



Modern Channel Coding

Mini-Module 5:

Symmetric Channels, Information Combining,
Decoding Thresholds for LDPC Codes

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Aalborg University, 6 -10 June 2005

Symmetric Channels



Binary-Input Symmetric Memoryless Channel

- binary input alphabet: $X \in \{+1, -1\}$
- arbitrary output alphabet: $Y \in \mathbb{R}$
- memoryless
- symmetric: $p(y|x) = p(-y|-x)$

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Channel can be decomposed into strongly symmetric sub-channels

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Symmetric Channels



Binary-Input Symmetric Memoryless Channel

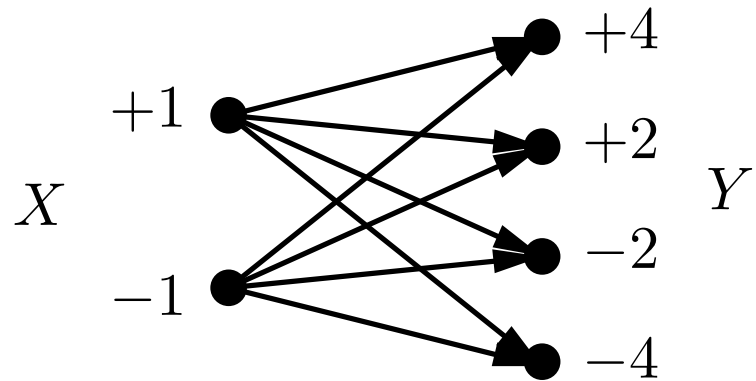
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Channel can be decomposed into strongly symmetric sub-channels

Example: BISMC

Original Channel

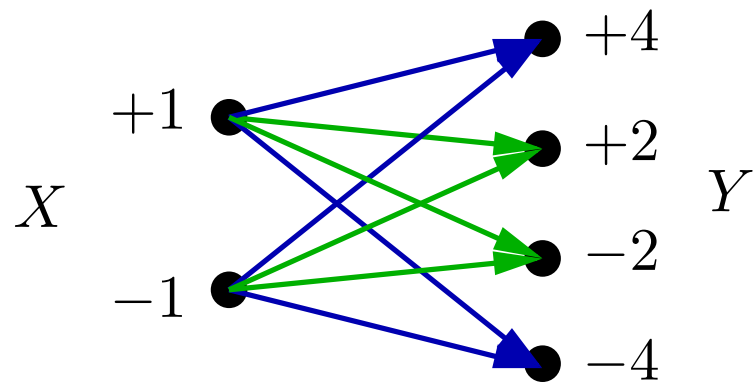
Sub-Channels



Example: BISMC

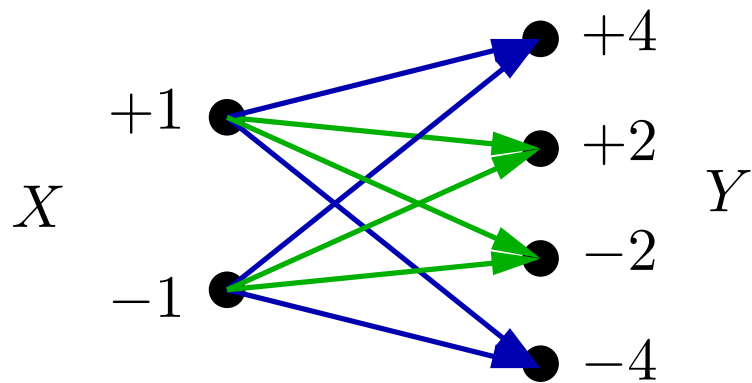
Original Channel

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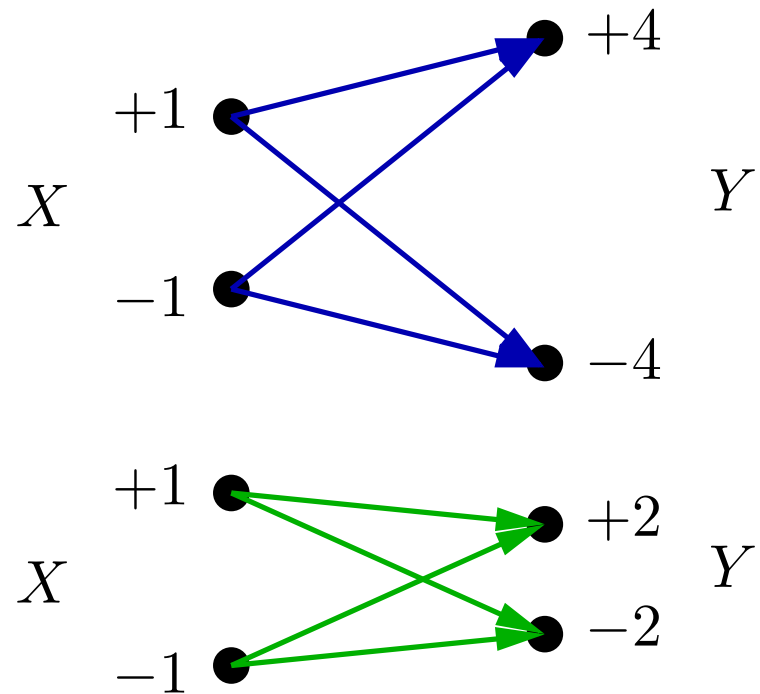


Example: BSMC

Original Channel

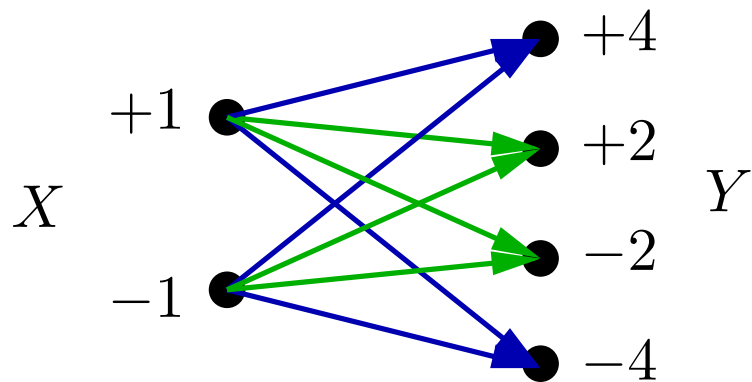


Sub-Channels

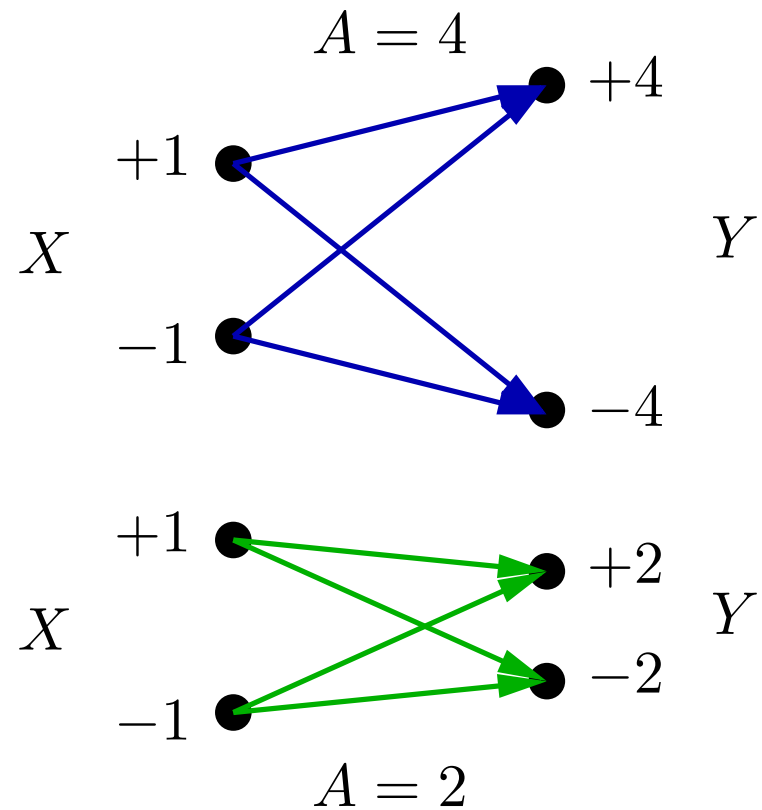


Example: BISMC

Original Channel



Sub-Channels



• Sub-channel indicator: $A := |Y|$

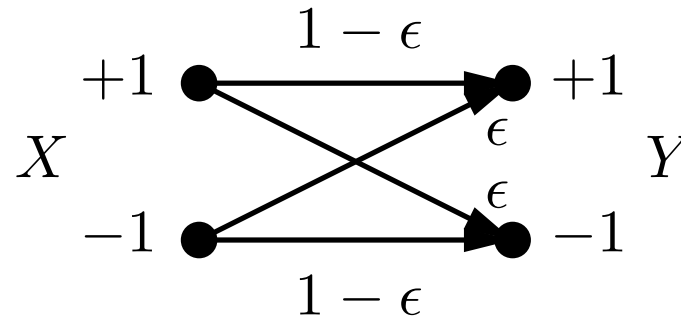
Mutual Information



- **BISMIC** with transition probabilities $p_{Y|X}(y|x)$

$$I(X; Y) := \mathbb{E} \left\{ \log_2 \frac{p_{X|Y}(x|y)}{p_X(x)} \right\}$$

Mutual Information



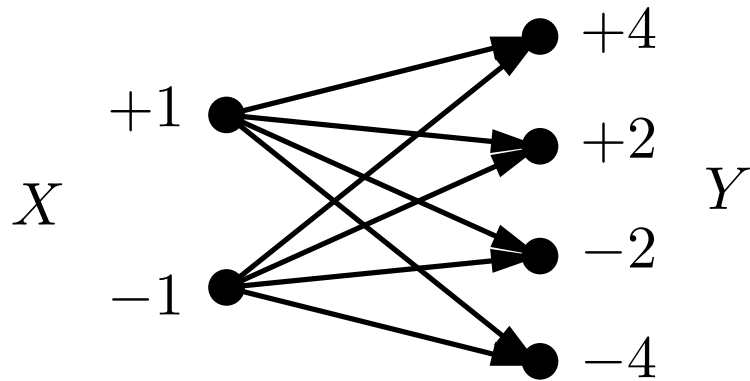
- **BSC** with crossover probability ϵ

$$I(X; Y) := 1 - h(\epsilon)$$

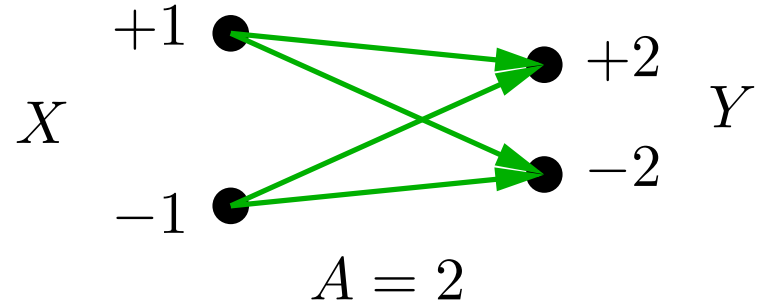
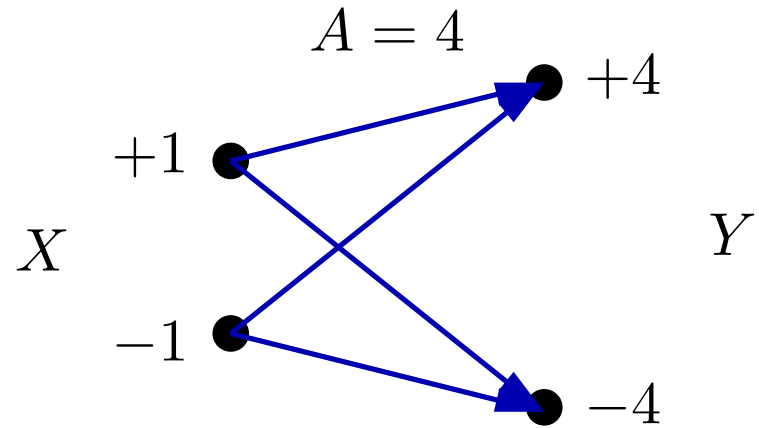
- Binary entropy function

$$h(\epsilon) := -\epsilon \log_2 \epsilon - (1 - \epsilon) \log_2(1 - \epsilon)$$

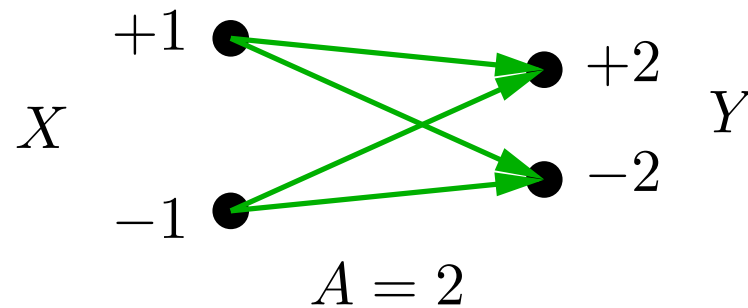
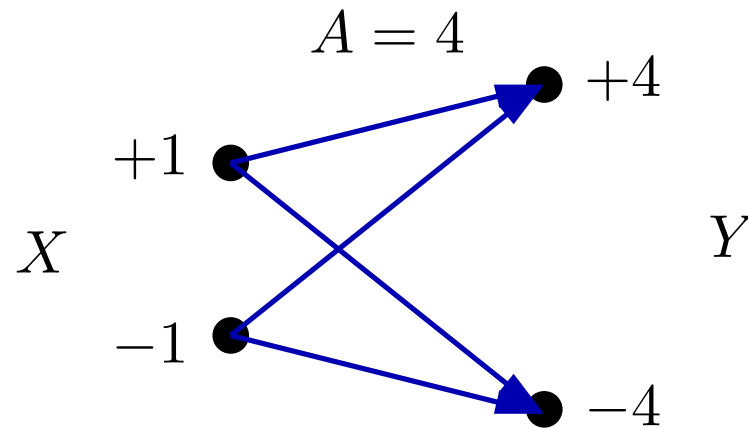
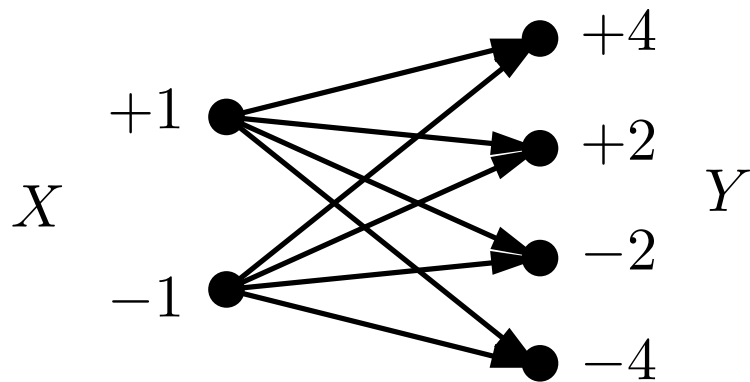
Example: BISMIC (2)



(Remember: $A := |Y|$)



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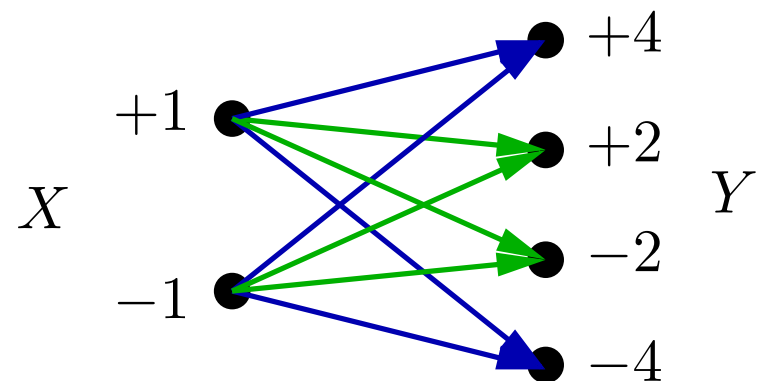
- $I(X; Y)$

- $I(X; Y|A = 4) = 1 - h(\epsilon_1)$

- $I(X; Y|A = 2) = 1 - h(\epsilon_2)$

Example: BISMC

Decomposition into
sub-channels that are BSCs



Example: BISMIC

- Mutual information of **blue sub-channel**:

$$j_1 = 1 - h(\epsilon_1)$$

- of **green sub-channel**:

$$j_2 = 1 - h(\epsilon_2)$$

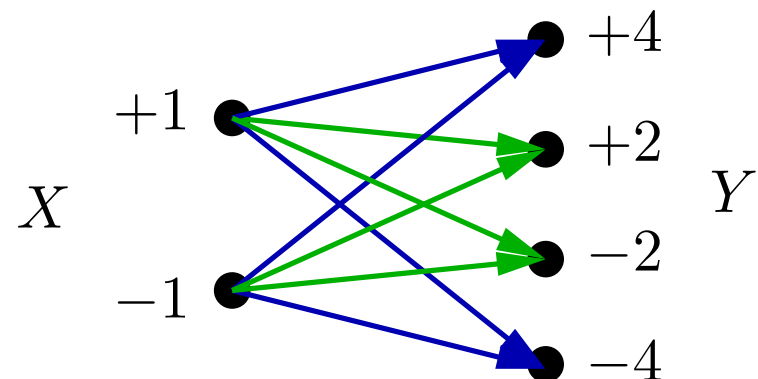
General:

$$J \in \{j_1, j_2\}$$

- Mutual information of (original) channel

$$I(X; Y) = \mathbb{E}\{J\}$$

Decomposition into sub-channels that are BSCs



Example: BSMC

- Mutual information of blue sub-channel:

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- of green sub-channel:

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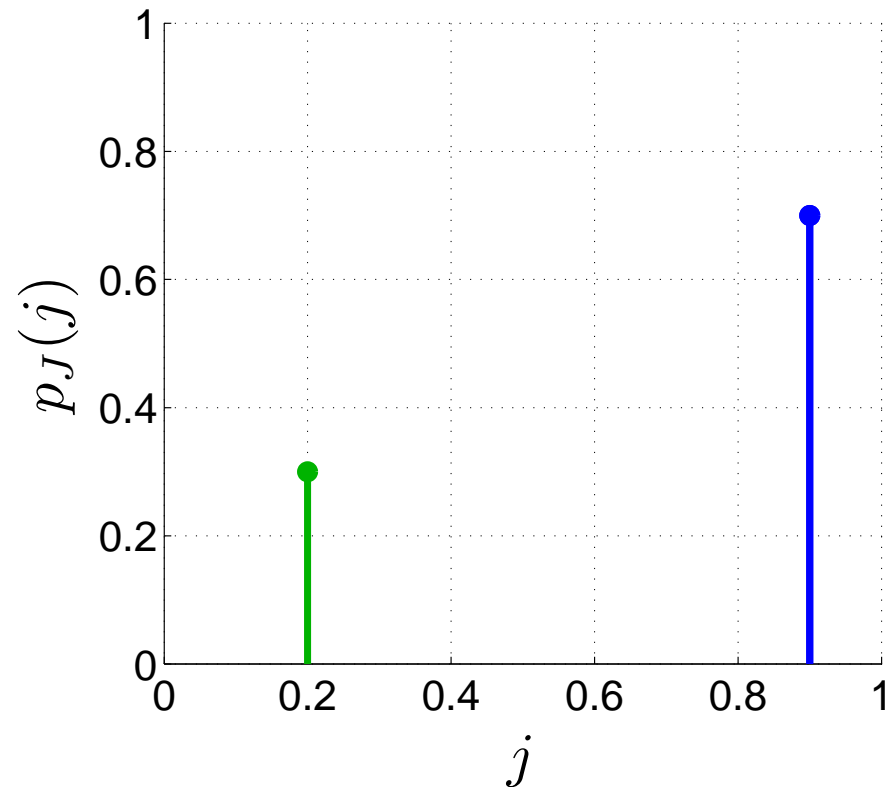
General:

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Mutual Information Profile



Mutual Information Profile

- Binary-input symmetric memoryless channel
- **Property of a BSMC** (also for continuous output alphabet)

Decomposable into sub-channels that are BSCs

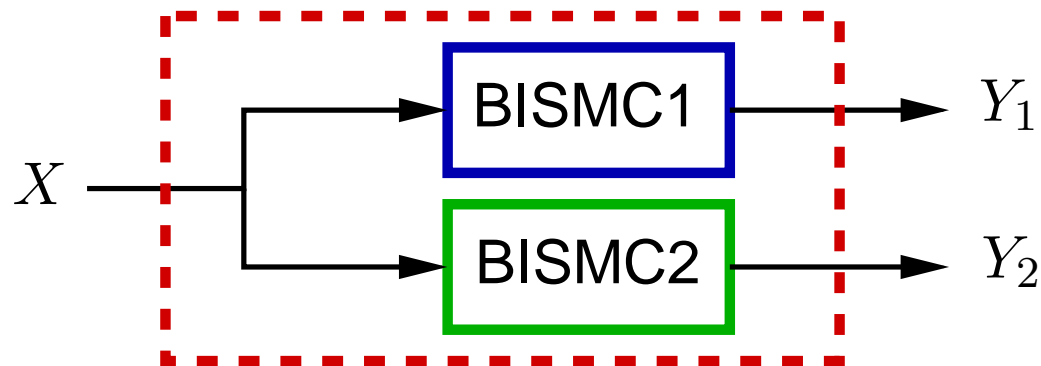
- **Characterization of a BSMC**

Mutual Information Profile

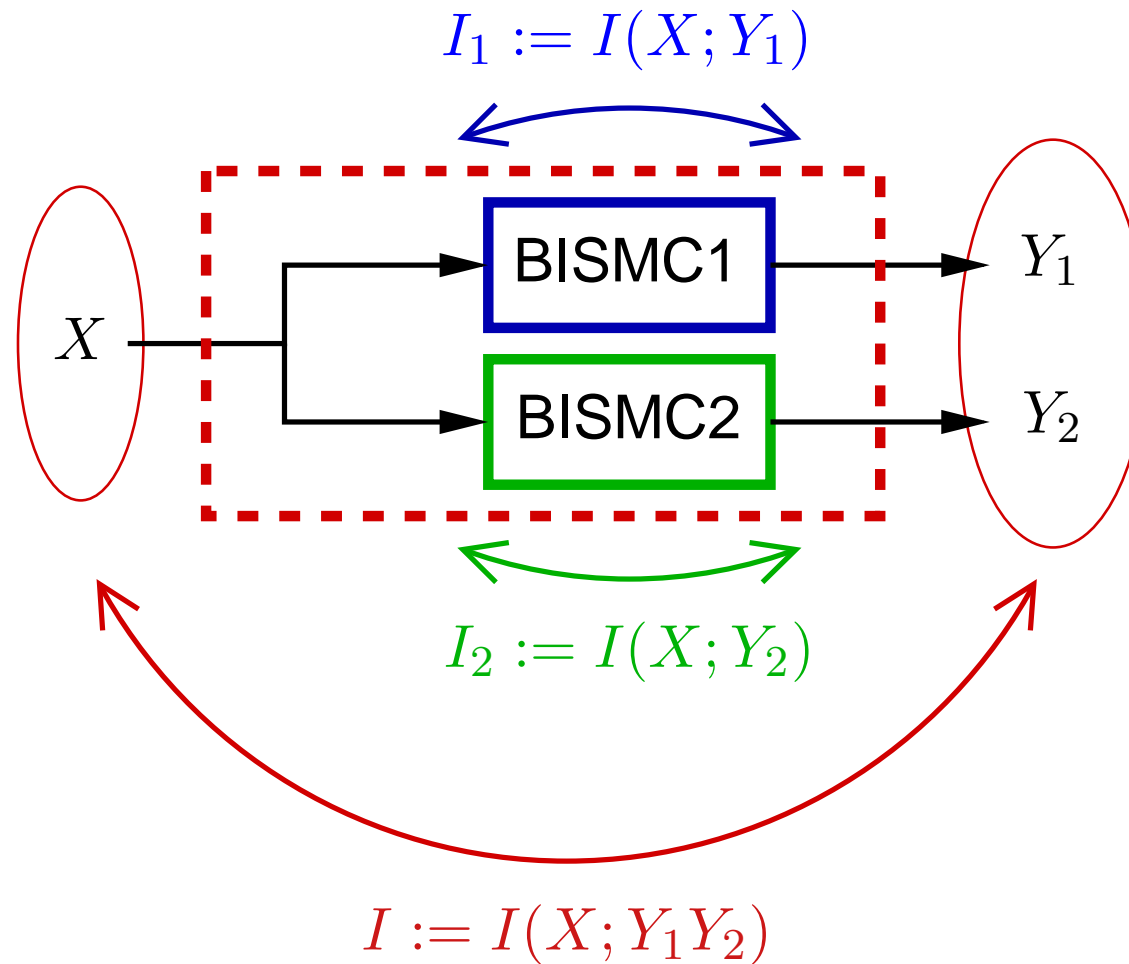
Distribution $p_J(j)$ of the sub-channel mutual information J

- **Notice:** $I(X; Y) = \mathbb{E}\{J\}$

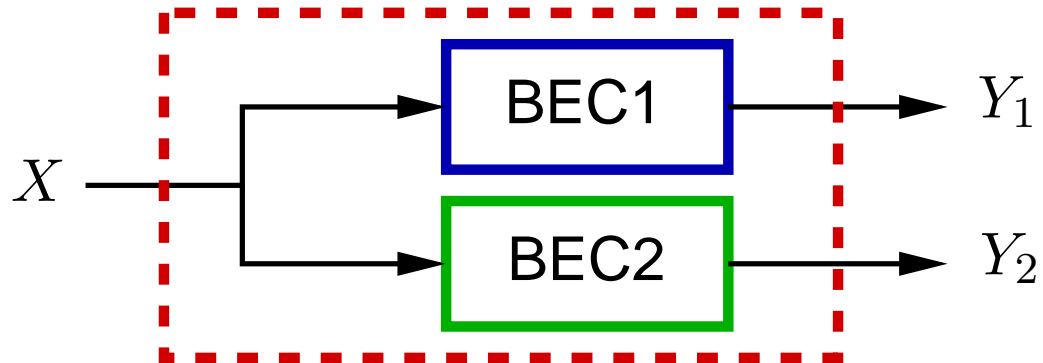
Information Combining



Information Combining



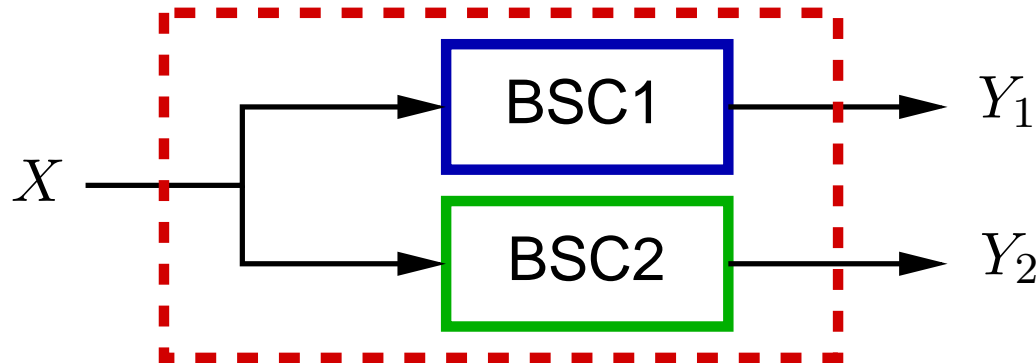
Examples for Information Combining



• Binary Erasure Channels

$$I = 1 - (1 - I_1)(1 - I_2)$$

Examples for Information Combining



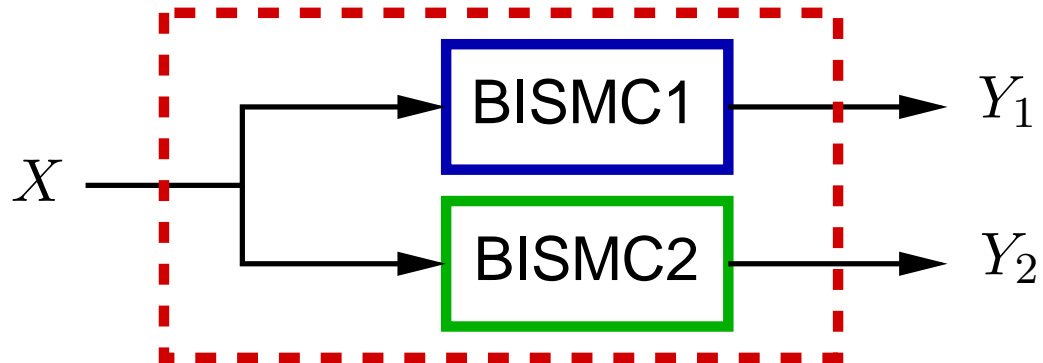
Binary Symmetric Channels

$$I = f_2^{\text{par}}(I_1, I_2)$$

with $f_2^{\text{par}}(I_1, I_2) := I_1 + I_2 - 1 + h\left(\epsilon_1(1 - \epsilon_2) + (1 - \epsilon_1)\epsilon_2\right)$,

$$\epsilon_1 = h^{-1}(1 - I_1), \quad \epsilon_2 = h^{-1}(1 - I_2)$$

Information Combining: Problem



- Overall mutual information depends on channel models
- Bounds on overall mutual information?

Information Combining: Solution (1)

$$\begin{aligned} I &:= I(X; Y_1 Y_2) \\ &= I(X; Y_1 Y_2 | J_1 J_2) \\ &= \int_{j_1} \int_{j_2} \underbrace{p_{J_1}(j_1)}_{\text{MIP1}} \underbrace{p_{J_2}(j_2)}_{\text{MIP2}} \underbrace{I(X; Y_1 Y_2 | J_1 = j_1, J_2 = j_2)}_{2 \times \text{BSC}} dj_1 dj_2 \\ &= \text{E} \left\{ \underbrace{f_2^{\text{par}}(J_1, J_2)}_{2 \times \text{BSC}} \right\} \end{aligned}$$

Information Combining: Solution (2)

- Bounding the expected value:

$$\mathbb{E}\left\{f_2^{\text{par}}(J_1, J_2)\right\} \geq$$

$$\mathbb{E}\left\{f_2^{\text{par}}(J_1, J_2)\right\} \leq$$

- Properties of $f_2^{\text{par}}(j_1, j_2)$:

Information Combining: Solution (2)

- Bounding the expected value:

$$\mathbb{E}\left\{f_2^{\text{par}}(J_1, J_2)\right\} \geq f_2^{\text{par}}\left(\mathbb{E}\{J_1\}, \mathbb{E}\{J_2\}\right) = f_2^{\text{par}}(I_1, I_2)$$

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- Properties of $f_2^{\text{par}}(j_1, j_2)$:

- $f_2^{\text{par}}(j_1, j_2)$ is convex- \cup (Mrs. Gerber's Lemma)

Information Combining: Solution (2)

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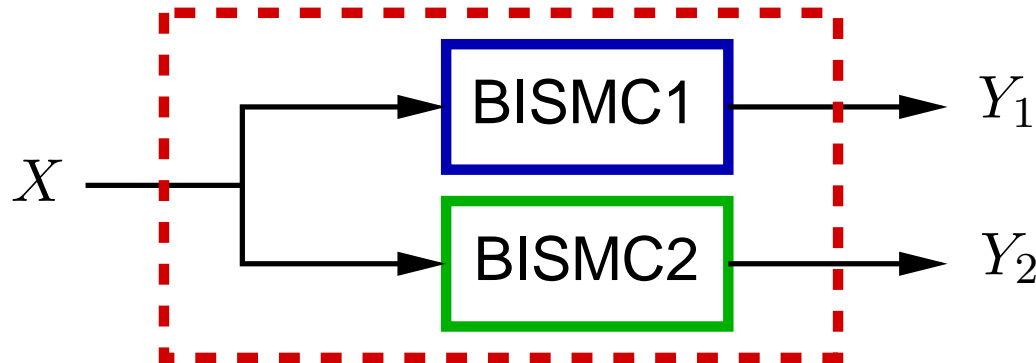
$$\begin{aligned}\mathbb{E}\left\{f_2^{\text{par}}(J_1, J_2)\right\} &\leq \mathbb{E}\left\{1 - (1 - J_1)(1 - J_2)\right\} = \\ &= 1 - (1 - I_1)(1 - I_2)\end{aligned}$$

- Properties of $f_2^{\text{par}}(j_1, j_2)$:

- $f_2^{\text{par}}(j_1, j_2)$ is convex- \cup (Mrs. Gerber's Lemma)

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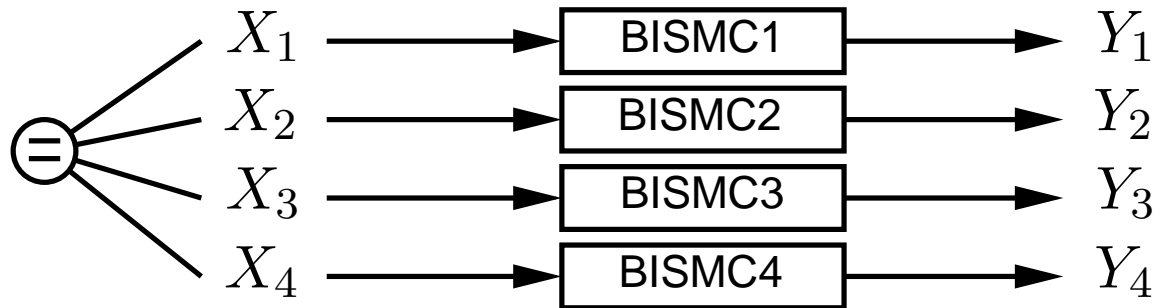
Information Combining: Bounds



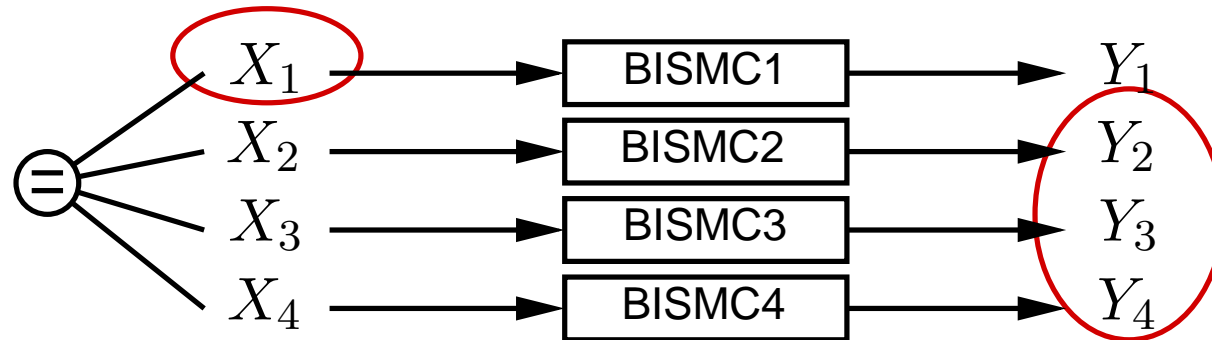
- Mutual information of the component channels $I_1 := I(X; Y_1)$ and $I_2 := I(X; Y_2)$
- Mutual information of the overall channel $I := I(X; Y_1 Y_2)$

$$\underbrace{f_2^{\text{par}}(I_1, I_2)}_{2 \times \text{BSC}} \leq I \leq \underbrace{1 - (1 - I_1)(1 - I_2)}_{2 \times \text{BEC}}$$

Repeat Codes



Repeat Codes



- **Given:**

Mutual informations of the component channels

$$I_n := I(X_n; Y_n), \quad n = 1, 2, 3, 4$$

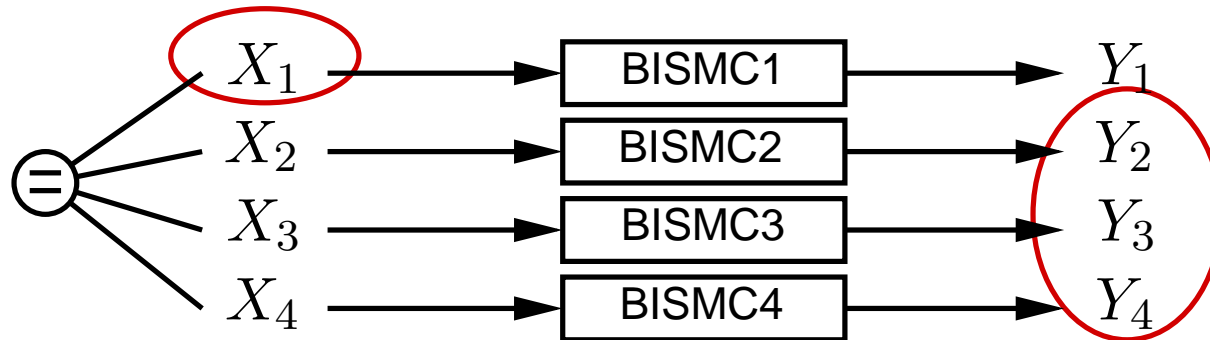
- **Wanted:**

Bounds on the extrinsic mutual information

$$I_{e,1} := I(X_1; Y_2 Y_3 Y_4)$$

(analogous for X_2, X_3, X_4)

Repeat Codes



● Solution:

$$\underbrace{f_3^{\text{par}}(I_2, I_3, I_4)}_{\text{only BSCs}} \leq I_{e,1} \leq \underbrace{1 - (1 - I_2)(1 - I_3)(1 - I_4)}_{\text{only BECs}}$$

Repetition Codes: EXIT Functions

- Code length N

- Input:

$$I_n := I_a \quad \forall n$$

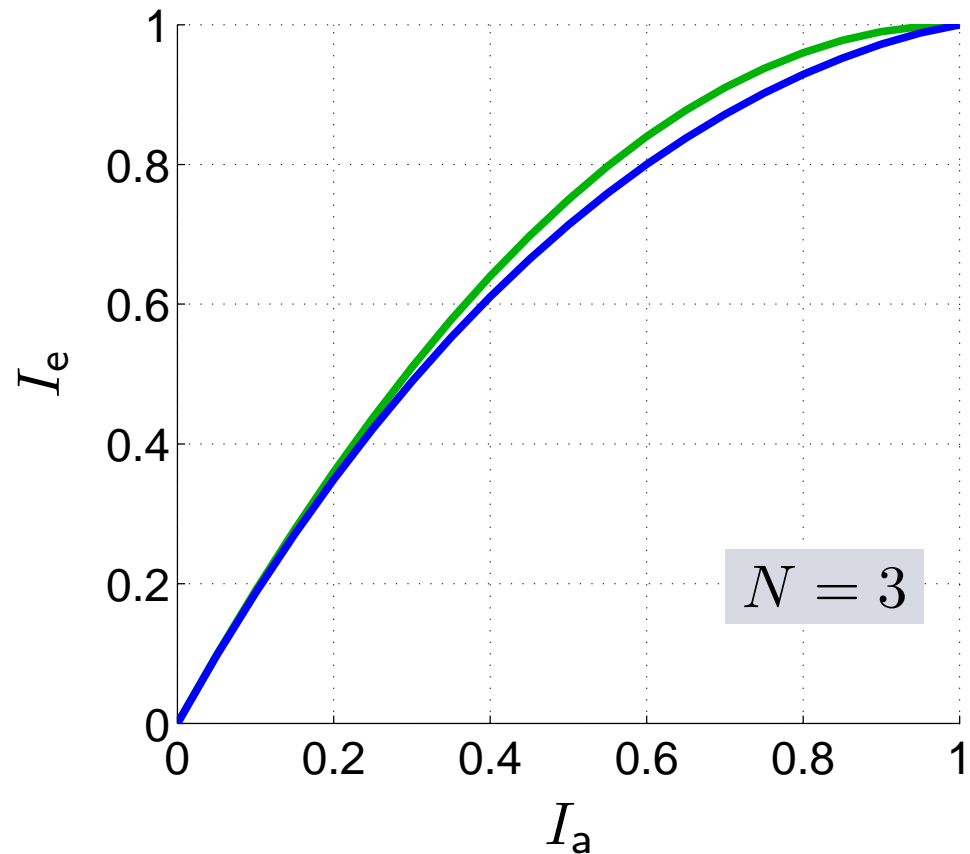
- Output:

$$I_e := \frac{1}{N} \sum_{n=1}^N I_{e,n}$$

- EXIT Function:

$$I_a \mapsto I_e$$

- BSCs, BECs



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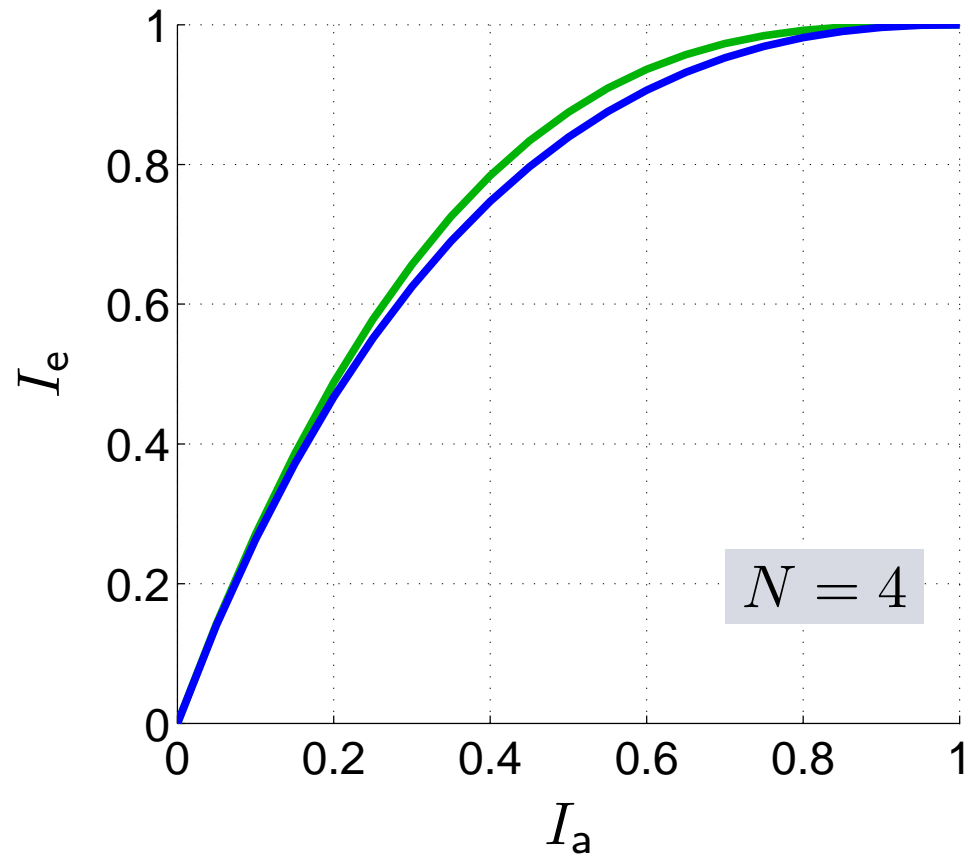
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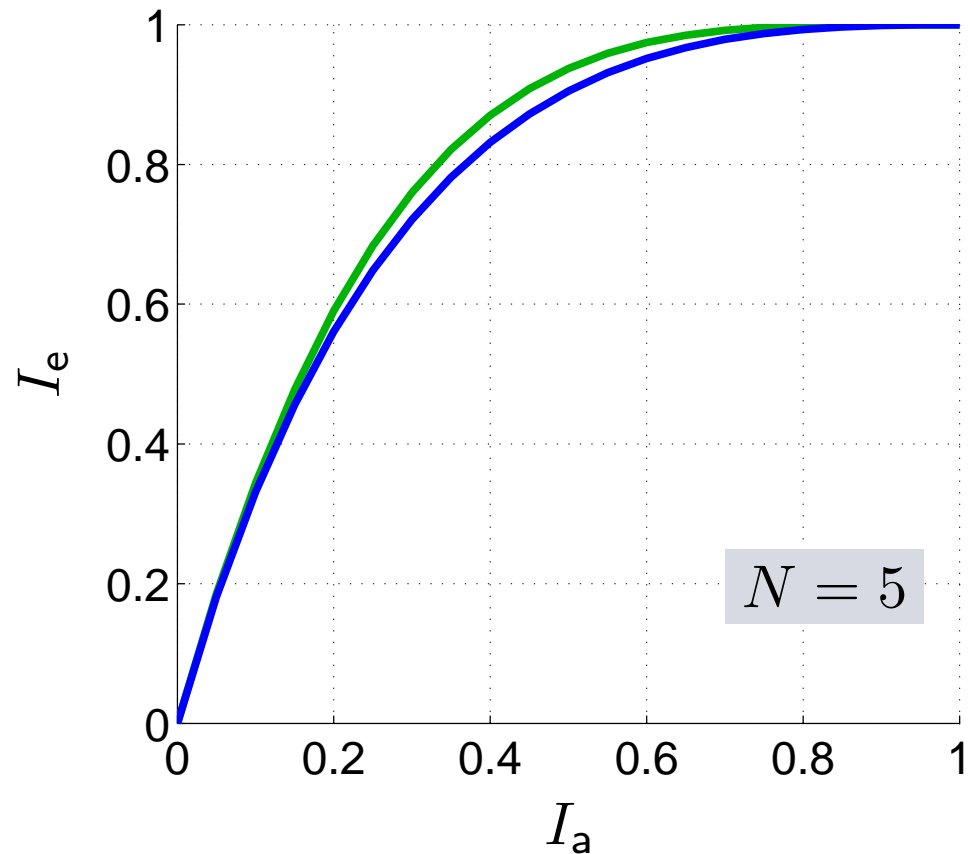
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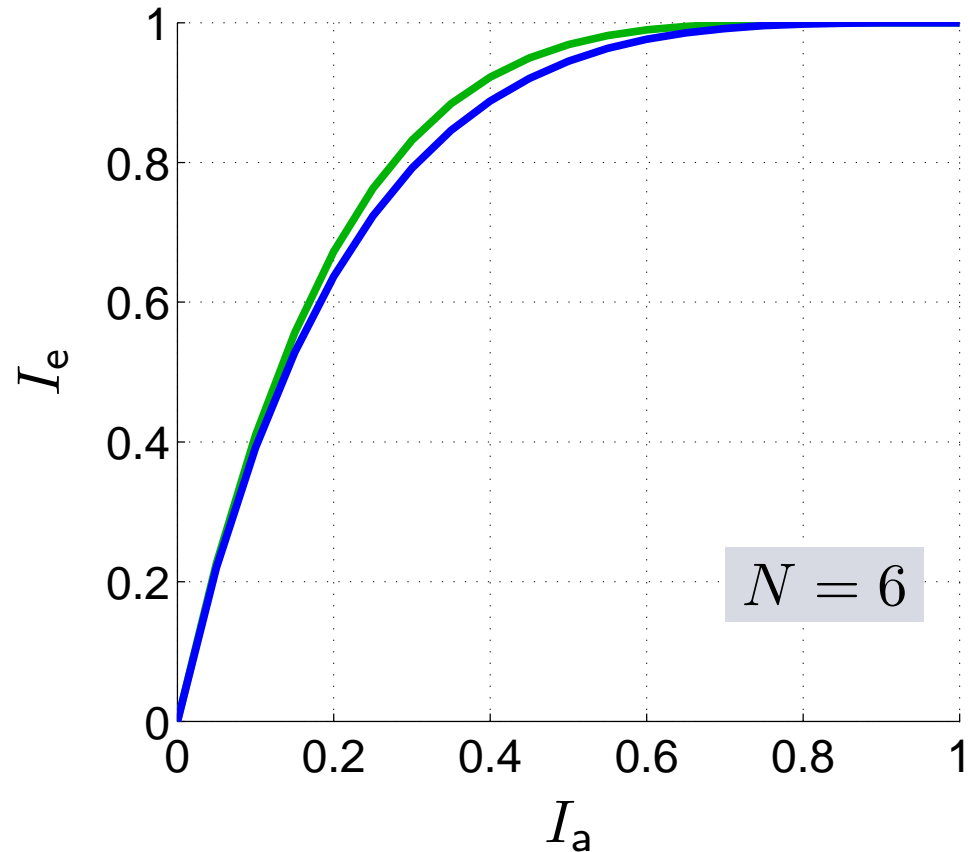
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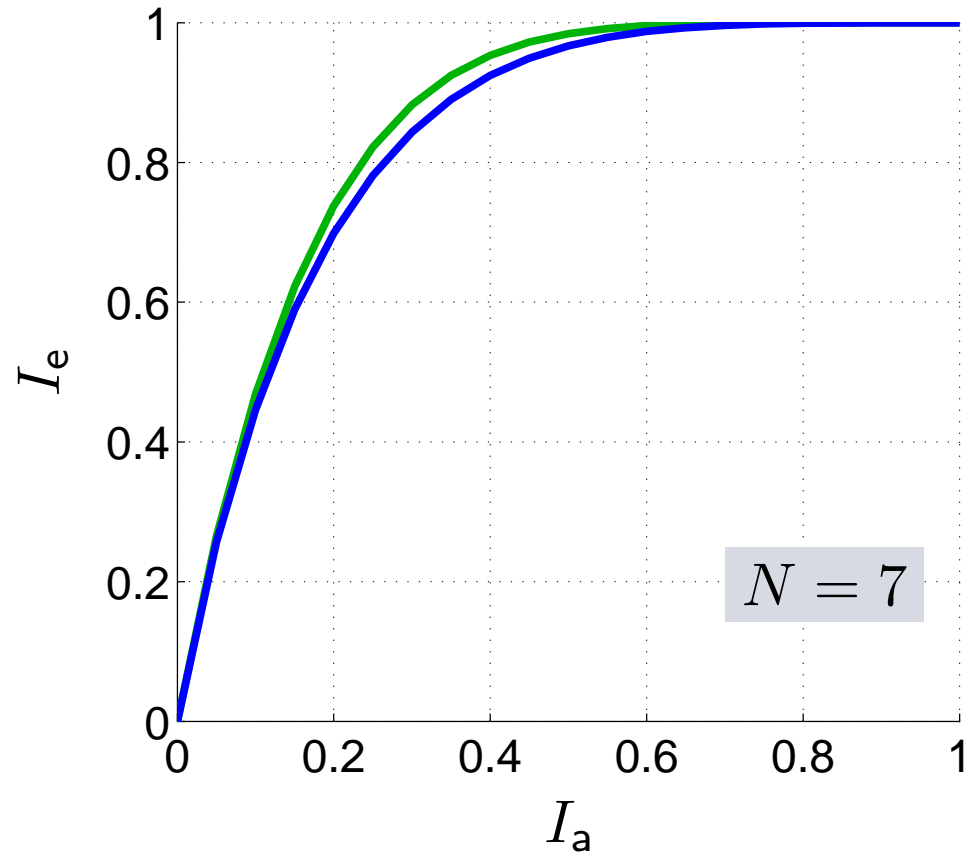
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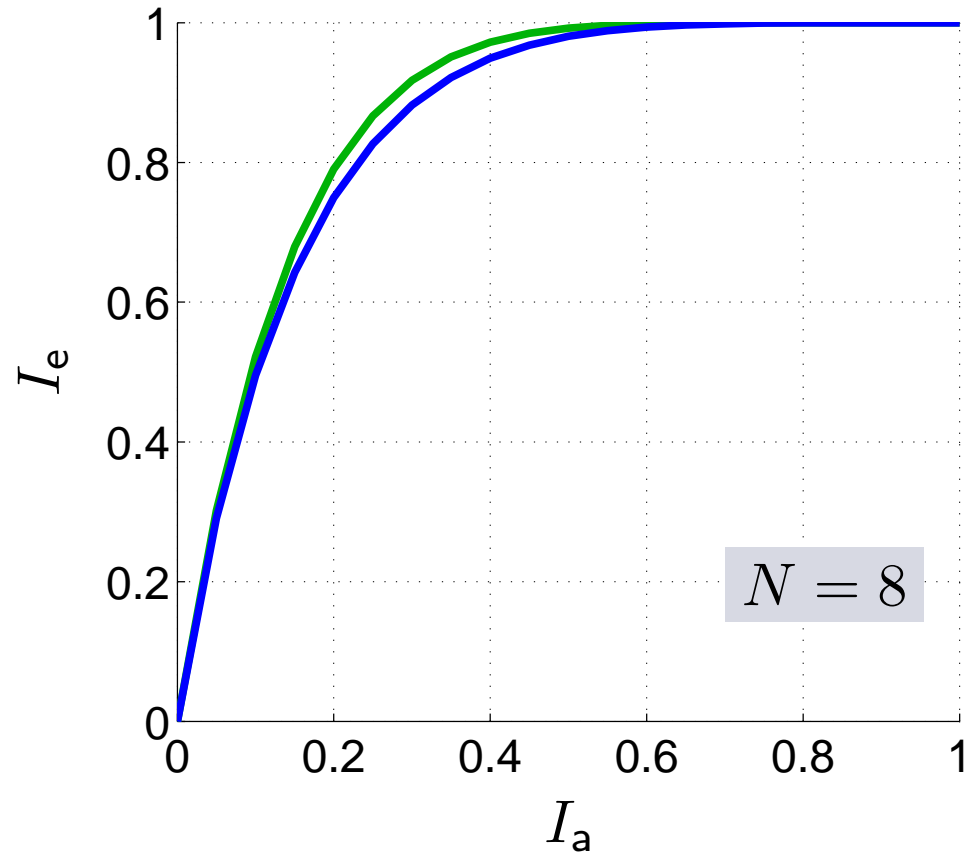
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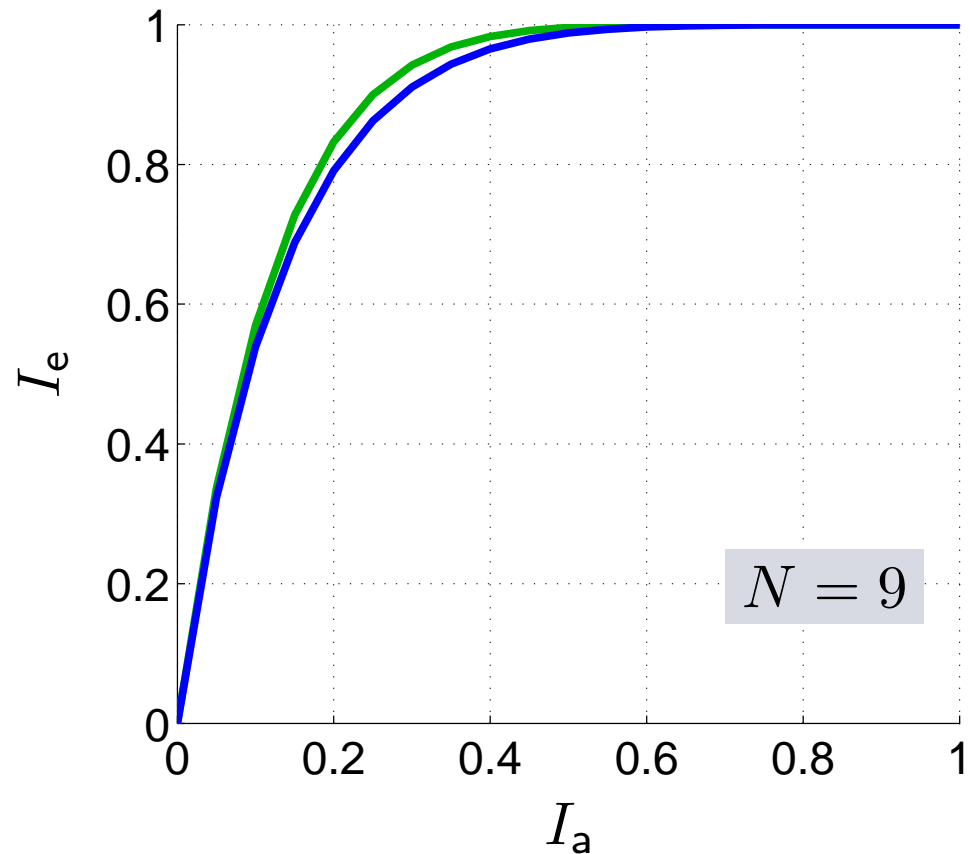
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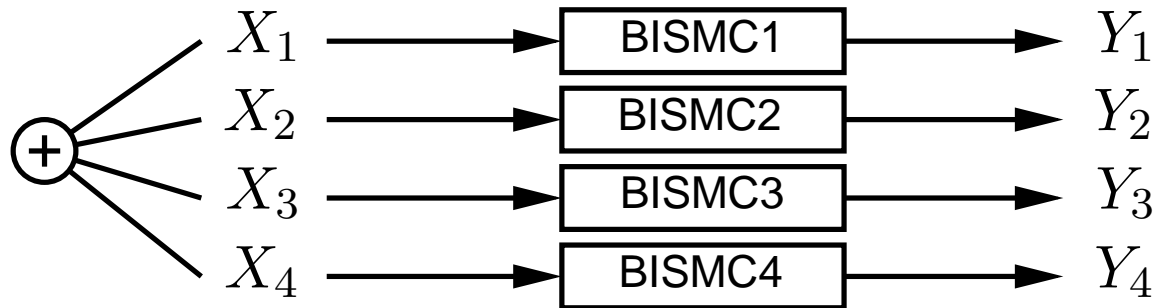
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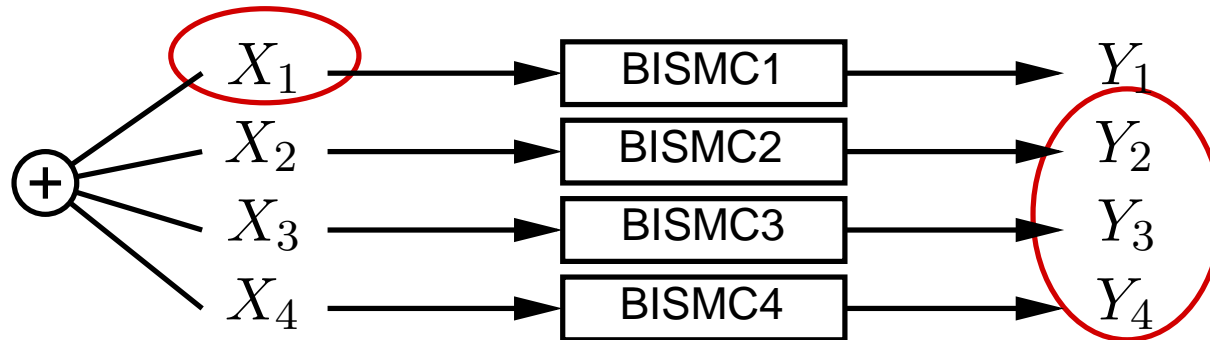
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Single Parity-Check Codes



Single Parity-Check Codes



- **Given:**

Mutual informations of the component channels

$$I_n := I(X_n; Y_n), \quad n = 1, 2, 3, 4$$

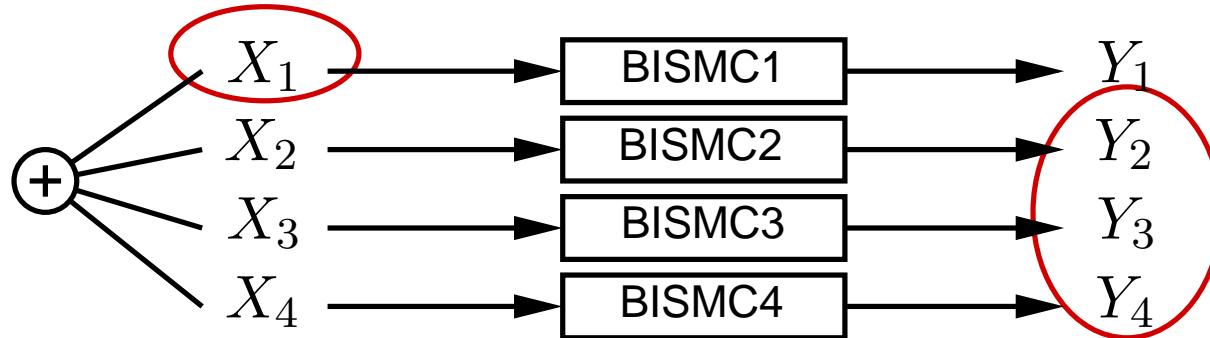
- **Wanted:**

Bounds on the extrinsic mutual information

$$I_{e,1} := I(X_1; Y_2 Y_3 Y_4)$$

(similarly for X_2 , X_3)

Single Parity-Check Codes



● Solution:

$$\underbrace{I_2 \cdot I_3 \cdot I_4}_{\text{only BECs}} \leq I_{e,1} \leq \underbrace{f_3^{\text{ser}}(I_2, I_3, I_4)}_{\text{only BSCs}}$$

Single Parity-Check Codes: EXIT Functions

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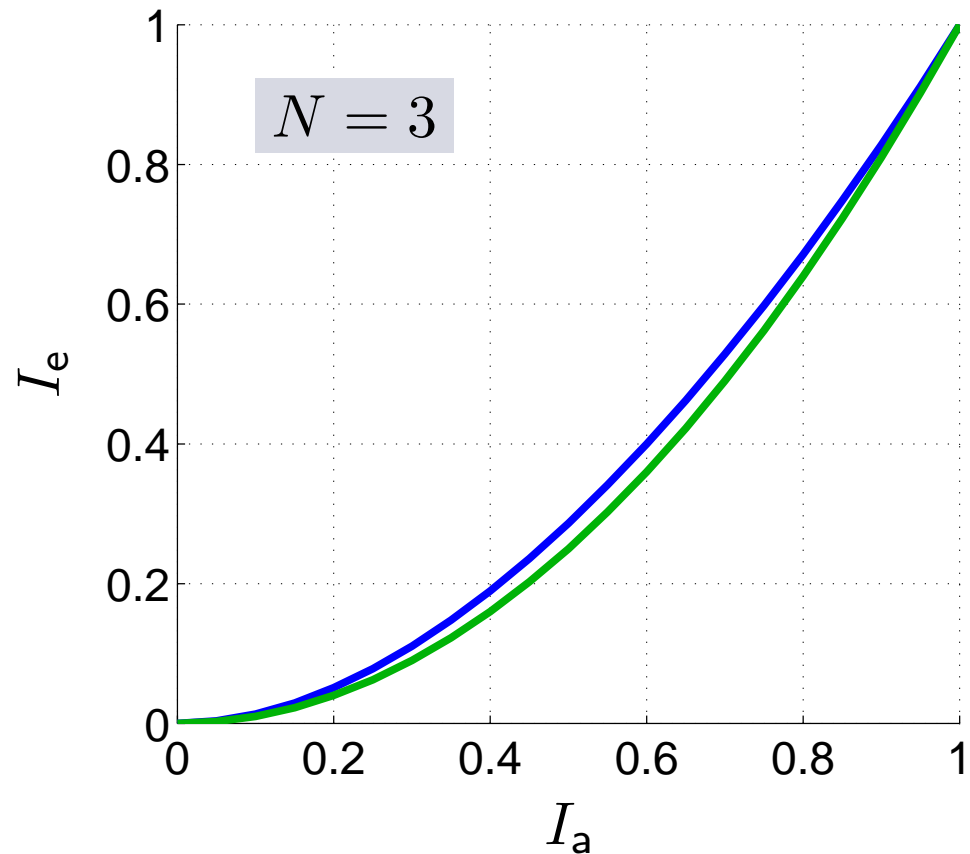
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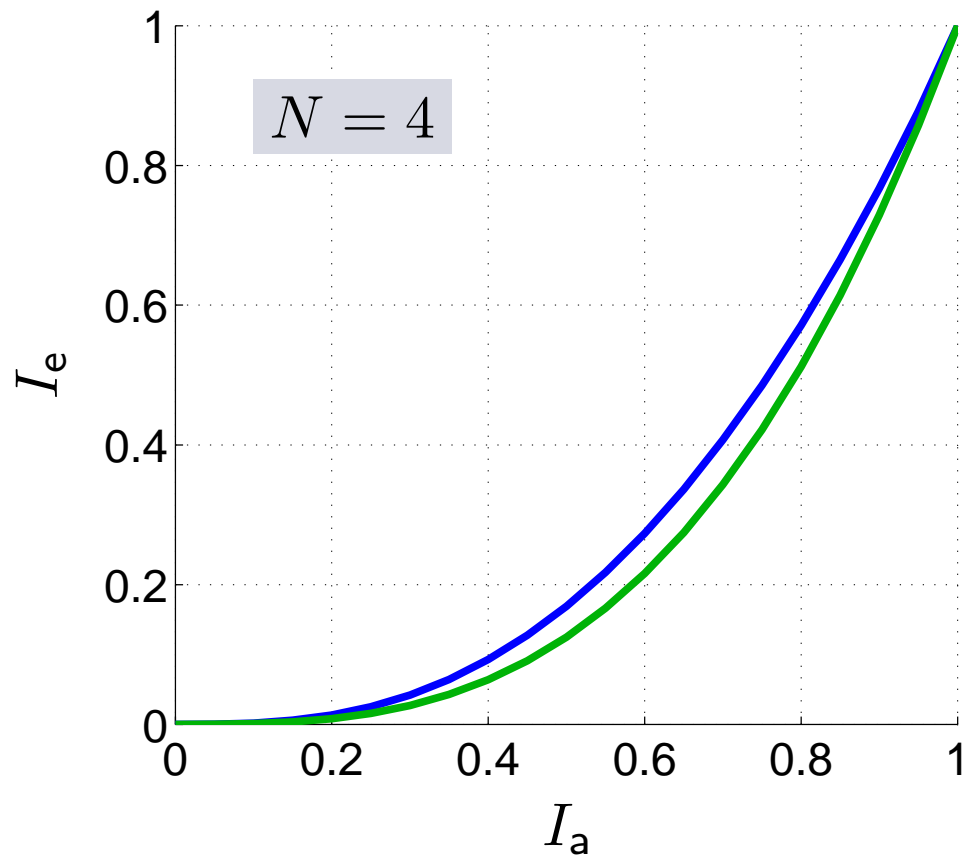
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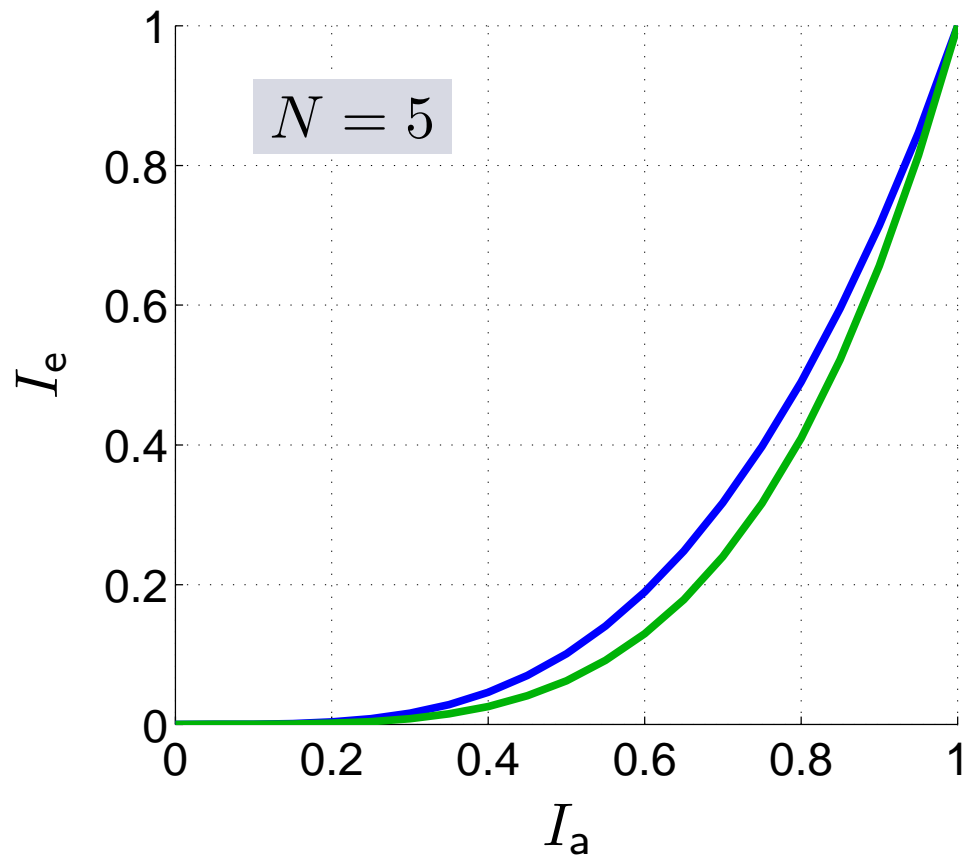
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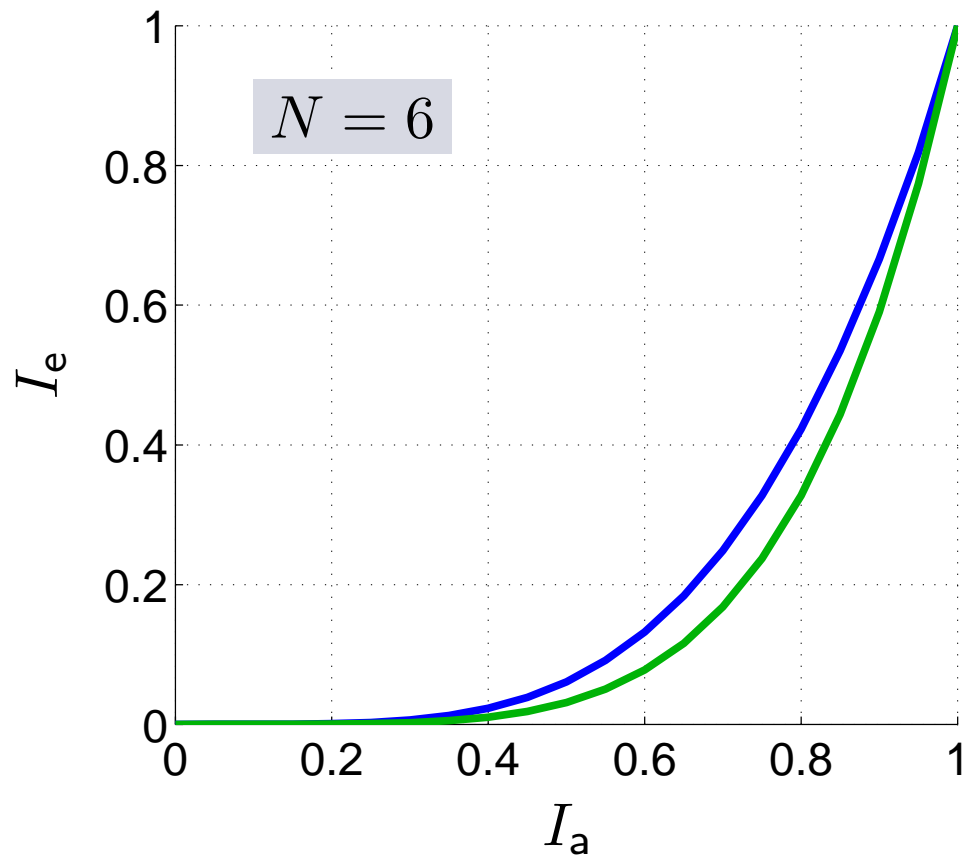
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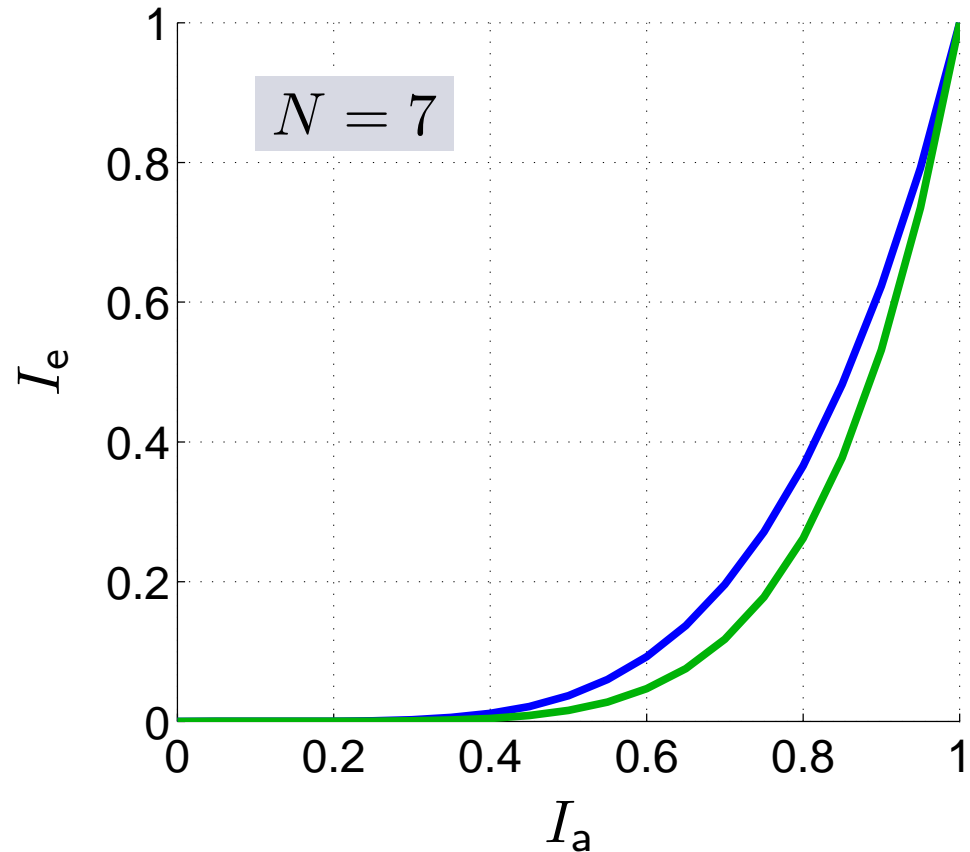
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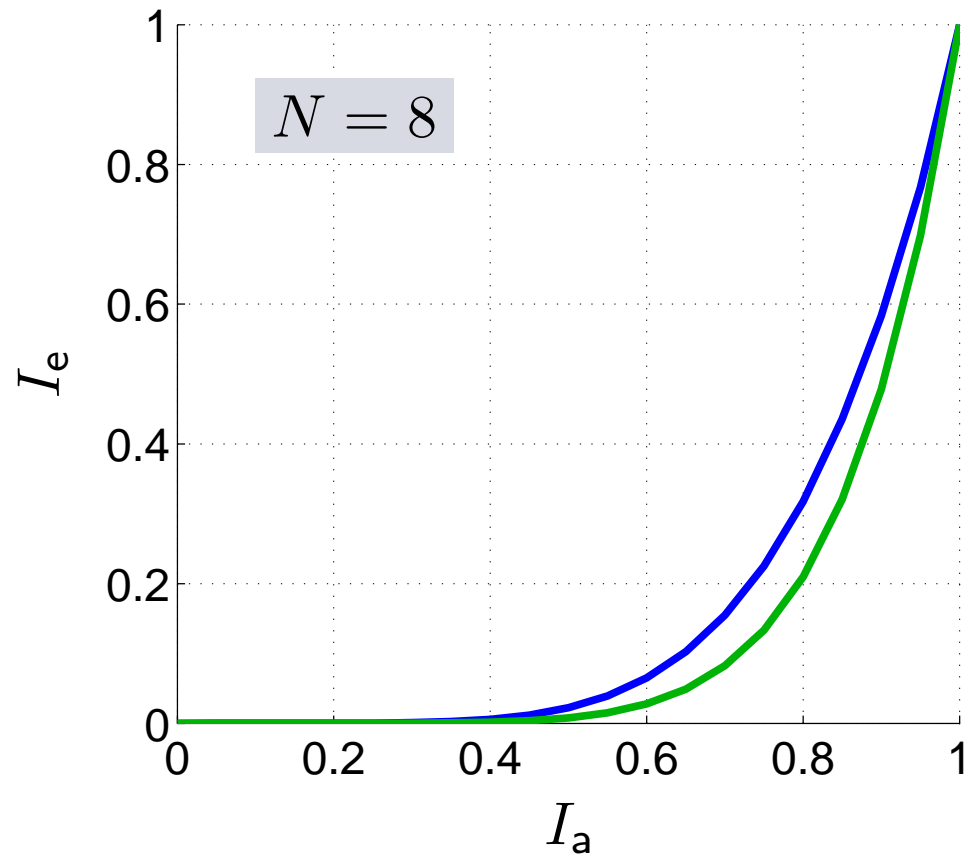
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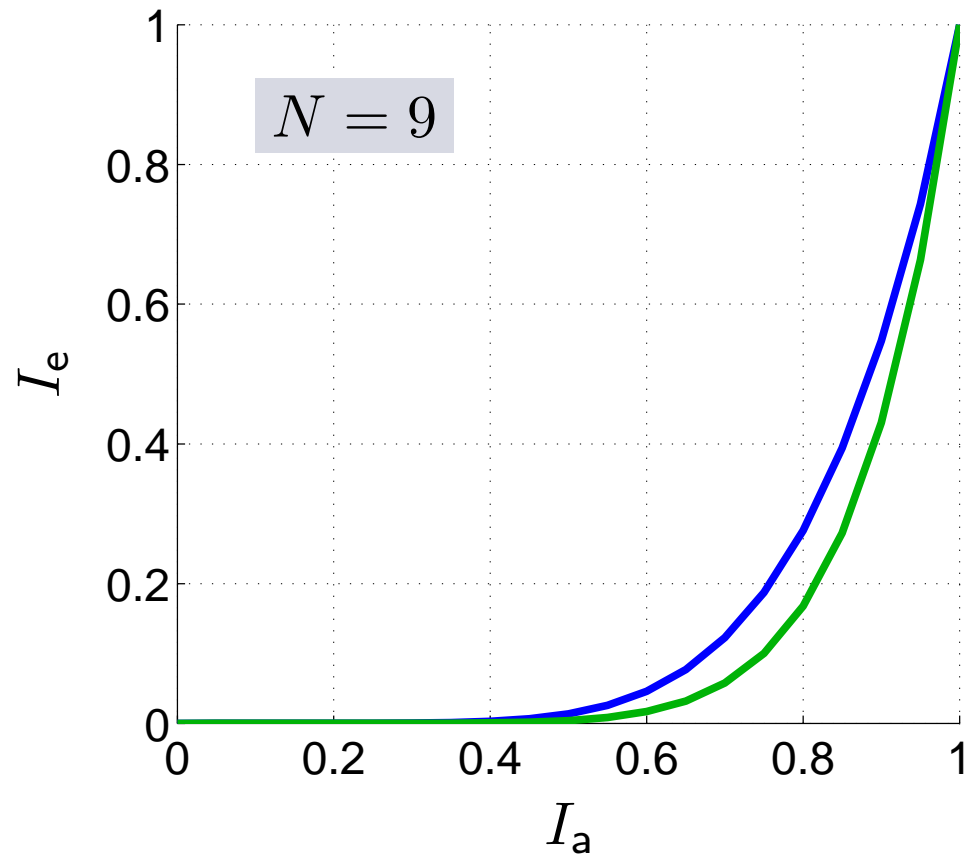
Single Parity-Check Codes: EXIT Functions

- Code length N
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 $I_n := I_a \quad \forall n$
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 $I_e := \frac{1}{N} \sum_{n=1}^N I_{e,n}$
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- **BSCs**, **BECs**

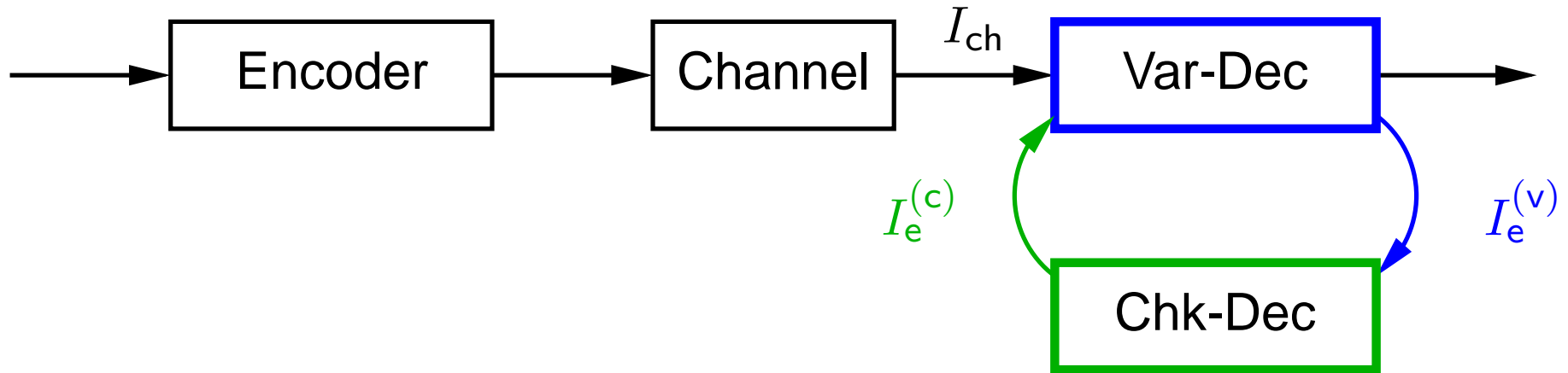


Single Parity-Check Codes: EXIT Functions

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EXIT Functions for LDPC Codes (Reviewed)



- Variable-Node EXIT-Function

$$I_e^{(c)} \mapsto I_e^{(v)} \quad (\text{Parameter: } I_{ch})$$

- Check-Node EXIT-Function

$$I_e^{(v)} \mapsto I_e^{(c)}$$

- Computation of EXIT functions based on specific model for the virtual extrinsic (a-priori) channel

EXIT-Charts (Reviewed)

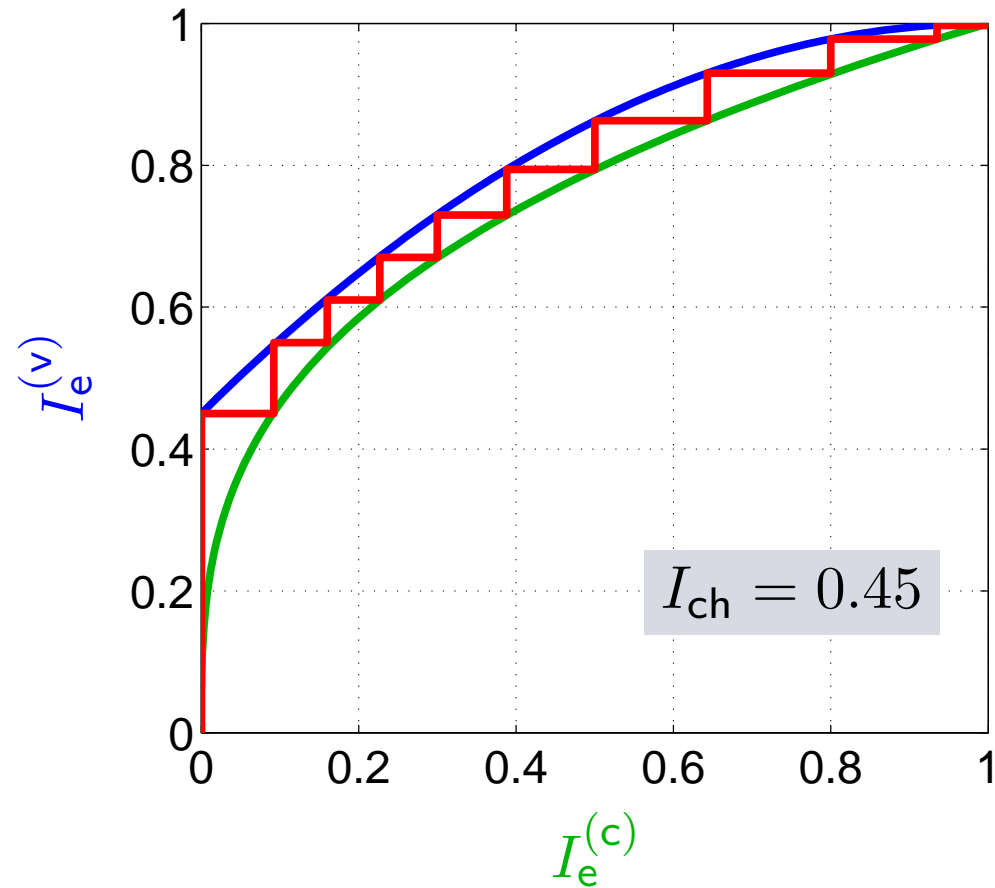
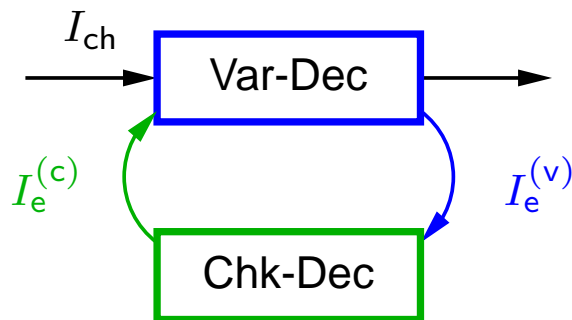
- Regular LDPC code

$$d^{(v)} = 3$$

$$d^{(c)} = 4$$

$$R = 1/4$$

- Iterative decoder:



- error free decoding guaranteed

EXIT-Charts (Reviewed)

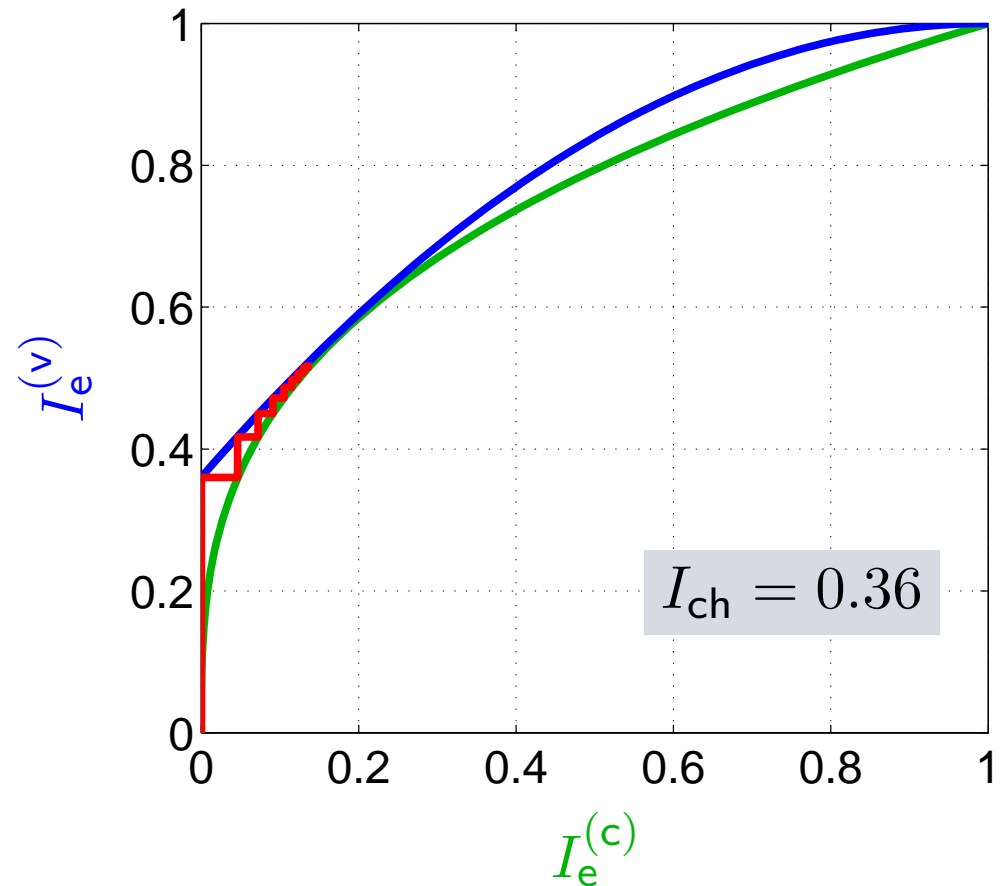
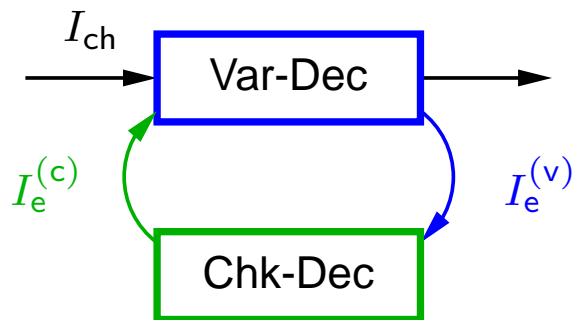
- Regular LDPC code

$$d^{(v)} = 3$$

$$d^{(c)} = 4$$

$$R = 1/4$$

- Iterative decoder:



- error free decoding impossible

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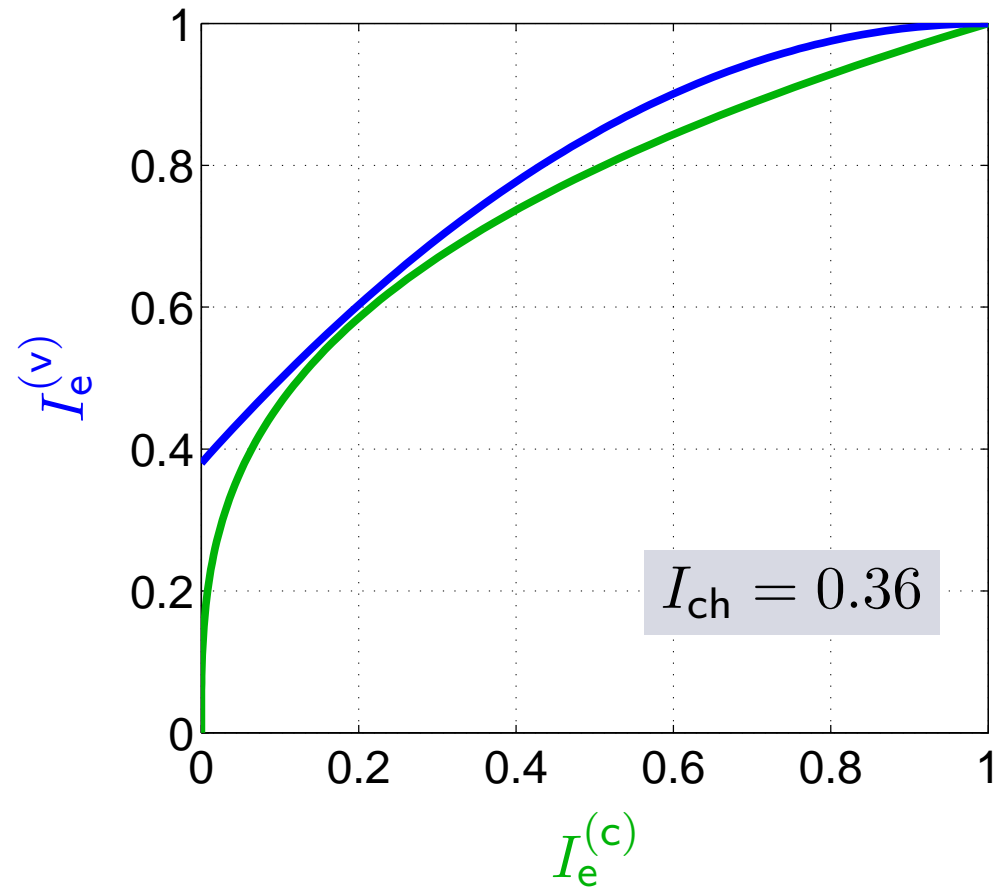
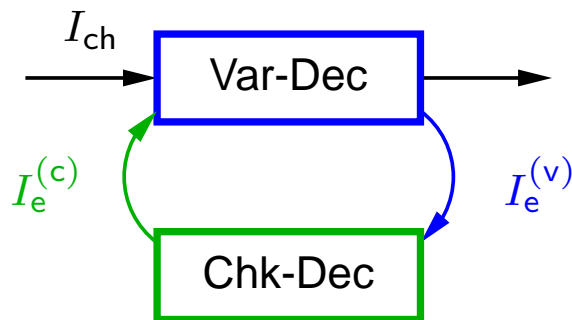
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- decoding threshold

Bounds on EXIT Functions

EXIT functions are computed based on a specific model for the virtual extrinsic (a-priori) channels

Disadvantage: Decoding threshold is generally not exact

Idea: Use bounds on information combining

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Idea: Use bounds on information combining

Variable-node decoding (bounds for repeat codes)

$$f_{d^{(v)}}^{\text{par}}(I_{\text{ch}}, I_e^{(c)}, \dots, I_e^{(c)}) \leq I_e^{(v)} \leq 1 - (1 - I_{\text{ch}})(1 - I_e^{(c)})^{d^{(v)}-1}$$

Check-node decoding (bounds for SPC codes)

$$(I_e^{(v)})^{d^{(c)}-1} \leq I_e^{(c)} \leq f_{d^{(c)}-1}^{\text{ser}}(I_e^{(v)}, \dots, I_e^{(v)})$$

Bounds on Decoding Threshold

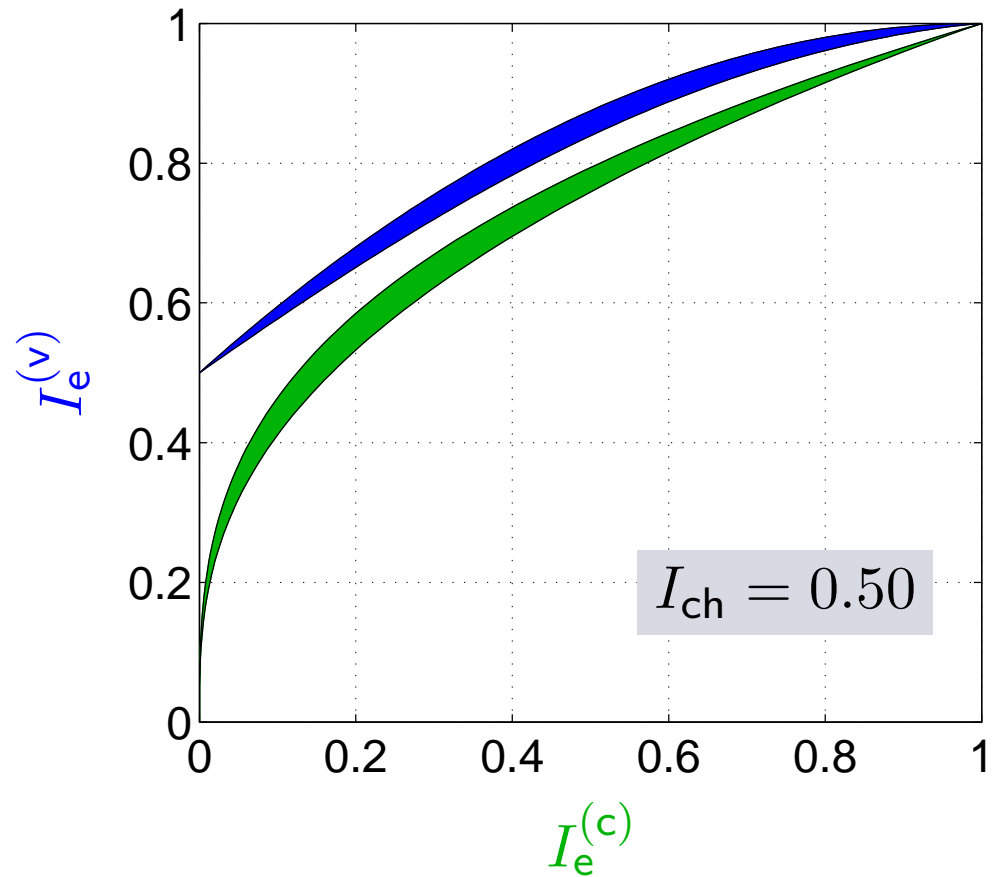
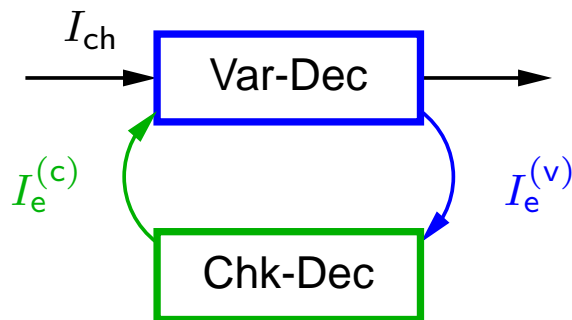
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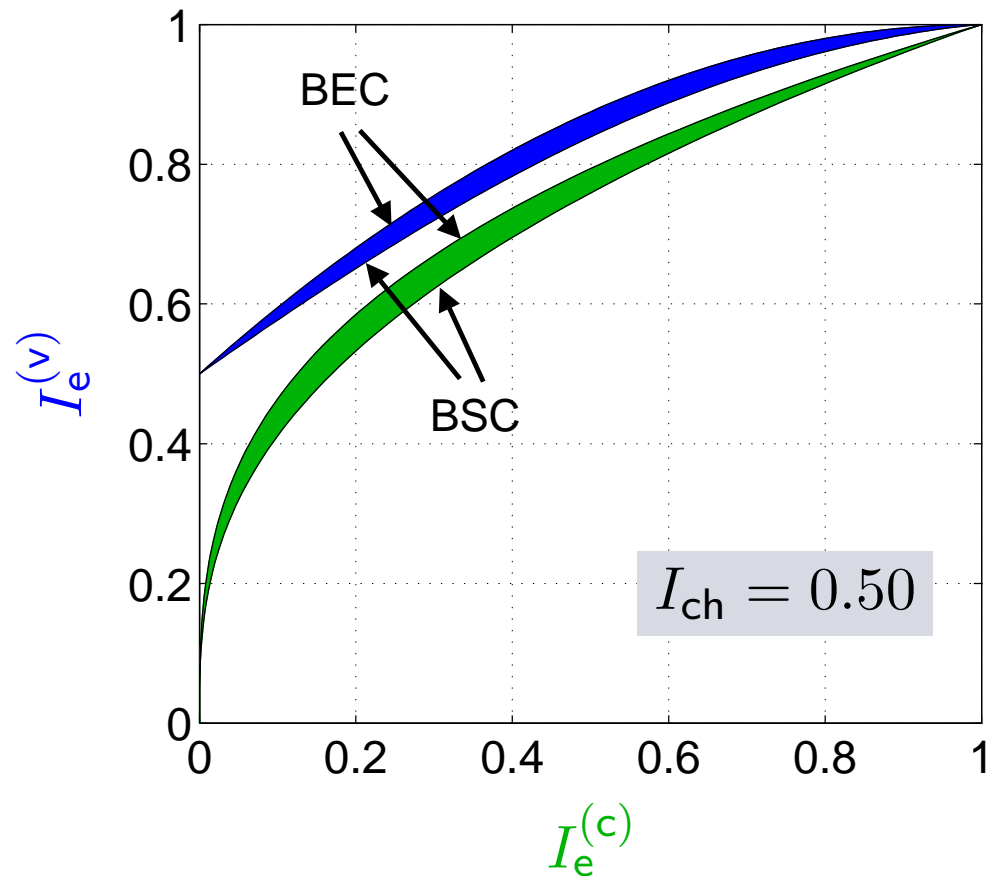
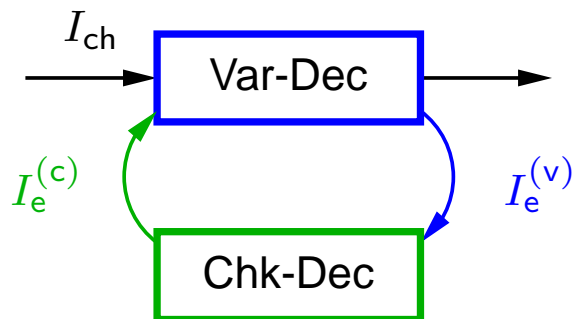
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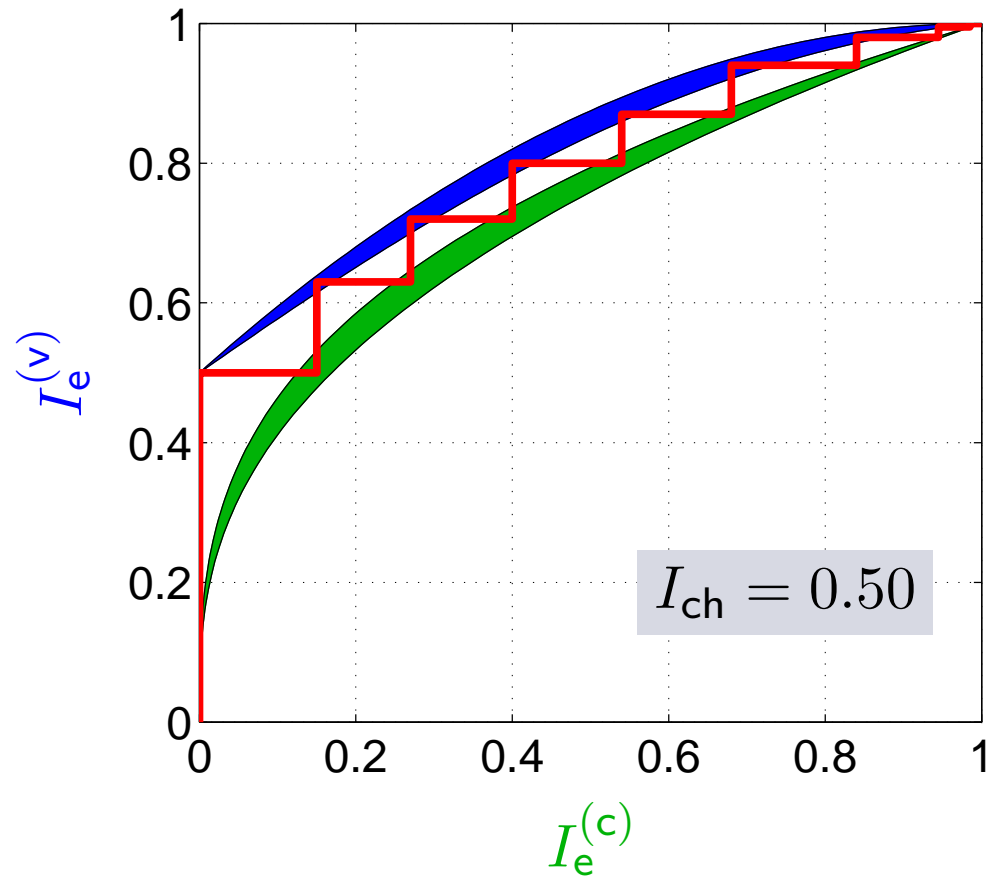
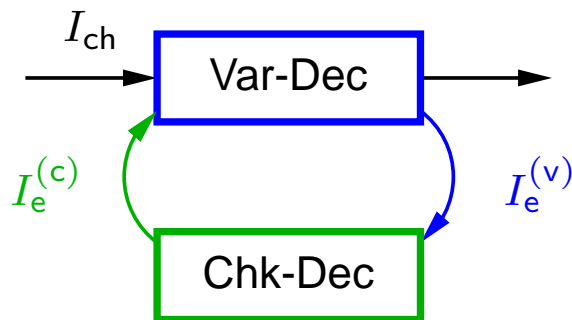
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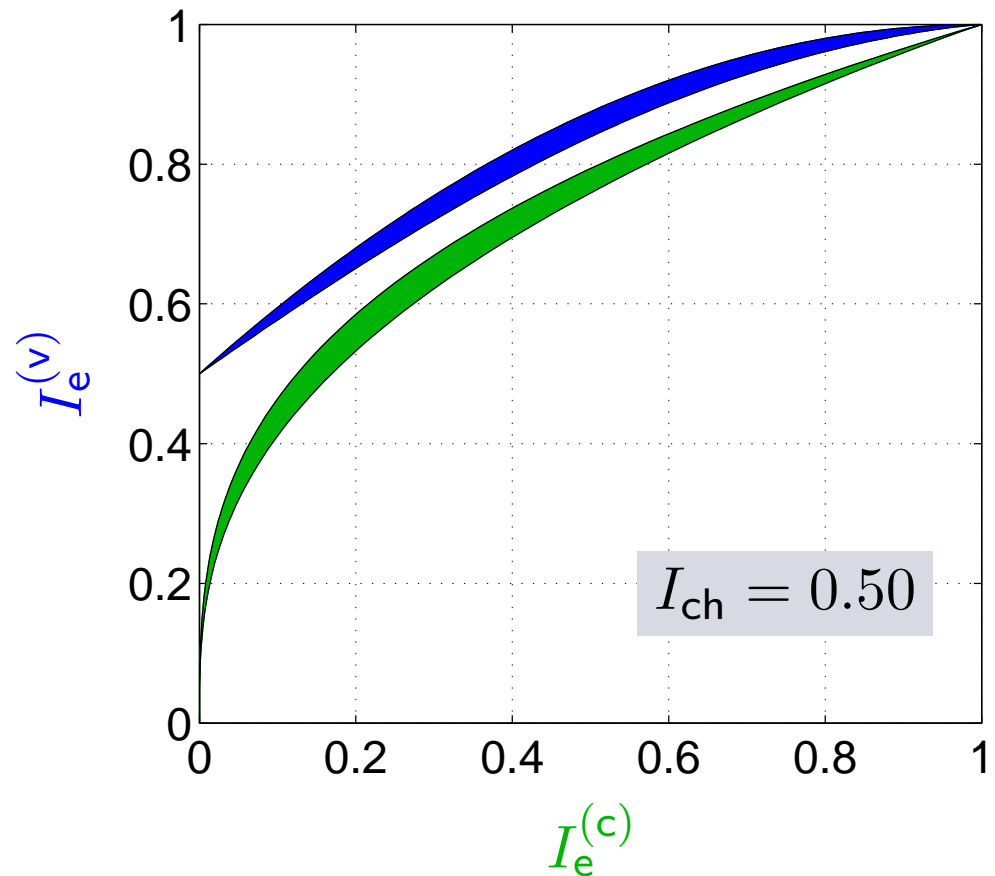
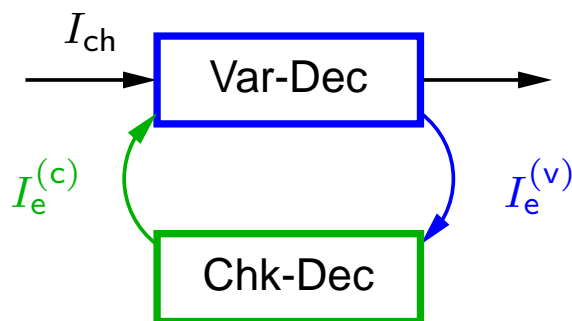
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error-free decoding guaranteed

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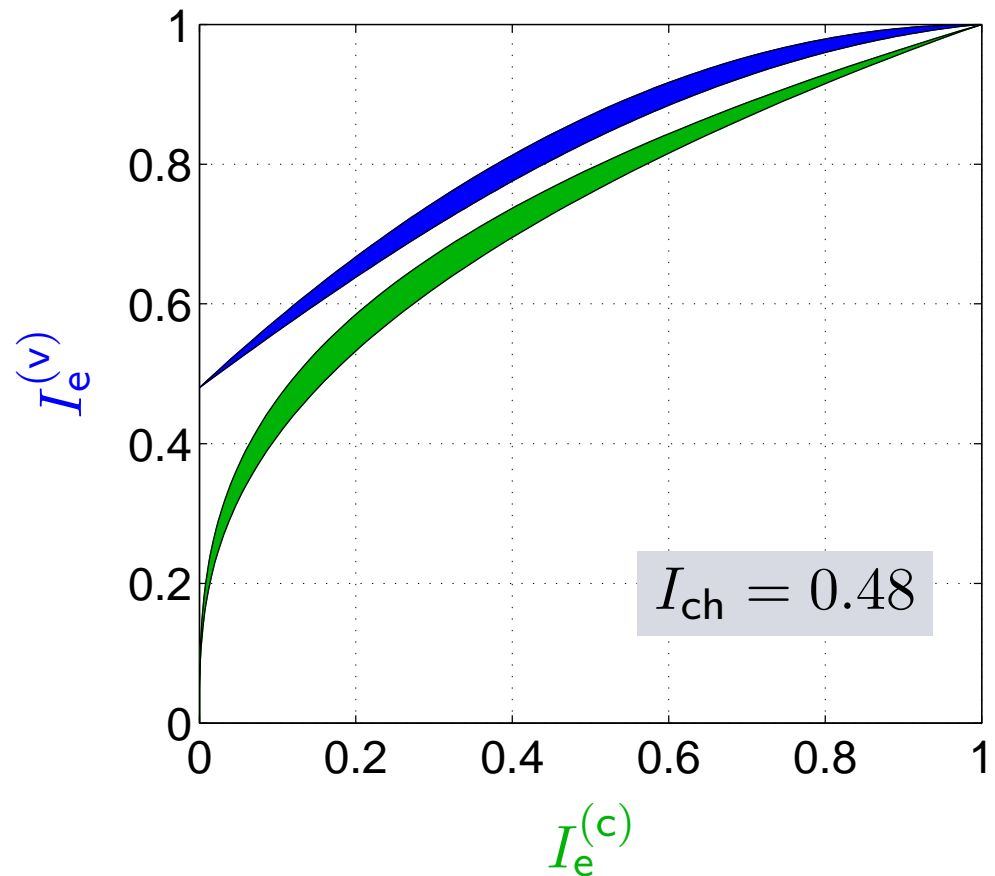
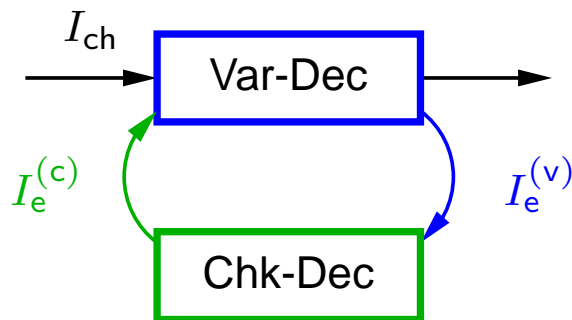
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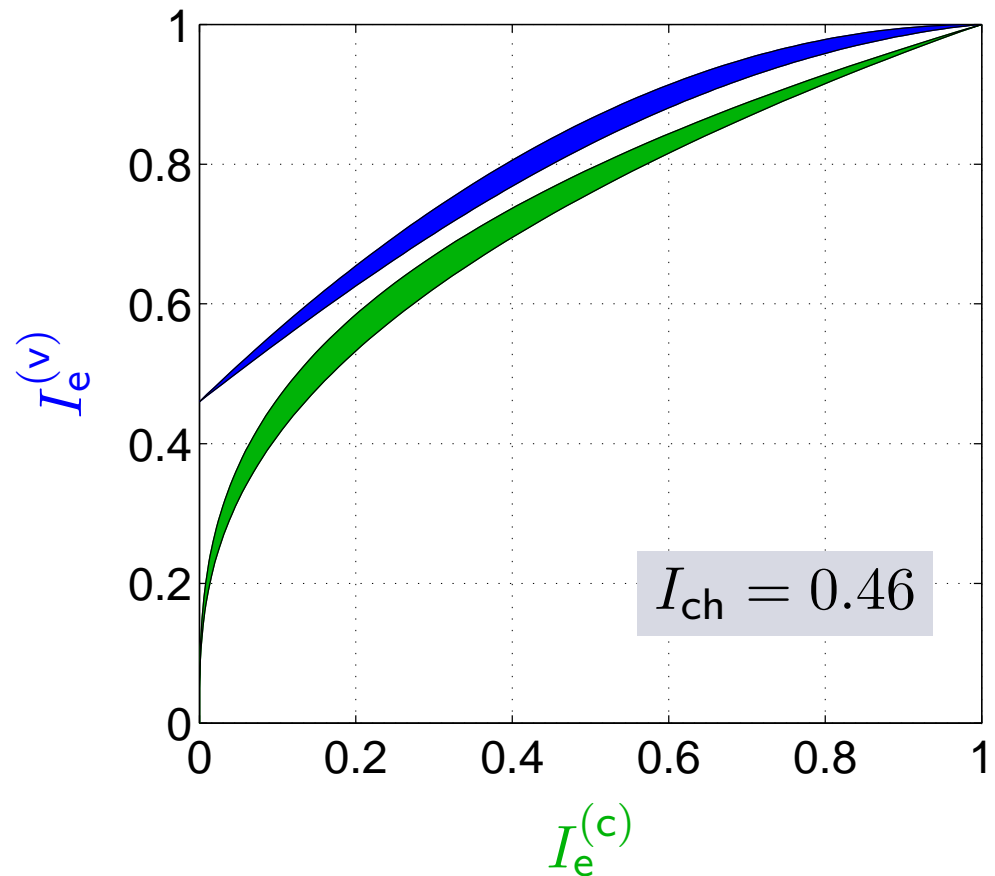
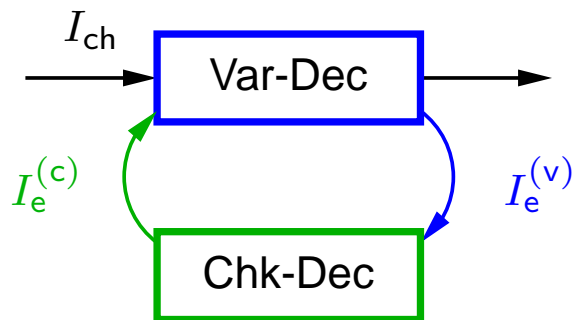
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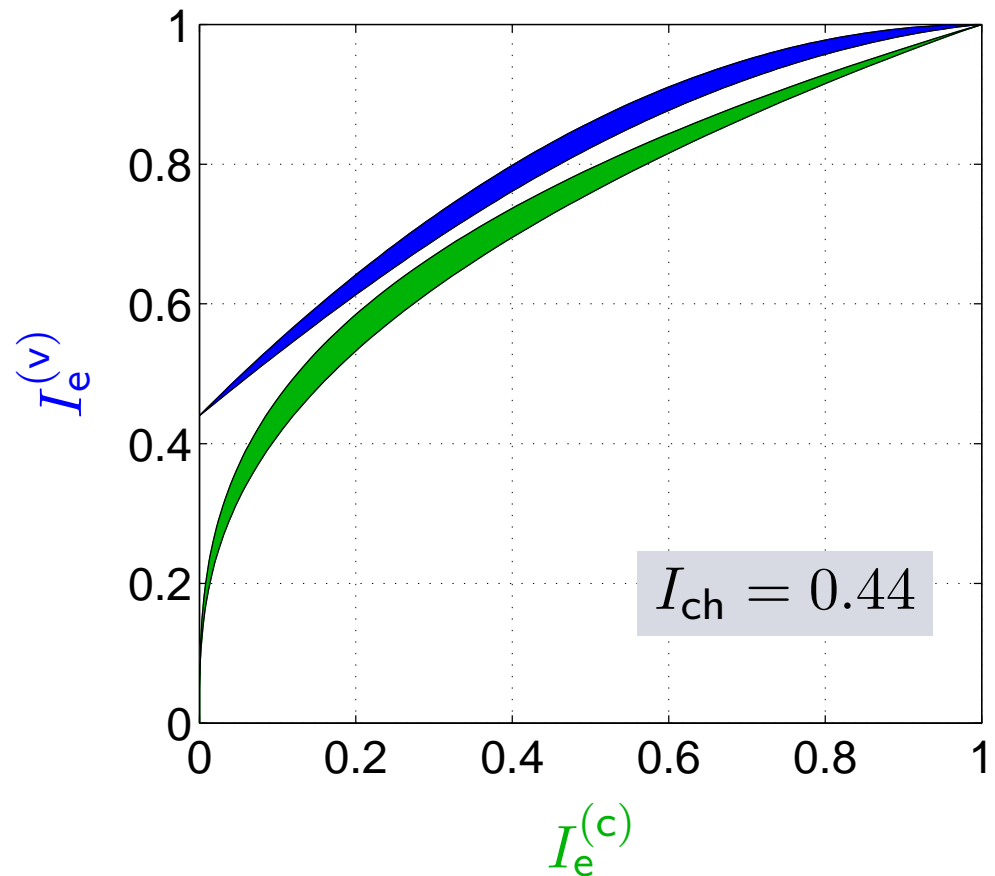
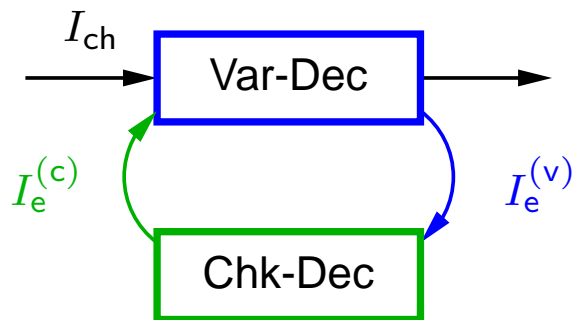
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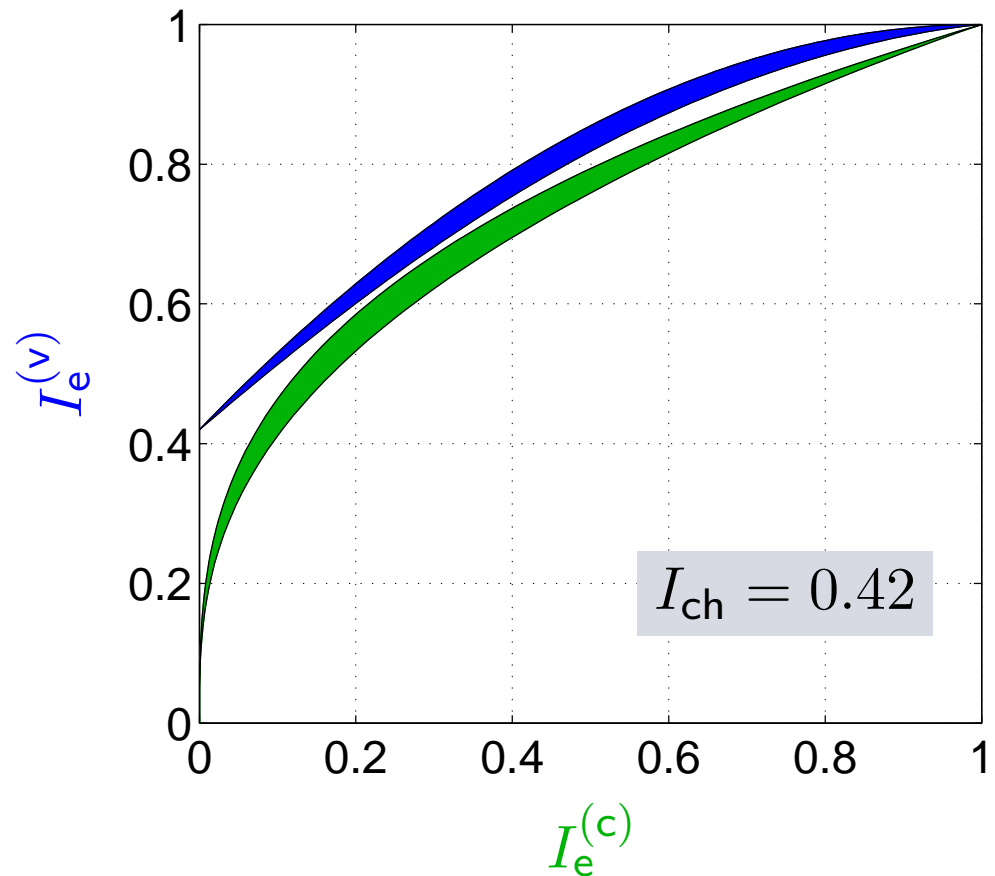
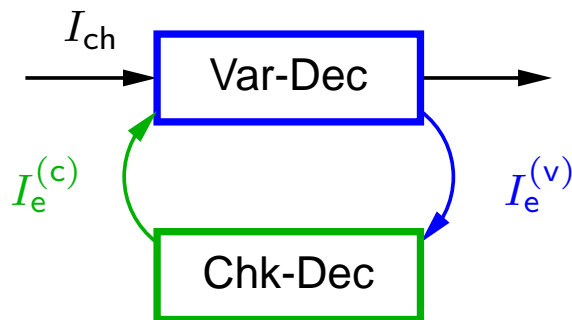
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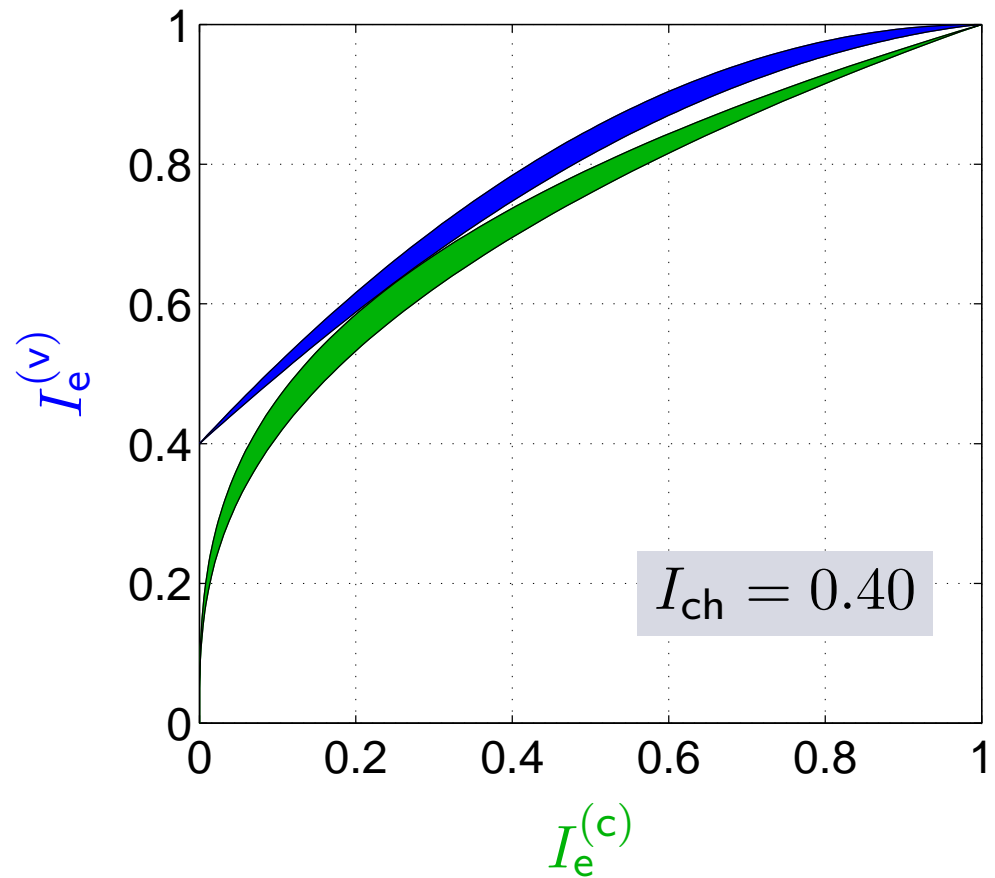
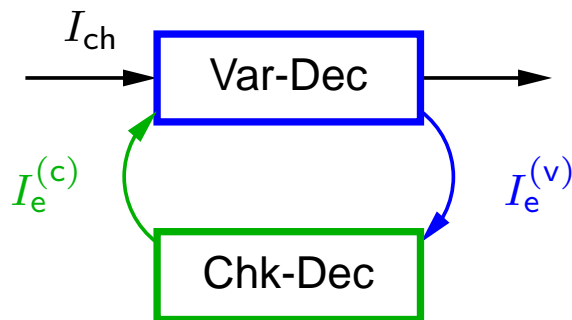
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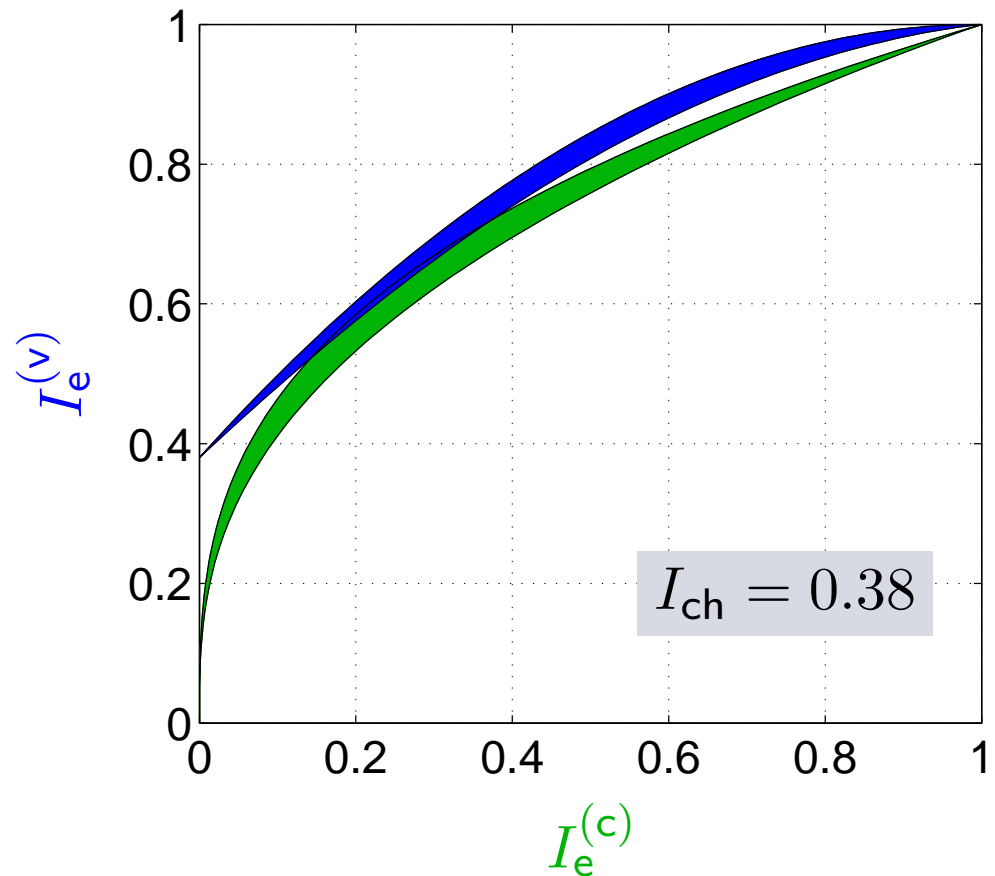
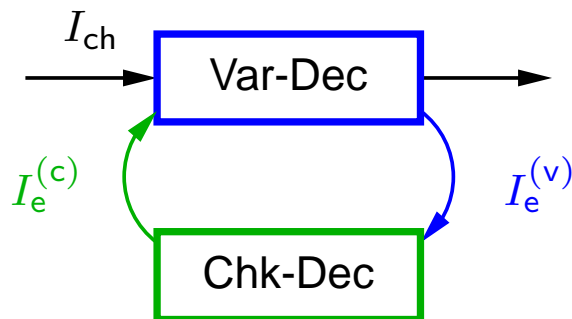
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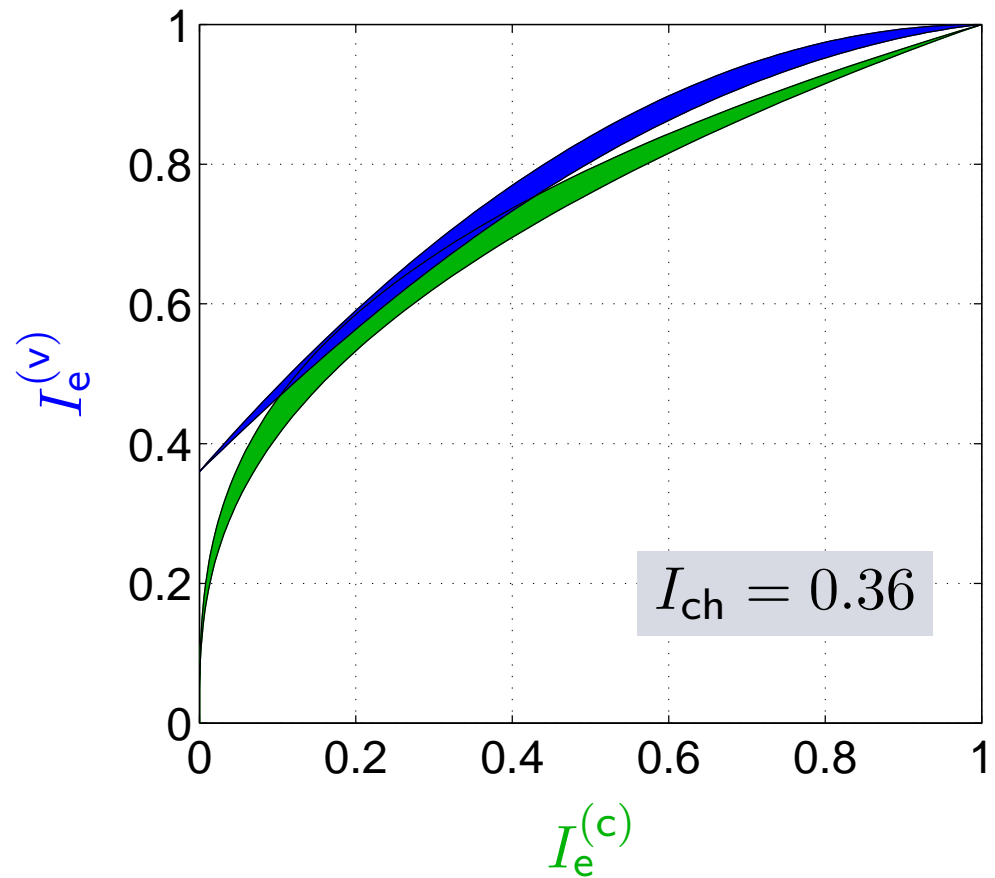
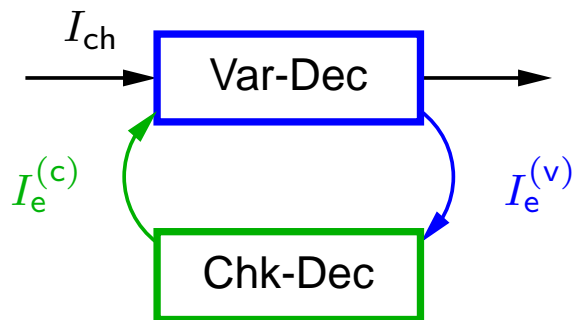
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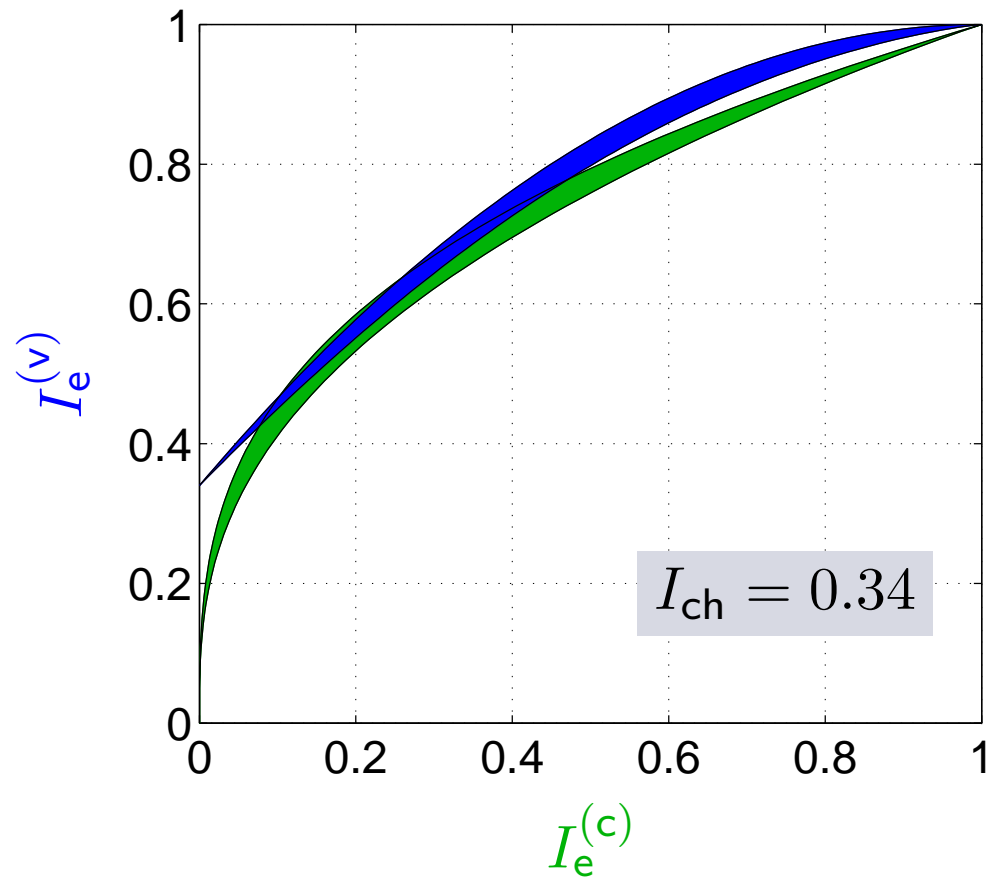
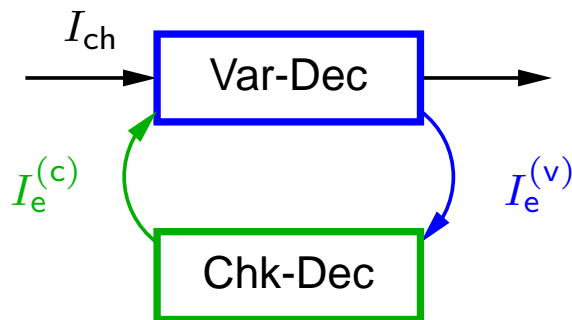
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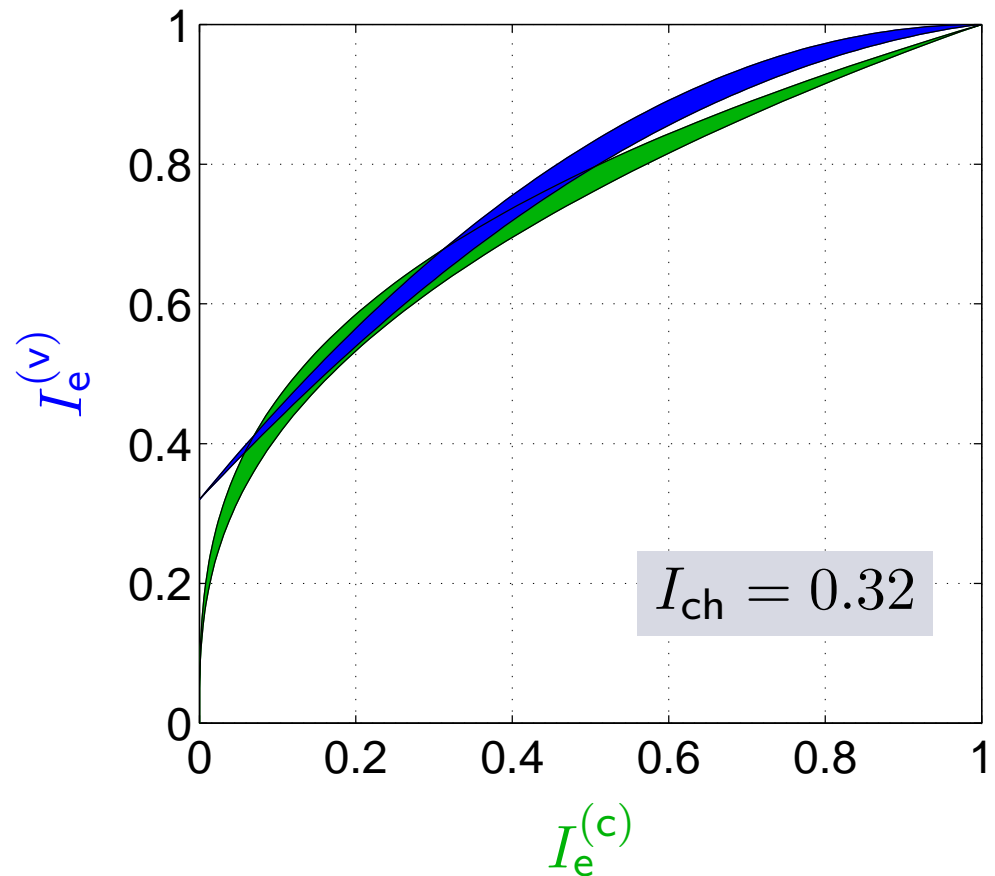
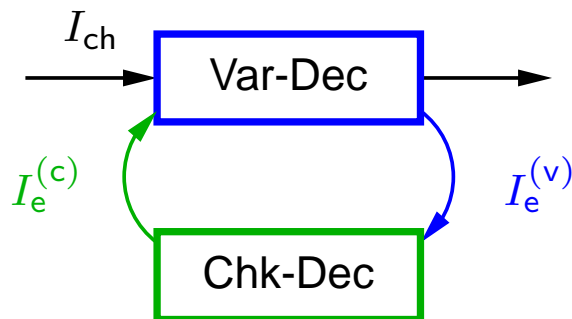
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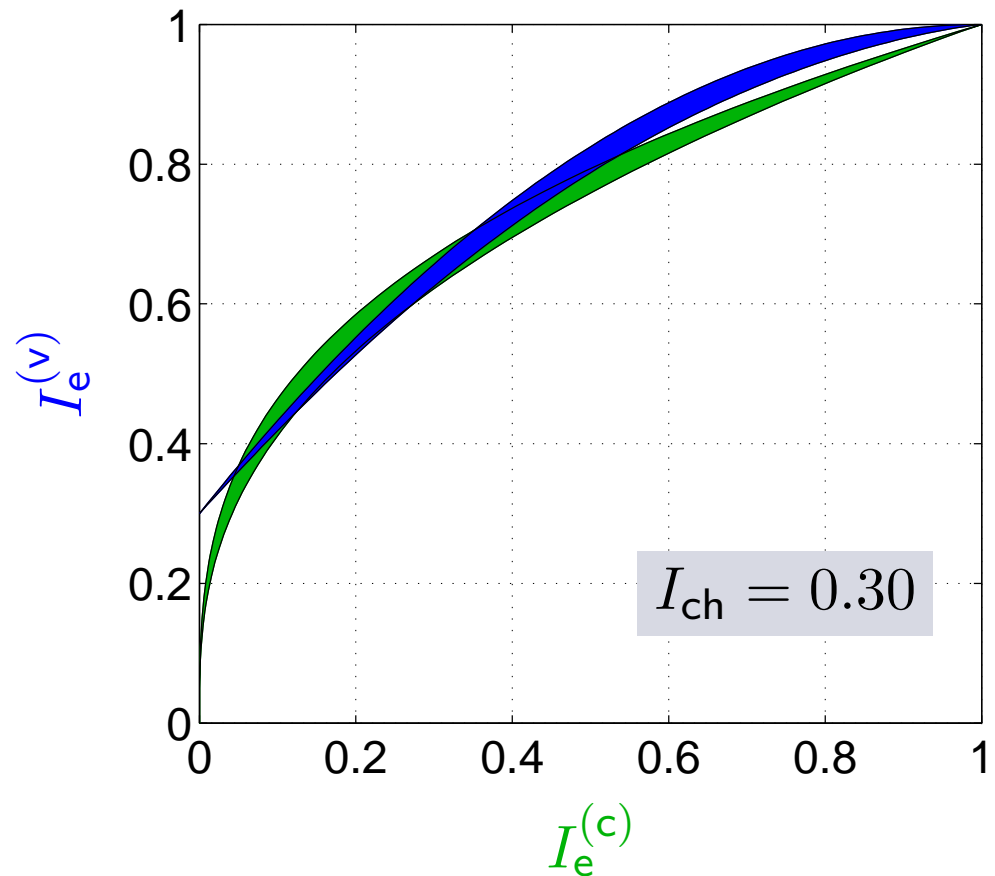
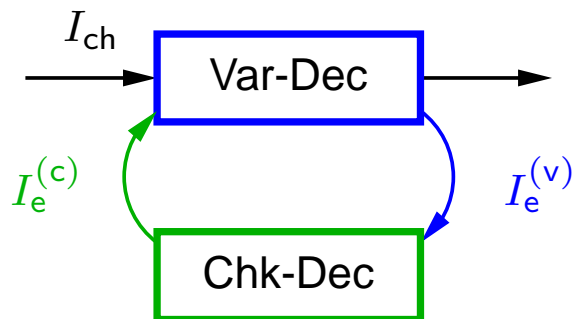
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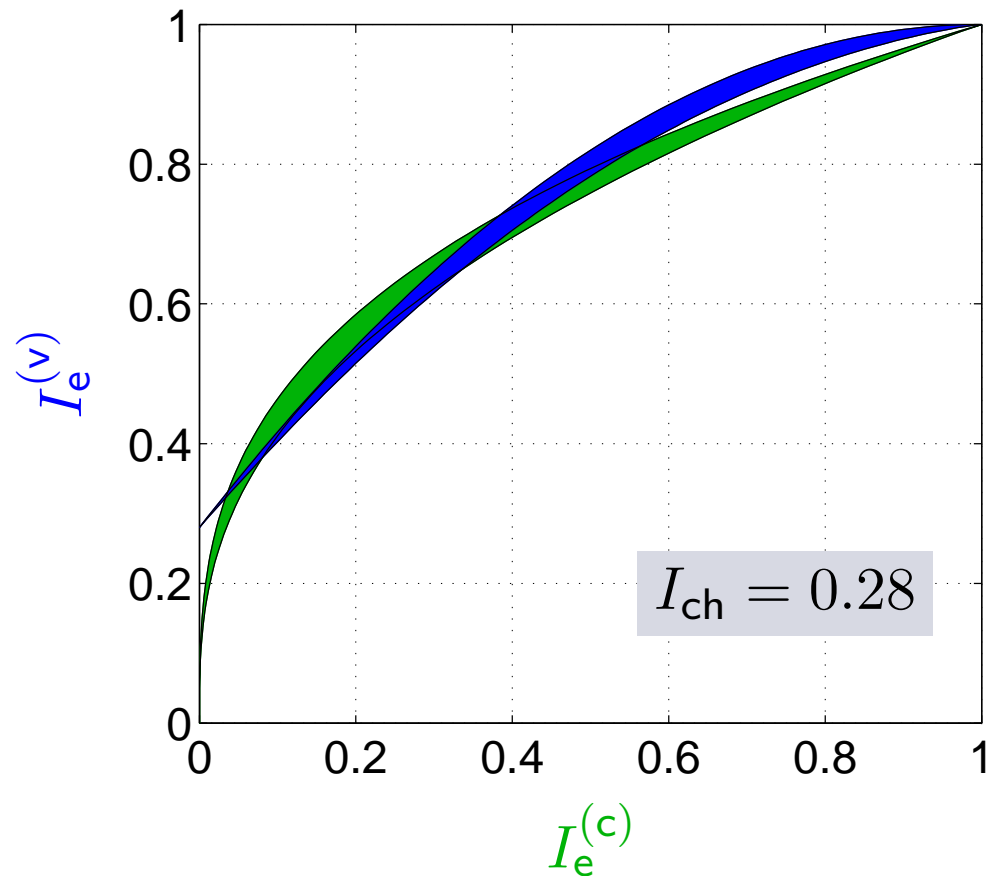
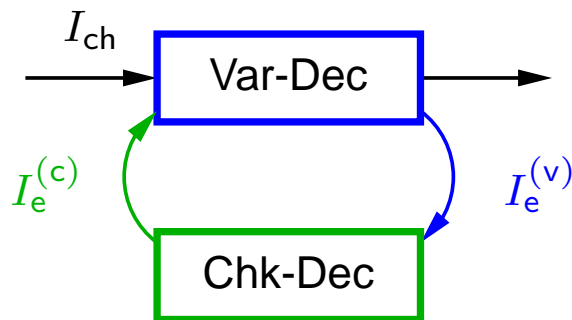
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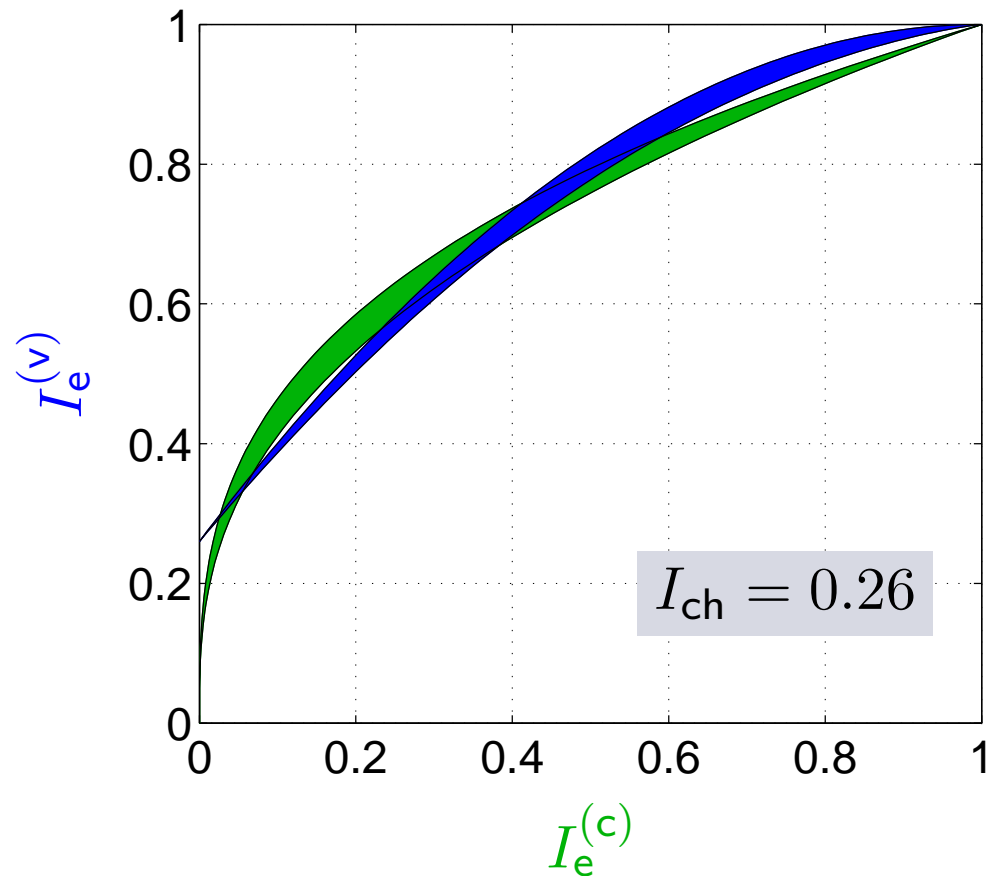
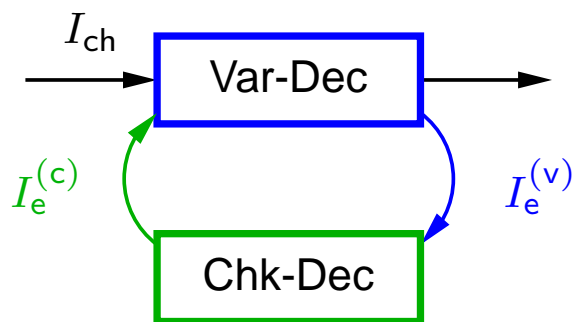
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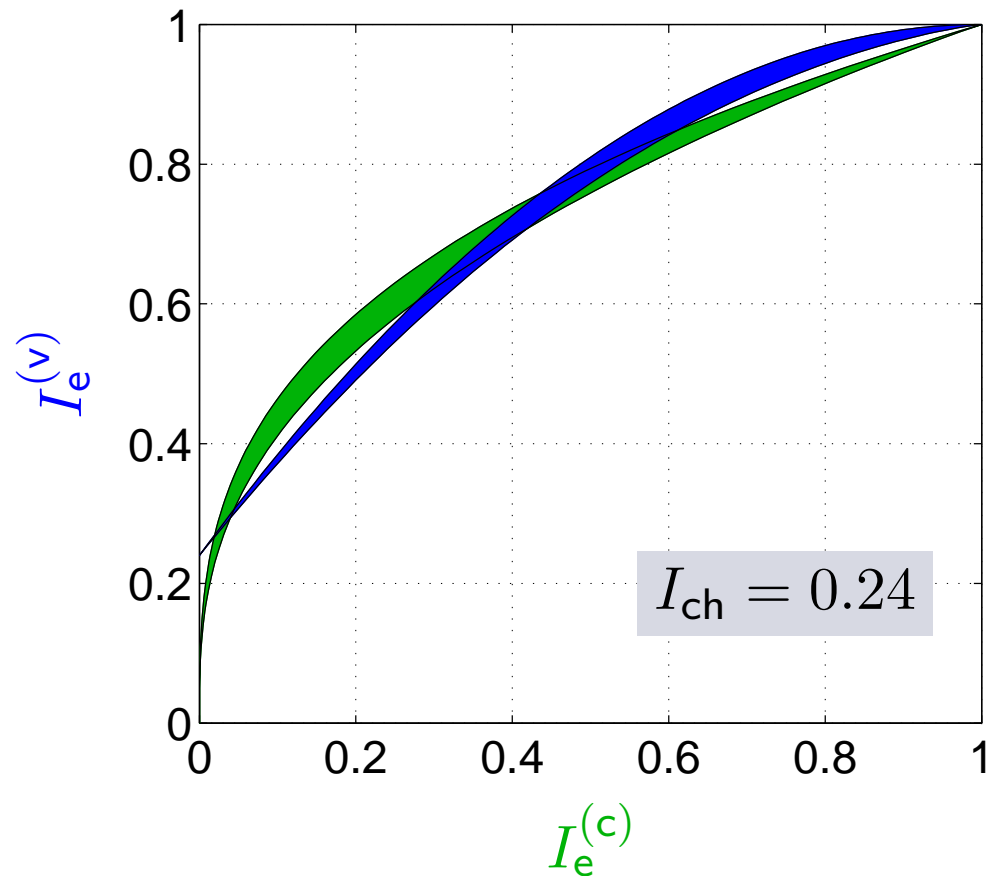
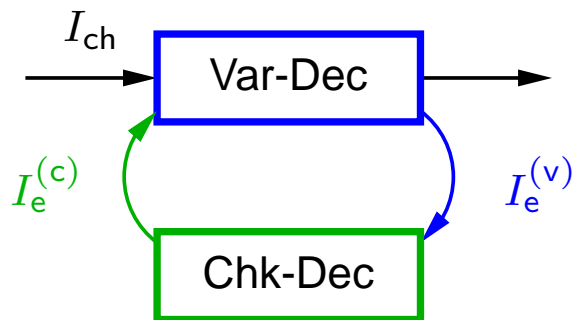
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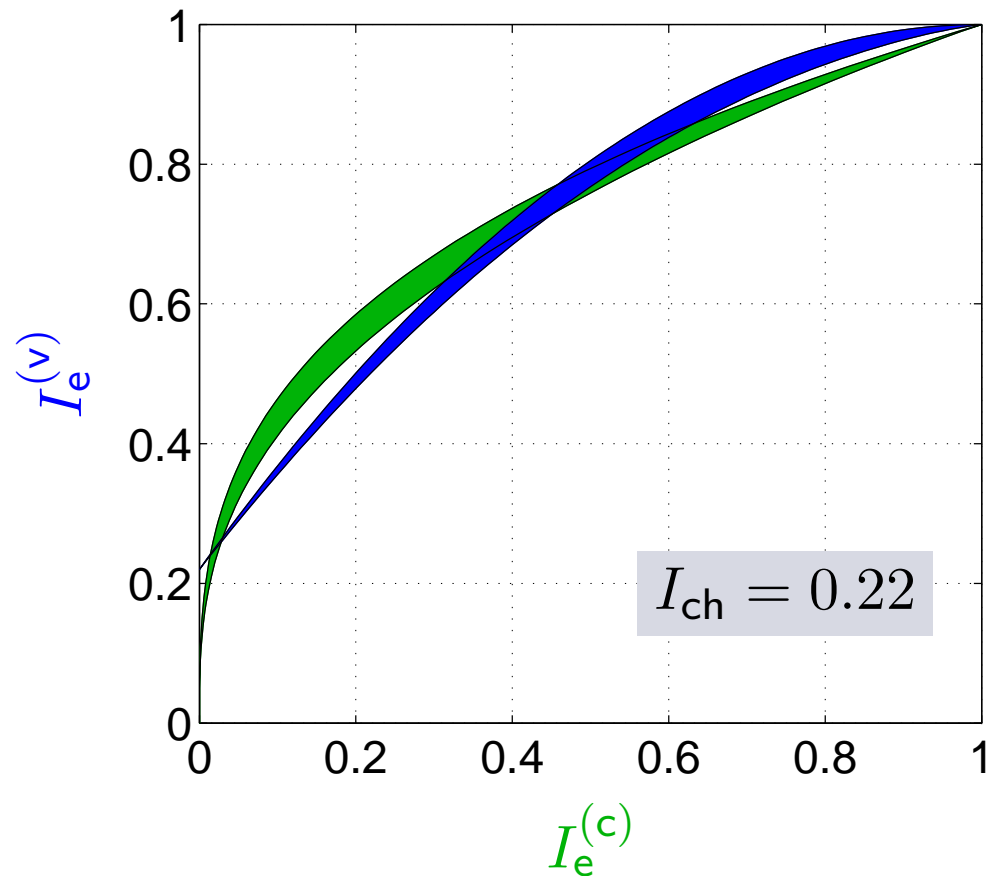
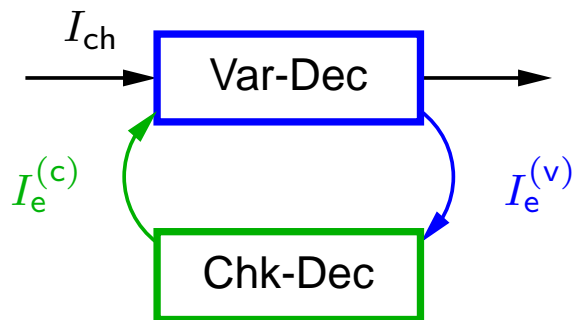
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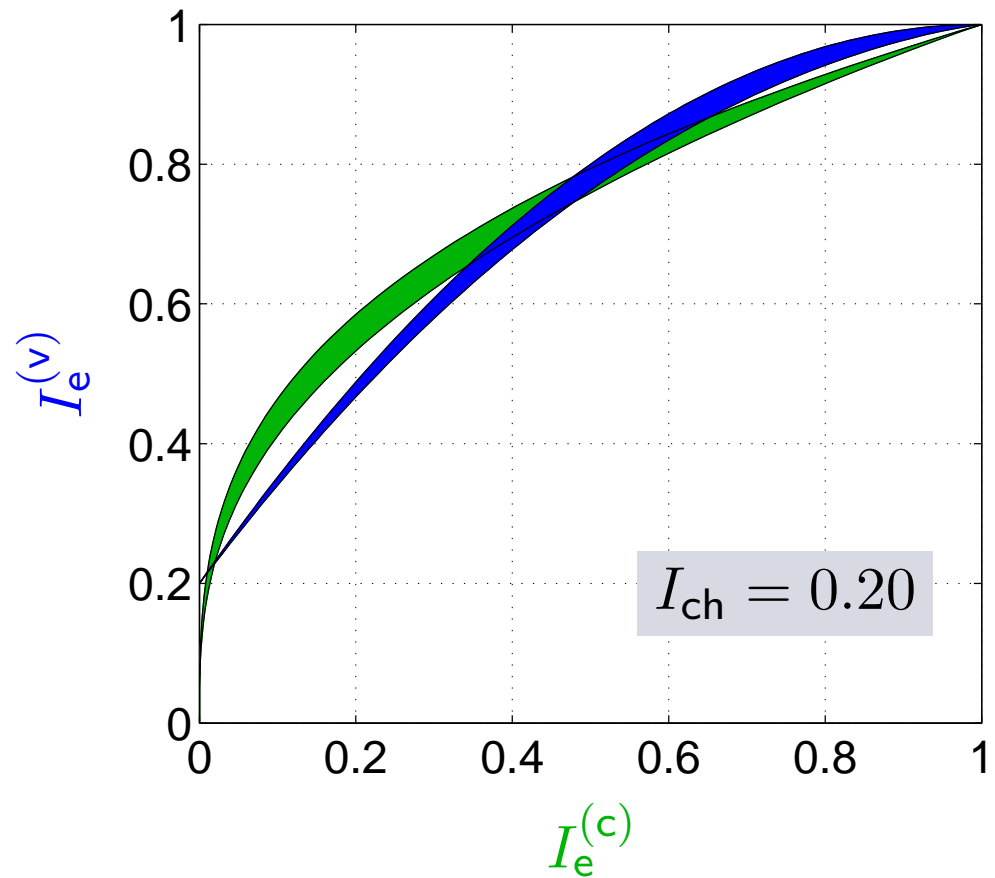
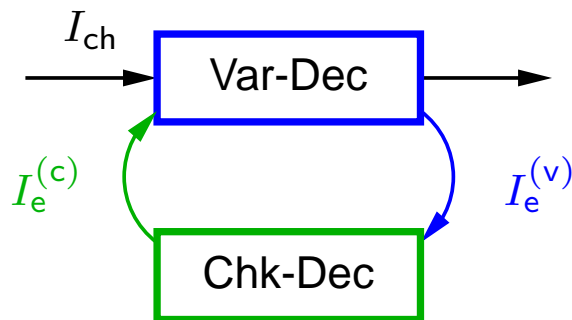
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Bounds on Decoding Threshold

- Decoding thresholds analytically determined
- Depend only on the mutual information (capacity) of the communication channel
- Valid for all(!) BISMCs

Advantage:

More general than the conventional EXIT-Chart Method

Disadvantage:

“Only” bounds on the threshold

Literature

- [1] I. Land, S. Huettinger, P. A. Hoeher, and J. Huber, “Bounds on information combining,” *IEEE Trans. Inform. Theory*, vol. 51, no. 2, pp. 612–619, Feb. 2005.
- [2] —, “Bounds on mutual information for simple codes using information combining,” *Ann. Télécommun.*, vol. 60, no. 1/2, pp. 184–214, Jan./Feb. 2005.
- [3] I. Sutskover, S. Shamai (Shitz), and J. Ziv, “Extremes of information combining,” *IEEE Trans. Inform. Theory*, vol. 51, no. 4, pp. 1313–1325, Apr. 2005.
- [4] I. Land, “Reliability information in channel decoding – practical aspects and information theoretical bounds,” Ph.D. dissertation, University of Kiel, Germany, 2005.