# On the construction of PIR schemes

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# Outline

# 1. Private information retrieval

### 2. PIR schemes for common storage systems

Distributed storage systems A PIR scheme on RS-coded databases A PIR scheme with regenerating codes

# 3. PIR schemes with low computation

Transversal designs and codes A PIR scheme with transversal designs Instances

# 4. Conclusion

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Private information retrieval (PIR):

Given a **remote** database  $F \in \Sigma^M$  and  $i \in [1, M]$ , can we **retrieve** the entry/file  $F_i$ , **without leaking** information on the index *i*? Private information retrieval (PIR):

Given a **remote** database  $F \in \Sigma^M$  and  $i \in [1, M]$ , can we **retrieve** the entry/file  $F_i$ , **without leaking** information on the index *i*?

Trivial solution: full download.

#### Introduced in:

Private Information Retrieval. Chor, Goldreich, Kushilevitz, Sudan. FOCS. 1995.

Database *F* stored (in some way) on *n* servers  $S_1, \ldots, S_n$ , user *U* wants to recover  $F_i$  privately.

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1. *U* generates a query vector  $q = (q_1, ..., q_n) \leftarrow Q(i)$  and sends  $q_i$  to server  $S_i$ 

2. Each server  $S_j$  computes  $r_j = \mathcal{A}(q_j, F_{|S_j})$  and sends it back to U



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3. *U* recovers 
$$F_i = \mathcal{R}(q, r, i)$$



# Privacy

A collusion of servers: set of servers  $\{S_j : j \in T\}$ , where  $T \subset [1, n]$ , which exchange information about queries, data, etc.

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• Information-theoretic privacy:

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

• Computational privacy: by varying the index *i*, distributions of queries  $q_{|T} = Q(i)_{|T}$  are computationally indistinguishable.

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

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Parameters to be taken into account:

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- computation complexity (client and servers)
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#### Several possible settings:

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



Private Information Retrieval. Chor, Goldreich, Kushilevitz, Sudan. FOCS. 1995.

#### Settings:

- |F| = M bits, with  $M = L^2$ , and  $[1, M] \simeq [1, L]^2$ .
- ▶ n = 4 servers  $S_{00}$ ,  $S_{01}$ ,  $S_{10}$ ,  $S_{11}$ , each storing a replica of F.
- **Goal:** retrieve  $F_i = F_{(i_1,i_2)}$ , for  $1 \le i_1, i_2 \le L$ .



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1. *U* generates at random two subsets *X*<sub>1</sub>, *X*<sub>2</sub> of [1, *L*]. Then *U* sends:

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2. At reception of  $(Z_1, Z_2)$ , each server computes  $a = \bigoplus_{z \in Z_1 \times Z_2} F_z$  and sends *a* to the user.

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- 3. User XORs the 4 bits and retrieves  $F_i$ .

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

**Correct**, and **secure** if no collusion.

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With n = 4 servers:

- **Communication:**  $8\sqrt{M}$  uploaded bits, 4 downloaded bits,
- **Storage:** replication of *F* over 4 servers,
- Complexity:
  - for each server: in average, XOR of  $(L/2)^2 = M/4$  bits
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Generalisable to  $n = 2^b$  servers:

- Communication: b2<sup>b</sup>M<sup>1/b</sup> = n log(n)M<sup>1/log(n)</sup> uploaded bits, n downloaded bits,
- Storage: replication of F over n servers,
- Complexity:
  - ▶ for each server: in average, XOR of *M*/*n* bits
  - ▶ for the user: XOR of *n* bits.

- 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]
  - lower 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, ...]

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# Context

Storage systems use codes to cope with node failures.

- Before 2010: mostly replication or parity-check.
- ▶ 2010's: MDS storage (*e.g.* [14, 10] Reed-Solomon code for Facebook).
- ▶ Recently: codes with locality (*e.g.* Hadoop Xorbas).

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Given a code C of length n:



**Definition** (Reed-Solomon code). Let  $\mathbf{x} = (x_1, \dots, x_n) \in \mathbb{F}_q^n$ , pairwise distinct.  $\operatorname{RS}_q(k, n) := \{(f(x_1), \dots, f(x_n)), f \in \mathbb{F}_q[X], \deg f < k\}$  **Definition** (Reed-Solomon code). Let  $\mathbf{x} = (x_1, \dots, x_n) \in \mathbb{F}_q^n$ , pairwise distinct.  $\operatorname{RS}_q(k, n) \coloneqq \{(f(x_1), \dots, f(x_n)), f \in \mathbb{F}_q[X], \operatorname{deg} f < k\}$ 

 $C = RS_q(k, n)$  is **MDS**:

- every codeword c ∈ C can be reconstructed from any k-subset of coordinates of c,
- ▶ any subset of  $d^{\perp}(C) 1 = k$  coordinates of *c* are independent.

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File storage:

a file  $F_i \in \Sigma \simeq \mathbb{F}_{q^s}^k$  is encoded into  $c_i \in \mathrm{RS}_q(k, n) \otimes \mathbb{F}_{q^s}$ 

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Main assumption (can be discussed):

 $s \gg M$ 

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#### Presentation

**Usual goal** (assuming  $s \gg M$ ): a large *PIR rate* 

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Next, we present a PIR scheme for RS-coded databases.

- Originally [TR16], then extended and reformulated [TGKFH18, TGR18].
- Scalable.
- Optimal PIR rate for t = 1 and  $M \to \infty$ .
- PIR rate conjectured optimal for  $M \to \infty$ .

TR16] *PIR from MDS Coded Data in Distributed Storage Systems*. Tajeddine, El Rouayheb. ISIT. **2016**.

 []] [TGKFH18] Robust PIR from Coded Systems with Byzantine and Colluding Servers.

 Tajeddine, Gnilke, Karpuk, Freij-Hollanti, Hollanti. ISIT. 2018.

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Notation:

$$a \star b := (a_1 b_1, \dots, a_n b_n)$$
  
$$\mathcal{C} \star \mathcal{C}' := \langle \{ c \star c' \mid c \in \mathcal{C}, c' \in \mathcal{C}' \} \rangle$$

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#### System parameters:

 $C \subseteq \mathbb{F}_q^n$  the *storage code*,  $C \in C^M$  the coded database  $\mathcal{D} \subseteq \mathbb{F}_q^n$  a *query code* of dual distance  $d^{\perp}(\mathcal{D}) = t + 1$  $J \subseteq [1, n]$  an information set for  $C \star \mathcal{D}$ , and  $\overline{J} := [1, n] \setminus J$ 



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#### Queries:

- 1. the user generates at random *M* words  $d_1, \ldots, d_M \in \mathcal{D}$  and defines *Q* as follows:
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**Remark:** queries remain private against collusions of servers of size  $\leq t$ .



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#### Reconstruction:



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#### Reconstruction: The user collects

$$\mathbf{r} = (r_1, \dots, r_n) = \underbrace{\sum_{m=1}^{M} d_m \star c_m}_{\in \mathcal{C} \star \mathcal{D}} + \underbrace{\mathbf{1}_{\bar{J}} \star c_i}_{=c_i \text{ on } \bar{J}}$$





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and interpolates on J to recover

$$-\sum_{m=1}^{M} d_m \star c_m,$$

- then  $c_i[|\overline{J}]$ .





Features for 1 run of the protocol.

- download cost: *n* symbols over  $\mathbb{F}_{q^s}$
- upload cost: an  $(M \times n)$ -matrix over  $\mathbb{F}_q$  (negligible if  $s \gg M$ )
- ▶ retrieval of  $|\overline{J}| = n \dim(\mathcal{C} \star \mathcal{D})$  symbols of the desired file
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 $d^{\perp}(\mathcal{D}) - 1 = t$  and  $\mathcal{C} \star \mathcal{D} = \mathrm{RS}_q(k + t - 1, n) \Rightarrow |\overline{J}| = n - k - t + 1$ 

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 and  $\mathcal{C} \star \mathcal{D} = \mathrm{RS}_q(k + t - 1, n) \Rightarrow |\overline{J}| = n - k - t + 1$ 

If (n - k - t + 1) | k, then **repeating** several runs gives a (download) **PIR rate**:

$$\rho=\frac{n-k-t+1}{n}=1-\frac{k+t-1}{n}$$

Features for 1 run of the protocol.

- download cost: *n* symbols over  $\mathbb{F}_{q^s}$
- upload cost: an  $(M \times n)$ -matrix over  $\mathbb{F}_q$  (negligible if  $s \gg M$ )
- ▶ retrieval of  $|\overline{J}| = n \dim(\mathcal{C} \star \mathcal{D})$  symbols of the desired file
- the protocol is **private** against collusions of size  $\leq d^{\perp}(\mathcal{D}) 1$

For **Reed-Solomon codes**:  $C = RS_q(k, n)$  and  $D = RS_q(t, n)$ :

$$d^{\perp}(\mathcal{D}) - 1 = t$$
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Otherwise, striping methods allow to achieve the same PIR rate.

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Regenerating codes

### **!!!** Sorry for the notation **!!!**

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**Definition:** C is an  $(n, k, d, \alpha, \beta, B)$ -regenerating code if:

- C is a linear space of dimension *B*, consisting in  $(\alpha \times n)$ -matrices over  $\mathbb{F}_{q}$ ,
- every  $c \in C$  is fully determined by any *k*-subset of columns,
- ► every column of *c* can be "repaired", by downloading  $\beta \le \alpha$  symbols from any *d*-subset of columns (hence  $d\beta \ge \alpha$ ).

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Main bound (cut-set bound [WDR07]):

$$B \leq \sum_{i=0}^{k-1} \min(\alpha, (d-i)\beta).$$

A particular optimal point (minimum-bandwidth repair, MBR):  $d\beta = \alpha$ . Then,

$$B = \left(kd - \frac{k(k-1)}{2}\right)\beta.$$

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Deptimal Exact-Regenerating Codes for Distributed Storage at the MSR and MBR Points via a Product-Matrix Construction. Rashmi, Shah, Kumar. IEEE-TIT. **2011**.

We set  $\beta = 1$ , hence  $\alpha = d$ .

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1. Message symbols are arranged in a  $(d \times d)$ -matrix

 $A = \begin{pmatrix} S & T^\top \\ T & \mathbf{0} \end{pmatrix}$ 

where *S* is  $(k \times k)$ -symmetric.



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$$\boldsymbol{C} = \boldsymbol{A}\boldsymbol{G} \in \mathbb{F}_q^{d \times n}$$
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**Remark:** row *C<sub>i</sub>* of *C* is a word of a RS code

- of dimension k, if j > k,
- of dimension *d* > *k* otherwise.

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Private Information Retrieval Schemes with Regenerating Codes. L., Tajeddine, Freij-Hollanti, Hollanti. arxiv:1811.02898. 2018.



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- For row j = d down to k + 1:
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  - Interpolate random values  $\sum d_m \star C_{j,m}$ .
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# PIR scheme on PM-MBR codes with no collusion

Private Information Retrieval Schemes with Regenerating Codes. L., Tajeddine, Freij-Hollanti, Hollanti. arxiv:1811.02898. 2018.

PIR scheme with **no collusion** (t = 1).

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# PIR scheme on PM-MBR codes

We get a PIR rate:

$$\rho = \frac{1 - \frac{k}{n}}{1 - \frac{k(k+1)(k-1)}{nB}} > 1 - \frac{k}{n}$$

# PIR scheme on PM-MBR codes

We get a PIR rate:



Comparison of PIR rates for n = 40 and k = 7.

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#### **Previous schemes:**

- low communication complexity
- computationally inefficient (linear in  $|F| = \sum_{m=1}^{M} |F_m|$ )

### Our goal:

- optimal computation ( $|r_i|$  for each server  $S_i$ )
- remove the assumption  $s \gg M$
- moderate communication complexity

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

- *X* a set of *points*, |X| = N = ns,
- groups  $\mathcal{G} = \{G_i\}_{1 \le i \le n}$  satisfying

$$X = \prod_{j=1}^{n} G_j$$
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- *blocks*  $B \in \mathcal{B}$  satisfying
  - $B \subset X$  and |B| = n; - for all  $\{i, j\} \subset X$ ,  $\{i, j\}$  lie:

either in a single group  $G \in \mathcal{G}$ , or in a unique block  $B \in \mathcal{B}$ 



Let  $\mathcal{T}$  be a transversal design  $\text{TD}(n, s) = (X, \mathcal{B}, \mathcal{G})$ .

Its **incidence matrix** *M* has size  $|\mathcal{B}| \times |X|$  and 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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The code C based on T over  $\mathbb{F}_q$  is the  $\mathbb{F}_q$ -linear code admitting M as a parity-check matrix ( $C^{\perp}$  is generated by M).

- length(C) = |X|,
- $\dim(\mathcal{C}) = \dim(\ker M)$ ,
- every  $B \in \mathcal{B}$  gives an  $h \in \mathcal{C}^{\perp}$  such that  $wt(h_{|G_i}) = 1, \forall j = 1, ..., n$ .

# Example

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







gives an incidence matrix

Its rank over  $\mathbb{F}_3$  is 6  $\implies$  the associated code  $\mathcal{C}$  is a [9,3]<sub>3</sub> code.

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• Initialisation. User *U* encodes  $F \mapsto c \in C$ , and gives  $c_{|G_i|}$  to server  $S_j$ .

• To recover 
$$F_i = c_i$$
, with  $i \in X$ :

1. User *U* randomly picks a block  $B \in \mathcal{B}$  containing *i*. Then *U* defines:

$$q_j = \mathcal{Q}(i)_j := \begin{cases} \text{unique } \in B \cap G_j & \text{if } i \notin G_j \\ \text{a random point in } G_j & \text{otherwise.} \end{cases}$$

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

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

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

Proof:

- the only server which holds *F*<sub>i</sub> 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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#### Features.

- ▶ communication complexity: *n* log *s* uploaded bits, *n* log *q* downloaded bits
- computational complexity:
  - only 1 read for each server (somewhat optimal)
  - $\leq n$  additions over  $\mathbb{F}_q$  for the user
- ▶ storage overhead:  $(ns M) \log q$  bits, where  $M = \dim(C)$

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**Question:** transversal designs with good dim(C) depending on (n,s)?

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### Instances with geometric designs

 $\mathcal{T}_{A},$  the classical affine transversal design:

- $X = \mathbb{F}_q^m, m \ge 2$ ,
- G a set of q disjoint hyperplanes partitionning X,
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Question: better instances?

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#### An **orthogonal array** OA(t, n, s) of strength *t* is a list *A* of words

- of length *n*,
- over a finite set S, |S| = s,
- such that, for every  $I \subset [1, n]$  of size  $t, A_{|I} = S^t$ .

Equivalently, an OA(t, n, s) is a code  $A \subset S^n$  with dual distance t + 1.

$$S = \{a, b\}$$
$$OA(2, 3, 2) = \begin{bmatrix} a & b & b \\ b & b & a \\ b & a & b \\ a & a & a \end{bmatrix}$$

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Construction OA  $\rightarrow$  TD:  
•  $X = S \times [1, n]$   
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$$(a, 1) \qquad (a, 2) \qquad (a, 3) \\ (b, 1) \qquad (b, 2) \qquad (b, 3)$$

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$$OA\}$$

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(0,2)

#### Construction $OA \rightarrow TD$ :

- $\blacktriangleright X = S \times [1, n]$
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J. Lavauzelle

•  $\mathcal{B} = \{\{(c_i, i), 1 \le i \le n\}, c \in \mathbf{Q}\}$ 

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# Resisting collusions

#### **Proposition.** For t = 2, an OA(t, n, s) gives a TD(n, s).

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for every *t*-set *T* of points lying in *t* different groups, there exists a unique block  $B \in \mathcal{B}$  such that  $T \subset B$ .

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- OAs with t > 2 exist (*e.g.* from Reed-Solomon codes)
- But associated TDs lead to codes with poor rates (except for  $t \ll n$ )

*Private Information Retrieval from Transversal Designs.* L. IEEE-TIT. **2019**.

# Outline

# 1. Private information retrieval

#### 2. PIR schemes for common storage systems

Distributed storage systems A PIR scheme on RS-coded databases A PIR scheme with regenerating codes

### 3. PIR schemes with low computation

Fransversal designs and codes A PIR scheme with transversal designs Instances

# 4. Conclusion

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# Questions?