# Selection of Costas Arrays to Minimize Cross-Interference 

## An Elementary Example

James K Beard
jkbeard@ieee.org

## Topics (1 of 2)

- Definition and Use of Costas Arrays
- Underlying Mathematics
- Finite Fields
- A Few Interesting Identities
- The Costas Condition
- The Difference Triangle
- Matrix Form
- SVD of the Matrix Form


## Topics (2 of 2)

- Cross-Correlation of Different Costas Arrays
- Selection of Costas Arrays Using the SVD
- The Databases
- Using Weighted Right Eigenvectors
- An Elementary Example
- Cross-Correlation Between Simple Waveforms
- Example of the Process
- References


## Base Generators

- Welch 1; for a one at (i,j)
- $i=\alpha^{j+c-1} \bmod p$
- Integers a a principal element, p a prime, c an offset
- Periodic in j and c, period (p-1)
- Lempel-Golomb 2
- $\alpha^{i}+\beta^{j}=1$
- Alpha and Beta Principal Elements in GF(q)
- Zero not allowed for i or j, Costas array of order q-2
- Order q a power of a prime


## Generators Use Finite Fields

| Generators | Mechanism | Order |
| :--- | :--- | :--- |
| Taylor 0, Welch 0, Rickard- <br> Welch 0 | Welch 1, add dot | p, a prime |

Welch 1 based require $q=p$, Lempel-Golomb based allow $q=p^{k}, k>0$

## "Searching" Generalizations

- The Searching Generalizations
- Not based on universally applicable logic with proof
- Their use does not always produce a Costas array
- They do not produce Costas arrays of order greater than 57
- The Methods
- Add or subtract dots with ad hoc reasoning
- Operate on known Costas arrays before adding dots according to a specified rationale


## The Searching Generalizations

| Generator | Maximum Order |
| :--- | :--- |
| Welch 0 | 53 |
| Taylor 0 | 47 |
| Taylor 1 | 52 |
| Taylor 4 | 57 |
| Beard additive 1 | 52 |
| Beard subtractive 1 | 52 |
| Rickard-Welch 0 | 53 |
| Rickard-Lempel-Golomb 1 | 52 |

## Finite Fields

- Sets of objects with commutative addition, subtraction, multiplication, division
- A zero, which is an additive identity element
- A one, which is a multiplicative identity element
 integer ${ }^{1}$
- Simplest example is arithmetic modulo a prime
- Base properties include ${ }^{1}$
- $\mathrm{xq}=\mathrm{x}$, so $\mathrm{xq-2=1/x}$, with multiplication defines division
- Any set GF(q) is isomorphic to any other such set


## Major Reference for Finite Fields

[1] Moore, E. H. (1896), "A doubly-infinite system of simple groups", in E. H. Moore; et al. (eds.), Mathematical Papers Read at the International Mathematics Congress Held in Connection with the World's Colombian Exposition, Macmillan \& Co., pp. 208-242
http://2020ok.com/books/20/mathematical-papers-read-at-the-international-mathematical-congress-held-in-connection-with-the-world-s-columbian-exposition-chicago-1893-edited-by-the-committee-of-the-congress-e -hastings-moore-os-41520.htm
"It is necessary that all quantitative ideas should be excluded from the concept marks [elements of GF(q)]. Note that the signs >, < do not occur in the theory."

## Vector Extensions

- Lempel-Golomb generators use GF(q), q=pk, k>0, can use vector extensions
- Most implementations of GF(q) use Conway polynomials
- Order k-1 polynomials characterized by k coefficients that are integers modulo p
- Addition, subtraction, multiplication done by polynomial arithmetic, then coefficients are taken modulo $p$
- Multiplication results resolved to order k-1 by taking modulo an irreducible monic generating polynomial, of order $k$
- Division by any element $\alpha$ is multiplication by $\alpha$ a-2


## The Costas Condition

- Base definition
- Given a simple frequency jump burst waveform and a matched filter, then, with mismatch in either or both range and Doppler (frequency), no more than one pulse in the burst will correlate in the matched filter.
- Commonly used ways of posing the Costas Condition
- The difference triangle
- Difference vectors
- Discrete Ambiguity Function (DAF)
- They are mathematically equivalent


## The Difference Triangle

- Based on the Costas array vector c(j)
- Difference triangle has n-1 rows
- Each row number i has (n-i) elements
- Each row consists of differences
- Row i, column j: d(i,j)=c(j+i)-c(j)
- Costas condition:
- No two elements of any given row are equal
- No element is zero because elements of c(j) aren't repeated


## Example of Difference Triangle



| Costas array: | 1 | 2 | 5 | 7 | 6 | 4 | 8 | 3 |  |
| :--- | :--- | :--- | :--- | :--- | ---: | ---: | ---: | ---: | ---: |
| Row | 1 | 1 | 3 | 2 | -1 | -2 | 4 | -5 |  |
| Row | 2 | 4 | 5 | 1 | -3 | 2 | -1 |  |  |
| Row | 3 | 6 | 4 | -1 | 1 | -3 |  |  |  |
| Row | 4 | 5 | 2 | 3 | -4 |  |  |  |  |
| Row | 5 | 3 | 6 | -2 |  |  |  |  |  |
| Row | 6 | 7 | 1 |  |  |  |  |  |  |
| Row | 7 | 2 |  |  |  |  |  |  |  |

## Difference Vectors

- A Difference Vector is the vector between any two ones in a Costas array matrix
- The Costas condition is that no two of them are equal
- Relationship to the Difference Triangle
- Two ones
- Column j , row $\mathrm{c}(\mathrm{j})$, and column ( $\mathrm{j}+\mathrm{i}), \mathrm{c}(\mathrm{j}+\mathrm{i}), \mathrm{d}(\mathrm{i}, \mathrm{j})=\mathrm{c}(\mathrm{j}+\mathrm{i})-\mathrm{c}(\mathrm{j})$
- Distance vector $d v(i, j)=(d(i, j), i)$
- There is also the one pointing the other way, -dv( $\mathrm{i}, \mathrm{j})$


## Discrete Ambiguity Function

- The DAF is a simple concept related to the ambiguity function
- Defined as a cross-correlation between two Costas array matrices
- Result is a square matrix $2 n$ - 1 elements on a side
- Center element is n
- Rest is zeros except for ones at positions defined by all the distance vectors


## Example of Distance



## Example of DAF



## Matrix Form of the Costas Condition

- Simplest when formulated from the difference triangle
- Concept is a "tall" matrix A (many more rows than columns) times the Costas array vector as a column vector
- Result of $A \cdot \vec{C}$ is a long column of integers
- Costas condition is that no element of the result vector is zero


## Definition of the Matrix

- First n•(n-1)/2 rows
- Elements are zeros, a +1, and a -1, elements of the result vector are elements of the difference triangle
- Elements of the result vector are nonzero because Costas array matrices have only a single one in each row (or column), so no two elements of $c(j)$ are equal
- Next (n-2)•(n-1)•n/6 rows are differences between two elements in each of the first $n \cdot(n-1) / 2$ rows
- Total total number of rows is $(n-1) \cdot n \cdot(n+1) / 6$


## Number of Rows of A


(c) 2020 J K Beard, license CC Attribution

## Singular Value Decomposition

- Simple equation
- $\mathrm{A}=\mathrm{VL} \cdot \wedge \cdot \mathrm{VR}^{\top}$
- $V L$ is a matrix whose columns are left eigenvectors $V l_{i}$
- VL has the same shape as A
$-\Lambda$ is a diagonal $n \times n$ matrix of eigenvectors $\xrightarrow{\lambda_{i}}$
- VR is an $n \times n$ matrix of right eigenvectors $V r_{i}$
- Reconstruction equation

$$
A=\sum_{i=1}^{n} \overrightarrow{v l_{i}} \cdot \lambda_{i} \cdot \overrightarrow{v r_{i}}
$$

## Interpretation

- Multiplication by the right eigenvector matrix VR
- Rotates the input vector
- When VR is a left-handed coordinate system (determinant is -1 ), VR reflects the input vector in one dimension
- Result is input vector rotated/reflected into "eigenspace"
- Scales the rotated vectors by $\lambda_{i}$
- Left eigenvector matrix VL expresses the rotated and scaled input vector in left eigenvector space


## Example of SVD of A from Database

| Header | 4 | 10 | 6 |  | Order - total_rows - rows_order_1 - rows_order_2 |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | 4 | 20 | 4 | 20 | Squared lengths of right eigenvectors |
|  | 0 | 20 | 14 | 70 | Squared lengths of left eigenvectors |
|  | 0 | 4 | 14 | 14 | Squared eigenvalues |
|  | 0 | 10 | 2 | 10 | Scale factors |
|  | 1 | -3 | -1 | 1 | Row 1 of right eigenvector matrix IV |
| IVR Matrix | 1 | -1 | 1 | -3 | Row 2 of right eigenvector matrix IV |
|  | 1 | 1 | 1 | 3 | Row 3 of right eigenvector matrix IV |
|  | 1 | 3 | -1 | -1 | Row 4 of right eigenvector matrix IV |
| IVL Mayrix | 0 | 1 | 1 | -2 | Row 1 of left eigenvector matrix IVL |
|  | 0 | 2 | 1 |  | Row 2 of left eigenvector matrix IVL |
|  | 0 | 3 | 0 | -1 | Row 3 of left eigenvector matrix IVL |
|  | 0 | 1 | 0 | 3 | Row 4 of left eigenvector matrix IVL |
|  | 0 | 2 | -1 |  | Row 5 of left eigenvector matrix IVL |
|  | 0 | 1 | -1 | -2 | Row 6 of left eigenvector matrix IVL |
|  | 0 | 0 | 1 | -5 | Row 7 of left eigenvector matrix IVL |
|  | 0 | 0 | 2 |  | Row 8 of left eigenvector matrix IVL |
|  | 0 | 0 | 2 |  | Row 9 of left eigenvector matrix IVL |
|  | 0 | 0 | 1 |  | Row 10 of left eigenvector matrix IVL |
| Matrix A | -1 | 1 | 0 | 0 | Row 1 of Costas constraint matrix A |
|  | -1 | 0 | 1 | 0 | Row 2 of Costas constraint matrix A |
|  | -1 | 0 | 0 | 1 | Row 3 of Costas constraint matrix A |
|  | 0 | -1 | 1 | 0 | Row 4 of Costas constraint matrix A |
|  | 0 | -1 | 0 |  | Row 5 of Costas constraint matrix A |
|  | 0 | 0 | -1 | 1 | Row 6 of Costas constraint matrix A |
|  | -1 | 2 | -1 | 0 | Row 7 of Costas constraint matrix A |
|  | -1 | 1 | 1 | -1 | Row 8 of Costas constraint matrix A |
|  | -1 | 1 | 1 | -1 | Row 9 of Costas constraint matrix A |
|  | 0 | -1 | 2 | -1 | Row 10 of Costas constraint matrix A |

## Selection of Costas Arrays

- An elementary example
- Waveform is simple FJB
- Platforms are multiple similar systems
- Cell phones in contact with the same tower
- Radars in same theater of operations
- Communications in overlapping or shared bands
- Goals
- Eliminate crosstalk
- Minimize cross-interference


## Approach

- Use Costas arrays as frequency hopping plan for FJB waveforms
- Use a different Costas array for each platform
- Select Costas arrays that share as few distance vectors as possible
- General notes
- The time-bandwidth product of a simple FJB waveform using a Costas array is $\mathrm{n}^{2}$ times the TW product of the "chip"
- We will look at low to moderate n


## Resources

- Costas arrays
- IEEE DataPort
- Costas arrays and enumeration to order 1030
- DOI 10.21227/H21P42
- Eigenvalues and right eigenvectors
- IEEE DataPort
- Database of Singular Value Decompositions of Matrix Representations of the Costas Condition
- DOI 10.21227/h498-px29
- Both databases generated and posted by James K Beard
- Access through https://doi.org/<DOI>


## We Look at Distance Vectors

- Conceptual model
- A waveform using one Costas array
- A receiver matched filter using another Costas array
- For each shared distance vector
- Two tones at a time will correlate in the matched filter
- Single tone correlations are universal and ignored here
- Since distance vectors are not repeated in any Costas array, more than one shared distance vector for a given offset and time and frequency cannot occur


## Minimizing Shared Distance Vectors

- Basic principles
- Other signals that don't correlate effectively form a noise floor
- Peaks in cross-correlation cause spikes in the noise floor
- Shared distance vectors are a simple handle on crosscorrlelations
- A First Cut Approach
- Use database of all known Costas arrays of a given order
- Plot the number of Costas arrays that has a given number of cross-correlations with all the rest


## Order 30



## Peaks on Distributions (1 of 2)

Costas array:
Row 1
Row 2
12
$5 \quad 7$
6
483

Row 3
45
4 -5

Row 4
Row 5
Row 6
Row 7
$\begin{array}{lllll}6 & 4 & -1 & 1 & -3\end{array}$

Costas array:
6
Row 1
Row 2
Row 3
$\begin{array}{lllllll}-5 & 4 & -2 & -1 & 2 & 3 & 1\end{array}$
$\begin{array}{llllll}-1 & 2 & -3 & 1 & 5 & 4\end{array}$
Row 4
$\begin{array}{lllll}-3 & 1 & -1 & 4 & 6\end{array}$
Row 5

- $2-5$

Row 6
$\begin{array}{lll}-2 & 6 & 3\end{array}$
Row 7
17
2


## Peaks on Distributions (2 of 2)

- These two fully-correlated Costas arrays are related
- Both rows and columns are reversed
- Costas array matrix is rotated $180^{\circ}$
- If Lempel-Golomb or extension,
- From the same two principal elements, except that
- The principal element.s are replaced by their reciprocals
- If Welch or extension,
- The offset c is increased or decreased by (q-1)/2
- The principal element $\alpha$ is replace by its reciprocal aq-2
- Rows of Difference Triangle
- Same numbers
- Reversed order
- All 28 distance vectors are shared


## Costas Array Numbers vs. Order



## Order 30



## Order 20


(c) 2020 J K Beard, license CC Attribution

## Order 15



## Order 8



## A Subgroup of Interest

- Begin with a Costas array that has less than a specified threshold of $p$ shared distance vectors with any other Costas array
- Select Costas arrays that have minimum correlation with this Costas array
- Delete members of the resulting group that have excessive shared distance vectors with other Costas arrays of the same order


## Order 8, Max Correlation 13



## Raw Data

|  | 1 | 6 | 9 | 17 | 19 | 27 | 29 | 69 | 91 | 116 | 167 | 171 | 304 | 392 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | 28 | 12 | 13 | 12 | 12 | 11 | 12 | 11 | 10 | 10 | 12 | 11 | 13 | 13 |
| 6 | 12 | 28 | 11 | 13 | 13 | 13 | 11 | 13 | 10 | 11 | 11 | 13 | 10 | 13 |
| 9 | 13 | 11 | 28 | 12 | 13 | 13 | 13 | 10 | 8 | 11 | 13 | 11 | 13 | 12 |
| 17 | 12 | 13 | 12 | 28 | 13 | 11 | 12 | 10 | 11 | 13 | 10 | 13 | 12 | 12 |
| 19 | 12 | 13 | 13 | 13 | 28 | 12 | 11 | 11 | 11 | 13 | 9 | 13 | 10 | 13 |
| 27 | 11 | 13 | 13 | 11 | 12 | 28 | 12 | 11 | 11 | 10 | 13 | 8 | 12 | 13 |
| 29 | 12 | 11 | 13 | 12 | 11 | 12 | 28 | 11 | 13 | 13 | 11 | 13 | 12 | 13 |
| 69 | 11 | 13 | 10 | 10 | 11 | 11 | 11 | 28 | 13 | 13 | 11 | 12 | 11 | 12 |
| 91 | 10 | 10 | 8 | 11 | 11 | 11 | 13 | 13 | 28 | 12 | 13 | 13 | 11 | 12 |
| 116 | 10 | 11 | 11 | 13 | 13 | 10 | 13 | 13 | 12 | 28 | 12 | 11 | 12 | 11 |
| 167 | 12 | 11 | 13 | 10 | 9 | 13 | 11 | 11 | 13 | 12 | 28 | 11 | 12 | 12 |
| 171 | 11 | 13 | 11 | 13 | 13 | 8 | 13 | 12 | 13 | 11 | 11 | 28 | 13 | 11 |
| 304 | 13 | 10 | 13 | 12 | 10 | 12 | 12 | 11 | 11 | 12 | 12 | 13 | 28 | 11 |
| 392 | 13 | 13 | 12 | 12 | 13 | 13 | 13 | 12 | 12 | 11 | 12 | 11 | 11 | 28 |

## Order 15, Max Correlations 40


(c) 2020 J K Beard, license CC Attribution

## Order 20, Max Correlations 80



## Order 20, Max Correlations 80

|  | 1 | 4 | 75 | 181 | 1167 | 1621 |
| ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| 1 | 190 | 80 | 77 | 79 | 71 | 77 |
| 4 | 80 | 190 | 80 | 78 | 76 | 78 |
| 75 | 77 | 80 | 190 | 80 | 77 | 78 |
| 181 | 79 | 78 | 80 | 190 | 77 | 77 |
| 1167 | 71 | 76 | 77 | 77 | 190 | 79 |
| 1621 | 77 | 78 | 78 | 77 | 79 | 190 |

## Order 30, Max Correlations 190


(c) 2020 J K Beard, license CC Attribution

## Order 30, Max Correlation 190

|  | 1 | 7 | 27 | 81 | 524 |
| ---: | ---: | ---: | ---: | ---: | ---: |
| 1 | 435 | 190 | 185 | 189 | 187 |
| 7 | 190 | 435 | 184 | 189 | 184 |
| 27 | 185 | 184 | 435 | 180 | 188 |
| 81 | 189 | 189 | 180 | 435 | 187 |
| 524 | 187 | 184 | 188 | 187 | 435 |

## Mapping Costas Array Vectors

- Mapping is $\overrightarrow{c m_{i}}=\Lambda^{r} \cdot V R^{T} \cdot \overrightarrow{c_{i}}$
- Statistics are for
- Entire database for that order
- Designated group with limited cross-correlation
- Statistics:
- Average, or reference vector
- Mean distance from reference vector
- RMS distance from reference vector


## Equations for the Statistics

- Mean, or reference vector

$$
\overrightarrow{\operatorname{cref}}=\frac{1}{n} \cdot \sum_{i=1}^{n} \overrightarrow{c m_{i}}
$$

- Mean distance from reference vector

$$
\bar{d}=\frac{1}{n} \cdot \sum_{1}^{n}\left|\overrightarrow{c m_{i}}-\overrightarrow{c r e f}\right|
$$

- MS distance from reference vector

$$
\sigma^{2}=\frac{1}{n-1} \cdot \sum_{1}^{n}\left(\mid \overrightarrow{c m_{i}}-\overline{c r e f \mid}-\bar{d}\right)^{2}
$$

## Statistics vs Weighting



## With Variance Weighting



## With Selected Eigenvectors



## Variance Weighting \& EV Selection



## First Notes

- For the entire database, sum of mapped vectors is always zero
- When exponent is zero and eigenvector matrix is unweighted, all Costas arrays map to the same distance from the origin, variance is zero
- Mean distance to reference is greater than length of reference vector for any weighting
- Exponent of -1, as used with the left eigenvector matrix to reconstruct A , is mediocre


## Unweighted Eigenvector Matrix

- Right eigenvector matrix is orthogonal


## $V R^{T} \cdot V R=V R \cdot V R^{T}=I$

- Operating on vectors with orthogonal matrices
- Preserves vector lengths
- Preserves dot products
- Preserves magnitudes of cross products
- Algorithm zeros first eigenvector
- Corresponds to zero eigenvalue
- Maps Costas array vector indexing from -(n-1)/2 to +(n-1)/2
- All lengths are the same, variance is zero
- Not likely to be useful for Costas array selection without weighting


## Why Sum of All in Database is Zero

- The Mapping
- Mapping always zeros result of eigenvector that is all ones
- This result carries only the information of whether indexing is from 0 to ( $n-1$ ), or from 1 to $n$, and is of no value in selection for waveforms
- Full database will always contain complementary row Costas matrices
- cm(i)=n-c(i)+1
- Note that

$$
\overrightarrow{c m^{T} \cdot v r(j)=}-\overrightarrow{C^{T}} \cdot \overrightarrow{v r(j)}
$$

## Eigenvalue Weighting of 0.5

- Base statistics
- Reference vector length 8.3
- Mean distance from reference 14.4
- Mean square of distances from reference 2.54
- Compares with origin as reference, mean distance 17, mean square distance variation of 0.36
- Pick Costas arrays that map within 2.5 of reference vector, from 5.8 to 10.8


## Selector Data File, Order 8 EP 0.5

8.279 Length of reference vector
14.44 Mean distance of mapped Costas array to reference vector
2.541 RMS distance of mapped Costas array to reference vector

| 0 | 0.5932 | 7.661 | 0.06717 | 0.329 | -2.728 | 0.1936 | 1.385 Reference vector |
| ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| 0 | -0.9083 | -1.577 | 1.176 | 0 | 0 | 0 | 0 Row 1 of weighted IVR matrix |
| 0 | -0.6488 | 0.5257 | -1.176 | -1.535 | 1.005 | 0 | 0 Row 2 of weighted IVR matrix |
| 0 | -0.3893 | 0.5257 | -0.7053 | 0.7676 | -1.508 | -1.355 | 0.6062 Row 3 of weighted IVR matrix |
| 0 | -0.1298 | 0.5257 | -0.2351 | 0.7676 | -0.5025 | 1.355 | -1.818 Row 4 of weighted IVR matrix |
| 0 | 0.1298 | 0.5257 | 0.2351 | 0.7676 | 0.5025 | 1.355 | 1.818 Row 5 of weighted IVR matrix |
| 0 | 0.3893 | 0.5257 | 0.7053 | 0.7676 | 1.508 | -1.355 | -0.6062 Row 6 of weighted IVR matrix |
| 0 | 0.6488 | 0.5257 | 1.176 | -1.535 | -1.005 | 0 | 0 Row 7 of weighted IVR matrix |
| 0 | 0.9083 | -1.577 | -1.176 | 0 | 0 | 0 | 0 Row 8 of weighted IVR matrix |

File name: Selector_N=8_EP=0.5000.csv

## Eigenvalue Weighting of -4

- Base Statistics
- Reference vector length 0.0057
- Mean distance from reference 0.019
- Mean square of distances from reference 0.014
- Compares with origin as reference, mean distance 0.019 , mean square distance variation of 0.013
- Pick Costas arrays that map between 0.005 and 0.037 from reference vector


## Eigenvector Weighting +4

- Base statistics
- Reference vector length 6,488
- Mean distance from reference 13,650
- Mean square variation of distances from reference 2510
- Compares with origin as reference, mean distance 15,830, mean square distance variation of 1,194
- Pick Costas arrays that map between 11,000 and 16,000 of reference vector


## Which Weighting?


(c) 2020 J K Beard, license CC Attribution

## Using Three Selectors

- Use eigenvalue exponents -4, +0.5, and +4
- First, accept all Costas arrays in the database that have distances within one sigma of the reference vector
- Then, cull all Costas arrays in those results that do not meet all three criteria


## Order 8 Entire Database



## First Results



## Eigenvalue Weighting Only



## Variance Weighting



## Selected Eigenvectors



## Selected EV with Weighting



## Artifacts of the Entire Cross-Matrix

- Vast majority share 13 or less distance vectors
- A few share more distance vectors
- Costas arrays 112 and 246 share all 28 distance vectors
- Measures to improve consistency
- Simply pitch either number 112 or number 246
- Reduce to less than two sigma width - do you need 59 Costas arrays in the group?


## Other Selection Cost Functions

- Dot product with reference vector
- Projection orthogonal to reference vector

$$
\left(I-\frac{\overrightarrow{v r} \cdot \overrightarrow{v r}}{\overrightarrow{v r}^{T} \cdot \overrightarrow{v r}}\right) \cdot \overrightarrow{c m}
$$

- Assymetrical limits
- Don't allow too close to reference vector because Costas arrays will be too similar and will likely correlate
- Perhaps allowing them farther won't rapidly increase cross-correlations


## Other Work (1 of 3)

- Extend search for low-correlation group
- Existing method starts with designated Costas array
- Search then selects others that meet cross-correlation criteria
- Cross-correlations between Costas arrays in group used to cull group
- Changing starting Costs array will produce a different group
- Use Jedwab/Wodliner dual/end-around distance vectors


## Other Work (2 of 3)

- Use other weightings
- Eigenvalue weightings is only a first example
- Others such as selecting a weighted subset may perform better
- Use other cost functions
- Current group definition cost function is shared distance vectors
- Current selection cost function is Euclidean distance from a reference vector


## Other Work (3 of 3)

- Use statistics of Costas array vectors in eigenspace
- First cut takes mean plus and minus one sigma
- We don't know what the distribution really looks like
- We are taking the volume of a hollow hyperpolygon
- Taking the volume of a hollow ellipsoid is far more exclusive, particularly for higher order
- We have just begun to scratch the surface here


## Equations Containing Volumes

- Hyperpolygon

$$
J_{H P}=\frac{\sum_{i=1}^{m}\left|v_{1}-v_{1}\right|}{\sqrt{\sigma_{1}^{2}+\sigma_{2}^{2}}} \leq \text { Thresh }_{H P}
$$

- Hypercube

$$
J_{H C}=\operatorname{Max}_{1 \leq i \leq M} \frac{\left|v_{1}-v_{1}\right|}{\sqrt{\sigma_{1}^{2}+\sigma_{2}^{2}}} \leq \text { Thresh }_{\mathrm{HC}}
$$

- Hypersphere (Bhatacharya distance)

$$
J_{H S}=\left(\overrightarrow{v_{1}}-\overrightarrow{v_{2}}\right)^{T} \cdot R^{-1} \cdot\left(\overrightarrow{v_{1}}-\overrightarrow{v_{2}}\right) \leq \text { Thresh }_{H S}
$$

## Equations of Volumes

- Hyperpolygon
- Hypercube

$$
V_{H S}=\frac{2^{M}}{\Gamma(M+1)}
$$

$$
V_{H C}=2^{M}
$$

- Hypersphere

$$
V_{H S}=\frac{\pi^{M / 2}}{\Gamma(M / 2+1)}
$$



## References

S. Golomb and H. Taylor, "Constructions and properties of Costas arrays," Proc. IEEE, vol. 72, pp. 1143-1163, 1984.
S. Golomb, "Algebraic constructions for Costas arrays," J. Comb. Theory Series A, vol. 7, pp. 1143-1163, 1984.
S. W. Golomb, "The T4 and G4 constructions for Costas arrays," IEEE Trans. Inf. Theory, vol. 38, pp. 1404-1406, 1992.
C. J. Colburn and J. H. Dinitz, Handbook of Combinatorial Designs, 2nd ed. ISBN 978-1584885061: Chapman \& Hall/CRC, 2007, Section VI. 9 by Herbert Taylor on Costas arrays, pp 357-361.
S. W. Golomb and G. Gong, "The status of Costas arrays," IEEE Trans. Inf. Theory, vol. 53, no. 11, pp. 4260-4265, November 2007.
N. Levanon and E. Mozeson, Radar Signals, 1st ed. ISBN 978-0-471-47378-7: John Wiley \& Sons, Inc., 2004.
J. Jedwab and J. Wodlinger, "The deficiency of Costas arrays," IEEE Trans. Inf. Theory, vol. 60, no. 12, pp. 7947-7954, December 2014.
J. K. Beard, "Costas arrays and enumeration to order 1030," IEEE Dataport, 2017. [Online]. Available:
http://dx.doi.org/10.21227/H21P42
J. Beard. (2020) Database of singular value decompositions of matrix representations of the costas condition. [Online]. Available: http://dx.doi.org/10.21227/h498-px29

## Answer to Question

- "What language did you use in this work; was it MATLAB?
- Answer:
- I used an object-oriented compiled language for this work
- Database entries for the Costas arrays and SVD files are formatted for simple use with MATLAB or other languages
- Database files are in CSV format, plain text with numbers separated by commas
- On each line, all numerical data precedes ASCII comments
- The work presented TODAY could have been done using MATLAB
(c) 2020 J K Beard, license CC Attribution

