

#### **Certifying quantum randomness with low latency**

#### Yanbao Zhang NTT Research Center for Theoretical Quantum Physics NTT Basic Research Lab, Japan Feb. 19, 2021

#### Experimental realization



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Theoretical model, security analysis & randomness extraction





Alan Mink

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## **Outline of the talk**



• Introduction to randomness

• Our scheme for quantum randomness generation

• Our method for certifying quantum randomness

• Experimental realization & results

## **Background: Why randomness is important?**



➢ Random numbers are generated through a process or device called the random number generator (RNG).



Huge amount of uniform randomness

High-quality, certified, private randomness



Simulation



Sampling



Gambling



Cryptography

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Classical process is deterministic **>** No perfect random numbers Quantum measure is probabilistic **>** Ideal random numbers as needed

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A classical

### **Background: Quantum random number generators**



Main idea: exploits the probabilistic nature of quantum measurements to generate genuine random numbers.



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Main idea: exploits the probabilistic nature of quantum measurements to generate genuine random numbers.



Depending on the amount of characterization on the quantum devices:

- Device-dependent QRNG
- Semi-device-(in)dependent QRNG
- Device-independent QRNG



### **Background: Quantum random number generators**



#### **Device-dependent QRNG**



- ✓ simple --- a small device
- high performance --- randomness rate
   ~250 Kbps (embedded in a smartphone)

#### **Device-independent QRNG**



Loophole-free Bell-test setup @ NIST-Boulder

- high security --- no need to characterize the device
- complicated --- a large-scale device
- high latency (time consuming) --- a few minutes or hours delay before generating randomness
- Iow performance --- randomness rate ~100 bps

# Background: Semi-device-independent QRNG ONT

- Semi-device-independent --- the device is partially characterized.
- > Advantage --- can achieve a balance between **performance** and **security**.



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- Semi-device-independent --- the device is partially characterized.
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#### Current problems: reliability and latency

- Questions:
- □ Increase reliability: can we address imperfections in both source & measure?
- Reduce latency: can we achieve low-latency randomness generation?

## **Overview of our achievements**



An

Studied a new semi-device-independent QRNG scheme



In practice,

- a single-photon source is not easily accessible. •
- a particular quantum state is hard to prepare. •
- a particular measurement is hard to perform.

## **Overview of our achievements**



Studied a new semi-device-independent QRNG scheme



Both Source and Measure are partially characterized.

> Developed *efficient* methods for randomness certification in the above scenario

Realized a simple low-latency real-time high-security QRNG

# A simple QRNG scheme







# A simple QRNG scheme with imperfections







# A simple QRNG scheme with imperfections





# A simple QRNG scheme with imperfections







- Guessing probability:  $P_{guess}(\mathbf{C}|\mathbf{Z}\mathbf{E})_{\rho}$
- Easily accessible measure of uniform randomness:  $H_{\min}(\mathbf{C}|\mathbf{Z}E)_{\rho} = -\log_2[P_{guess}(\mathbf{C}|\mathbf{Z}E)_{\rho}]$
- Flexible measure of uniform randomness:

 $H_{\min}^{\varepsilon}(\mathbf{C}|\mathbf{Z}\mathbf{E})_{\rho} = \sup_{\rho'} \{H_{\min}(\mathbf{C}|\mathbf{Z}\mathbf{E})_{\rho'}, P(\rho, \rho') \le \varepsilon\}$ 

R. König, R. Renner, and C. Schaffner, IEEE Trans. Inf. Theory 55, 4337 (2009)

M. Tomamichel, R. Colbeck, and R. Renner, IEEE Trans. Inf. Theory 56, 4674 (2010) Copyright 2020 NTT CORPORATION



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Goal: Lower-bound smooth conditional min-entropy  $H_{\min}^{\varepsilon}(\mathbf{C}|\mathbf{Z}\mathbf{E})$ 



- Guessing probability:  $P_{guess}(C|ZE)_{\mu}$
- Easily accessible measure of uniform randomness:  $H_{\min}(\mathbf{C}|\mathbf{Z}E)_{\mu} = -\log_2[P_{guess}(\mathbf{C}|\mathbf{Z}E)_{\mu}]$
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Goal: Lower-bound smooth conditional min-entropy  $H_{\min}^{\varepsilon}(\mathbf{C}|\mathbf{Z}\mathbf{E})$ 

## **Our method: Concepts involved**



(in the general approach of quantum probability estimation)

- ➢ Quantum model Q(CZ) --- the set of all possible joint states  $\rho_{CZE}$  at the end of the experiment.
- ➢ Quantum estimation factor (QEF) --- a function F<sub>q</sub>(CZ) satisfying a set of constraints imposed by each possible  $\rho_{CZE} \in Q(CZ)$ .

Y. Z., H. Fu, and E. Knill, Phys. Rev. Research 2, 013016 (2020)Y. Z., L. K. Shalm *et al.*, Phys. Rev. Lett. 124, 010505 (2020)

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Under the quantum Markov-chain conditions (natural for time-ordered trials)

 $C_{<i}$  ↔  $(Z_{<i}, E)$  ↔  $Z_i, \forall i$ , [IID assumption is not required]

we need only to construct

- Model  $\mathbf{Q}(CZ)$  --- the set of all possible joint states  $\rho_{CZE}$  at the end of a trial.
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## **Our method: Concepts involved**



(in the general approach of probability estimation)

- Classical model  $\boldsymbol{e}(\mathbf{CZ})$  --- the set of all possible joint states  $\mu_{\mathbf{CZE}}$  at the end of the experiment.
- ➢ Probability estimation factor (PEF) --- a function F<sub>c</sub>(CZ) satisfying a set of constraints imposed by each possible  $\mu_{CZE} \in \mathcal{C}(CZ)$ .

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Y. Z., E. Knill, and P. Bierhorst, Phys. Rev. A 98, 040304(R) (2018)

E. Knill, Y. Z., and P. Bierhorst, Phys. Rev. Research 2, 033465 (2020)

# **Our method: Main theorem**



(of quantum probability estimation)

• Quantum model  $\mathbf{Q}_i$  ( $C_i Z_i$ ) and QEF  $F_{q,i}(C_i Z_i) \ge 0$  with power  $\beta_q > 0$  for each trial *i*.

QEF Def. 
$$\forall \rho_{C_i Z_i E} \in \mathbf{Q}_i (C_i Z_i), \left\langle F_{q,i}(C_i Z_i) \widehat{R}_{1+\beta_q}(\rho_E(C_i Z_i) | \rho_E(Z_i)) \right\rangle \leq 1.$$

\* Models and QEFs for different trials can be different.

\*  $\hat{R}_{1+\beta_q}(\rho_E(C_iZ_i)|\rho_E(Z_i))$  is the sandwiched Rényi power of order  $(1+\beta_q)$ .

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- The success event  $\Phi \triangleq \{ \mathbf{cz} : \prod_{i=1}^{N} F_{q,i}(c_i z_i) \ge t_{\min} \}.$
- $\kappa$  --- a desired lower bound of the success probability.

**Theorem**: For each possible state  $\rho_{CZE}$ , *either* the success probability satisfies  $\operatorname{Prob}_{\rho_{CZE}}(\Phi) \leq \kappa$ ,

or conditional on success

$$H_{\min}^{\varepsilon}(\mathbf{C}|\mathbf{Z}\mathbf{E})_{\rho_{\mathbf{C}\mathbf{Z}\mathbf{E}}|\Phi} \geq \frac{1}{\beta_{q}}\log(t_{\min}) + \frac{1}{\beta_{q}}\log\left(\frac{\varepsilon^{2}}{2}\right) + \frac{1+\beta_{q}}{\beta_{q}}\log(\kappa).$$

#### **Our method: Main theorem** (of probability estimation)



• Classical model  $\boldsymbol{e}_i$  ( $C_i Z_i$ ) and PEF  $F_{c,i}(C_i Z_i) \ge 0$  with power  $\beta_c > 0$  for each trial *i*.

**PEF Def.**  $\forall \mu_{C_i Z_i E} \in \boldsymbol{\ell}_i (C_i Z_i), \langle F_{c,i}(C_i Z_i) [\mu_E(C_i | Z_i)]^{\beta_c} \rangle \leq 1.$ 

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# **Our method: for the scenario considered**

Measurements considered:

$$M_{X} = \begin{pmatrix} M_{X, n=1} & 0 \\ 0 & M_{X, n\neq 1} \end{pmatrix}, \quad M_{Z} = \begin{pmatrix} M_{Z, n=1} & 0 \\ 0 & M_{Z, n\neq 1} \end{pmatrix}, \quad 1. \quad M_{X, n\neq 1} \text{ and } M_{Z, n\neq 1} \text{ are arbitrary}$$

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3.  $M_X$  and  $M_Z$  are randomly selected with bounded probabilities.

States considered: 
$$\rho = \begin{pmatrix} \rho_{n=1} & 0 \\ 0 & \rho_{n\neq 1} \end{pmatrix}$$
, where  $\operatorname{Tr}(\rho_{n=1}) \ge p_{1,\text{lb}}$ .

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States considered:  $\rho = \begin{pmatrix} \rho_{n=1} & 0 \\ 0 & \rho_{n\neq1} \end{pmatrix}, \text{ where } \operatorname{Tr}(\rho_{n=1}) \geq p_{1,\text{lb}}.$ 
Physical model
Construct the best QEF and PEF
by convex optimization
Quantum model
Quantum model Q
& classical model Q

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## **Our QRNG: Experimental realization**



- A laser pulse is inputted into a Mach–Zehnder interferometer (MZI), and outputs are detected by two superconducting single-photon detectors (SSPDs).
- Two orthogonal measurement bases: energy basis & time basis.
  - 1. Energy basis: random (0: click at SSPD1, or 1: click at SSPD2)
  - 2. Time basis: t1 (almost) t3 (rare event)
- Advantage --- easily integrated onto a chip.
- > Our QRNG is semi-device-independent --- allows imperfections in both source & measure.



# **Our QRNG: Experimental realization**





Our QRNG allows:

- Imperfect source --- weak optical pulse rather than single-photon source.
- Imperfect basis choice --- a basis is selected with an inexact probability.
- Imperfect measure --- measurements are misaligned.

### **Result 1: Low-latency real-time high-security QRNG**





➤ Each instance generates 8192 (or 2 × 8192) random bits against quantum (or classical) adversary with insecurity  $2^{-64} \approx 5.4 \times 10^{-20}$  → high security.

Insecurity --- Adversary's ability to distinguish the generated random bits (real case) from the perfectly random bits (ideal case).

Each instance takes 0.1 s runtime (which includes the latency 0.047 s) + 0.02 s (or 0.04 s) extraction time 
real time & low latency.

#### **Result 2: Trade-off between quantity & quality**

- O NTT
- Depending on the specific application, we choose the insecurity level beforehand. E.g.,

Simulation requires low security --- recommended insecurity level  $10^{-5}$ .

Cryptography requires high security --- recommended insecurity level  $10^{-20}$ .



Expected number of random bits certifiable from the measurement outcomes observed in every 0.1 s runtime.

#### **Result 3: Classical vs Quantum adversary**





Simulation: Binary-outcome measurements such that  $\langle M_1 \rangle = 0$ and  $\langle M_2 \rangle = 1 - d$ .

Ideal case: 1-qubit + two mutually unbiased measurements Practical case: 95% 1-qubit + two misaligned measurements (misalignment angle is 5°)

# Clear demonstration of the reduction of the rate w.r.t. quantum adversaries as compared to that w.r.t. classical adversaries.

## **Comparison with other start-of-art works**



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	QRNG Type	Latency	Rate (over a long run)	Insecurity	
<b>ID Quantique</b> PRX, 2014 arXiv:2011.14129	device dependent	unreported	4.90 Mbps** (the best QRNG chip)	uncertified	Fig. 3 of USTC, Nature 2018
<b>USTC</b> Nature, 2018	device independent	13 hours	181 bps	$10^{-5}$ quantum adversary	
<b>NIST</b> PRL, 2020	device independent	5 min	55 bps	$5.4  imes 10^{-20}$ quantum adversary	
<b>Tsinghua Uvi.</b> PRX 2016	semi device independent	unreported	5 Kbps	$1.8  imes 10^{-15}$ quantum adversary	
Our work	semi device independent	47 ms	153 Kbps	$5.4  imes 10^{-20}$ quantum adversary	

\* Latency and Rate are two *different* measures of QRNG performance.

- \* Previous works focus on the study of the rate of a QRNG; however, the latency is more relevant for practical applications.
- \*\* The rate 250 Kbps in the video presentation is the typical entropy rate of the smallest QRNG chip embedded in a smartphone.

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#### Significance of this work and future developments



#### Summary

- Simple & reliable QRNG scheme even with imperfections in both source and measure.
- New & efficient method for randomness certification, which is extendable to QKD.
- Low-latency real-time high-security QRNG.
- Advantage of quantum adversary.



#### Outlook

- Reduce the size of our QRNG → Integration into mobile phones.
- Build a continuously-operating, high-security and high-speed quantum randomness beacon [ongoing efforts at NIST@USA and USTC@China].

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#### Thank you for your attention!