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HCM University of Technology, 09/2023

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- 2. DRNG Definition and Survey
- 3. DVRF Protocol
- 4. DRNG System for Blockchain-based Applications
- 5. Experiment and Result
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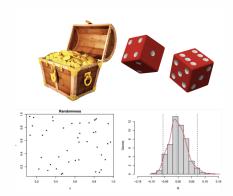
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Motivation

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#### Randomness is very important:

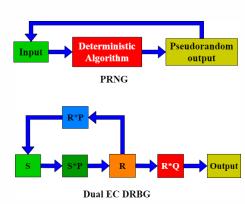
- Used in many applications in life: Gaming, Simulation, Voting, Cryptography, . . .
- A reliable source of randomness is required for such applications.



Motivation 4 | 32

#### Producing randomness is hard.

- True random number generator (TRNG): Produce true random output, but slow and must be stored for testing error.
- Pseudo-random generator (PRNG): Fast, produce pseudo-random outputs. But the owner knows the whole generation process!
- Notorious example of PRNG: The backdoor in Dual EC DRBG of NSA.



<sup>1</sup>https://en.wikipedia.org/wiki/Dual\_EC\_DRBG

### Decentralized Random Number Generator

- The role of generating randomness is split among participants.
- Reduce the risk of a single individual having access to the whole randomness-generating process.
- However, older DRNGs have problems in security or efficiency, while newer DRNG constructions are not widely studied.



## Objectives

 $6 \mid 32$ 

In this thesis, we wish to fulfill the following objectives:

• Formally define the syntax and security properties of DRNGs.

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- Formally define the syntax and security properties of DRNGs.
- Conduct a systematic literature review and analyze the strengths and weaknesses of existing DRNG constructions.
- Based on the results of our survey, specify the most suitable DRNG construction tailored for blockchain-based applications.
- Finally, apply the aforementioned protocol to construct a DRNG system for blockchain-based applications.

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Formal Definition

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A DRNG consists of two interactive protocols DRNGSetup, DRNGGen and an algorithm DRNGVerify as follows:

• DRNGSetup( $1^{\lambda}$ ) $\langle \{P\}_{P \in \mathcal{P}} \rangle$ : Executed by all participants in  $\mathcal{P}$ . Outputs a set QUAL, public parameter **pp**, state  $\mathbf{st}_0$  and each qualified  $P_i$  holds a secret key  $\mathbf{sk}_i$ .

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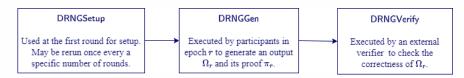
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- DRNGVerify(pp,  $\Omega_r$ ,  $\pi_r$ , st<sub>r</sub>): Executed by anyone to verify the correctness of  $\Omega_r$ . Outputs a bit  $b \in \{0, 1\}$ .



## Security Properties

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A secure DRNG protocol satisfies the following properties:<sup>2</sup>

• Pseudo-randomness: For any r, the output  $\Omega_r$  is pseudo-random. More formally, if  $(\Omega_r, \pi_r, \mathsf{st}_{r+1}) \leftarrow \mathsf{DRNGGen}(\mathsf{st}_r, \mathsf{pp}) \langle \{P_i(\mathsf{sk}_i)\}_{i \in \mathsf{QUAL}} \rangle$ , then for any computational bouned adversaries  $\mathcal{A}$ , there is a negligible function  $\mathsf{negl}$  such that

$$|\Pr[\mathcal{A}(\Omega_r,(\Omega_i)_{i=1}^{r-1})=1]-\Pr[\mathcal{A}(U,(\Omega_i)_{i=1}^{r-1})=1]|\leq \mathsf{negl}(\lambda)$$

where U is uniformly sampled in  $\{0,1\}^{\lambda}$ .

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- Unbiasability: Adversaries cannot control the distribution of the output for their own goal.
- Liveness (Availability): The protocol must produce an output. In other words,  $\Omega_r \neq \perp$  for all r.

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- Unbiasability: Adversaries cannot control the distribution of the output for their own goal.
- Liveness (Availability): The protocol must produce an output. In other words,  $\Omega_r \neq \perp$  for all r.
- Public Verifiability: For any r, an external verifier can check the correctness of  $\Omega_r$  using DRNGVerify.

<sup>&</sup>lt;sup>2</sup>https://eprint.iacr.org/2019/1320.pdf

## DRNG Classification

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DRNGs are classified through their cryptographic primitives as follows:

Cryptographic Primitives	DRNG Constructions
Hash	Proof-of-work, RANDAO.
Publicly verifiable secret sharing	Randshare, SCRAPE, ALBATROSS.
Threshold signature	Drand, DFINITY.
Verifiable random function	Algorand, DVRF.
Homomorphic encryption	Nguyen et al., HERB.
Verifiable delay function	Minimal VDF Beacon, Harmony.

## DRNG Classification

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## Advantages and disadvantages of DRNG constructions:

	Advantages	Disadvantages
Hash	Achieve $O(n^2)$ communication cost, $O(n)$	Do not achieve Unbiasability and Liveness.
	computation and verification cost.	
PVSS	Achieve full security properties.	Suffer $O(n^3)$ to $O(n^2 \log^2 n)$ computation and
		verification cost.
Thres.	- Achieve full security properties.	Suffer $O(n \log^2 n)$ computation cost.
Sig.	<ul> <li>Achieve O(n<sup>2</sup>) communication cost.</li> </ul>	
VRF	- Achieve O(n <sup>2</sup> ) communication cost.	- DVRF suffers $O(n \log^2 n)$ computation cost.
	- DVRF achieves full security properties.	- Algorand does not achieve Unbiasability.
	- Algorand enjoys $O(n)$ computation cost.	
HE	<ul> <li>Achieve O(n²) communication cost.</li> </ul>	- HERB suffers $O(n \log^2 n)$ computation cost.
	- HERB achieves full security properties.	- Nguyen et al. does not achieve Unbiasability.
	- Nguyen et al. enjoys $O(n)$ computation	
	cost.	
VDF	- Achieve full security properties.	
	- Achieve $O(n^2)$ communication cost and	Suffer very high computation cost.
	O(n) verification cost.	

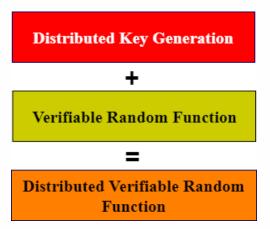
## Summary

	Pseudorandom	Unpredictable	Unbiasability	Liveness	Public Ver.	Comm. Cost	Comp. Cost	Verf. Cost	Primitives
Proof-of-work	Х	✓	Х	Х	✓	$\mathcal{O}(n^2)$	very high	O(1)	Hash
RANDAO	✓	✓	Х	Х	✓	$\mathcal{O}(n^2)$	$\mathcal{O}(1)$	$\mathcal{O}(n)$	Hash
RandShare	✓	✓	✓	✓	✓	$\mathcal{O}(n^3)$	$\mathcal{O}(n^3)$	$\mathcal{O}(n^3)$	PVSS
SCRAPE	✓	✓	✓	✓	✓	$\mathcal{O}(n^3)$	$\mathcal{O}(n^2 \log^2 n)$	$\mathcal{O}(n^2 \log^2 n)$	PVSS
ALBATROSS	✓	✓	✓	✓	✓	$\mathcal{O}(n^3)$	$\mathcal{O}(n^2 \log n)$	$\mathcal{O}(1)$	PVSS
Algorand	Х	<b>√</b>	Х	Х	✓	$\mathcal{O}(n^2)$	O(n)	O(1)	VRF
DVRF	$\checkmark$	<b>√</b>	$\checkmark$	$\checkmark$	$\checkmark$	$\mathcal{O}(n^2)$	$\mathcal{O}(n\log^2 n)$	$\mathcal{O}(n\log^2 n)$	VRF
Nguyen19	✓	✓	Х	✓	✓	$\mathcal{O}(n^2)$	O(n)	$\mathcal{O}(n)$	HE
HERB	<b>√</b>	<b>√</b>	<b>√</b>	<b>√</b>	<b>√</b>	$\mathcal{O}(n^2)$	$\mathcal{O}(n\log^2 n)$	$\mathcal{O}(n\log^2 n)$	HE
Harmony	Х	<b>√</b>	✓	<b>√</b>	✓	$\mathcal{O}(n^2)$	very high	O(n)	VDF
Minimal VDF	Х	<b>√</b>	✓	<b>√</b>	✓	$\mathcal{O}(n^2)$	very high	O(n)	VDF
Drand	Х	<b>√</b>	<b>√</b>	<b>√</b>	<b>√</b>	$\mathcal{O}(n^2)$	$\mathcal{O}(n\log^2 n)$	$\mathcal{O}(n\log^2 n)$	BLS Signature
DFINITY	Х	<b>√</b>	<b>√</b>	<b>√</b>	<b>√</b>	$\mathcal{O}(n^2)$	$\mathcal{O}(n\log^2 n)$	$\mathcal{O}(n\log^2 n)$	BLS Signature

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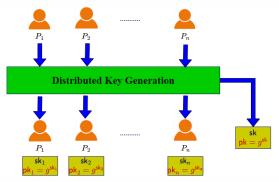
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## Components



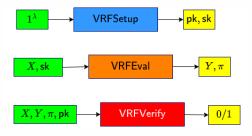
## Component: Distributed Key Generation

- Executed jointly by **n** participants.
- Generate a public-secret key pair  $(pk = g^{sk}, sk)$  and a partial public-secret key pair  $(pk_i = g^{sk_i}, sk_i)$  for each participant  $P_i$ .
- At least t+1 partial secret keys are required to restore  ${\sf sk}.$



## Component: VRF Based on Elliptic Curves

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#### ECVRF construction: <sup>3</sup>

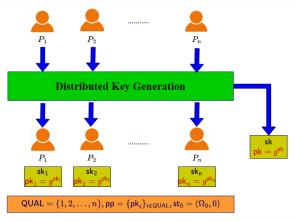
- The public key pk is  $pk = g^{sk}$ .
- Let h = H(X) and compute  $Y = h^{sk}$ .
- Compute the proof  $\pi$  to prove the knowledge of sk such that  $pk = g^{sk}$  and  $Y = h^{sk}$ , then output  $(Y, \pi)$ .

<sup>3</sup>https://eprint.iacr.org/2017/099.pdf

Construction: Setup

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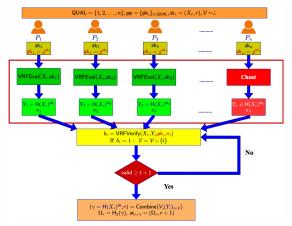
## $\mathsf{DRNGSetup}(1^{\lambda})\langle \{P\}_{P\in\mathcal{P}}\rangle$ : For simplicity, see figure below.



Construction: Generation

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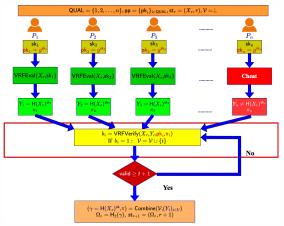
 $\mathsf{DRNGGen}(\mathsf{st}_r,\mathsf{pp})\langle\{P_i(\mathsf{sk}_i)\}_{i\in\mathsf{QUAL}}\rangle$ : For simplicity, see figure below.



Construction: Generation

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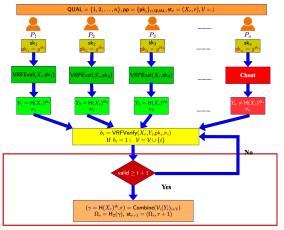
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Construction: Generation

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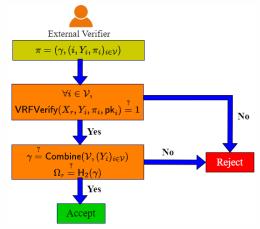
 $\mathsf{DRNGGen}(\mathsf{st}_r, \mathsf{pp}) \langle \{P_i(\mathsf{sk}_i)\}_{i \in \mathsf{QUAL}} \rangle$ : For simplicity, see figure below.



Construction: Verification

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**DRNGVerify(pp,**  $\Omega_r$ ,  $\pi_r$ ,  $\operatorname{st}_r$ ): For simplicity, see figure below.



Complexity Analysis

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The communication, computation and verification complexity of the protocol depend on the number of participants, denoted by  $\boldsymbol{n}$  as follows:

- Communication Complexity:  $O(n^2)$ .
- Computation Complexity per Participant:  $O(n \log^2 n)$ .
- Verification Complexity per Verifier:  $O(n \log^2 n)$ .

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## Randomness for Blockchain

- Various blockchain-based games (e.g., Axie Infinity) require randomness for distributing prizes, items.
- Existing blockchain systems employ older DRNGs such as RANDAO → Do not satisfy required security properties.
- We propose to use DRVF protocol above to generate randomness for such applications.

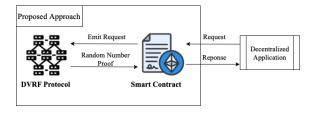


Figure: Axie Infinity <sup>4</sup>

<sup>4</sup>https://axieinfinity.com

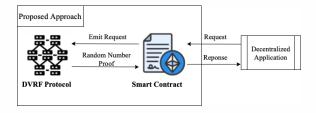
## Proposed System Architecture

 $25\mid 32$ 



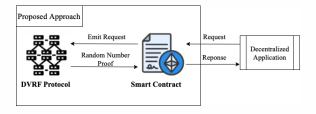
• Dapp: An application wishes to use a random number.

## Proposed System Architecture



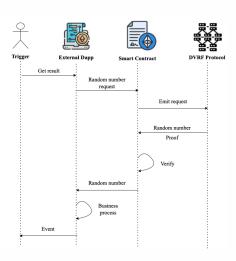
- Dapp: An application wishes to use a random number.
- Smart Contract: Forward random number request from Dapp to DVRF and verify the result from DVRF.

## Proposed System Architecture



- Dapp: An application wishes to use a random number.
- Smart Contract: Forward random number request from Dapp to DVRF and verify the result from DVRF.
- DVRF: Used for generating randomness in a distributed manner.

## Proposed System Workflow



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NIST Test Suite

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- Consists of different tests to test the randomness of binary sequences produced by hardware or software-based cryptographic random or pseudo-random number generators following different statistical tests.
- We use NIST Test Suite to test our implementation with 20 numbers; each number is 100000 bits long.

Result

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Test name	Pass rate
Frequency	20/20
Frequency in a Block	20/20
Run	20/20
Longest Run of Ones in a Block	19/20
Binary Matrix Rank	20/20
Discrete Fourier Transform	20/20
Non-Overlapping Template Matching	20/20
Overlapping Template Matching	20/20
Universal Statistical	20/20
Linear Complexity	19/20
Serial	20/20
Approximate Entropy	19/20
Cumulative Sums	20/20

In the test suite  $^5$ , for 20 numbers, the acceptable pass rate is equal to  $0.99 \pm 3\sqrt{(0.99(1-0.99)/20} = [0.923,1] \rightarrow \text{all test passed}$ .

<sup>&</sup>lt;sup>5</sup>https://csrc.nist.gov/pubs/sp/800/22/r1/upd1/final

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## Conclusion and Future Work

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#### Conclusion.

- A summary of the thesis has been accepted at IUKM 2023.
- Formally defined the syntax and security properties of DRNGs.
- Conducted a systematic literature review of existing DRNGs.
- Specified a DRNG construction tailored for blockchain-based applications.
- Applied the aforementioned protocol to construct a DRNG system for blockchain-based applications.
- Assessed the security of the system using the NIST test suite.

#### Future Work.

- Construct DRNGs that are secure against quantum threats.
- Define DRNGs using the Universal Composable Security framework.

<sup>6</sup>https://www.jaist.ac.jp/IUKM/IUKM2023/

Thank you

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## Thank You for Listening!