# CODE DESIGN BASED ON METRIC-SPECTRUM AND APPLICATIONS 

A Dissertation<br>by<br>PANAYIOTIS D. PAPADIMITRIOU

## Submitted to the Office of Graduate Studies of Texas A\&M University in partial fulfillment of the requirements for the degree of DOCTOR OF PHILOSOPHY

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ABSTRACT<br>Code Design Based on Metric-Spectrum and Applications. (December 2004)<br>Panayiotis D. Papadimitriou, B.S., University of Patras, Greece;<br>M.S., University of Patras, Greece<br>Chair of Advisory Committee: Dr. Costas N. Georghiades

We introduced nested search methods to design $(n, k)$ block codes for arbitrary channels by optimizing an appropriate metric spectrum in each iteration. For a given $k$, the methods start with a good high rate code, say $k /(k+1)$, and successively design lower rate codes up to rate $k / 2^{k}$ corresponding to a Hadamard code. Using a full search for small binary codes we found that optimal or near-optimal codes of increasing length can be obtained in a nested manner by utilizing Hadamard matrix columns. The codes can be linear if the Hadamard matrix is linear and non-linear otherwise. The design methodology was extended to the generic complex codes by utilizing columns of newly derived or existing unitary codes. The inherent nested nature of the codes make them ideal for progressive transmission.

Extensive comparisons to metric bounds and to previously designed codes show the optimality or near-optimality of the new codes, designed for the fading and the additive white Gaussian noise channel (AWGN). It was also shown that linear codes can be optimal or at least meeting the metric bounds; one example is the systematic pilot-based code of rate $k /(k+1)$ which was proved to meet the lower bound on the maximum cross-correlation. Further, the method was generalized such that good codes for arbitrary channels can be designed given the corresponding metric or the pairwise error probability.

In synchronous multiple-access schemes it is common to use unitary block codes
to transmit the multiple users' information, especially in the downlink. In this work we suggest the use of newly designed non-unitary block codes, resulting in increased throughput efficiency, while the performance is shown not to be substantially sacrificed. The non-unitary codes are again developed through suitable nested searches. In addition, new multiple-access codes are introduced that optimize certain criteria, such as the sum-rate capacity.

Finally, the introduction of the asymptotically optimum convolutional codes for a given constraint length, reduces dramatically the search size for good convolutional codes of a certain asymptotic performance, and the consequences to coded codedivision multiple access (CDMA) system design are highlighted.

To my beloved Father, Mother, Brother, and to my Blessed Geronta.

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## CHAPTER I

## INTRODUCTION

Modern Communications make use of various types of codes to improve communication reliability by appropriately inserting redundancy to the information to be transmitted. There are two major types of channel codes, convolutional and block codes, over which all modern concatenated coding schemes are based. Other types of codes include the codes used to "multiplex" the information from many data sources prior to transmission. For example, in the code division multiple access scheme, a block code is used to multiplex the information from different users, e.g. a Hadamard block code.

Code design is often focused on a specific communication scenario, such as transmission over a specific channel, or under some constraints (for example, power, bandwidth). The code design is traditionally performed by algebraic methods, combined with some type of a sophisticated search. The target of the design is usually the minimization of the probability of error which is characterized by some metric.

Since in many cases the probability of error, is hard to derive analytically, a usual approach is to employ the union-bound which is the sum of all the pairwise codeword error probabilities. The set of all the values of the metric characterizing the pairwise error probabilities is called the metric-spectrum.

In this work, we develop a generic block code design methodology for arbitrary channel based on a nested search targeted at optimizing the corresponding metricspectrum. Extensive comparisons to metric bounds and applications of the designed codes are given to point out their efficiency. In addition, we introduce asymptotically
optimum convolutional codes based on the metric-spectrum to facilitate code design.
In more detail, in this dissertation, we first give a brief background on the basic concepts of this work, such as the channel codes, convolutional and block codes, as well as the probability of error of some communication channels of interest, such as the AWGN and the fading channel with coherent and noncoherent detection. Additionally we include a brief coding literature survey.

In Chapter III we introduce the union bound on the probability of error, and the concept of the metric-spectrum in general, and specifically for the aforementioned communication channels. Based on the metric-spectrum, we give the definition of best and optimal codes. In addition we present from the literature some metric bounds, and derive our own bounds for a limited number of cases, as well as derive some new unitary codes to be used in the search methods.

Chapter IV deals with search methods to find block codes for arbitrary communication channels, for which the pairwise error probability is known either analytically or through an upper bound. The new block codes, binary and complex, derived from the search methods, are presented in Chapter V, targeting the AWGN and fading channels. The optimality or near-optimality of the new codes is shown - when applicable - with comparisons to the corresponding metric bounds and to prior state-of-the-art codes.

In Chapter VI we show the applications of the previously designed codes for the multiple-access case, as well as introduce modifications of search methods to fit the specific communication problems in multiple-access scenarios. Where applicable, comparison to existing codes for the multiple-access channel is also performed, showing the efficiency of our codes.

Chapter VII includes the introduction of asymptotically optimum rate $1 / n$ convolutional codes for a given constraint length, based on the distance spectrum concept.

It is shown that one need not employ very low rate convolutional codes to achieve maximum asymptotic performance, which can be achieved by codes of rates up to $1 / 7$. Based on this result, it is also argued that the use of low rate convolutional codes in CDMA may not be the most efficient approach.

Finally, Chapter VIII concludes the dissertation.

## CHAPTER II

## BACKGROUND

In this chapter we give the necessary background needed in the dissertation. We discuss briefly channel coding techniques, such as block codes and convolutional codes, which are the codes that we deal with in this dissertation. More emphasis is given to block codes, binary and complex, throughout the dissertation. Secondly, we review some major communication channels and their corresponding probabilities of error, in which our design methods are based. Finally, a literature survey is performed towards the end of the chapter on related code design techniques.

## II.1. Channel Coding

Channel coding, refers to the addition of redundancy into the information stream to be transmitted in a way that it (the information) will be received at the receiver with a small probability of error (reliable transmission). We will consider two major categories of channel codes; block and convolutional codes.

## II.1.1. Block Codes

We consider the binary $(n, k)$ block code described by a matrix,

$$
\mathcal{C}_{M, n}=\left(\begin{array}{cccc}
c_{0,0} & c_{0,1} & \ldots & c_{0, n-1}  \tag{2.1}\\
c_{1,0} & c_{1,1} & \ldots & c_{1, n-1} \\
\vdots & \ddots & \ddots & \vdots \\
c_{M-1,0} & c_{M-1,1} & \ldots & c_{M-1, n-1}
\end{array}\right)
$$

where $M=2^{k}$ is the cardinality of the code, and $n$ the code length.

$$
\begin{equation*}
\mathbf{c}_{j}=\left[c_{j, 0}, c_{j, 1}, \ldots, c_{j, n-1}\right], \quad j=0,1, \ldots, M-1 \tag{2.2}
\end{equation*}
$$

constitutes the codeword $\mathbf{c}_{j}$ of length $n$ with elements from the binary field [1, p. 69]. It is apparent that the block code can be considered as a matrix of size $M \times n$ with the codewords as its rows.

If the block code is linear, then it can be also uniquely represented by its generator matrix, $\mathbf{G}$, of size $k \times n\left(k=\log _{2} M\right)$ where

$$
\begin{equation*}
\mathcal{C}_{M, n}=\mathbf{m G} \tag{2.3}
\end{equation*}
$$

and $\mathbf{m}$ is the matrix containing all the possible $M=2^{k}$ combinations of $k$ bits (assuming binary code), as its rows, i.e.

$$
\mathbf{m}=\left(\begin{array}{ccccc}
0 & 0 & \ldots & 0 & 0  \tag{2.4}\\
0 & 0 & \ldots & 0 & 1 \\
0 & 0 & \ldots & 1 & 0 \\
0 & 0 & \ldots & 1 & 1 \\
\ldots & \ldots & \ldots & \ldots & \ldots \\
1 & 1 & \ldots & 1 & 0 \\
1 & 1 & \ldots & 1 & 1
\end{array}\right)
$$

The code rate, $R$, is defined as

$$
\begin{equation*}
R=\frac{k}{n} \tag{2.5}
\end{equation*}
$$

The weight of a binary codeword is the number of ones it contains. Hamming distance $d_{H}$ between two binary codewords is the number of bits in which the two codewords differ, and finally minimum distance $d_{\min }$ of a block code is the minimum

Hamming distance between all its distinct codeword pairs, [1].
In the encoding process, an information $k$-tuple (word), e.g. the $j^{\text {th }}$ row of $\mathbf{m}$, $\mathbf{m}_{j}$, is mapped to a codeword, e.g. the $j^{\text {th }}$ row of $\mathcal{C}_{M, n}, \mathbf{c}_{j}(2.1)$, (2.2); for linear codes this mapping is given by

$$
\begin{equation*}
\mathbf{c}_{j}=\mathbf{m}_{j} \mathbf{G} . \tag{2.6}
\end{equation*}
$$

The block encoding process is memoryless, meaning that the codeword selected by the information $k$-tuple does not depend on previous information $k$-tuples.

Systematic block codes are a special case of block codes where the information $k$-tuple appears as a block in the codeword.

In the dissertation we focus only on code design, hence we assume generic maximum-likelihood decoding. The interesting reader may consult the various coding books for numerous decoding algorithms $[1,2]$.

For simplicity, we considered in this brief introduction binary block codes. However in general the code's elements $c_{j, q}$ maybe from any complex alphabet $\mathcal{A}$.

If $\mathcal{A}$ is the $Q$-ary PSK alphabet, we let the generator matrix G have elements from the ring of integers modulo $Q, \mathbb{Z}_{Q}[3]$. Likewise $\mathbf{m}$ is the matrix containing all the possible $M=Q^{k}$ combinations of $k Q$-ary integers $(\in[0,1, \ldots, Q-1])$, as its rows. Then we define the (complex) block code as, cf. [3],

$$
\begin{equation*}
\mathcal{C}_{M, n}=\Psi(\mathbf{m G}), \tag{2.7}
\end{equation*}
$$

where

$$
\begin{equation*}
[\Psi(\mathbf{C})]_{j q} \equiv \exp \left(-i \frac{2 \pi}{Q} \mathbf{C}_{j q}\right) \tag{2.8}
\end{equation*}
$$

$i=\sqrt{-1}$, and $\mathbf{C}_{q j}$ the element of $\mathbf{C}$ at the $j^{\text {th }}$ row and $q^{t h}$ column.

## II.1.2. Convolutional Codes

The convolutional encoder can be considered as a finite impulse response (FIR) filter [1]. Therefore it can encode the whole data stream into a single codeword without the necessity of breaking down the data stream into $k$-tuples as it is happening in the block codes. However by $k$-tuples in the convolutional codes, we generally mean the $k$ bits entering the encoder in each shift of the encoder. Likewise by $n$ we denote the number of bits exiting the encoder in each shift of the encoder (or in each entry of a new $k$-tuple).

The convolutional encoder of rate $R=k / n$ is characterized by its $k \times n$ impulse responses, i.e. one impulse response for each input-output pair. Besides the rate, the convolutional encoder is also characterized by the constraint length $K$, which equals the length of the longest impulse response.

Let's take for example the rate $R=1 / 2$ convolutional encoder of Fig. 1:


Fig. 1. Rate $1 / 2$ convolutional encoder.

This encoder (shift register) is characterized by the two impulse responses:

$$
\begin{align*}
& \mathbf{g}_{1}=[1,0,1]  \tag{2.9}\\
& \mathbf{g}_{2}=[1,1,1]
\end{align*}
$$

which represent the connections of the shift register to the corresponding encoder
outputs, where the adders are modulo- 2 . The constraint length of this encoder is $K=3$.

## II.2. Communication Channels - Probability of Error

The communication channels are the media through which the transmitted signal reaches the receiver. These channels distort in some sense the transmitted signal. Therefore the receiver must either apply advanced equalization techniques or a provision must be taken to add a redundancy to the transmitted signal, in some form of channel coding, so that its errorless recovery will be more likely.

The channel code shall be designed for each communication channel, so that the corresponding probability of error is minimized. In the following we will list a few of the popular communication channels [4, 5], and we will give the corresponding probabilities of error.

## II.2.1. AWGN Channel

In the AWGN channel, the transmitted signal vector is corrupted by additive random noise following the normal distribution [6],

$$
\begin{equation*}
\mathbf{r}=\mathbf{x}+\boldsymbol{\nu} \tag{2.10}
\end{equation*}
$$

where $\mathbf{x}=\left[x_{0}, x_{1}, \ldots, x_{n-1}\right]^{T}$ and $\mathbf{r}=\left[r_{0}, r_{1}, \ldots, r_{n-1}\right]^{T}$ are the transmitted and received vectors respectively, and $\boldsymbol{\nu}=\left[\nu_{0}, \nu_{1}, \ldots, \nu_{n-1}\right]^{T}$ is the additive noise vector. $\nu_{j}$ are i.i.d. random variables such that $\nu_{j} \sim \mathcal{N}\left(0, \sigma^{2}\right)$, where $\sigma^{2}=N_{0} / 2$ is the noise variance.

Assuming that we transmit one of two different binary vectors $\mathbf{x}_{1}$ and $\mathbf{x}_{2}$, then the pairwise error probability (PEP) is given by

$$
\begin{equation*}
P_{2}\left(\mathbf{x}_{1} \rightarrow \mathbf{x}_{2}\right)=Q\left(\sqrt{\frac{E_{s}}{N_{0}} 2 d_{H}\left(\mathbf{x}_{\mathbf{1}}, \mathbf{x}_{\mathbf{2}}\right)}\right) \tag{2.11}
\end{equation*}
$$

where $E_{s}$ is the energy per transmitted symbol and $d_{H}\left(\mathbf{x}_{\mathbf{1}}, \mathbf{x}_{\mathbf{2}}\right)$ is the Hamming distance between vectors $\mathbf{x}_{1}$ and $\mathbf{x}_{2}$.

If we now assume the transmission of two complex vectors $\mathbf{x}_{1}$ and $\mathbf{x}_{2}$, then the pairwise error probability (PEP) can be shown to be [7]

$$
\begin{equation*}
P_{2}\left(\mathbf{x}_{1} \rightarrow \mathbf{x}_{2}\right)=Q\left(\sqrt{\frac{E_{s}}{N_{0}} \frac{d_{E}^{2}\left(\mathbf{x}_{\mathbf{1}}, \mathbf{x}_{\mathbf{2}}\right)}{2}}\right) \tag{2.12}
\end{equation*}
$$

where

$$
\begin{equation*}
d_{E}^{2}\left(\mathbf{x}_{\mathbf{1}}, \mathbf{x}_{\mathbf{2}}\right)=\sum_{j=1}^{n}\left|x_{1 j}-x_{2 j}\right|^{2} \equiv\left\|\mathbf{x}_{\mathbf{1}}-\mathbf{x}_{\mathbf{2}}\right\|^{2} \tag{2.13}
\end{equation*}
$$

is the squared Euclidean distance.
We observe from (2.11) and (2.12) that in the AWGN channel, the maximization of the Hamming or Euclidean distance minimizes the probability of error (for binary signaling).

## II.2.2. Noncoherent Block Fading Channel

Assume the following discrete-time vector model of the block fading channel,

$$
\begin{equation*}
\mathbf{r}=\alpha \mathbf{x}+\boldsymbol{\nu} \tag{2.14}
\end{equation*}
$$

where $\mathbf{x}=\sqrt{E_{s}} \mathbf{d}, \mathbf{d}=\left[d_{0}, d_{1}, \ldots, d_{n-1}\right]^{T}$. The fading variable $\alpha$ is modeled as a zero-mean, circularly symmetric, complex Gaussian random variable of variance $\sigma_{\alpha}^{2}$, and $\boldsymbol{\nu}$ is a vector of i.i.d., zero-mean, circularly symmetric complex Gaussian random variables having variance $\sigma^{2}=N_{0}$. $E_{s}$ is the energy per symbol.

If we assume that the modulation symbols $d_{j}$ take values from the binary set
$\{1,-1\}$ with equal probability and independently in time, then the noncoherent maximum likelihood (ML) detector can be shown to be

$$
\begin{equation*}
\hat{\mathbf{d}}=\arg \max _{\mathbf{d}}\left|\mathbf{r}^{H} \mathbf{d}\right|^{2} . \tag{2.15}
\end{equation*}
$$

The ML detector makes an error if it chooses, say, the $2^{\text {nd }}$ codeword (vector), while the first codeword was transmitted. The pairwise word error probability $P_{2}\left(\mathbf{d}_{1} \rightarrow \mathbf{d}_{2}\right)$ can be shown to be (see Appendix A)

$$
\begin{equation*}
P_{2}^{w} \equiv P_{2}\left(\mathbf{d}_{1} \rightarrow \mathbf{d}_{2}\right)=\frac{1}{2}-\frac{1}{2} \sqrt{\frac{\Lambda^{2}\left(1-\rho^{2}\right)}{\Lambda^{2}\left(1-\rho^{2}\right)+4 \Lambda+4}} \tag{2.16}
\end{equation*}
$$

where

$$
\begin{equation*}
\Lambda=\frac{\sigma_{\alpha}^{2}}{\sigma^{2}} n E_{s}=n \sigma_{\alpha}^{2} \frac{E_{s}}{N_{0}}=n \frac{\bar{E}_{s}}{N_{0}}, \tag{2.17}
\end{equation*}
$$

and $\rho$ is the normalized cross-correlation of codewords $\mathbf{d}_{1}$ and $\mathbf{d}_{2}$, defined as

$$
\begin{equation*}
\rho=\frac{1}{n} \mathbf{d}_{1}^{T} \mathbf{d}_{2} . \tag{2.18}
\end{equation*}
$$

Notice that $0 \leq \rho^{2} \leq 1$. From (2.16) we see that the pairwise word error probability is minimized for $\rho^{2}=0$, i.e. for orthogonal codewords. Since $P_{2}^{w}$ depends on $\rho^{2}$ for a given code and $\Lambda$, we are interested in minimizing $\rho^{2}$, or its absolute value $|\rho|$ (i.e., make it as close to zero as possible). This equivalently means that the Hamming distance $\left(d_{H}\right)$ [1] between two codewords, should be as close as possible to $n / 2$, since $|\rho|=\left|1-2 d_{H} / n\right|$. Note the difference with the AWGN channel, where we want pairs with $d_{H}$ as close as possible to $n$.

If we let now the modulation symbols $d_{j}$ take complex values, we have that the pairwise word error probability $P_{2}^{w}$ is upper-bounded by [8]

$$
\begin{equation*}
P_{2}^{w}\left(\rho^{2}\right) \leq \frac{1}{2} \cdot \frac{1}{1+\frac{\Lambda^{2}\left(1-|\rho|^{2}\right)}{4(1+\Lambda)}}=\frac{1}{2} \cdot \frac{4 \Lambda+4}{\Lambda^{2}\left(1-|\rho|^{2}\right)+4 \Lambda+4} \tag{2.19}
\end{equation*}
$$

which is also minimized for $|\rho|^{2}=0$ and maximized for $|\rho|^{2}=1$, where here

$$
\begin{equation*}
\rho=\frac{1}{n} \mathbf{d}_{1}^{H} \mathbf{d}_{2} \tag{2.20}
\end{equation*}
$$

assuming the codewords $\mathbf{d}_{i}$ have norm $\left\|\mathbf{d}_{i}\right\|=\left(\mathbf{d}_{i}^{H} \mathbf{d}_{i}\right)^{1 / 2}=\sqrt{n}$ ( $n$ is the codeword length).

It should be mentioned that the expression in (2.16) was found to be, at least for our checked cases, about 3 dB tighter to that of (2.19) which is an upper-bound, however for complex signals.

## II.2.3. Coherent Fading Channel

By coherent fading channel we refer to a fading channel, with coherent maximum likelihood (ML) detection. In mathematical terms, the communication through the fading channel can be described as,

$$
\begin{equation*}
\mathbf{r}=\mathbf{A} \mathbf{x}+\boldsymbol{\nu} \tag{2.21}
\end{equation*}
$$

where here $\mathbf{A}=\operatorname{diag}\left(\left[\alpha_{0}, \alpha_{1}, \ldots, \alpha_{n-1}\right]\right)$, and $\alpha_{j}$ are the i.i.d. fading coefficients following the generic Rician distribution $[9,5]$,

$$
p(\alpha)= \begin{cases}2 \alpha(1+K) \exp \left[-K-\alpha^{2}(1+K)\right] I_{0}(2 \alpha \sqrt{K(1+K)}), & \alpha \geq 0  \tag{2.22}\\ 0, & \text { o.w. }\end{cases}
$$

where $K$ is the Rice factor representing the ratio of the power of the fixed-path (line-of-sight) component to the power of the Rayleigh (diffused) component of the fading
amplitude $\alpha . \boldsymbol{\nu}=\left[\nu_{0}, \nu_{1}, \ldots, \nu_{n-1}\right]^{T}$ is the additive noise vector, where $\nu_{j}$ is a sample of a zero mean Gaussian process with variance $\sigma^{2}=N_{0}$.

For simplicity we assume perfect channel state information (CSI) at the receiver, and transmission of symbols from the $Q$-ary PSK alphabet, i.e.

$$
\begin{equation*}
x_{j}=\exp \left(-i \frac{2 \pi}{Q} p\right) \tag{2.23}
\end{equation*}
$$

where $p=0,1,2, \ldots, Q-1$, and $i=\sqrt{-1}$.
Then it has been shown in $[9,10]$ that the pairwise error probability is upperbounded by:

$$
\begin{equation*}
P_{2}\left(\mathbf{x}_{1} \rightarrow \mathbf{x}_{2}\right) \leq \exp \left(-\frac{\bar{E}_{s}}{4 N_{0}} d^{2}\right) \tag{2.24}
\end{equation*}
$$

where

$$
\begin{equation*}
d^{2}=\sum_{j \in \xi} \frac{\left|x_{1 j}-x_{2 j}\right|^{2} K}{1+K+\frac{\bar{E}_{s}}{4 N_{0}}\left|x_{1 j}-x_{2 j}\right|^{2}}+\left(\frac{\bar{E}_{s}}{4 N_{0}}\right)^{-1} \ln \left(\frac{1+K+\frac{\bar{E}_{s}}{4 N_{0}}\left|x_{1 j}-x_{2 j}\right|^{2}}{1+K}\right), \tag{2.25}
\end{equation*}
$$

and $\xi$ is the set of all $j$, for which $x_{1 j} \neq x_{2 j}$.
Expression (2.24) is generic in that it can be simplified to the two extreme cases i.e. the AWGN and the Rayleigh channel, for $K=\infty$ and $K=0$, respectively.

In more detail [9] for $K=\infty$ (AWGN), (2.25) reduces to, cf. (2.13)

$$
\begin{equation*}
d^{2}=\sum_{j \in \xi}\left|x_{1 j}-x_{2 j}\right|^{2} \tag{2.26}
\end{equation*}
$$

i.e. the squared Euclidean distance, and for $K=0$ (Rayleigh), (2.25) reduces to

$$
\begin{equation*}
d^{2}=\sum_{j \in \xi}\left(\frac{\bar{E}_{s}}{4 N_{0}}\right)^{-1} \ln \left(1+\frac{\bar{E}_{s}}{4 N_{0}}\left|x_{1 j}-x_{2 j}\right|^{2}\right) . \tag{2.27}
\end{equation*}
$$

Equation (2.24) can be simplified to

$$
\begin{equation*}
P_{2}\left(\mathbf{x}_{1} \rightarrow \mathbf{x}_{2}\right) \leq\left[\prod_{j \in \xi}\left(1+\frac{\bar{E}_{s}}{4 N_{0}}\left|x_{1 j}-x_{2 j}\right|^{2}\right)\right]^{-1} \tag{2.28}
\end{equation*}
$$

## II.2.4. Generic Channel

In the generic channel case, we will assume any channel for which the pairwise error probability or an upper-bound of it is known, e.g.

$$
\begin{equation*}
P_{2}\left(\mathbf{x}_{1} \rightarrow \mathbf{x}_{2}\right) \leq f(\mu) \tag{2.29}
\end{equation*}
$$

where $f(\cdot)$ a function monotonic in $\mu$.
Equation (2.29) will be useful later in the generalization of our code design methodology.

## II.3. Coding Literature Survey

The topic of the code design is one of the richest in the communication literature, from the fact that all modern communication systems are relying in good channel codes. Since in this dissertation we are focused on basic channel codes, we won't refer to any concatenated coding schemes.

Historically, the coding theory began in the late 1940's with the work of Golay, Hamming and Shannon [11]. Since then, many codes have been developed for a multitude of channel conditions, and an extensive list of their majority may be found in many coding books $[11,1,2,12,13]$.

For the AWGN channel, codes from all categories have been designed. From the category of block codes, some popular codes are the Hamming, Golay, Reed-Muller, BCH and Reed-Solomon codes [11]. Another interesting class of block codes are also
the linear codes constructed from simplex codes by using the notion of anticodes (see [11, p. 547] and the references therein). The key idea behind these codes was found to be the most related (independent though) to our block code design, as compared to the rest of the block codes.

In more detail, these codes are constructed from the generator matrix of a binary simplex code (or several copies of it), by deleting certain columns, which form the generator matrix of the anticode. The formation of the anticode is more involved, using the tool of projective geometry (see [11] and the references therein).

It must be also noted that the majority of block code designs is based on algebraic properties, as opposed to the next category, the convolutional codes, which are usually found based on exhaustive searches or heuristic design techniques.

Convolutional codes for the AWGN channel exist for a wide range of code rates. Their simple ML decoding algorithm (the so-called Viterbi algorithm [14]) has made them popular compared to block codes. Extensive lists of convolutional codes can be found in $[15,16,17,18,19,20,21,1]$, for example.

In the coded modulation for AWGN many good codes also exist, which provide good performance with minimal or no bandwidth expansion compared to uncoded modulation. Extensive lists and references of codes exist in [22, 23, 24, 12, 13, 25].

For the coherent fading channel, we are aware of only trellis code designs, e.g. [10, 9, 26, 27, 28, 29, 30]. See also [5].

Coding for the fading channel with noncoherent detection seems to be still at an early stage, since only a limited number of publications have been reported. The characteristic of this case is that only block codes have been considered, to the best of our knowledge, with the exception of the work of Giallorenzi and Wilson [31]. We are aware of the pioneering work of Knopp and Leib [32, 3] in 1993, as well the works of $[33,8,34,35]$.

In more detail, Knopp and Leib in $[32,3]$ created good $M$-PSK block codes, in one case by excluding unwanted vectors (codewords that increase the maximum crosscorrelation) through concatenation of generator matrices. In another case, by allowing codeword overlapping and relying on computer searches, both exhaustive and random. In [33] the authors came up with an analytical linear block code design approach for noncoherent detection, however they confined themselves to codes with very small redundancy. Finally, in [34] a random search is performed either on DFT matrix' columns, or on the elements of a predefined-size generator matrix so that the maximum cross-correlation of the resulting code is minimum.

## CHAPTER III

## UNION BOUND, METRIC SPECTRUM AND OPTIMAL BLOCK CODES*

The performance of a communication system is usually measured by the probability of error. The error may refer among others, to the transmitted signals (codewords), or to the transmitted bits.

## III.1. Union Bound and Metric Spectrum

Let us assume the transmission of (one of) $M$ codewords over a communication channel. Further we assume the codewords are of a specific length, say $n$, with elements from some alphabet, $\mathcal{A}$.

Then by the total probability theorem [6], the probability of a codeword error, $P(e)$, is given by

$$
\begin{equation*}
P(e)=\sum_{j=0}^{M-1} P\left(e \mid \mathbf{s}_{j}\right) P\left(\mathbf{s}_{j}\right) \tag{3.1}
\end{equation*}
$$

where $P\left(e \mid \mathbf{s}_{j}\right)$ is the probability of decision error when the actual transmitted codeword is $\mathbf{s}_{j}$, and $P\left(\mathbf{s}_{j}\right)$ the a priori probability of $\mathbf{s}_{j}$. Now, $P\left(e \mid \mathbf{s}_{j}\right)$ can be upperbounded by the union bound as [7, p. 265],

$$
\begin{equation*}
P\left(e \mid \mathbf{s}_{j}\right) \leq \sum_{i=0, i \neq j}^{M-1} P_{2}\left(\mathbf{s}_{j} \rightarrow \mathbf{s}_{i}\right) \tag{3.2}
\end{equation*}
$$

where $P_{2}\left(\mathbf{s}_{j} \rightarrow \mathbf{s}_{i}\right)$ is the pairwise error probability of erroneously deciding that codeword $\mathbf{s}_{i}$ was transmitted, when $\mathbf{s}_{j}$ is the actually transmitted one.

[^0]By assuming equally likely transmitted codewords, i.e. $P\left(\mathbf{s}_{j}\right)=1 / M, \forall j$, we have through (3.1), (3.2) that

$$
\begin{equation*}
P(e) \leq \frac{1}{M} \sum_{j=0}^{M-1} \sum_{i=0, i \neq j}^{M-1} P_{2}\left(\mathbf{s}_{j} \rightarrow \mathbf{s}_{i}\right) \tag{3.3}
\end{equation*}
$$

If the underlying channel code is linear, and if the uniform error property [25, p . 530], [4] holds, i.e.

$$
\begin{equation*}
P\left(e \mid \mathbf{s}_{j}\right)=c, \text { for some constant } c, \tag{3.4}
\end{equation*}
$$

then for equally likely transmitted codewords, (3.1) can be simplified to

$$
\begin{equation*}
P(e)=P\left(e \mid \mathbf{s}_{0}\right) \tag{3.5}
\end{equation*}
$$

and by using (3.2) we have that

$$
\begin{equation*}
P(e) \leq \sum_{i=1}^{M-1} P_{2}\left(\mathbf{s}_{0} \rightarrow \mathbf{s}_{i}\right) \tag{3.6}
\end{equation*}
$$

where we have assumed that $\mathbf{s}_{0}$ is the transmitted codeword.
Let us assume that the pairwise error probability, $P_{2}\left(\mathbf{s}_{j} \rightarrow \mathbf{s}_{i}\right)$ is a strictly decreasing function ${ }^{1}$ of some metric $\mu$ (although it may not be a true metric ${ }^{2}$ ), which is a function of $\mathbf{s}_{i}, \mathbf{s}_{j}$,

$$
\begin{equation*}
P_{2}\left(\mathbf{s}_{j} \rightarrow \mathbf{s}_{i}\right) \equiv f(\mu) . \tag{3.7}
\end{equation*}
$$

[^1]For example, in the AWGN channel (2.12), the pairwise error probability is a strictly decreasing function of the squared Euclidean distance between the two codewords.

Now we can rewrite (3.3) as

$$
\begin{equation*}
P(e) \leq \frac{2}{M} \sum_{\mu \in \mathcal{M}} N_{\mu} P_{2}(\mu) \tag{3.8}
\end{equation*}
$$

where $\mathcal{M}$ the set of all the possible pairwise values of $\mu$, and

$$
\begin{equation*}
\sum_{\mu \in \mathcal{M}} N_{\mu}=\binom{M}{2} \tag{3.9}
\end{equation*}
$$

Similarly (3.6) may be written as

$$
\begin{equation*}
P(e) \leq \sum_{\mu \in \mathcal{M}_{\mathrm{UEP}}} N_{\mu} P_{2}(\mu) \tag{3.10}
\end{equation*}
$$

where here $\mathcal{M}_{\text {UEP }}$ is the set of all the possible pairwise values of $\mu$ according to (3.6), and obviously,

$$
\begin{equation*}
\sum_{\mu \in \mathcal{M}_{\mathrm{UEP}}} N_{\mu}=M-1 \tag{3.11}
\end{equation*}
$$

Let us assume that the metric $\mu$ can take for all the possible transmitted codewords the values $\mu_{0}<\mu_{1}<\mu_{2}<\ldots<\mu_{\delta}$.

Now specifically, for each of the equations (3.8) or (3.10), we can define the metric spectrum,

$$
\begin{equation*}
\mathcal{S}_{\mu} \equiv\left\{\left(\mu_{0}, N_{0}\right),\left(\mu_{1}, N_{1}\right),\left(\mu_{2}, N_{2}\right), \ldots,\left(\mu_{\delta}, N_{\delta}\right)\right\} \tag{3.12}
\end{equation*}
$$

where $N_{i}$ are the multiplicities (some of them can be zero) of the corresponding $\mu_{i}$. If the multiplicities of (3.12) satisfy (3.11) we will call the corresponding metric spectrum short, to distinguish from the (full) metric spectrum resulting from all the
pairwise metrics, cf. (3.9).
The $\mu_{\text {min }} \equiv \mu_{q}$, for some $q \in[0, \delta]$ is defined as the minimum ${ }^{3} \mu$ for either (3.8) or (3.10), for which its corresponding multiplicity $N_{\min }$ is non-zero.

The metric-spectrum is useful in the sense that if we know it for a certain transmission of codewords (signals), like the codewords of a block code, then we can easily obtain the upper-bound on the probability of a codeword error. Therefore, we could say that, the metric spectrum "measures" the performance of the code, through the union upper-bound.

## III.2. Optimal Metric Spectrum and Optimal Block Codes

Having defined the metric spectrum for our communication problem (3.12), we can derive the optimal metric-spectrum, which derivation depends on the monotonicity of the pairwise error probability on the metric $\mu$. Here in the general case, cf. (3.7), we will assume that the pairwise error probability is strictly decreasing in $\mu$.

The optimal metric-spectrum intuitively shall be the one that minimizes asymptotically (at high $E_{s} / N_{0}$ ) the probability of error as it is given by the union bound, (3.8) or (3.10), over all the possible metric-spectra, e.g. the spectra of all the possible block codes of a certain cardinality, length and alphabet.

In mathematical terms, the optimal metric spectrum may be stated as follows:

Definition III.1. Optimal metric spectrum (PEP is strictly decreasing on $\mu$ ).
The optimal metric spectrum $\mathcal{S}^{*}$ over all the possible spectra $\mathcal{S}$ of block codes of cardinality $M$, length $n$ and alphabet $\mathcal{A}$, is the one for which one of the following is

[^2]true:
\[

$$
\begin{aligned}
& \text { 1. } \mu_{\min }^{*}>\mu_{\min } \text {, or } \\
& \text { 2. } \mu_{\min }^{*}=\mu_{\min } \text {, and there exists some } \\
& \lambda \in\{q, q+1, q+2, \ldots, \delta\}: N_{\min }^{*}=N_{\min }, \ldots, N_{\lambda-1}^{*}=N_{\lambda-1}, N_{\lambda}^{*}<N_{\lambda} .
\end{aligned}
$$
\]

That is the optimal metric spectrum has either the maximum $\mu_{\min }$ among all the metric spectra, or if there is some other metric spectrum having same $\mu_{\min }$ then the optimal metric spectrum is the one having the smaller multiplicity for some $\mu$ (starting checking from the multiplicity of $\mu_{\text {min }}$ onwards).

We now define as optimal block codes the codes having the optimal metric spectrum. Note that these codes minimize asymptotically the probability of word error, according to the union-bound.

Moreover best codes are loosely defined as the codes achieving the optimal metric spectrum over all the spectra of the codes of a limited search. And finally, max- $\mu_{\min }$ codes are defined as the codes achieving the theoretical upper-bound (when available) on the minimum metric $\mu_{\text {min }}$.

In the following we will be more specific and we will review the metrics and the optimal spectra for some of the most widely used channel models referred to in §II.2.

## III.2.1. AWGN Channel

In the AWGN channel, the metric $\mu=d$ ( $d$ can be the Hamming or the squared Euclidean distance). Note also that the pairwise error probability in this case, (2.11), (2.12), is a strictly decreasing function of $d$; therefore the generic definition of the optimal metric spectrum, given in the previous section, also holds here.

Also in this case we will use interchangeably the minimum $\mu$ with the minimum distance values, $\mu_{\min }=d_{\text {min }}$.

## III.2.2. Coherent Fading Channel

From (2.28), we have that in the coherent fading channel with perfect channel state information (CSI), the metric $\mu=B$, where

$$
\begin{equation*}
B=\prod_{j \in \xi}\left(1+\frac{\bar{E}_{s}}{4 N_{0}}\left|x_{1 j}-x_{2 j}\right|^{2}\right) \tag{3.13}
\end{equation*}
$$

It is apparent that the pairwise error probability is here also a strictly decreasing function of $\mu$, therefore the generic definition of the optimal metric spectrum applies also here.

On the other hand, in the literature it is common to approximate (3.13) for reasonably large $\bar{E}_{s} / N_{0}$ values $[9,27]$, i.e.

$$
\begin{equation*}
\tilde{B}=\left(\frac{\bar{E}_{s}}{4 N_{0}}\right)^{\Xi} \prod_{j \in \xi}\left|x_{1 j}-x_{2 j}\right|^{2} \tag{3.14}
\end{equation*}
$$

where $\Xi=|\xi|$ is the cardinality of the set $\xi$, cf. (2.25). In (3.14), $\Xi$ is usually called the effective length and the second term

$$
\begin{equation*}
\Gamma=\prod_{j \in \xi}\left|x_{1 j}-x_{2 j}\right|^{2} \tag{3.15}
\end{equation*}
$$

is the so-called product distance.
Therefore based on the above approximation, in prior work the code design looked independently on the effective length and the product distance [9, 27].

From our perspective, since the approximation for reasonably large signal-to-noise ratios, cf. (3.13), (3.14),

$$
\begin{equation*}
\frac{\bar{E}_{s}}{4 N_{0}}\left|x_{1 j}-x_{2 j}\right|^{2} \gg 1 \tag{3.16}
\end{equation*}
$$

is weak for highly dense constellations, we suggest in the code design using equation (3.13) instead as our optimization criterion (this will be revisited in Chapter V).

## III.2.3. Noncoherent Block Fading Channel

For the non-coherent block fading channel, we have from equations (2.16) and (2.19) that

$$
\begin{equation*}
\mu=|\rho| . \tag{3.17}
\end{equation*}
$$

In this case, however, the pairwise error probability is a strictly increasing function of $\mu$, therefore the optimal metric (cross-correlation in this case) spectrum, given in the previous section, needs to be redefined for this case. Another consequence is that in this channel, the maximum value of $\mu$ needs to be minimized to assure low probability of error.

Recall the metric spectrum defined in (3.12), where now, $\mu_{0}=0$ (the smallest possible $|\rho|$ value). For a $\mathcal{C}_{M, n}$ block code, we define also

$$
\begin{equation*}
\rho_{\max } \equiv \mu_{\max } \equiv \mu_{\delta} \text { for some } \delta \tag{3.18}
\end{equation*}
$$

Therefore the new definition of the optimal metric spectrum for the noncoherent block fading channel is as follows.

Definition III.2. Optimal metric spectrum (PEP is strictly increasing on $\mu$ ).
The optimal metric spectrum $\mathcal{S}^{*}$ over all the possible spectra $\mathcal{S}$ of block codes of
cardinality $M$, length $n$ and alphabet $\mathcal{A}$, is the one for which one of the following is true:

1. $\mu_{\max }^{*}<\mu_{\max }$, or
2. $\mu_{\max }^{*}=\mu_{\max }$, and there exists some

$$
\lambda \in\{0,1,2, \ldots, \delta\}: N_{\lambda}^{*}<N_{\lambda}, N_{\lambda+1}^{*}=N_{\lambda+1}, \ldots, N_{\delta}^{*}=N_{\delta} .
$$

In this case, we need also to add one more definition, that of the min- $\mu_{\max }$ codes, defined as the codes achieving the theoretical lower bound (if any) on the maximum metric $\mu_{\max }$ (as opposed to the previous definition of the max $-\mu_{\min }$ codes).

In addition, we define a block code as catastrophic (for the noncoherent fading channel) if it has $\rho_{\max }=1$, since in this case the codeword pair that has $\rho=1$ will exhibit PEP equal to 0.5 , cf. (2.16).

## III.2.4. Generic Channel

In this case we assume we are given the pairwise error probability which is a complicated function, so that a "metric" $\mu$ cannot be easily derived. Therefore we can set

$$
\begin{equation*}
\mu=P_{2}(\cdot) \tag{3.19}
\end{equation*}
$$

where $P_{2}(\cdot)$ is the PEP of the generic channel. In this case since $\mu$ is the same as the pairwise error probability, we follow Definition III. 2 for the optimal metric spectrum.

## III.3. Metric Bounds

As per our discussion on the previous subsections, the knowledge of a metric bound helps in determining the "quality", i.e. the performance of a designed code in a
particular channel condition.
In the related literature, there exist many bounds both lower and upper for many metrics and corresponding parameters, while also there are cases with metrics for which a bound has not yet been derived. In these cases, we believe our codes (to be presented in Chapter V) will serve as a reference point for future researchers on the topic.

We will start with the Hamming distance, for which there exist bounds for a large multitude of binary code parameters. In [36], the authors provide an extensive list of upper and lower bounds on the minimum distance $d_{\text {min }}$ of binary codes of length up to 127; see also [37].

For the squared Euclidean distance, we are aware of the upper-bounds of $[38,39$, 40]. However in [38] the upper-bound is asymptotic in code length $(n \rightarrow \infty)$, and in [39] the upper-bound is not parameterized with respect to the code's cardinality and length of $Q$ ary-PSK (or complex in general) sequences. Finally, the upper-bound of [40] is parameterized to the code's cardinality $M$, length $n$ and $Q$ ary-PSK alphabet, but is of limited practicality in our case since it is valid, in general, for large cardinalities $\left(M>(Q / 3)^{n}\right)$.

For the coherent fading channel discussed in the Section §III.2.2, we are not aware of any bound on the corresponding metrics.

However the case of the noncoherent fading channel cross-correlation metric is very rich in lower bounds on the maximum cross-correlation, and we give more details in the following subsections.

## III.3.1. Lower Bounds on $\rho_{\max }$ for Binary Block Codes

The larger lower bound (hence the tightest among other lower bounds) we found on the $\rho_{\max }$ of binary codes was that of Levenshtein [41], which we briefly state below:

Theorem III.1. Levenshtein's bound on $\rho_{\max }$.
Let

$$
D_{n}(z)=\left\{\begin{array}{l}
\sum_{i=0}^{\kappa-1}\binom{n}{2 i}-\binom{n-2}{2 \kappa-2} \frac{Q_{2 k-2}^{n-2}(z)}{Q_{2 \kappa}^{2}(z)},  \tag{3.20}\\
\text { if } z_{2 \kappa-1}(n-2)<z \leq z_{2 \kappa}(n-2), \\
\text { where } \kappa=1,2, \ldots,\left\lfloor\frac{n}{2}\right\rfloor \\
\sum_{i=0}^{\kappa-1}\binom{n}{2 i+1}-\binom{n-2}{2 \kappa-1} \frac{Q_{2 \kappa-1}^{n-2}(z)}{Q_{2 \kappa 1}^{n}(z)} \\
\text { if } z_{2 \kappa}(n-2)<z \leq z_{2 \kappa+1}(n-2), \\
\text { where } \kappa=1,2, \ldots,\left\lfloor\frac{n-1}{2}\right\rfloor
\end{array}\right.
$$

where the polynomials $Q_{j}^{n}(z)$ can be found from the following recurrence relation:

$$
\begin{equation*}
(n-j) Q_{j+1}^{n}(z)=z Q_{j}^{n}(z)-j Q_{j-1}^{n}(z), \quad Q_{0}^{n}(z)=1 \tag{3.21}
\end{equation*}
$$

and $z_{j}(n)$ is the largest root of $Q_{j}^{n}(z)$, with $z_{0}(n)=-\infty,(z \in \mathbb{R})$.
Then for any code $\mathcal{C} \subseteq F_{2}^{n}$ ( $F_{2}^{n}$ the Hamming space [41]) such that $\varrho(\mathcal{C})<n$,

$$
\begin{equation*}
|\mathcal{C}| \leq D_{n}(\varrho(\mathcal{C})) \tag{3.22}
\end{equation*}
$$

where $\varrho(\mathcal{C}) \equiv n \rho_{\max }(\mathcal{C})$, and $|\mathcal{C}|=M$ the cardinality of the code $\mathcal{C}$.

In the sequel, we give 6 indicative examples of the evaluation of the Levenshtein's bound (through a symbolic math tool) for various code rates:

- $\mathcal{C}_{6 / 7}$ code, $\rho_{\max } \geq 0.714286$, using $\kappa=3$ (for $\kappa=1,2$ the conditions of (3.20) couldn't be met).
- $\mathcal{C}_{10 / 11}$ code, $\rho_{\max } \geq 0.815723$, using $\kappa=4$.
- $\mathcal{C}_{11 / 12}$ code, $\rho_{\max } \geq 0.833333$, using $\kappa=5$.
- $\mathcal{C}_{11 / 13}$ code, $\rho_{\max } \geq 0.715564$, using $\kappa=3$.
- $\mathcal{C}_{12 / 13}$ code, $\rho_{\max } \geq 0.846154$, using $\kappa=6$.
- $\mathcal{C}_{12 / 32}$ code, $\rho_{\max } \geq 0.290939$, using $\kappa=1$.

Unfortunately it is not known, in general, how tight Levenshtein's bound is. To estimate the bound tightness we compared it with the well known Welch's bound [42],

$$
\begin{equation*}
\rho_{\max }^{2} \geq \frac{1}{M-1}\left(\frac{M}{n}-1\right) \tag{3.23}
\end{equation*}
$$

which is though for complex codes, and as such expected to be loose when applied to binary codes. We found though, that e.g. for $M=32$ and $M=2048$ both bounds agree for $n \geq 9$ and $n \geq 65$ respectively.

We can however "tighten" Levenshtein's bound by the observation that the normalized cross-correlation values of any binary block code of length $n$, are some elements of the set $\mathcal{S}_{0}=\left\{1, \frac{n-2}{n}, \frac{n-4}{n}, \ldots, \frac{\varpi}{n}\right\}$, where $\varpi=0$ for $n$ even, and $\varpi=1$ for $n$ odd. On the other hand, if $\delta$ is Levenshtein's LB, then $\exists \delta \notin \mathcal{S}_{0}$. Therefore, we propose the quantized Levenshtein's LB, $\delta_{q}=\lceil\delta\rceil$, where the operation $\lceil\cdot\rceil$ here means: $\delta_{q}$ is the smallest element of $\mathcal{S}_{0}$, such that $\delta_{q} \geq \delta$.

Furthermore, for a few code rates, we can easily derive some computationally simple (tight for some cases) lower bounds on the $\rho_{\max }$ of binary codes.

The bounds are based on the simple observations that a rate $k / k$ binary code has $\rho_{\max }=1$ (since it necessarily includes complementary codewords, assuming it doesn't have identical codewords), and the rate $k / M\left(M=2^{k}\right)$ orthogonal binary code has $\rho_{\text {max }}=0$.

- For a rate $k /(k+1)$ code, a tight lower bound is $\rho_{\max } \geq(k-1) /(k+1)$.

The proof is trivial: Let the codewords $\mathbf{d}_{1}, \mathbf{d}_{2}$ of the rate $k / k$ code which have $|\rho|=1$, or equivalently $\left|\mathbf{d}_{1}^{T} \mathbf{d}_{2}\right|=k$. Then with the addition of any $M$-bit column to the rate $k / k$ code (which results to a $k /(k+1)$ code), we will have that $\left|\left[\mathbf{d}_{1} ; b_{1}\right]^{T}\left[\mathbf{d}_{2} ; b_{2}\right]\right|=\left|\mathbf{d}_{1}^{T} \mathbf{d}_{2}+b_{1} b_{2}\right|$ where $b_{1}, b_{2}$ the corresponding bits of the additional column. This will be minimum, i.e. $\left|\mathbf{d}_{1}^{T} \mathbf{d}_{2}+b_{1} b_{2}\right|=k-1$, if $b_{1} b_{2}=1$, which is true for $b_{1}=b_{2}$ ( note that $\mathbf{d}_{1}^{T} \mathbf{d}_{2}=-k$ ).

Therefore the rate $k /(k+1)$ code will have $\rho_{\max } \geq(k-1) /(k+1)$, and the bound is tight since it is achieved, for example, for a code resulting by the addition of an all-zeroes or all-ones column to a systematic $k / k$ code (pilot code).

- Following similar arguments, we can show that the rate $k /(k+\mu)$ code $(k>\mu)$, have $\rho_{\max } \geq(k-\mu) /(k+\mu)$ (and by observation, the bound is tighter for smaller $\mu)$.
- For a rate $k /(M-2)$ code, a simple tight lower bound is $\rho_{\max } \geq 2 /(M-2)$, see §VI.1.2, [43].
III.3.2. Lower Bounds on $\rho_{\max }$ for Complex Block Codes

The lower bound depends on the dimensions of the code $M$ (code's cardinality), $n$ (codeword length), and of course on the alphabet of the code's elements. From a
search in the literature we found the bounds of Welch [42], Mazo [44], and Levenshtein [45] for the complex alphabet.

After evaluating them we found Levenshtein's bound to be the tightest. However for some cases checked, we found that all the aforementioned bounds merge (become identical) after some $n$. For example, all the three bounds merge for $n \geq 4,6,8$ for $M=16,32,64$, respectively (Levenshtein's and Mazo's bounds merge for $n \geq 3,4,5$ for $M=16,32,64$, respectively).

It must be also noted that except for trivial cases, it is not known how tight Levenshtein's bound (for complex codes) is.

One could also try to "quantize" the Levenshtein bound for the corresponding alphabet of the block codes used, as it was done in §III.3.1, [46] for the binary alphabet, so as to tighten the bound for the corresponding alphabet. However this requires finding all the possible values of the absolute pairwise crosscorrelations, which is in general highly computationally intensive for complex codes.

## III.4. Good and Optimal Block Codes of Certain Parameters

Having referred to the union bound, the metric spectrum that measures the code performance to a specific communication problem, we will refer to some simple but best and optimal block codes of specific cardinality and length (see their definitions in §III.2). These codes will be the basis of the search methods to be developed in the sequel.

## III.4.1. Good Systematic Codes with Minimal Length

First we consider the rate $k / k$ binary systematic block code, which has as codewords all the $M=2^{k}$ combinations of $k$ bits. This code is a linear code since it contains all
the $M$ combinations of $k$ bits, the modulo- 2 addition of any two codewords will be a codeword of the code.

It is obvious that the minimum distance of this code is $d_{\text {min }}=1$. It is also easy to infer - by construction - that the maximum $d_{\min }$ of a binary block code of rate $k / k$ is 1 , see also [36], which is achieved by the aforementioned systematic binary block code.

The systematic $(k, k)$ binary block code is a max- $d_{\text {min }}$ code, however in the fading channel with noncoherent detection it is catastrophic ( $\rho_{\max }=1$ ), since it contains complementary codewords. Therefore for this case we will increase the code length by one.

It was proved in $\S$ III.3.1 that the $\rho_{\max }$ of a rate $k /(k+1)$ binary block code is upper-bounded by $\rho_{\max } \geq(k-1) /(k+1)$, and the bound is achieved, for example, by a code resulting by appending an all-zeros or all-ones column to a systematic $k / k$ code. Such a code is a min- $\rho_{\max }$ code, since it achieves the lower bound on $\rho_{\max }$.

## III.4.2. Orthogonal/Unitary Codes

In this subsection we derive and list some unitary block codes of size $M \times M\left(\mathcal{C}_{M, M}\right)$ that will be useful in the sequel.

The Hadamard code of size $M \times M \mathcal{H}_{M}$ resulting from the Sylvester construction (with corner element equal to 0 ) can be shown to be equal to (cf. Appendix B)

$$
\begin{equation*}
\mathcal{H}_{M}=\mathbf{m m}^{T} \tag{3.24}
\end{equation*}
$$

(i.e. $\mathbf{G}=\mathbf{m}^{T}$ ) where the addition is in $\mathrm{GF}(2)[1]$, and $\mathbf{m}$ is the matrix containing all the possible $M=2^{k}$ combinations of $k$ bits, as its rows, (2.4); $\mathbf{a}^{T}$ is the transpose of a. Eq. (3.24) means that any column of a linear binary block code is also a column
of $\mathcal{H}_{M}$, by definition of $\mathbf{m}[47]$ (see Appendix B). It is also easily seen that $\mathcal{H}_{M}$ is a systematic code (with shuffled systematic columns), see Appendix B.

The codewords of the $\mathcal{H}_{M}$ Hadamard code differ each other in $M / 2$ positions, which means that the $\rho_{\max }$ of this code is $\rho_{\max }=0$, i.e. the Hadamard code is an optimal code for the noncoherent fading channel. Since this code is also linear, it is easily shown that its minimum distance is $d_{\min }=M / 2$. Therefore comparing this value to the minimum distance bounds of [36], we conclude that the Hadamard code is also a max- $d_{\text {min }}$ code for the AWGN channel (at least for the verified cases of [36]).

If we now set the $M \times M \mathcal{I}_{M}$ matrix, cf. (2.7), (2.8)

$$
\begin{equation*}
\mathcal{I}_{M}=\Psi\left(\mathbf{m m}^{T}\right), \tag{3.25}
\end{equation*}
$$

then the DFT matrix $\mathbf{D}_{Q}$ with elements [48],

$$
\begin{equation*}
D_{Q}[\alpha, \beta] \equiv W_{Q}^{-\alpha \beta} \equiv e^{-i 2 \pi \alpha \beta / Q}, \alpha, \beta=0,1, \ldots, Q-1 \tag{3.26}
\end{equation*}
$$

(hence of alphabet $Q$-PSK) equals to $\mathcal{I}_{M}($ for $M=Q)$ if $k=1$, i.e. $\mathbf{m}$ is an $M \times 1$ vector, $\mathbf{m}=[0,1,2, \ldots, Q-1]^{T}$.

For $k>1\left(\mathbf{m}\right.$ an $M \times k$ matrix, $\left.M=Q^{k}\right)$, (3.25) gives again unitary codes $\left(\mathbf{G}=\mathbf{m}^{T}\right)$; the proof is given in Appendix C. As in the binary case it is also obvious that any column of the code of (2.7) is also a column of the code of (3.25).

Finally another family of unitary matrices is obtained through the Sylvester construction [1] on DFT matrices [49]. That is if $\mathbf{D}_{Q}$ is the DFT matrix we construct the unitary matrix $\mathcal{S}_{M}$ (of size $M \times M$, for some $M$ ) in the following manner: set $\mathbf{A}=\mathbf{D}_{Q}$, and then iterate the formulation

$$
\left[\begin{array}{cc}
\mathbf{A} & \mathbf{A}  \tag{3.27}\\
\mathbf{A} & -\mathbf{A}
\end{array}\right] \rightarrow \mathbf{A}
$$

until $\mathbf{A}$ is of size $M \times M$ (then $\left.\mathcal{S}_{M}=\mathbf{A}\right)$, for applicable $M$ and $Q$.
The matrices $\mathcal{S}_{M}$ provide more flexibility than $\mathcal{I}_{M}$. For example an $\mathcal{S}_{16}$ with $Q=8$ can be obtained, but $\mathcal{I}_{16}$ with $Q=8$ is not possible, since $\log _{8}(16)$ is not an integer.

Other constructions for any $M$ and $Q$ are possible. One for example, could also use the following iterative construction (instead of the Sylvester construction (3.27)),

$$
\left[\begin{array}{cc}
\mathbf{A} & \mathbf{A}  \tag{3.28}\\
-\overline{\mathbf{A}} & \overline{\mathbf{A}}
\end{array}\right] \rightarrow \mathbf{A}
$$

where $\overline{\mathbf{A}}$ denotes the complex conjugate of $\mathbf{A}$, and the above construction is taken from the well known Alamouti code in the space-time coding literature [50]. However, it can be shown that the codes derived from both constructions, have identical $\rho$ spectra.

The aforementioned orthogonal/unitary codes will be the key elements for the search methods to be developed in the sequel. Their key characteristic (among others) is that they are optimal at least for the noncoherent fading channel, since they exhibit $\rho_{\max }=0$.

Intuitively, and from the previous discussion, we believe that the previously analyzed orthogonal/unitary codes are (for their parameters) one of the best choices in any channel condition, because they contain no repeated columns ${ }^{4}$, and moreover the linear codes contain all the possible columns (of a linear code).

[^3]
## CHAPTER IV

## SEARCH METHODS*

In this Chapter, we will concentrate on a new search/design methodology of best or, if possible, optimal block codes for the most common communication channels, i.e. AWGN, Noncoherent and Coherent Fading channels. In other words, we search for codes that minimize the various metric spectra, where the metrics can be the squared Euclidean distance, the cross-correlation, etc., as they are given in Chapter III.
IV.1. Search for Optimal Binary Block Codes for the Noncoherent Block Fading Channel

We start the search with the binary block codes for the noncoherent block fading channel, since this is one of the most unfathomable areas of the coding literature.

Recall that we define the optimal $(n, k)$ block code for the noncoherent fading channel as the code having the optimal cross-correlation spectrum, $\rho$-spectrum (see also related work for convolutional codes $[21,51]$ and the references therein). There are more than one optimal $(n, k)$ block codes, because if we interchange the columns of an optimal code, we obtain another optimal code, since the $\rho$-spectrum remains the same.

In the following we redefine the optimal $\rho$-spectrum specifically for the binary codes.

[^4]Definition IV.1. Optimal $\rho$-spectrum for Binary Codes.
Let the $\rho$-spectrum $\mathcal{S}_{\rho}$ of an $(n, k)$ binary block code be the set of all pairs of absolute cross-correlations and their multiplicities, i.e.,

$$
\mathcal{S}_{\rho}=\left\{\left(0, N_{0}\right),\left(1 / n, N_{1 / n}\right), \ldots,\left(\rho_{\max }, N_{\rho_{\max }}\right)\right\} .
$$

Then the optimal $\rho$-spectrum $\mathcal{S}_{\rho}^{*}$ over all the possible spectra $\mathcal{S}_{\rho}$ of $(n, k)$ block codes is the one for which one of the following is true:

1. $\rho_{\max }^{*}<\rho_{\text {max }}$, or
2. $\rho_{\max }^{*}=\rho_{\max }$, and there exists some $\lambda: \lambda / n=0,1 / n, 2 / n, \ldots, \rho_{\max }$, for which

$$
N_{\lambda / n}^{*}<N_{\lambda / n}, N_{(\lambda+1) / n}^{*}=N_{(\lambda+1) / n}, \ldots, N_{\rho_{\max }}^{*}=N_{\rho_{\max }} .{ }^{1}
$$

We will restrict first our search to systematic codes, since we don't have as much unknown bits as in the nonsystematic codes. We look into codes of rates $R=k / n$, where $k<n \leq M\left(M=2^{k}\right)$. For $n=M$ the optimal code is an orthogonal code, e.g. $\mathcal{H}_{M}$, and so by increasing $n$ beyond $M$ we won't find better codes.
IV.1.1. Rate 2/n Systematic Code Search

As an example, the rate $R=2 / 3$ systematic code [4], would look like,

$$
\mathcal{C}=\left(\begin{array}{lll}
0 & 0 & b_{0}  \tag{4.1}\\
0 & 1 & b_{1} \\
1 & 0 & b_{2} \\
1 & 1 & b_{3}
\end{array}\right)
$$

[^5]In this case we have to find the optimal code out of $2^{4}=16$ possible codes. However, since a codeword and its complement should not coexist in the code since the absolute cross-correlation between the two is one in this case and the receiver cannot distinguished between them, we require that the following conditions hold in (4.1),

$$
\begin{equation*}
b_{0}=b_{3}, b_{1}=b_{2} \tag{4.2}
\end{equation*}
$$

Thus, the search has been reduced to only over $2^{2}=4$ codes, since we now have only 2 unknown bits due to (4.2).

Calculating the $\rho$-spectra of all the possible 4 codes we see they are identical: $\mathcal{S}_{\rho}^{*}=\{(1 / 3,6)\}$. So all 4 codes perform the same based on (3.8). For example two optimal rate $2 / 3$ systematic codes are:

$$
\mathcal{C}_{2 / 3}^{*}=\left(\begin{array}{ccc}
0 & 0 & 0  \tag{4.3}\\
0 & 1 & 0 \\
1 & 0 & 0 \\
1 & 1 & 0
\end{array}\right), \text { and } \mathcal{C}_{2 / 3}^{\star}=\left(\begin{array}{ccc}
0 & 0 & 0 \\
0 & 1 & 1 \\
1 & 0 & 1 \\
1 & 1 & 0
\end{array}\right)
$$

where the first corresponds to inserting a pilot bit and the second is a single-bit paritycheck code. Both perform the same in a noncoherent block-faded channel, although the code with the pilot symbol has an advantage when suboptimum detection is used in which the channel is first estimated based on the pilot symbol and then used to detect the two data bits.

For a rate $2 / 4$ code search, we can see, similarly to (4.2), that by forcing the parity parts of the codewords that correspond to complementary systematic parts to be the same, we reduce the search size as well making sure that these pairs have the minimum possible $|\rho|=0$.

For example consider two such codewords of the rate $2 / 4$ systematic code: $\mathbf{d}_{1}=$ $\left[0,0, b_{0}, b_{1}\right]^{T}$, and $\mathbf{d}_{2}=\left[1,1, b_{2}, b_{3}\right]^{T}$. By setting $\left[b_{0}, b_{1}\right]=\left[b_{2}, b_{3}\right]$, this codeword pair has $|\rho|=0$. With this approach, the search size is reduced from $2^{M(n-k)}$ to $2^{M(n-k) / 2}$ codes. The result of the search follows:

$$
\mathcal{C}_{2 / 4}^{*}=\left(\begin{array}{cccc}
0 & 0 & 0 & 0  \tag{4.4}\\
0 & 1 & 0 & 1 \\
1 & 0 & 0 & 1 \\
1 & 1 & 0 & 0
\end{array}\right)
$$

with $\mathcal{S}_{\rho}^{*}=\{(0,6)\}$, which is a Hadamard matrix, $\mathcal{H}_{4}$, with interchanged columns. Note that both codes $\left(\mathcal{C}_{2 / 3}^{*}, \mathcal{C}_{2 / 4}^{*}\right)$ are optimal (i.e. they have optimal $\rho$-spectra). The union-bound performance (word error rate (WER) vs. average signal to noise ratio per bit $\left(\overline{\mathrm{SNR}_{\mathrm{b}}}\right)$ ) of these optimal codes, along with the simulation results, are plotted in Figure 2, and are indicatively shown in Table I.

Table I. $\overline{\mathrm{SNR}_{\mathrm{b}}}$ required to achieve $10^{-2} \mathrm{WER}$

| Rate | $2 / 3$ | $2 / 4$ |
| :---: | :---: | :---: |
| Simulation, dB | 20.24 | 19.54 |
| Union Bound, dB | 22.24 | 21.73 |



Fig. 2. Simulation results and union bound (UB) of the systematic optimal rate $2 / 3$ and $2 / 4$ codes.

## IV.1.2. Rate 3/n Systematic Code Search

For the rates $3 / 4$ up to $3 / 7$ we can apply a reduced search similar to what was used for the rate $2 / 4$ code. That is we are forcing the parity parts of the codewords that correspond to complementary systematic parts to be the same, and thus we make sure those codeword pairs have minimum $|\rho|$. The systematic codes found for rates $3 / 4$ up to $3 / 7$ are given below:

- Rate 3/4:

$$
\mathcal{C}_{3 / 4}^{*}=\left(\begin{array}{cccc}
0 & 0 & 0 & 0  \tag{4.5}\\
0 & 0 & 1 & 0 \\
0 & 1 & 0 & 0 \\
0 & 1 & 1 & 0 \\
1 & 0 & 0 & 0 \\
1 & 0 & 1 & 0 \\
1 & 1 & 0 & 0 \\
1 & 1 & 1 & 0
\end{array}\right),
$$

$\mathcal{S}_{\rho}^{*}=\{(0,12),(2 / 4,16)\}$.

- Rate $3 / 5$ :

$$
\mathcal{C}_{3 / 5}^{*}=\left(\begin{array}{ccccc}
0 & 0 & 0 & 0 & 0  \tag{4.6}\\
0 & 0 & 1 & 0 & 0 \\
0 & 1 & 0 & 0 & 1 \\
0 & 1 & 1 & 0 & 1 \\
1 & 0 & 0 & 0 & 1 \\
1 & 0 & 1 & 0 & 1 \\
1 & 1 & 0 & 0 & 0 \\
1 & 1 & 1 & 0 & 0
\end{array}\right),
$$

$\mathcal{S}_{\rho}^{*}=\{(1 / 5,24),(3 / 5,4)\}$.

- Rate $3 / 6$ :

$$
\mathcal{C}_{3 / 6}^{*}=\left(\begin{array}{cccccc}
0 & 0 & 0 & 0 & 0 & 0  \tag{4.7}\\
0 & 0 & 1 & 0 & 0 & 1 \\
0 & 1 & 0 & 0 & 1 & 0 \\
0 & 1 & 1 & 0 & 1 & 1 \\
1 & 0 & 0 & 0 & 1 & 1 \\
1 & 0 & 1 & 0 & 1 & 0 \\
1 & 1 & 0 & 0 & 0 & 1 \\
1 & 1 & 1 & 0 & 0 & 0
\end{array}\right),
$$

$$
\mathcal{S}_{\rho}^{*}=\{(0,16),(1 / 3,12)\} .
$$

- Rate 3/7:

$$
\mathcal{C}_{3 / 7}^{*}=\left(\begin{array}{ccccccc}
0 & 0 & 0 & 0 & 0 & 0 & 0 \\
0 & 0 & 1 & 0 & 0 & 1 & 1 \\
0 & 1 & 0 & 0 & 1 & 0 & 1 \\
0 & 1 & 1 & 0 & 1 & 1 & 0 \\
1 & 0 & 0 & 0 & 1 & 1 & 0 \\
1 & 0 & 1 & 0 & 1 & 0 & 1 \\
1 & 1 & 0 & 0 & 0 & 1 & 1 \\
1 & 1 & 1 & 0 & 0 & 0 & 0
\end{array}\right)
$$

$$
\mathcal{S}_{\rho}^{*}=\{(1 / 7,28)\}
$$

- Rate $3 / 8$ :

For the rate $3 / 8$ code search, we are similarly forcing the first 4 bits of the parity parts of the codewords that correspond to complementary systematic parts to be the same, while setting the remaining bit to be complementary. For example consider two such codewords of the rate $3 / 8$ systematic code: $\mathbf{d}_{1}=\left[0,0,0, b_{0}, b_{1}, b_{2}, b_{3}, b_{4}\right]^{T}$, and $\mathbf{d}_{2}=\left[1,1,1, b_{5}, b_{6}, b_{7}, b_{8}, b_{9}\right]^{T}$. If we set $\left[b_{5}, b_{6}, b_{7}, b_{8}, b_{9}\right]=\left[b_{0}, b_{1}, b_{2}, b_{3}, \overline{b_{4}}\right]$, we make sure that this codeword pair has the minimum possible $|\rho|=0$. Therefore we reduced the search from $2^{40}$ to $2^{20}$ codes. The result of this search is the following orthogonal systematic code (equals to a Hadamard code, $\mathcal{H}_{8}$, with interchanged columns):

$$
\mathcal{C}_{3 / 8}^{*}=\left(\begin{array}{cccccccc}
0 & 0 & 0 & 0 & 0 & 0 & 0 & 0  \tag{4.9}\\
0 & 0 & 1 & 0 & 0 & 1 & 1 & 1 \\
0 & 1 & 0 & 0 & 1 & 0 & 1 & 1 \\
0 & 1 & 1 & 0 & 1 & 1 & 0 & 0 \\
1 & 0 & 0 & 0 & 1 & 1 & 0 & 1 \\
1 & 0 & 1 & 0 & 1 & 0 & 1 & 0 \\
1 & 1 & 0 & 0 & 0 & 1 & 1 & 0 \\
1 & 1 & 1 & 0 & 0 & 0 & 0 & 1
\end{array}\right),
$$

$\mathcal{S}_{\rho}^{*}=\{(0,28)\}$.

By simple observation the rate $3 / 7$ and $3 / 8$ codes are optimal since they have optimal $\rho$-spectra. From [43] the rate $3 / 6$ code is also optimal. For the rate $3 / 4$ code we run a full search (over $2^{32}$ codes) and verified that this code has optimal spectrum, and we also verified the optimality of the rate $3 / 5$ code (over the systematic codes though)
by running a full search over the parity part. For the performance (union bound, Eq. (3.8) ) of the aforementioned codes, indicatively we give that $10^{-2}$ WER is achieved for the $\mathcal{C}_{3 / 8}^{*}$ code at $\overline{\mathrm{SNR}_{\mathrm{b}}}=23.67 \mathrm{~dB}$, while for the $\mathcal{C}_{3 / 4}^{*}$ code at $\overline{\mathrm{SNR}_{\mathrm{b}}}=24.42 \mathrm{~dB}$.

From the resulting optimal codes, we observe that:

$$
\begin{equation*}
\mathcal{C}_{2 / 4}^{*}=\left[\mathcal{C}_{2 / 3}^{*}, \mathbf{c}_{0}\right], \mathbf{c}_{0} \text { the fourth column of } \mathcal{C}_{2 / 4}^{*} \tag{4.10}
\end{equation*}
$$

and

$$
\begin{align*}
& \mathcal{C}_{3 / 5}^{*}=\left[\mathcal{C}_{3 / 4}^{*}, \mathbf{c}_{1}\right], \mathbf{c}_{1} \text { the fifth column of } \mathcal{C}_{3 / 5}^{*}, \\
& \mathcal{C}_{3 / 6}^{*}=\left[\mathcal{C}_{3 / 5}^{*}, \mathbf{c}_{2}\right], \mathbf{c}_{2} \text { the sixth column of } \mathcal{C}_{3 / 6}^{*},  \tag{4.11}\\
& \mathcal{C}_{3 / 7}^{*}=\left[\mathcal{C}_{3 / 6}^{*}, \mathbf{c}_{3}\right], \mathbf{c}_{3} \text { the seventh column of } \mathcal{C}_{3 / 7}^{*}, \\
& \mathcal{C}_{3 / 8}^{*}=\left[\mathcal{C}_{3 / 7}^{*}, \mathbf{c}_{4}\right], \mathbf{c}_{4} \text { the eighth column of } \mathcal{C}_{3 / 8}^{*}
\end{align*}
$$

This observation, suggests a nested search, similar to the nested convolutional code search in [52], where a lower rate code is obtained by adding the best code column to a higher rate code.

## IV.1.3. Nested Search

Assume we are given a $(\xi, k)$ binary block code $\mathcal{C}_{k / \xi}$ (i.e. of rate $k / n$ ), and want to find the best possible $(n, k)$ code $(n>\xi)$ using a nested search.

The steps of the nested search are summarized below:

1. Set $j=\xi+1$.
2. Search over the possible $(j, k)$ block codes $\mathcal{C}_{k / j}=\left[\mathcal{C}_{k /(j-1)}, \mathbf{c}\right]$, where $\mathbf{c}$ is an $M$-bit vector to be found from a search, to yield the best code $\mathcal{C}^{\prime}{ }_{k / j}$, having
optimal spectrum over all the spectra of the search.
3. Set $\mathcal{C}_{k / j}=\mathcal{C}^{\prime}{ }_{k / j}$.
4. Set $j=j+1$.
5. If $j>n$ Stop, else go to Step 2.

Step 2 of the nested search can be done in a number of ways, depending mostly on $k$. The following search methods, for example, have been used in Step 2, classified in the order of the complexity of the nested search required to find a systematic rate $k / n$ code, starting from the rate $k / k$ systematic code (complexity is given in terms of the number of codes searched, irrelevant of their length $n \leq M, M=2^{k}$ ):

1. Full search. The complexity is

$$
\begin{equation*}
\Phi=(n-k) \times 2^{M} \tag{4.12}
\end{equation*}
$$

2. Reduced search. For codes with $n \leq 2 k+1$, we force the parity bits corresponding to complementary systematic parts to be equal, and for codes with $n>2 k+1$ we alternatively set those parity bits to be complementary for $n$ even, and equal for $n$ odd (cf. §IV.1.1 and $\S I V .1 .2$ ). Therefore we achieve for these codeword pairs the minimum possible $|\rho|$. The complexity using this method is

$$
\begin{equation*}
\Phi=(n-k) \times 2^{M / 2} \tag{4.13}
\end{equation*}
$$

Using similar arguments, based on the structure of the $k / k$ systematic code,
one can reduce the complexity to $\Phi \propto 2^{M / 4}$, and so on (see Appendix D).
3. Hyper-reduced search (see Appendix D). In this method, we let the c vector take only columns of the $\mathcal{H}_{M}$ Hadamard code (3.24). We observed that the systematic part of the code is simply the $M / 2, M / 4, \ldots, 2,1$ st columns of the $\mathcal{H}_{M}$ (counting starts from 0 ), cf. Appendix B. Therefore we find the first code of rate $\frac{k}{k+1}$ by searching over $M-k$ columns of the $\mathcal{H}_{M}$ (excluding the $k$ systematic columns), the code of rate $\frac{k}{k+2}$ by searching over $M-k-1$ columns of $\mathcal{H}_{M}$, and so on (code $\mathcal{C}_{k / j}$ must have different columns $\forall j$ ). The complexity of the nested search using this method is only

$$
\begin{equation*}
\Phi=\sum_{j=M-n+1}^{M-k} j \leq(n-k)(M-k) . \tag{4.14}
\end{equation*}
$$

All these search methods ${ }^{2}$ yield at the end, i.e. for code rates $k /(M-1)$ and $k / M$, optimal codes. That is they have $\rho$-spectra equal to $\left(\frac{1}{M-1},\binom{M}{2}\right)$ and $\left(0,\binom{M}{2}\right)$ respectively. One can easily verify that if we take any $M-1$ columns of $\mathcal{H}_{M}$ to form a rate $k /(M-1)$ code, this code is optimal. In this category also belongs the reduced $(7,4,3)$ Hamming code which appeared in [35]. See also related work in [53].

Furthermore all search methods found to yield equivalent codes (same $\rho$-spectrum), for those ranges of $k$ that agree. Two exceptions were the rate $4 / 10$ and $5 / 18$ codes found with method 2 , which have higher $\rho_{\max }$ than the other methods.

Note that the codes derived from Method 3 are linear since they consist of columns of the linear $\mathcal{H}_{M}$ Hadamard code.

[^6]For an $(n, k)$ linear binary block code $\mathcal{C}_{k / n}$ employed on the block fading channel with non-coherent ML detection, the error probability for the transmission of the $m^{\text {th }}$-codeword is the same for all $m$, [4, p. 439] (in our case the block fading channel is binary-input symmetric).

Assuming that the all-zero codeword was transmitted, the probability of a word error is upper bounded by the union-bound [4, p. 440], (3.6),

$$
\begin{equation*}
P(e) \leq \sum_{m=1}^{M-1} P_{2}\left(\rho_{m}^{2}\right) \tag{4.15}
\end{equation*}
$$

where $\rho_{m}=1-2 w_{m} / n$ is the normalized cross-correlation of the $m^{\text {th }}$ codeword pair ( $0^{t h}$ codeword, $m^{t h}$ codeword ), codeword $0^{t h}$ is the all-zero codeword, and $w_{m}$ is the weight of the $m^{\text {th }}$ codeword.

Thus the linearity of the block codes derived from Method 3 gives rise to a $4^{\text {th }}$ search method for the Step 2 of the nested search:

We use in this search the union bound (4.15), (3.10) to select the best code, which requires (per code) the calculation of only $M-1$ weights, thus reducing dramatically the complexity (as compared to calculate the (full) pairwise $\rho$-spectrum which requires calculation of $\binom{M}{2}$ cross-correlations per code). That is, we will select the best code as the one which has the optimal short $\rho$-spectrum (over the limited search), that results only from the weight calculation (as opposed to all the possible pairs), cf. §III.1. This is Method 4, and the codes found are, as expected, identical to those of Method 3, but with Method 4 we can more easily find codes with $k \geq 10$, that we were not able to find (due to complexity) with Method 3.

In the dissertation, unless otherwise stated, we assume that method 4 is used in the step 2 of the aforementioned (forward) nested search.
a. Best Rate $k /(k+1)$ Code

Method 3 of the nested search indicates that the columns of the $\mathcal{H}_{M}$ matrix can be used to find a best code (if not optimal). But so far our nested search was based on (started from) the rate $k / k$ systematic code, which as we noted, is comprising from $\mathcal{H}_{M}$ 's columns (Appendix B).

So here, we will search for the best rate $k /(k+1)$ codes, whose $k+1$ columns are simply some columns of the $\mathcal{H}_{M}$ matrix, in order to see whether the use of the systematic $k / k$ code for the beginning of the nested search is a good choice or not. The complexity of finding such codes is $\binom{M}{k+1}$.

We searched for codes, up to $k=5$, and found them having identical $\rho$-spectrum with the systematic $k /(k+1)$ codes found with method 3 .

More specifically for $k=3$, there were 69 (out of $\binom{8}{4}=70$ ) codes with optimal $\rho$-spectrum, for $k=4$ there were 4353 (out of 4368), and for $k=5$ there were 444416 (out of 906192) best $^{3}$ codes.

Therefore we see that (at least for $k \leq 5$ ) the systematic $k / k$ code is an optimal (or best) choice to start the nested search. However for all $k$ the systematic code is a good choice to start the nested search, since for the rate $k /(k+1)$ code the nested search will pick at least a $\min -\rho_{\max }$ code, e.g. the systematic pilot rate $k /(k+1)$ code, cf. §III.3.1.

We verified also for a few code rates that starting our nested search (Methods 3, 4) with just the first column of the $\mathcal{H}_{M}$ matrix (i.e. the all-zero column), codes with identical $\rho$-spectrum were obtained as if we were started with the rate $k / k$ systematic code (see also §VI.1.1, [43]).

[^7]
## IV.1.4. Backward Nested Search

The aforementioned nested search proceeds forward. Likewise, we can have a backward nested search where we begin from a $\mathcal{C}_{k / M}$ code (e.g. the $\mathcal{H}_{M}$ code, $M=2^{k}$ ), and in each iteration we remove an appropriate column until we get to the desired $\mathcal{C}_{k / n}$ code $(n<M)$.

Similar to the (forward) nested search, the backward nested search steps are as follows:

1. Set $j=M-1$.
2. Search over the possible $(j, k)$ block $\operatorname{codes} \mathcal{C}_{k / j}=\mathcal{C}_{k /(j+1)} \backslash\{\mathbf{c}\}$, where $\mathbf{c}$ a column of $\mathcal{C}_{k /(j+1)}$, to yield the best code $\mathcal{C}^{\prime}{ }_{k / j}$, having the optimal $\rho$-spectrum over all the yielded spectra of the search.
3. Set $\mathcal{C}_{k / j}=\mathcal{C}^{\prime}{ }_{k / j}$.
4. Set $j=j-1$.
5. If $j<n$ Stop, else go to Step 2.

## IV.1.5. Enhanced Nested Search

Because of the low complexity of the nested search, we could possibly find better codes if in each iteration we were seeking for two or more columns concurrently.

For example, if were looking for two columns the enhanced nested search will be as follows, assuming we are given a $(\xi, k)$ block code $\mathcal{C}_{k / \xi}$ :

1. Set $j=\xi+2$.
2. Search over the possible $(j, k)$ block codes $\mathcal{C}_{k / j}=\left[\mathcal{C}_{k /(j-2)}, \mathbf{c}_{\mathbf{1}}, \mathbf{c}_{\mathbf{2}}\right]$, where $\mathbf{c}_{\mathbf{1}}, \mathbf{c}_{\boldsymbol{2}}$ are $M$-bit vectors to be found from a search, to yield the best code $\mathcal{C}^{\prime}{ }_{k / j}$, having optimal spectrum over all the spectra of the search.
3. Set $\mathcal{C}_{k / j}=\mathcal{C}^{\prime}{ }_{k / j}$.
4. Set $j=j+2$.
5. If $j>n$ (for some $n$ ) Stop, else go to Step 2.

All the search methods for Step 2 mentioned for the forward nested search may be applied here also. In the results shown later, we assume only search over 2 columns with use of Method 4. Note that the forward nested search can be combined with the enhanced nested search. For example in the aforementioned example if $\xi=5$, we will find with the enhanced nested search codes with $n=7,9,11, \ldots$. In that case, we can find a code with $n=6$ using the nested search, and then switch to the enhanced nested search to find codes with $n=8,10,12, \ldots$.

Similarly also to the enhanced nested search, we can have an enhanced backward nested search.

## IV.2. Generalized Nested Search Methods

In the following we will summarize and generalize the previously derived, for the binary codes over the noncoherent fading channel, nested search methods.

In these nested search methods we search over the columns of a $\mathcal{C}_{M, M}$ unitary $\operatorname{code}^{4}$ (see §III.4.2) in a nested way to obtain a best code. The motivation behind

[^8]this was explained in the previous section $([46,49])$ and, in short, it is based on the observation (for some cases) that $\mathcal{H}_{M}, \mathcal{I}_{M}, \mathcal{S}_{M}$ codes achieve the bounds on $d_{\text {min }}$, as well as on maximum $|\rho|\left(\rho_{\max }\right)$.

Three basic forms of nested search are again considered, that is forward, backward and enhanced.

## IV.2.1. Generalized Forward Nested Search

The forward nested search steps, assuming we are given a block code $\mathcal{C}_{M, \xi}$ and want to find the best $\mathcal{C}_{M, n}$ code $(n>\xi)$, are summarized below:

1. Set $j=\xi+1$.
2. Search over the possible $\mathcal{C}_{M, j}$ block codes $\mathcal{C}_{M, j}=\left[\mathcal{C}_{M, j-1}, \mathbf{c}\right]$, where $\mathbf{c}$ is a column of a $\mathcal{C}_{M, M}$ code, to yield the best code $\mathcal{C}^{\prime}{ }_{M, j}$, having optimal metric spectrum over all the metric spectra of the search.
3. Set $\mathcal{C}_{M, j}=\mathcal{C}^{\prime}{ }_{M, j}$.
4. Set $j=j+1$.
5. If $j>n$ Stop, else go to Step 2.

The forward nested search can typically start with the systematic $\mathcal{C}_{M, k}$ code [46], provided the $\mathcal{C}_{M, M}$ code has the systematic columns, or even the $\mathcal{C}_{M, 1}$ code [49], which is a single column, e.g. one column of a $\mathcal{C}_{M, M}$ code (chosen randomly, or through some heuristic limited search). However if complexity permits, we can start, for example, with the $\mathcal{C}_{M, \xi}$ block code resulting from the full search over-the-columns of the $\mathcal{C}_{M, M}$ code (we will cover this in §IV.3.1).

We have also chosen to place the restriction that a code must have distinct columns, so that for $n=M$ we will get a unitary $\mathcal{C}_{M, M}$ code, e.g. $\mathcal{H}_{M}, \mathcal{I}_{M}, \mathcal{S}_{M}$.

It must be mentioned that in Step 2 of the nested search, there may be more than one $\mathbf{c}$ vectors that yield best codes, i.e. codes having the optimal metric spectrum over the spectra of the limited search of the Step 2. In this dissertation, in order to cut down the complexity, we select the first $\mathbf{c}$ vector found to yield the best code. However from simulations we found that by relaxing this restriction better codes may be found (due to the nested nature of the search).
IV.2.2. Generalized Backward Nested Search

In the backward nested search we start from a unitary $\mathcal{C}_{M, M}$ code, and iteratively we end up to the best $\mathcal{C}_{M, n}$ code $(n<M)$, by removing an appropriate column in each iteration. Similar to the forward nested search of the previous subsection, the generalized backward nested search steps are as follows:

1. Set $j=M-1$.
2. Search over the possible $\mathcal{C}_{M, j}$ block codes $\mathcal{C}_{M, j}=\mathcal{C}_{M, j+1} \backslash\{\mathbf{c}\}$, where $\mathbf{c}$ is a column of $\mathcal{C}_{M, j+1}$, to yield the best code $\mathcal{C}^{\prime}{ }_{M, j}$, having optimal metric spectrum over all the metric spectra of the search.
3. Set $\mathcal{C}_{M, j}=\mathcal{C}^{\prime}{ }_{M, j}$.
4. Set $j=j-1$.
5. If $j<n$ Stop, else go to Step 2.

## IV.2.3. Generalized Enhanced Forward/Backward Nested Search

Again, due to the low complexity of the aforementioned generalized nested search methods, it is likely that we can find better codes if in each iteration we were seeking for two or more columns concurrently.

For example, if we were looking for two columns, the enhanced forward nested search will be as follows, assuming we are given a block code $\mathcal{C}_{M, \xi}$ :

1. Set $j=\xi+2$.
2. Search over the possible $\mathcal{C}_{M, j}$ block codes $\mathcal{C}_{M, j}=\left[\mathcal{C}_{M, j-2}, \mathbf{c}_{\mathbf{1}}, \mathbf{c}_{\mathbf{2}}\right]$, where $\mathbf{c}_{\mathbf{1}}, \mathbf{c}_{\mathbf{2}}$ are columns of a $\mathcal{C}_{M, M}$ code, to yield the best code $\mathcal{C}^{\prime}{ }_{M, j}$ having optimal metric spectrum over all the metric spectra of the search.
3. $\operatorname{Set} \mathcal{C}_{M, j}=\mathcal{C}^{\prime}{ }_{M, j}$.
4. Set $j=j+2$.
5. If $j>n$ (for some $n$ ) Stop, else go to Step 2.

Note that the generalized forward nested search can be combined with the generalized enhanced forward nested search, similar to §IV.1.5. Again, similarly also to the Enhanced Forward Nested Search we can have an Enhanced Backward Nested Search. The derivation is straightforward, and hence omitted.

So far, we concentrated on $\mathcal{C}_{M, n}$ block codes with $n \leq M$. For $n>M$ we can proceed as with the previous methodology. That is we can "concatenate" $\alpha \mathcal{C}_{M, M}$ codes $(\alpha>1)$, to form a code of size $M \times \alpha M$ and perform the aforementioned search methods over the columns of this big code, instead of the single $\mathcal{C}_{M, M}$ code.

## IV.3. Other Common Search Methods

Besides the aforementioned proposed nested search methodology, we will perform also for comparison various typical searches, based on exhaustive and random search approaches.

## IV.3.1. Full (Exhaustive) Search

In the full, otherwise exhausted, search we recognize various types. For example, there is the full search over all the elements of the code, say $\mathcal{C}_{M, n}$ code with elements from a $Q$-ary alphabet. This search is highly complex since it requires a search over $Q^{M \times n}$ codes.

If on the other hand we constrain the columns of the code to be unique columns of a unitary matrix, say $\mathcal{C}_{M, M}$ of $\S$ III.4.2, then the full search is over $\binom{M}{n}$ codes (full over-the-columns of the $\mathcal{C}_{M, M}$ code, search), and it is independent of the code's alphabet $Q$.

## IV.3.2. Random Search

Although the codes of the nested search methods can be obtained with low computational complexity, they depend on the codes of the previous iteration, which has as a consequence that many good codes may not be obtained.

On the other hand, the full search has tremendous complexity, e.g. the optimal selection of $n$ out of $M$ Hadamard columns requires a search over $\binom{M}{n}$ codes, which maybe impractical for large $M$ (e.g. $\binom{1024}{512} \approx 10^{306}$ ).

Therefore, in these cases, it is also common to perform a random search to deal with the high search complexity. Similarly to the various cases of "full search", we recognize also various random search approaches. That is a random search over all
the elements of the code, or random search over unique columns of e.g. a unitary matrix (see also [34, 3]).

However, a random search may have a negligible probability to find a good code if the corresponding full search size is large, but due to its adjustable complexity (which depends on the run-time) we adopted it to try to find better codes, if possible, to that of the nested search.

In more detail, the implementation of the random column search in this dissertation, is as follows: To find a $\mathcal{C}_{M, n}$ code, we run a search over $\Lambda$ codes (for some $\Lambda$ ), where each of these $\Lambda$ codes is a random selection of $n$ distinct columns of a $\mathcal{C}_{M, M}$ unitary matrix. Since the selection is random, there is a probability that the same code appears in the search more than once (for large $\binom{M}{n}$ compared to $\Lambda$, this probability is small), and there is no effort to avoid that for complexity reasons. The random number generator used was the "Mersenne-Twister" [54, 55].

## IV.4. Indicative Complexity Comparison of the Nested Search Method

At this point, it is useful to present a complexity comparison between search methods for binary block codes for the noncoherent block fading channel.

As it will be shown later, our codes for example for the noncoherent fading channel, are either meeting the quantized lower bound on $\rho_{\max }$, cf. §III.3.1, or they are close to it. Therefore, in order to evaluate our nested search, we give a complexity comparison (in the number of codes to be searched) between the full-search and our forward nested search with Method 4 (§IV.1.3), shown in Figure 3. The search complexity gap between the two methods is more than obvious.

For example also a rate $11 / 13$ code requires a full search over $\sim 10^{8015}$ codes, and a nested search over only 4073 codes, while a rate $11 / 1792$ code requires a full
search over $\sim 10^{1,104,785}$ codes, and a nested search over only $2,042,807$ codes.
Additionally, if we take into account that the full search needs a pairwise $\rho$ spectrum calculation per code, while the forward nested search with Method 4 calculation of only $M-1$ weights per code, the complexity gap increases even further.


Fig. 3. Full search (upper set of curves) vs. forward nested search (lower set of curves) complexity comparison, in number of codes required to be searched; the lower curve in a set corresponds to the lower corresponding $M$ shown in the legends.

## CHAPTER V

## NEW BLOCK CODES*

In this chapter we give codes resulting from the search methods of the previous chapter. We will follow, however, a different order and we will present first the codes for the noncoherent block fading channel, for "historic" reasons, since they were developed first [46].

The evaluation of the codes found is performed through comparison of their achieved extremum metric to a metric bound, as those presented in §III.3, as well as to comparison to codes of prior work when feasible.

## V.1. Noncoherent Block Fading Channel

## V.1.1. Binary Codes

In Figure 4 we have plotted the lower bounds on $\rho_{\max }$, along with the $\rho_{\max }$ of the codes resulting from the forward (§IV.1.3) and the backward nested searches (§IV.1.4) for $M=16$ and $M=32$, based on the $\mathcal{H}_{M}$ (3.24). Moreover, for the sake of clarity, we give in Tables II-III the corresponding columns of the Hadamard matrix $\mathcal{H}_{M}$, comprising the codes of Fig. 4(a) found with the forward and backward nested searches. We observe that although these codes have the same $\rho_{\max }$, they are not

[^9]Table II. Columns of $\mathcal{H}_{M}$ comprising the forward nested search codes of Fig. 4(a).

| $n$ | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 | 16 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| columns | $8,4,2,1,0$ | 15 | 3 | 5 | 10 | 12 | 6 | 7 | 9 | 11 | 13 | 14 |

Table III. Columns of $\mathcal{H}_{M}$ comprising the backward nested search codes of Fig. 4(a).

| $n$ | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 | 16 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| columns | $0,15,14,13,11$ | 7 | 10 | 9 | 6 | 5 | 12 | 8 | 4 | 3 | 2 | 1 |

identical.
We run also the random column search (based on the $\mathcal{H}_{M}$ ) for $\Lambda=10^{5}$ codes, cf. §IV.3.2, but it didn't yield better codes for the corresponding cases.

It must be noted that all the codes of this subsection are based on search over the columns of $\mathcal{H}_{M}$ (and therefore they are linear codes), unless otherwise stated. Moreover, the codes found with the forward nested search (§IV.1.3) are systematic since the search starts from the systematic rate $k / k$ code $\left(M=2^{k}\right)$.

Figure 5 displays the codes for $M=64$ along with the lower bounds. The legend "Search methods" reflects the best of the codes obtained from the forward nested, backward nested, enhanced nested (§IV.1.3 - §IV.1.5) and random column search methods of Chapter IV. Specifically the enhanced nested search for $M=64$ yielded better codes (than the other methods) for $n=29,32,35,36,49,52$, and the random column search for $n=17,47$, 48 (with $\Lambda \geq 10^{5}$ ).

In Figures 6-7 we have plotted again the $\rho_{\max }$ of the best of the codes obtained through the (forward) nested, enhanced nested and backward nested search methods, but for $M=128$ and $M=256$ correspondingly (denoted in the figure legends as "Search methods"). The random column search with $\Lambda=10^{5}$ didn't yield better codes in these cases.


Fig. 4. $\rho_{\max }$ of our binary codes (based on the $\mathcal{H}_{M}$ ) vs. Levenshtein's lower bound.

Fig. 5. $M=64$ (rate $6 / n$ codes); $\rho_{\max }$ of our binary codes (based on the $\mathcal{H}_{64}$ ) vs. Levenshtein's lower bound.

Fig. 6. $M=128$ (rate $7 / n$ codes); $\rho_{\max }$ of our binary codes (based on the $\mathcal{H}_{128}$ ) vs. Levenshtein's lower bound.

Figures 8-12 ${ }^{1}$ contain the $\rho_{\max }$ of the codes found with the forward nested search alone to show its efficiency. The comparison is done with respect to Levenshtein's lower bounds. For clarity, we have also plotted in Figure 13 the $M=8192$ case, cf. Fig. 12, for $n=14, \ldots, 64$.

In Appendix E, we give the listings of all the codes found in this subsection with the forward nested search for $k=4$ up to $k=11$. For $k=4$ they are also given, as previously mentioned, in Table II. Note that the codes of the forward nested search presented in this subsection (i.e. with $k=4$ up to $k=13$ ) contain a pilot bit, since they contain the first column (index 0 ) of the $\mathcal{H}_{M}(3.24)$ in their $(k+1)$ st column.

So far, our codes were based on the $\mathcal{H}_{M}$ matrix, given in (3.24). In Figure 14 we depict codes found through the (forward) nested search of §IV.1.3 (method 3) with the following differences.

The nested search starts from the first column of a Hadamard code, and the columns of the resulted codes are selected (through the search) from the $\mathcal{H}_{M}$ matrix (legend "Sylvester"), and from the non-linear Hadamard code obtained from the first Paley construction [56, 57] (legend "first Paley type").

As we observe in Figure 14, the codes based on the $\mathcal{H}_{M}$ matrix have in general lower $\rho_{\max }$ than the non-linear Hadamard code from the first Paley construction. This result suggests another research direction, that of finding good orthogonal codes, e.g. [56], for our nested search methods.

From the presented results in this subsection, we see that our codes exhibit $\rho_{\max }$ close to or on the lower bounds. Note also that although some lower rate codes, say $k /(n+\mu), \mu>0$, may have higher $\rho_{\max }$ than the $k / n$ code (for some $k, n$ and $\mu$ ), it

[^10]
Fig. 8. $M=512$ (rate $9 / n$ codes), $n=10, \ldots, 512 ; \rho_{\max }$ of our binary codes (based on the $\mathcal{H}_{512}$ ) vs. Levenshtein's lower
bound.

Fig. 9. $M=1024$ (rate $10 / n$ codes), $n=11, \ldots, 1024 ; \rho_{\text {max }}$ of our binary codes (based on the $\mathcal{H}_{1024}$ ) vs. Levenshtein's
lower bound.
Fig. 10. $M=2048$ (rate $11 / n$ codes), $n=12, \ldots, 2048 ; \rho_{\max }$ of our binary codes (based on the $\mathcal{H}_{2048}$ ) vs. Levenshtein's lower bound.

Fig. 12. $M=8192$ (rate $13 / n$ codes), $n=14, \ldots, 8192 ; \rho_{\max }$ of our binary codes (based on the $\mathcal{H}_{8192}$ ) vs. Levenshtein's


Fig. 13. $M=8192$ (rate $13 / n$ codes), $n=14, \ldots, 64 ; \rho_{\max }$ of our binary codes (based on the $\left.\mathcal{H}_{8192}\right)$ vs. Levenshtein's lower bound.
doesn't mean that they will necessarily perform worse since the multiplicity $N_{\rho_{\max }}$ is also important, cf. (3.8), (3.10).

Notice that we also list very low rate codes, which may not be practical for use in the fading channel (due to the large bandwidth expansion), but can be used in other channels. For example, one can use the codes designed here for any system requiring sequences with low pairwise cross-correlations, e.g. in a synchronous CDMA system one can replace the Hadamard-Walsh codes with the designed codes to increase system capacity [43] (see also Chapter VI).

To the best of our knowledge, this is the first time a large multitude of binary block codes was designed for the noncoherent block fading channel and reported in


Fig. 14. $M=32$ (rate $5 / n$ codes), $n=6, \ldots, 32 ; \rho_{\max }$ of our binary codes (based on $\mathcal{H}_{32}$ ("Sylvester") and first Paley type Hadamard matrices) vs. Levenshtein's lower bound.
the literature (at least in the form of Figures), for low as well as high code rates. In addition, it seems that reports of actual binary code designs are not present in the literature (to perform a direct comparison with our binary codes) except one found in [35] (see comments in §IV.1.3), with limited however code reports. Binary codes, targeted though for the multiple-access channel (having the $\rho_{\max }$ metric as well for design criterion), are reported in [53], but we will refer to them in the appropriate Chapter (Chapter VI).

In $[32,3]$ the authors designed $M$-PSK block codes based in general on random search (or exhaustive when applicable). However, for the binary case $M=2$ there
were no codes reported. In [33] the authors introduced an analytical $M$-PSK linear block code design approach for noncoherent detection, but they were constrained to codes with very small redundancy and didn't report on any binary codes, i.e. $M=2$.

## V.1.2. Complex Codes

In this subsection we present some complex code results of the search methods described in §IV.2, as well as in §IV.3. To simplify here further the search (in terms of computing effort) we paid attention only in the last spectrum line ( $\rho_{\max }, N_{\delta}$ ), i.e. $\lambda=\delta$ (see definition of the optimal $\rho$-spectrum). By this, we mean that the selection of the corresponding code is done not with the optimal metric spectrum criterion, but rather with the "best" last spectrum line (which is $\left(\rho_{\max }, N_{\rho_{\max }}\right)$ ) criterion (unless otherwise specified). Therefore (in Step 2 when we use nested search) we select the code that either its $\rho_{\max }$ is the lowest possible over the search, or if there are multiple codes with same minimal $\rho_{\max }$, then its $N_{\rho_{\max }}$ is the lowest possible (if again there is a tie, we select the first found code).

In order to get a complex code $\mathcal{C}_{M, n}$ (of cardinality $M$ and length $n<M$ ) with small $\rho_{\max }$, we perform in the straightforward approach a full search over the $M$ columns of the $\mathcal{C}_{M, M}$ code (3.26), (3.27) and we select those $n$ columns that yield the $\mathcal{C}_{M, n}$ code with the best last spectrum line $\left(\rho_{\max }, N_{\delta}\right)$. Note that this search requires calculation of $\binom{M}{n}$ cross-correlation spectra, which may be prohibitively complex for large $M$, in which case we will switch to the nested search of $\S I V .2$.

In Figure 15 we present the $\rho_{\max }$ of the $\mathcal{C}_{M, n} Q$ ary-PSK codes found with the full search over-the-columns for $M=16$ (§IV.3.1), where we used the $\mathcal{C}_{M, M}=\mathcal{S}_{M}$ Unitary matrix (3.27), and in Figure 16 we have the codes found with the same search but using the $\mathcal{C}_{M, M}=\mathcal{I}_{M}$ Unitary matrix (3.25). Notice that we have included also (Fig. 15) the case $Q=2$ which corresponds to binary codes, since in general the


Fig. 15. $\rho_{\max }$ of $Q$ ary-PSK codes found with the full over-the-columns search vs. lower bound (based on the $\mathcal{S}_{16}$ unitary matrix); $M=16,2 \leq n \leq M$.
search details of this subsection are different to those of $\S \mathrm{V} .1 .1$, hence different codes may be found.

In Figure 17 we present the $\rho_{\max }$ of the $\mathcal{C}_{M, n}$ Qary-PSK codes found for $M=32$, with the full search over-the-columns but using the short $\rho$-spectrum, cf. §III. 1 (where again we used the $\mathcal{C}_{M, M}=\mathcal{S}_{M}$ Unitary matrix (3.27)). Recall that the short $\rho$ spectrum, as opposed to the (full) $\rho$-spectrum, contains not all the pairwise absolute crosscorrelations, but rather all the pairwise absolute crosscorrelations with respect to a specific codeword. Therefore the search using the short $\rho$-spectrum is much less complex than if we were using the (full) $\rho$-spectrum, since it requires only $M-1$ cross-correlations. This complexity reduction can make our search methods feasible


Fig. 16. $\rho_{\max }$ of $Q$ ary-PSK codes found with the full over-the-columns search vs. lower bound (based on the $\mathcal{I}_{16}$ unitary matrix); $M=16,2 \leq n \leq M$.
for getting codes with larger cardinality and codeword length.
It can be shown $[34,3]$, that if from $\mathbf{D}_{M}(3.26)$ we pick any $n$ columns, the resulting $\mathcal{C}_{M, n}$ code has absolute pairwise cross-correlations:

$$
\begin{equation*}
\left|\rho_{i j}\right|=f(|i-j|) \tag{5.1}
\end{equation*}
$$

which are a function of the corresponding absolute rows difference; here $i, j$ are the indices of two rows (codewords) of $\mathcal{C}_{M, n}$. Therefore, since the pairwise crosscorrelations have the form of (5.1), instead of calculating the whole pairwise crosscorrelation spectrum of $\binom{M}{2}$ pairwise cross-correlations (full $\rho$-spectrum), it suffices
to calculate only $M-1$ pairwise cross-correlations, i.e. $\rho_{0 j}, j=1,2, \ldots, M-1$ (short $\rho$-spectrum).

However, it can be shown that (5.1) is not valid in general, if the $\mathcal{C}_{M, n}$ code is resulting from the $\mathbf{D}_{Q}$ according to (3.27) or (3.28), i.e. for $Q<M$. But due to the dramatic complexity reduction we have example results by using the short $\rho$-spectrum that otherwise would be impossible to obtain.

A reasonable question arises here, that of whether the $\rho_{\max }$ calculated with the full and the short $\rho$-spectra respectively are equal. This question will be tackled in the sequel in this subsection in the discussion of the results.

If we want now to get codes of higher cardinality and length, we'll have to switch to the low complexity nested search methods. In the forward nested search, we use the $\mathcal{C}_{M, M}=\mathcal{S}_{M}$ Unitary matrix (3.27), starting the search from just the first column of the $\mathcal{S}_{M}$, i.e. $\xi=1$, cf. (§IV.2.1), unless otherwise stated. In the backward nested search which is also based on $\mathcal{S}_{M}$, and in order to be consistent with the forward nested search, in this subsection, we chose not to remove the first column of the $\mathcal{S}_{M}$ code in any iteration of the backward nested search.

In Figures 18-19, we have the codes for $M=64$ and $M=256$ respectively, resulting from the forward nested search, where we observe that for moderate to large $n, Q$ ary-PSK codes of small $Q$ achieve $\rho_{\max }$ close to that of the larger constellation codes. Note that in the case $Q=256$ (in Figure 19) we made use of the short $\rho$-spectrum.

Figure 20 depicts the search results with the forward nested search for the case of $M=Q=1024$. Figure 21 contains the comparison between the forward nested and backward nested search for $M=Q=256$. As expected, the forward nested search yields in general better codes for small $n$, and the backward nested search for large $n$. However the difference in $\rho_{\max }$ of the two methods at high $n$ is very small (for the

Fig. 17. $\rho_{\max }$ of $Q$ ary-PSK codes vs. lower bound (the codes were found with the full over-the-columns search but using
the short $\rho$-spectrum, and are based on the $\mathcal{S}_{32}$ unitary matrix); $M=32,2 \leq n \leq M$.

Fig. 18. $\rho_{\max }$ of $Q$ ary-PSK codes vs. lower bound (based on the $\mathcal{S}_{64}$ unitary matrix); $M=64,2 \leq n \leq M$.

Fig. 19. $\rho_{\max }$ of $Q$ ary-PSK codes vs. lower bound (based on the $\mathcal{S}_{256}$ unitary matrix); $M=256,2 \leq n \leq M$.
cases shown).
We also observed that when we used the short $\rho$-spectrum in the code-search of Figures 15, 19 (for $Q<M$ ), codes with identical $\rho_{\max }$ were found. Furthermore for the codes of Fig. 17, $\rho_{\max }$ calculated via the short $\rho$-spectrum was equal to that via the (full) $\rho$-spectrum. More research though needs to be performed towards the relationship between the (full) $\rho$-spectrum and the short $\rho$-spectrum (and if their corresponding $\rho_{\max }$ are equal in general) for codes designed through (3.27).

Lastly, in Figures 22-23 we show the importance on the choice of the unitary matrix to be used in the forward nested search, since it affects the efficiency of the search method. Moreover results with random search over $\Lambda=10^{5}$ codes, according to §IV.3.2 are given, showing that when the full search (over the columns of a unitary matrix) size $\binom{M}{n}$ is not very large, random search is capable to give good codes.

In the figures of this subsection, we have also plotted the Levenshtein bound [45] (see also $\S$ III.3.2). We see that the $Q$ ary-PSK codes have a $\rho_{\max }$ close to the lower bound. However the aforementioned bound has been constructed for codes with elements from the complex alphabet and not specifically from the Qary-PSK alphabet, therefore some looseness is to be expected.

We believe also that with some more programming effort, i.e. by including more spectral lines in the nested search, better codes may be obtained, at the additional expense of higher complexity search.

In the literature (as briefly mentioned in the literature survey of $\S I I .3$ ), there also exists a Fourier-based construction of $M$-PSK codes [34] by randomly selecting $n$ rows of the $\mathbf{D}_{M}$ DFT matrix such that the resulting vectors have as little correlation as possible. However this method of [34] is effective as long as $\binom{M}{n}$ is not very large, and is limited to $Q=M$.

For $Q<M$ though, we can form a $\mathcal{C}_{M, M}$ code according to $\S$ III.4.2 and perform

Fig. 20. $\rho_{\max }$ of 1024 -PSK codes vs. lower bound (based on the $\mathcal{S}_{1024}$ unitary matrix); $M=1024,2 \leq n \leq M$.

Fig. 21. $\rho_{\max }$ of 256 -PSK codes vs. lower bound (based on the $\mathcal{S}_{256}$ unitary matrix); Comparison of forward nested vs.
backward nested search; $M=256,2 \leq n \leq M$.

Fig. 22. $\rho_{\max }$ of $Q$ ary-PSK codes vs. lower bound (based on the $\mathcal{S}_{64}$, and $\mathcal{I}_{64}$ unitary matrices); $M=64,2 \leq n \leq M$.

Fig. 23. $\rho_{\max }$ of $Q$ ary-PSK codes vs. lower bound (based on the $\mathcal{S}_{256}$, and $\mathcal{I}_{256}$ unitary matrices); $M=256,2 \leq n \leq M$.
random search, cf. §IV.3.2, Figures 22-23, on the columns of that code to pick those $n$ columns such that the resulting $\mathcal{C}_{M, n}$ code is best.

Although it is risky to compare versus random search methods, we would say for example (based on simulations), that for $Q=M=256$ the aforementioned method of [34] yields the same or lower $\rho_{\max }$ codes than our nested search approximately for $n$ up to 20 , provided reasonable search time (it was tested for 100 times the corresponding search time required by our nested search).

Besides this, there exists an algebraic structure to find complex block codes with low $\rho_{\max }$ of cardinality $M=Q^{K}$ (for some integer $K$ ) and length $n$, by using $Q$-PSK modulation on codes from the ring of integers modulo $Q, \mathcal{Z}_{Q},[32,3,33,34]$.

In [34], in order to reduce the complexity of the algebraic approach, the authors performed a random search over systematic generator matrices. If we were to compare their approach to ours in obtaining low $\rho_{\max } \mathcal{C}_{M, n}$ codes, we would say that it is very good for small $n$, but very complicated for today's computer power, for large $n$. For example a full search to obtain a $\mathcal{C}_{256,128}$ code with say $Q=4$ (and the algebraic approach) requires a search over $\approx 10^{298}$ codes, which means that a random search (of maybe $\approx 10^{7}$ codes) may have a small probability to find a good code. For the same parameters, our nested search requires search over only 32640 codes to find all the $\mathcal{C}_{256, n}$ codes with $2 \leq n \leq 256$ !

We also believe that our methodology gives more design flexibility, e.g. $Q$-PSK codes of cardinality $M$ cannot be obtained with the algebraic approach, unless $K=$ $\log _{Q} M$ is an integer. Lastly the codes derived through the algebraic approach are not guaranteed to be max-SC codes (for more details on these codes, see §VI. 2 (6.12)).

We performed very long random searches according to the algebraic approach of [34] and the $\rho_{\max }$ comparison to our forward nested search codes, cf. Fig. 23, 21, is given in Tables IV, V. Particularly for the codes with length $n \geq 128$, we stopped the

Table IV. Code $\rho_{\max }$ comparison; $M=256, Q=4$.

| $n$ | 16 | 64 | 128 | 192 | 224 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Forward nested | 0.39528 | 0.16087 | 0.09111 | 0.05753 | 0.03993 |
| Random [34] | 0.37500 | 0.18222 | 0.12932 | 0.10546 | 0.10278 |

Table V. Code $\rho_{\max }$ comparison; $M=256, Q=256$.

| $n$ | 16 | 128 | 192 |
| :---: | :---: | :---: | :---: |
| Forward nested | 0.40103 | 0.09756 | 0.05715 |
| Random [34] | 0.37665 | 0.12979 | 0.10531 |

random searches after not seeing any change in $\rho_{\max }$ for several days. For example also, the total number of codes randomly searched [34] for the code $\mathcal{C}_{256,128}(Q=256)$ was approximately $1.14 \cdot 10^{7}$.
V.2. AWGN Channel

## V.2.1. Binary Codes

In this subsection we present code results for the AWGN channel, from the search methods described in $\S$ IV.2, where we have used the Hadamard code $\mathcal{H}_{M}$ (3.24) as the $\mathcal{C}_{M, M}$ code $\left(M=2^{k}\right)$ required by our search methods.

We start the forward nested search with the systematic $\mathcal{C}_{M, k}$ code, i.e. $\xi=k$, cf. §IV.2.1 (therefore all the codes found with this method are systematic). Note that the systematic $\mathcal{C}_{M, k}$ block code consists of the $M / 2, M / 4, \ldots, 2,1$ st columns of the $M \times M$ linear binary Hadamard matrix $\mathcal{H}_{M}$ (counting starts from 0 ), see Appendix


Fig. 24. $d_{\text {min }}$ of linear binary block codes (based on the $\mathcal{H}_{16}$ ) vs. coexisting lower and upper bounds; $k=4,5 \leq n \leq 2^{k}$.
B. Likewise, in the backward nested search, in order to be consistent with the forward nested search, we don't remove the aforementioned "systematic" columns (i.e. the columns of the systematic $\mathcal{C}_{M, k}$ code).

In Figures $24-25$ we depict the minimum (Hamming) distance $d_{\text {min }}$ of the codes found through the forward and backward nested searches for $k=4$ and $k=5$, respectively. It is obvious that the best of the codes of these two search methods are $\max -d_{\min }$ codes, since they achieve the coexisting upper and lower bounds on $d_{\text {min }}$ [36].

For example also we give in the following vectors $\mathbf{c}_{f}$ and $\mathbf{c}_{b}$, the corresponding columns of the Hadamard matrix $\mathcal{H}_{32}(3.24)$, comprising the codes of Fig. $25(k=5)$


Fig. 25. $d_{\text {min }}$ of linear binary block codes (based on the $\mathcal{H}_{32}$ ) vs. coexisting lower and upper bounds; $k=5,6 \leq n \leq 2^{k}$.
of the forward and backward nested searches respectively.

$$
\begin{align*}
& \overbrace{n=9}^{n=15} \\
& \mathbf{c}_{f}=\overbrace{16,8,4,2,1,31,7,11,21}, 25,13,14,19,22,26,28,3,5,9,17,30 \text {, } \\
& 6,10,18,29,12,20,27,15,23,24,0] \text {, } \tag{5.2}
\end{align*}
$$



Fig. 26. $d_{\text {min }}$ of linear binary block codes (based on the $\mathcal{H}_{64}$ ) vs. coexisting lower and upper bounds; $k=6,7 \leq n \leq 2^{k}$.

$$
\begin{array}{r}
\mathbf{c}_{b}=\overbrace{\left[\begin{array}{l}
16,8,4,2,1,15,22,21,12 \\
n=9 \\
\hline
\end{array} 1,11,13,23,10,20\right.}, 18,14,17,9,30,29, \\
27,24,7,26,25,6,5,28,3,31,0] . \tag{5.3}
\end{array}
$$

In Figure 26 the codes found with $k=6$ are depicted. In more detail, in addition to the forward and backward nested search methods we have plotted the results of the enhanced forward nested search (over 2 columns). We observe that the best of the codes either achieve the $d_{\text {min }}$ bound or they are close to it.

Recall that in the nested search methods, the codes depend on the previously


Fig. 27. $d_{\text {min }}$ of linear binary block codes (based on the $\mathcal{H}_{128}$ ) vs. coexisting lower and upper bounds; $k=7,8 \leq n \leq 2^{k}$.
found codes. We have found that by ad-hoc modification of the nested search better codes may be found. For example, recall that in the backward nested search we don't remove the systematic columns during the search. By checking also some cases, we observed that the forward nested search "selects" the last column of the Hadamard matrix for the $(k+1)$ st column. Therefore by not removing this column from the backward nested search in addition to the systematic columns, we found a few better codes than the other methods. The best of the codes found with this ad-hoc modification, as well the other of our nested search methods are depicted for $k=7$ in Figure 27, where again we see that either they meet the $d_{\text {min }}$ bound either they are close to it.

In order to show the efficiency of the forward nested search alone, we have plotted in Figure 28 the resulted low $d_{\text {min }}$ codes for $k=14$. A PC Pentium ${ }^{\circledR} 4$ at 2.26 GHz was employed and the execution time of the forward nested search to get all the codes of rates $k /(k+1)$ to $k / 2^{k}$, for $k=7$ and $k=14$, was approximately 1 second and 49 hours, respectively.

In order to have a comparison with state-of-art codes (besides the comparison we have to the ultimate criterion, i.e. the $d_{\text {min }}$ bound) we chose for example the BCH code $(n, k)=(15,5)$ with generator polynomial $2467_{8}$ in octal [4, p. 437] which has $d_{\min }=7$. This code has weight multiplicities (distribution) $N_{7}=15, N_{8}=15$ and $N_{15}=1\left(N_{0}=1\right)$. Our best code found with the forward nested search (Fig. 25) has the same $d_{\text {min }}=7$ and exactly the same weight distribution. The code is given in (5.2) for $n=15$.

However there are BCH codes (and even there should be other block codes) that achieve a larger $d_{\text {min }}$ compared to our codes, e.g. the $(31,6) \mathrm{BCH}$ code compared to our codes of Fig. 26, since no optimality of our codes is claimed. We believe that with some more programming effort, along the lines of the enhanced nested search codes of larger $d_{\text {min }}$ may be found.

Lastly we would like to demonstrate a very simple construction (named "Direct" construction) of good linear block codes of certain rates without the need for any search. By comparing the $d_{\text {min }}$ bounds [36] and the structure of the linear Hadamard matrices, it can be easily inferred that one may get good codes around the rates of $k / 2^{k-1}, k /\left(2^{k-1}+2^{k-2}\right)$, and so on, by simply using parts of the Hadamard matrices as codes. For example, the codes of rate $k / n$ are constructed from the $M-n, \ldots, M-$ 2, $M-1$ columns $\left(M=2^{k}\right)$ of the Hadamard matrix (assuming first column's index is 0 ). The $d_{\min }$ of the codes found for $k=6,7$ is given in Figures $29-30$ respectively, where we observe many max- $d_{\min }$ codes in the aforementioned code rates.

Fig. 28. $d_{\text {min }}$ of linear binary block codes (based on the $\mathcal{H}_{16384}$ ); $k=14,15 \leq n \leq 2^{k}$.


Fig. 29. $d_{\text {min }}$ of linear binary block codes resulted from the Direct construction vs. coexisting lower and upper bounds; $k=6,7 \leq n \leq 2^{k}$.

Moreover the $(n, k)=\left(2^{k-1}-1, k\right)$ block codes found with the direct construction for $k=4,5,6,7,8,9$, have same $d_{\text {min }}$ as the corresponding BCH codes [58], [4, p. 437].

One could also easily get a good code of rate $k /(n+\alpha M), 1 \leq n \leq M, \alpha \geq 1$, from a good code of rate $k / n$ by simply concatenating $\alpha$ Hadamard matrices (of size $M \times M)$ to it. The motivation behind it is the observation that the concatenation of Hadamard matrices yield codes with $d_{\text {min }}$ close to or on the $d_{\text {min }}$ bound [36].

From the results in this subsection, we can conclude that good linear binary block codes for the AWGN channel can be designed with our methodology, with small complexity, for a wide range of code rates.

Further one may come up with high-rate codes, by using the duals of the ob-


Fig. 30. $d_{\text {min }}$ of linear binary block codes resulted from the Direct construction vs. coexisting lower and upper bounds; $k=7,8 \leq n \leq 2^{k}$.
tained low-rate codes, for which the weight distribution can be obtained from the corresponding ones of the low-rate codes [11, Ch. 5], [25]. However we will not pursue in this dissertation this research direction.

In the literature, there exists a somewhat related to our design methodology construction of linear block codes, based on simplex codes and the notion of anticodes. These codes are constructed from the generator matrix of a binary simplex code (or several copies of it), by deleting certain columns, which form the generator matrix of the anticode. The formation of the anticode now is more involved, using the mathematical tool of projective geometry. The interested reader may consult [11, Ch. $17, \S 6]$ and the many references therein.

In this subsection we presented a large multitude of linear binary block codes with large $d_{\text {min }}$ (suitable for the AWGN channel), derived from simple searches. Since we already compared the $d_{\min }$ of our codes to the $d_{\text {min }}$ bounds (visually in the figures), which is the ultimate comparison, we won't proceed to further comparisons with state-of-art codes [1, 11], besides the aforementioned ones.

Finally, we would like to comment, based on [51, 59], that although we see that the minimum distance of a code increases in general with increasing $n$, this doesn't necessarily translate to better asymptotic performance. The asymptotic performance is better evaluated by the product $R d_{\text {min }}$ (asymptotic coding gain). This becomes obvious from the following form of the union bound of the probability of codeword error of a linear binary block code over AWGN, cf. (3.10), [4],

$$
\begin{equation*}
P(e) \leq \sum_{d=d_{\min }}^{n} N_{d} Q\left(\sqrt{2 \gamma_{b} R d}\right) \tag{5.4}
\end{equation*}
$$

where $\gamma_{b}$ is the signal to noise ratio per information bit, $R$ the code rate, $d_{\text {min }}$ is the minimum weight of the code excluding the all-zero codeword, and $N_{d}$ is the weight multiplicity, which equals the number of times the weight $d$ appears in the code.

In Figure 31 we have plotted the contents of Figure 26, where we have as the $y$-axis the asymptotic coding gain $\left(R d_{\min }\right)$ instead of $d_{\text {min }}$. Like in [51], which is for convolutional codes though, we observe that the maximum asymptotic coding gain (bound) is not strictly increasing with $n$. This means that one may not have to deploy very low rate block codes to achieve a certain asymptotic coding gain.


Fig. 31. Product $R d_{\text {min }}$ of linear binary block codes (based on the $\mathcal{H}_{64}$ ) vs. coexisting lower and upper bounds; $k=6,7 \leq n \leq 2^{k}$.

## V.2.2. Complex Codes

In this subsection we present complex block codes, minimizing the pairwise squared Euclidean distance, resulting from the search methods of §IV. 2 and targeted for the AWGN channel [60].

In more detail, Figure 32 contains complex block codes, minimum $d_{E}^{2}(2.13)$ vs. code length $n$, of cardinality $M=64$. The first three codes of the legend, are based on the $\mathcal{C}_{M, M}=\mathcal{I}_{64}$ Unitary matrix, cf. (3.25), with parameters $Q=64$ and $k=1$. The fourth code is based on the $\mathcal{S}_{64}$ Unitary matrix, cf. (3.27), with $Q=32$. It must be noted that in order to reduce the programming effort, in the second steps of the


Fig. 32. Minimum $d_{E}^{2}$ of complex block codes based on $\mathcal{I}_{M}$ and $\mathcal{S}_{M}$, and binary bound vs. code length $n ; M=64$.
nested search methods, we paid attention only to the first spectral line (minimum $d_{E}^{2}$ ), and not to the whole spectrum.

In Figure 32 we have also plotted the bound ${ }^{2}$ on the minimum $d_{E}^{2}$ of binary codes (since the upper-bound of [40] requires $M>(Q / 3)^{n}$, cf. §III.3), which is four times the minimum Hamming distance bound of the codes [36]. We observe that the complex codes are able to offer better performance (increased minimum $d_{E}^{2}$ ) especially at small code lengths; see also Table VI where we have some bandwidth efficient codes that their minimum distance compares favorably with the minimum distance of say

[^11]Table VI. Some bandwidth efficient codes

| Type of Search | Unitary Code | $M$ | $n$ | $Q$ | $k$ | $\min d_{E}^{2}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Random | $\mathcal{S}_{M}$ | 256 | 4 | 32 | - | 2.39 |
| Random | $\mathcal{I}_{M}$ | 256 | 4 | 256 | 1 | 2.69 |
| Random | $\mathcal{I}_{M}$ | 4096 | 6 | 8 | 4 | 2.93 |
| Random | $\mathcal{I}_{M}$ | 4096 | 6 | 4096 | 1 | 2.95 |
| Full | $\mathcal{I}_{M}$ | 16 | 4 | 16 | 1 | 8.00 |
| Random | $\mathcal{S}_{M}$ | 1024 | 10 | 512 | - | 10.68 |

$2^{\frac{\log _{2} M}{n}}$-PSK constellation (which has the same bandwidth expansion).
However, we observe some codes with specific length $n$, which are inferior to the binary bound. For at least these specific lengths $n$, we can construct good codes using our "Direct" construction method, which is based on our intuition obtained from the structure of Hadamard codes, cf. Fig. 29, [47]. In more detail, the codes of cardinality $M$ and length $n$ are constructed from the $M-n, \ldots, M-2, M-1$ columns of an $\mathcal{S}_{M}$ Unitary matrix (assuming first column's index is 0 ). Codes found with this method are shown in Fig. 33 for $Q=16$ and $M=64$.

To test also the efficiency of the nested search, in Figure 34 we have plot codes found with the forward nested search with $M=Q=1024^{3}$.

The complex block codes presented achieve in general higher minimum $d_{E}^{2}$ than the bound of binary codes. However the lack of efficient minimum $d_{E}^{2}$ upper-bounds for complex block codes, cf. §III.3, does not let us draw safe conclusion about the difference in the minimum $d_{E}^{2}$ between binary and complex block codes.

[^12]

Fig. 33. Minimum $d_{E}^{2}$ of complex block codes found with the Direct Construction, based on $\mathcal{S}_{64}$, and binary bound vs. code length $n ; M=64$.


Fig. 34. Minimum $d_{E}^{2}$ of complex block codes found with the forward nested search vs. code length $n ; M=1024$.

## V.3. Coherent Fading Channel

For the Coherent Fading Channel, we found complex block codes (depicted in Figure 35) through the forward nested search (§IV.2.1), based on the $\mathcal{C}_{M, M}$ codes $\mathcal{I}_{64}$ and $\mathcal{S}_{64}{ }^{4}$, using the metric B , cf. (3.13), [60], with $\mathrm{SNR}=10$.

In more detail, when we use the $\mathcal{I}_{64}$ matrix, we start the nested search with the systematic $\mathcal{C}_{M, k}$ code (that is a code containing the $k$ systematic columns of $\mathcal{I}_{64}$ ). On the other hand, when we make use of the $\mathcal{S}_{64}$ matrix in our forward nested search, we start the search with a single column code, containing the $11^{\text {th }}$ column of $\mathcal{S}_{64}$ (chosen simply by a few trials). In both cases however, in order to reduce the search complexity at the Step 2 of the search methods, we paid again attention only in the first spectral line (minimum metric and its corresponding multiplicity), as opposed to the whole metric spectrum. It is observed in Figure 35 that for all codes originated from $\mathcal{I}_{64}$ or $\mathcal{S}_{64}$, the higher the $Q$ the larger the minimum metric B for the same code length $n$.

Figures 36-37 depict the minimum metrics $\Xi$ and $\Gamma$, cf. (3.14), (3.15), of the codes found with the forward nested search, based again on the $\mathcal{C}_{M, M}$ codes $\mathcal{I}_{64}$ and $\mathcal{S}_{64}$.

From the comparison of the Figures $35-37$ it is evident that the code design for the coherent Rayleigh channel, should look directly on maximizing the minimum B (3.13). If one would try to design codes based independently either on maximizing the minimum $\Xi$ or on maximizing the minimum $\Gamma$, although these metrics are independent of the SNR, one may end up with opposite results; for example the codes found with $Q=64$ are the best based on metric $\Xi$, but the worst (in general) based on the

[^13]

Fig. 35. Minimum metric $\mathrm{B}(\mathrm{SNR}=10)$, cf. (3.13), of linear block codes $\mathcal{C}_{M, n}$, based on $\mathcal{I}_{64}$ and $\mathcal{S}_{64} ; M=64$.
product distance metric $\Gamma$ (cf. Figures 36-37).
An evaluation of the complex block codes found can not be performed, since we are not aware either of any bounds on the corresponding metrics, neither of any previous complex block codes for the coherent fading channel.


Fig. 36. Minimum metric $\Xi$, cf. (3.14), of linear block codes $\mathcal{C}_{M, n}$, based on $\mathcal{I}_{64}$ and $\mathcal{S}_{64} ; M=64$.

## V.4. Other Channels with Known Pairwise Error Probability

It is obvious that using our code design methodology, best or optimal codes can be found for any transmission channel. The only requirement is the knowledge of the corresponding pairwise error probability or at least an upper-bound of it, out of which we will extract the metric which would be used by our search methods to find the code that optimizes it.

There are of course, many other transmission channels of interest, than the ones covered here. However, in order to keep the size of this dissertation reasonable, we won't present block codes for other channels than the ones already presented in the


Fig. 37. Minimum metric $\Gamma$, cf. (3.15), of linear block codes $\mathcal{C}_{M, n}$, based on $\mathcal{I}_{64}$ and $\mathcal{S}_{64} ; M=64$.
previous sections.

## CHAPTER VI

## APPLICATIONS TO MULTIPLE-ACCESS*

Besides the application of the designed block codes for their target channel, other applications can be found for communication situations that the same metric dominates the probability of error. In this chapter we will investigate the application of the previously designed codes in the multiple-access communications [4], as well we will propose - when necessary - minor modifications to better match each specific case.

## VI.1. Binary Code Search Maximizing Total Squared Correlation

In [61] it was shown that the sum capacity of the synchronous code division multiple access (CDMA) channel with equal average input energy constraints is maximized with signature (multi-) sets meeting Welch's lower bound on the total square correlation (TSC) ${ }^{1}$. Specifically for binary signature sets, it has been shown [53] that the sum capacity is maximized for optimum TSC signature sets (sets achieving the lower bound on TSC) of certain cardinality and length [62] (see also [61, 63]), while the

[^14]rest of the optimum TSC binary signature sets exhibit negligible sum capacity loss as compared to optimum TSC real/complex sequence sets (of the same cardinality and length).

On the other hand, optimum TSC sequence sets don't imply sets with low crosscorrelation spectrum, §IV.1, [46]. If an optimum TSC set [53] has a few pairs with high cross-correlation, this may result in some users experiencing high probability of error since, for example, the latter (assuming for simplicity equal user powers and BPSK modulation) can be upper-bounded by a function of the sum of the pairwise absolute and/or squared cross-correlations of the sequences of the users with respect to the sequence of the user of interest $[64, \S 3.4]$. This situation will be more important in low to moderately loaded systems. Therefore it is critical that the TSC-optimality be sought along with the optimization of the cross-correlation spectrum.

In §IV.1, [46], we presented search methods to obtain binary block codes with low (in some cases optimal) cross-correlation spectrum (" $\rho$-spectrum"). In [53], Karystinos and Pados derived new TSC-bounds and developed simple designs of binary optimal TSC sequences by appropriately utilizing Hadamard matrices (codes). Although their sequences are TSC-optimal, they are not guaranteed to have low $\rho$-spectrum. In this Section we merge the two aforementioned concepts to construct optimal-TSC signature sets with low cross-correlations. In addition we show, based on our search method, that TSC-optimality may prevent the code from having low cross-correlation spectrum.

## VI.1.1. Sequences with Low Cross-correlations

Let's assume we have a multiple-access binary block code (matrix) $\mathcal{C}_{K, n}$ (having $K$ binary codewords (sequences) of length $n$ ). In a $K$-user CDMA system with processing gain $n$, for example, each user is assigned a single codeword of $\mathcal{C}_{K, n}$.
$\mathcal{C}_{K, n}$ is obtained through a nested search similar to the nested searches of Chapter IV, which is explicitly shown below. The steps of the nested search to find the best $\mathcal{C}_{K, n}^{*}$ code having optimal cross-correlation spectrum (among the cross-correlation spectra of the limited search), starting from a known $\mathcal{C}_{K, \xi}$ code, $\xi \geq 1$ are summarized below:

1. Set $j=\xi+1$.
2. Search for the $K$-bit (column) $\mathbf{c}$ vector, such that $\mathbf{c} \notin \mathcal{C}_{K, j-1}{ }^{2}$, and $\mathcal{C}_{K, j}=$ $\left[\mathcal{C}_{K, j-1}, \mathbf{c}\right]$ is the best code of the search. Let $\mathcal{C}_{K, j}^{*}$ denote the best code of the search.
3. Set $\mathcal{C}_{K, j}=\mathcal{C}_{K, j}^{*}$.
4. Set $j=j+1$.
5. If $j>n$ Stop, else go to Step 2.

For the search in Step 2 of the nested search, we let the $\mathbf{c}$ vector take only columns (e.g. their first $K$ bits) of an $N \times N$ Hadamard code, $K \leq N$ and $N$ is close to $K$ [46]. We also start the search (in this subsection) with $\mathcal{C}_{K, 1}$ being the first column of the $N \times N$ Hadamard code $(\xi=1)$, having only the first $K$ bits.

## VI.1.2. TSC-optimal Sequences with Low $\rho$-spectrum

Codes obtained with the nested search of §VI.1.1 (hereafter called "Search A") although have low cross-correlations, they are not guaranteed to be TSC-optimal for all load cases, i.e. for all $K$. Therefore we will incorporate in our search the design of [53] to guarantee the TSC-optimality for applicable code sizes [53].

[^15]For a binary code $\mathcal{C}_{K, n}$, TSC is defined as (assuming real codewords-sequences ${ }^{3}$ $\mathbf{d}_{i}$ )

$$
\begin{equation*}
\mathrm{TSC}=\frac{1}{n^{2}} \sum_{i=1}^{K} \sum_{j=1}^{K}\left(\mathbf{d}_{i}^{T} \mathbf{d}_{j}\right)^{2} \tag{6.1}
\end{equation*}
$$

and in terms of our $\rho$-spectrum, (6.1) can be written as

$$
\begin{equation*}
\mathrm{TSC}=2 \sum_{|\rho|=0}^{\rho_{\max }} N_{|\rho|} \rho^{2}+K \tag{6.2}
\end{equation*}
$$

We consider, similar to [53], the following cases:
a. Overloaded Case: $K \geq n$

Assume there exists a Hadamard matrix of size $N \times N$, such that [53], $N=4\left\lfloor\frac{K+1}{4}\right\rfloor$, and $N \geq n$. Then, [53] $K \in\{N-1, N, N+1, N+2\}$.

For the first two possible values of $K$, Search A yields optimal TSC sequences with low $\rho$-spectrum. For $K=N+1$ or $K=N+2$ the following search applies:

Let $\mathcal{C}_{K, n}$ be of the form

$$
\begin{equation*}
\mathcal{C}_{K, n}=\left[\mathcal{C}_{N, n} ; \mathbf{A}\right], \tag{6.3}
\end{equation*}
$$

with A a $\mu \times n$ matrix, $\mu=K-N[53]$,

$$
\begin{equation*}
\mathbf{A}=\mathbf{v}^{T}, \mathbf{v} \in\{ \pm 1\}^{n}, \text { if } K=N+1 \tag{6.4}
\end{equation*}
$$

and if $K=N+2$,

[^16]\[

\mathbf{A}=\left\{$$
\begin{array}{l}
\left(\mathbf{v}^{T}, \mathbf{v}^{T} ; \mathbf{v}^{T},-\mathbf{v}^{T}\right), \mathbf{v} \in\{ \pm 1\}^{\frac{n}{2}}, n \text { even }  \tag{6.5}\\
\left(\mathbf{v}^{T}, \alpha_{1}, \mathbf{v}^{T} ; \mathbf{v}^{T}, \alpha_{2},-\mathbf{v}^{T}\right), \mathbf{v} \in\{ \pm 1\}^{\frac{n-1}{2}}, n \text { odd }
\end{array}
$$\right.
\]

where $\alpha_{1}, \alpha_{2} \in\{ \pm 1\}$.
Thus, our search for optimum-TSC codes with low cross-correlations proceeds as follows:

Initialize $\mathcal{C}_{K, n}^{*}$ to the zero matrix. For each possible $\mathbf{A}$, start the nested search with $\mathcal{C}_{K, \xi}=\left[\mathcal{C}_{N, \xi} ; \mathbf{A}_{\mu, \xi}\right]$ code, where $\mathcal{C}_{N, \xi}$ a known code, and $\mathbf{A}_{\mu, \xi}$ the left-most submatrix of $\mathbf{A}$ of size $\mu \times \xi, \xi \geq 1$. The steps are summarized below:

1. Set $j=\xi+1$.
2. Search for the $N$-bit vector $\mathbf{c}$ such that $\mathbf{c} \notin \mathcal{C}_{N, j-1}$, and $\mathcal{C}_{K, j}=\left[\mathcal{C}_{N, j-1}, \mathbf{c} ; \mathbf{A}_{\mu, j}\right]$ is best (if $j=n$, the optimality shall be checked also over $\mathcal{C}_{K, n}^{*}$.)
3. Let $\mathcal{C}_{K, j}^{*}$ be the best code of Step 2 .
4. Set $\mathcal{C}_{K, j}=\mathcal{C}_{K, j}^{*}$ and $\mathcal{C}_{N, j}=\mathcal{C}_{N, j}^{*}$, where $\mathcal{C}_{N, j}^{*}$ is the upper-most sub-matrix of $\mathcal{C}_{K, j}^{*}$ of size $N \times j$.
5. Set $j=j+1$.
6. If $j>n$, re-start the nested search with the next possible $\mathbf{A}$ (if all possible A's have been searched, Stop), else go to Step 2.

For the search in Step 2 we again let the vector $\mathbf{c}$ be only columns of an $N \times N$ Hadamard code, [53]. In this subsection we also start the search with $\mathcal{C}_{N, 1}$ the first column of the $N \times N$ Hadamard code $(\xi=1)$, i.e. $\mathcal{C}_{K, 1}=\left[\mathcal{C}_{N, 1} ; \mathbf{A}_{\mu, 1}\right]$.

In case of large $n$, i.e. for unmanageable search complexity, one can set (for example in the case $K=N+1$ ), $\mathbf{v}=[\mathbf{u} ; \mathbf{u} ; \ldots ; \mathbf{u}]$, where $\mathbf{u}$ is an $n / \zeta$-bit vector (for
some integer $\zeta$, and $n$ even), to reduce the search complexity, sacrificing possibly in the $\rho$-spectrum (for $n$ odd, set $\mathbf{v}$ accordingly.)

The following examples demonstrate the search method of this subsection.

Example 1: We searched for a code of $K=34$ codewords of length $n=18(N=$ 32). The result was a new TSC-optimal code $\mathcal{C}_{34,18}^{*}(\mathrm{TSC}=66)$, with $\rho_{\max }=6 / 18=$ 0.3333 and $\rho$-spectrum $\left\{N_{\rho_{\max }}, N_{\rho_{\max }-1 / n}, N_{\rho_{\max }-2 / n}, \ldots, 0\right\}=\{20,0,216,0,252,0,73\}$, as compared to [53] which has $\mathrm{TSC}=66$, but $\rho_{\max }=12 / 18=0.6666$. The code is shown in the $\{0,1\}$ format.

$$
\mathcal{C}_{34,18}^{*}=\left(\begin{array}{llllllllllllllllll}
0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\
0 & 1 & 0 & 0 & 0 & 0 & 1 & 1 & 0 & 0 & 1 & 0 & 1 & 1 & 1 & 0 & 0 & 1 \\
0 & 0 & 1 & 0 & 0 & 0 & 1 & 0 & 1 & 1 & 0 & 1 & 1 & 0 & 1 & 1 & 0 & 0 \\
0 & 1 & 1 & 0 & 0 & 0 & 0 & 1 & 1 & 1 & 1 & 1 & 0 & 1 & 0 & 1 & 0 & 1 \\
0 & 0 & 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 & 1 & 0 & 0 & 0 & 1 & 0 & 1 & 1 \\
0 & 1 & 0 & 1 & 0 & 0 & 0 & 1 & 1 & 0 & 0 & 0 & 1 & 1 & 0 & 0 & 1 & 0 \\
0 & 0 & 1 & 1 & 0 & 0 & 0 & 0 & 0 & 1 & 1 & 1 & 1 & 0 & 0 & 1 & 1 & 1 \\
0 & 1 & 1 & 1 & 0 & 0 & 1 & 1 & 0 & 1 & 0 & 1 & 0 & 1 & 1 & 1 & 1 & 0 \\
0 & 0 & 0 & 0 & 1 & 0 & 0 & 1 & 1 & 0 & 1 & 1 & 1 & 1 & 1 & 1 & 0 & 0 \\
0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 & 1 & 0 & 0 & 1 & 0 & 0 & 0 & 1 & 0 & 1 \\
0 & 0 & 1 & 0 & 1 & 0 & 1 & 1 & 0 & 1 & 1 & 0 & 0 & 1 & 0 & 0 & 0 & 0 \\
0 & 1 & 1 & 0 & 1 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 & 0 & 1 \\
0 & 0 & 0 & 1 & 1 & 0 & 1 & 1 & 0 & 0 & 0 & 1 & 1 & 1 & 0 & 1 & 1 & 1 \\
0 & 1 & 0 & 1 & 1 & 0 & 0 & 0 & 0 & 0 & 1 & 1 & 0 & 0 & 1 & 1 & 1 & 0 \\
0 & 0 & 1 & 1 & 1 & 0 & 0 & 1 & 1 & 1 & 0 & 0 & 0 & 1 & 1 & 0 & 1 & 1 \\
0 & 1 & 1 & 1 & 1 & 0 & 1 & 0 & 1 & 1 & 1 & 0 & 1 & 0 & 0 & 0 & 1 & 0 \\
0 & 0 & 0 & 0 & 0 & 1 & 1 & 0 & 0 & 1 & 0 & 0 & 1 & 1 & 1 & 1 & 1 & 1 \\
0 & 1 & 0 & 0 & 0 & 1 & 0 & 1 & 0 & 1 & 1 & 0 & 0 & 0 & 0 & 1 & 1 & 0 \\
0 & 0 & 1 & 0 & 0 & 1 & 0 & 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 & 0 & 1 & 1 \\
0 & 1 & 1 & 0 & 0 & 1 & 1 & 1 & 1 & 0 & 1 & 1 & 1 & 0 & 1 & 0 & 1 & 0 \\
0 & 0 & 0 & 1 & 0 & 1 & 0 & 0 & 1 & 1 & 1 & 0 & 1 & 1 & 0 & 1 & 0 & 0 \\
0 & 1 & 0 & 1 & 0 & 1 & 1 & 1 & 1 & 1 & 0 & 0 & 0 & 0 & 1 & 1 & 0 & 1 \\
0 & 0 & 1 & 1 & 0 & 1 & 1 & 0 & 0 & 0 & 1 & 1 & 0 & 1 & 1 & 0 & 0 & 0 \\
0 & 1 & 1 & 1 & 0 & 1 & 0 & 1 & 0 & 0 & 0 & 1 & 1 & 0 & 0 & 0 & 0 & 1 \\
0 & 0 & 0 & 0 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 0 & 0 & 0 & 0 & 1 & 1 \\
0 & 1 & 0 & 0 & 1 & 1 & 0 & 0 & 1 & 1 & 0 & 1 & 1 & 1 & 1 & 0 & 1 & 0 \\
0 & 0 & 1 & 0 & 1 & 1 & 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 & 1 & 1 & 1 & 1 \\
0 & 1 & 1 & 0 & 1 & 1 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 1 & 1 & 0 \\
0 & 0 & 0 & 1 & 1 & 1 & 0 & 1 & 0 & 1 & 0 & 1 & 0 & 0 & 1 & 0 & 0 & 0 \\
0 & 1 & 0 & 1 & 1 & 1 & 1 & 0 & 0 & 1 & 1 & 1 & 1 & 1 & 0 & 0 & 0 & 1 \\
0 & 0 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 0 & 0 & 0 & 1 & 0 & 0 & 1 & 0 & 0 \\
0 & 1 & 1 & 1 & 1 & 1 & 0 & 0 & 1 & 1 & 0 & 0 & 1 & 1 & 0 & 1 \\
0 & 1 & 1 & 0 & 1 & 0 & 0 & 0 & 0 & 1 & 1 & 1 & 1 & 1 & 0 & 0 & 0 \\
0 & 0 & 0 & 1 & 1 & 1 & 1
\end{array}\right)
$$

Example 2: In this example, we consider the $\rho_{\text {max }}$ of a code from the asynchronous CDMA case [65], just for benchmarking, since our codes are designed for the synchronous case, i.e. minimum cross-correlation spectrum at zero lag.

The Gold code derived from the primitive polynomials $45_{8}$, and $75_{8}$ (polynomial
degree, $\xi=5)\left[66\right.$, p. 117] consists of 33 sequences of length 31 and has $\rho_{\max }=9 / 31$, with multiplicity $N_{\rho_{\max }}=6$ (as well as being TSC-optimal [53] with TSC=36.097). We used our aforementioned search by setting $\mathbf{v}=\left[\mathbf{u} ; \mathbf{u}_{[1: 10]}\right]$, where $\mathbf{u}$ is a 21 -bit ${ }^{4}$ vector, and $\mathbf{u}_{[1: 10]}$ the first 10 elements of $\mathbf{u}$. The result is a TSC-optimal code $\mathcal{C}_{33,31}^{*}$ with $\rho_{\max }=9 / 31$ (same as the Gold code), but with lower multiplicity $N_{\rho_{\max }}=4$.

[^17]However, if we don't restrict the cardinality of the code to be 33, we can see that we can get $(K, 31)$ block codes (i.e. codes with cardinality $K$ and length $n=31$ ) with higher than Gold code's cardinality $(K>33)$ and $\rho_{\max } \leq 9 / 31$. For example the binary codes $(64,31),(128,31)$ and $(256,31)$ shown in Figures $5-7$ and given in Appendix E, have $\rho_{\max }=7 / 31,9 / 31,9 / 31$ respectively and they are TSC-optimal.

From these results we see that one may find TSC-optimal codes exhibiting lower $\rho_{\max }$, if instead of using the constructions discussed in this subsection to get codes of cardinality $K$ (for $K=N-1, K=N+1$ or $K=N+2$ ), he designs codes of higher cardinality $K^{\prime}>K$ where $4 \mid K^{\prime}$ (i.e. $K^{\prime}$ is the cardinality of a Hadamard code) according to §V.1.1.

Example 3: Here we will give more comparisons on the $\rho_{\max }$ between the TSCoptimal Gold codes and our TSC-optimal forward nested codes of higher than the Gold code cardinality:

- The $(9,7)$ Gold code has $\rho_{\max }=5 / 7[66, \mathrm{p} .136]$. Our codes $(16,7),(32,7)$, $(64,7)$ found with the forward nested search and given in Appendix E have $\rho_{\text {max }}=3 / 7,5 / 7,5 / 7$ respectively.
- The $(65,63)$ Gold code has $\rho_{\max }=17 / 63[66$, p. 136]. Our codes $(128,63)$, $(256,63),(512,63),(1024,63),(2048,63)$ found with the forward nested search and given in Appendix E have $\rho_{\max }=9 / 63,13 / 63,15 / 63,15 / 63,17 / 63$ respectively.

From these comparisons, it is obvious that our TSC-optimal nested codes offer much higher cardinality (more users can be served) and equal or lower $\rho_{\max }$ to that of Gold codes of same length (however recall that here we are interested for the synchronous multiple access).

Example 4: In this example we show that there are cases where a TSC-optimal code found with the search of this section has higher $\rho_{\max }$ than a non TSC-optimal code found with Search $A$; i.e. a TSC-optimal code $\mathcal{C}_{9,7}^{\star}(N=8)$ found with a full search over $\mathbf{v}$, has $\mathrm{TSC}=12.43$ and $\rho_{\max }=5 / 7$. On the other hand, Search A yield $\mathcal{C}_{9,7}^{*}(N=12)$, which has TSC $=13.41$, but lower $\rho_{\max }=3 / 7$.

$$
\mathcal{C}_{9,7}^{\star}=\left(\begin{array}{lllllll}
0 & 0 & 0 & 0 & 0 & 0 & 0 \\
0 & 1 & 0 & 0 & 1 & 1 & 0 \\
0 & 0 & 1 & 0 & 1 & 0 & 1 \\
0 & 1 & 1 & 0 & 0 & 1 & 1 \\
0 & 0 & 0 & 1 & 0 & 1 & 1 \\
0 & 1 & 0 & 1 & 1 & 0 & 1 \\
0 & 0 & 1 & 1 & 1 & 1 & 0 \\
0 & 1 & 1 & 1 & 0 & 0 & 0 \\
0 & 0 & 0 & 0 & 0 & 0 & 1
\end{array}\right), \quad \mathcal{C}_{9,7}^{*}=\left(\begin{array}{lllllll}
0 & 0 & 0 & 0 & 0 & 0 & 0 \\
0 & 1 & 0 & 0 & 0 & 1 & 1 \\
0 & 1 & 1 & 1 & 0 & 1 & 0 \\
0 & 0 & 1 & 0 & 1 & 0 & 1 \\
0 & 1 & 0 & 1 & 0 & 0 & 1 \\
0 & 1 & 1 & 1 & 1 & 0 & 0 \\
0 & 1 & 1 & 0 & 1 & 1 & 1 \\
0 & 0 & 1 & 1 & 0 & 0 & 1 \\
0 & 0 & 0 & 1 & 1 & 1 & 1
\end{array}\right)
$$

So we see that in this context, the TSC-optimality may prevent the code from having a low $\rho_{\max }$. In addition a catastrophic code (i.e. a code having $\rho_{\max }=1$, or, equivalently, having complementary codewords) can be TSC-optimal, as we explain in the following example and also observed in [63].

Example 5: Catastrophic TSC-optimal codes: Let the $\mathcal{C}_{6,4}$ TSC-optimal code $(\mathrm{TSC}=10)$

$$
\begin{equation*}
\mathcal{C}_{6,4}=\left[\mathbf{H} ; \mathbf{z}^{T}, \mathbf{z}^{T} ; \mathbf{z}^{T},-\mathbf{z}^{T}\right] \tag{6.6}
\end{equation*}
$$

where $\mathbf{H}$ a $4 \times 4$ Hadamard matrix, and $\mathbf{z} \in\{ \pm 1\}^{2}$, [53]. It can be easily shown that all the possible 4 codes of (6.6) are catastrophic. On the other hand, a $\mathcal{C}_{6,4}^{*}$ code found with Search A $(N=8)$ has $\rho_{\max }=0.5$, and $\operatorname{TSC}=10$.

$$
\mathcal{C}_{6,4}^{*}=\left(\begin{array}{cccc}
0 & 0 & 0 & 0 \\
0 & 1 & 0 & 1 \\
0 & 0 & 1 & 0 \\
0 & 1 & 1 & 1 \\
0 & 0 & 0 & 1 \\
0 & 1 & 0 & 0
\end{array}\right) .
$$

Therefore it is important that the TSC-optimality is sought along with the minimization of the $\rho$-spectrum, which may yield in the relaxation of the TSC-optimality if the resulting code is catastrophic or has large $\rho$-spectrum.

Lastly we would like to mention that in the case of $K=N+2$ and $n$ odd, there is one more degree of freedom in the search, that of $\alpha_{1}, \alpha_{2}$. For example, for the case of $\mathcal{C}_{34,19}$ code, $\alpha_{1}=-\alpha_{2}$ yields a code with better $\rho$-spectrum, than if $\alpha_{1}=\alpha_{2}$; both cases though result in TSC optimal codes.
b. Underloaded Case: $K \leq n$

In [67] it was shown that the TSC-optimal codes $(K \leq n)$ of $[53,68]$ have also minimum $\rho_{\max }$. Here we will generalize their results to show that these codes have in addition optimal $\rho$-spectrum.

Assume there exists a Hadamard matrix of size $N \times N$, such that [67], $N=$ $4\left\lfloor\frac{n+2}{4}\right\rfloor$, and $N \geq K$. Then, $n \in\{N-2, N-1, N, N+1\}$.

Note that the results of this subsection are also valid for the cases where $N^{\prime} \geq$ $K \geq n\left(N^{\prime} \times N^{\prime}\right.$ the size of a Hadamard matrix), for the corresponding values of $n$ (e.g. $n \in\left\{N^{\prime}-2, N^{\prime}-1\right\}$.)

1. $n=N$.

It is obvious that if we take an orthogonal code $\mathcal{C}_{N, N}$ and remove any number of rows, then the resulting code, say $\mathcal{C}_{K, N}, K \leq N$, has still $\rho_{\max }=0$, hence
has optimal $\rho$-spectrum, i.e. $\mathcal{S}_{\rho}=\left\{\left(0,\binom{K}{2}\right)\right\}$.
2. $n=N \pm 1$.

If now, from the aforementioned $\mathcal{C}_{K, N}$ code we remove one column, or add any one arbitrary column $[46,67]$, it is easily shown from (2.18), that the resulting code $\mathcal{C}_{K, N-1}$, or $\mathcal{C}_{K, N+1}$ will have $\rho_{\max }=1 /(N-1)$ or $1 /(N+1)$ respectively (due to the missing or additional column), and so they have optimal $\rho$-spectrum, i.e. $\mathcal{S}_{\rho}=\left\{\left(\rho_{\max },\binom{K}{2}\right)\right\}$.
3. $n=N-2$.

Since by definition $N$ is a multiple of $4, n=N-2 \equiv 2(\bmod 4)$. We know that an $n \times n$ Hadamard (orthogonal) matrix exists only if $n=0(\bmod 4)$, except for the trivial cases of $n=1$, and $n=2$, for which $\mathcal{C}_{2,2}$ has optimal $\rho$-spectrum, i.e. $\mathcal{S}_{\rho}=\{(0,1)\}$. So when $n \equiv 2(\bmod 4)$, and $n>2, \rho_{\max } \neq 0$. In such a $\mathcal{C}_{K, N-2}$ code $^{5}$ (i.e. a code resulting by removing two columns of $\mathcal{C}_{K, N}$ of case 1 ), the absence of the two columns will contribute a maximum of $2 /(N-2)$ to the $\rho_{\max }(=0)$ of the $\mathcal{C}_{K, N}$. Therefore a code $\mathcal{C}_{K, N-2}$ has $\rho_{\max }=2 /(N-2)$, (see also [67]).

In [68], there is a construction of a TSC-optimal $\mathcal{C}_{K, N-2}$ code. In our words, the $\mathcal{C}_{K, N}$ code, which has resulted by removing $N-K$ rows from an $N \times$ $N$ Hadamard matrix, can be written, through possible row exchanges (row exchanges don't alter the $\rho$-spectrum of the code), in the form $\left[\mathbf{B}, \mathcal{C}_{K, N-2}\right]$, where $\mathbf{B}=\left[\mathbf{v}_{1}, \mathbf{v}_{1} ; \mathbf{v}_{2},-\mathbf{v}_{2}\right], \mathbf{v}_{1}$ a $\lfloor K / 2\rfloor$-bit all 1's vector, and $\mathbf{v}_{2}$ a $\lceil K / 2\rceil$-bit all 1's vector. Then [68], $\mathcal{C}_{K, N-2}$ is a TSC-optimal code with

$$
\begin{equation*}
\mathrm{TSC}=K+\frac{4}{n^{2}}\lfloor K / 2\rfloor(\lfloor K / 2\rfloor-1)+\frac{4}{n^{2}}\lceil K / 2\rceil(\lceil K / 2\rceil-1) \tag{6.7}
\end{equation*}
$$

[^18]Next, we will try to assess if the aforementioned $\mathcal{C}_{K, N-2}$ has optimal $\rho$-spectrum. Let the $\mathcal{C}_{K, N-2}^{\prime}$ code

$$
\begin{equation*}
\mathcal{C}^{\prime}{ }_{K, N-2}=\tilde{\mathcal{C}}_{K, N} \backslash\left\{\mathbf{c}_{1}, \mathbf{c}_{2}\right\} \tag{6.8}
\end{equation*}
$$

where $\tilde{\mathcal{C}}_{K, N}$ equals $\mathcal{C}_{K, N}$ with probably some rows exchanged, and $\mathbf{c}_{1}, \mathbf{c}_{2}$ are any two columns of $\tilde{\mathcal{C}}_{K, N}$. Let $\mathbf{D}=\left[\mathbf{c}_{1}, \mathbf{c}_{2}\right]$, a $K \times 2$ matrix having $\alpha$ rows (not necessarily consecutive) of the form $[ \pm 1, \pm 1]$, and $\beta=K-\alpha$ rows of the form $[ \pm 1, \mp 1]$. Then it is easy to show that $\mathcal{C}^{\prime}{ }_{K, N-2}(n=N-2)$ has $\rho$-spectrum

$$
\begin{equation*}
\mathcal{S}_{\rho}=\left\{(0, \alpha \beta),\left(\frac{2}{n}, \frac{1}{2} \alpha(\alpha-1)+\frac{1}{2} \beta(\beta-1)\right)\right\} . \tag{6.9}
\end{equation*}
$$

Now, we need to find the values of $\alpha$ and $\beta$ that yield optimal $\rho$-spectrum (6.9). One way is to find $\alpha$ and $\beta$ that maximize the multiplicity $N_{0}=\alpha \beta$ (since the sum of multiplicities is fixed, this implies that $N_{2 / n}$ will be minimized), such that $\alpha+\beta=K$. It can be shown that $N_{0}$ is maximized for

$$
\alpha=\left\{\begin{array}{l}
K / 2, \text { for } K \text { even },  \tag{6.10}\\
\lfloor K / 2\rfloor \text { or }\lceil K / 2\rceil, \text { for } K \text { odd. }
\end{array}\right.
$$

Hence, for these values of $\alpha(\beta=K-\alpha)$, the $\mathcal{C}^{\prime}{ }_{K, N-2}$ code (as well $\mathcal{C}_{K, N-2}$, [68]) has optimal $\rho$-spectrum in addition to be TSC-optimal $[68,67]$ (the TSC is given by (6.7) ).

## VI.1.3. Applications

In this subsection we evaluate the performance of our overloaded sequences in a synchronous CDMA system. For the sake of simplicity, we assume all users have unit power.

Consider the following discrete-time QPSK synchronous CDMA system model, with $K$ users and processing gain $P$,

$$
\begin{equation*}
\mathbf{r}=\sum_{k=1}^{K} b_{k} \mathbf{s}_{k}+\mathbf{n} \tag{6.11}
\end{equation*}
$$

where $\mathbf{r}=\left[r_{0}, r_{1}, \ldots, r_{P-1}\right]^{T}$ is the received chip vector, $b_{k}$ is the $k^{t h}$-user's QPSK symbol, $\mathbf{s}_{k}=\left[s_{0, k}, s_{1, k}, \ldots, s_{P-1, k}\right]^{T}$ the $k^{t h}$-user's signature, and $\mathbf{n}=\left[n_{0}, n_{1}, \ldots, n_{P-1}\right]^{T}$ is the noise vector, with $n_{j}$ i.i.d., zero-mean, circularly symmetric complex Gaussian random variables having variance $N_{0}$.

The signature sequences equal $\mathbf{s}_{k}=\mathbf{d}_{k} / \sqrt{P}$, where $\mathbf{d}_{k}\left(\in\{ \pm 1\}^{P}\right)$ is the $k^{t h}$ codeword of the $\mathcal{C}_{K, P}$ code. The TSC optimal $\mathcal{C}_{K, P}$ codes used, are summarized in Table VII. In the same Table we have listed also Levenshtein's bound on $\rho_{\max }$ of binary codes [41], which for the corresponding codes' parameters coincide with the Welch bound on $\rho_{\max }$ [42] which is targeted for complex codes. Hence although our codes have $\rho_{\text {max }}$ close to the bound, we believe the bound is quite loose for the corresponding codes of Table VII, except of course for the trivial case of the orthogonal code $\mathcal{C}_{256,256}$ (cf. §III.3.1).

The performance of the matched-filter (MF) receiver for various overload factors $f, f \equiv \frac{K-P}{P} 100 \%$, is given in Figure 38 for $K=256$, as the average-over-the-users bit error rate vs. the signal to noise ratio per bit.

As expected, the performance degrades severely with high overload factors. Therefore an advanced receiver is required. In Figure 39 we plot the performance of a

Table VII. TSC optimal $\mathcal{C}_{K, P}$ codes.

| $(K, P)$ | $\rho_{\max }$ | $\rho_{\max }$ bound | TSC |
| :---: | :---: | :---: | :---: |
| $(256,168)$ | 0.0833 | 0.0453 | 390.1 |
| $(256,192)$ | 0.0625 | 0.0362 | 341.3 |
| $(256,224)$ | 0.0446 | 0.0237 | 292.6 |
| $(256,240)$ | 0.0333 | 0.0162 | 273.1 |
| $(256,248)$ | 0.0323 | 0.0112 | 264.3 |
| $(256,256)$ | 0.0000 | 0.0000 | 256.0 |

5-stage ${ }^{6}$ partial Parallel Interference Canceller (PIC) [69, 70] (note that for $P=256$, orthogonal users, we employ MF receiver). We can say, based on Figure 39, that the performance of overloaded synchronous CDMA with $K=256$ users and partial PIC is acceptable for even $50 \%$ overload.

Since in practice the AWGN channel appears in cellular systems very rarely, e.g. when you are very close to the base station, we evaluate the performance of the codes of Table VII over wireless channels also, like the Pedestrian A (PedA), and Vehicular A (VehA) channels [71], for which we assume block fading. We assume also a chip rate of 1.2288 Mcps , which makes PedA and VehA channels, 2-path and 5-path channels respectively, and perfect channel estimation. In addition, we incorporate to our simulation model quadrature spreading (prior to transmission of the sum chip signal) similar to that of an existing 3G CDMA wireless standard [72, §9.3.1.3.4].

The simulation results for various loads and for the PedA channel, are shown in Figure 40, where we see that in $33 \%$ and $50 \%$ overload we are away about 1.9 dB

[^19]

Fig. 38. Matched filter receiver; $K=256$ over AWGN.


Fig. 39. 5-stage partial PIC; $K=256$ over AWGN.
and 5.2 dB (at $5 \%$ BER) respectively from the orthogonal codes $(P=256)$, while dramatically increasing system capacity. On the other hand for the difficult VehA channel (since it has more paths, the increased multipath-multiuser interference becomes severe for the overloaded sequences), it seems from Figure 41, that up to $33 \%$ overloaded system is acceptable with the current receiver.

In Figures 40-41 we have also included the performance of a Rake receiver. Therefore comparing to the Rake performance, we can claim that we can achieve same performance while enhancing system capacity by $33 \%$, but at the same time, we have to pay in higher receiver complexity.

We believe that with receivers which take into account the known $\rho$-spectrum of our spreading sequences, better performance can be achieved, but this is out of the scope of this dissertation.

Finally, since multipath transmission seems to limit the overload factor in synchronous CDMA, an alternative application is the deployment of our overloaded codes in a suitably designed multi-carrier CDMA (MC-CDMA) system (e.g. a system with DS-CDMA followed by OFDM modulation), since there the received signal is affected only by flat Rayleigh fading and noise [73].


Fig. 40. 5-stage partial PIC; $K=256$ over PedA channel (block fading).


Fig. 41. 5-stage partial PIC; $K=256$ over VehA channel (block fading).

## VI.2. Complex Block Code Search for Maximizing Sum Capacity

The maximization of the sum capacity for synchronous CDMA (S-CDMA) with equal average input energy constraints is achieved when $\mathcal{C}_{M, n}$ codes (of cardinality $M$, codeword length $n$ and norm $\sqrt{n}$ ) that satisfy

$$
\begin{equation*}
\mathcal{C}_{M, n}^{H} \mathcal{C}_{M, n}=M \mathbf{I}_{n} \tag{6.12}
\end{equation*}
$$

are employed $\left(\mathcal{C}^{H}\right.$ is the complex conjugate transpose of $\mathcal{C}$, and $\mathbf{I}_{n}$ is the identity matrix of size $n \times n$ ), [61]. It has been shown in [63] that sequences that satisfy (6.12) achieve Welch's lower bound on total square correlation (TSC) with equality. We will call the codes that satisfy (6.12), "max-SC" codes ${ }^{7}$.

Although max-SC codes maximize the sum-capacity of S-CDMA, they do not necessarily have low cross-correlation spectrum. In fact, with a max-SC code it is possible that two users are assigned the same spreading sequence (see e.g. [61]). Clearly, in this case these two users will experience high error probability with a conventional receiver [64, §3.4].

In S-CDMA, the real interest is on overloaded codes, i.e. codes with $M>n$, since it is intended that the complete synchronization will help the system accommodate more users than the asynchronous one [63].

In this subsection we review the design methodology of $\S$ IV. 2 , for overloaded complex block codes (alternatively, sequence sets) satisfying (6.12), but also having low cross-correlation spectrum.

[^20]VI.2.1. Max-SC Block Codes with Low Cross-correlation Spectrum

Given a $\mathcal{C}_{M, M}$ block code satisfying (6.12) with elements of absolute value 1 , one can easily get a max-SC code $\mathcal{C}_{M, n}$ (of length $n<M$ ) by simply selecting $n$ columns of the $\mathcal{C}_{M, M}$ code, see for example [53]. However in such a code construction, the cross-correlation between certain codewords may be high, which is not desired for S-CDMA, especially since suboptimum receivers are used in general.

To obtain a max-SC $\mathcal{C}_{M, n}$ code (having low cross-correlation spectrum) from a max-SC $\mathcal{C}_{M, M}$ code, we select the $n$ columns either by a full over-the-columns search (§IV.3.1), or if the full search is not feasible due to the required complexity, by a nested search as described in §IV.2, where the search criterion is the minimization of the cross-correlation spectrum ( $\rho$-spectrum). Note that $\mathcal{C}_{M, M}$ block codes satisfying (6.12) with elements of absolute value 1, are the codes given in §III.4.2.

Therefore the codes of §V.1.2 given in Figures 15-21 are max-SC codes, while in addition, they exhibit low cross-correlation spectrum.

Finally, in [74] there exists a design of complex max-SC codes of cardinality $M$ and length $M-1$. Using our methodology, max-SC codes of cardinality $M$ and length $M-1$ can be obtained by simply removing any column from a max-SC $\mathcal{C}_{M, M}$ code of $\S$ III.4.2, see also [46]. In addition such codes have optimal $\rho$-spectrum, equal to $\mathcal{S}_{\rho}^{*}=\left\{\left(\frac{1}{M-1},\binom{M}{2}\right)\right\} .{ }^{8}$

## VI.3. Bandwidth Efficient Synchronous Multiple-access

The time-division, code-division, orthogonal frequency-division synchronous multipleaccess schemes were and are (mainly) based on orthogonal (unitary) transformations of the multi-user signal, in order to facilitate the received signal equalization. The

[^21]unitary transformation has the disadvantage that it is not bandwidth efficient. One can transmit the same amount of information using a non-unitary transformation (multiple-access code) at a significantly reduced bandwidth, but at the expense of higher receiver complexity for reliable communication.

The design criterion of this non-unitary transformation, is simply the crosscorrelation spectrum (since we will assume receivers whose performance depends on the cross-correlation) of the underlying transformation, which is actually a block code. The low cross-correlation spectrum ( $\rho$-spectrum) [46] of the multiple-access block code, will result to small multi-user interference hence improved performance.

In the previous Chapters we designed block codes of length less than the cardinality (bandwidth-efficient), with low cross-correlation spectrum. In this subsection we consider the block codes of $\S \mathrm{V} .1 .2$ as non-unitary transformations for the multiuser signal, and evaluate the performance of the corresponding multiple-access scheme through simulations. We also compare the bandwidth efficiency and the performance of our proposed generic multiple-access scheme (using our bandwidth-efficient block codes), with the conventional multiple-access schemes over the AWGN and Rayleigh faded multipath channels.

Other approaches towards bandwidth efficiency for multiple access channels can be found in the literature, based on capacity, quality-of-service and power criteria (see for example [75] and references therein).

## VI.3.1. Signal Model and Code Design

Let's consider Figure 42, where $\mathbf{b}$ is the $K$ users' multiuser symbols vector ${ }^{9}$ and $\mathcal{C}_{K, P}$ is the $K \times P$ multiple-access matrix (code). The multiple-access signal $\mathbf{z}$ is then given

[^22]

Fig. 42. Generic multiple-access transmitter.
by

$$
\begin{equation*}
\mathbf{z}=\mathcal{C}_{K, P}^{T} \mathbf{b} \tag{6.13}
\end{equation*}
$$

where $(\cdot)^{T}$ means matrix transpose, and there is also a block adding some guard period (if needed) to the signal $\mathbf{z}$. The transmitted symbol $\mathbf{s}$ is $(P+D)$ chips long (see Fig. 42). The guard period is simply needed to eliminate or reduce the intersymbol interference (ISI), so that a simpler receiver may be used.

It can be easily seen that the model of Fig. 42, fits all the multiple-access schemes that are based on linear transformation of $\mathbf{b}$. For example, when $P=K$ and $\mathcal{C}_{K, P}$ is the identity matrix, the scheme is TDMA; when $P=K, \mathcal{C}_{K, P}$ is the IDFT matrix, and the guard period is a cyclic prefix (preferably of length $D \geq L$ where $L$ the memory of the channel), the scheme is cyclic-prefix OFDM (CP-OFDM). If in the latter case the guard period is all zeros, the scheme is the zero-padded OFDM (ZP-OFDM), e.g. [76]. If $D=0$ and $\mathcal{C}_{K, P}$ is a binary matrix, the scheme is classical synchronous direct-sequence CDMA (DS-CDMA), for applicable $K$ and $P$. By letting in the latter case an all-zero guard period, the scheme is the CDM (code-division multiplexing), [77].

Towards the unification of the multiple-access schemes one may see OFDM (from the transmitter's perspective) not as a multicarrier system, but simply as CDMA where the spreading codes are from the $K$-PSK alphabet, while for the conventional

CDMA the spreading codes are BPSK modulated.
From the discussion in this section we conclude that we can indeed unify the multiple-access schemes, which degenerate to the generic multiple-access scheme of Fig. 42.

The main problem is the design of the multiple-access matrix (code) $\mathcal{C}_{K, P}$, such that the system is bandwidth-efficient $(K>P)$, and the received signal can be equalized with manageable complexity, for which our solution are the block codes of $\S \mathrm{V} .1 .2$.

We will fix throughout this subsection the maximum number of users to be $M=64$, and the $Q$-ary PSK codes (different processing gain $P$ ) to be used, will be the ones depicted in Figure 18.

## VI.3.2. Simulation Results

In this subsection, we evaluate the performance of the codes obtained by the nested search (Figure 18) when used as the multiple-access matrix (code) of our generic multiple-access scheme. The performance evaluation will be based on the simulated bit-error rate of the multiuser signal (QPSK modulated), and comparisons will be made with the conventional OFDM, CDMA and TDMA multiple-access schemes.

It is known (see also §VI.3.1) that TDMA can be considered as CDMA. We showed that the same is true also for OFDM. Therefore, we believe the generic multiple-access scheme (see Fig. 42) shall be still referred to as CDMA, with the difference that the code will not be binary but $Q$-ary (here we deal only with a $Q$-ary PSK code alphabet). Also, the processing gain shall be smaller than the length of the multiuser symbols vector $\mathbf{b}$ to improve bandwidth efficiency.

We measure bandwidth efficiency by the overload factor $f$,

$$
\begin{equation*}
f \equiv \frac{M-P}{P} 100 \% \tag{6.14}
\end{equation*}
$$

Table VIII. 5-path multipath channel

| Tap | Delay | Power |
| :---: | :---: | :---: |
| 1 | 0 | 0.75 |
| 2 | $T_{c}$ | 0.20 |
| 3 | $2 T_{c}$ | 0.02 |
| 4 | $3 T_{c}$ | 0.02 |
| 5 | $4 T_{c}$ | 0.01 |

where $M=64$ is the maximum number of users that can be served by the multipleaccess system and $P$ is the processing gain. We disregard from this factor the extra guard period added (see Figure 42), since one may compensate for that at the expense of receiver complexity.

The simulations have been performed over the AWGN and 5-path Rayleigh blockfaded ${ }^{10}$ channels. The power-delay profile of the multipath channel is shown in Table VIII, where $T_{c}$ denotes the chip period.

Since we deal with channel delay-spread up to $4 T_{c}$, we have set the guard period constant to $D=4$ chips (see Figure 42), although we do not need it for the AWGN channel case.

We have chosen to simulate cases with overload factors of $0 \%$ i.e. conventional multiple-access schemes, $14.3 \%$ and $33.3 \%$. The cross-correlation spectra, last spectrum line ( $\rho_{\max }, N_{\rho_{\max }}$ ), of the codes found with the nested search for the corresponding overload factors and for arbitrarily chosen (except for the conventional multipleaccess schemes) $Q$-ary alphabet are shown in Table IX. We observe also, as expected,

[^23]Table IX. Cross-correlation spectrum and correlation properties of the multiple-access codes

| Multiple-Access <br> Scheme | $f(\%)$ | $M$ | $P$ | $Q$ | $\rho_{\text {max }}$ | $N_{\rho_{\text {max }}}$ | $R_{C C}$ | $R_{A C}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| TDMA | 0 | 64 | 64 | - | 0 | 2016 | 0.000244 | 0 |
| CP-OFDM | 0 | 64 | 64 | 64 | 0 | 2016 | 0.338542 | 41.671875 |
| CDMA | 0 | 64 | 64 | 2 | 0 | 2016 | 0.985119 | 0.937500 |
| CDMA | 14.3 | 64 | 56 | 32 | 0.074386 | 64 | 0.984006 | 1.007653 |
| CDMA | 33.3 | 64 | 48 | 32 | 0.112673 | 64 | 0.984430 | 0.980903 |
| CDMA | 33.3 | 64 | 48 | 2 | 0.125000 | 256 | 0.985119 | 0.937500 |

that the higher the overload factor, the higher the $\rho_{\max }$, and also for the corresponding code parameters, by changing the code's alphabet from BPSK to 32-PSK we get a code with lower $\rho_{\text {max }}$.

Since the correlations at non-zero lag (of the multiple-access matrix rows) are important in the multipath transmission, we followed a similar to CDMA systems approach to improve them. That is, we multiply the columns of the multiple-access code (except the codes of TDMA, CP-OFDM and ZP-OFDM) by an m-sequence, or part of it [78]. No further attempt was made to improve the correlation properties of the code, and the interested reader may consult for example [79].

In more detail, we chose to use the m-sequence resulting from the primitive polynomial 1038 (in octal) [66]. Since, however, this m-sequence is of length 63 , we will place a $0(-1)$ at the front to make it of length $P=64$, and we will truncate it at the end when the corresponding multiple-access code has $P<63$.

The correlation properties ( $R_{C C}$ and $R_{A C}$ ) of the corresponding codes, resulting by multiplying their columns with the aforementioned sequence (where applicable),
are given also in Table IX. $R_{C C}$ and $R_{A C}$ are the average mean square values of the aperiodic cross-correlation and auto-correlation functions [65] respectively, and they were proposed in [80] to evaluate the performance of the code as a whole for the case of asynchronous DS-CDMA though. Unfortunately we are not aware of any performance measure of a multiple-access code over multipath fading channels.

In Figure 43 we plot the comparative performance (uncoded average over the users' bit-error rates) of the fully-loaded generic multiple-access scheme ${ }^{11}$ for various code dimensions, including the conventional multiple-access schemes.

At the receiver, we employ a simple DFT for the CP-OFDM [81], and a partialPIC (parallel interference canceller), [69, 70, 82], as well as a Bayesian linear minimum mean square error (LMMSE) estimator [83, p. 389]. For the case of TDMA and CDMA (with $P=64$ ) a matched-filter is used over the AWGN channel.

The purpose of this subsection is not to evaluate receivers' performance, rather to show the bandwidth efficiency that can be achieved using the proposed scheme with acceptable performance. The use of the receivers was done in a way that the comparison between different multiple-access schemes, and bandwidth efficiencies is as fair as possible.

We observe that performance deteriorates rapidly (as expected) with increasing overload factor $f$. Increasing the overload factor say for fixed $M$ has as effect that the code length $P$ is decreasing. This in turn results in higher $\rho_{\max }$, as well as higher auto-correlation at non-zero lag [66], which factors deteriorate the system's performance with correlation-based receivers. We believe however that with more advanced receivers (iterative, for example [77]), or receivers associated with iterative decoding and equalization [84], larger overload factors maybe employed with acceptable per-

[^24]
(b) 5-path Rayleigh block-faded channel.

Fig. 43. $(M=) K=64$ number of users (QPSK-modulated), processing gain $P, Q$-ary code alphabet.
formance.
The cross-correlation spectrum $\left(\rho_{\max }, N_{\rho_{\max }}\right)$ is an important factor in determining performance, and of course more important in the AWGN channel (single-path channels), due to perfect synchronization. Note the degradation, cf. Fig. 43(a), for the cases of CDMA with processing gain $P=48$, by changing the code's alphabet from $Q=32$ to $Q=2$ (cf. Table IX).

The bad performance of the CP-OFDM (in multipath conditions) as compared to the conventional CDMA and TDMA may be explained from the poor auto-correlation properties of the IDFT matrix, cf. Table IX (even the overloaded CDMA, $P=56$, outperforms it). To this consents also the performance of the ZP-OFDM, see Fig. 43(b), which is comparable to the CP-OFDM although we use a Bayesian LMMSE receiver (as opposed to the simple DFT-based receiver of CP-OFDM). We believe that the comparison will be in favor of the CDMA with less processing gain (increased bandwidth efficiency), as better receivers are employed.

One way to improve the CDMA performance over single-path channels for a given overload factor $f$, is to increase proportionally the dimensions of the multiple-access code, cf. (6.14), i.e.

$$
\begin{equation*}
P=\frac{1}{1+\frac{f}{100}} M \tag{6.15}
\end{equation*}
$$

since in general the cross-correlation spectrum is better (lower) for larger $(M, P)$. For example let the multiple access code have parameters $(M, P)=(256,192)$ and $Q=32$. Obviously $f=33.3 \%$. We performed the forward nested search, cf. §V.1.2, with those parameters and the resulting code had cross-correlation spectrum

$$
\begin{equation*}
\left(\rho_{\max }, N_{\rho_{\max }}\right)=(0.054754,256) . \tag{6.16}
\end{equation*}
$$

We observe that the $\rho_{\max }$ of this code is less than half of the code with $(M, P)$

(b) 5-path Rayleigh block-faded channel.

Fig. 44. Performance comparison for different $M=K ; f=33.3 \%$.
$=(64,48)$ and $Q=32$ (see Table IX), and as such we expect better performance. To improve also further the correlation properties (for the multipath transmission) we multiplied each column of the code with part of the m-sequence resulting from the primitive polynomial 4358 (in octal) [66].

The performance comparison of the new code is shown in Fig. 44, where we see that in the AWGN channel it indeed outperforms the code with lower $M(=K)$, while keeping the same overload factor, but for the multipath channel, there is no obvious improvement.

We must mention that the codes presented in this Section were designed primarily for synchronous channels (e.g. AWGN), and to make them suitable for multipath transmission, we multiplied their columns, as explained, by a bit of a modified msequence. Therefore we didn't expect the relative performance of the codes over the multipath channel to be similar over the AWGN channel. However the performance over the multipath channel is promising, and we believe with the use of more advanced receivers the gap may be closed.

## CHAPTER VII

## ASYMPTOTICALLY OPTIMUM RATE $1 / N$ CONVOLUTIONAL CODES FOR A GIVEN CONSTRAINT LENGTH*

Previous efforts to search for good convolutional codes were based on maximizing the free-distance and minimizing the spectral lines of the distance spectrum for a given code rate and constraint length. This led to optimum distance spectrum (ODS) codes $[19,20,21]$. There are applications, however, for which the code rate is not uniquely dictated by the system, and there is some flexibility in choosing it. An example of this are CDMA-based systems (such as the IS-95 standard) where a convolutional code is followed by spreading (a repetition code) to expand the bandwidth to what is available. In these systems we phase the question of how much coding (i.e. code-rate) and how much spreading to use for a given bandwidth. That is, we need to answer the question: Given a constraint-length, what is the best code we can use, or, in other words, what is the lowest code-rate to use over which no (or insignificant) coding gain is possible. This problem was first mentioned in [19].

Given the fact that at low rates an exhaustive search for good codes is not possible, we must find a way to limit the search to a set where the codes would yield best performance. As a performance measure we will use the maximum asymptotic coding gain, defined as

$$
\begin{equation*}
\gamma_{\max }(K)=\max _{R} \underbrace{d_{\text {free }}(R, K) \cdot R}_{\gamma_{\text {free }}(R, K)}, \tag{7.1}
\end{equation*}
$$

[^25]where $R$ is the code-rate and $d_{\text {free }}(R, K)$ is the free-distance of the code which is a function of the code-rate $R$ and constraint-length $K$. The maximum asymptotic coding gain is a more meaningful measure of performance than the maximum free distance (MFD) as it accounts for the rate loss. Additionally, a $\gamma_{\max }$-code is an MFD code, but the reverse is not necessarily true.

In this Chapter we focus on rate $R=1 / n, n=2,3, \cdots$ codes and, to simplify notation, will suppress the dependence of $\gamma_{\max }$ on $K$. We will refer to the set of codes that achieve maximum asymptotic coding gain (there are countably infinite solutions to (7.1)) as the $\gamma_{\max }$-code set. The search for optimum codes can thus be limited to the $\gamma_{\max }$-code set, and in particular a subset of it corresponding to the lowest code-rates possible for a system.
VII.1. The $\gamma_{\text {max }}$-Code Set

We use the improved Heller bound $[15,17]$, to upper-bound the $d_{f r e e}$ of an $(n, 1, K)$ convolutional code, where $n=1 / R$ is the inverse rate, and $K$ the constraint length of the code. Let $d_{h}$ be the Heller bound

$$
\begin{equation*}
d_{h}=\min _{\delta \geq 1}\left\lfloor\frac{2^{\delta-1}}{2^{\delta}-1}(K+\delta-1) n\right\rfloor \tag{7.2}
\end{equation*}
$$

and suppose it is achieved for $\delta=\beta$. Define

$$
\begin{equation*}
\alpha=\frac{2^{\beta-1}}{2^{\beta}-1}\left(n(K+\beta-1)-1+2^{1-\beta}\right) \tag{7.3}
\end{equation*}
$$

Then the improved Heller bound is

$$
d_{h}^{i} \leq \begin{cases}d_{h}, & \text { if } d_{h} \text { is even }  \tag{7.4}\\ d_{h}-1, & \text { if } d_{h} \text { is odd, and } d_{h}>\alpha\end{cases}
$$

Figure 45 depicts the asymptotic coding, gain $\gamma_{\text {free }}(R, K)$, vs. $n=1 / R$. We


Fig. 45. $\gamma_{\text {free }}$ for various constraint lengths $K$
observe there is no significant gain by lowering the rate of a convolutional code; in fact, lowering the code-rate may degrade performance. As an example, Figure 46 plots the $K=9$ case alone. Even though as $n \rightarrow \infty$ all the codes converge to $\gamma_{\max }$, $\gamma_{\max }$ is in fact first achieved at $n=7$ and at multiples of seven thereafter.

Table X shows the achieved maximum asymptotic coding gains $\gamma_{\max }$ and the code rates that achieve them for constraint lengths from 3 to 12 . Because of the quick convergence to the asymptotic coding gains, optimum performance does not require very low rate codes. From the above results, we see that it suffices to search over the code rates given in Table X to extract the maximum asymptotic performance for a given constraint length.


Fig. 46. $\gamma_{\text {free }}$ for $K=9$.

Note that this analysis was derived using the improved Heller bound, which is an upper bound on the free-distance. It has been found that this bound is tight at small constraint lengths, $[17,85]$. In [85] the authors designed low-rate codes $(4 \leq n \leq 512)$ using a nested search for constraint lengths 7 through 11, and they found that all of their codes achieve the improved Heller bound. However it seems that for $n=2$ we can't achieve the Heller bound for all constraint lengths (see for example [21]).

## VII.2. Some Practical Considerations

The above analysis was based on asymptotic coding gains, which are achieved at high SNRs. If we need to find a good code for some specific application, e.g. one requiring

Table X. Asymptotically optimum convolutional codes

| $K$ | $\gamma_{\max }$ | Rates for $\gamma_{\max }$-code set |
| :---: | :---: | :---: |
| 3 | 2.6667 | $R=1 / 3 i, \quad i=1,2, \cdots$ |
| 4 | 3.3333 | $R=1 / 3 i, \quad i=1,2, \cdots$ |
| 5 | 4.0000 | $R=1 / i, \quad i=2,3, \cdots$ |
| 6 | 4.5714 | $R=1 / 7 i, \quad i=1,2, \cdots$ |
| 7 | 5.1429 | $R=1 / 7 i, \quad i=1,2, \cdots$ |
| 8 | 5.7143 | $R=1 / 7 i, \quad i=1,2, \cdots$ |
| 9 | 6.2857 | $R=1 / 7 i, \quad i=1,2, \cdots$ |
| 10 | 6.8571 | $R=1 / 7 i, \quad i=1,2, \cdots$ |
| 11 | 7.4286 | $R=1 / 7 i, \quad i=1,2, \cdots$ |
| 12 | 8.0000 | $R=1 / i, \quad i=2,3, \cdots$ |

a BER of only $10^{-3}$, then we might have to search for a near- $\gamma_{\max }$ code, if the first bit multiplicities of the $\gamma_{\max }$ code are very large, see [18]. In other words the criterion of optimality won't be the optimum $\gamma$-spectrum, but the minimization of the required SNR for a given BER.

The numerical results in Table X indicate that by starting with a $\gamma_{\max }$ code we can obtain $\gamma_{\max }$ codes of multiple rates by simply repeating all the generator polynomials of the parent code. This is a rare case, where repetitions of MFD codes lead to MFD codes [52]. For example, let the constraint length be $K=9$, and start with a rate $R=1 / 7 \gamma_{\max }$ code. Then by repetition we can get $\gamma_{\max }$ codes of rates $1 / 14,1 / 28$, etc. This is because by repeating all the generator polynomials $\alpha(\alpha>1)$ times, we multiply both the free distance and the inverse rate of the parent code by $\alpha$, so that the asymptotic coding gain remains the same. This type of repetition doesn't

Table XI. Other low-rate convolutional codes

|  | $\gamma_{\max }$ | $n$ |
| :--- | :---: | :---: |
| orthogonal | $K / 2$ | $2^{K}$ |
| superorthogonal | $K / 2+1$ | $2^{K-2}$ |

affect the multiplicity of the first spectral line, but it shifts the other multiplicities, resulting in a spectrally thinned code that can perform better at low SNR's, despite the fact that its asymptotic coding gain is the same as higher-rate codes.

## VII.3. Application to CDMA

This analysis can find applications to schemes where we have the freedom to choose the code rate arbitrarily, but we are complexity constrained to a fixed constraintlength [19], such as in CDMA systems.

In previous work, the classes of orthogonal and superorthogonal codes [86] were proposed as low-rate coding schemes for CDMA systems. The characteristics of these codes are shown in Table XI.

In Figure 47 we plot the asymptotic coding gains versus $K$ for the codes considered in this paper. We can see that the use of orthogonal or superorthogonal codes is not as good a choice, since conventional convolutional codes outperform them while also using higher rates. Another disadvantage of the orthogonal-like codes is that they exist for only a few practical rates, as can be seen from Table XI.

In [85] the authors proposed low-rate MFD convolutional codes for CDMA systems and found they outperform both the previous low-rate coding schemes with orthogonal-like codes $[86,87]$ and the conventional DS-CDMA schemes. These codes were found by a nested search using the optimum distance spectrum criterion. The


Fig. 47. $\gamma_{\max }$ vs. $K$.
work in [85] has a larger scope than ours, and otherwise differs from ours in that we focus on maximum asymptotic coding gain instead of maximum free distance.

From the analysis in this Chapter, it seems that there is no significant gain using very low-rate convolutional codes, as opposed to using higher rate codes. For example, if we need to have $N$ times bandwidth expansion, it wouldn't be appropriate to use a rate $1 / N$ convolutional code, since we could use a higher rate $\gamma_{\max }$ code, say of rate $1 / n, n<N$, and achieve roughly the same performance with respect to asymptotic coding gain. Therefore the rest of the spreading $N / n$, could be made up by some spreading sequence, or some other coding scheme in a serial concatenated fashion. Hence we can obtain at least the same performance compared to a scheme that uses
a single very low-rate convolutional code, while reducing system complexity.
In summary, in this Chapter, we presented results that show the rates that achieve maximum asymptotic performance for a fixed constraint length are periodic, and that there are high-rate codes that outperform lower rate codes of the same constraint length. We also showed how this analysis can be applied to CDMA systems in order to improve performance and reduce complexity in the overall system.

The results can be summarized as follows:

- The maximum asymptotic performance of convolutional codes can be achieved with rates up to $R \approx 1 / 7$ for constraint lengths up to 12 .
- The use of very low-rate convolutional codes in CDMA (code-spread CDMA) may not be most efficient in terms of performance and complexity.


## CHAPTER VIII

## CONCLUSIONS

In this dissertation, a code design methodology based on the optimization of the metric spectrum for a specific communication problem was derived. Further, applications of the codes found were demonstrated in various multiple-access scenarios. In addition, we introduced asymptotically optimum convolutional codes for a given constraint length, to reduce the convolutional code search size for a specific asymptotic performance.

The main results of the dissertation are summarized below:

1. Low complexity nested search methods were derived to get good block codes for any channel.
2. New unitary matrices were developed for use with the new nested search methods.
3. Good block codes can be obtained by looking at the columns of a Hadamard or a special unitary matrix.
4. New block codes were designed for the noncoherent and coherent fading channels as well as the AWGN channel.
5. Comparison to metric bounds and previous codes revealed the optimality or near optimality of the new block codes.
6. Linear codes can be optimal or at least meeting the metric bounds.
7. Pilot based codes may not be suboptimal; in fact there are pilot based codes achieving the metric bound.
8. Bandwidth efficient block codes for use in the synchronous multiple-access channels were derived having low crosscorrelations.
9. Asymptotically optimal convolutional codes for a given constraint length were introduced.

Analytically, low complexity nested search methods were derived, starting from simple search approaches, where the optimization of the metric spectrum is sought in each iteration. The nested search methods are based on existing and newly derived unitary matrices.

By appropriately matching the metric spectrum to the specific communication problem, new codes for a variety of channel conditions were derived, including AWGN and fading channels. Extensive comparisons to metric bounds revealed that the designed codes are either optimal or close to optimal, in addition to the fact that the majority of the codes found is almost impossible to be found with conventional search/design techniques due to complexity. Moreover the nested nature of our new codes make them ideal for progressive transmission.

The newly designed block codes were applied also to the synchronous multipleaccess communications, and in addition the design was modified, where needed, to fit the specific design parameters, such as sum capacity, and bandwidth efficiency. Extensive comparisons and simulations to existing codes, revealed the efficiency of the new multiple-access codes.

We believe that better codes can be found (than the ones presented) using our methodology, but putting a large effort in the nested search programming. In addition, the research and design of other orthogonal/unitary matrices such that they produce best codes when used in our search methods is a promising research direction.

Finally, we proposed asymptotically optimum convolutional codes assuming con-
stant constraint length, so as to evaluate the very low rate convolutional codes. The results revealed that someone need not search for low rate codes to achieve a specific asymptotic performance, since higher rate codes may achieve it. This result finds applications, among others, in reducing the code search size as well in showing that modern cdma systems need not apply high rate convolutional codes to improve system performance.

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## APPENDIX A

## PROOF OF THE PAIRWISE ERROR PROBABILITY (2.16)

The log-likelihood of the problem can be shown to be, cf. (2.15),

$$
\begin{equation*}
\ell(\mathbf{d})=\left|\mathbf{r}^{H} \mathbf{d}\right|^{2} \tag{A.1}
\end{equation*}
$$

Supposing the $q^{\text {th }}$ codeword $\mathbf{d}_{q}$ was transmitted, the pairwise error probability is the probability that the detector will choose say the $\mathbf{d}_{m}$ codeword (for some $m$ ). Therefore

$$
\begin{align*}
P_{2}^{w} & =P\left(\ell\left(\mathbf{d}_{q}\right)<\ell\left(\mathbf{d}_{m}\right) \mid \mathbf{d}_{q} \text { transmitted }\right) \\
& =P(\underbrace{\left|\mathbf{r}^{H} \mathbf{d}_{q}\right|^{2}-\left|\mathbf{r}^{H} \mathbf{d}_{m}\right|^{2}}_{D}<0 \mid \mathbf{d}_{q} \text { transmitted }) \tag{A.2}
\end{align*}
$$

which is a solved problem [4, Appendix B], although in a more general form,

$$
\begin{equation*}
P_{2}^{w}=Q_{1}(a, b)-\frac{v_{2} / v_{1}}{1+v_{2} / v_{1}} I_{0}(a b) \exp \left[-\frac{1}{2}\left(a^{2}+b^{2}\right)\right] \tag{A.3}
\end{equation*}
$$

where [4]

$$
\begin{equation*}
Q_{1}(a, b)=\int_{b}^{\infty} x \exp \left[-\frac{1}{2}\left(x^{2}+a^{2}\right)\right] I_{0}(a x) d x \tag{A.4}
\end{equation*}
$$

and

$$
\begin{equation*}
I_{0}(x)=\sum_{k=0}^{\infty} \frac{(x / 2)^{2 k}}{(k!)^{2}}, \quad x \geq 0 . \tag{A.5}
\end{equation*}
$$

In our case, it can be shown [4, Appendix B] that

$$
\begin{align*}
& v_{1}=\sqrt{\frac{E_{s}^{2} F\left(1-\rho^{2}\right)+1}{F\left(1-\rho^{2}\right)}}-E_{s},  \tag{A.6}\\
& v_{2}=\sqrt{\frac{E_{s}^{2} F\left(1-\rho^{2}\right)+1}{F\left(1-\rho^{2}\right)}}+E_{s}, \tag{A.7}
\end{align*}
$$

and

$$
\begin{equation*}
a=b=0 \tag{A.8}
\end{equation*}
$$

where $F=n^{2} \sigma^{4}\left(n \frac{\sigma_{\alpha}^{2}}{\sigma^{2}} E_{s}+1\right)$.
Now, from (A.3) after simple calculations, we get (2.16).

## APPENDIX B

## COLUMN EQUIVALENCE BETWEEN LINEAR HADAMARD AND BLOCK CODES

Recall that a linear $(n, k)$ binary block code $\mathcal{C}$ is the set of all $M=2^{k}$ possible codewords generated by the corresponding $k \times n$ generator matrix G, i.e.

$$
\begin{equation*}
\mathcal{C}=\left\{\mathbf{c}_{0}, \mathbf{c}_{1}, \ldots, \mathbf{c}_{M-1}\right\} \tag{B.1}
\end{equation*}
$$

where each codeword $\mathbf{c}_{i}=\left[c_{i, 0}, c_{i, 1}, \ldots, c_{i, n-1}\right]$ is produced by the corresponding information $k$-tuple $\mathbf{m}_{i}=\left[m_{i, 0}, m_{i, 1}, \ldots, m_{i, k-1}\right]$, i.e.

$$
\begin{equation*}
\mathbf{c}_{i}=\mathbf{m}_{i} \mathbf{G} . \tag{B.2}
\end{equation*}
$$

Each column of the generator matrix $\mathbf{G}$ can take one of $M$ possible values. Conventionally we also let the $k$-tuple $\mathbf{m}_{i}$ to equal to the binary representation of $i$, $i=0,1, \ldots, M-1$.

If we rewrite the code $\mathcal{C}$ as an $M \times n$ matrix, where each codeword is a row of the matrix, i.e.

$$
\mathcal{C}=\left(\begin{array}{c}
\mathbf{c}_{0}  \tag{B.3}\\
\mathbf{c}_{1} \\
\vdots \\
\mathbf{c}_{M-1}
\end{array}\right),
$$

then the element $c_{i, j}$ of the code matrix $\mathcal{C}$ is given by

$$
\begin{equation*}
c_{i, j}=\mathbf{m}_{i} \mathbf{g}_{j}^{(q)}=\sum_{t=0}^{k-1} m_{i, t} g_{t, j}^{(q)} \tag{B.4}
\end{equation*}
$$

where $\mathbf{g}_{j}^{(q)}$ is the $j^{\text {th }}$ column of $\mathbf{G}, j=0,1, \ldots n-1$, and the supscript $(q)$ means that the corresponding column is the binary representation of an integer $q \in[0, M-1]$. The summation in (B.4) is in modulo- 2 arithmetic.

Now the inverse Hadamard kernel [88, $\S 3.5 .2]$ is given by the following relationship

$$
\begin{equation*}
h_{M}[i, q]=(-1)^{\sum_{t=0}^{k-1} b_{t}(i) b_{t}(q)} \tag{B.5}
\end{equation*}
$$

where $b_{t}(i)$ is the $t^{t h}$ bit in the binary representation of $i$. Note that $h_{M}[i, q]$ are the elements of the Hadamard matrix of size $M \times M$ resulted through the Sylvester construction $[88,1]$.

It is easily verified that,

$$
\begin{equation*}
c_{i, j}=\overline{\left(h_{M}[i, q]+1\right) / 2} \tag{B.6}
\end{equation*}
$$

where $\bar{x}$ is the complement of $x$.
Therefore $c_{i, j}$, cf. (B.4), (B.6), is the $(i, q)^{\text {th }}$ element of the linear binary $(0,1)$ Hadamard matrix of size $M \times M$ (resulted through the Sylvester construction by replacing the negative with complement), with upper-left corner element equal to 0 . Therefore (3.24) follows by setting $\mathbf{G}=\mathbf{m}^{T}$ in (B.2), cf. (B.6). So the columns of any $(n, k)$ linear code matrix $\mathcal{C}$ are columns of the $M \times M$ linear Hadamard matrix $\mathcal{H}_{M}(3.24)$.

Another important property of $\mathcal{H}_{M}$ is that it contains the $k=\log _{2} M$ systematic columns. This is easily seen by the fact that the generator matrix of $\mathcal{H}_{M}, \mathbf{G}=\mathbf{m}^{T}$ contains, by construction of $\mathbf{m}(2.4)$, all possible binary columns of length $k$, hence it contains the columns of the identity matrix $\mathbf{I}_{k}$.

Assuming the construction (2.4) of $\mathbf{m}$, it can be easily seen that the systematic
columns in $\mathcal{H}_{M}$ are the columns $2^{k-1}, 2^{k-2}, \ldots, 2,1$ (counting starts from 0 ).

## APPENDIX C

## PROOF OF THE UNITARITY OF MATRIX $\mathcal{I}_{M}$

Recall the $M \times M \mathcal{I}_{M}$ matrix $\left(M=Q^{k}\right)$, cf. $\S$ III.4.2

$$
\begin{equation*}
\mathcal{I}_{M} \equiv \mathcal{I}_{Q^{k}}=\Psi\left(\mathbf{m m}^{T}\right) \tag{C.1}
\end{equation*}
$$

where $\mathbf{m}$ is an $M \times k$ matrix containing all the possible $M$ combinations of $k Q$-ary elements as its rows,

$$
\mathbf{m}=\left(\begin{array}{ccccc}
0 & 0 & \cdots & 0 & 0  \tag{C.2}\\
0 & 0 & \ldots & 0 & 1 \\
0 & 0 & \cdots & 0 & 2 \\
\cdots & \cdots & \cdots & \cdots & \cdots \\
0 & 0 & \ldots & 0 & Q-1 \\
0 & 0 & \cdots & 1 & 0 \\
0 & 0 & \cdots & 1 & 1 \\
\cdots & \cdots & \cdots & \cdots & \cdots \\
0 & 0 & \cdots & 1 & Q-1 \\
0 & 0 & \cdots & 2 & 0 \\
\cdots & \cdots & \cdots & \cdots & \cdots \\
\cdots & \cdots & \cdots & \cdots & \cdots \\
Q-1 & Q-1 & \ldots & Q-1 & Q-1
\end{array}\right) .
$$

We want to prove that (C.1) is a Unitary matrix for the general case, $k \geq 2$, since for $k=1 \mathcal{I}_{Q}$ is the DFT matrix, cf. §III.4.2.

For $k=2$, let's rewrite (C.2) with respect to its $Q$ consecutive $Q \times 2$ sub-matrices $\mathbf{A}_{j}, j=0, \ldots, Q-1$. For example,

$$
\begin{align*}
& \mathbf{A}_{\mathbf{0}}=\left(\begin{array}{cc}
0 & 0 \\
0 & 1 \\
0 & 2 \\
\cdots & \cdots \\
0 & Q-1
\end{array}\right),  \tag{C.3}\\
& \mathbf{A}_{\mathbf{1}}=\left(\begin{array}{cc}
1 & 0 \\
1 & 1 \\
1 & 2 \\
\cdots & \cdots \\
1 & Q-1
\end{array}\right), \tag{C.4}
\end{align*}
$$

and in general,

$$
\mathbf{A}_{\mathbf{j}}=\left(\begin{array}{c|c}
j & 0  \tag{C.5}\\
j & 1 \\
j & 2 \\
\cdots & \cdots \\
j & Q-1
\end{array}\right)
$$

so that

$$
\begin{equation*}
\mathbf{m}=\left[\mathbf{A}_{0} ; \mathbf{A}_{1} ; \mathbf{A}_{2} ; \ldots ; \mathbf{A}_{Q-1}\right] . \tag{C.6}
\end{equation*}
$$

Now we can write $\mathbf{B}=\mathbf{m m}^{T}$ (of size $Q^{2} \times Q^{2}$ ) as,

$$
\mathbf{B}=\mathbf{m m}^{T}=\left(\begin{array}{c|c|c|c}
\ldots & \ldots & \ldots & \ldots  \tag{C.7}\\
\hline \ldots & \ldots & \ldots & \ldots \\
\hline \ldots & \mathbf{A}_{s} \mathbf{A}_{j}^{T} & \ldots & \ldots \\
\hline \ldots & \ldots & \ldots & \ldots
\end{array}\right),
$$

where $s, j \in[0, Q-1]$.
Then it can be easily derived that,

$$
\begin{equation*}
\mathcal{I}_{Q^{2}{ }_{s j}}=\Psi\left(\mathbf{A}_{s} \mathbf{A}_{j}^{T}\right)=\omega^{s j} \mathcal{I}_{Q}, \tag{C.8}
\end{equation*}
$$

where $\omega \equiv \exp \left(-i \frac{2 \pi}{Q}\right)$, and $\mathcal{I}_{Q}$ is a Unitary matrix ( $\mathcal{I}_{Q}$ equals the DFT matrix of size $Q \times Q$ as mentioned previously).

$$
\mathcal{I}_{Q^{2}}=\mathbf{m m}^{T}=\left(\begin{array}{c|c|c|c}
\ldots & \ldots & \ldots & \ldots  \tag{C.9}\\
\hline \ldots & \ldots & \ldots & \ldots \\
\hline \ldots & \mathcal{I}_{Q^{2}}{ }_{s j} & \ldots & \ldots \\
\hline \ldots & \ldots & \ldots & \ldots
\end{array}\right) .
$$

Therefore in order to prove the Unitarity of $\mathcal{I}_{Q^{2}}$ (neglect the normalization factor), we have to show that,

$$
\begin{equation*}
\mathcal{I}_{Q^{2}} \mathcal{I}_{Q^{2}}^{H}=\mathcal{I}_{Q^{2}}^{H} \mathcal{I}_{Q^{2}}=Q^{2} \mathbf{I}, \tag{C.10}
\end{equation*}
$$

where $\mathbf{I}$ is the identity matrix.
Let $\mathbf{F}=\mathcal{I}_{Q^{2}} \mathcal{I}_{Q^{2}}^{H}$. Then it can be derived using (C.8),

$$
\begin{equation*}
\mathbf{F}_{s j}=\sum_{p=0}^{Q-1} \mathcal{I}_{Q^{2}{ }_{s p}} \mathcal{I}_{Q^{2} p j}^{H}=Q \sum_{p=0}^{Q-1} \omega^{(s-j) p} \mathbf{I} . \tag{C.11}
\end{equation*}
$$

If we set also $\mathbf{G}=\mathcal{I}_{Q^{2}}^{H} \mathcal{I}_{Q^{2}}$, then it can be shown that

$$
\begin{equation*}
\mathbf{G}_{s j}=\sum_{p=0}^{Q-1} \mathcal{I}_{Q^{2}{ }_{s p}}^{H} \mathcal{I}_{Q^{2}{ }_{p j}}=Q \sum_{p=0}^{Q-1} \omega^{(j-s) p} \mathbf{I} . \tag{C.12}
\end{equation*}
$$

It is obvious that $\mathbf{F}_{j j}=\mathbf{G}_{j j}=Q^{2} \mathbf{I}$ (here the identity matrix is of size $Q \times Q$ ). Therefore in order to prove the Unitarity of $\mathcal{I}_{Q^{2}}$, it suffices to show that

$$
\begin{equation*}
\sum_{p=0}^{Q-1} \omega^{(s-j) p}=\sum_{p=0}^{Q-1} \omega^{(j-s) p}=0, \text { for } s \neq j \tag{C.13}
\end{equation*}
$$

Recall that $s, j \in[0, Q-1]$, and also $w=s-j$ is a non-zero integer $-Q<w<Q$ (because $s \neq j$ (C.13)).

Therefore the first term of (C.13) becomes,

$$
\begin{equation*}
\sum_{p=0}^{Q-1} \omega^{(s-j) p}=\sum_{p=0}^{Q-1} \omega^{w p}=\frac{\left(\omega^{w}\right)^{Q}-1}{\omega^{w}-1}=\frac{\left(\omega^{Q}\right)^{w}-1}{\omega^{w}-1}=\frac{(1)^{w}-1}{\omega^{w}-1}=0 . \tag{C.14}
\end{equation*}
$$

Similarly the second term of (C.13) is also zero. Therefore it is proved that $\mathcal{I}_{M} \equiv \mathcal{I}_{Q^{k}}$ is Unitary also for $k=2$.

To prove the Unitarity of $\mathcal{I}_{Q^{k}}$ for $k>2$ we will use mathematical induction; for $k=2$ we already proved that $\mathcal{I}_{Q^{2}}$ is Unitary. Now we just need to show that if $\mathcal{I}_{Q^{k}}$ is Unitary for some $k=n$, then it is also Unitary for $k=n+1$.

For $k=n+1\left(M=Q^{n+1}\right), \mathbf{m}$ is a $Q^{n+1} \times(n+1)$ matrix similar to that described in (C.2). Similarly to the case $k=2$, we will partition matrix $\mathbf{m}$ to its $Q$ consecutive $Q^{n} \times(n+1)$ sub-matrices $\mathbf{A}_{j}, j=0, \ldots, Q-1$, i.e.

$$
\mathbf{A}_{\mathbf{j}}=\left(\begin{array}{c|cccc}
j & 0 & \cdots & 0 & 0  \tag{C.15}\\
j & 0 & \cdots & 0 & 1 \\
j & 0 & \cdots & 0 & 2 \\
\cdots & \cdots & \cdots & \cdots & \cdots \\
j & 0 & \cdots & 0 & Q-1 \\
j & 0 & \cdots & 1 & 0 \\
\cdots & \cdots & \cdots & \cdots & \cdots \\
j & 0 & \cdots & Q-1 & Q-1 \\
\cdots & \cdots & \cdots & \cdots & \cdots \\
j & 1 & \cdots & 0 & 0 \\
j & 1 & \cdots & 0 & 1 \\
j & 1 & \cdots & 0 & 2 \\
\cdots & \cdots & \cdots & \cdots & \cdots \\
j & Q-1 & \cdots & Q-1 & Q-1
\end{array}\right) .
$$

Now we can again rewrite $\mathbf{B}=\mathbf{m m}^{T}$ (of size $Q^{n+1} \times Q^{n+1}$ ) as,

where $s, j \in[0, Q-1]$.
Then it can be easily derived that (note that the submatrix formed by the $n$ rightmost columns of $\mathbf{A}_{j}(\mathrm{C} .15)$ equals $\mathbf{m}$ for $k=n$ ),

$$
\begin{equation*}
\mathcal{I}_{Q^{n+1}{ }_{s j}}=\Psi\left(\mathbf{A}_{s} \mathbf{A}_{j}^{T}\right)=\omega^{s j} \mathcal{I}_{Q^{n}}, \tag{C.17}
\end{equation*}
$$

where $\mathcal{I}_{Q^{n}}$ is a Unitary matrix by assumption (in the beginning of the mathematical induction), and again we have assumed,

$$
\mathcal{I}_{Q^{n+1}}=\mathbf{m m}^{T}=\left(\begin{array}{c|c|c|c}
\ldots & \ldots & \ldots & \ldots  \tag{C.18}\\
\hline \ldots & \ldots & \ldots & \ldots \\
\hline \ldots & \mathcal{I}_{Q^{n+1}} & \ldots & \ldots \\
\hline \ldots & \ldots & \ldots & \ldots
\end{array}\right) .
$$

Therefore in order to prove the Unitarity of $\mathcal{I}_{Q^{n+1}}$ (neglect again the normalization factor), we have to show that,

$$
\begin{equation*}
\mathcal{I}_{Q^{n+1}} \mathcal{I}_{Q^{n+1}}^{H}=\mathcal{I}_{Q^{n+1}}^{H} \mathcal{I}_{Q^{n+1}}=Q^{n+1} \mathbf{I} \tag{C.19}
\end{equation*}
$$

where $\mathbf{I}$ is the identity matrix.
Let $\mathbf{F}=\mathcal{I}_{Q^{n+1}} \mathcal{I}_{Q^{n+1}}^{H}$. Then, it can be shown

$$
\begin{equation*}
\mathbf{F}_{s j}=\sum_{p=0}^{Q-1} \mathcal{I}_{Q^{n+1}{ }_{s p}} \mathcal{I}_{Q^{n+1}}^{H}=Q^{n} \sum_{p=0}^{Q-1} \omega^{(s-j) p} \mathbf{I} . \tag{C.20}
\end{equation*}
$$

If we set also $\mathbf{G}=\mathcal{I}_{Q^{n+1}}^{H} \mathcal{I}_{Q^{n+1}}$, then it can be shown that

$$
\begin{equation*}
\mathbf{G}_{s j}=\sum_{p=0}^{Q-1} \mathcal{I}_{Q^{n+1}}{ }_{s p} \mathcal{I}_{Q^{n+1_{p j}}}=Q^{n} \sum_{p=0}^{Q-1} \omega^{(j-s) p} \mathbf{I} . \tag{C.21}
\end{equation*}
$$

It is obvious that $\mathbf{F}_{j j}=\mathbf{G}_{j j}=Q^{n+1} \mathbf{I}$. Therefore in order to prove the Unitarity of $\mathcal{I}_{Q^{n+1}}$, it suffices to show that

$$
\begin{equation*}
\sum_{p=0}^{Q-1} \omega^{(s-j) p}=\sum_{p=0}^{Q-1} \omega^{(j-s) p}=0, \text { for } s \neq j, \tag{C.22}
\end{equation*}
$$

which is true, cf. (C.14) for the $k=2$ case.
So we proved the Unitarity of $\mathcal{I}_{Q^{n+1}}$, and therefore the Unitarity of $\mathcal{I}_{Q^{k}}$ for $k>2$ was automatically proved by the mathematical induction.

## APPENDIX D

## NESTED SEARCH RELATED

1. Complexity Reduction of Method 2

Let for example $M=8$ and $n=4$. Then we have the following systematic code:

$$
\mathcal{C}_{3 / 4}=\left(\begin{array}{cccc}
0 & 0 & 0 & b_{0}  \tag{D.1}\\
0 & 0 & 1 & b_{1} \\
0 & 1 & 0 & b_{2} \\
0 & 1 & 1 & b_{3} \\
1 & 0 & 0 & b_{4} \\
1 & 0 & 1 & b_{5} \\
1 & 1 & 0 & b_{6} \\
1 & 1 & 1 & b_{7}
\end{array}\right),
$$

for which the search complexity is $2^{8}$ codes. Method 2 suggests that $\left(b_{0}, b_{1}, b_{2}, b_{3}\right)=$ $\left(b_{7}, b_{6}, b_{5}, b_{4}\right)$, thus reducing the complexity to $2^{4}$ codes. If we proceed similarly, a straightforward complexity reduction is to set $\left(b_{0}, b_{1}\right)=\left(b_{3}, b_{2}\right)$, which again will ensure that the codeword-pairs $\left[0,0,0, b_{0}\right]^{T}-\left[0,1,1, b_{3}\right]^{T}$, and $\left[0,0,1, b_{1}\right]^{T}-$ $\left[0,1,0, b_{2}\right]^{T}$, have $\rho=0$ (similarly for the last 4 codeword-pairs). Therefore the systematic code to be searched has been reduced to

$$
\mathcal{C}_{3 / 4}=\left(\begin{array}{cccc}
0 & 0 & 0 & b_{0}  \tag{D.2}\\
0 & 0 & 1 & b_{1} \\
0 & 1 & 0 & b_{1} \\
0 & 1 & 1 & b_{0} \\
1 & 0 & 0 & b_{0} \\
1 & 0 & 1 & b_{1} \\
1 & 1 & 0 & b_{1} \\
1 & 1 & 1 & b_{0}
\end{array}\right),
$$

with search complexity $2^{M / 4}=4$. Similarly one can reduce further the complexity.
2. Derivation of the Hyper-reduced Search (Method 3)

Method 2 suggests that the $M$-bit vector

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{1}, b_{2}, \ldots, b_{M-1}\right]^{T} \tag{D.3}
\end{equation*}
$$

to be found for the $\mathcal{C}_{k / j}$ code in the nested search should take one of the two forms (let $k=3, M=8$ for the sake of simplicity):

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{1}, b_{2}, b_{3}, b_{3}, b_{2}, b_{1}, b_{0}\right]^{T} \tag{D.4}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{1}, b_{2}, b_{3}, \overline{b_{3}}, \overline{b_{2}}, \overline{b_{1}}, \overline{b_{0}}\right]^{T} \tag{D.5}
\end{equation*}
$$

depending on $n$. Here we will remove the dependency on $n$, so that in any $n$ the $\mathbf{c}$ should take one of the aforementioned forms (the search will choose which one).

Now we observe that the first $M / 2=4$ codewords of the $\mathcal{C}_{3 / n}$ systematic code, i.e.

$$
\left(\begin{array}{c|ccc}
0 & 0 & 0 & \cdots  \tag{D.6}\\
0 & 0 & 1 & \cdots \\
0 & 1 & 0 & \cdots \\
0 & 1 & 1 & \cdots
\end{array}\right),
$$

is a systematic code with an additional all-zero column. Therefore similar to the reasoning of Method 2 we will let the vector $\left[b_{0}, b_{1}, b_{2}, b_{3}\right]$ to take one of the two forms, i.e. $\left[b_{0}, b_{1}, b_{1}, b_{0}\right]$ or $\left[b_{0}, b_{1}, \overline{b_{1}}, \overline{b_{0}}\right]$.

Based on this, and in order to reduce further the search complexity, the vector c shall take one of the following $M / 2=4$ forms, cf. (D.4),(D.5):

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{1}, b_{1}, b_{0}, b_{0}, b_{1}, b_{1}, b_{0}\right]^{T} \tag{D.7}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{1}, \overline{b_{1}}, \overline{b_{0}}, \overline{b_{0}}, \overline{b_{1}}, b_{1}, b_{0}\right]^{T} \tag{D.8}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{1}, b_{1}, b_{0}, \overline{b_{0}}, \overline{b_{1}}, \overline{b_{1}}, \overline{b_{0}}\right]^{T} \tag{D.9}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{1}, \overline{b_{1}}, \overline{b_{0}}, b_{0}, b_{1}, \overline{b_{1}}, \overline{b_{0}}\right]^{T} \tag{D.10}
\end{equation*}
$$

Again we observe that the first $M / 4=2$ codewords of the $\mathcal{C}_{3 / n}$ systematic code, i.e.

$$
\left(\begin{array}{cc|cc}
0 & 0 & 0 & \cdots  \tag{D.11}\\
0 & 0 & 1 & \cdots
\end{array}\right)
$$

is a systematic code with additional 2 all-zero columns. Therefore, again similar to the reasoning of Method 2 we will let the vector $\left[b_{0}, b_{1}\right.$ ] to take one of the two forms, i.e. $\left[b_{0}, b_{0}\right]$ or $\left[b_{0}, \overline{b_{0}}\right]$.

So, based also on this complexity reduction, the vector c shall take one of the following $M=8$ forms, cf. (D.7)-(D.10):

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{0}, b_{0}, b_{0}, b_{0}, b_{0}, b_{0}, b_{0}\right]^{T} \tag{D.12}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, \overline{b_{0}}, \overline{b_{0}}, b_{0}, b_{0}, \overline{b_{0}}, \overline{b_{0}}, b_{0}\right]^{T} \tag{D.13}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{0}, \overline{b_{0}}, \overline{b_{0}}, \overline{b_{0}}, \overline{b_{0}}, b_{0}, b_{0}\right]^{T} \tag{D.14}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, \overline{b_{0}}, b_{0}, \overline{b_{0}}, \overline{b_{0}}, b_{0}, \overline{b_{0}}, b_{0}\right]^{T} \tag{D.15}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{0}, b_{0}, b_{0}, \overline{b_{0}}, \overline{b_{0}}, \overline{b_{0}}, \overline{b_{0}}\right]^{T} \tag{D.16}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, \overline{b_{0}}, \overline{b_{0}}, b_{0}, \overline{b_{0}}, b_{0}, b_{0}, \overline{b_{0}}\right]^{T} \tag{D.17}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, b_{0}, \overline{b_{0}}, \overline{b_{0}}, b_{0}, b_{0}, \overline{b_{0}}, \overline{b_{0}}\right]^{T} \tag{D.18}
\end{equation*}
$$

or

$$
\begin{equation*}
\mathbf{c}=\left[b_{0}, \overline{b_{0}}, b_{0}, \overline{b_{0}}, b_{0}, \overline{b_{0}}, b_{0}, \overline{b_{0}}\right]^{T} \tag{D.19}
\end{equation*}
$$

By simple observation, these 8 forms that the vector chall take, are simply the 8 columns of the Hadamard matrix of length 8 , hence Method 3. So we see that Method 3 is the extension of Method 2 towards less complexity.

## APPENDIX E

## LOW $\rho_{\max }$ BINARY CODES

In this appendix we list some of the rate $k / n$ block codes (of cardinality $M=2^{k}$ ) found in §V.1.1 with the forward nested search. The listing is in the form of a rowvector containing the indices of the columns of $\mathcal{H}_{M}(3.24)$ comprising the corresponding codes. For example using the following listing the rate $5 / 6$ code is comprising from the $[16,8,4,2,1,0]$ columns of the $\mathcal{H}_{M}$ orthogonal code (we assign index 0 to the most left column of $\mathcal{H}_{M}$ ).

- $k=4$

$$
\begin{equation*}
\mathbf{c}_{4}^{f}=\overbrace{8,4,2,1,0,15,3}^{n=7}, 5,10,12,6,7,9,11,13,14], \tag{E.1}
\end{equation*}
$$

- $k=5$

$$
\mathbf{c}_{6}^{f}=[32,16,8,4,2,1,0,63,3,12,21,33,58,38,47,18,31,52,57,5,9,13,6,17,36,
$$

$$
62,10,29,50,40,7,19,34,26,43,53,60,11,20,37,24,41,54,14,22,39,25,35,28,44 \text {, }
$$

$$
\begin{equation*}
59,23,42,27,45,15,48,30,46,49,51,55,56,61] \tag{E.3}
\end{equation*}
$$

$$
\begin{align*}
& \mathbf{c}_{5}^{f}=\overbrace{\overbrace{16,8,4,2,1,0}^{n=6}, 15,17,6,26}^{n=10}, 27,10,18,22,31,3,12,5,30,9,24,11,20,19, \\
& 13,14,21,23,25,28,29] \text {, } \\
& \text { - } k=6
\end{align*}
$$

- $k=7$
$\mathbf{c}_{7}^{f}=[64,32,16,8,4,2,1,0,63,71,89,106,11,117,5,22,34,123,24,76,37,113,40$, $118,3,72,23,44,26,69,52,107,80,58,92,90,35,68,97,6,116,121,31,19,127,47,114$, $100,9,98,66,41,61,70,21,15,49,93,74,105,120,30,7,82,73,104,39,38,18,53,46$, $86,50,124,99,14,17,13,36,59,77,122,12,125,84,110,20,33,81,27,57,83,67,28$, $95,43,51,102,54,87,91,55,115,45,79,56,78,10,75,60,94,42,103,108,85,48,25$, $65,96,29,62,88,101,109,111,112,119,126], \quad(E .4)$
- $k=8$
$\mathbf{c}_{8}^{f}=[128,64,32,16,8,4,2,1,0,255,15,51,85,150,232,45,78,143,244,18,36,131$, $65,249,24,196,96,190,59,234,77,156,74,157,115,21,63,205,180,110,211,9,53$, $235,89,219,168,33,163,118,12,182,42,240,112,13,140,210,82,133,37,138,207$, $213,34,223,186,130,19,99,91,97,137,227,148,167,117,30,193,166,179,233,189$, $95,155,120,212,55,48,208,70,191,104,67,68,209,108,251,116,216,160,49,29$, $183,220,73,164,27,6,3,206,61,221,119,178,248,50,215,58,174,176,26,79,229$, $197,111,93,254,39,109,113,100,80,5,127,169,144,217,62,72,86,202,192,92$, $243,90,171,252,225,200,71,25,204,239,185,56,226,146,22,47,132,224,245,238$, $214,124,123,125,152,154,46,181,218,81,87,172,253,11,54,103,126,153,102$, $129,94,151,35,114,44,40,88,236,31,177,107,149,162,159,136,142,188,41,106$, $175,57,122,105,7,173,195,161,231,60,201,121,198,52,66,83,139,241,10,14$, $247,147,228,84,145,28,246,76,98,75,135,134,23,194,184,101,43,141,170,20$, 17, 187, 158, 38, 69, 165, 199, 203, 222, 230, 237, 242, 250], (E.5)
- $k=9$
$\mathbf{c}_{9}^{f}=[256,128,64,32,16,8,4,2,1,0,255,263,57,330,155,495,30,301,420,120,204,482,432,212,105,371,53,449$, $67,287,462,348,438,51,21,152,107,230,162,192,333,394,407,246,304,153,320,124,72,43,400,446,274,251$, $19,190,87,321,403,221,487,154,290,215,18,119,66,302,175,324,349,317,409,91,353,410,115,14,439,213$, $22,58,445,159,427,137,463,372,502,150,71,359,241,10,343,428,189,125,443,370,187,448,114,268,376$, $378,323,355,179,351,160,60,203,82,140,253,98,84,24,386,116,368,217,316,272,129,373,228,421,276$, $300,413,146,103,259,313,451,315,489,478,88,29,491,145,239,186,37,151,69,389,104,303,112,201,326$, $157,135,271,500,33,65,183,73,454,223,336,248,312,385,511,78,494,468,218,401,176,496,48,46,436,426$, $231,232,25,344,257,3,77,434,149,163,350,342,188,471,391,102,80,93,262,510,118,68,424,235,54,456$, $34,430,422,412,164,352,236,392,264,245,193,270,243,158,447,275,467,338,383,97,85,281,76,13,205,198$, $279,209,106,347,503,365,364,360,210,148,367,226,224,86,265,433,283,250,273,475,267,44,488,305,358$, $498,457,247,319,332,214,363,11,399,461,440,442,206,156,222,27,269,139,404,169,133,185,437,398,242$, $240,318,141,402,200,361,425,197,417,208,380,379,507,173,229,328,357,299,469,506,17,123,294,168,194$, $170,165,504,362,184,42,485,375,261,74,55,49,444,335,405,59,70,459,136,95,329,94,306,122,131,458$, $460,289,220,327,416,415,477,110,6,453,310,450,476,35,23,15,414,369,219,292,26,286,166,5,252,20,50$, $260,52,396,121,484,431,337,238,374,90,39,161,196,501,499,441,470,207,266,216,480,144,384,423,126$, $254,466,211,99,138,244,282,258,225,497,509,472,411,202,490,127,81,339,41,7,435,486,452,298,40,419$, $388,293,341,277,307,113,377,278,174,92,483,395,291,237,28,397,45,296,492,465,505,249,181,346,180$, $387,108,100,178,182,354,47,36,142,171,285,111,89,172,325,195,75,309,101,390,280,455,288,322,12,61$, $406,297,83,356,464,481,429,109,167,381,345,79,134,117,473,408,143,233,295,474,130,227,234,31,284$, $177,62,479,366,340,9,191,147,334,38,56,331,63,96,132,199,308,311,314,382,393,418,493,508]$, (E.6)
- $k=10$
$\mathbf{c}_{10}^{f}=[512,256,128,64,32,16,8,4,2,1,0,1023,15,113,402,676,840,220,358,425,570,707,789,54,129,894,90$, $859,942,305,473,910,580,521,1009,67,698,150,645,115,42,399,869,905,620,501,674,352,567,612,205,148$, $451,169,949,428,882,271,642,979,121,484,726,142,1000,530,820,260,507,79,394,283,48,795,135,940,876$, $784,601,658,341,494,654,565,387,223,742,485,831,702,525,334,467,76,709,916,262,423,443,469,172,773$, $274,440,594,461,125,943,1002,56,282,745,716,607,319,130,124,436,332,934,360,669,630,903,855,681,713$, $266,397,834,168,929,623,603,431,411,463,968,765,250,643,715,664,720,911,727,879,606,635,691,898,771$, $695,177,99,581,604,26,550,384,493,254,80,923,163,480,584,158,51,408,503,513,241,775,751,627,1001$, $878,793,194,516,1005,827,264,20,82,752,380,938,38,308,418,618,621,763,41,63,806,211,906,118,815$, $379,634,464,721,426,278,438,671,202,301,218,680,317,490,157,596,616,216,636,532,847,1011,217,415$, $333,593,349,434,398,222,517,750,210,187,639,68,640,689,47,378,287,824,821,805,651,368,1006,958,258$, $320,180,578,375,541,339,253,832,599,33,538,1018,376,833,608,366,371,230,759,240,181,486,605,131,421$, $936,185,673,89,109,914,557,732,108,736,614,826,817,997,602,406,116,562,132,893,790,203,367,505,323$, $1016,31,441,613,227,444,560,348,986,40,481,531,856,536,615,535,896,904,510,25,261,70,660,668,149$, $470,969,196,447,690,190,88,646,1015,410,456,887,452,930,60,870,667,242,126,811,482,422,987,927,875$, $340,34,297,312,611,98,13,769,768,666,133,728,899,931,239,740,442,971,156,960,509,342,991,117,457$, $502,522,299,959,255,276,159,204,236,94,228,316,629,37,861,269,514,59,84,474,303,369,554,628,10,937$, $848,471,331,362,982,961,670,610,723,529,839,885,883,446,372,173,891,926,102,908,215,587,183,700,964$, $346,313,58,975,542,221,687,6,842,327,508,450,412,309,377,53,338,696,739,837,189,573,136,225,224$, $147,534,134,662,14,97,552,28,597,872,289,409,976,915,107,1010,1013,684,475,437,496,951,354,30,72$, $794,237,907,761,153,582,248,952,364,243,533,427,772,954,247,786,928,981,850,152,454,404,197,659,998$, $430,718,677,622,111,511,743,424,176,980,491,279,925,304,865,589,321,712,731,575,300,792,351,523,697$, $822,144,432,548,1022,558,373,392,539,693,526,95,280,191,164,956,302,950,955,999,504,166,23,329,350$, $708,439,151,812,233,807,901,75,226,465,619,155,405,977,737,83,476,683,553,648,835,829,867,830,776$, $864,992,965,234,119,912,920,1020,598,307,73,779,652,854,537,543,781,985,631,746,688,699,390,970,292$, $902,143,1003,663,571,174,989,967,545,917,801,231,559,429,186,649,846,322,413,200,175,506,849,994$, $294,756,123,922,62,564,657,103,318,828,973,656,747,579,566,733,725,55,479,275,251,809,500,106,110$, $455,93,924,281,472,661,219,860,800,285,290,644,600,199,590,1017,400,19,298,141,585,819,214,825,783$, $245,857,325,44,851,9,483,74,933,932,208,361,962,171,311,209,45,139,782,935,462,814,71,388,498,563$, $459,449,195,145,61,655,770,744,788,685,591,650,259,874,179,919,293,29,24,249,489,1014,66,843,519$, $734,988,785,235,995,569,836,686,647,866,735,85,978,495,561,11,46,871,365,137,7,420,948,637,884,257$, $724,540,122,974,595,391,335,246,291,393,170,892,881,295,77,990,229,357,549,749,886,555,165,625,755$, $65,774,383,435,626,665,760,953,764,1012,730,780,852,556,945,43,337,52,653,100,816,403,453,547,803$, $722,363,232,162,710,69,167,272,888,445,873,306,198,140,201,188,161,182,265,844,396,478,984,184,154$, $787,1007,944,18,101,268,823,577,862,296,460,477,448,12,777,939,757,416,741,92,617,633,753,574,767$, $499,273,624,49,328,1004,714,193,487,96,1008,717,813,57,868,678,609,192,568,729,818,918,889,105,853$, $374,353,754,966,963,207,497,592,675,389,838,791,17,407,796,797,81,466,345,330,35,138,641,544,897$, $808,895,286,270,748,104,458,841,414,355,941,947,160,267,488,419,682,527,146,347,288,877,370,706,359$, $528,27,78,238,909,524,863,520,50,858,1019,672,385,913,972,310,804,120,900,810,921,703,701,5,212$, $336,386,546,492,433,845,314,638,36,127,244,22,704,324,401,213,1021,632,957,694,112,758,91,996,315$, $551,983,3,778,277,692,711,395,326,946,178,284,252,87,890,705,356,21,588,583,762,263,586,382,206$, $343,114,344,39,86,738,572,381,417,518,468,515,576,679,719,766,798,799,802,880,993], \quad($ E. 7$)$
- $k=11$
$\mathbf{c}_{11}^{f}(1: 682)=[1024,512,256,128,64,32,16,8,4,2,1,0,1023,1055,1251,1388,549,949,118,187,1543,390,1870$, $349,1662,1967,1984,215,728,822,196,1715,954,1363,1507,1481,1678,1760,1207,971,558,1927,300,931,1962$, $2010,854,35,1290,5,248,1524,1694,1226,311,1862,1758,1804,22,627,1893,155,695,1834,756,295,1282,170$, $1608,965,714,880,316,264,1879,721,1692,74,1303,431,1351,2019,1837,1063,1618,1413,1563,1886,548,1039$, $1500,2007,304,1801,956,1121,294,112,566,1542,875,1821,862,445,1785,66,883,944,353,860,1732,538,849$, $276,1731,946,328,497,700,842,1223,1784,909,899,1993,590,683,392,870,855,1112,1831,1386,1946,841,34$, $318,613,957,1672,1094,2046,480,676,1519,330,838,1849,639,1544,1438,1062,1058,831,1836,747,797,1273$, $1512,874,378,1985,279,1964,252,792,1319,394,39,1741,1085,978,522,1605,148,412,663,1394,1149,473$, $147,1330,1345,1665,426,1606,1231,225,564,1316,1657,832,1408,185,57,91,578,507,648,1851,1992,601$, $1111,454,224,1830,1065,1745,1331,754,1145,1517,501,1477,374,1146,1245,468,1162,80,449,494,2004,2000$, $1096,1909,630,1591,145,1562,467,1880,314,255,103,381,1682,1402,1503,1001,315,857,38,1781,1750,1255$, $1000,299,51,809,723,1648,79,1349,396,1102,1264,529,1518,1150,1666,1456,576,732,1865,63,1339,986$, $1281,423,1890,1242,681,810,1885,591,1017,1174,982,1154,1295,653,1810,1817,646,278,1161,1389,415,68$, $1117,2045,1169,666,339,262,1326,1403,1166,1382,1020,532,217,1935,1965,1461,1365,1148,1557,1095,626$, $678,687,400,401,1690,450,1011,244,298,1311,1406,1061,1220,1298,672,1192,6,337,1328,1015,1772,1833$, 2017, 1528, 1808, 1573, 761, 1128, 547, 1898, 628, 1321, 417, 1425, 1629, 144, 369, 1143, 1652, 485, 1261, 615, 60, 1239, $343,530,1482,1089,921,934,696,1299,1022,1131,2041,1341,348,702,650,1160,1214,852,152,1861,1691,36$, $856,11,610,73,1046,1054,245,488,10,1923,1970,1488,52,133,466,1620,338,2027,2009,1230,867,1479,525$, $422,1746,1485,774,1346,1407,659,1814,1285,1805,250,269,1417,341,326,923,992,317,1253,434,907,685$, $888,1698,142,1472,1384,1197,1009,228,1462,372,1915,43,1098,90,1087,1838,1523,297,1567,709,1948,950$, $1265,1916,537,404,1355,1446,270,218,1552,1340,724,41,834,675,1043,557,1429,1599,1522,791,1612,258$, $30,1527,1790,1167,523,355,1908,1969,664,605,69,1778,1449,1515,1827,577,749,359,1247,861,302,1910$, $1164,993,1336,194,1795,1945,735,1623,1210,1941,1409,940,1271,961,1860,2014,1894,1843,520,1268,88$, $513,658,1634,1494,1380,1031,1205,1474,139,346,1080,1367,920,1994,1881,877,268,2024,87,492,421,981$, $1809,1799,281,958,1212,644,1097,729,1845,556,1451,1342,1733,1952,1088,843,386,1867,1233,236,829,826$, $1645,1211,1636,1082,1008,1399,1877,579,471,151,518,356,1980,1350,835,1256,1974,1201,1109,286,222$, $2036,898,1585,1445,987,1060,1532,1184,1144,1661,366,1600,595,833,2044,1677,540,988,1546,405,1415$, $767,662,614,1405,1617,462,336,1188,1276,1751,1372,1476,506,1511,1443,1598,1194,230,1294,452,199$, $1754,165,1647,2043,1466,1070,1722,197,740,1179,929,976,1730,1866,782,1597,1434,340,570,656,1114,716$, $1508,821,241,24,1053,2001,167,257,1763,163,633,1619,114,1776,242,410,1307,402,711,2008,731,1914$, $263,730,803,1601,40,1569,1079,692,1738,1484,943,425,996,1611,611,465,440,845,1310,1553,1858,781], \quad$ (E.8)
- $k=11$
$\mathbf{c}_{11}^{f}(683: 1365)=[483,859,1960,1371,592,1797,1021,995,1516,213,1428,42,738,1917,634,127,1301,573,1997$, $1044,737,1704,231,383,499,1458,1577,1175,741,863,1483,166,1703,1779,177,905,970,1724,1949,715,1454$, $1531,670,706,712,1961,393,1856,504,1277,1874,1939,1263,550,1421,435,1419,1702,975,370,1156,1138,123$, $989,1228,1716,1313,2006,25,327,125,1926,285,1447,1387,811,447,1572,360,332,1469,1433,748,1081,1090$, $1457,1317,1274,1383,926,1234,1641,1292,1975,1411,850,1635,178,509,47,1602,1936,640,498,310,1147$, $1933,1040,240,1362,132,1312,2013,652,1237,388,1427,55,1743,200,1986,120,668,1250,1802,2035,207$, $1979,104,574,935,596,960,599,772,1768,490,1030,173,608,649,568,1912,459,750,28,1436,117,1944,1492$, $2025,779,2040,254,267,446,1943,1826,1026,495,1010,272,70,1504,208,1583,1541,1574,1100,1844,1707$, $1467,622,906,1195,227,377,271,619,1513,752,195,308,1450,2015,516,2016,1792,930,220,1728,1182,1748$, $1101,130,1940,1099,1381,1761,1685,1878,517,916,1630,146,1368,1607,882,1116,1735,61,1038,1675,1465$, $1852,1695,97,1391,1674,1376,603,1794,198,891,1076,997,77,515,941,375,180,722,1497,770,1033,443,759$, $1168,571,851,1369,1357,1762,1152,1347,952,1176,1423,1286,1968,1075,885,974,679,1124,1396,363,477$, $1938,140,437,27,1976,1153,667,280,1338,99,815,391,1025,209,1847,1884,1548,1191,1551,1308,925,1014$, $33,2032,853,998,1537,379,105,1442,1680,107,585,458,1594,134,1689,115,612,565,1439,2028,432,1302$, $1800,1091,1990,939,1958,894,1706,972,188,942,453,1719,637,1966,994,78,561,102,802,229,536,878$, $1257,1534,1005,1989,335,100,1978,1042,1050,1651,1660,1929,1686,1646,1973,1681,1892,1988,562,1981$, $1903,413,560,1035,903,2018,72,1556,62,277,1034,733,1213,521,805,563,1582,186,1007,727,1309,889$, $1714,1759,1238,1931,1579,202,1982,358,237,763,1919,553,439,893,1222,638,1315,1570,980,1151,160,1900$, $551,594,1555,1134,1846,1244,81,1752,1603,928,625,1832,1056,476,742,1907,1270,119,1643,149,174,966$, $438,464,1275,1767,1676,433,329,347,1621,514,357,1558,1078,325,1742,153,239,179,1755,1671,914,1491$, $1637,725,138,682,1475,1957,1911,866,274,2039,1323,820,607,1032,1278,1596,1998,814,1930,1260,642,584$, $800,2047,1734,2029,312,1229,1863,876,1057,1359,1996,1918,673,1093,1337,938,1609,872,1392,589,284$, $175,319,265,1325,1925,1455,1913,1126,510,121,734,342,1375,1334,762,1526,1132,1499,219,37,758,1288$, $399,661,1178,1835,1693,979,1721,385,539,481,181,406,708,1509,345,776,296,1287,879,1991,13,1774$, $1700,189,331,632,1983,1820,1059,623,1977,1787,739,686,1905,1105,324,1235,1782,824,1791,817,1538$, $1327,567,323,896,575,1987,1221,1972,629,1631,526,1565,1127,858,1329,1356,807,1215,828,382,837,1638$, $137,233,1420,1588,2011,839,1995,362,460,1697,1314,1343,48,1510,511,1955,1196,292,86,933,1293,1348$, $655,71,1896,884,1740,720,2038,636,1159,1650,848,253,7,684,689,1115,1241,1922,487,690,1452,354,1850$, $1868,799,1610,364,2021,191,1670,1045,1589,1377,1163,183,204,1822,1029,1729,376,1361,496,1649,1560$, $1027,1130,1642,15,1048,1653,1744,1710,1871,436,1628,544,1036,246,2012,641,1549,1571,1490,1416,169$, $156,719,1823,275,1889,1478,1410,1219,216,409,1535,769,351,1165,1186,141,602,1807,1170,1108,1584,746$, $545,1119,23,1269,1684,1204,1859,1217,205,847,836,1373]$, (E.9)
- $k=11$
$\mathbf{c}_{11}^{f}(1366: 2048)=[1071,705,249,1324,984,617,1658,1444,424,693,657,94,764,744,912,1018,973,583,1113$, $1259,651,1798,999,484,1440,1370,787,1683,873,1258,1547,669,765,3,333,1803,1183,677,111,911,620,1283$, $901,1426,788,582,1956,54,1418,647,321,1514,1279,1141,694,20,503,1493,282,917,900,1064,1473,56,606$, $474,830,95,2033,786,1262,881,1498,794,1530,1699,1448,713,1208,580,502,419,444,844,1397,1739,2022,93$, $1304,150,865,352,555,2002,306,1550,1227,1495,823,1180,1639,616,609,1566,1824,1864,593,806,161,478$, $131,1139,1828,380,234,674,1747,945,505,1173,1771,45,1727,519,967,29,1074,1586,1901,1815,2020,964,59$, $951,429,1726,1049,1004,1848,1012,384,691,1172,157,1950,203,361,1464,1829,58,407,76,1615,26,1480$, $1578,508,1266,1496,707,1633,238,1920,368,1819,533,745,751,1709,962,2026,221,983,790,19,12,1934,777$, $1037,367,266,868,871,1254,486,631,1713,1291,798,122,1897,428,398,1887,1904,1028,922,1189,83,1135$, $172,251,597,113,1561,1110,1592,959,755,688,1374,827,109,793,1202,587,427,84,1441,210,1840,106,1593$, $527,1272,701,1687,743,1701,1300,1077,136,1921,1595,479,2030,135,1157,753,469,158,1002,395,660,14$, $785,1581,1335,301,1587,2031,1432,1123,768,2034,569,1818,472,232,586,1003,869,1942,1656,1540,1789$, $1209,82,783,1757,1364,1107,403,1366,528,463,1673,201,1218,313,1568,1158,206,818,1764,491,1505,543$, $53,1280,1468,1786,680,1937,389,1092,1954,886,1437,223,448,1246,1414,1899,1718,825,247,365,1252,322$, $1052,50,698,350,1765,621,1963,524,1430,49,1806,1928,1118,1614,892,92,908,948,1539,1502,704,1068$, $2037,1353,598,89,1769,1876,1016,819,162,1855,305,643,1019,969,344,1902,1667,1453,176,915,1297,816$, $373,1590,1067,418,1378,1906,1839,1104,214,18,226,904,1725,457,1521,1360,1679,718,784,918,1354,1400$, $1463,991,108,1712,1332,1580,408,1216,290,1520,1506,1971,726,985,1137,1604,717,1193,1120,1125,1379$, $1006,171,588,1155,1041,1225,190,46,414,654,21,1723,1842,919,775,1401,804,420,116,1171,1431,932,618$, $1525,1627,1083,1576,1625,963,1737,1084,808,840,1659,1140,703,1344,1872,1640,289,1688,75,846,937,924$, $1289,287,1051,1575,1236,451,1753,1069,534,710,1564,1888,1559,1932,1086,1841,1501,1783,1951,955,671$, $1306,864,1073,1200,1873,235,1305,1412,1632,1669,96,17,1775,212,293,475,1435,1644,1613,1185,411,554$, $1773,1882,259,2005,736,1788,1720,760,1708,65,182,1999,1249,766,1705,500,461,307,159,1953,1487,977$, $910,1047,1358,164,1470,1203,1243,1756,387,482,85,1133,1711,1240,1793,1883,1395,291,442,604,665,1655$, $1533,572,1624,1136,1663,1198,1422,697,927,1780,1947,600,493,2003,309,416,273,110,334,44,1206,1813$, $31,1770,541,129,1545,1895,243,913,1924,1122,1333,531,1190,1857,211,1654,795,1232,1486,101,192,1187$, $902,397,780,1199,1777,2042,1322,1766,635,1072,559,1875,1103,193,1825,1142,1616,936,699,1224,778,1460$, $1393,126,890,1717,1812,1869,441,1626,124,1696,990,9,456,1489,1736,796,430,897,1352,1296,947,1853$, $1471,1796,1854,154,2023,895,773,1318,1267,1066,581,757,1891,1424,1668,1106,489,1536,645,1129,1248$, $1398,184,813,542,470,1390,624,552,168,320,371,535,1181,1404,1622,1811,789,1385,968,283,771,953,455$, $1664,98,1459,1529,67,546,143,261,260,288,303,801,812,887,1013,1177,1284,1320,1554,1749,1816,1959]$.


## APPENDIX F

## LIST OF PUBLICATIONS

- Publications from the Graduate Work

1. Panayiotis D. Papadimitriou and Costas N. Georghiades, On Binary Code Design for the Noncoherent Block Fading Channel with ML Decoding, submitted to the IEEE JSAC 2005 special issue on Differential and Noncoherent Wireless Communications.
2. P.D. Papadimitriou, C.N. Georghiades, On Asymptotically Optimum Rate $1 / n$ Convolutional Codes for a Given Constraint Length, IEEE Communications Letters, Vol. 5, No. 1, pp. 25-27, Jan. 2001.
3. Panayiotis D. Papadimitriou and Costas N. Georghiades, Block Code Design based on Metric-Spectrum, Proceedings of the IEEE Global Communications Conference (GLOBECOM), Nov. 29 - Dec. 3, 2004, Dallas, TX, USA.
4. Panayiotis D. Papadimitriou and Costas N. Georghiades, New linear binary block codes for the AWGN channel, Proceedings of the 38th Asilomar Conference on Signals, Systems and Computers, November 7-10, Pacific Grove, CA, 2004.
5. Panayiotis D. Papadimitriou and Costas N. Georghiades, On a Unified View of Synchronous Multiple-Access Channels: A Bandwidth Efficiency Perspective, Proceedings of the IEEE Wireless Communications and Networking Conference (WCNC), March 21-25, 2004, Atlanta, GA, USA.
6. Panayiotis D. Papadimitriou and Costas N. Georghiades, On Optimal Chip Equalization for Equal-Power Synchronous CDMA Systems, Proceedings of the 38th Annual Conference on Information Sciences and Systems (CISS), March, 17-19, 2004, Princeton University, NJ, USA.
7. Panayiotis D. Papadimitriou and Costas N. Georghiades, Zero-padded OFDM with Improved Performance over Multipath Channels, Proceedings of the IEEE Consumer Communications and Networking Conference (CCNC), January, 5-8, 2004, Las Vegas, NV, USA.
8. Panayiotis D. Papadimitriou and Costas N. Georghiades, On Binary Code Design for the Non-Coherent Block Fading Channel, Proceedings of the IEEE Global Communications Conference (GLOBECOM), December 1-5, 2003, San Francisco, CA, USA.
9. Panayiotis D. Papadimitriou and Costas N. Georghiades, Complex Block Codes with Low Cross-Correlation Spectrum for S-CDMA Systems, Proceedings of the Asilomar Conference on Signals, Systems, and Computers, November 9-12, 2003, Pacific Grove, CA, USA.
10. Panayiotis D. Papadimitriou and Costas N. Georghiades, Code-search for Optimal TSC Binary Sequences with Low Cross-Correlation Spectrum, Proceedings of the Military Communications Conference (MILCOM), October 13-16, 2003, Boston, MA, USA.
11. Panayiotis D. Papadimitriou and Costas N. Georghiades, A TDMA-based Physical Layer Solution for High-Rate Synchronous CDMA Systems, Proceedings of the IEEE Wireless Communications and Networking Conference (WCNC), March 16-20, 2003, New Orleans, Louisiana, USA.
12. C.N. Georghiades and P.D. Papadimitriou, On the Use of Trellis-Coded

Modulation for $3 G$ CDMA Systems, Proceedings of the Nortel Networks Wireless Forum, October 1999, Dallas, Texas, USA.

## - Other Publications

1. Panayiotis D. Papadimitriou, Prabodh Varshney and Mohammad Jaber Borran, Linear MMSE Chip Equalization and Parallel Interference Cancellation as applied to $1 x E V-D V$, Proceedings of the IEEE Semiannual Vehicular Technology Conference (VTC), October 6-9, 2003, Orlando, FL, USA.
2. Prabodh Varshney, Mohammad Jaber Borran, Hannu Vilpponen, and Panayiotis D. Papadimitriou, Performance Comparison between MC-CDMA and $1 x E V-D V$, Proceedings of the 14th IEEE International Symposium on Personal, Indoor and Mobile Radio Communications (PIMRC), September 7-10, 2003, Beijing, China.
3. Mohammad Jaber Borran, Prabodh Varshney, Hannu Vilpponen, and Panayiotis D. Papadimitriou, Channel Estimation and Signal Detection for MultiCarrier CDMA Systems with Pulse-Shaping Filter, Proceedings of the IEEE International Conference on Communications (ICC), May 11-15, 2003, Anchorage, AK, USA.
4. P.D. Papadimitriou, T.A. Sexton, P. Varshney, and H. Vilpponen, Turbo Coded Modulation over GSM Channels, Proceedings of the International Conference on Third Generation Wireless and Beyond, May 30-June 2, 2001, San Francisco, USA.
5. P.D. Papadimitriou and P. Varshney, Turbo Coded Modulation for HighThroughput TDMA Systems, Proceedings of the IEEE Vehicular Technol-
ogy Conference (VTC), May 6-9, 2001, Rhodes, Greece.

## APPENDIX G

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## VITA

Panayiotis D. Papadimitriou was born in Ancient Corinth, Hellas (Greece), in 1973. He received his B.S. in physics, M.S. in electronics in 1995 and 1997 from University of Patras, Hellas, and Ph.D. in electrical engineering in 2004 from Texas A\&M University, College Station, TX. From 1998 to 2000 he was with the Wireless Communications Laboratory (WCL) of the Electrical Engineering Department of Texas A\&M University as a Research Assistant. From May 2000 to August 2003 he was with Nokia Mobile Phones, and since September 2003 he is with Nokia Research Center, Irving, TX, as a Research Engineer. He has been reviewer for major IEEE journals and conferences, and has 8 patents pending. His current research interests are in the areas of channel coding, and baseband signal processing.

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The typist for this dissertation was Panayiotis D. Papadimitriou.


[^0]:    *(C)2004 IEEE. Part of this chapter is reprinted, with permission, from "Block Code Design based on Metric-Spectrum", by Panayiotis D. Papadimitriou and Costas N. Georghiades, in Proceedings of the IEEE Global Communications Conference (GLOBECOM), Nov. 29 - Dec. 3, 2004, Dallas, TX, USA.

[^1]:    ${ }^{1}$ The case of strictly increasing function is straightforward.
    ${ }^{2}$ Definition of Metric [2]: A function $d: \mathcal{A} \times \mathcal{A} \rightarrow \mathbb{R}$ that maps two elements $a, b$ from a set $\mathcal{A}$ to a real number $d(a, b)$ is called a metric of $\mathcal{A}$ if the following axioms are satisfied:

    1. $d(a, b) \geq 0, d(a, b)=0 \Leftrightarrow a=b$,
    2. $d(a, b)=d(b, a)$,
    3. $d(a, b) \leq d(a, z)+d(z, b)$.
[^2]:    ${ }^{3}$ Note that if the pairwise error probability was strictly increasing in $\mu$, then as we shall see later, we would be interested in the maximum of $\mu$.

[^3]:    ${ }^{4}$ Note that the repetition coding is in general considered as a pure coding technique, since someone can perform better with more sophisticated coding.

[^4]:    *(C2004 IEEE. Part of this chapter is reprinted, with permission, from "Block Code Design based on Metric-Spectrum", by Panayiotis D. Papadimitriou and Costas N. Georghiades, in Proceedings of the IEEE Global Communications Conference (GLOBECOM), Nov. 29 - Dec. 3, 2004, Dallas, TX, USA., and from "On Binary Code Design for the Non-Coherent Block Fading Channel", by Panayiotis D. Papadimitriou and Costas N. Georghiades, in Proceedings of the IEEE Global Communications Conference (GLOBECOM), December 1-5, 2003, San Francisco, CA, USA.

[^5]:    ${ }^{1}$ For a code with $n$ odd, $\lambda$ is necessarily odd, from the definition of the normalized cross-correlation, and for $n$ even, $\lambda$ is similarly even. For the sake of simplicity though we do not make this distinction.

[^6]:    ${ }^{2}$ Method 1 was used for $k \leq 4$, method 2 for $k \leq 5$, and method 3 for $k \leq 9$. Above these values complexity is a problem (for the current computer power).

[^7]:    ${ }^{3}$ Here $(k=4,5)$ best means the best code found over the corresponding search. For $k=3$ though, we had verified by full search the optimality of the corresponding $\rho$-spectrum.

[^8]:    ${ }^{4}$ For the $\mathcal{C}_{M, M}$ codes $\mathcal{H}_{M}$ and $\mathcal{I}_{M}$, the search over the code columns is equivalent to the search over the columns of the corresponding generator matrix $\mathbf{m}^{T}$.

[^9]:    *(C)2004 IEEE. Part of this chapter is reprinted, with permission, from "Block Code Design based on Metric-Spectrum", by Panayiotis D. Papadimitriou and Costas N. Georghiades, in Proceedings of the IEEE Global Communications Conference (GLOBECOM), Nov. 29 - Dec. 3, 2004, Dallas, TX, USA., from "New linear binary block codes for the AWGN channel", by Panayiotis D. Papadimitriou and Costas N. Georghiades, in Proceedings of the 38th Asilomar Conference on Signals, Systems and Computers, November 7-10, Pacific Grove, CA, 2004., and from "On Binary Code Design for the Non-Coherent Block Fading Channel", by Panayiotis D. Papadimitriou and Costas N. Georghiades, in Proceedings of the IEEE Global Communications Conference (GLOBECOM), December 1-5, 2003, San Francisco, CA, USA.

[^10]:    ${ }^{1}$ For reference purposes we mention that all the rate $k / n$ codes, $k+1 \leq n \leq 2^{k}$, of the (forward) nested search for $k=10$ and $k=13$, were obtained using a PC Pentium ${ }^{\circledR} 4$ at 2.26 GHz , in 22 seconds, and less than 6 hours respectively.

[^11]:    ${ }^{2}$ The lower and upper bounds are coexisting.

[^12]:    ${ }^{3}$ All the codes from $n=2$ to $n=1024$ were found in approximately 10 seconds, using a PC with Pentium ${ }^{\circledR} 4$ processor at 2.26 GHz .

[^13]:    ${ }^{4}$ When there is no $k$ value in the legend, the corresponding code is based on $\mathcal{S}_{M}$, else on $\mathcal{I}_{M}$.

[^14]:    *(C2004 IEEE. Part of this chapter is reprinted, with permission, from "On a Unified View of Synchronous Multiple-Access Channels: A Bandwidth Efficiency Perspective", by Panayiotis D. Papadimitriou and Costas N. Georghiades, in Proceedings of the IEEE Wireless Communications and Networking Conference (WCNC), March 21-25, 2004, Atlanta, GA, USA., from "Complex Block Codes with Low CrossCorrelation Spectrum for S-CDMA Systems", by Panayiotis D. Papadimitriou and Costas N. Georghiades, in Proceedings of the Asilomar Conference on Signals, Systems, and Computers, November 9-12, 2003, Pacific Grove, CA, USA., and from "Code-search for Optimal TSC Binary Sequences with Low Cross-Correlation Spectrum", by Panayiotis D. Papadimitriou and Costas N. Georghiades, in Proceedings of the Military Communications Conference (MILCOM), October 13-16, 2003, Boston, MA, USA.
    ${ }^{1}$ The so-called Welch's lower bound on total square correlation (TSC), is a byproduct of Welch's lower bound on the maximum cross-correlation of a complex set proof [42].

[^15]:    ${ }^{2}$ Meaning $\mathbf{c}$ is not a column of $\mathcal{C}_{K, j-1}$.

[^16]:    ${ }^{3}$ Since we deal with binary codes, and we need real codewords, we just replace each codeword bit $x$ by $2 x-1$.

[^17]:    ${ }^{4}$ For affordable search complexity.

[^18]:    ${ }^{5}$ Similar conclusions can be drawn for the case of $n=N+2, N=4\left\lfloor\frac{n+1}{4}\right\rfloor$, [53].

[^19]:    ${ }^{6}$ It comprises of a conventional first stage and four interference cancellation stages.

[^20]:    ${ }^{7}$ It has been common to call these codes (sequence sets) as Welch Bound Equality (WBE) sequence sets, see e.g. [63], due to the so called Welch's lower bound on total square correlation (TSC). However, since by the Welch bound we generally mean Welch's lower bound on the maximum square cross-correlation (see e.g. [45, 44]), we prefer to use a different name for codes satisfying (6.12).

[^21]:    ${ }^{8}$ Note that the Welch bound [42] for $\mathcal{C}_{M, M-1}$ codes is $\rho_{\max } \geq \frac{1}{M-1}$.

[^22]:    ${ }^{9}$ In practice the $K$-ary symbol vector $\mathbf{b}$ maybe assigned to up to $K$ users.

[^23]:    ${ }^{10}$ The channel remains constant over the duration of $(P+D)$ chips.

[^24]:    ${ }^{11}$ We call it fully-loaded since we use $K=M=64$, however in other context the same case maybe called over-loaded since $K>P$.

[^25]:    *(C2004 IEEE. Reprinted, with permission, from "On Asymptotically Optimum Rate $1 / \mathrm{n}$ Convolutional Codes for a Given Constraint Length", by P.D. Papadimitriou and C.N. Georghiades, in IEEE Communications Letters, Vol. 5, No. 1, pp. 25-27, Jan. 2001.

