

# Parallel Encoding Algorithm for LDPC Codes Based on Block-Diagonalization

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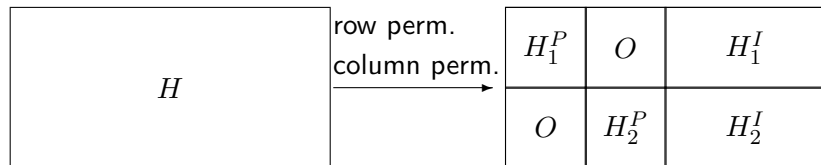
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# Abstract

**Purpose of Research:** Reduce the encoding time for LDPC codes

**Main Idea:** Parallel encoding based on block-diagonalization of  $H_P$



$$\begin{pmatrix} H_1^P & O & H_1^I \\ O & H_2^P & H_2^I \end{pmatrix} (\mathbf{p}_1, \mathbf{p}_2, \mathbf{m}) = \mathbf{0} \Rightarrow \begin{cases} H_1^P \mathbf{p}_1 = -H_1^I \mathbf{m} \\ H_2^P \mathbf{p}_2 = -H_2^I \mathbf{m} \end{cases}$$

## Contributions of Research

- Propose an efficient *parallel* encoding algorithm for LDPC codes
- Evaluate the number of operations of the proposed algorithm
  - The number of operations of each processor is almost equal
  - The encoding time becomes  $1/K$  compared with conventional one

# Background

## Low-Density Parity-Check (LDPC) code

Linear code defined by a sparse parity check matrix  $H \in \mathbb{F}^{M \times N}$

	Complexity	Parallelization	
Encoder	$O(N + \delta^2)$	?	$(\delta = O(N), \delta \ll N)$
Decoder	$O(N)$	Possible	

## Researches of Encoding Algorithm

	Complexity	Parallelization
Generator matrix	$O(N^2)$	Possible
[Richardson 2001], [Kaji 2006]	$O(N + \delta^2)$	?
This study	$O(N + \delta^2)$	Possible

# General Framework of Encoding

Encoding algorithm is divided into *precoding step* and *encoding step*

## Precoding Step

- Input: Parity check matrix  $H$
- Output: Systematic form  $(H_P | H_I)$

$$PHQ = (H_P | H_I) \quad P, Q \text{ are permutation matrices}$$

$$(H_P | H_I) \begin{pmatrix} \mathbf{p} \\ \mathbf{m} \end{pmatrix} = \mathbf{0} \quad \Rightarrow \quad H_P \mathbf{p} = -H_I \mathbf{m}$$

## Encoding Step

- Input: Message  $\mathbf{m}$
- Output: Parity part  $\mathbf{p}$

Solve linear equation  $H_P \mathbf{p} = -H_I \mathbf{m}$

Encoding algorithm is regarded as an algorithm finding  $P, Q$  such that  $H_P \mathbf{p} = -H_I \mathbf{m}$  is efficiently solved

# Outline of Proposed Algorithm

## Precoding Step of Proposed Algorithm

- 1 (To realize parallel algorithm,) Transform  $H$  into **singly bordered block-diagonal** (SBBD) matrix [Aykanat 2004]

$$H \Rightarrow H_2^{\text{SBBD}} = \begin{pmatrix} A_1 & O & B_1 \\ O & A_2 & B_2 \end{pmatrix}$$

- 2 (To efficiently solve the linear equations,) Rearrange row and column of  $A_i$  by conventional algorithm (e.g. Approximate triangularization [Richardson 2001])

## Outline of the remaining slides

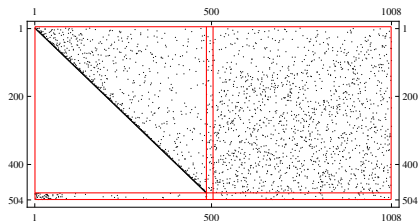
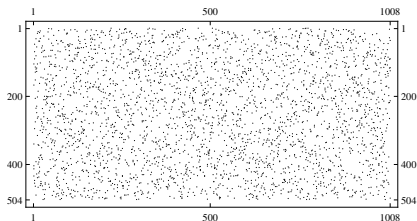
- 1 Approximate triangularization [Richardson 2001]
- 2 Singly bordered block-diagonalization [Aykanat 2004]
- 3 Propose parallel encoding algorithm
  - 1 Precoding step
  - 2 Encoding step
  - 3 Number of operation

# [Richardson 2001] (1: Precoding Step)

[Richardson 2001]

Transform  $H_P$  into *approximate triangular matrix* (ATM)

Complexity  $O(N + \delta^2)$



$$H \Rightarrow H^{\text{ATM}} = \begin{pmatrix} T & C & H_u^I \\ D & E & H_l^I \end{pmatrix}$$

$$\begin{pmatrix} T & C & H_u^I \\ D & E & H_l^I \end{pmatrix} (\mathbf{p}_1, \mathbf{p}_2, \mathbf{m})^T = \mathbf{0}^T$$

## [Richardson 2001] (2: Encoding Step)

$$\begin{pmatrix} T & C & H_u^I \\ D & E & H_l^I \end{pmatrix} (\mathbf{p}_1, \mathbf{p}_2, \mathbf{m})^T = \mathbf{0}^T$$

$$\blacksquare \mathbf{p}_2^T = \phi^{-1}(DT^{-1}H_u^I - H_l^I)\mathbf{m}^T$$

$$\blacksquare T\mathbf{p}_1^T = -C\mathbf{p}_2^T - H_u^I\mathbf{m}^T$$

where  $\phi := E - DT^{-1}C \in \mathbb{F}^{\delta \times \delta}$

### Number of Operations

- Number of multiplication (For non-binary case)

$$\mu = \text{wt}(H_l^I) + \text{wt}(H_u^I) + \text{wt}(C) + \text{wt}(D) + 2\text{wt}(T) + \text{wt}(\phi^{-1})$$

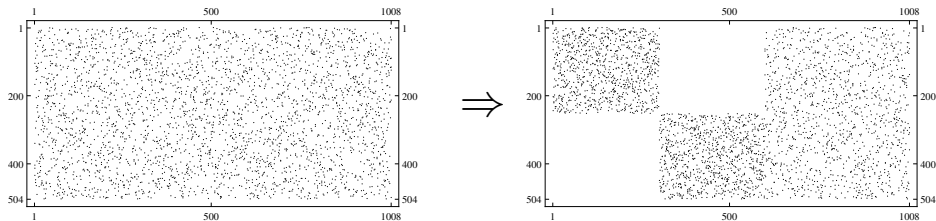
- Number of addition

$$\alpha = \mathcal{S}(H_l^I) + \mathcal{S}(H_u^I) + \mathcal{S}(C) + \mathcal{S}(D) + 2\mathcal{S}(T) + \mathcal{S}(\phi^{-1}) + M$$

where  $\mathcal{S}(A) := \text{wt}(A) - (\# \text{ of non-zero rows})$

# Block-diagonalization (1: Singly bordered BD)

Singly bordered block-diagonalization (SBBBD) [Aykanat 2004]



$$H \Rightarrow H_2^{\text{SBBBD}} = \begin{pmatrix} A_1 & O & B_1 \\ O & A_2 & B_2 \end{pmatrix}$$

(To simplify the notation, we assume the number of diagonal blocks  $K = 2$  in this talk)

To transform  $H$  into SBBBD matrix, hypergraph partition is used

- 1 Show a hypergraph representation of  $H$
- 2 Solve the hypergraph partition problem



# SBBD for $H$ (1: Hypergraph representation of a matrix)

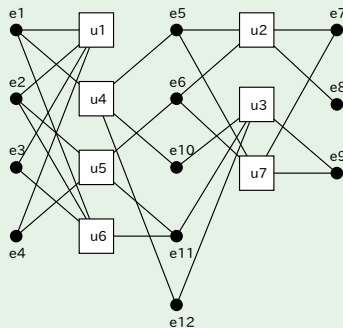
Row-net model [Çatalyürek 1999]

$i$ -th column  $\Rightarrow$   $i$ -th net (or hyperedge)  $e_i$

$j$ -th row  $\Rightarrow$   $j$ -th vertex  $u_j$

## Example

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



## SBBD for $H$ (2: Hypergraph partition)

$K$ -way hypergraph partition  $\Pi = \{\mathcal{U}_1, \mathcal{U}_2, \dots, \mathcal{U}_k\}$

(1)  $\emptyset \neq \mathcal{U}_i \subseteq \mathcal{U}$ , (2)  $\mathcal{U}_i \cap \mathcal{U}_j = \emptyset$  (for  $i \neq j$ ), (3)  $\bigcup_{i=1}^K \mathcal{U}_i = \mathcal{U}$

*Cuts* is the nets which connecting to more than one parts

*Cutset*  $\mathcal{X}(\Pi)$  is the set of cuts for the partition  $\Pi$

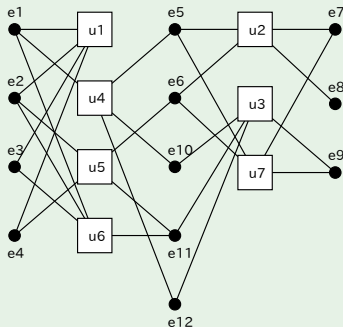
### Example

$$K = 2$$

$$\mathcal{U}_1 = \{u_1, u_4, u_5, u_6\}$$

$$\mathcal{U}_2 = \{u_2, u_3, u_7\}$$

$$\mathcal{X}(\Pi) = \{e_5, e_6, e_{10}, e_{11}, e_{12}\}$$



# SBBD for $H$ (3: Hypergraph partition problem and Transformation of matrix)

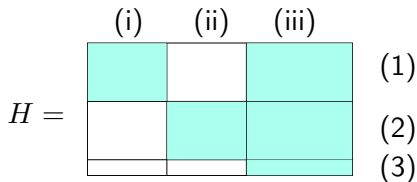
## $K$ -way hypergraph partition problem

minimize :  $|\mathcal{X}(\Pi)|$

s.t. Balance condition  $\max_i |\mathcal{U}_i| < |\mathcal{U}|(1 + \epsilon)/K$

There exist some heuristic algorithms (e.g. PaToH [Çatalyürek])

## Block-diagonalization of $H$ ( $K = 2$ )



(1)  $\mathcal{U}_1$

(2)  $\mathcal{U}_2$

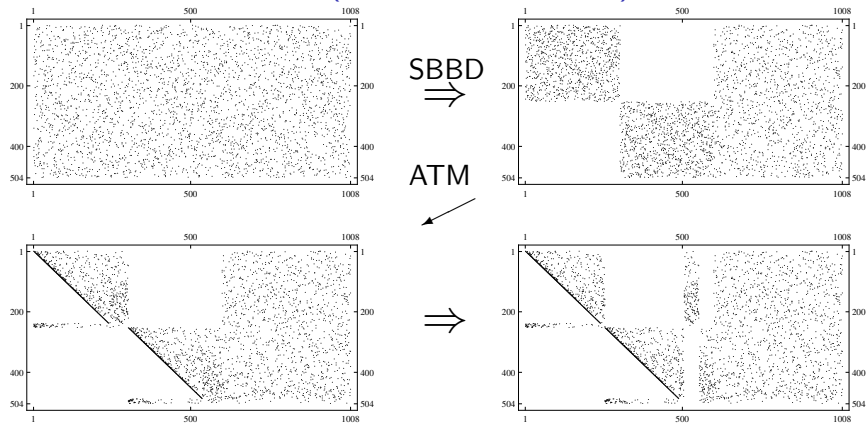
(3) Vertexes only connected to cutset  $\mathcal{X}(\Pi)$

(i) Nets only connecting to  $\mathcal{U}_1$

(ii) Nets only connecting to  $\mathcal{U}_2$

(iii) Cutset  $\mathcal{X}(\Pi)$

# Proposed Algorithm (1: Precoding step)



$$\begin{pmatrix} T_1 & C_1 & O & O & H_{1,u}^I \\ D_1 & E_1 & O & O & H_{1,l}^I \\ O & O & T_2 & C_2 & H_{2,u}^I \\ O & O & D_2 & E_2 & H_{2,l}^I \end{pmatrix} (\mathbf{p}_{1,1}, \mathbf{p}_{1,2}, \mathbf{p}_{2,2}, \mathbf{p}_{2,2}, \mathbf{m})^T = \mathbf{0}^T$$

## Proposed Algorithm (2: Encoding Step)

$$\begin{pmatrix} T_1 & C_1 & O & O & H_{1,u}^I \\ D_1 & E_1 & O & O & H_{1,l}^I \\ O & O & T_2 & C_2 & H_{2,u}^I \\ O & O & D_2 & E_2 & H_{2,l}^I \end{pmatrix} (\mathbf{p}_{1,1}, \mathbf{p}_{1,2}, \mathbf{p}_{2,1}, \mathbf{p}_{2,2}, \mathbf{m})^T = \mathbf{0}^T$$

$\Rightarrow$

$$\begin{pmatrix} T_1 & C_1 & H_{1,u}^I \\ D_1 & E_1 & H_{1,l}^I \end{pmatrix} (\mathbf{p}_{1,1}, \mathbf{p}_{1,2}, \mathbf{m})^T = \mathbf{0}^T$$
$$\begin{pmatrix} T_2 & C_2 & H_{2,u}^I \\ D_2 & E_2 & H_{2,l}^I \end{pmatrix} (\mathbf{p}_{2,1}, \mathbf{p}_{2,2}, \mathbf{m})^T = \mathbf{0}^T$$

Parity parts  $\mathbf{p}_1, \mathbf{p}_2$  are parallelly solved in dual processor system

## Numerical Example (Computational Complexity)

Name [MacKay]	RU Algorithm		Proposed Algorithm			
	$\mu/\alpha$	$(\delta)$	$\mu_1/\alpha_1$	$(\delta_1)$	$\mu_2/\alpha_2$	$(\delta_2)$
PEGReg504x1008	4599/3542	(21)	2369/1802	(23)	2384/1819	(23)
PEGReg252x504	2283/1739	(16)	1125/839	(13)	1124/843	(13)
PEGirReg504x1008	5068/4058	(1)	2587/2079	(2)	2599/2093	(1)
PEGirReg252x504	2560/2054	(1)	1284/1028	(2)	1289/1034	(1)
32000.2240.3.105	102659/98159	(7)	50366/48136	(10)	52180/49871	(10)
16383.2130.3.103	55472/51164	(16)	27453/25298	(15)	28055/25848	(19)
4095.737.3.101	14418/12915	(10)	7192/6428	(9)	7174/6412	(9)
10000.10000.3.631	144200/123378	(337)	87501/76950	(302)	96271/85278	(325)
8000.4000.3.483	45006/36709	(141)	23913/19638	(117)	25204/20868	(127)
4000.2000.3.243	20240/16075	(74)	10417/8279	(64)	10475/8298	(61)
504.504.3.504	4572/3517	(19)	2262/1721	(14)	2273/1729	(16)

$\mu_i$  : The number of multiplication of  $i$ -th processor

$\alpha_i$  : The number of addition of  $i$ -th processor

- The number of operations of each processor is almost equal
- The encoding time becomes  $1/K$  compared with conventional one

# Conclusion

- We have proposed a *parallel* encoding algorithm for LDPC codes
  - Main Idea : Block-diagonalization of parity part  $H_P$
- We have evaluated the number of operations of the proposed algorithm
  - The number of operations of each processor is almost equal
  - The encoding time becomes  $1/K$  compared with conventional one