



# Randomness

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Aggelos Kiayias



# Importance

- Most security related tools and protocols require parties to use “random coins”.
- The security analysis typically assumes that the underlying probability distributions of such sources operate ideally.
- is this a reasonable assumption to make?





# Examples

- In Diffie Hellman key exchange, parties choose random exponents.
- The key to any symmetric cipher such as AES must be selected randomly.
- It is important to include “nonces” into protocols to ensure **liveness**.
- etc.



# Web Attacks

- In most web-services a user can request a “password-reset” operation.
- The new password is mailed to an address the user has.
- This creates the following simple attack : request a password reset and then brute-force login.
- (if rapid-login attempts are allowed and entropy of new password is low this can work).

see Argyros-Kiayias [http://crypto.di.uoa.gr/CRYPTO.SEC/Randomness\\_Attacks.html](http://crypto.di.uoa.gr/CRYPTO.SEC/Randomness_Attacks.html)





# Where to find randomness?

- “Anybody who contemplates arithmetic methods for the generation of random numbers is in a state of sin.” John von Neumann.



# Biased coins.

- Suppose you have a coin that is biased.
- How do you simulate a perfectly unbiased coin with it?

62.5%



37.5%







# von Neumann's Algorithm

- Flip the coin twice:

case 1:



output



case 2:



output

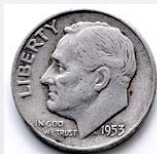
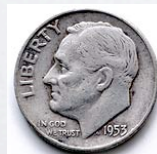


case 3:



repeat

case 4:



repeat



# Analysis

- First experiment:
  - Heads = 23.4375%, Tails = 23.4375%
  - no result yet: 53.125%
- With two experiments:
  - Heads  $\approx$  35.988% Tails  $\approx$  35.988%
  - no result yet  $\approx$  28%
- Asymptotically: no result = 0, Heads=Tails=50%





# Obtaining Randomness

- A *crystal oscillator* is a circuit that produces signal with a precise frequency. Uses **quartz crystals**.
- **piezoelectric** property : electricity causes vibration - vibration causes electricity.
- They are used to make clocks either for measuring time or for synchronizing complex digital circuits.
- **A PC is typically equipped with two such crystals: the CPU clock and the physical clock.**



# Truerand

- Part of cryptolib cryptographic library.
- Extracts randomness from the number of times a counter is incremented (cpu clock) in a fixed physical time interval (e.g., 1/60th of a second) (physical clock) this puts the two PC clocks against each other.
- The two clocks have slight discrepancies and thus the counter will produce a different number every time.





# Air Turbulence

- Air turbulence inside hard drives is a chaotic phenomenon.
- Reading/writing into the hard disk requires placing the head into the right track of the disk [*Seek Time*]. Then the disk must rotate to the right sector [*Rotational Latency*].
- A disk-read will require a different amount of time (as measured from the **CPU clock**) from which one can extract bits of randomness.



# User Input

- Events that are generated by user actions:
  - typing.
  - mouse movements.





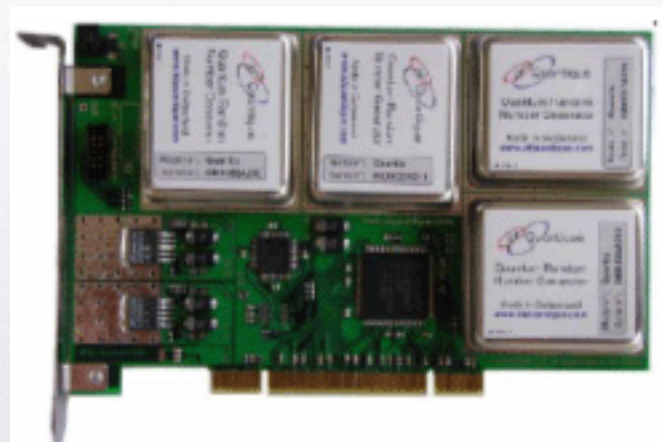
# Specialized Hardware

“True” RNG

Thermal Noise.  
e.g. in Intel RNG



Quantum:  
transmit  
photons through a  
semi-reflective mirror :  
reflect/pass = 0/1







# Cheap Randomness?

- The two basic procedures for randomness (discrepancies between the two clocks or between hard disk reads and a clock) will result in a number of CPU **clock-ticks**.
- Question: *given the output of such a counter where are the random bits?*
- *where would you expect the most random area to be?*





# /dev/random

- Collect “randomness” from various sources : key strokes, timings, network, mouse movement.
- Estimate “entropy”.
- Block call if more bits are requested than available.
- unblocking alternative : /dev/urandom



# Entropy Extraction

- Entropy: how much “uncertainty” exists in a random variable.
- Formula:  $-\sum_{x \in \Omega} \text{Pr}[x] \log_2 \text{Pr}[x]$
- Maximizes when all values are equiprobable.
- Given some random variable  $X$  that is “somewhat” uncertain define a random variable  $Y = g(X)$  that is “more uncertain.”





# min entropy

- An alternative measure :  $-\log \max \Pr[X=v]$ .

$$H_{\infty}(X)$$

it holds :  $H_{\infty}(X) \leq H(X)$



# Common Practices

- Form one or more random variables that have some entropy.
- Concatenate them and hash (e.g. SHA-1, MD5) to produce the random string.
- This is a very popular but not theoretically backed up practice (and potentially unsound).





# Randomness Extraction

- A randomness extractor

$$E : \Omega \rightarrow \{0, 1\}^k$$

if  $X \leftarrow \mathcal{D}_\Omega$  and  $\text{entropy}(X) > c \cdot k$

then  $E(X) \approx U$  where  $U \leftarrow \{0, 1\}^k$

**Some caution** : there (provably) do not exist randomness extractors that work for arbitrary probability distributions (assuming merely min-entropy)



# A simple heuristic

- Consider a random variable  $X$  resulting from a counter (e.g., truerand, hard disk air turbulence etc.). Sample twice and

$X_1 = 110101100101$       one bit each time

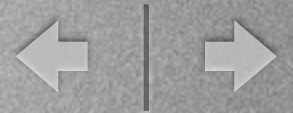
$X_2 = 110001010010$

...      

use this as the 1st von Neumann experiment
use this as the 2nd von Neumann experiment

note : truerand produces 32 bit output (MSBs very **low** entropy)



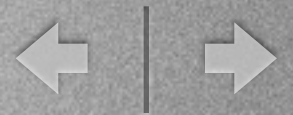


# Not sure?

- Use **different** methods to come up with a number of random strings.
- **Combine** strings together using a XOR gate.

if any of  $X_1, X_2, \dots, X_N$  is random then  
 $X_1 \oplus X_2 \oplus \dots \oplus X_N$  is random

Beware : **independence**



# Independence

Observe:

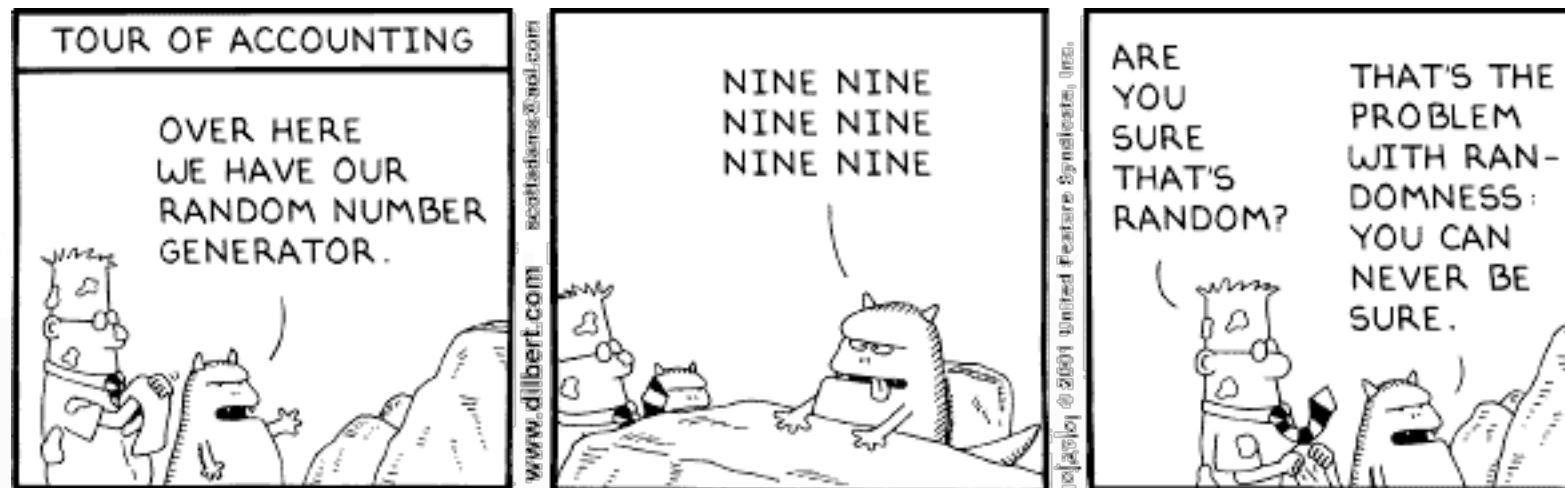
01101011101101 $\oplus$   
10010100010010 =  
11111111111111

It is important to XOR  
independent random  
sources.





# What is randomness?



Is the string 00000000000000 “random”?

In the uniform distribution over  $\{0, 1\}^{12}$   
it is equiprobable as any other string

*But how often a uniform distribution is observed in nature?*

*The **Kolmogorov Complexity** of this string is very low.*



# Efficiency

- Extracting “randomness” is **expensive**:
  - probing system events.
  - repeating many times to allow for unbiasing.
  - using specialized hardware.
  - X-ORing independent sources together to obtain good results.





# Pseudorandom Number Generation

- Rationale : given that randomness extraction can be expensive follow the following strategy:
- Use **expensive** means to extract a very good quality random **seed**.
- Use a PRNG on this seed to **stretch it** to an arbitrarily long random looking sequence.



# PRNGs : LCG

- Linear Congruential Generators.
- Recursively defined :

e.g., rand() of glibc used to be such a function

$$x_n = (a \cdot x_{n-1} + b) \mod m$$

What is the maximum period of an LCD ?

$$\begin{aligned} x_n = x_{n+m-1} &\iff (a^{m-1} - 1)x_n + a^{m-2}b + \dots ab + b = 0 \\ &\iff (a^{m-1} - 1)(x_n + (a - 1)^{-1}b) = 0 \end{aligned}$$





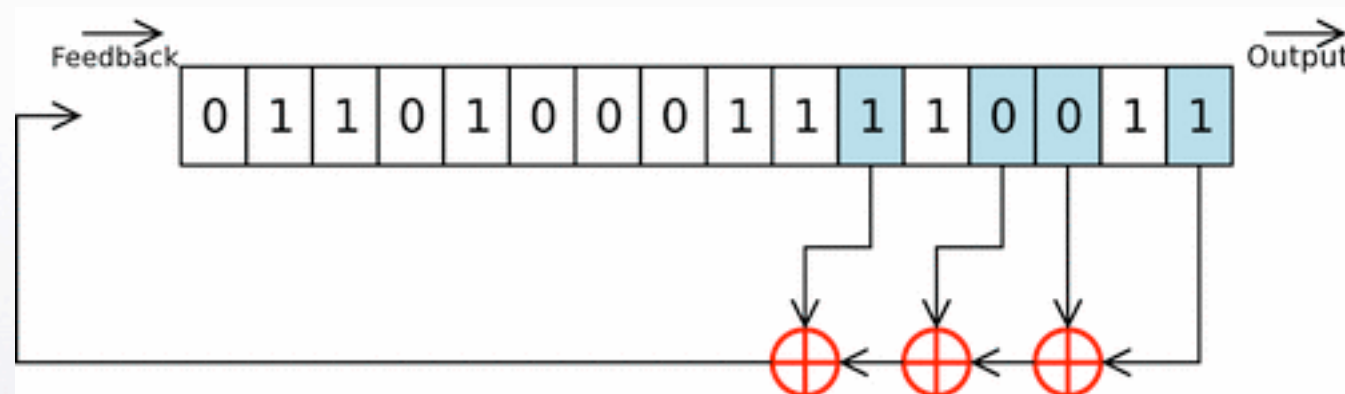
# LCG maximal period

- Can be achieved if  $m$  is a prime number.
- LCG not secure for security applications.



# PRNGs : LFSRs

- Linear feedback shift registers. Also solvable by a linear system.







- Composition of two linear feedback shift registers (the “shrinking generator”).  
Alleged of cryptographic quality  
(unproven).



# Provable PRNGs

- A PRNG with a cryptographic proof of pseudorandomness:
- Example the BBS generator:

$$x_0 \rightarrow x_1 \rightarrow x_2 \rightarrow x_3 \rightarrow \dots$$

$$x_0 = \text{seed}$$

$$x_i = (x_{i-1})^2 \bmod n$$

$$\text{output } \text{LSB}(x_1) \text{LSB}(x_2) \text{LSB}(x_3) \dots$$

**Theorem.** Distinguishing output from random results in the recovery of the factors of  $n$