# Randomness can be amplified

Renato Renner, ETH Zurich

collaboration with Roger Colbeck, University of York

#### Outline

It may be difficult to assert that a process is random ...

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© Dilbert by Scott Adams

#### Outline

#### It may be difficult to assert that a process is random ...



© Dilbert by Scott Adams

... but once you know it is just a little, you can amplify it and obtain perfectly random bits.

... 99 99 99 ...

randomness amplification

 $\cdots 0011101011 \cdots$ 



#### Randomness amplification with certification





#### Randomness amplification with certification





Random numbers are used in numerous applications:

• Gambling



- Gambling
- Simulation (e.g., Monte Carlo algorithms)



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- Experiments (e.g., choice of samples)



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- Simulation (e.g., Monte Carlo algorithms)
- Experiments (e.g., choice of samples)
- Cryptography (generation of keys)
- Decision-making (e.g., in politics)

# Quality of randomness is crucial

#### RELATED VIDEO



Obama on surveillance: "There may be another way of skinning the cat"

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(Reuters) - As a key part of a campaign to embed encryption software that it could crack into widely used computer products, the U.S. National Security Agency arranged a secret \$10 million contract with RSA, one of the most influential firms in the computer security industry, Reuters has learned.

Documents leaked by former NSA contractor Edward Snowden show that the NSA created and promulgated a flawed formula for generating random numbers to create a "back door" in encryption products, the New York Times reported in September. Reuters later reported that RSA became the most important

distributor of that formula by rolling it into a software tool called Bsafe that is used to enhance security in personal <u>computers</u> and many other products.

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We need to "test" randomness. But how?

# How is randomness generated in practice?

• Pseudo-random number generation



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• "Classical" hardware



 $\cdots 0011101011 \cdots$ 

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• "Classical" hardware



... 0011101011 ...

Quantum hardware





#### Statistical tests



→ 00101111010111010 →

statistical test

OK

#### Statistical tests

#### Note: Statistical tests are not sufficient.



→ 00101111010111010 →

statistical test

OK

#### Statistical tests

#### Note: Statistical tests are not sufficient.





→ 00101111010111010



→ 00101111010111010

Safe to use as a lottery machine.







Andrew Random Rumber Generator Bo Martin Bor Daniel URB Bor Daniel

→ 00101111010111010

Safe to use as a

lottery machine.



Safe to use as a lottery machine.



→ 00101111010111010

00101111010111010

Better not use as a lottery machine.





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#### unpredictability is crucial

### How to check unpredictability?

Given a sequence of bits, it is impossible to prove that they were unpredictable.



statistical test

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#### Idea: "certification" of process

Rather than the actual output, consider the process that generates it.





#### **Certificate of Compliance**

This is to certify that the Random Number Generator

#### Quantis-v10.10.08

**ID Quantique SA** 

by

REF : CTL-037/37001

has been tested by

**CTL, Compliance Testing Laboratory** 

and has been found to be suitably unpredictable and fit for purpose

Issue Date: 30.03.2011

Technical Compliance Manager, CAST Limited







CAST LTD Compliance Testing Laboratory A company approved and certified under the Online Gambling Regulation Act 2001 and accredited by UKAS for UK Testing

Compliance Testing Laboratory, Tŷ Menai, Fford Penlan, Parc Menai Business Park, Bangor, Gwynedd LL57 4HJ

Schweizerische Eidgenossenschaft Confédération suisse Confederazione Svizzera Confederaziun svizra

Obj

Federal Department of Justice and Police FDJP Federal Office of Metrology METAS

#### Certificate of Conformity No 151-04687

Object	Quantum Random Number Generator Quantis-USB S/N 070222A410 Quantis-PCI-1 S/N 08338A310 Quantis-PCI Express S/N 1002251A210
Applicant	<b>id Quantique SA</b> Ch. De la Marbrerie 3 1227 Carouge/Geneva Switzerland
Requirements	The output of the Quantis random number generator has to pass all DIEHARD Battery of Tests, confirming that the random number generator distributes numbers with sufficient non- predictability, fair distribution and lack of bias to particular outcomes. Specifically: 10 data sets consisting of 1E8 bits per data set is considered to be random if none of the 234 p-values produced by the 15 DIEHARD Battery of Tests has a value between 1 and 1-epsilon, where epsilon is 1e-6.
Confirmation	The tested Quantis-USB, Quantis-PCI-1 and Quantis-PCI Express have passed all DIEHARD Battery of Tests. The sequence of random bits generated cannot be predicted. The sequence of random bits generated cannot be reproduced.
Remarks	The testing procedure used is described in the annex document "Annex_METAS_151-04687"

CH-3003 Bern-Wabern, 10 May 2010

For the Test

Division Mechanics, Radiation and Time

Dr.Damian Twerenbold

Dr.Philippe Richard, Vice-Director

This document may not be published or forwarded other than in full.

METAS Lindenweg 50, CH-3003 Bern-Wabern, Tel. +41 31 32 33 111, www.metas.ch

# Generating certified randomness

#### **Device-dependent**



- requires accurate and trusted model of device
- practical (commercially available)
- poster by Daniela Frauchiger

#### Device-independent



#### certification procedure

- independent of details of device (no trust required)
- experimentally challenging (high-quality entanglement)
- this talk



Challenge/response protocol



- Challenge/response protocol
- Challenges need to be generated at random



- Challenge/response protocol
- Challenges need to be generated at random
- ➡ Requires randomness in the first place :-(

# Certified randomness amplification

**Basic setup** 



# But what is randomness really?


Guiding principe:

Capture operational needs.

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Intuitive requirement: unpredictability Each new bit uniformly distributed and independent of anything else.



→ 0010111101011101010100011

#### Intuitive requirement:

# Each new bit uniformly distributed and independent of anything else.

## Formal definition uses random variables

source 
$$\longrightarrow X_1 X_2 \cdots X_n$$

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Necessary condition:

$$P_{X_i|X_1\cdots X_{i-1}} = P_U \quad (\forall i)$$

where  $P_U$  is the uniform distribution

Necessary criterion: 
$$P_{X_i|X_1\cdots X_{i-1}} = P_U$$
 ( $\forall i$ )

#### This is however not sufficient!



good randomness 00101111010111010

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definition must be time-dependent

# Refined definition

# Necessary and sufficient criterion:

 $X_i$  is random if it is uniform and independent of anything outside its future light cone.

### Specifically:

$$P_{X_i|X_1\cdots X_{i-1}E} = P_U$$



## Refined definition: example



## Refined definition: example



## Is quantum randomness "truly" random?

MAY 15, 1935

PHYSICAL REVIEW

VOLUME 47

#### Can Quantum-Mechanical Description of Physical Reality Be Considered Complete?

A. EINSTEIN, B. PODOLSKY AND N. ROSEN, Institute for Advanced Study, Princeton, New Jersey (Received March 25, 1935)

In a complete theory there is an element corresponding to each element of reality. A sufficient condition for the reality of a physical quantity is the possibility of predicting it with certainty, without disturbing the system. In quantum mechanics in the case of two physical quantities described by non-commuting operators, the knowledge of one precludes the knowledge of the other. Then either (1) the description of reality given by the wave function in

1.

A NY serious consideration of a physical theory must take into account the distinction between the objective reality, which is independent of any theory, and the physical concepts with which the theory operates. These quantum mechanics is not complete or (2) these two quantities cannot have simultaneous reality. Consideration of the problem of making predictions concerning a system on the basis of measurements made on another system that had previously interacted with it leads to the result that if (1) is false then (2) is also false. One is thus led to conclude that the description of reality as given by a wave function is not complete.

Whatever the meaning assigned to the term *complete*, the following requirement for a complete theory seems to be a necessary one: *every element of the physical reality must have a counterpart in the physical theory*. We shall call this the condition of completeness. The second question

Criterion for "true" randomness:  $X_i$  is random if it is uniform and independent of anything outside its future light cone.



#### Criterion for "true" randomness:

 $X_i$  is *random* if it is uniform and independent of anything outside its future light cone.

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Within quantum theory, randomness of  $X_i$  follows from the Born rule.

However, whether it is really random depends on the completeness of quantum theory.



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### Theorem [informal version]

No extension of quantum theory that is compatible with "free choice" can improve on the predictions of quantum theory. Colbeck and RR, *Nat. Comm.* **2**, 411 (2011)

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True randomness generation possible with trusted devices!

## Imperfect randomness



Necessary and sufficient criterion:  $X_i$  is  $\varepsilon$ -random if  $\|P_{X_i|E_i} - P_U\|_1 \le 2\varepsilon$ 

where  $E_i$  denotes everything outside the future of  $X_i$ .





Randomness extractors take a random seed as an additional input.

#### Is the seed really necessary?



#### Is the seed really necessary?



#### Lemma (Santha and Vazirani)

There exists no function f such that the output f(X) is uniform for any  $\varepsilon$ -random input X.

Proc. of FOCS-84, 434-440 (1984)

# Doesn't this rule out randomness amplification?



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Lemma (Colbeck and RR) [informal version]

For any  $\epsilon < \epsilon_0$  there exists a device-independent protocol whose output f(X) is uniform for any  $\epsilon$ -random input X.

*Nature Physics* **8**, 450–453 (2012)

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Lemma (Colbeck and RR) [informal version]

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No contradiction: protocol may access quantum device.

# Idea: Bell-type setup



#### Protocol idea

• choose measurement settings using weak randomness

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- test correlations (chained Bell inequality) [Pearle, Phys. Rev. D, 1970] and [Braunstein, Caves, Ann. Phys. 1990]

# Idea: Bell-type setup



#### Protocol idea

- choose measurement settings using weak randomness
- test correlations (chained Bell inequality) [Pearle, Phys. Rev. D, 1970] and [Braunstein, Caves, Ann. Phys. 1990]
- output one of the measurement outcomes, chosen using weak randomness

# Assumptions



### Certification is valid if

- weak randomness at least  $\varepsilon$ -random
- two devices isolated from each other

## Role of quantum theory



 certification produces positive output if correlations are the ones predicted by quantum theory

# Role of quantum theory



- certification produces positive output if correlations are the ones predicted by quantum theory
- however, certificate is valid independently of whether quantum theory is correct or complete



#### Results

• Colbeck and RR in 2011:  $\varepsilon < 0.08$ 



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- Gallego *et al.* in 2012: ε < 0.5



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- 2013:

noise tolerance



### Results

- Colbeck and RR in 2011:  $\varepsilon < 0.08$
- Gallego *et al.* in 2012:
- 2013:
- 2014:

noise tolerance improved efficiency

 $\varepsilon < 0.5$ 

# Implications for quantum theory



Corollary [informal version]

Arbitrarily weak randomness is sufficient to carry out Belltype experiments and conclude that quantum theory is complete.

see also Colbeck and RR, Nat. Comm. 2, 411 (2011)

# Summary



Results
# Summary



#### Results

- Randomness can be generated under weak assumptions:
  \* seed randomness may be arbitrarily weak
  - \* devices may be untrusted.

# Summary



#### Results

- Randomness can be generated under weak assumptions:
  \* seed randomness may be arbitrarily weak
  \* devices may be untrusted.
- Completeness of quantum theory can be experimentally verified using weak randomness only.

### Summary of summary

We do not know whether there is randomness ...



### Summary of summary

We do not know whether there is randomness ...



... but if there is just a little bit, we can amplify it and make it perfect.

··· 99 99 99 ··· randomness amplification ··· 0011101011 ···

### Literature

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## Thank you for your attention