

Euclidean lattices in cryptography

Alice Pellet--Mary

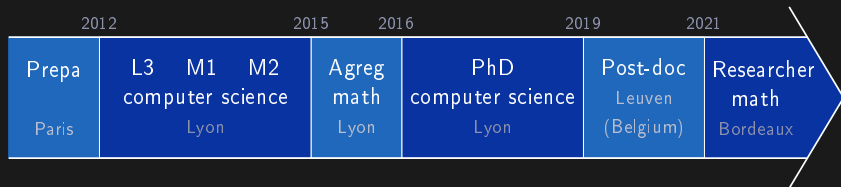
CNRS and Université de Bordeaux

MARGAUx PhD days
Bordeaux

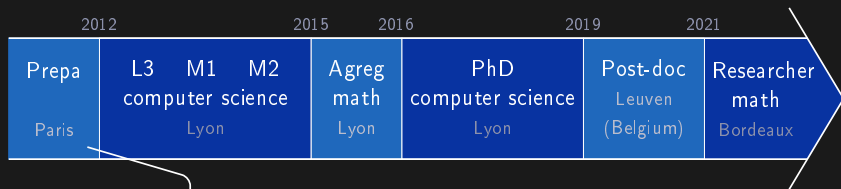


université
de **BORDEAUX**

What I did until now



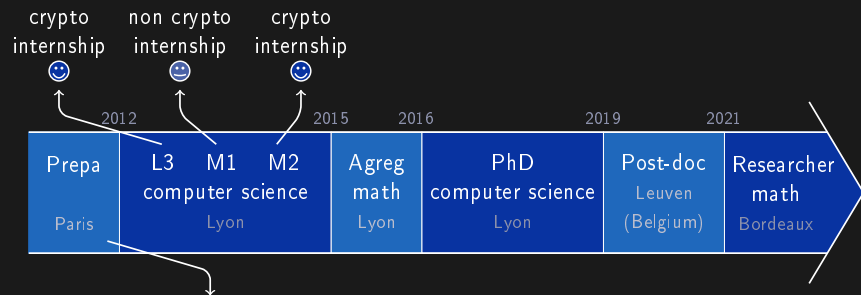
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“If you want to do research, go for
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math teacher

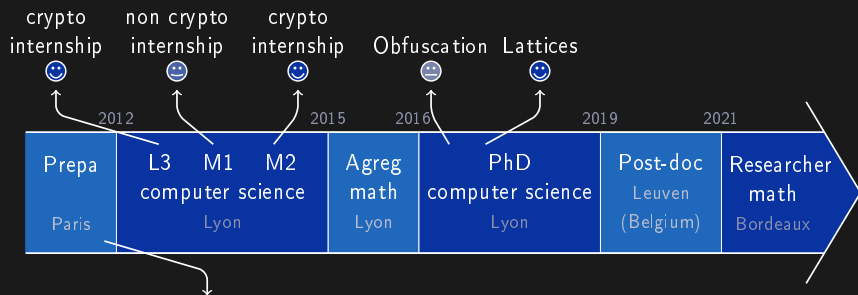
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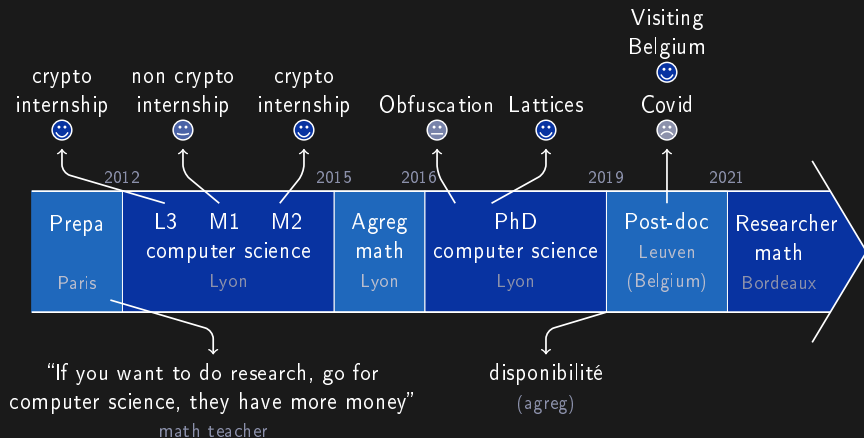
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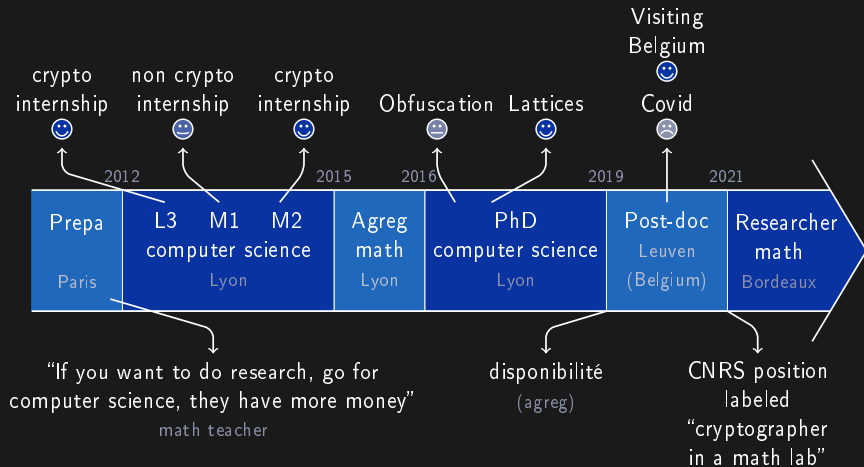
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What I did until now



What I did until now



Cryptography



(Cryptology =) Cryptography = science of secrets

Examples: encryption, signatures, homomorphic encryption, e-voting ...

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A cryptographic **primitive** is mathematically defined by

- ▶ some **correctness** properties
- ▶ some **security** properties
 - ▶ need to model the attacker

Encryption: symmetric

Alice

$s \in \mathbb{Z}$

Bob

$s \in \mathbb{Z}$

Encryption: symmetric

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$$s \in \mathbb{Z}$$

$$c = \text{Enc}(m, s)$$

(message $m \in \{0, 1\}$)

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Correctness:

$$\forall m \in \{0, 1\}, \text{Dec}(\text{Enc}(m, s), s) = m$$

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$$\forall m \in \{0, 1\}, \text{Dec}(\text{Enc}(m, s), s) = m$$

Security: (against chosen plaintext attacks)

for any polynomial time algorithm \mathcal{A} ,

$$\Pr_{m \leftarrow \mathcal{U}(\{0, 1\})} (\mathcal{A}(\text{Enc}(m, s)) = m) = 1/2 + \varepsilon$$

(usually require $|\varepsilon| \leq 2^{-128}$)

Encryption: asymmetric [DH76, RSA78]

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\xleftarrow{pk}

$sk, pk \in \mathbb{Z}$

[DH76] Diffie, Hellman. New Directions in Cryptography.

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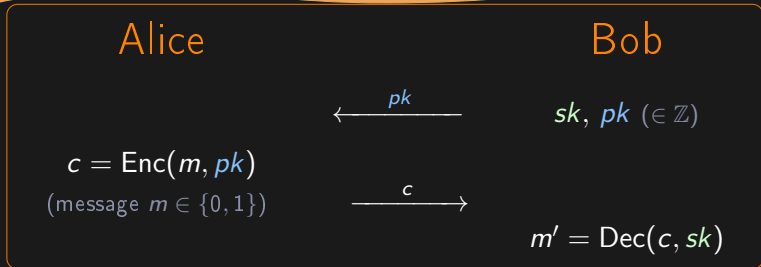
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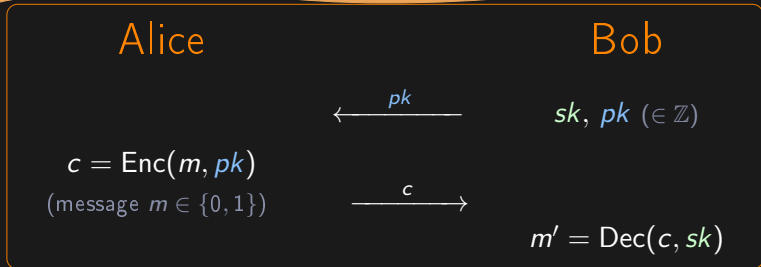
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Definition: an algorithmic problem is **hard** if there is no algorithm solving it
in **polynomial time**

Foundation of asymmetric cryptography

Cryptographic primitives

asymmetric
encryption

signature

homomorphic
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...

error correcting codes

lattices

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My research: classify lattice problems

Lattice
problem 1

Lattice
problem 2

Lattice
problem 3

Lattice
problem 4

My research: classify lattice problems

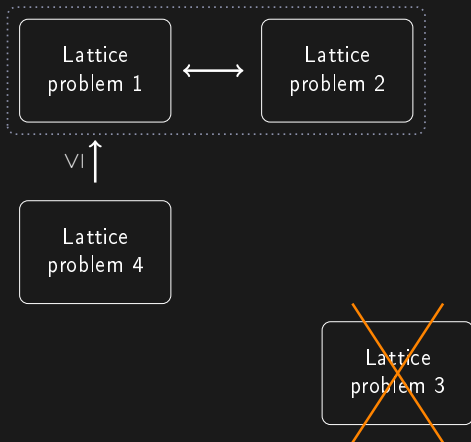
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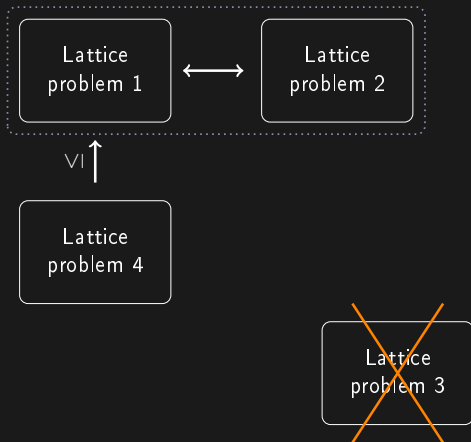
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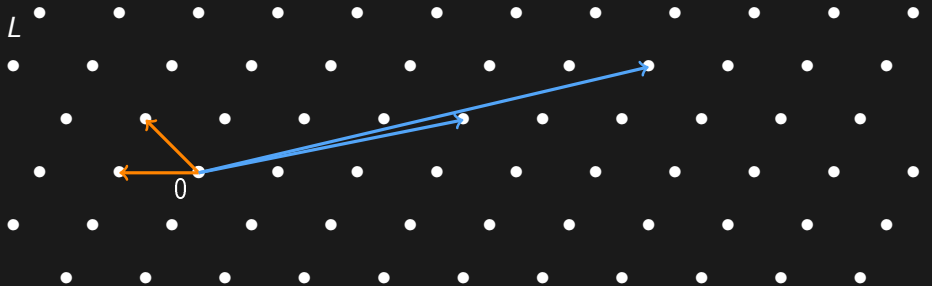
Tools:

- ▶ algorithms
- ▶ number theory
- ▶ a little programming
(just toy examples)

Lattices and algorithmic problems



Lattices

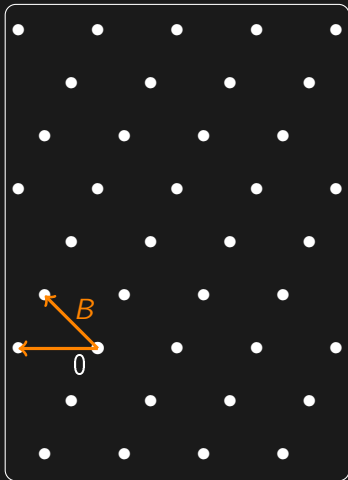


- ▶ $L = \{Bx \mid x \in \mathbb{Z}^n\}$ is a lattice
- ▶ $B \in GL_n(\mathbb{R})$ is a basis
- ▶ n is the dimension of L

Representing a lattice

Representation of a lattice L :

a basis $B \in \mathbb{Z}^{n \times n}$ of L



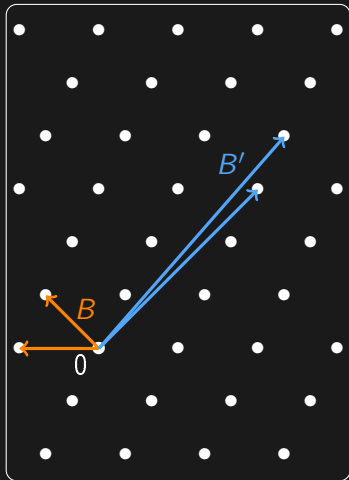
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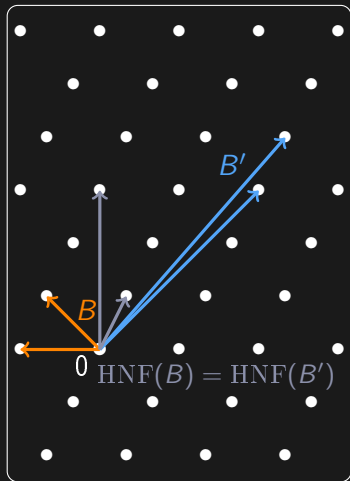
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Solution: take the Hermite Normal Form (HNF) of any B

- ▶ it is unique ($\text{HNF}(B) = \text{HNF}(B')$)
- ▶ it is efficiently computable



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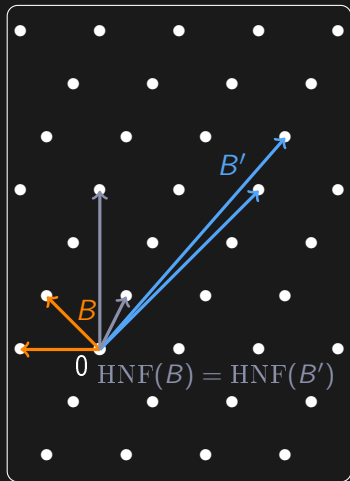
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⇒ canonical representation of L
(i.e., worse basis ever)



Algorithmic problems



SVP : Shortest Vector Problem
(input: HNF basis of L)

CVP : Closest Vector Problem
(input: HNF basis of L and target t)

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Supposedly **hard** to solve when n is large
(even with a **quantum** computer)

How hard is SVP/CVP?

In theory: best algorithm has asymptotic complexity $2^{c \cdot n + o(n)}$
(for some $c \approx 0.292$, or $c \approx 0.265$ for quantum computers [Laa15])

\Rightarrow not polynomial

[Laa15] Laarhoven. Search problems in cryptography.

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- ▶ from $n = 500$ to $n = 1000 \rightsquigarrow$ cryptography

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The zoo of lattice problems

Exact solution

- ▶ find a shortest vector

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- ▶ find a vector $\leq \gamma$

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Worst-case

- ▶ find a short vector in any possible input lattice L

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Average-case

- ▶ find a short vector with good probability (when L is random)

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Plain lattices

- ▶ find a short vector in a lattice over \mathbb{Z}

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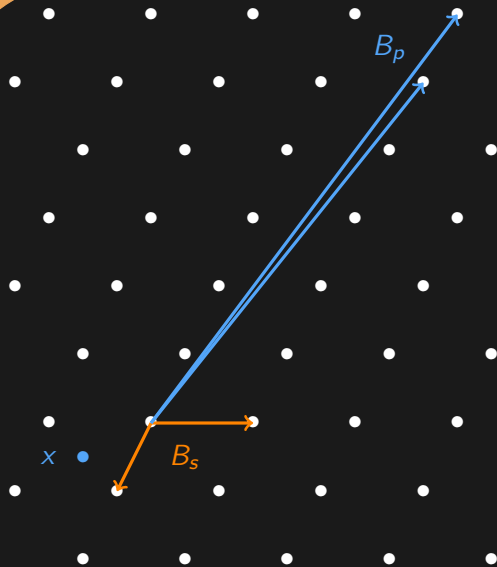
Algebraic lattice

- ▶ find a short vector in a lattice over \mathcal{O}_K (ring of integers of number field K)

Digression: building cryptography from lattices



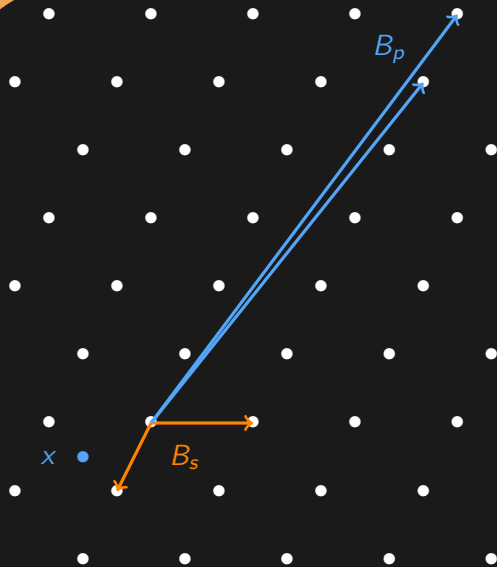
Asymmetric encryption from lattices



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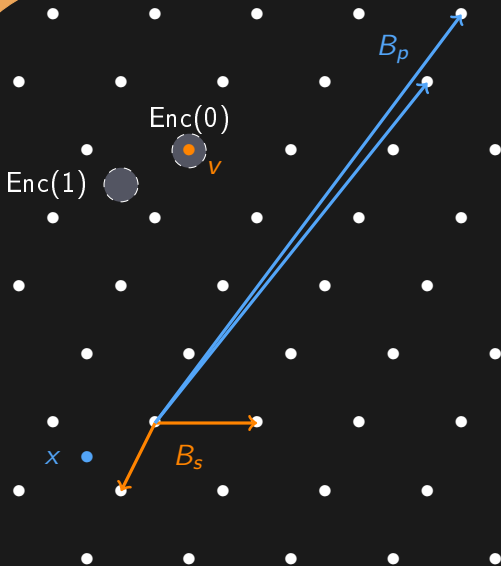


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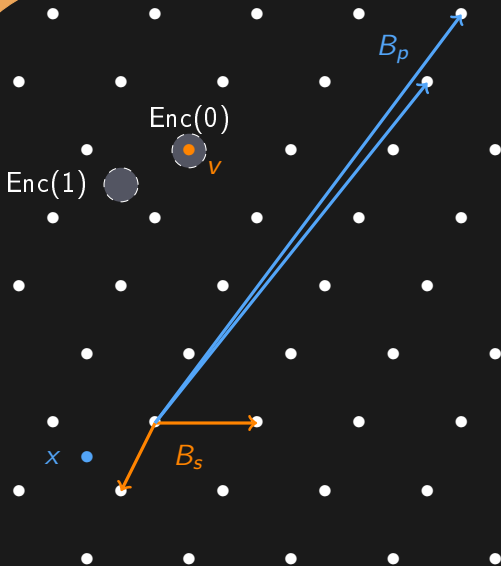
$$\text{sk} = B_s$$

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Encryption(m, pk):

- ▶ sample random $v \in L$
- ▶ sample small $e \in \mathbb{R}^n$
- ▶ return $c = v + e + m \cdot x$

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- ▶ sample random $v \in L$
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Decryption(c, sk):

- ▶ find $w \in L$ closest to c
- ▶ if c is very close to w , return $m = 0$
- ▶ otherwise return $m = 1$

Theorem

The encryption construction is correct and secure assuming that the problem decision-CVP is hard.

decision-CVP: given the HNF basis of L and a target t , decide whether t is close to a point of L or not.

The LLL algorithm

Lovász local lemma

Let Ω be a probability space, $\mathcal{A} = \{A_1, \dots, A_k\}$ events in Ω .

Suppose $P(A_i) \leq p < 1 \forall i$, and $\#\{B \in \mathcal{A} \mid B, A_i \text{ not independent}\} \leq d, \forall i$.

If $ep(d+1) \leq 1$, then $P\left(\bigcap_{i=1}^k \bar{A}_i\right) > 0$

Where $\bar{A}_i = \Omega \setminus A_i$ and $e = 2.718\dots$ is the Euler's number

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MathType

The LLL algorithm

- ▶ runs in polynomial time
- ▶ finds a vector $v \in L$ with $\|v\|_2 \leq 2^n \cdot \lambda_1(L)$ ($\lambda_1(L) = \min_{\substack{w \in L \\ w \neq 0}} \|w\|_2$)

Dimension 2: Lagrange-Gauss algorithm

video

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video

Theorem: the algorithm

- ▶ finds a **shortest vector** of L
- ▶ runs in **polynomial time**

Larger dimension: LLL algorithm

Input: basis $B = (b_1, \dots, b_n)$

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This algorithm

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- ▶ does not run in polynomial time

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Algorithm:

- ▶ while there exist i such that $\|b_i\|_2 > 4/3 \cdot \lambda_1(L_i)$
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 - ▶ run Lagrange-Gauss on L_i

This algorithm

- ▶ finds $v \in L$ with $\|v\|_2 \leq 2^n \cdot \lambda_1(L)$
- ▶ runs in polynomial time

LLL over a number field?

Can we adapt LLL to lattices over \mathcal{O}_K ?

[LPSW19] Lee, Pellet-Mary, Stehlé, Wallet. An LLL algorithm for module lattices.

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\Rightarrow we obtain LLL over \mathcal{O}_K but not polynomial time anymore

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Take-away: crypto is fun!

(It is a good way to do nice math and have fun)

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- ▶ we are hiring a 2 years post-doc working on algebraic lattices
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(Tip: very useful to keep a “stagiaire de 3eme” busy for a few hours)

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