# Procedural 3D Audio for AR Applications

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## Abstract

This is the first paragraph

THis is the second

THird paragraph of abstract

Four paragraphs is enough I guess

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## Abbreviations

**ASW** Apparent Source Width.

AVIL Audio Visual Immersion Lab.

**BRIR** Binaural Room Impulse Response.

**CS** Compressive Sensing.

**DOA** Direction of Arrival.

**ERB** Equivalent Rectangular Band.

**HATS** Head And Torso Simulator.

**HOA** Higher Order Ambisonics.

**HRTF** Head-Related Transfer Function.

IACC Inter-Aural Cross Coherence.

**ILD** Inter-Aural Level Difference.

**ITD** Inter-Aural Time Difference.

**STFT** Short-Time Fourier Transform.

WFS Wave Field Synthesis.

X Abbreviations

### Nomenclature

- $\Omega_{LS}$  Vector containing directions of Loudspeakers in reproduction.
- $\Omega_L$  Grid of directions used for the CS algorithm.
- $\Omega_s$  Subvector of  $\Omega_L$  containing only the prominent directions after CS processing.
- **H** Combined transfer matrix for mixed-norm problem.
- $\check{\mathbf{p}}$  Combined measurement pressure vector for mixed-norm problem.
- **x** Combined amplitude.
- $\ell_p$  Norm-p.
- H Transfer Matrix for plane waves impinging on rigid sphere.
- **p** Measurement vector for the pressure on the spherical array.
- **x** Amplitude vector for plane waves impinging on the sphere.
- $\widetilde{\mathbf{p}}$  Pressure vector reconstructed from prominent plane waves.
- $B_n^m$  Ambisonics coefficients.
- L Number of plane waves in a discrete grid of directions.
- LS Number of Loudspeakers in reproduction.
- N Truncation order for the spherical Harmonic Functions.
- $P_n^m$  The associated Legendre polynomials of the first kind.
- Q Number of sampling points on the spherical microphone array.
- $R_0$  Radius of reproduction area.
- $Y_n^m$  Spherical harmonic Functions.
- $\Omega$  Angular Dependency on both azimuth and inclination angle.
- $\lambda$  Regularization factor for natural field HOA processing.
- $\mathbf{B}_N$  Ambisonics coefficients vector truncated at order N.
- **S** Loudspeaker signals resulting from HOA decoding.
- **W** Vector containing radial functions  $W_n$ .

xii Nomenclature

 $\mathbf{Y}_N(\mathbf{\Omega}_L)$  Spherical harmonics vector truncated at order N for all measurement angles in vector  $\mathbf{\Omega}_L$ .

- $\mathbf{p}'$  Residual pressure.
- $\varepsilon\,$  Noise parameter for Compressive Sensing Algorithm.
- a Radius of microphone array.
- "w/ Residual" Exploiting the residual pressure (full implementation of signal path in Figure ??).
- "w/o Residual" Residual pressure is neglected (only upper path in Figure ??).

## снарте в 1

# Introduction

This is the introduction. Another pragraph of the introduction...

2 Introduction

## Theoretical Background

This is a way to link to explanations Direction of Arrival (DOA)  $\,$ 

THis is a todo:

THis is smth done:

#### 2.1 State-Of-The-Art

#### 2.2 Modal Analysis

$$\frac{1}{r^2}\frac{\partial}{\partial r}(r^2\frac{\partial p}{\partial r}) + \frac{1}{r^2\mathrm{sin}\theta}\frac{\partial}{\partial \theta}(\mathrm{sin}\theta\frac{\partial p}{\partial \theta}) + \frac{1}{r^2\mathrm{sin}^2\theta}\frac{\partial^2 p}{\partial \phi^2} - \frac{1}{c^2}\frac{\partial^2 p}{\partial t^2} = 0. \tag{2.1}$$

[43].

#### 2.2.1 Features Extraction

### 2.3 Modal Synthesis

#### 2.3.1 John's way

#### 2.3.2 Angeliki's way

## Method

A combination of the methods described in Chapter 2 is proposed in the present study.

### 3.1 Chuck language

Modal features extraction code

- 3.2 PureData
- 3.3 Heavy Compiler
- 3.4 Unity
- 3.5 Overview

6 Method

## Measurements

Here we can describe the audio recordings if we do any

8 Measurements

## снартек 5

# Implementation

Here we can put pictures and codes snippets

### 5.1 Impact Sounds

- 5.1.1 Additive synthesis
- 5.1.2 Filter-based additive synthesis
- 5.2 Rolling Sounds
- 5.3 Scratching Sounds

10 Implementation

# Results & Discussion

# Conclusion

This is the conclusion 4-5 paragraph approx

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# Results of tests to users

# Some other stuff in the appendix

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