#### On Parameter Optimization for Staircase Codes

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		Conclusions O	CHALMERS
	Outline		

- 1. Staircase Codes and Previous Work
- 2. Spatially-Coupled Codes and Density Evolution
- 3. Extended Code Construction
- 4. Conclusions

# Staircase Codes (and Product Codes)

Staircase Codes ●O				CHALMERS

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## Staircase Codes (and Product Codes)

rectangular array [Elias, 1954]



Example: n = 4

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each row/column is a codeword in C(2n code constraints in total)

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- Start with a binary linear code  $C(n, k, d_{\min})$  as a "building block"
- C: BCH code defined by  $(\nu, t, s)$ , where
  - ν: Galois-field extension degree
  - t: error-correction capability
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#### Problem Formulation

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For fixed OH, find a "good" triple (\nu, t, s).
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- Use density evolution and ensemble thresholds to optimize parameters, can account for miscorrections assuming extrinsic message passing (EMP) [Jian et al., ISIT, 2012]



Tanner graph







m constraint nodes corresponding to C



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 $d_{v} = 2$ 

 $d_{c} = n$




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Conclusio

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- Key observation: staircase code contained in the ensemble for m=n/2,  $L \to \infty$  and w=2 assuming "structured" permutations  $\pi$
- Asymptotic  $(m \to \infty)$  ensemble behavior can be analyzed via density evolution (DE) assuming extrinsic message passing (EMP)







C<sub>1</sub> with (ν, t, s) = (9, 5, 151) \*[Zhang and Kschischang, JLT, 2014]
DE for (C<sub>1</sub>, ∞, 30, 2) SC-GLDPC, adapted to sliding-window decoding





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- Use decoding thresholds for parameter optimization









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• Result for OH = 33.33%:  $C_2$  defined by  $(\nu, t, s) = (8, 3, 63)$ .





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- Result for OH = 33.33%:  $C_2$  defined by  $(\nu, t, s) = (8, 3, 63)$ .
- Staircase codes with  $\mathcal{C}_1$  and  $\mathcal{C}_2$  have different slopes  $\Rightarrow$  DE gain prediction not preserved

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- The type of lifting preserves the staircase array structure and time-invariant encoding/decoding operations

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### Example (OH = 33.33%): Extended Code Construction



- Extended staircase code based on  $C_2$  for q=2
- Steeper waterfall performance at the expense of a larger staircase block size  $2\cdot n/2 = 192$
- Staircase code with  $C_1$  has block size n/2 = 180

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	Conclusions •	

## Conclusions

Staircase Codes 00	Density Evolution 00	Extended Code Construction 00	Conclusions •	CHALMERS
		Conclusions		

1. Density evolution can be used as an effective tool for finding good staircase code parameters.

8/8



- 1. Density evolution can be used as an effective tool for finding good staircase code parameters.
- 2. Extended staircase code construction can provide steeper waterfall performance at the expense of a larger staircase block size.

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# Thank you!



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