# Cryptanalysis of Code-based Cryptography

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### Outline

1. Motivation

2. Tutorial: How to hide a linear code

3. Tutorial: Decoding attacks

4. Tutorial: Further targets

#### 1. Motivation

2. Tutorial: How to hide a linear code

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## Code-based encryption scheme (Niederreiter version)

Public key: a random-looking  $r \times n$  matrix  $H_{pub}$  with entries in  $\mathbb{F}_q$ .

Secret key:  $H_{pub}$  has a hidden (algebraic) structure allowing fast decoding.

Encryption of a weight-w word  $\mathbf{e} \in \mathbb{F}_q^n$ .

• Send ciphertext  $\mathbf{s} = H_{pub} \cdot \mathbf{e}$ .

#### Decryption:

- Use linear algebra to undo the conversion from the public code C<sub>pub</sub> to the secret code C<sub>sec</sub> and
- make use of the fast decoding algorithm for  $C_{sec}$  to find low-weight message **e**.

#### **Attacks**

There are basically two types of attacks:

- 1. Structural attacks
  - Find the secret code given  $H_{pub}$ .
- 2. Decrypt a single ciphertext
  - Use a generic decoding algorithm.

#### Design goals

- Choose secret code and conversions so that retrieving C<sub>sec</sub> is infeasible.
- Choose parameters so that generic attacks need > 2<sup>b</sup> bit ops to find a weight-w word (b-bit security).

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#### Todo: Hide a linear code

Start with a "linear code allowing fast decoding".

 Niederreiter (1986): use (Generalized) Reed–Solomon codes.

For a prime power q; an integer  $0 \le t < q$ ; a primitive element  $\alpha \in \mathbb{F}_q$  the Reed–Solomon code

$$\left\{ (f(0), f(1), f(\alpha), \dots, f(\alpha^{q-2})) : f \in \mathbb{F}_q[x], \deg f < q - t \right\}$$

- has length q, dimension q t, and
- minimum distance t + 1 (MDS code).
- Berlekamp's algorithm decodes t/2 errors in  $O(q^2)$ .

#### Aim:

 add defenses against structural attacks while maintaining good error-correction.

### **Defenses**

#### Scaling

• Pick q elements  $\gamma_1,\ldots,\gamma_q\in\mathbb{F}_q^*$  to produce codewords  $(\gamma_1c_1,\ldots,\gamma_qc_q)$ .

#### Permuting

• Pick a permutation  $\pi \in S_q$  and permute the coordinates of the codewords to get  $(c_{\pi(1)}, \ldots, c_{\pi(q)})$ .

#### Puncturing

• Consider the shortened code containing codewords of the form  $(c_{i_1}, \ldots, c_{i_n})$  where  $1 \leq i_1 < \cdots < i_n \leq q$ .

### Generalized Reed-Solomon code

- Fix integers n, t with  $0 \le t < n \le q$ ;
- an ordered set of distinct elements  $\{\alpha_1, \ldots, \alpha_n\} \subseteq \mathbb{F}_q$ ;
- $\gamma_1, \ldots, \gamma_n \in \mathbb{F}_q^*$  (not necessarily distinct).

#### The Generalized Reed-Solomon code

$$\{(\gamma_1 f(\alpha_1), \dots, \gamma_n f(\alpha_n)) : f \in \mathbb{F}_q[x], \deg f < n - t\}$$

- has length n, dimension n-t, and
- minimum distance t + 1 (MDS code).
- Can apply RS decoders to the punctured code after undoing the scaling and permuting.

### A GRS parity-check matrix

A parity–check matrix of the Generalized Reed–Solomon code with parameters q, n, t and support  $\{\alpha_1, \alpha_2, \dots, \alpha_n\} \subseteq \mathbb{F}_q$  and scalars  $\{\gamma_1, \dots, \gamma_n\} \subseteq \mathbb{F}_q^*$  is given by

$$H = \begin{pmatrix} \gamma_1 & \gamma_2 & \cdots & \gamma_n \\ \gamma_1 \alpha_1 & \gamma_2 \alpha_2 & \cdots & \gamma_n \alpha_n \\ \vdots & \vdots & \ddots & \vdots \\ \gamma_1 \alpha_1^{t-1} & \gamma_2 \alpha_2^{t-1} & \cdots & \gamma_n \alpha_n^{t-1} \end{pmatrix}$$

- This is the parity-check matrix of a permuted, scaled, punctured Reed-Solomon code.
- If we keep the  $\alpha_i$  and  $\gamma_i$  private: can we use H as  $H_{pub}$  for the encryption scheme?

### Sidelnikov–Shestakov attack

Recover private key (the  $\alpha_i$ 's and the  $\gamma_i$ 's) from public key in polynomial time.

 Reconstruct codewords of weight t + 1 from the rows of the systematic generator matrix of the public code (MDS code).

Each row corresponds to a codeword polynomial

$$f_{b_i}(x) = c_{b_i} \cdot \prod_{j=1, j \neq i}^k (x - \alpha_j)$$
 of degree  $k - 1 = n - t - 1$  whose coeffs  $c_{b_i}$  can be reconstructed from the  $b_i$  in  $O(k^2 n)$ .

### Rescuing GRS codes?

Fix: Berger–Loidreau (2005): add  $\ell$  parity checks to the matrix to hide the GRS code.

 Fake parity checks decrease the dimension of the public code (no longer MDS) and thus remove codewords needed for Sidelnikov–Shestakov attack.

### Rescuing GRS codes?

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Wieschebrink (2006, 2010): apply Sidelnikov–Shestakov to the square of the public code (likely to be a GRS code containing minimum-weight word of the desired form).

### Subfield subcodes

- Let  $q = 2^m$ ;
- fix n, k with  $0 \le k < n \le q$ ;
- consider a linear code C over  $\mathbb{F}_q$ .

The subfield subcode  $C|_{\mathbb{F}_2}$  of C is the restriction of C to  $\mathbb{F}_2$ .

$$C|_{\mathbb{F}_2} = \{(c_1, \dots, c_n) \in C \mid c_i \in \mathbb{F}_2 \text{ for } i = 1, \dots, n\}.$$

- Dimension:  $\dim(C|_{\mathbb{F}_2}) \ge n m(n \dim C)$ .
- Minimum distance:  $d(C|_{\mathbb{F}_2}) \geq d(C)$ .

## A family of GRS codes

Let  $\alpha_1, \ldots, \alpha_n \in \mathbb{F}_{2^m}$ ,  $h = \prod_{i=1}^n (x - \alpha_i)$ , and g a degree-t polynomial in  $\mathbb{F}_{2^m}[x]$  with  $g(\alpha_i) \neq 0$ .

• The words  $c=(c_1,\ldots,c_n)$  in  $\mathbb{F}_{2^m}^n$  with

$$\left\{ \left( \frac{fg}{h'}(\alpha_1), \dots, \frac{fg}{h'}(\alpha_n) \right) : f \in \mathbb{F}_{2^m}[x], \ \deg(f) < n - t \right\}$$

form a linear [n, n-t] code in  $\mathbb{F}_{2^m}^n$ , denoted as  $\Gamma_{2^m}(g) = \Gamma_{2^m}(\alpha_1, \dots, \alpha_n, g)$ .

### Properties of $\Gamma_{2^m}(g)$

- Minimum distance  $d(\Gamma_{2^m}(g)) \ge t + 1$ .
- Use Berlekamp's algorithm for decoding up to half the minimum distance.

## Goppa codes

The restriction  $\Gamma_2(g)$  of  $\Gamma_{2^m}(g)$  to the field  $\mathbb{F}_2$  is called a Goppa code.

### Properties of $\Gamma_2(g)$

- Dimension  $k \ge n mt$ .
- Minimum distance  $\geq t + 1$ .

### *q*-ary Goppa codes

Let q be an arbitrary prime power.

The restriction  $\Gamma_q(g)$  of  $\Gamma_{q^m}(g)$  to the field  $\mathbb{F}_q$  is called a Goppa code.

### Properties of $\Gamma_q(g)$

- Dimension  $k \ge n mt$ .
- Minimum distance  $\geq t + 1$ .

# Wild Goppa codes

Let q be an arbitrary prime power and g squarefree in  $\mathbb{F}_q[x]$ .

The restriction  $\Gamma_q(g)$  of  $\Gamma_{q^m}(g)$  to the field  $\mathbb{F}_q$  is called a Goppa code.

# Properties of $\Gamma_q(g^{q-1})$

- Dimension  $k \ge n mt$ .
- Minimum distance  $\geq qt+1$  since  $\Gamma_q(g^q)=\Gamma_q(g^{q-1})$  for squarefree g.

Goppa codes of the form  $\Gamma_q(g^{q-1})$  are called wild Goppa codes.

### Structural security

Many possible codes for a given parameter set m, n, k.

• Guessing the Goppa polynomial g or the support set  $\{\alpha_1, \ldots, \alpha_n\}$  is made infeasible.

Wieschebrink's version of Sidelnikov–Shestakov attack for subcodes not applicable

square code is not GRS.

Faugère et al. (2010): distinguish hidden Goppa-code matrix from random matrix for high-rate Goppa codes.

No key recovery.

#### Alternative constructions

#### More compact keys:

- Misoczki–Barreto: quasi-dyadic Goppa codes
- Berger et al: quasi-cyclic GRS codes
- Misoczki et al: quasi-cyclic MDPC

So far no good attacks known.

#### Warning

- Don't overdo it! Compact keys are desirable BUT keep your key space large enough
- Biasi et al. (2012) claimed keys as small as AES; unfortunately, construction yields  $\ll$  2<sup>80</sup> keys for claimed 80-bit security.

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### Generic decoding is hard

#### Syndrome-decoding problem:

- given an  $r \times n$  binary matrix H,
- ▶ a vector  $\mathbf{s} \in \mathbb{F}_2^r$ ,
- ▶ and  $w \ge 0$ ,

find  $\mathbf{e} \in \mathbb{F}_2^n$  of weight  $\leq w$  such that  $H\mathbf{e} = \mathbf{s}$ .

Berlekamp, McEliece, van Tilborg (1978) showed that the syndrome-decoding problem is NP-hard.

- The best known generic decoding algorithms all take exponential time.
- About  $2^{(0.5+o(1))n/\log n}$  binary operations required for a code of length n, dimension  $\approx 0.5n$ , and minimum distance  $\approx n/\log n$ .

## Information-set decoding

Best known generic decoding methods rely on so-called information-set decoding or in short: ISD.

```
Quite a long history:
 1962 Prange:
                                                        1994 van Tilburg;
 1981 Clark (crediting Omura);
                                                        1994 Canteaut-Chabanne:
 1988 Lee-Brickell:
                                                        1998 Canteaut-Chahaud:
 1988 Leon:
                                                        1998 Canteaut-Sendrier:
 1989 Krouk:
                                                        2008 Bernstein-Lange-P.:
 1989 Stern:
                                                        2009 Bernstein-Lange-P.-van Tilborg:
 1989 Dumer:
                                                       2009 Finiasz-Sendrier:
 1990 Coffey-Goodman;
                                                        2010 P.;
 1990 van Tilburg;
                                                        2011 Bernstein-Lange-P.:
 1991 Dumer:
                                                       2011 Sendrier:
 1991 Coffev-Goodman-Farrell:
                                                       2011 May-Meurer-Thomae;
 1993 Chabanne-Courteau:
                                                       2012 Becker-Joux-Mav-Meurer.
 1993 Chabaud:
```

- Papers in the last 5 years were aiming at attacking actual cryptographic parameters,
- focusing on either implementations or asymptotic analyses.

### Todo: build a generic decoder

Build a (w-bounded) decoder that gets as input

- a parity-check matrix H,
- ullet a ciphertext  $\mathbf{s} \in \mathbb{F}_2^r$ , and
- an integer  $w \ge 0$ .

The algorithm tries to determine an error vector  $\mathbf{e}$  of weight w such that

$$s = He$$
.

Note: from now on consider only linear codes over  $\mathbb{F}_2$ .

### **Problem**

Given an  $r \times n$  matrix, a syndrome **s**.

### Row randomization

Can arbitrarily permute rows without changing the problem.

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Can arbitrarily permute rows without changing the problem.

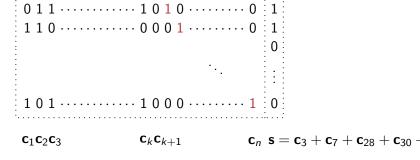
#### Column normalization

Can arbitrarily permute columns without changing the problem.

#### Column normalization

Can arbitrarily permute columns without changing the problem.

## Information-set decoding



Can add one row to another  $\Rightarrow$  build identity matrix.

1 0 1 ..... 1 1 0 0 ..... 0 0

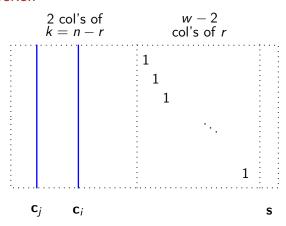
Goal: find w columns which xor s.

## Basic information-set decoding

### Prange (1962):

- Perhaps xor involves none of the first n-r columns.
- If so, immediately see that s is constructed from w columns from the identity submatrix.
- If not, re-randomize and restart this is a probabilistic algorithm.
- Expect about  $\frac{\binom{n}{w}}{\binom{r}{w}}$  iterations.

#### Lee-Brickell



Check for each pair (i,j) with  $1 < i < j \le k$  if  $\mathbf{s} + \mathbf{c}_i + \mathbf{c}_j$  has weight w - 2.

## Decreasing the number of iterations

### Lee-Brickell (1988):

- More likely that xor involves exactly 2 of the first n − r columns.
- Check for each pair (i,j) with  $1 < i < j \le n-r$  if  $\mathbf{s} + \mathbf{c}_i + \mathbf{c}_j$  has weight w-2.
- Expect about  $\frac{\binom{n}{w}}{\binom{n-r}{2}\binom{r}{w-2}}$  iterations, each checking  $\binom{n-r}{2}$  sums  $\mathbf{s}+\mathbf{c}_i+\mathbf{c}_j$ .

## Decreasing the number of iterations

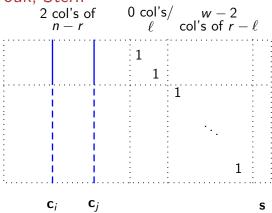
### Lee-Brickell (1988):

- More likely that xor involves exactly p of the first n − r columns.
- Check for each pair (i,j) with  $1 < i < j \le n-r$  if  $\mathbf{s} + \mathbf{c}_i + \mathbf{c}_j$  has weight w p.
- Expect about  $\frac{\binom{n}{w}}{\binom{n-r}{p}\binom{r}{w-p}}$  iterations, each checking  $\binom{n-r}{p}$  sums  $\mathbf{s} + \mathbf{c}_{i_1} + \cdots + \mathbf{c}_{i_p}$ .

#### Note

- Cost for computing these sums grows with *p*.
- Choosing  $p = \frac{w}{2}$  would minimize # iterations but increase cost of each iterations enormously; p = 2 is optimal.

### Leon, Krouk, Stern



Check for each pair (i,j) with  $1 < i < j \le n-r$  if  $\mathbf{s} + \mathbf{c}_i + \mathbf{c}_j$  has weight w-2 and the first  $\ell$  bits all zero.

• Early abort if  $\mathbf{s} + \mathbf{c}_i + \mathbf{c}_j \neq \mathbf{0}$  on first  $\ell$  bits.

### **Improvements**

Leon (1989), Krouk (1989):

• Check for each (i,j) if  $\mathbf{s} + \mathbf{c}_i + \mathbf{c}_j$  has weight w-2 and the first  $\ell$  bits all zero.

- Fast to test, iteration cost decreases.
- Expect about  $\frac{\binom{n}{w}}{\binom{n-r}{2}\binom{r-\ell}{w-2}}$  iterations only a few more than for Lee–Brickell.

## Collision decoding

Stern (1989): enforce 0's on first  $\ell$  bits using a meet-in-the-middle approach  $\Rightarrow$  square-root improvement.

#### Strategy

- Split first n − r columns in two disjoint sets of equal size;
   draw c<sub>i</sub>'s from the left, c<sub>j</sub>'s from the right set.
- Find collisions between first  $\ell$  bits of  $\mathbf{s} + \mathbf{c}_i$  and the first  $\ell$  bits of  $\mathbf{c}_j$ .
- For each collision, check if  $\mathbf{s} + \mathbf{c}_i + \mathbf{c}_j$  has weight w 2.

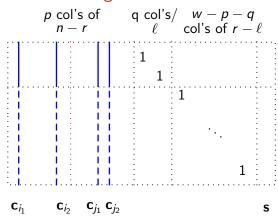
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   draw c<sub>i</sub>'s from the left, c<sub>j</sub>'s from the right set.
- Find collisions between first  $\ell$  bits of  $\mathbf{s} + \mathbf{c}_{i_1} + \cdots + \mathbf{c}_{i_{p/2}}$  and the first  $\ell$  bits of  $\mathbf{c}_{j_1} + \cdots + \mathbf{c}_{j_{p/2}}$ .
- For each collision, check if  $\mathbf{s} + \mathbf{c}_{i_1} + \cdots + \mathbf{c}_{i_{p/2}} + \mathbf{c}_{j_1} \cdots + \mathbf{c}_{j_{p/2}}$  has weight w p.
- Expect about  $\frac{\binom{n}{w}}{\binom{(n-r)/2}{p/2}^2\binom{r-\ell}{w-p}}$  iterations.

### Ball-collision decoding



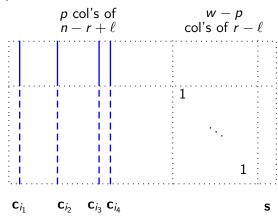
- Disjoint split of columns on the left.
- Allow a few zeros in the previously "forbidden zone".

### Ball-collision decoding

#### Bernstein, Lange, P. (2011):

- Find collisions between the Hamming ball of radius q around  $\mathbf{s} + \mathbf{c}_{i_1} + \cdots + \mathbf{c}_{i_p}$  and the Hamming ball of radius q around  $\mathbf{c}_{j_1} + \cdots + \mathbf{c}_{j_p}$ .
- Main theorem: (asymptotically) exponential speedup of ball-collision decoding over Stern's collision decoding.
- Reference implementation of ball-collision decoding: http://cr.yp.to/ballcoll.html

### Using representations



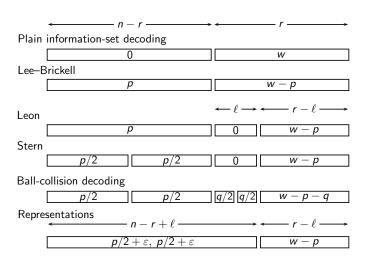
- Only partial Gauss elimination.
- Consider selected sums of p columns out of  $n r + \ell$ .

### Increase number of p-sums

May–Meurer–Thomae (2011), Becker–Joux–May–Meurer (2012):

- Increase number of words with 0's on first  $\ell$  positions by removing the split of n-r columns into in two disjoint sets.
- Do not check all  $\binom{k}{p}$  sums  $\mathbf{s} + \mathbf{c}_{i_1} + \cdots + \mathbf{c}_{i_p}.$
- Examine a fraction of those sums using representation technique by Howgrave-Graham–Joux (2010).
- Main theorem: (asymptotically) exponential speedup of representation technique over ball-collision decoding.

### Error distributions



### Asymptotics

Recent papers are mostly asymptotic speedups.

- Gains are significant for coding-theoretic values for the minimum distance (Gilbert–Varshamov radius).
- For cryptographic applications, only small differences in cost between Stern's algorithm, ball-collision decoding, representation decoding.
- Bernstein, Lange, P., van Tilborg (2009): asymptotic analysis of ISD for McEliece minimum distances  $d \approx n/\log n$ .

### Practical ISD

#### Bernstein, Lange, P. (2008):

• use variant of Stern's algorithm



to extract a plaintext from a ciphertext by decoding w = 50 errors in a binary code with  $n = 2^{10}$  and r = 500.

Faster by a factor of more than 150 than previous attacks;
 within reach of a moderate cluster of computers.

#### Break of original McEliece parameters:

 About 200 (academic) computers involved, with about 300 cores; computation finished in under 90 days; used about 8000 core-days.

### Challenges

http://pqcrypto.org/wild-challenges.html

- Inspired by latticechallenge.org project at TU Darmstadt.
- Want: cryptanalytic benchmarks.
- Build confidence in new setups (e.g., wild McEliece).

#### How it works:

- Different setups, challenges are indexed by field size and key size.
- Each challenge consists of a public key and a ciphertext.
- Find matching plaintext (or even to find the secret keys).

Gregory Landais at INRIA decrypted ciphertexts for binary Goppa codes with keys up to 28 kB (almost 60-bit security)

### Key sizes

Typical key sizes for binary Goppa codes:

• 187kB for 128-bit security against ISD

Typical key sizes for q-ary Goppa codes:

• 88kB for  $\Gamma_{31}(g)$  (small subfield m=2, secure?). (P., PQCrypto 2010).

Typical key sizes for wild Goppa codes:

• 88kB for  $\Gamma_{31}(g^{30})$  (extra structural security "incognito") (Bernstein, Lange, P., SAC 2010).

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### Code-based signatures

Bleichenbacher attack against CFS digital signatures

• Replaces classical birthday attacks with cost  $2^{r/2}$  by general birthday attacks with four lists and cost  $2^{r/3}$ .

Sendrier (2011): DOOM (Decoding one out of many)

• improves on Johansson and Jönsson when solving the decoding problem for N instances at once (gaines  $\sqrt{N}$ ).

## **Beyond Coding Theory**

Learning Parity with Noise (LPN) problem: an LPN oracle  $\Pi(\mathbf{x},\epsilon)$  with secret  $\mathbf{x}$  in  $\mathbb{F}_2^k$  returns a sample

$$(\mathbf{a}, \langle \mathbf{x}, \mathbf{a} \rangle + e)$$

- ullet where  $oldsymbol{a}$  is chosen uniformly at random from  $\mathbb{F}_2^k$  and
- the bit e is chosen with  $\mathsf{Prob}(e=1) = \epsilon$  and  $\mathsf{Prob}(e=0) = 1 \epsilon$ .

Given *n* samples  $(\mathbf{a}, y) = (\mathbf{a}, \langle \mathbf{x}, \mathbf{a} \rangle + e)$  try to recover  $\mathbf{x}$  by solving the decoding problem:

$$\mathbf{y} = \mathbf{x}A + \mathbf{e}$$

with  $A = (\mathbf{a}_1, \dots, \mathbf{a}_n)$ ,  $\mathbf{y} = (y_1, \dots, y_n)$  and  $w = \epsilon n$ .

### ISD vs BKW

Meurer (Ph.D. thesis 2013) compares asymptotic cost of ISD against Blum–Kalai–Wasserman algorithm to solve LPN:

- BKW asymptotically superior to ISD; comparable for  $\epsilon < 0.125$ .
- For all practical instances  $k=128,\ldots,1024$  and  $\epsilon \leq 0.05$  ISD performs better than BKW; ISD need fewer oracle queries and (thus) less memory.
- Meurer needs  $2^{72}$  bit operations to break the Levieil–Fouque parameters k=768 and  $\epsilon=0.05$  (conjectured to achieve 100-bit security).
- Open problems: combine ISD and BKW.

#### Conclusion

#### Structural attacks

- Algebraic codes need subfields. GRS not secure.
- Alternatively, use quasi-cyclic MDPC codes. Don't overdo shrinking key size (keep the key space big enough).

#### Information-set-decoding

- Many variants; all of them have exponential running time.
- Useful to estimate security levels in code-based (and lattice-based?) cryptography.
- Scripts to estimate parameters:

```
https://bitbucket.org/cbcrypto/isdf2
https://bitbucket.org/cbcrypto/isdfq
```

# Thank you for your attention!