



Improved Private Information Retrieval Rate for Noncolluding Coded Distributed Storage

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Joint Estonian-Latvian Theory Days 2022 May 08, 2022

- Distributed storage using coding techniques:¹
 - data is encoded by an [n,k] linear code, and then distributed and stored across n storage servers

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 - E.g., locally repairable codes (LRCs)

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Data consists of M files, file index $m \in \{1, ..., M\} \triangleq [1 : M]$, and each file $X^{(m)}$ has size/length β (file size or subpacketization)















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- Iinear-coded data:
 - using an arbitrary $\left[n,k\right]$ linear code to encode the data
 - LRCs are (in general) not MDS codes



Private Information Retrieval (PIR) for Distributed Storage

- n non-colluding servers: $l \in [1:n]$
- M files: $\mathbf{X}^{(m)}$, $m \in [M]$
- file size: β symbols



PIR: Upload

- n non-colluding servers: $l \in [1:n]$
- M files: $\mathbf{X}^{(m)}$, $m \in [M]$
- file size: β symbols





PIR: Download

- n non-colluding servers: $l \in [1:n]$
- M files: $\mathbf{X}^{(m)}$, $m \in [\mathbf{M}]$
- file size: β symbols





Requirements of PIR

- n non-colluding servers: $l \in [1:n]$
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Information-Theoretic PIR

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- PIR schemes were firstly studied in the computer science community
- PIR for replicated data (2 servers) was proposed
 - in the case of a single server, the solution is to download the entire data
- The efficiency of a classical PIR scheme is measured by the total amount of communication, i.e., the sum of the upload and download cost





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only the download cost is considered!!!





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- The PIR rate is independent of the number of files: a file-independent scheme

$$\mathsf{R}(\mathscr{C}_{\mathsf{MDS}}) = 1 - \frac{k}{n}$$





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$$C_{\mathrm{M},\mathrm{PIR}} \triangleq \frac{1 - \frac{1}{n}}{1 - \left(\frac{1}{n}\right)^{\mathrm{M}}}$$



Channel Capacity vs. PIR Capacity

- Channel capacity. $P_{\rm e} \rightarrow 0$ as the code blocklength $n \rightarrow \infty$
 - Achievability: What is the transmission rate that a coding scheme can achieve (lower bound)?
 - Converse: What is the maximum possible transmission rate that a coding scheme can achieve (upper bound)?
- **PIR capacity.** Ensure privacy and correctness (zero error) as the file size $\beta \rightarrow \infty$
 - Achievability: What is the PIR rate that a PIR scheme can achieve (lower bound)?
 - Converse: What is the maximum possible PIR rate that a PIR scheme can achieve (upper bound)?





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PIR rate of the file-independent scheme proposed by Tajeddine and El Rouayheb


Influential Previous Work



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asymptotic MDS-PIR capacity

PIR rate of the file-independent scheme proposed by Tajeddine and El Rouayheb



Data is encoded by an [n,1] repetition code with $\beta=n-1$





• To retrieve $\mathbf{X}^{(m)} = \begin{bmatrix} X_{1,1}^{(m)}, \dots, X_{n-1,1}^{(m)} \end{bmatrix}^{\mathsf{T}}$ of size n-1



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- Queries: Send U to Server 1, send $U+e_{(m-1)\cdot(n-1)+1}$ to Server 2,..., and send $U+e_{(m-1)\cdot(n-1)+(n-1)}$ to Server n



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- Answers:

$$A_{1} = \sum_{m'=1}^{M} \sum_{j=1}^{n-1} U_{m',j} X_{j,1}^{(m')}, \qquad A_{2} = \sum_{m'=1}^{M} \sum_{j=1}^{n-1} U_{m',j} X_{j,1}^{(m')} + X_{1,1}^{(m)} \cdots$$
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 - requires a large subpacketization parameter β that is exponential in the number of files ${\it M}$
 - a Shannon-theoretic re-formulation of converse bound is proposed



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 - the minimum upload cost of all possible PIR capacity-achieving linear PIR schemes is equal to

 $n(\mathsf{M}-1)\log_2 n$



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• the minimum file size of all possible PIR capacity-achieving linear PIR schemes is equal to n-1



We propose a PIR scheme for linear-coded data with any number of files:

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- It achieves the MDS-PIR capacity for a particular class of non-MDS storage codes
 - those codes are referred to as MDS-PIR capacity-achieving codes
 - a generalization of the Sun-Jafar scheme and Banawan-Ulukus scheme



Review: Information-Theoretic PIR





Retrievability: Use Information Sets

$$\beta' \begin{cases} X^{(m)} : \beta = \beta' \times k \\ X^{(m)}_{1,1} X^{(m)}_{1,2} \cdots X^{(m)}_{1,k} \\ X^{(m)}_{2,1} X^{(m)}_{2,2} \cdots X^{(m)}_{2,k} \\ \vdots & \vdots & \cdots & \vdots \\ X^{(m)}_{\beta',1} X^{(m)}_{\beta',2} \cdots X^{(m)}_{\beta',k} \\ \end{cases}$$

 $C^{(m)}:\beta=\beta'\times n$

$C_{1,1}^{(m)}$	$C_{1,2}^{(m)}$	•••	$C_{1,n}^{(m)}$
$C_{2,1}^{(m)}$	$C_{2,2}^{(m)}$	•••	$C_{2,n}^{(m)}$
:	:	•••	:
$C^{(m)}_{\beta',1}$	$C^{(m)}_{\beta',2}$	•••	$C^{(m)}_{\beta',n}$

Goal: reconstruct all β' stripes of $X^{(m)}$



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Retrievability: Use Information Sets



• Information set: a set $\mathcal{I} = \{j_1, \dots, j_k\} \subseteq [1:n]$ such that the code symbols $(C_{j_1}, C_{j_2}, \dots, C_{j_k})$ determine the k information symbols



• For any [n,k] code ${\mathscr C}$, one can always find two parameters ν and κ such that

- each coordinate $j \in [1:n]$ appears exactly κ times in ν sets $\{S_i\}_{i=1}^{\nu}$
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- An [n, k] code C^{*} (not necessarily be MDS) is called an MDS-PIR capacity-achieving code if

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- $\bullet \ {\mathscr C}_{\mathsf{MDS}} \subset {\mathscr C}^*: (\nu, \kappa) = (n, k)$



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• Only the PIR capacity of non-MDS-PIR capacity-achieving codes is not yet determined!



Example: An MDS-PIR Capacity-Achieving [5,3,2] Code

• Consider a [5,3,2] binary non-MDS code ${\mathscr C}$ with generator matrix

$$\mathsf{G} = \begin{pmatrix} 1 & 0 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 & 1 \\ 0 & 0 & 1 & 0 & 1 \end{pmatrix}$$

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• There exist 5 information sets of $\mathscr C$ such that $((\nu,\kappa) = (5,3))$





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information sets	sets	code coordinates										
$T' = \int 2 \cdot 2 \cdot 4 \int$	S'		9	2	1	5	Stack	code coordinates				
$L_1 = \{2, 3, 4\}$	O_1		4	0	4	0	SLACK	1	2	3	4	5
$\mathcal{T}'_{2} = \{1 \ 4 \ 5\}$	S'_{2}	1			4	5		-	4	•	Т	0
22 - [1, 4, 0]	02							1	2	3	4	5
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$\mathcal{T}_{2}' = \{1, 4, 5\}$	S'_{2}	1			4	5	>	1	4	•	т	0
22 [1, 1, 5]		-			-			1	2	3	4	5
$\mathcal{I}'_3 = \{1, 2, 3\}$	S'_3	1	2	3					_	-	_	
0 (/ /)	0						1		$(\nu,$	κ)	= (3	(3, 2)



- Consider the binary [5,3,2] non-MDS-PIR capacity-achieving code \mathscr{C}'
- Define the interference symbols: $I_{h,l} \triangleq \boldsymbol{u}_h^{\mathsf{T}} \boldsymbol{c}_l, h \in \mathbb{N}, l \in [1:n]$
- u is a vector of length βM with i.i.d. uniformly distributed components



- Consider the binary [5,3,2] non-MDS-PIR capacity-achieving code \mathscr{C}'
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$$\mathcal{I}'_1 = \{2,3,4\} \subseteq \mathcal{S}'_1 = \{2,3,4,5\} \Longrightarrow \text{obtain } x^{(m)}_{1,1}$$



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• $\mathcal{S}'_3 = \{1,2,3\} \Longrightarrow$ recover the *m*-th file: $\begin{bmatrix} x_{1,1}^{(m)}, x_{1,2}^{(m)}, x_{1,3}^{(m)} \end{bmatrix}$ $(\beta = 1)$



• Theorem (Symmetric Protocol). The PIR rate

$$R_{M,S}(\mathscr{C}) = \frac{(\nu - \kappa)k}{\kappa n} \left[1 - \left(\frac{\kappa}{\nu}\right)^M \right]^{-1} \quad \text{ is achievable}$$



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Asymmetry Helps for Non-MDS-PIR Capacity-Achieving Codes

• Theorem (Asymmetric Protocol A). The PIR rate

$$\mathsf{R}_{\mathsf{M},\,\mathsf{A}}(\mathscr{C}) \triangleq \left(1 - \frac{\kappa}{\nu}\right) \left[1 - \left(\frac{\kappa}{\nu}\right)^{\mathsf{M}}\right]^{-1} \quad \text{ is achievable}$$



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• It can be shown that $R_{M,S}(\mathscr{C}) < R_{M,A}(\mathscr{C})$ for any given ν and κ



• Consider the [5,3,2] binary non-MDS code \mathscr{C}' with generator matrix

$$\mathsf{G}' = \begin{pmatrix} 1 & 2 & 3 & 4 & 5 \\ 1 & 0 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 & 0 \\ 0 & 0 & 1 & 0 & 1 \end{pmatrix}$$



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Protocol B:

Responses	Server 1	Server 2	Server 3	Server 4	Server 5
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If the generator matrix G of a non-MDS-PIR capacity-achieving code 𝒞_{DS} has the structure (n = ∑^P_{p=1} n_p, k = ∑^P_{p=1} k_p, G_p: size k_p × n_p)

 $\mathsf{G} = \begin{pmatrix} \mathsf{G}_1 & & \\ & \mathsf{G}_2 & \\ & & \mathsf{G}_p \end{pmatrix}, \quad \mathscr{C}^{\mathsf{G}_p} : [n_p, k_p] \text{ MDS-PIR capacity-achieving codes with } \mathsf{G}_p$ (a direct sum of MDS-PIR capacity-achieving codes)



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• Theorem (Asymmetric Protocol B). The PIR rate

$$\mathsf{R}_{\mathsf{M},\,\mathsf{B}}(\mathscr{C}_{\mathsf{DS}}) \triangleq \left(\sum_{p=1}^{\mathsf{P}} \frac{k_p}{k} \Big(\mathsf{C}_{\mathsf{M}}^{[n_p,k_p]}\Big)^{-1}\right)^{-1} \quad \text{is achievable}$$



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- If such code exists, then one can show that $R_{M,\,A}(\mathscr{C}_{DS}) < R_{M,\,B}(\mathscr{C}_{DS})$









- For codes that cannot be decomposed into a direct sum of MDS-PIR capacity-achieving codes, the PIR capacity is still unknown...
 - a code-dependent, but file-independent asymmetric protocol is also proposed
 - Protocol A could still be improved





• Open Problem 1: What is the PIR capacity for non-MDS encoded data?





- Open Problem 2: Is $C_{\mathcal{M}}^{[n,k]}$ the limit for any [n,k] linear-coded DSS?
 - So far, no [n,k] non-MDS-PIR capacity-achieving code gives a strictly larger PIR rate than $\mathbf{C}_M^{[n,k]}$





Asymmetric PIR protocols could be needed for a coded DSS using non-MDS-PIR capacity-achieving codes

