



Polar Codes

Using MATLAB



Content

- Intro To Polar Codes
- Polarization Transformation Encoder
- Successive Cancellation (SC) Decoder
- The MATLAB implementation Code
- MATLAB Results



Intro To Polar Codes

Polar codes break the wheel somewhat in the field of channel coding.

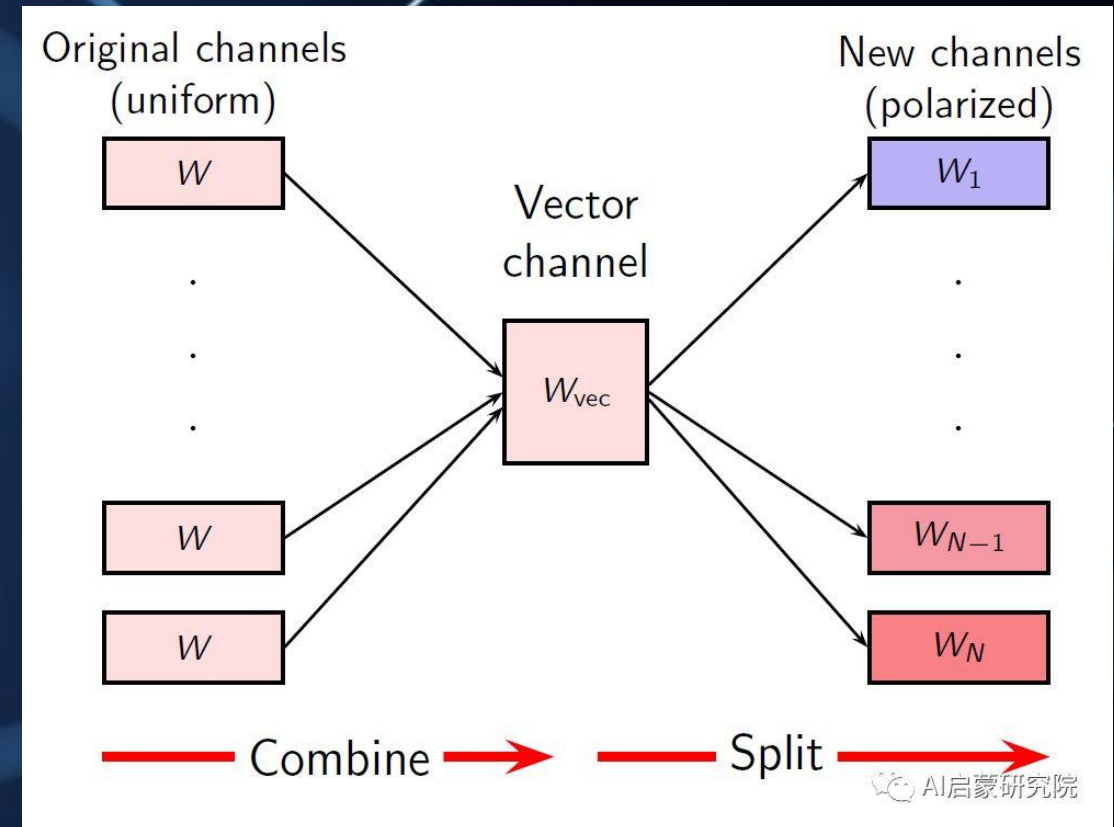
Polar codes operate on blocks of symbols/bits and are therefore technically members of the block code family.

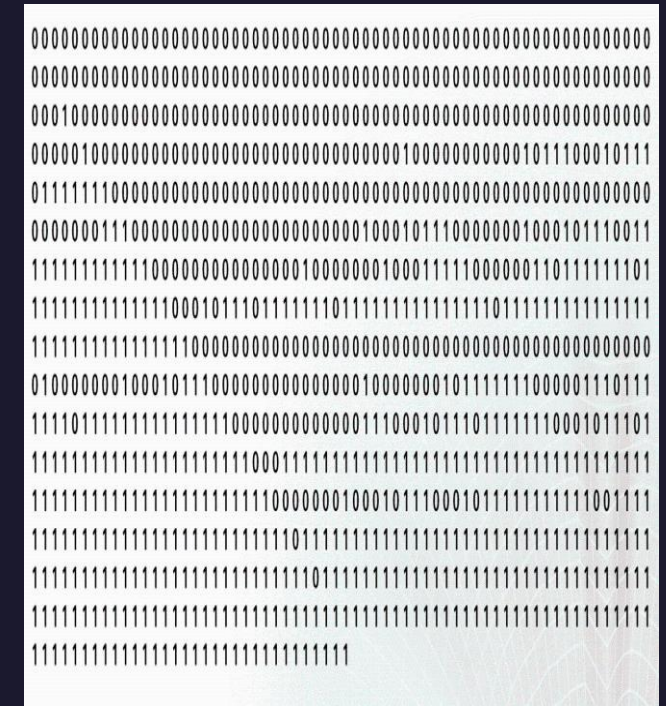
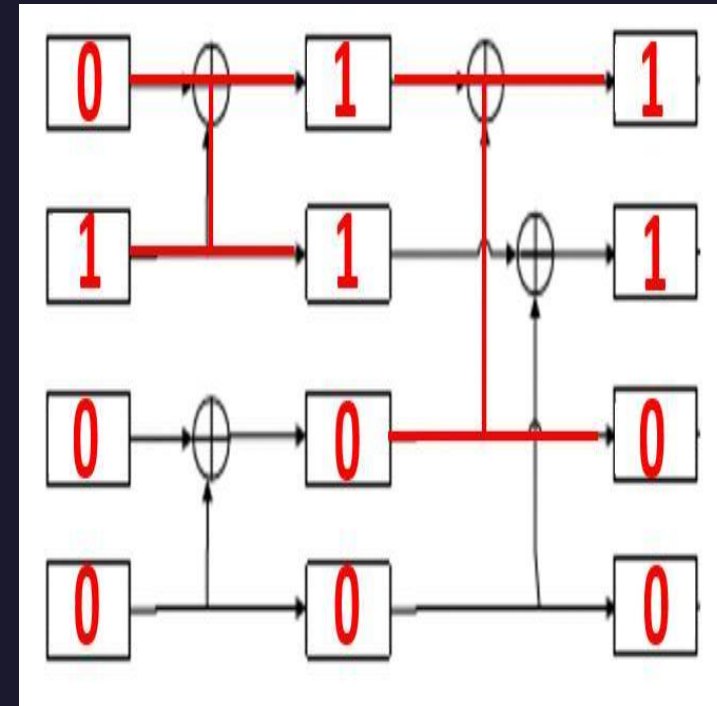
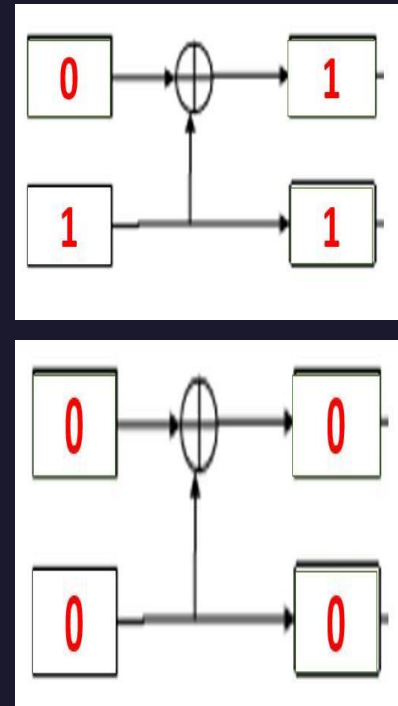
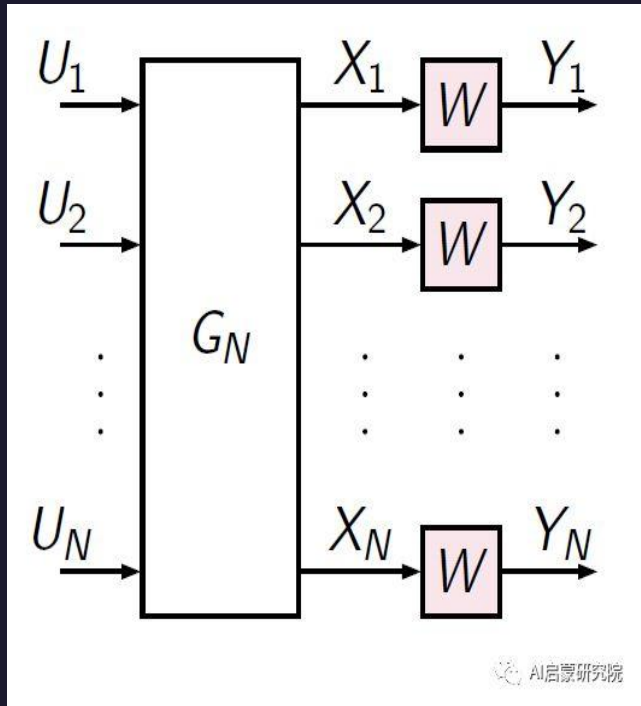
The transformation involves two key operations called channel combining and channel splitting.

The real magic in polar codes lies in the clever bit manipulations and mappings to the channels at the encoder to convert a block of bits into a polarized bit stream at the receiver.

That is a received bit and its associated channel ends up being either a “good channel” or “bad channel” pole/category.

As the size of the bit block increases, the received bit stream polarizes in a way that the number of “good channels” approaches Shannon capacity. This phenomenon is what gives polar codes their name.





Polarization Transformation Encoder

Polar transform: G_2
2 bits to 2 bits

$$G_2 = \begin{bmatrix} 1 & 0 \\ 1 & 1 \end{bmatrix} \text{ kernel}$$

• $[u_1 \ u_2] G_2 = [u_1+u_2 \ u_2]$
 \uparrow \uparrow
input output

\swarrow mod 2 (or) XOR

Binary tree representation

$u^{(2)} = [u_1+u_2 \ u_2]$

$u^{(2)}$: length-2 vector

Polar Transform: General

$$G_{2^n} = \begin{bmatrix} 1 & 0 \\ 1 & 1 \end{bmatrix}^{\otimes n}$$

- $N = 2^n$
- G_N : $N \times N$ matrix, Kronecker product of 2×2 kernel
- Binary tree representation
 - Depth n
 - $u^{(N)} = u G_N$: evaluated on tree with u at bottom and $u^{(N)}$ at top
- 5G: uses up to $n = 10$

The mapping $u_1^4 \mapsto x_1^4$ from the input of W_4 to the input of W^4 can be written as $x_1^4 = u_1^4 G_4$ where G_N is the generator matrix. Hence, we obtain the relation $W_4(y_1^4|u_1^4) = W^4(y_1^4|u_1^4 G_4)$ between the two transition probabilities.

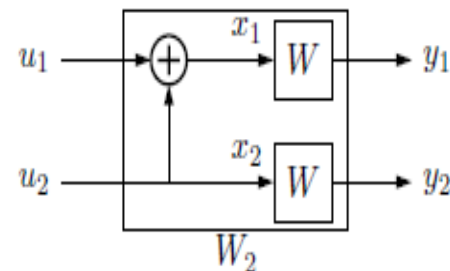
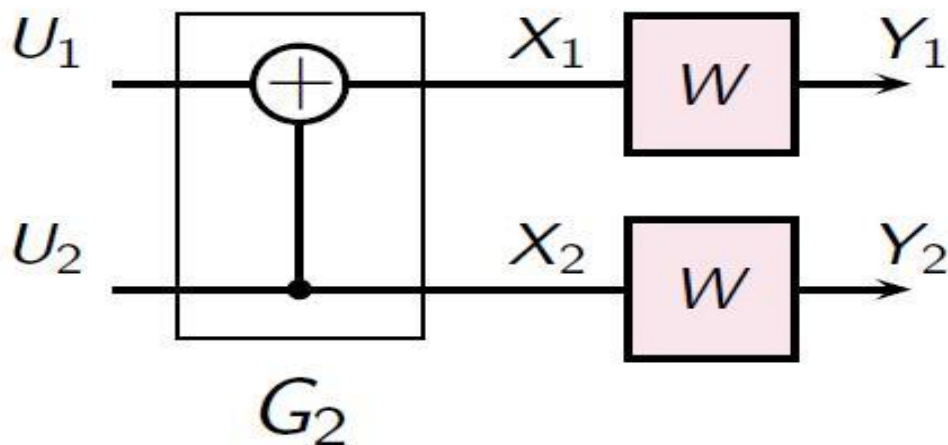


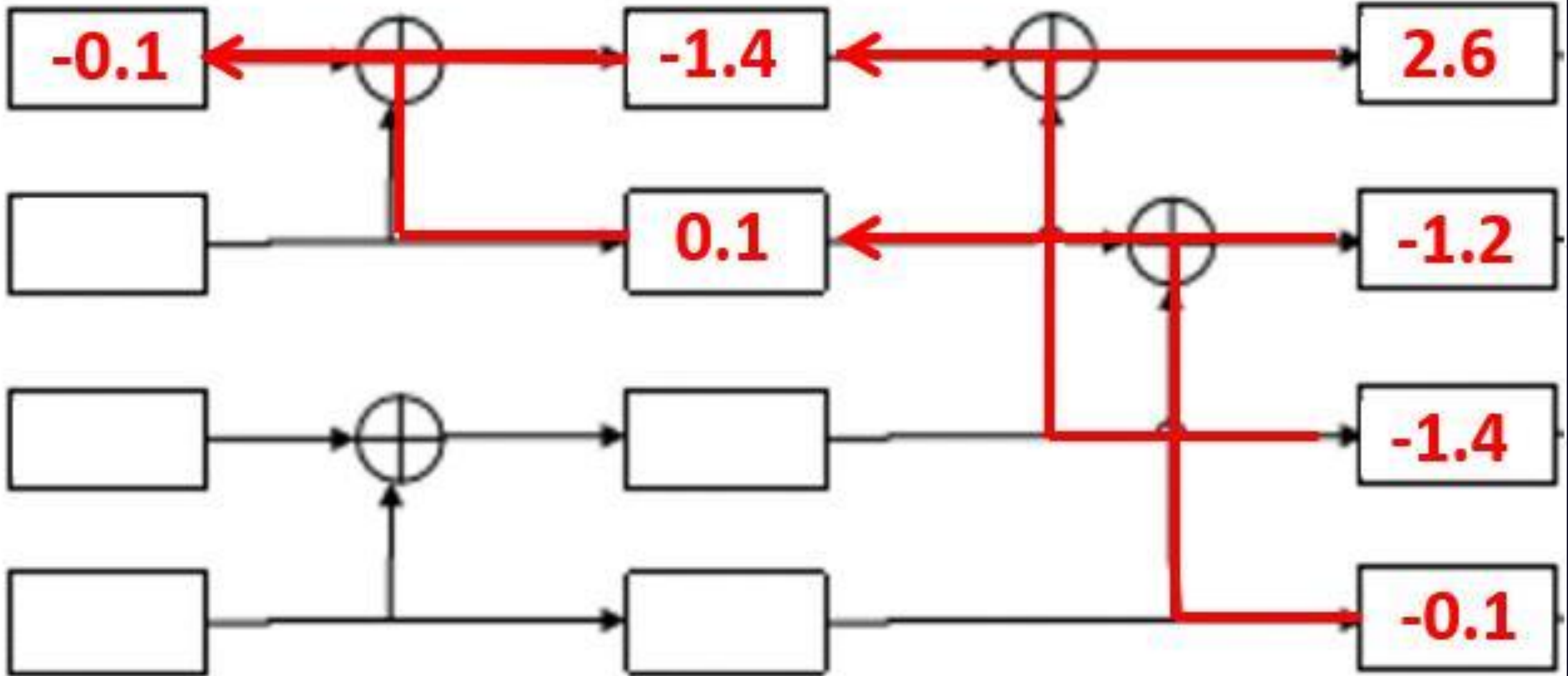
Figure 2.1: The channel W_2 .



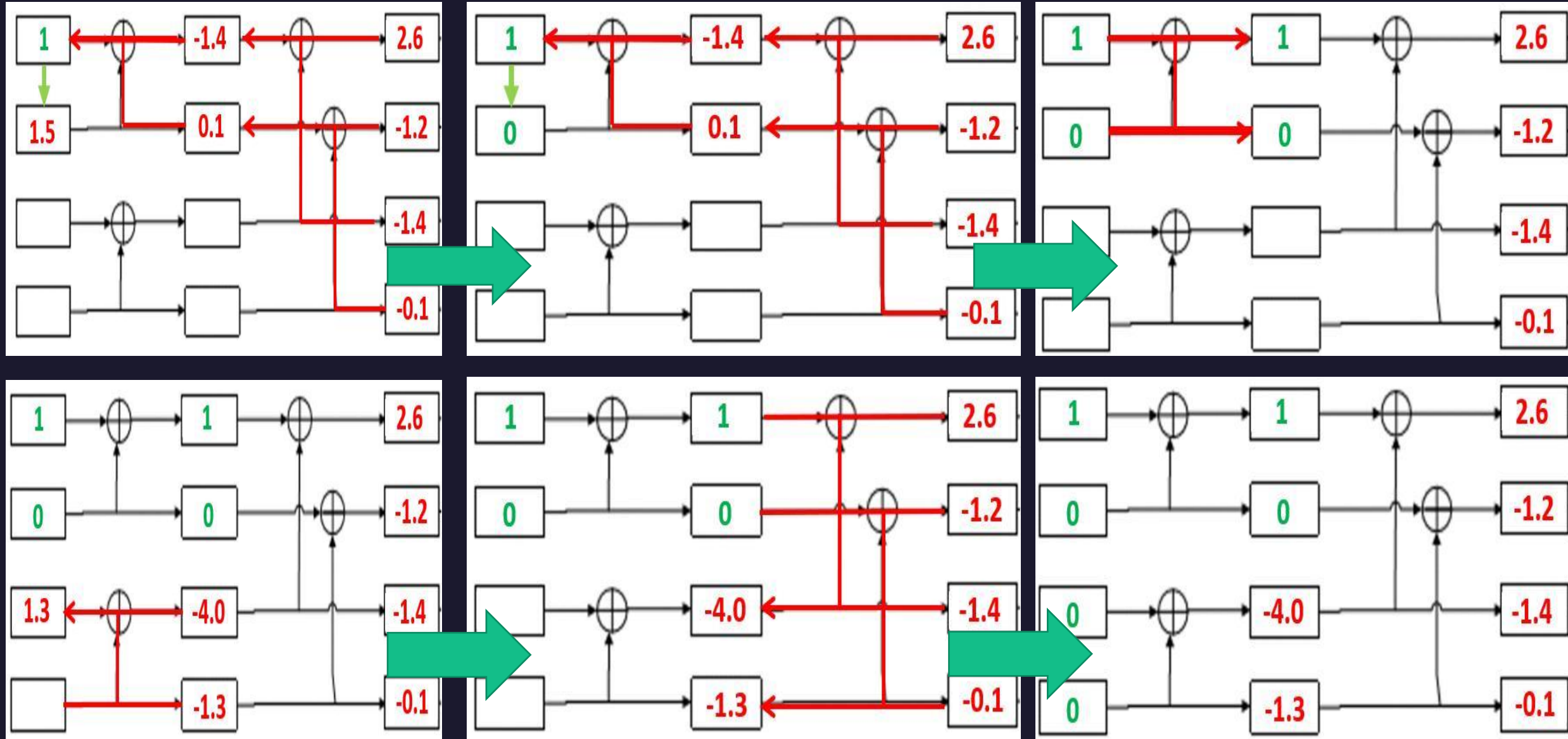
$$I(W) \triangleq I(X; Y) = \sum_{y \in \mathcal{Y}} \sum_{x \in \mathcal{X}} \frac{1}{2} W(y|x) \log \frac{W(y|x)}{\frac{1}{2} W(y|0) + \frac{1}{2} W(y|1)}, \quad (2.1)$$

where X and Y are two discrete random variables corresponding to input and output, respectively, and $W(y|x)$ is the channel transition probability for $x \in \mathcal{X}$ and $y \in \mathcal{Y}$.

Successive Cancellation (SC) Decoder



Successive Cancellation (SC) Decoder



The MATLAB implementation Code

```
Editor - D:\ASMAA 2021\collage\3rd\1. Intro to Digital Commu\4. labs\1. this year\lab2\part 3\polar\BSC with p (this is the one)\polar_code_main.m
polar_code_main.m
1 - clc
2 - clear
3
4 - N=8; % N Channels
5 - n=log2(N); % N=2^n
6 - A=[4 6 7 8]; % information bit == message
7 - u_A=[1 1 0 1]; % information vector == mostly it is equal to the message positions
8 - AC=[1 2 3 5]; % frozen bit == reliability sequence for N ==or it's called Q
9 - u_AC=[0 0 0 0]; % frozen vector ==the principal idea of polar coding is putting the
10 % information bits on those "good" channels whose capacity tend to be 1
11 % and the frozen bits on the "bad" ones.
12 - snr=6;
13 - p_vec = 0:0.01:0.5; % prob of BSC flipping
14 - BER_vec = zeros(size(p_vec));
15 %% Polar codes encoder
16 F=[1 0;1 1]; % F==G polar transformation kernel matrix
17 F_n=F;
18 for i=1:(n-1) % num of bits combined
19 % this is the polar transformation because G = kron( A, B )
20 % returns the Kronecker tensor product of matrices A and B .
21 F_n=kron(F_n,F); % If A is an m -by- n matrix and B is a p -by- q matrix,
22 % then kron(A,B) is an m*p -by- n*q matrix formed by taking all possible
23 % products between the elements of A and the matrix B .
24 end
25 I=eye(2^n); % where eye(N) is the N-by-N identity matrix.
26 G_n=F_n; % F==G polar transformation kernel matrix
27 u=u_A*I(A,:)+u_AC*I(AC,:); % u is the unencoded codeword to be compared with the received or decoded codeword
28 x=mod(u_G_n(A,:)+u_AC*G_n(AC,:),2); % x is the encoded codeword
```

```
Editor - D:\ASMAA 2021\collage\3rd\1. Intro to Digital Commu\4. labs\1. this year\lab2\part 3\polar\BSC with p (this is the one)\polar_code_main.m
polar_code_main.m
30 %% polar_code_channel
31 %BSC with p prob of flipping
32 for p_index = 1:length(p_vec)
33
34 x = BSChannel(x,p_vec(p_index));
35 y=zeros(1,N);
36
37 % mapping
38 for i=1:N
39 if(x(i)==0)
40 y(i) = 1; % 0-->+1
41 else
42 y(i) = -1; % 1-->-1
43 end
44 end
45 y =awgn(y,snr);
46 %% Decoder
47 u_e = polar_code_SC_decoder(n,N,y,AC); % u_e: estimated codeword
48 %% computing BER
49 count=0;
50 for i=1:length(u) %u is the un-encoded bit seq using polarization transformation encoding
51
52 if(u_e(i)~=u(i))
53 count=count+1;
54 end
55 end
56 BER_vec(p_index)=count/length(u);
57
```


The MATLAB implementation Code

```

Editor - D:\ASMAA 2021\collage\3rd\1. Intro to Digital Commu\4. labs\1. this year\lab2\part 3\polar\BSC with p (this is the one)\BSChannel.m
polar_code_main.m  polar_code_SC_decoder.m  BSChannel.m  +
1 function rec_encoded_seq = BSChannel(encoded_seq,p)
2 %
3 % Inputs:
4 %   encoded_seq: The input sequence to the channel
5 %   p:           The bit flipping probability
6 % Outputs:
7 %   rec_encoded_seq: The sequence after passing through the channel
8 %
9 % This function takes the encoded sequence passing through the channel, and
10 % generates the output sequence
11 encoded_seq = ~encoded_seq;
12 rec_encoded_seq = zeros(size(encoded_seq));
13 rec_encoded_seq = ~rec_encoded_seq;
14
15 channel_effect = rand(size(rec_encoded_seq))<=p;
16
17 rec_encoded_seq = xor(encoded_seq,channel_effect);
18 rec_encoded_seq = rec_encoded_seq + 0;

```

```

Editor - D:\ASMAA 2021\collage\3rd\1. Intro to Digital Commu\4. labs\1. this year\lab2\part 3\polar\BSC with p (this is the one)\BSChannel.m
polar_code_main.m  polar_code_SC_decoder.m  BSChannel.m  +
1 function [u_e] = polar_code_SC_decoder(n,N,y,AC)
2 %
3 %   n: number of level
4 %   N: length of codeword
5 %   y: undecoded codeword
6 %   AC: frozen bit
7 %   stage: current processing stage
8 %   LLR: log-likelihood ratio
9 %   HB: estimated hard bits
10 %   u_e: estimate of codeword
11
12 % initializing the log-likelihood ratio
13 LLR = zeros([N,n+1]);
14 LLR(:,1) = y;
15
16 %polar_code_initializing_HardBit
17 HardBits = zeros(N,n+1);
18
19 for i=1:N
20     if(LLR(i,1)>=0)
21         HardBits(i,1) = 0;
22     else
23         HardBits(i,1) = 1;
24     end
25 end
26
27 for stage=1:n
28     % Calculate alpha_left
29     % polar_code_updateLLR_Left
30     Ns = 2^(n-stage+1);

```

- log-likelihood ratio (LLR) where

$$L_N^{(i)}(y_1^N, \hat{u}_1^{i-1}) = \ln \left(\frac{W_N^{(i)}(y_1^N, \hat{u}_1^{i-1} | u_i = 0)}{W_N^{(i)}(y_1^N, \hat{u}_1^{i-1} | u_i = 1)} \right);$$

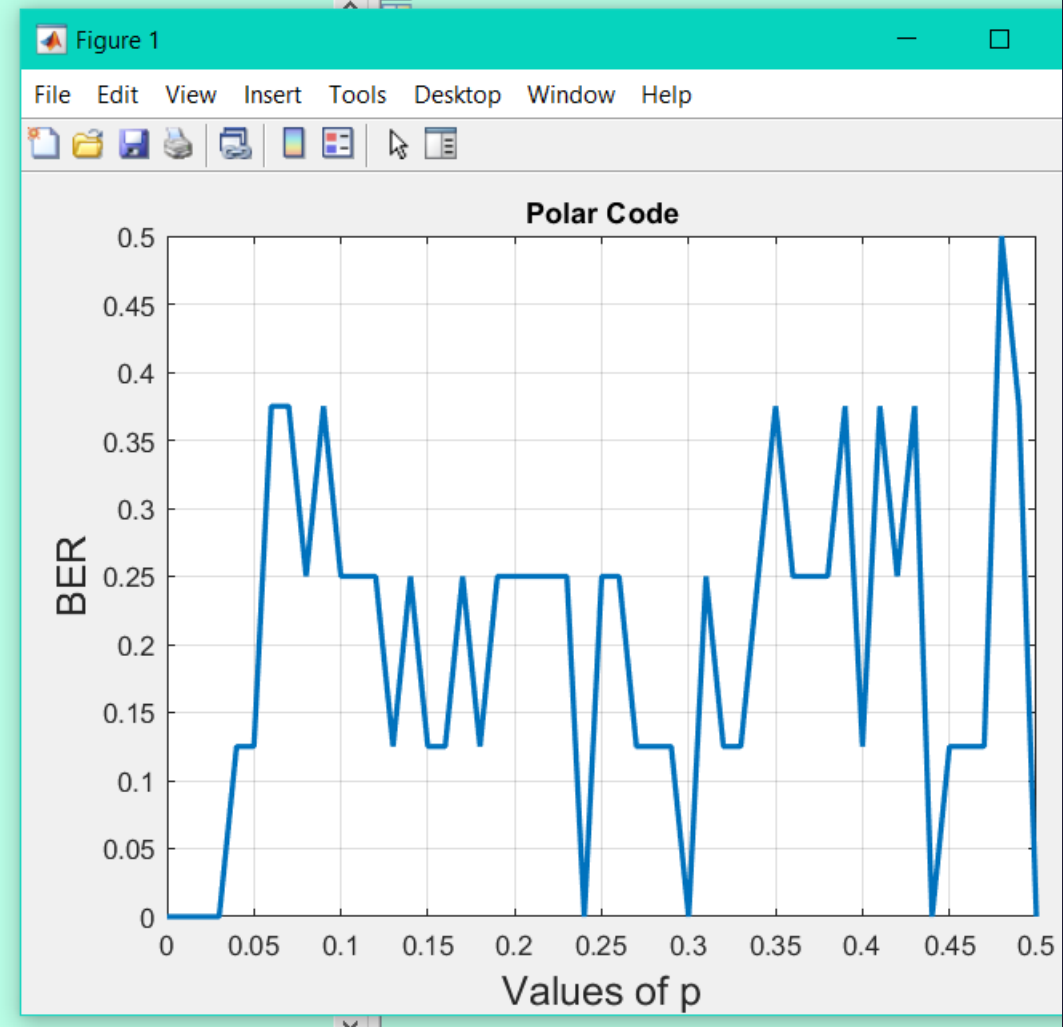
The MATLAB implementation Code

```
polar_code_main.m x polar_code_SC_decoder.m x BSChannel.m x +
26 - for stage=1:n
27     % Calculate alpha_left
28     % polar_code_updateLLR_Left
29     Ns = 2^(n-stage+1);
30     for j=1:Ns:N
31         for i=j+jNs/2-1
32             p = LLR(i,stage); %alpha_i
33             q = LLR(i+Ns/2,stage); %alpha_(i+Ns/2)
34             LLR(i,stage+1) = sign(p)*sign(q)*min([abs(p),abs(q)]);
35         end
36     end
37
38
39     %polar_code_updateHB_L
40     %Calculate beta_left
41     Ns = 2^(n-stage+1);
42     for j=1:Ns:N
43         for i=j+jNs/2-1
44             if(stage==n&&ismember(i,AC))
45                 HardBits(i,stage+1) = 0;
46             elseif(LLR(i,stage+1)>=0)
47                 HardBits(i,stage+1) = 0;
48             else
49                 HardBits(i,stage+1) = 1;
50             end
51         end
52     end
53
54
```

```
Editor - D:\ASMAA 2021\collage\3rd\1. Intro to Digital Commu\4. labs\1. this year\lab2\part 3\polar\BSC with p (this is the one)\polar_code_SC_decoder.m
polar_code_main.m x polar_code_SC_decoder.m x BSChannel.m x +
54
55     %polar_code_updateLLR_R
56     % Calculate alpha_right
57     Ns = 2^(n-stage+1);
58     for j=1:Ns:N
59         for i=j+jNs/2-1
60             p = LLR(i,stage); %alpha_i
61             q = LLR(i+Ns/2,stage); %alpha_(i+Ns/2)
62             LLR(i+Ns/2,stage+1) = (1-2*HardBits(i,stage+1))*p+q;
63         end
64     end
65
66     %HardBits = polar_code_updateHB_R
67     %Calculate beta_right
68     Ns = 2^(n-stage+1);
69     for j=1:Ns:N
70         for i=j+jNs/2+jNs-1
71             if(stage==n&&ismember(i,AC))
72                 HardBits(i,stage+1) = 0;
73             elseif(LLR(i,stage+1)>=0)
74                 HardBits(i,stage+1) = 0;
75             else
76                 HardBits(i,stage+1) = 1;
77             end
78         end
79     end
80     end
81     u_e = HardBits(:,n+1)';
82 -end
```

Results

```
Correct! your BER=0 when P=0
Correct! your BER=0 when P=1.000000e-02
Correct! your BER=0 when P=2.000000e-02
Correct! your BER=0 when P=3.000000e-02
some bits flipped & needed error correction,your BER=1.250000e-01 when P=4.000000e-02
some bits flipped & needed error correction,your BER=1.250000e-01 when P=5.000000e-02
some bits flipped & needed error correction,your BER=3.750000e-01 when P=6.000000e-02
some bits flipped & needed error correction,your BER=3.750000e-01 when P=7.000000e-02
some bits flipped & needed error correction,your BER=2.500000e-01 when P=8.000000e-02
some bits flipped & needed error correction,your BER=3.750000e-01 when P=9.000000e-02
some bits flipped & needed error correction,your BER=2.500000e-01 when P=1.000000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=1.100000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=1.200000e-01
some bits flipped & needed error correction,your BER=1.250000e-01 when P=1.300000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=1.400000e-01
some bits flipped & needed error correction,your BER=1.250000e-01 when P=1.500000e-01
some bits flipped & needed error correction,your BER=1.250000e-01 when P=1.600000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=1.700000e-01
some bits flipped & needed error correction,your BER=1.250000e-01 when P=1.800000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=1.900000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=2.000000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=2.100000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=2.200000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=2.300000e-01
Correct! your BER=0 when P=2.400000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=2.500000e-01
some bits flipped & needed error correction,your BER=2.500000e-01 when P=2.600000e-01
```



References

1. Book:

POLAR CODES FOR ERROR CORRECTION, ANALYSIS AND DECODING ALGORITHMS.

2. Videos and Links:

- https://youtu.be/D_gadv-V-MQ
- <https://youtu.be/Vj-1PwUNBek>
- <https://www.youtube.com/watch?v=S3bZOSINFGo>
- <https://youtu.be/PNBFUV-ZetY>
- <https://github.com/cihatkececi/ChannelCodingProjectList#polar-codes>

The End.. Thanks to Allah !

Any Questions?

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