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# Private Information Retrieval: Chasing Capacity with Algebraic Codes

Simons Institute  
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Institute for Advanced Study  
Technical University of Munich



**Aalto University**  
School of Science

Joint with/Thanks go to:

R.Freij-Hollanti, O.Gnilke, L.Holzbaur  
D.Karpuk, J.Li, R.Tajeddine, A.Wachter-Zeh,...

# Presentation outline

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- Introduction to private information retrieval (PIR)
- PIR capacity: known results and our conjecture ( $\approx$  theorem)
- Star product PIR
- Full support-rank PIR and that theorem
- Current and future directions (beyond PIR)

# Collaborators

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Ragnar  
Aalto



Dave  
WithSecure



Oliver  
Aalborg



Razane  
Helsinki



Lukas  
Infineon



Jie  
Huawei



Antonia  
TU Munich



# Private information retrieval (PIR)

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- With PIR, a user is able to download one out of  $m$  files  $\{x^1, \dots, x^m\}$  from a database without revealing the identity  $i \in [m]$  of the file to the database holder.

## Theorem

*If the data is stored on only one server, perfect privacy cannot be achieved except by downloading the entire data.*

- Distributed storage system (DSS) with  $n$  servers...
- ...encoded with an  $[n, k]$  (MDS) code!

# Short history of PIR

---

- PIR from replicated databases was introduced by Chor in 1995 and was an active topic thereafter [Cho+95; Bei+02; Dvi+16].
  - A sequence of papers reduced the communication cost to be sub-linear in  $m$ .

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- 100s of papers since 2015; hits on IEEE Xplore:
  - 1995–2004: 7
  - 2005–2014: 72
  - 2015–2024: 393

## A toy example with $[n, k]_q = [3, 2]_2$ code

---

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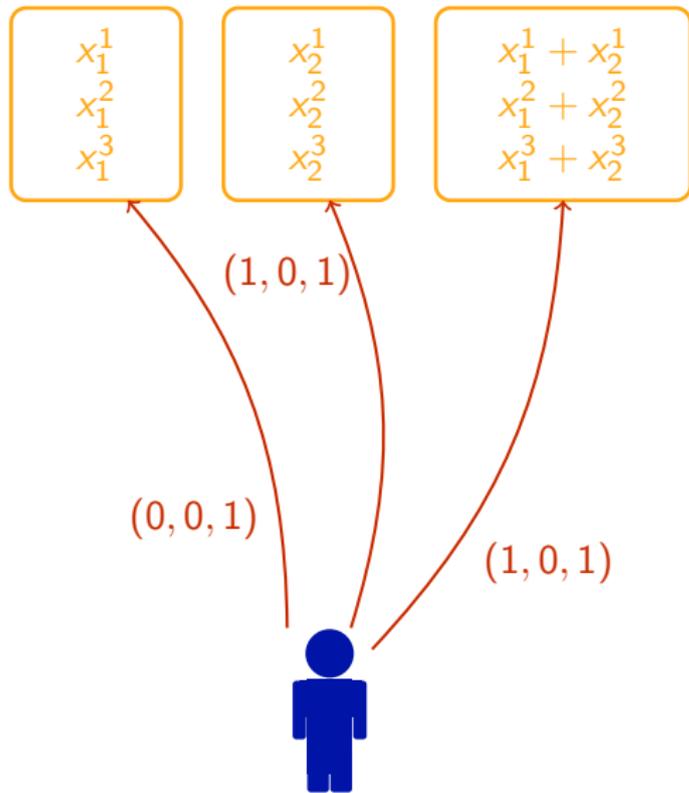
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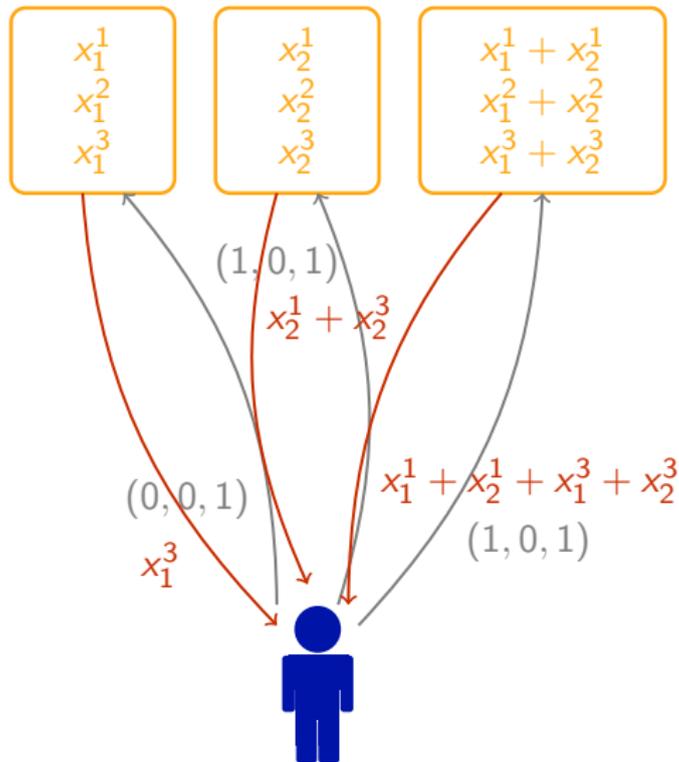


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- Servers respond  $r_j = \langle y_j, q_j \rangle$ .
- Decode  $x_1^1 = \sum_{j=1}^n r_j$ .

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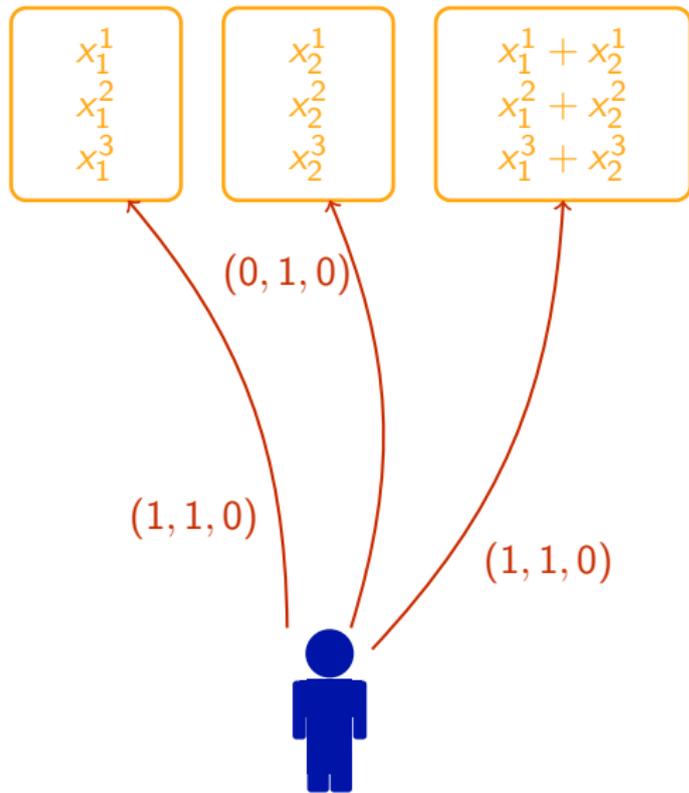
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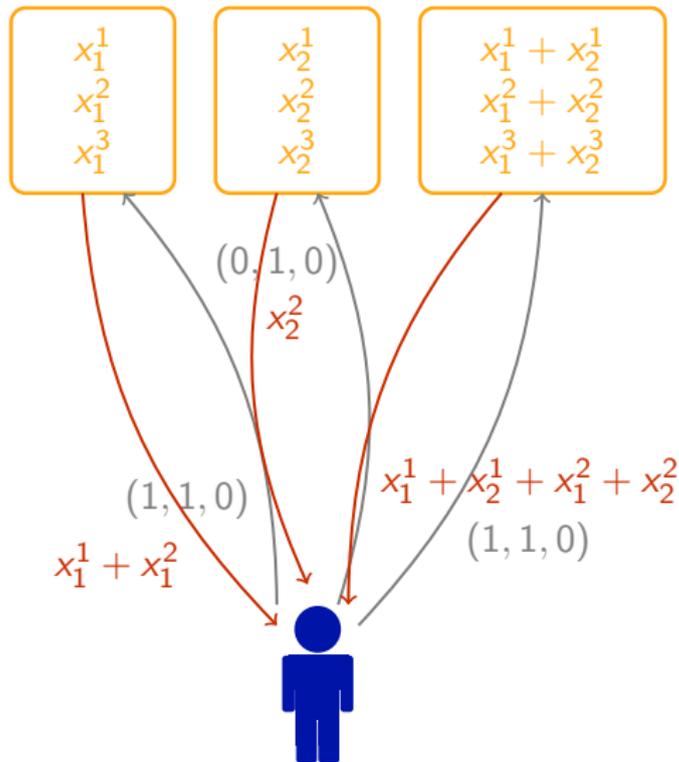


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- $q_2 = u + e_1 = (0, 1, 0)$  to the **2nd** server,  $q_1 = q_3 = u$ .
- $r_j = \langle y_j, q_j \rangle$ .
- $x_2^1 = \sum_{j=1}^n r_j$ .
- Privacy holds if no *collusion*.

## Collusion and $t$ -PIR

---

Servers in a *colluding set* may exchange their obtained queries in order to reveal the identity of the desired file.

### Definition

A PIR scheme *protects against* the colluding set  $J \subseteq [n]$ , if the projection of the overall query  $Q^i$  to  $J$  does not depend on the desired file  $i \in [m]$ .

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### Definition

A  $t$ -PIR scheme protects against any colluding set of size  $\leq t$ .

# Capacity of PIR

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- The rate  $\mathcal{R}$  of a PIR scheme is defined as

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- The capacity  $\mathcal{C}$  of PIR is the maximum possible rate for a given model.
- We call a scheme asymptotically capacity achieving if

$$\mathcal{R} = \lim_{m \rightarrow \infty} \mathcal{C}.$$

# PIR capacity and constructions

---

- Several capacity results and scheme constructions have been reported (non-exhaustive list!):
  - replication [Sun+17; Tia+19]
  - MDS-coded storage [Ban+18; Zhu+19]
  - colluding servers [Sun+18b]
  - **MDS and colluding** [Fre+17; Taj+18; D'O+18]

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  - colluding servers [Sun+18b]
  - **MDS and colluding** [Fre+17; Taj+18; D'O+18]
  - symmetric PIR (SPIR) [Wan+17b; Wan+17a; Wan+17c]
  - single-server PIR with side information [Hei+18]
  - non-MDS storage [Fre+19; Kum+19]
  - ...
  - graph-based PIR [Sad+23]

# Capacity of PIR

- A storage system with  $m$  files has the following (conjectured, mostly proven) capacities:

	replication	$[n, k]$ -coded
no collusion	$\dagger \frac{1-1/n}{1-(1/n)^m} \xrightarrow{m \rightarrow \infty} 1 - \frac{1}{n}$	$\P \frac{1-k/n}{1-(k/n)^m} \xrightarrow{m \rightarrow \infty} 1 - \frac{k}{n}$
$t$ -collusion	$\ddagger \frac{1-t/n}{1-(t/n)^m} \xrightarrow{m \rightarrow \infty} 1 - \frac{t}{n}$	$\S \frac{1-\frac{t+k-1}{n}}{1-(\frac{t+k-1}{n})^m} \xrightarrow{m \rightarrow \infty} 1 - \frac{t+k-1}{n}$

<sup>†</sup> Sun–Jafar [Sun+17].

<sup>¶</sup> Banawan–Ulukus [Ban+18].

<sup>‡</sup> Sun–Jafar [Sun+18b].

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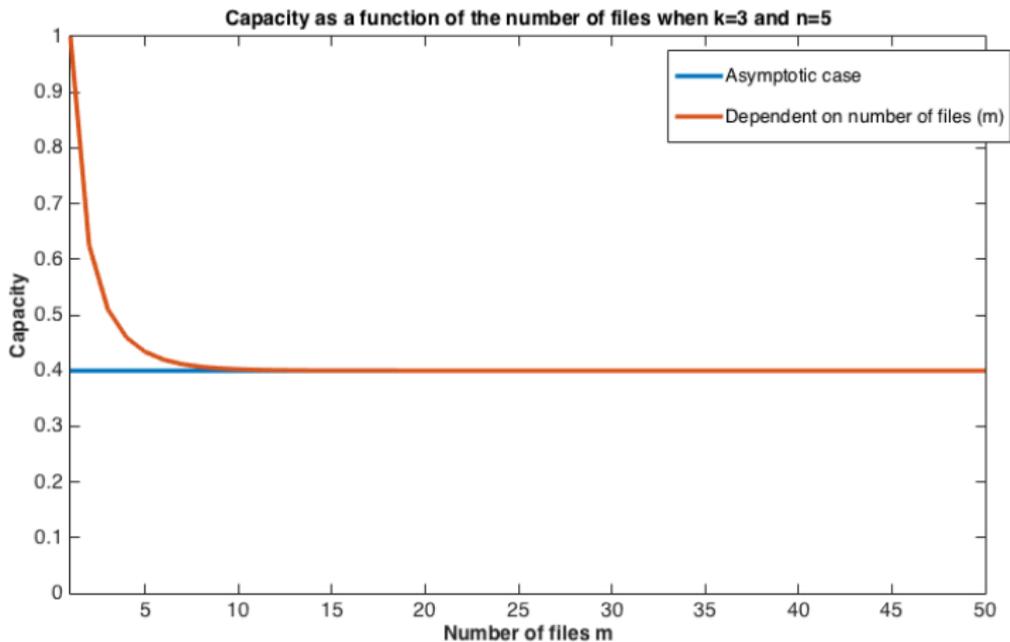
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# Fast convergence: coded case ( $k > 1, t = 1$ )

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# Capacity of uncoded PIR

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## Theorem (Sun–Jafar 2016)

The capacity of replicated  $n$  server PIR for a storage system containing  $m$  files is given by

$$\left(1 + \frac{1}{n} + \cdots + \frac{1}{n^{m-1}}\right)^{-1} = \frac{1 - \frac{1}{n}}{1 - \frac{1}{n^m}} \xrightarrow{m \rightarrow \infty} 1 - \frac{1}{n}$$

Proof (sketch):

- Information theoretic argument to provide an upper bound.
- Scheme that achieves this bound.

## Sun–Jafar construction for replicated data

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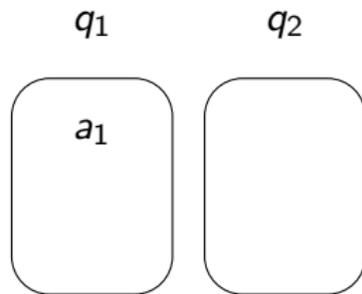
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- “Sub-packetize” files into  $n^m = 4$  (!!!) symbols  $a_1, a_2, a_3, a_4$  and  $b_1, b_2, b_3, b_4$ . Assume a user wants  $a$ .
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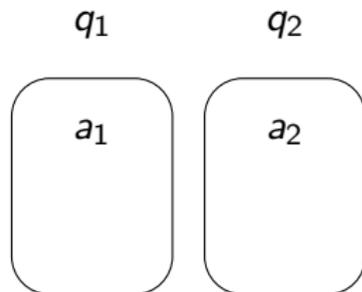
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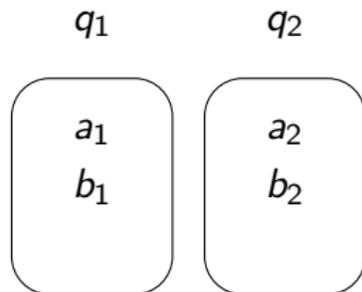


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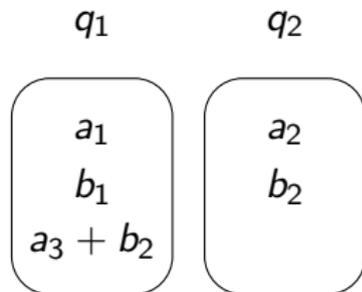


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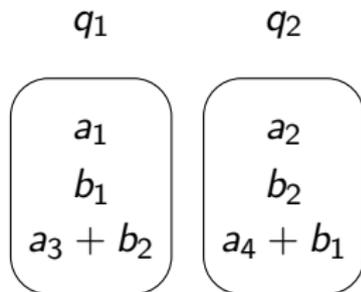


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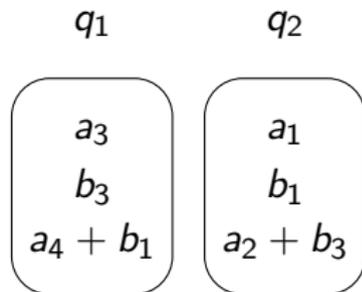


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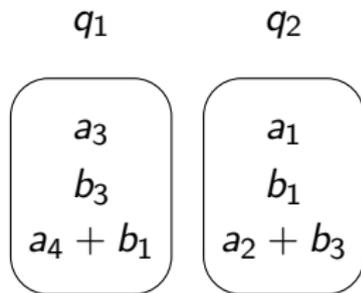


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- Rate =  $\frac{4}{6} = \frac{2}{3}$ .

## Proof of converse (sketch)

---

### Theorem (Sun-Jafar, 2016)

*The rate of any replicated PIR scheme on  $n$  servers with  $m$  files satisfies*

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In other words,

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File size :=  $L$ . *Claim:*

$$\text{\#symbols downloaded} \geq L + \frac{L}{n} + \frac{L}{n^2} + \cdots + \frac{L}{n^{m-1}}.$$

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Proof idea (induction over  $m$ ):

- Need to download  $\geq L$  symbols of the file we want.  
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- From some server, need

$$\geq \frac{D_m}{n} = \frac{1}{n} \left( L + \frac{L}{n} + \frac{L}{n^2} + \cdots + \frac{L}{n^{m-1}} \right)$$

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- Induction step: Assume we want file  $m + 1$ .
- Then by induction assumption, from some server need  $\frac{D_m}{n}$  symbols from the files  $1, \dots, m$ .

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- Induction step: Assume we want file  $m + 1$ .
- Then by induction assumption, from some server need  $\frac{D_m}{n}$  symbols from the files  $1, \dots, m$ .
- In addition, need to download  $L$  symbols from file  $m + 1$ .
- Total download:

$$L + \frac{D_m}{n} = L + \left( \frac{L}{n} + \frac{L}{n^2} + \frac{L}{n^3} + \dots + \frac{L}{n^m} \right) = D_{m+1}$$

□

The proofs for the coded storage case and for the colluding case are similar. Combine to get **coded AND colluding** case? Hard!

## Conjecture for PIR capacity with $t > 1, k > 1$

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**Conjecture** [Fre+17, Conj. 1] Let  $C$  be a linear  $[n, k, d]$  code. Consider  $m$  files and let  $1 \leq t \leq n - k$ . Any  $t$ -PIR scheme has rate

$$\mathcal{R} \leq \frac{1 - \frac{k+t-1}{n}}{1 - \left(\frac{k+t-1}{n}\right)^m} \xrightarrow{m \rightarrow \infty} 1 - \frac{k+t-1}{n}.$$

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- Disproved in [Sun+18a] for  $m = 2, k = t = 2, n = 4$ .  
The PIR rate is  $3/5$ , while the conjecture states  $4/7$ .

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- Disproved in [Sun+18a] for  $m = 2, k = t = 2, n = 4$ . The PIR rate is  $3/5$ , while the conjecture states  $4/7$ .
- The query scheme in the counter-example is not full support-rank!
- Proved for full support-rank schemes in [Hol+22].
- *How*, and what is “full support-rank”?

## Codes from star products

---

- For two vectors  $x, y \in \mathbb{F}_q^n$ , define the *star product*

$$x \star y := (x_1 y_1, \dots, x_n y_n).$$

- Let  $C$  and  $D$  be linear codes in  $\mathbb{F}_q^n$ . Define the *star product code* as the linear span

$$C \star D := \langle \{c \star d \mid c \in C, d \in D\} \rangle.$$

---

<sup>†</sup>Mirandola–Zémor [Mir+15]: Apart from pairs  $C, C^\perp$  and their products, the only pairs that get to this bound are *generalized Reed–Solomon (GRS) codes*.

# Codes from star products

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- For two vectors  $x, y \in \mathbb{F}_q^n$ , define the *star product*

$$x \star y := (x_1 y_1, \dots, x_n y_n).$$

- Let  $C$  and  $D$  be linear codes in  $\mathbb{F}_q^n$ . Define the *star product code* as the linear span

$$C \star D := \langle \{c \star d \mid c \in C, d \in D\} \rangle.$$

- *Product Singleton Bound*<sup>†</sup>:

$$d_{C \star D} \leq n - \dim(C) - \dim(D) + 2$$

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<sup>†</sup>Mirandola–Zémor [Mir+15]: Apart from pairs  $C, C^\perp$  and their products, the only pairs that get to this bound are *generalized Reed–Solomon (GRS) codes*.

# Star-product PIR scheme

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- We proposed a fully general coded retrieval scheme protecting against  $t$ -collusion [Fre+17]<sup>†</sup>.
- Asymptotically capacity achieving at the known points ( $k = 1$ ,  $t = 1$ ), when employed with GRS codes.
- Also achieves the (asymptotic) capacity of the above conjecture.

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- Asymptotically capacity achieving at the known points ( $k = 1$ ,  $t = 1$ ), when employed with GRS codes.
- Also achieves the (asymptotic) capacity of the above conjecture.
- **Novelty:**
  - *Earlier:*  $n$  queries from the entire space  $\mathbb{F}_q^m$ .
  - *Star product scheme:*  $m$  queries from an  $[n, t]$  code  $D \subseteq \mathbb{F}_q^n$ .  
→ smart (star-product) interplay of the  $[n, k]$  storage code  $C$  and the query code  $D$ .

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## Rate vs. capacity

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- What the user receives is a codeword in  $C \star D$  with errors in known positions.
- These errors can be treated as erasures and we know that the code  $C \star D$  can correct up to  $d_{C \star D} - 1$  erasures.

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- Asymptotically capacity (and conjecture) achieving:

## Capacity of $\star$ -product schemes

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Any “strongly linear” scheme can be replaced by a star product scheme for the same privacy model, without losing in the PIR rate:

### Theorem ([Hol+22])

*Consider a strongly linear PIR scheme from a storage code  $C$  and a query scheme as above. Then the rate is bounded by*

$$\mathcal{R} \leq 1 - \frac{k + t - 1}{n}$$

*for any number of files  $m$ .*

This bound coincides with the asymptotic capacity conjecture, which is achieved for any number of files with star product PIR.

# Full support-rank PIR

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- Clearly, it is suboptimal to send linearly dependent queries to servers.
- However, submatrices of the query matrix may be dependent [Sun+18a], *i.e.*, have supported columns that are linearly dependent.
- The technical assumption of full support-rank restricts all supported columns  $\mathcal{T}$ ,  $|\mathcal{T}| \leq t$ , to be independent:

## Definition

A linear PIR scheme is of *full support-rank* if for every query realization  $q \in \mathbb{F}^{\alpha m \times \beta n}$ , any subset  $\mathcal{T} \subseteq [n]$  of  $|\mathcal{T}| \leq t$  servers, and any file index  $i \in [m]$

$$\text{rank}(q[\psi_\alpha(i), \psi_\beta(\mathcal{T})]) = |\text{colsupp}(q[\psi_\alpha(i), \psi_\beta(\mathcal{T})])|.$$

# Capacity of full support-rank PIR

---

## Theorem ([Hol+22])

*The capacity of full support-rank linear PIR from  $[n, k]$ -MDS coded storage with  $t$  colluding servers is*

$$C = \frac{1 - \frac{k+t-1}{n}}{1 - \left(\frac{k+t-1}{n}\right)^m} \xrightarrow{m \rightarrow \infty} 1 - \frac{k+t-1}{n}.$$

- The converse follows the converse proof for the symmetric case [Wan+17a] with some additional lemmas.
- A capacity-achieving scheme can be constructed from [Fre+17; D'O+18].

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- The converse follows the converse proof for the symmetric case [Wan+17a] with some additional lemmas.
- A capacity-achieving scheme can be constructed from [Fre+17; D'O+18].
- The proof settles the earlier conjecture for linear PIR schemes for full support-rank schemes, which seems to cover *almost* everything.

## How to interpret the above result?

---

- Our definition of full support-rank PIR captures the linear independency of the queries that all general capacity-achieving schemes have in common.
- In order to exceed the conjectured capacity, it is *necessary* for some restrictions of the queries to subsets of  $t$  servers to be linearly dependent.

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- Our definition of full support-rank PIR captures the linear independency of the queries that all general capacity-achieving schemes have in common.
- In order to exceed the conjectured capacity, it is *necessary* for some restrictions of the queries to subsets of  $t$  servers to be linearly dependent.
- It is exactly this property that allows the scheme of [Sun+18a], which is *not* of full support-rank, to exceed the full support-rank capacity.
- It seems difficult to extend the counter-example for  $m > 2$  while maintaining a good rate.

# Conclusion

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- Intro to star product PIR from coded storage.
- Overview of capacity results.
- Strongly linear and full support-rank PIR capacity (almost) proving earlier conjectures.
- Importance of star product schemes in terms of practical implementation: small field sizes and low sub-packetization.
- Highly generalizable  
→ stragglers, adversaries, networks, streaming, distributed computation, interference alignment, quantum,...

# Beyond PIR: current and future directions

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Okko



Elif



Syed



Masahito



Tefjol



Matteo

- Secure (analog) distributed matrix multiplication (SDMM):  
Okko Makkonen
- Cross-subspace alignment codes (CSA) for PIR and SDMM:  
cf. Jafar et al.
- Generalizations of the above using algebraic geometry codes:  
Okko, Dave, Elif Sacikara (+Gretchen)
- Quantum PIR: Matteo Allaix, Lukas, Tefjol Pllaha, Masahito Hayashi+group, Syed Jafar+group

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Aalto University  
School of Science

# Linear and strongly linear (SL) PIR

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## Definition

A PIR scheme is *linear* if the responses are given by

$$A_j^i = \langle Q_j^i, Y_j \rangle, \forall j \in [n].$$

## Definition

A linear PIR scheme is *strongly linear* (SL) if each symbol of the desired file  $x^i$  is obtained as a deterministic linear function over  $\mathbb{F}_q$  of the response vector  $(A_1^i, \dots, A_n^i)$ , not depending on the randomness used to produce the queries.

- Strong linearity is important in practice, since it allows for **small field size** and **low sub-packetization level**  $O(k(n-k))$  (in contrast to  $O(n^m)$ ).

# PIR codes from star products

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- Consider  $m$  files  $x^1, \dots, x^m$ .

$$\begin{matrix} x^1 \\ \vdots \\ x^m \end{matrix} \begin{pmatrix} \boxed{x_1^1 \quad \dots \quad x_k^1} \\ \vdots \quad \ddots \quad \vdots \\ \boxed{x_1^m \quad \dots \quad x_k^m} \end{pmatrix}$$

# PIR codes from star products

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- Consider  $m$  files  $x^1, \dots, x^m$ .
- We encode this data using an  $[n, k, d_C]$  storage code  $C$  with generator matrix  $G_C$  and store it on  $n$  servers.

$$\begin{matrix} x^1 \\ \vdots \\ x^m \end{matrix} \begin{pmatrix} \boxed{x_1^1 \quad \dots \quad x_k^1} \\ \vdots \quad \ddots \quad \vdots \\ \boxed{x_1^m \quad \dots \quad x_k^m} \end{pmatrix} \cdot G_C = \begin{matrix} \text{Server 1} & \dots & \text{Server } n \end{matrix} \begin{pmatrix} \boxed{y_1^1} & \dots & \boxed{y_n^1} \\ \vdots & \ddots & \vdots \\ \boxed{y_1^m} & \dots & \boxed{y_n^m} \end{pmatrix}$$

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- Protects against failure of up to  $d_C - 1$  servers.