# Lattice-Based Cryptography 

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## Agenda

(1) Foundations: lattice problems, SIS/LWE and their applications
(2) Ring-Based Crypto: NTRU, Ring-SIS/LWE and ideal lattices
(3) Practical Implementations: BLISS, NewHope, Frodo, HElib, $\Lambda \circ \lambda, \ldots$
(4) Along the Way: open questions, research directions

## Foundations

## Lattice-Based Cryptography



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- Efficient: linear, embarrassingly parallel operations
- Resists quantum attacks (so far)
- Security from mild worst-case assumptions
- Solutions to 'holy grail' problems in crypto: FHE and related


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- Basis $\mathbf{B}=\left\{\mathbf{b}_{1}, \ldots, \mathbf{b}_{m}\right\}$ :

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## Hard Lattice Problems

- Find/detect 'short' nonzero lattice vectors: (Gap)SVP ${ }_{\gamma}$, SIVP $_{\gamma}$
- For $\gamma=\operatorname{poly}(m)$, solving appears to require $2^{\Omega(m)}$ time (and space).


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\left(\begin{array}{c}
\mid \\
a_{1} \\
\mid
\end{array}\right)
$$


$\in \mathbb{Z}_{q}^{n}$

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- Goal: find nontrivial $z_{1}, \ldots, z_{m} \in\{0, \pm 1\}$ such that:

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\mid \\
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## Collision-Resistant Hash Function

- Set $m>n \log _{2} q$. Define 'shrinking' $f_{\mathrm{A}}:\{0,1\}^{m} \rightarrow \mathbb{Z}_{q}^{n}$

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f_{\mathrm{A}}(\mathrm{x})=\mathbf{A} \mathbf{x}
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- Collision $\mathbf{x}, \mathbf{x}^{\prime} \in\{0,1\}^{m}$ where $\mathbf{A x}=\mathbf{A} \mathbf{x}^{\prime} \ldots$
$\ldots$ yields solution $\mathbf{z}=\mathbf{x}-\mathbf{x}^{\prime} \in\{0, \pm 1\}^{m}$.
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- $\mathbf{A} \in \mathbb{Z}_{q}^{n \times m}$ defines a ' $q$-ary' lattice:

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\mathcal{L}^{\perp}(\mathbf{A})=\left\{\mathbf{z} \in \mathbb{Z}^{m}: \mathbf{A} \mathbf{z}=\mathbf{0}\right\}
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## Worst-Case to Average-Case Reduction [Ajtai'96,...]

Finding 'short' $(\|\mathbf{z}\| \leq \beta \ll q)$ nonzero $\mathbf{z} \in \mathcal{L}^{\perp}(\mathbf{A})$
(for uniformly random $\mathbf{A} \in \mathbb{Z}_{q}^{n \times m}$ )
$\Downarrow$
solving $\operatorname{GapSVP}_{\beta \sqrt{n}}, \operatorname{SIVP}_{\beta \sqrt{n}}$ on any $n$-dim lattice

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- Verify $(\mathbf{A}, \mu, \mathbf{z})$ : check that $\mathbf{A} \mathbf{z}=H(\mu)$ and $\mathbf{z}$ is sufficiently short.


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- Verify $(\mathbf{A}, \mu, \mathbf{z})$ : check that $\mathbf{A z}=H(\mu)$ and $\mathbf{z}$ is sufficiently short.
- Security: forging a signature for a new message $\mu^{*}$ requires finding short $\mathbf{z}^{*}$ s.t. $\mathbf{A} \mathbf{z}^{*}=H\left(\mu^{*}\right)$. This is SIS: hard!


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- Search: find secret $\mathrm{s} \in \mathbb{Z}_{q}^{n}$ given many 'noisy inner products'

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\begin{array}{ll}
\mathbf{a}_{1} \leftarrow \mathbb{Z}_{q}^{n} & , \quad b_{1} \approx\left\langle\mathbf{s}, \mathbf{a}_{1}\right\rangle \bmod q \\
\mathbf{a}_{2} \leftarrow \mathbb{Z}_{q}^{n}, & b_{2} \approx\left\langle\mathbf{s}, \mathbf{a}_{2}\right\rangle \bmod q
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## LWE is Hard

( $n / \alpha$ )-approx worst case lattice problems

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& \text { case } \leq \text { search-LWE } \leq{ }_{\zeta} \text { decision-LWE } \leq \text { crypts } \\
& \text { (quantum }\left[\mathrm{R}^{\prime} 05\right] \text { ) } \quad\left[\mathrm{BFKL} \mathrm{~K}^{\prime} 93, \mathrm{R}^{\prime} 05, \ldots\right]
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- Also fully classical reductions, for worse params [Peikert'09,BLPRS'13]


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!!! Fully Homomorphic Encryption
!!! Attribute-Based Encryption for arbitrary policies and much, much more...

## Key Exchange from LWE [Regev'05,LP'11]

## $\mathbf{r} \leftarrow \mathbb{Z}^{n}$ (error)


$s \leftarrow Z_{s}^{n}$ (error)

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\begin{aligned}
& 0 \\
& \mathbf{r} \leftarrow \mathbb{Z}^{n} \text { (error) } \\
& \mathbf{r}^{t} \cdot \mathbf{v} \approx \mathbf{r}^{t} \mathbf{A s} \\
& k \approx \mathbf{u}^{t} \cdot \mathbf{s} \approx \mathbf{r}^{t} \mathbf{A} \mathbf{s}
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$\overline{1}$
$(\mathbf{A}, \mathbf{u}, \mathbf{v}, k)$

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## Efficiency from Rings

## SIS/LWE are (Sort Of) Efficient

$$
\left(\cdots \mathbf{a}_{i} \cdots\right)\left(\begin{array}{c}
\vdots \\
\mathrm{s} \\
\vdots
\end{array}\right)+e_{i}=b_{i} \in \mathbb{Z}_{q}
$$

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- Cryptosystems have rather large keys:



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## Wishful Thinking. . .

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\vdots
\end{array}\right) \star\left(\begin{array}{c}
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- Get $n$ pseudorandom scalars from just one (cheap) product operation?
- Replace $\mathbb{Z}_{q}^{n \times n}$-chunks by $\mathbb{Z}_{q}^{n}$.


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Fast and practical with FFT: $n \log n$ operations $\bmod q$.

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- Same ring structures used in NTRU cryptosystem [HPS'98], compact one-way / CR hash functions [Mic'02,PR'06,LM'06,...]


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- Decision: distinguish $\left(a_{i}, b_{i}\right)$ from uniform $\left(a_{i}, b_{i}\right) \in R_{q} \times R_{q}$ (with noticeable advantage)


## Hardness of Ring-LWE [LyubashevskyPeikertRegev' 10]

- Two main theorems (reductions):
worst-case approx-SVP on ideal lattices in $R$
$\leq_{\nwarrow}$ search $R$-LWE $\leq_{\tau}$ decision $R$-LWE
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## decision $R$-LWE $\leq$ lots of crypto

* If you can break the crypto, then you can distinguish $\left(a_{i}, b_{i}\right)$ from $\left(a_{i}, b_{i}\right) \ldots$


## Ideal Lattices

- Say $R=\mathbb{Z}[X] /\left(X^{n}+1\right)$ for power-of-two $n$.
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Error distribution is Gaussian in canonical embedding.

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## (Approximate) Shortest Vector Problem

- Given (an arbitrary basis of) an arbitrary ideal $\mathcal{I} \subseteq R$, find a nearly shortest nonzero $a \in \mathcal{I}$.


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$\star$ There is a $2^{\Omega(\sqrt{n} / \log n)}$ barrier for the main technique. Can it be circumvented?


## Implementations

## Key Exchange

- NewHope [ADPS'15]: Ring-LWE key exchange a la [LPR'10,P'14], with many optimizations and conjectured $\geq 200$-bit quantum security.


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About $10 x$ slower than NewHope, but only $\approx 2 x$ slower than ECDH.

## Digital Signatures

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- Compelling efficiency:

| System | Sig (Kb) | PK (Kb) | KSign/sec | KVer/sec |
| :---: | :---: | :---: | :---: | :---: |
| RSA-4096 | 4.0 | 4.0 | 0.1 | 7.5 |
| ECDSA-256 | 0.5 | 0.25 | 9.5 | 2.5 |
| BLISS | 5.6 | 7.0 | 8.0 | 33 |

(Conjectured $\geq 128$ bits of security, openssl implementations.)

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Focuses on modularity, safety, and consistency with best theory.

## Conclusions

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## Thanks!

