Procedural 3D Audio for AR Applications

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Kongens Lyngby 2017

Abstract

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THis is the second

THird paragraph of abstract

Four paragraphs is enough I guess

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| В | 3 User Guide to our product | | | | | | | |
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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

- Ω_{LS} Vector containing directions of Loudspeakers in reproduction.
- Ω_L Grid of directions used for the CS algorithm.
- Ω_s Subvector of Ω_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.
- ℓ_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.
- Ω Angular Dependency on both azimuth and inclination angle.
- λ 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 ??).

Introduction

Immersion and all these stuff that makes our thing good. Why we are doing it and what do we want to give to the community?

Why is our method better that others? (eg wavetable)? And why we think this is the future of the audio in video games?

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 Sinusoidal Additive Synthesis

2.3.2 Filter-based Modal Synthesis

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

Resynthesis patches

- 3.3 Heavy Compiler
- 3.4 Unity
- 3.5 Overview

6 Method

Measurements

Here we can describe the audio recordings and put pictures

8 Measurements

снартек 5

Implementation

Here we can put pictures and codes snippets

5.1 Impact Sounds

- 5.1.1 Sinusoidal Additive Synthesis
- 5.1.2 Filter-based Modal Synthesis
- 5.2 Rolling Sounds
- 5.3 Scratching Sounds
- 5.4 User Interface

10 Implementation

Results & Discussion

- 6.1 Which Synthesis Method Is Better?
- 6.2 Did we manage to achieve what we wanted?
- 6.3 How can we improve our work?

Conclusion

This is the conclusion 4-5 paragraph approx

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Results of tests to users

User Guide to our product

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