

# Moulin Coding

A Multilinear-Algebraic Solution for Cloud Storage Services

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# Outline

Part I: Motivation from cloud storage services

Part II: Review multilinear algebra (Brief! Just one page!)

Part III: Actual construction of *Moulin Codes*

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# Motivation from cloud storage services



A cloud storage service is a collection of hard disks that help you store big files.

Initially, you upload a big file to the cloud. Each hard disk will store part of your file.

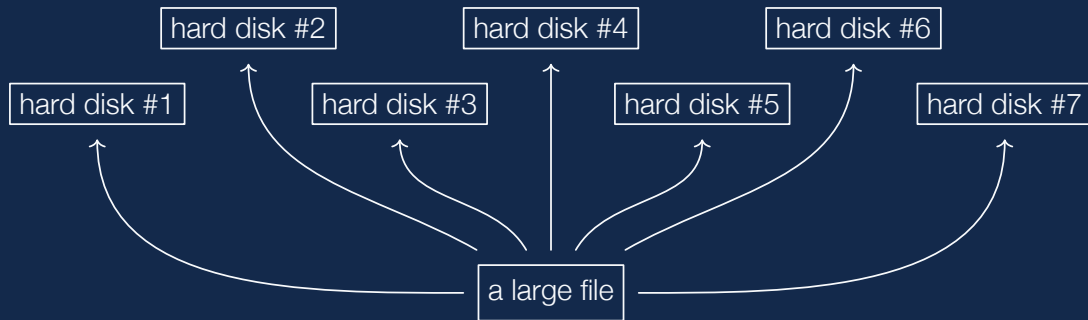
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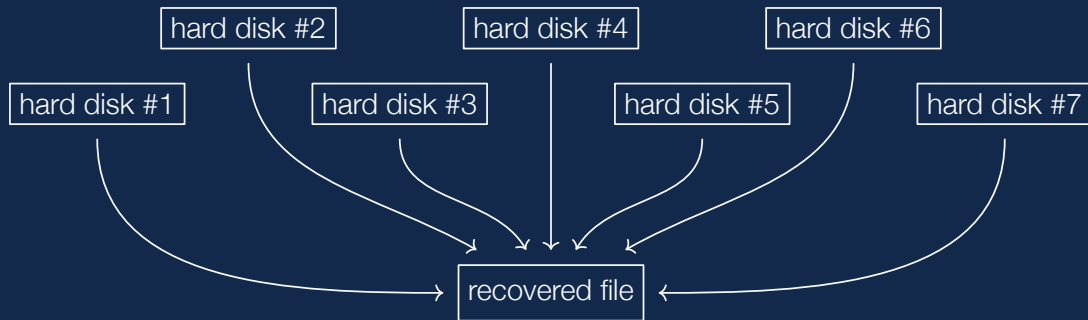


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## What could go wrong behind the scene?

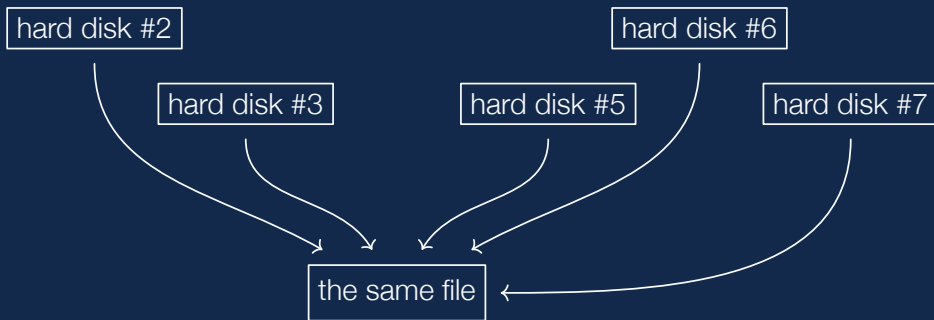


Difficulty (A): Errors (mostly erasures) occur spontaneously. To ensure that random errors do not corrupt your file, the cloud is equipped with error correcting codes.

For instance, the cloud may use a  $[7, 5, 3]$ -MDS code to protect the file, meaning that every set of five disks contains sufficient information to recover the file. Example 2 3

Difficulty (B): Fixing errors costs money. We can certainly reconstruct the entire file from healthy disks and simulate the user-uploading phase. But can it be cheaper? Example 2 3

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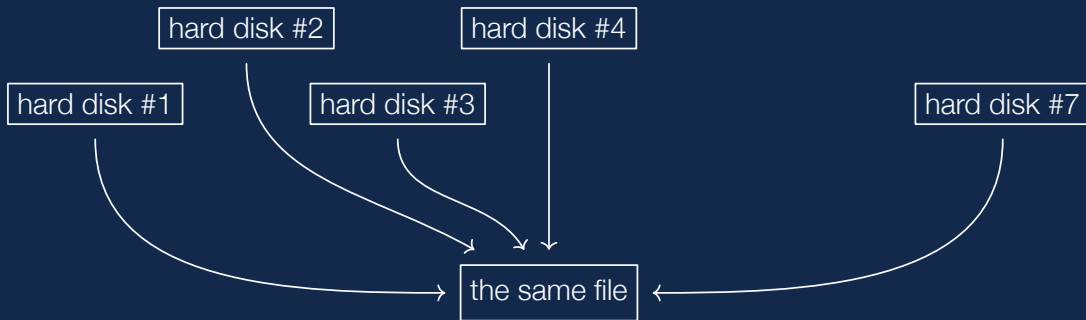


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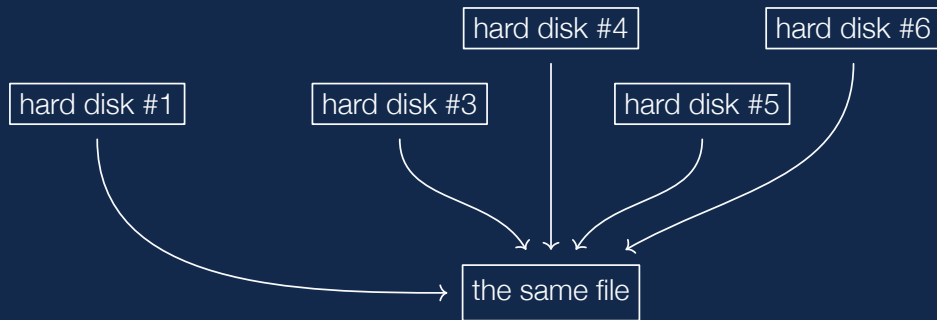


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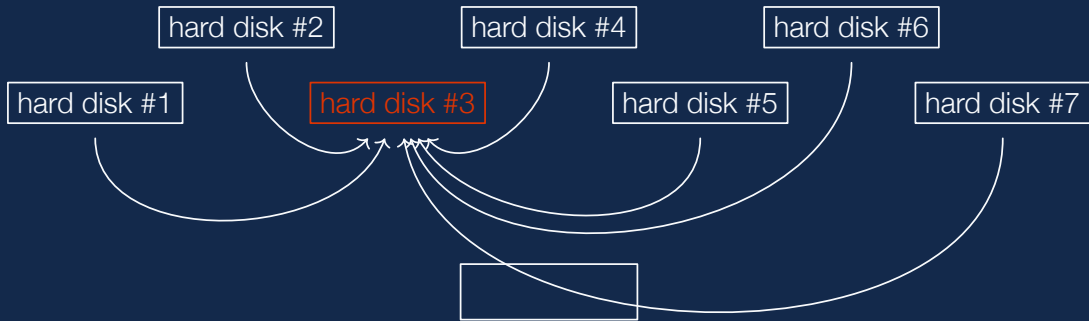


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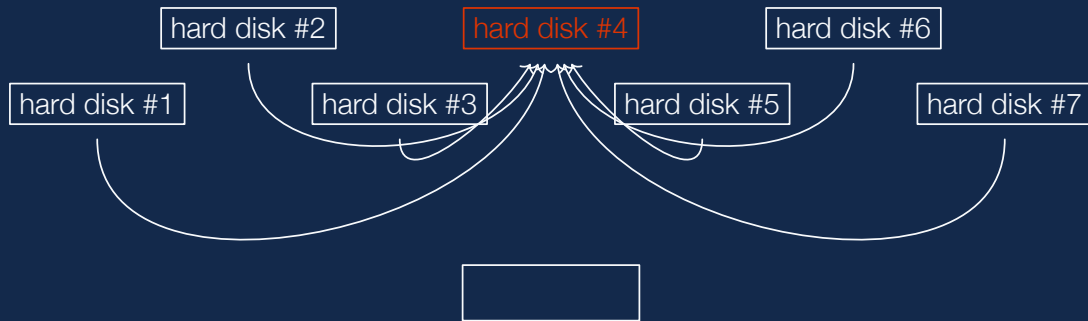


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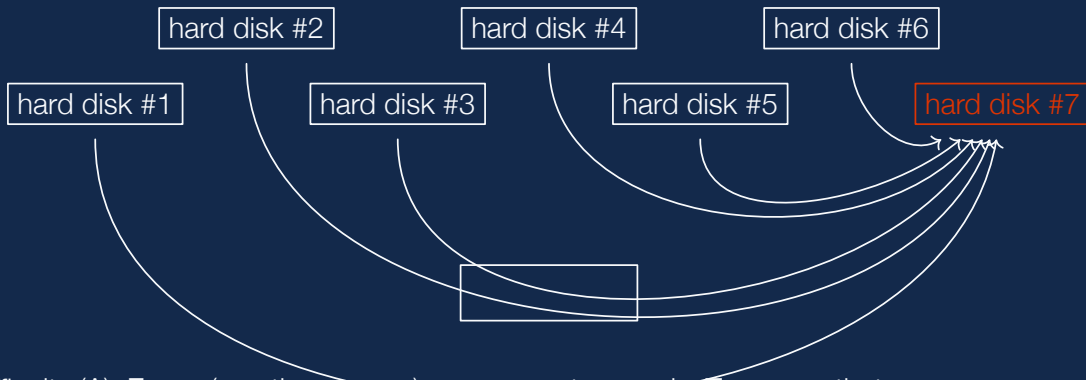
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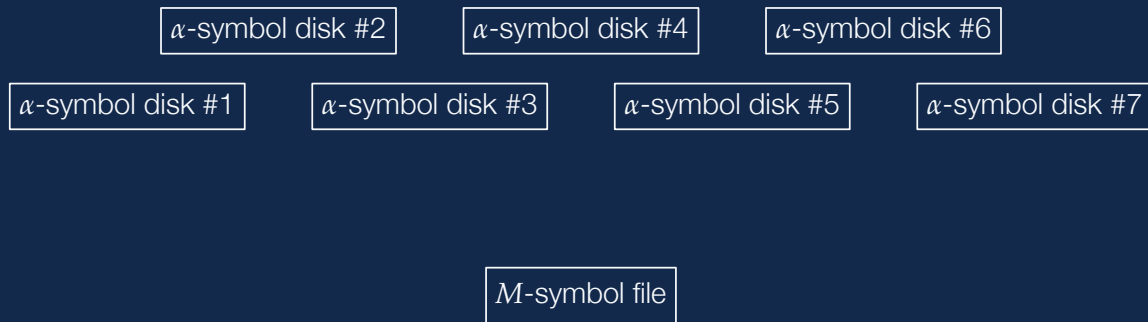


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# Some notations and criteria of being a good cloud

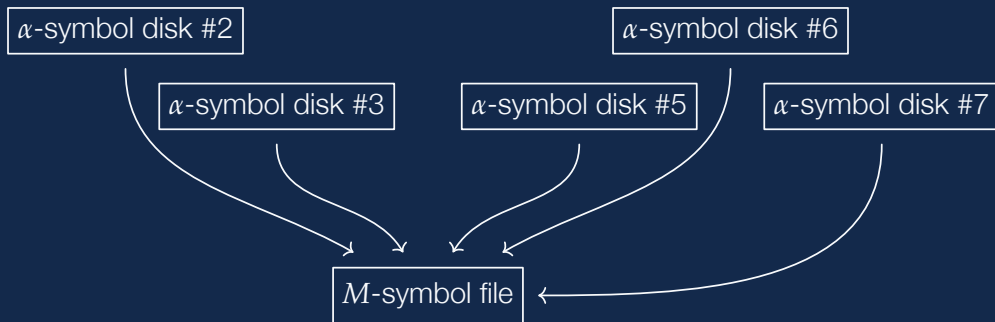


The following notations are used in related literature: The file consists of  $M$  symbols. There are  $n$  ( $= 7$ ) hard disks. Every disk can store  $\alpha$  symbols. ( $\alpha$  is called *disk capacity*).

Requirement (A): Every set of  $k$  ( $= 5$ ) disks contains sufficient information to recover the file.

Requirement (B): Every set of  $d$  ( $= 6$ ) disks can reconstruct, from scratch, the remaining disk by each sending out  $\beta$  symbols of information it has. ( $\beta$  is called *repair bandwidth*.)

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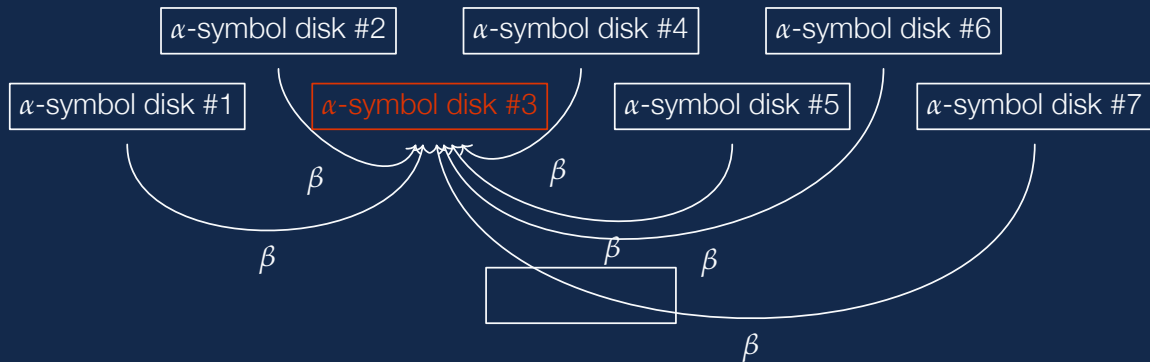


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# Designing cloud as a linear coding problem

We can now formalize what a cloud should satisfy.

File size is  $M$  symbols  $\longleftrightarrow$  File is a linear map  $\varphi: \mathbb{F}^M \rightarrow \mathbb{F}$ , where  $\mathbb{F}$  is some large alphabet.

$n$  disks of capacity  $\alpha$   $\longleftrightarrow$  the  $h$ th disk stores restriction  $\varphi|_{X_h}$  for some subsp  $\mathbb{F}^\alpha \cong X_h \subseteq \mathbb{F}^M$ .

Any  $k$  disks recover the file  $\longleftrightarrow$  Any  $k$  subspaces  $X_{h_1}, \dots, X_{h_k}$  span  $\varphi$ 's domain,  $\mathbb{F}^M$ .

Any  $d$  disks repair with bandwidth  $\beta$   $\longleftrightarrow \exists$  subsp  $\mathbb{F}^\beta \cong Y_h^f \subseteq X_h$  s.t.  $Y_{h_1}^f + \dots + Y_{h_d}^f \supseteq X_f$ .

One such tuple  $(n, k, d, \alpha, \beta, M; X_h, Y_h^f)$  is called a *regenerating code*.

Sanity check:  $k \leq d < n$  (repairing is possible) and  $d\beta < M$  (repairing is nontrivial).

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Part III: Actual construction of *Moulin Codes*

# Multilinear algebra review (theses are the only properties we need)

Anti-commutativity: Let  $x, y, z$  be vectors, then  $y \wedge y = 0$  and  $x \wedge z = -z \wedge x$ .

Multilinearity: Let  $t$  be scalar, then  $x \otimes (y + tz) = x \otimes y + tx \otimes z$ ; and same for  $\wedge$ .

Functoriality: Let  $\tilde{\zeta}, \eta, \zeta$  be tensors, then  $\tilde{\zeta} \mapsto \zeta$  extends naturally to  $\tilde{\zeta} \otimes \eta \mapsto \zeta \otimes \eta$ .

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## Construct Moulin Code for special $k = d$

Recall:  $n$  disks;  $k$  recover the file;  $d$  repair erased disks;  $k \leq d < n$ , otherwise trivial.

Let  $W := \mathbb{F}^k$ . Consider the wedge-multiplication

$$\begin{aligned} W \otimes W \wedge W &\longrightarrow W \wedge W \wedge W, \\ x \otimes y \wedge z &\longmapsto x \wedge y \wedge z. \end{aligned}$$

It has a natural transpose/dual map, called co-wedge-multiplication

$$\begin{aligned} \nabla: W \wedge W \wedge W &\longrightarrow W \otimes W \wedge W, \\ x \wedge y \wedge z &\longmapsto x \otimes y \wedge z - y \otimes x \wedge z + z \otimes x \wedge y. \end{aligned}$$

Let the file be any map  $\varphi: W \otimes W \wedge W \rightarrow \mathbb{F}$  such that  $\varphi|_{\text{im } \nabla} = 0$ , meaning that it satisfies parity checks  $\varphi(\nabla(x \wedge y \wedge z)) = \varphi(x \otimes y \wedge z) - \varphi(y \otimes x \wedge z) + \varphi(z \otimes x \wedge y) = 0$ .

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## $k = d$ special case, page 2

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Let the  $n$  disks choose vectors  $c_1, c_2, \dots, c_n \in W$  that are MDS (i.e., any  $k$  of which span  $W$ ).  
Let the disks store the restrictions  $\varphi|_{c_1 \otimes W \wedge W}$  and  $\varphi|_{c_2 \otimes W \wedge W}$  and all the way to  $\varphi|_{c_n \otimes W \wedge W}$

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 $\sum_{h \in \mathcal{K}} c_h \otimes W \wedge W = \text{span}\langle c_h : h \in \mathcal{K} \rangle \otimes W \wedge W = W \otimes W \wedge W =$  the entire domain of  $\varphi$ .

When the  $f$ th is erased, the  $h$ th sends it  $\varphi|_{c_h \otimes c_f \wedge W}$  (notice  $c_h \otimes c_f \wedge W \subseteq c_h \otimes W \wedge W$ ).

Let  $\mathcal{D}$  be a set of  $d$  indices,  $\sum_{h \in \mathcal{D}} c_h \otimes c_f \wedge W = \text{span}\langle c_h : h \in \mathcal{D} \rangle \otimes c_f \wedge W = W \otimes c_f \wedge W$ .  
We repair  $\varphi(c_f \otimes y \wedge z) = \varphi(y \otimes c_f \wedge z) - \varphi(z \otimes c_f \wedge y)$  as the latter is learned from  $\varphi|_{W \otimes c_f \wedge W}$

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## $k = d$ special case, page 2

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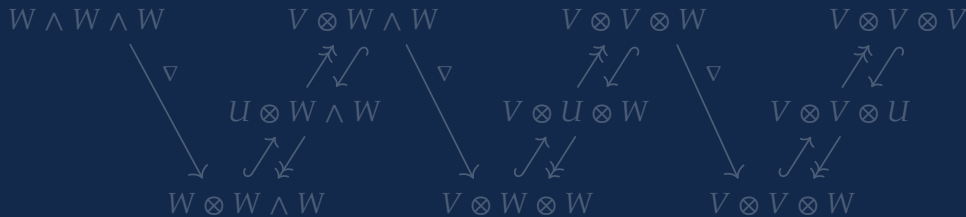
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# Construct Moulin Code for general case $k \leq d$

Recall:  $n$  disks;  $k$  recover the file;  $d$  repair erased disks.  $W := \mathbb{F}^k$ .

Let  $V := \mathbb{F}^{d-k}$ . Let  $U := V \oplus W = \mathbb{F}^d$ . Consider the diagram:



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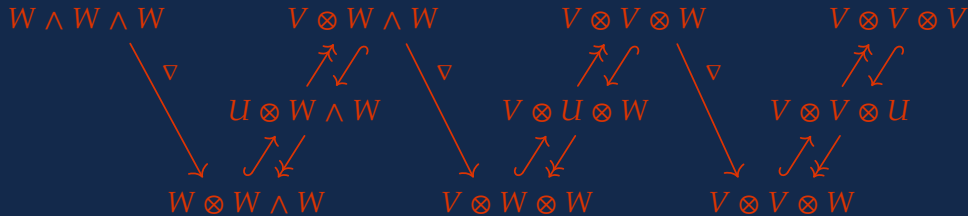
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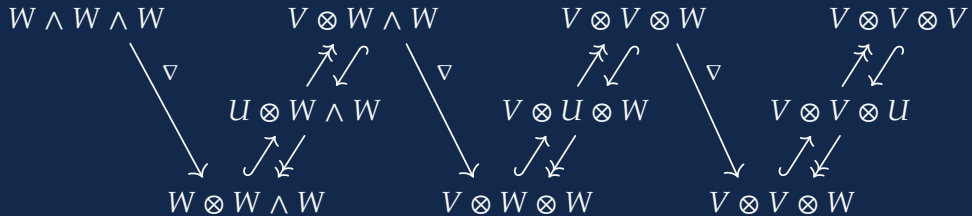
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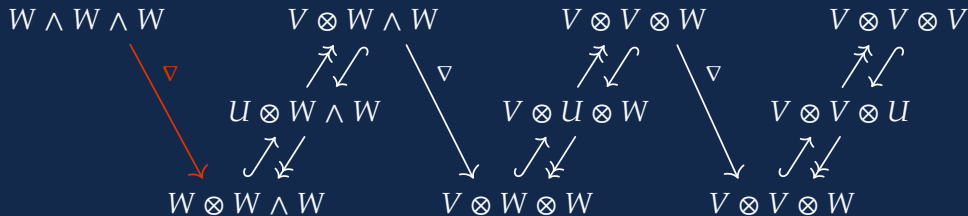
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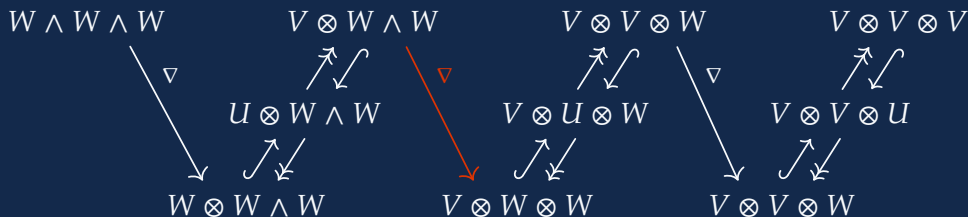
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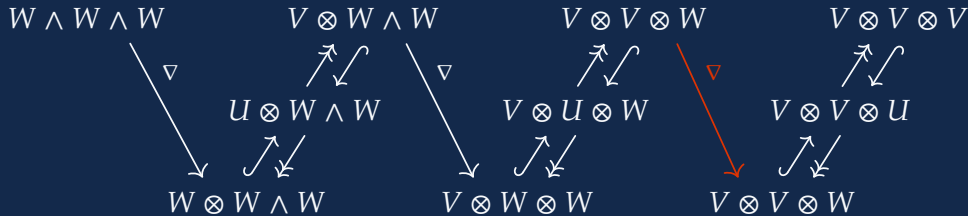
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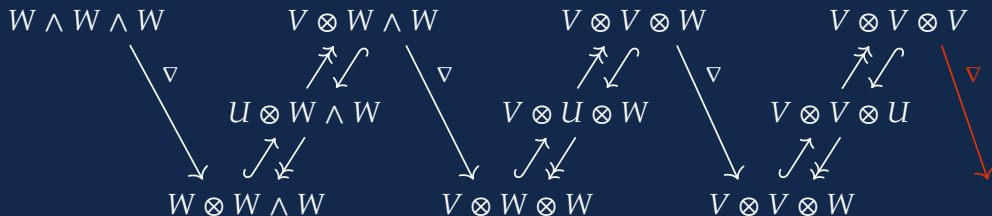
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## $k \leq d$ general case, page 2

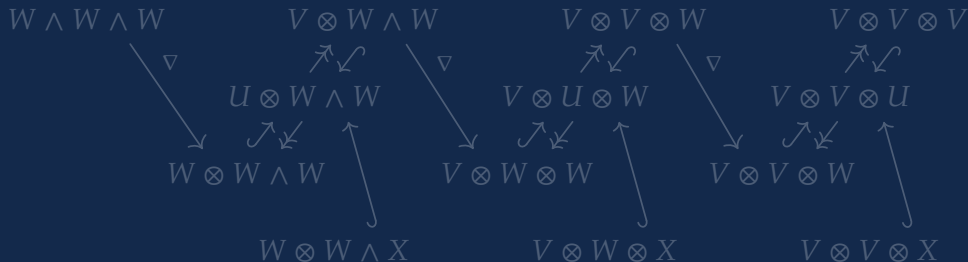
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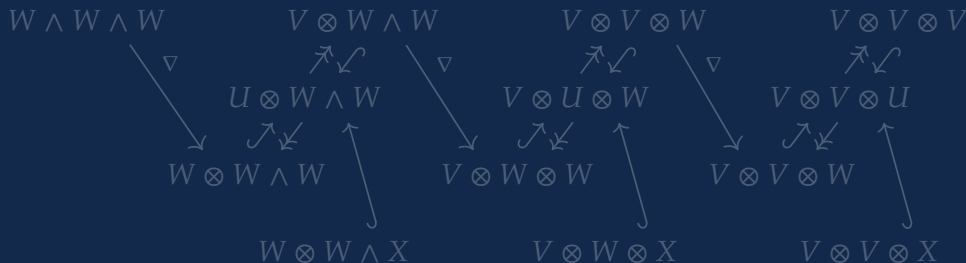
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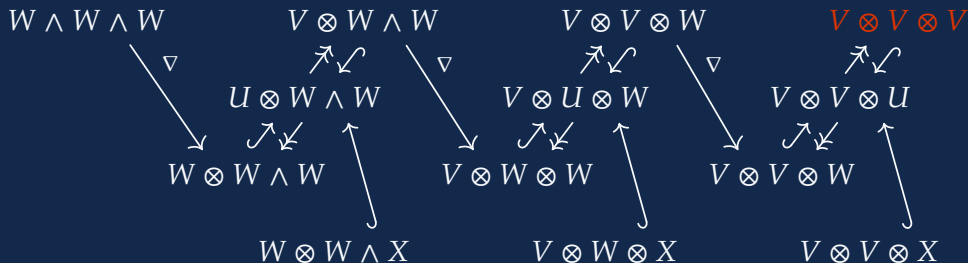
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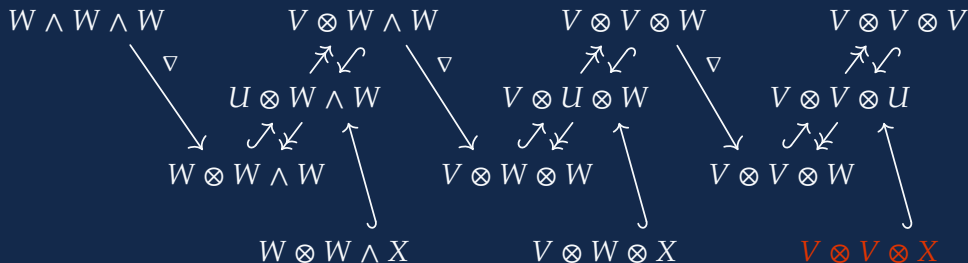
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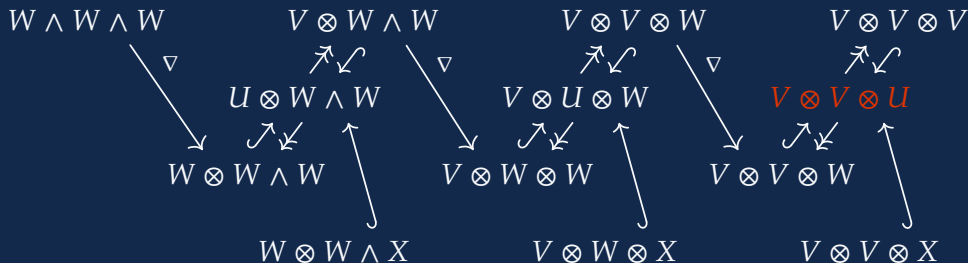
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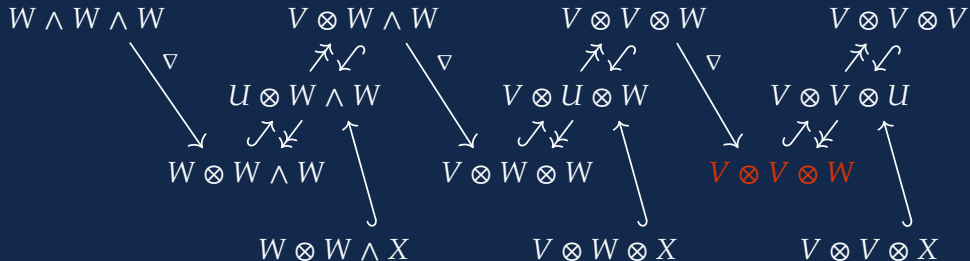
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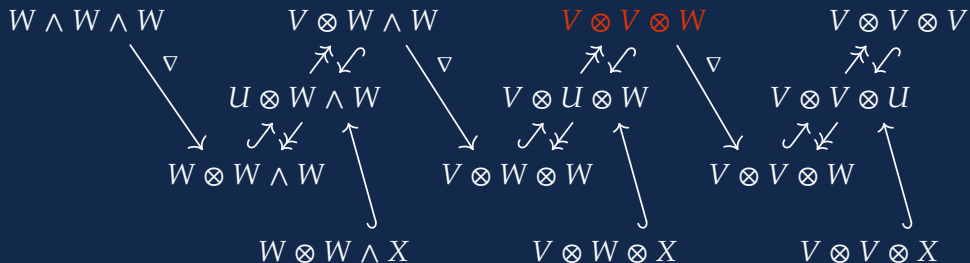
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Recall:  $n$  disks;  $k$  recover the file;  $d$  repair erased disks.  $(U, V, W) := (\mathbb{F}^d, \mathbb{F}^{d-k}, \mathbb{F}^k)$

File  $\varphi: \bigoplus U\text{-spaces} \rightarrow \mathbb{F}$  is such that  $\varphi(\text{tensor}) = \varphi(\nabla(\text{tensor}))$ .

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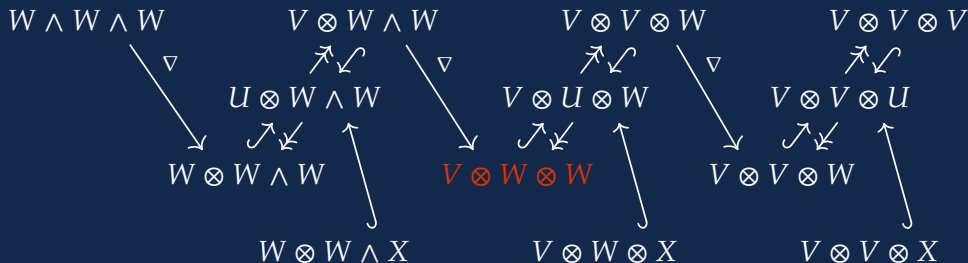
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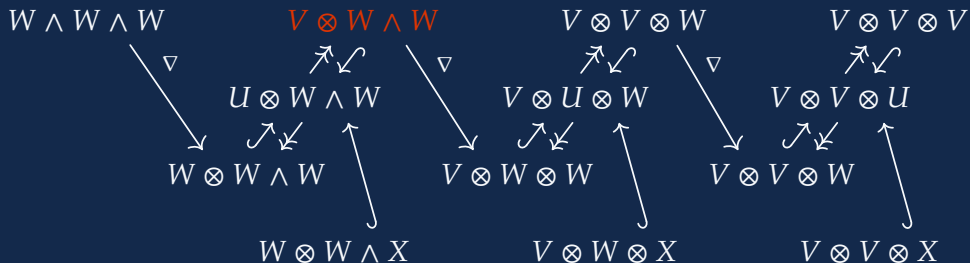
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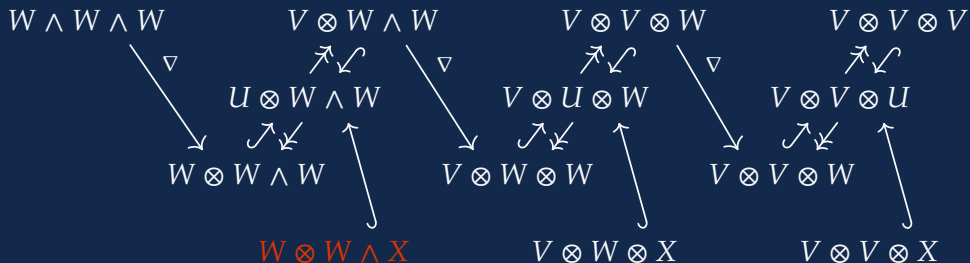
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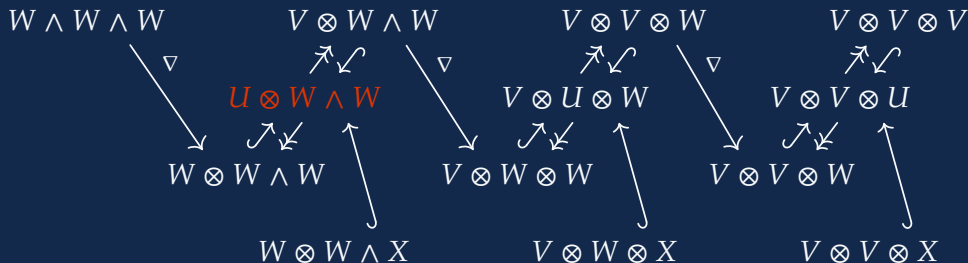
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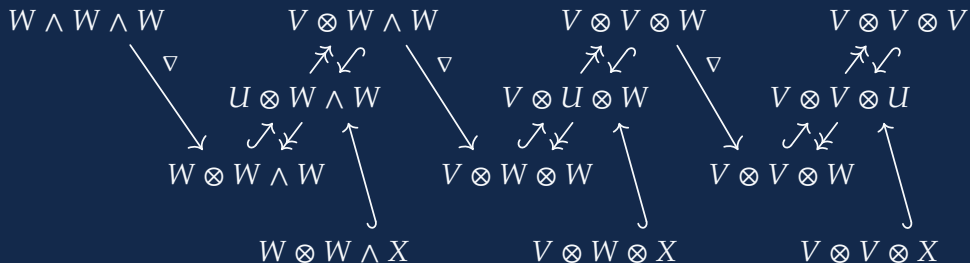
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## $k \leq d$ general case, page 3

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When the  $f$ th disk is erased, decompose  $a_f = (b_f, c_f) \in V \oplus W$  and send  $\varphi|_{\text{im } \partial_f}$ , where

$$\begin{aligned}\partial_f: V \otimes U &\longrightarrow V \otimes V \otimes U + V \otimes U \otimes W, \\ x \otimes y &\longmapsto b_f \otimes x \otimes y - x \otimes b_f \otimes y + x \otimes y \otimes c_f, \\ \partial_f: U \otimes W &\longrightarrow V \otimes U \otimes W + U \otimes W \wedge W, \\ x \otimes y &\longmapsto b_f \otimes x \otimes y - x \otimes c_f \wedge y.\end{aligned}$$

The weird definition is to satisfy the following two properties:

The definition of  $\partial_f$  extends to tensors of arbitrary length;  
it becomes a differential operator (a co-boundary operator) and is linear in  $a_f$ .

Let  $v \in T^p V$  and  $\omega \in \Lambda^q W$ , then  $\varphi(\partial_f(v \otimes \omega)) - \varphi(\partial_f(\nabla(v \otimes \omega))) = (-1)^p \varphi(v \otimes a_f \otimes \omega)$ .  
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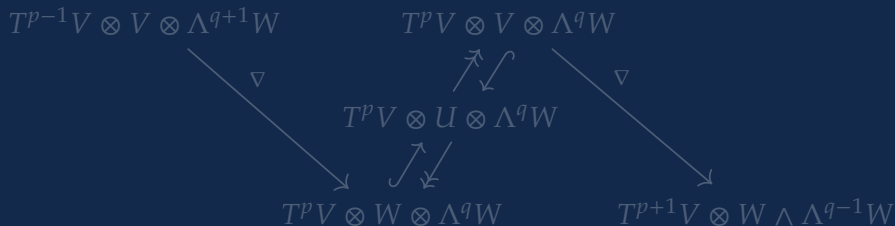
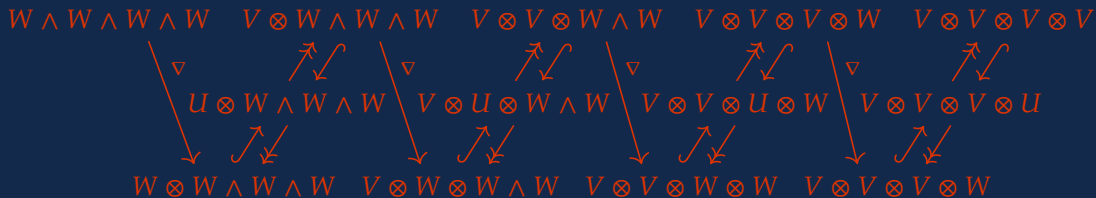
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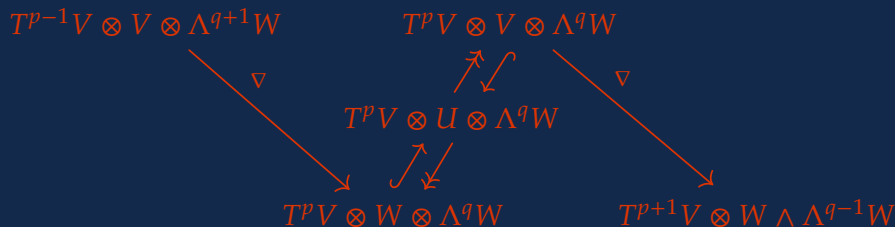
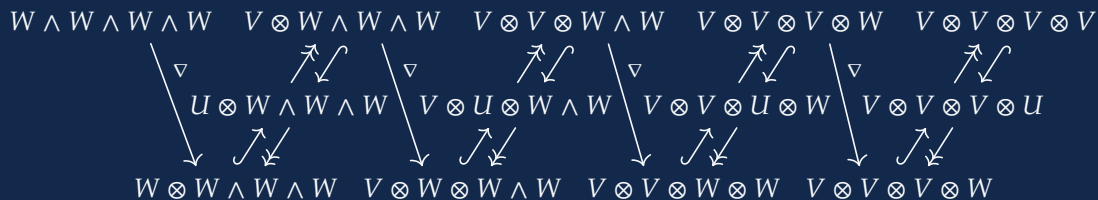
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# Full generality Moulin Codes with larger diagram



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$$\begin{aligned}\nabla(u \wedge v \wedge w \wedge x \wedge y \wedge z) = & u \otimes v \wedge w \wedge x \wedge y \wedge z \\ & - v \otimes u \wedge w \wedge x \wedge y \wedge z \\ & + w \otimes u \wedge v \wedge x \wedge y \wedge z \\ & - x \otimes u \wedge v \wedge w \wedge y \wedge z \\ & + y \otimes u \wedge v \wedge w \wedge x \wedge z \\ & - z \otimes u \wedge v \wedge w \wedge x \wedge y.\end{aligned}$$

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# The performance of regenerating code

Recall:  $n$  disks;  $k$  recover file;  $d$  repair erasure; capacity  $\alpha$ ; bandwidth  $\beta$ ; file size  $M$ .

Some reductions:  $(n, k, d)$  depends on actual applications.

So papers on this subject usually fix  $(n, k, d)$  and compare different codes'  $(\alpha, \beta, M)$ .

Researchers usually start from  $n = d + 1$  and increase  $n$  later,  
so it makes sense to ignore  $n$  and parametrize the comparison by  $(k, d)$ .

It is also common to assume that the file is very very large,  
so  $M$  can be pretty large and we only care about the long-term efficiency  $(\alpha/M, \beta/M)$ .

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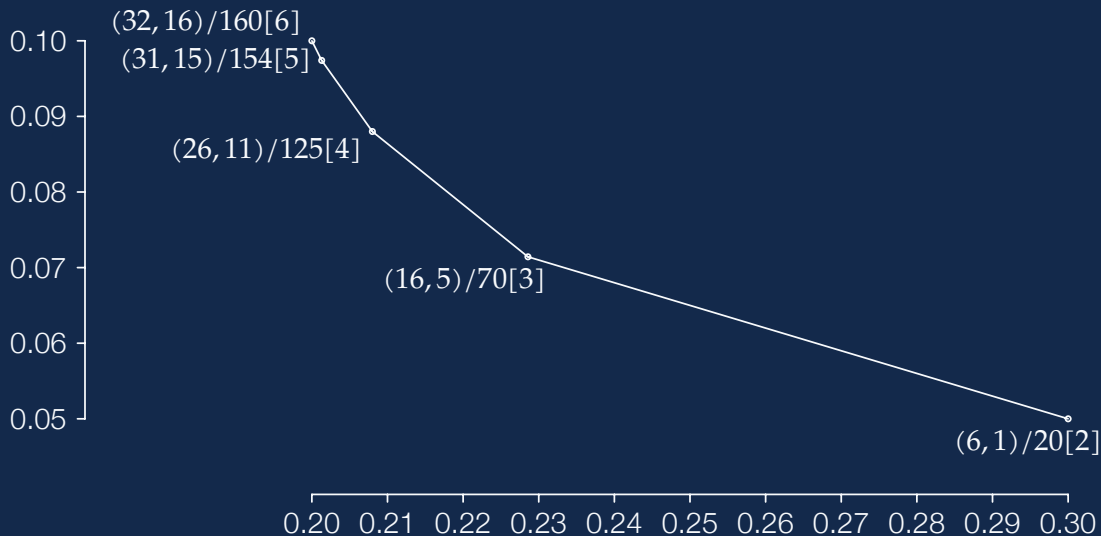
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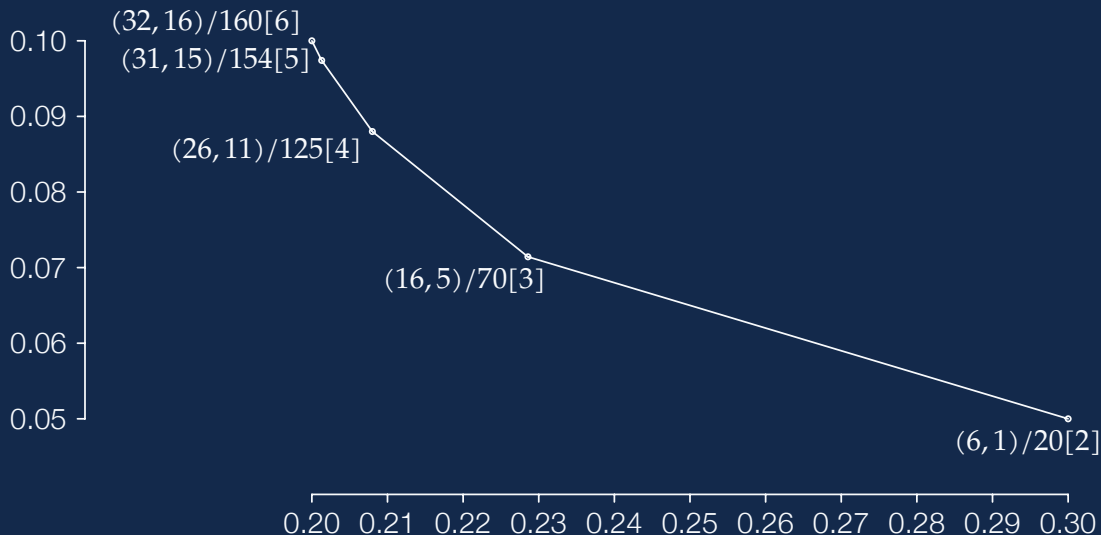


# The performance of Moulin Code



Back to the opening example  $(n, k, d) = (7, 5, 6)$ . The plot of various  $(\alpha/M, \beta/M)$  is here. The number in [square bracket] is the width of the diagram (the largest exponent in  $\Lambda^p$  &  $T^q$ ).

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## Open question

Is Moulin Codes' construction isomorphic to any (well-)known structure?

Are Moulin Codes optimal in terms of the  $(\alpha/M, \beta/M)$ -plot?

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# Thank you

Questions?

Beamer available at <https://ag21.symbol.codes>. (So the links below are included.)

Paper version is titled *Multilinear Algebra for Distributed Storage*, is available at <https://arxiv.org/abs/2006.08911>, and is recently accepted for publication in SIAM SIAGA.

A similar work (that focuses on the case  $M = k\alpha$  and uses symmetric algebra) is available at <https://arxiv.org/abs/2006.16998> and is recently accepted for publication in Springer AAECC.