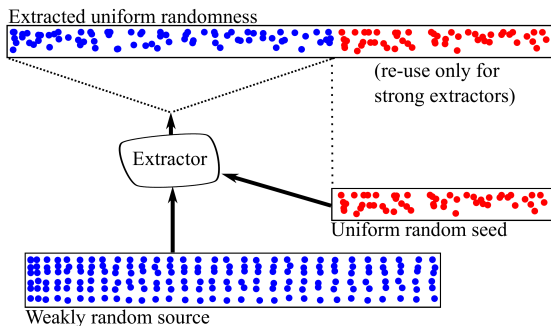
# Seeded extractors

## Definition

A **seeded extractor** is a function  $f : \mathcal{X}^N \times \mathcal{V} \mapsto \mathcal{Z}^M$  such that  $M \log_2 |\mathcal{Z}| \simeq H_{\min}(\mathbf{x})$ , and if  $v \sim \mathcal{U}(\mathcal{V})$ , then  $d_V(p_z, p_{z^*}) \ll 1$

## Definition

A seeded extractor is said to be **strong** if  $z$  is independent of  $v$



## Universal hashing

A seeded extractor can be obtained from an  $\varepsilon$ -almost strongly universal<sub>2</sub> family of hash functions  $T_k : \mathcal{X}^N \mapsto \mathcal{Z}^M$  where the seed is the key  $k$

### Proposition (Leftover hashing lemma)

*If a strongly universal<sub>2</sub> family of hash functions is used with a uniform seed, then*

$$d_V(p_{\mathbf{z}}, p_{\mathbf{z}^*}) \leq \frac{1}{2} \sqrt{|\mathcal{Z}|^M / 2^{H_2(\mathbf{x})}} = 1/2^{(H_2(\mathbf{x}) - M \log_2 |\mathcal{Z}|)/2+1}$$

*where  $H_2(\mathbf{x}) = \log_{1/2} \sum_{\mathbf{a}} p_{\mathbf{x}}(\mathbf{a})^2$  is the collision entropy of the input and  $M \log_2 |\mathcal{Z}|$  is the output nominal information (number of output bits)*

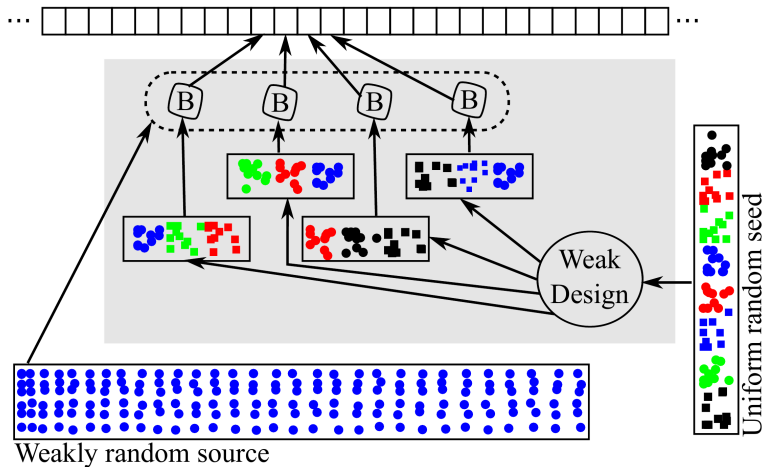
*If an  $\varepsilon$ -almost strongly universal<sub>2</sub> family of hash functions is used, then*

$$d_V(p_{\mathbf{z}}, p_{\mathbf{z}^*}) \leq \frac{1}{2} \sqrt{|\mathcal{Z}|^M} \sqrt{\varepsilon - 1/|\mathcal{Z}|^M + 1/2^{H_2(\mathbf{x})}}$$

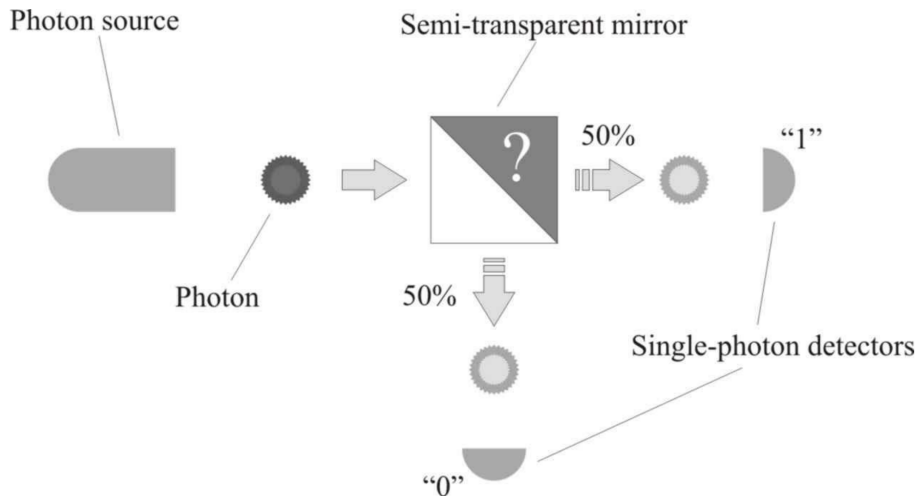
# Trevisan's extractor

- ▶ binary extractor
- ▶ each output bit obtained by combining a different subset of  $t$  seed bits
- ▶ subsets have minimum overlap

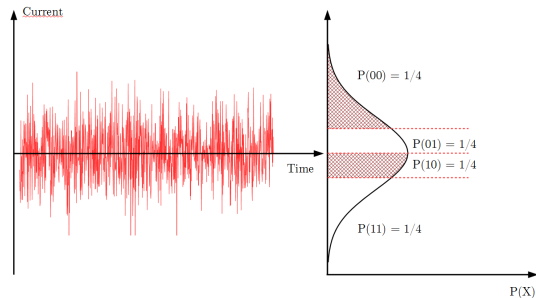
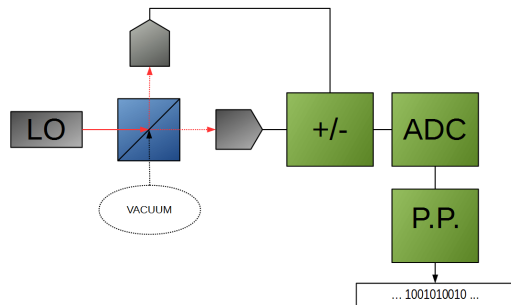
Extracted uniform randomness



## Discrete variable Quantum sources



# Continuous variable Quantum sources



# Summary

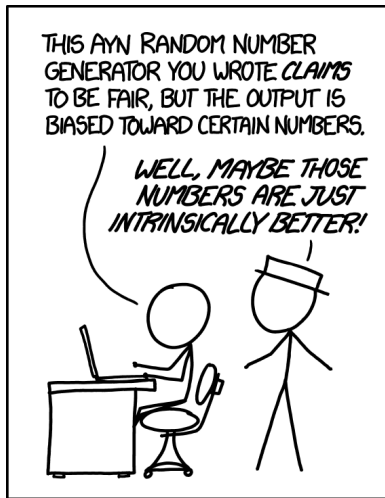
In this lecture we have:

- ▶ introduced the problem of secure randomness generation, distinguishing between pseudo- and true RNG
- ▶ presented several examples of **pseudo-RNG**
- ▶ introduced the unconditional security metric for **true-RNG**
- ▶ described two classes of **randomness extractors**
- ▶ presented the principles behind **quantum RNGs**

## Assignment

- ▶ **class notes**
- ▶ **textbook**, §B.1–B.3

## End of lecture



Ayn Random, reproduced from [xkcd](https://xkcd.com/1277) URL: [xkcd.com/1277](https://xkcd.com/1277)