# Uses and applications of randomness

The built of a secure and trustable source of random number generator

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  - Chair of Algorithms Design and Analysis
- Leader of the Brazilian Randomness Beacon Project (FAPESP)
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- Leader of other TCS and InfoSec projects (CNPq, FAPERJ)
- Young Scientist (FAPERJ) and Research Productivity (CNPq) grants

### First of all: what is a random event

A mathematical definition: The output of a probabilistic experiment



#### A pratical definition: Anything that <u>appears</u> to be random







- Games, lottery, cassino, bingo...
- Selection of judges and jurors
- Computer simulations
- Test of hypotheses randomized controlled trial
- Computer security: key generation, nonces,...

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#### Why randomness in the industry

• Current industrial plants are complex computer systems... ... and vulnerable to the same kind of attacks



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#### In practice: how do we get random numbers?

- Step 1: find a "good" source of "physical" randomness
  - Show that your source is unpredictable (in practice) and has no patterns
    - Statistic tests, implementation analysis
  - If you have a quantum source, great!
  - If you can prove quantumness, explendid! (Bell tests!)
- Step 2: post-process the obtained numbers using a PRNG
  - Simple way to get uniform distribuitions frmo non-uniform ones

```
int getRandomNumber()
{
return 4; // chosen by fair dice roll.
// guaranteed to be random.
}
```

#### Attacks on random numbers

- Critical activities dependent on good random numbers
- Attacks to random number generators
  - Netscape SSL
  - Microsoft Windows 2000/XP
  - MIFARE NXP CRYPTO-1
  - Android Bitcoins
  - Playstation 3
  - NIST SP 800-90

• Poor randomness can have critical impact!

Android bug batters Bitcoin wallets Cryptanalysis of the Random Number Generator of the Windows USENIX Security Symposium. San Jose, CA. 31 July 2008. Operating System Old flaw, new problem Reverse-Engineering a Cryptographic RFID Tag Karsten Nohl and David Evans Starbug and Henryk Plötz By Richard Chirgwin 12 Aug 2013 at 00:43 9 🖵 SHARE V University of Virginia Chaos Computer Club Leo Dorrendorf Department of Computer Science Berlin School of Engineering and Computer Science {nohl,evans}@cs.virginia.edu starbug@ccc.de, henryk@ploetzli.ch The Hebrew University of Jerusalem 91904 Jerusalem, Israel Abstract dorrel@cs.huji.ac.il The security of embedded devices often relies on the secrecy of proprietary cryptographic algorithms. These Zvi Gutterman Benny Pinkas\* pe's Ir algorithms and their weaknesses are frequently disclosed through reverse-engineering software, but it is commonly thought to be too expensive to reconstruct designs from a hardware implementation alone. This Department of Computer Science School of Engineering and Computer Science paper challenges that belief by presenting an approach to reverse-engineering a cipher from a silicon imple-University of Haifa The Hebrew University of Jerusalem mentation. Using this mostly automated approach, we reveal a cipher from an RFID tag that is not known 31905 Haifa, Israel 91904 Jerusalem, Israel to have a software or micro-code implementation. We reconstruct the cipher from the widely used Mifare of its prog zvikag@cs.huji.ac.il benny@pinkas.net Classic RFID tag by using a combination of image analysis of circuits and protocol analysis. Our analysis reetscape w veals that the security of the tag is even below the level that its 48-bit key length suggests due to a number of design flaws. Weak random numbers and a weakness in the authentication protocol allow for pre-computed November 4, 2007 rainbow tables to be used to find any key in a matter of seconds. Our approach of deducing functionality from circuit images is mostly automated, hence it is also feasible for large chips. The assumption that algorithms can be kept secret should therefore to be avoided for any type of silicon chip. d Netscap re 2. This Abstract or UNIX cintosh ve Il faut qu'il n'exige pas le secret, et qu'il puisse sans inconvénient tomber entre les mains de l'ennemi. The pseudo-random number generator (PRNG) used by the Windows operating system is ([A cipher] must not depend on secrecy, and it must not matter if it falls into enemy hands.) employed operating the most commonly used PRNG. The pseudo-randomness of the output of this generator is August Kerckhoffs, La Cryptographie Militaire, January 1883 [13] crucial for the security of almost any application running in Windows. Nevertheless, its exact Users of Android Bitcoin apps have woken to the unpleasant news that algorithm was never published. 1 Introduction ture and were able to fill in the missing details through We examined the binary code of a distribution of Windows 2000, which is still the second , it's impo algorith cryptanalysis of the cipher output for known keys and an old pseudo random number generation bug has been exploited to most popular operating system after Windows XP. (This investigation was done without any inputs. This black-box approach requires some prior unhelp from Microsoft.) We reconstructed, for the first time, the algorithm used by the pseudoiust three steal balances from users' wallets. it process derstanding of the structure of a cipher and is only appli-It has long been recognized that security-through-obscurrandom number generator (namely, the function CryptGenRandom). We analyzed the security cable to ciphers with statistical weaknesses. The output ity does not work. However, vendors continue to beated. of the algorithm and found a non-trivial attack: given the internal state of the generator, the of a sound cipher should not be statistically biased and lieve that if an encryption algorithm is released only as The Bitcoin Foundation's announcement, here, merely states that an previous state can be computed in  $O(2^{23})$  work (this is an attack on the forward-security of therefore should not leak information about its structure. a hardware implementation, then reverse-engineering the the generator, an O(1) attack on backward security is trivial). The attack on forward-security unspecified component of Android "responsible for generating secure cipher from hardware alone is beyond the capabilities of Other ciphers have been disclosed through disassemdemonstrates that the design of the generator is flawed, since it is well known how to prevent riable s likely adversaries with limited funding and time. The random numbers contains critical weaknesses, that render all Android bly of their software implementation. Such implemensuch attacks. design of the cipher analyzed in this paper, for example, tations can either be found in computer software or as We also analyzed the way in which the generator is run by the operating system, and found had not been disclosed for 14 years despite more than a wallets generated to date vulnerable to theft." microcode on an embedded micro-controller. Ciphers that it amplifies th bly include the A5/1 NIST Removes Cryptography Algorithm from Random Number 🛛 🚛 🚮 mode, and there ISM cell phone cominitial values of Schneier on Security d Keeloq algorithms pro by whatever value **Generator Recommendations** The cryptography on process runs a d known to be available system generated lementation; tags and April 21, 2014 it. The result of c tirely in hardware. reveal 128 Kbyte Books Talks Academic About Me Blog Essavs News f G+ 🖌 oprietary cryptog-The implicatio n alone. Reversebe used to learn when very little is Blog >ign: ware implementation \*Research supported 362D0 Following a public comment period and review, the National Institute of Standards and Technology (NIST) has removed a cryptographic algorithm from its draft guidance on random number generators. Sony PS3 Security Broken 💄 MEDIA CONTACT Before implementing the change, NIST is requesting final public comments on the revised document, f fu Recommendation for Random Number Generation Using Deterministic Random Bit Generators & (NIST Jennifer Huergo Sony used an ECDSA signature scheme to protect the PS3. Trouble is, they didn't pay sufficient jennifer.huergo@nist.gov⊠ Special Publication 800-90A, Rev. 1). (301) 975-6343 attention to their random number generator. The revised document retains three of the four previously available options for generating pseudorandom bits needed to create secure cryptographic keys for encrypting data. It omits an EDITED TO ADD (1/13): More info. algorithm known as Dual EC DRBG, or Dual Elliptic Curve Deterministic Random Bit Generator, NIST recommends that current users of Dual\_EC\_DRBG transition to one of the three remaining approved algorithms as quickly as possible. **ORGANIZATIONS** Tags: authentication, cryptography, games, gaming consoles, random numbers, Sony, videos a Posted on January 6, 2011 at 5:52 AM · 85 Comments In September 2013, news reports prompted public concern about the trustworthiness of Information Technology Laboratory Dual EC DRBG. As a result, NIST immediately recommended against the use of the algorithm and **Computer Security Division** reissued SP 800-90A for public comment. D Like D Q +1 i Ø Tweet

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- Most of our "sources of Adoms are.... Deterministic!
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## Some definitions for the concept of "random"

- A mathematical definition
  - The output of a probabilistic event
- An information-theoretic definition
  - Information content of a string is the length of the small program that print it
  - Beautiful, but not practical theory
- A complexity-theoretic defnition
  - Pseudorandom generator: deterministic algorithm that outputs a sequence that is *indistinguishable* from a random sequence using a probabilistic polytime algorithm
  - "randomness is in the eye of the beholder"



## One first randomness source

Good entropy in a small package

## Our first prototype



#### Analysis of results...



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#### Analysis of results...

#### • Read voltage data each 3 ms (multimeter minimum time).

- Read 8 sets of 64 voltage data (buffer limitation). Totalizing 512.
- Calculate average voltage of the full set
- Convert to bits: If voltage upper than average -> 1
   If voltage lower then average -> 0
- Concatenate bits into a 512-bits string.
- \* We are exploring the symmetry of previous distribution



#### **Randomness Test Suit**

Statistical test	<u>p</u> -value	proportion	<u>result</u>
Frequency	0.35048	47/50	pass
Block frequency	0.000123	47/50	pass
Cumulative sum	0.171867	47/50	pass
Longest runs	0.015598	47/50	pass
Rank	0.002374	50/50	pass
FFT	0.085587	47/50	pass
Non-overlapping template	0.085587	50/50	pass
Overlapping template	0.6163	49/50	pass
Random excursions variant	0.213309	48/50	pass
Serial	0.213309	50/50	pass
Linear Complexity	0.213309	49/50	pass



# Our proposed architecture



# Next Steps

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- Characterize our randonmess source according to NIST SP 800-90
- Generate multiple sources of randomness
- Devise a quantum source of randomness
- Implement a "verifiable randomness" protocol
- Develop beacons-based security protocols
- Insert legally valid timestamp and digital signature
- Provide randomness as a service and promote applications

# Thank you for your attention!

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