



## False Decoding Probability (Detection) of BCH and LDPC Codes

Alessia Marelli, Technical Leader Rino Micheloni, Fellow

**Microsemi Corporation** 





- False decoding probability in SSDs
- BCH code
- LDPC code
- HW/SW co-simulation
- CRC concatenation
- Conclusions







Microco



 Unfortunately, there is a not-null probability of false decoding. This is when the ECC performs erroneous correction while declaring successful decoding (in practice, a silent, catastrophic event).







No way to prevent it



Flash Memory Summit 2016 Santa Clara, CA Microsen



## Memory Algebraic Space



$$P_E(w) = \frac{\sum_{l=0}^{n} a_l \sum_{s=0}^{t} N(l, w; s)}{\binom{n}{w}} \qquad t+1 \le w \le n$$

$$P_{ME} = \sum_{w=t+1}^{n} P_E(w)\phi(w)$$

SUMMI

$$\phi(w) = \binom{n}{w} p^{w} (1-p)^{n-w}$$

- Hamming code is perfect and it
  corrects single-error. Whenever
  there is a double-error,
  miscorrections happen.
- BCH code is not perfect. In order to estimate the probability, we need to study the algebraic structure of the code.
- w = Number of errors
- t = Number of correctable errors
- *n* = Codeword length
- *a<sub>i</sub>* (weight) is the number of codewords having a 1-count equal to *i*
- *N(l,w;s)* is the number of words with weight *w* at a distance *s* from a codeword with weight *l*





- BCH weights are unknown in most cases
- Therefore, estimates must be done
- Peterson estimate:
  - For a primitive BCH code with length *n* and correcting capability *t*, weights can be estimated as

$$a_i \cong \frac{\binom{n}{i}}{(n+1)^t}$$

Successive estimates introduce a corrective term *E<sub>i</sub>* to the formula







R. Micheloni, 3D Flash Memories, Springer 2016

- Probabilities have monotonic behavior with a long floor in the middle, approximated with  $Q = 2^{-(n-k)} \sum_{s=0}^{t} {n \choose s}$
- BCH has very good detection capability for long codeword and high code rate



- Decoder is not Bounded Distance but Belief Propagation (BP)
- Weight estimation does not apply to BP. Therefore, the BCH approach is not applicable here.
- As the LDPC decoder is iterative, the "correctable region" changes with the number of iterations
- LDPC relies on its sparseness





## ash Memory Soft False Decoding in LDPC

- With soft decoding, Hamming distance is replaced by Euclidean distance
- Even if the algebraic space changes, the false decoding probability does not, since we are still using BP
- Soft False Decoding probability can possibly be even higher in the soft case









The only way to estimate false decoding probability is through simulations





Flash Memory Summit 2016 Santa Clara, CA » Microsemi





 An FPGA rack is used to accomplish the desired speed





 Able to reach FER 1e-11 on a weekly basis





$$\begin{array}{c} \mathsf{CRC} \longrightarrow \mathsf{LDPC} \longrightarrow \overbrace{\mathsf{LDPC}} \longrightarrow \mathsf{LDPC} \longrightarrow \mathsf{CRC} \end{array}$$

CRC	P <sub>ME</sub> (CRC)	P <sub>ME</sub> (LDPC)	P <sub>ME</sub> (concat)
CRC-16	< 2*10 <sup>-5</sup>	< 10 <sup>-11</sup>	< 2*10 <sup>-16</sup>
CRC-32	< 2*10 <sup>-10</sup>	< 10 <sup>-11</sup>	< 2*10 <sup>-21</sup>
CRC-48	< 4*10 <sup>-15</sup>	< 10 <sup>-11</sup>	< 4*10 <sup>-26</sup>
CRC-64	< 6*10 <sup>-20</sup>	< 10 <sup>-11</sup>	< 6*10 <sup>-31</sup>

Microsen





- False decoding can cause trouble in SSDs
- False decoding is an intrinsic issue of any code and cannot be avoided
- BCH code has a very low false decoding probability
- BCH weight estimation does not apply to LDPC
- False decoding + error floor can be estimated by HW/SW co-simulations
- Concatenation with CRC can be used to lower the probability of false decoding





- R. Micheloni, "3D Flash Memories", Springer, 2016.
- S. Lin, D. Costello, "Error Control Coding", *Prentice Hall*.
- R. Micheloni, A. Marelli, and K. Eshghi, "Inside Solid State Disks (SSDs)," *Springer*, 2012.
- R. Micheloni, L. Crippa, and A. Marelli, "Inside NAND Memories", *Springer*, 2010.
- R. Micheloni, A. Marelli, and R. Ravasio, "Error Correction Codes for Non-Volatile Memories", *Springer*, 2008.









- Come and visit us at booth #213
- www.microsemi.com