

2014 Flash Memory Summit Santa Clara, CA August 5 - August 7, 2014

#### LDPC CODES WITH LOW ERROR-FLOOR

#### (Invited Paper) Shu Lin

Department of Electrical and Computer Engineering University of California, Davis Davis, CA 95616, U.S.A.

(Co-author: Melody Diao, SandDisk, Milpitas, CA 95035) Remark: This work was done at the UC-Davis while Dr. Diao was a Ph.D Student from 2011-2013.





- The performance of an LDPC code with iterative decoding is measured by:
  - 1. The error performance (or coding gain or how close to the Shannon limit),
  - 2. The rate of decoding convergence (how fast the decoding process terminates),
  - 3. Error-floor (how low the error rate can achieve).





**Error-Floor** 



- The performance of an LDPC code is determined by a number of structural properties collectively:
  - 1. Minimum distance (or minimum weight);
  - 2. Girth of its Tanner graph;
  - 3. Cycle distribution of its Tanner graph;
  - 4. Connectivity;



- 5. Trapping set configurations and distribution of its Tanner graph;
- 6. Degree distributions of variable and check nodes of its Tanner graph;
- 7. Row redundancy of the parity-check matrix,
- 8. Other unknown structures
- No single structural property dominates the performance of a code.
- It is still unknown how the code performance depends on the above structural properties analytically as a function.

Memory III. Categories of Constructions

- Major methods for constructing LDPC codes can be divided into two general categories:
  - 1. graph-theoretic-based constructions
  - 2. algebraic-based methods
- Most well known graph-theoretic-based construction methods are PEG (progressive edge growing) and protograph-based methods.
- Algebraic constructions of LDPC codes are mainly based on finite fields, finite geometries, and combinatorial designs.



- Algebraic constructions, in general, result in mostly QC-LDPC codes, especially QC-LDPC codes whose parity-check matrices are arrays of circulant permutation matrices (CPMs) and/or zero matrices (ZMs).
- We refer to this type of QC-LDPC codes as codes with CPM-structure or CPM-QC-LDPC codes.
- QC-LDPC codes have advantages over other types of LDPC codes in hardware implementations of encoding and decoding.
- Encoding of a QC-LDPC code can be efficiently implemented using simple shift registers.



- In hardware implementation of a QC-LDPC decoder, the quasi-cyclic structure of the code simplifies the wire routing for message passing.
- Well designed QC-LDPC codes perform as well as any other types of LDPC codes in the waterfall region.
- All these advantages inevitably will make QC-LDPC codes the mainstream LDPC codes for future applications in communication and storage systems.
- Algebraic LDPC codes in general have lower error-floor and their decoding converges faster than graph-theoretic-based LDPC codes.



## Memory IV. A Very Low Error-Floor RS-Based QC-LDPC Code

- Let  $\alpha$  be a primitive element of the field  $GF(2^7) = \{0, 1, \alpha, \alpha^2, \dots, \alpha^{126}\}$  which consist of 128 elements.
- For the following 6x127 matrix over  $GF(2^7)$ :

$$B = \begin{bmatrix} 1 & \alpha & \alpha^2 & \cdots & \alpha^{126} \\ 1 & \alpha^2 & (\alpha^2)^2 & \cdots & (\alpha^2)^{126} \\ 1 & \alpha^3 & (\alpha^3)^2 & \cdots & (\alpha^3)^{126} \\ 1 & \alpha^4 & (\alpha^4)^2 & \cdots & (\alpha^4)^{126} \\ 1 & \alpha^5 & (\alpha^5)^2 & \cdots & (\alpha^5)^{126} \\ 1 & \alpha^6 & (\alpha^6)^2 & \cdots & (\alpha^6)^{126} \end{bmatrix}$$



- The base matrix **B** is the conventional parity-check matrix of a cyclic (127, 121) Reed-Solomon code over GF(2<sup>7</sup>) whose generator polynomial has  $\alpha$ ,  $\alpha^2$ ,  $\alpha^3$ ,  $\alpha^4$ ,  $\alpha^5$ ,  $\alpha^6$  as roots.
- Dispersing each entry in **B** by a 127×127 CPM, we obtain a 127×127 array **H** of CPMs of size 127×127.
- *H* is a 762 ×16129 matrix with column and row weight 6 and 127, respectively. The rank of this matrix is 757. *H* has 5 redundant rows.
- The null space of **H** gives a (6, 127)-regular (16129, 15372) QC-LDPC code C with rate 0.953.



- The Tanner graph  $\mathcal{G}$  of the code C has girth 6 and each variable node of  $\mathcal{G}$  has a large degree of connectivity.
- *G* has no small trapping set with size smaller than 11.
- With 50 iterations of the MSA, the code achieves a biterror rate (BER) of 10<sup>-15</sup> and a block-error rate (BLER) of almost 10<sup>-12</sup> without visible error-floors
- The bit and block error performances of this QC-LDPC code decoded with 5, 10, 50 iterations of the min-sum algorithm (MSA) with a scaling factor 0.75 are shown in Fig.1 (computed with an FPGA decoder).



Figure 1: Performances of the (16129,15372) QC-LDPC code calculated by an FPGA decoder.



### emory V. Important Decoder Implementation Issues

- Number of logic gates (or number of message processing units);
- Number of wires connecting the message processing units;
- Memory requirement;
- Power consumption;
- Decoding latency.



- To construct LDPC codes with good waterfall error performance and very low error-floor, algebraic construction is the way to go.
- A solution to the decoder implementation is the Merry-Go-Round decoder architecture.
- This presentation is simply an academic point of view.



# Thank you!

