## A Too $\lambda \kappa$ it for $\mathbf{R} \mathbf{i} \nu \gamma-\Lambda \Omega \mathbf{E} \kappa \rho \mathbf{y} \pi \tau \sigma \gamma \rho \alpha \phi$

Vadim Lyubashevsky ${ }^{1}$ Chris Peikert ${ }^{2}$<br>${ }^{1}$ INRIA \& ENS Paris<br>${ }^{2}$ Georgia Tech<br>${ }^{3}$ Courant Institute, NYU

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Eurocrypt 2013
27 May

## A Toolkit for Ring-LWE Cryptography

Vadim Lyubashevsky¹

Oded Regev ${ }^{3}$
${ }^{1}$ INRIA \& ENS Paris
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## Lattice- and Ring-Based Cryptography

- Offers worst-case hardness [Ajtai'96,...], asymptotic efficiency \& parallelism, and (apparent) quantum resistance.


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* Signatures [LM'08,GPV'08,L'09,CHKP'10,B'10,GKV'10,BF'11ab,L'12,...]
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- Most modern schemes are based on the SIS/LWE problems [A'96,R'05] and/or their ring variants [M'02,PR'06,LM'06,LPR'10].

X SIS/LWE aren't quite practical: $\Omega\left(n^{2}\right)$ key sizes and runtimes
$\checkmark$ Ring-based primitives are! $\tilde{O}(n)$ complexity

## LWE Over Rings, Over-Simplified [LPR'10]

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("Expansion factor" $\sqrt{n}$ is worst-case, often quite loose.)

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Note: $\Phi_{m}(X)$ divides $\left(X^{m}-1\right)$, has degree $n=\varphi(m)=\operatorname{deg}\left(\Phi_{m}\right)$.
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$\checkmark$ Ring-LWE (appropriately defined) is hard in any cyclotomic [LPR'10]
... assuming problems on ideal lattices are quantum-hard in the worst case.


## The Form of Cyclotomic Polynomials

- For prime $p$,

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## Yuck!!!

X Irregular $\Phi_{m}(X)$ induces cumbersome, slower operations modulo $\Phi_{m}(X)$
$X$ Large expansion factors - up to super-polynomial $n^{\omega(1)}$ [Erdős'46]
x Provable \& concrete security also degrade with expansion factor: pay twice!

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Fast Algorithms: ring operations (,$+ \cdot$ ); noise generation \& decoding; conversions among the best representations for each task. $\Longrightarrow$ Runtimes: $O(n)$ per prime divisor of $m$, or $O(n \log n)$.

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(3) Use decoding basis of dual ideal $R^{\vee}$ for noise generation \& decoding.
$\checkmark$ Corresponds to the "true" definition of ring-LWE.

## Tensorial Decomposition and the "Powerful" Basis

- Recall: $\Phi_{p}(X)=1+X+\cdots+X^{p-1}$ and $\Phi_{p^{e}}(X)=\Phi_{p}\left(X^{p^{e-1}}\right)$.


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## Ancient Theorem [Kummer, 1840s]

- Let $m=\prod_{\ell} m_{\ell}$ be the prime-power factorization of $m$.

Then the $m$ th cyclotomic ring $R=\mathbb{Z}[X] / \Phi_{m}(X)$ is isomorphic to the tensor product of all the $m_{\ell}$ th cyclotomic rings:

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- It is not the "power" basis $\left\{1, X, X^{2}, \ldots, X^{\varphi(m)-1}\right\}$ of $\mathbb{Z}[X] / \Phi_{m}(X)$.
E.g., for $m=15$ it's $\left\{X^{j}\right\}$ for $j \in\{0,3,5,6,8,9,11,14\}$.


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E.g.: powerful basis is better-conditioned than power basis.

## Geometry of the Ring

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$\checkmark$ Ring-LWE is provably hard with (spherical) Gaussian noise under $\sigma$.

## Dual Ideal $R^{\vee}$ and Decoding Basis

- $R=\mathbb{Z}[X] / \Phi_{p}(X)$ under embedding $\sigma$ is a lattice in $\mathbb{C}^{p-1}$.

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- $R^{\vee}$ is a (fractional) ideal, and $p R^{\vee} \subseteq R \subseteq R^{\vee}$, with $p R^{\vee} \approx R$.

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- By contrast, such optimal decoding is not possible for $R / q R$, because $R^{\vee}$ lacks optimally short elements for its density.
- Bottom line: using $R^{\vee}$ is actually beneficial in applications!
(And "advanced" applications benefit even more from its algebraic properties.)


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## Thanks!

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