### Open problems in applications of Fourier learning to the Diffie-Hellman problem in finite fields

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# Outline

- Hardcore bits
- Goldreich-Levin algorithm
- Decoding linear codes
- Fourier learning
- Applications revisited
- Open questions

#### Big thanks to Barak Shani and Joel Laity.

# Some papers on elliptic curve bit security

- Dan Boneh and Igor Shparlinski. On the unpredictability of bits of elliptic curve Diffie- Hellman scheme. CRYPTO 2001.
- David Jao, Dimitar Jetchev and Ramarathnam Venkatesan: On the Bits of Elliptic Curve Diffie-Hellman Keys. INDOCRYPT 2007.
- Dimitar Jetchev and Ramarathnam Venkatesan: Bits Security of the Elliptic Curve Diffie-Hellman Secret Keys. CRYPTO 2008.

## Applications of Fourier Learning in Cryptography

- Daniel Bleichenbacher. On The Generation of One-Time Keys in DL Signature Schemes. Talk, 2000.
- Adi Akavia, Shafi Goldwasser and Shmuel Safra: Proving Hard-Core Predicates Using List Decoding. FOCS 2003.
- Adi Akavia: Solving Hidden Number Problem with One Bit Oracle and Advice. CRYPTO 2009.
- Paz Morillo and Carla Ràfols: The Security of All Bits Using List Decoding. PKC 2009.
- Daniele Micciancio and Petros Mol: Pseudorandom Knapsacks and the Sample Complexity of LWE Search-to-Decision Reductions. CRYPTO 2011.

### Applications of Fourier Learning in Cryptography

- Alexandre Duc and Dimitar Jetchev: Hardness of Computing Individual Bits for One-Way Functions on Elliptic Curves. CRYPTO 2012.
- Nelly Fazio, Rosario Gennaro, Irippuge Milinda Perera and William
   E. Skeith III: Hard-Core Predicates for a Diffie-Hellman Problem over Finite Fields. CRYPTO (2) 2013.
- Elke De Mulder, Michael Hutter, Mark E. Marson and Peter Pearson. Using Bleichenbacher's Solution to the Hidden Number Problem to Attack Nonce Leaks in 384-Bit ECDSA, CHES 2013.
- Diego F. Aranha, Pierre-Alain Fouque, Benot Grard, Jean-Gabriel Kammerer, Mehdi Tibouchi and Jean-Christophe Zapalowicz: GLV/GLS Decomposition, Power Analysis, and Attacks on ECDSA Signatures with Single-Bit Nonce Bias. Asiacrypt 2014.

Can these works tell us anything interesting about the DLP in finite fields?

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#### So what is this all about?

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#### Hardcore bits

- Let  $f : X \to Y$  be a one-way function.
- This means: Given x one can efficiently compute y = f(x), but given y it is computationally infeasible to find x ∈ X such that f(x) = y.
- By definition, given f(x) one cannot efficiently deduce x.
   But, given f(x) it might be possible to compute some partial information about x.

Let 
$$X = \{0, 1\}^n$$
 and  $\underline{x} = (x_1, \dots, x_n) \in X$ .  
Define  $\operatorname{bit}_i(\underline{x}) = x_i$ .

#### Hardcore bits

• Let  $f : X \to Y$  be a one-way function.

■ We say the *i*-th bit is **easy** for *f* if, given *f*(<u>x</u>), one can compute the value bit<sub>i</sub>(<u>x</u>) with probability significantly better than guessing.

(I assume the values  $\underline{x}$  are sampled uniformly in the game.)

It is immediate that a one-way function has many bits that are not easy.

We call such bits **hardcore bits** for f.

• The problem is to prove that a specific bit is hardcore.

## Proof technique

- To show  $bit_i(x)$  is hardcore one argues as follows:
- Suppose one has an algorithm/oracle that on input any y ∈ Y outputs with high probability the correct value of bit<sub>i</sub>(x) where y = f(x).
- Suppose one is also given a challenge  $y^* = f(x^*)$ .
- Then one constructs an efficient algorithm that computes x\* by making oracle queries to the algorithm.

### Proof technique

- When *f* is "algebraic" and the oracle is always correct then this is easy.
- For example, suppose  $f(x) = g^x \pmod{p}$  where g has odd prime order r.
- Let O be an oracle such that O(y) returns  $bit_0(x)$ .

• Let 
$$y^* = g^{x^*}$$
 be the challenge.

• Calling  $O(y^*)$  gives  $x_0^*$ .

Now set

$$y = (y^*g^{-x_0^*})^{2^{-1} \pmod{r}}$$

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• Calling O(y) gives  $x_1^*$ .

The process repeats in the obvious way.

#### Hardcore bits

- This approach generalises to functions other than bits.
- Let  $g: X \to Z$  be some function.
- Then one can talk about whether g(x) is hardcore.
- For example  $g(x_1, \ldots, x_n) = (x_1, \ldots, x_k)$  for some 1 < k < n.
- One is arguing that it is hard to compute the first *k* bits of *x*.
- This is a weaker notion: It might be hard to compute the first k bits of x, but that does not imply it is hard to compute the first bit of x.

### Ancient history

- The big challenge is to handle oracles that are not correct all the time.
- First case of interest was hardcore bits for RSA.
- Goldwasser, Micali and Tong (FOCS 1982): least significant bit of RSA is hardcore if oracle is correct with probability 1 – 1/log<sub>2</sub>(N).

In other words, make about  $\log_2(N)$  oracle queries and only one of them is wrong.

- Ben Or, Chor and Shamir (STOC 1983): least significant bit of RSA is hardcore if oracle is correct with probability 3/4 + ε.
- Alexi, Chor, Goldreich and Schnorr (1988): handles oracle that is correct with probability  $1/2 + \epsilon$ .
- None of these papers discuss Fourier analysis.

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### A general solution

- Goldreich, Levin (1989) gave a construction to derive a hardcore bit for any one-way function.
- Idea: Let  $X = \mathbb{F}_2^n$ . Given  $\underline{x} \in X$  one chooses  $\underline{t} \in X$  and sends  $(\underline{t}, f(\underline{x}))$ .
- The hardcore bit is

$$\underline{t} \cdot \underline{x} = \sum_{j=1}^n t_j x_j.$$

- Idea: Let O be an oracle that, on input f(x), outputs t · x non-negligibly better than guessing.
   Using O and choosing t one can compute x.
- It was pointed out by Rackoff and Wigderson that the Goldreich-Levin algorithm is based on the Walsh transform (fourier analysis in the group F<sup>n</sup><sub>2</sub>).

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#### Elementary approach to Goldreich-Levin

- Let *O* be an oracle that, for a secret value  $\underline{x}$ , on input  $\underline{t}$  outputs  $\underline{t} \cdot \underline{x}$  non-negligibly better than guessing.
- If there are no errors: query  $O(\underline{e}_i)$  for unit vectors  $\underline{e}_i$ .
- Basic trick: Choose random  $\underline{a}$  and query  $O(\underline{a} + \underline{e}_i) O(\underline{a})$ .
- If both oracle outputs correct then have

$$(\underline{a} + \underline{e}_i) \cdot \underline{x} - \underline{a} \cdot \underline{x} = x_i.$$

- Repeat for many random <u>a</u> and take majority vote.
- **Note:** It is essential to be able to choose the inputs to *O*.

### Connection with decoding linear codes

- We are getting a lot of values  $\underline{t} \cdot \underline{x}$ , for various  $\underline{t} \in X$ , some of them with errors.
- Putting all the rows <u>t</u> together as an m × n matrix we have measurements T<u>x</u> + <u>e</u> where <u>e</u> is a length m column vector of low weight.
- Hence, can re-phrase computing <u>x</u> in terms of T being the "generator matrix" of a code and T<u>x</u> + <u>e</u> being the received "code word".

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- Hence, can re-phrase computing  $\underline{x}$  in terms of T being the "generator matrix" of a code and  $T\underline{x} + \underline{e}$  being the received "code word".
- This is of course a bit of a cheat: We are essentially choosing the generator matrix to have a special structure.

#### Fourier Analysis on Finite Groups

- Consider  $G = \mathbb{F}_2^n$ , a finite additive group of order  $2^n$ .
- The set of functions f : G → C is a C-vector space of dimension 2<sup>n</sup>.
- There is an inner product

$$\langle f,g\rangle = \frac{1}{2^n} \sum_{\underline{x}\in G} f(\underline{x}) \overline{g(\underline{x})}$$

An orthonormal basis for this set of functions is

$$\chi_{\underline{a}}(\underline{x}) = (-1)^{\underline{a} \cdot \underline{x}}$$

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where <u>a</u> runs over all elements of  $\mathbb{F}_2^n$ .

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#### Fourier analysis on finite groups

- Let  $f: G \to \mathbb{C}$  be given,  $G = \mathbb{F}_2^n$ .
- Then *f* has a Fourier expansion

$$f(\underline{x}) = \sum_{\underline{a} \in \mathbb{F}_2^n} \hat{f}(\underline{a}) \chi_{\underline{a}}(\underline{x})$$

where the Fourier coefficients are  $\hat{f}(\underline{a}) = \langle f, \chi_{\underline{a}} \rangle$ .

- Parseval's identity:  $\langle f, f \rangle = \sum_{\underline{a} \in G} \hat{f}(\underline{a})^2$ .
- We call a character <u>*x<sub>a</sub>*</u> heavy if |*f*(<u>a</u>)| is relatively large with respect to ⟨*f*, *f*⟩.
- Parseval implies there cannot be many heavy Fourier coefficients.
- f(x) is called concentrated if it has some heavy Fourier coefficients.

### Lemma

• Let 
$$f : \mathbb{F}_2^n \to \{1, -1\}$$
 be such that  
 $f(\underline{x}) = (-1)^{\underline{x} \cdot \underline{s}} = \chi_{\underline{s}}(\underline{x})$   
for all  $\underline{x} \in X \subseteq \mathbb{F}_2^n$ , and  
 $f(\underline{x}) = (-1)^{\underline{x} \cdot \underline{s}+1} = -\chi_{\underline{s}}(\underline{x})$   
for all  $\underline{x} \in \overline{X} = \mathbb{F}_2^n \setminus X$ .  
• Let  $|X| = \delta 2^n$ .  
• Then  $\langle f, f \rangle = 1$  and  $\hat{f}(\underline{s}) = 2\delta - 1$ .

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### Fourier approach to Goldreich-Levin

• Let  $G = \mathbb{F}_2^n$  and fix  $\underline{s} \in G$ .

- Let  $f(\underline{t}): G \to \{-1, 1\}$  be such that on  $1/2 + \delta$  of the inputs  $\underline{t} \in G$  we have  $f(\underline{t}) = (-1)^{\underline{t} \cdot \underline{s}}$ .
- Consider the Fourier series for  $f(\underline{t})$ .
- By the previous Lemma,  $f(\underline{t})$  is concentrated and  $\chi_{\underline{s}}$  is a heavy Fourier character.

In other words, the coefficient  $|\hat{f}(\underline{s})|$  is large.

One extends the algorithmic ideas from learning one secret <u>s</u> to learning all the heavy Fourier characters.

### List decoding connection

- Suppose f(x) is a function on G = 𝔽<sup>n</sup><sub>2</sub> which has several heavy characters s<sub>1</sub>,..., s<sub>k</sub>.
- It means f(x) and (−1)<sup>x·s<sub>j</sub></sup> agree on a large set of inputs for each 1 ≤ j ≤ k.
- We can write T again for the matrix corresponding to the function queries we will make, and represent the outputs of f (turned back from {-1,1} to {0,1}) as a codeword.
- An algorithm that computes a list of heavy coefficients  $\underline{s}_1, \ldots, \underline{s}_k$  can be viewed as a list decoding algorithm.

### Further work

- There are general algorithms to compute all heavy Fourier coefficients of any concentrated function on a finite abelian group G.
- Best paper to read to get the main ideas is Kushilevitz and Mansour (STOC 1991).
- There are improved algrithms, see recent survey paper by Gilbert, Indyk, Iwen and Schmidt.
- All these works require chosen queries to the function.

### Bit security of CDH

- Given  $g, g^a, g^b \in \mathbb{F}_p^*$  want to know what bits of  $g^{ab}$  are secure.
- So suppose one has an oracle O(g, g<sup>a</sup>, g<sup>b</sup>) that outputs some bits of g<sup>ab</sup>.
- We want to use O to compute all of  $s = g^{ab}$ .
- Idea is to choose random r and call O(g, g<sup>a</sup>, g<sup>b</sup>g<sup>r</sup>), which gives bits of g<sup>a(b+r)</sup> = s(g<sup>a</sup>)<sup>r</sup>.
- Hidden number problem: Fix s ∈ 𝔽<sup>\*</sup><sub>p</sub> and let O be an oracle such that O(t) = LSB(st). Goal is to compute s given access to O.

### Boneh-Venkatesan

- Hidden number problem: Given (t, bits(ts)) to compute  $s \in \mathbb{F}_p^*$ .
- BV consider oracle that computes the √log(p) most significant bits of the Diffie-Hellman secret s = g<sup>ab</sup>.
- Oracle is always correct.
- Multipliers t chosen randomly and non-adaptively.
- BV use lattice method.
- Lots of following work.
- Challenge: one bit, unreliable oracle.

# Fourier analysis in $\mathbb{F}_p^*$

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### Application: Bit security of CDH

- Given  $g, g^a, g^b \in \mathbb{F}_p^*$  want to prove that a single bit of  $g^{ab}$  is secure.
- Akavia et al considered function f(x) : F<sub>p</sub> → {-1,1} by f(x) = (-1)<sup>LSB(x)</sup>. One can show that this is concentrated. [Also (-1)<sup>MSB(x)</sup>.]
- Big result from CRYPTO 2009: "Solving Hidden Number Problem with One Bit Oracle and Advice".
- Idea: Translation of Fourier coefficients by s.
- Recall that we choose random r and call O(g, g<sup>a</sup>, g<sup>b</sup>g<sup>r</sup>) to get a bit of g<sup>a(b+r)</sup> = s(g<sup>a</sup>)<sup>r</sup>.

### Applications to elliptic curves

- Would like to prove certain bits are hardcore for ECDH.
- Given *P*, *aP*, *bP* want to show that if can compute some bit of *abP* then can compute all *abP*.
- Boneh and Shparlinski developed an approach.
- Suppose O is an oracle that takes (E, P, aP, bP) such that P ∈ E and computes the most significant bits of the x-coordinate of abP.

### Boneh and Shparlinski

• Trick is to consider isomorphism  $\phi: E \to E'$  of Weierstrass curves given by

$$\phi(\mathbf{x},\mathbf{y})=(\lambda^2\mathbf{x},\lambda^3\mathbf{y}).$$

- Then call  $O(E', \phi(P), \phi(aP), \phi(bP))$ .
- The secret is s = x(abP) and, for chosen λ, get bits of λ<sup>2</sup>s, which is more-or-less back to hidden number problem with chosen multipliers.
- Boneh and Shparlinski used lattice methods.
- Duc and Jetchev used Fourier methods.

### Elliptic curve Diffie-Hellman

- Changing Weierstrass models does not actually prove a hardcore bit for a fixed representation.
- I call it the "BS" trick.
- Hence, the problem of hardcore bits for ECDH is still open.
- Any ideas?

## Obstruction

- "Beurling-Helson theorem".
- *f*(*x*) concentrated and *f*(*g*(*x*)) concentrated implies that *g*(*x*) is an affine map.
- If g(x) comes from elliptic curve operations then it is a non-trivial rational function.
- Hence, elliptic curve operations do not preserve concentrated.

#### CDH in non-prime finite fields

- Fazio, Gennaro, Perera and Skeith (CRYPTO 2013) showed bit security for CDH in F<sub>p<sup>2</sup></sub>.
- Their model involves field isomorphisms (a version of the "BS trick").
- The paper "The Multivariate Hidden Number Problem" (ICITS 2015) written with my student Barak Shani treats general fields F<sub>p</sub>".
- Also uses a "BS trick".
- It is still open to prove bit security of Diffie-Hellman in finite fields.

# **Open Questions**

- Do these ideas have anything to do with DLP?
- Can one actually prove bit security results for single bits in realistic models?
- Are Fourier learning algorithms optimal from a concrete point of view?

Thank you for your attention

See you at Asiacrypt!



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