



# Geometric WOM codes and adaptations to multilevel flash codes

Kathryn Haymaker (Joint work with Dr. Christine Kelley)

Department of Mathematics, University of Nebraska - Lincoln

## What is flash memory?

- A non-volatile storage medium used in many technologies: USB drives, digital cameras, phones, and hybrid computer hard drives.
- The memory is organized into blocks of  $\sim 10^5$  cells, each of which can be charged up to one of  $q$  levels.



- Increasing cell charge is easy, decreasing is costly.
- Codes for flash memories generalize Write Once Memory (WOM) codes (case when  $q = 2$ ).

## WOM goals and notation

- maximize the number of rewrites before erasing
- incorporate error correction
- construct low-complexity, high-rate codes

Notation:

- $\mathcal{C} = \langle \mathbf{v}_1, \dots, \mathbf{v}_t \rangle / n$  is a binary  $t$ -write WOM code on  $n$  cells, representing  $\mathbf{v}_i$  messages on the  $i^{\text{th}}$  write.
- $\langle \mathbf{v} \rangle^t / n$  denotes a code where  $\mathbf{v}_1 = \mathbf{v}_2 = \dots = \mathbf{v}_t$ .
- The rate of  $\mathcal{C}$  is

$$\frac{\log_2(\mathbf{v}_1 \dots \mathbf{v}_t)}{n}$$

## Example: Rivest-Shamir WOM code

This code maps 2 information bits to 3 coded bits and tolerates two writes.

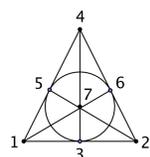
Info.	1 <sup>st</sup> write	2 <sup>nd</sup> write
00	000	111
01	100	011
10	010	101
11	001	110

The sequence 11 → 10 would be written in the memory as

$$\boxed{001} \rightarrow \boxed{101}$$

## PG(m, 2) and the Hamming code

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



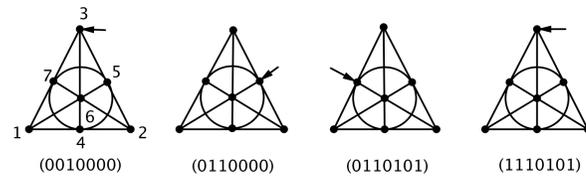
Minimum weight words in the [7, 4] Hamming code.

Lines in PG(2, 2)

## Merkx's $\langle 7 \rangle^4 / 7$ WOM code using PG(m, 2)

- Merkx [?] constructed WOM codes based on finite projective geometries over  $\mathbb{F}_2$ .

Messages  $\leftrightarrow$  points in PG(m,2)



Four writes of the Merkk PG(2, 2) WOM code.

- WOM codewords are one error from a binary Hamming codeword; the location of the error indicates the point that corresponds to the information message.

## Reed-Muller codes

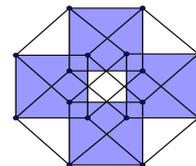
- Let  $F = \mathbb{F}_2$ ,  $V$  be a vector space of dimension  $m$  over  $F$ , and  $F^V$  the set of functions from  $V \rightarrow F$ .

The Reed-Muller code of order  $r$  and length  $2^m$ ,  $\mathcal{R}(r, m)$  is the subspace of  $F^V$  that consists of all polynomial functions of degree  $\leq r$ :

$$\mathcal{R}(r, m) = \left\langle \prod_{i \in I} x_i \mid I \subseteq \{1, 2, \dots, m\}, 0 \leq |I| \leq r \right\rangle.$$

## Another geometric connection

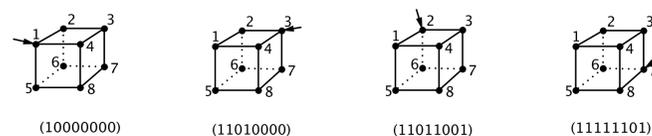
Minimum-weight generators of the  $\mathcal{R}(2, 4)$  code correspond to 2-flats in  $EG(4, 2)$ .



In general  $\mathcal{R}(m-2, m) \cong EG(m, 2)$ .

## New WOM codes

The following is an example of four writes in the  $\langle 8, 8, 8, 4 \rangle / 8$  WOM code from  $EG(3, 2)$ :



- The WOM code corresponding to  $EG(4, 2)$  has parameters  $\langle 16, 16, 16, 12, 8, 8, 8, 4 \rangle / 16$ .

## Result

Proposition:  $EG(m, 2)$  gives rise to a WOM code with  $4(m-2)$  writes and parameters

$$\langle 2^m, 2^m, 2^m, 2^m - 4, 2^{m-1}, 2^{m-1}, 2^{m-1}, 2^{m-1} - 4, \dots, 8, 8, 8, 4 \rangle / 2^m$$

Proof idea:

- Find a hyperplane that contains the first four information points, and use the  $EG(3, 2)$  code on a 3-flat.
- Set all other points in the hyperplane to one, and use the  $EG(m-1, 2)$  code on the remaining points.

## Rate comparison and remarks

Code	length	rate
PG(2, 2)	7	1.60
EG(3, 2)	8	1.38
PG(3, 2)	15	1.82
EG(4, 2)	16	1.66
PG(4, 2)	31	1.60
EG(5, 2)	32	1.50

Merck PG codes have higher rates; EG codes have simple encoding and decoding as well as code lengths that are powers of 2.

## Using binary WOM codes on multilevel cells

Flash memory cells on  $q > 2$ -levels motivates coding strategies for 'generalized' WOMs. Reapplication of binary WOM codes provides a basis for comparison.

The complement scheme:



Use a binary WOM code on the cells.

After binary writes are exhausted, bump all cell levels to 1.

Use binary WOM on levels between 1 and 2.

## Strategies for adapting to q-level cells

R-S code on  $q = 3$  levels using complement scheme:

Information	1 <sup>st</sup> write	2 <sup>nd</sup> write	3 <sup>rd</sup> write	4 <sup>th</sup> write
00	000	111	111	222
01	100	011	211	122
10	010	101	121	212
11	001	110	112	221

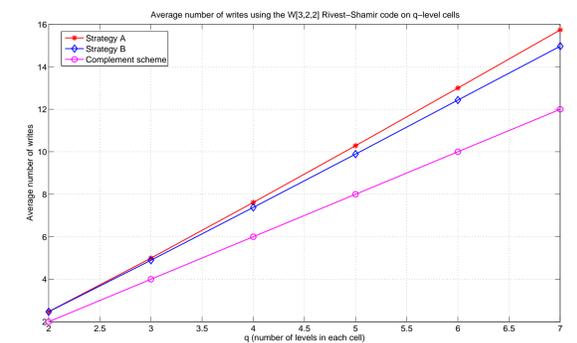
Improved schemes:

Use a WOM code  $\mathcal{C}$  by finding a  $q$ -ary word  $\mathbf{c}$  that is component-wise  $\geq$  current memory contents, with  $\mathbf{c} \pmod{2} \in \mathcal{C}$ ; decodes to message. Choose  $\mathbf{c}$  that

- Strategy A: minimizes the number of cells that are increased.
- Strategy B: minimizes the highest level cell (distribute increases evenly among all cells).

## Comparison of average write performance

Theorem: Let  $\mathcal{C}$  be an  $\langle \mathbf{v} \rangle^t / n$  binary WOM code. Then, the guaranteed number of writes by applying either strategy A or strategy B to  $\mathcal{C}$  on  $q$ -level flash cells is at least  $(q-1)t$ .



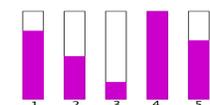
The average write performance of Strategies A, B, and the complement scheme for the Rivest-Shamir code, simulated on  $10^6$  random message sequences to record the number of writes.

## Conclusions

- Showed how EGs can be used to obtain a new family of WOM codes with structure useful in schemes that require component WOM codes.
- Introduced strategies for adapting WOM codes to multilevel cells.

## Future work:

- Determine qualities of the underlying WOM code that cause either Strategy to perform better.
- Quantify average performance as  $q \rightarrow \infty$ .
- Construct binary or multilevel flash codes using  $q$ -ary codes or other discrete structures.
- Coding for the rank modulation scheme.



The permutation induced by the cell levels on the left is (4, 1, 5, 2, 3). In general, the permutation is  $(x_1, x_2, \dots, x_n)$ , where  $x_i$  is the number corresponding to the cell with the highest level,  $x_2$  the cell with the second highest level, etc.

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