

HRTF Measurements and their Improvements with Time-Frequency Methods

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Overview:

HRTF measurements

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Spatial
Hearing

Acoustic
System
Estimation
and HRTF
Measure-
ments

HRTF
Modeling

Future and
Current
Projects

Conclusion

1 Spatial Hearing

2 Acoustic System Estimation and HRTF Measurements

- MESM

3 HRTF Modeling

- Boundary Element Method

4 Future and Current Projects

- Adaptive Frame Methods for HRTF modelling
- Time-Frequency Implementation
- Psychoacoustics

5 Conclusion

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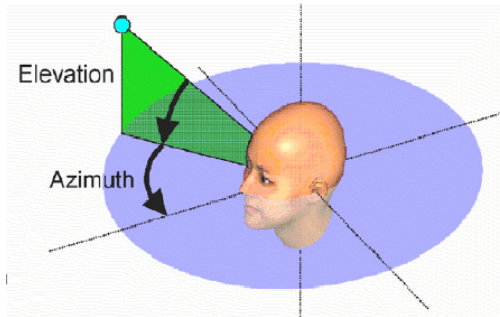
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Spatial Hearing

How can humans localize sounds ?



Signals from two receivers (=ears) available!

Spatial Hearing

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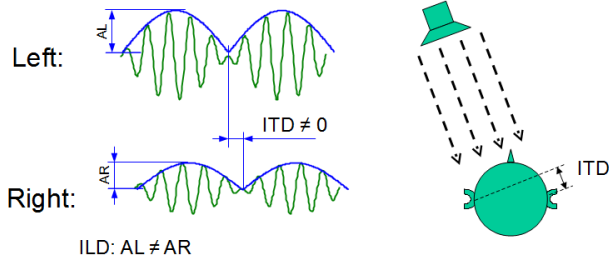
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- Interaural level differences (ILDs)
- Interaural time differences (ITDs)



Important for Left-Right Localization!

Spatial Hearing

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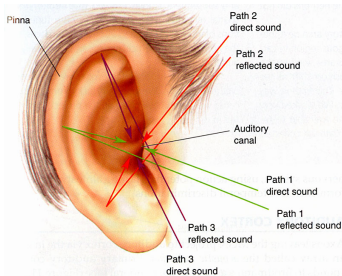
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- Asymmetries in the geometry of the individual receivers lead to
 - Direction-dependent spectral change of incoming sound.
 - Important for Up-Down and Front-Back Localization!



- **Head-related transfer functions (HRTFs):**
 - Describe the filtering effect of the head, torso, pinna.
 - Depend on the position of the sound source.
 - Unique for every person.

Acoustic System Estimation and HRTF Measurements

Acoustic System Estimation

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Measurement of Head Related Transfer Functions (HRTFs)



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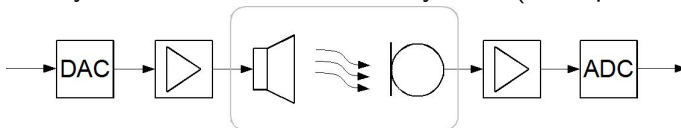
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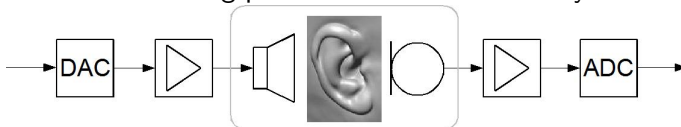
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Electro-acoustic signal path:
weakly non-linear, time invariant systems (PA, Speakers)



with head-movement weakly non-linear, time variant system
But the interesting part is the HRTF: an LTI system!



(Non-blind) System identification :

Choice of Excitation signals:

- Impulse
- white noise
- binary pseudo random sequences
- frequency sweeps
 - linear
 - exponential

We choose **Exponential Sweeps**: small crest factor,
monofrequent, non-linearities well separable, ...

Acoustic System Estimation

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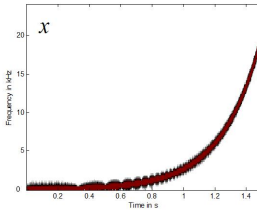
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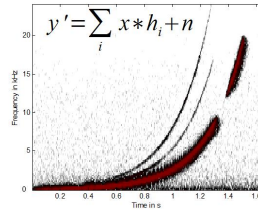
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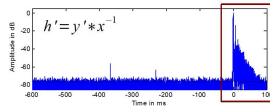
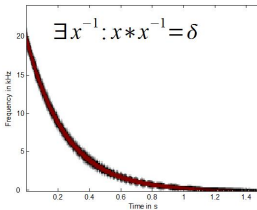
Input



Output



Deconvolution



Improvement of Head-Related-Transfer-Function-Measurements

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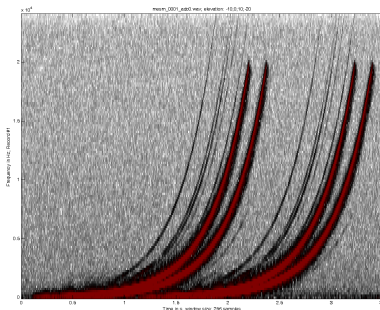
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Improvement of the Measurement by the Multiple Exponential Sweeps Method (MESM) [Majdak et al., 2007]



Optimized parameter for overlapping and interleaving the sweeps in the time-frequency domain.
Speed up measurement by **factor of four**.

Improvement of Head-Related-Transfer-Function-Measurements

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Time-Frequency Denoising [Majdak et al., 2011]:

Measurement is diluted by noise, which in this case is often frequency-dependent. Standard-methods need assumption of white noise or produce artifacts.

We propose a method using a time-frequency multiplier.

Advantages:

- Takes redundant representation into account.
- Uses a-priori knowledge of input signal.
- Noise can have any spectral shape.
- It improves the measurement significantly for long IRs and low SNR.
- It *doesn't* introduce artifacts, also not in the case of high SNR.

Improvement of Head-Related-Transfer-Function-Measurements

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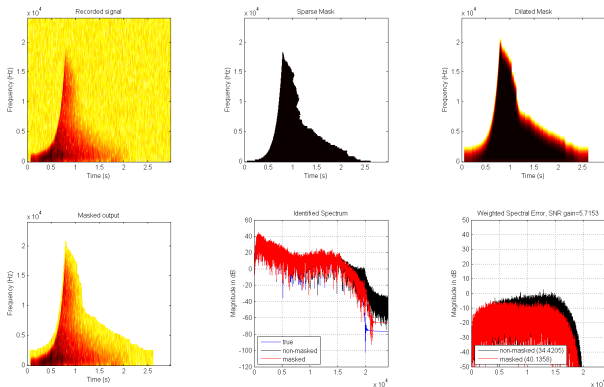
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Time-Frequency Denoising [Majdak et al., 2011]:



Application to concrete HRTF measurements and
determination of exact advantages is current research!



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HRTF Modeling by BEM

Helmholtz equation

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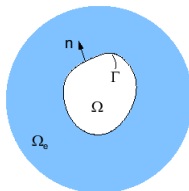
■ Helmholtz equation

$$L(\Phi(x)) = \nabla^2 \Phi(x) + k^2 \Phi(x) = 0$$

■ Boundary conditions

$$\Phi(x) = p(x), x \in \Gamma_D, \frac{\partial \Phi(x)}{\partial n} =$$

$$\left| \frac{\partial \Phi}{\partial r} - ik\Phi \right| \leq \epsilon$$



■ Fundamental solution

$$L(G(x, y)) = \delta(x - y) \quad G(x, y) = \frac{e^{ik||x-y||}}{4\pi||x-y||}.$$

With Green's Theorem restriction to boundary!

Representation formula

$$\alpha\Phi(x) = - \int_{\Gamma} G(x, y) \Psi(y) ds_y + \int_{\Gamma} \frac{\partial G(x, y)}{\partial n_y} \Phi(y) ds_y$$

Discretization \implies Boundary Element Method (BEM).

To solve operator equation

$$Bu = f$$

it is projected on finite-dimensional subspace:

$$Bu = f \text{ with } B_{ij} = \langle B\phi_i, \phi_j \rangle$$

Standard choices: (ϕ_i) Orthonormal basis

[Sauter and Schwab, 2004] or Riesz basis [Dahlke et al., 2005].

BEM-Model of HRTFs

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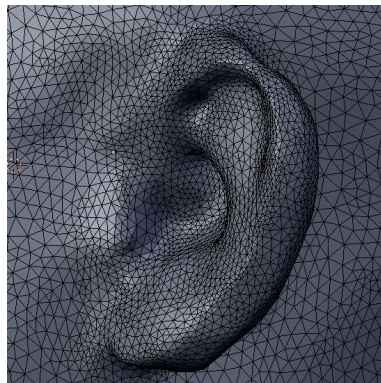
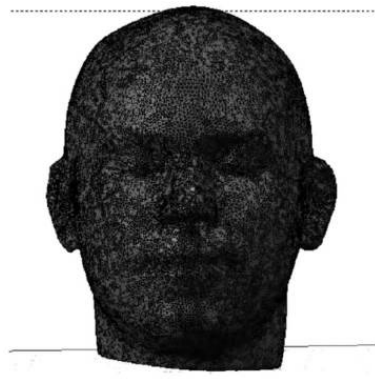
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Fast Multipole BEM-Model of HRTFs

[Kreuzer et al., 2009]:



BEM-Model of HRTFs

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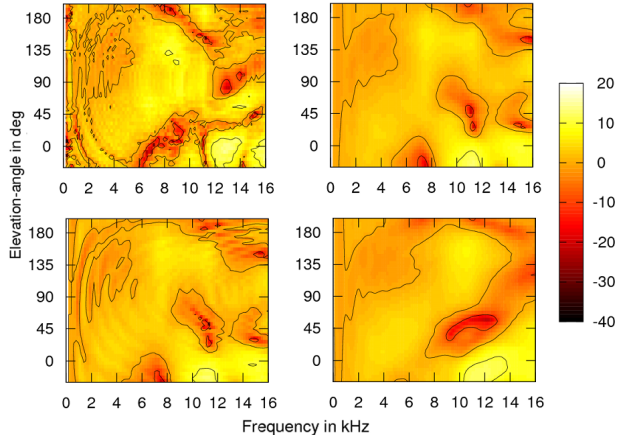
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Different frequencies

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Frequenz: 1000Hz

Acoustic pressure distribution for different frequencies.
The source is positioned 1.2m in front of the person.

Different frequencies

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Frequenz: 2000Hz

Acoustic pressure distribution for different frequencies.
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Different frequencies

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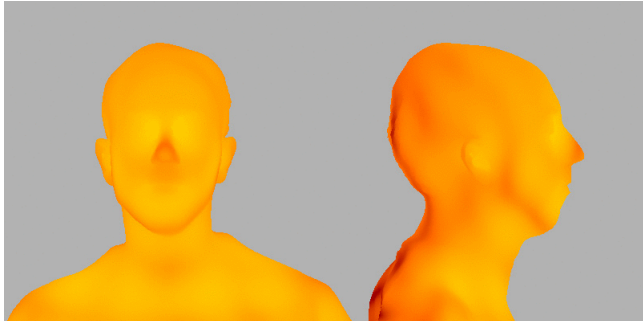
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Frequenz: 3000Hz

Acoustic pressure distribution for different frequencies.
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Different frequencies

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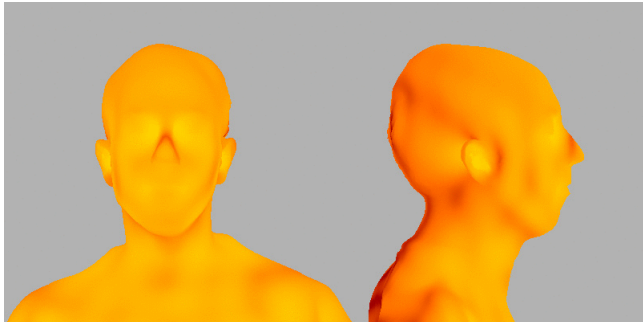
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Frequenz: 4000Hz

Acoustic pressure distribution for different frequencies.
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Different frequencies

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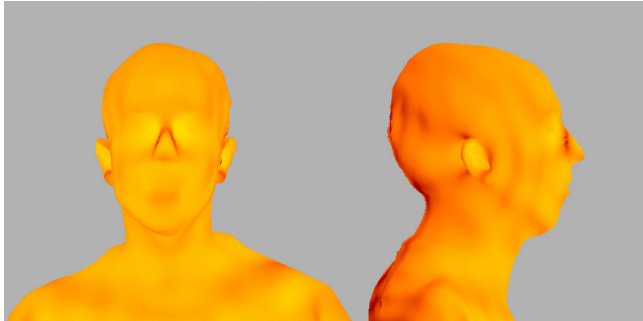
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Frequenz: 5000Hz

Acoustic pressure distribution for different frequencies.
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Different frequencies

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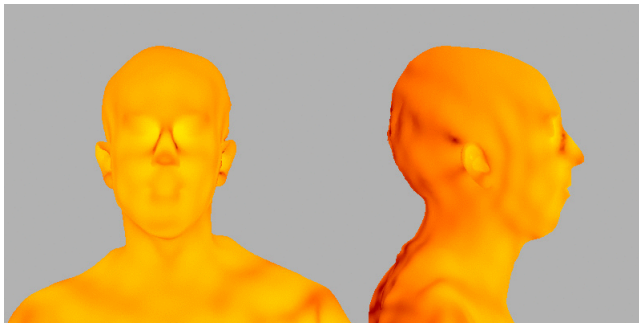
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Frequenz: 6000Hz

Acoustic pressure distribution for different frequencies.
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Different frequencies

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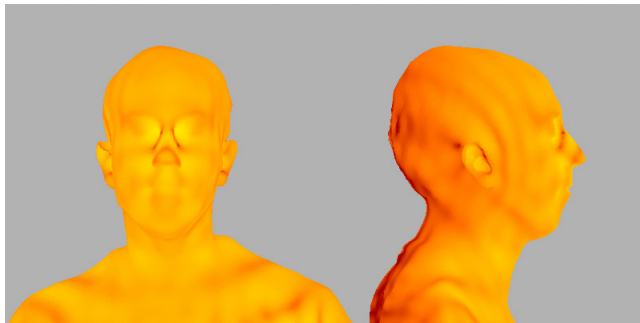
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Frequenz: 7000Hz

Acoustic pressure distribution for different frequencies.
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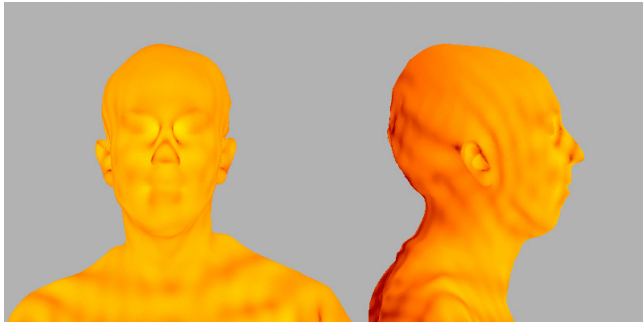
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Frequenz: 8000Hz

Acoustic pressure distribution for different frequencies.
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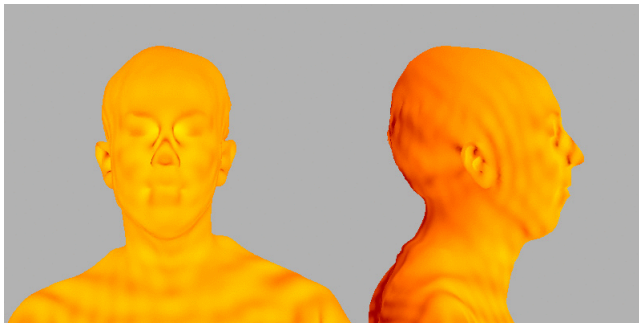
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Frequenz: 9000Hz

Acoustic pressure distribution for different frequencies.
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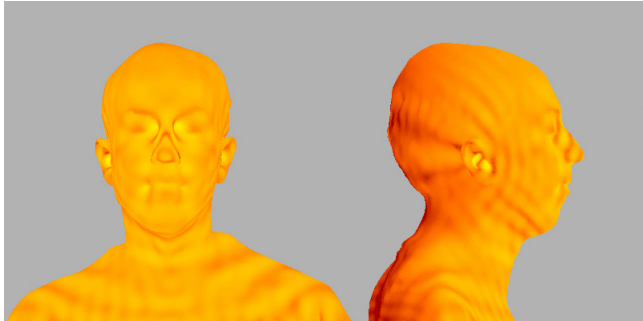
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Frequenz: 10000Hz

Acoustic pressure distribution for different frequencies.
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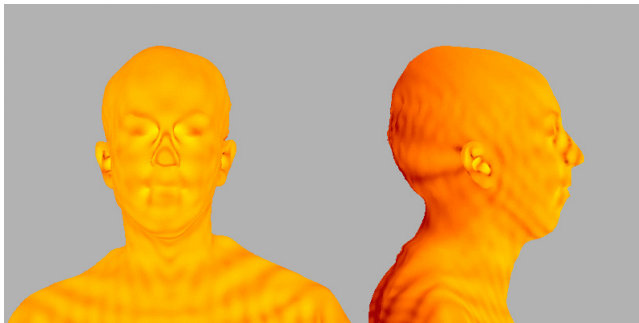
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Frequenz: 11000Hz

Acoustic pressure distribution for different frequencies.
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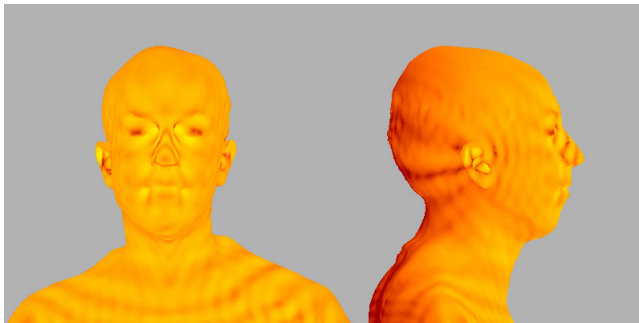
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Frequenz: 12000Hz

Acoustic pressure distribution for different frequencies.
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Different frequencies

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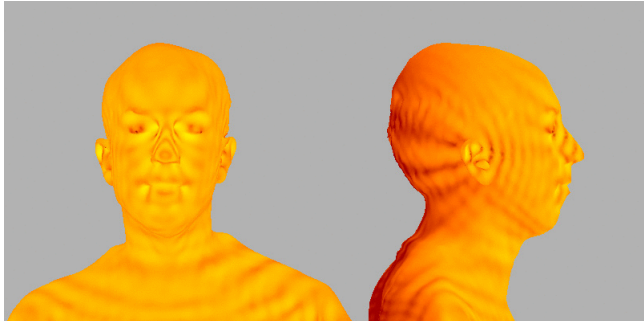
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Frequenz: 13000Hz

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Future and Current Projects

Galerkin, again

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To solve operator equation

$$Bu = f$$

it is projected on finite-dimensional subspace:

$$Bu = f \text{ with } B_{ij} = (B\phi_i, \phi_j)$$

Standard choices: (ϕ_i) Orthonormal basis

[Sauter and Schwab, 2004] or Riesz basis [Dahlke et al., 2005].

There are other options: Frames!

Matrix representation of operators can also be done with frames [Balazs, 2008b].

Galerkin, again

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Adaptive Wavelet and Frame Techniques for Acoustic BEM

HRTF mea-
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In a joint project with S. Dahlke (Univ. Marburg) and H. Harbrecht (Univ. Basel) we will:

Efficient wavelet solver: Implementation for Helmholtz problem.

Fully discrete adaptive wavelet method: Implement adaptive methods [Dahmen et al., 2007]. Use local error adaption.

Besov regularity theory. Investigate the regularity properties of boundary integral equations.

General frames for acoustics. Use adaptive frame methods [Dahlke et al., 2005]: Apply Wavelet and α -modulation frames for HRTFs.

All developments will be validated by calculating HRTFs.

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Time-Frequency Domain Implementation

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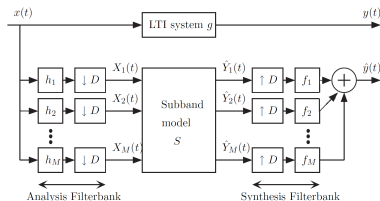
Time-Frequency Domain Implementation of Head-Related Transfer Functions for Real-Time Virtual Acoustic Applications:

allows the implementation of HRTFs, which offers flexibility in the trade-off between *error*, *delay* and *efficiency*. (D. Marelli will join ARI.)

This is linked to best approximation by Gabor [Feichtinger et al., 2004, Dörfler and Torrésani, 2010] and frame multipliers [Balazs, 2008a] but also allows optimization of analysis and synthesis.

Time-Frequency Domain Implementation

Subband Method:



Allows

- modeling for discrete set of spatial position
- continuous approach for real-time interpolation

HRTFs for Psychoacoustics

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Projects of Psychoacousticians at ARI:

- Best practice for localization experiments with Virtual Acoustics.



- What are the perceptual relevant features of HRTFs?
- How can localization of sound be improved for Cochlea Implantees.
- ...

Conclusions

Conclusions

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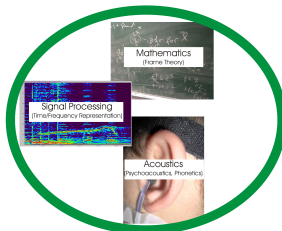
Conclusion
References

Measuring, modeling and applying HRTFs is a inter-disciplinary research topic linking mathematics, signal processing, numerical acoustics, acoustical measurement and psychoacoustics.

Linking Theory to Applications!

Thank you for your attention!

Questions? Comments?



Thanks to P. Majdak and W. Kreuzer for help with this presentation!

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