#### **Error-Correcting Codes for Cryptography**

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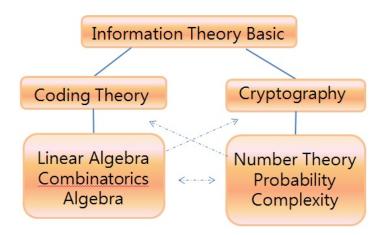
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# Outline

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- Introduction to Coding Theory
- Complementary Information Set (CIS) Codes
- General Constructions Including SRG and DRT.
- Classification of CIS Codes of Lengths  $\leq$  12
- Optimal CIS Codes of Lengths  $\leq$  130
- Long CIS Codes
- Higher-Order CIS Codes
- Conclusion and Open Problems

#### **Overview**



# **Father of Information Theory**



Figure : Claude Shannon (1916-2001)

Shannon's two foundational papers from Bell System Technical Journal:

"A Mathematical Theory of Communication" on Information Theory (1948)

"Communication Theory of Secrecy Systems" on Cryptography (1949)

#### What is a code?

- Let *A* be a finite alphabet. Usually  $A = \mathbb{Z}_2, \mathbb{Z}_p$  (in general  $\mathbb{F}_q, \mathbb{Z}_m$ , chain rings, Galois rings, or Frobenius rings).
- $A^n := \{(x_1, \cdots, x_n) | x_i \in A\}.$
- An (error-correcting) code C over A is a subset of A<sup>n</sup> (with at least two elements).
- Elements of C are called codewords.
- A code over  $\mathbb{Z}_2$  is called a binary code.
- The weight of x = (x<sub>1</sub>, ..., x<sub>n</sub>) is the number of nonzero coordinates, denoted by wt(x). For example, wt(0, 1, 2, 1, 0) = 3.
- The Hamming distance  $d(\mathbf{x}, \mathbf{y})$  between  $\mathbf{x}, \mathbf{y} \in A^n$  is wt( $\mathbf{x} \mathbf{y}$ ). For example, if  $\mathbf{x} = (1, 0, 0, 1, 0)$  and  $\mathbf{y} = (0, 0, 1, 0, 0)$ , then their Hamming distance is 3.

#### Linear codes: most useful codes

- A linear code C of length *n* and dimension *k* over Z<sub>p</sub>:= a *k*-dimensional subspace of Z<sup>n</sup><sub>p</sub>.
- We denote C by an [n, k] linear code over Z<sub>p</sub>.
- The minimum distance (weight) *d* of a linear code C:=the minimum of wt(x), x ≠ 0 ∈ C.
- We denote it by an [n, k, d] code. Given n and k, d can be at most n - k + 1 (Singleton' bound).

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• A set of *k* columns of an [*n*, *k*, *d*] code is called an information set if it is linearly independent.

#### How many errors can correct?

# **Theorem** Any [n, k, d] linear code can correct up to $t = \lfloor \frac{d-1}{2} \rfloor$ errors (by the nearest neighbor decoding).

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# **Preliminaries**

- Let *C* be a linear [*n*, *k*, *d*] code over finite field *GF*(*q*) of length *n*, dimension *k* and minimum distance *d*.
- The Euclidean inner product of  $\mathbf{x} = (x_1, \dots, x_n)$  and  $\mathbf{y} = (y_1, \dots, y_n)$  in  $GF(q)^n$  is  $\mathbf{x} \cdot \mathbf{y} = \sum_{i=1}^n x_i y_i$ .
- The dual of *C*, denoted by *C*<sup>⊥</sup> is the set of vectors orthogonal to every codeword of *C* under the Euclidean inner product.

• If  $C = C^{\perp}$ , C is called self-dual (sd), and if  $C \subset C^{\perp}$ , self-orthogonal.

#### **Preliminaries-continued**

- The weight enumerator of C is the polynomial
  *W*<sub>C</sub>(X, Y) = ∑<sup>n</sup><sub>i=0</sub> A<sub>i</sub>X<sup>n-i</sup>Y<sup>i</sup>, where A<sub>i</sub> is the number of codewords of weight *i*.
- A code C is called formally self-dual (f.s.d.) if  $W_{C^{\perp}}(x, y) = W_{C}(x, y)$ .
- Of course any self-dual code is an f.s.d. code but an f.s.d. code is not necessarily self-dual.
- A code C is divisible by δ provided all codewords have weights divisible by an integer δ, called a divisor of C.

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#### Example: Extended Hamming [8,4,4] Code

• Let C have generator matrix

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- *C* is the famous extended Hamming [8, 4] code with minimum distance d = 4.
- C is self-dual.
- Weight Distribution:  $A_0 = 1, A_4 = 14, A_8 = 1$ .
- divisor δ = 4.

# Why Self-dual codes?

- One of the most interesting classes of linear codes
- Connections with group theory, design theory, Euclidean lattices, modular forms, quantum codes

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- Many optimal linear codes are often self-orthogonal/self-dual.
- They are also asymptotically good.

# Why Self-dual codes?

- One of the most interesting classes of linear codes
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Question: Is there an interesting superclass of self-dual codes?

# **Complementary Information Set Codes**

• A binary linear code of length 2*n* and dimension *n* is called Complementary Information Set (CIS) with a partitition *L*, *R* if there is an information set *L* whose complement *R* is also an information set.

[Claude Carlet, Philippe Gaborit, Jon-Lark Kim, and Patrick Sole, "A new class of codes for Boolean masking of cryptographic computations", *IEEE Trans. Inform. Theory*, VOL. 58, NO. 9, Sep. 2012, pp. 6000-6011.]

- We call the partition [1..n], ..., [n + 1..2n] the systematic partition.
- Systematic self-dual codes are CIS with the systematic partition.
- It is also clear that the dual of a CIS code is CIS.
- Hence CIS codes are a natural generalization of self-dual codes.

#### Walsh Hadamard transform

- An vectorial Boolean function *F* is any map from  $\mathbb{F}_2^n \to \mathbb{F}_2^n$ .
- Its Walsh Hadamard transform of F at (a, b) is defined as

$$W_F(a,b) = \sum_{x \in \mathbb{F}_2^n} (-1)^{a \cdot x + b \cdot F(x)},$$

where  $a \cdot x$  denotes the scalar product of vectors a and x.

If *f* is a Boolean function with domain F<sup>k</sup><sub>2</sub> and range F<sub>2</sub>, then the Fourier transform *f* of *f* at *a* is defined by

$$\hat{f}(a) = \sum_{x \in \mathbb{F}_2^k} f(x)(-1)^{a \cdot x} = \sum_{x \in \text{supp}(f)} (-1)^{a \cdot x},$$

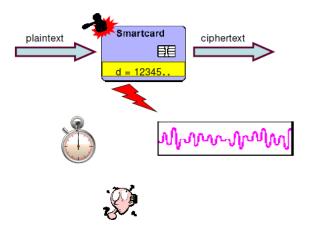
where supp(f) is the support of function *f*.

• We note that for  $a \neq 0$ ,

$$W_{F_1}(a,b) = 0$$
 if and only if  $\widehat{b \cdot F_1}(a) = 0.$  (1)

# **Motivations**

CIS codes have an application in cryptography, in the framework of counter-measures to side channel attacks on smartcards.



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# **Motivations**

 Assuming a systematic unrestricted code C of length 2n of the form

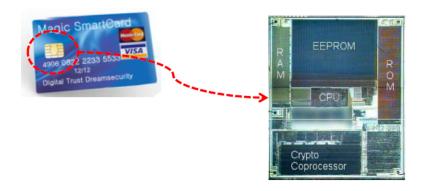
$$C = \{(x, F(x)) | x \in \mathbb{F}_2^n\},\$$

the vectorial Boolean function is constructed as the map  $x \mapsto F(x)$ .

- In that setting *C* is CIS by definition iff *F* is a bijection.
- When C is a linear code, we can also consider a systematic generator matrix (I, A) of the code, where I is the identity matrix of order n and A is a square matrix of order n. Then F(x) = xA, and the CIS condition reduces to the fact that A is nonsingular.

# **Motivations-continued**

The physical implementation of cryptosystems on devices such as smart cards leaks information.



## **Motivations-continued**

- This information can be used in differential power analysis or in other kinds of side channel attacks.
- These attacks can be disastrous if proper counter-measures are not included in the implementation.
- Until recently, it was believed that for increasing the resistance to attacks, new masks have to be added, thereby increasing the order of the countermeasure.

[M. Rivain and E. Prouff. Provably Secure Higher-Order Masking of AES. Proceedings of CHES 2010,

#### LNCS 6225 (2010) pp. 413-427]

- Change the variable representation (say *x*) into randomized shares  $m_1, m_2, \ldots, m_{t+1}$  called masks such that  $x = m_1 + m_2 + \cdots + m_{t+1}$  where + is a group operation in practice, the XOR.
- At the order t = 1, the masks are given by  $(m_1, m_2) = (m_1, x + m_1)$ . If both  $m_1$  and  $x + m_1$  are known, then x is obtained, hence not secure.

#### **Motivations-continued**

• It is shown that another option consists in encoding the some of masks, which is much less costly than adding fresh masks.

[H. Maghrebi, S. Guilley and J.-L. Danger. Leakage Squeezing Countermeasure Against High-Order Attacks. Proceedings of WISTP, LNCS 6633, pp. 208-223, 2011]

- For example, at the order t = 1, using a vectorial Boolean function F, we consider the ordered pair  $(F(m_1), x + m_1)$ .
- Notably, it is demonstrated that the same effect as adding several masks can be obtained by the encoding of one single mask.

[H. Maghebi, S. Guilley, C. Carlet and J.-L. Danger. Classification of High-Order Boolean Masking Schemes and Improvements of their Efficiency. http://eprint.iacr.org/2011/520]

# **Graph Correlation Immune Functions**

- This method, called leakage squeezing, uses vectorial Boolean functions more precisely, permutations *F* : 𝔽<sup>n</sup><sub>2</sub> → 𝔽<sup>n</sup><sub>2</sub>, such that, given some integer *d* as large as possible, for every pair of vectors *a*, *b* ∈ 𝔽<sup>n</sup><sub>2</sub> such that (*a*, *b*) is nonzero and has Hamming weight < *d*, the value of the Walsh Hadamard transform of *F* at (*a*, *b*), is null.
- We call such functions *d*-GCI, for Graph Correlation Immune.
- Thus a d-GCI function is a protection against an attack of order *d*.

#### Proposition (Maghebi, et. al, 2011)

The existence of a linear *d*-GCI function of *n* variables is equivalent to the existence of a CIS code of parameters  $[2n, n, \ge d]$  with the systematic partition.

# **General construction**

#### Lemma

If a [2n, n] code *C* has generator matrix (I, A) with *A* invertible then *C* is CIS with the systematic partition. Conversely, every CIS code is equivalent to a code with a generator matrix in that form.

In particular this lemma applies to systematic self dual codes whose generator matrix (I, A) satisfies  $AA^T = I$ .

#### Lemma

Let f(x) be a polynomial over  $\mathbb{F}_2$  of degree less than *n*. Then,  $gcd(f(x), x^n - 1) = 1$  if and only if the circulant matrix generated by f(x) has  $\mathbb{F}_2$ -rank *n*.

#### **General construction- continued**

#### **Proposition**

The double circulant code whose generator matrix is represented by (1, f(x)) satisfying Lemma is a CIS code.

#### **Proposition**

If a [2n, n] code *C* has generator matrix (I, A) with rk(A) < n/2 then *C* is *not* CIS.

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### **Rank criterion for linear codes**

#### Theorem

Let  $\Sigma$  denote the set of columns of the generator matrix of a [2n, n] linear code *C*.

*C* is CIS iff  $\forall B \subseteq \Sigma$ ,  $rk(B) \ge |B|/2$ .

The proof uses **matroid** theory and Edmonds' matroid base packing theorem: A matroid on a set S contain k disjoint bases iff

$$\forall U \subseteq S, k(rk(S) - rk(U)) \leq |S \setminus U|.$$

Apply to the matroid of the columns of the generator matrix under linear dependence, with

$$S = \Sigma, \ k = 2, \ rk(\Sigma) = n, \ |\Sigma| = 2n.$$

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# **SRG and DRT**

- Let A be an integral matrix with 0, 1 valued entries.
- We say that A is the adjacency matrix of a strongly regular graph (SRG) of parameters (n, κ, λ, μ) if A is symmetric, of order n, verifies AJ = JA = κJ and satisfies

$$\mathbf{A}^{2} = \kappa \mathbf{I} + \lambda \mathbf{A} + \mu (\mathbf{J} - \mathbf{I} - \mathbf{A})$$

 We say that A is the adjacency matrix of a doubly regular tournament (DRT) of parameters (n, κ, λ, μ) if A is skew-symmetric, of order n, verifies AJ = JA = κJ and satisfies

$$\mathbf{A}^{2} = \lambda \mathbf{A} + \mu (\mathbf{J} - \mathbf{I} - \mathbf{A})$$

where *I*, *J* are the identity and all-one matrices of order *n*.

# **CIS codes from SRG and DRT**

In the next result we identify A with its reduction mod 2.

#### **Proposition**

Let *C* be the linear binary code of length 2n spanned by the rows of (I, M). With the above notation, *C* is CIS if *A* is the adjacency matrix of a

- SRG of odd order with  $\kappa$ ,  $\lambda$  both even and  $\mu$  odd and if M = A + I
- DRT of odd order with  $\kappa, \mu$  odd and  $\lambda$  even and if M = A
- SRG of odd order with  $\kappa$  even and  $\lambda, \mu$  both odd and if M = A + J
- DRT of odd order with  $\kappa$  even and  $\lambda, \mu$  both odd and if M = A + J

# **Quadratic Double Circulant Codes**

Let *q* be an odd prime power. Let *Q* be the *q* by *q* matrix with zero diagonal and  $q_{ij} = 1$  if j - i is a square in GF(q) and zero otherwise. (This *Q* is a modified Jacobsthal matrix.)

#### Corollary

If q = 8j + 5 then the span of (I, Q + I) is CIS. If q = 8j + 3 then the span of (I, Q) is CIS.

#### Proof

It is well-known that if q = 4k + 1 then Q is the adjacency matrix of a SRG with parameters  $(q, \frac{q-1}{2}, \frac{q-5}{4}, \frac{q-1}{4})$ . If q = 4k + 3 then Q is the adjacency matrix of a DRT with parameters  $(q, \frac{q-1}{2}, \frac{q-3}{4}, \frac{q+1}{4})$ . The result follows by the previous proposition.

The codes obtained in that way are Quadratic Double Circulant codes (Gaborit, 2002).

# Existence of an optimal code that is not CIS

#### **Proposition**

If C is a [2n, n] code whose dual has minimum weight 1 then C is not CIS.

#### **Proposition**

There exists a least one optimal binary code that is not CIS.

#### **Proof:**

The [34, 17, 8] code described in the Magma package BKLC(GF(2), 34, 17)) (best known linear code of length 34 and dimension 17) is an optimal code (minimum weight 8 is the best possible minimum distance for such a code) which dual has minimum distance 1, and therefore is not CIS.

# Classification of CIS codes of lengths $\leq 12$

- Let  $n \ge 2$  be an integer and  $g_n$  denote the cardinal of GL(n, 2) the general linear group of dimension n over GF(2).
- It is well-known (see MacWilliams-Sloane's book), that

$$g_n = \prod_{j=0}^{n-1} (2^n - 2^j).$$

#### Proposition

The number  $e_n$  of equivalence classes of CIS codes of dimension  $n \ge 2$  is at most  $g_n/n!$ .

#### Proof:

Every CIS code of dimension *n* is equivalent to the linear span of (I, A) for some  $A \in GL(n, 2)$ . But the columns of such an *A* are pairwise linearly independent, hence pairwise distinct. Permuting the columns of *A* lead to equivalent codes.

#### **Examples**

- There is a unique CIS code in length 2 namely *R*<sub>2</sub> the repetition code of length 2.
- For n = 2, the  $g_2 = 6$  invertible matrices reduce to three under column permutation: the identity matrix *I* and the two triangular matrices  $T_1 = \begin{pmatrix} 1 & 1 \\ 1 & 0 \end{pmatrix}$ , and  $T_2 = \begin{pmatrix} 0 & 1 \\ 1 & 1 \end{pmatrix}$ .
- The generator matrix (*I*, *I*) spans the direct sum *R*<sub>2</sub> ⊕ *R*<sub>2</sub>, while the two codes spanned by (*I*, *T*<sub>1</sub>) and (*I*, *T*<sub>2</sub>) are equivalent to a code *C*<sub>3</sub>, an isodual code which is not self dual. Thus *e*<sub>2</sub> = 2 < *g*<sub>2</sub>/2! = 3.

# Shortening

The building up construction is known for binary self-dual codes. In this section, we extend it to CIS codes. We show that every CIS code can be constructed in this way.

#### Lemma

Given a [2n, n] CIS code *C* with generator matrix  $(I_n|A)$  where *A* is an invertible square matrix of order *n*, we can obtain a [2(n-1), n-1] CIS code *C'* with generator matrix  $(I_{n-1}|A')$ , where *A'* is an invertible square matrix of order n-1.

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#### **Building up construction**

#### **Building up construction**

Suppose that *C* is a [2n, n] CIS code *C* with generator matrix  $(I_n|A)$ , where *A* is an invertible matrix with *n* rows  $r_1, \ldots, r_n$ . Then for any two vectors  $x = (x_1, \cdots, x_n)$  and  $y = (y_1, \cdots, y_n)^T$  the following matrix  $G_1$  generates a [2(n + 1), n + 1] CIS code  $C_1$  with the systematic partition:

$$G_{1} = \begin{pmatrix} 1 & 0 & 0 & \cdots & 0 & |z_{1} & |x \\ \hline 0 & 1 & 0 & \cdots & 0 & |y_{1} & |r_{1} \\ 0 & 0 & 1 & \cdots & 0 & |y_{2} & |r_{2} \\ \vdots & & \vdots & & \vdots & \vdots \\ 0 & 0 & 0 & \cdots & 1 & |y_{n} & |r_{n} \end{pmatrix},$$
(2)

where  $c_i$ 's satisfy  $x = \sum_{i=1}^{n} c_i r_i$  and  $z_1 = 1 + \sum_{i=1}^{n} c_i y_i$ .

# Example

• Let us consider a [6, 3, 3] CIS code *C* whose generator matrix is given below.

- In order to apply the building-up construction, we take for example x = (1, 1, 0) and  $y = (1, 1, 0)^T$ . Then  $c_1 = c_2 = 1, c_3 = 0$ . Hence z = 1.
- In fact, we get the extended Hamming [8, 4, 4] code whose generator matrix is given below.

$$G_1 = \begin{pmatrix} 1 & 0 & 0 & 0 & 1 & 1 & 1 & 0 \\ 0 & 1 & 0 & 0 & 1 & 0 & 1 & 1 \\ 0 & 0 & 1 & 0 & 1 & 1 & 0 & 1 \\ 0 & 0 & 0 & 1 & 0 & 1 & 1 & 1 \end{pmatrix}$$

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#### Converse of the building up construction

#### **Proposition**

Any [2n, n] CIS code *C* is equivalent to a [2n, n] CIS code with the systematic partition which is constructed from a [2(n-1), n-1] CIS code by using the building up construction.

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### Counting formula similar to mass formula

#### Proposition

Let  $n \ge 2$ . Let **C** be the set of all [2n, n] CIS codes and let  $S_{2n}$  act on **C** as column permutations of the codes in **C**. Let  $C_1, \ldots, C_s$  be representatives from every equivalence class of **C** under the action of  $S_{2n}$ . Let **C**<sub>sys</sub> be the set of all [2n, n] CIS codes with generator matrix  $(I_n|A)$  with A invertible. Suppose that each  $C_i \in \mathbf{C}_{sys}$   $(1 \le i \le s)$ . Then we have

$$g_n = \sum_{j=1}^{s} |\operatorname{Orb}_{S_{2n}}(C_j) \cap \mathbf{C}_{sys}|, \tag{3}$$

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where  $\operatorname{Orb}_{S_{2n}}(C_j)$  denotes the orbit of  $C_j$  under  $S_{2n}$ .

#### **Classification of CIS codes of lengths 2,4**

We classify all CIS codes of lengths up to 12 up to equivalence using the building up method. It is easy to see that any CIS code has minimum distance  $\geq$  2.

- 2*n* = 2. It is clear that there is a unique CIS code of length 2, whose generator matrix is [11].
- 2n = 4. Applying Proposition (building-up) to the repetition code of generator matrix [1 1], we show that there are exactly two CIS codes of length 4. Their generator matrices are (*I*|*A*<sub>2,1</sub>) and (*I*|*A*<sub>2,2</sub>), where

$$A_{2,1} = \left(\begin{array}{cc} 1 & 0 \\ 0 & 1 \end{array}\right), A_{2,2} = T_2 = \left(\begin{array}{cc} 0 & 1 \\ 1 & 1 \end{array}\right)$$

# **Classification of CIS codes of length 6**

#### **Proposition**

There are exactly six CIS codes of length 6. Only one code has d = 3 and the rest have d = 2.

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$$\begin{pmatrix} I | A \end{pmatrix}, \text{ where } A \text{ is one of the following.} \\ \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}, \begin{pmatrix} 1 & 0 & 0 \\ 1 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}, \begin{pmatrix} 1 & 0 & 0 \\ 1 & 1 & 0 \\ 1 & 0 & 1 \end{pmatrix}, \begin{pmatrix} 1 & 1 & 1 \\ 0 & 1 & 0 \\ 1 & 0 & 1 \end{pmatrix}, \begin{pmatrix} 1 & 1 & 1 \\ 1 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}, \begin{pmatrix} 1 & 1 & 1 \\ 1 & 1 & 0 \\ 1 & 0 & 1 \end{pmatrix},$$

# Summary: Classification of all CIS codes of lengths up to 12 in the order of sd, non-sd fsd, and none of them

2 <i>n</i>	<i>d</i> = 2	d = 3	<i>d</i> = 4	Total
2	1 (1+0+0)			1
4	2 (1+1+0)			2
6	5 (1+2+2)	1 (0+1+0)		6
8	22 (1+9+12)	4 (0+2+2)	1 (1+0+0)	27
10	156 (2+40+114)	35 (0+9+26)	4 (0+2+2)	195
12	2099 (2+318+1779)	565 (0+87+478)	41 (1+7+33)	2705

Recently, Finley Freibert (Ohio Dominican University) in his thesis has classified all CIS codes of length 14 and all CIS codes of length 16 and d = 4.

# CIS codes of lengths $\leq$ 130 with record distances

#### Theorem

There exist optimal or best-known CIS codes of lengths  $2n \le 130$ .

2 <i>n</i>	2	4	6	8	10	12	14	16	18	20	22
d	2*	2*	3*	4*	4*	4*	4*	5*	6*	6*	7*
code	dc	dc	$\sim$ dc	sd	dc	sd	sd	$\sim$ dc	$\sim$ dc	nfsd	id

2 <i>n</i>	102	104	106	108	110	112	114	116	118	120
d										
code	bk	bk	qdc	bk	bk	bk	bk	SC	SC	sd

# Long CIS codes

We begin by a well-known fact from MacWillams-Sloane.

#### Lemma

The number of invertible *n* by *n* matrices is  $\sim c2^{n^2}$ , with  $c \approx 0.29$ .

Denote by B(n, d) the number of matrices A such that d columns or less of (I, A) are linearly dependent. A crude upper bound on this function can be derived as follows.

#### Lemma

The quantity B(n, d) is  $\leq M(n, d)$  where

$$M(n,d) = \sum_{j=2}^{d} \sum_{t=1}^{j-1} \binom{n}{j-t} \binom{n}{t} t 2^{n(n-1)}.$$

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# CIS codes are asymptotically good

Denote by  $H(x) = -x \log_2 x - (1 - x) \log_2(1 - x)$  the binary entropy function.

#### Lemma

The quantity M(n, d) is dominated by  $2^{n^2 - n} 2^{2nH(\delta)}$  when  $d \sim 2\delta n$  with  $0 < \delta < 1$ .

#### **Proposition**

For each  $\delta$  such that  $H(\delta) < 0.5$  there are long CIS codes of relative distance  $\delta$ .

#### **Proof:**

Consider (*I*, *A*) as the parity check matrix of the CIS code and combine the above lemmas to ensure that, asymptotically, |GL(n,2)| >> B(n,d) showing the existence of a CIS code of distance > d, for *n* large enough.

## **Higher-order CIS codes**

- The generator matrix of a [*tk*, *k*] code is said to be in **systematic form** if these columns are at the first *k* positions, that is, if it is blocked as (*I<sub>k</sub>*|*A*) with *I<sub>k</sub>* the identity matrix of order *k*.
- We call a systematic code of length *tk* which admits *t* pairwise disjoint information sets a *t*-CIS (unrestricted) code.
- Therefore, 2-CIS codes mean the above CIS codes.
- Reference: "Higher-order CIS codes" by Claude Carlet, Finley Freibert, Sylvain Guilley, Michael Kiermaier, Jon-Lark Kim, Patrick Solé, IEEE Trans. Information Theory, Sep. 2014.

## **3-CIS codes**

- A pair  $(F_1, F_2)$  of permutations of  $\mathbb{F}_2^k$  forms a Correlation Immune Pair (CIP) of strength *d* if and only if for every (a, b, c) such that  $a, b, c \in \mathbb{F}_2^k$ ,  $a \neq 0$ , and  $w_H(a) + w_H(b) + w_H(c) \leq d$ , we have  $\widehat{b \cdot F_1}(a) = 0$  or  $\widehat{c \cdot F_2}(a) = 0$ , equivalently  $W_{F_1}(a, b) = 0$  or  $W_{F_2}(a, c) = 0$ .
- It expresses the fact that the leakage squeezing with two masks (i.e., t = 3 shares) and two permutations  $F_1$  and  $F_2$  allows to resist high-order attacks of order d.

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• We here give it the name of CIP of strength *d*.

## Equivalent form of CIP

The definition of a CIP of strength d is equivalent to Condition (8) in the below reference:

$$\begin{array}{l} \forall a \in \mathbb{F}_2^k, a \neq 0, \exists q, r \text{ such that} \\ \left\{ \begin{array}{l} w_H(a) + q + r = d - 1, \\ \forall b \in \mathbb{F}_2^k, w_H(b) \leq q \Longrightarrow \widehat{b \cdot F_1}(a) = 0, \\ \forall c \in \mathbb{F}_2^k, w_H(c) \leq r \Longrightarrow \widehat{c \cdot F_2}(a) = 0. \end{array} \right. \end{array}$$

C. Carlet, J.-L. Danger, S. Guilley, and H. Maghrebi, "Leakage Squeezing of Order Two," *Proceedings of INDOCRYPT* 2012, Springer in LNCS 7668, pp. 120–139 (Kolkata, India). Online version: http://eprint.iacr.org/2012/567.

# **Characterization of CIP**

We are now ready for the coding theoretic characterization of CIP.

#### Theorem

If  $F_1$ ,  $F_2$  are permutations of  $\mathbb{F}_2^k$  then they form a CIP of strength d if and only if the systematic code of length 3k and size  $2^{2k}$ 

### $C(F_1, F_2) = \{ (x + y, F_1(x), F_2(y)) | x, y \in \mathbb{F}_2^k \}$ (4)

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has dual distance at least d + 1.

#### Theorem (Carlet, Danger, Guilley, Maghrebi)

If  $F_1$ ,  $F_2$  are linear permutations of  $\mathbb{F}_2^k$ , then they form a CIP of strength *d* if and only if the [3k, k] linear code

 $C(F_1,F_2)^{\perp} = \{(u,G_1(u),G_2(u)) | u \in \mathbb{F}_2^k\}$ 

is 3-CIS and has minimum distance at least d + 1. Here  $G_1 = (F_1^*)^{-1}$ ,  $G_2 = (F_2^*)^{-1}$  where  $F^*$  denotes the adjoint operator of *F*, that is, the operator whose matrix is the transpose of that of *F*.

#### Proof

The code  $C(F_1, F_2)$  being the set of words  $(x + y, F_1(x), F_2(y))$ , with  $x, y \in \mathbb{F}_2^k$ , its dual  $C^{\perp}$  is the set of words (u, v, w) such that  $(x + y) \cdot u + F_1(x) \cdot v + F_2(y) \cdot w$  $= x \cdot (u + F_1^*(v)) + y \cdot (u + F_2^*(w))$ = 0 for every $x, y \in \mathbb{F}_2^k$ . Hence  $C^{\perp}$  is the set of words (u, v, w) such that  $u = F_1^*(v), u = F_2^*(w)$  so that  $v = (F_1^*)^{-1}(u) = G_1(u), w = (F_2^*)^{-1}(v) = G_2(u)$ . The result follows.

### Correlation Immune t-uple(t-Cl) of strength d

More generally we make the following definition for  $t \ge 2$ . The *t*-uple  $F_1, \dots, F_t$  of permutations of  $\mathbb{F}_2^k$  form a Correlation Immune *t*-uple (*t*-Cl) of strength *d* if and only if for every  $(a_0, \dots, a_t)$  such that  $a_0 \ne 0$  and  $w_H(a_0) + \dots + w_H(a_t) \le d$ , we have that

$$\prod_{i=1}^{l}\widehat{a_i\cdot F_i}(a_0)=0.$$

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#### t-CIS Partition Algorithm:

# An algorithm to determine if a given linear code is *t*-CIS. Input: Begin with a binary [tk, k] code *C*. Output: An answer of "Yes" if *C* is *t*-CIS (along with a column partition) and an answer of "No" if not.

- Let {*l*<sub>1</sub>,..., *l<sub>t</sub>*} be a set of labeled disjoint independent subsets of *M*. (Note that each *l<sub>i</sub>* (1 ≤ *i* ≤ *t*) can be randomly assigned to each have order 1, or one may be given the first *k* indices of a standard form matrix *G*.)
- **2.** Select  $x \in M \setminus \bigcup_{1 \le i \le t} I_i$ .
- **3.** While  $\bigcup_{1 \le i \le t} I_i \subsetneq M$  do:
  - 3.1 Initialize  $S_0 := M$ . For j > 0, recursively define  $S_j := \operatorname{span}(l_{j'} \cap S_{j-1})$ , where  $j' = ((j-1) \mod t) + 1$ . Initialize j := 0.
  - **3.2** For the current value of *j* check that  $|S_j| \le t \cdot \operatorname{rank}(S_j)$ . If the inequality is false (it is immediately clear that Edmonds' Theorem is violated), then exit the while loop and output the set  $S_j$  with an answer of "No."
  - **3.3** If  $x \in S_j$ , then set j := j + 1 and go back to b).
  - 3.4 If  $x \notin S_{j}$ , then check if  $I_{j'} \cup \{x\}$  is independent. If so then replace  $I_{j'}$  with the larger independent set and repeat the while loop with a new  $x \in M \setminus \bigcup_{1 \le i \le t} I_{j}$ .
  - 3.5 If I<sub>j'</sub> ∪ {x} is dependent, then find the unique minimal dependent set C ⊂ I<sub>j'</sub> ∪ {x} (accomplished by solving the matrix equation associated with finding the linear combination of columns in I<sub>i'</sub> that sum to x).
  - 3.6 Select any x' ∈ C \ S<sub>j-1</sub> and replace l<sub>j'</sub> with l<sub>j'</sub> ∪ {x} \ {x'}, then set x := x' and repeat the while loop.
- 4. End while loop. If the while loop was not exited early, then output the partition {*l*<sub>1</sub>,..., *l*<sub>t</sub>} of *M* and answer "Yes."

#### The table captions are as follows.

- bk= obtained by the command BKLC(GF(2), n, k) from Magma.
- bk\*= same as bk with successive zero columns of the generator matrix replaced in order by successive columns of the identity matrix of order k. Trivially the generator matrix of bk has < k zero columns.</li>
- qc= quasi-cyclic.

The following tables show that all 3-CIS codes of dimension 3 to 85 have the best known minimum distance among all linear [n, k] codes, and in fact the best possible minimum distance for  $n \leq 36$ .

n	6	9	12	15	18	21	24	27	30	33	36	39
k	2	3	4	5	6	7	8	9	10	11	12	13
d	4	4	6	7	8	8	8	10	11	12	12	12
code	qc	qc	bk	bk	bk	bk*	bk*	bk	bk	bk	bk*	bk*

n	123	126	129	132	135	138	141	144	147	150	153	156	159	162
k	41	42	43	44	45	46	47	48	49	50	51	52	53	54
d	29	31	32	?	32	32	32	32	34	34	33	34	34	35
code	bk*	bk*	bk*	?	bk*	bk*	bk*	bk*	bk	bk*	bk	bk*	bk*	bk

n	165	168	171	174	177	180	183	186	189	192	195	198	201	204
k	55	56	57	58	59	60	61	62	63	64	65	66	67	68
d	36	36	36	36	36	38	38	38	40	41	42	42	42	41
code	bk*	bk*	bk*	bk*	bk*	bk	bk*	bk*	bk	bk	bk	bk*	bk*	bk

We have checked that the best known linear [132, 44, 32] code in the Magma database is not 3-CIS.

## **Optimal** *t*-CIS codes with $5 \le t \le 256$

- For 1 ≤ k ≤ [256/t] except for k = 37, we have checked that there are 4-CIS [tk, k] codes that are either bk or bk\*. We have checked that the best known linear [148, 37, 41] code in the Magma database is not 4-CIS.
- For 5 ≤ t ≤ 256 and 1 ≤ k ≤ [256/t], all the best known codes in the Magma database have been checked. We conclude that there are t-CIS [tk, k] codes that are either bk or bk\*.

# Conclusion

We show the following.

- Introduce a new class of CIS codes.
- In length 2*n* these codes are, when in systematic form, in one to one correspondence with linear bijective vectorial Boolean functions in *n* variables.
- Classify CIS codes of lengths  $\leq$  12 and give optimal or best known CIS codes of lengths  $\leq$  130 and discuss an asymptotic bound.
- Introduce *t*-CIS codes of rate 1/*t* with *t* pairwise disjoint information sets and find optimal *t*-CIS codes.

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# **Future Work**

For the future work,

- More generally, does the CIS property involves an upper bound on the minimum distance?
- Finally, it is worth studying CIS codes over other fields than  $\mathbb{F}_2$ , and also over  $\mathbb{Z}_4$ .
- More constructions and classifications of t-CIS codes are desired.
- For a connection of multiply constant-weight codes with PUFs, see ref [3].

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### References

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[2] Claude Carlet, Finley Freibert, Sylvain Guilley, Michael Kiermaier, Jon-Lark Kim, Patrick Solé, "Higher-order CIS codes", *IEEE Trans. Inform. Theory,* VOL. 60, No. 9, Sep. 2014, pp. 5283 - 5295.

[3] Yeow Meng Chee, Zouha Cherif, Jean-Luc Danger, Sylvain Guilley, Han Mao Kiah, Jon-Lark Kim, Patrick Solé, and Xiande Zhang, "Multiply constant-weight codes and the reliability of loop physically unclonable functions", to appear in *IEEE Trans. Inform. Theory.*