

Fast Cryptographic Primitives & Circular-Secure Encryption Based on Hard Learning Problems

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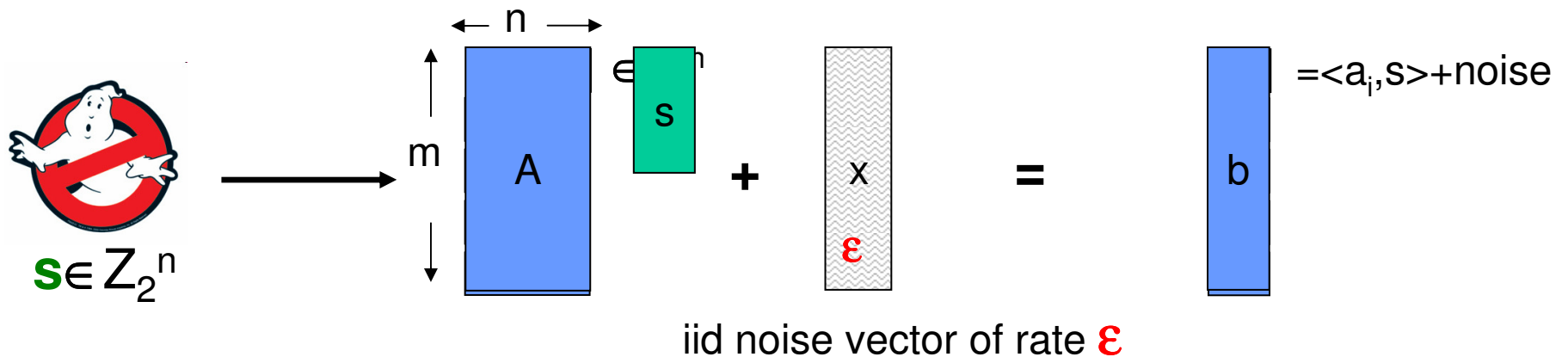
Princeton University, Georgia Tech, SRI international, UCLA

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Learning Noisy Linear Functions

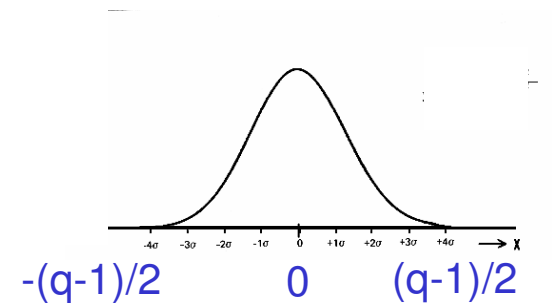
Learning Parity with Noise (LPN)

Problem: find s



e.g., $\epsilon = 1/4$

- Extension to larger moduli: [Learning-with-Errors \(LWE\)](#) [Reg05] :
 - \mathbb{Z}_q where $q(n) = \text{poly}(n)$ is typically prime
 - Gaussian noise w/mean 0 and std $\approx \sqrt{q}$



Learning Noisy Linear Functions

Problem: find s

$$\begin{matrix} \leftarrow n \rightarrow \\ \uparrow m \\ \downarrow \end{matrix} \begin{matrix} A \\ \text{blue rectangle} \end{matrix} \begin{matrix} s \\ \text{green rectangle} \end{matrix} + \begin{matrix} x \\ \text{gray rectangle} \\ \epsilon \\ \text{red symbol} \end{matrix} = \begin{matrix} b \\ \text{blue rectangle} \end{matrix}$$

- **Assumption:** LWE/LPN is computationally hard for all $m = \text{poly}(n)$
- Well studied in Coding Theory/Learning Theory/ Crypto [GKL93,BFKL93, Chab94,Kearns98,BKW00,HB01,JW05,Lyu05,FGKP06,KS06,PW08,GPV08,PVW08...]
- **Pros:**
 - Reduction from worst-case Lattice problems [Reg05,Peik09]
 - Hardness of **search** problem
 - So far resists sub-exp & quantum attacks

Why LWE/LPN ?

- Problem has **simple** algebraic structure: “almost linear” function
 - exploited by [BFKL94, AIK07, D-TK-L09]
- Computable by **simple (bit) operations** (low hardware complexity)
 - exploited by [HB01, AIK04, JW05]

rare
combination

- **Message of this talk:** Very useful combination

$$\begin{matrix} \text{A} \\ \text{S} \end{matrix} + \begin{matrix} \text{x} \\ \epsilon \end{matrix} = \text{b}$$

Main Results

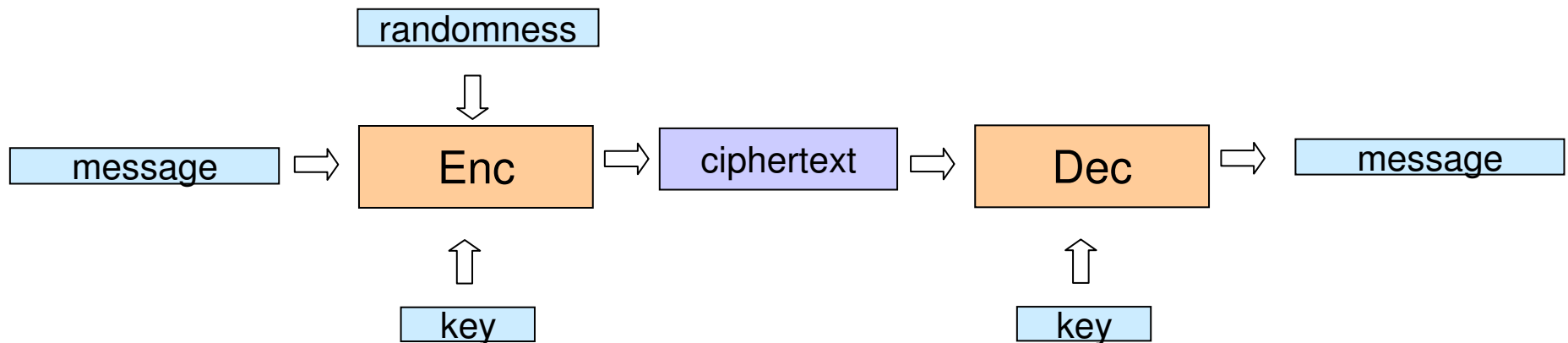
This talk:

- Fast circular secure encryption schemes
 - Symmetric encryption from LPN
 - Public-key encryption from LWE

- Fast pseudorandom objects from LPN
 - Pseudorandom generator $G:\{0,1\}^n\rightarrow\{0,1\}^{2n}$ in quasi-linear time
 - Oblivious weak randomized pseudorandom function

Encryption Scheme

- Security: Even if **Adv** gets **information** cannot **break** scheme.
 - CPA [GM82]: given **oracle** to $E_{\text{key}}()$ can't **distinguish** $E_k(m_1)$ from $E_k(m_2)$
- What if **Adv** sees $E_k(\text{msg})$ where **msg** depends on the **key** (KDM attack)?
 - E.g., $E_{\text{key}}(\text{key})$ or $E_{\text{key}}(f(\text{key}))$ or $E_{k_1}(k_2)$ and $E_{k_2}(k_1)$



KDM / circular security

F-KDM Security [BlackRogawayShrimpton02] : Adv gets $E_k(f(k))$ for $f \in F$

Circular security [CamenischLysyanskaya01] : Adv gets $E_{k_1}(k_2), E_{k_2}(k_3), \dots, E_{k_i}(k_1)$

Can we achieve KDM/circular security?

- many recent works [BRS02, HK07, BPS07, BHHO08, CCS08, BDU08, HU08, HH08]

- natural questions

- disk encryption

- anonymous

- axiomatic security [AdarBanarHerzogGorog08]

- Gentry's fully homomorphic scheme [Gen09]

- non-trivial to achieve:

- some ciphers become insecure under KDM attacks (e.g., AES in LRW mode)

- random oracle constructions are problematic [HofheintzUnruh08, HaleviKrawczyk07]

- can't get KDM from trapdoor permutation in a black-box way [HaitnerHolenstein08]

[BHHO08]: Yes, we can !

Symmetric Scheme from LPN

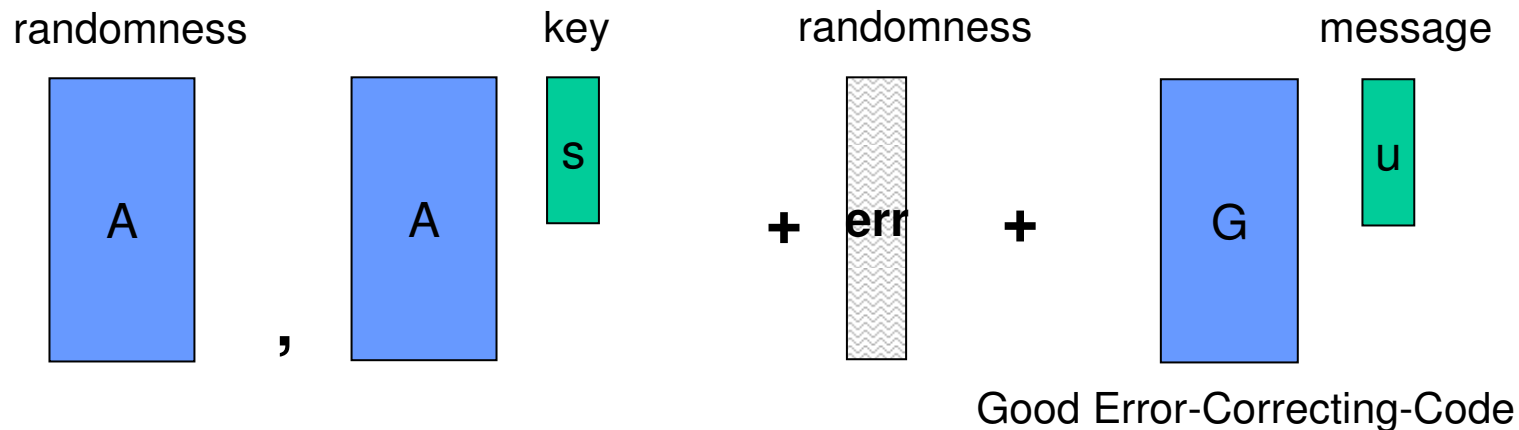
Symmetric Scheme

- Let G be a good linear error-correcting code with decoder for noise $\epsilon+0.1$

$$\text{Enc}_s(\text{mes}; A, \text{err}) = (A, As + \text{err} + G \cdot \text{mes})$$

$$\text{Dec}_s(A, y) = \text{decoder}(y - As)$$

- Natural scheme originally from [\[GilbertRobshawSeurin08\]](#)
 - independently discovered by [\[A08, DodisTauman-KalaiLovet09\]](#)
- Also obtain amortized version with [quasilinear](#) implementation (See paper)



Clique Security

$$\text{Enc}_s(\text{mes}; A, \text{err}) = (A, As + \text{err} + G \cdot \text{mes})$$

$$\text{Dec}_s(A, y) = \text{decoder}(y - As)$$

Thm. Scheme is circular (clique) secure and KDM w/r to affine functions

Proof:

• Useful properties:

- **Plaintext homomorphic:** Given $E_s(u)$ and v can compute $E_s(u+v)$

$$(A, As + \text{err} + G \cdot (u + v))$$

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- **Key homomorphic:** Given $E_s(u)$ and r can compute $E_{s+r}(u)$

$$(A, A \cdot (s+r) + \text{err} + Gu + A \cdot r)$$

Clique Security

$$\text{Enc}_s(\text{mes}; A, \text{err}) = (A, As + \text{err} + G \cdot \text{mes})$$

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• Useful properties:

- **Plaintext homomorphic:** Given $E_s(u)$ and v can compute $E_s(v+u)$
- **Key homomorphic:** Given $E_s(u)$ and r can compute $E_{s+r}(u)$
- **Self referential:** Given $E_s(0)$ can compute $E_s(s)$

$$\begin{aligned}
 & (A - G, As + \text{err}) \\
 = & (A', (A - G)s + \text{err}) \\
 = & (A', A's + \text{err} + Gs) \\
 = & E_s(s)
 \end{aligned}$$

Clique Security

$$\text{Enc}_s(\text{mes}; A, \text{err}) = (A, As + \text{err} + G \cdot \text{mes})$$

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Proof:

- Useful properties:
 - **Plaintext homomorphic:** Given $E_s(u)$ and v can compute $E_s(v+u)$
 - **Key homomorphic:** Given $E_s(u)$ and r can compute $E_{s+r}(u)$
 - **Self referential:** Given $E_s(0)$ can compute $E_s(s)$
- Suppose that **Adv** break clique security (can ask for $E_{S_i}(S_k)$ for all $1 \leq i, k \leq t$)
- Construct **B** that breaks standard CPA security (w/r to single key S).
- **B** simulates **Adv**: choose t offsets $\Delta_1, \dots, \Delta_t$ and pretend that $S_i = S + \Delta_i$
 - Simulate $E_{S_i}(S_k)$: get $E_s(0) \rightarrow E_s(S) \rightarrow E_{s+\Delta_i}(S) \rightarrow E_{s+\Delta_i}(S + \Delta_k)$

Public-key Scheme from LWE

Regev's Scheme - [GPV-PVW08] variant

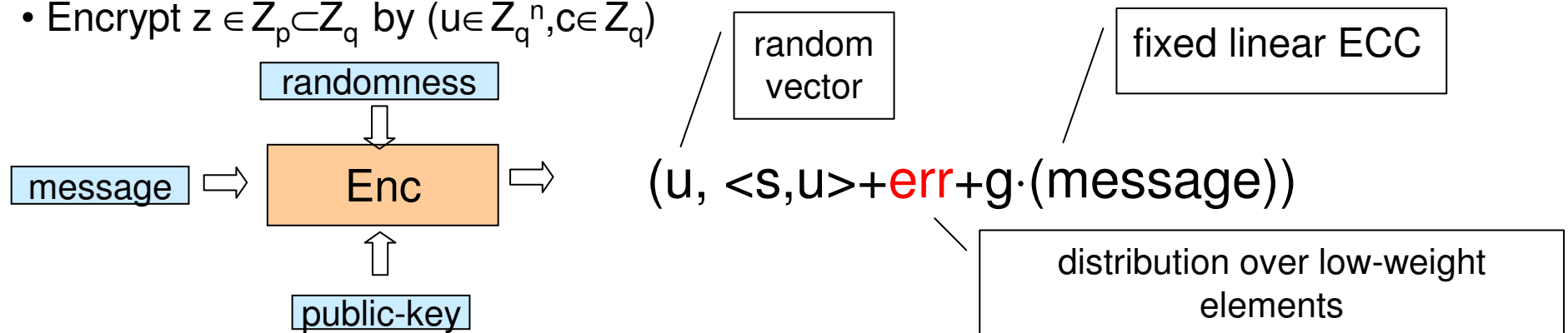
- Public-key: $A \in \mathbb{Z}_q^{n \times m}$, $b \in \mathbb{Z}_q^m$
- Secret-key: $s \in \mathbb{Z}_q^n$

A diagram illustrating the public key equation: $A + s + x + \epsilon = b$. The components are represented as follows:

- A : A blue rectangular box.
- s : A green rectangular box.
- x : A hatched rectangular box.
- ϵ : A red Greek letter epsilon at the bottom of the hatched box.
- b : A blue rectangular box.

 The boxes are arranged in a sequence: A , $+$, s , $+$, x , $+$, ϵ , $=$, b .

- Encrypt $z \in \mathbb{Z}_p \subset \mathbb{Z}_q$ by $(u \in \mathbb{Z}_q^n, c \in \mathbb{Z}_q)$



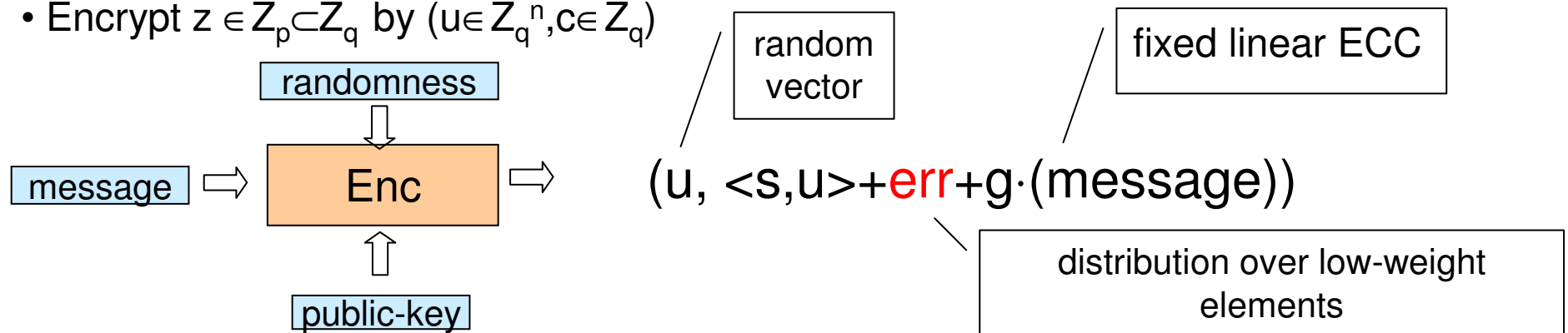
- To Decrypt (u, c) : compute $c - \langle s, u \rangle = g \cdot \text{mes} + \text{err}$ and decode
- CPA Security in [Regev05, GentryPeikertVaikuntanathan08]
- Want: Plaintext homomorphic, Self referential, Key homomorphic

Regev's Scheme - [GPV-PVW08] variant

- Public-key: $A \in \mathbb{Z}_q^{n \times m}$, $b \in \mathbb{Z}_q^m$
- Secret-key: $s \in \mathbb{Z}_q^n$

$$A \cdot s + x \cdot \epsilon = b$$

- Encrypt $z \in \mathbb{Z}_p \subset \mathbb{Z}_q$ by $(u \in \mathbb{Z}_q^n, c \in \mathbb{Z}_q)$



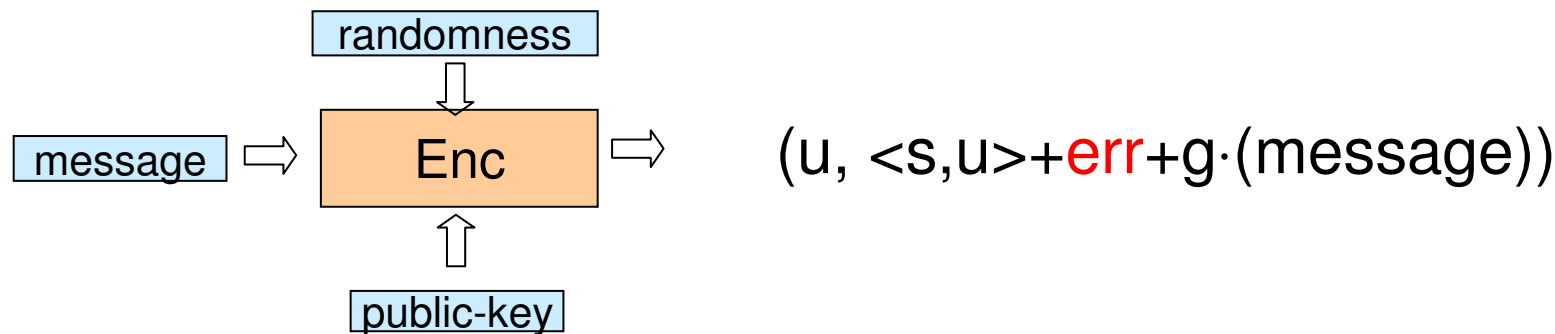
- To Decrypt (u, c) : compute $c - \langle s, u \rangle = g \cdot \text{mes} + \text{err}$ and decode
- CPA Security in [Regev05, GentryPeikertVaikuntanathan08]
- Want: Plaintext homomorphic, **Self referential**, Key homomorphic

Self Reference

- Public-key: $A \in \mathbb{Z}_q^{n \times m}$, $b \in \mathbb{Z}_q^m$
- Secret-key: $s \in \mathbb{Z}_q^n$

$$A s + x \epsilon = b$$

- Encrypt $z \in \mathbb{Z}_p \subset \mathbb{Z}_q$ by $(u \in \mathbb{Z}_q^n, c \in \mathbb{Z}_q)$

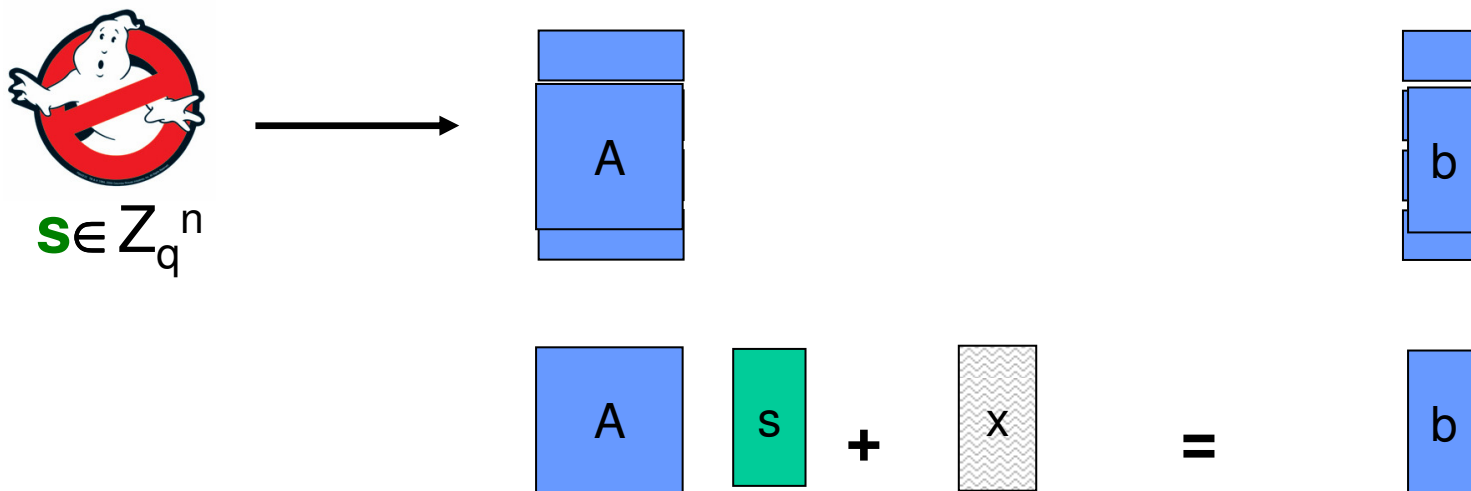


- Can we convert $E(0)$ to $E(s_1)$?
- Can use prev ideas (up to some technicalities) but...
- **Problem:** s_1 may not be in \mathbb{Z}_p
- **Sol:** Choose s with entries in \mathbb{Z}_p by sampling from Gaussian around $(0 \pm p/2)$
- Security: we show how to convert standard LWE to LWE with $s \leftarrow \text{Noise}$

Hardness of LWE with $s \leftarrow \text{Noise}$

Convert standard LWE to LWE with $s \leftarrow \text{Noise}$

1. Get (A, b) s.t A is invertible



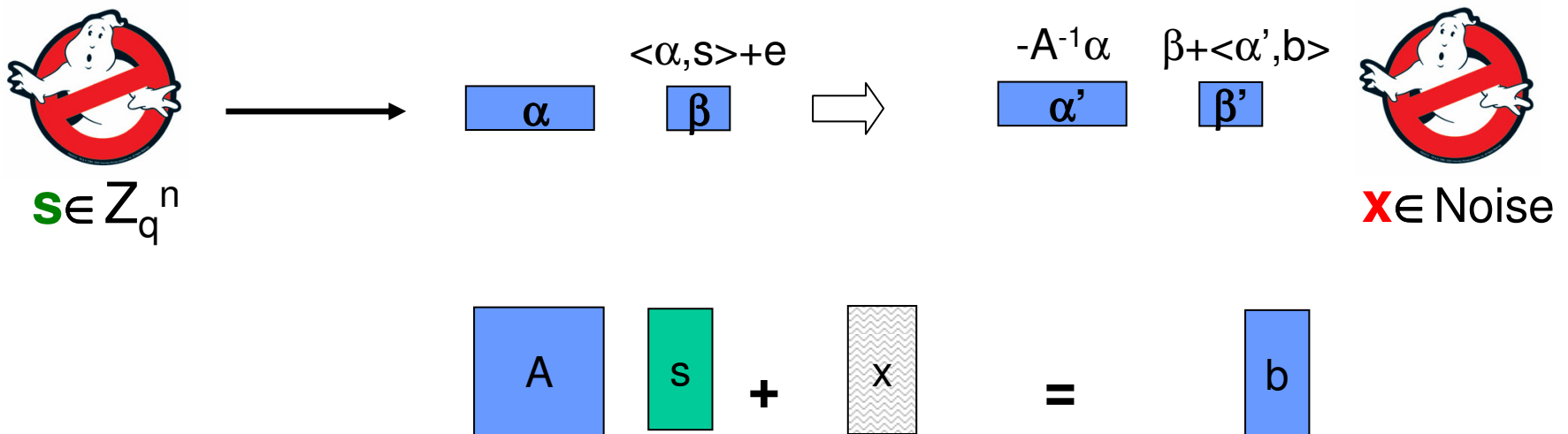
Hardness of LWE with $s \leftarrow \text{Noise}$

Convert standard LWE to LWE with $s \leftarrow \text{Noise}$

- If $(\alpha, \beta) \leftarrow \text{LWE}_s$ then $(\alpha', \beta') \leftarrow \text{LWE}_x$

Proof:

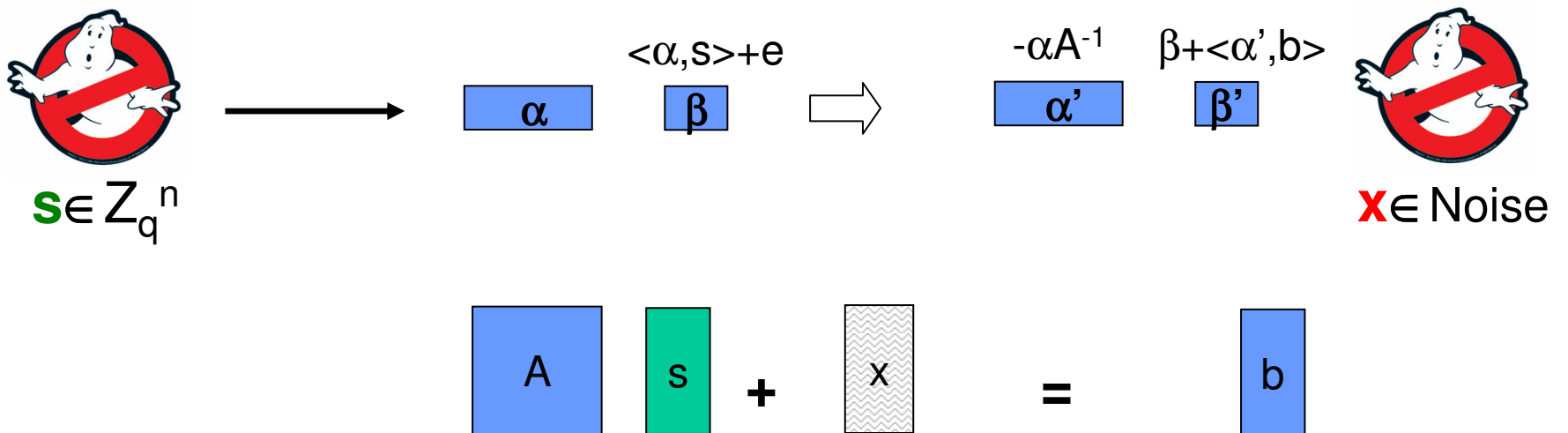
$$\begin{aligned} \beta' &= \beta + \langle \alpha', b \rangle \\ &= \langle \alpha, s \rangle + e + \langle \alpha', As \rangle + \langle \alpha', x \rangle \\ &= \langle \alpha, s \rangle + e + \langle -A^{-1}\alpha, As \rangle + \langle \alpha', x \rangle \end{aligned}$$



Hardness of LWE with $s \leftarrow \text{Noise}$

Convert standard LWE to LWE with $s \leftarrow \text{Noise}$

- If $(\alpha, \beta) \leftarrow \text{LWE}_s$ then $(\alpha', \beta') \leftarrow \text{LWE}_x$
- If (α, β) are uniform then (α', β') also uniform
- Hence distinguisher for LWE_x yields a distinguisher for LWE_s



Hardness of LWE with $s \leftarrow \text{Noise}$

- Reduction generates invertible linear mapping $f_{A,b}: s \rightarrow x$



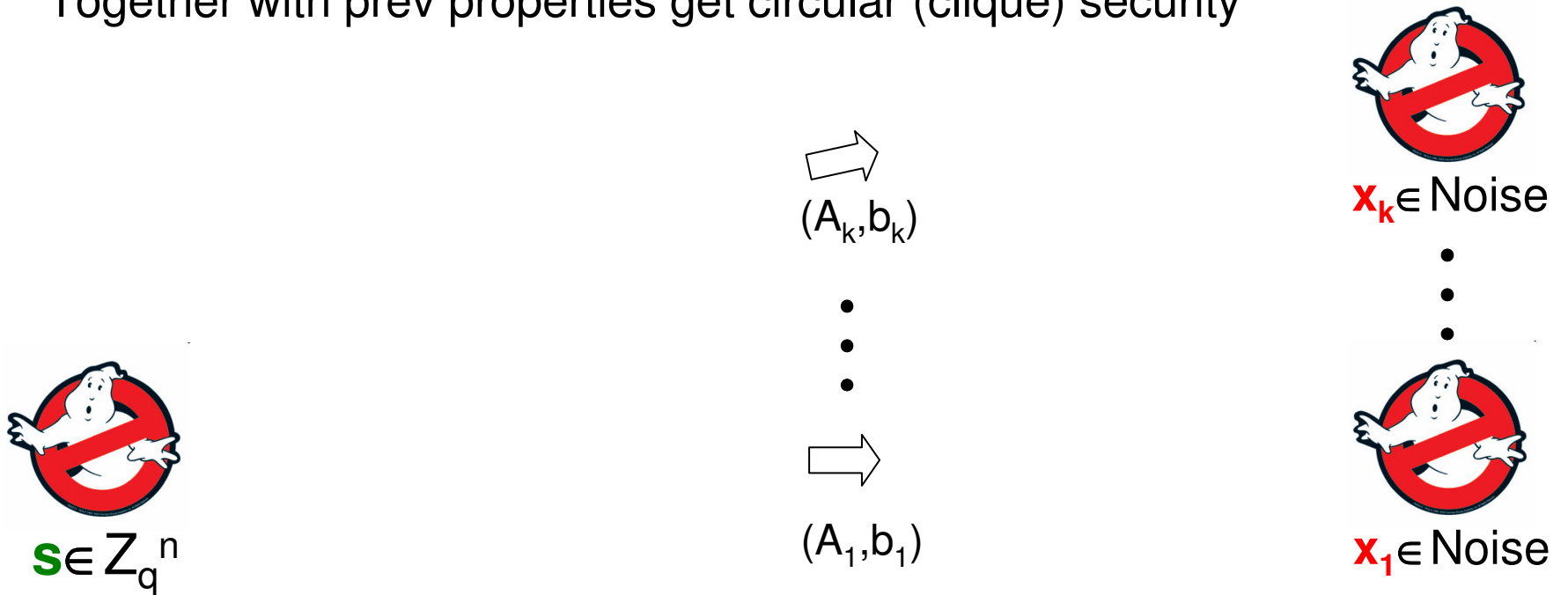
(A, b)



$$\begin{array}{|c|} \hline A \\ \hline \end{array} \begin{array}{|c|} \hline s \\ \hline \end{array} + \begin{array}{|c|} \hline x \\ \hline \end{array} = \begin{array}{|c|} \hline b \\ \hline \end{array}$$

Hardness of LWE with $s \leftarrow \text{Noise}$

- Reduction generates invertible linear mapping $f_{A,b}: \mathbf{s} \rightarrow \mathbf{x}$
- **Key Hom:** get pk's whose sk's x_1, \dots, x_k satisfy known linear-relation
- Together with prev properties get circular (clique) security



- Improve efficiency via amortized version of [\[PVW08\]](#)

Open Questions

- **LWE** vs. **LPN** ?
 - **LWE** follows from worst-case lattice assumptions [Regev05, Peikert09]
 - **LWE** many important crypto applications [GPV08,PVW08,PW08,CPS09]
 - **LWE** can be broken in “ $NP \cap \text{co-NP}$ ” unknown for **LPN**
 - **LPN** central in learning (“complete” for learning via Fourier)
[FeldmanGopalanKhotPonnuswami06]

- **Circular Security** vs. **Leakage Resistance** ?
 - Current constructions coincident
 - LPN/Regev/BHHO constructions resist key-leakage
[AkaviaGoldwasserVaikuntanathan09, DodisKalaiLovett09, NaorSegev09]
 - common natural ancestor?

Regev's Scheme - [GPV-PVW08] variant

• Public-key: $(A,b) \in \mathbb{Z}_q^{n \times m} \times \mathbb{Z}_q^m$

Secret-key: $s \in \mathbb{Z}_q^n$

$$s + A + x = b$$

ϵ

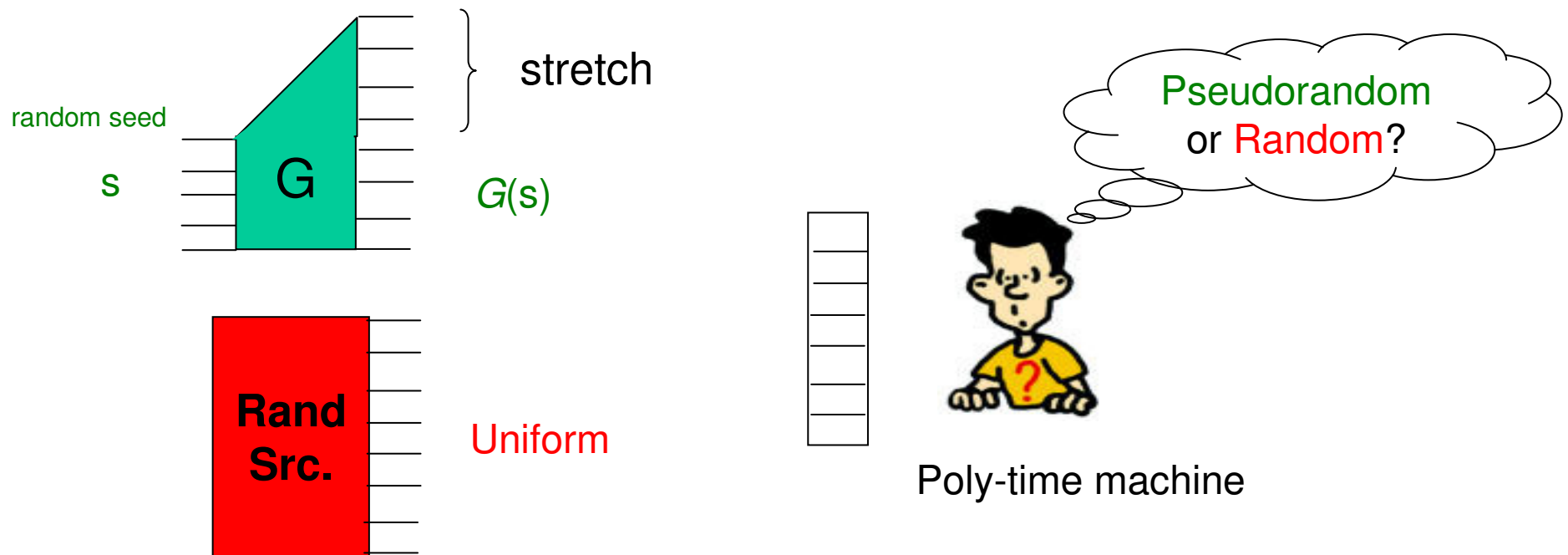
• Encrypt $z \in \mathbb{Z}_p \subset \mathbb{Z}_q$ by $(u,v+f(z))$ where $f: \mathbb{Z}_p \rightarrow \mathbb{Z}_q$ is linear ECC, i.e., $f(z)=az$

$$\begin{matrix} A \\ b \end{matrix} + r = \begin{matrix} u \\ v \end{matrix} + f(z)$$

$v = \langle s, u \rangle + \langle x, r \rangle$
noise

- To Decrypt (u,c) : compute $c - \langle s, u \rangle = f(z) + \langle x, r \rangle$ and decode
- Security [R05,GPV]: If b was truly random then (u,v) is random and get OTP
- Want: Plaintext homomorphic, Self referential, Key homomorphic
- Plaintext hom: let message space be subgroup of \mathbb{Z}_q by taking $q=p^2$

Pseudorandom Generator (PRG)



- Can be constructed from any one-way function [HILL90]
- Stretch of 1 bit \Rightarrow Stretch of polynomially many bits [BM-Y, GM84]

Circuit Complexity of PRGs

Pseudorandom generator $G:\{0,1\}^n \rightarrow \{0,1\}^{2n}$

- At least $\Omega(n)$ circuit size
- Can we get low overhead of $O(n)$ or $n \cdot \text{polylog}(n)$?
 - natural question
 - [IKOS08] PRG with low overhead \Rightarrow low-overhead cryptography
e.g., PK-encryption in time $O(|\text{message}|)$, for sufficiently large message.

Construction	Assumption	Time (circuit size)
[BM84, GM84]	1-bit PRG G'	$n \cdot \text{Time}(G') > n^2$
[Gen00, DRV02, DN02]	Number Theoretic	More than n^2
[BFKL94, FS96]	LPN	n^2
[AIK06]	sparse-LPN (non-standard)	n
This work	LPN (standard)	$n \cdot \text{polylog}(n)$

Circuit Complexity of PRGs

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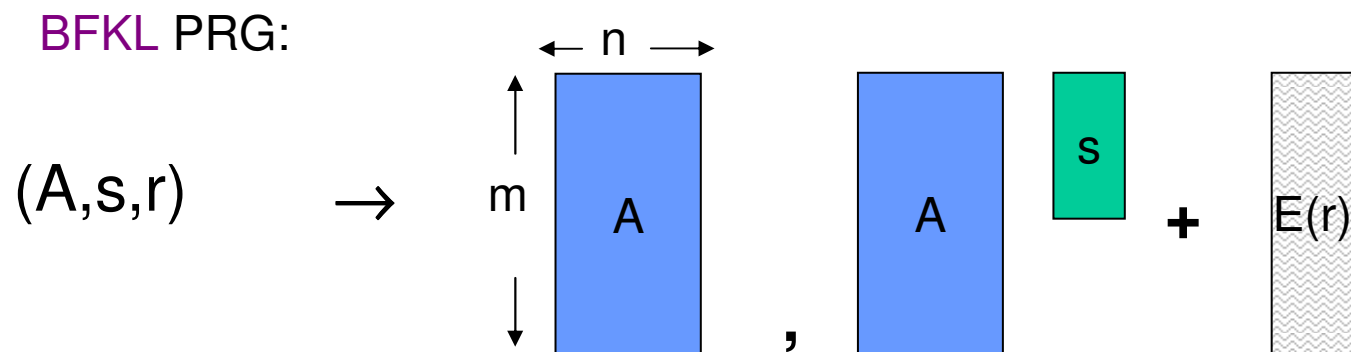
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[Genarro00, DedicReyzinVadhan02, DamgardNielsen02]	Number Theoretic	More than n^2
[BlumFurstKearnsLipton94, FischerStern96]	LPN	n^2
[A-IshaiKushilevitz06]	sparse-LPN (non-standard)	n
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The [BFKL] generator

BFKL generator: $G(A, s, r) = (A, As + \text{Err}(r))$

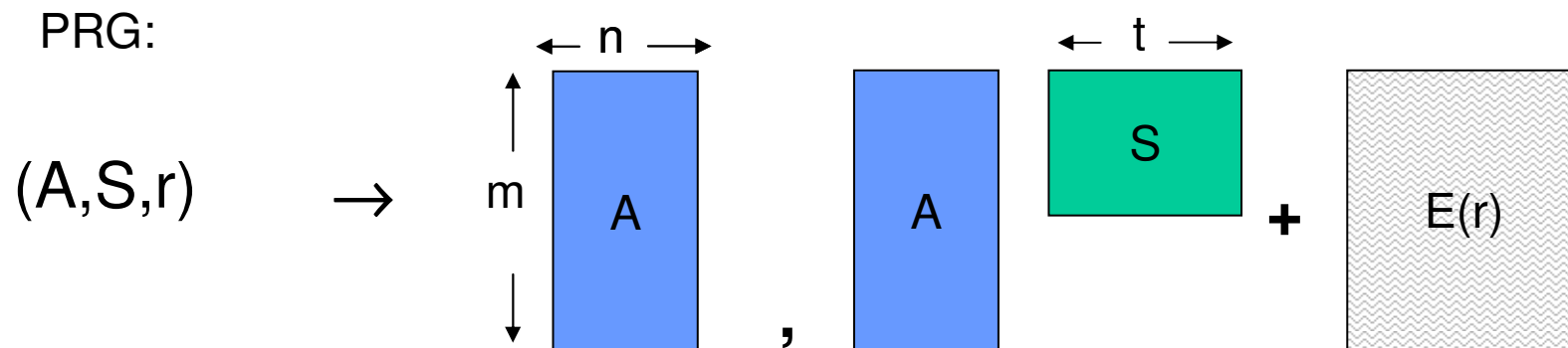
- input: $nm+n+mH_2(\epsilon)$ output: $nm+m$ stretch: $m(1-n/m - H_2(\epsilon))$
- Efficiency: only bit operations !
- **Bottleneck 1**: at least $\Omega(mn)$ due to matrix-vector multiplication
- **Bottleneck 2**: Sampling $\text{Err}(r)$ (with low randomness complexity) takes time
[FischerStern96] : quadratic time on a RAM machine



Solving 1: Amortization

BFKL generator: $G(A, s, r) = (A, As + \text{Err}(r))$

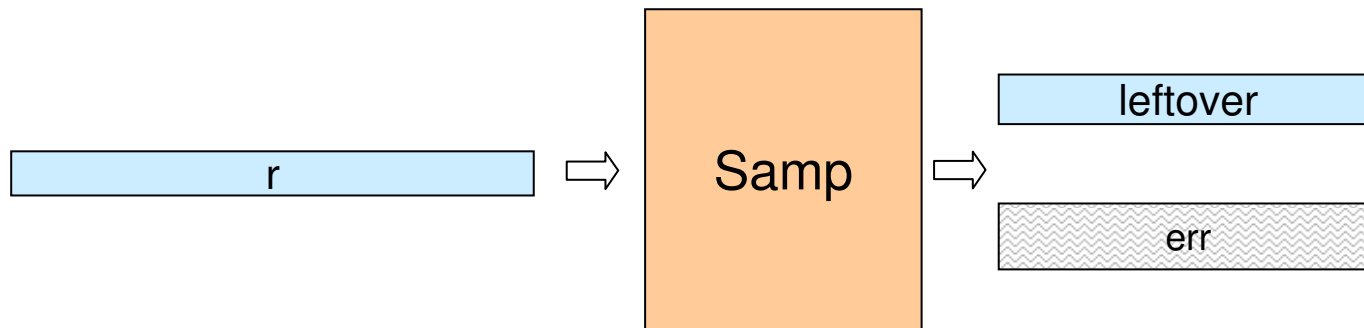
- **Bottleneck 1**: at least $\Omega(mn)$ due to matrix-vector multiplication
- **Sol**: Amortization
- Use many different s 's with the same A
- Preserves pseudorandomness since A is public
 - Proof via Hybrid argument
- If matrices are very **rectangular** can multiply in quasi-linear time [Cop82]
 - E.g., $t=n$ and $m=n^6$



Solving 2: Sampling with leftovers

Bottleneck 2: Sampling noise w/low randomness takes $O(n^2)$

- **Sol:** [AIK06] $\text{Samp}(r) = (\text{err}, \text{leftover})$



- PRG $G(A,S,r) = (A, AS+\text{err}, \text{leftover})$
- How to sample w/leftovers?
 - If $\epsilon=1/4$ partition r to pairs and let $\text{err}_i = r_{2i-1} \cdot r_{2i}$
 - r has a lot of entropy given err , so can **extract** the leftover
 - Can get linear time with leftover of linear length
- G has **linear stretch** and computable in **quasi-linear** time

Open Questions

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 - **LWE** follows from worst-case lattice assumptions [Regev05, Peikert09]
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[AGV09,DKL09,NS09]
 - common natural ancestor?

Conclusion and Open Questions

- DRLC is useful for private-key primitives that need
 - fast hardware implementation
 - special homomorphic properties
- Find more crypto application for DRLC
 - collision resistance hash-functions
 - public-key crypto [Alek03] uses $m=O(n)$, $\epsilon=\sqrt{n}$