SPATIAL NOISE CANCELLATION INSIDE CARS: PERFORMANCE ANALYSIS AND EXPERIMENTAL RESULTS

Hanchi Chen, Prasanga Samarasinghe, Thushara D. Abhayapala, Wen Zhang

Research School of Engineering
College of Engineering and Computer Science
The Australian National University

ABSTRACT
A loudspeaker array is a key component in active noise cancellation (ANC) systems. Most in-car ANC systems utilize the car’s own integrated loudspeakers to cancel the noise due to engine and other sources. In this paper, we evaluate the integrated loudspeakers’ noise cancelling capabilities by analyzing the in-car noise field and the loudspeaker responses. We show that the average noise power in a spatial region can be expressed using a series of coefficients, and that the noise field can be decomposed into several basis noise patterns. Through analysing the measurements in a car, we show that the car’s built-in loudspeakers are capable of attenuating the driving noise by up to 30 dB for frequencies up to 500 Hz within a spherical region of 10 cm radius.

Index Terms—Active noise cancellation, spherical harmonics, loudspeaker array, sound field analysis

1. INTRODUCTION
The application of noise cancellation methods to minimize interior cabin noise has been a key topic of research in the automobile industry for the last 15−20 years. Initially, this problem was approached via passive noise cancellation methods, which use acoustic treatments such as structural damping and acoustic absorption. However, with the growing need to improve fuel efficiency, there has been more preference on lighter bodies and smaller engines, which has significantly increased the structural vibration and consequent interior noise, predominantly at low frequencies (e.g. 0−500 Hz) [1]. As passive methods were least effective with low frequency noise, active methods were developed where secondary loudspeakers were proposed to attenuate measured noise inside the cabin [1, 2, 3, 4, 5]. With modern in-car entertainment systems providing 4−6 built-in loudspeakers, the addition of an active noise cancellation system is considered to involve no greater cost [6].

Generally, active control creates a signal out of phase with that generated by the vehicle, thus noise is attenuated via destructive interference. In practice, this is achieved by using microphones to measure the residual difference between the two signals, and a feed forward/feed back control system to do the necessary processing [7]. Feed-forward systems use an additional “reference signal” correlated with the noise signal to attenuate them individually, whereas Feed-back systems use a single-input single-output system to attenuate overall measured noise [1]. Even though both methods are proven to deliver positive results, significant soundfield control over a single measurement point is only capable of narrowband attenuation at about 40 Hz [8]. Addressing this issue, multi-input multi-output (MIMO) controllers with multiple microphones as error sensors (typically mounted on headrests) were introduced to increase spatial coverage [6, 8, 9, 10, 11, 12]. For the specific case of road noise cancellation, MIMO controllers were shown to achieve attenuation levels up to 8 dB below 40 Hz and around 3 dB within 80−200 Hz [8]. Recent work on non-automobile related MIMO controllers is presented in [13], where noise reduction above 10 dB is obtained over a distributed set of 16 spatial samples in 0.3×0.3 m region for frequencies up to 500 Hz. A wave domain MIMO ANC system is proposed in [14].

To the best of our knowledge, the existing in-car MIMO controllers are constrained to a set of arbitrary observation points. As a result, spatial control over continuous regions is limited and made worse with increased frequency. Addressing this issue, we focus this work on modeling vehicle-interior noise over a continuous spatial region such that noise control can be achieved over the region with size similar to a human head for frequencies up to f = 500 Hz. We also derive the maximum attenuation levels for a given speaker arrangement so that industrial designers can investigate the potential noise cancellation capability of a given loudspeaker system for various noise sources and driving conditions. All of the analysis we perform are based on acoustic measurements taken in a real in-car environment.

The paper is organized as follows. Section 2 defines the problem and Section 3 describes the concept of average spatial noise. In Section 4 the performance analysis of a given speaker system is analyzed. Finally, Section 5 discusses experimental results based on real measurements.

2. PROBLEM FORMULATION
Denote the unwanted noise pressure at a point \( x \) as \( P_n(x) \), and the sound pressure due to the loudspeakers as \( P_l(x) \), the average residual noise energy within the interested region \( S \) can be expressed as

\[
\int_S |P_l(x)|^2 dS = \int_S |P_n(x) + P_l(x)|^2 dS. \tag{1}
\]

A complete in-car active noise cancellation system consists of many components, each component may have an impact on the system’s overall performance. In this paper, we aim to evaluate the potential performance of in-car loudspeakers on ANC applications by estimating the minimum values of \( \int_S |P_l(x)|^2 dS \) for various frequencies, based on the information on in-car noise field and the acoustic characteristics of the car’s integrated loudspeakers, so as to see if the integrated loudspeakers are the potential bottleneck for in-car ANC systems.
3. PRELIMINARY: AVERAGE NOISE POWER OVER REGION

We use the spherical harmonic decomposition to express the sound pressure at a given point within a region of interest. It is assumed that the region of interest $S$ with radius $R$ is a free space with no sound sources inside. The sound waves propagating inside the region are only due to sources outside the region. If we define a spherical coordinate system with its origin located at the center of $S$, the sound pressure $P(r, \theta, \phi, k)$ at a given point and frequency within the sphere can be represented as a weighted sum of spherical harmonics [15, 16],

$$ P(r, \theta, \phi, k) = \sum_{n=0}^{\infty} \sum_{m=-n}^{n} \alpha_{nm}(k) j_n(kr) Y_{nm}(\theta, \phi), \quad (2) $$

where $k = 2\pi f/c$ is the wave number, $f$ and $c$ are the frequency and the wave propagation speed, respectively. $\alpha_{nm}$ are the spherical harmonic coefficients, $j_n(kr)$ is the spherical Bessel function of order $n$, and $Y_{nm}(\theta, \phi)$ denotes the spherical harmonic of order $n$ and degree $m$. $Y_{nm}(\theta, \phi)$ has the orthogonal property

$$ \int_0^\pi \int_0^{2\pi} Y_{nm}^* Y_{n'm'} \sin(\theta) d\theta d\phi = \delta_{n-n', m-m'} \delta_{\alpha}, \quad (3) $$

where the arguments $(\theta, \phi)$ are omitted for simplicity, and $\delta_{\alpha}$ is the two dimensional Dirac Delta function. We can then use the decomposition (2) to express the average sound energy within $S$.

Due to the orthogonal property (3), we have

$$ \int_S |P(x)|^2 dS = \int_0^R \int_0^\pi \int_0^{2\pi} P(x)^* P(x) r^2 dr \sin(\theta) d\theta d\phi = \sum_{n,m} \alpha_{nm}^* \alpha_{nm} \int_0^R j_n^2(kr) r^2 dr, \quad (5) $$

where $x = (r, \theta, \phi)$, and the wave number $k$ is omitted for simplicity. Define a new symbol $W_n$, such that

$$ W_n = \left( \int_0^R j_n^2(kr)^2 r^2 dr \right)^{1/2}. \quad (6) $$

Clearly $W_n$ is real, thus (5) becomes

$$ \int_S |P(x)|^2 dS = \sum_{n,m} |\alpha_{nm}|^2 W_n^2, \quad (7) $$

which shows that the average sound power level within $S$ is equal to the sum of squared spherical harmonic coefficients with weighting $W_n$.

In the active noise cancellation scenario, the residual noise field $P_r(x)$ in (1) thus have the average energy

$$ \int_S |P_r(x)|^2 dS \leq \int_S |P_n(x) + P_c(x)|^2 dS \quad (8) $$

$$ = \sum_{n,m} |\alpha_{nm}^{(no)} + \alpha_{nm}^{(sc)}| W_n |^2, \quad (9) $$

where $\alpha_{nm}^{(no)}$ and $\alpha_{nm}^{(sc)}$ are the spherical harmonic coefficients representing the noise field and the loudspeaker sound field, respectively.

We then move on to derive an estimation of $\int_S |P_l(x)|^2 dS$, by analyzing the noise field and loudspeaker channel characteristics.

4. NOISE CANCELLING PERFORMANCE ANALYSIS

4.1. Noise field characterization

For a certain driving condition, we assume that the random noise field within $S$ can be seen as a weighed combination of a number of fixed, basis noise patterns, or noise modes [17], each driving condition may have a different set of basis. Then the noise field pressure within $S$ at any time under a fixed driving condition can be decomposed as

$$ P_n(x) = \sum_i g_i P_i(x), \quad (10) $$

where $P_i(x)$ denotes the $i$th basic noise pattern at $x$, and $g_i$ are some random weighing factors for each noise pattern. Theoretically an infinite number of modes are needed to fully describe an arbitrary noise field, however for a relatively small region and low frequencies, only a small number of noise modes are required for a good approximation of the noise field [17]. Using the spherical harmonics decomposition (2) to decompose the noise field $P_n(x)$ and the basis patterns $P_i(x)$, we can express each noise field coefficient $\alpha_{nm}^{(no)}$ using the corresponding coefficient $\alpha_{nm}^{(i)}$ of every basis pattern,

$$ \alpha_{nm}^{(no)} = \sum_i g_i \alpha_{nm}^{(i)}. \quad (11) $$

We can write all the coefficients in a vector form such that $\alpha = [\alpha_{no0}, \alpha_{no1}, ..., \alpha_{no\infty}, \alpha_{sc0}, \alpha_{sc1}, ..., \alpha_{sc\infty}]^T$, and by multiplying both sides of (12) with a diagonal matrix $W$ with diag$\{W\} = [W_0, W_1, W_2, ..., W_{\infty}]^T$, we have

$$ e = \sum_i g_i c_i. \quad (13) $$

where $e$ represents the random noise field in $S$ and $\|e\|^2 = \int_S |P_h(x)|^2 dS$. Similar to the modal domain MUSIC DOA algorithm [18], we can find a set of $c_i$ by calculating the autocorrelation matrix $E\{e e^H\}$, and then decompose $E\{e e^H\}$ to acquire a set of orthonormal eigenvectors and their corresponding eigenvalues. Unlike the MUSIC DOA method which utilizes the noise subspace eigenvectors, we select the signal subspace eigenvectors to be $c_i$, which correspond to the significant eigenvalues $\lambda_i$. The eigenvalues indicate the energy distribution of the overall noise field among the basis noise patterns, and $E\{\|c_i\|\} = \lambda_i$.

Therefore the expected average noise power within $S$ can be calculated as

$$ E\{\int_S |P_l(x)|^2 dS\} = E\{\|e\|^2\} = \sum_i \|\lambda_i c_i\|^2. \quad (14) $$

Through decomposing the noise field into basis noise patterns, we gain more insight in the dimensionality / sparsity of the noise field. A noise field of high order may have a compact representation using (10). Furthermore, additional signal analysis methods such as direction-of-arrival (DOA) estimation may be applied on the basis noise patterns to identify principal noise sources, which helps in determining optimal loudspeaker placement for ANC purposes when designing the vehicle.
4.2. Residual noise level estimation

We model the characteristics of loudspeakers at each frequency bin through the wave domain channel matrix $H$, which describes the loudspeakers’ response over the entire region of interest,

\[ H = \begin{bmatrix} H_{1,0} & H_{2,0} & H_{3,0} & \ldots \\ H_{1,1} & H_{2,1} & H_{3,1} & \ldots \\ H_{1,2} & H_{2,2} & H_{3,2} & \ldots \\ \vdots & \vdots & \vdots & \ddots \end{bmatrix} \]  

(15)

with $H_{n,m}$ being the spherical harmonic coefficient of order $n$ and degree $m$, defined in the region of interest $S$, due to the $j$th loudspeaker playing a unit signal at one frequency. For an $N$th order region $S$ and an array of $J$ independent loudspeakers, the size of $H$ is $(N + 1)^2$-by-$J$.

Since the noise field can be completely described by its eigenvectors $c_1, c_2, \ldots$, we can estimate the noise cancellation performance by comparing the eigenvectors with the loudspeaker channels. In particular, we define the weighed channel matrix $T = WH$, where $W$ is the diagonal matrix defined in Section 4.1.

Then we can solve for the loudspeaker driving signal solution that minimizes (8) for each basis noise field pattern defined by $c_i$, which can be derived as

\[ D = -(T^HT)^{-1}T^H c_i. \]  

(16)

The residual error vector is then

\[ e_i = c_i + TD = (I - T(T^HT)^{-1}T^H)c_i. \]  

(17)

The driving signal solution (16) is essentially the Least Mean-Square Error (LMS) solution over the continuous space $S$, instead of the LMS solution based on a number of discrete spatial sampling points which is commonly used in existing car ANC systems.

We use the eigenvalues $\lambda_i$ as well as the original and residual noise field vectors, $c_i$ and $e_i$, respectively, to express the noise cancelling performance, and the overall expected noise power reduction ratio can be given using (14)

\[ e = \frac{E\left[ \int_S |p(x)|^2 ds \right]}{E\left[ \int_S |e(x)|^2 ds \right]} = \frac{\sum_i \|\lambda_i e_i\|^2}{\sum_i \|\lambda_i c_i\|^2}, \]  

(18)

where the term $c_i$ in (18) can be omitted since $c_i$ are orthonormal.

5. EXPERIMENTAL RESULTS

5.1. Experiment setup

In this experiment, we use the method developed in the previous sections to analyze the potential noise cancellation performance of the loudspeakers installed in a car (2005 Ford Falcon XR6 sedan).

We use an Eigenmike to measure the in-car noise field; the region of interest is chosen to be a spherical area with 10 cm radius, located at the head position of the frontal passenger seat. The radius of the region is larger than that of the Eigenmike (4.2 cm), therefore we only analyze the sound field for frequencies below 500 Hz, within this frequency range, only the 0th and 1st order sound field harmonics are active inside the region of interest [19], which can be reliably measured by the Eigenmike placed in the center of the region. Also, spectral analysis of the in-car noise indicate that the majority of the noise power lie below 500 Hz (an example of the noise spectrum is shown in FIG 3), thus the noise cancelling performance within this frequency band is indicative of the overall cancelling quality.

The vehicle has four full-band loudspeakers installed, two of which are integrated in either of the front doors, while the other two are placed behind each rear seat. Unfortunately, the car’s audio system can only play stereo signals, which means the two loudspeakers on either side cannot be driven separately, and always play the same signal.

In order to characterize the noise field, we record the in-car noise under various driving conditions. We also recorded the noise fields due to engine and air-conditioner while the car is stationary. For each driving condition, a 10-second-long recording is separated into 100 snapshots, we then calculate the sound field coefficients for each snapshot and at every frequency bin, and finally calculate the coefficient covariance matrix of all the 100 snapshots. The covariance matrix used as the estimation of $\sigma e^H$, and is used for further data analysis.

The loudspeaker channel matrix is obtained by measuring the spatial response at the region of interest due to the left channel and right channel separately using the Eigenmike, the sound field coefficients for each frequency bin are calculated in the same way as the noise field samples. The 1st order sound field and the stereo speaker system result in a 4-by-2 channel matrix for each frequency bin.

When calculating the residual noise field vector $e_i$, we include a small regularization parameter $\beta$, such that (17) becomes

\[ e_i = (I - T(T^HT + \beta I)^{-1}T^H)c_i, \]  

(19)

with $\beta = 0.01$. The regularization prevents severe ill-conditioning of the matrix inversion, thereby preventing the occurrence of very high secondary loudspeaker volumes.

5.2. Experimental data analysis

By diagonalizing the estimated covariance matrices acquired from the recordings from various driving conditions, we obtained the eigenvalues for every case and each frequency bin. The eigenvalues are given in Table 1 for the freeway driving condition and a pure engine noise recording. For the freeway recording, the car was driven on a freeway at 100 km/h, with air conditioning.
Table 1: Table of noise field eigenvalues for freeway driving condition and pure engine noise

<table>
<thead>
<tr>
<th>Frequency (Hz)</th>
<th>Engine Only</th>
<th>Busy Road</th>
<th>AC Only</th>
<th>Freeway</th>
</tr>
</thead>
<tbody>
<tr>
<td>50</td>
<td>15.04</td>
<td>0.00</td>
<td>0.00</td>
<td>0.00</td>
</tr>
<tr>
<td>100</td>
<td>3.50</td>
<td>0.00</td>
<td>0.00</td>
<td>0.00</td>
</tr>
<tr>
<td>150</td>
<td>1.00</td>
<td>0.00</td>
<td>1.00</td>
<td>0.00</td>
</tr>
<tr>
<td>200</td>
<td>0.50</td>
<td>0.00</td>
<td>0.50</td>
<td>0.00</td>
</tr>
<tr>
<td>250</td>
<td>0.25</td>
<td>0.00</td>
<td>0.25</td>
<td>0.00</td>
</tr>
<tr>
<td>300</td>
<td>0.13</td>
<td>0.00</td>
<td>0.13</td>
<td>0.00</td>
</tr>
<tr>
<td>350</td>
<td>0.07</td>
<td>0.00</td>
<td>0.07</td>
<td>0.00</td>
</tr>
<tr>
<td>400</td>
<td>0.04</td>
<td>0.00</td>
<td>0.04</td>
<td>0.00</td>
</tr>
<tr>
<td>450</td>
<td>0.02</td>
<td>0.00</td>
<td>0.02</td>
<td>0.00</td>
</tr>
<tr>
<td>500</td>
<td>0.01</td>
<td>0.00</td>
<td>0.01</td>
<td>0.00</td>
</tr>
</tbody>
</table>

Figure 2: Noise power spectrum attenuation for 4 different driving conditions.

turned to low; for the engine noise recording, the car was parked in a quiet place with air conditioning switched off, and the engine ran at various rpm during the recording.

From Table 1 we see that the eigenvalues decay quickly as the frequency increases, which indicates the shape of the noise spectrum, where the lower frequencies are more dominant.

Furthermore, one may notice that the first eigenvalues for both cases and each frequency bin are much larger than the other 3 eigenvalues, this is particularly noticeable at lower frequencies, and the same phenomenon is observed in all the other driving scenarios. In Section 4.1 we showed that each eigenvector of the covariance matrix corresponds to a specific spatial sound field pattern, with the relative importance of each pattern indicated by its eigenvalue. This result shows that there is one dominant noise pattern in the region of interest for each frequency bin. Therefore we expect that the lower frequency noise fields can be seen as sparse, thus controlling such sound fields may require only a small number of well-placed loudspeakers which can nicely reproduce the dominant noise pattern.

FIG. 2 plots the noise power attenuation for four different driving conditions, with the values calculated using (18). In addition to the freeway recording and the engine noise recording, the “Busy Road” recording was taken while driving on a 3-lane road at moderate speed with multiple vehicles passing by; while the “AC only” recording was taken with the car parked in a quiet place and engine idle, the air conditioning turned to maximum.

FIG. 2 indicates that for most cases, the noise cancelling performance is relatively consistent, with the attenuation reducing gradually from 30 – 35 dB at 50 Hz to 15 – 20 dB at 500 Hz. This frequency-dependent performance is expected since the noise field is expected to be more complicated and harder to reproduce/cancel when the wavelength is shorter. We also notice that the noise field due to air conditioning is particularly difficult to cancel at 50 – 100 Hz, compared to other scenarios. We expect this is because the noise field due to AC is less similar to that of the loudspeakers, compared to other noise sources. One may also notice the common peak in all cases at 470 Hz, clearly at this frequency, the loudspeakers are unable to reproduce the noise fields very well.

We also include FIG. 3 which depicts the overall noise spectrum without attenuation, and the expected residual noise spectrum if the in-car loudspeakers are employed to cancel the noise field. The original noise spectrum is recorded while driving at 70 km/h with air conditioning at minimum. The attenuation is cut off at 500 Hz. We can see from the figure that the most dominant noise frequencies can be effectively cancelled by the integrated loudspeakers, resulting in a much quieter sound field within the region of interest.

In general, we can conclude that the integrated loudspeakers are capable of cancelling the noise field within our defined region of interest at the front passenger seat. However, we would expect the performance to degrade should the noise cancellation be carried out for multiple seats. Nevertheless, a proper in-car ANC system would be able to drive the four loudspeakers separately, which provides extra degrees of freedom for the loudspeaker channels, thereby promoting the overall performance of the system.

6. CONCLUSION
This paper presents an expression to represent the average noise power within a spherical region, as well as a method to characterize the spatial noise field within the region. Using the channel information of the secondary loudspeakers, we derive the expected spatial noise cancelling performance of the integrated loudspeakers in a car.

Through analysis of the in-car noise data acquired from field tests using the method we proposed, we show that the noise field at low frequencies are relatively sparse, and that the car’s integrated loudspeakers are capable of cancelling the in-car noise field below 500 Hz around a typical head position.
7. REFERENCES


