

# CHANNEL CODING - FINAL PROJECT

## UNIFIED HIGH-SPEED WIRELINE-BASE HOME NETWORKING TRANSCEIVERS

Access networks – In premises networks

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- Standard overview
- Encoder
- Decoder
- Rationale Decoder
- BICM
- Results

# An introduction



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- The **G.hn ITU G9960** is a standard proposed by the ITU-T.
- **Designed for:** the transmission of data over premises' wiring.
- The standard **defines:**
  1. the home network architecture and reference models.
  2. the physical layer specification.



# Transmission modes



- Each node of the home-network has a different **profile**.
- The standard refers to two different profiles:
  1. **Low-complexity profile (L-CP)**.
  2. **Standard profile (SP)**.
- A node of the network is required to support one profile, at minimum.

Profile name	Domain type	Valid bandplans
L-CP	Power-line baseband	25 MHz
SP	Power-line baseband	50 MHz, 100 MHz
	Telephone-line baseband	50 MHz, 100 MHz
	Coax baseband	50 MHz, 100 MHz
	Coax RF	50 MHz, 100 MHz, 200 MHz

# Transmission modes

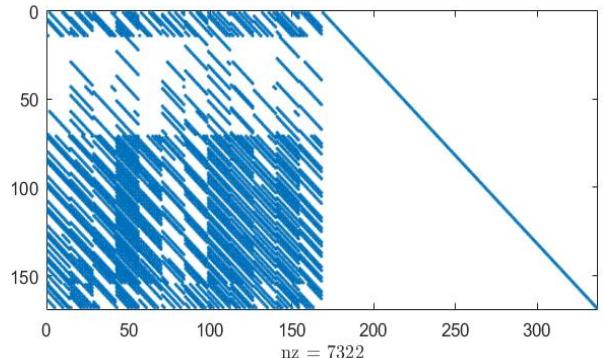
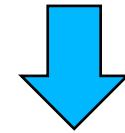
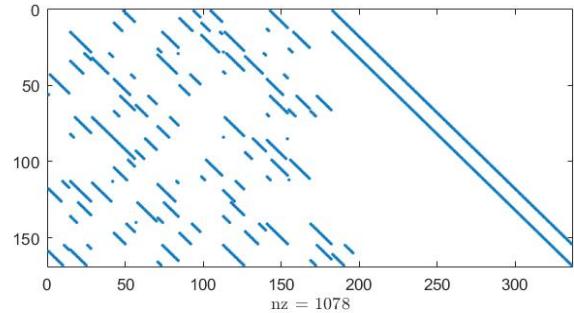
- The parity check matrix  $H$  of size  $(N-K) \times N$  will have:
  - Rate  $\frac{1}{2}$  :  $N = 1920$  (*LCP,SP*),  
 $8640$  (*SP*).
  - Rate  $\frac{2}{3}$  :  $N = 1440, 6480$  (*SP*)
  - Rate  $\frac{5}{6}$  :  $N = 1152, 5184$  (*SP*)
- Rate  $\frac{16}{18}, \frac{20}{21}$  are obtained puncturing the code with rate  $\frac{5}{6}$ , through different puncturing patterns.

Profile name	FEC rate	FEC block size
L-CP	$\frac{1}{2}$	120 bytes (Payload)
SP	$\frac{1}{2}, \frac{2}{3}, \frac{5}{6}$ $\frac{16}{18}, \frac{20}{21}$	120 and 540 bytes (Payload)

# Encoder



- Given  $H$ , get its systematic form  $H_{sys}$ .

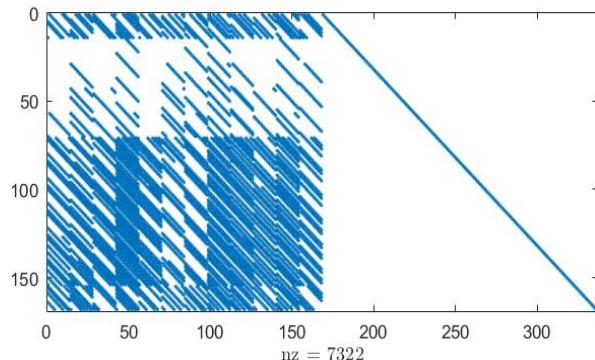
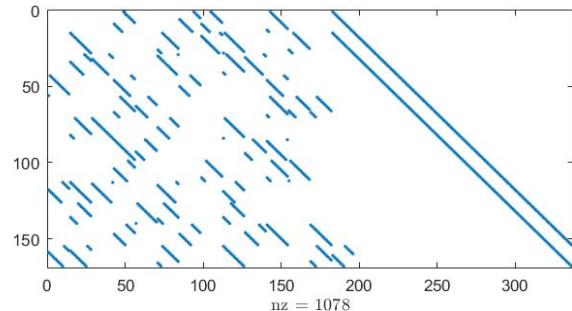


# Encoder



1. Given  $H$ , get its systematic form  $H_{sys}$ .
2. Encoding Procedure for a single word:

- ✓ The  $K$  information bits of  $u$  are directly copied to the codeword  $v$ .
- ✓ Let  $A$  be the submatrix obtained considering  $N-K$  rows and the first  $k$  columns of  $H_{sys}$ ; then, the  $N-K$  parity-check bits are computed as  $A^* u$ .
- ✓ The final codeword is  $v = [u|A u]$
- Preprocessing is done only once.



# Decoder – a first (naif) approach



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- All the minsum/ sumproduct algorithm have been written in c, and invoked via mex functions.
- There are at least three matrices as big as the H matrix:

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Unfeasible in terms of:  

- Memory allocation.
- Computational efforts.



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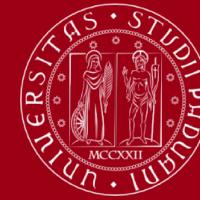


Unfeasible in terms of:  

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# Decoder – Rationale



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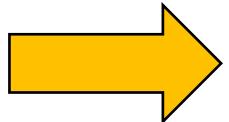
- Preprocess the matrix  $H$  in such a way to get all the **useful patterns** from it.

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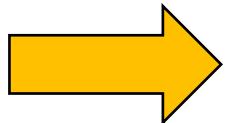


Do it only once.

# Decoder – Rationale



- Preprocess the matrix H in such a way to get all the **useful patterns** from it.



Do it only once.

- From H we get:

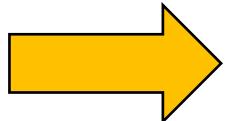
$$\Psi \quad \quad \quad \Psi$$
$$v \rightarrow c \quad c \rightarrow v$$

$$\prod_{v \rightarrow c} \quad \prod_{c \rightarrow v}$$

$$\{l_i\}_{i=1}^{N-K} \quad \{j_i\}_{i=1}^N$$

# Decoder – Rationale

- Preprocess the matrix  $H$  in such a way to get all the patterns from it.



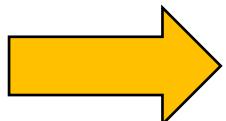
Do it only once.

- From  $H$  we get:

$$\begin{matrix} \Psi \\ v \rightarrow c \end{matrix} \quad \begin{matrix} \Psi \\ c \rightarrow v \end{matrix}$$

$$\begin{matrix} \prod \\ v \rightarrow c \end{matrix} \quad \begin{matrix} \prod \\ c \rightarrow v \end{matrix}$$

$$\{l_i\}_{i=1}^{N-K} \quad \{j_i\}_{i=1}^N$$



No need to evaluate directly  $H$  in the message passing algorithm for the computation of LLRs.



# Updates as a linear map



- Let  $\Psi_{c \rightarrow v}$  and  $\Psi_{v \rightarrow c}$  be the check update matrix and the variable update matrix, respectively:

$$\Psi_{c \rightarrow v} = \begin{bmatrix} I_{l_1}^C & & & 0 \\ & \ddots & \ddots & \\ 0 & & & I_{l_{N-K}}^C \end{bmatrix}$$

$$\Psi_{v \rightarrow c} = \begin{bmatrix} I_{j_1}^C & & & 0 \\ & \ddots & \ddots & \\ 0 & & & I_{j_N}^C \end{bmatrix}$$

- $I_s^C$  denotes the complement of the Identity matrix of size  $s$ .
- $\{l_i\}_{i=1}^{N-K}$  and  $\{j_i\}_{i=1}^N$  are the number of ones in each row and column respectively.

- Let's define  $\underset{c \rightarrow v}{LLR}, \underset{v \rightarrow c}{LLR} \in \mathbb{F}_2^U$  as the LLRs vectors, with  $U$  the total numbers of ones (edges) in the H matrix.

$$LLR = \begin{bmatrix} & & \\ & & \\ & \vdots & \\ & & \\ & & \end{bmatrix}_{c \rightarrow v} \quad \left. \begin{array}{l} j_1 \\ \vdots \\ j_N \end{array} \right\}$$

$$LLR = \begin{bmatrix} & \\ & \\ \vdots & \\ & \end{bmatrix} \quad \begin{array}{l} l_1 \\ \quad \\ \quad \\ \quad \end{array}$$



# Updates in minSum and sumProd

- For both minsum and sumproduct decoder the **variable updates** will have the following expression:

$$LLR = \underset{v \rightarrow c}{\Psi} \cdot \underset{c \rightarrow v}{LLR} + p$$

- In the sum product the **check updates** is:

$$\underset{c \rightarrow v}{LLR} = \left( \underset{c \rightarrow v}{\Psi} \cdot \Phi \left( \underset{v \rightarrow c}{|LLR|} \right) \right) * \text{sgn} \left( \underset{v \rightarrow c}{LLR} \right)$$

- Where  $\Phi(x) = \log \left( \frac{e^x + 1}{e^x - 1} \right)$ ,  $\text{sgn}(\cdot)$  is the function that maps each element of the vector to its corresponding sign and  $p$  is the vector of prior LLRs.



In order to properly compute the LLRs updates, vectors must be properly ordered...

## HOW?

# Permutation matrices



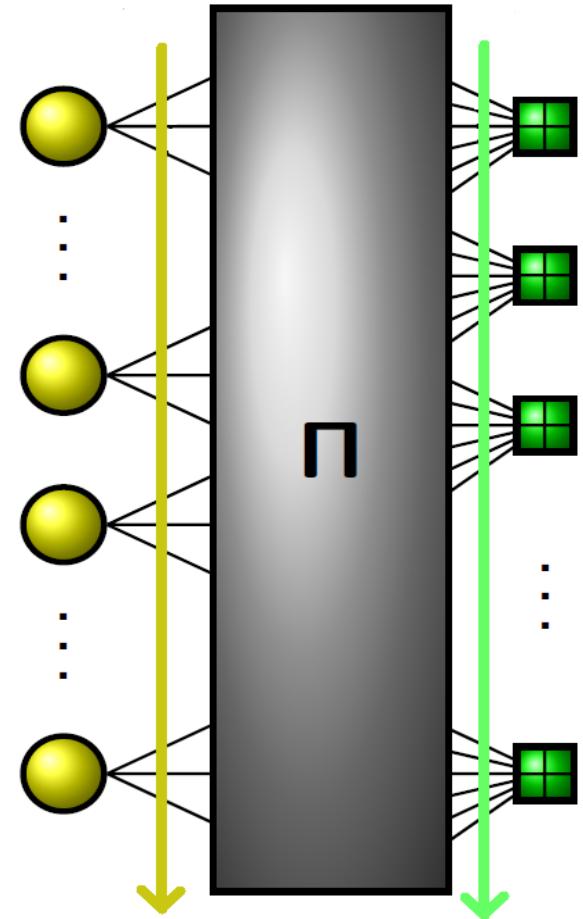
In order to properly compute the LLRs updates, vectors must be properly ordered...

## HOW?

We will refer to two different LLR representation:

**Check representation (CR)**

**Variable representation (VR)**



# Permutation matrices

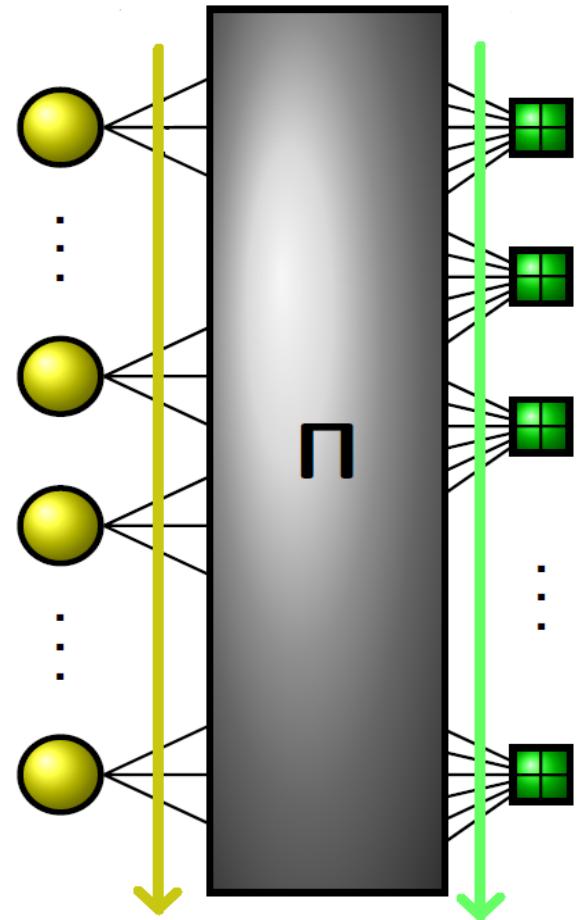


**CHECK REPRESENTATION (CR)**

$$H = \begin{bmatrix} 1 & 0 & 1 & 1 & 0 & 0 & 0 & 1 & 1 \\ 0 & 1 & 0 & 1 & 1 & 1 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 & 1 & 1 & 1 & 0 & 1 \\ 0 & 1 & 1 & 1 & 0 & 0 & 0 & 1 & 0 \\ 1 & 0 & 1 & 0 & 0 & 1 & 1 & 1 & 0 \end{bmatrix}$$

**VARIABLE REPRESENTATION (VR)**

$$H = \begin{bmatrix} 1 & 0 & 1 & 0 & 1 & 0 & 1 & 0 & 1 \\ 0 & 1 & 0 & 1 & 0 & 1 & 0 & 1 & 0 \\ 0 & 0 & 1 & 0 & 1 & 0 & 1 & 0 & 1 \\ 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 & 1 \\ 0 & 0 & 1 & 1 & 0 & 1 & 0 & 1 & 1 \\ 1 & 1 & 0 & 0 & 1 & 1 & 1 & 0 & 0 \\ 0 & 1 & 1 & 1 & 0 & 0 & 0 & 1 & 1 \\ 1 & 0 & 0 & 1 & 1 & 0 & 1 & 0 & 1 \\ 0 & 1 & 0 & 0 & 0 & 1 & 1 & 1 & 0 \end{bmatrix}$$



# Permutation matrices (1/2)

- Let  $per : D_U \rightarrow D_U$  be the permutation map that associates to each edge in expressed in the **CR** the corresponding position in the **VR**.
- $D_U = \{1, \dots, U\}$ ,  $U$  the number of ones (edges) in the matrix  $H$ .

$$\Pi = \begin{bmatrix} e_{per(1)}^\top \\ \vdots \\ e_{per(U)}^\top \end{bmatrix}$$

- Where  $e_i \in \mathbb{F}_2^U$  denotes the  $i$ -th canonical vector in  $\mathbb{F}_2^U$ .

## Permutation matrices (2/2)

- If we think of  $\prod_{c \rightarrow v}$  as a linear application and we exploit the property of the permutation matrices:

$$\prod_{v \rightarrow c} = \prod_{c \rightarrow v}^{-1} = \prod_{c \rightarrow v}^{\top}$$

- Hence, there is no need to compute directly  $\prod_{v \rightarrow c}$  since:

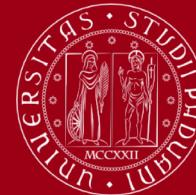
$$\prod_{c \rightarrow v} \longleftrightarrow \prod_{v \rightarrow c}$$

# Sum product



```
for it=1:iter
    LLRvc = perMatrVC * LLRvc;           ← Get LLRvc in CR
    curSign = sign(LLRvc);
    curSign(curSign == 0) = 1;
    signLLRcv = GetSign(curSign,nOR);
    tmpP = abs(LLRvc);
    tmpP(tmpP < minf) = 1e-10;
    temp = upMatrCV * PhiMap(tmpP);
    LLRcv = PhiMap(temp).* signLLRcv;      ← Update
    LLRcv = perMatrCV * LLRcv;             ← Get LLRcv in VR
    LLRvc = upMatrVC * LLRcv + LLRprior;   ← Update
    curIndex = 1;
    for j=1:length(nOC)
        if(vPLLRS(j) + sum(LLRcv(curIndex:nOC(j)+curIndex-1)) < 0)
            u_hat(j) = 1;
        else
            u_hat(j) = 0;
        end
        curIndex = curIndex + nOC(j);
    end
    if( mod(Hreal * u_hat,2) == 0)
        break;
    end
end
```

# Practical considerations



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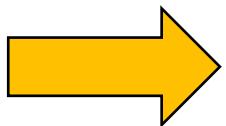
- Product between sparse matrices is optimized in Matlab.  
(<https://it.mathworks.com/help/matlab/math/sparse-matrix-operations.html>)
- Only vectors proportional to the number of ones in the check matrix are used.

**Mex function** for specific tasks have been implemented:

- Arrayfunc command of matlab leads to slow computation.
- Mex function **PhiMap()** improves dramatically the performance.
- Search in the minsum is not a bottle neck since elements to be checked are few (consequence to the fact that H is sparse).

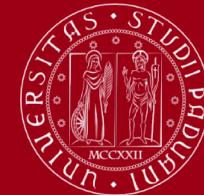
## ENCODING

- Grouping sequences of  $b = \log_2 M$  bits and then mapping them according to the suitable constellation mappers.
- Both **constellation mappers** (4 and 16 symbols) designed with mex function.



Faster than defining a matlab function and then using the arrayfunc function.

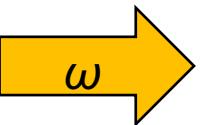
# BICM – Implementation perspective



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## COMPUTATION OF THE LLRs FOR DECODER

b0	b1
0	0
0	1
1	0
1	1



Re	Im
-1	-1
1	-1
-1	1
1	1

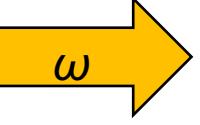
Given the  
rx symbol



$$LLR = \ln \left( \frac{P(0,0) + P(0,1)}{P(1,0) + P(1,1)} \right)$$

$b_0 \rightarrow v_0$

b0	b1
0	0
1	0
0	1
1	1



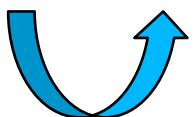
Re	Im
-1	-1
-1	1
1	-1
1	1

Given the  
rx symbol

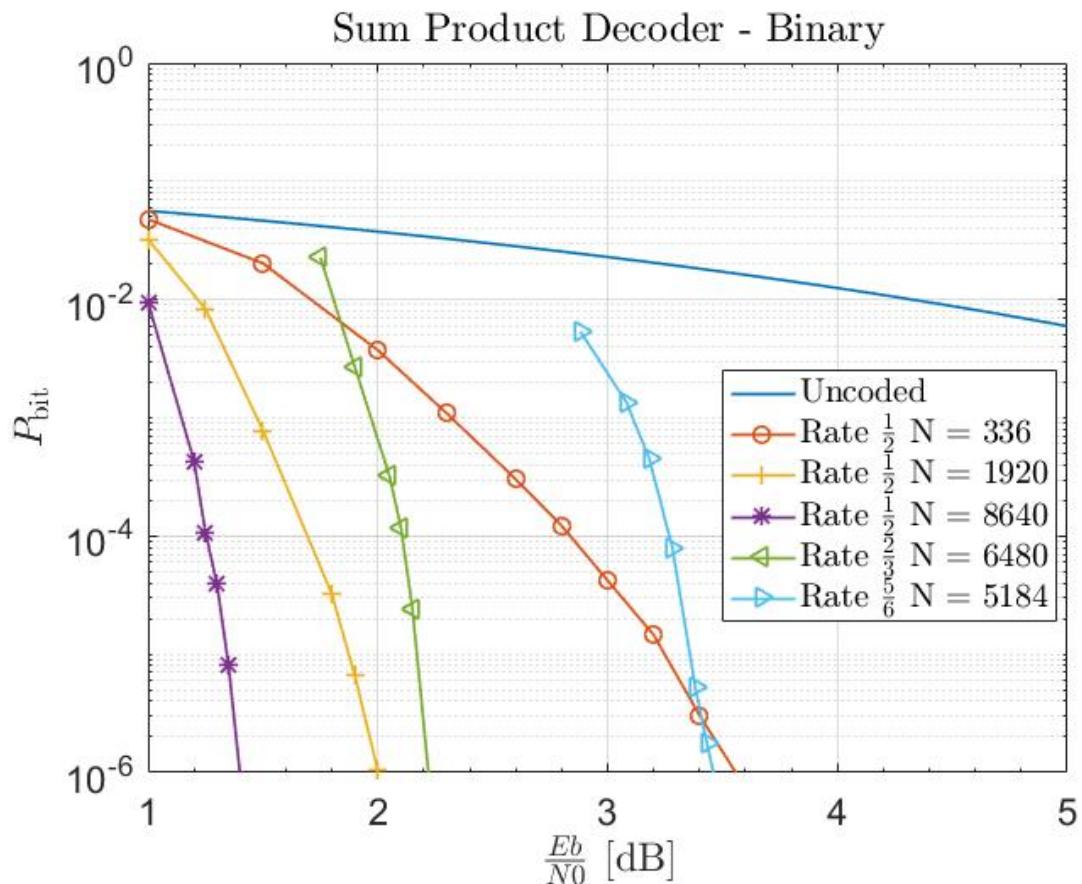


$$LLR = \ln \left( \frac{P(0,0) + P(1,0)}{P(0,1) + P(1,1)} \right)$$

$b_1 \rightarrow v_1$



# Results

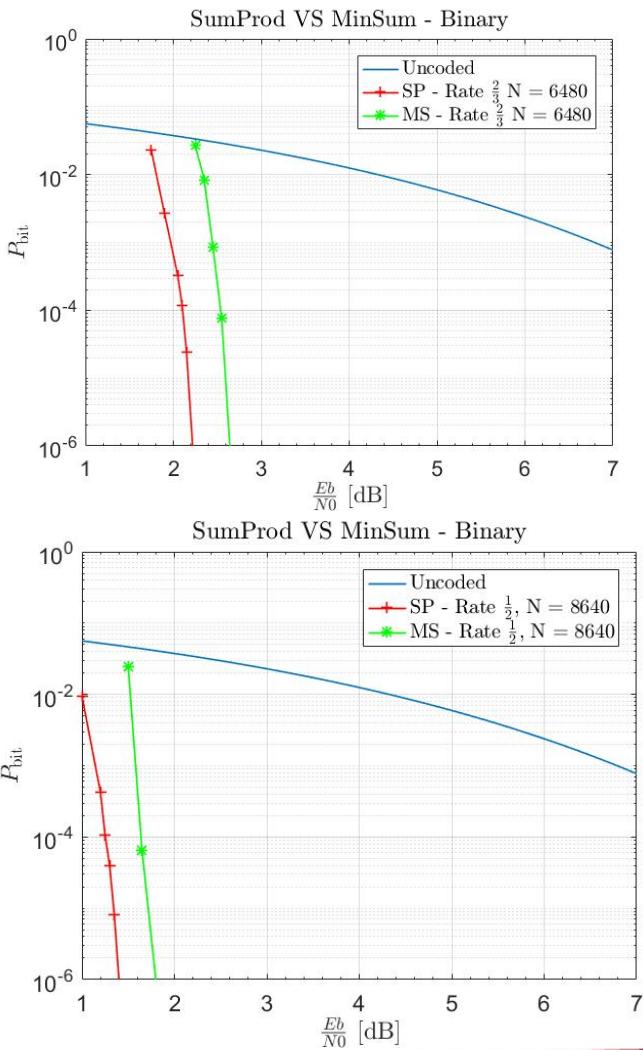
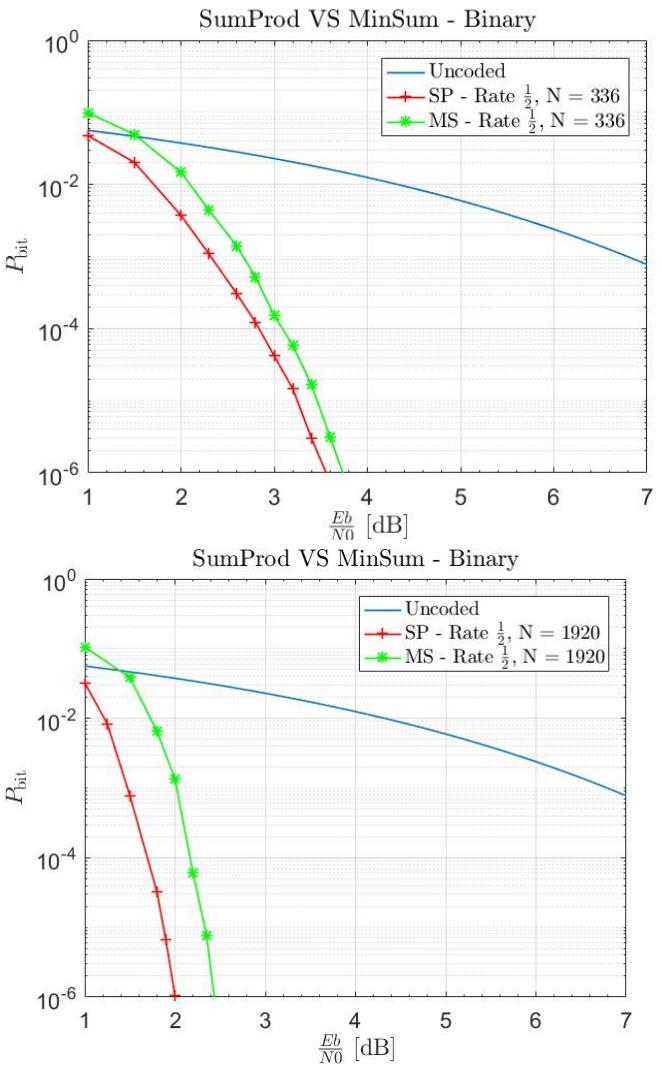


**Uncoded case:**

$$P_{\text{bit}} = 10^{-6}$$

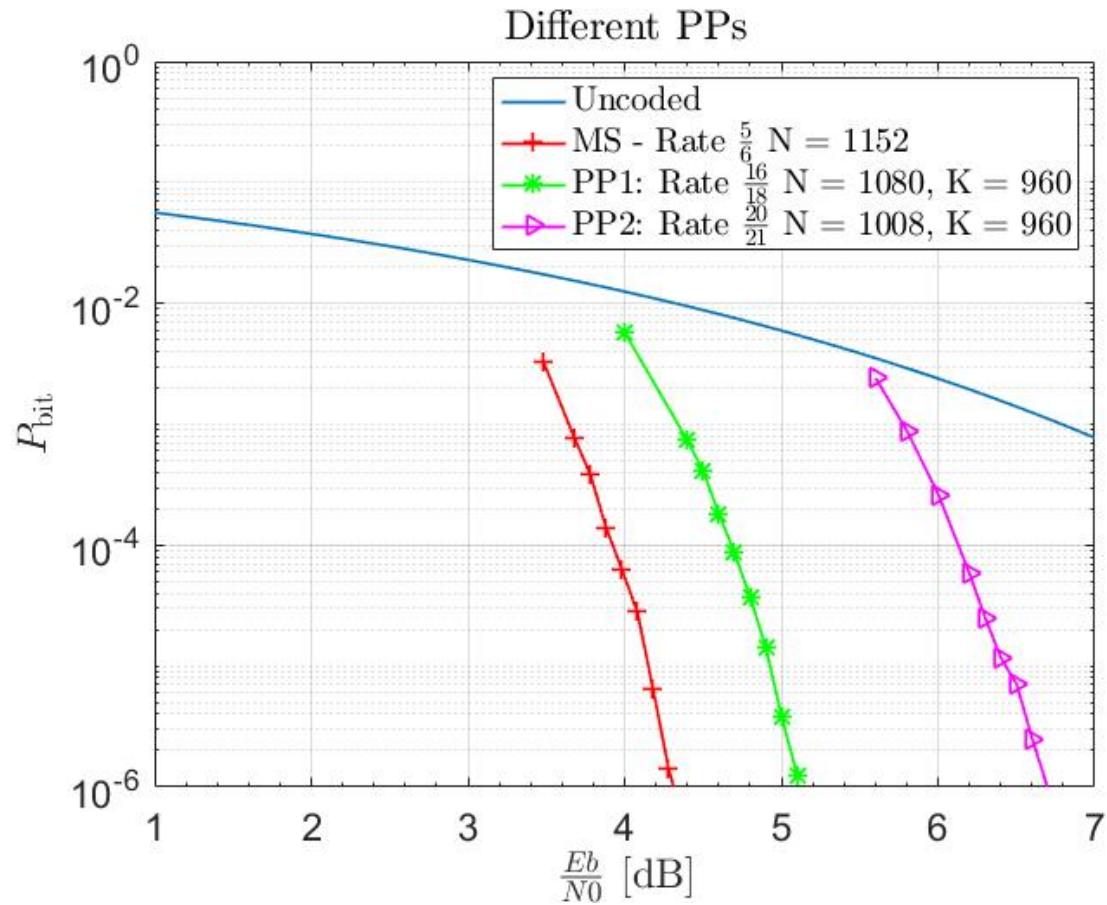
for  $\frac{E_b}{N_0} \cong 10,5 \text{ dB}$

# Results – MinSum vs SumProd



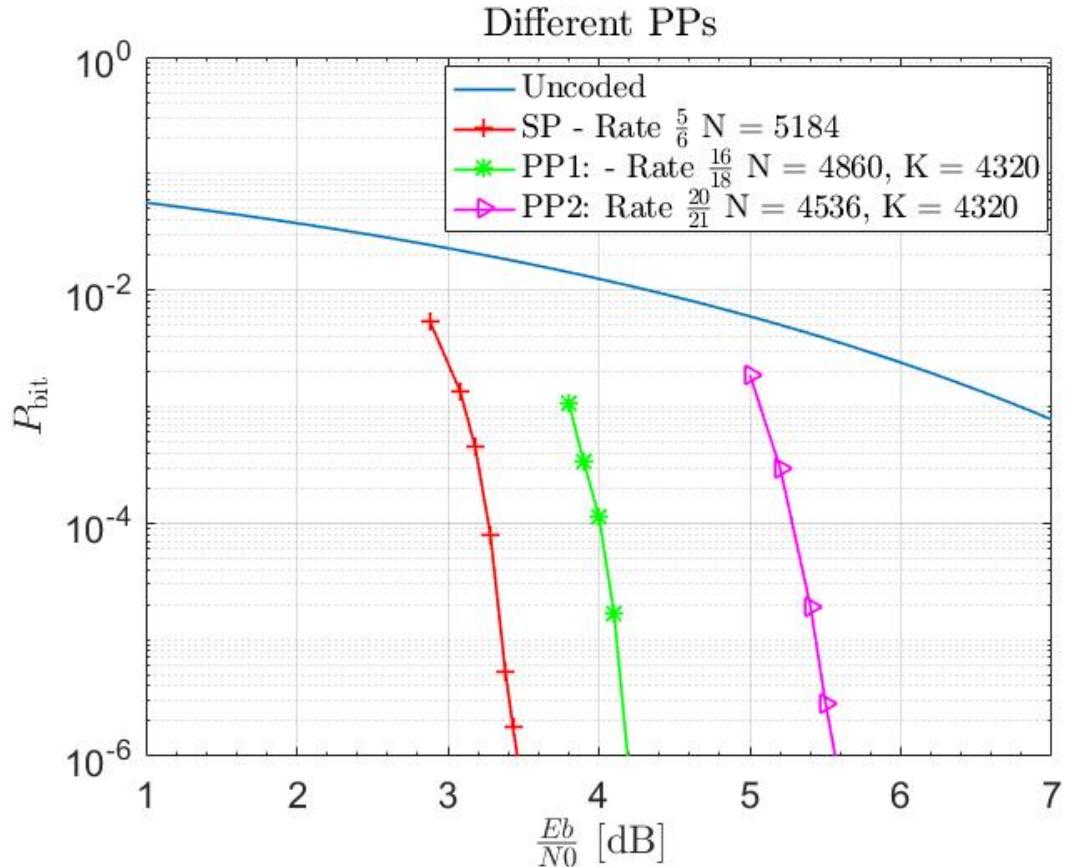
# Results – Different Puncturing Patterns

For K = 960:

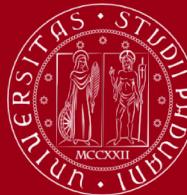


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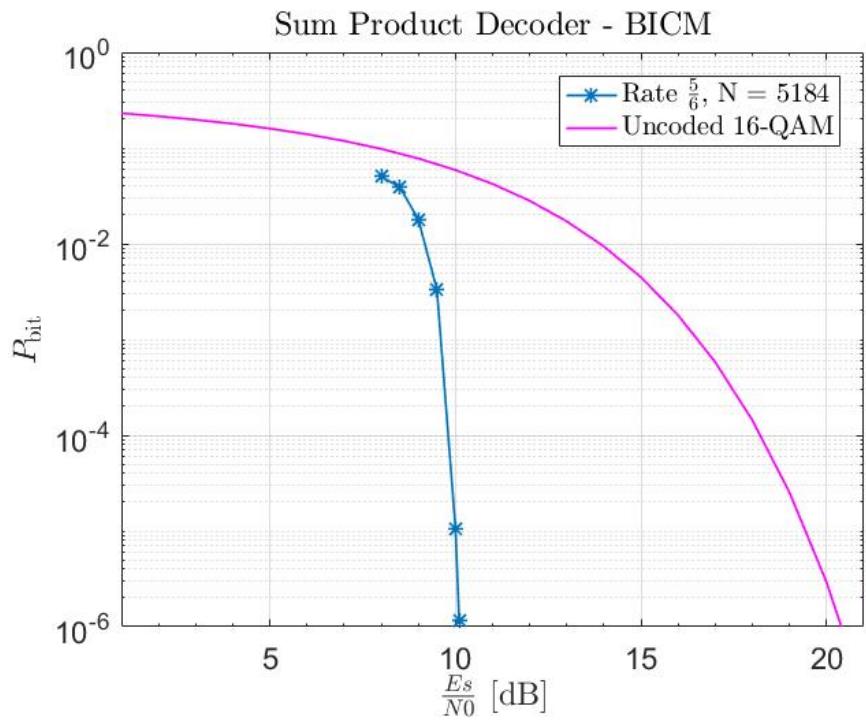
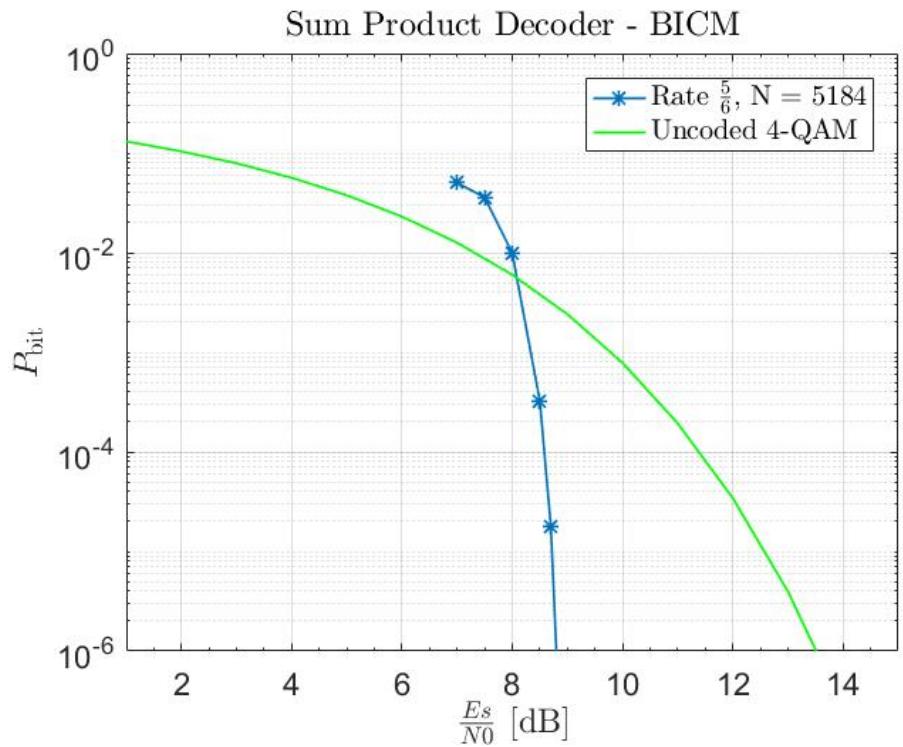
For K = 4320:



# Results - BICM



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- Possible extensions/improvements.

## Details

- All the images have been created with LaTeX or Matlab.
- The images reported in pag. 8 were taken from two superb books (According to Goodreads): The Pragmatic Programmer and Programming Pearls.
- The image of LDPC decoder have been selected from PDFs of Channel Coding Course (Tomaso Erseghe).