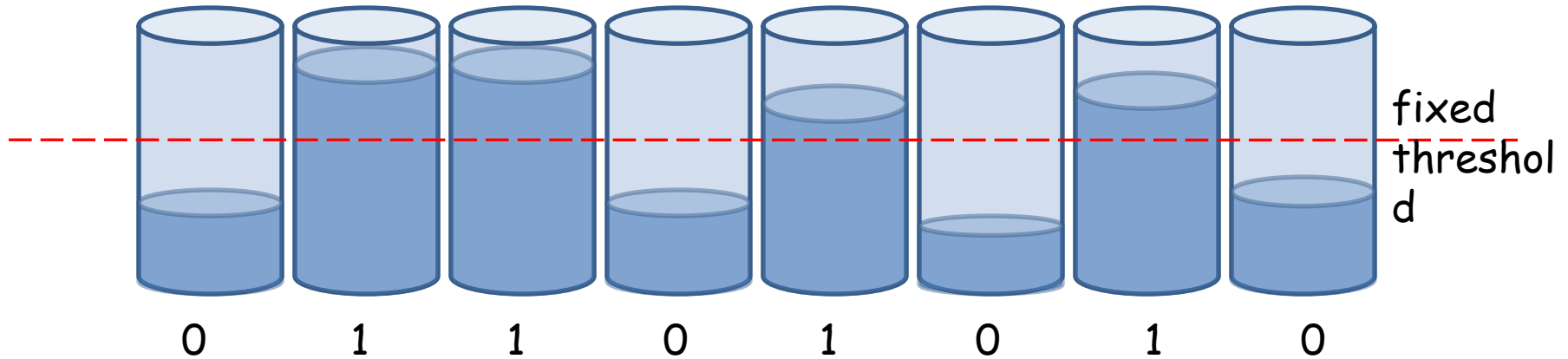


048704/236803
Seminar on Coding for
Non-Volatile Memories

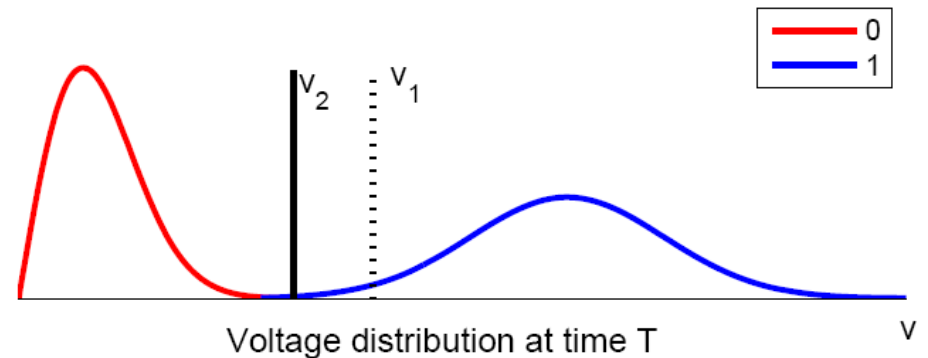
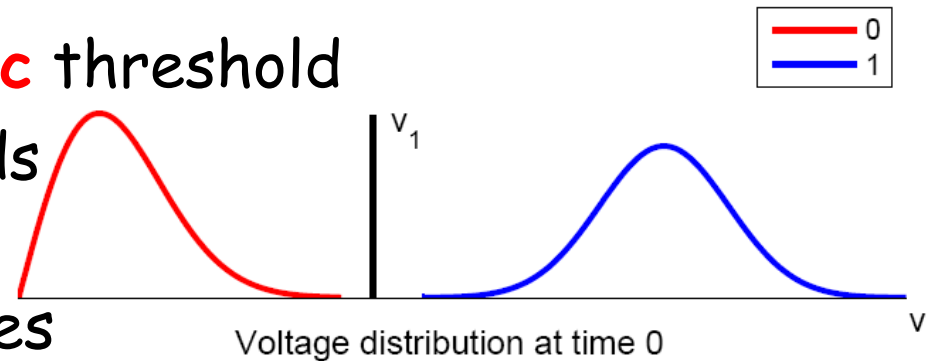
Read Cycle of Flash Memories

- Compare cell levels with a threshold (or a sequence of thresholds)



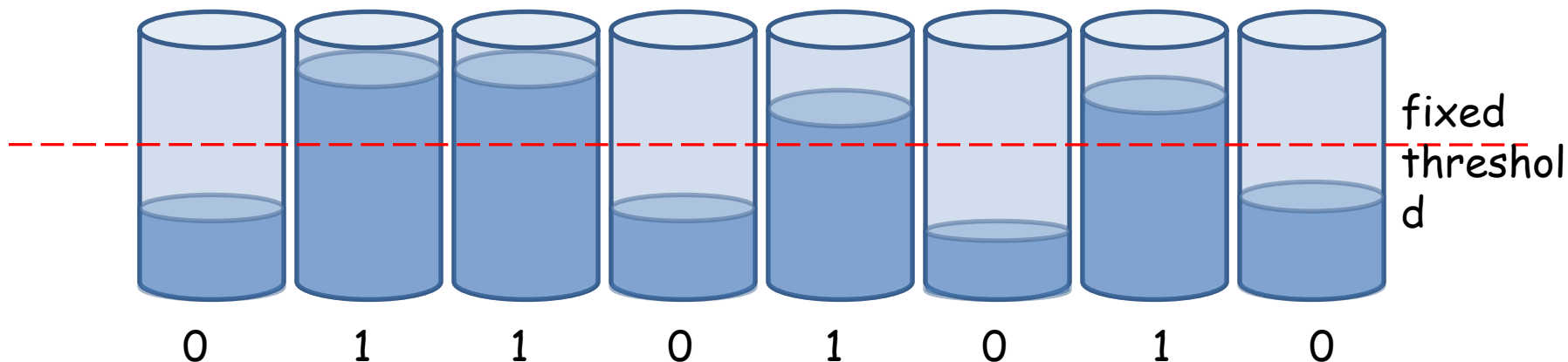
Balanced Codes: Motivation

- Charge Leakage \rightarrow voltage drift **in one direction**
- **Fixed** threshold vs **dynamic** threshold
- Dynamic reading thresholds reduces the BER
- A **balanced vector** satisfies
#0's = #1's



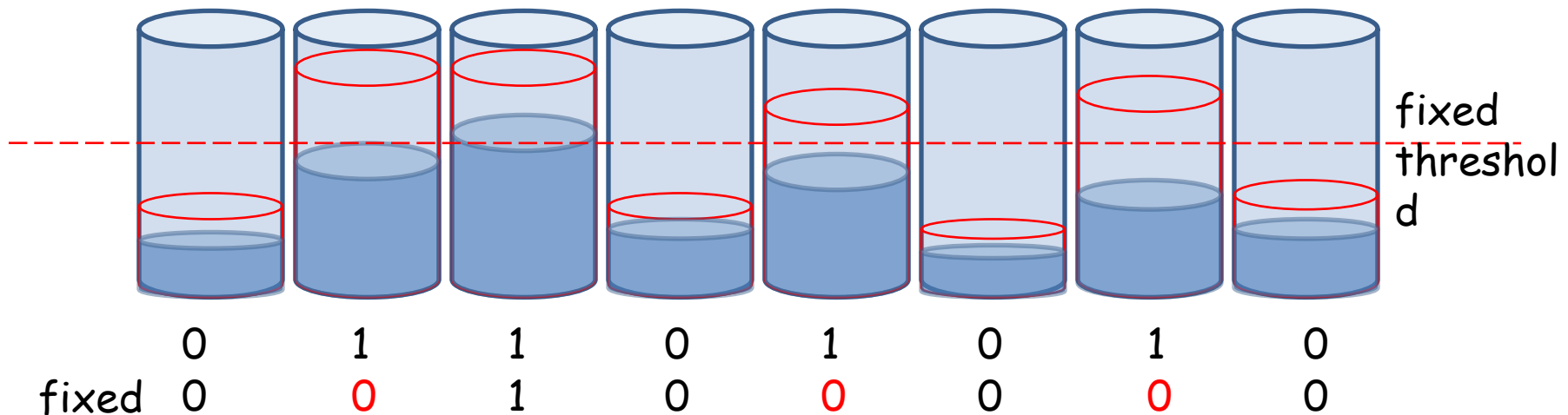
Balanced Codes: Motivation

- In writing, half of cells store **0** and the other half store **1**
- In reading, the $n/2$ cells with lower voltages are read as **0**
The other $n/2$ cells with higher voltages are read as **1**
- **Relative ranking** is most likely preserved



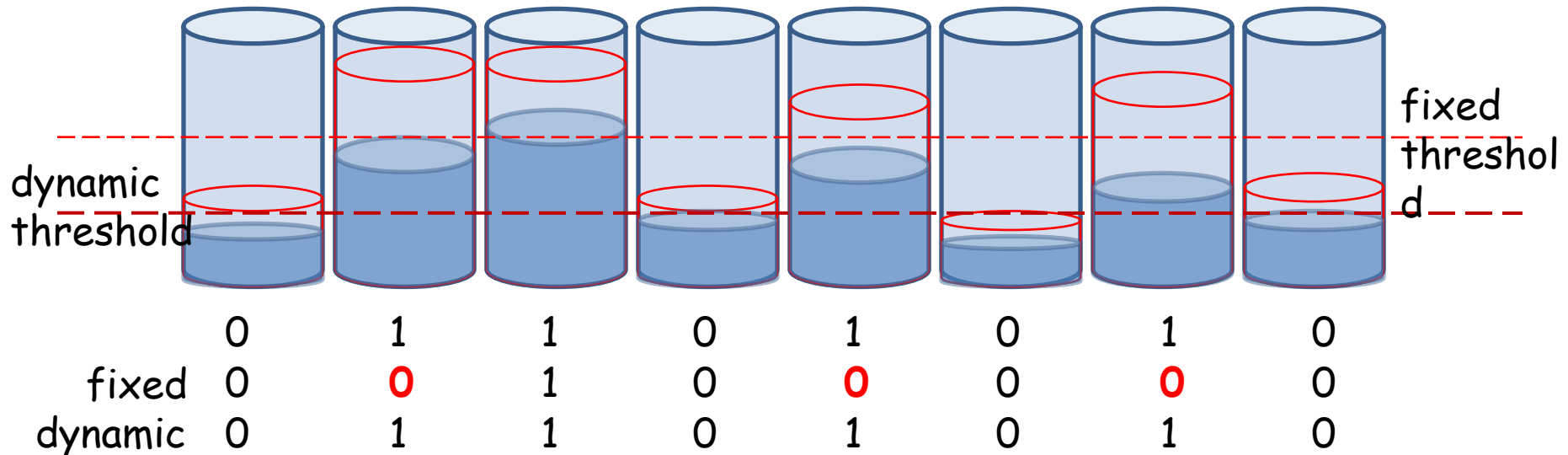
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Balanced Codes

- Problems:
 1. How to guarantee that **at most** half of the cells have value 1?
 2. How to guarantee that **exactly** half of the cells have value

Balanced Codes

- How many balanced length- n (even) vectors are there?

$$- M(n) = \binom{n}{n/2} = \frac{n!}{(n/2)! \cdot (n/2)!}$$

$$- \log_2 M(n) = n - \frac{1}{2} \cdot \log_2 n - \frac{1}{2} \cdot \log_2(\pi/2) - \varepsilon(n)/n, \\ 0 \leq \varepsilon(n) \leq 1.81$$

$$- \log_2 M(n) \approx n - \frac{1}{2} \cdot \log_2 n$$

- How to construct balanced codes?

- The redundancy should be close to $\frac{1}{2} \cdot \log_2 n$

- Lookup table

- Optimal ✓
- Not efficient ✗

Knuth's Balancing Algorithm

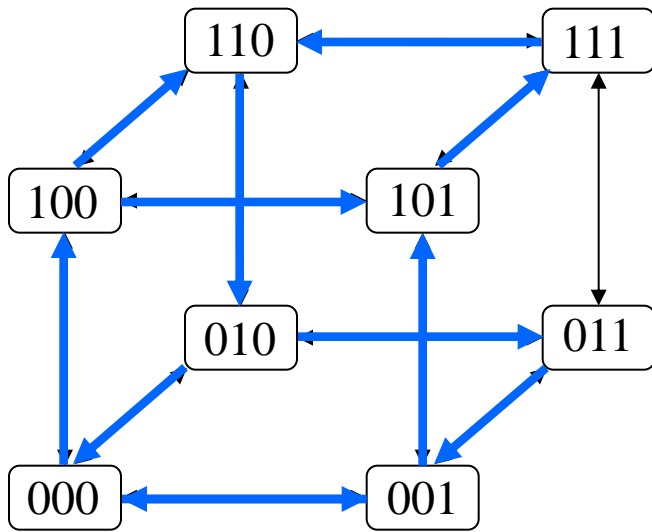
- Given a length- n vector $\mathbf{v}=(v_0, \dots, v_{n-1})$
 - If the vector is balanced, no need to do anything
 - Otherwise, find $0 \leq i \leq n-1$ such that the vector $\mathbf{v}_i=(1-v_0, \dots, 1-v_i, v_{i+1}, \dots, v_{n-1})$ is balanced
 - Write the index i in $\lceil \log(n) \rceil$ more cells (recursively or using a table so it is balanced)
 - The redundancy is roughly $\lceil \log(n) \rceil$
- Why is it possible to find such an i ?
 - $w_H(\mathbf{v}_0) = n - w_H(\mathbf{v}_{n-1})$
 - If $w_H(\mathbf{v}_0) < n/2$ then $n - w_H(\mathbf{v}_{n-1}) > n/2$
 - There exists i such that $w_H(\mathbf{v}_i) = n/2$

Flash/Floating Codes

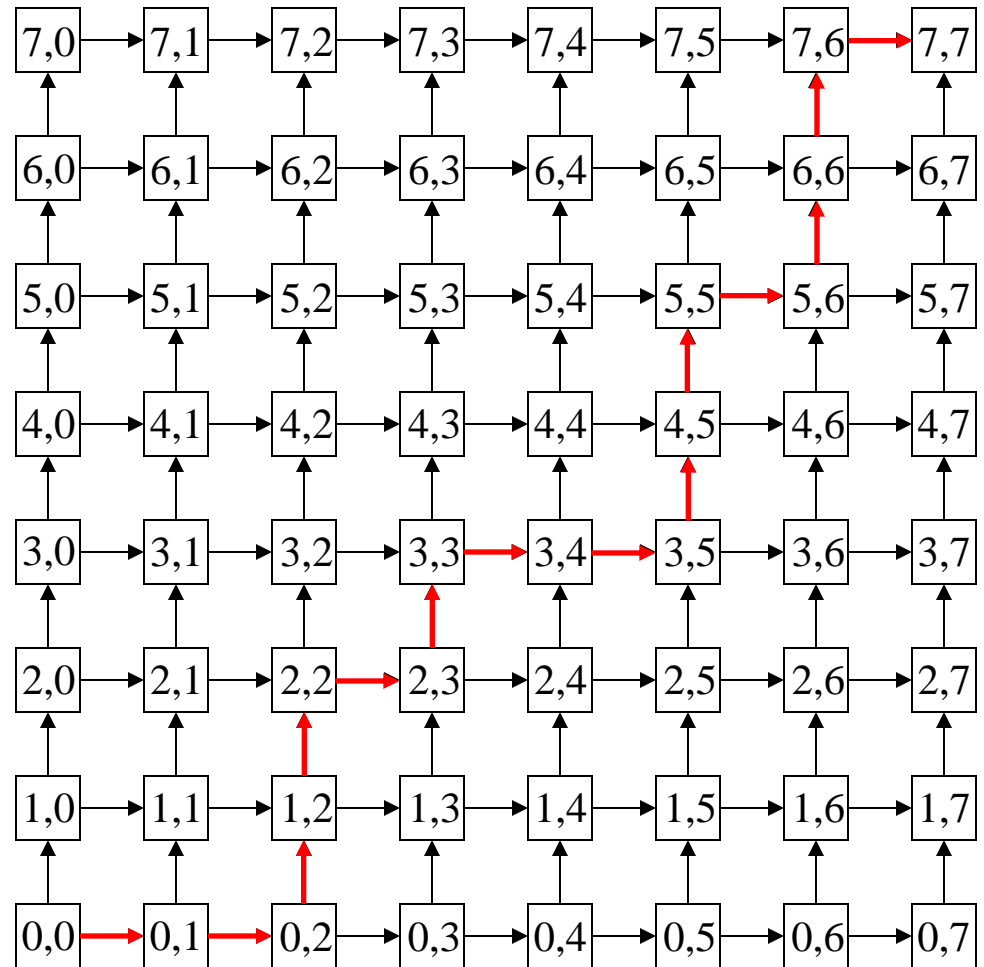
- k bits are stored using n cells
- A write is a change $0 \rightarrow 1$ or $1 \rightarrow 0$ of one of the k bits
- Definition - Flash Codes: An $(n, k, t)_q$ Flash/Floating Code is a coding scheme that accommodates any sequence of up to t writes of k bits, using n q -level cells, in such a way that a block erasure is never required
- **Goal**: Given k, n, q maximize the number of writes t

Flash Codes

Example: Storing **three bits** using **two 8-level cells**



Bits Diagram



Cells Diagram

Write Deficiency

- A trivial upper bound on the number of writes:

$$t \leq n(q - 1)$$

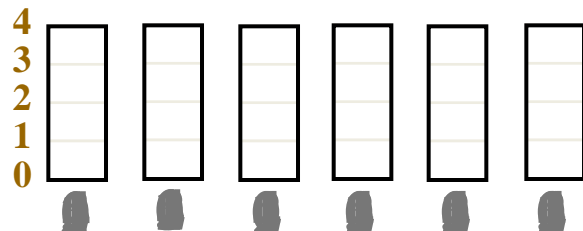
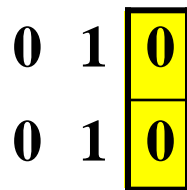
- **Write Deficiency:** The difference between the trivial upper bound, $n(q - 1)$, and the guaranteed number of writes t

$$\delta = n(q - 1) - t$$

The write deficiency shows how close a given flash code is to the trivial upper bound

Example - Two Bits Construction

- Every cell is filled to the top before moving to the next one
- When the cells coincide, the last cell represents two bits.
The cell's residue modulo 4 sets the bits value:
0 - (0,0) 1 - (0,1) 2 - (1,0) 3 - (1,1)
- The maximum number of writes (worst case) is $n(q-1) - [(q-1)/2]$ (optimal) before erasing is required.

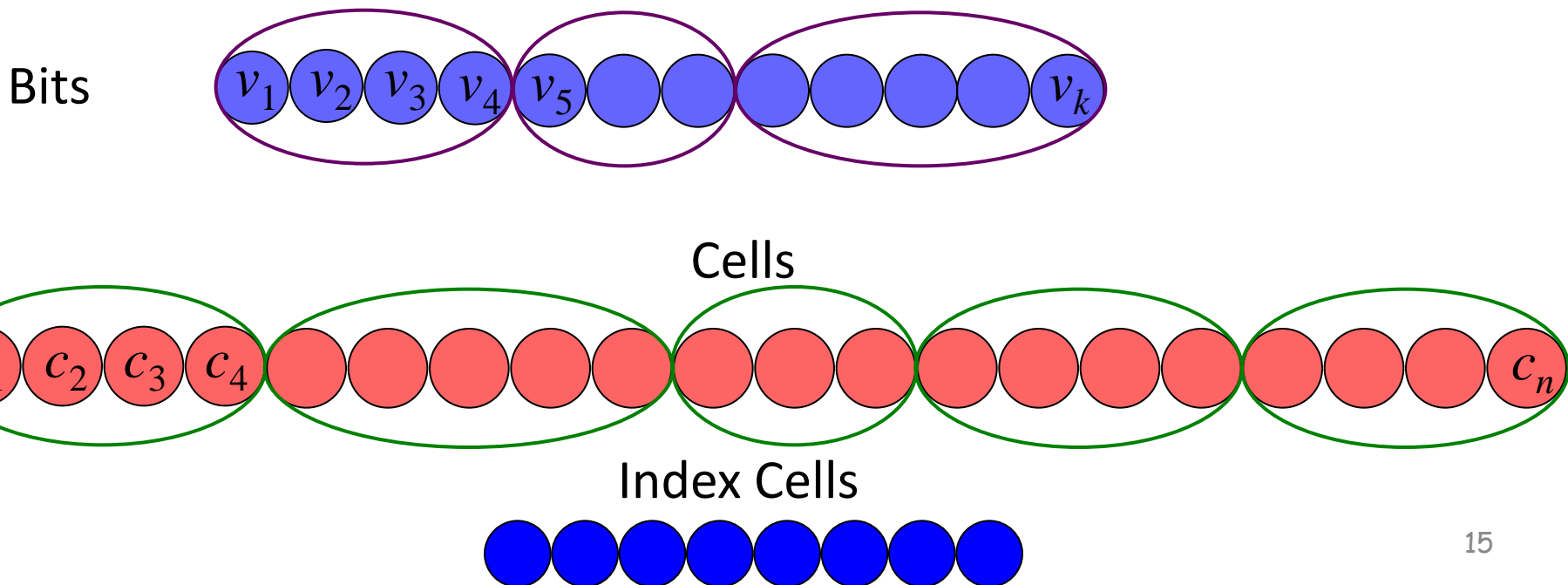


$t =$



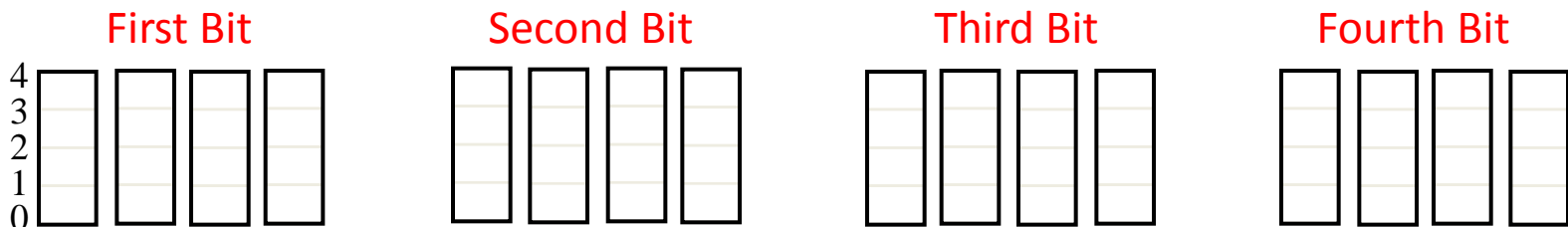
Indexed Flash Codes

- Partition the k bits into groups of k' bits
- Partition the cells into blocks of $n' < n$ cells
- Each group of bits is represented by one of the blocks
- When a block gets full, start using the next empty block
- Indexing is needed to indicate for each block which bit-group it represents
- Leads to overhead due to index cells



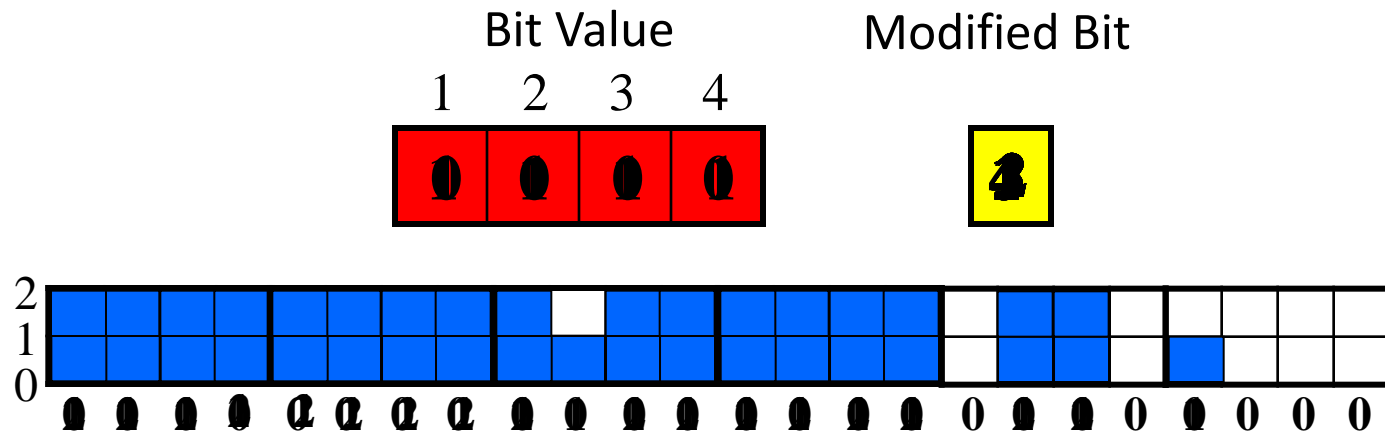
Index-Less Indexed Flash Codes

- Use the same idea but without the index cells
- How?
 - Each block consists of **k cells** and stores **one bit**
 - The blocks are used differently in such a way that it is possible to decode which bit each block stores
 - The bit value is the **parity** of its block
- **Example:** Storing 4 bits
 - The memory consists of **4-cell blocks**
 - Assume each cell has 5 levels: 0,1,2,3,4



Index-Less Indexed Flash Codes

Example: Writing 4 bits using 24 cells of 3 levels

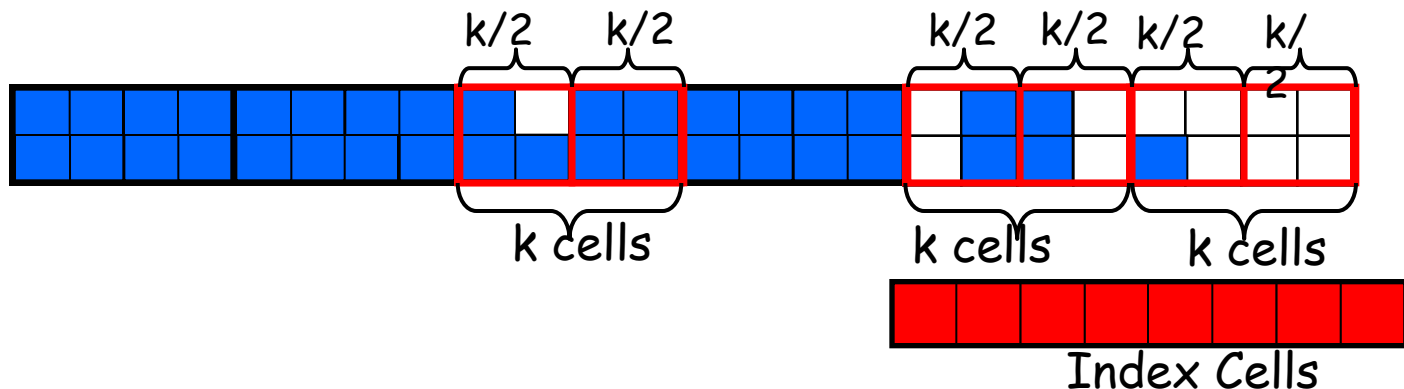


When writing stops, at most $(k - 1)(k(q - 1) - 1)$ levels are not used

The write deficiency order is $\delta = O(k^2q)$

Nearly Optimal Construction

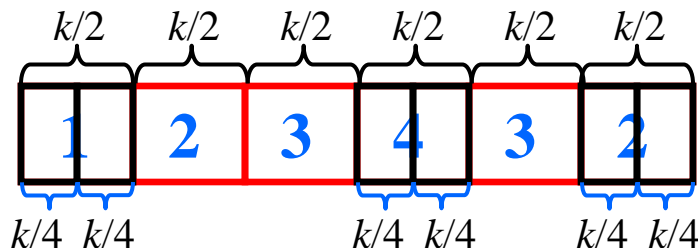
- How **to continue** when writing stops?
 - Every block is divided into **two sub-blocks of $k/2$ cells**
 - Every sub-block stores one bit
 - It is not possible to write the bits as before
 - Now... use the **index cells!**



Nearly Optimal Construction

- How **to continue** when writing stops?
 - Every block is divided into **two sub-blocks of $k/2$ cells**
 - Every sub-block stores one bit
 - It is not possible to write the bits as before
 - Now... use the **index cells!**
 - For each sub-block, its bit index is stored in the index cells
 - Repeat the process recursively **$\log_2 k$** steps
 - At each step, at most **$2k - 2$** sub-blocks need to be indexed
- **Theorem:** The write deficiency order is

$$\delta = O(qk \log^2 k / \log q)$$



Index Cells