

Reduced Complexity-and-Latency Variable-to-Check Residual Belief Propagation for LDPC Codes



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The Fourth International Workshop on Signal Design and its Application in Communications
October 19 – 23, 2009

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- Residual belief propagation (RBP)
- Variable-to-check residual belief propagation (VCRBP)
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- **Forced-convergence NVCRBP (FC-NVCRBP)**
- **Sign-based NVCRBP (S-NVCRBP)**
- Simulation Results
- Summary and Conclusions

INTRODUCTION

- **Future system requires higher data throughput**
 - Fast and accurate decoder (**fast convergence, high performance**)

Standard BP (simultaneous scheduling)

Layered / Shuffled BP (serial scheduling)

} Non-dynamic scheduling



Residual BP (Dynamic Scheduling)

RBP, Node-wise RBP (NRBP)

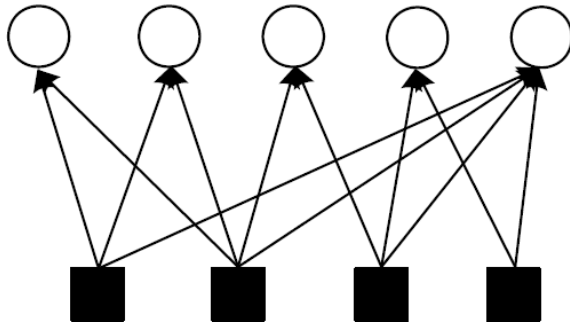
Variable-to-Check RBP (VCRBP), Node-wise VCRBP (NVCRBP)

Forced-Convergence NVCRBP (FC-NVCRBP), Sign-based NVCRBP (S-NVCRBP)

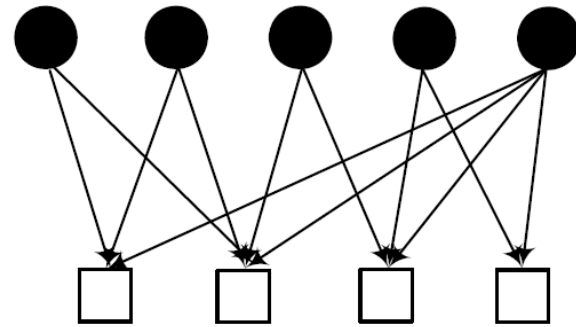
INTRODUCTION – standard BP

- Example Procedure of BP Decoding for LDPC Codes [1]
 - Simultaneously update all the check nodes and variable nodes

(a)



(b)

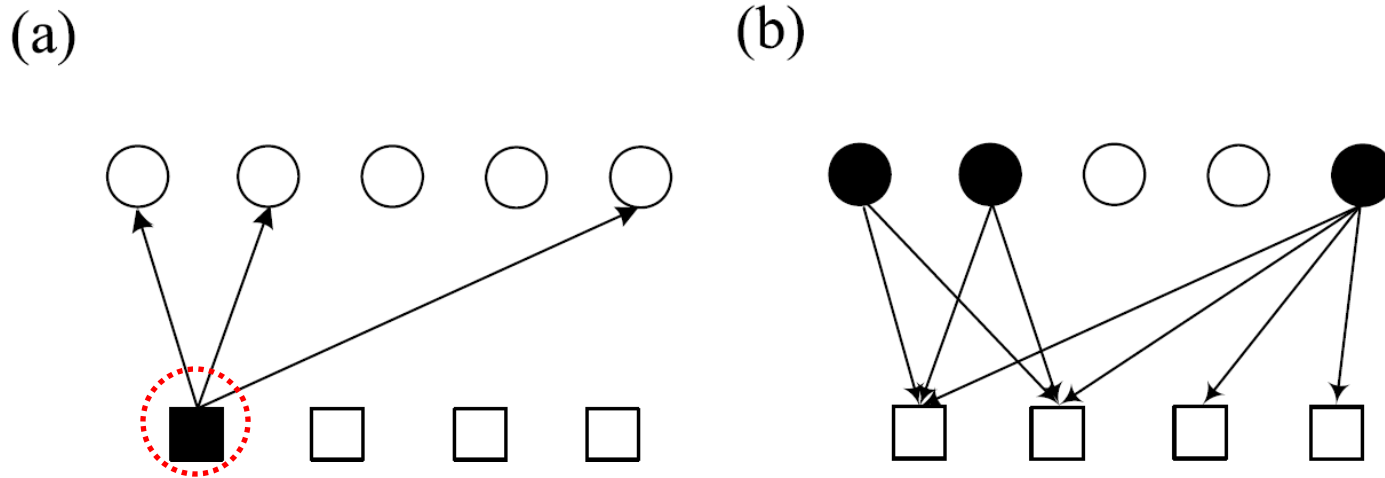


Black circles and squares present updated variable nodes and updated check nodes respectively.

[1] R. G. Gallager, Low-Density Parity-Check Codes. Cambridge, MA: MIT Press, 1963.

INTRODUCTION – layered BP

- **Example Procedure of LBP Decoding for LDPC Codes [2]**
 - Serially update toward check nodes

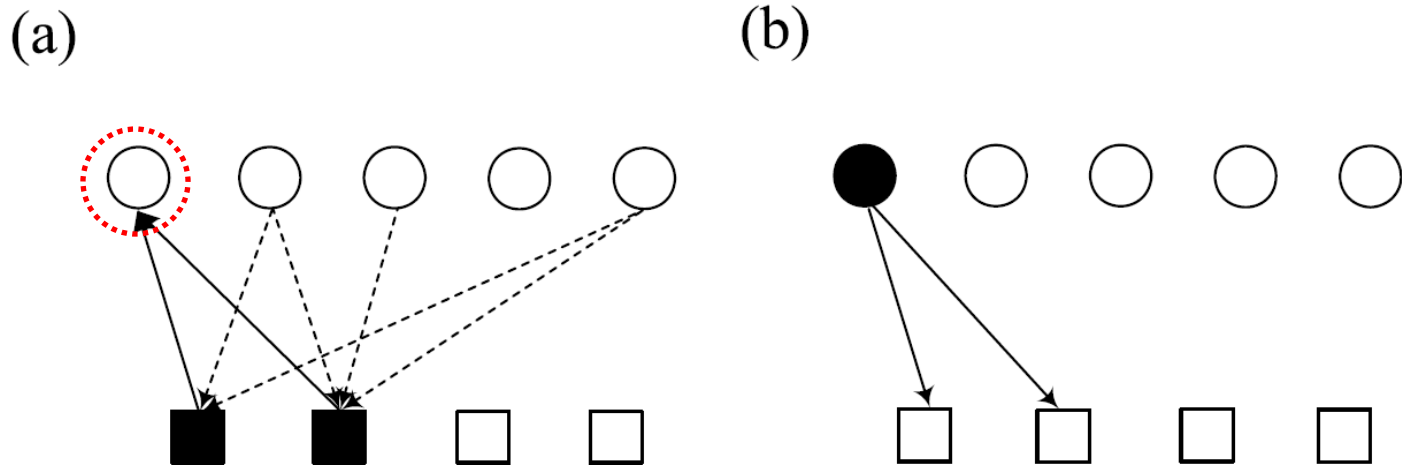


Black circles and squares present updated variable nodes and updated check nodes respectively.

[2] M. Rovini, F. Rossi, P. Ciao, N. Linsalata, and L. Fanucci, "Layered Decoding of Non-Layered LDPC Codes," In Proc. 9th EUROMICRO Conference on Digital System Design, pages 537-544, August, 2006.

INTRODUCTION – shuffled BP

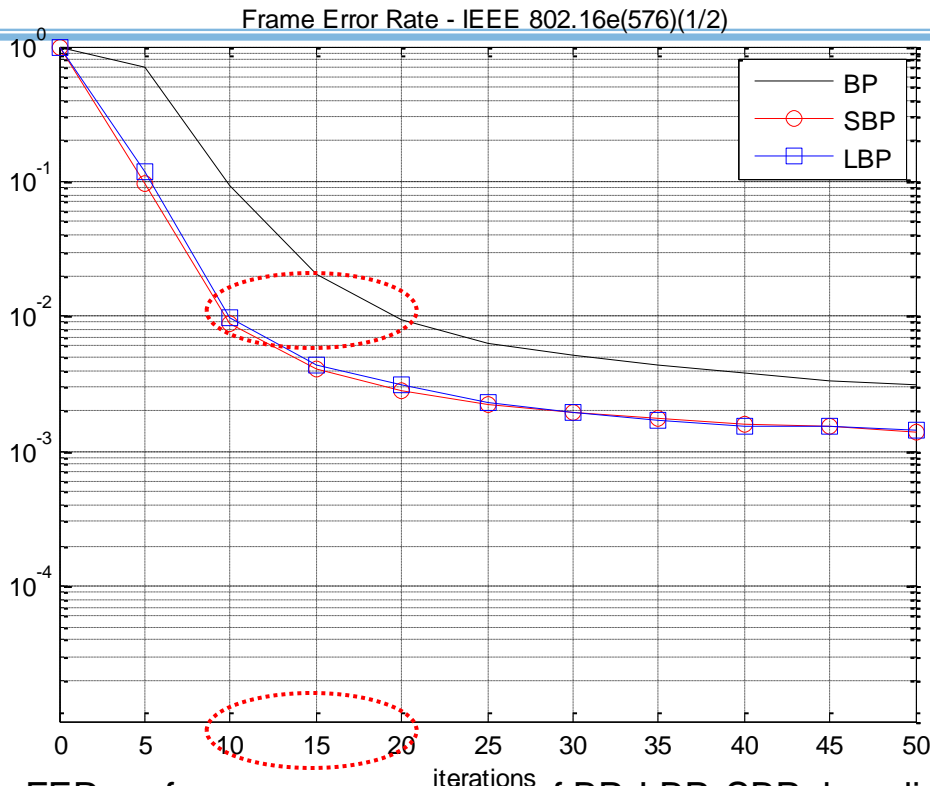
- **Example Procedure of SBP Decoding for LDPC Codes [3]**
 - Serially update toward variable nodes



Black circles and squares present updated variable nodes and updated check nodes respectively.

[3] J. Zhang and M. Fossorier, "Shuffled belief propagation decoding," IEEE Trans. on Comm., 53:209-213, February, 2005.

INTRODUCTION - comparison



Convergence speed of the decoding by serial schedule algorithms (LBP [2], SBP [3]) are **twice** faster in terms of iterations than standard BP [1] algorithm.

FER performance comparison of BP, LBP, SBP decoding using IEEE 802.16e block length-576 rate-1/2 code **up to 50 iterations at 2.5dB.**

[1] R. G. Gallager, Low-Density Parity-Check Codes. Cambridge, MA: MIT Press, 1963.

[2] M. Rovini, F. Rossi, P. Cio, N. Linsalata, and L. Fanucci, "Layered Decoding of Non-Layered LDPC Codes," In Proc. 9th EUROMICRO Conference on Digital System Design, pages 537-544, August, 2006.

[3] J. Zhang and M. Fossorier, "Shuffled belief propagation decoding," IEEE Trans. on Comm., 53:209-213, February, 2005.



(CHECK-TO-VARIABLE) RESIDUAL BP = RBP

AND

VARIABLE-TO-CHECK RESIDUAL BP = VCRBP



RBP FOR LDPC CODES

■ Residual Belief Propagation [4]

$$r(m_k) = |m_k^* - m_k|,$$

where m_k^* is a newly computed m_k by some update function.

RBP for LDPC codes [5]

$$r(m_{c \rightarrow v}) = |m_{c \rightarrow v}^* - m_{c \rightarrow v}|$$

VCRBP for LDPC codes [6]

$$r(m_{v \rightarrow c}) = |m_{v \rightarrow c}^* - m_{v \rightarrow c}|$$

[4] G. Elidan, I. McGraw, and D. Koller, "Residual belief propagation: informed scheduling for asynchronous message passing," *In Proc. 22nd Conference on Uncertainty in Artificial Intelligence, MIT, Cambridge, MA, July, 2006.*

[5] A. I. Vila Casado, M. Griot, and R. D. Wesel, "Informed Dynamic Scheduling for Belief-Propagation Decoding of LDPC Codes," *In Proc. IEEE ICC 2007, Glasgow, Scotland, June, 2007.*

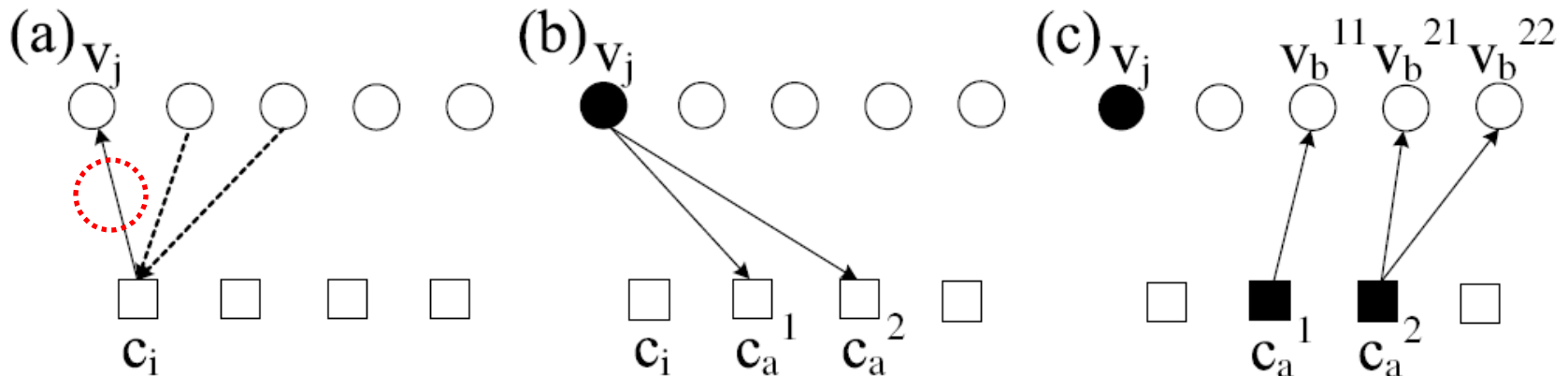
[6] Jung-Hyun Kim, Mi-Young Nam, and Hong-Yeop Song, "Variable-to-Check Residual Belief Propagation for LDPC Codes," *IET Electronic Letters, vol.45, no. 2, pp. 117-118, January, 2009.*



RBP FOR LDPC CODES

■ Example Procedure of RBP Decoding for LDPC Codes [5]

Waste computation

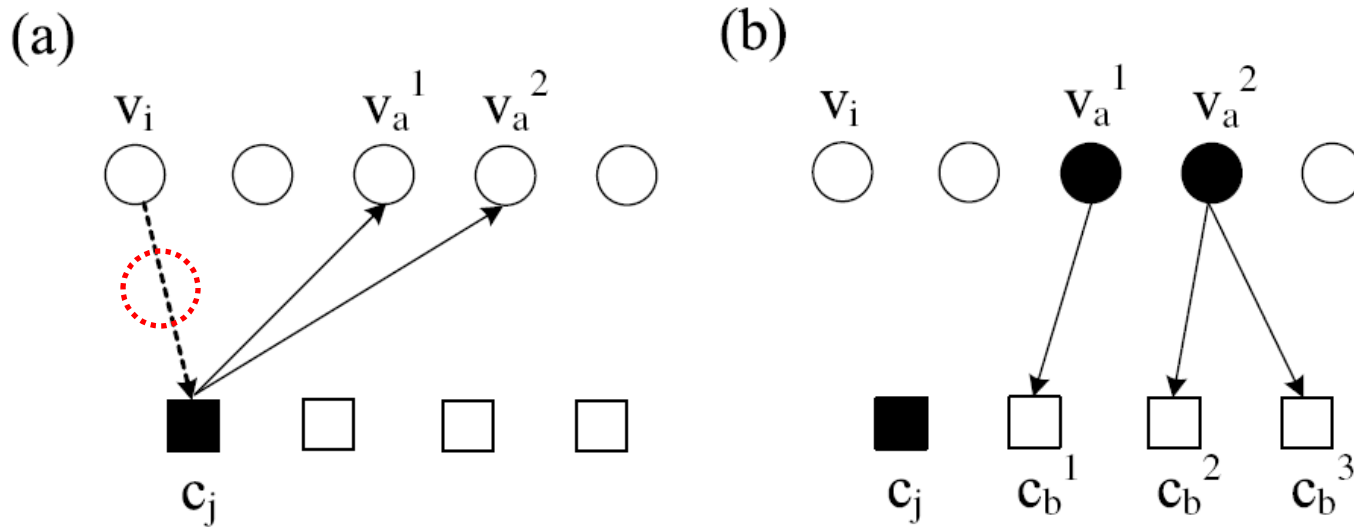


Black circles and squares present updated variable nodes and updated check nodes respectively.

[5] A. I. Vila Casado, M. Griot, and R. D. Wesel, "Informed Dynamic Scheduling for Belief-Propagation Decoding of LDPC Codes," *In Proc. IEEE ICC 2007, Glasgow, Scotland*, June, 2007.

VCRBP FOR LDPC CODES

■ Example Procedure of VCRBP Decoding for LDPC Codes [6]



Black circles and squares present updated variable nodes and updated check nodes respectively.

[6] Jung-Hyun Kim, Mi-Young Nam, and Hong-Yeop Song, "Variable-to-Check Residual Belief Propagation for LDPC Codes," *IET Electronic Letters*, vol.45, no. 2, pp. 117-118, January, 2009.

NODE-WISE RBP = NRBP = LAYERED RBP

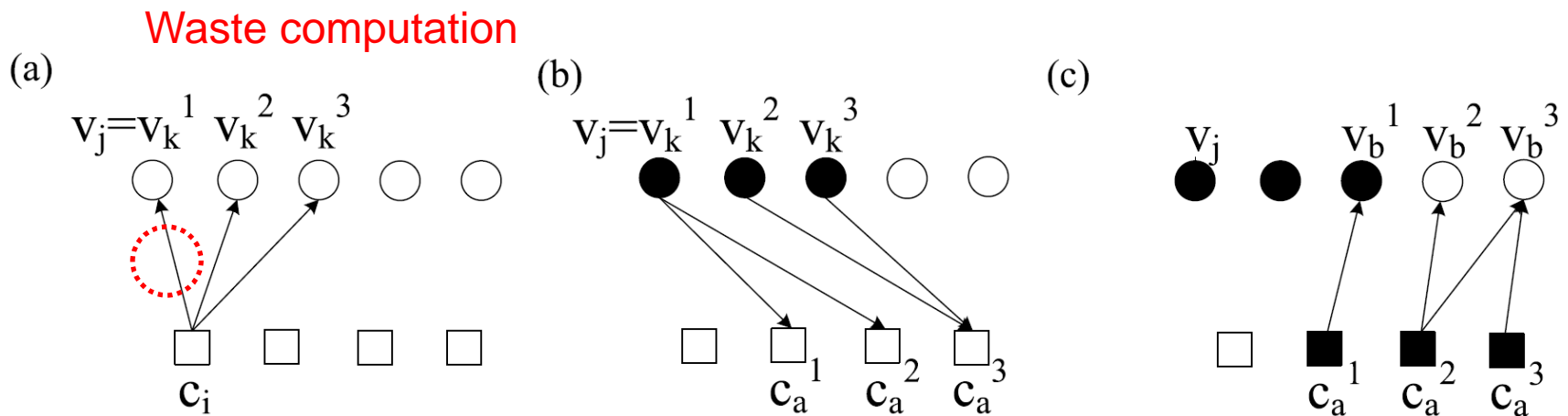
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NODE-WISE VCRBP = NVCRBP = SHUFFLED VCRBP



Node-wise RBP (NRBP) = Layered RBP

■ Example Procedure of NRBP Decoding for LDPC Codes [7]

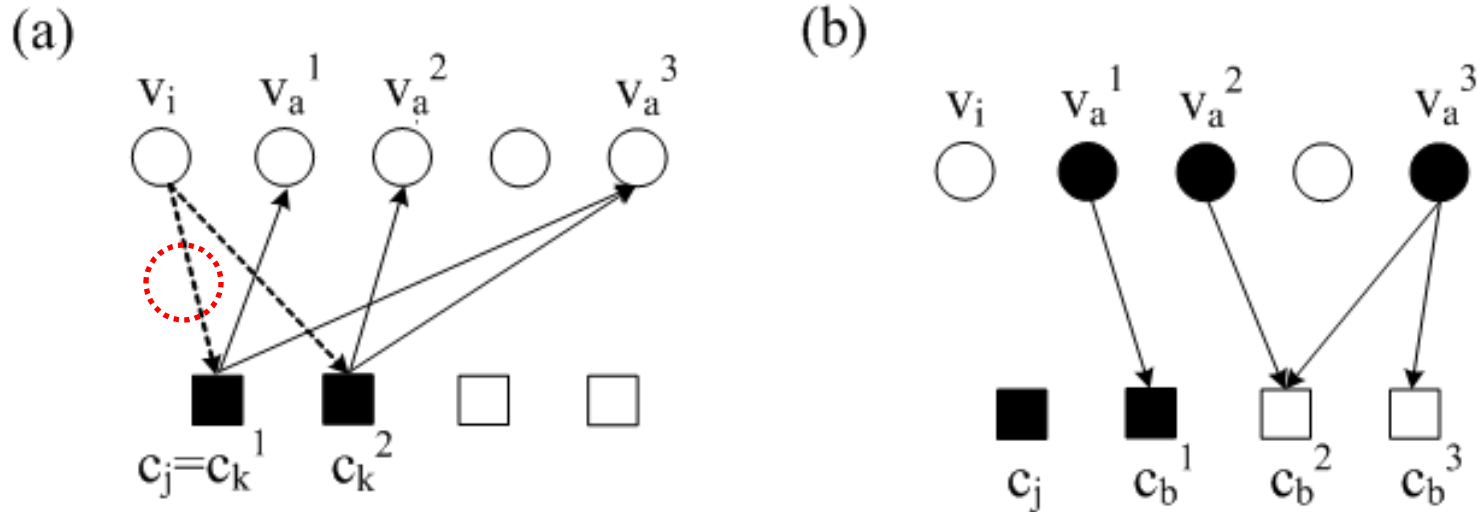


Black circles and squares present updated variable nodes and updated check nodes respectively.

[7] A. I. Vila Casado, M. Griot, and R. Wesel, "Improving LDPC Decoders via Informed Dynamic Scheduling," IEEE Information Theory Workshop 2007, Lake Tahoe, CA, September, 2007.

Node-wise VCRBP (NVCRBP) = Shuffled VCRBP

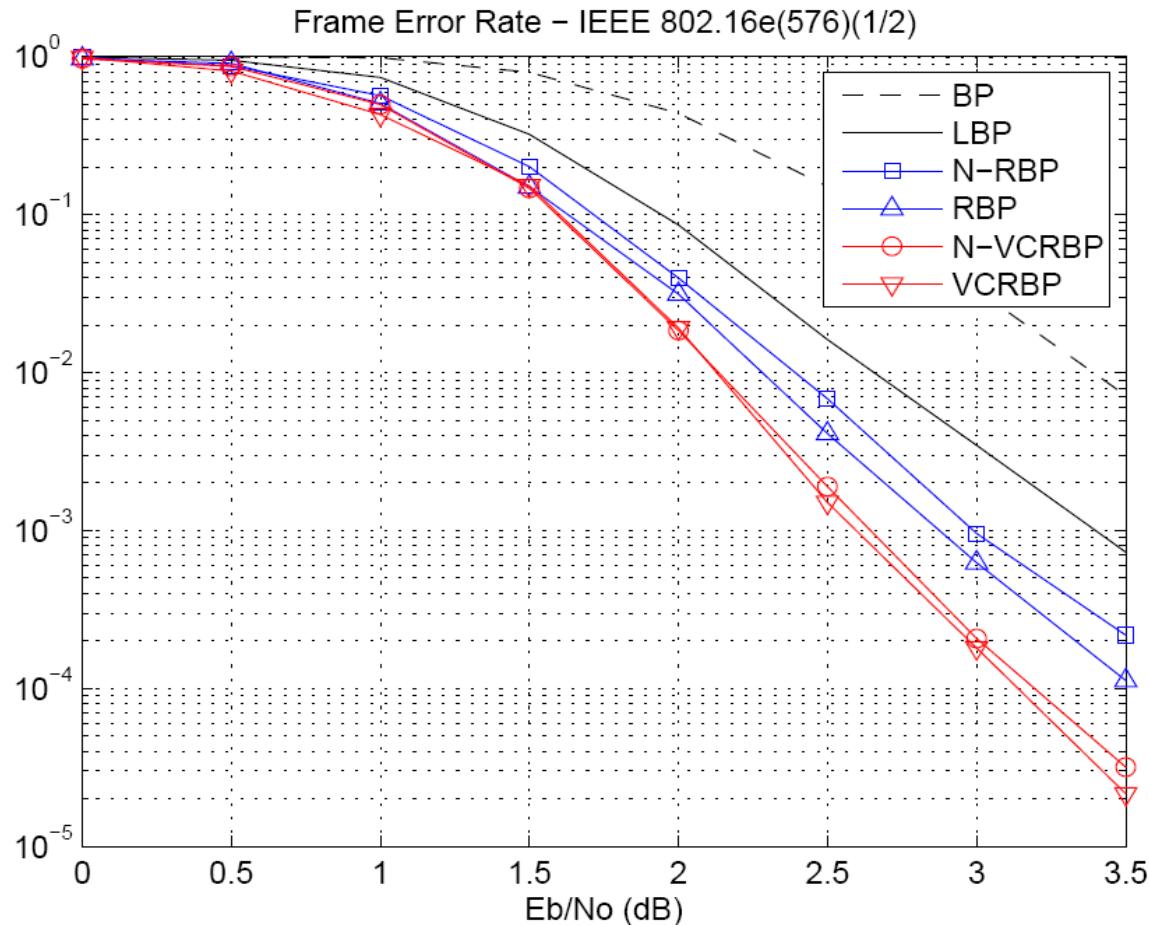
- Example Procedure of NVCRBP Decoding for LDPC Codes [8]



Black circles and squares present updated variable nodes and updated check nodes respectively.

[8] Jung-Hyun Kim, Mi-Young Nam and Hong-Yeop Song, "Variable-to-Check Residual Belief Propagation for Informed Dynamic Scheduling of LDPC Codes," *ISITA2008, The Langham Hotel, Auckland, New Zealand, December 7-10, 2008.*

FER Comparison - Simulation

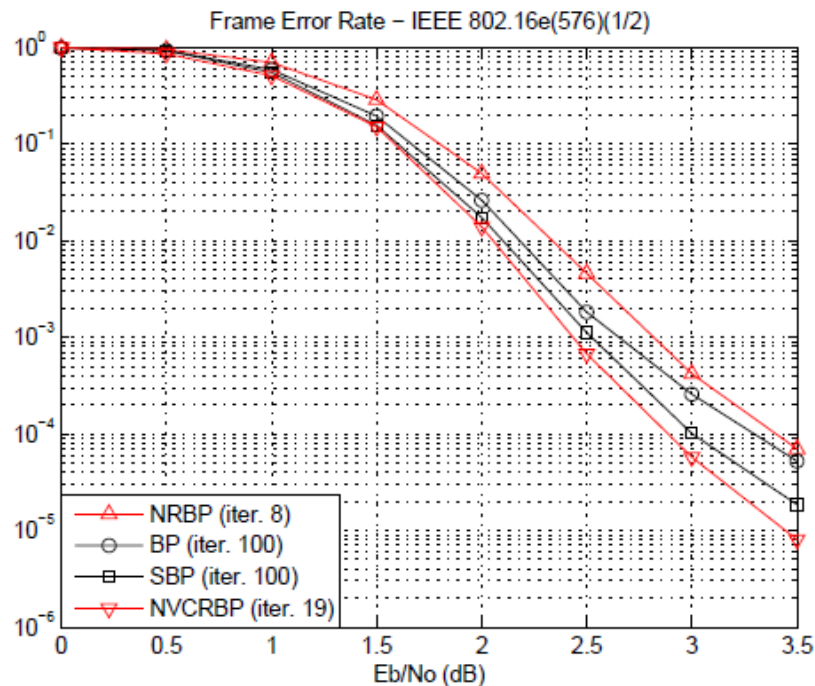


FER performance comparison of BP, LBP, NRBP, RBP, NVCRBP, and VCRBP decoding using IEEE 802.16e block length-576 rate-1/2 code with **at most 8 iterations**

Performance Comparison at **Constant** Complexity of Computation

APPROXIMATE DECODING COMPLEXITY

	BP / SBP	NRBP	NVCRBP
The number of computations for $m_{c \rightarrow v}$ in one iteration	1	$(d_v - 1)(d_c - 1) + 1$	$d_c - 1$
The number of maximum iterations \times The number of computations for $m_{c \rightarrow v}$ in one iteration = Approximate decoding complexity (in Fig. 1)	100×1 = 100	$8 \times ((3.17 - 1)(6.33 - 1) + 1)$ $\cong 100$	$19 \times (6.33 - 1)$ $\cong 100$



NRBP decoding does **WORSE** than standard BP decoding **at the constant complexity of computation!!**

FER performance comparison of BP, SBP, NRBP and NVCRBP decoding using IEEE 802.16e block length-576 rate-1/2 code **with maximum 100, 100, 8, and 19 iterations**, separately.

FORCED-CONVERGENCE NVCRBP = FC-NVCRBP

AND

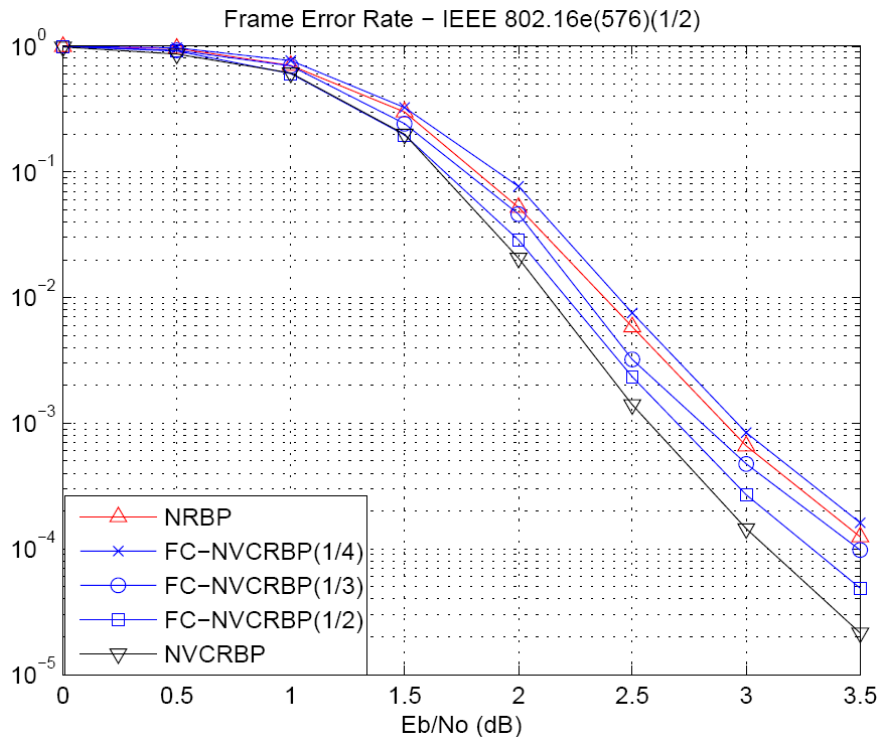
SIGN-BASED NVCRBP = S-NVCRBP



Forced Convergence

FC-NVCRBP FOR LDPC CODES

Forced Convergence NVCRBP Decoding for LDPC Codes



FER performance comparison of NRBP, FCNVCRBP(1/4), FC-NVCRBP(1/3), FC-NVCRBP(1/2), NVCRBP decoding using IEEE 802.16e block length-576 rate-1/2 code with **at most 8 iterations**

Convergence criterion

$$r(m_{v \rightarrow c}) = |m_{v \rightarrow c}^* - m_{v \rightarrow c}| \leq r_{th}$$

FC-NVCRBP skips updates of convergent nodes.

Approximate version for r_{th}

Take some appropriate portion of the residuals, say, $\frac{1}{2}$, $\frac{1}{3}$, or $\frac{1}{4}$

Sign-based S-NVCRBP FOR LDPC CODES

■ Sign-based NVCRBP Decoding for LDPC Codes

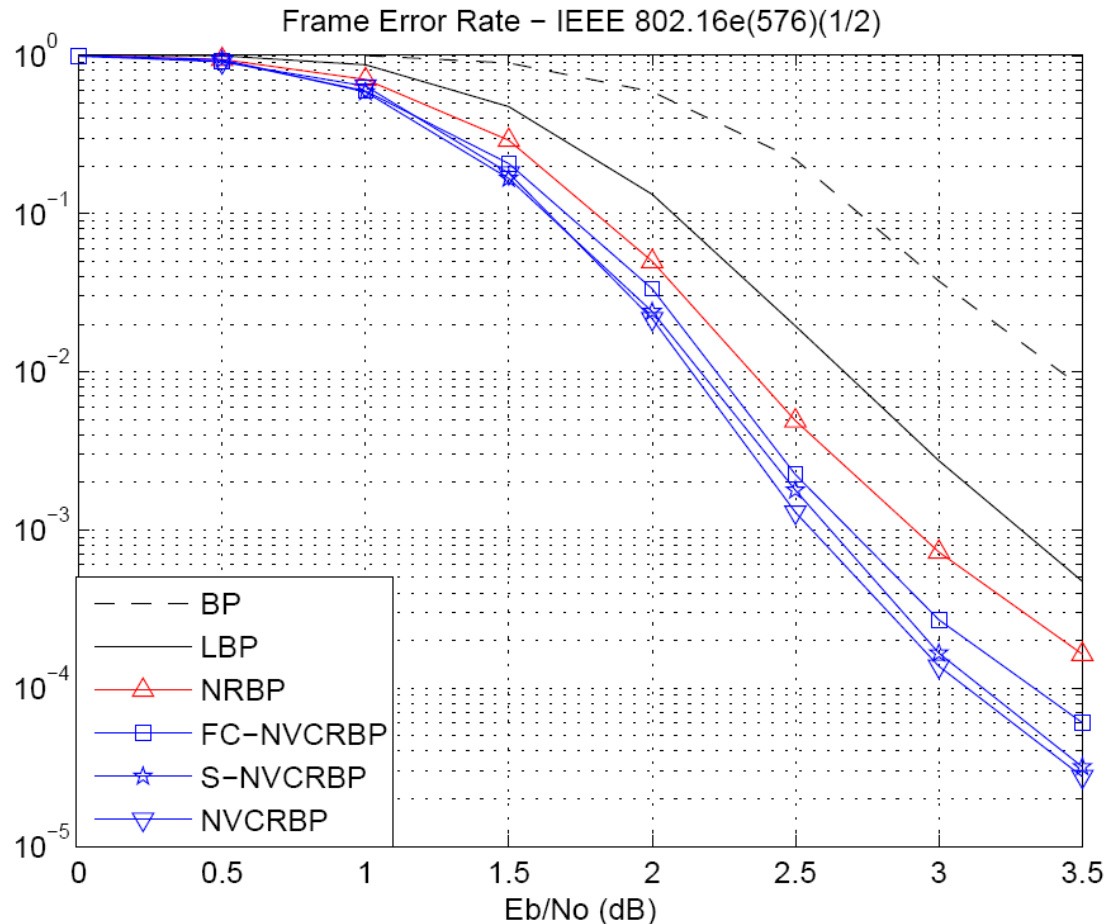
New ordering measure $s(\cdot)$:

$$s(m_{v \rightarrow c}) = \text{sign}(m_{v \rightarrow c}^*) \times \text{sign}(m_{v \rightarrow c})$$

where if $m_{v \rightarrow c}$ has a positive value then let $\text{sign}(m_{v \rightarrow c}) = 1$,
otherwise if $m_{v \rightarrow c}$ has a negative value then let $\text{sign}(m_{v \rightarrow c}) = -1$.

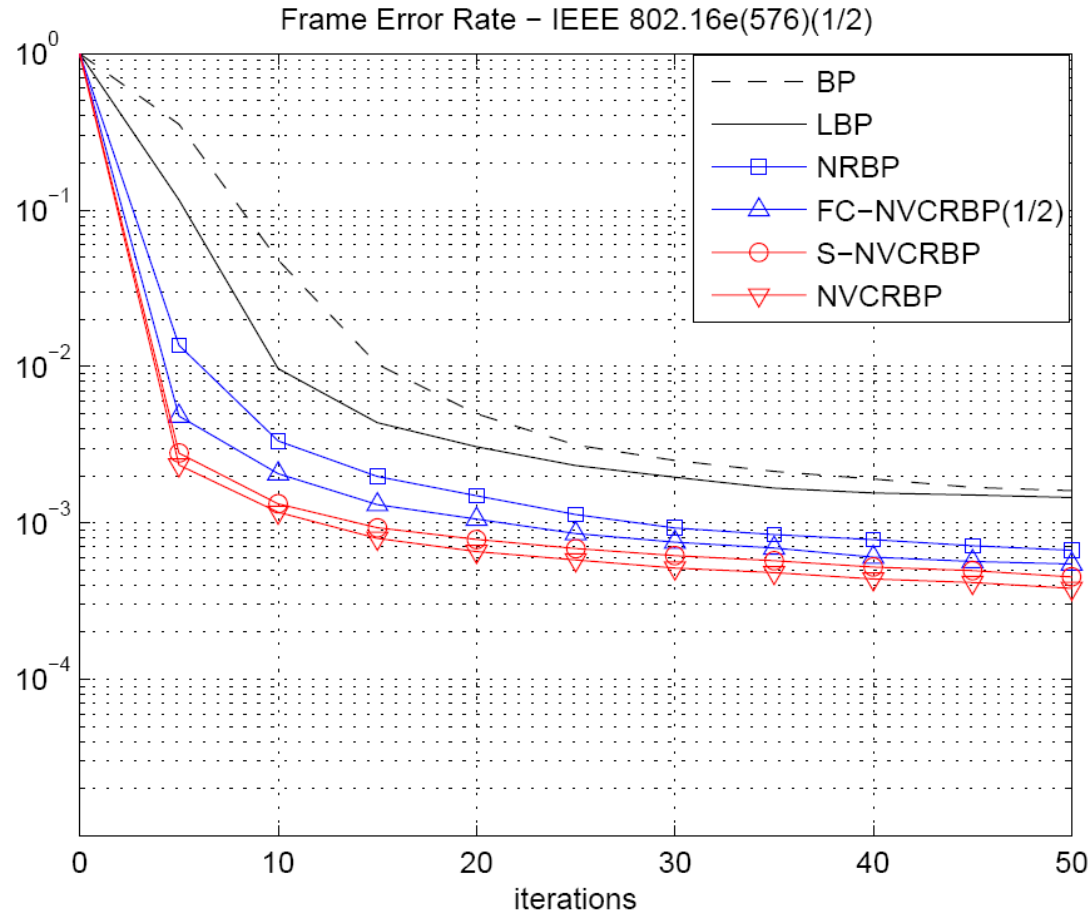
S-NVCRBP does not need to calculate all residuals
And **neither** to compare all residuals each other.

Performance Comparison



FER performance comparison of BP, LBP, NRBP, FC-NVCRBP(1/2), S-NVCRBP, and NVCRBP decoding using IEEE 802.16e block length-576 rate-1/2 code with **at most 8 iterations**.

Performance as the iteration continues



FER performance comparison of BP, LBP, NRBP, FCNVCRBP(1/2), S-NVCRBP, and NVCRBP decoding using IEEE 802.16e block length-576 rate-1/2 code **up to 50 iterations at 2.5dB.**

FINALLY...



Summary and Conclusions

- **VCRBP**

- makes LDPC decoding **converge much faster** in terms of the number of iterations than RBP (=CVRBP).
- guarantees **better performance** with **lower decoding complexity** than RBP within only 8 iterations.
- performs **similarly better after sufficiently many iterations** than RBP.

- **NVCRBP**

- has **very close performance** to VCRBP with significantly **lower decoding complexity**.

- **FC-NVCRBP and S-NVCRBP**

- **very close performance** with **much lower complexity and latency** compared to NVCRBP within only 8 iterations as well as after sufficiently many iterations.

THANK YOU!!

