# Private information retrieval with codes

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#### 1. Private information retrieval

#### 2. PIR schemes with low computation and storage

Transversal designs and codes A PIR scheme with transversal designs Collusion-resistant PIR schemes with weighted lifted codes

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Is it possible?

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Trivial solution: download all files.

- perfect privacy: no information
- bad download rate...

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 $\boldsymbol{q} \coloneqq (q_1,\ldots,q_n) \leftarrow \mathcal{Q}(i)$ 

Send query  $q_i$  to server  $S_i$ .



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 $r_j \coloneqq \mathcal{A}(\boldsymbol{q}_j, F_{|\boldsymbol{S}_j})$ 



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3. Local reconstruction of the desired file:

$$F_i = \mathcal{R}(\boldsymbol{q}, \boldsymbol{r}, \boldsymbol{i})$$
.



n = 2 servers storing a replica of k = 5 files  $F_1, \ldots, F_5$ 

**Goal:** retrieve file  $F_2$ .

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- 1. Query generation. Pick at random a subset
  - $I \subseteq \{1, \ldots, 5\}$ , and define:

    - query  $q_1 = I$  to server  $S_1$  query  $q_2 = I \Delta \{2\}$  to server  $S_2$



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**Upload:**  $2 \times 5 = 10$  bits to transmit to the servers **Download:** 2|F| bits to receive from the servers **Server computation:** XOR of  $\frac{5}{2}|F|$  bits in average **Client computation:** XOR of 2|F| bits



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# Privacy

The adversary: a **collusion of servers** = a subset of servers  $\{S_j : j \in T\}$ , where  $T \subset [1, n]$ , which exchange information about queries.

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• Information-theoretic (IT) privacy:

$$\mathbf{I}(i; \boldsymbol{q}_{|T}) = 0, \quad \forall T \subseteq [1, n], |T| \leq t.$$

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**Theorem [CGKS95, CG97].** If t = n (in particular if n = 1 server), then:

- for **IT** privacy, **no better solution than full download**,
- computational privacy is possible, but remains expensive as of now.

Main parameters of PIR schemes

We focus on **IT-privacy** (hence we need  $n \ge 2$  servers)

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Several possible **settings**:

- replicated database vs. coded database
- unresponsive or **byzantine** servers
- small entries vs. large entries
- bounded vs. unbounded number of entries in the database
- dynamic database vs. static database

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16 files are replicated over 4 servers. Files are indexed by pairs  $(i,j) \in \{1,2,3,4\}^2$ Assume one wants to retrieve file  $F_{4,3}$ .



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- 1. **Query generation:** pick at random two subsets  $X_1, X_2$  of  $[1, \ell]$ . Then send:
  - $\begin{array}{l} (X_1, X_2) \text{ to server } S_{00}, \\ (X_1 \Delta \{i_1\}, X_2) \text{ to server } S_{10}, \\ (X_1, X_2 \Delta \{i_2\}) \text{ to server } S_{01}, \\ (X_1 \Delta \{i_1\}, X_2 \Delta \{i_2\}) \text{ to server } S_{11}. \end{array}$
- 2. Answers: at reception of  $(Z_1, Z_2)$ , each server  $S_j$  computes  $R_j = \bigoplus_{z \in Z_1 \times Z_2} F_z$  and sends back  $R_j$ .

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- 1. Query generation: pick at random two subsets  $X_1, X_2$  of  $[1, \ell]$ . Then send:
  - $-(X_1, X_2)$  to server  $S_{00}$ , -  $(X_1\Delta\{i_1\}, X_2)$  to server  $S_{10}$ ,
  - $(X_1, X_2 \Delta \{i_2\})$  to server  $S_{01}$ , -  $(X_1 \Delta \{i_1\}, X_2 \Delta \{i_2\})$  to server  $S_{11}$ .
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- 3. **Reconstruction:** compute the XOR of the 4 files  $R_i$  and retrieves  $F_{i_1,i_2}$ .

# Features of the PIR scheme in [CGKS'95-98]

Correct, and secure if no collusion.

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**Quantitative results.** Assume the *k* files have same size |F|. With n = 4 servers,

- **Communication:**  $8\sqrt{k}$  uploaded bits, 4|F| downloaded bits,
- **Storage:** replication of all files over 4 servers,
- **Complexity:**

for each server: in average, XOR of  $(\ell/2)^2 = k/4$  files for the user: XOR of 4 files.

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Generalizable to  $n = 2^b$  servers:

- **Communication:**  $b2^{b}k^{1/b} = n \log(n)k^{1/\log(n)}$  uploaded bits, n|F| downloaded bits,
- **Storage:** replication of all files over *n* servers,
- **Complexity:** 
  - for each server: in average, XOR of k/n files
  - ▶ for the user: XOR of *n* files.

- 1995: first definition [CGKS95]
- 2000: reduction from smooth locally decodable codes [KT00]
- 2000-10's: many improvements
  - PIR with 3 servers and subpolynomial communication [Yek08, Efr09]
  - PIR with 2 servers and subpolynomial communication [DG16]
  - Iower storage overhead with PIR codes [FVY15]
- 2016-now: capacity-achieving schemes, schemes dedicated to storage systems
  - capacity of PIR [SJ17, BU18]
  - (nearly) capacity-achieving schemes [SRR14, CHY15, TR16, ...]

#### 1. Private information retrieval

#### 2. PIR schemes with low computation and storage

Transversal designs and codes A PIR scheme with transversal designs Collusion-resistant PIR schemes with weighted lifted codes

## Context

#### **Previous scheme:**

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#### Tools: coding theory and combinatorics

- transversal designs and associated codes,
- "lifted" codes.

#### 1. Private information retrieval

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#### Transversal designs and codes

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# Coding theory

A (linear) **code** C is a *k*-dimensional subspace of  $\mathbb{F}_q^n$ .

Any code admits **parity-check matrices**  $H \in \mathbb{F}_q^{(n-k) \times n}$  such that

$$\mathcal{C} = \{ \boldsymbol{c} \in \mathbb{F}_q^n \mid \boldsymbol{H}\boldsymbol{c} = \boldsymbol{0} \}.$$

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#### Terminology:

- *h* ∈ RowSpan(*H*) is a **parity-check equation** for *C*.
- **Support:** supp $(h) := \{i \in \{1, ..., n\}, h_i = 0\}$
- Weight:  $\operatorname{wt}(h) := |\operatorname{supp}(h)|.$

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- Weight: wt(h) := |supp(h)|.

**Important remark.** If r = wt(h) and  $i \in supp(h)$ , then for every  $c \in C$ , one can recover  $c_i \in \mathbb{F}_q$  by accessing at most r - 1 other coordinates  $c_i$  of the codeword c:

$$c_i = -\frac{1}{h_i} \sum_{j \in \operatorname{supp}(h) \setminus \{i\}} h_j c_j$$

In that case we call supp(h) \ {i} a helper set for i.

**Our goal.** Design a code  $C \subseteq \mathbb{F}_q^n$  such that, for every  $i \in \{1, ..., n\}$ , there exists a set of helper sets which uniformly covers  $\{1, ..., n\}$ .

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- Querying these "random coordinates" will leak no information about *i* to the servers.

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Let's do this with **combinatorics**.





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## Transversal designs

A transversal design  $TD(n, s) = (X, \mathcal{B}, \mathcal{G})$  is given by:

- $\blacktriangleright$  X a set of *points*, |X| = N = ns,
- a partition of X into subsets  $\mathcal{G} = \{G_j\}_{1 \le j \le n}$  called *groups*:

$$X = \prod_{j=1}^{n} G_j$$
 and  $|G_j| = s$ ,



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$$X = \coprod_{j=1}^{n} \frac{\mathbf{G}_{j}}{\mathbf{G}_{j}}$$
 and  $|\mathbf{G}_{j}| = s$ ,

- ▶ a set of subsets of *X*, "incident" to  $\mathcal{G}$ , called *blocks*  $B \in \mathcal{B}$ :
  - $B \subset X \text{ and } |B| = n$
  - for all  $\{i, j\} \subset X$ , the pair  $\{i, j\}$  lie either in a single group  $G \in \mathcal{G}$ , or in a unique block  $B \in \mathcal{B}$



# Example: a TD(3,3)

#### An example for a TD(3,3):

- -ns = 9 points
- -s = 3 groups  $G_1, G_2, G_3$  of size 3
- ns = 9 blocks of n = 3 points, partitionned into 3 parallel classes  $\mathcal{B}_1, \mathcal{B}_2, \mathcal{B}_3$



## Codes from designs

Let  $\mathcal{T}$  be a transversal design  $\text{TD}(n,s) = (X, \mathcal{B}, \mathcal{G})$  with points  $X = \{x_1, \dots, x_{ns}\}$ , blocks  $B = \{B_1, \dots, B_{ns}\}$  and groups  $\mathcal{G} = \{G_1, \dots, G_n\}$ .

Its **incidence matrix** *M*, of size  $|\mathcal{B}| \times |X| = ns \times ns$ , is defined by:

$$M_{i,j} = \begin{cases} 1 & \text{if } x_j \in B_i \\ 0 & \text{otherwise.} \end{cases}$$

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**Definition.** The **linear code** C **based on** T **over**  $\mathbb{F}_q$  is the  $\mathbb{F}_q$ -linear code having M as a parity-check matrix (*i.e.*  $C^{\perp}$  is generated by M).

- length(C) = |X| = ns,
- $-\dim(\mathcal{C})=\dim(\ker M),$
- − every block  $B \in \mathcal{B}$  gives a parity-check equation  $h \in C^{\perp}$ , such that

$$\operatorname{supp}(\boldsymbol{h}) = \boldsymbol{B}$$
 and  $\operatorname{wt}(\boldsymbol{h}_{|\boldsymbol{G}_i}) = 1, \quad \forall j = 1, \dots, n$ 

The transversal design TD(3,3) represented by:



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gives a code with the following parity-check matrix:

 $H = \begin{pmatrix} 1 & 1 & 1 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 1 & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 1 & 1 & 1 \\ 1 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 & 0 & 1 & 0 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 & 0 & 1 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 & 1 & 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 1 & 0 & 0 & 0 & 1 & 0 \end{pmatrix}$ eristic

#### Dimension of the code?

depends on the characteristic,

▶ for instance, over 
$$\mathbb{F}_3$$
, we have  $\operatorname{rk}(H) = 6 \implies \operatorname{dim}(\mathcal{C}) = 3$ .

#### 1. Private information retrieval

## 2. PIR schemes with low computation and storage

#### Transversal designs and codes

#### A PIR scheme with transversal designs

Collusion-resistant PIR schemes with weighted lifted codes

Let  $C \subseteq \mathbb{F}_q^N$  be a code based on a TD(n, s), with N = ns.

• Initialisation. Encode files  $(F_1, \ldots, F_k) \mapsto c \in C$ , and upload  $c_{|G_i}$  on server  $S_j$ .



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- 2. Each server  $S_i$  sends back  $c_{q_i}$
- 3. User recovers

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$$c_i = -\sum_{j: i \notin G_j} c_{q_j} = -\sum_{b \in B \setminus \{i\}} c_b$$



#### Theorem. This PIR protocol is information-theoretically private.

Proof:

- the only server which holds  $F_i$  received a random query;
- for each other server  $S_j$ , query  $q_j$  gives no information on the block *B* which has been picked  $\Rightarrow$  no information leaks on *i*.
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Question: transversal designs leading to large dimension codes?

### Instances with geometric designs

An example: the **classical affine transversal design**:

- $\blacktriangleright X = \mathbb{F}_q^m \text{ for } m \ge 2,$
- $\mathcal{G}$  a partition of *X* into *q* hyperplanes  $G_1, \ldots, G_q$ ,
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Collusion-resistant PIR schemes with weighted lifted codes

# We have seen a **combinatorial** construction of codes for PIR, using **transversal designs**. Let's now see what we can do **algebraically**.

## Reed-Solomon and Reed-Muller codes

**Definition.** The (full-length) **Reed–Solomon code** of dimension *k* over  $\mathbb{F}_q$  is:

$$\operatorname{RS}_q(k) := \left\{ \operatorname{ev}_{\mathbb{A}^1}(f) := (f(x_1), \dots, f(x_q)) \mid \operatorname{deg}(f) \leq k - 1 \right\}.$$

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**Definition.** The **Reed–Muller code** of order *m* and degree *r* over  $\mathbb{F}_q$  is:

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Reed–Muller codes have the following property:

$$\begin{aligned} \forall \boldsymbol{c} &= \operatorname{ev}_{\mathbb{A}^m}(f) \in \operatorname{RM}_q(m,r) \quad \text{and} \quad \forall \text{ affine line } \boldsymbol{L} \subset \mathbb{A}^m, \\ & \operatorname{ev}_{\mathbb{A}^1}(f_{|\boldsymbol{L}}) \in \operatorname{RS}_q(r+1) \,. \end{aligned}$$

(where  $f_{|L}$  is the lowest-degree univariate polynomial interpolating *f* over *L*)

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(where  $f_{|L}$  is the lowest-degree univariate polynomial interpolating f over L)

In particular, if  $r \le q - 2$ , then  $c_i = f(P_i)$  can be reconstructed by interpolating a polynomial of degree r on q - 1 other points of **any line** passing through  $P_i$ .



Database *F* is encoded with  $RM_q(m, r)$ , then distributed across the servers



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Private information retrieval with codes



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**Features** with  $\text{RM}_q(m, r)$  of length  $q^m$ .

- communication complexity:  $(m 1)q \log q$  uploaded bits,  $q \log q$  downloaded bits
- computational complexity:
  - only 1 read for each server (optimal)
  - a decoding procedure for  $RS_q(r)$  for the user

▶ storage overhead: the **information rate** of  $\text{RM}_q(m, r)$  with  $r \leq q - 1$  is

$$\simeq \frac{(r/q)^m}{m!} \le \frac{1}{m!} \dots$$

 $\implies$  We need codes with the same "recovery properties", and with larger dimension.

"Lifted" codes are the largest codes having the same property as Reed-Muller codes.

New affine-invariant codes from lifting. Guo, Kopparty, Sudan. ITCS. 2013.

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**Definition.** The *m*-th lifted Reed-Solomon code of degree *r* over  $\mathbb{F}_q$  is:

 $\operatorname{Lift}_q(m,r) \coloneqq \{\operatorname{ev}_{\mathbb{A}^m}(f) \mid f \in \mathbb{F}_q[\mathbf{X}] \text{ and } \forall \text{ affine line } L \subset \mathbb{A}^m, \operatorname{deg}(f_{|L}) \leq r\}.$ 

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Lifted codes contain Reed-Muller codes, **sometimes properly**.

**Example.** For q = 4, m = 2, r = 2, consider  $f(X, Y) = X^2 Y^2$  and an affine line *L* with equation (aT + b, cT + d). Then,

$$f(aT+b,cT+d) \equiv (a^2d^2+b^2c^2)T^2+a^2c^2T+b^2d^2 \mod (T^4-T)$$

corresponds to a degree–2 polynomial in *T*. Hence,

$$ev(X^2Y^2)\in Lift_4(2,2) \quad but \quad ev(X^2Y^2)\notin RM_4(2,2)\,.$$

### Lifted codes: application to PIR

**Theorem (Guo, Kopparty, Sudan '13).** For every fixed *m*, and for growing alphabet and length, lifted codes reach arbitrarily large information rates.

Black squares: pairs (i, j) such that  $ev(X^i Y^j) \in Lift_q (m = 2, r = q - 2)$ . q = 4 q = 8q = 16

**Corollary.** For a sufficiently large number of servers, we have PIR with storage overhead  $\rightarrow 0$ .

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Question: how to deal with collusions and byzantine errors?

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For convenience, here m = 2.

**Definition.** A *t*-curve is:

$$\mathcal{L} = \{(x, g(x)) \in \mathbb{A}^2 \mid g \in \mathbb{F}_q[X], \deg(g) \le t\}$$

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**Definition.** The weighted lifted Reed-Solomon code of degree *r* and weight *t* over  $\mathbb{F}_q$  is:

WLift<sub>q</sub>(*t*, *r*) := { $ev_{\mathbb{A}^2}(f) \mid f \in \mathbb{F}_q[X, Y]$  and  $\forall t$ -curve  $\mathcal{L} \subset \mathbb{A}^2$ ,  $deg(f_{\mid \mathcal{L}}) \leq r$ }

**Consequence:** for every codeword  $c \in WLift_q(t, r)$  and every *t*-curve  $\mathcal{L}$ , we have:

 $c_{|\mathcal{L}} \in \mathrm{RS}_q(r+1)$ .



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Seminario Gasiull
# A PIR scheme based on weighted lifted codes



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- Private information retrieval with codes -

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- $\implies$  no *t*-set of servers can find where is
- $\implies$  the PIR scheme is *t*-private

## Parameters



Weighted Lifted Codes: Local Correctabilities and Application to Robust Private Information Retrieval. L., Nardi. IEEE TIT. 2021.

**Theorem.** Let *p* be a prime number,  $t \ge 1$  and  $\alpha \ge 2$  be fixed integers. Then, the information rate WLift<sub>*p*<sup>*e*</sup></sub>(*t*, *p*<sup>*e*</sup> -  $\alpha$ ) grows to 1 when  $e \to \infty$ .

**Corollary:** we get PIR schemes with relative storage overhead  $\rightarrow 0$ , for a constant number of adversaries.



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**Theorem.** Let *p* be a prime number,  $t \ge 1$  and  $c \ge 1$  be fixed integers. Let  $\gamma = 1 - p^{-c}$  and  $C_e = \text{WLift}_{p^e}(t, \gamma p^e)$ . Then, the information rate  $R_e$  of  $C_e$  satisfies:

$$\lim_{e\to\infty}R_e=K_{t,p,c}>0$$

**Corollary:** we get PIR schemes with **constant relative storage overhead**, for a **constant number of collusions** and a **constant fraction of errors**.

Other works. PIR has been a hot topic during for few years.

- ► Notion of PIR capacity: achievable bounds on the download rate of PIR schemes. → requires lot of comuttation of the server side
- **Optimal** constructions over given distributed storage systems:
  - ightarrow data is already encoded by the storage system
  - $\rightarrow$  we can avoid re-encoding and still do PIR

SJ17] *The Capacity of Private Information Retrieval*. Sun, Jafar. IEEE-TIT. **2017**.

TGR18] *PIR from MDS Coded Data in Distributed Storage Systems*. Tajeddine, Gnilke, El Rouayheb. IEEE-TIT. **2018**.

[TGKFH18] *Robust PIR from Coded Systems with Byzantine and Colluding Servers*. Tajeddine, Gnilke, Karpuk, Freij-Hollanti, Hollanti. ISIT. **2018**.

Private Information Retrieval Schemes With Product-Matrix MBR Codes. L., Tajeddine, Freij-Hollanti, Hollanti. IEEE IFS. 2021.

### **Open questions / future works.**

- 1. Combinatorial bounds on the parameters.
- 2. Updatable files?
- 3. Extension to peer-to-peer storage systems (codes on random graphs).

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# Thank you for your attention!