

# SOUND SOURCE LOCALIZATION IN A SECURITY SYSTEM USING A MICROPHONE ARRAY

Vera Behar<sup>1</sup>, Hristo Kabakchiev<sup>2</sup> and Ivan Garvanov<sup>3</sup>

<sup>1</sup>*Institute of Information & Communication Technologies, BAS, 25-A Acad. G. Bonchev Str., Sofia, Bulgaria*

<sup>2</sup>*Faculty of Mathematics & Informatics, Sofia University, 15 Tsar Osvoboditel Blvd., Sofia, Bulgaria*

<sup>3</sup>*University of Library Studies & Information Technologies, Sofia, Bulgaria*

*behar@bas.bg, ckabakchiev@yahoo.com, igarvanov@yahoo.com*

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**Abstract:** A possible algorithm for sound source localization in a security system that is based on beamforming of a microphone array is described in this paper. It is shown that the adaptive beamforming algorithm, Minimum Variance Distortionless Response (MVDR), can be a part of the signal processing implemented in a security system. This signal processing includes the following stages: sound source localization, signal parameter estimation, signal priority analysis and, finally, control of protective and warning means (for example, video camera). The adaptive beamforming method MVDR is used for estimating the direction-of arrival (DOA) of signals generated by different sound sources, which arrive at the microphone array from different directions of the protected area. The scenario, in which four sound sources located at different points of the protected area generate different sound signals (warning, alarm, emergency and natural noise), is simulated in order to verify the algorithm for DOA estimation. The simulation results show that an adaptive microphone array can be successfully used for accurate localization of all sound sources in the observation area. The parallel version of the described algorithm is tested in Blue Gene environment using the interface MPI.

## 1 INTRODUCTION

The security system is a standard part of any building in the city. In most sensors used by a security system for protection of a limited space (home, parking) are mounted sound sirens that are activated in the event of an adverse situation in the protected space. Usually, in case of such a situation (fire, smoke, vibration, and breakage of glass or opening the car) the sirens of sensors give a loud beep for a few minutes. The assessment of the direction and parameters of the incoming sound signals can be used to control the movement of a video camera that records the situation in the most dangerous direction and submits the data to the management centre.

The novelty of this paper is to use the adaptive beamforming algorithm in order to locate, using a microphone array, the direction of sound signals coming from sensors or other sound sources. Microphones arrays represent a set of microphones

arranged in some geometric configuration. They can be realized as linear microphone arrays, where the microphones are positioned in a straight line, or as circular microphone arrays, where the microphones are placed in a circle, or as rectangular microphone arrays, where the microphones are arranged in the shape of a rectangle plate (Benesty, 2008). Microphone arrays have many advantages. Firstly, the beamforming can be done digitally so as to control all dangerous directions (door, windows, cars) using only a single microphone array. Otherwise, when using directional microphones of other types, for example, parabolic microphones, a lot of such microphones are required, because each microphone can control only one direction. Secondly, all noise signals coming from other uncontrolled directions (speaking of people, banging on the walls, etc.) are adaptively rejected by a microphone array, which increases the detectability of signals from sensors and improves the security of the protected area. For comparison, when using a

directional parabolic microphone, noise signals are not removed and they interfere with the detection of the signal. In third, a microphone array can simultaneously generate several independent beam patterns and collect the information from multiple sound sources. In the fourth, the signal power at the output of a microphone array is increased  $M$  times ( $M$  - is the number of array microphones), which allows to substantially increase the security of the protected area. Moreover, a three-dimensional area can be controlled using the rectangular or circular microphone arrays, and, finally, microphone arrays can be easily adapted to detect acoustic signals with different frequency characteristics by change of the distance between microphones in the array.

In this paper, we propose to use the Minimum Variance Distortionless Response (MVDR) beamforming algorithm for DOA estimation of signals arrived from different sound sources at a microphone array (Godara, 1997; Trees, 2002; Vouras, 1996; Moelker, 1996). We consider the case, when each sound source is located in the array's far-field, and the sounds generated by sound sources propagate through the air. The DOA is proposed to be estimated as a direction, in which the signal power at the output of a microphone array exceeds a previously predetermined threshold. The paper is structured as follows. In the next second section, the expressions for calculation of array response vectors are derived for three types of microphone arrays. The model of signals arrived at a microphone array in a security system is described in the third section. The MVDR algorithm for DOA estimation is mathematically described in the fourth section.

The parallel version of the MVDR algorithm tested in Blue Gene environment using the interface MPI is described in the fifth section. The simulation scenario, in which four sound sources located at different points of the protected area generate different sound signals (warning, alarm, emergency and natural noise), is described in the sixth section. The simulation scenario is used in order to verify the algorithm for DOA estimation. The results obtained show that the MVDR beamforming algorithm applied to a microphone array can be successfully used for accurate localization of all sound sources in the observation area. The parallel version of the described algorithm is tested in Blue Gene environment using the interface MPI.

## 2 MICROPHONE ARRAYS

Microphone arrays are composed of many microphones working jointly to establish a unique beam pattern in the desired direction. The array microphones are put together in a known geometry, which is usually uniform - Uniform Linear Arrays (ULA), Uniform Rectangular Arrays (URA) or Uniform Circular Arrays (UCA) (Ioannidis, 2005). Since the ULA beam pattern can be controlled only in one dimension (azimuth), so in various sound applications, URA and UCA configurations with the elements extended in two dimensions must be used in order to control the beam pattern in two dimensions (azimuth and elevation).

### 2.1 URA Configuration

In a URA array, all elements are extended in the  $x$ - $y$  plane. There are  $M_x$  elements in the  $x$ -direction and  $M_y$  elements in the  $y$ -direction creating an array of  $(M_x \times M_y)$  elements. All elements are uniformly spaced  $d$  apart in both directions. Such a rectangular array can be viewed as  $M_y$  uniform linear arrays of  $M_x$  elements or  $M_x$  uniform linear arrays of  $M_y$  elements. Usually, the first array element is considered as the origin of Cartesian coordinates as shown in Fig.1.

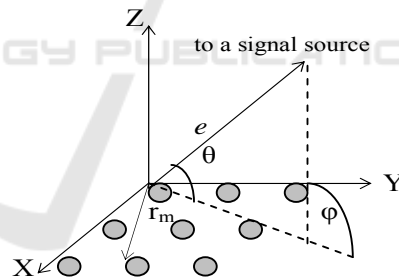


Figure 1: URA configuration

The direction of a signal arriving from azimuth  $\varphi$  and elevation  $\theta$  can be described with a unit vector  $e$  in Cartesian coordinates as:

$$e(\varphi, \theta) = (e_x, e_y, e_z) = (\cos \theta \sin \varphi, \cos \theta \cos \varphi, \sin \theta) \quad (1)$$

The vector  $r_m$  in the direction of the  $m(i,k)$  element can be described in Cartesian coordinates as:

$$r_{m(i,k)} = (d(i-1), d(k-1), 0) \quad (2)$$

In (2),  $i$  and  $k$  denote the element position along the  $y$ - and the  $x$ -axis, respectively. The sequential element number  $m(i,k)$  is defined as:

$$\begin{aligned} m(i,k) &= (i-1)M_x + k \\ i &= 1 + M_y, k = 1 + M_x \end{aligned} \quad (3)$$

If the first element in the rectangular array is a reference element, the path-length difference  $d_{m(i,k)}$  for a signal incident at element  $m(i,k)$  can be defined as the projection of the vector  $r_{m(i,k)}$  on the signal direction vector  $e$ :

$$d_{m(i,k)} = e^T r_{m(i,k)} = \quad (4)$$

Therefore, the URA array response vector  $a_c$  takes the form:

$$\begin{aligned} a_c(\varphi, \theta) &= [1, \exp\left(\frac{j2\pi d_2}{\lambda}\right), \dots, \\ & \dots, \exp\left(\frac{j2\pi d_{m(i,k)}}{\lambda}\right), \dots, \exp\left(\frac{j2\pi d_M}{\lambda}\right)] \end{aligned} \quad (5)$$

In (5), the total number of elements in the microphone array is:

$$M = M_x M_y \quad (6)$$

## 2.2 ULA Configuration

The ULA array response vector  $a_c$  is calculated by (5) where  $M_x=1$ .

## 2.3 UCA Configuration

In a UCA array, all elements are arranged along the ring of radius  $r$  (Fig.2).

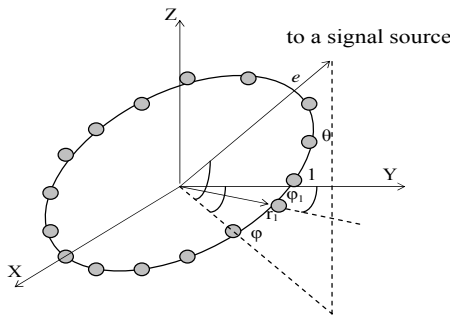


Figure 2: UCA configuration

The ring contains  $M$  array elements. Since these elements are uniformly spaced within the ring, so they have an interelement angular spacing  $\Delta\varphi=2\pi/M$  and a linear interelement spacing  $d=2r\pi/M$ . It is

usually assumed that the first antenna element is located at the  $y$ -axis, and the ring center is the origin of Cartesian coordinates. The vector in the direction of the  $m$ th array element can be written in Cartesian coordinates as:

$$r_m = (r \sin \varphi_m, r \cos \varphi_m, 0) \quad (7)$$

In (7), the angle  $\varphi_m$  is calculated as:

$$\varphi_m = \frac{2\pi(m-1)}{M} \quad (8)$$

The unit vector  $e(\varphi, \theta)$  in the direction of a signal source is given by (1). If the ring center serves as a reference point, the propagation path-length difference  $d_m$  for a signal incident at element  $m$  can be defined as the projection of the vector  $r_m$  on the direction vector  $e$ :

$$d_m = e^T r_m = d \cos \theta \cos(\varphi - \varphi_m), m = 1+M \quad (9)$$

Therefore, the UCA array response vector  $a_c$  takes the form:

$$a_c(\varphi, \theta) = \left[ \exp\left(\frac{j2\pi d_1}{\lambda}\right), \dots, \exp\left(\frac{j2\pi d_M}{\lambda}\right) \right] \quad (10)$$

where  $d_m$  is calculated by (9) for  $m=1,2,\dots,M$ .

## 3 SIGNAL MODEL

The signal model is based on the scenario, according to which one or several ( $L$ ) sensor signals combined with some sound noise arrive at the microphone array with  $M$  microphones. The output signal of each microphone is a sum of sound-source-generated signals and thermal noise. The vector of complex samples of the output signal of a microphone array at time instant  $k$  can be mathematically described as:

$$x(k) = \sum_{l=1}^L b_l s_l(k) + n(k) \quad (11)$$

In (1),  $x(k)$  is the  $(M \times 1)$  complex data vector,  $s_l(k)$  is the complex signal generated by the  $l$ th sound source,  $b_l$  is the  $(M \times 1)$  microphone array response vector generated in the direction of the  $l$ th sound source,  $n(k)$  is the  $(M \times 1)$  complex noise vector and  $L$  is the number of sound sources. The signal received from the sound source  $l$  is given by:

$$s_i(k) = \sqrt{P_i} A_i(k) \cos(2\pi f_0 t + \varphi) \quad (12)$$

In (12),  $P_i$  is the received signal power,  $A_i(k)$  is the modulating function, different for each sound source and  $f_0$  is the sound carrier frequency. The microphone noise  $n(k)$  occupies the entire frequency bandwidth of a microphone and can be represented mathematically as band-limited white additive Gaussian noise (AWGN).

### 4 SIGNAL PROCESSING

Many sensors for fire detection or building surveillance are equipped with sound alarm devices. In case of alarm event (smoke, flame, intrusion, glass breaking, and unauthorized car opening) the alarm device generates powerful sound signal with certain parameters and duration. For the sake of simplicity, let's assume that a set of sensors and one microphone array are installed for the object protection in the observation area and a video camera is located above a microphone array as shown in Fig.3.

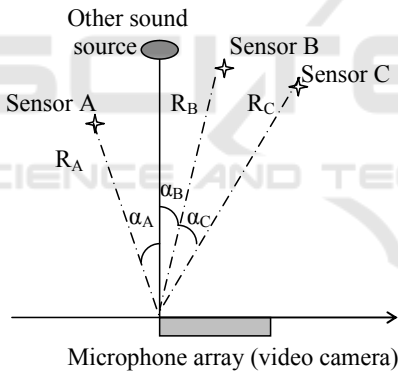


Figure 3: The security system topology

In a security system, the sound source localization could be used for pointing the additional video surveillance devices (video cameras) in the needed directions, which record the additional information and send it to control center of a security system. The priority direction for pointing of a video camera is determined by analysis and identification of signals received from the detected sound sources. The analyzed signal parameters used for signal identification are duration, frequency, modulation, type (continuous, intermittent), and power. The general block-scheme of a possible signal processing in a security system is shown in Fig.4.

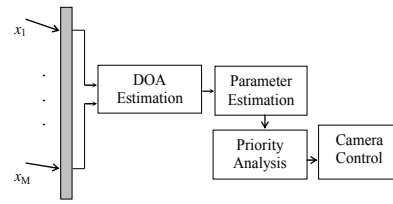


Figure 4: Signal processing in a security system

We assume that the direction-of-arrival (DOA) of sound signals is referred to a Cartesian coordinate system, the origin of which coincides with the first element of a microphone array. In a security system, in which each sensor is equipped with a sound generator, a microphone array scans the protected area of observation in an electronic way (Fig.5). In the process of scanning, a microphone array with a predetermined angular step directs its main beam in a certain direction.

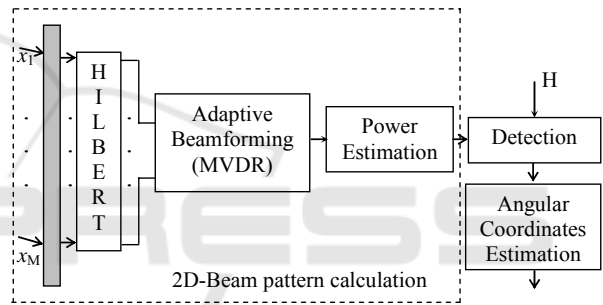


Figure 5: The block-scheme of DOA estimation

At the output of a microphone array, the signal power received from any direction is estimated as:

$$P(\varphi, \theta) = |y(\varphi, \theta)|^2 \quad (13)$$

In (13),  $y$  and  $P$  are the output signal and the output power of a microphone array steered in the  $(\beta, \theta)$ -direction ( $\beta$  - azimuth and  $\theta$  - elevation). The output of a microphone array with  $M$  elements is formed as:

$$y(k) = W^H x(k) \quad (14)$$

where  $k$  is the time instant, and  $x(k)$  is the complex vector of array observations,  $W = [w_1, w_2, \dots, w_M]^T$  is the complex vector of the beamformer weights,  $T$  and  $H$  denote transpose and conjugate transpose, respectively. The conventional (delay-and-sum) beamformer is the simplest, with all its weights of equal magnitudes and the phases that are selected to steer the array in particular direction, i.e. the complex vector of weights  $W$  is equal to the array response vector  $a_c$ , which is defined by the array configuration. The conventional non-adaptive beamformer has unity response in each look direction, that is, the mean output power of the beamformer in the look direction is the same as the

received source power. In conditions of no directional interferences, this beamformer provides maximum SNR but it is not effective in the presence of the other directional signals, intentional or unintentional. The others beamformers such as a Minimum Variance Distortionless Response beamformer can overcome this problem by suppressing unwanted signals from off-axis directions (Tummonery, 1994; Vouras, 2008). To suppress unwanted signals, this beamformer does not require the a priori information about them. It requires only the information for the direction-of-arrival of expected signals. In this paper we propose to form the signal  $y$  according to the adaptive MVDR method. The MVDR-beamformer adaptively calculates the vector of weights ( $W$ ) providing the maximum gain in the desired direction while minimizing the power in the other directions. According to this method, the optimal weight vector ( $W$ ) is chosen to maximize the signal to interference plus noise ratio (SINR) in a certain direction:

$$SINR = \frac{\sigma_s^2}{W^H K W} |W^H a_c|^2 \quad (15)$$

In (15),  $K$  is the “interference + noise” covariance matrix of size  $(M \times M)$ ,  $\sigma_s^2$  is the signal power, and  $a_c$  is the array response vector in the  $(\varphi, \theta)$  direction determined by an array configuration. The solution is found by linear constrained optimization. The criterion of optimization is formulated as:

$$\min_W W^H K W \text{ subject to } W^H a_c = 1 \quad (1)$$

The solution of (16) gives the following weights:

$$W_{MVDR} = \frac{K^{-1} a_c}{a_c^H K^{-1} a_c} \quad (17)$$

Many practical applications of MVDR-beamformers require online calculation of the weights according to (17), and it means that the covariance matrix  $K$  should be estimated and inverted online. However, this operation is very computationally expensive and it may be difficult to estimate the sample covariance matrix in real time if the number of samples is large. Furthermore, the numerical calculation of the weights WMVDR using the expression (17) may be very unstable if the sample covariance matrix is ill-conditioned. A numerical stable and computationally efficient algorithm can be obtained by using QR decomposition of the incoming signal matrix. This matrix is decomposed as  $X=QR$ , where  $Q$  is the

unitary matrix and  $R$  is the upper triangular matrix. Hence the QR-based algorithm for calculation of beamformer weights includes the following three stages:

The linear equation system  $R^H z_1 = a_c$  is solved for  $z_1$ , and the solution is  $z_1^* = (R^H)^{-1} a_c$

The linear equation system  $R z_2 = z_1^*$  is solved for  $z_2$ , and the solution is  $z_2^* = R^{-1} z_1^*$

The weight vector  $\hat{W}$  is obtained as  $\hat{W} = z_2^* / (a_c^H z_2^*)$

In the process of scanning of the observation area, the microphone array is digitally steered in each angular direction  $(\varphi, \theta)$ . After adaptive beamforming of a microphone array in the direction  $(\varphi, \theta)$ , the signal power at the output of a microphone array is stored, forming in this way the beam pattern of a microphone array i.e.  $P(\varphi, \theta)$ . Next, firstly the local maximums of the obtained beam pattern must be found and after that they are compared with a fixed predetermined threshold  $H$ . If some local maximum of the beam pattern, i.e.  $P_{max,i}(\varphi^*, \theta^*)$ , corresponding to some angular direction  $(\varphi^*, \theta^*)$  exceeds the threshold  $H$ , then this angular direction  $(\varphi^*, \theta^*)$  is the estimate of the DOA.

## 5 PARALLEL ALGORITHM

### 5.1 Algorithm Description

Parallel version of the algorithm for DOA estimation is implemented as a program in Blue Gene environment using the interface MPI. The parallel program calculates the signal power at the output of a microphone array simultaneously for all directions of observation (Fig.5). The structure of the parallel program uses the fact that the server loads one the same copy of the program on all processors from 0 to  $(\text{NumProc} - 1)$  where  $\text{NumProc}$  is the number of processors allocated to the program. The program uses the current processor number  $iD$ , which is defined by MPI-subroutine `MPI_COMM_RANK`, in order to determine which of the two processes to be performed (depending on that whether the processor is a master processor, i.e.  $iD = 0$  or slave processor, i.e.  $iD > 0$ ). The master processor ( $iD = 0$ ) performs initialization of parameters and prepares the data for all processors. This processor performs simulation

of signals (or, in practice, reading the signals from the buffer), in result of which the signal matrix  $X$  is formed. Moreover, for each slave processor, the main processor calculates the angular direction (FFI), for which the slave processor ( $iD = 1 \dots \text{NumProc} - 1$ ) calculates the signal power at the output of an adaptive microphone array. The angular direction (FFI), in which the microphone array is steered, is sent from the master processor to each slave processor using the loop organized by the MPI-subroutine `MPI_Send`. The main processor also prepares its data portion (FFI =  $-90^\circ$  and an array FFI ( $i$ ),  $i = 1 \dots \text{NumProc}$ , which contains all angular directions). Then all processors perform identical calculations - each of them determines the signal power at the output of a microphone array for angular direction FFI, using the subroutine `DIAG_AZ_PAR`. Once calculating the signal power at the output of a microphone array, each slave processor sends the resulting value to the master processor via the MPI-subroutine `MPI_Send`.

The master processor via the MPI-function `MPI_Recv` accepts the results from all slave processors and forms the beam pattern of the microphone array. After that the subroutine `FIND_AZIMUTH` finds the angular positions of all local maximums of the beam pattern, which exceed the predetermined threshold  $H$ . The angular positions of local maximums are the directions of arrival of sound of signals. The number of processors `NumProc` is equal to the number of  $(\square, \theta)$ - directions used in calculation of the beam pattern of a microphone array. At step 2°, the number of processors is equal to  $\text{NumProc} = (180^\circ / 2^\circ + 1) = 91$ .

### 5.2 Create and Run the Executable File

Firstly, in Blue Gene environment with the interface MPI, the executable file, for example, `SOUND_F_PAR.exe`, is created using the pre-created file `makesound_F_PAR.txt`, which is started with the command `make`:

```
> make -f makesound_F_PAR.txt
```

With this command all program modules of the program package are translated and, as a result, the executable file `SOUND_F_PAR.exe` is created. The executable file `SOUND_F_PAR.exe` is run using the control file `SOUND_F_PAR.jcf` (Job Control File) with the following command:

```
> llsbmit SOUND_F_PAR.jcf
```

After the execution the system responds with a message like:

llssubmit:

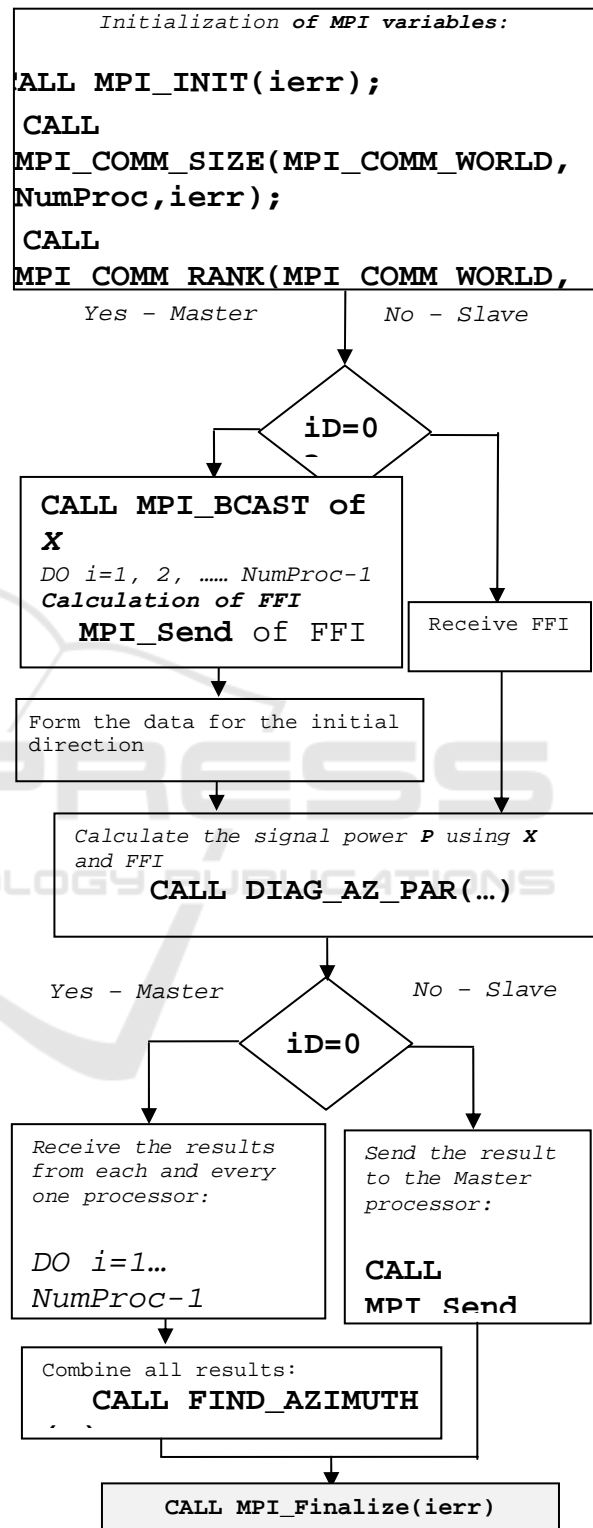


Figure 6: Parallel version of the algorithm

```

The job "bgpfen.daits.government.bg. < task
number>" has been submitted.
The content of the control file
SOUND_F_PAR.jcf can be like that:
#@ job_name = SoundDetect
#@ comment = "SoundDetect :BlueGene"
#@ error = $(jobid).err
#@ output = $(jobid).out
#@ environment = COPY_ALL;
#@ wall_clock_limit = 01:00:00
#@ notification = error
#@ notify_user = never
#@ job_type = bluegene
#@ bg_size = 128
#@ class = n0128
#@ queue
/bgsys/drivers/ppcfloor/bin/mpirun
-exe SOUND_F_PAR.exe -verbose 1
-mode VN -np 91
    
```

The number of processors np in the file SOUND\_F\_PAR.jcf given above, equals to the number of angular (for example, azimuthal) directions, which were used in the formation of the beam pattern of a microphone array. At step 2°, the number of processors is equal to np = 91.

## 6 SIMULATION RESULTS

The computer simulation is performed to verify the described algorithm for sound source localization. As shown in Fig.3, the scenario of simulation includes three sensors (A, B and C) located respectively at 50m, 60m and 70m away from the microphone array. In order to evaluate the performance of the algorithm for DOA estimation when using different types of sensors, the parameters of the sensors produced by three well-known companies (SONITRON, E2S and SYSTEM SENSOR) are used in simulation.

Depending of the company of production, the sirens of sensors generate sound signals at frequency f0 with the power LW in range from 96dB to 103 dB (Table 1). In simulation we assume that all sensors in the protected area are produced by the same company.

According to the simulation scenario, the source of natural noise is a car located in the perpendicular direction relative to the microphone array.

The horn of this car generates a sound, whose power is 110dB (Fig.3). The distance to the car is 90m.

Table 1: Sensor parameters

Company	Signal power LW [dB]	Sound frequency [Hz]
SONITRON	96	2500
E2S	100	1000
SYSTEM SENSOR	103	2400

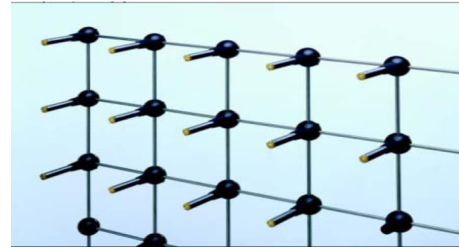


Figure 7: Microphone array WA 0807

Two microphone array configurations, the uniform linear array (ULA) and the uniform rectangular array (URA), are simulated for each sensor type. The topology of a microphone array WA 0807 of the company Brüel & Kjær is used in simulation (Fig.7).

- The Brüel&Kjær microphone array parameters are:
- Frequency, at which the controlled sensors generate the sound (Hz);
- Array configuration (linear, rectangular, square);
- Distance between array microphones (d), which can be changed for each type of sensors;
- Total number of microphones in the microphone array.

The parameters of microphones of the type 4935 according to the catalogue of the company Brüel & Kjær are used in simulation of the microphone array (Fig.8).



Figure 8: Microphone 4935 (Brüel & Kjær)

The noise level of such a microphone is 35dB in the frequency range [100 - 5000] Hz. It is assumed that all simulated microphone arrays (ULA and URA) have the same overall dimension of 0.5m. The interelement spacing of each microphone array and as a consequence the corresponding number of elements are determined according to the carrier frequency of a signal generated by the sound source.

For each type of sensors, the interelement distance in a microphone array is calculated as  $d = \lambda / 2$ , where  $\lambda$  is the wavelength of the sound generated by a sensor. The sound wavelength depends on the frequency of the generated sound, i.e.  $\lambda = c/f_0$ , where  $c = 344$  m/s is the propagation velocity of sound in air, and  $f_0$  is the frequency of the acoustic signal (Table 1). The signal amplitude (A) at the output of each microphone of a microphone array is calculated as a function of the sound pressure LP:

$$A = 0.00002 \cdot 10^{\frac{L_P}{20}} \quad (18)$$

In (18), the sound pressure LP (in dB) depends on the power of the sound LW, which is different for each sensor (Table 1) and also depends on the distance R to the sound source:

$$L_P = L_W - 11 - 20 \log R \quad (19)$$

The real and estimated values of the DOA are presented in Table 2 for each type of a microphone array. The beam patterns of the microphone arrays are presented respectively in Fig.9 ... Fig.14.

Table 2: True and estimated azimuthal directions

SENSOR TYPE	Array Type	Source Azimuth [°]	Estimated Azimuth [°]
SONITRON	ULA (11x1)	-14;0;14;28	-14; 0;14; 28
	URA (11x4)	-14;0;14;28	-14; 0; 14; 28
E2S	ULA (4x1)	-26; 0; 26	-26; 0; 26
	URA (4x4)	-26;0;26;52	-26; 0; 26; 52
SYSTEM SENSOR	ULA (8x1)	-14;0;14;28	-14; 0;14; 28
	URA (8x4)	-14;0;14;28	-14; 0;14; 28

The number of directions, for example, in azimuth (NAZ), controlled by a microphone array

depends on the angular resolution of the microphone array ( $\Delta\phi$ ), which in its turn is determined by the geometrical configuration of the microphone array and the number of its elements:

$$N_{AZ} = 180^\circ \frac{\square}{\Delta\phi} \quad (20)$$

The angular resolution  $\Delta\phi$  is determined as the width of the main lobe of the beam pattern created by a microphone array. Comparing the plotted beam pattern presented on Fig.9...Fig.14, it can be seen that the best angular resolution in azimuth is provided by using the microphone array ULA-11 (with 11 microphones) and opposite, the worst angular resolution is provided by using the microphone array ULA-4 (with 4 microphones). Therefore, the ability of a microphone array to separate the signals from different sound sources is improved with increasing the number of microphones in the array.

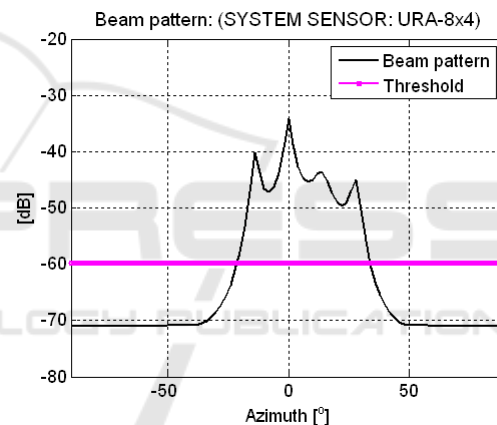


Figure 9: Beam pattern of the URA-8x4 (Sensor Type -SYSTEM SENSOR)

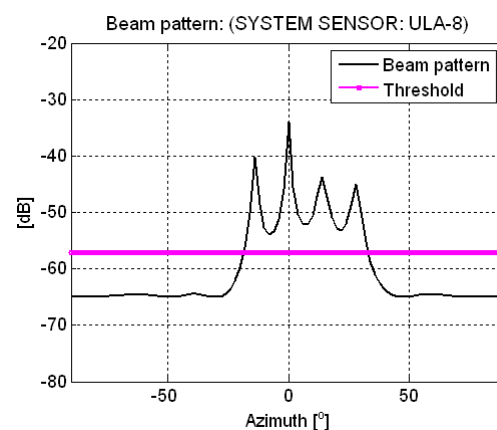


Figure 10: Beam pattern of the ULA-8x4 (Sensor Type -SYSTEM SENSOR)



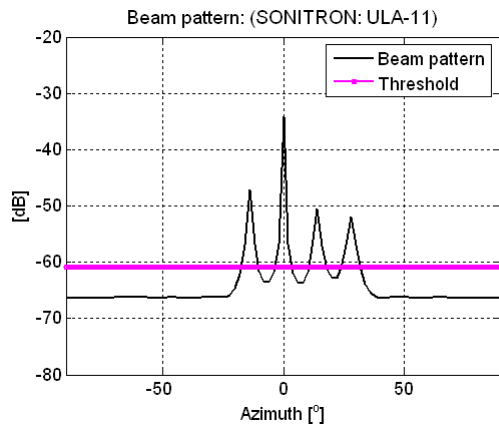


Figure 11: Beam pattern of the ULA-11 (Sensor Type –SONITRON)

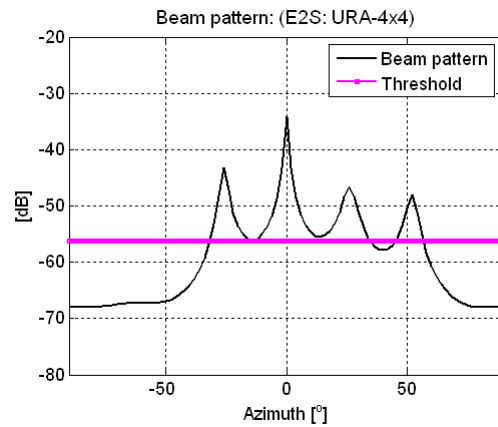


Figure 14: Beam pattern of the URA- 4x4 (Sensor Type –E2S)

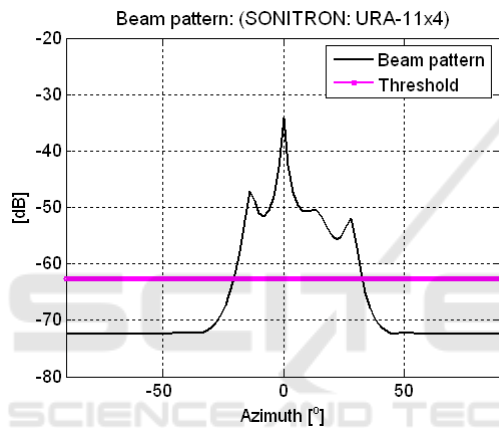


Figure 12: Beam pattern of the URA-11x4 (Sensor Type –SONITRON)

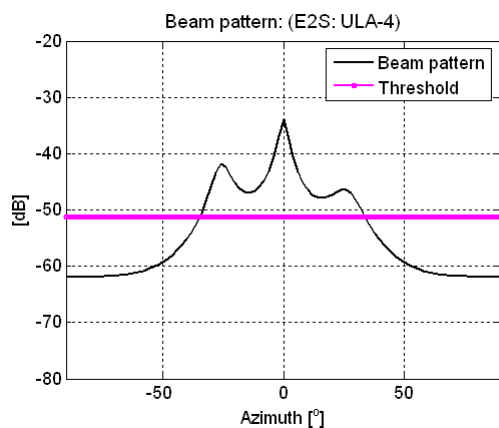


Figure 13: Beam pattern of the ULA- 4x1 (Sensor Type –E2S)

It is well known that the maximal number of signals arrived from different directions, which can be separated by a microphone array, equals  $(M-1)$ , where  $M$  is the number of array elements. Therefore, the beam pattern plotted in Fig. 13 shows that the microphone array ULA-4 can separate only 3 sound signals received from different directions and generated by 3 E2S sensors. The graphical results also show that linear microphone arrays (ULA) should be used in cases where it is important to control the movement of the video camera only in azimuthal direction. However, when it is important to control the movement of the video camera in 2D space (azimuth and elevation), you must use rectangular microphone arrays (URA). Comparison analysis of the beam patterns plotted in Fig. 11 (for ULA-11, SONITRON) and Fig.12 (for URA-11x4, SONITRON) shows, that the use of a rectangular microphone reduces the angular resolution in azimuth.

## 7 CONCLUSIONS

The results obtained show that the accurate DOA estimates can be obtained using a microphone array if the adaptive MVDR-algorithm is used for beamforming. It is also shown that the maximal number of separated signals and also the effectiveness of microphone arrays depend on the number of array elements. Finally, the results obtained can be successfully used for solving different problems associated with noise source localization and identification.

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