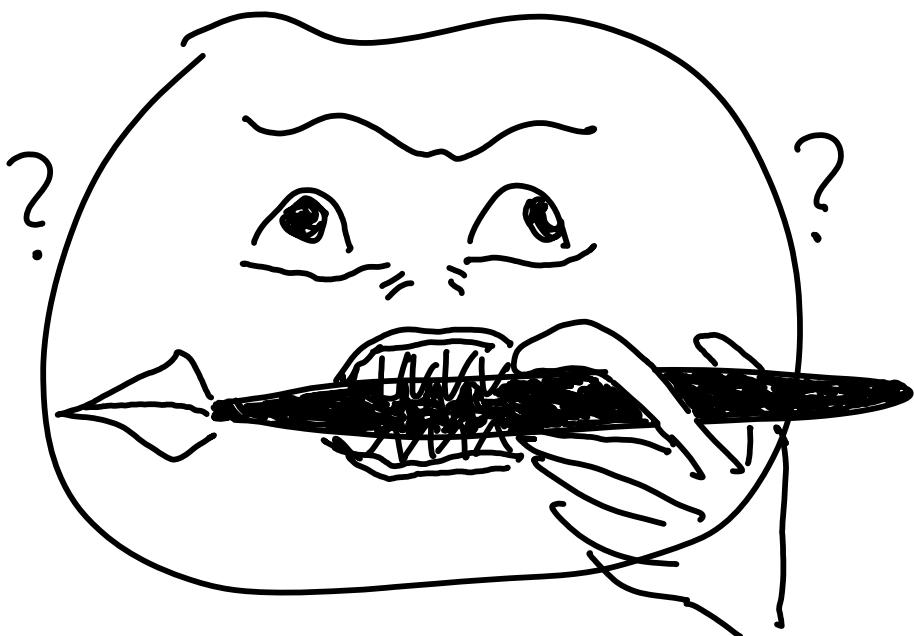


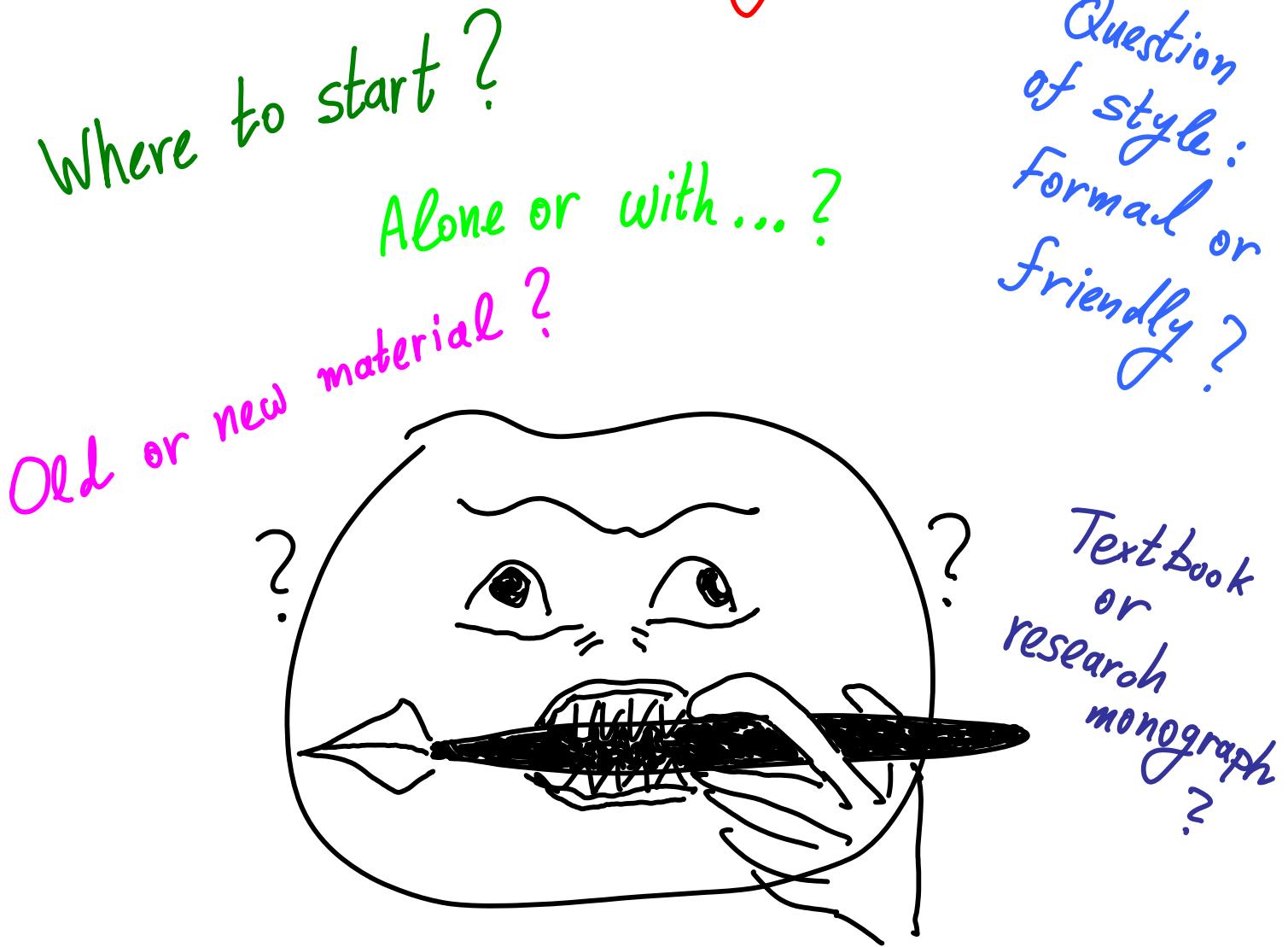
# Writer's Misery

[לֹא כִּי בְּרֵבָה יְנַדֵּג] "וְאֵנוֹ כִּי כִּי יְמַלֵּךְ מִזְרָחֶיךָ"

(≈ Jealousy among writers increases wisdom)



# Writer's Misery



Where to start?

Alone or with...?

Old or new material?

Question  
of style:  
Formal or  
friendly?

Textbook  
or  
research  
monograph?

Whose notation to use? How many figures?

What do I (really) want to say?

Where / When  
to finish? ...

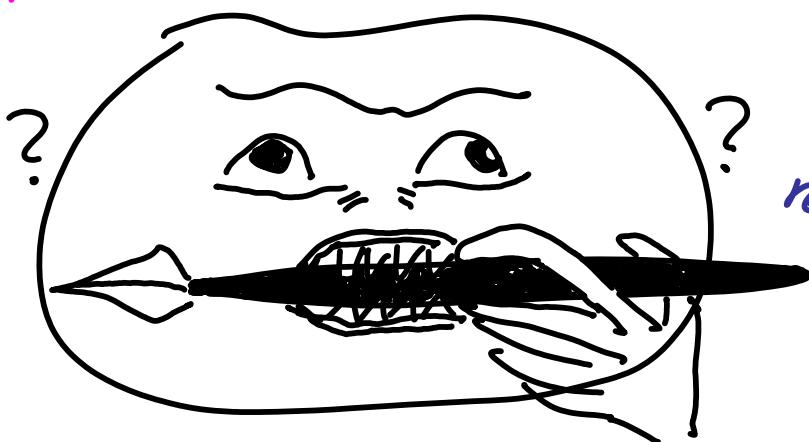
Competition...?

# Writer's Misery —

Where to start?

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Old or new?



Question  
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Formal or  
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?

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What do I want to say?

Where / When  
to finish? ...

Competition...?

Why did I start all this??  
... . . .

# Complexity Theory & Statistics

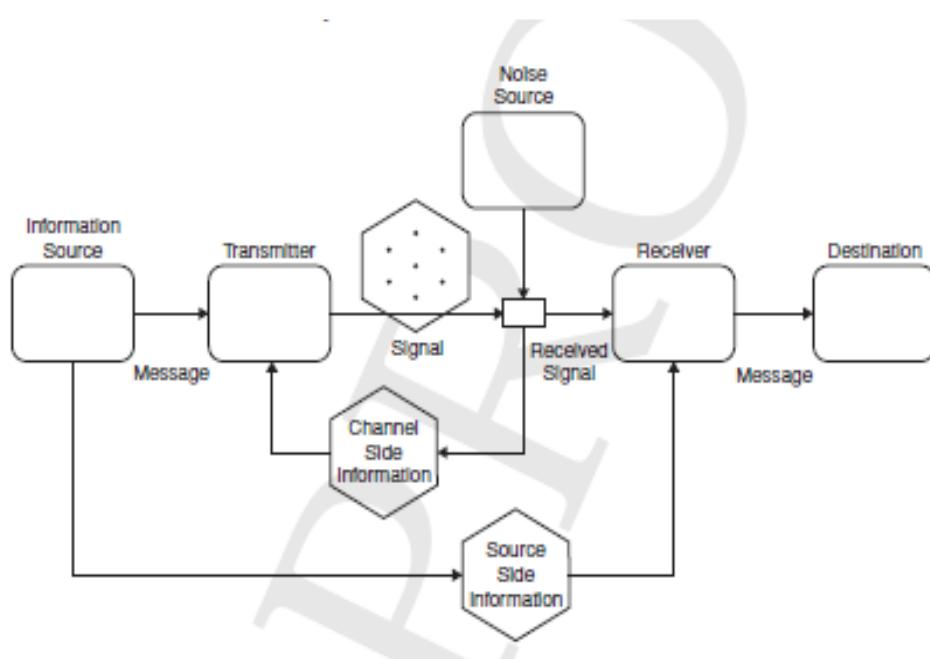
- \* writing complexity =  $1+2+\dots+n = \underline{\underline{O(n^2)}}$   
where  $n = 422$  pages ...
- \* 4 + 1 years (writing: March 2009 ÷ Oct. 2013)  
editing + printing: one more year
- \* 16 drafts (4 years, 1 every 3 months)
- \* 5 deadline extensions with publisher
- \* 13 chapters + 1 Appendix,  
(originally 10 + 4 chapter splits - 1 cancelled)  
  
134 figures, — examples  
— definitions, — theorems  
— references, — index terms

# Cover Page designs ...

## Lattice Coding for Signals and Networks



Ram Zamir

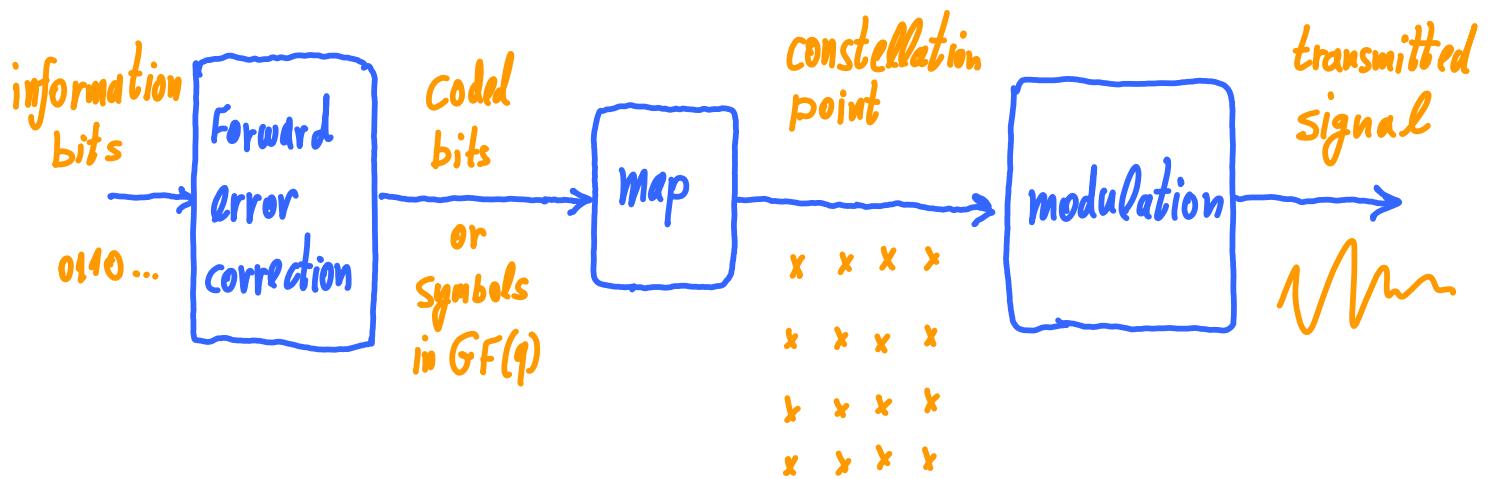


Many Cons , What about Pros ?

- ⑥ Beauty of Lattices
- ⑥ History
- ⑥ Circumstances
- ⑥ Teaching (basis for a course)
- ⑥ Anecdotes , Future ...

# Lattice Codes as an "Alternative Language" for Digital Communication

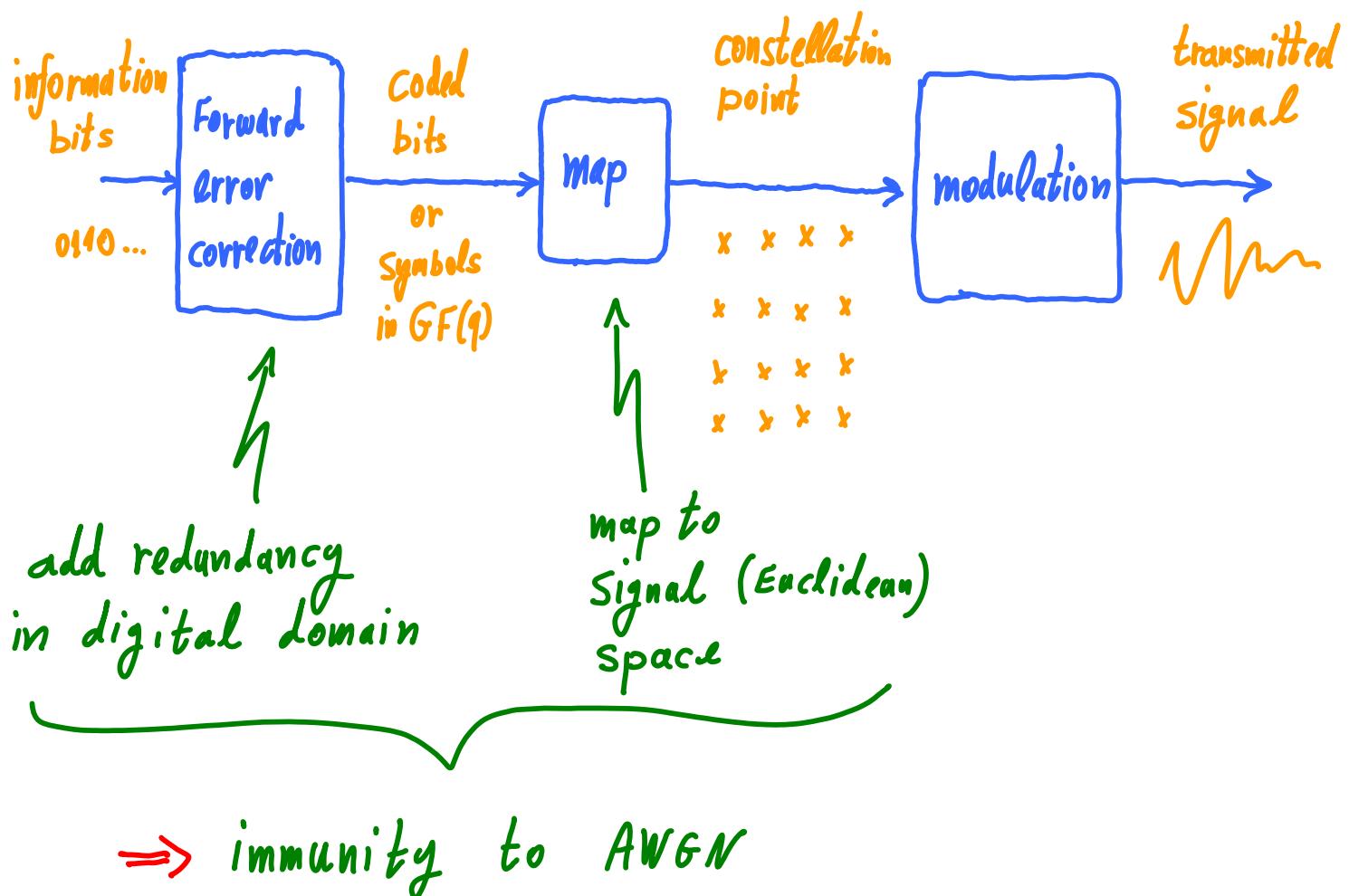
## 1. Error correction in signal space (AWGN channel):



Block diagram of a digital modulator

# Lattice Codes as an "Alternative Language" for Digital Communication

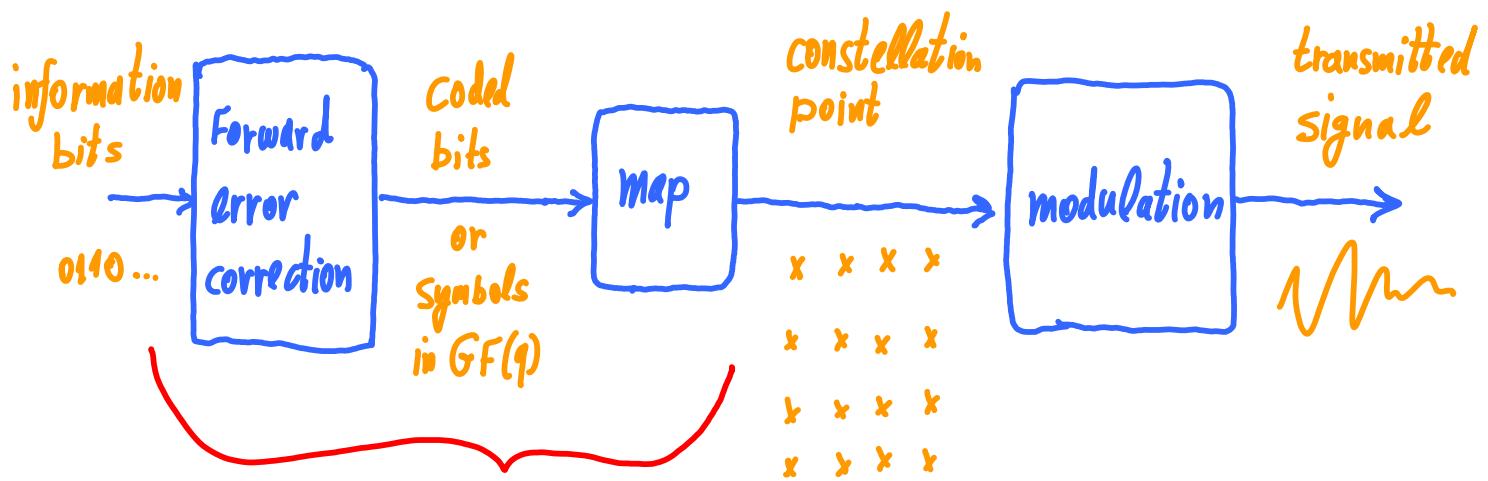
## 1. Error correction in signal space (AWGN channel):



Block diagram of a digital modulator

# Lattice Codes as an "Alternative Language" for Digital Communication

1. Error correction in signal space (AWGN channel):



Replace by a lattice code:

info bits  $\rightarrow \mathcal{L}$

Block diagram of a digital modulator

# What is a lattice?



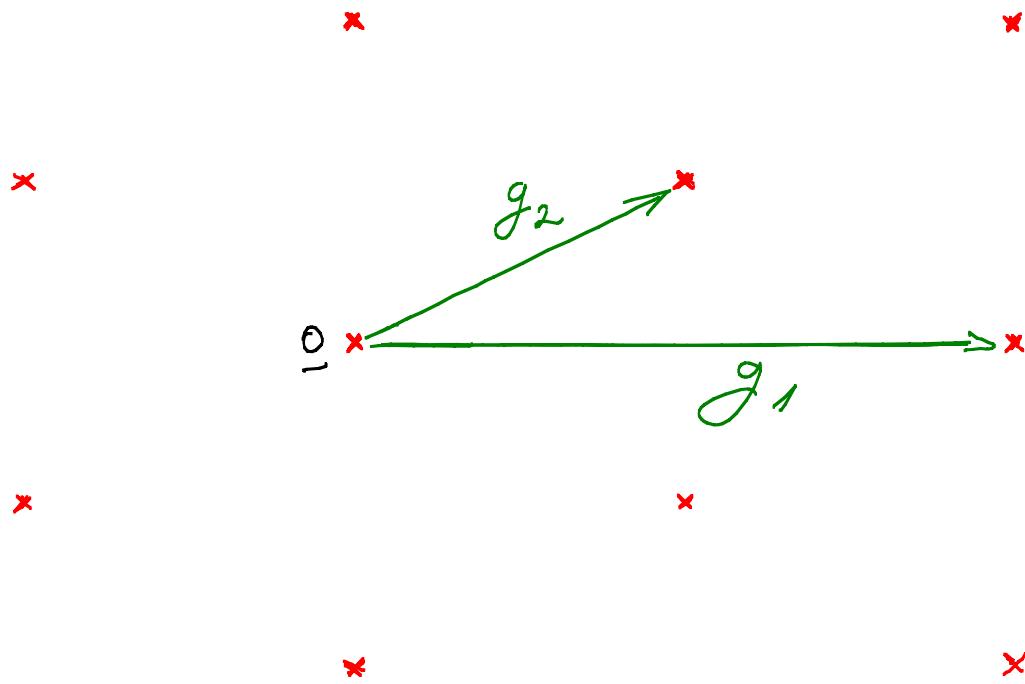
\* Picture editing  
by Kesseun Zamir

## $n$ -dimensional lattice : Definition

Let  $\underline{g}_1, \dots, \underline{g}_n$  - linearly independent vectors in  $\mathbb{R}^n$

$$\underline{\underline{G}} = \left( \begin{array}{c|c|c|c} \underline{g}_1 & | & \dots & | & \underline{g}_n \end{array} \right) = \text{generator matrix}$$

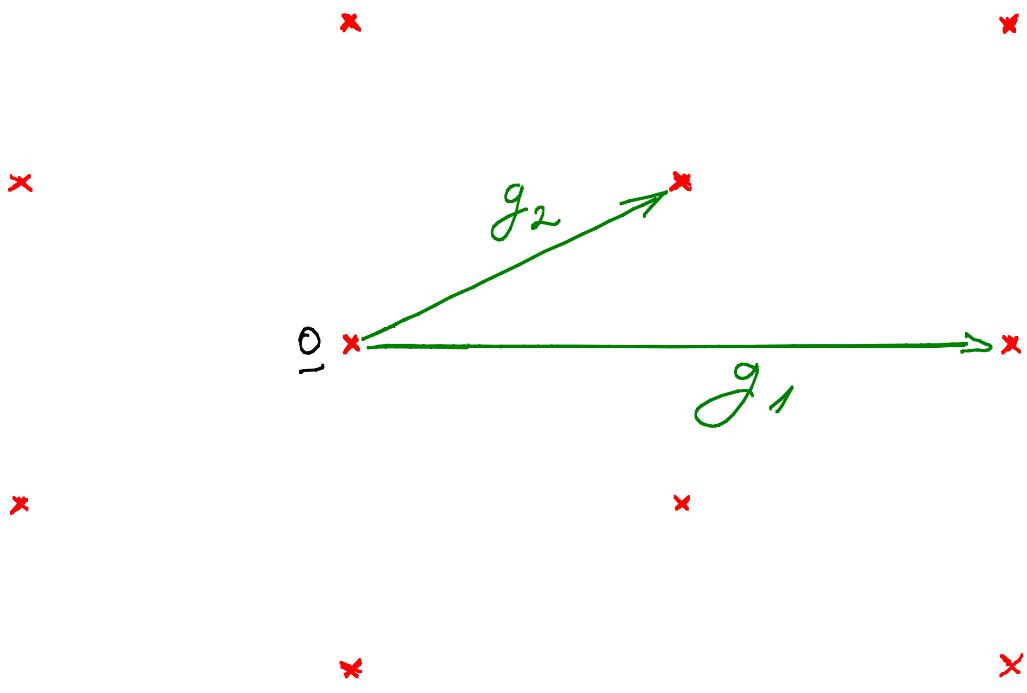
$$\begin{aligned} \mathcal{N}(G) &= \left\{ i_1 \cdot \underline{g}_1 + \dots + i_n \cdot \underline{g}_n : i_1, \dots, i_n \in \mathbb{Z} \right\} \\ &= \left\{ \underline{\underline{G}} \cdot \underline{i} : \underline{i} \in \mathbb{Z}^n \right\} \\ &= \underline{\underline{G}} \cdot \mathbb{Z}^n \end{aligned}$$



## $n$ -dimensional lattice: Definition

Let  $\underline{g}_1, \dots, \underline{g}_n$  - linearly independent vectors in  $\mathbb{R}^n$

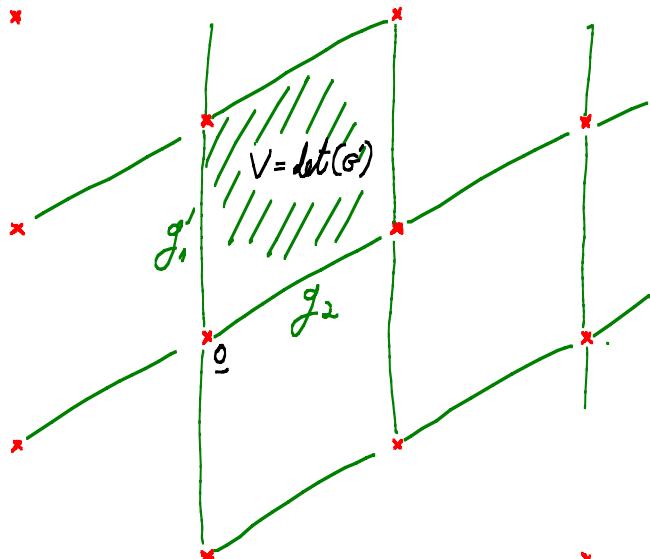
$$\underline{G} = \begin{pmatrix} \underline{g}_1 & | & \dots & | & \underline{g}_n \end{pmatrix} = \text{generator matrix}$$



Linearity:

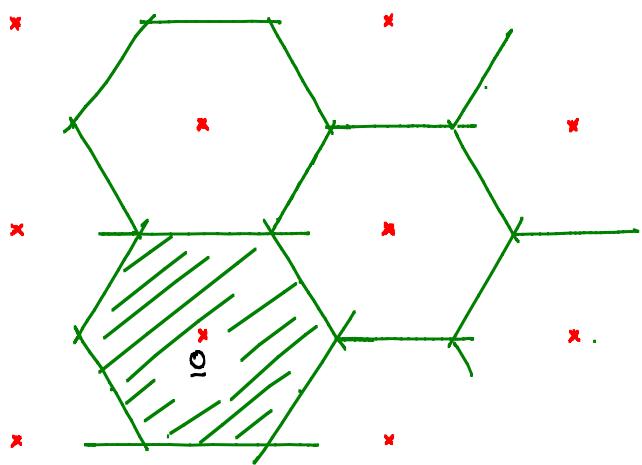
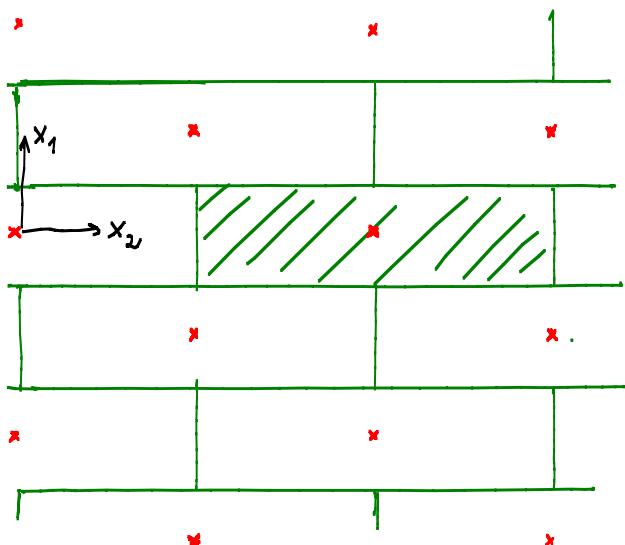
$$\lambda_1, \lambda_2 \in \mathbb{Z} \Rightarrow \lambda_1 \pm \lambda_2 \in \mathbb{Z}$$

# Partitions, Fundamental Cells



Other Basis  $\Rightarrow$   
Other Parallelepiped  
 $\Rightarrow$  Cell Volume  $V$  is  
invariant of partition

Sequential Quantization



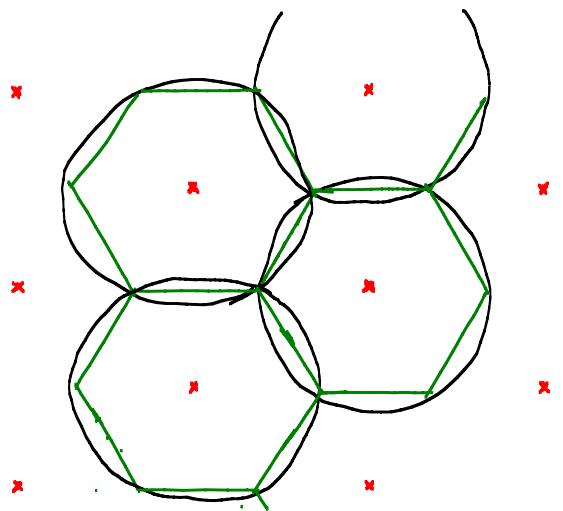
Voronoi Partition

$$P_0 = \left\{ x : \|x\| \leq \|x - l_i\| \right\}$$

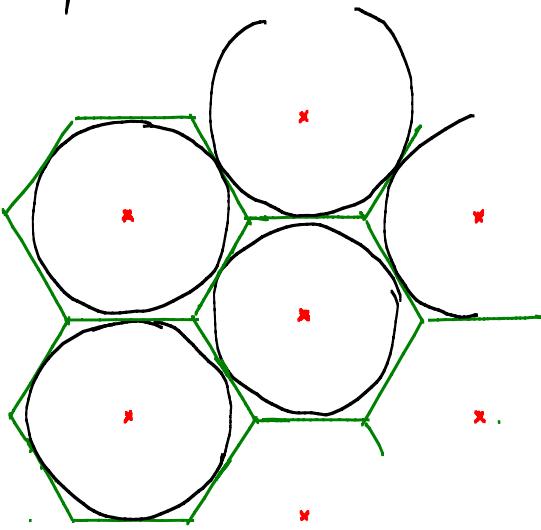
$\forall l_i \in L$

# Covering, Packing, kissing Number & More ...

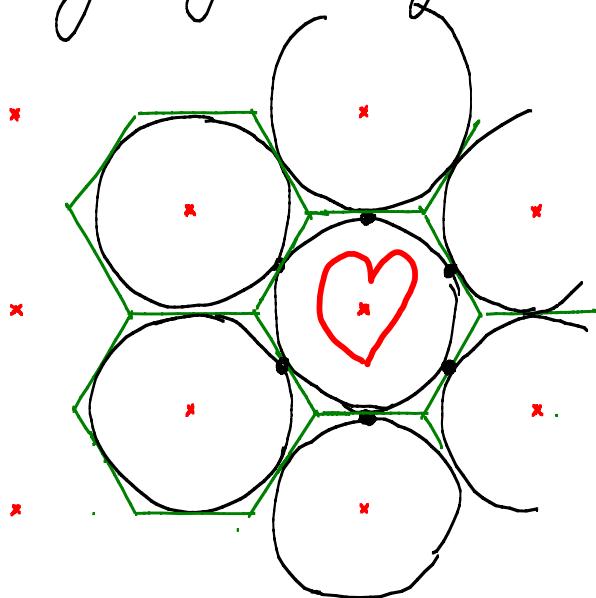
Covering  $\mathbb{R}^n$  with (few) Spheres



Packing (many) spheres in  $\mathbb{R}^n$



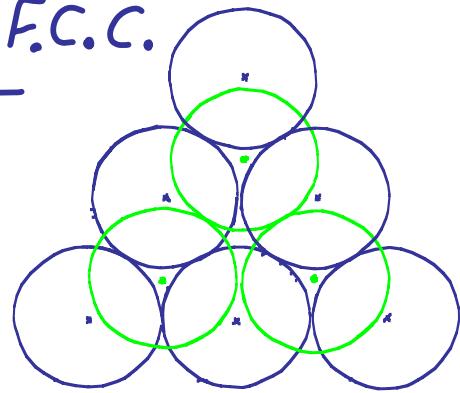
Kissing by (many) Spheres



&  
good arrangements  
for quantization  
and AWGN channel  
Coding

Not an "All-Purpose" Lattice!

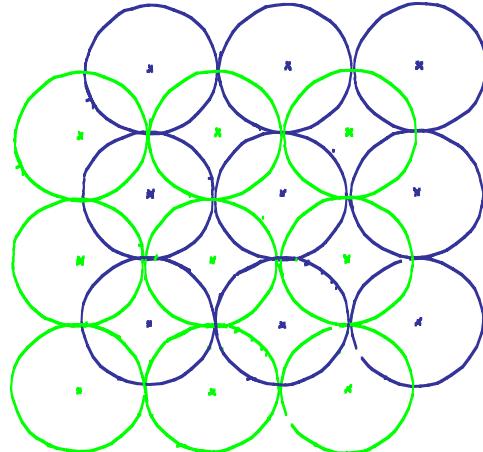
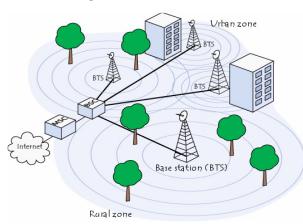
\* Best 3-dim Packing: F.C.C.



each layer = hexagonal  
layers are staggered

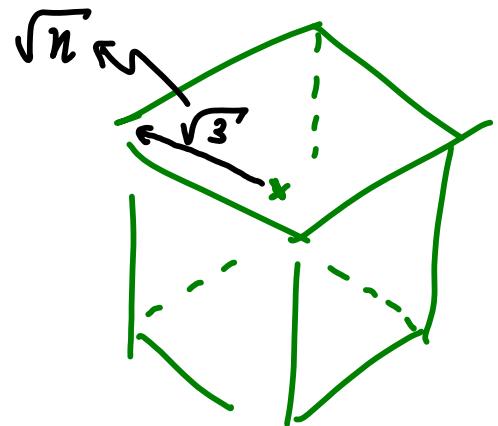
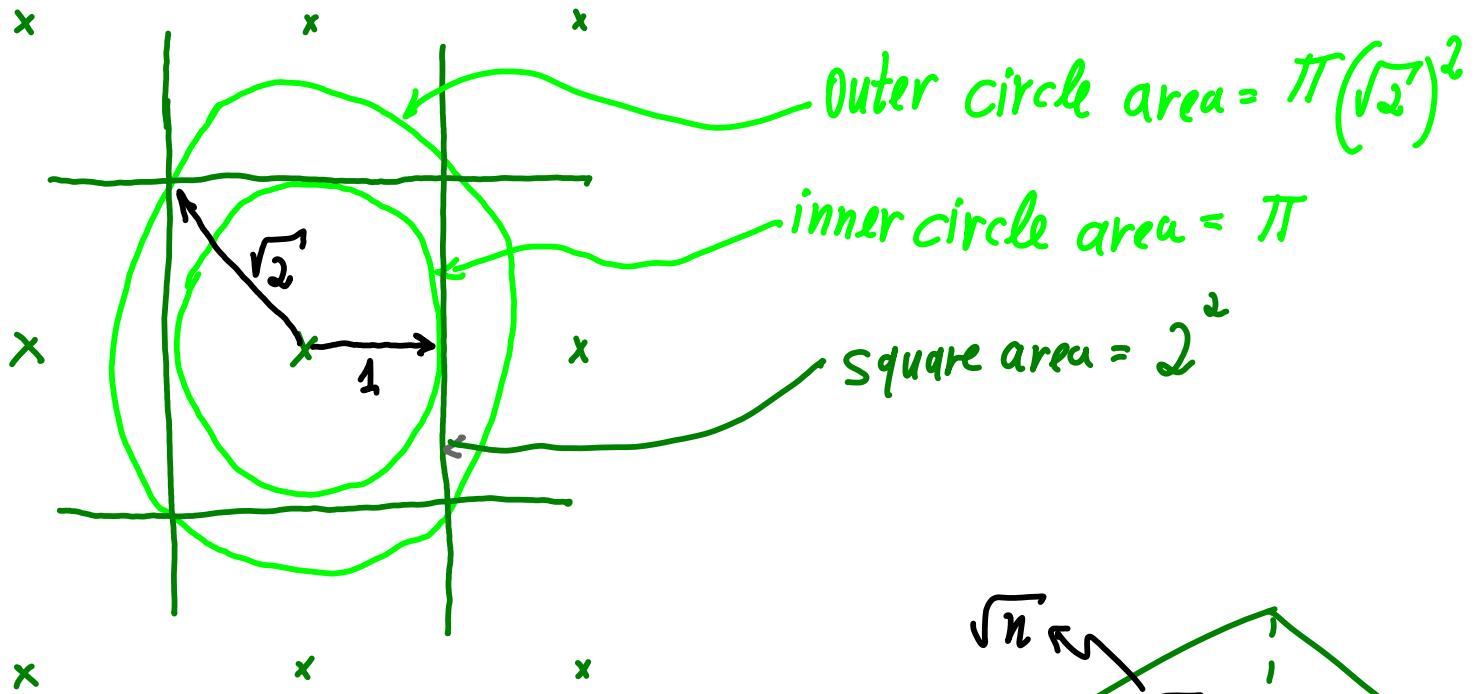
\* Best 3-dim Covering: B.C.C.

each layer = cubic  
layers are staggered

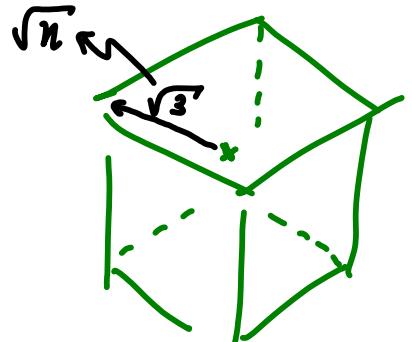
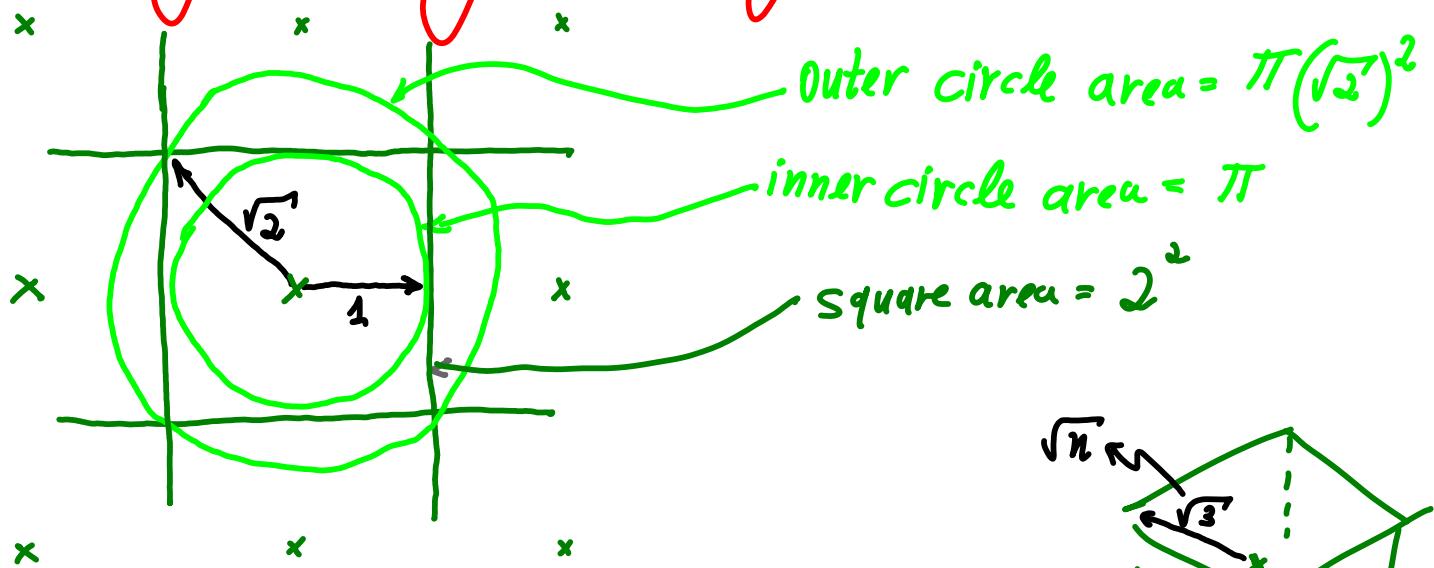


As  $n \rightarrow \infty$ , most lattices are "good" for almost everything!

# Packing & Covering efficiency of the Cubic lattice



# Packing & Covering efficiency of the Cubic lattice



Behavior @ general dimension  $n$ :

- \*  $n = 1, 2, 3, \dots n$

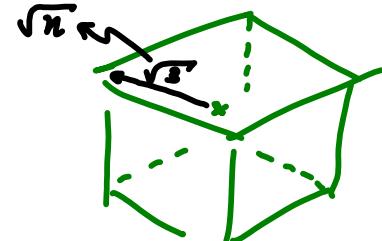
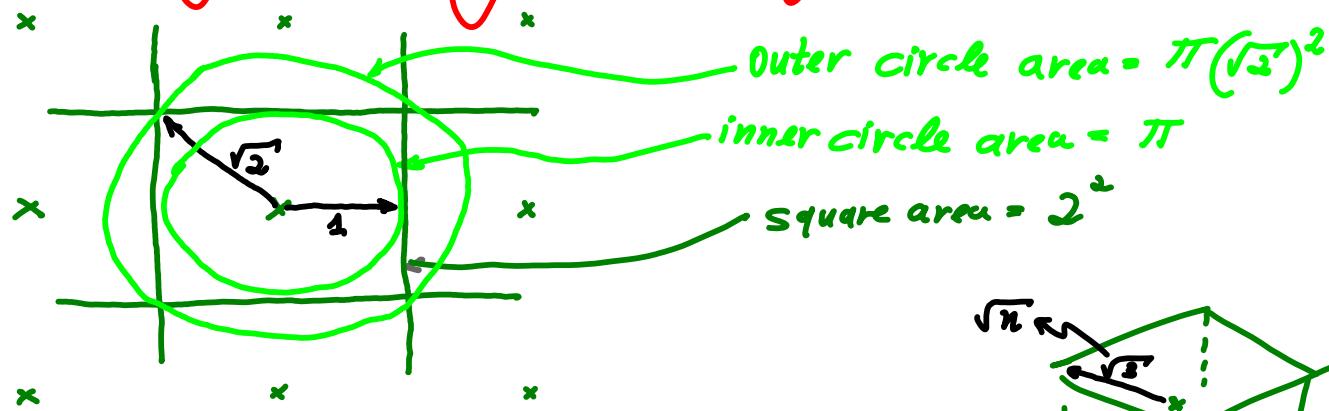
- \* cubic cell volume =  $1, 2^2, 2^3, \dots 2^n$  ↗

- \* inner ball " =  $1, \pi, \frac{4\pi}{3}, \dots V_n$  ↘

- \* outer ball " =  $2, \pi(\sqrt{2})^2, \frac{4\pi}{3}(\sqrt{3})^3, \dots V_n \cdot (\sqrt{n})^n$  ↗

- \* where  $V_n \triangleq$  volume of unit radius  $n$ -dim ball  $\sim \left(\frac{2\pi e}{n}\right)^n$

# Packing & Covering efficiency of the Cubic lattice



Behavior @ general dimension  $n$ :

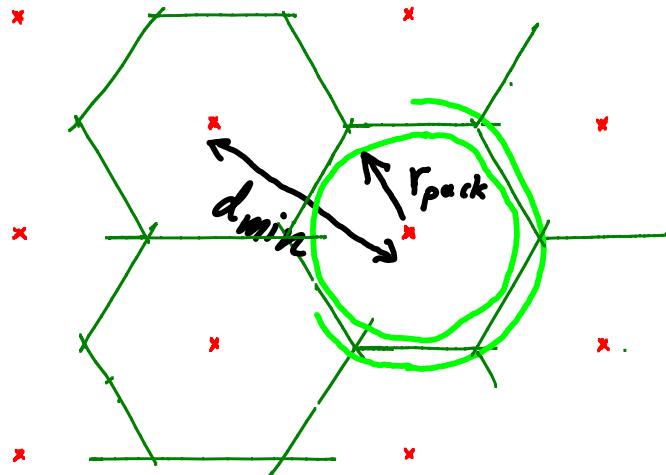
- \*  $n = 1, 2, 3, \dots n$
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- \* where  $V_n \triangleq$  volume of unit radius  $n$ -dim ball  $\sim \left(\frac{2\pi e}{n}\right)^n$

$$\Rightarrow \text{Packing efficiency} \triangleq \frac{\text{Packed balls volume}}{\text{Space volume}} \xrightarrow{n} 0 \Rightarrow \text{bad...}$$

while

$$\text{Covering efficiency} \triangleq \frac{\text{Covering balls volume}}{\text{Space volume}} \xrightarrow{n} \sqrt{\frac{\pi e}{2}} = 2 \Rightarrow \text{quite good!}$$

# The nominal Coding gain of a (good) lattice



$$d_{\min} = 2 \cdot r_{\text{pack}}$$

$$d_{\min}(\text{hexagonal}) \approx 1.074 \times d_{\min}(\text{square}) / \quad \Rightarrow \quad \Gamma_c^{\text{nom}} \approx 0.62 \text{ dB}$$

@ same cell volume

$$d_{\min}(\text{Fcc}) \approx 1.122 \times d_{\min}(\text{cubic}) / \quad \Rightarrow \quad \Gamma_c^{\text{nom}} \approx 1 \text{ dB}$$

@ same cell volume

Why is  $\Gamma_c^{\text{nom}}$  important?

It's a dominant factor in determining error probability  
in the presence of Additive White Gaussian Noise

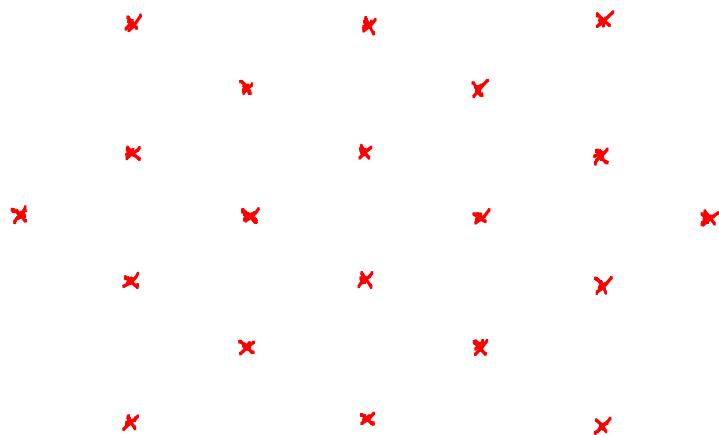


# Lattice Codes in Signal Space

square ( $\mathbb{Z}$ )-lattice  $\Rightarrow$  uncoded constellation  
⋮ ("bad lattice")



More "interesting" lattice  $\Rightarrow$  coded constellation  
("good lattice")



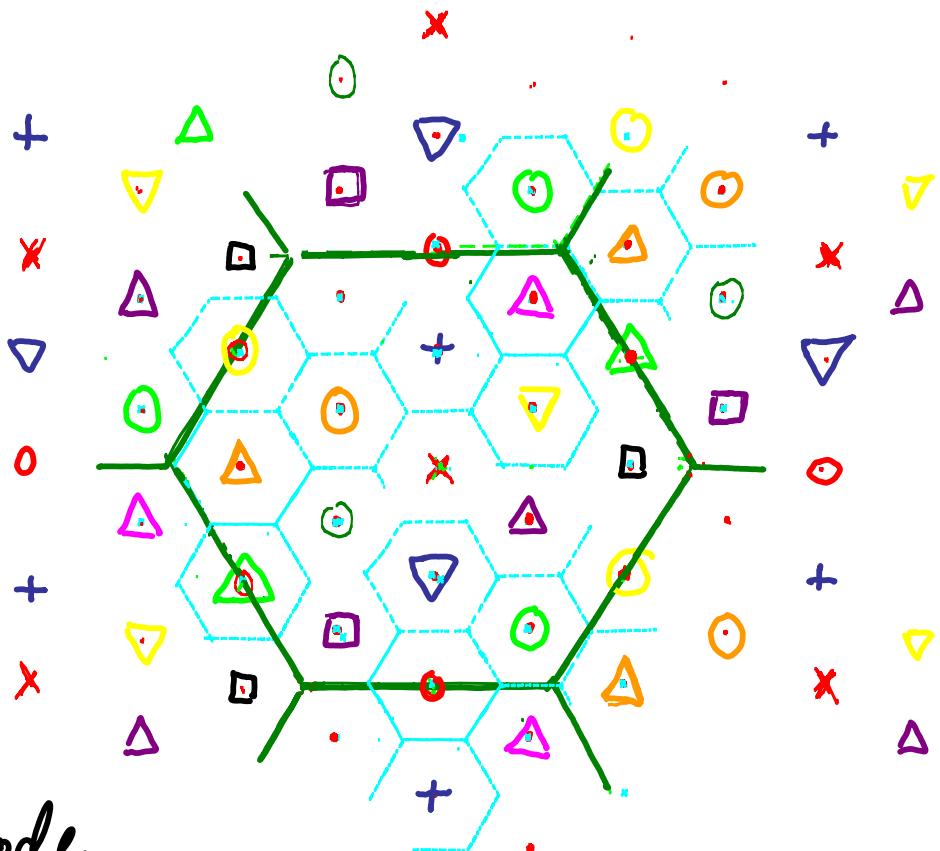
# Nested Lattices

$$\mathcal{N}_2 \subset \mathcal{N}_1 \Rightarrow \underline{\underline{G}}_2 = \underline{\underline{G}}_1 \cdot \underline{\underline{J}}$$

Relative Cosets =  $\mathcal{N}_2 / \mathcal{N}_1$

Coset  $\triangleq \ell_1 + \mathcal{N}_2$ , for some  $\ell_1 \in \mathcal{N}_1$

$$|\mathcal{N}_2 / \mathcal{N}_1| = V_2 / V_1 = |\det(\underline{\underline{J}})|$$



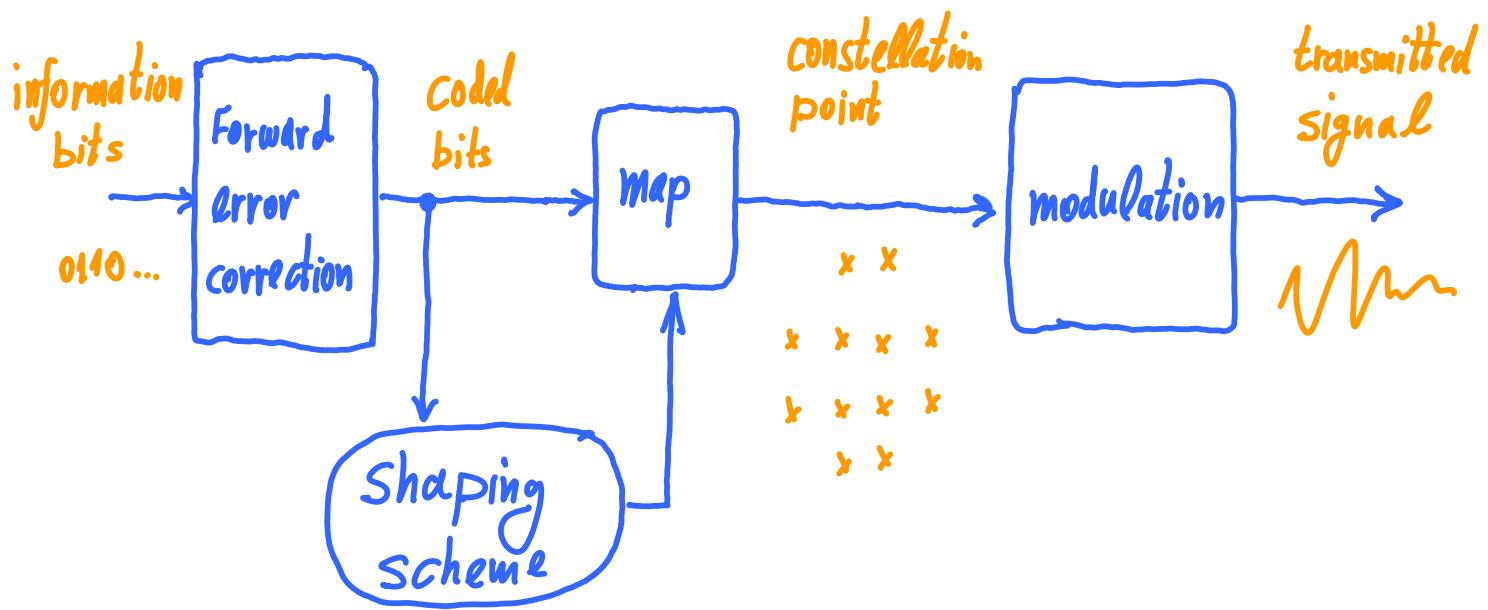
$\Rightarrow$  Lattice Code

Back to ...

Lattice Codes as an "Alternative Language"  
for Digital Communication

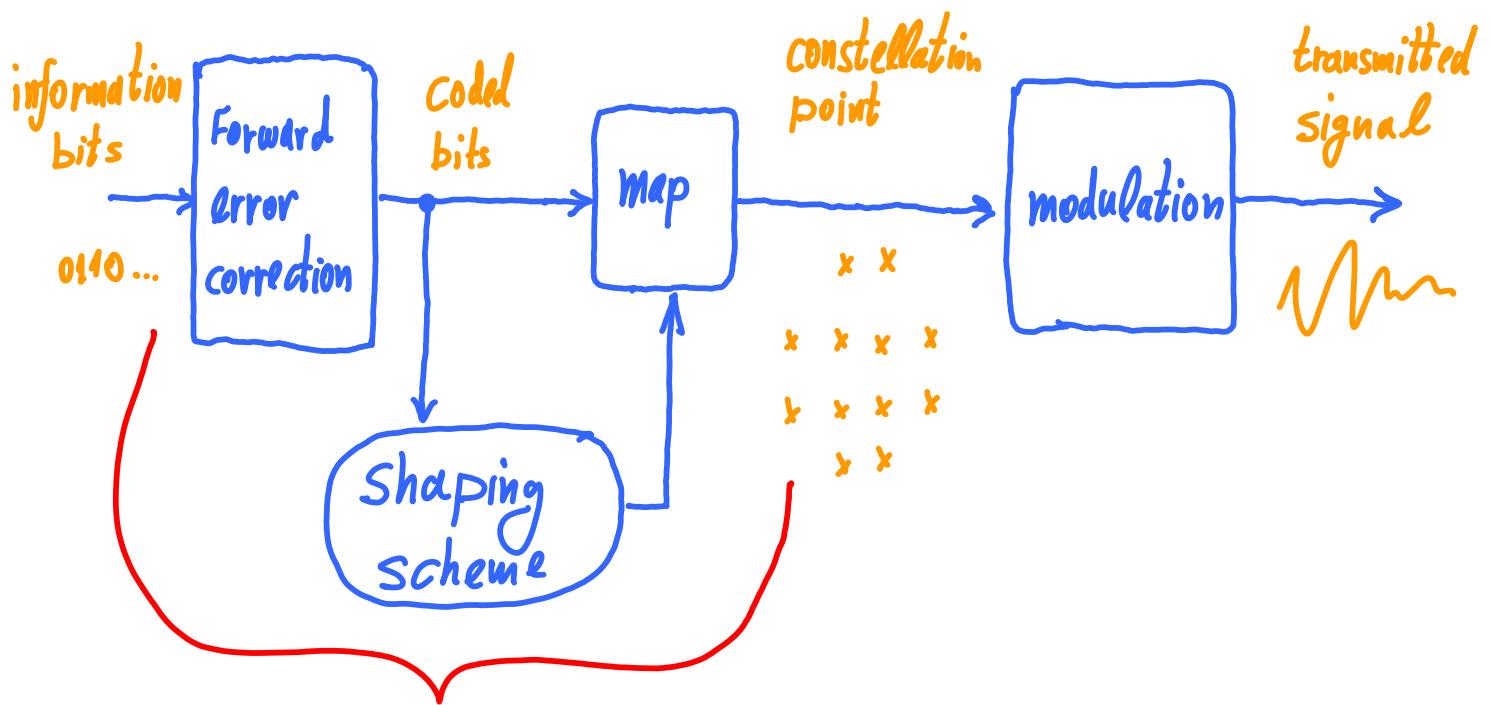
# Lattice Codes as an "Alternative Language" for Digital Communication

## 1. Shaping : power & peak amplitude control:



Block diagram of a digital modulator

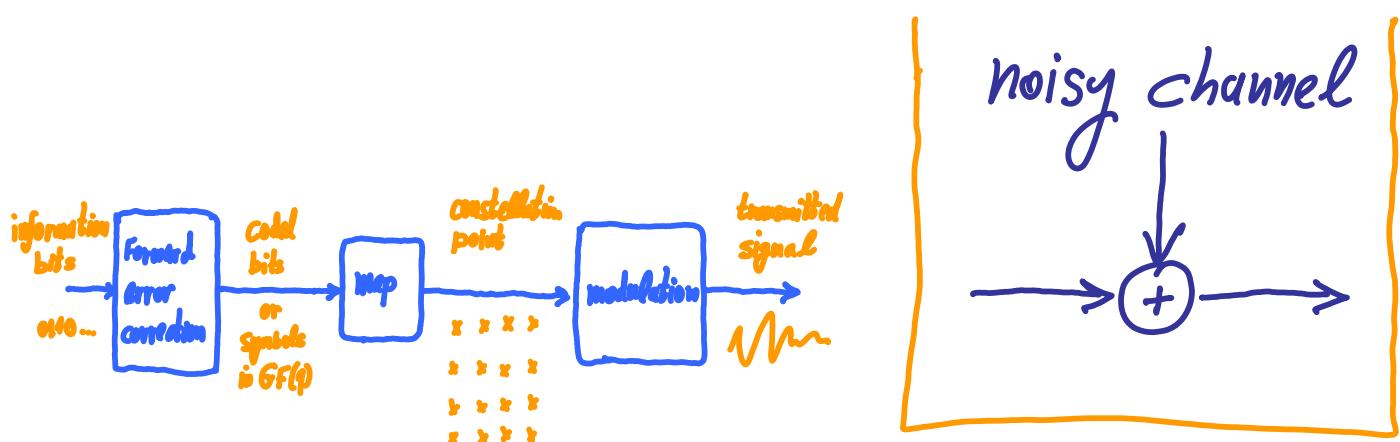
## 1. Shaping : power & peak amplitude control:



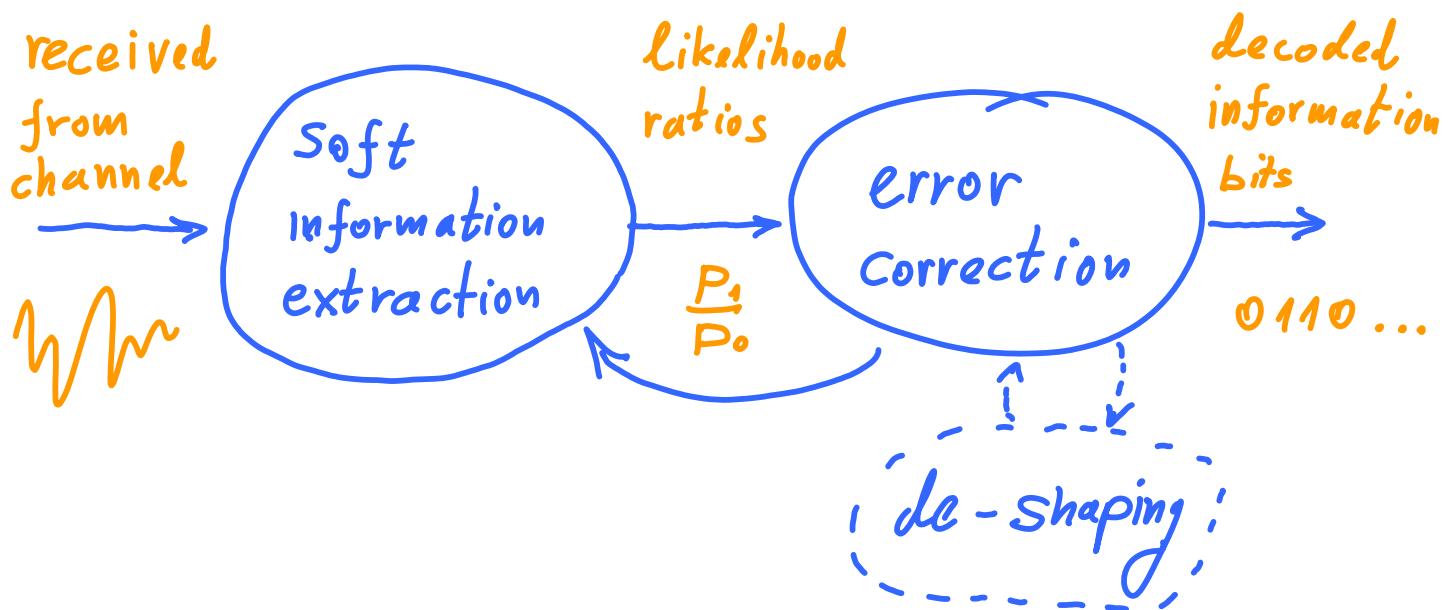
Replace by a Voronoi constellation :

info bits  $\rightarrow$   $\text{coding} \quad \text{shaping}$

Block diagram of a digital modulator

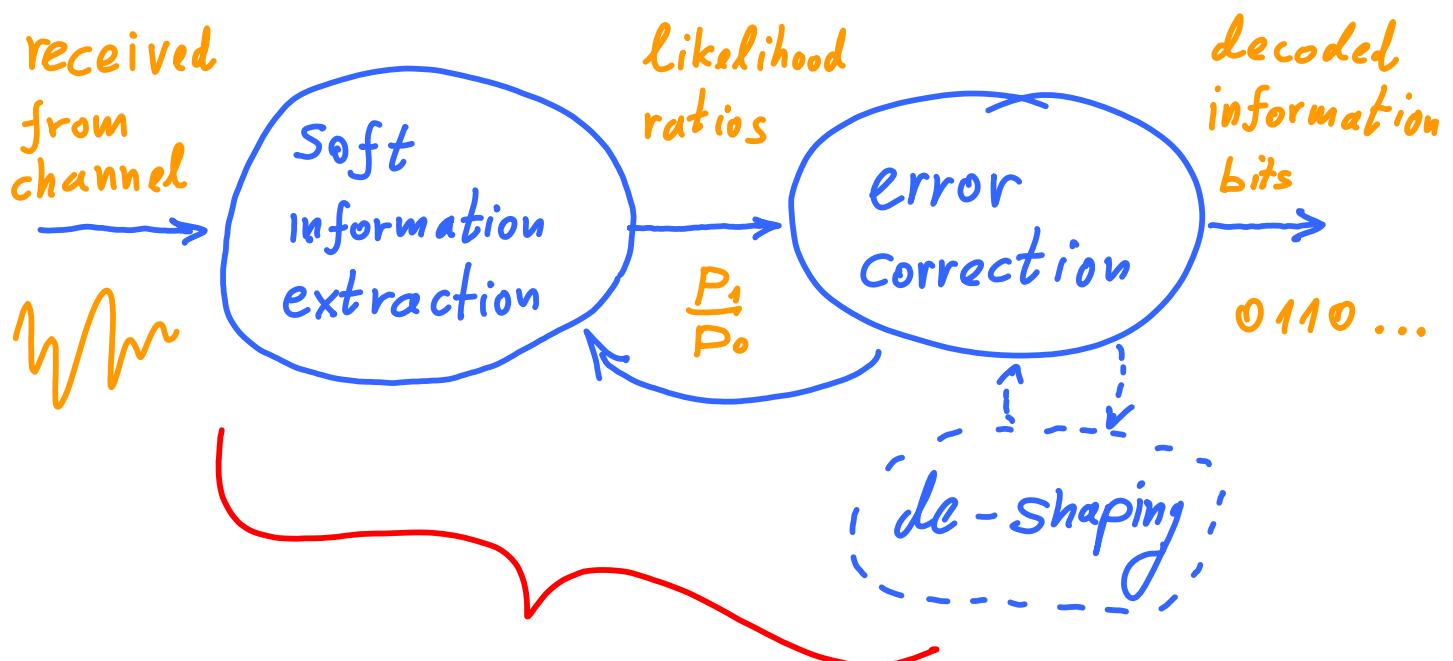


### 3. Practical receiver / decoder structure :



Block diagram of a digital de-modulator

### 3. Practical receiver / decoder structure:

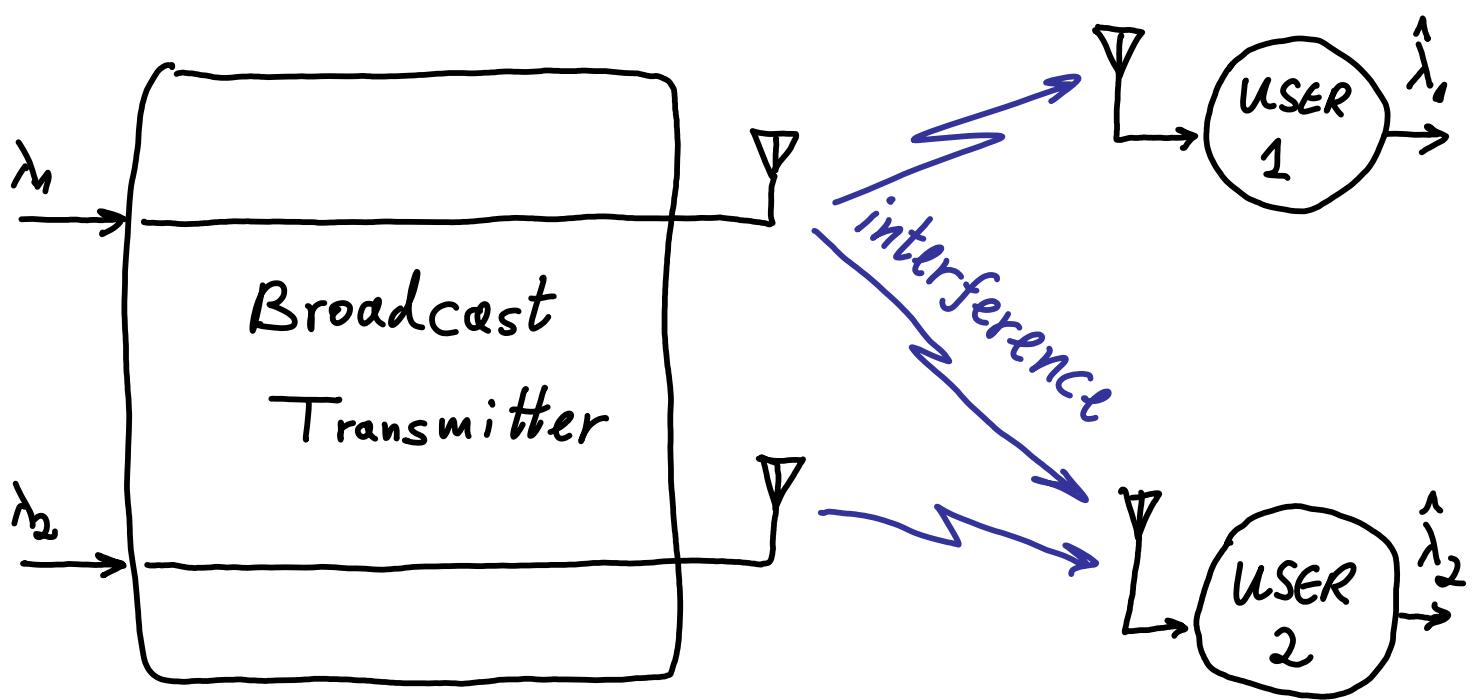
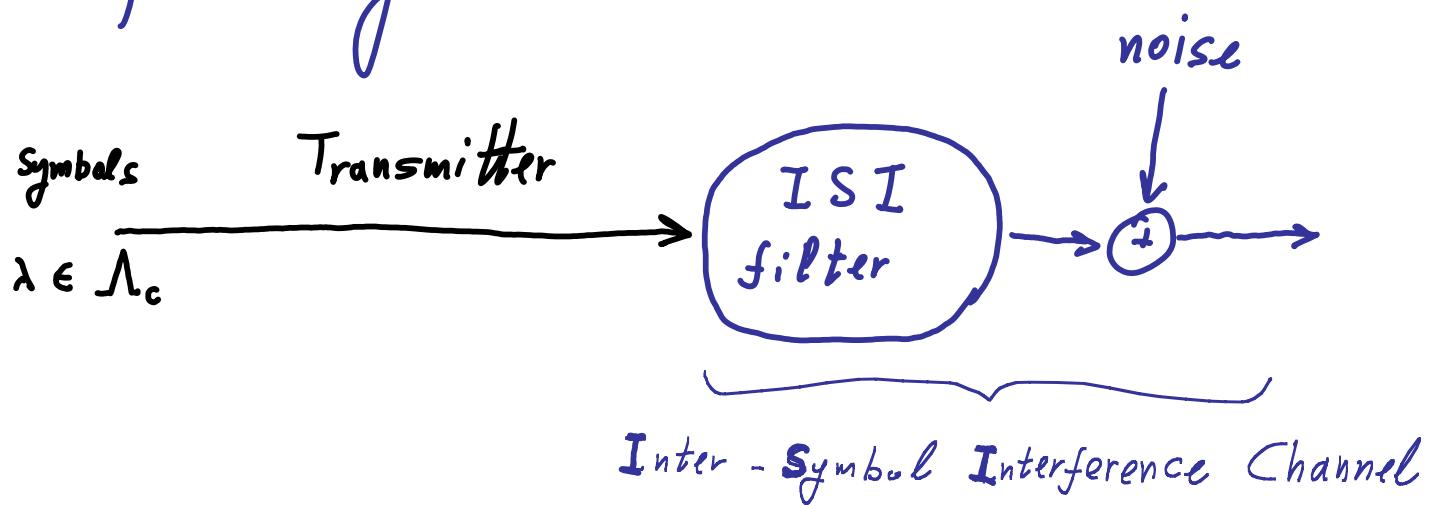


Lattice decoding:

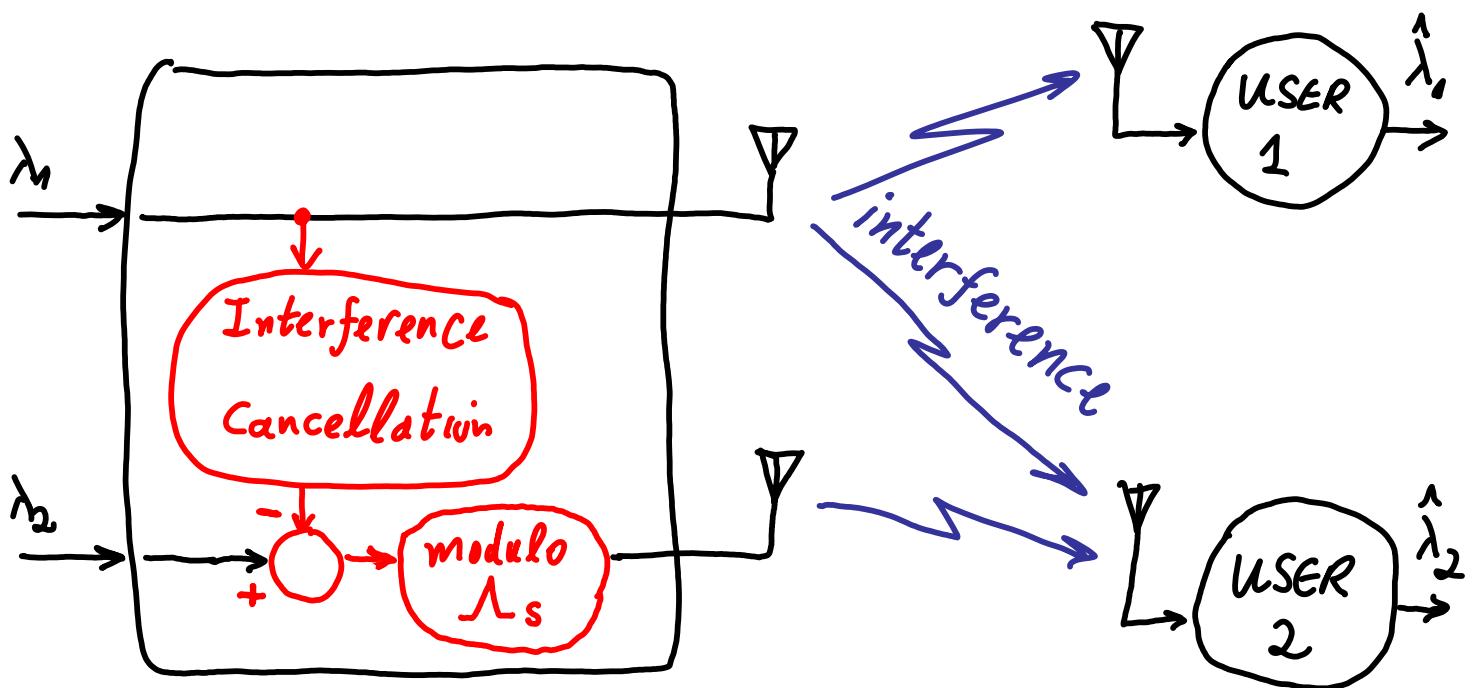
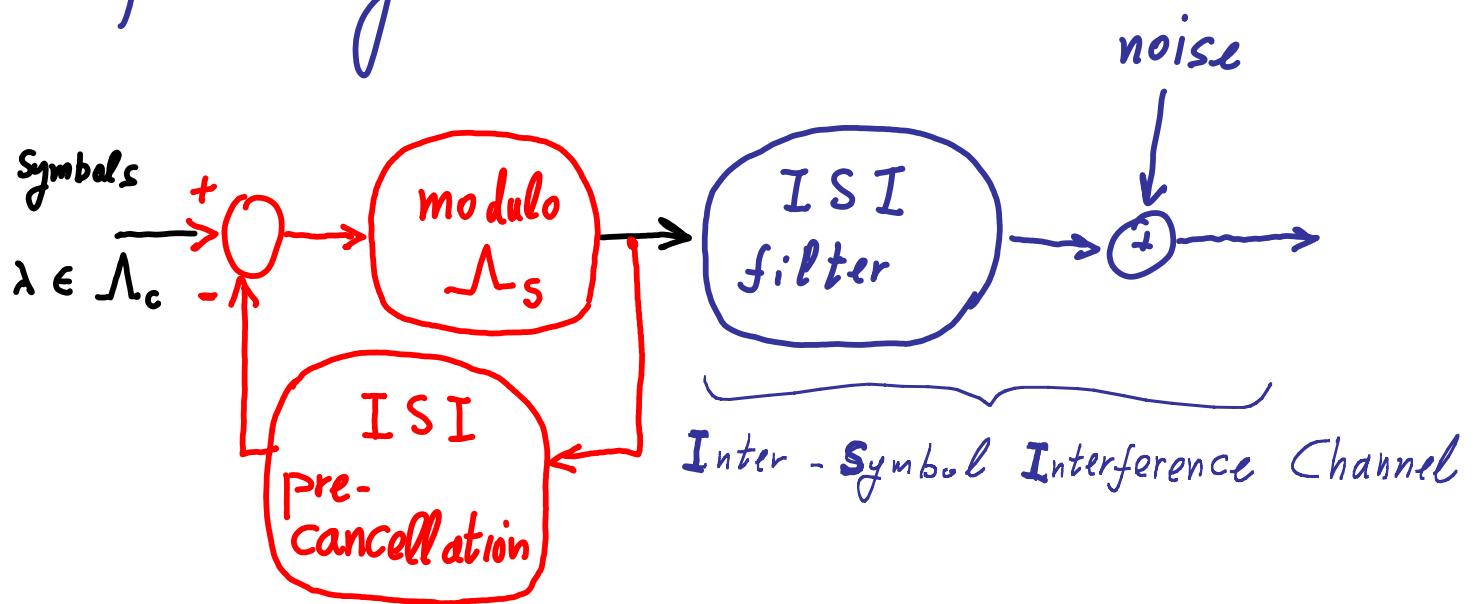
$$\Lambda_c / \Lambda_s + \text{noise} \rightarrow \Lambda_c \rightarrow \text{info bits}$$

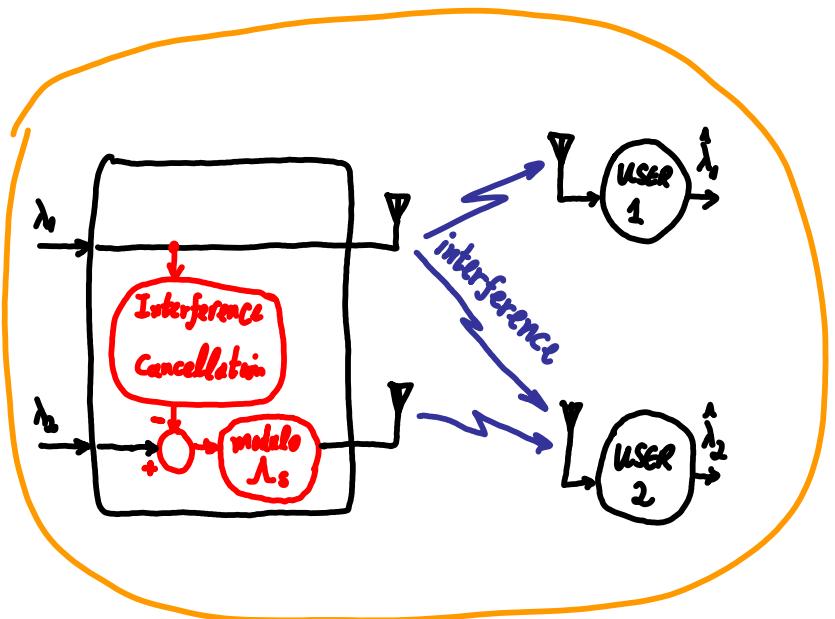
Block diagram of a digital de-modulator

#### 4. Precoding (equalization , Multi-User MIMO):



## 4. Precoding (equalization , Multi-User MIMO):





MIMO Broadcast  
by  
Dirty-paper coding  
[Caire - Shamai 2002]

→ lattice binning

~~~~~  
→ alternative language for  
multi-user information theory !

Many Cons , What about Pros ?

- Beauty of Lattices
- History
- Circumstances
- Teaching (basis for a course)
- Anecdotes , Future ...

# How did it all start ?



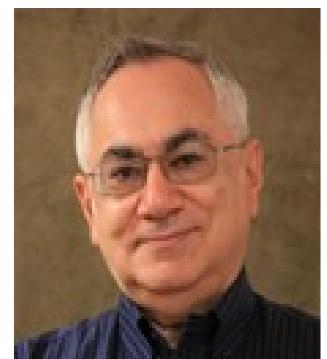
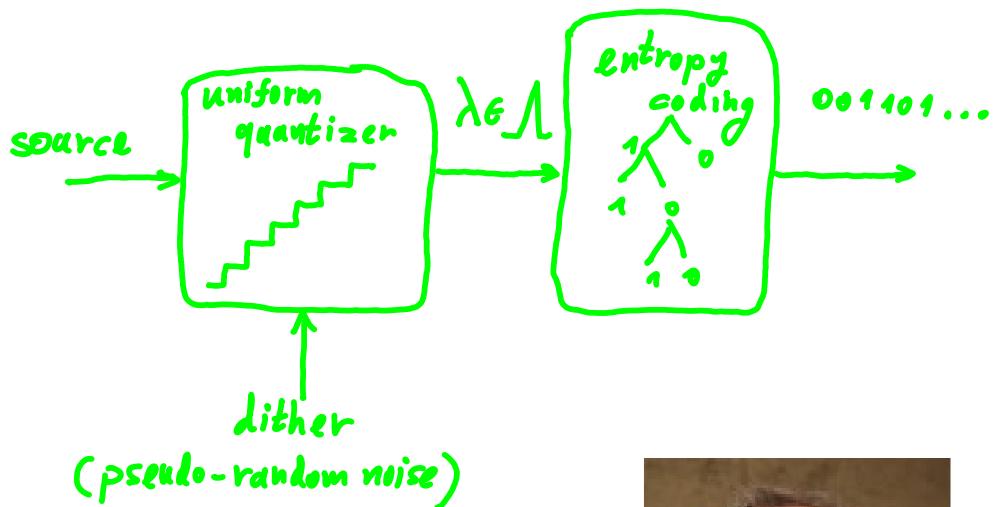
Meir Feder

data compression class 1989...



Jacob Ziv

universal (dithered) quantization [1985]



Allen Gersho

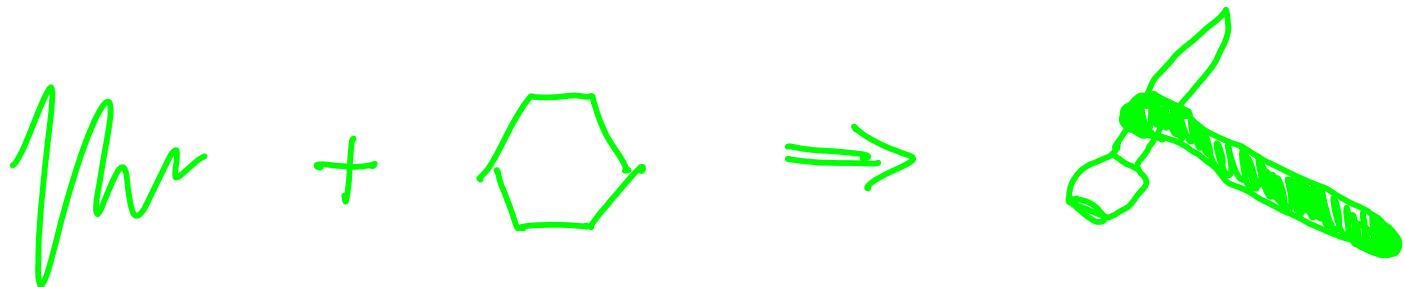
Gersho's conjecture [1979]

⇒ MSc [~ Jan 1991]

Moral 1 :

Dither (randomization) + Lattice

⇒ a promissing analatic tool !





Meir Feder

# How did it all start ?



Yair Beery first book about lattice codes

~ 1991  
seminar on the...



John Conway



Neil Sloane



Gregory Poltyrev



Simon Litsyn

~ 1992  
challenge : dithered modulation ?!

~ 1993 covering  $\leftrightarrow$  quantization

$$G(\lambda_n) \rightarrow \frac{1}{2\pi c}$$

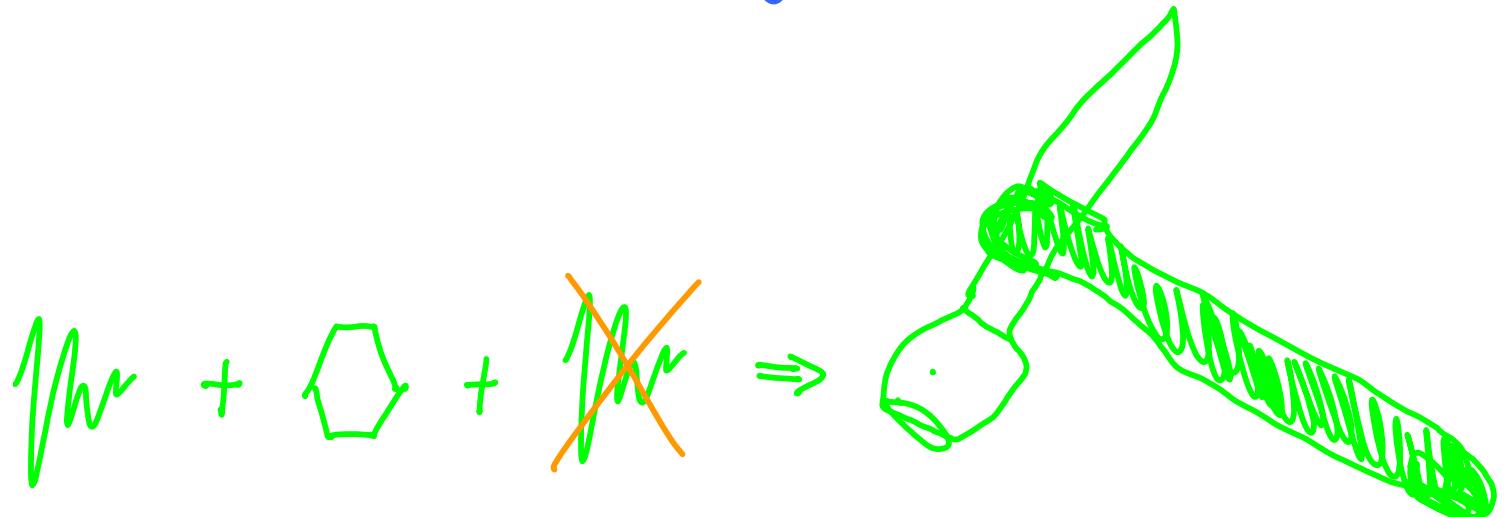
$\Rightarrow$  PhD [1993 , 1994]

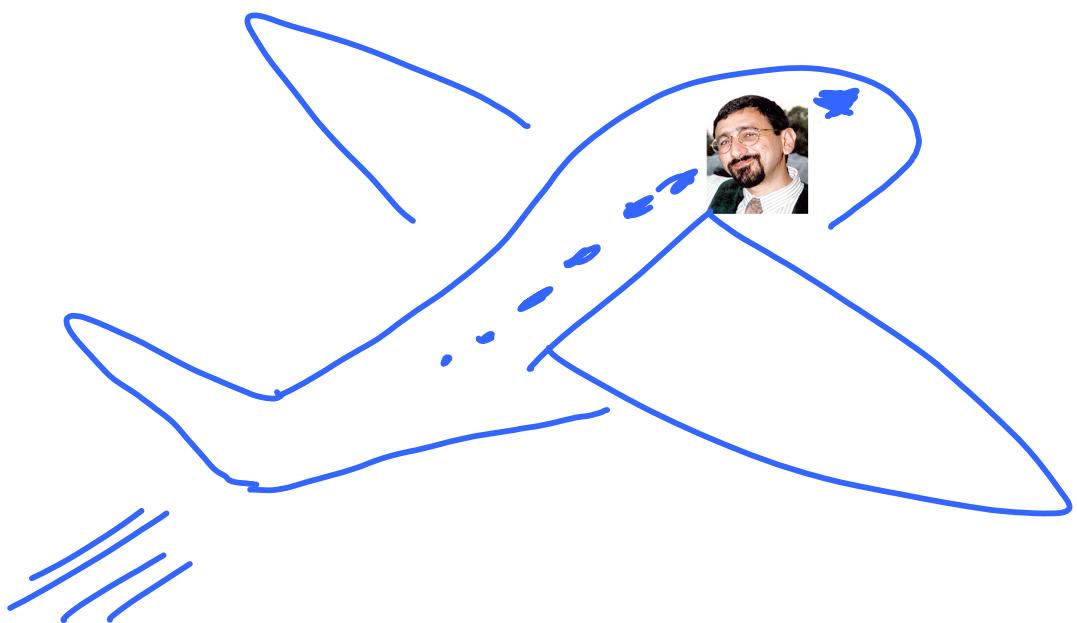
Moral 2 :

(MMSE)

Dither + Lattice + Wiener Estimation

⇒ a very promissing analatic tool ??





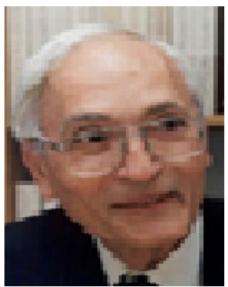
July 1994 - going to post doc ...



Toby Berger



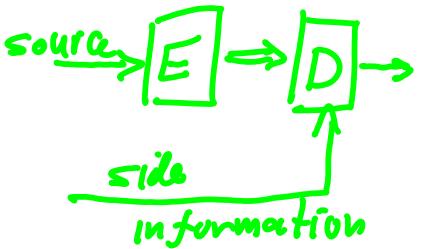
Aaron  
Wyner



Jacob  
Ziv

# Mathematical Theory of Data Compression [1971] & Multi-terminal source Coding [1978+]

## Wyner-Ziv Problem

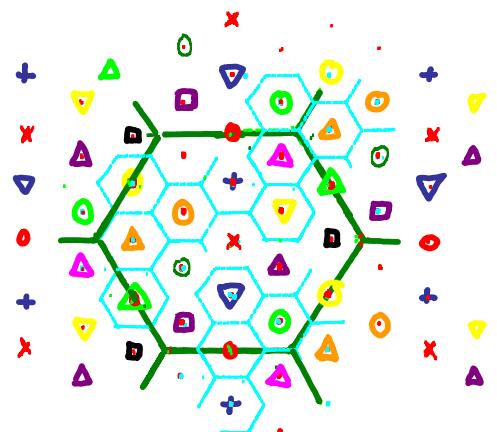


Shlomo  
Shamai

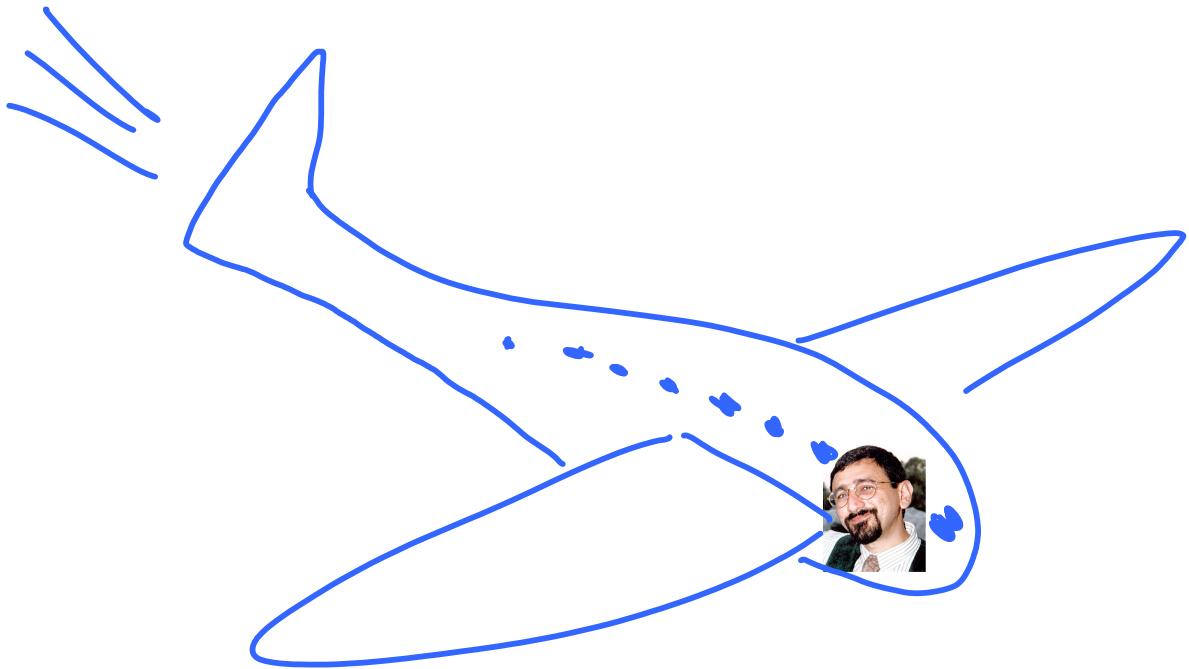


Sergio  
Verdú

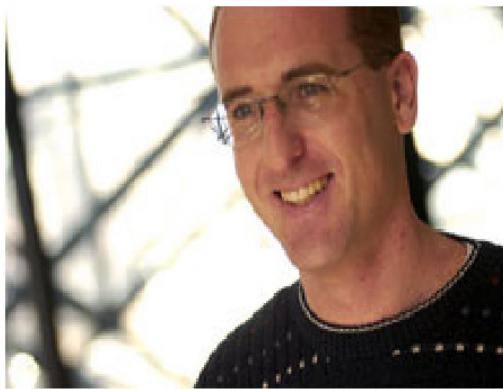
nested binary / lattice  
Wyner-Ziv coding



→ post doc



July 1996 - back to TAU ...

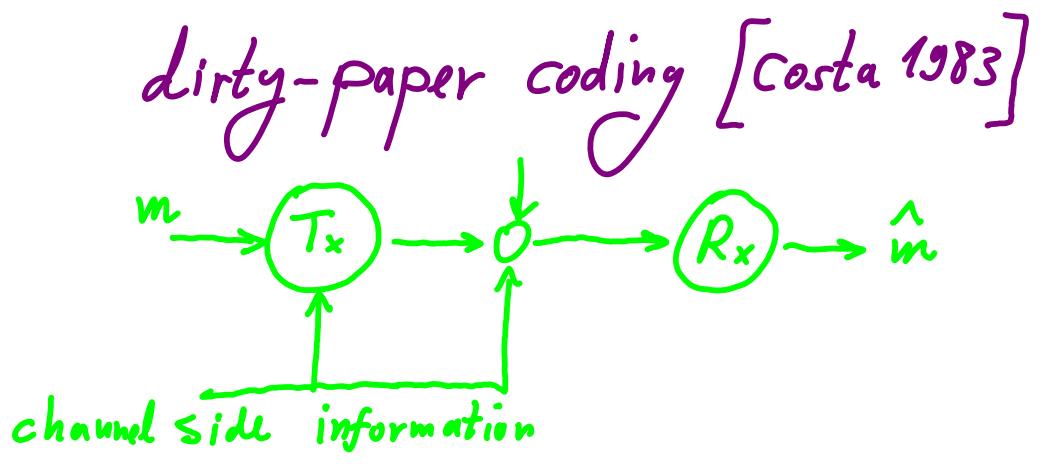


Uri Erez

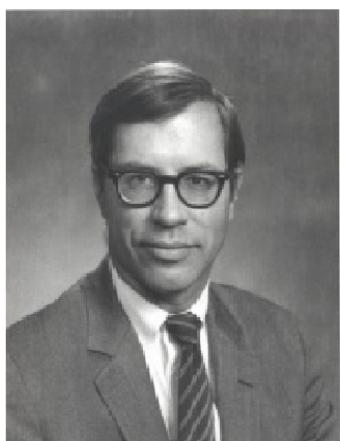
advanced information theory class 1997;  
side-information @ transmitter



Shlomo Shamai



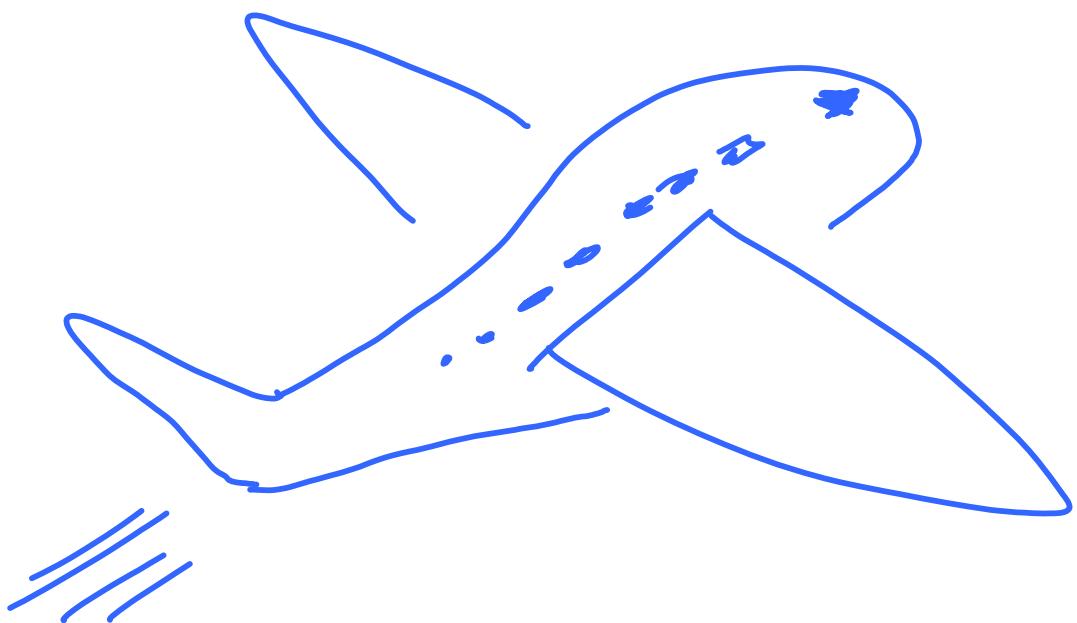
⇒ lattice DPC ?



David Forney

achieving  $\frac{1}{2} \log(1 + SNR)$  with  
lattice  $(\mathcal{L}_c / \mathcal{L}_s)$  coding

⇒ first PhD student



Aug. 2002 : going to Sabbatical @ MIT

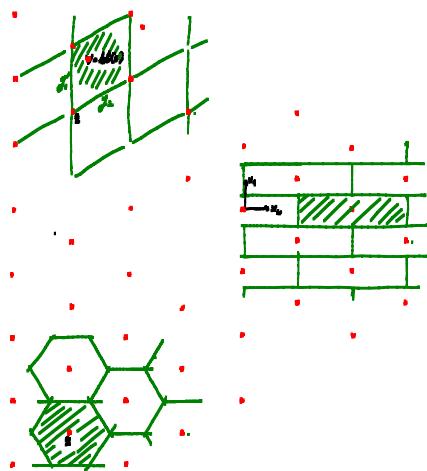
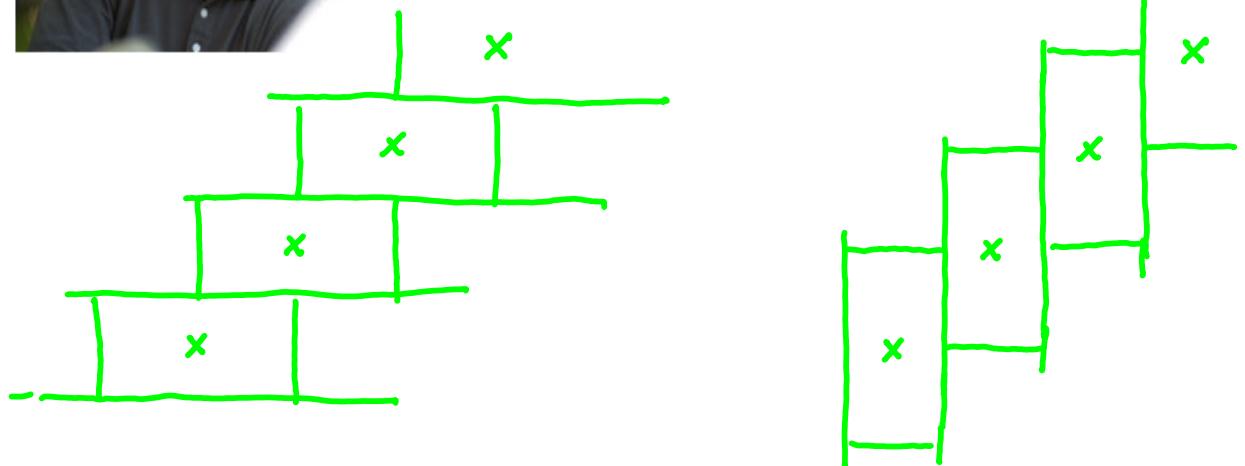


Greg  
Wornell

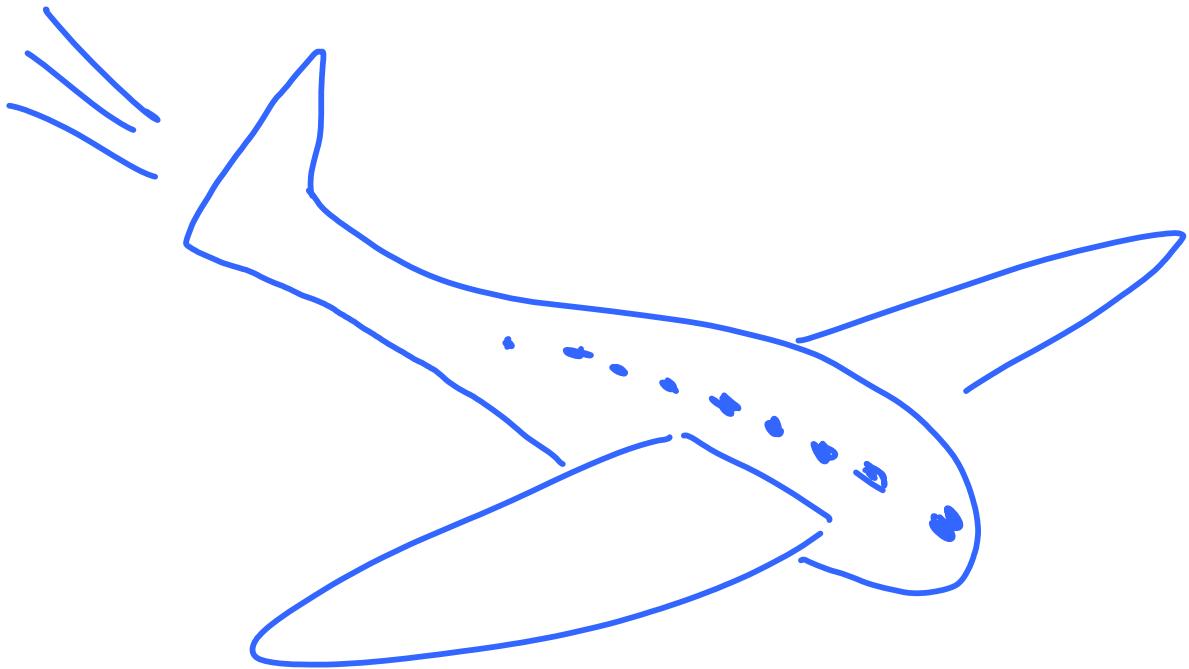


Emin  
Martinian

distortion side information  
using  
variable partition codes



⇒ professorship



back to TAU ...

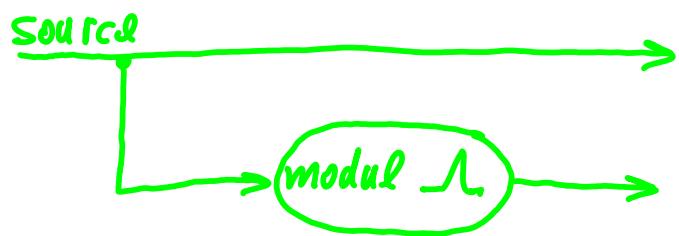


Tal  
Phylosof

Yuval  
Kochman

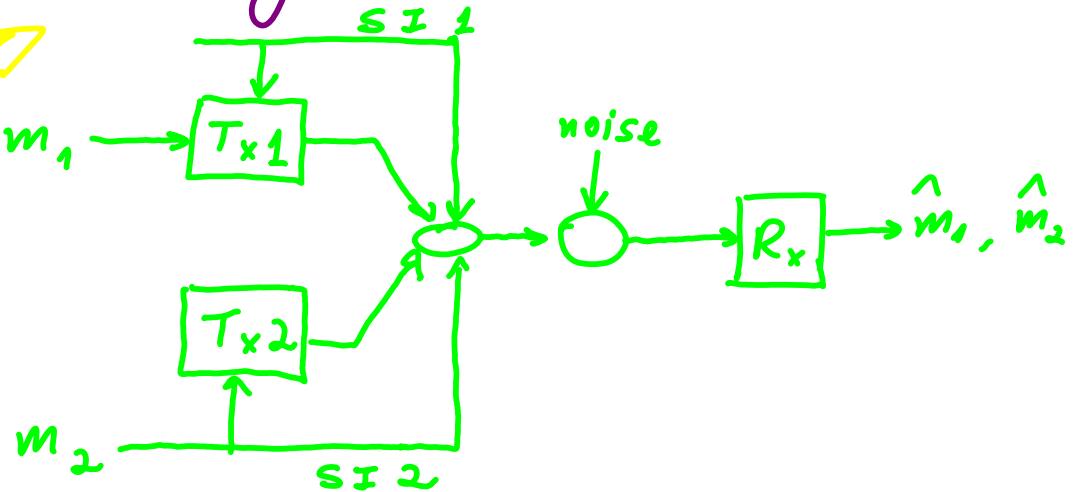
Zvi Reznic

## modulo - lattice modulation



Uri Erez

## dirty multiple-access channel



Many Cons , What about Pros ?

- ⑤ Beauty of Lattices
- ⑤ History
- ⑤ Circumstances
- ⑤ Teaching (basis for a course)
- ⑤ Anecdotes , Future ...

# Triggers to start writing ...

## \* Followers & competitors



Sandeep Pradhan

binning  
via syndromes [1999]

Lattice Korner-Marton  
[2007]



Bobak Nazer



Michael Gastpar

compute & forward  
[2007]

## \* Full professor



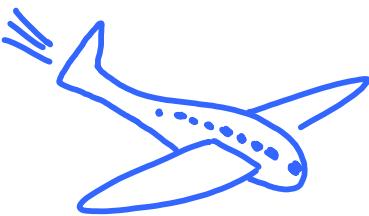
## \* Next generation



Tal Phyllosof @ GM

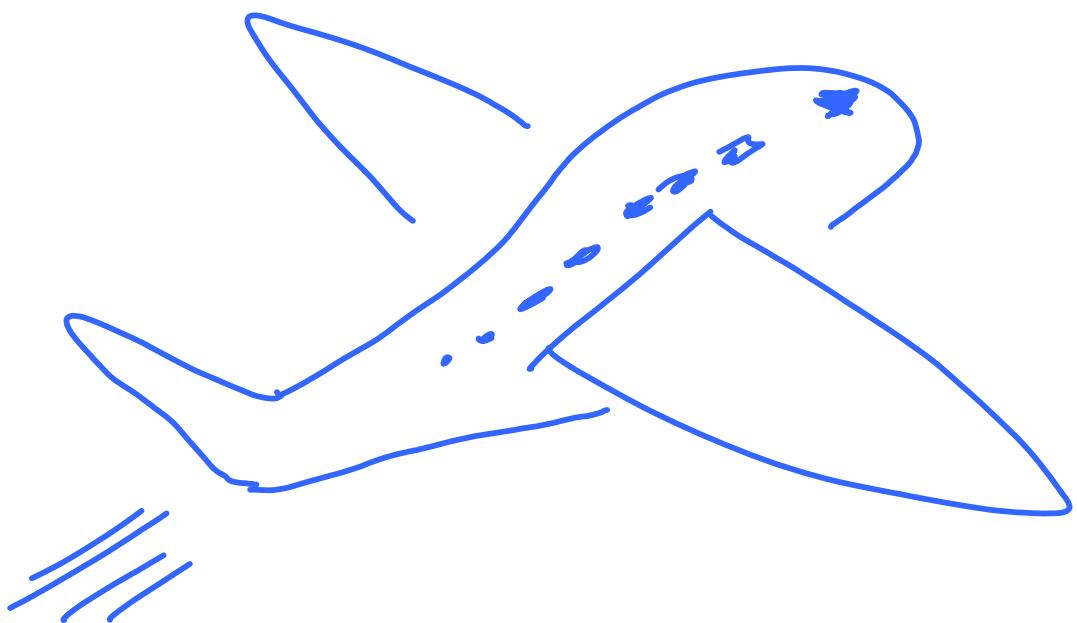


Uri Erez  
@ TAU



Yuval Kochman @ HUJI

## \* So what's next? ...



Aug. 2008 - going to Sabbatical @ ETH

# Triggers to start writing ...

\* Followers & competitors

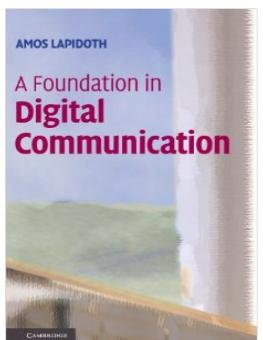


\* Full professor

\* Next generation

\* So what's next ?

\* Colleagues who did it !  
(Sabbatical @ ETH)



Amos Lapidot

\* Colleagues who encouraged  
(visit @ Aalborg University Denmark)



Jan Østergaard

Many Cons , What about Pros ?

- Beauty of Lattices
- History
- Circumstances
- Teaching (basis for a course)
- Anecdotes , Future ...

# Draft 1 : Tutorial @ ITA 2009 (UCSD, Feb. 2009)

---

Title: Lattices are Everywhere!

"Lattice Codes, Signals and Networks"

Author: Ram Zamir

---

## Abstract:

As bees and crystals (and people selling oranges in the market) know it for many years, lattices provide efficient structures for packing, covering, quantization and channel coding. In the recent years, interesting links were found between lattices and coding schemes for multi-terminal networks. This book covers close to 20 years of my research in the area; of enjoying the beauty of lattice codes, and discovering their power in problems like: dithered quantization, dirty paper coding, Wyner-Ziv video coding, modulo-lattice modulation, distributed interference cancellation, and more.

## Table of Contents:

---

Chapter 1: Lattice Figures of Merits

Chapter 2: Waveform Coding I: Dithered Quantization

Chapter 3: Nested Lattices and Side Information Problems

Chapter 4: Waveform Coding II: Reversed Equalization

Chapter 5: Modulo-Lattice Modulation for Joint Source-Channel Coding

Chapter 6: Noisy Network Coding

# Draft 2: Proposal to Cambridge University Press

(May 2003)

## Contents

|                                                                              |    |          |
|------------------------------------------------------------------------------|----|----------|
| <b>1 Introduction</b>                                                        | 3  | Chap. 2  |
| <b>2 Lattices and Figures of Merit</b>                                       | 5  |          |
| 2.1 Representation and Partition . . . . .                                   | 5  |          |
| 2.2 Sphere Packing and Covering . . . . .                                    | 6  |          |
| 2.3 Lattice Quantization and Modulation . . . . .                            | 8  | Chap. 3  |
| 2.4 Construction of Good Lattice Ensembles . . . . .                         | 10 |          |
| 2.5 Non-Euclidean Partitions and Non-Gaussian Quantization Noise . . . . .   | 10 |          |
| <b>3 Dithered Quantization</b>                                               | 13 |          |
| 3.1 Universal Quantization . . . . .                                         | 14 |          |
| 3.2 Filtered ECDQ: the test-channel simulator . . . . .                      | 16 |          |
| 3.3 Comparison with Lloyd-Max Quantization . . . . .                         | 19 | Chap. 4  |
| <b>4 Voronoi Codebooks</b>                                                   | 21 |          |
| 4.1 Nested Lattices . . . . .                                                | 22 |          |
| 4.2 MMSE Estimation and Lattice Inflation . . . . .                          | 23 |          |
| 4.3 Achieving the AWGN Channel Capacity . . . . .                            | 25 | Chap. 5  |
| 4.4 Achieving the QG Rate-Distortion Function . . . . .                      | 26 |          |
| 4.5 Error exponents of Lattice Codebooks . . . . .                           | 28 | Chap. 8  |
| 4.6 The Non-Gaussian Case . . . . .                                          | 28 | Chap. 9  |
| <b>5 Side-Information Problems</b>                                           | 29 |          |
| 5.1 Random Binning Solutions . . . . .                                       | 30 |          |
| 5.2 Lattice Wyner-Ziv Coding . . . . .                                       | 30 |          |
| 5.3 Lattice Dirty-Paper Coding . . . . .                                     | 30 |          |
| 5.4 Application to Distributed Sources and Broadcast Channels . . . . .      | 32 |          |
| 5.5 The Non-Gaussian Case . . . . .                                          | 32 | Chap. 10 |
| <b>6 Waveform Sources and Channels</b>                                       | 33 |          |
| 6.1 Predictive Quantization and Wyner-Ziv DPCM . . . . .                     | 33 |          |
| 6.2 Decision Feedback Equalization (DFE) and Lattice Pre-coding . . . . .    | 35 |          |
| 6.3 Oversampling . . . . .                                                   | 36 |          |
| 6.4 Noise Shaping and Multiple Descriptions . . . . .                        | 36 | X        |
| <b>7 Modulo-Lattice Modulation</b>                                           | 37 |          |
| 7.1 Joint Encoding of a Wyner-Ziv Source and a Dirty-Paper Channel . . . . . | 37 |          |
| 7.2 Analog Matching of Colored Sources and Channels . . . . .                | 40 |          |
| 7.3 Transmission with Unknown SNR . . . . .                                  | 42 |          |
| 7.4 Companding . . . . .                                                     | 42 | Chap. 11 |
| <b>8 Gaussian Networks</b>                                                   | 43 |          |
| 8.1 The Korner-Marton Problem . . . . .                                      | 43 |          |
| 8.2 The Dirty Multiple Access Channel . . . . .                              | 45 |          |
| 8.3 Lattice Network Coding . . . . .                                         | 45 |          |
| 8.4 Back to Analog: Coherency Gain in Parallel Relaying . . . . .            | 47 | Chap. 12 |
| <b>9 Appendix</b>                                                            | 49 |          |
| 9.1 Prediction Gain in Source and Channel Coding . . . . .                   | 49 |          |
| 9.2 More about Classical Network Information Theory . . . . .                | 49 |          |
| <b>10 Bibliography</b>                                                       | 51 |          |

# Introduction to Lattice Codes

|          |                                                  |           |
|----------|--------------------------------------------------|-----------|
| <b>1</b> | <b>Introduction</b>                              | <b>11</b> |
| 1.1      | Source and channel coding . . . . .              | 14        |
| 1.2      | The information-theoretic view . . . . .         | 17        |
| 1.3      | Structured codes . . . . .                       | 18        |
| 1.4      | Preview . . . . .                                | 19        |
| <b>2</b> | <b>Lattices</b>                                  | <b>23</b> |
| 2.1      | Representation . . . . .                         | 24        |
| 2.2      | Partition . . . . .                              | 29        |
| 2.3      | Equivalent cells and coset leaders . . . . .     | 34        |
| 2.4      | Transformation and tiling . . . . .              | 38        |
| 2.5      | Algebraic constructions . . . . .                | 42        |
| <b>3</b> | <b>Figures of Merit</b>                          | <b>55</b> |
| 3.1      | Sphere packing and covering . . . . .            | 55        |
| 3.2      | Quantization: normalized second moment . . . . . | 63        |
| 3.3      | Modulation: volume to noise ratio . . . . .      | 66        |
| <b>4</b> | <b>Dithering and Estimation</b>                  | <b>77</b> |
| 4.1      | Crypto lemma . . . . .                           | 79        |
| 4.2      | Generalized dither . . . . .                     | 85        |
| 4.3      | White dither spectrum . . . . .                  | 90        |
| 4.4      | Wiener estimation . . . . .                      | 93        |
| 4.5      | Filtered dithered quantization . . . . .         | 97        |

~ first 6 lectures in every course

# *Advanced Course on Digital Communication*

## *Chapters 1 ÷ 4 , and*

|     |                                                    |     |
|-----|----------------------------------------------------|-----|
| 6   | Infinite Constellation for Modulation              | 135 |
| 6.1 | Rate per unit volume . . . . .                     | 136 |
| 6.2 | ML decoding and error probability . . . . .        | 137 |
| 6.3 | Gap to capacity . . . . .                          | 139 |
| 6.4 | Non-AWGN and mismatch . . . . .                    | 143 |
| 6.5 | Non-equiprobable signaling . . . . .               | 145 |
| 6.6 | Maximum a posteriori decoding* . . . . .           | 155 |
| 8   | Nested Lattices                                    | 211 |
| 8.1 | Definition and properties . . . . .                | 212 |
| 8.2 | Cosets and Voronoi codebooks . . . . .             | 215 |
| 8.3 | Nested linear, lattice and trellis codes . . . . . | 219 |
| 8.4 | Dithered codebook . . . . .                        | 222 |
| 8.5 | Good nested lattices . . . . .                     | 226 |
| 9   | Lattice Shaping                                    | 233 |
| 9.1 | Voronoi modulation . . . . .                       | 235 |
| 9.2 | Syndrome-dilution scheme . . . . .                 | 242 |
| 9.3 | The high-SNR case . . . . .                        | 242 |
| 9.4 | Shannon meets Wiener (at medium SNR) . . . . .     | 250 |
| 9.5 | The Mod- $\Lambda$ channel . . . . .               | 258 |
| 9.6 | Achieving $C_{\text{AWGN}}$ for all SNR . . . . .  | 266 |
| 9.7 | Geometric interpretation . . . . .                 | 273 |
| 9.8 | Noise-matched decoding . . . . .                   | 275 |
| 9.9 | Is the dither really necessary? . . . . .          | 277 |

*Possible extensions (requires also part of chapter 6):*

|      |                                                 |     |
|------|-------------------------------------------------|-----|
| 13   | Error Exponents                                 | 431 |
| 13.1 | Sphere-packing exponent . . . . .               | 433 |
| 13.2 | Measures of lattice-to-noise density . . . . .  | 436 |
| 13.3 | Threshold-decoding exponent . . . . .           | 437 |
| 13.4 | Nearest-neighbor decoding exponent . . . . .    | 440 |
| 13.5 | Distance spectrum and pairwise errors . . . . . | 444 |
| 13.6 | Minimum-distance exponent . . . . .             | 445 |
| 13.7 | The expurgated MHS ensemble . . . . .           | 447 |
| 13.8 | Error exponents of Voronoi codes . . . . .      | 449 |

# Course on Data Compression (Vector Quantization)

Chapters 1 ÷ 4 , and

|                                                    |            |
|----------------------------------------------------|------------|
| <b>5 Entropy-Coded Quantization</b>                | <b>105</b> |
| 5.1 The Shannon entropy . . . . .                  | 105        |
| 5.2 Quantizer entropy . . . . .                    | 106        |
| 5.3 Joint and sequential entropy coding* . . . . . | 111        |
| 5.4 Entropy-distortion tradeoff . . . . .          | 113        |
| 5.5 Redundancy over Shannon . . . . .              | 116        |
| 5.6 Optimum test-channel simulation . . . . .      | 120        |
| 5.7 Comparison with Lloyd's conditions . . . . .   | 124        |
| 5.8 Is random dither really necessary? . . . . .   | 126        |
| 5.9 Universal quantization* . . . . .              | 126        |

Possible extensions :

|                                                      |            |
|------------------------------------------------------|------------|
| 9.10 Voronoi quantization . . . . .                  | 281        |
| <b>10 Side-Information Problems</b>                  | <b>289</b> |
| 10.1 Syndrome coding . . . . .                       | 292        |
| 10.2 Gaussian multi-terminal problems . . . . .      | 301        |
| 10.3 Rate-distortion with side information . . . . . | 305        |
| 10.4 Lattice Wyner-Ziv coding . . . . .              | 310        |
| 10.5 Channels with side information . . . . .        | 323        |
| 10.6 Lattice dirty-paper coding . . . . .            | 327        |
| <b>11 Modulo-Lattice Modulation</b>                  | <b>343</b> |
| 11.1 Separation vs. JSCC . . . . .                   | 344        |
| 11.2 Figures of merit for JSCC . . . . .             | 346        |
| 11.3 Joint Wyner-Ziv / dirty-paper coding . . . . .  | 348        |
| 11.4 Bandwidth conversion . . . . .                  | 354        |

# *Advanced Course on Information Theory*

## *Chapters 1 + 4 , and*

|                                                      |            |
|------------------------------------------------------|------------|
| <b>7 Asymptotic Goodness</b>                         | <b>163</b> |
| 7.1 Sphere bounds . . . . .                          | 166        |
| 7.2 Sphere-Gaussian equivalence . . . . .            | 172        |
| 7.3 Good covering and quantization . . . . .         | 177        |
| 7.4 Does packing imply modulation? . . . . .         | 181        |
| 7.5 The Minkowski-Hlawka Theorem . . . . .           | 182        |
| 7.6 Good packing . . . . .                           | 185        |
| 7.7 Good modulation . . . . .                        | 187        |
| 7.8 Non-AWGN . . . . .                               | 193        |
| 7.9 Simultaneous goodness . . . . .                  | 195        |
| <br>                                                 |            |
| <b>10 Side-Information Problems</b>                  | <b>289</b> |
| 10.1 Syndrome coding . . . . .                       | 292        |
| 10.2 Gaussian multi-terminal problems . . . . .      | 301        |
| 10.3 Rate-distortion with side information . . . . . | 305        |
| 10.4 Lattice Wyner-Ziv coding . . . . .              | 310        |
| 10.5 Channels with side information . . . . .        | 323        |
| 10.6 Lattice dirty-paper coding . . . . .            | 327        |
| <br>                                                 |            |
| <b>11 Modulo-Lattice Modulation</b>                  | <b>343</b> |
| 11.1 Separation vs. JSCC . . . . .                   | 344        |
| 11.2 Figures of merit for JSCC . . . . .             | 346        |
| 11.3 Joint Wyner-Ziv / dirty-paper coding . . . . .  | 348        |
| 11.4 Bandwidth conversion . . . . .                  | 354        |
| <br>                                                 |            |
| <b>12 Gaussian Networks</b>                          | <b>363</b> |
| 12.1 The two-help-one problem . . . . .              | 365        |
| 12.2 Dirty multiple-access channel . . . . .         | 378        |
| 12.3 Lattice network coding . . . . .                | 388        |
| 12.4 Interference alignment . . . . .                | 409        |
| 12.5 Summary and outlook . . . . .                   | 418        |
| <br>                                                 |            |
| <b>13 Error Exponents</b>                            | <b>431</b> |
| 13.1 Sphere-packing exponent . . . . .               | 433        |
| 13.2 Measures of lattice-to-noise density . . . . .  | 436        |
| 13.3 Threshold-decoding exponent . . . . .           | 437        |
| 13.4 Nearest-neighbor decoding exponent . . . . .    | 440        |
| 13.5 Distance spectrum and pairwise errors . . . . . | 444        |
| 13.6 Minimum-distance exponent . . . . .             | 445        |
| 13.7 The expurgated MHS ensemble . . . . .           | 447        |
| 13.8 Error exponents of Voronoi codes . . . . .      | 449        |

Many Cons , What about Pros ?

- Beauty of Lattices
- History
- Circumstances
- Teaching (basis for a course)
- Anecdotes , Future ...

# Anecdotes

o Who can help me with the figures ?

(Ilai Bistritz)



o Collaboration in writing Chapters 11 and 12

(Yuval Kochman & Bobak Nazer)



o Story of a book ...

(Shannon - Slepian - Wyner - Berger - Ephremides)



# Future ...

Home CFP Committee Program Registration About

**ITW**  
Jerusalem  
**2015**

**2015 IEEE Information Theory Workshop**  
Jerusalem, ISRAEL | April 26 – May 1



Search

**Recent Posts**

- New submission deadline: Oct. 31, 2014
- "Jerusalem Explained" video added
- Submission now open through EDAS
- Plenary speakers and invited sessions added
- Welcome TPC members!

**Categories**

- News

**Submission is now open through EDAS:**

<http://edas.info/newPaper.php?c=18275&track=61231>

**Dates**

- Paper submission: October 31, 2014 (23:59:59pm PDT)
- Acceptance notification: January 10, 2015
- Final paper submission: March 1, 2015 (23:59:59pm PDT)

**Dates for invited papers**

- Paper registration (title+abstract): December 15, 2014
- Final manuscript: March 1, 2015 (23:59:59pm PDT)

**Upload link for invited papers:**

<http://edas.info/newPaper.php?c=18275&track=61232>

**Scope**

Original contributions in Information and Coding theory are solicited. The scope of topics is broad, with emphasis on the following themes:

IT and C8

Last but not Least ...

Student @ Lab 102



The  
Zamir  
Family



Thank You!

