Direction of Arrival Estimation Based on MUSIC Algorithm Using Uniform and Non-Uniform Linear Arrays

Eva Kwizera¹, Elijah Mwangi² and Dominic B.O. Konditi³
¹Department of Electrical Engineering, Pan African University, Kenya, P.O. Box 62000-00200, Nairobi-Kenya
²School of Engineering, University of Nairobi, P.O. Box 30197–00100, Nairobi-Kenya
³Department of Telecommunication and Information Engineering, Technical University of Kenya, P.O. Box 52428-00200, Nairobi-Kenya

ABSTRACT
In signal processing, the direction of arrival (DOA) estimation denotes the direction from which a propagating wave arrives at a point, where a set of antennas is located. Using the array antenna has an advantage over the single antenna in achieving an improved performance by applying Multiple Signal Classification (MUSIC) algorithm. This paper focuses on estimating the DOA using uniform linear array (ULA) and non-uniform linear array (NLA)of antennas to analyze the performance factors that affect the accuracy and resolution of the system based on MUSIC algorithm. The direction of arrival estimation is simulated on a MATLAB platform with a set of input parameters such as array elements, signal to noise ratio, number of snapshots and number of signal sources. An extensive simulation has been conducted and the results show that the NLA with DOA estimation for co-prime array can achieve an accurate and efficient DOA estimation.

Keywords: Direction of Arrival (DOA) estimation, Multiple Signal Classification (MUSIC), Root-MUSIC, Non-Uniform Linear Array (NLA), Uniform Linear Array (ULA).

I. INTRODUCTION
In the past decades, many array models such as the uniform linear array (ULA), uniform circular array, uniform rectangular array, and non-uniform linear array (NLA) have been utilized towards the achievement of the direction of arrival (DOA) estimation[1]. To get an accurate DOA estimation of the narrowband signal sent from a far field source to a receiving array antenna can increase the wireless communication systems capacity [2]. Therefore, putting effort on improving DOA estimation methods is a key to developing the quality of wireless networks.

Many methods have been employed to solve such problems among them the maximum likelihood (ML) method of Capon (1969) and Burg's maximum entropy (ME) method which are among the non-subspace techniques [3], [4]. Although they have been often successful and widely used, these methods have certain fundamental limitations especially the bias and sensitivity in parameter estimates, largely because they use an incorrect model of the measurements [5]. Then, Schmidt in1979[6]corrected the measurement model in the case of sensor arrays of arbitrary form and proposes the subspace technique termed Multiple Signal Classification (MUSIC) algorithm. It is based on exploiting the eigen structure of the input covariance matrix. The DOA of multiple source signals can be easily estimated by identifying the peaks of a MUSIC spatial spectrum. Thereafter, for reduction of computational complexity of MUSIC, Root-MUSIC algorithm was developed by Barrayl bell in 1983[7]. It is based on polynomial rooting giving higher resolution, but it is possible to use it when only a uniform linear array is present. For the small number of array elements with also small value of signal to noise ratio, the Root- MUSIC is more accurate compared to MUSIC.

Recently, a non-uniform linear array in a form of co-prime array has been proposed[8]. Its most remarkable property is that it increases the degrees of freedom. In addition, the autocorrelation of signals can be estimated in a much denser spacing other than the physically sparse sampling spacing, and sinusoids in noise can be estimated in a more effective way. Due to the useful properties of the NLA, its importance has been realized and has been the object of research in the last few years. Some researchers such as Paland Vaidyanathan in [9], [10] proposed a new method for a super resolution spectral estimation from the perspective of degree of freedom increase. Further to these efforts, Wengand Petar in [11] proposed a search-free DOA algorithm for co-prime arrays by using a projection-like method to eliminate the phase ambiguities for obtaining the unique estimation of DOA.

In this paper, a method of estimation of DOA by comparing the performance analysis using uniform and non-uniform linear array antennas is proposed. It underlies the factors that affect the accuracy and resolution of the system based on
multiple signal classification (MUSIC) and root-MUSIC algorithms. The performance evaluation of the MUSIC algorithm under ULA and NLA is given.

The remainder of this paper is organized as follows. In Section 2, the signal model of the uniform linear array is presented. In Section 3, the description of a detailed MUSIC algorithm implementation is given. Section 4, shows a non-uniform linear array with combined MUSIC algorithm. Simulation and discussion of the results are presented in Section 5. Finally, conclusion and recommendation for future work is highlighted in Section 6.

II. SIGNAL MODEL OF UNIFORM LINEAR ARRAY

Consider a linear array antenna with $M$ antenna elements that are equally spaced with a distance $d$ that is strictly equal to a half wavelength ($d = \frac{\lambda}{2}$). Assume that there are $K$ narrowband signal sources located at $\theta_1, \theta_2, ..., \theta_K$ with signal powers $\sigma_1^2, \sigma_2^2, ..., \sigma_K^2$. The incident signals and the noise are uncorrelated. In addition the incident signals are themselves uncorrelated. Let the number of signal sources be less than the number of antenna elements ($K < M$).

The steering vector for $k^{th}$ source located at $\theta_k$ is with $\mathbf{a}(\theta_k) \in \mathbb{C}^{M \times 1}$ with $k^{th}$ element $e^{j(2\pi/\lambda)d_1 \sin(\theta_k)}$, where $d_1$ is the antennas location and $\lambda$ is the wavelength as shown in the fig. 1.

The signal collected by all antennas at time can be expressed as

$$X(t) = A\mathbf{s}(t) + n(t)$$  \hspace{1cm} (1)

Where $X(t) = [x_1(t) \ x_2(t) \ ... \ x_M(t)]^T$ is a vector received by the array antenna,

$$A = [a(\theta_1) \ a(\theta_2) \ ... \ a(\theta_K)]$$

is a steering vector. Its expression is shown in (2), $\mathbf{s}(t)$ is the signal vector generated by the source, $n(t) = [n_1(t) \ n_2(t) \ ... \ n_M(t)]^T$ and is the additive white Gaussian noise.

$$\mathbf{a}(\theta_k) =
\begin{bmatrix}
1 \\
e^{-j\varphi_1} \\
e^{-j\varphi_2} \\
\vdots \\
e^{-j\varphi_{K-1}} \\
e^{-j\varphi_K} \\
\end{bmatrix}
\begin{bmatrix}
1 \\
e^{-j\varphi_1} \\
e^{-j\varphi_2} \\
\vdots \\
e^{-j\varphi_{K-1}} \\
e^{-j\varphi_K} \\
\end{bmatrix}
\begin{bmatrix}
\vdots \\
\vdots \\
\vdots \\
\vdots \\
\vdots \\
\vdots \\
\end{bmatrix}
$$

(2)

where $\varphi_k = \frac{2\pi d}{\lambda} \sin \theta_k$.

The narrowband signal from (1) can be expressed as:

$$S_k(t) = s_k(t) \ exp\{j\omega_k(t)\}$$

(3)

Where $s_k(t)$ is the complex envelope of $S_k(t)$ and $\omega_k(t)$ is the angular frequency of $S_k(t)$.

As assumed all signals have the same center frequency, therefore:

$$\omega_k = \omega_0 = \frac{2\pi c}{\lambda}$$

(4)

where $c$ is the speed of the light and $\lambda$ is the wavelength of the signal.

According to the narrowband assumption, the following approximation is valid:

$$S_k(t - t_1) \approx s_k(t)$$

(5)

The delayed wavefront signal is:

$$S_k(t - t_1) = s_k(t) \ exp\{j\omega_k(t - t_1)\} = s_k(t) \ exp\{j\omega_0(t - t_1)\}$$

The output signal of the $m^{th}$ element is:

$$X_m(t) = \sum_{k=1}^{K} s_k(t) \ exp\left[-j(m - 1) \frac{2\pi d \sin \theta_k}{\lambda}\right] + n_m(t)$$

(7)

From (6) the output steering array vector is:

$$a_m(t) = \exp\left[-j(m - 1) \frac{2\pi d \sin \theta_k}{\lambda}\right]$$

(8)

III. MUSIC ALGORITHM IMPLEMENTATION

Multiple signal classification is a subspace technique based on exploiting the eigenstructure of input covariance matrix [12]. Through a set of input parameters such as number of array elements, number of snapshots, element spacing, angular
separation, signal-to-noise ratio and MUSIC algorithm, the DOA is estimated with high resolution. This leads to high quality of wireless communication.

The autocorrelation of the received signal is:

\[ R_x = E[XX^H] \]  

(9)

where \( H \) is the conjugate transpose matrix. The noise is assumed to be zero mean and additive white Gaussian and is uncorrelated to the signal.

Replacing (1) into (9), the covariance matrix is obtained:

\[ R_x = E[(Az + N)(Az + N)^H] = \sigma^2 A^HA + E[NN^H] = AR_xA^H + R_N \]  

(10)

where \( R_x = E[zz^H] \) is called source signal correlation matrix, \( R_N = \sigma^2 I \) is a noise correlation matrix.

If \((\lambda_1, \lambda_2, ..., \lambda_M)\) are eigenvalues of spatial correlation matrix \( R_x \); Then the performance of eigenvalue associated with a particular eigenvector is given as:

\[ R_x - \lambda_i I = 0 \]  

(11)

\[ AR_xA^H + \sigma^2 I - \lambda_i I = 0 \]  

(12)

\[ AR_xA^H + (\sigma^2 - \lambda_i) I = 0 \]  

(13)

Therefore, eigenvectors \( v_i \) of \( AR_xA^H \) are obtained using (14):

\[ v_i = \sigma^2 - \lambda_i \]  

(14)

The eigenvalues are sorted according to their magnitudes \( \lambda_1 \geq \lambda_2 \geq ... \geq \lambda_M \geq 0 \). The larger eigenvalues correspond to signal subspace, while small eigenvalues correspond to noise. The largest eigenvalues are all values greater than \( K \) that is \( M - K \), and the rest are all values that are less than \( K \). Thus, MUSIC “Spatial spectrum” in [12] is defined as:

\[ P_{\text{music}}(\theta) = \frac{1}{\alpha^N} E_xE_x^H \alpha(\theta) \]  

(15)

IV. NON-UNIFORM LINEAR ARRAY WITH COMBINED MUSIC ALGORITHM

A system with the array antennas linearly spaced, the different array elements spacing and the signal phase differences considered. In this case, one non-uniform linear array can be decomposed into two uniform linear arrays as shown in fig. 2 and fig. 3 respectively. The direction of arrival is estimated by combining MUSIC results from the two co-prime arrays.

![Fig. 2. Co-prime non-uniform linear array](image1)

![Fig. 3. Two co-prime uniform linear arrays](image2)

The received signal vector of each sub-array at the \( t \)-th time slot can be defined as:

\[ X_M(t) = A_M z(t) + n(t) \]  

(16)

\[ X_N(t) = A_N z(t) + n(t) \]  

(17)

The array output vector of the co-prime array is given by:

\[ Y(t) = A(t) z(t) + n(t), \]  

(18)

According to the far-field assumption, the steering vector corresponding to the \( k \)-th source is:

\[ a_k = [1, e^{-j\frac{2\pi}{\lambda} d_1 \sin (\theta_k)}, \ldots, e^{-j\frac{2\pi}{\lambda} d_M \sin (\theta_k)}] \]  

(19)

Where \( d_i (I = 1, 2, ..., M + N - 1) \) Steering arrays of each linear array are given by:

\[ a_{Nk} = [1, e^{-j\pi \sin (\theta_k)}, \ldots, e^{-j\pi (N-1) \sin (\theta_k)}]^T \]  

(20)

\[ a_{Nk} = [1, e^{-j\pi \sin (\theta_k)}, \ldots, e^{-j\pi (N-1) \sin (\theta_k)}]^T \]  

(21)

By obtaining each sample of covariance matrices from (16) and (17), the two decomposed uniform linear sub-arrays give:

\[ R_{2M} = E[X_M(t)^H X_M(t)] \]  

(22)

\[ R_{2N} = E[X_N(t)^H X_N(t)] \]  

(23)

Replacing the received signal vector of each sub-array (16) and (17) by their values, the following is obtained:
Where \( R_{SM} = E[s(t)^H s(t) + n(t)^H n(t)] \) and \( R_{SN} = E[s(t)^H s(t) + n(t)^H n(t)] \) are source signal correlation matrices of subarrays \( M \) and \( N \) respectively, \( R_N = \sigma^2 I \) is a noise correlation matrix for each subarray.

If \( \lambda_1, \lambda_2, \ldots, \lambda_M \) and \( \lambda_1, \lambda_2, \ldots, \lambda_N \) are eigenvalues of the spatial correlation matrix \( R_{SM} \) and \( R_{SN} \), then the performance of eigenvalue associated with a particular eigenvector for each sub-array is given as:

\[
R_x - \lambda_i I = 0
\]

\[
A_M R_{SM} A_M^H + (\sigma^2 - \lambda_i) I = 0 \tag{26}
\]

\[
A_N R_{SN} A_N^H + (\sigma^2 - \lambda_i) I = 0 \tag{27}
\]

The eigenvectors \( v_i \) of \( A_M R_{SM} A_M^H \) and \( A_N R_{SN} A_N^H \) from (24) and (25) are obtained using (36) whereby \( v_i \) is:

\[
v_i = \sigma^2 - \lambda_i \tag{29}
\]

Therefore applying eigen-decomposition to the sample covariance matrices in (24) and (25) yields:

\[
R_{SM} = E_{SM} A_M^H E_{SM}^H + E_{MN} A_M^H E_{MN}^H \tag{30}
\]

\[
R_{SN} = E_{SN} A_N^H E_{SN}^H + E_{NN} A_N^H E_{NN}^H \tag{31}
\]

Then, according to the orthogonality between the signal subspace and the noise subspace of each subarray, the MUSIC spatial pseudo-spectrum of the two decomposed linear subarrays \( M \) and \( N \) respectively, are:

\[
P_{MIU}(\theta) = \frac{1}{a_M(\theta) a_N(\theta)} E_{MN} E_{MN}^H \tag{32}
\]

\[
P_{MIU}(\theta) = \frac{1}{a_N(\theta) a_M(\theta)} E_{MN} E_{MN}^H \tag{33}
\]

V. SIMULATION RESULTS AND DISCUSSION

In this session, computer simulations are provided to substantiate the performance analysis of uniform and non-uniform linear arrays. In all cases, the impinging source signals are narrowband signals operating at the same center frequency 2.4GHz the similar to the one used in wireless communication (wi-fi), with the azimuth arrival angle interval in the range: \([-\pi/2,\pi/2]\). These signals are uncorrelated with themselves and with the noise as well. The additive background noise is assumed to be spatially and temporally uncorrelated white complex Gaussian with the zero-mean.

These simulations are subdivided into three parts. Firstly the validation of the results using existing data in the literature was given, then the variations of the direction of arrival with number of snapshots and with number of array elements, for both ULA and NLA are simulated. This is to study the performance evaluation and the accuracy of the direction of arrival estimation for each array arrangement.

a. Validation of results

The simulation results were justified by using existing data in the literature. The dashed lines in fig.4 are results represented by Dhering[7] and the continuous lines are the present work with the increased signal to noise ratio. As observed, there is a good agreement between the simulated results and the published data by Dhering.

![Fig. 4: variation of DOA estimation with SNR](image)

b. Experiment 1: Variation of DOA with the snapshots

In experiment 1, the variation of the DOA estimation with the number of snapshots is simulated. For uniform linear array, the number of snapshots was varied from \( N=100 \) to \( N=1000 \) snapshots in steps of 100 snapshots. The results of the DOA for \( N=100,500 \) and \( 1000 \) snapshots are given in fig 5. This simulation is based on MUSIC algorithm. During the simulation of this experiment, the following signal and array parameters are kept constant:

True DOA: 60° and 68°, Signal frequency: \( \text{Freq}=2.4\text{GHz} \), SNR=-5dB, Array size: M=11.
The results from fig 5 can be summarized in Table 1. It can be noted that with \( N = 100 \) snapshots, the estimated DOA is 60.5° and 67° respectively; Also, with \( N = 500 \) snapshots the estimated DOA is 59.5° and 68° respectively; with \( N = 1000 \) snapshots the estimated DOA is 60° and 68.5° respectively.

**Table 1:** Estimated DOA with snapshots for ULA

<table>
<thead>
<tr>
<th>No of snapshots</th>
<th>( \hat{\theta}_1 ) (degree)</th>
<th>( \hat{\theta}_2 ) (degree)</th>
</tr>
</thead>
<tbody>
<tr>
<td>100</td>
<td>60.5</td>
<td>67</td>
</tr>
<tr>
<td>500</td>
<td>59.5</td>
<td>68</td>
</tr>
<tr>
<td>1000</td>
<td>60</td>
<td>69</td>
</tr>
</tbody>
</table>

The simulation for the non-uniform linear array with DECOM (7,5), the number of snapshots was varied from \( N = 100 \) to \( N = 1000 \) in steps of 100 snapshots. The results of the DOA for \( N = 100, 500 \) and 1000 snapshots are given in fig. 6, fig. 7 and fig. 8 respectively.

**Table 2:** Estimated DOA with snapshots for DECOM

<table>
<thead>
<tr>
<th>No of snapshots</th>
<th>( \hat{\theta}_1 ) (degree)</th>
<th>( \hat{\theta}_2 ) (degree)</th>
</tr>
</thead>
<tbody>
<tr>
<td>100</td>
<td>60</td>
<td>68</td>
</tr>
<tr>
<td>500</td>
<td>60</td>
<td>68</td>
</tr>
<tr>
<td>1000</td>
<td>60</td>
<td>68</td>
</tr>
</tbody>
</table>

c. **Experiment 2: Variation of DOA with array elements**

In experiment 2, the variation of the DOA estimation with the number of array size is simulated. For uniform linear array, the number of array element was varied from \( M = 3 \) elements to \( M = 11 \) elements in steps of 2 elements. The results of the DOA for \( M = 3, 6 \) and 11 elements are given in fig 4.10. This simulation is based on
MUSIC algorithm. During the simulation of this experiment, the following signal and array parameters are kept constant:

**TrueDOA:** 60° and 68°, **signal frequency:** \(\text{Freq} = 2.4\text{GHz}\), **snapshots:** \(N = 100\), **SNR = -5dB**

![MUSIC Spectrum Function](image1)

**Fig. 9:** DOA estimation with array elements variation

The results from fig. 9 can be summarized in Table 5. It can be noted that with \(M = 3\) elements, the estimated DOA is 61° and 66° respectively; Also, with \(M = 6\) elements the estimated DOA is 60° and 68.5° respectively; with \(M = 11\) the estimated DOA is 60° and 68° respectively.

**Table 3:** Estimated DOA with the array elements for ULA

<table>
<thead>
<tr>
<th>(M)</th>
<th>(\delta_1) (degree)</th>
<th>(\delta_2) (degree)</th>
</tr>
</thead>
<tbody>
<tr>
<td>3</td>
<td>61</td>
<td>66</td>
</tr>
<tr>
<td>6</td>
<td>60</td>
<td>68.5</td>
</tr>
<tr>
<td>11</td>
<td>60</td>
<td>68</td>
</tr>
</tbody>
</table>

The simulation for the non-uniform linear array, the array size was varied. The results of the DOA for **DECOM(4,3)**, **DECOM(9,4)**, **DECOM(11,5)** are given are in fig. 10, fig. 11, fig. 12 respectively.

![DOA estimation based on combined MUSIC algorithm](image2)

**Fig. 10:** Variation of DOA estimation with DECOM (4,3)

![DOA estimation based on combined MUSIC algorithm](image3)

**Fig. 11:** Variation of DOA estimation with DECOM (9,4)

![DOA estimation based on combined MUSIC algorithm](image4)

**Fig. 12:** Variation of DOA estimation with DECOM (11,5)
The results from fig. 10, fig. 11, fig. 12 can be summarized in Table 6. It can be noted that with DECOM(4,3), the estimated DOA for 4 elements is 59.5° and 67.5°, for 3 elements is 60° and 69° respectively; Also, with DECOM(9,4) the estimated DOA for 9 elements is 60° and 68°, for 4 elements is 60° and 68.5° respectively; with DECOM(11.5) the estimated DOA for 11 elements is 60° and 68°, for 5 elements is 60° and 68° respectively.

Table 4: Estimated DOA with signal to noise ratio for DECOM

<table>
<thead>
<tr>
<th>DECOM</th>
<th>$\theta_1$</th>
<th>$\theta_2$</th>
<th>$\theta_3$</th>
<th>$\theta_4$</th>
</tr>
</thead>
<tbody>
<tr>
<td>DECOM(4,3)</td>
<td>59.5</td>
<td>67.5</td>
<td>60</td>
<td>69</td>
</tr>
<tr>
<td>DECOM(9,4)</td>
<td>60</td>
<td>68</td>
<td>60</td>
<td>68</td>
</tr>
<tr>
<td>DECOM(11.5)</td>
<td>60</td>
<td>68</td>
<td>60</td>
<td>68</td>
</tr>
</tbody>
</table>

d. Discussion

A comparative study has been made between uniform linear array and non-uniform linear array. The computer simulation are depicted to show the performance evaluation of MUSIC and Root-MUSIC algorithms based on variation of DOA estimation with number of snapshots, signal to noise ratio, number of array elements and number of signal sources. The simulation results were divided into five experiments.

The experiment 1 shows the variation of DOA with the number of snapshots. It is noted that the results from fig. 5 show that the more the snapshots the narrower is the beam width of the signal. Although the higher the number of snapshots the more accurate is the DOA estimation for the uniform linear array, the non-uniform linear array has better performance as shown in fig. 6, fig. 7 and fig. 8.

The experiment 2 shows the variation of DOA with the number of array elements. For the smart antennas to obtain a reasonable gain, an array antenna with many elements is necessary. As observed in fig 4.9 the beam width becomes narrower as the number of array elements keeps on increasing. But the performance is better when using non-uniform linear array as observed in fig. 10, fig. 11 and fig. 12. Although a very big number of sensors lead to much computational complexity which demands more time for processing, also it may lead to a mutual coupling and may occupy a big space which makes it to be more expensive. Therefore, choosing a reasonable number of array elements is necessary to avoid problems stated above.

VI. CONCLUSION

The direction of arrival (DOA) plays a very big important role in wireless communication systems particularly in array signal processing. It has many application in engineering fields such as radar, sonar, weather forecasting, tracking targets, ocean and geological exploration, seismic survey and biomedical, and communications in general.

From the simulation results, it is clear that the MUSIC algorithm is more accurate and has a higher resolution. This occurs especially when there is large size of antenna array, more SNR and a high number of snapshots for the ULA. In addition, when comparing the uniform linear array to the non-uniform linear array, the latter shows a higher accuracy and higher resolution. The NLA has more degree of freedom and allow a larger inter-element spacing than a half wavelength ($d > \frac{\lambda}{2}$) which is not the case for ULA. In addition, the autocorrelation of signals can be estimated in a much denser spacing other than the physically sparse sampling spacing, and sinusoids in noise can be estimated in a more effective way when using non-uniform linear array. The Non-uniform linear array is thus more advantageous than a uniform linear array.

Finally, the answer to some accuracy and directivity problems of direction of arrival estimation by using the MUSIC algorithm was given. The simulation experiments are given to perform some of those problems.

Briefly, this paper described what DOA estimation is, and give a mathematical model of DOA estimation. Then, the analysis of the performance for uniform linear array (ULA) and non-uniform linear array (NLA) were given. The estimation DOA based on the multiple classification signal (MUSIC) algorithm was provided. An extensive simulation has been conducted in MATLAB and the results show that the NLA for co-prime array can achieve an accurate and efficient DOA estimation.

In the future, the application of the two dimensions of NLA in form of DOA estimation for co-prime array is recommended in more accordance with the real time environments.

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