

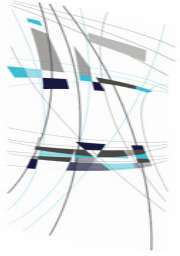
Methods and tools to optimize the trade-off “performance versus complexity” of error control codes architectures.

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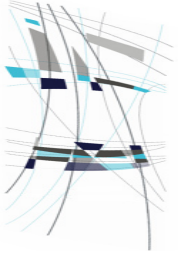
Telecom ParisTech
4 octobre 2012





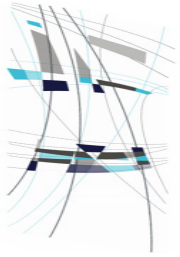
OUTLINE

- Motivation
- Reduced Monte-Carlo Simulation
- Entropy Inspired Distance
- Hardware Emulation
- Conclusion



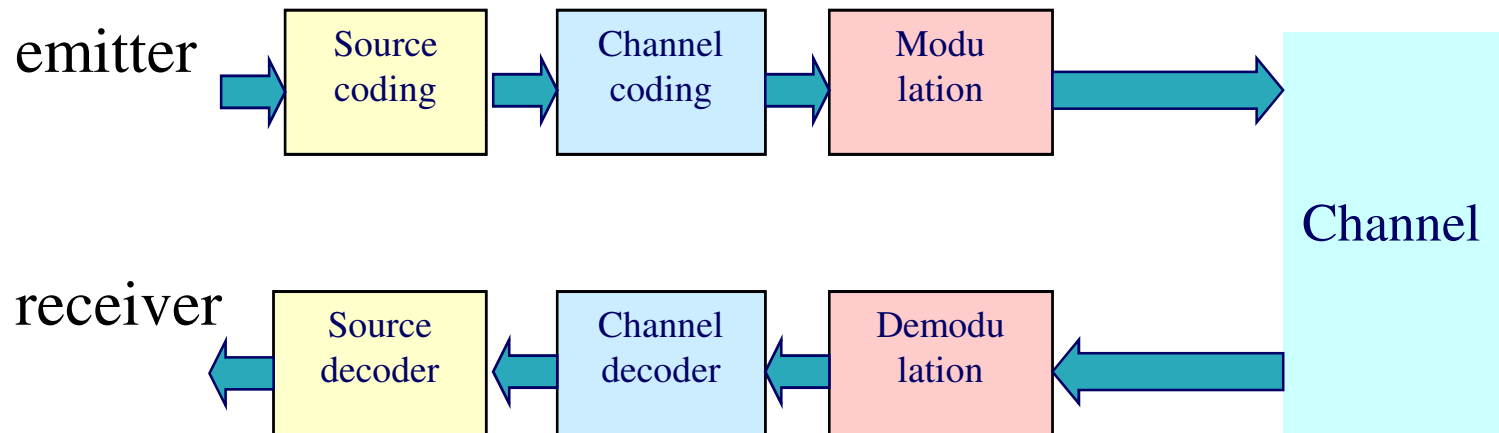
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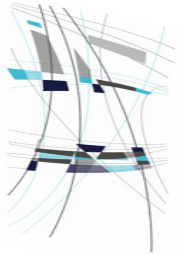


Motivation

Design of a communication system...



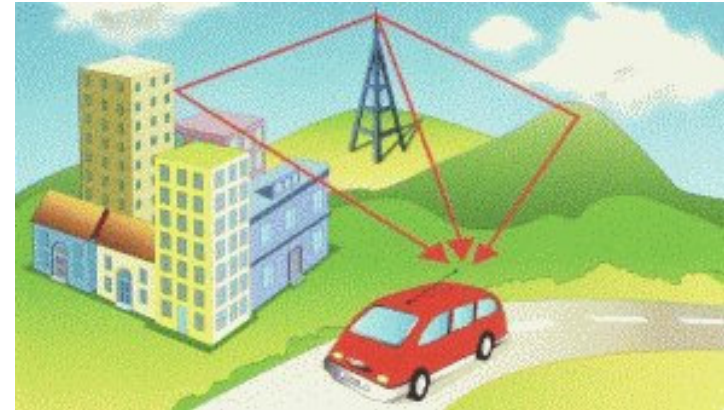
...find the best complexity-performance trade-off



Motivation

Performance:

- **BER**
- Jammer rejection
- time of synchronization...
- ...

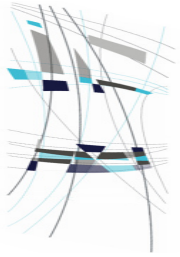


Complexity:

- **area, power dissipation**
- time to market
- ...

algorithm
ADC resolution,
sampling frequency,
fixed precision

A very complex problem...



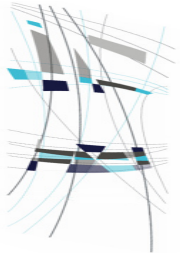
Monte-carlo simulation

- **Formal expression of the BER: refer to Proakis**
- **In practice, estimation of the BER using Monte-Carlo simulation**
 - Software model of emitter, channel, receiver
 - Emulation of the transmission of N bits
 - Estimation of the BER as Nb_errors/N

VERY EFFICIENT... BUT

TIME AND CPU CONSUMING:

Bit Error Rate of 10^{-6} (+-3%) requires 10^9 bits.



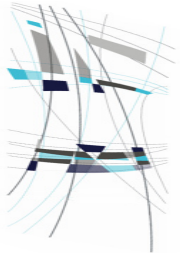
Two separate problems

- **1) The code design problem.**

- Theoretical bound
- Weight estimation using impulse method and its derivative
- EXIT CHART Tools.

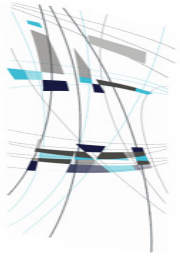
Let's start from a C reference model in floating point (ideal decoder).

- **2) Evaluate performance of "hardware decoder" vs "ideal decoder"**



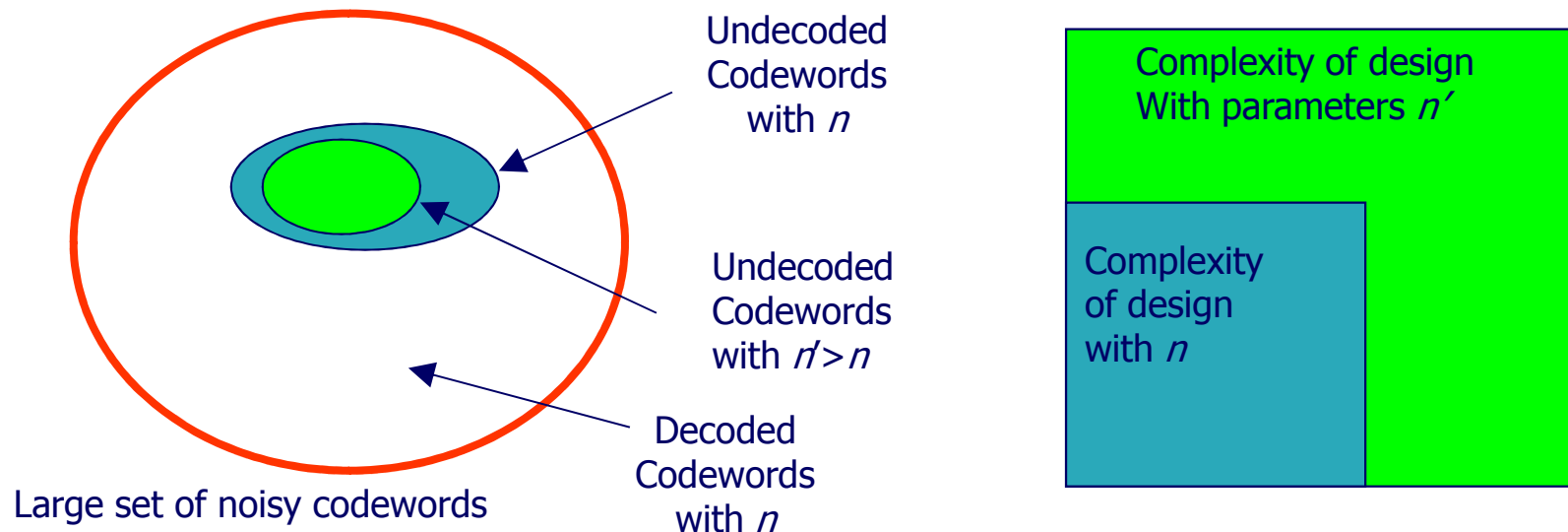
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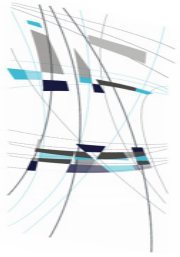


REDUCED MONTE CARLO SIMULATION

- Let us assume that we want to find the best trade-off of an algorithm parameter n . Assuming that:
 - ◇ 1) Decoder complexity is an increasing function of n .
 - ◇ 2) Performance is a strictly increasing function, i.e. if a noisy codeword is decoded with parameter n , then the codeword is decoded with parameter $n' > n$.

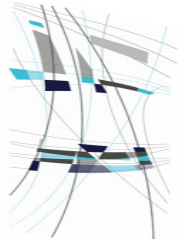


In that case, RMCS can be efficient



REDUCED MONTE CARLO SIMULATION

- Step 1: Run Monte-Carlo simulation with the “worst-case” configuration. Store the undecoded codeword in the set S ;
- Step 2: Re-run decoder with better parameters only in the subset S to evaluate performances ;
- Step 3: Perform a classical MCS in order to verify the validity of hypotheses 1 for some configurations.

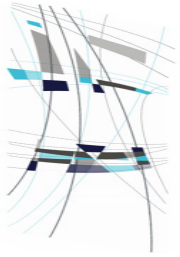


EXAMPLE ON NON-BINARY LDPC GF(64) WITH EMS (parameters n).

10^7 frames
(FER $5 \cdot 10^{-3}$)

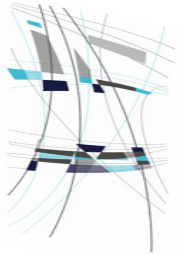
	<i>it</i> = 8	<i>it</i> = 10	<i>it</i> = 12	<i>it</i> = 14	<i>it</i> = 16
<i>n</i> = 8	49693	13535	5404	2993	2105
<i>n</i> = 10	12340	2569	815	414	291
<i>n</i> = 12	4763	893	270	109	62
<i>n</i> = 14	2419	467	163	72	42
<i>n</i> = 16	1349	223	56 71	22	13 22
<i>n</i> = 18	835	151	25	10	4
<i>n</i> = 20	592	116	17	7	6
<i>n</i> = 22	455	103	14	4	3
<i>n</i> = 24	373	86	14 21	5	4 8
<i>n</i> = 26	321	91	16	4	3
<i>n</i> = 28	262	54	9	5	3
<i>n</i> = 30	235	52	8	4	3
<i>n</i> = 32	228	52	7 19	4	2 8

Save 3 months of simulation



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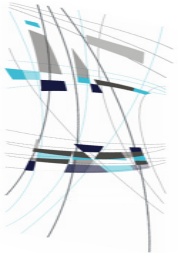


ENTROPY INSPIRED DISTANCE

- OBSERVATION : FROM APP TO BER, A HUGE QUANTITY OF INFORMATION IS SUPPRESSED.

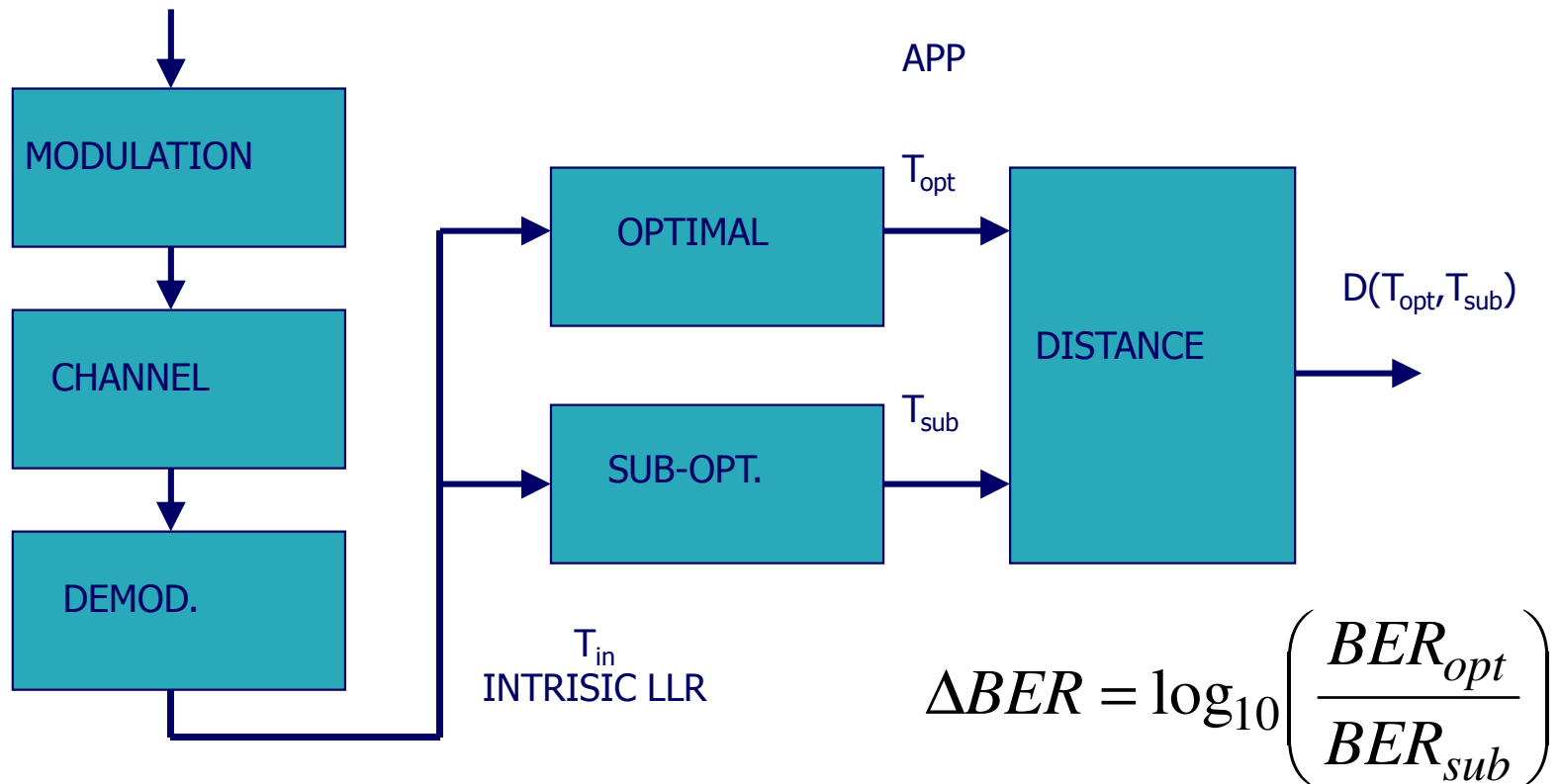
QUESTION 1 : CAN WE EXPLOIT THIS INFORMATION ?

QUESTION 2 : HOW ?

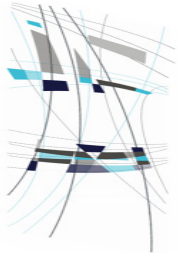


DISTANCE BETWEEN OPTIMAL/SUB-OPT.

SET OF M CODEWORDS OF SIZE P ($N=M \times P$ Q -ary symbols)



FIND $D(T_{opt}, T_{sub})$ RELATED TO ΔBER



QUESTION : WHAT DISTANCE TO CHOOSE...

- LET $(p_k^0, p_k^1, \dots, p_k^{Q-1})$ AND $(\tilde{p}_k^0, \tilde{p}_k^1, \dots, \tilde{p}_k^{Q-1})$ BE THE APP OF THE k^{th} DECODED SYMBOL FOR OPTIMAL AND SUB-OPTIMAL DECODERS.

$$\sum_{i=0}^{Q-1} p_k^i = 1$$

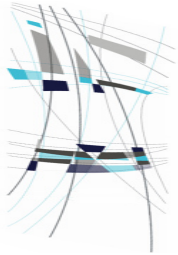
$$\sum_{i=0}^{Q-1} \tilde{p}_k^i = 1$$

- FIRST ATTEMPT : L1 MORM

$$L_1 = \sum_{k=0}^{N-1} \left(\sum_{i=0}^{Q-1} |p_k^i - \tilde{p}_k^i| \right)$$

EXPERIMENTAL RESULT: NO CLEAR CORRELATION BETWEEN
L1(Tsub, Topt) AND Δ BER.

PROPOSED EXPLANATION: $p = 10^{-6}$ AND $p = 10^{-12}$ ARE REALLY DIFFERENT FROM
A DECODING PERSPECTIVE



QUESTION : WHAT DISTANCE TO CHOOSE...

- LET $(p_k^0, p_k^1, \dots, p_k^{Q-1})$ AND $(\tilde{p}_k^0, \tilde{p}_k^1, \dots, \tilde{p}_k^{Q-1})$ BE THE APP OF THE k^{th} DECODED SYMBOL FOR OPTIMAL AND SUB-OPTIMAL DECODERS.

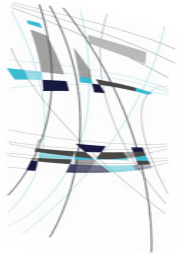
$$\sum_{i=0}^{Q-1} p_k^i = 1$$

$$\sum_{i=0}^{Q-1} \tilde{p}_k^i = 1$$

- SECOND ATTEMPT : L1-log MORM
$$L_1 = \sum_{k=0}^{N-1} \left(\sum_{i=0}^{Q-1} -\log |p_k^i - \tilde{p}_k^i| \right)$$

EXPERIMENTAL RESULT: NO CLEAR CORRELATION BETWEEN L1-log(T_{sub} , T_{opt}) AND ΔBER .

PROPOSED EXPLANATION: $p=0.7$ AND $p=0.9$ ARE REALLY DIFFERENT FROM A DECODING PERSPECTIVE AND $-\log(0.2) \ll -\log(10^{-5})$



QUESTION : WHAT DISTANCE TO CHOOSE...

- LET $(p_k^0, p_k^1, \dots, p_k^{Q-1})$ AND $(\tilde{p}_k^0, \tilde{p}_k^1, \dots, \tilde{p}_k^{Q-1})$ BE THE APP OF THE k^{th} DECODED SYMBOL FOR OPTIMAL AND SUB-OPTIMAL DECODERS.

$$\sum_{i=0}^{Q-1} p_k^i = 1$$

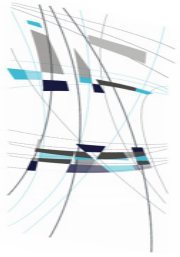
$$\sum_{i=0}^{Q-1} \tilde{p}_k^i = 1$$

- THIRD ATTEMPT : KULLBACK-LEIBLER DIVERGENCE

$$KL = \sum_{k=0}^{N-1} \left(\sum_{i=0}^{Q-1} -p_k^i \log(p_k^i / \tilde{p}_k^i) \right)$$

EXPERIMENTAL RESULT: NO CLEAR CORRELATION BETWEEN
KL(Tsub, Topt) AND Δ BER.

PROPOSED EXPLANATION: *NO EXPLANATION...*

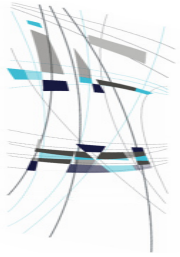


ENTROPY INSPIRED DISTANCE (EID)

- ENTROPY OF A DISTRIBUTION : $H(X) = \sum_{i=0}^{Q-1} -p_k^i \log(p_k^i)$
- PROPERTIES : $H(X) \geq 0$, $H(X) = \log(Q)$ for $p^i = 1/Q$, $i=0..Q-1$.

$$EID = \sum_{k=0}^{N-1} \left(\sum_{i=0}^{Q-1} -|p_k^i - \tilde{p}_k^i| \log(|p_k^i - \tilde{p}_k^i|) \right)$$

EXPERIMENTAL RESULT: USEFULL TOOLS TO PREDICT THE Δ BER !!!



PROPERTIES OF EID

- IF $\text{Arg max}(p^i) = \text{Arg max}(\tilde{p}^i)$

THEN EID IS A DISTANCE, I.E.

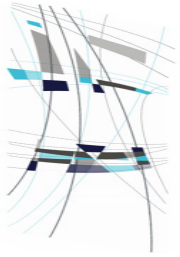
$$\text{EID}(X, X') = 0 \Rightarrow X = X' \quad (\text{note that } \text{EID}([0, 0, 0, 1], [1, 0, 0, 0]) = 0)$$

$$\text{EID}(X, X') = \text{EID}(X', X)$$

$$\text{EID}(X, Y) + \text{EID}(Y, Z) \geq \text{EID}(X, Z)$$

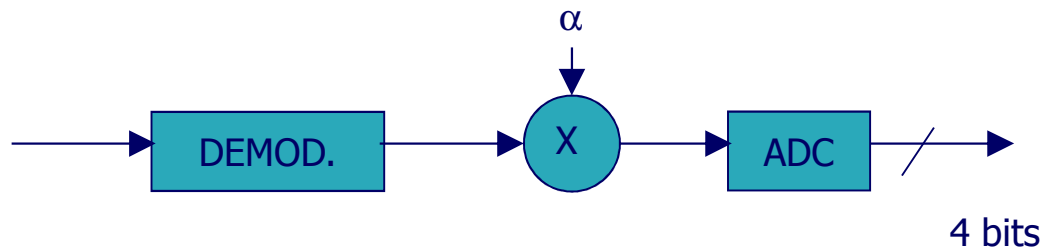
AT THE MOMENT, IT WAS PROVEN FOR $Q=2$ UP TO 12.

...STILL NEED A PROOF FOR $Q > 12$



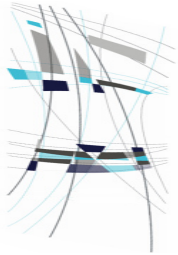
SIMULATION RESULT : CASE 1

- DUO BINARY TURBO-CODE
- SEARCH FOR THE OPTIMAL QUANTIZATION FACTOR



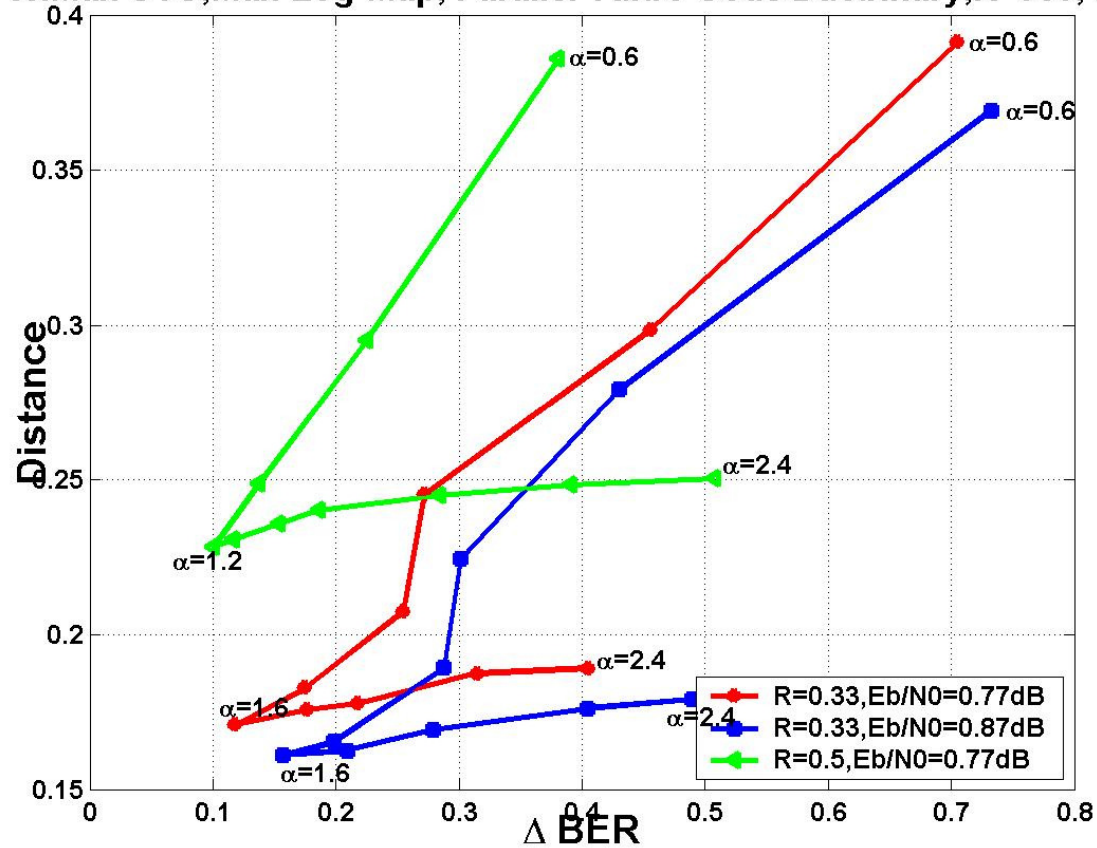
- IF α too small => ERASURE
- IF α too big => SATURATION (HARD DECODER)

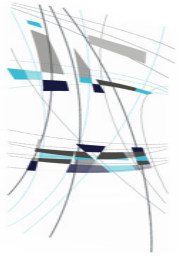
THERE IS AN OPTIMAL VALUE OF α



SIMULATION RESULT : CASE 1

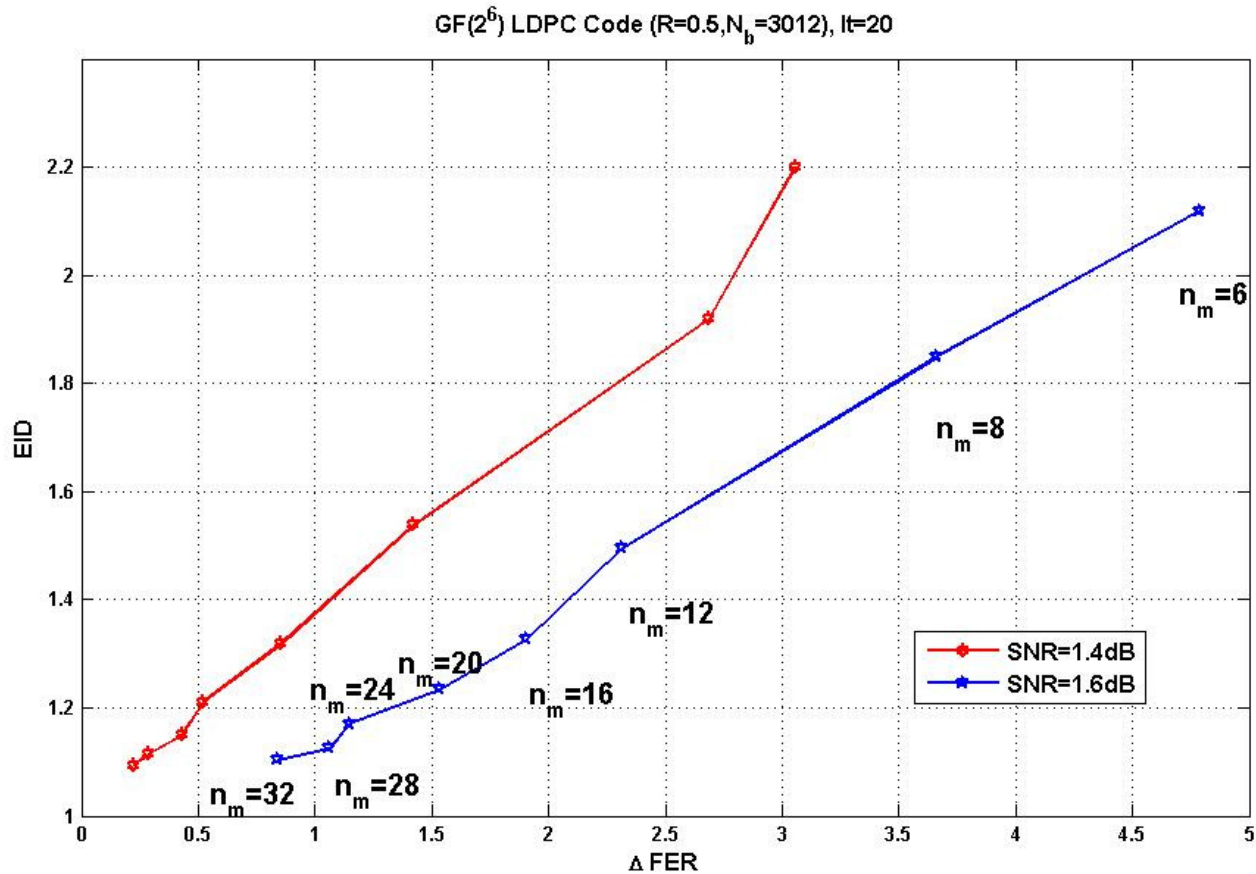
WiMax CTC,Max-Log-Map, Parallel Turbo Code Duobinary,K=960, It=7

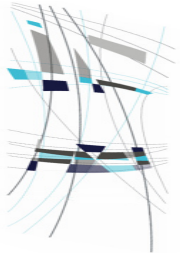




SIMULATION RESULT : CASE 2

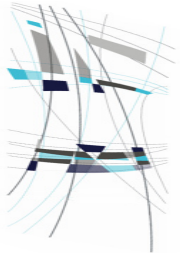
- **NON BINARY LDPC DECODER ON GF(64) USING EMS ALGORITHM**





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Software simulation

Three methods to reduce the simulation time:

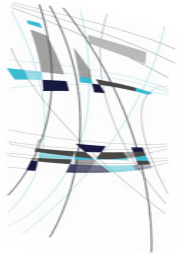
a) code optimization

b) powerful computers

c) parallel computing

(One Mbps for a turbo-decoder with a cluster of 16 PCs)

also use hardware emulation



Current methodology

Software

Algorithm

C programs

Compilation

Validation/optimization
with long simulations

Fix specifications

Hardware

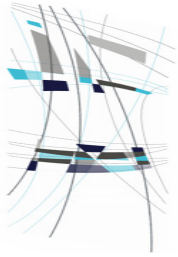
VHDL programs

Synthesis, place and route
operations

Validation

Final prototype





Proposed methodology

Software

Algorithm

C programs

Compilation

Validation/optimization

Fix algorithm + Set of non-specified parameters

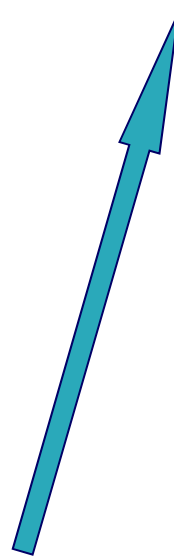
Hardware

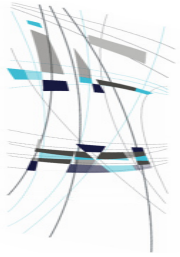
Generic VHDL programs, IP

Synthesis, place and route operations (on FPGA)

Hardware simulation/validation

Final prototype





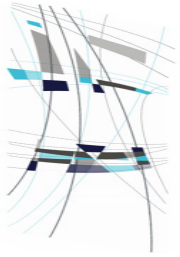
Channel emulation

Type of communication channel:

- AWGN
- Rice
- Rayleigh
- ...

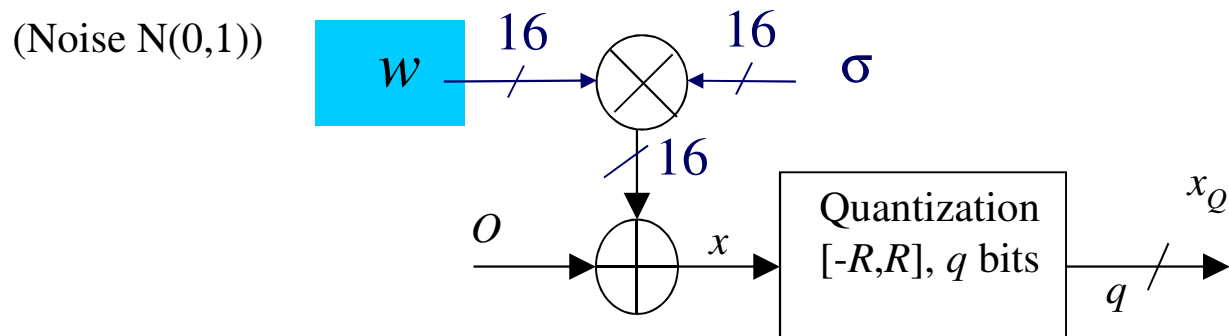
All those channels can be derived from Gaussian Noise (with ARMA filter, non-linear operators).

=> Need a White Gaussian Noise Generator (WGNG)

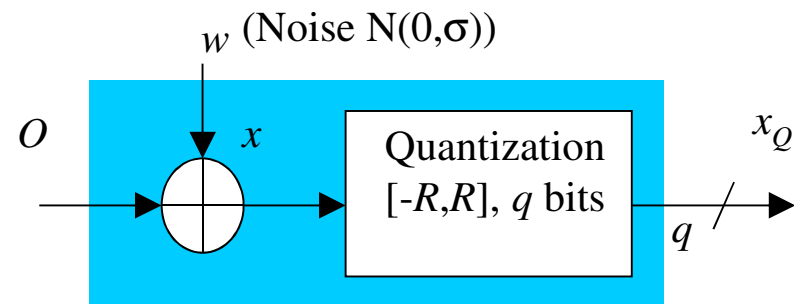


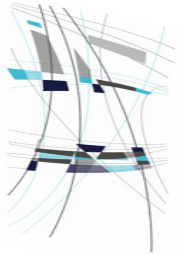
New idea

- Straight method: Direct emulation of the AWGN channel.

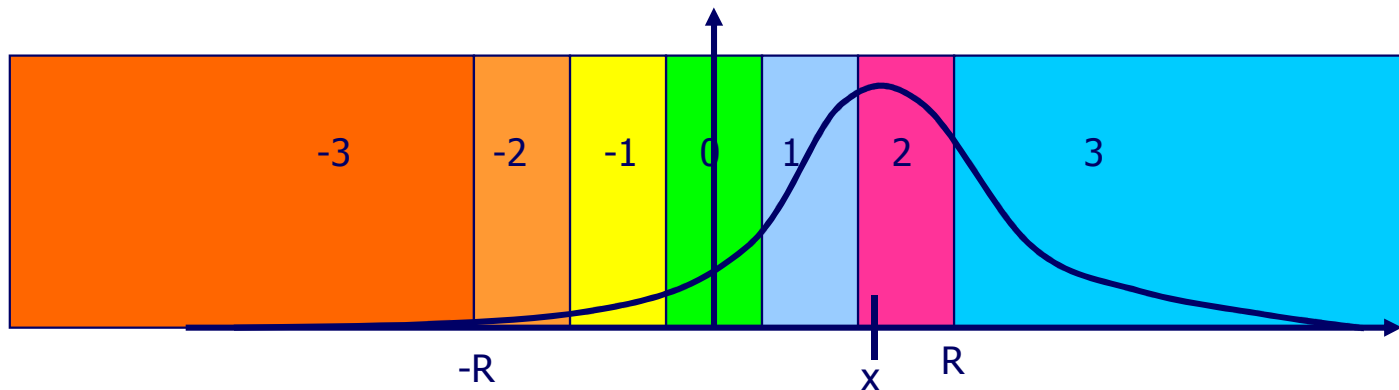
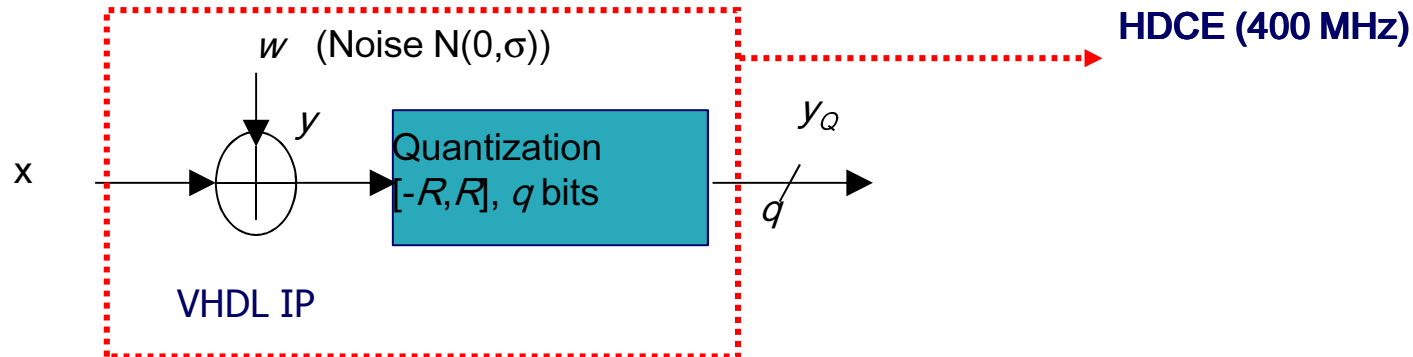


- New method: emulate channel + quantization.

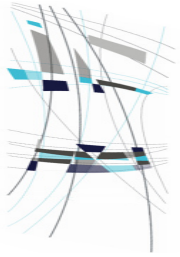




DISCRETE HARDWARE CHANNEL EMULATOR

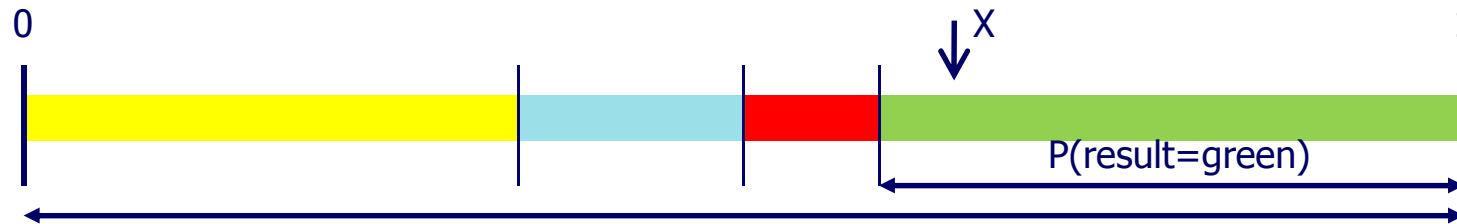


- **FOR A GIVEN x , σ and R , y_q is EQUIVALENT TO A DISCRETE R.V.**



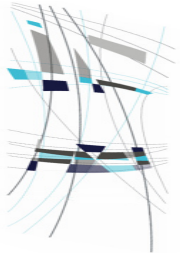
Principle of generation of a discrete random variable.

- 1D method
 - ◇ Draw a random number between $[0,1]$ and see where it falls



(Discrete random variable with $N=4$ values, represented by color)

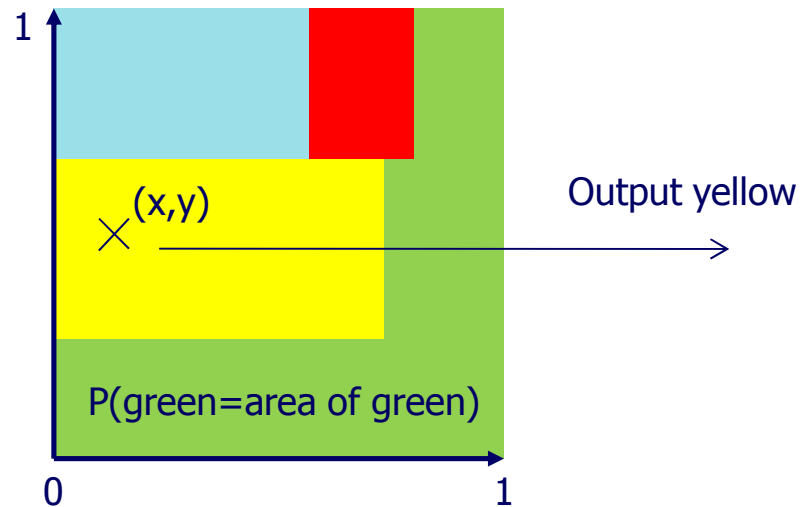
- Complex to implement: the value x needs to be compared to all the thresholds ($N-1$ comparisons).
- Solution : go towards 2D.



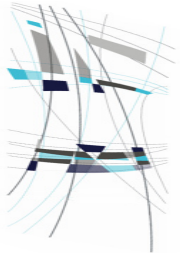
Principle of generation of a discrete random variable.

- 2D method

- ◇ Principle: generate two random variables x, y between $[0,1]$ and see where it falls.

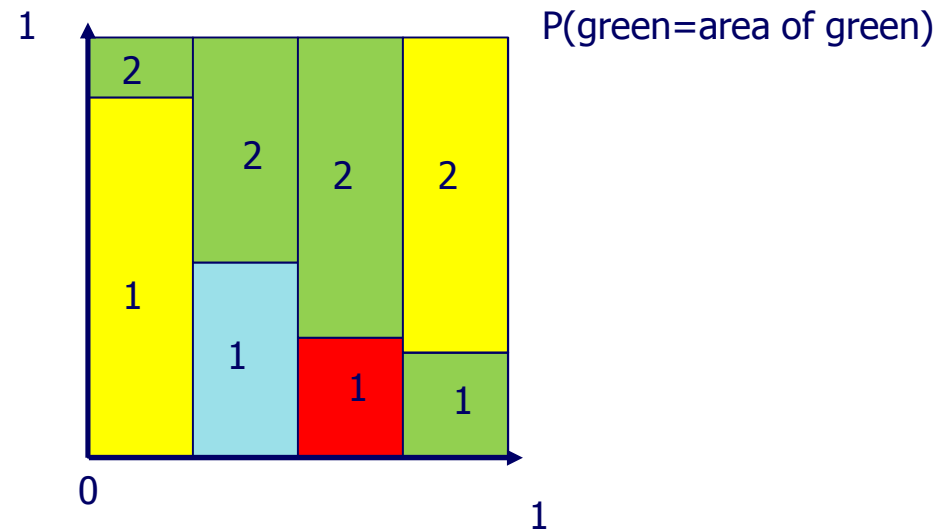


- ◇ No simplification \Rightarrow need a structure.

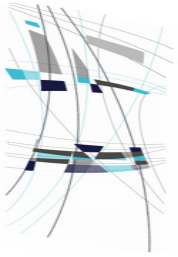


Principe of generation of a discrete random variable.

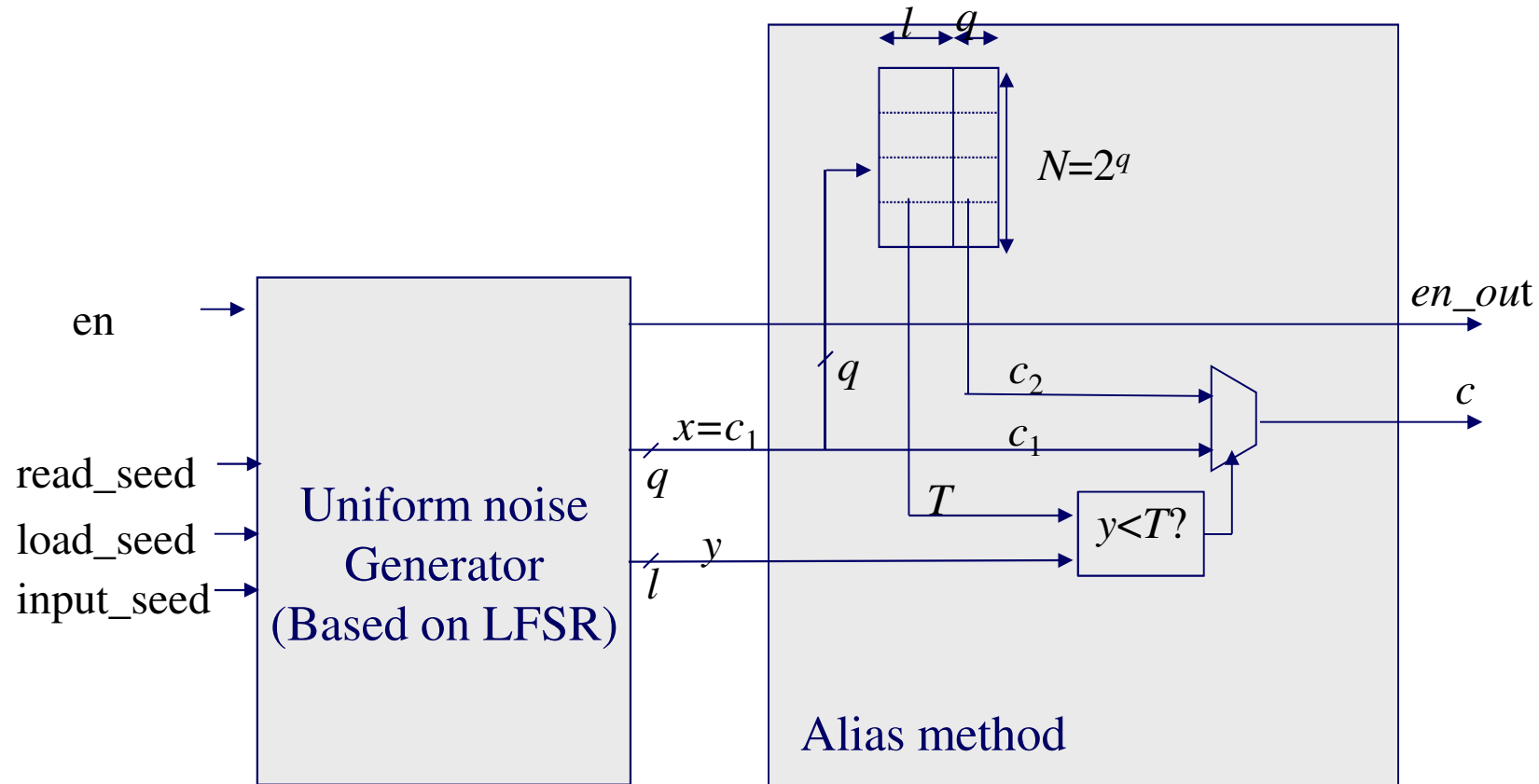
- 2D method: with x , select a column, with y , select color 1 or 2 of the column.

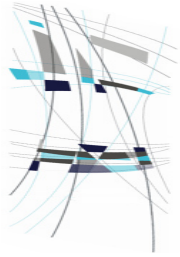


- ◇ X : random number between 1 to N to select color 1 (c_1), then, read color 2 (c_2) and the threshold T in a memory and compare y to t to select c_1 or c_2 .

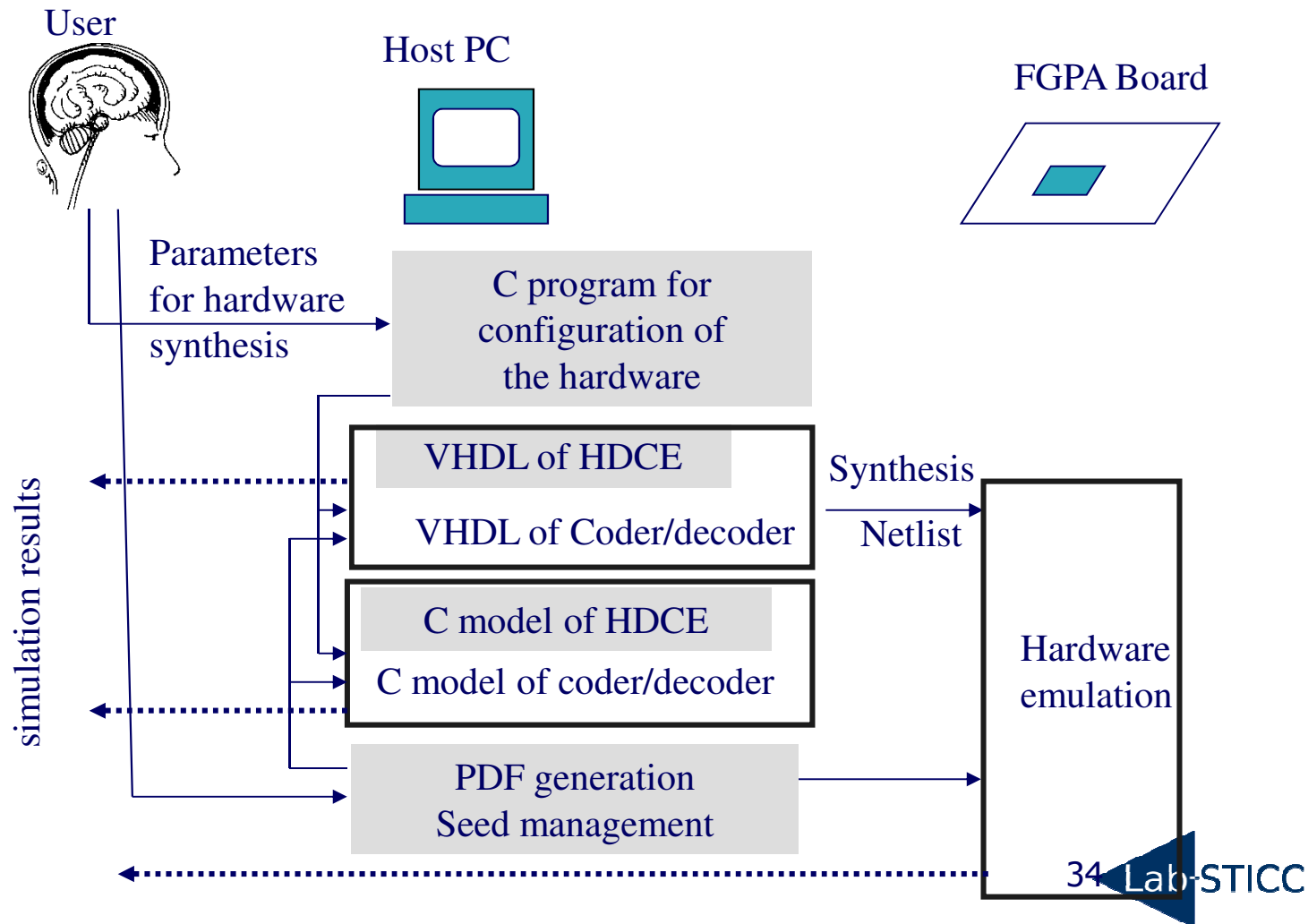


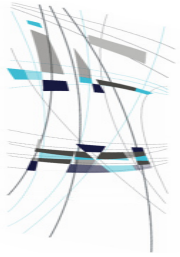
Hardware Discrete Channel Emulator.





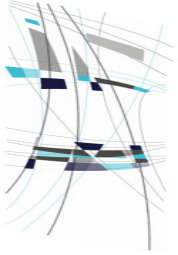
Coherent set of simulation/emulation





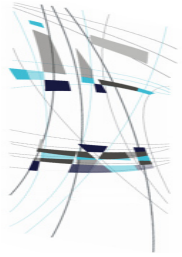
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CONCLUSION

- PROPOSITION OF 2 METHODS TO AVOID MONTE-CARLO SIMULATION :
 - ◇ Reduced Monte Carlo Simulation
 - ◇ Entropy Inspired Distance
- THOSE TWO METHODS ALLOW TO TRADE OFF SPEED VS PRECISION.
=> NEED TO BE VALIDATED BY A DIRECT MONTE-CARLO
 - ◇ If you have a generic VHDL, can use HDCE to replace software simulation by hardware simulation (factor of 1000 in speed).

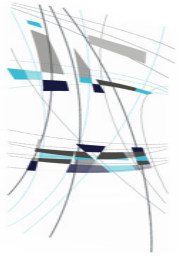


Conclusion



M.C. Escher (1898 - 1972)

Designing an iterative decoder is still an art...



PUBLICATION

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