# **Locating arrays with error correcting ability**

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Dedicated to Professor Helleseth's 70-th birthday MMC Workshop, September 7, 2017.

- ▶ Applications  $F = \{f_1, f_2, \ldots, f_k\}$  are installed in a PC.
- ▶ Each application has two states S=*{*1, 2*}*.
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- $\blacktriangleright$  A pair  $(f, \sigma)$  is called a 1-way interaction. A  $\{\textsf{(f}_i, \sigma_i), (\textsf{f}_j, \sigma_j)\}$  is called a 2-way interaction.
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#### **Interaction testing: Terminologies**

- $\blacktriangleright$  Let  $F = \{f_1, f_2, \ldots, f_k\}$  be the set of *k* **factors**.
- ▶ For each *f ∈ F*, let *S* = *{*1*,* 2*, . . . ,s}* be the set of possible **levels** or **values**.
- ▶ A *t*-way interaction is a choice of a set *K* of *t* factors, and a selection of a value  $\sigma_f \in S$  for each factor  $f \in K$ .

$$
\mathcal{T} = \big\{ (f, \sigma_f) \mid f \in K \big\} \text{ with } K \in {\binom{F}{t}}, \sigma_f \in S
$$

- ▶ A test is a *k*-tuple indexed by the factors, and the coordinate indexed by *f* has an entry in *S*.
- ▶ A **test suit** is a collection of tests.
- ▶ It is natural to use an  $N \times k$  array  $A = (a_{rf})$  to present a test suit consisting of *N* **tests** and *k* **factors**.

### **Interaction testing: Problems**

#### Assumptions:

- $\blacktriangleright$  Each test gives a result 0 (pass) or 1 (fail).
- ▶ Failures are caused by an *i*-way interaction with *i ≤ t*.

#### Problem:

- ▶ Is there an *i*-way interaction causing faults?
- ▶ Which are they?
- ▶ Given *k* and *t*, how many tests (*N*) are required?

#### Combinatorial testing arrays:

- ▶ Covering arrays
- ▶ Locating arrays
- ▶ Detecting arrays

# **Interaction testing arrays and a** *t***-locating array**

- ▶ Suppose  $A = (a_{rf})$  is an  $N \times k$  testing array.
- ▶ let *K* be a *t*-subset of the column indices of *A*.
- $▶$  A *t*-way interaction  $T = \{(f, \sigma_f) | f \in K\}$  appears in the *r*-th row  $\Leftrightarrow$  $a_{rf} = \sigma_f$  for each  $f \in K$ .
- $\rho_A(T)$  consists of the rows indices *r* of *A* in which the *t*-way interaction *T* appears, namely

 $\rho_A(T) = \{r \mid a_r f = \sigma_f \text{ for each } f \in K\}.$ 

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$$

#### How can we find faults?

- ▶ Let *T* be the set of *i*-way interactions for *i ≤ t*. And assume that there is only one *i*-way interaction which causes failure in *T* .
- **►** An array *A* can detect any single failure in  $T$  iff  $\rho_A(T)$ 's are distinct for all  $T$ in  $\mathcal T$ .
- $\triangleright$  Such an array *A* is called a  $\overline{t}$ -locating array.



# **Example: Non** 1**-locating array**

An *s*-ary testing array with  $N = 6$ ,  $k = 9$  and  $s = 3$  levels for each factor.



- ▶ Assume there is at most **one** 1-way interaction causing faults.
- ▶ Outcome says that  $t_1$ ,  $t_2$  have the same value  $\sigma$  and  $t_3$ ,  $t_4$ ,  $t_5$ ,  $t_6$  are different from *σ*.
- ▶ Such a 1-way interaction is  $(f_6, 2)$ .
- ▶  ${t_1, t_2} = \rho((f_6, 2)).$

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- ▶ Such a 1-way interactions are  $(f_2, 2)$  or  $(f_9, 3)$ . Which is faulty?
- ▶  ${t_3, t_4} = \rho((f_2, 2)) = \rho((f_9, 3)).$

#### **Example: A locating array with strength** 1

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- ▶ Outcome says that  $t_3$ ,  $t_4$  have the same value  $\sigma$  and  $t_1$ ,  $t_2$ ,  $t_5$ ,  $t_6$  are different from *σ*.
- $\blacktriangleright$   $(f_2, 2)$  is faulty.
- ► For any distinct  $T = (f, \sigma)$  and  $T' = (f', \sigma'), \rho(T) \neq \rho(T').$

# **How can we check the locating array property?**



1 2 3

*f*<sup>1</sup> *{*1*} {*2*,* 3*} {*4*,* 5*,* 6*} f*<sup>2</sup> *{*2*} {*3*,* 4*} {*1*,* 5*,* 6*} f*<sup>3</sup> *{*3*} {*4*,* 5*} {*1*,* 2*,* 6*} f*<sup>4</sup> *{*4*} {*5*,* 6*} {*1*,* 2*,* 3*} f*<sup>5</sup> *{*5*} {*1*,* 6*} {*2*,* 3*,* 4*} f*<sup>6</sup> *{*6*} {*1*,* 2*} {*3*,* 4*,* 5*} f*<sup>7</sup> *{*1*,* 3*} {*2*,* 5*} {*4*,* 6*} f*<sup>8</sup> *{*2*,* 4*} {*3*,* 6*} {*1*,* 5*}*



 $T' = (f', \sigma')$ ,  $\rho(T) \neq \rho(T')$ .



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The above is regarded as **a spread system** with 9 spreads on 6 points with



# **A** binary locating array of strength  $\bar{t} = 2(t \leq 2)$



# **A** binary locating array of strength  $\bar{t} = 2(t \leq 2)$

A binary  $\bar{t}$ -**locating array** with  $N = 11$ ,  $k = 6$ .



For any distinct 1*,* 2-way interactions, *ρ*(*T*)'s are distinct.



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A locating array with strength 1







▶ If a *t*-locating array tolerates *e* errors, namely, even if the outcome has **at most** *e* **errors**, the *t*-locating property still holds, then the array is called *e***-error correcting** *t***-locating array** or a (*t, e*)**-locating array**.

#### **Known bound on**  $N$  or  $k$  when  $e = 0$

- ▶ For a  $(\bar{t}, e)$ -locating array with *s* levels and *k* factors, let  $\text{LAN}_{(\bar{t}, e)}(k, s)$  be the minimum number *N* of tests (rows).
- ▶ For a  $(\bar{t}, e)$ -locating array with *s* levels and *N* tests, let LAk<sub>( $\bar{t}, e$ )( $N, s$ ) be the</sub> maximum number *k* of factors (columns).



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#### Problem 1

Given *k*, *s*, *t* and *e*, find the value of  $\text{LAN}_{(t,e)}(k, s)$ . Or, given *N*, *s*, *t* and *e*, find the value of  $LAk_{(\bar{t},e)}(N,s)$ .

 $\blacktriangleright$  Not many has been known for such bounds even when  $e = 0$ .

### **Lower bounds on**  $N$  **for**  $e = 0$

Theorem 1 (Tang, Colbourn and Yin(2012))

▶ *For*  $k \ge t \ge 2$  *and*  $s \ge 2$ *,* 

$$
\mathsf{LAN}_{(t,0)}(k,s) \geq \left\lceil \frac{2 {k \choose t} s^t}{1 + {k \choose t}} \right\rceil.
$$

▶ *For*  $s \ge t \ge 2$ *,* 

$$
\mathsf{LAN}_{(t,0)}(k,s) \geq \left[ -\frac{3}{2} - {k \choose t} + \sqrt{{k \choose t}^2 + (3 + 6s^t){k \choose t} + \frac{9}{4}} \right].
$$

Theorem 2 (A simple bound)

$$
\mathsf{LAN}_{(t,0)}(k,s) \geq \left\lceil \log_2 s\left(t + \log_s {k \choose t}\right) \right\rceil.
$$

When *k* is large, the simple bound is much better than  $T_rC_r$ , bounds. Masakazu Jimbo **(Chubu Univ.) Locating arrays with error correcting ability Sept. 7 13 / 23** 

#### **An improvement of the lower bounds on** *N*

The bound below is an improvement of Tang-Colbourn-Yin's bounds.

Theorem 3 (An improved bound)

*For any given k, s, N and t, we fix an integer τ >* 1 *arbitirary. Then a lower bound for N satisfies*

$$
\sum_{\ell=1}^{\tau-1}(\tau-\ell){\binom{N}{\ell}}\geq \binom{k}{t}(\tau s^t-N).
$$

T-C-Y's bound can be derived by setting  $\tau = 2, 3$ .

# **A lower bounds on** *N* **with** *e***-correcting ability**

Theorem 4 (An improved bound)

*For any given k, s, t*,*and e,*

$$
2^N \ge \left(\sum_{i=0}^e \binom{N}{i}\right) \binom{k}{t} s^t
$$

*holds. Especially, for e* = 0, we have

$$
N \geq \left\lceil \log_2 s \left( t + \log_s \binom{k}{t} \right) \right\rceil.
$$

Even when  $e = 0$ , no construction attaininng the bound is known.

# **Upper bounds** LAk(1*,e*)(*N,s*) **and an optimal binary** (1*,* 1)**-locating array**

 $\blacktriangleright$  Let  $A(n, d)$  denote the maximum possible size of a binary code  $C$  of length *n* and Hamming distance *d*.

Proposition (Hamming bound and Johnson bound)

$$
\color{red} \blacktriangleright
$$

 $\mathsf{LAK}_{(t,e)}(\mathsf{N},s) \leq \frac{\mathsf{A}(\mathsf{N},2e+1)}{2}$  $\frac{2e+1}{s} \leq \frac{2^N}{s^t \sum_{\ell=1}^e}$  $\frac{1}{s^t \sum_{\ell=0}^e {N \choose \ell}}$ .

- ▶ For  $t = e = 1$ , recall that  $LAk_{(1,1)}(N,2) \leq \frac{2^N}{2(N+1)}$ .
- ▶ A (1*,* 1)-locating array generated from the [*N* = 2*<sup>m</sup> −* 1*,* 2 *<sup>m</sup> − m −* 1*,* 3] Hamming code attains the above bound.

Theorem 5 LAk<sub>(1,1)</sub>(2<sup>*m*</sup> − 1, 2) = 2<sup>2*<sup>m</sup>*−*m*−2 *for any m* ≥ 3*.*</sup> **Collaborating arrays with error correcting ability Sept. 7** 16 / 23

# **A** construction of  $(t, e)$ -locating arrays with  $N = O(k)$  for  $t \ge 2$

- ▶ Some other optimal  $(1, e)$ -locating arrays can be derived from affine geometry.
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# **A** construction of  $(t, e)$ -locating arrays with  $N = O(k)$  for  $t \ge 2$

- ▶ Some other optimal  $(1, e)$ -locating arrays can be derived from affine geometry.
- ▶ Now, we consider the case of *t ≥* 2. As stated before no constructions with  $N \leq O(k)$  are known.
- ▶ We will derive such construction by utilizing Payley type matrices.

# **A Paley type locating array**



#### **Paley type** *s***-ary** (*t, e*)**-locating arrays**

- $\blacktriangleright$  Let  $\mathbb{F}_q$  be the finite fields of order *q*. (Consider an array with  $N = k = q$ .)
- ▶ Let  $\chi$ <sub>*s*</sub> be a primitive multiplicative character of order *s* on  $\mathbb{F}_q$  and  $\zeta$ <sub>*s*</sub> be a primitive *s*-th root of 1 in C.
- ▶ We define a  $q \times q$  array  $A = (a_{xy}) (x, y \in \mathbb{F}_q)$  by  $a_{xy} =$  $\int 0$  if  $x = y$ , *i* if  $\chi$ <sub>s</sub> $(x - y) = \zeta$ <sup>*i*</sup><sub>s</sub>

Then the following can be shown by utilizing some number theoretic technique including Weil's theorem.

Theorem 7 *For any given s, t and e, a q × q array A is an s-ary* (*t, e*)*-LA if q is large enough.*

#### **Examples of Paley type binary** (*t, e*)**-locating arrays**

#### Theorem 8

*Let*  $q \equiv 3$  (mod 4) *be a prime power. Then, for*  $s = 2$ ,

- ▶ *A* is a binary  $(1, e)$ -*LA* with  $e = \frac{q-7}{4}$  if  $q \ge 7$ *.*
- ▶ *A* is a binary (2, e)-LA with  $e = \frac{3q 10\sqrt{q} 43}{16}$  if  $q \ge 11$ *.*
- ▶ *A is a binary* (3*, e*)*-LA with e* = <sup>7</sup>*q−*114*√q−*<sup>215</sup> <sup>64</sup> *if q >* 293*.*

#### Theorem 9

# *Let*  $q \equiv 1$  (mod 4) *be a prime power. Then, for*  $s = 2$ ,

- ▶ *A* is a binary  $(1, e)$ -LA with  $e = \frac{q-11}{4}$  if  $q > 11$ .
- ▶ *A* is a binary (2, e)-LA with  $e = \frac{3q 10\sqrt{q} 91}{16}$  if  $q > 51$ .
- ▶ *A is a binary* (3*, e*)*-LA with e* = <sup>7</sup>*q−*114*√q−*<sup>535</sup> <sup>64</sup> *if q >* 370*.*

#### **Remark to Paley type locating arrays and truncation of rows**

- ▶ A Paley type matrix A can generate an *s*-ary (*t*, *e*)-locating array with  $N = k = q$  if *q* is sufficiently large.
- ▶ A Paley matrix is utilized to construct a Hadamard matrix and a Hadamard matrix is an orthogonal array of strength 2 (not strength *t*).
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- ▶ A Paley matrix is utilized to construct a Hadamard matrix and a Hadamard matrix is an orthogonal array of strength 2 (not strength *t*).
- ▶ Constructions of *t*-locating arrays with  $N \leq O(k)$  is not known for general *t* even if  $e = 0$  except for our construction, which is  $N = k$ .
- ▶ But known lower bound  $LAN_{(t,0)}(k,s)$  is  $N ≥ O(\log k)$ . Our construction requires  $N = O(k)$ . It is not known whether  $N = O(\log k)$  can be attained, or not.
- ▶ We try to truncate rows from our Paley type locating array to reduce the number of tests without loosing the property of a *t*-locating array. (Here, we do not care the error correcting ability *e*.)





More research are required for locating arrays!!!



Takk.

Gratulere med dagen Professor Helleseths sin 70 Arsdag!