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# Impulse Response Estimation for the Auralisation of Vehicle Engine Sounds using Dual Channel FFT Analysis

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## ABSTRACT

A method is presented to estimate the impulse response of a filter that describes the transformation in sound that takes place between a close-mic recording of a vehicle engine and the sound of the same engine at another point in or near to the vehicle. The proposed method makes use of the Dual Channel FFT Analysis technique and does not require the use of loudspeakers, computer modelling or mechanical devices. Instead, a minimum of two microphones is required and the engine itself is used as the source of sound. This is potentially useful for virtual reality applications or in sound design for computer games, where users select their virtual position at points inside or outside the vehicle. A case study is described to examine the method in practice and the results are discussed. The described method can be readily extended for surround sound applications using spatial microphone array recording techniques.

## 1. INTRODUCTION

In this work, we are interested specifically in the accurate auralisation of the sound of an engine at points inside and near to its vehicle, using a close-mic recording of the engine as the source signal. The idea is that using a single set of engine sounds recorded at only one point, Finite Impulse Response (FIR) filters can be used to accurately recreate the sound at other points in the vehicle in real-time. In virtual reality applications such as computer driving simulations, this reduces the need for multiple sets of sound assets recorded at different points around the vehicle. Also, multi-channel surround-sound auralisation can be achieved without drastically increasing the amount of memory and disk space that is required by the application. Another advantage of such an approach is that a recorded engine sound from one car can be easily transplanted into another virtual vehicle, while preserving the acoustic characteristics of the vehicle. In addition, using only one sound source for the engine means that any sound design, audio effects or alterations that might be applied to the engine recording, for example to simulate a damaged or enhanced engine in a computer game, need only be applied once.

In order to implement the auralisation of a vehicle engine at different points in space around the vehicle, appropriate predetermined acoustic impulse responses are required. These impulse responses, known as *acoustic transfer functions* when transformed into the frequency domain, describe the relation between the close-mic recording of the engine and the sound of the same engine at the points of interest around the vehicle. This article presents a method to obtain the impulse responses that describe the filters required for the auralisation process.

The work described in this paper is designed to be applied in gaming, computer simulation and virtual reality applications that require the design of filters to describe complex vibro-acoustic systems for auralisation purposes. The use of FIR filters is particularly useful in applications where users are given the choice of switching in real-time between multiple listener positions. In driving computer games, for example, users are often given the choice of multiple camera positions, either internal or external to the vehicle, from which to observe the action. The proposed technique may also have use in other areas relating to sound and music computing. One potential such application could be the estimation of vibro-acoustic transfer functions that take place in a classical string instrument such as a violin. In this case the string of the instrument would act as the sound source for the measurement, perhaps recorded at close distance by an electric pick-up.

The measurement and prediction of the acoustic transfer function between the engine of a vehicle and the driver's ears in the cockpit has been investigated in some detail in the area of *Noise, Vibration and Harshness* (NVH), also known as *Noise and Vibration* (N&V) [1, 2]. The aim of aforementioned work is to study the noise and vibration characteristics experienced in vehicles in order to then modify them according to specific design goals. Typically, a combination of vibratory and acoustic (vibro-acoustic) energy is considered to travel from one point in a vehicle to another through both air-borne and structure-borne pathways. The analysis of these vibro-acoustic pathways by which the energy is transferred from one point to another is known as Transfer Path Analysis (TPA) [3–6].

One approach to measure the air-borne acoustic transfer function between two points is to use a loudspeaker and a microphone. A broadband transfer function can then be acquired using a number of possible methods. One robust and reliable approach is to drive the loudspeaker with a

swept-sine wave, as described in [7].

Unfortunately both the loudspeaker, and to a lesser extent the microphone, take up space within the measurement environment. This means that their presence not only has some effect on the transfer function itself, but also that there are limitations on where in the vehicle they can be placed. With current technology it is possible to build high quality microphones that take up very little space, however high quality loudspeakers with a wide frequency range and a flat frequency response can be difficult to fit into small awkward spaces. A common solution that is employed to deal with this problem is to exploit the *acoustic reciprocity theorem*, which dictates that the positions of the loudspeaker and microphone are interchangeable [8, 9]. This means for example that to measure the transfer function between a point in a car engine bay and the ears of the driver, the loudspeaker can be placed in the driver's position where there is plenty of space, and the microphone can be placed under the bonnet of the car in the engine bay.

Transducers that are used to measure the acoustic transfer function in this way should ideally have omni-directional characteristics, or at least have a known directivity pattern that is frequency independent. They should also have a flat frequency response and cover a wide spectrum of audible frequencies. This presents another problem, because in practice it is highly difficult to build a loudspeaker that meets these specifications and the introduction of inaccuracies are inevitable.

In addition to these issues, measurements using loudspeakers and microphones do not take into account the structure-borne contribution of the acoustic transfer function. The structure-borne contribution is mostly made up of acoustic energy transferred through the chassis of the car via the connecting power-train mounts. This makes up a significant part of the overall sound experienced in a vehicle interior [10]. Calculation of the structure-borne contribution is not trivial, and can be done using predictive models [11] or measurement using mechanical devices [12]. Both approaches have limitations and require considerable time and effort to implement.

Contrary to the requirement of Transfer Path Analysis techniques, to meet the goals of this work the separation of air-borne and structure-borne components of the acoustic transfer function is not a necessity. Instead, the goal is to generate a filter that integrates all components and results in a realistic sounding and immersive auralisation of the engine at different points around the vehicle. As an alternative, the use of *Dual Channel Fast Fourier Transform (FFT) Analysis* is investigated as a relatively fast and simple method to obtain a broadband transfer function that can be used to derive a transformation filter [13, 14]. With the proposed technique, the engine itself is used as the sound source, removing any requirement for a loudspeaker or mechanical devices, and instead using only microphones. Although a minimum of two microphones is required, and this basic case is considered in this paper, the method can be readily extended to measure multiple points in and around the vehicle simultaneously, and also to capture spa-

tial information at the points of interest using a microphone array such as the coincident tetrahedral *soundfield* microphone [15] or a spaced multichannel array [16].

The paper is organised as follows: Section 2.1 introduces the dual channel FFT analysis technique. In Section 2.2 the proposed method is described using a case study in which an impulse response is measured in a car. Section 2.3 presents an analysis of the results of the case study, demonstrating the validity of the method. Finally, conclusions and future work are found in Section 3

## 2. METHOD

### 2.1 Dual Channel FFT Analysis

Using dual channel FFT analysis, it is possible to calculate the transfer function that describes the relationship between two signals, with the assumption that they are coupled by a *linear time-invariant (LTI)* system [13, 14]. This relationship is described by (1) where  $a(t)$  is the input signal,  $b(t)$  is the output signal and  $h(t)$  is the impulse response of the linear time-invariant system that describes the relationship between the two signals.

$$b(t) = a(t) * h(t) = \int_{-\infty}^{\infty} a(t - \tau) \cdot h(\tau) d\tau \quad (1)$$

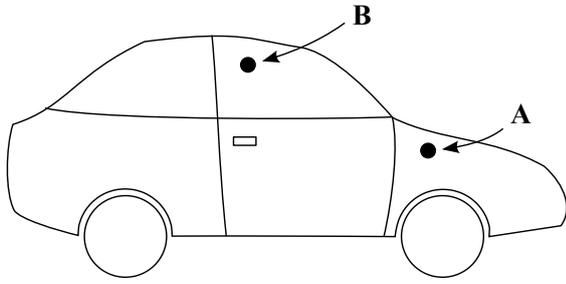
The LTI system can also be described in the frequency domain by its transfer function  $H(\omega)$ , which can be calculated by taking the Fourier Transform of the impulse response  $h(t)$ . The convolution theorem states that the output of the LTI system in the frequency domain  $B(\omega)$  is the product of the input spectrum  $A(\omega)$  and the transfer function of the system  $H(\omega)$ . The transfer function of the system can therefore be calculated by dividing the output spectrum  $B(\omega)$  by the input spectrum  $A(\omega)$ , as follows:

$$H(\omega) = \frac{B(\omega)}{A(\omega)} \quad (2)$$

In theory, by applying a broadband signal to the input of the system that covers the frequency range of interest, the transfer function of the system can be directly measured using (2). However real-world measurements can be contaminated with noise which causes a degree of error. The effect of this noise can be greatly reduced by repeating the measurement and performing a complex average [13]. This is done in practice by multiplying both the numerator and the denominator of (2) by the complex conjugate  $A^*(\omega)$  in order to give the cross spectrum  $G_{AB}$  and the input auto spectrum  $G_{AA}$ . Averages are taken for  $G_{AB}$  and  $G_{AA}$  over a number of measurements in order to calculate the transfer function  $H(\omega)$ , as described by (3). This complex averaging process has the effect of reducing the level of random noise introduced in the output signal  $b(t)$ .

$$H(\omega) = \frac{\overline{G_{AB}}}{\overline{G_{AA}}} \quad (3)$$

Finally the impulse response of the system  $h(t)$  can be calculated, if required, by performing an Inverse Fourier Transform on the transfer function  $H(\omega)$ .



**Figure 1.** Diagram showing positions of microphones in the car used for the case study.

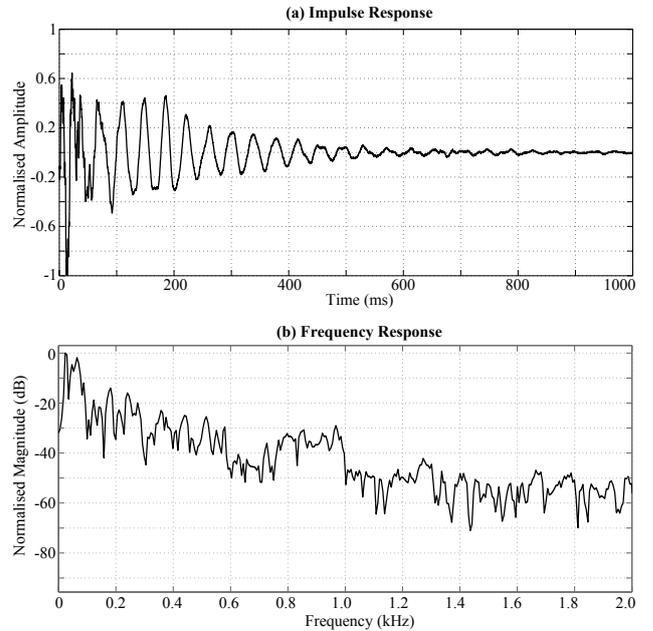
To demonstrate how the Dual Channel FFT Analysis technique can be used to obtain the transfer function between two recordings of an engine made at different points within a vehicle, a case study is described in the following section.

## 2.2 Case Study

To describe the method, we look at the specific case where the aim is to auralise the engine sound in the cockpit of a real car, a Subaru Impreza, using a close-mic recording of the engine. In order to obtain the data required to perform the dual channel FFT analysis, the engine must first be simultaneously recorded at a close location and at any other locations where the sound will be auralised. In practice, to record the engine at a close distance, an omni-directional Behringer ECM8000 microphone was suspended under the bonnet of the car in a small pocket of open space near the engine, position **A**. A second omni-directional microphone, an Earthworks M30, was mounted on a microphone stand inside the cockpit at the position of the driver's head, position **B**. Figure 1 illustrates the microphone positioning inside the car. The two measurement microphones have relatively flat frequency responses in the frequency range of interest, and although ideally they should be perfectly matched, they were considered close enough in specification for this case study.

Measurements were performed by recording the engine simultaneously at both microphone positions while controlling the throttle of the engine in a neutral gear with the car standing still. In order to measure the full frequency range of sound that the engine of the car can produce, the *revolutions per minute* (RPM) of the engine were increased from a low idling level to a relative high rate and back to idling speed for a duration of about 23 seconds. The process was repeated 12 times and recordings were made at position **A** and **B** simultaneously, resulting in 12 recordings of the engine from each microphone, 24 in total. All recordings were made at a sampling rate of 96 kHz, and a bit depth of 24 bits per sample.

The sweep of the RPM of the engine was performed by the driver while monitoring a stopwatch and the tachometer of the car in order to attempt to produce similar recordings in each of the 12 measurements. It should be noted that the exact reproduction of engine sweep in each measurement was not a requirement during this process. The



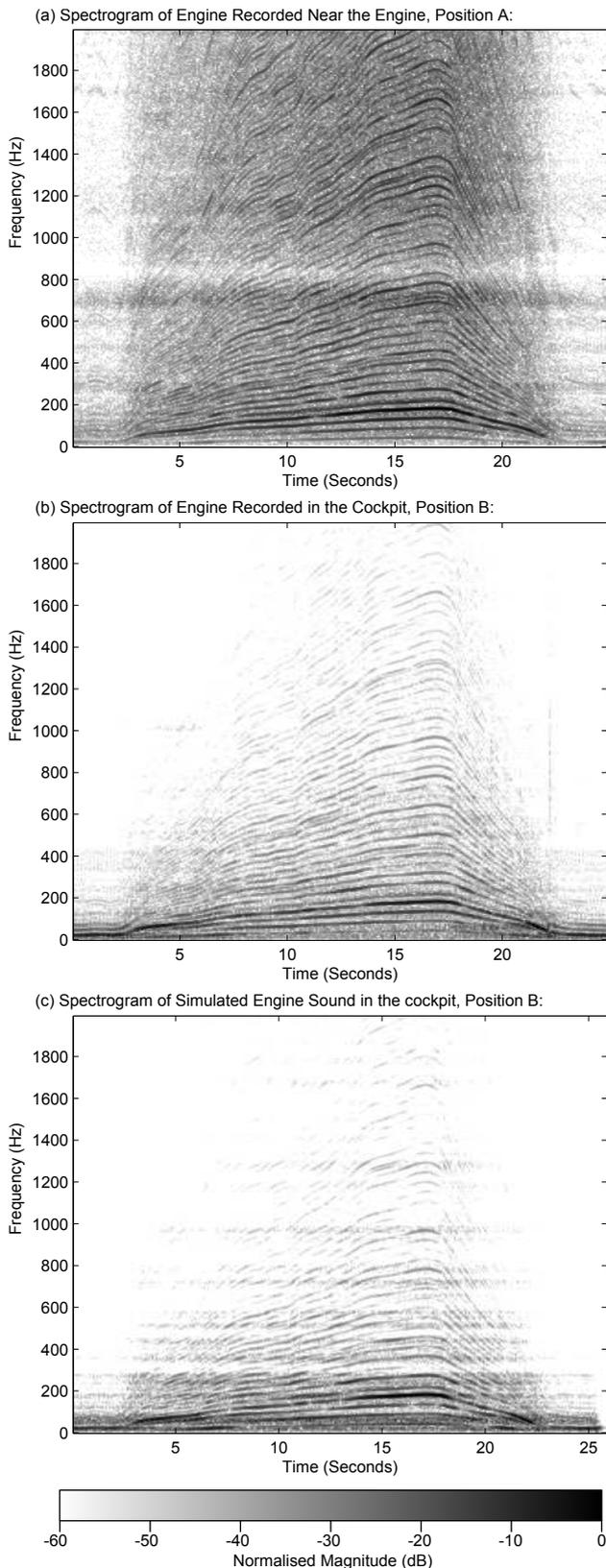
**Figure 2.** (a) Impulse response and (b) frequency response of derived FIR filter.

aim of repeating the measurements was to provide a large amount of data in order to attempt to improve the signal to noise ratio of the result using the averaging process described in Section 2.1.

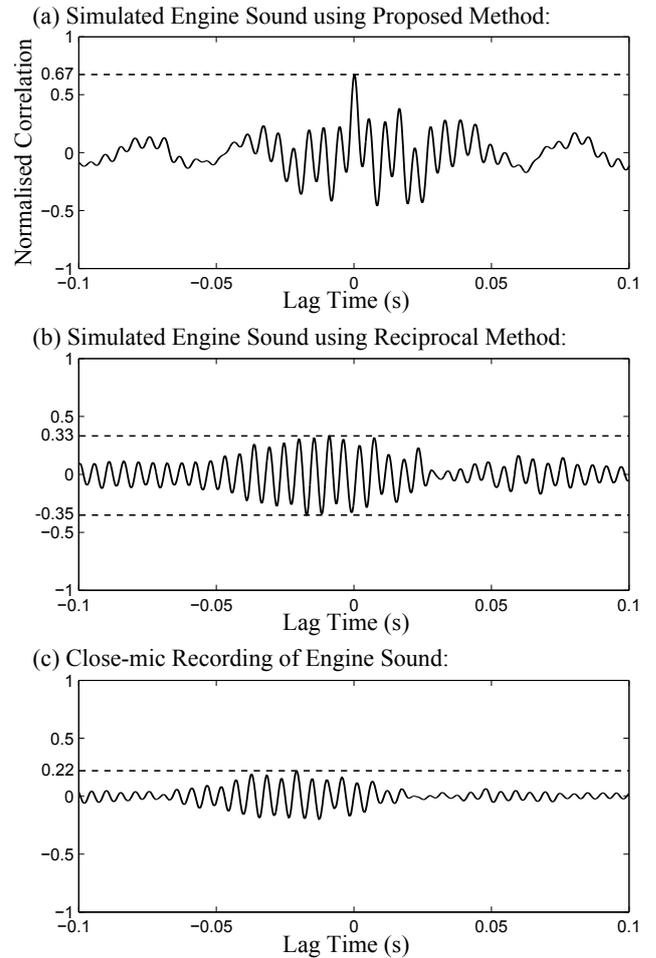
## 2.3 Analysis

For each of the 12 recordings, the two signals **A** and **B** were split into overlapping segments with a length of  $M=262144$  samples and an overlap of  $M/2$  samples. Each segment was windowed using a Hann function and then zero padded at the end to a length of  $2M$  before calculating the discrete Fourier Transform. The cross spectrum  $G_{AB}$  and the input auto spectrum  $G_{AA}$  were then estimated for each segment and averages were taken over all measurements, according to the Welch method [17]. The transfer function was then calculated using (3) and finally the signal was cleaned by removing information at frequencies above 22 kHz and below 22 Hz. These limits were chosen to ensure that the measured frequency range lies comfortably within the operational frequency limits of the two microphones. The impulse response  $h(t)$  and frequency response of the resulting filter are illustrated in Figure 2.

In order to auralise the engine sound inside the cockpit, the engine recording at microphone position **A** is convolved with the impulse response illustrated in Figure 2(a). The filtered engine sound can then be directly compared with the real engine sound recorded simultaneously in the cockpit itself. The real recording made in the cockpit consists mostly of the engine sound, however it is also contaminated slightly by microphone self-noise and environmental sounds such as the movement of the accelerator pedal and some creaking and rattling sounds from the body of the car, caused by engine vibration and changes in temperature.



**Figure 3.** Spectrograms of the car engine (a) recorded at position **A**, (b) recorded at position **B** and (c) auralised at position **B** using the recording at position **A** as the source.



**Figure 4.** Normalised cross-correlation of the recording of engine at position **B** with (a) the auralised sound at the same point using the proposed method (b) the auralised sound using the reciprocal method and (c) the unprocessed recording of engine at position **A**.

Demonstration audio files relating to this work can be accessed online at [18] on the OpenAIR website [19].

Figure 3(a) and (b) are spectrograms of the engine sound recorded at microphone positions **A** and **B** respectively for one of the 12 measurements, presented over a frequency range of between 0 and 2000 Hz. Figure 3(c) is the spectrogram of the virtual auralised engine sound at position **B**, that has been generated by processing the signal recorded at position **A**.

A similarity in the spectral content between the real and the auralised sounds is evident from comparing spectrograms in Figure 3(b) and (c), and this similarity is further confirmed by listening to the files themselves. However it is evident from the spectrograms in Figure 3 and the frequency response of the filter, illustrated in Figure 2(b), that certain frequency bands are suppressed. In addition the auralised sound appears to be low-pass filtered in comparison with the actual recorded sound in the cockpit.

The comparison between the real recordings and auralised sounds is further investigated by measuring the normalised cross-correlation of the signals. Figure 4(a) shows the result of the cross-correlation between the real

sound recorded in the cockpit and the auralised sound prepared using the filter described in Figure 2 for one of the 12 measurements. For this measurement, the correlation between the two signals is 0.67 at 0 s lag (1 would be exactly the same and 0 would indicate no similarity at all). Calculated for all 12 measurements, the mean peak correlation is 0.59 with a standard deviation of 0.09.

To compare the proposed method with an alternative technique, a third auralisation was prepared using the *reciprocal* method. For this method, an impulse response describing the sound transformation between positions **A** and **B** in the car was obtained by placing a loudspeaker at position **B**, in the cockpit of the car, and an omni-directional microphone at position **A**. A sine sweep measurement technique was then used to obtain the impulse response, as described in [7]. This method is a potential alternative to the one described in this paper, however it is not expected to perform as well mainly because it does not measure the structure-borne contribution to the transfer function. Note that this approach also has the disadvantage that it is not trivial to obtain coincident spatial impulse response measurements, as can be readily measured with the Dual Channel FFT method via a microphone array such as a soundfield microphone.

Figure 4(b) shows the result of the cross-correlation between the real sound recorded in the cockpit and the auralised sound prepared using the reciprocal method, using data from one of the 12 recordings. Using this method, the mean peak correlation for all 12 measurements is 0.26, with a standard deviation of 0.06. The relatively low value of correlation is supported by the audible quality of the auralised sound, which reveals a lack of low frequency content in comparison with the actual sound recorded in the cockpit.

Finally, Figure 4(c) shows the cross-correlation between the unprocessed engine sound recorded at position **A** and the sound recorded in the cockpit, recorded at position **B**, for one set of measurement data. The unprocessed engine sound results in a mean peak correlation of 0.15 for all 12 measurements, with a standard deviation of 0.04. As expected, the unprocessed engine sound shows the least correlation with the sound recorded in the cockpit.

### 3. CONCLUSIONS

This paper presents a method to auralise the sound of a vehicle's engine at selected points in the vehicle's interior, such as the cockpit or passenger compartment. The method is designed to be used in virtual reality applications and computer games. The aim is to provide a realistic and immersive audio experience to users both in terms of how the engine is filtered by both airborne and structure-borne transfer paths before reaching the ear, and in terms of the spatial characteristics and reverberation of the sound within the virtual space. At the same time, the method allows sound designers and developers of such applications full flexibility in designing and manipulating car engine sounds.

The first stage of the method is to measure the transfer functions that describe the relationship between a close-

mic recording of the engine and the sound of the engine at the points of interest in the vehicle's interior. Once the transfer functions are determined, the derived impulse responses can be used to provide real-time audio from any recorded engine using auralisation techniques. The method is described here for a single channel output, however it can be readily extended for multi-channel systems in order to provide a surround sound experience from an engine recorded at a single point. The simplest way to achieve this would be to replace the single microphone in the cockpit with a microphone array, such as a Soundfield microphone, and calculate the transfer functions for each microphone channel.

Results from the case study show that the method works well, providing an auralised signal that exhibits a relatively high correlation with an actual recorded signal measured at the same point in the cockpit of a car. However, although the auralised signal sounds similar to the real signal, there are some audible differences meaning that there is room for improvement. Observations of the signals in the frequency domain reveal that certain frequency bands appear to be suppressed in the auralised signal, and that the auralised signal is low-pass filtered in comparison to the real signal recorded in the cockpit. Further investigation is required to understand the cause of these errors.

One explanation could be that the method assumes that the relationship between a close-mic recording of an engine and the sound of the engine in the vehicle interior can be described by a linear time invariant system, but in fact non-linearity is inevitable in such a system a complex vibro-acoustic system. Another cause of difference between auralised and measured audio would be the influence of other sounds and noises in either the cockpit of the car or the engine bay that are not correlated with sounds coming from the engine. Examples of such sounds are creaking in the bodywork of the car, fan noise and noise from the exhaust.

In future work, we would like to investigate if and how the method could be improved by taking into account other sources of sounds that are experienced in a vehicle interior, for example from the exhaust pipe. We would also like to investigate causes of error with the method, and the possibility of improving the results using post-processing techniques. We would like to apply the method to a variety of different vehicles in order to further test its validity and flexibility. Finally we would like to conduct a series of listening tests in order to investigate how the difference is perceived between the virtually auralised engine sounds and recorded engine sounds recorded under the same conditions.

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