

Robustness of the Learning with Error (LWE) Assumption

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Cryptography



sk

0	1	1	1	0	0
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sk

0	1	1	1	0	0
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Public-key cryptography (e.g. RSA)



(sk_1, pk_1)

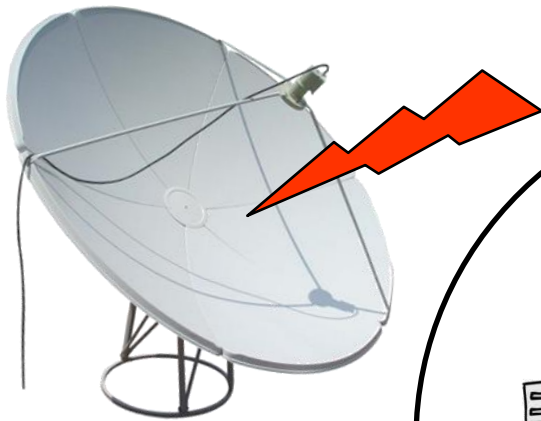


(sk_2, pk_2)

RSA (and other schemes) are **insecure** when a small fraction of the secret key is leaked

[Rivest-Shamir85, Coppersmith1996, Heninger-Shacham2009]

Computation Leaks



EM Radiation

[Quisquater 01]

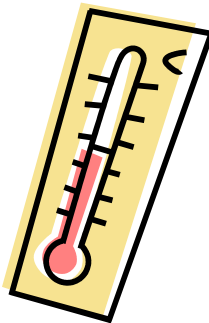


Power Consumption

[Kocher et al. 98]



Timing [Kocher 96]



Memory Leaks



Cold-boot attack

[HSHCPCFAF 08]

Benign Leakage

- **Weak keys**
 - Secret keys may not be generated with perfect randomness
- **Re-use of secret keys**
 - We may want to use the same secret key for different applications (i.e., biometrics, identity based crypto,...).

How Do we Deal with These Attacks?

Traditionally:

“this is not our job. We’re theorists. Our job is to design schemes that are secure assuming the secret key is totally hidden.”

Recently:

Use more theory to battle reality.

Outline

✓ Motivation

- **Modeling Leakage**
- **Thm:** Learning With Error (LWE [Regev2005]) problem is hard even with leakage
- **Proof overview**
- **Application:** Efficient symmetric encryption scheme robust to leakage

Modeling Leakage

Computation leaks

[Micali-Reyzin2004]

[Ishai-Prabhakaran-Sahai2003]

[Wagner2006]

[Dziembowski-Pietrzak2008]

[Pietrzak2009]

[Faust-Kiltz-Pietrzak-Rothblum2009]

Memory leaks

[Akavia-Goldwasser-Vaikuntanathan2009]

[Dodis-K-Lovett2009]

[Naor-Segev2009]

[Katz-Vaikuntanathan2009]

[Alwen-Dodis-Wichs2009]

[Alwen-Dodis-Naor-Segev-Walfish-Wichs2009]

[Dodis-Goldwasser-K-Peikert-Vaikuntanathan2010]

[Goldwasser-K-Peikert-Vaikuntanathan2010]

Memory Leakage

Goal: Construct schemes (standard) secure w.r.t. leakage

Challenge: Don't strengthen computational assumptions

[Rivest97, Boyko99, Canetti-Dodis-Halevi-Kushilevitz-Sahai00]:

Bit leakage

Useful for composition:

Reuse secret key across
different applications

[Akavia-Goldwasser]

[Naor-Segev2009]:

secret key is chosen on $L(sk)$

[Dodis-K-Lovett2009]: sk is hard (computationally) to compute
given $L(sk)$
 X has min-entropy k if

Formally: \forall PPT A , $\forall x$, $\Pr[X=x] \leq 2^{-k}$
 $\Pr[A(L(sk))=sk] < 2^{-k}$

Previous Results

- [Akavia-Goldwasser-Vaikuntanathan2009]: Regev's public-key encryption scheme is secure against leakage.
- [Naor-Segev2009]: several public-key encryption schemes secure against leakage.
- [Katz-Vaikuntanathan2009]: Signature schemes secure against leakage.
- [Dodis-K-Lovett2009]: Symmetric-key encryption scheme secure w.r.t. auxiliary input leakage.
- [Dodis-Goldwasser-K-Peikert-Vaikuntanathan2010]: Several public-key encryption schemes secure w.r.t. auxiliary input leakage.

Drawback

The parameters of the schemes depend on maximum anticipated leakage

Security w.r.t.
 $(1-\epsilon)$ leakage



$\text{poly}(1/\epsilon)$
efficiency loss

Scheme Independent of Leakage Parameters

This work:

Single symmetric-key encryption scheme, secure against **any** auxiliary input leakage under **standard LWE**, and assumption degrades proportional to leakage size

same assumption with smaller security parameter

Thm:

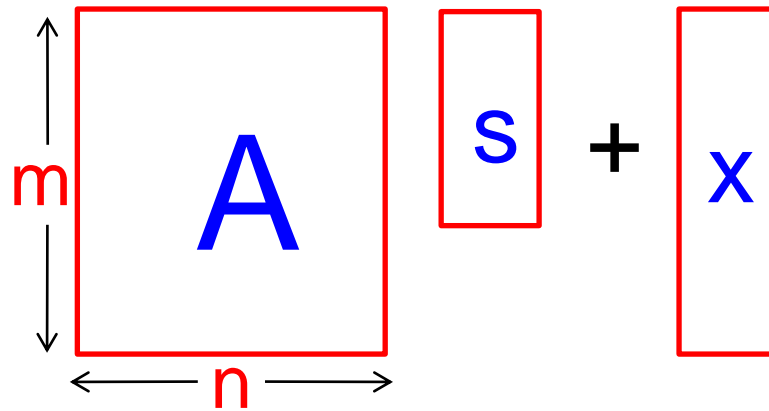
The **LWE** assumption is robust to **auxiliary input leakage**:
It degrades proportional to leakage size

Learning with Errors (LWE)

[Regev2005]

LWE_{n,m,q,χ} **Assumption:** $(A, As+x) \approx (A, U)$

where $s \in_R \mathbb{Z}_q^n$, $A \in_R \mathbb{Z}_q^{m \times n}$, and $x \leftarrow \chi^m$,



- Decision to search reduction **Usually:** χ is discrete Gaussian distribution
- Can be reduced to the **worst-case** hardness of approximating shortest vector in lattice [Regev05, Peikert09]

Robustness of LWE

Thm: $(A, As+x) \approx (A, U)$

where $s \in \{0,1\}^n$ is **weak source** with min-entropy k ,

$A \in_R \mathbb{Z}_q^{m \times n}$, $x \leftarrow \chi^m$, and $q = \text{super-poly}(n)$,

assuming **LWE** _{$k/(\log q), m, q, \chi'$}

std dev is super-poly small

Thm: $(A, As+x) \approx (A, U)$

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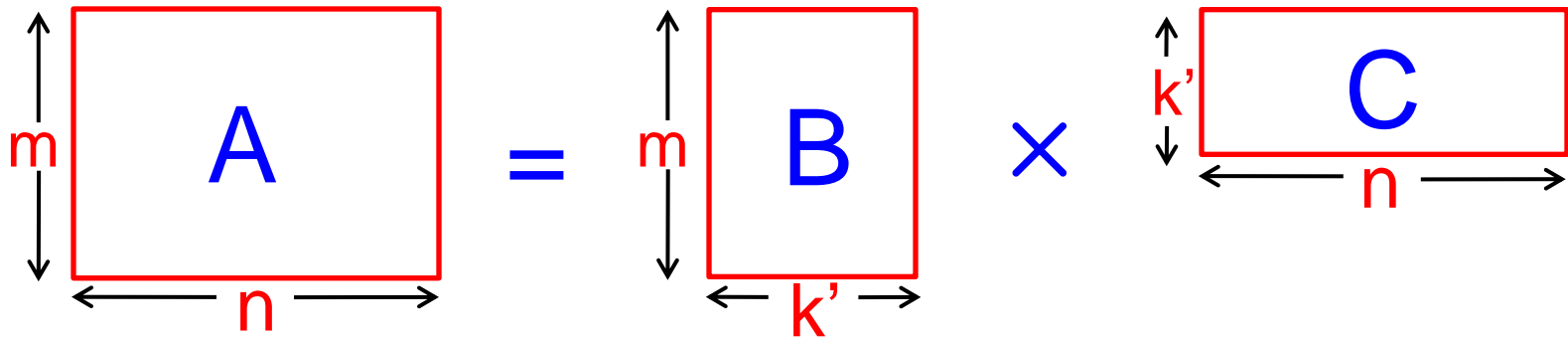
Thm: $(A, As+x) \approx (A, U)$

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$A \in_R \mathbb{Z}_q^{m \times n}$, $x \leftarrow \chi^m$, and $q = \text{super-poly}(n)$,

assuming $\text{LWE}_{k/(\log q), m, q, \chi}$

Proof: Suppose



$$As+x = BCs+x = Bu+x \approx U$$

Leftover hash lemma
 $k' < k/\log q$

$\text{LWE}_{k', m, q, \chi}$

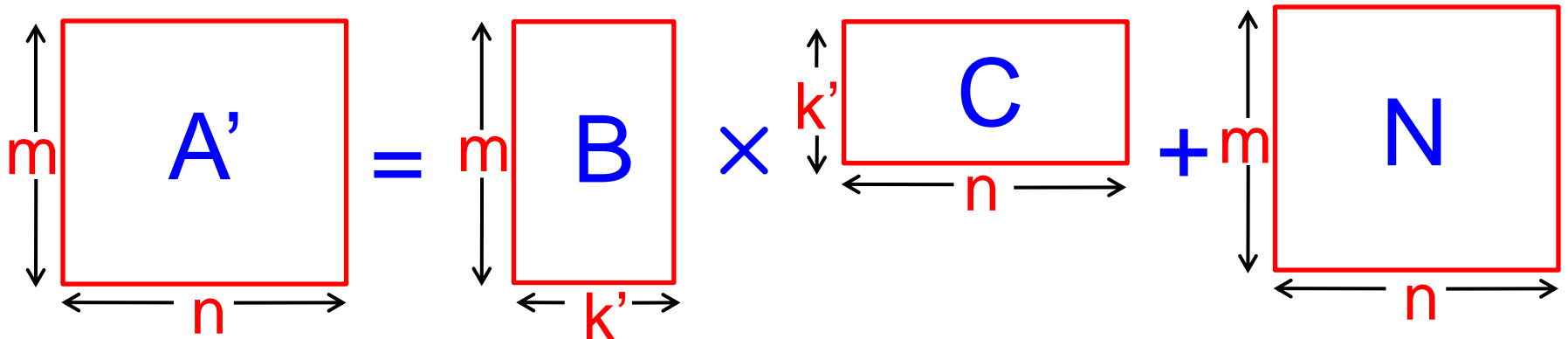
Thm: $(A, As+x) \approx (A, U)$

where $s \in \{0,1\}^n$ is **weak source** with min-entropy k ,

$A \in_R \mathbb{Z}_q^{m \times n}$, $x \leftarrow \chi^m$, and $q = \text{super-poly}(n)$,

Assuming $\text{LWE}_{k/\log, m, q, \chi}$

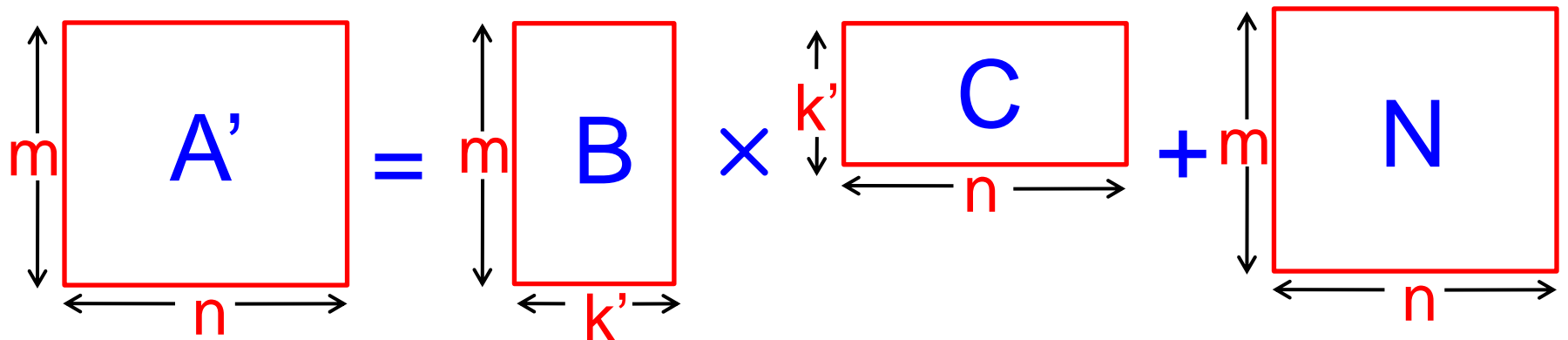
Proof: Let



Claim1: $A' \approx A$ assuming $\text{LWE}_{k', m, q, \chi'}$

Claim2: $(A', A's+x) \approx (A', U)$ assuming $\text{LWE}_{k', m, q, \chi}$

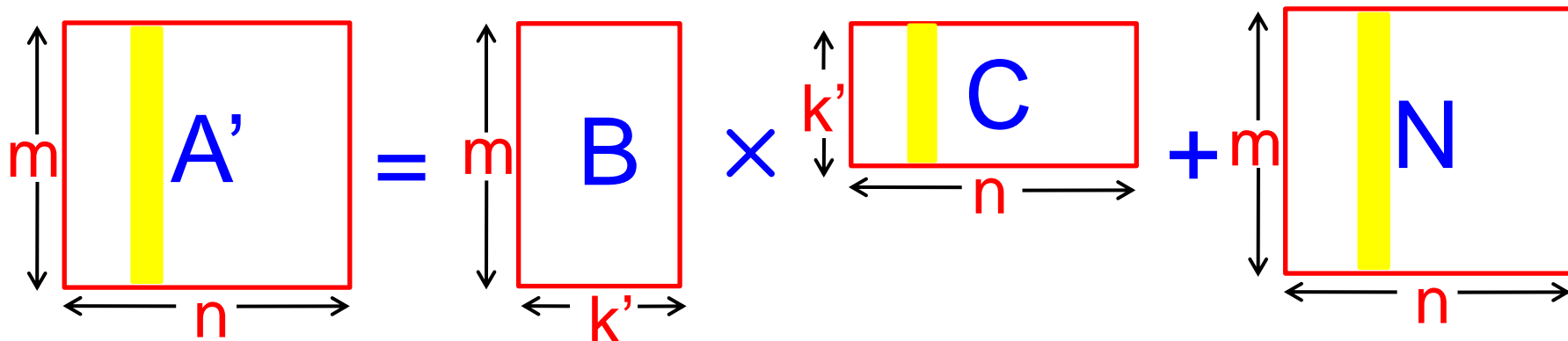
Proof: Let



Claim1: $A' \approx A$ assuming $LWE_{k',m,q,\chi'}$

Claim2: $(A', A's+x) \approx (A', U)$ assuming $LWE_{k',m,q,\chi}$

Proof: Let



Claim1: $A' \approx A$ assuming $\text{LWE}_{k',m,q,\chi'}$

Claim2: $(A', A's+x) \approx (A', U)$ assuming $\text{LWE}_{k',m,q,\chi}$

$$A's+x = (BC+N)s+x = BCs+Ns+x \equiv BCs+x \equiv Bu+x \approx U$$

$Ns+x \equiv x$, since $x \gg Ns$:
 x is Gaussian with std deviation
 super-poly(n) larger than N

$k' < k/\log q$



The Encryption Scheme

Secret key: $s \in_R \{0,1\}^n$

$x \leftarrow \chi^m$
is Gaussian

Enc. Alg: $\text{Enc}_s(M) = (A, As + x + (q/2)M)$

The scheme is **independent** of
leakage parameters

$\text{Ecc}(M) \in \{0,1\}$

Dec. Alg : $\text{Dec}_s(A,y) = \text{decode}(y - As)$

Summary

Thm: LWE problem is hard even with **weak secrets**, and hardness decays proportional to leakage

even with
auxiliary input

Corollary: Symmetric encryption scheme secure w.r.t. **auxiliary input leakage** under LWE, where efficiency of the scheme is **independent** of maximum anticipated leakage.

Corollary [Canetti-K-Mayank-Wich2010]: (distributional) obfuscation for point function with multi-bit output under standard LWE.

Thanks !