

# Efficient Addressing of Multi-dimensional Signal Constellations Using a Lookup Table

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**Abstract:** This paper describes a lookup table for the addressing of an optimally shaped constellation. The method is based on partitioning the subconstellations into shaping macro-shells of integer bit rate and increasing average energy. A lookup table is used to select a subset of the partitions in the cartesian product space. By devising appropriate partitioning/merging rules, we obtain suboptimum schemes of very low addressing complexity and small performance degradation. The performance is computed using weight distribution of an optimally shaped constellation.

## 1 Introduction

In shaping, one tries to reduce the average energy of a signal constellation for a given number of points from a given packing. The price to be paid for the reduction in the average energy (measured by the shaping gain,  $\gamma_s$ ) involves: (i) an increase in the factor CER, <sup>2</sup>, (Constellation-Expansion-Ratio), and (ii) an increase in the addressing complexity<sup>3,4</sup>. Addressing is often the most difficult task associated with the shaping of a high-dimensional constellation. For example, for 2-D subconstellations composed of 256 points in a 32-D space, a direct addressing scheme using a lookup table requires a block of memory with about  $2^{128}$  memory locations (with each location having a word length of 128 bits). In the present work, we introduce suboptimum methods to reduce this memory size to about 0.8 kilo-bytes per 32-D while the degradation in performance is negligible. Previous work: Conway and Sloane in [2] introduced the idea of Voronoi constellations based on using the Voronoi region of a lattice  $\Lambda_s$  as the shaping region. In the work of Wei [3] shaping is a side effect of the method employed to transmit a nonintegral number of

bits per two dimensions. The addressing of this method is achieved by a lookup table. Forney and Wei generalize this method in [1]. Voronoi constellations are further considered by Forney in [4]. In [5], Calderbank and Ozarow introduce a shaping method which is directly achieved on the 2-D subconstellations. In this method, the 2-D subconstellations are partitioned into equal sized subregions of increasing average energy. A shaping code is then used to specify the sequence of the subregions. The shaping code is designed so that the lower energy subregions are used more frequently. The idea of trellis shaping is introduced in [6]. This idea is based on using an infinite-dimensional Voronoi region determined by a convolutional code to shape the constellation. Lang and Longstaff in [7] use an addressing scheme which is based on decomposing the space into lower-dimensional subspaces via generating function techniques.

In [8], Kschischang and Pasupathy discuss a shaping method which is based on using the 2-D points with nonequal probability. In [9], Livingston discusses a shaping method in which the 2-D subspaces are partitioned into circular shells of increasing size. In this method, the 2-D shells are used with equal probability inducing a nonuniform distribution on the 2-D points. In a continuation to [5] and [9], Calderbank and Klimesh in [10] use a balanced binary code to select the sequence of the 2-D circular shells. This scheme results in a fixed rate per signaling interval.

In our previous work [11], some practical addressing schemes to achieve or approximate points on the optimum tradeoff curves are given. The addressing scheme of Lang and Longstaff is further discussed by Kschischang and Pasupathy in [12] (also refer to [13]). Laroia, Farvardin and Tretter in [14] apply ideas from a type of structured vector quantizer to constellation addressing.

In comparing different schemes, we need to compute  $\gamma_s$  accurately. Previous methods [15], [11], [12] (also refer to [13]) are based on a continuous approximation. To perform an exact computation, we need the corresponding weight distribution.

<sup>2</sup>CER<sub>s</sub> is ratio of the number of points used per two dimensions to the minimum necessary number of points per two dimensions [1].

<sup>3</sup>Addressing is the mapping of the data bits to the constellation points.

<sup>4</sup>A third factor is the increase in PAR (Peak-to-Average-power-Ratio) which is uniquely determined by  $\gamma_s$ , CER<sub>s</sub> and structure of the 2-D subconstellations [1]. Due to this dependence, we concentrate on the  $\gamma_s$ , CER<sub>s</sub> relationship.

## 2 Weight distribution of an optimally shaped constellation

The weight distribution of a set of points  $\Lambda$  with respect to a given center is defined as:

$$\Theta_{\Lambda}(q) = \sum_{u \in \Lambda} q^{\|u\|^2} = \sum_{\nu} C_{\Lambda}(\nu) q^{\nu}, \quad (1)$$

where  $\|u\|^2$  is the norm of the vector associated with point  $u$  and  $C_{\Lambda}(\nu)$  is the number of points of  $\Lambda$  with norm  $\nu$ .

The baseline constellation of cardinality  $M$ , denoted as  $B_2(M)$ , is defined as the set of  $M$  points of the least energy from the 2-D half integer grid,  $Z^2 + (1/2)^2$ . An optimally shaped,  $N$ -D constellation is a subset of points of  $\{B_2(M)\}^n$ ,  $n = N/2$ , of the least energy. We have,

$$\Theta_{\{B_2(M)\}^n}(q) = [\Theta_{B_2(M)}(q)]^n. \quad (2)$$

It can be shown that the energy shells of  $Z^N + (1/2)^N$  are of values  $2i + N/4$ ,  $i = 0, 1, \dots$ , where  $i$  is used as the index of the corresponding shell. If  $B_2$  is composed of  $K$  energy shells, we obtain  $n(K-1) + 1$  shells of values  $2i + N/4$ ,  $i = 0, \dots, n(K-1)$  for  $\{B_2(M)\}^n$ . In  $\{B_2(M)\}^n$ , unlike  $Z^N + (1/2)^N$ , shells of indices  $K \leq i \leq n(K-1)$  are partially included and shells with indices  $i > n(K-1)$  are completely discarded.

Define  $C_{B_2(M)}(i)$  as the cardinality of the  $i$ 'th shell of  $B_2(M)$ . Using Eq. 2, we obtain:

$$C_{\{B_2(M)\}^n}(i) = \text{DFT}_L^{-1} \{ \text{DFT}_L [C_{B_2(M)}(i)] \}^n, \quad (3)$$

where  $L = n(K-1) + 1$  and  $\text{DFT}_L$ ,  $\text{DFT}_L^{-1}$  are the  $L$ -point discrete Fourier transform and its inverse. Note that  $C_{B_2(M)}(i)$  is padded out with zeros.

## 3 Recursive merging of energy shells

Consider a  $B_2(M)$  set composed of  $K$  energy shells. In an  $N = 2n$ -D space, cartesian product of the 2-D shells results in  $K^n$  shaping clusters which aggregate into  $L = n(K-1) + 1 \leq K^n$  shells. A known method to decrease the addressing complexity is based on merging the adjacent 2-D shells into a small number of energy layers (macro-shells) [5]. Motivated by the sequential nature of shell aggregation, the merging of shells in [11] (also refer to [14]) is achieved gradually in a hierarchy of stages achieved on the 2-fold cartesian product of the lower dimensional subspaces. In [11], to simplify the addressing, the cardinalities of the macro-shells are restricted to be an integral power of two. In this case, using macro-shells of equal cardinality results in a especially simple scheme. We first explain this approach and then show how one can improve upon it.

Consider an  $N = 2^u$ -D constellation. We recursively merge energy shells. There are  $2^k$  macro-shells of

equal cardinality in the  $N_i = 2^{i+1}$  dimensional subspaces,  $i = 0, \dots, u-2$ . In the two-fold cartesian product of the  $N_i$ -D subspaces, we obtain  $2^{2k_i}$  clusters of equal cardinality. These clusters are arranged in the order of increasing average energy. Then,  $2^{k_i - k_{i+1}}$ ,  $i = 0, \dots, u-3$ , subsequent clusters are merged into a higher stage ( $2N_i = N_{i+1}$ -D) macro-shell. The final constellation is obtained by discarding the  $N$ -D clusters with the highest average energy. To achieve the addressing, we need a set of lookup tables to store the components of each macro-shell. The  $i$ 'th addressing stage,  $i = 0, \dots, u-3$ , requires a lookup table with  $2^{2k_i}$  memory locations each with  $2k_i$  bits. The last stage requires  $2^{2k_{u-2}}$  memory locations each with  $2k_{u-2}$  bits where  $r_s = (N/2) \log_2(\text{CER}_s)$  and  $\text{CER}_s$  is restricted to have values such that  $r_s$  is an integer.

In our experience, for a fixed set of  $k_i$  values,  $i = 0, \dots, u-3$ , the order in which they are used has almost no effect on the overall performance. Considering that the memory size is a symmetrical function of these values, it is appropriate to select them equal to each other. If they are selected to be nonequal (to provide a specific tradeoff between complexity and performance), there is a small benefit of using the larger values in the later stages of the hierarchy.

In general, we are looking for efficient, recursive merging rules which result in macro-shells of integer bit rate. Using macro-shells of equal cardinality (uniform merging) is not the best merging rule as is explained in the next section.

## 4 Uniform versus nonuniform merging of clusters

Consider the 2-fold cartesian product of a  $\{B_2(M)\}^{N/4}$  set. Each of the two  $\{B_2\}^{N/4}$  is partitioned into  $K$  macro-shells. Consider two merging rules. In Case I, macro-shells contain a fixed number of points in the order of increasing energy. In Case II, macro-shells contain a fixed number of energy shells. In both cases, in the 2-fold cartesian product space, we obtain  $K^2$  clusters. A subset of these clusters of the lowest average energy is selected. Computation of the performance is based on Eq. 3. The final result is shown in Fig. 1 which shows the tradeoff between  $\text{CER}_s$  and  $\gamma_s$ . It is seen that using macro-shells with a fixed number of energy shells (Case II) results in a better performance. This phenomenon can be justified by considering the hardening effect. It should be mentioned that neither of these two merging rules are optimum (in the sense of providing the best tradeoff for a given value of  $K$ ). The performance of a given merging rule also depends on the specific tradeoff point. Figure 2 shows the density of points in the energy shells of  $\{B_2(256)\}^{N/2}$ . It is seen that the points concentrate in a thin energy layer of the space.

Another consideration is the result of the following

fact: Discarding the clusters of higher energy induces a nonuniform probability distribution on the lower dimensional subspaces such that the clusters of lower energy are used more frequently. This fact is in favor of using a higher resolution in the areas of lower energy. This observation, in conjunction with the hardening effect, suggest decreasing the resolution rather quickly up to regions around the concentration layer and then change it in a slower pace.

In the following, we discuss a practical method for the nonuniform merging of clusters into macro-shells of integer bit rate.

## 5 Merging of clusters using a binary tree

Assume that there are  $2^k$  macro-shells of equal cardinality at a given stage of our hierarchy. In the 2-fold cartesian product space, we obtain  $2^{2k}$  clusters which are merged into  $2^l$  macro-shells of integer bit rate. Define  $2^{-\ell_i}$  to be the fraction of the number of clusters in the  $i$ th macro-shell,  $i=0, \dots, 2^l - 1$ . The  $\ell_i$ 's satisfying  $\sum_i 2^{-\ell_i} = 1$ . A simple argument shows that the  $\ell_i$ 's can be selected as the lengths of different paths in any binary tree with  $2^l - 1$  intermediate nodes (resulting in  $2^l$  final nodes). As the number of such trees is usually quite small, one can use an exhaustive search to find the best tree for a specific tradeoff between  $CER_s$  and  $\gamma_s$ . This configuration allows to use a set of prefix codes for the addressing of the macro-shells. The idea of using a prefix coding scheme for the addressing is also discussed in a different context in [11]. The approach presented here is much more efficient.

This nonuniform merging rule is applied in the  $(u-2)$ th stage (stage indexed by  $u-3$ ) of the hierarchy. The corresponding merging rule for the  $(u-1)$ th stage is as follows: If there are an integral power of two of successive macro-shells with equal cardinality, these are merged into a single, larger macro-shell. One can also apply this rule successively several times. The number of successive times is denoted by  $S$ . The performance and complexity of this approach is shown in Table 1. We have also examined: (i) the case of  $S=0$ , and (ii) applying the nonuniform merging in the  $(u-1)$ 'th stage. In both cases the results were inferior to those presented here.

## 6 Numerical comparisons

A four state trellis diagram of [6] achieves  $\gamma_s = 0.95$  dB,  $CER_s = 1.5$ . In [14], an example for  $N=64$  is given which needs 480 multiply-adds and a memory of 1.5 kilo-bytes to achieve a tradeoff point with  $CER_2 = 1.5$  near to the optimum curve (the optimum  $\gamma_s$  for  $N=64$ ,  $CER_s = 1.5$  is equal to 1.21 dB).

$CER_s$	$\gamma_s$ (dB)/Memory (Byte)
1.1	0.73 (0.73) dB / 0.77 k
1.2	0.88 (0.91) dB / 0.88 k
1.3	0.95 (1.00) dB / 0.72 k
1.4	0.99 (1.05) dB / 0.84 k

Table 1: Performance and complexity of the nonuniform merging rule,  $N=32$ ,  $(k_0, k_1, k_2, l) = (4, 4, 7, 3)$ . The optimum values of  $\gamma_s$  are written in parenthesis.

For a given  $CER_s$ , by appropriately choosing the merging parameters, we achieve nearly all of the shaping gain possible using a small amount of memory (refer to Table 1). Computation of the optimum  $\gamma_s$  is based on Eq. 3.

## 7 Summary and conclusions

We have presented efficient addressing schemes based on partitioning the subconstellations into nonuniform shaping macro-shells of integer bit rate. The corresponding shaping performance is computed using the weight distribution of an optimally shaped constellation. As an example of performance in a 32-D space, we use about 0.8 kilo-bytes of memory to achieve tradeoff points very close to the optimum performance. It seems that this is the simplest known method to achieve shaping gains in the order of 1.0 dB. Note that this method needs only a small number of table lookups and no arithmetic operation is needed.

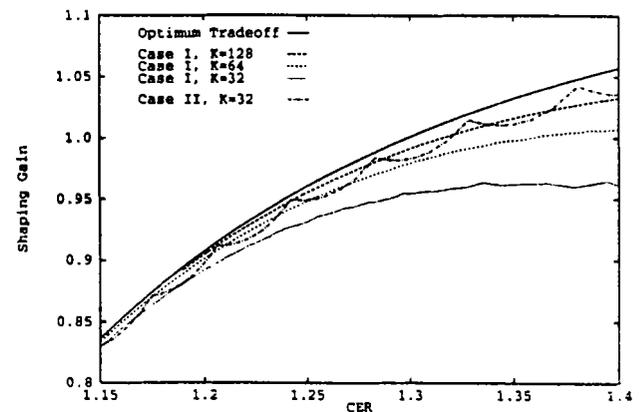


Figure 1: Tradeoff between  $CER_s$  and  $\gamma_s$  using  $K$  macro-shells in the  $N/2$ -D subspaces,  $N=32$ . Case I corresponds to macro-shells with a fixed number of points and Case II corresponds to macro-shells with a fixed number of energy shells.

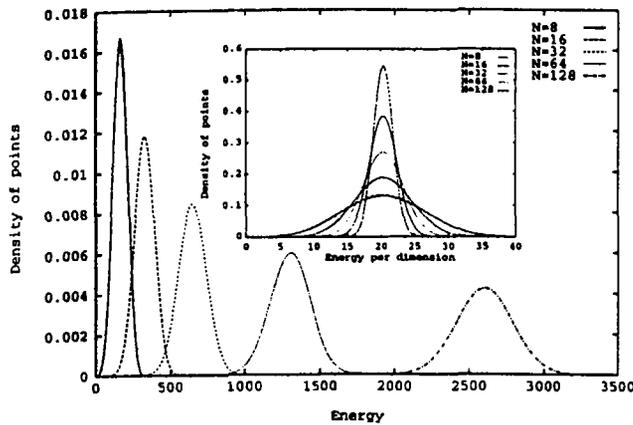


Figure 2: Density of points of  $\{B_2(256)\}^{N/2}$  as a function of energy or energy per dimension,  $N = 8, 16, 32, 64, 128$ .

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