EFFICIENT AND PERCEPTUALLY PLAUSIBLE 3-D SOUND FOR VIRTUAL REALITY

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INTRODUCTION

METHOD

RESULTS

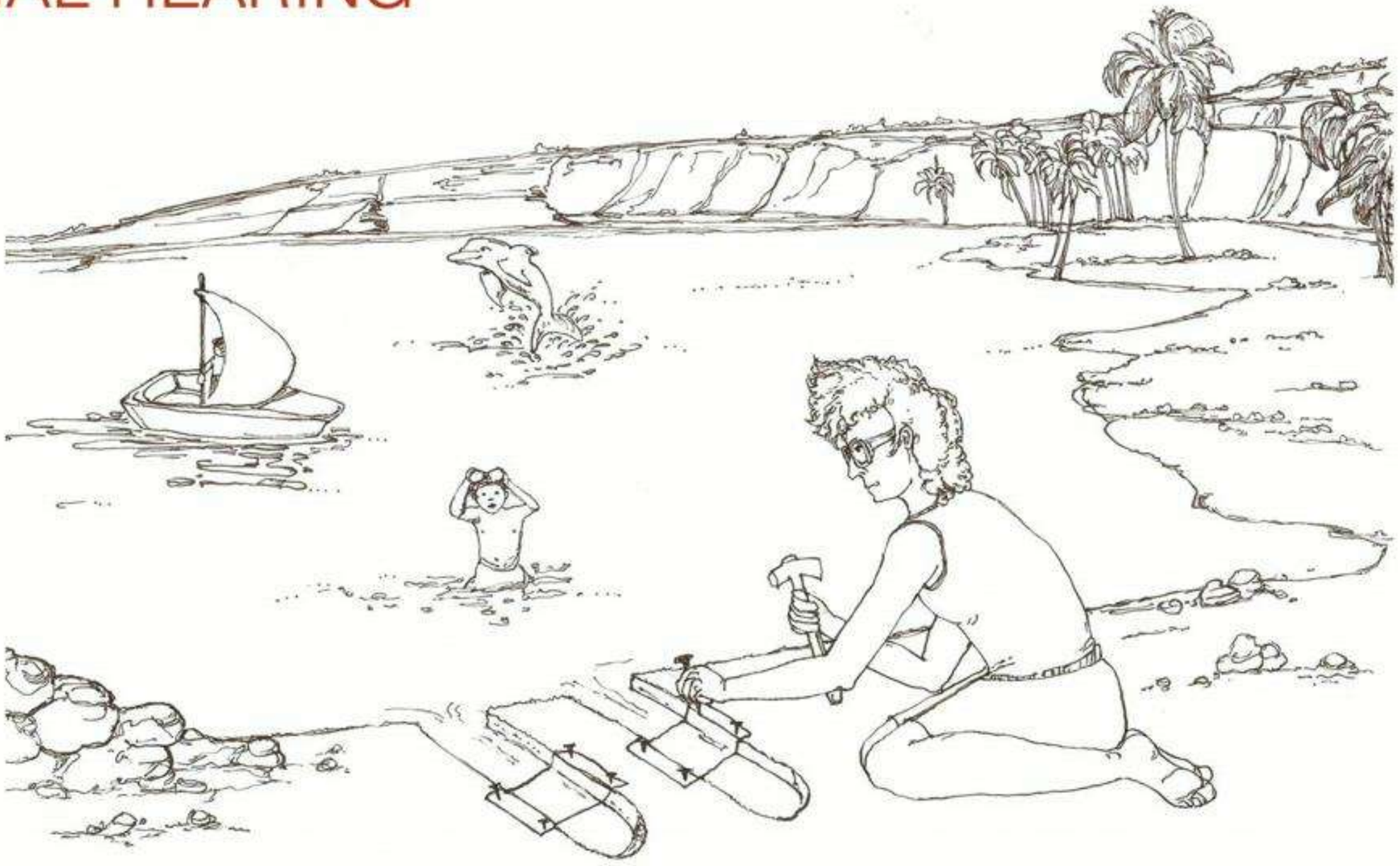
DISCUSSION

MOTIVATION

"HoloLens Demo at Penn Museum" by pennlibtrl (CC BY-SA 2.0)

- 3-D Audio improves presence and immersion
- Graphics rendering consumes most of the compute
- Room acoustical simulation is expensive

SPATIAL HEARING



after A. S. Bregman (1994): Auditory scene analysis, MIT Press, Cambridge, USA, pp. 5.
Image: Fabian Brinkmann (CC-BY 4.0)

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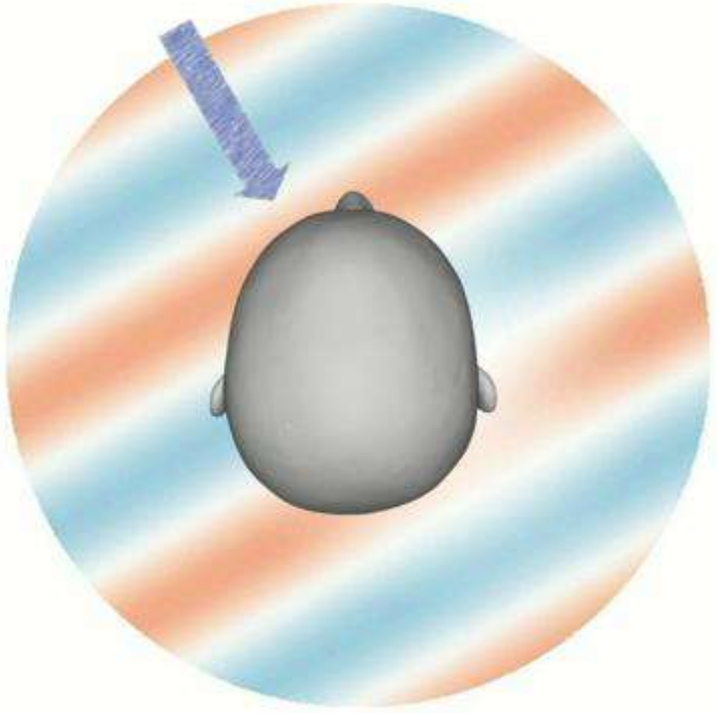

Blauert (**1997**). *Spatial hearing. The psychophysics of human sound localization*, (MIT Press, Cambridge, Massachusetts)
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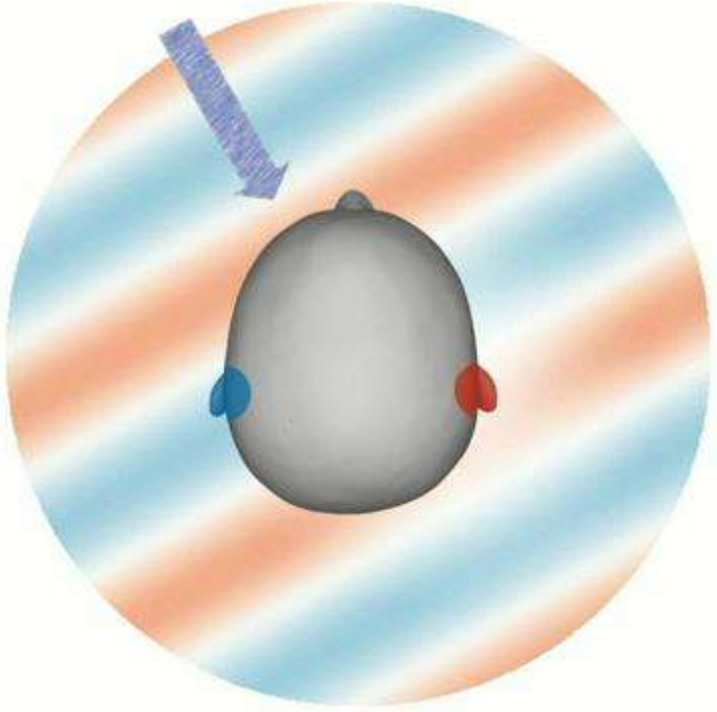

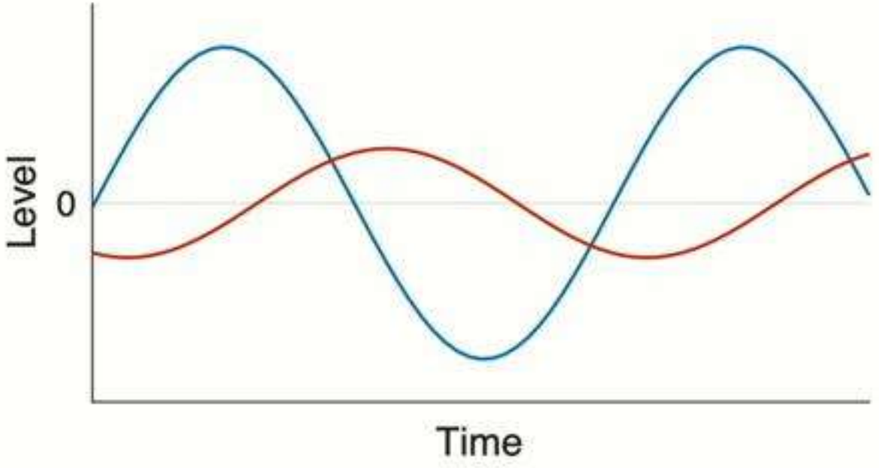

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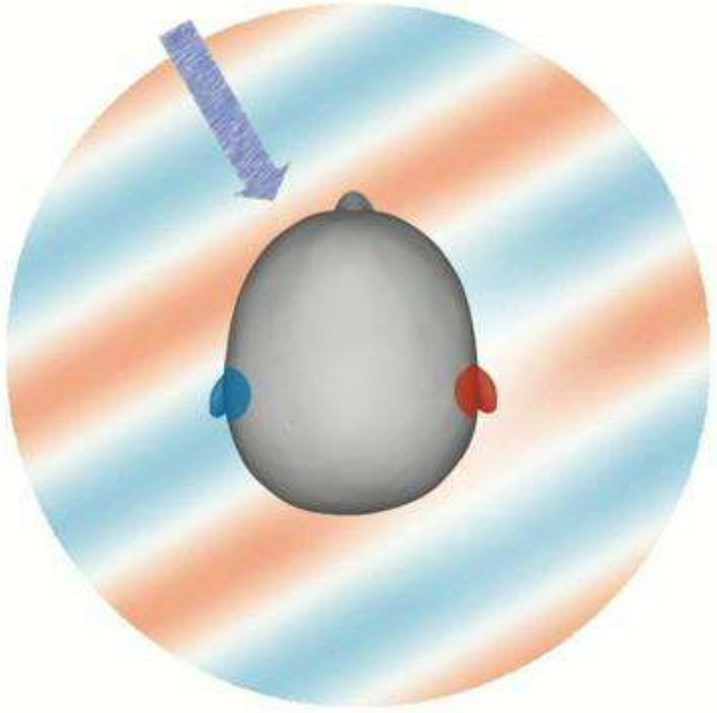

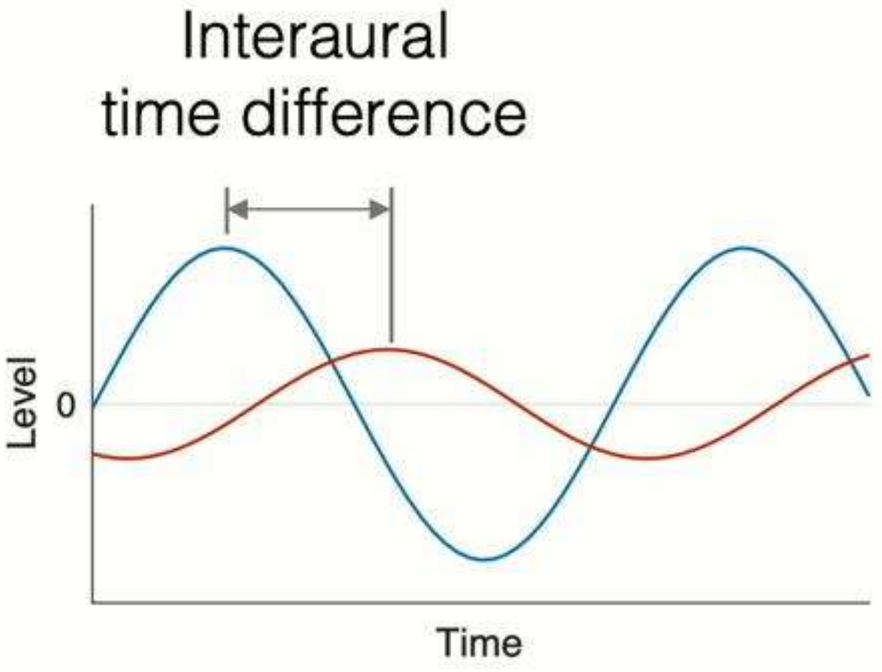

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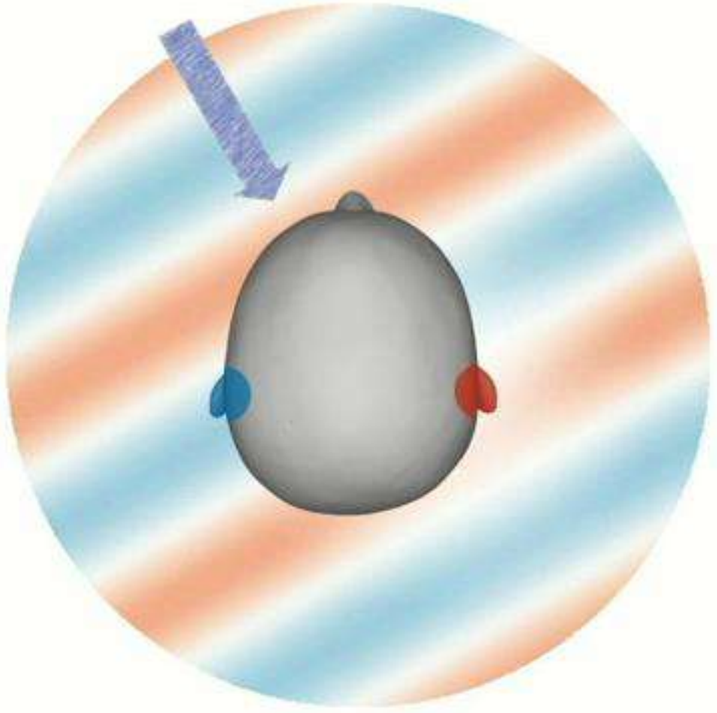

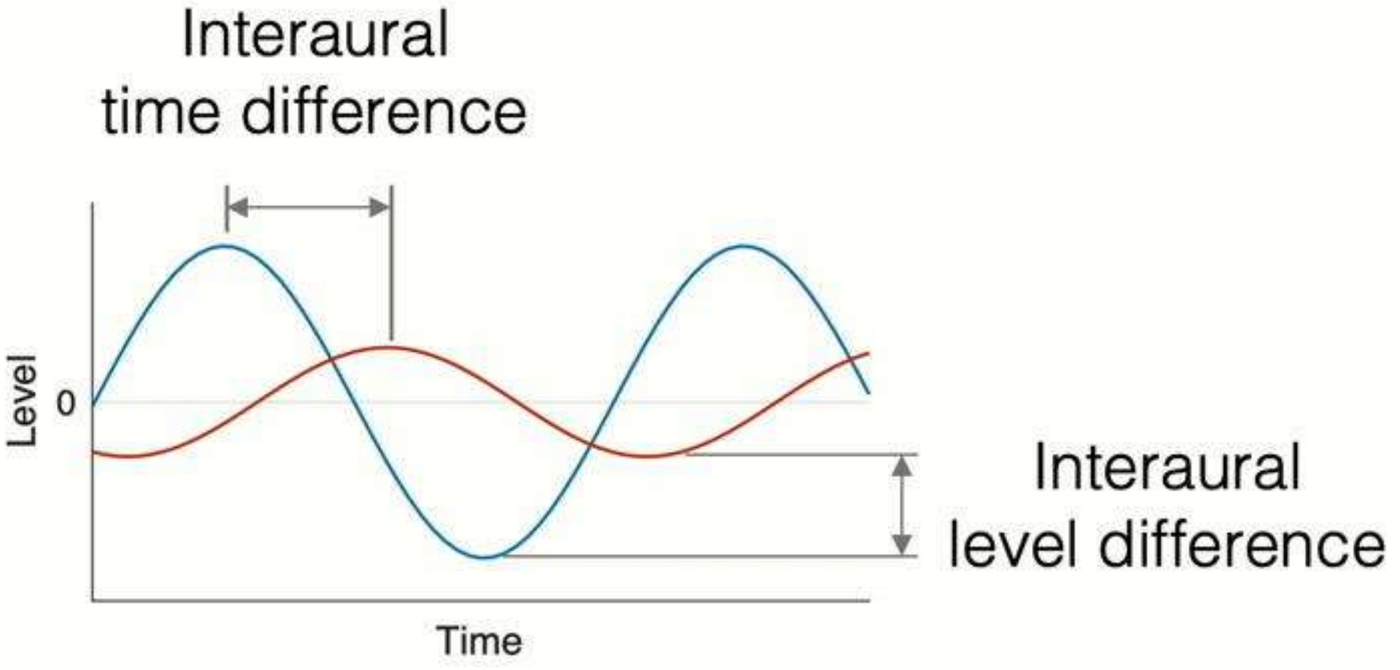

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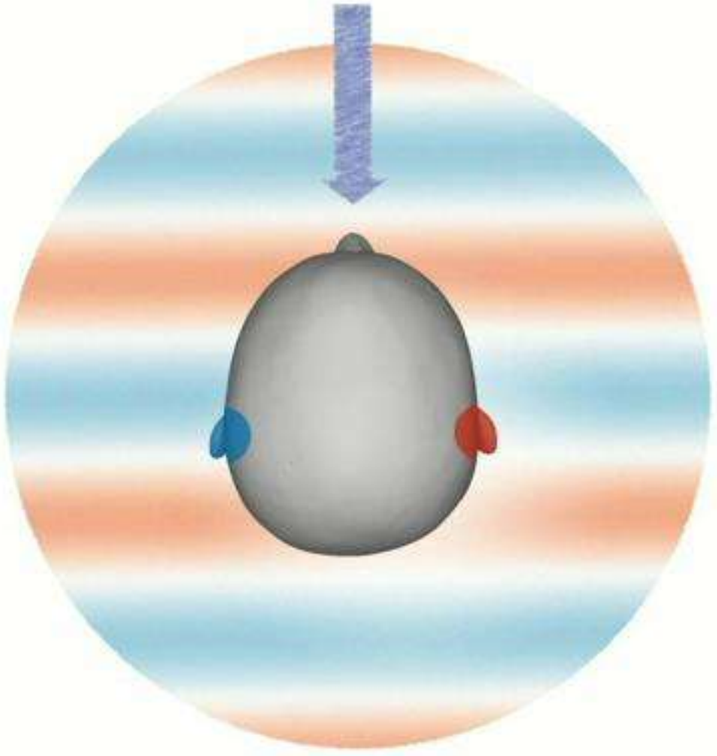

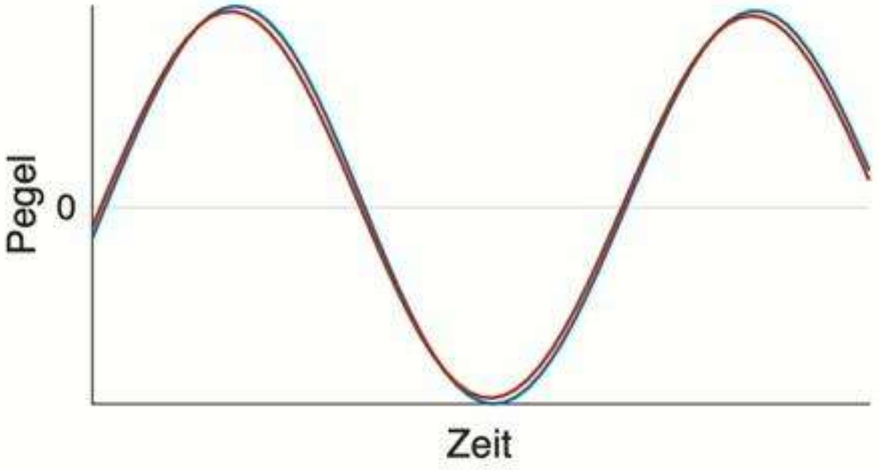

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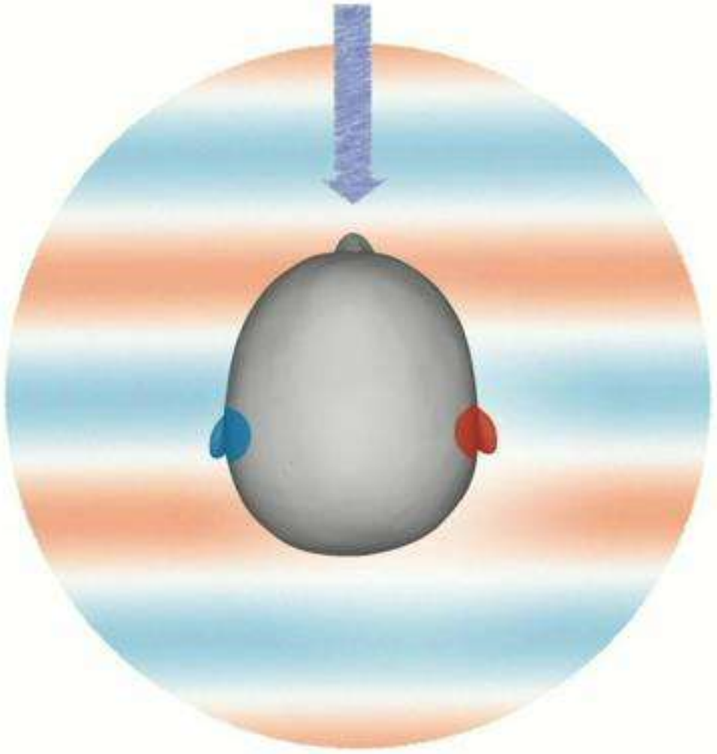

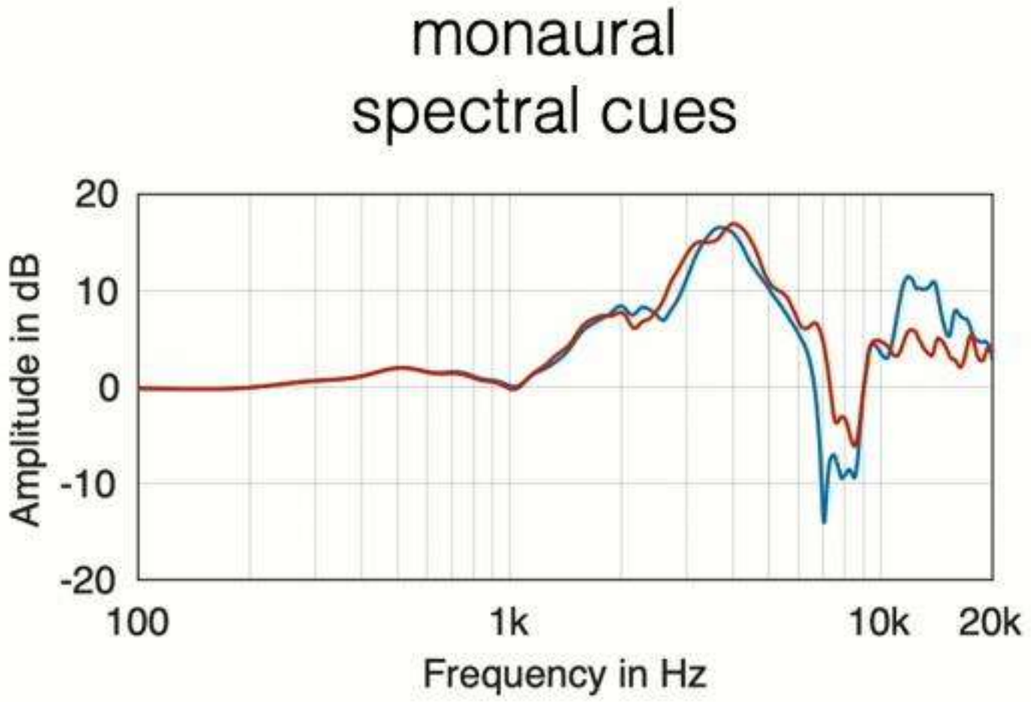

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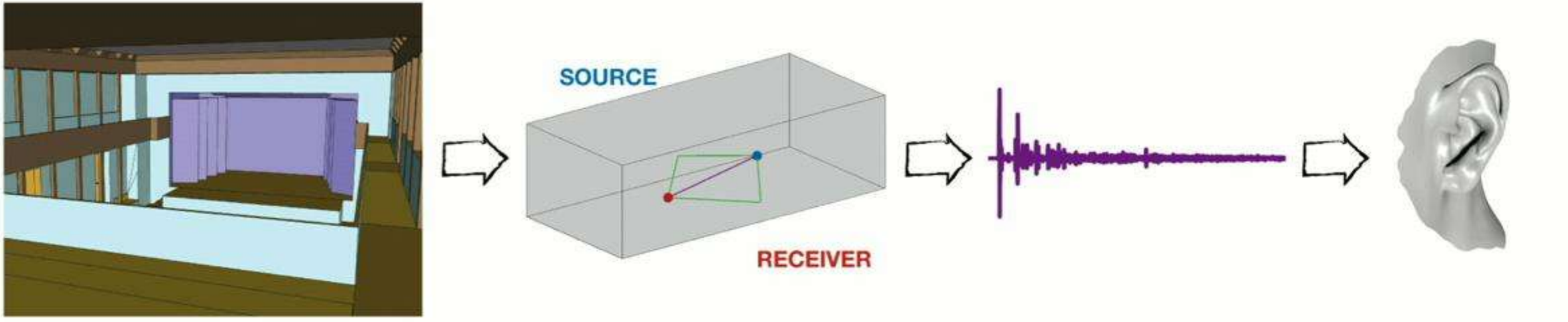
ACOUSTICAL SIMULATION



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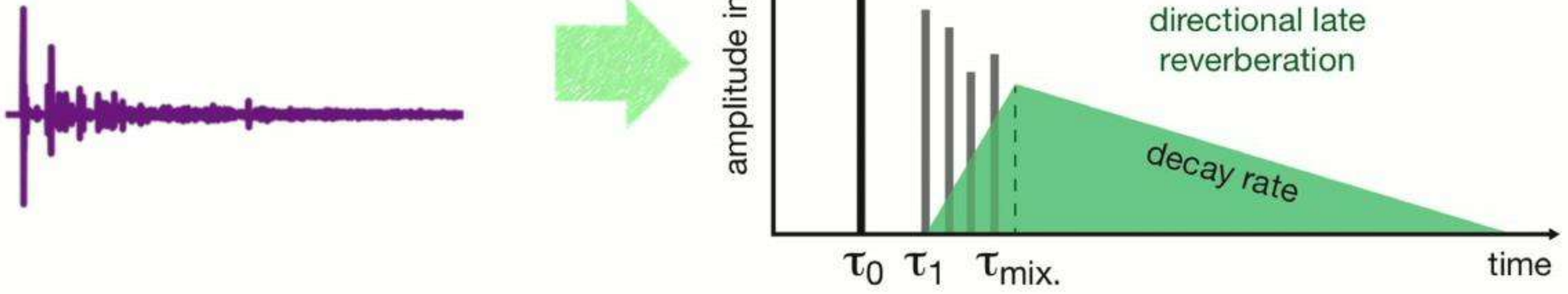
PARAMETRIC SPATIAL AUDIO



Lindau *et al.* (2012) Perceptual evaluation of model- and signal-based predictors of the mixing time… JAES **60**(11): 887 – 898.
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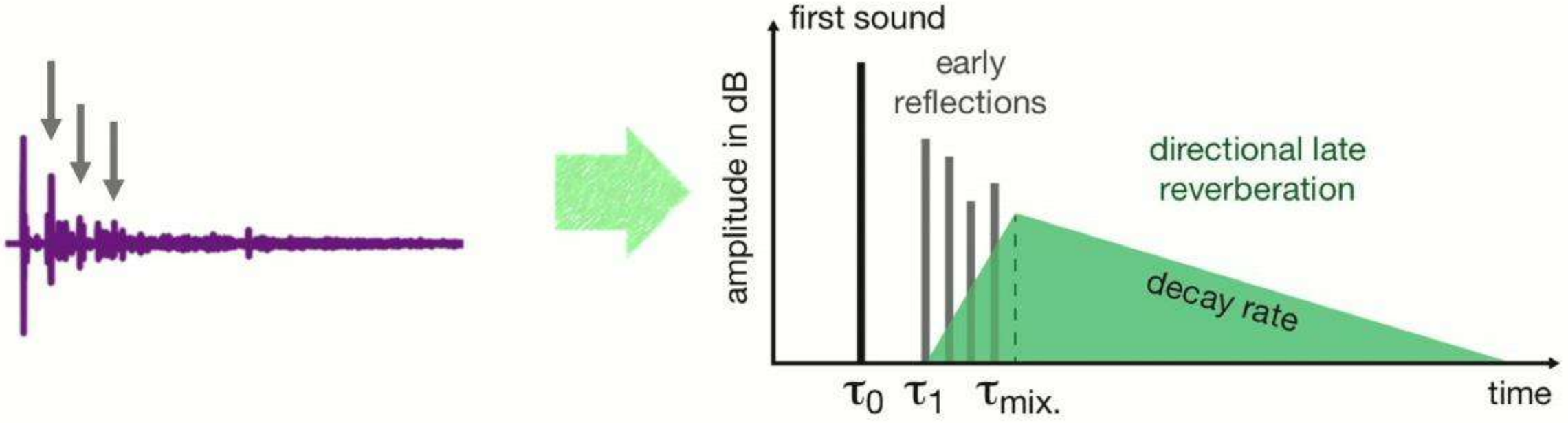

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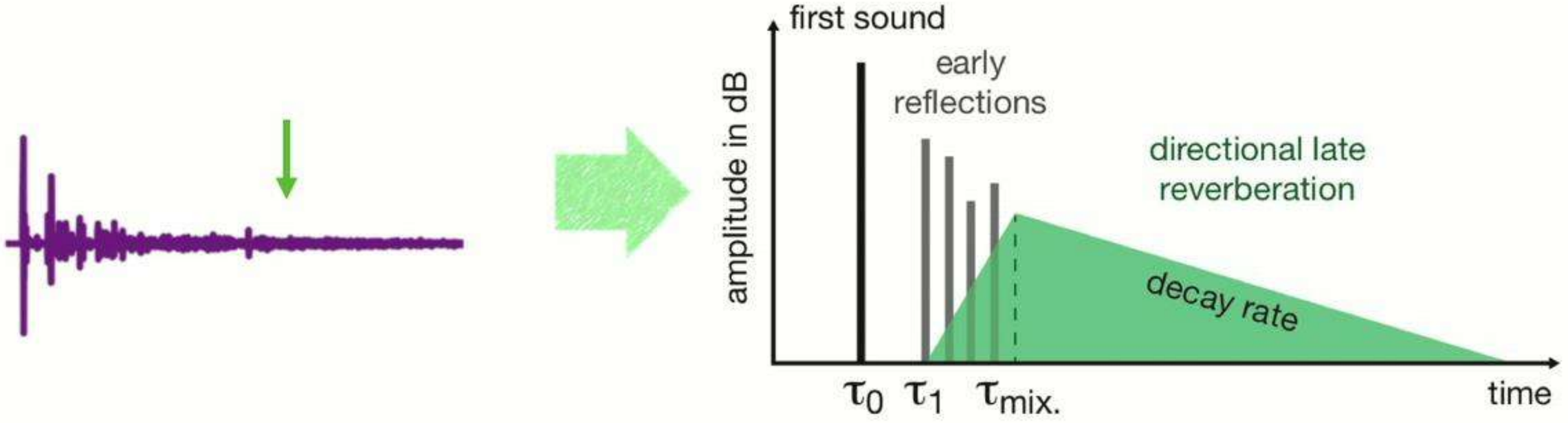

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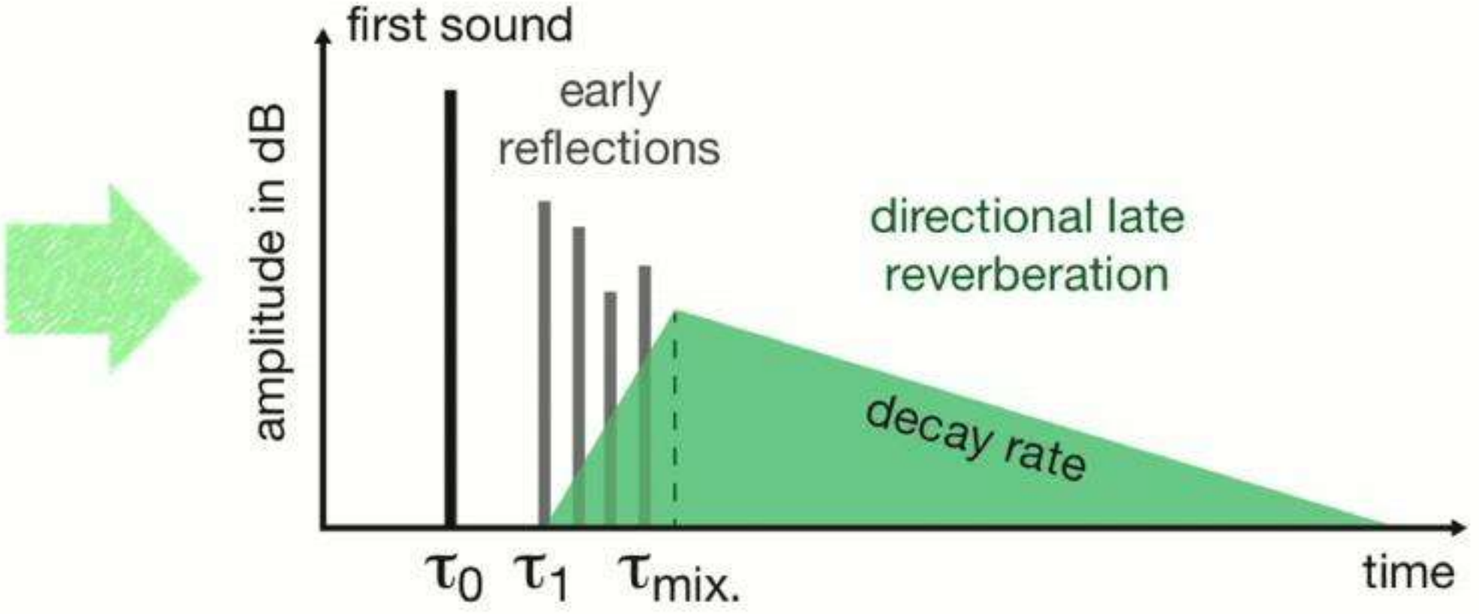

- Cheap rendering
- Low memory
- Aesthetic modification

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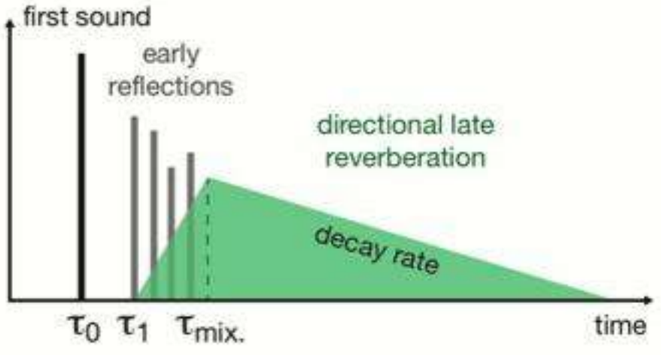
PARAMETRIC DE- AND ENCODING IN CONSIDERATTION OF EARLY REFELCTIONS



- Encoding (offline)
  - Dependency on environment
  - Dependency on audio content
  - Scalable to match computational resources
  - Smooth spatial distribution
  - Low-cost and short memory

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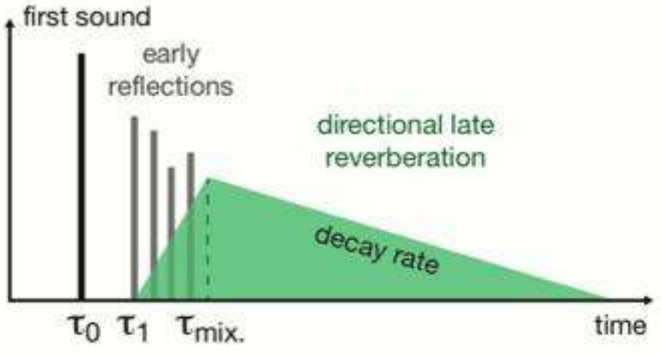
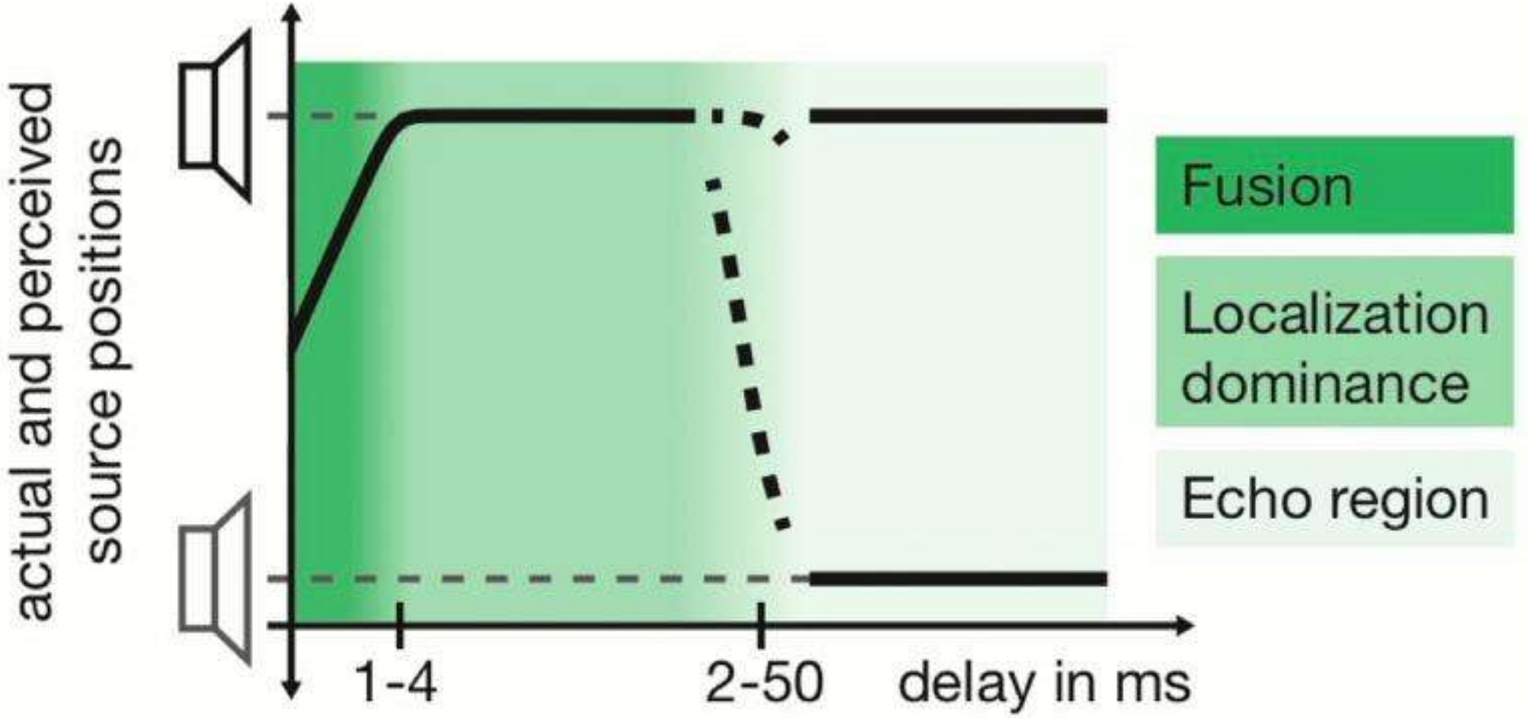


- Encoding (offline)
  - Dependency on environment
  - Dependency on audio content
  - Scalable to match computational resources
  - Smooth spatial distribution
  - Low-cost and short memory
- Decoding (real-time)
  - Efficient
  - Perceptually plausible

PRECEDENCE IN ROOM ACOUSTICS – TEMPORAL ASPECTS



Litovsky *et al.* (1999): The precedence effect. *J. Acoust. Soc. Am.* **104**(4): 1633 – 1654.
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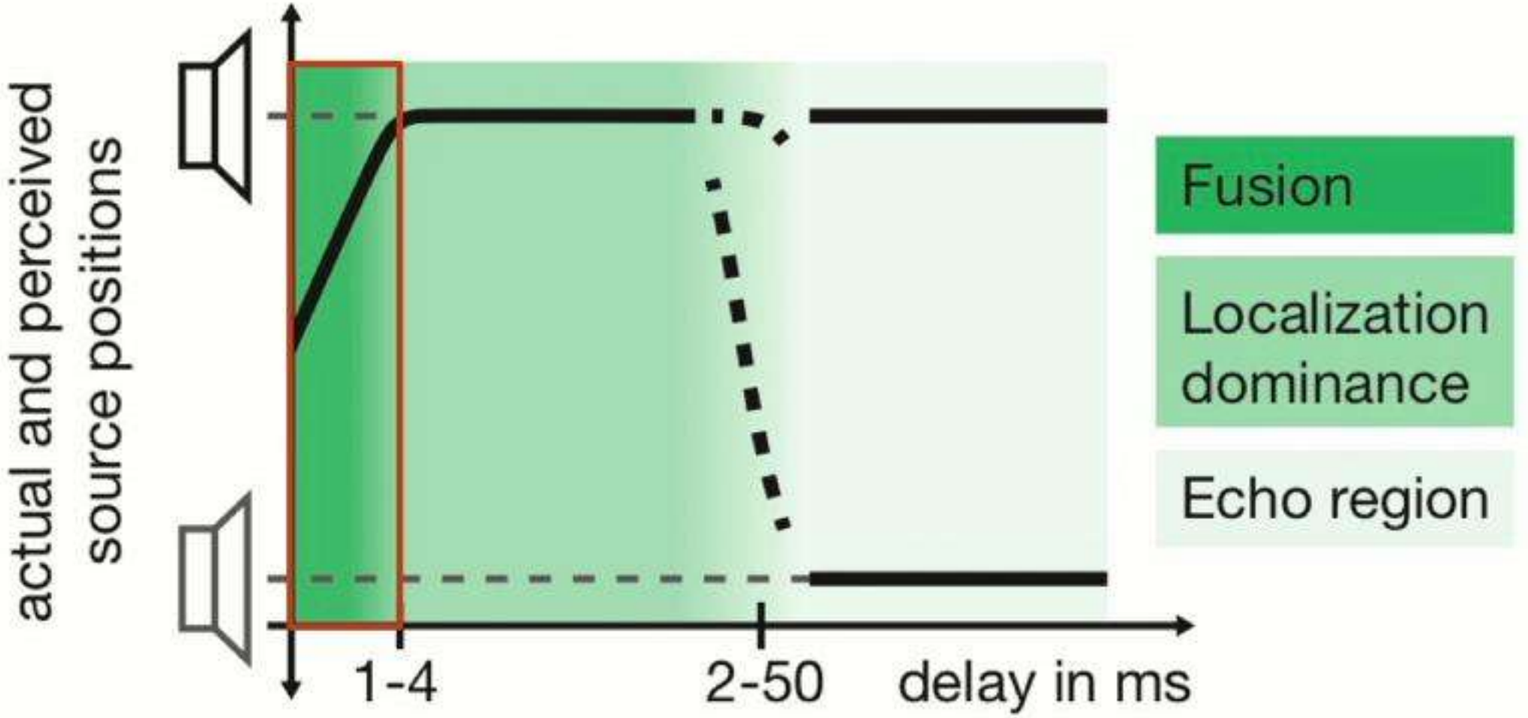

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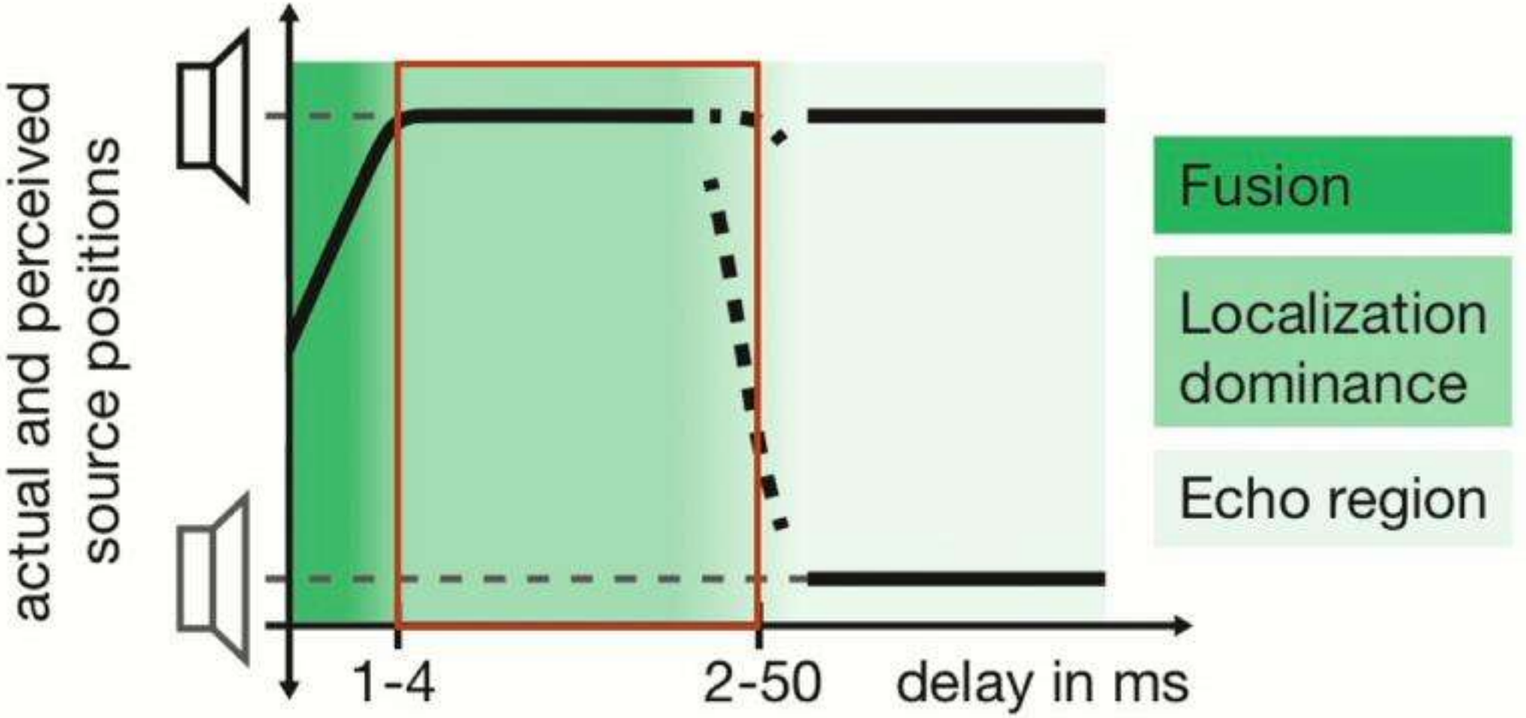

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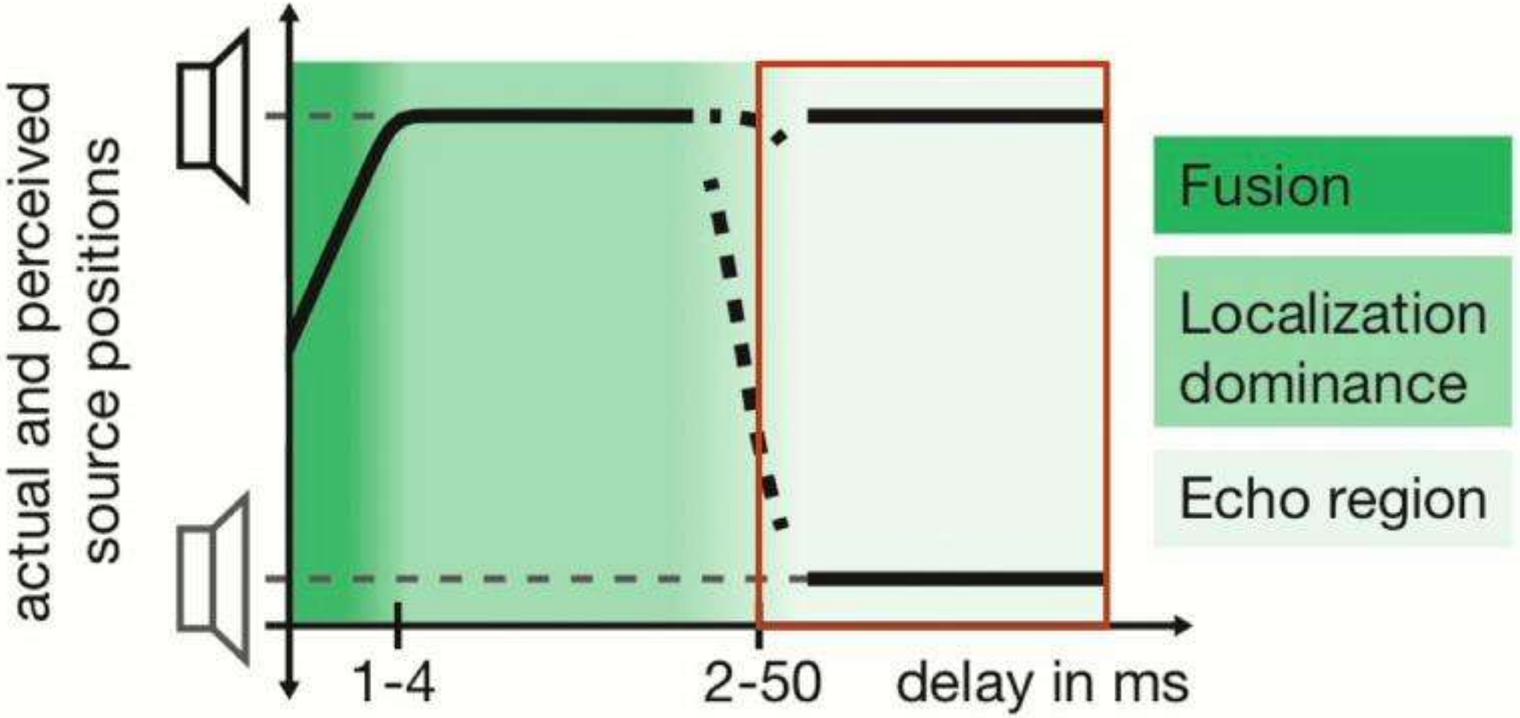

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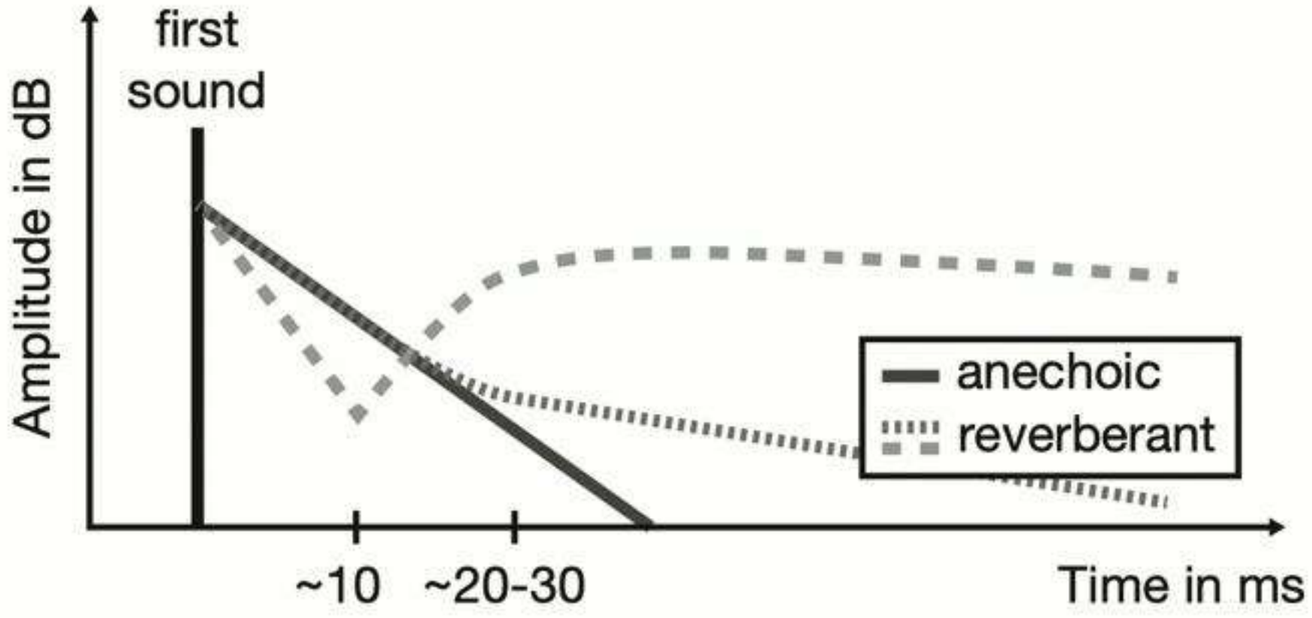
PRECEDENCE IN ROOM ACOUSTICS – ENERGETIC ASPECTS



Olive and Toole (1989): The detection of reflections in typical rooms. *J. Audio Eng. Soc.* **37**(7/8): 539–553.
Rakerd *et al.* (2000): Echo suppression in the horizontal and median sagittal plane. *J. Acoust. Soc. Am.* **107**(2):1061–1064.
Jensen and Welti (2003): The importance of reflections in a binaural room impulse response. *114th AES Convention.*

PRECEDENCE IN ROOM ACOUSTICS – SPATIAL ASPECTS

- Decreased threshold with increasing spatial separation
- Differences of 10 - 15 dB

Bech (1995/1996): Timbral aspects of reproduced sound in small rooms. Part I/II. *J. Acoust. Soc. Am.* **97**(3) and **99**(6).
Litovsky and Cunningham (2001): Investigation of the relationship among three common measures of precedence. *J. Acoust. Soc. Am.*
Best *et al.* (2004): Separation of concurrent broadband sound sources… *J. Acoust. Soc. Am.* **115**(1):324–336.

INTRODUCTION

METHOD

RESULTS

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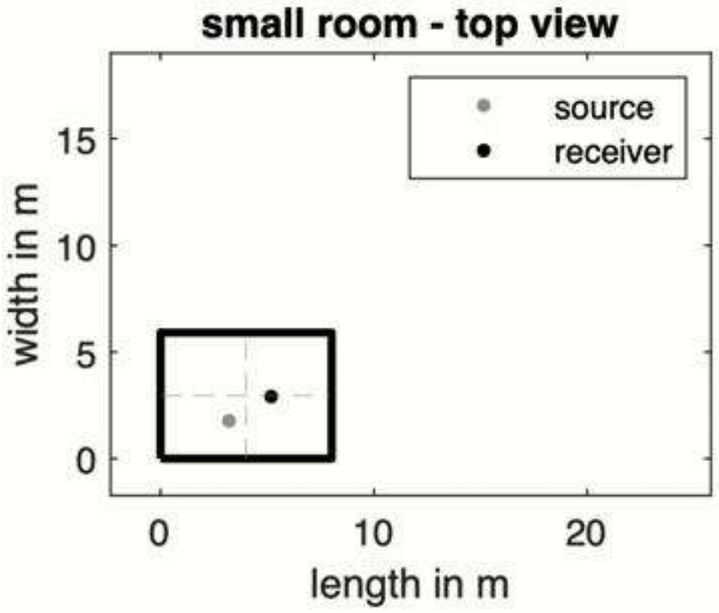
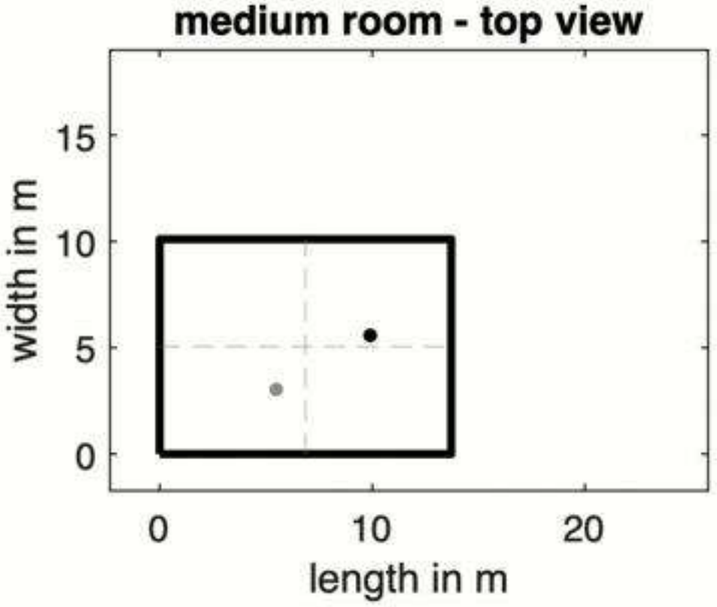
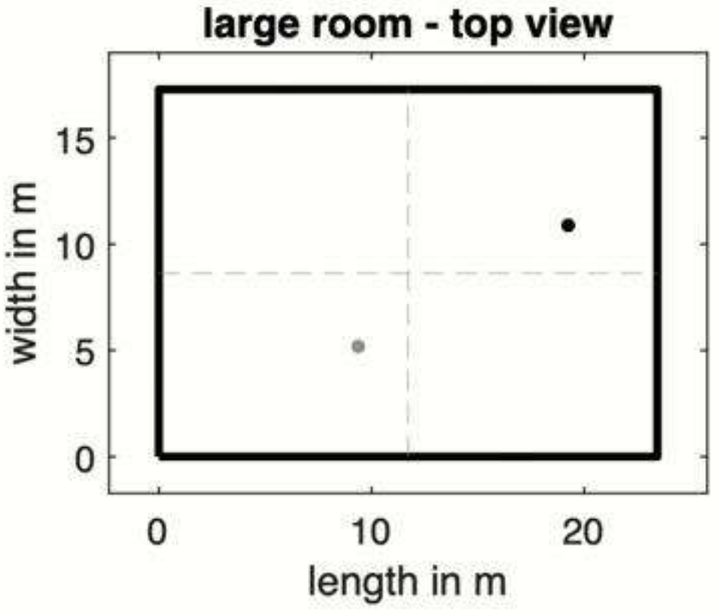
DATABASE

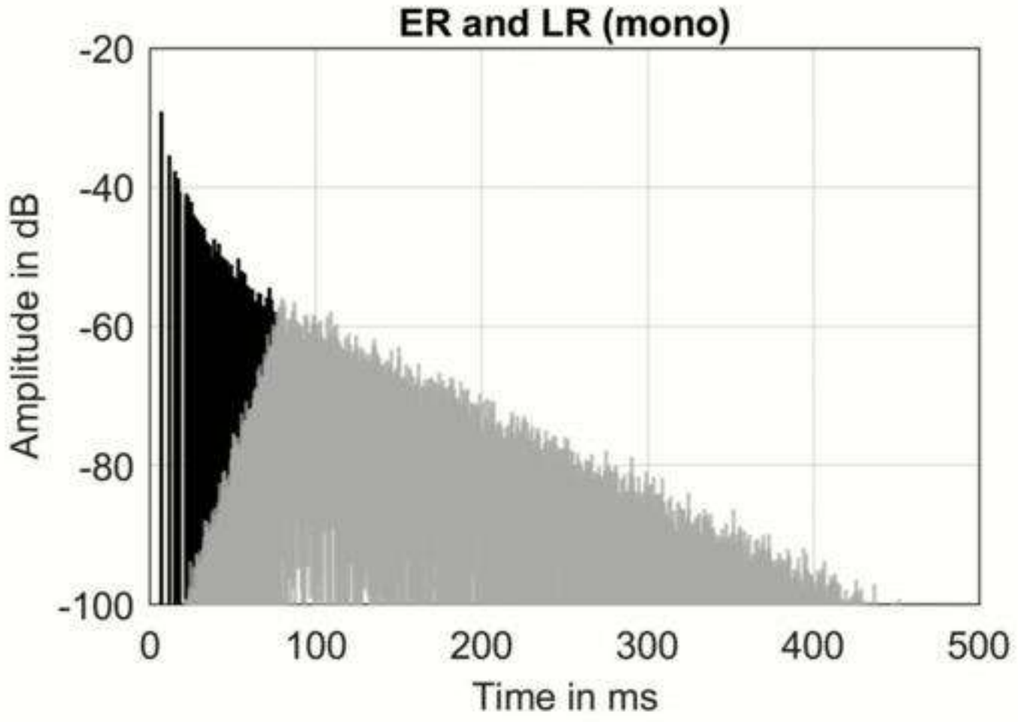
- 9 empty shoe box rooms
  - 3 Reverberation times: 0.5 s, 1 s, 2 s
  - 3 Volumes: 200 m^3, 1000 m^3, 5000 m^3







DATABASE – IMAGE SOURCE MODEL



Brinkmann and Weinzierl (2017): AKtools. 142nd AES Convention, Berlin, Germany

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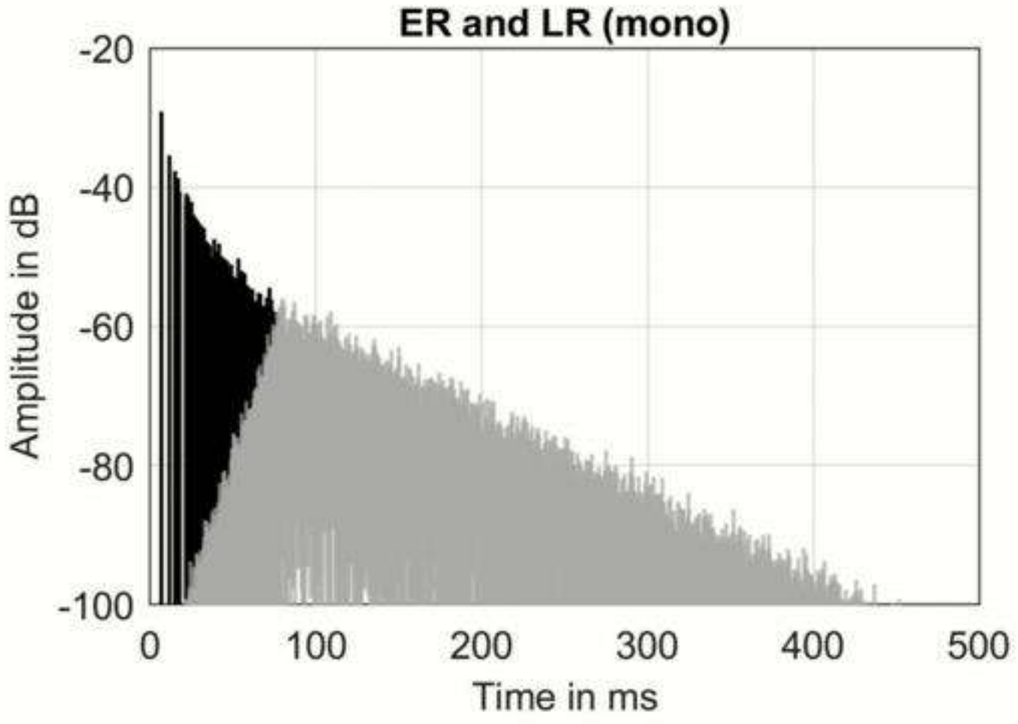

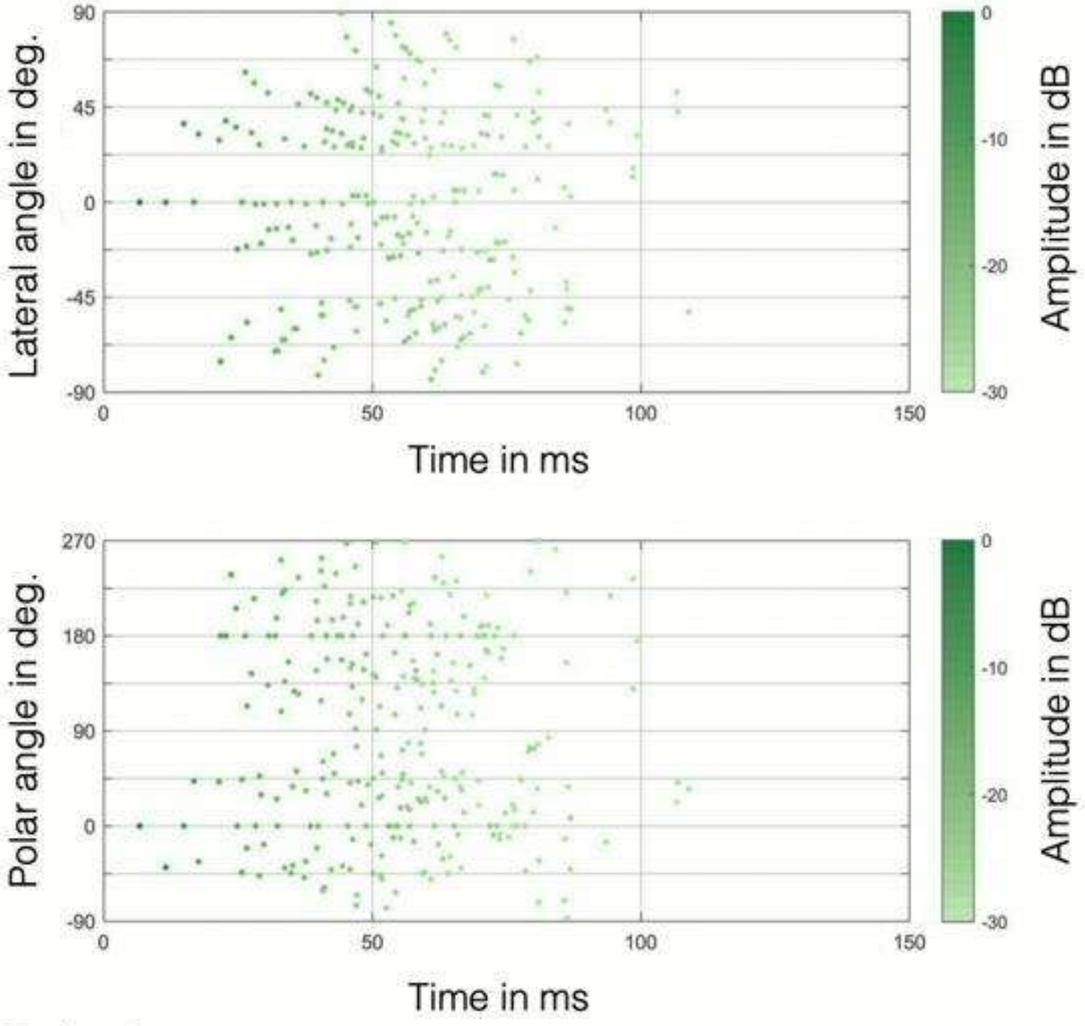

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DATABASE - TRITON

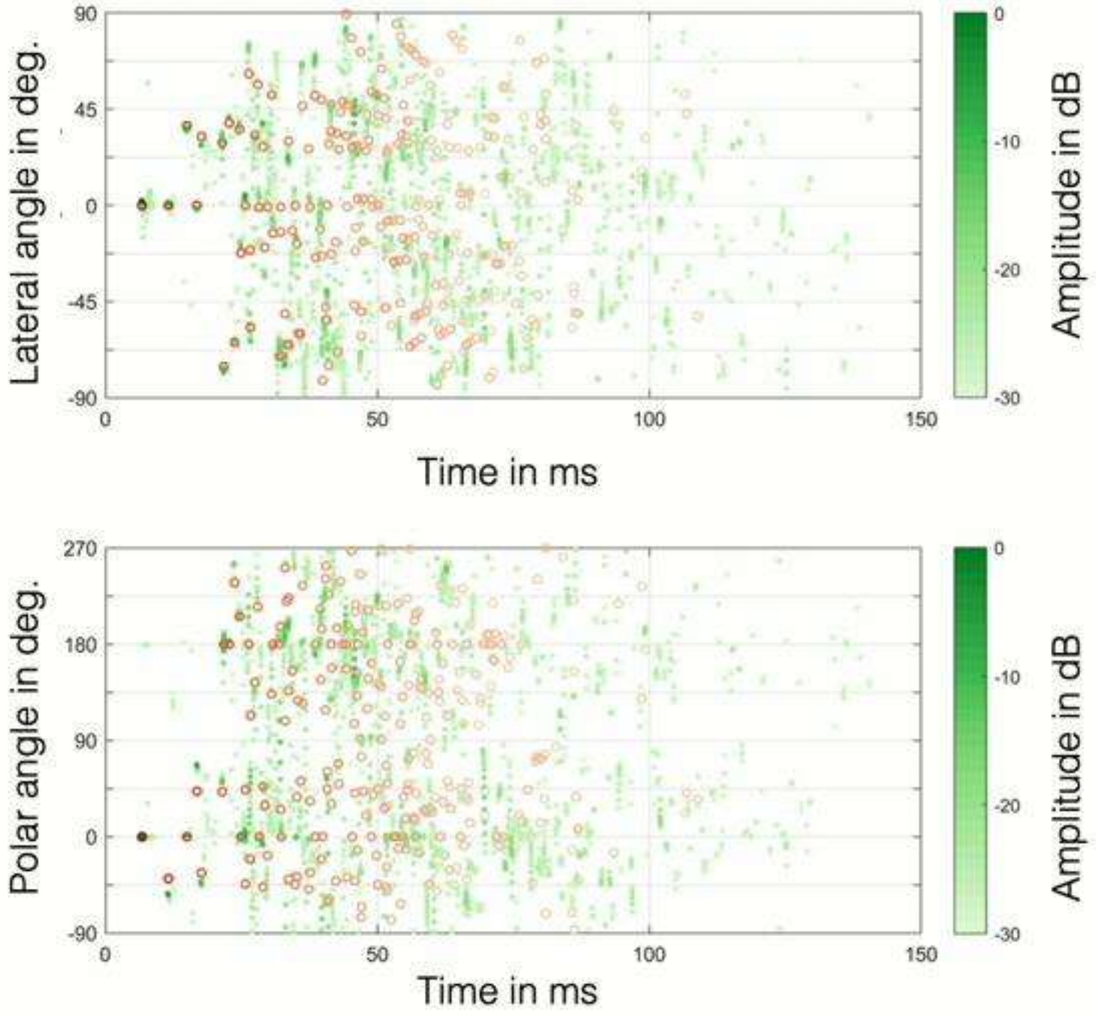
- Wave based simulation up to 8 kHz
- Direction from sound intensity $\boldsymbol{I}$

$$\boldsymbol{I} = p\boldsymbol{v}, \qquad \boldsymbol{v} = -\frac{1}{\rho_0}\int \nabla p \, \mathrm{d}t$$

- Pressure gradient $\nabla \boldsymbol{p}$ from neighboring points in x/y/z-direction
- 10^{th} order, zero phase low-pass @ 2 kHz

Raghuvanshi and Snyder (2018): Parametric directional coding for precomputed sound propagation. *ACM Trans. Graph.*

DATABASE - TRITON



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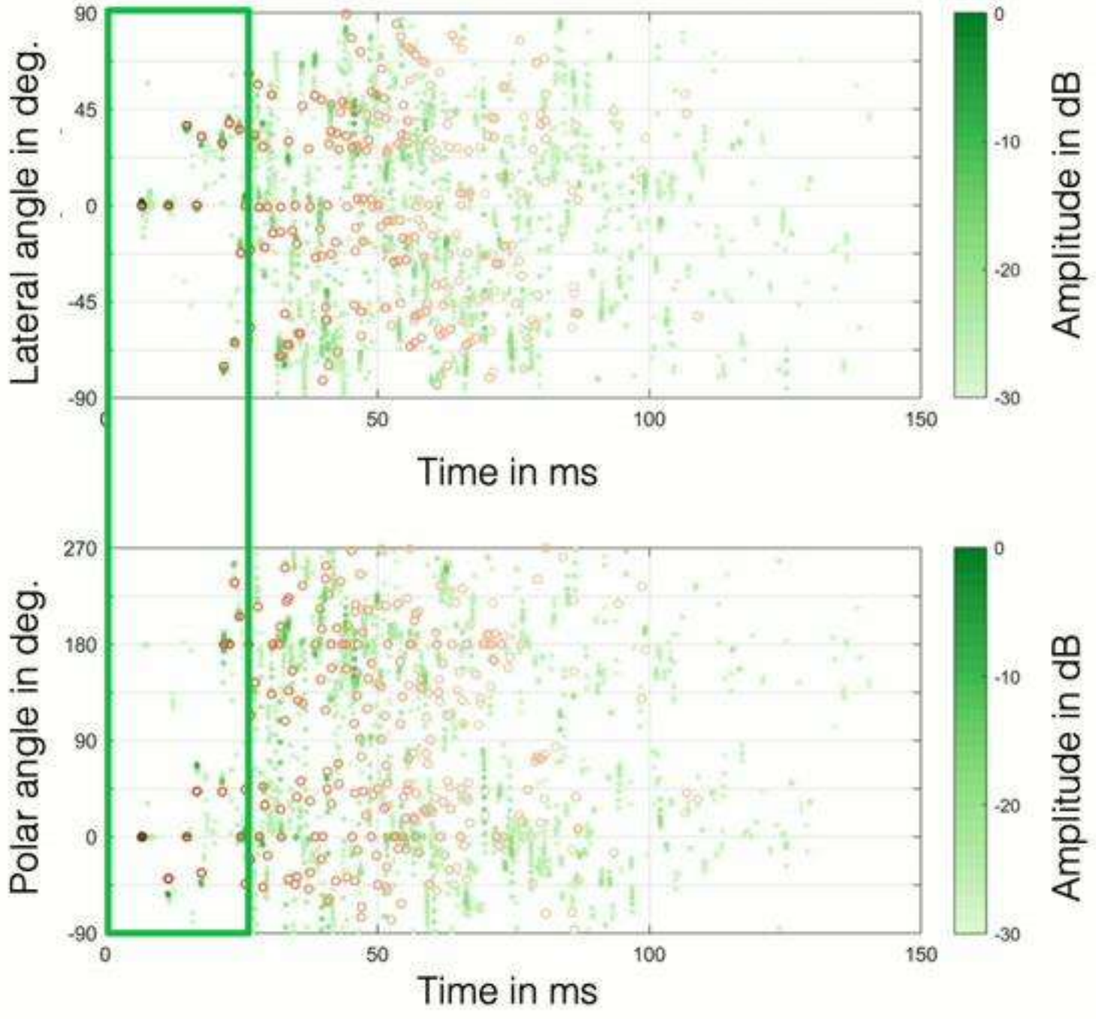

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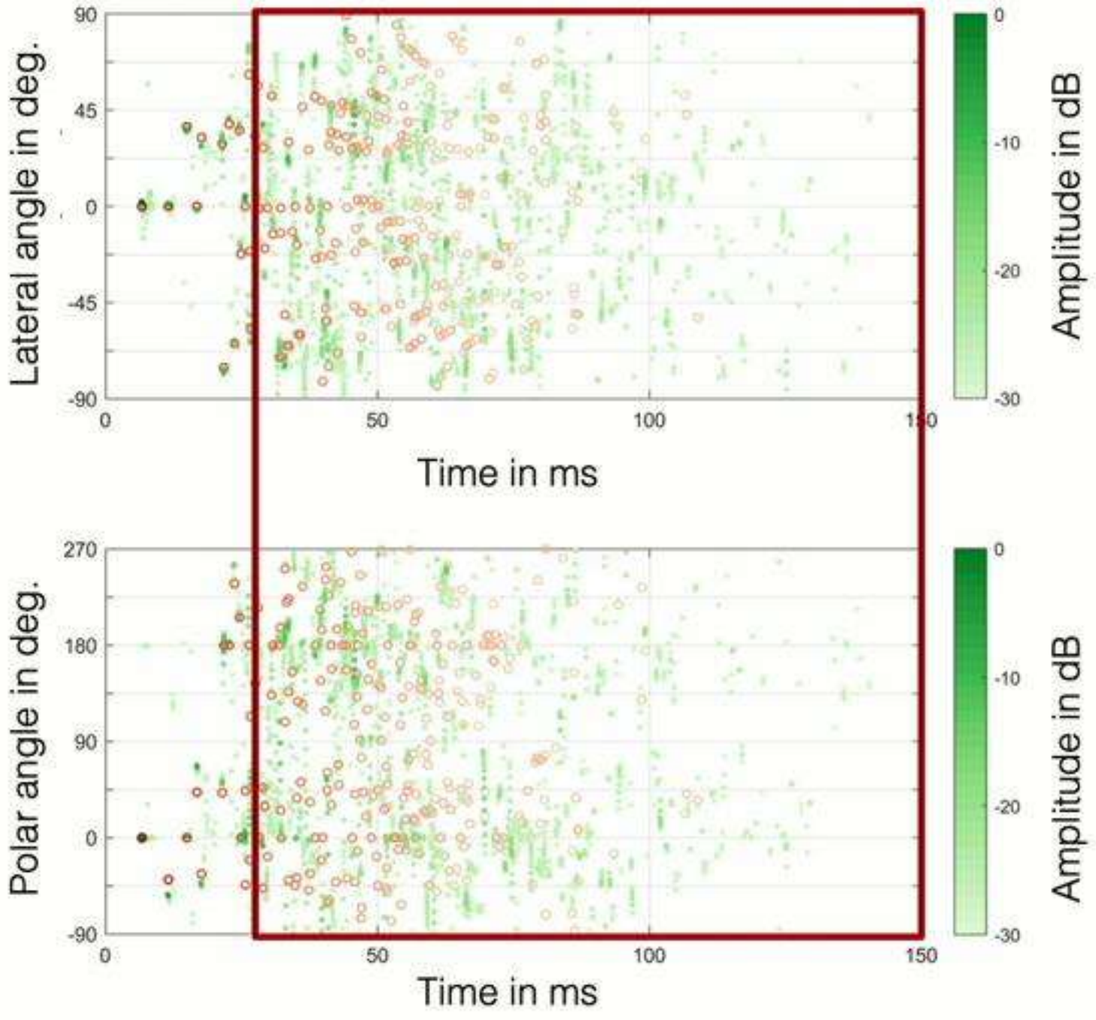

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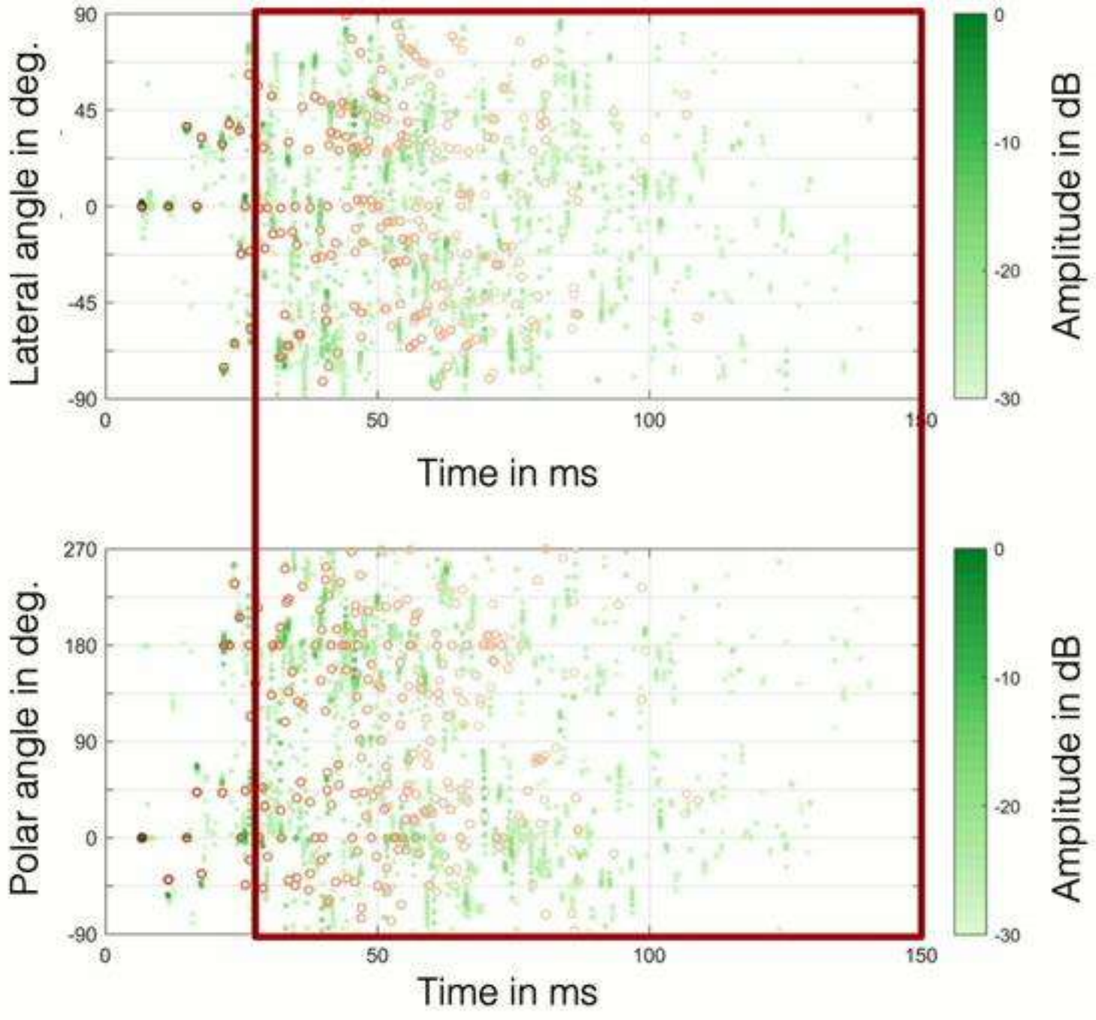

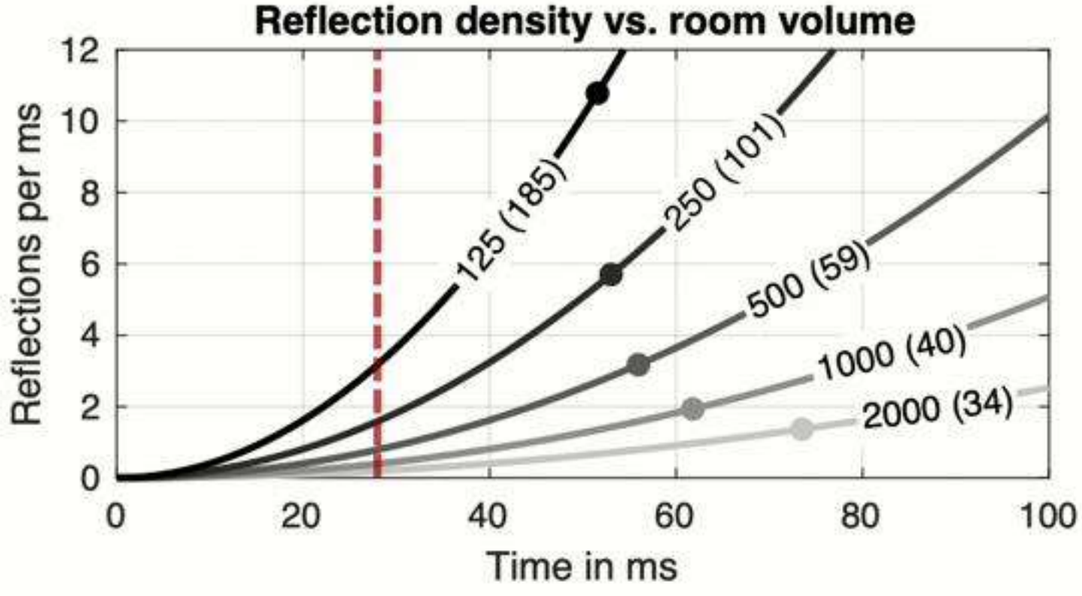

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PROPOSED ENCODING

a) estimate τ_0, a_0, and $\measuredangle_0 = \{\phi_0, \theta_0\}$

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b) estimate τ_i, a_i, and $\measuredangle_i$ based on masking threshold

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PROPOSED ENCODING

a) estimate τ_0, a_0, and $\measuredangle_0 = \{\phi_0, \theta_0\}$

b) estimate τ_i, a_i, and $\measuredangle_i$ based on masking threshold

c) select N reflections

d) estimate late reverberation based on residual energy

PROPOSED ENCODING: τ_0, a_0

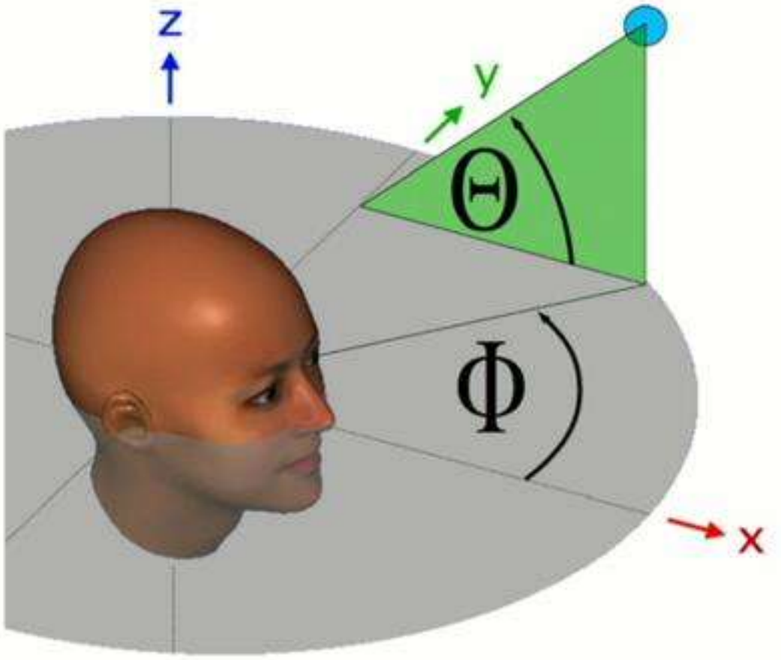
τ_0: Onset estimator according to [1]

$$a_0 = \left[\frac{1}{1.5\ \mathrm{ms}} \int_{\tau_0 - 0.5\ \mathrm{ms}}^{\tau_0 + 1\ \mathrm{ms}} p(t)^2 \mathrm{d}t \right]^{1/2}$$

[1] Raghuvanshi and Snyder (2018): Parametric directional coding for precomputed sound propagation. *ACM Trans. Graph.*

PROPOSED ENCODING: $\measuredangle_0$

$$\phi_0 = \frac{1}{\int_{\tau_0-0.5\ \mathrm{ms}}^{\tau_0+1\ \mathrm{ms}} p^2 \mathrm{d}t} \int_{\tau_0-0.5\ \mathrm{ms}}^{\tau_0+1\ \mathrm{ms}} p(t)^2 \phi(t) \mathrm{d}t$$

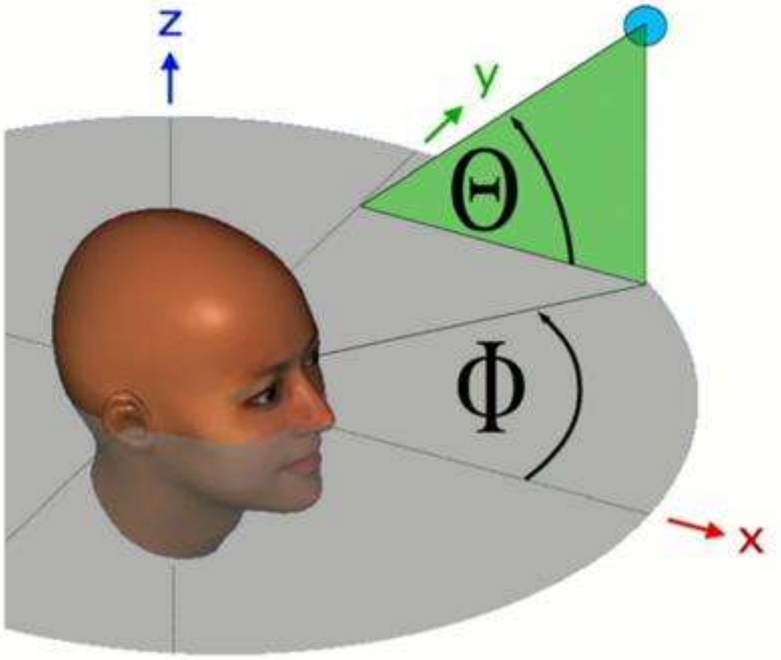


Ziegelwanger and Majdak (2014): Modeling the direction continuous time-of-arival. *J. Acust. Soc. Am.* **135**(3): 1278 – 1293.

PROPOSED ENCODING: $\measuredangle_0$

$$\phi_0 = \frac{1}{\int_{\tau_0-0.5\,\mathrm{ms}}^{\tau_0+1\,\mathrm{ms}} p^2 \mathrm{d}t} \int_{\tau_0-0.5\,\mathrm{ms}}^{\tau_0+1\,\mathrm{ms}} p(t)^2 \phi(t) \mathrm{d}t$$

$$\theta_0 = \angle \left(\int_{\tau_0-0.5\,\mathrm{ms}}^{\tau_0+1\,\mathrm{ms}} p(t)^2 e^{-i\theta(t)}\, \mathrm{d}t \right)$$



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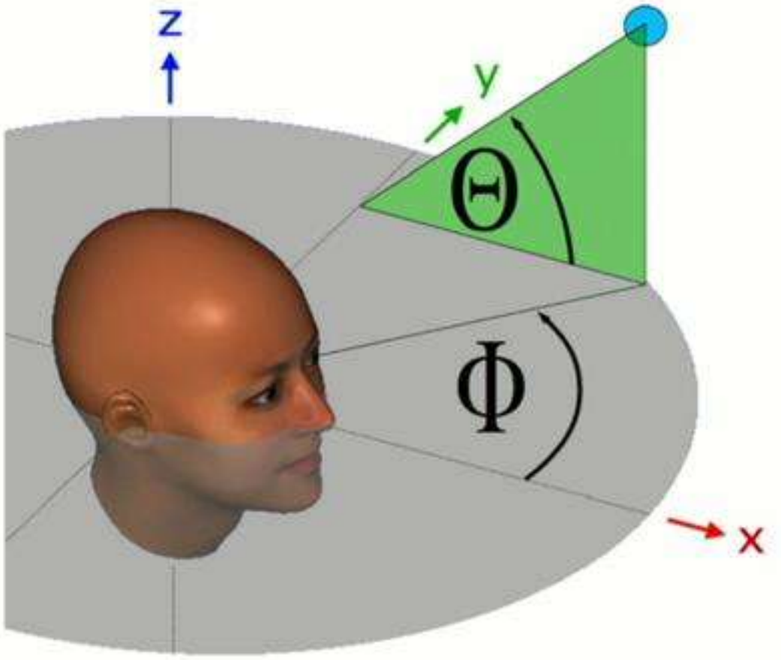
$$\phi_0 = \frac{1}{\int_{\tau_0-0.5\ \mathrm{ms}}^{\tau_0+1\ \mathrm{ms}} p^2 \mathrm{d}t} \int_{\tau_0-0.5\ \mathrm{ms}}^{\tau_0+1\ \mathrm{ms}} p(t)^2 \phi(t) \mathrm{d}t$$



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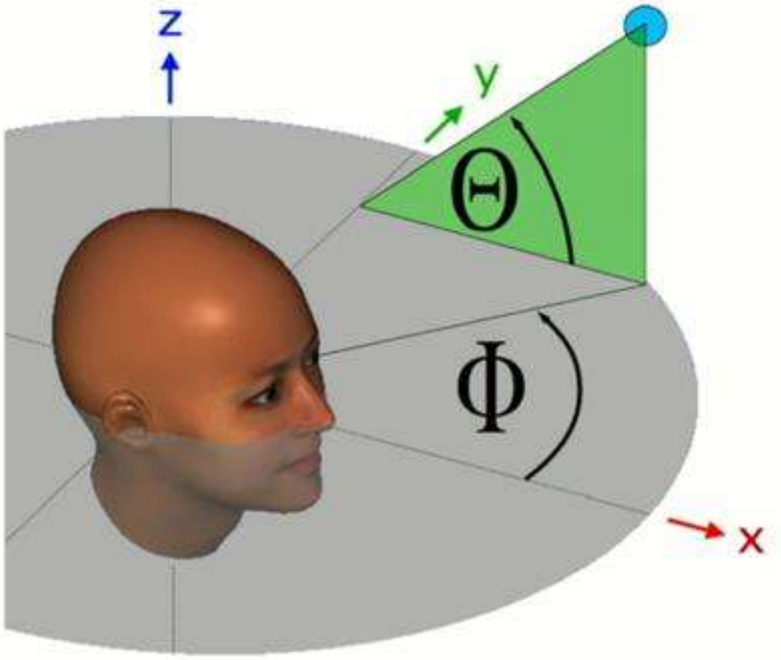
PROPOSED ENCODING: $\measuredangle_0$

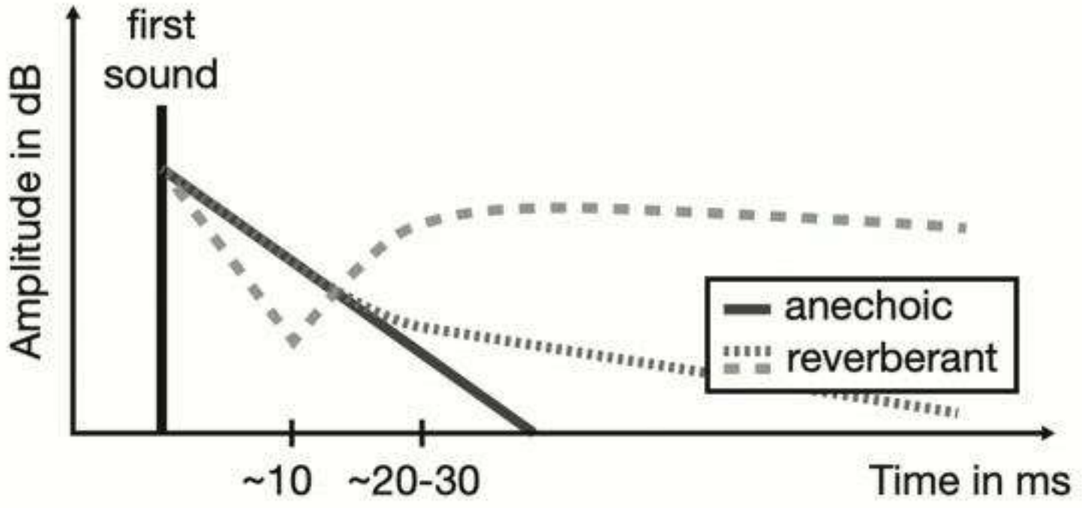
$$\phi_0 = \frac{1}{\int_{\tau_0-0.5\,\mathrm{ms}}^{\tau_0+1\,\mathrm{ms}} p^2 \mathrm{d}t} \int_{\tau_0-0.5\,\mathrm{ms}}^{\tau_0+1\,\mathrm{ms}} p(t)^2 \phi(t) \mathrm{d}t$$

$$\theta_0 = \angle \left(\int_{\tau_0-0.5\,\mathrm{ms}}^{\tau_0+1\,\mathrm{ms}} p(t)^2 e^{-i\theta(t)}\, \mathrm{d}t \right)$$



Ziegelwanger and Majdak (2014): Modeling the direction continuous time-of-arival. *J. Acust. Soc. Am.* **135**(3): 1278 – 1293.

PROPOSED ENCODING: MASKING THRESHOLD

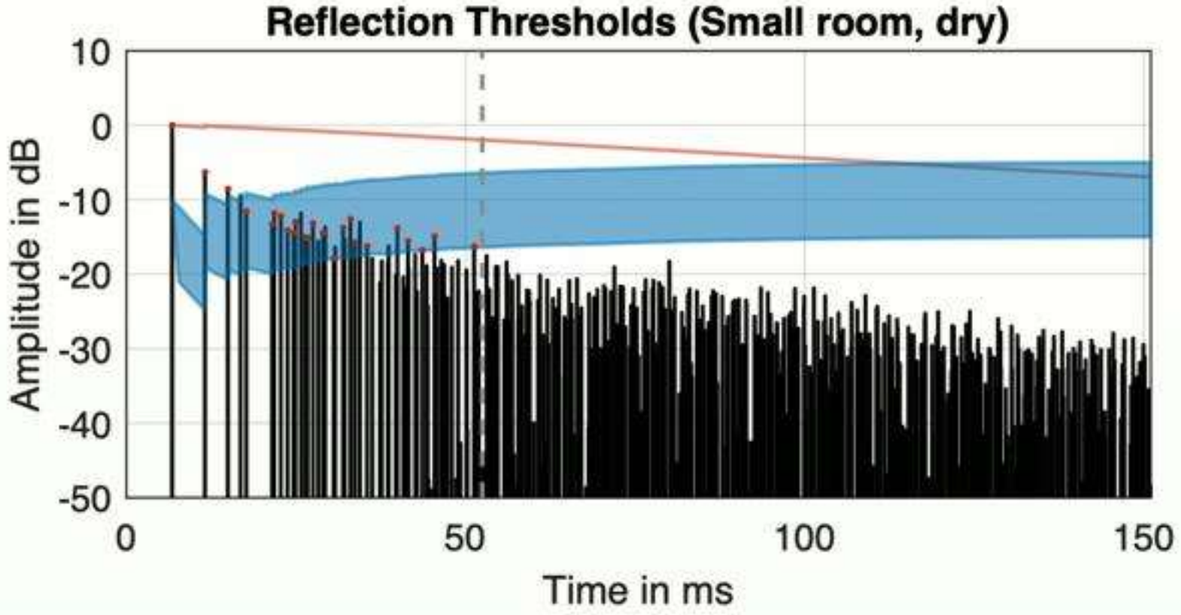


slope: -1 dB/ms

offset: -10 dB

v-shape: add 35% reflection energy to threshold

PROPOSED ENCODING: MASKING THRESHOLD



slope: -1 dB/ms

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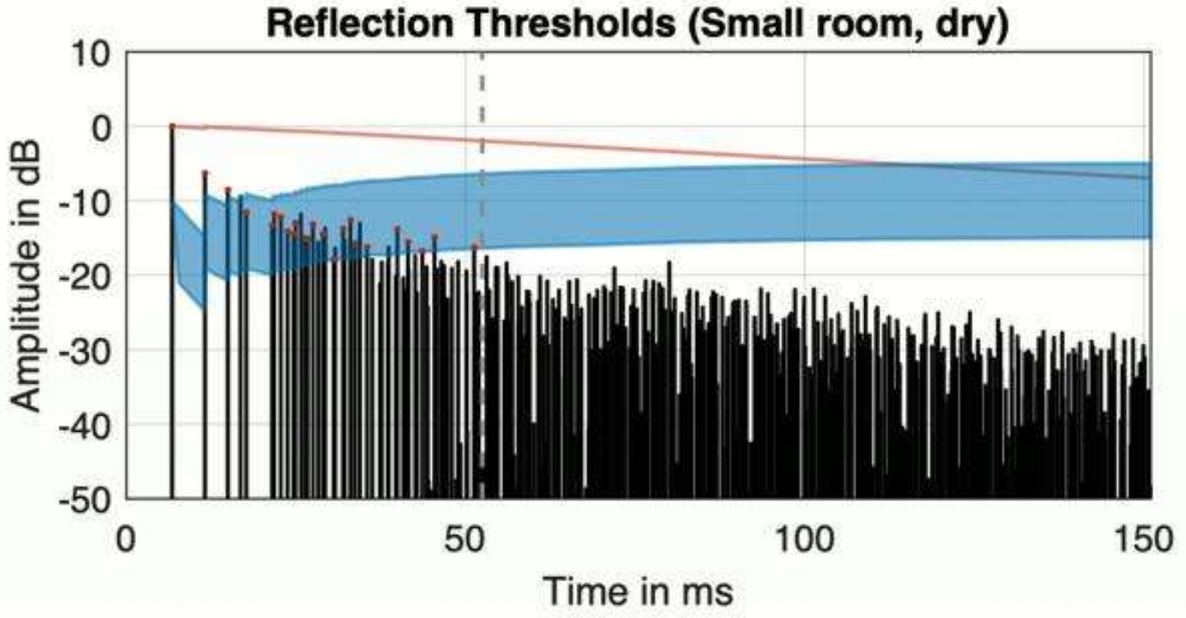
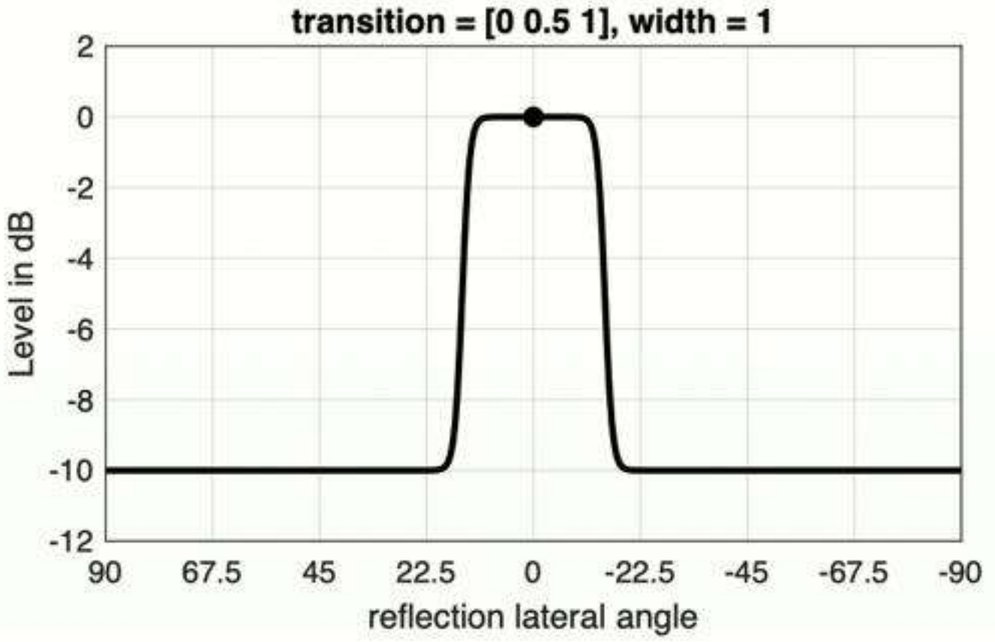
PROPOSED ENCODING: MASKING THRESHOLD





slope: -1 dB/ms

offset: -10 dB

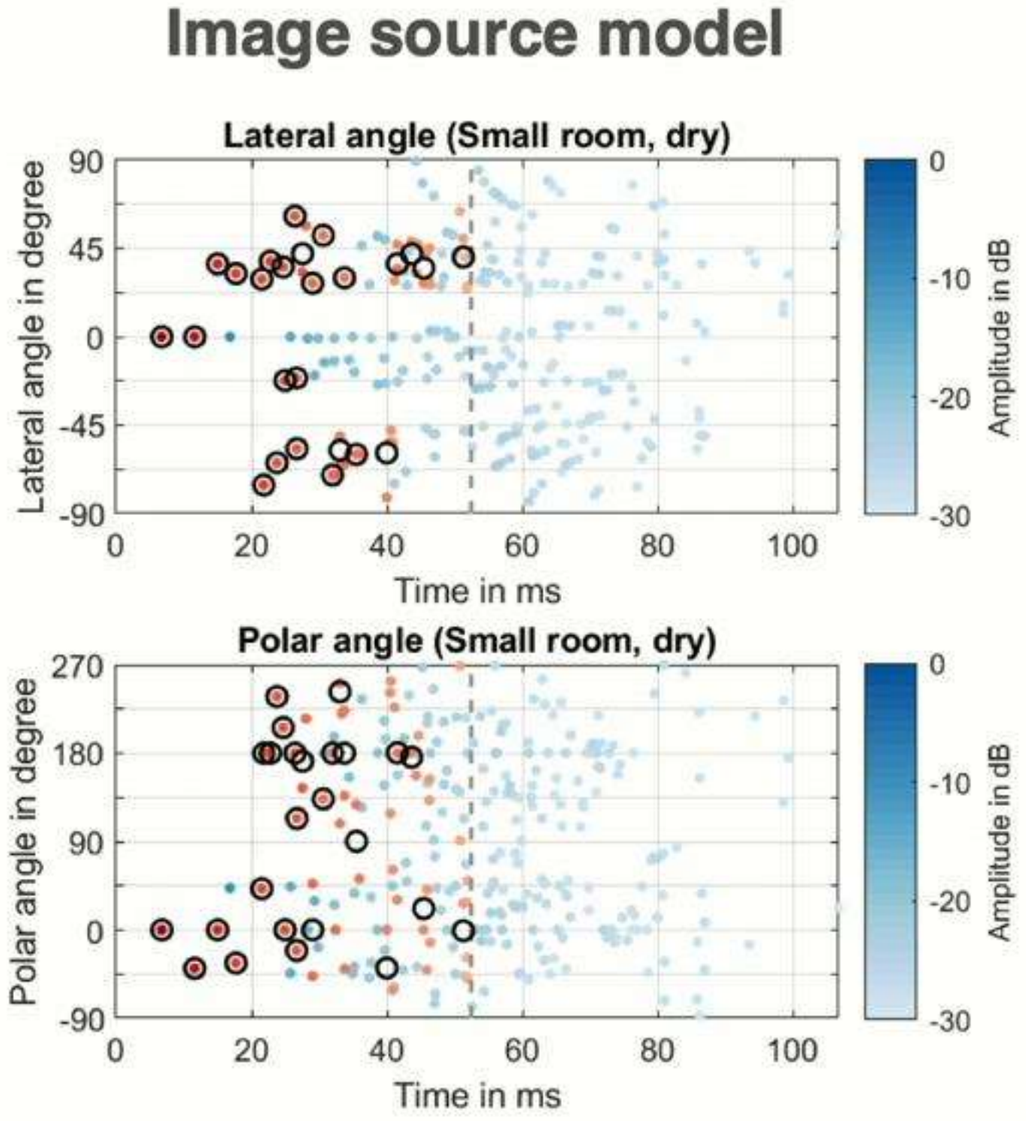
v-shape: add 35% reflection energy to threshold

width according to [1]

depth: -10 dB

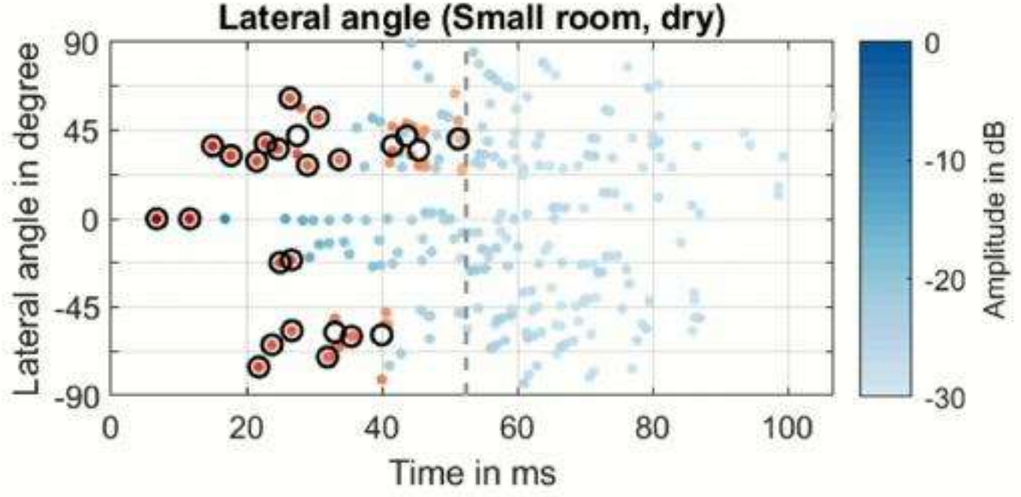
[1] Best *et al.* (2004): Separation of concurrent broadband sound sources… *J. Acoust. Soc. Am.* **115**(1):324–336.

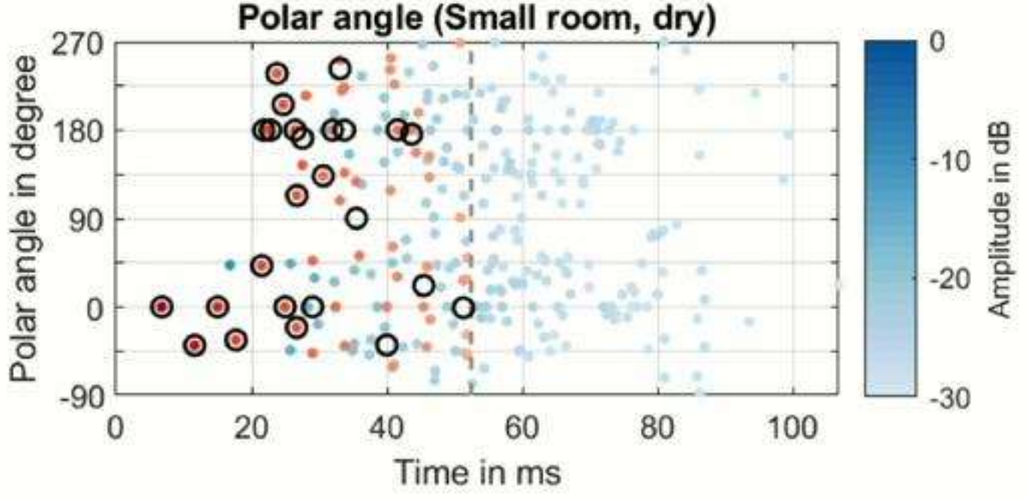
PROPOSED ENCODING: DETECTED REFLECTIONS



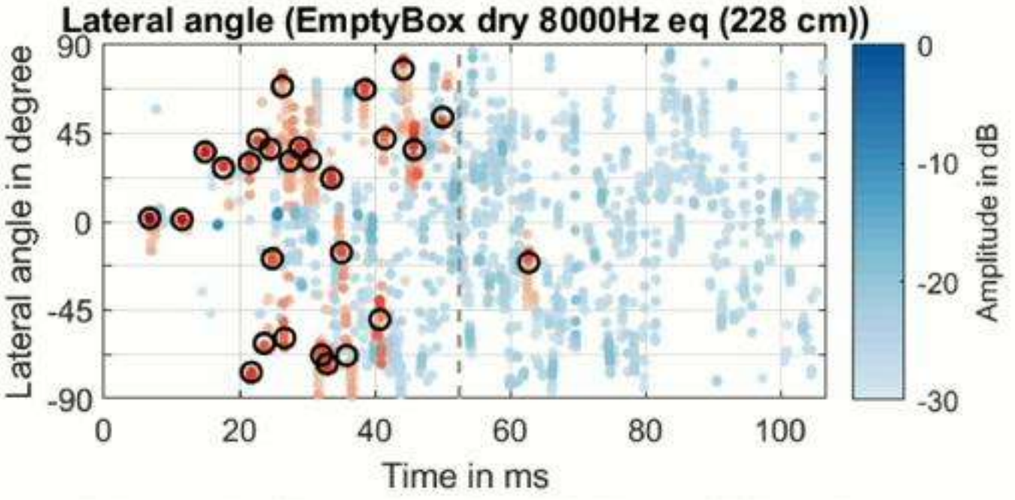
PROPOSED ENCODING: DETECTED REFLECTIONS

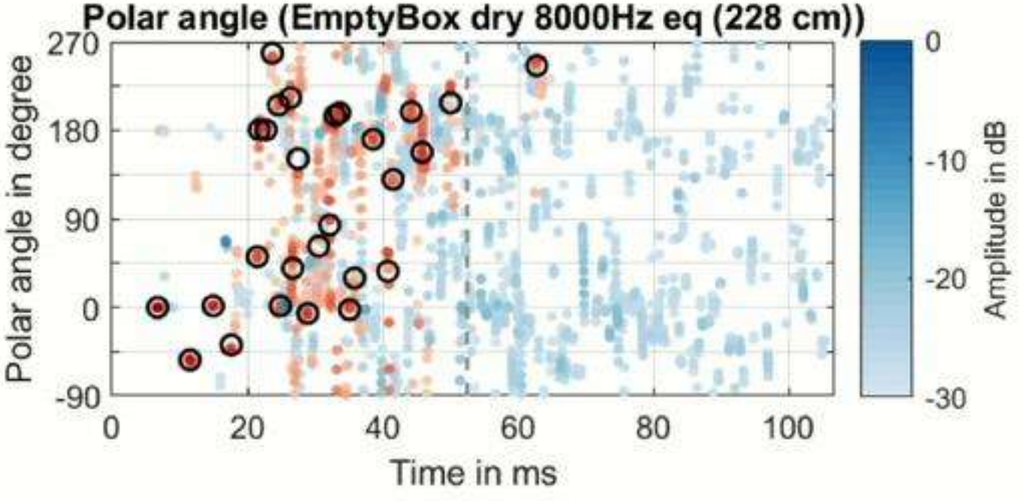
Image source model



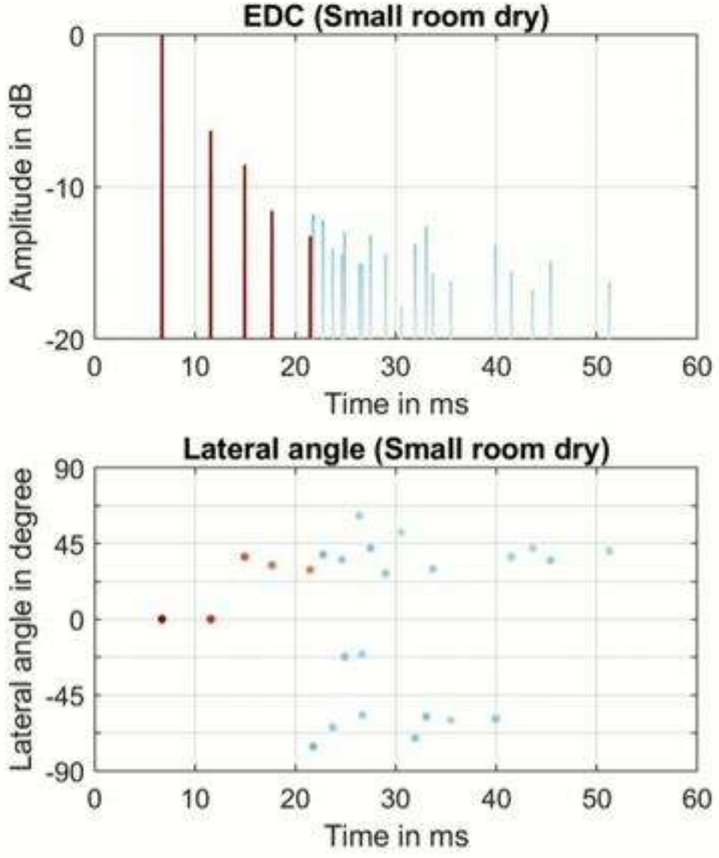


Triton



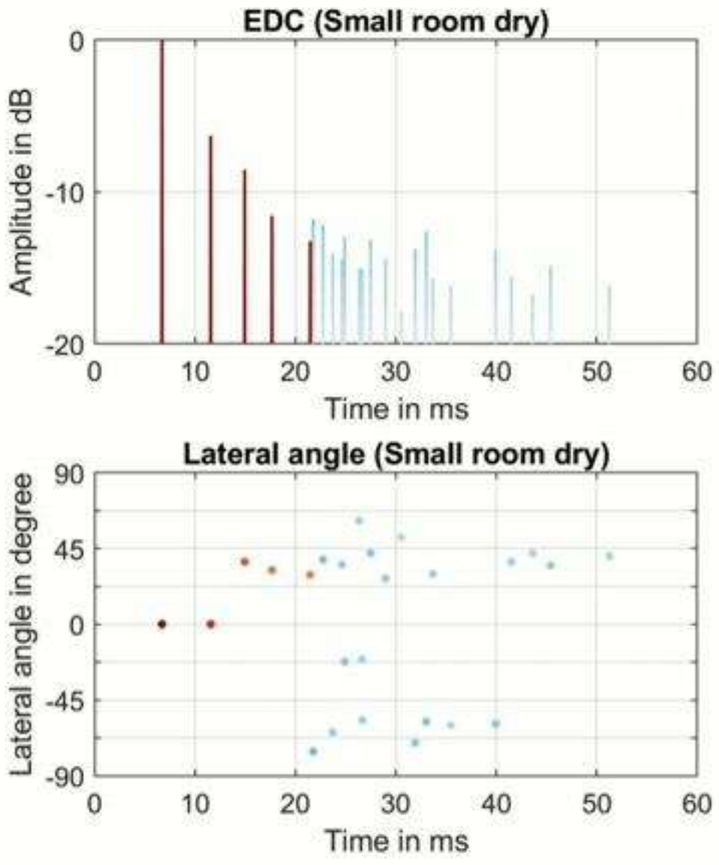


PROPOSED ENCODING: SELECTION

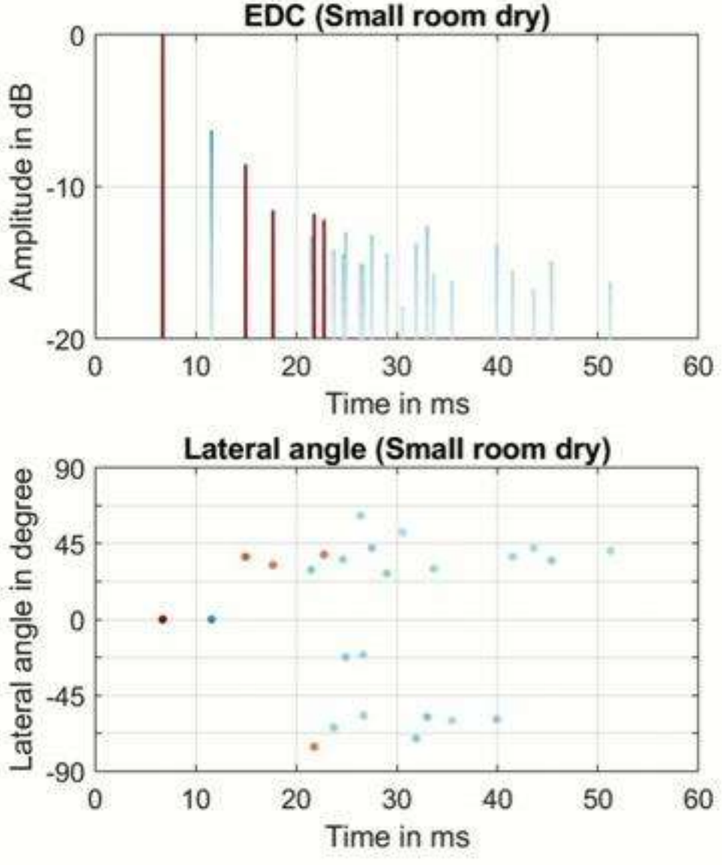


First

PROPOSED ENCODING: SELECTION

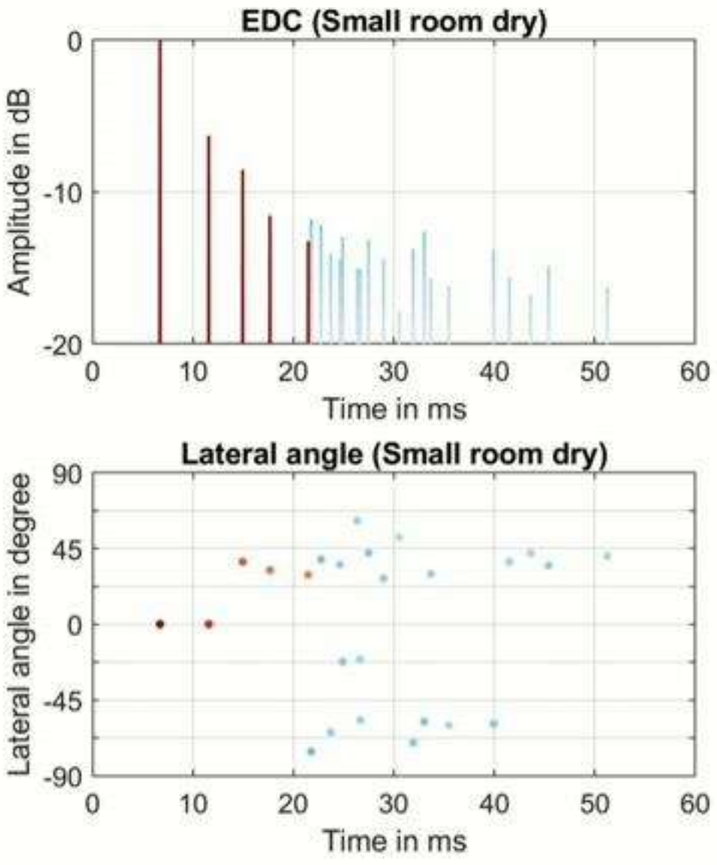


First

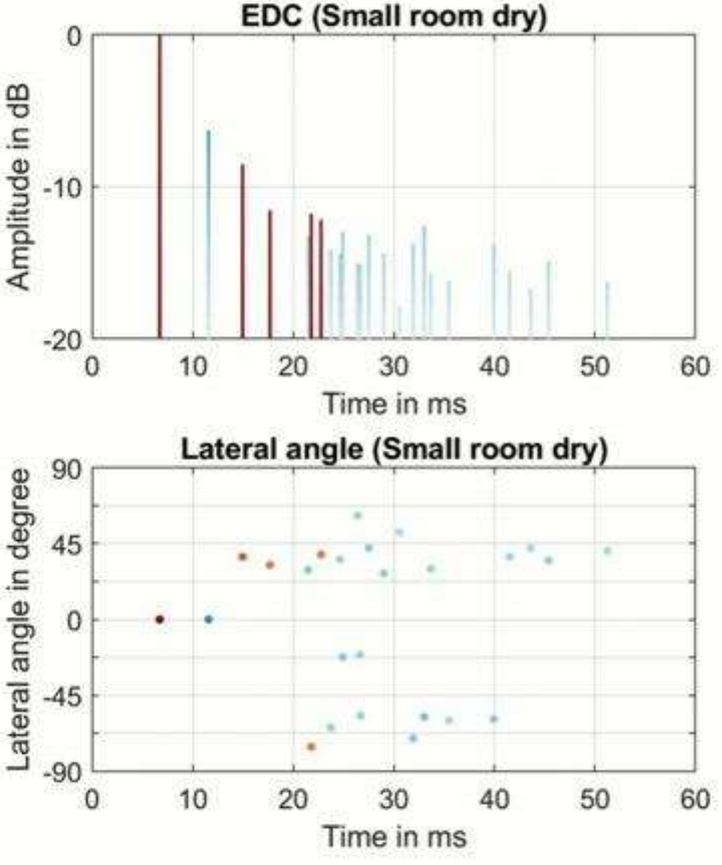


Exceed

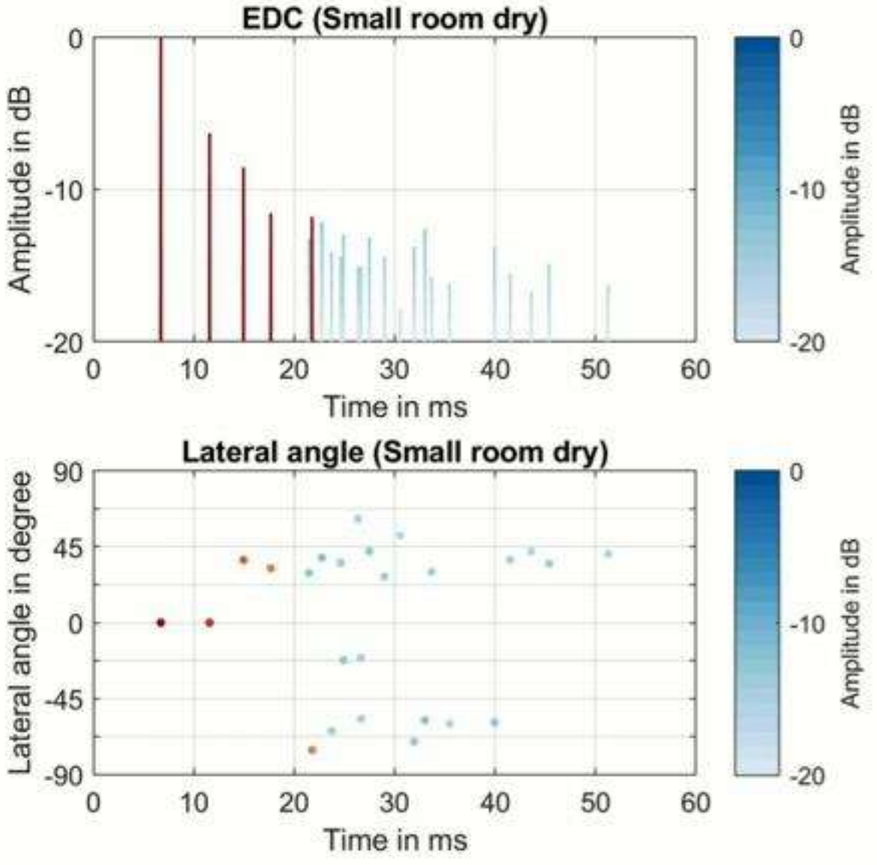
PROPOSED ENCODING: SELECTION



First

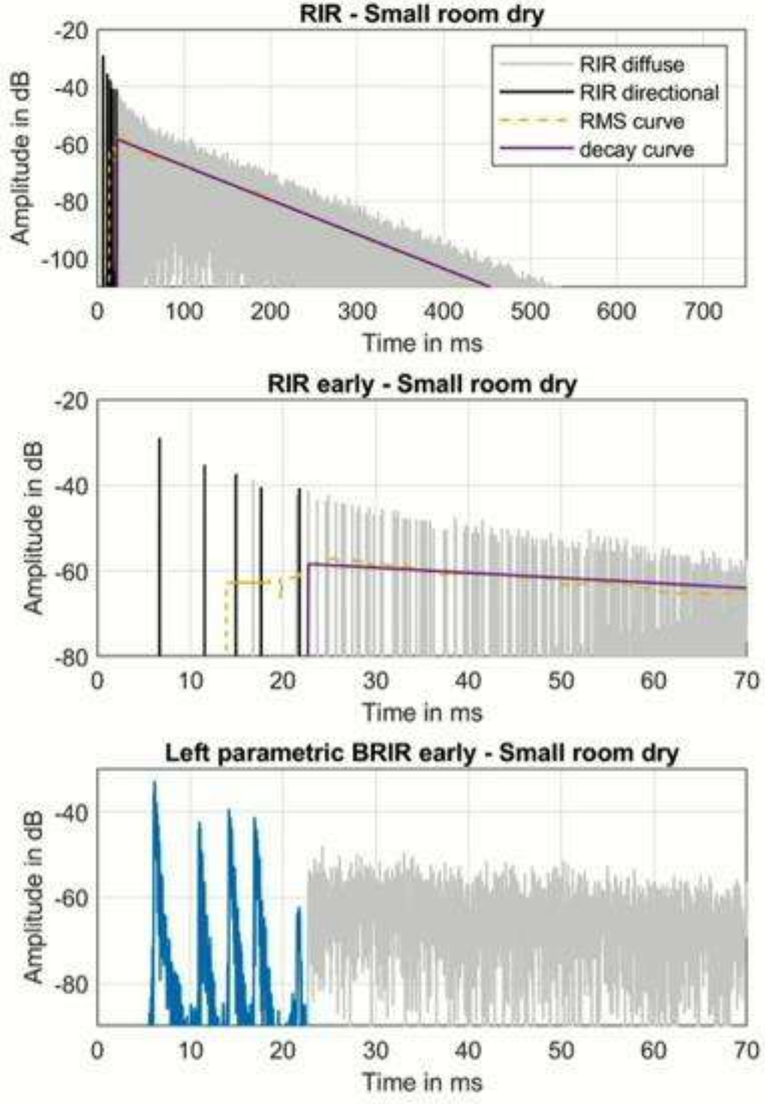


Exceed

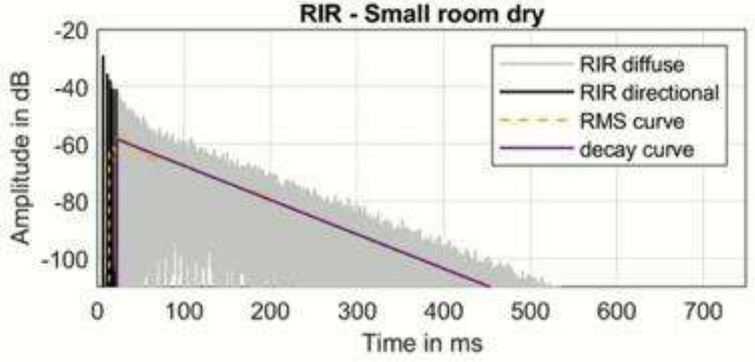


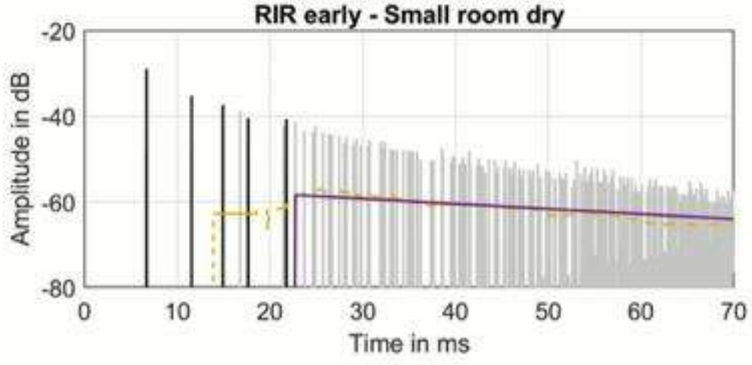
Loudest

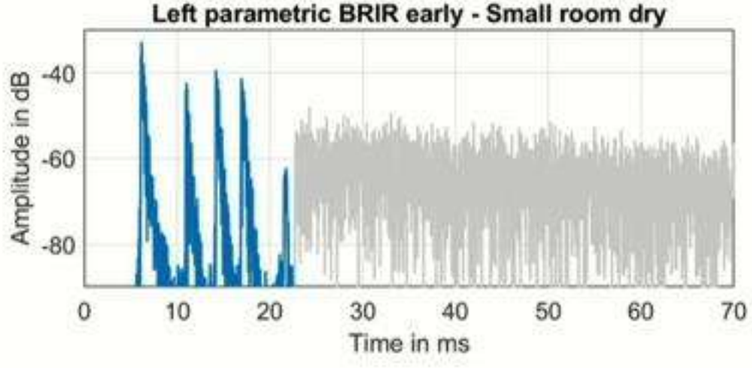
PROPOSED ENCODING: LATE REVERBERATION

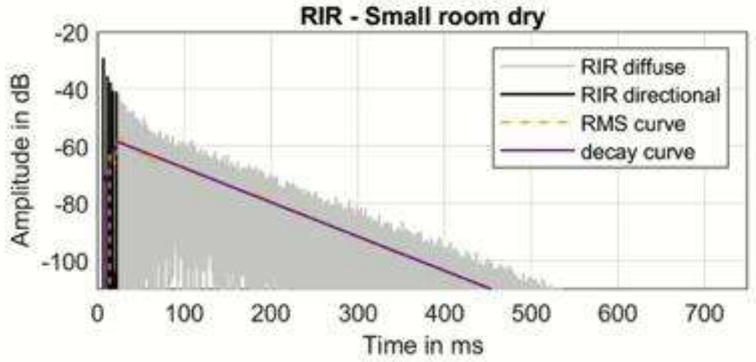


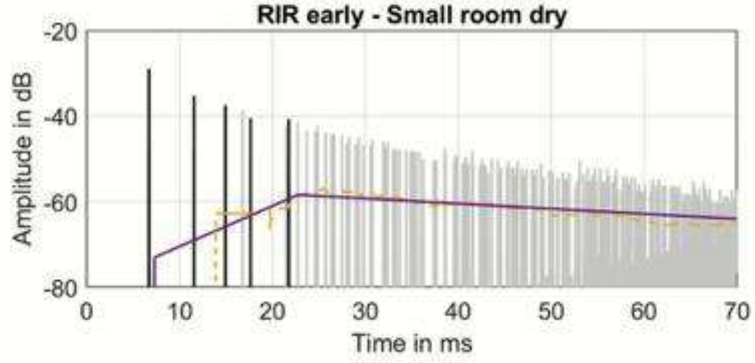
PROPOSED ENCODING: LATE REVERBERATION

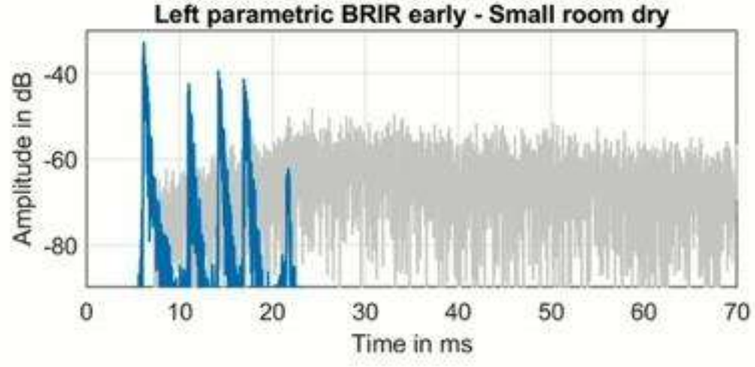












INTRODUCTION

METHOD

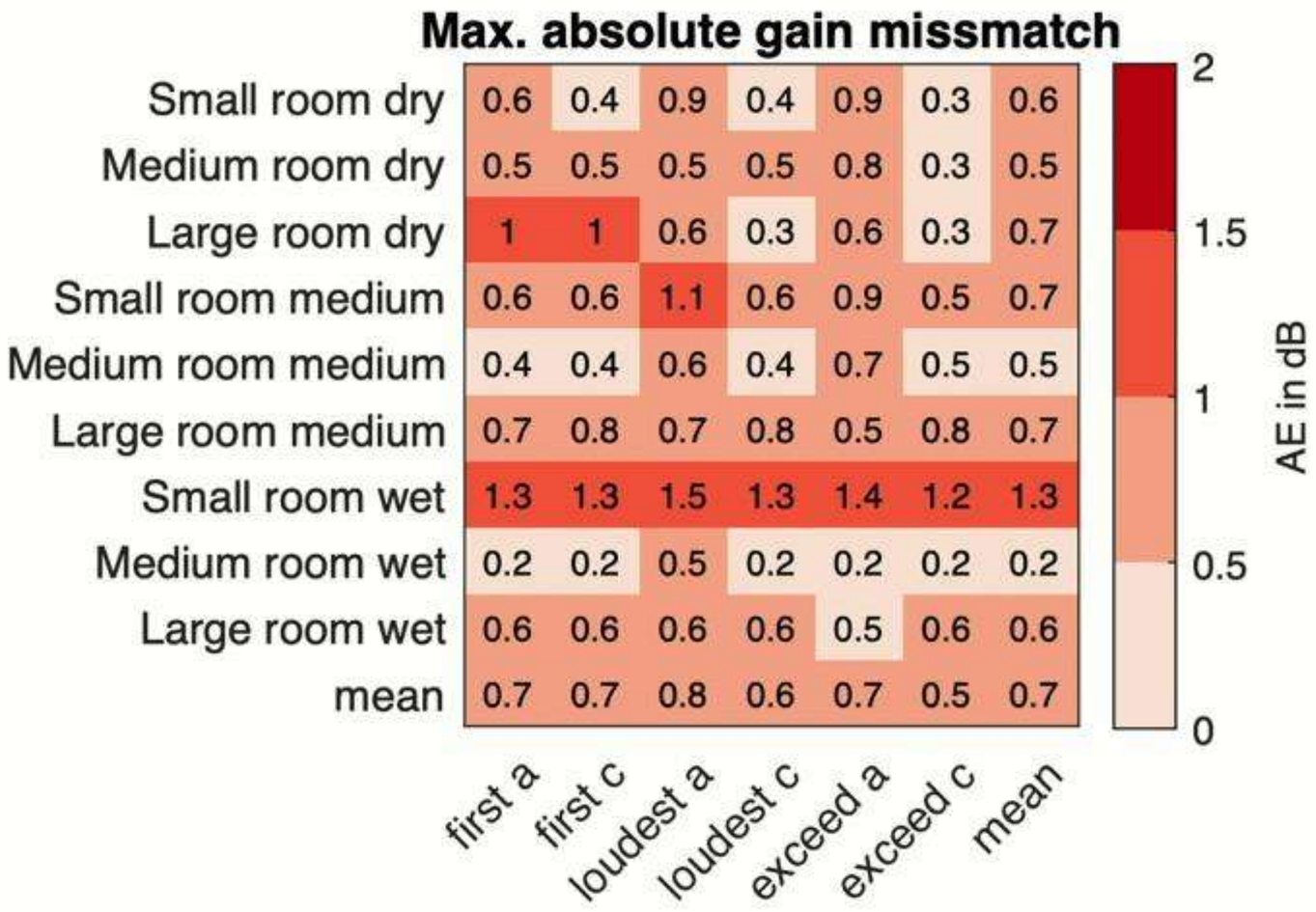
RESULTS

DISCUSSION

PHYSICAL EVALUATION

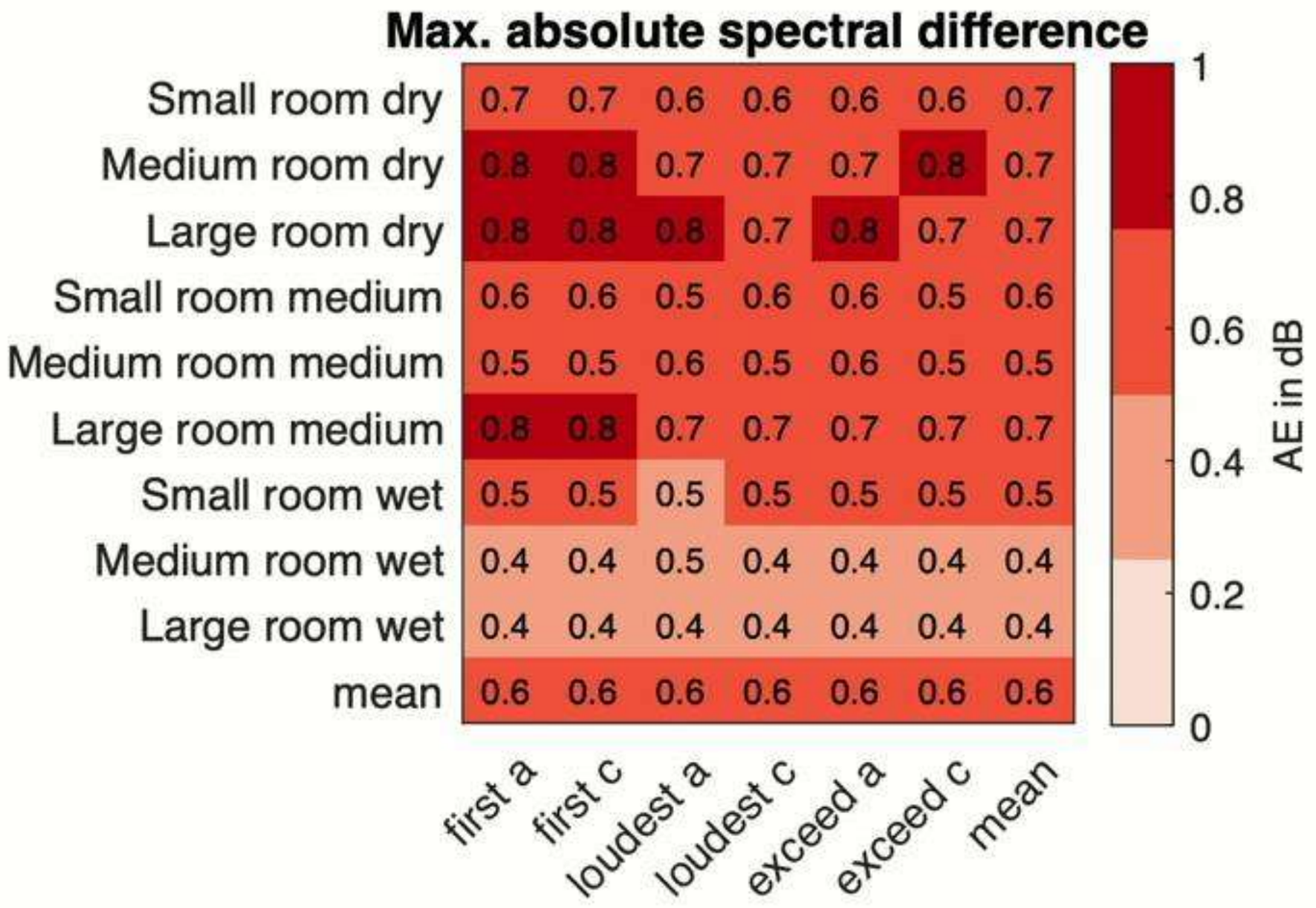
- 0, 1, 2, 4, 6, 8, 10 and 15 reflections
- Three selection methods (first, exceed, loudest)
- Two late reverberations (single, double ramp)
- Comparison against reference

PHYSICAL EVALUATION



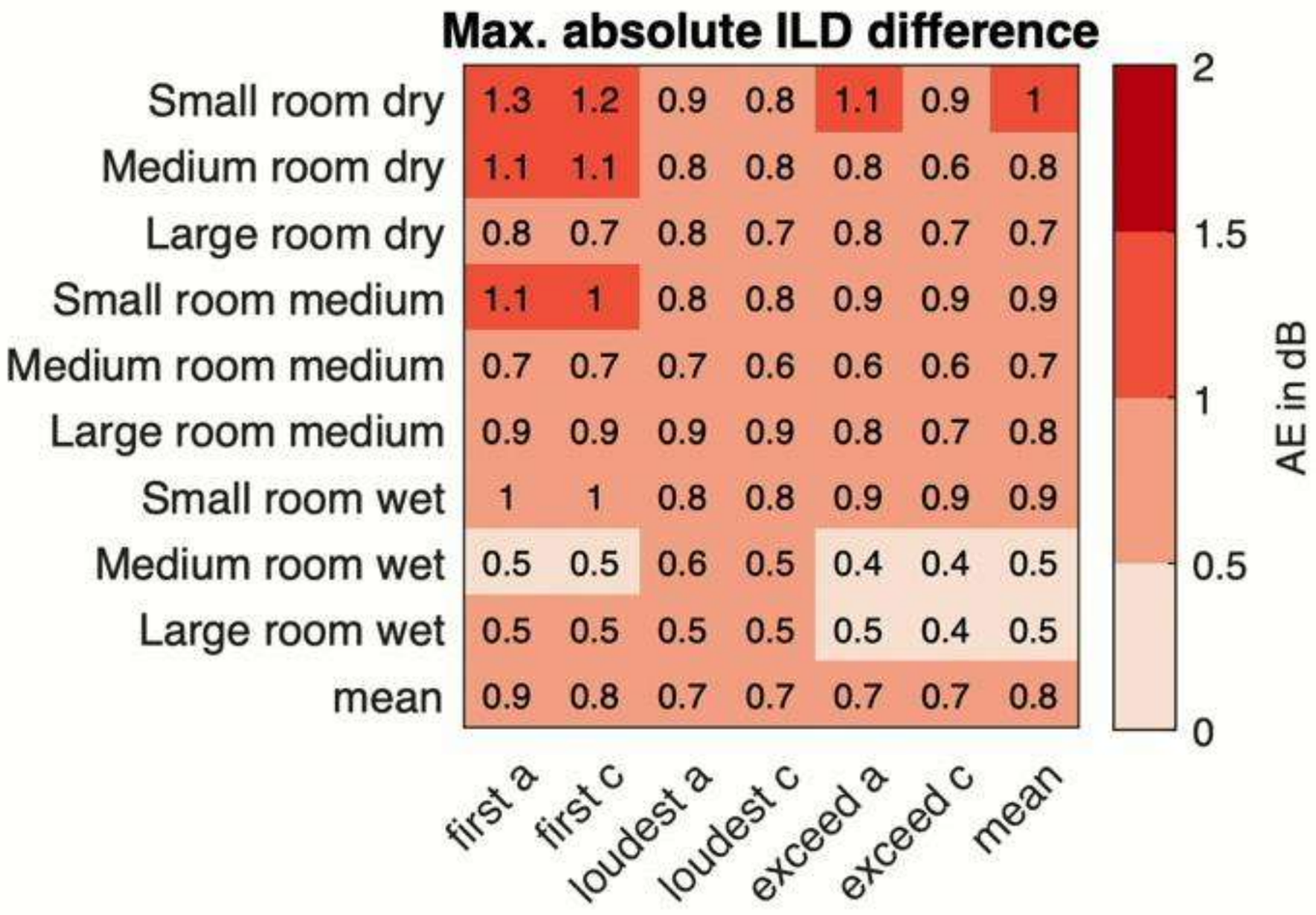
- Good level preservation
- Slightly audible differences
- Minor differences across algorithms

PHYSICAL EVALUATION



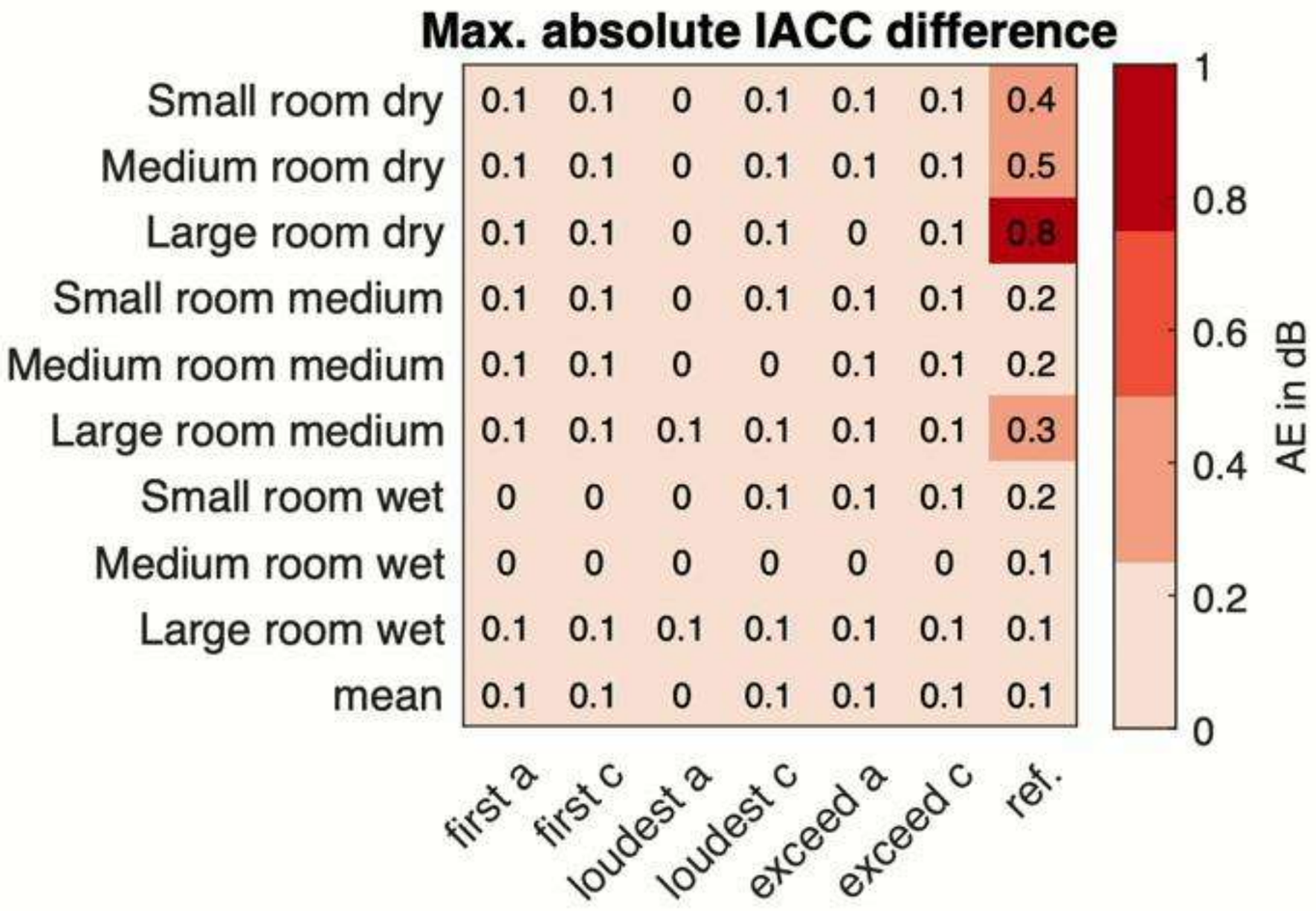
- Slightly audible coloration
- Minor differences across algorithms

PHYSICAL EVALUATION



- Slight mismatches in source position
- Minor differences across algorithms

PHYSICAL EVALUATION

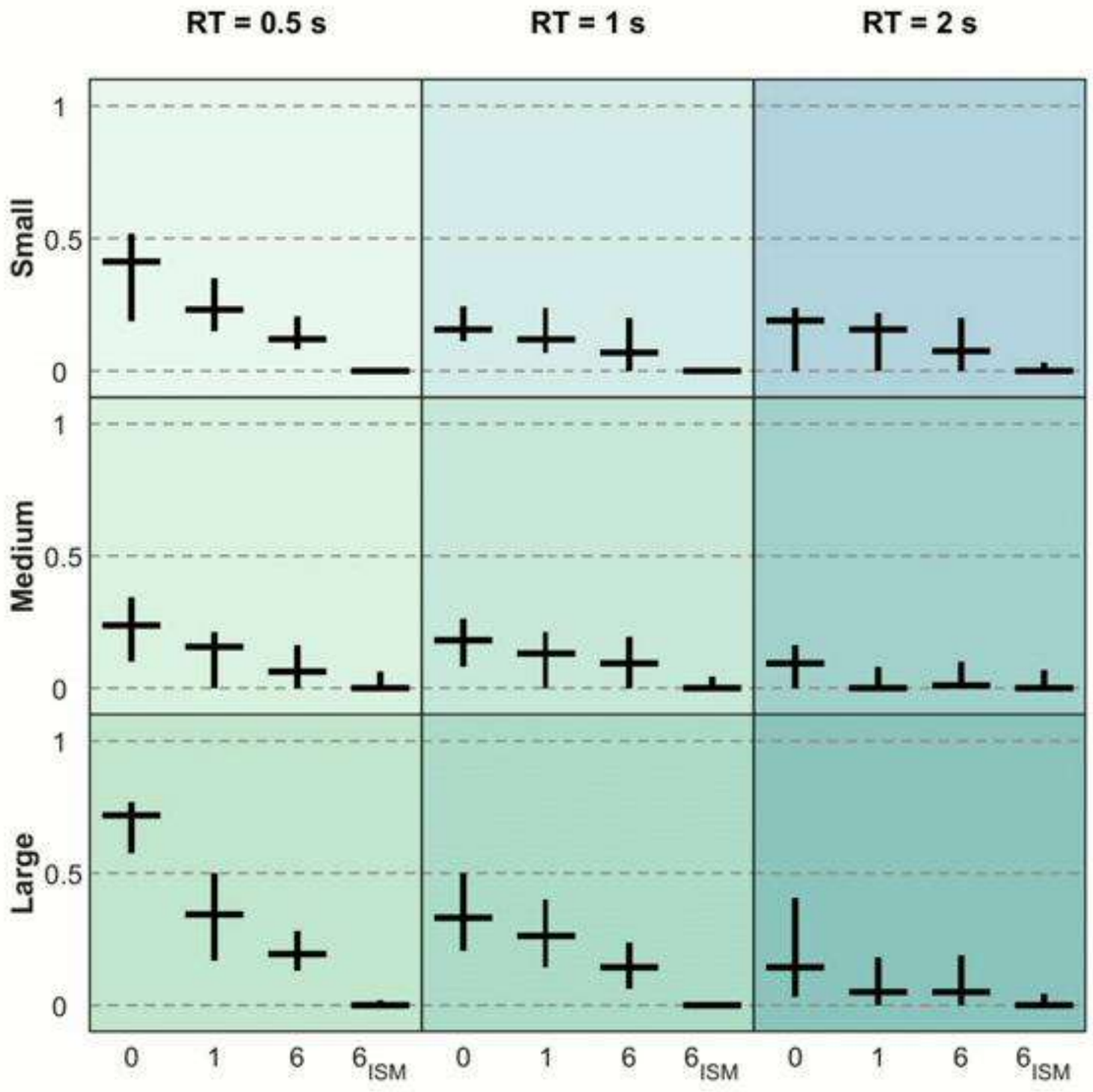


- Slight mismatches in source width & envelopment
- Minor differences across algorithms

PERCEPTUAL EVALUATION

- 27 participants (5 female, 22 male, 38 yrs.)
- 0, 1, and 6 reflections
- First order image source model as anchor (6_{ISM})
- ‘Loudest’ selection method
- ‘Double sloped’ late reverberation
- Running anechoic speech
- Rated against reference

PERCEPTUAL EVALUATION



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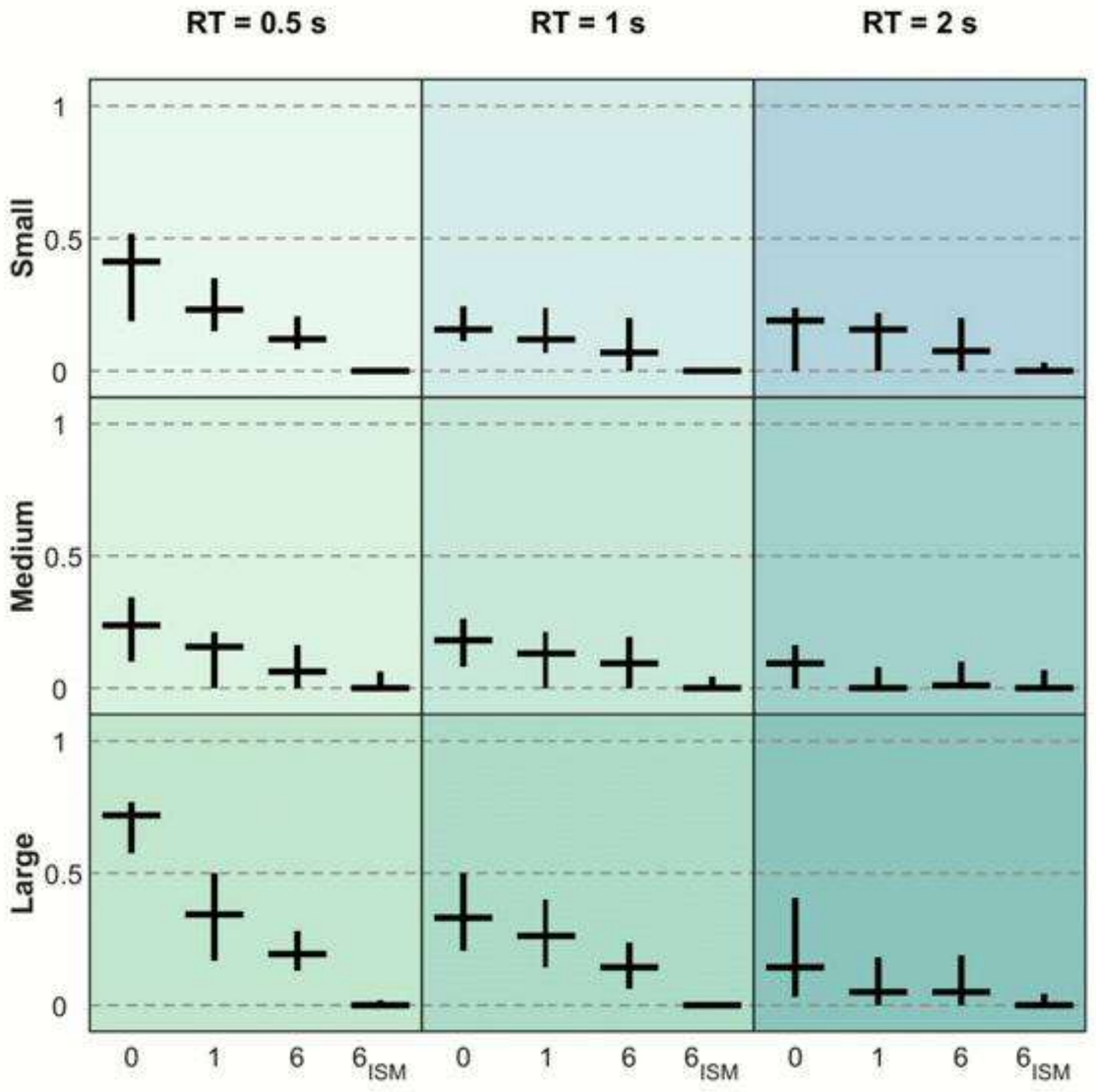
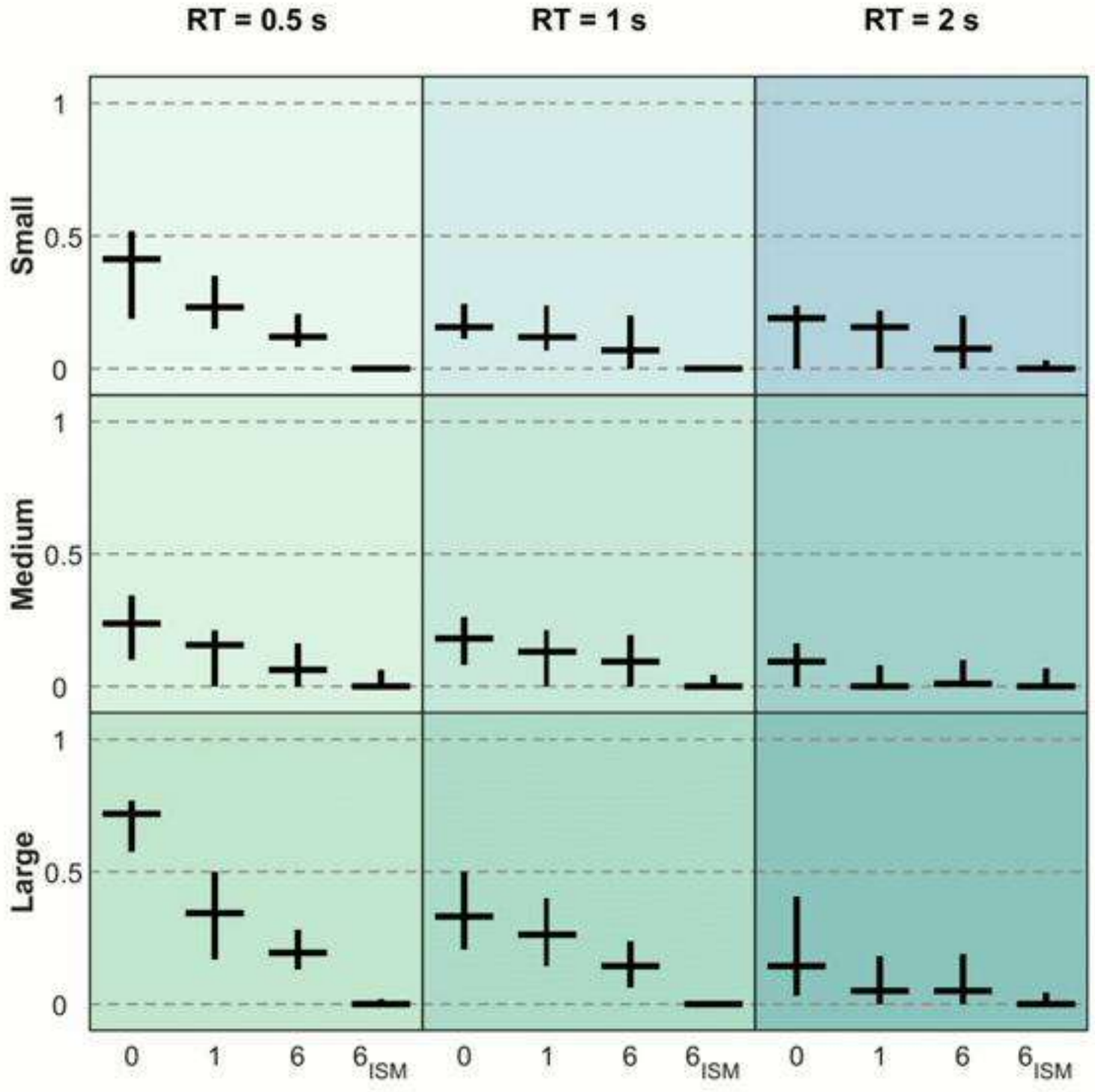


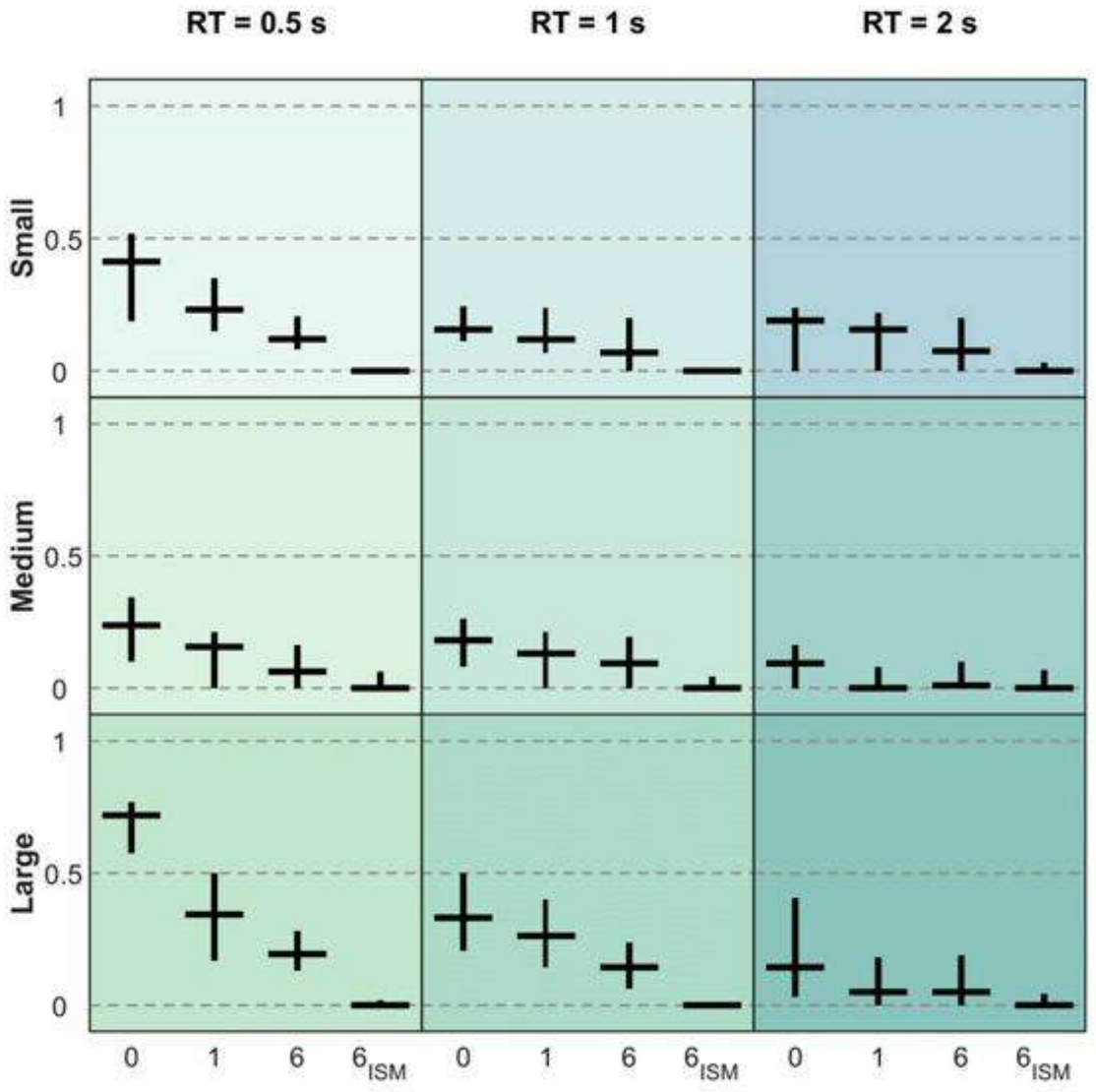
- Differences decrease with **N**

PERCEPTUAL EVALUATION



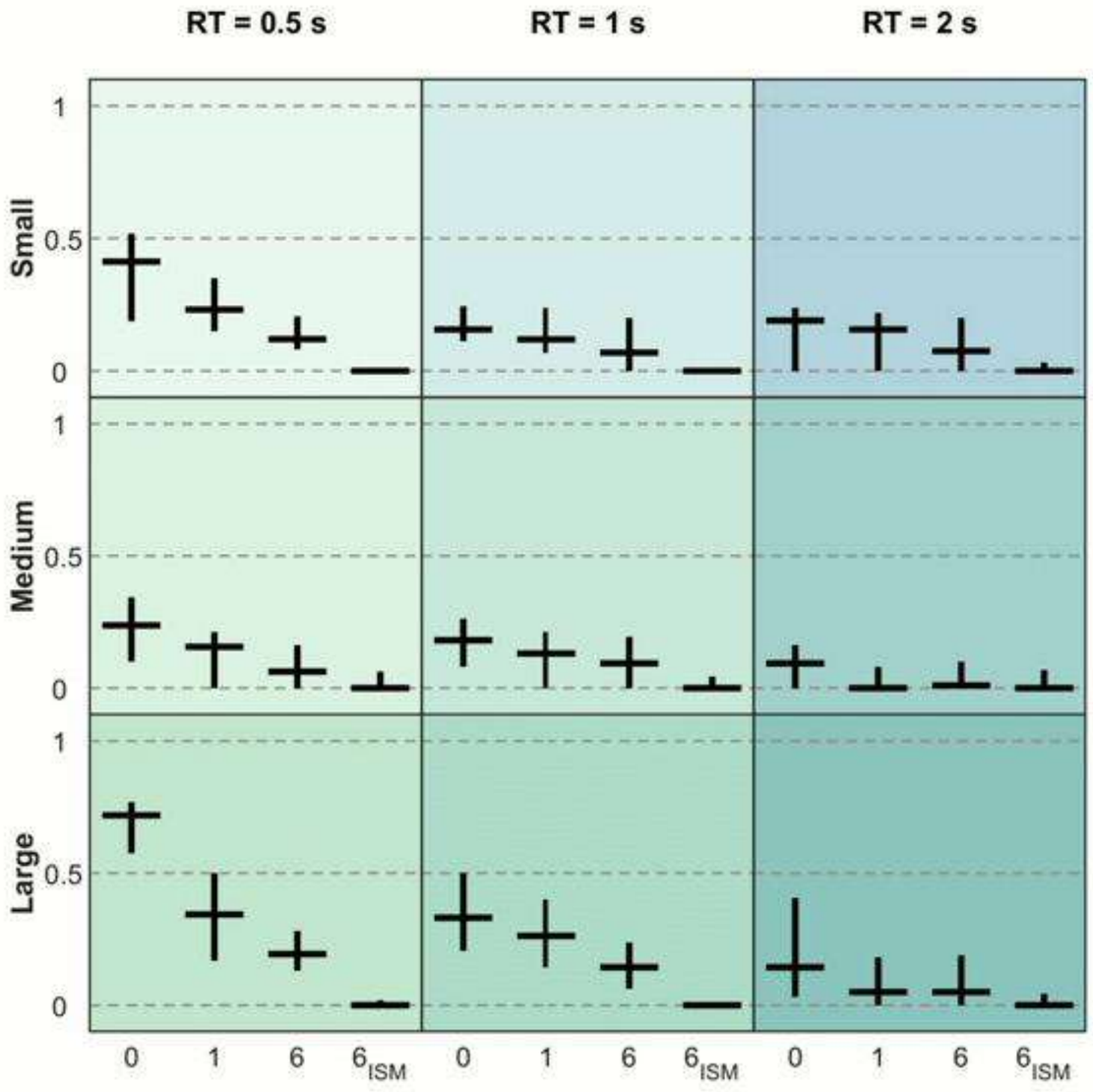
- Differences decrease with **N**
- 6_{ISM} is always rated 0

PERCEPTUAL EVALUATION



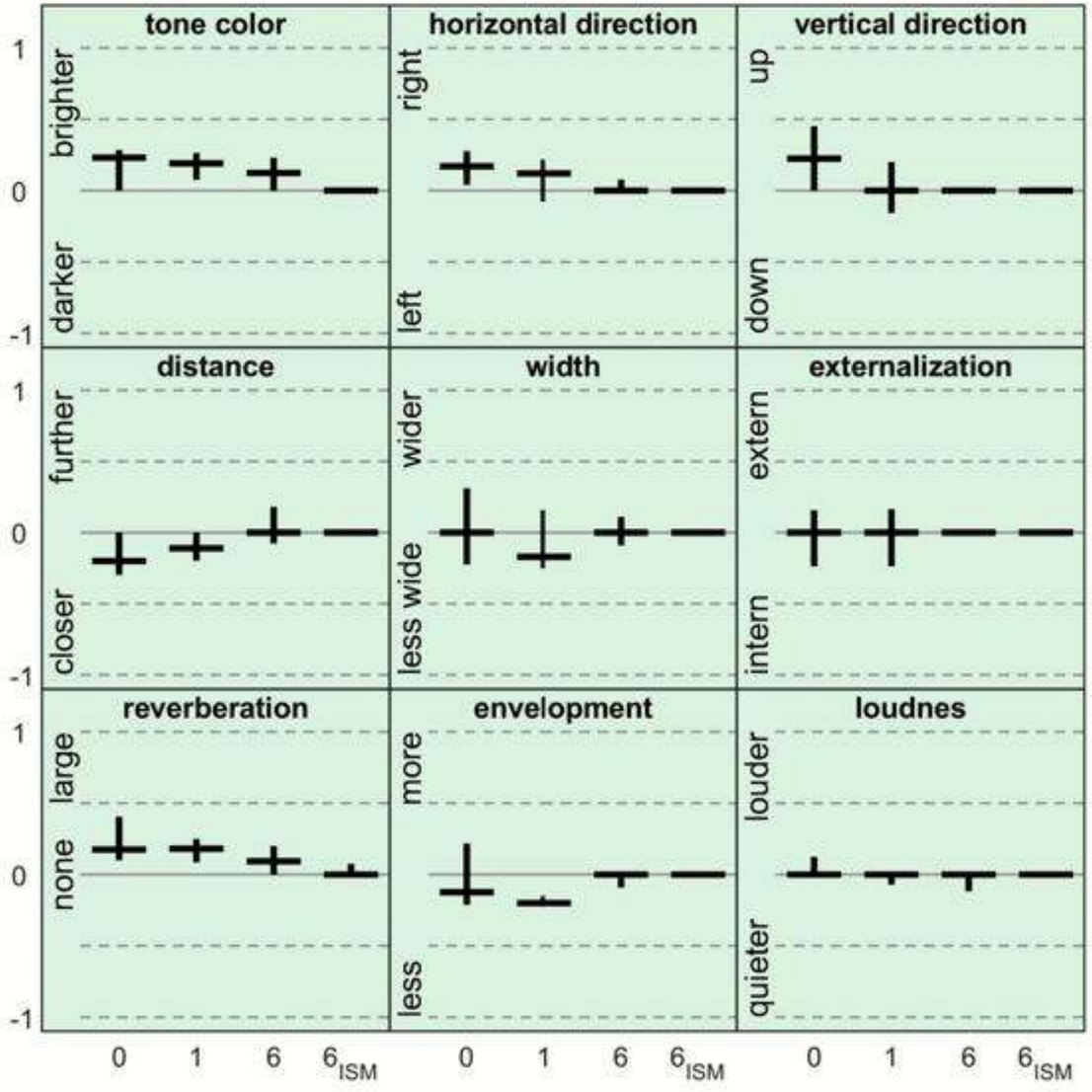
- Differences decrease with **N**
- 6_{ISM} is always rated 0
- Differences decrease with **RT**

PERCEPTUAL EVALUATION

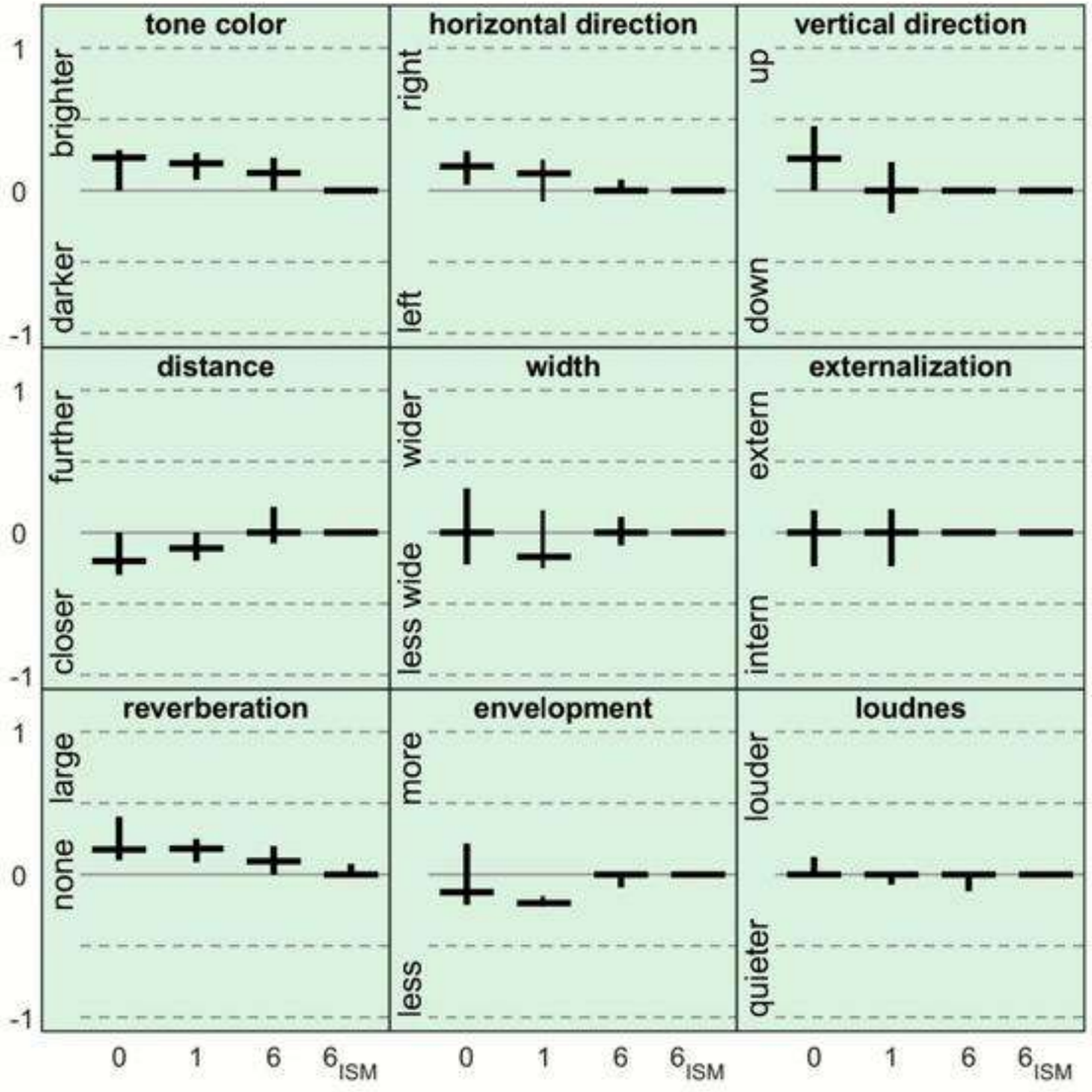


- Differences decrease with **N**
- 6_{ISM} is always rated 0
- Differences decrease with **RT**
- Effect of **V** (?)

PERCEPTUAL EVALUATION

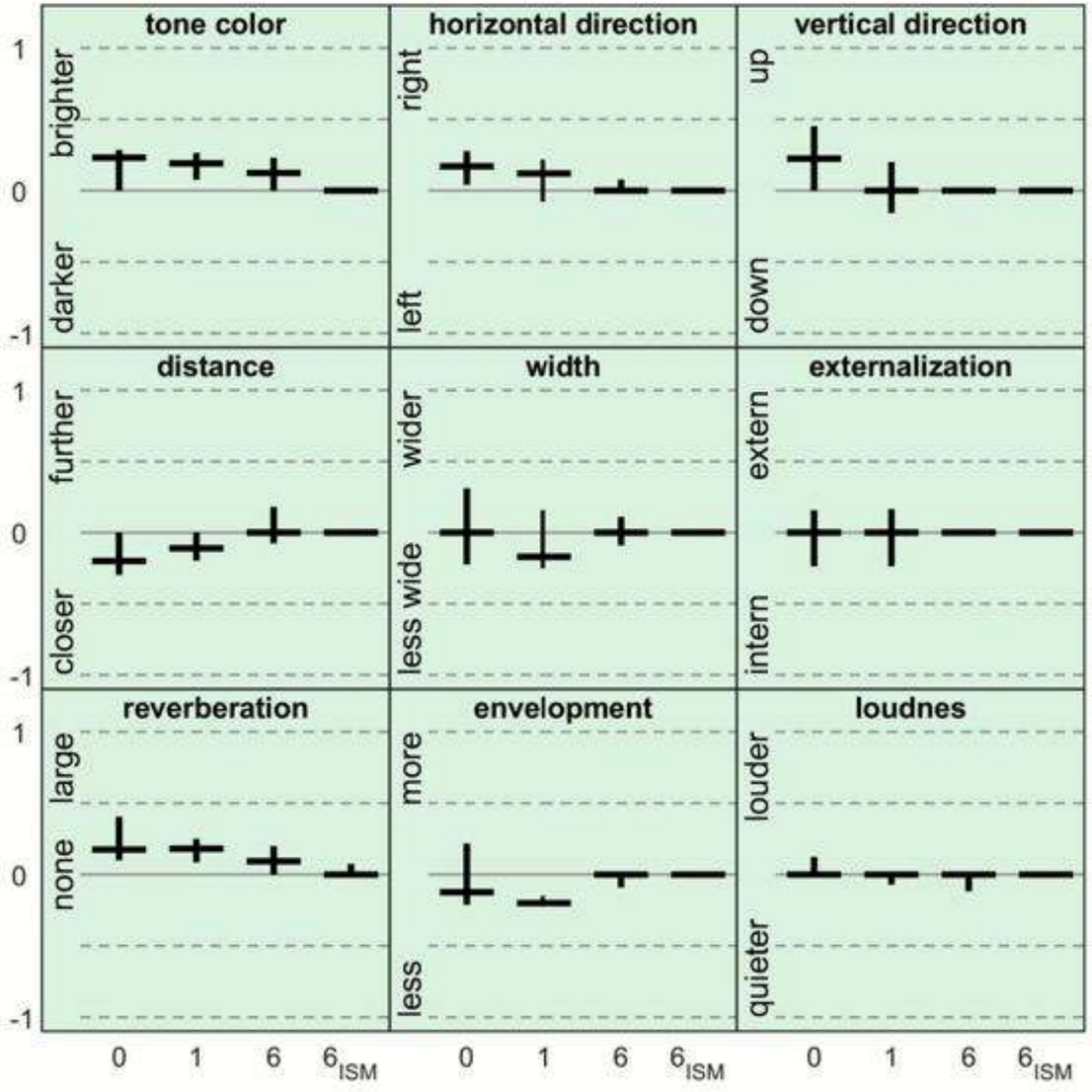


PERCEPTUAL EVALUATION



- Differences decrease with **N**

PERCEPTUAL EVALUATION



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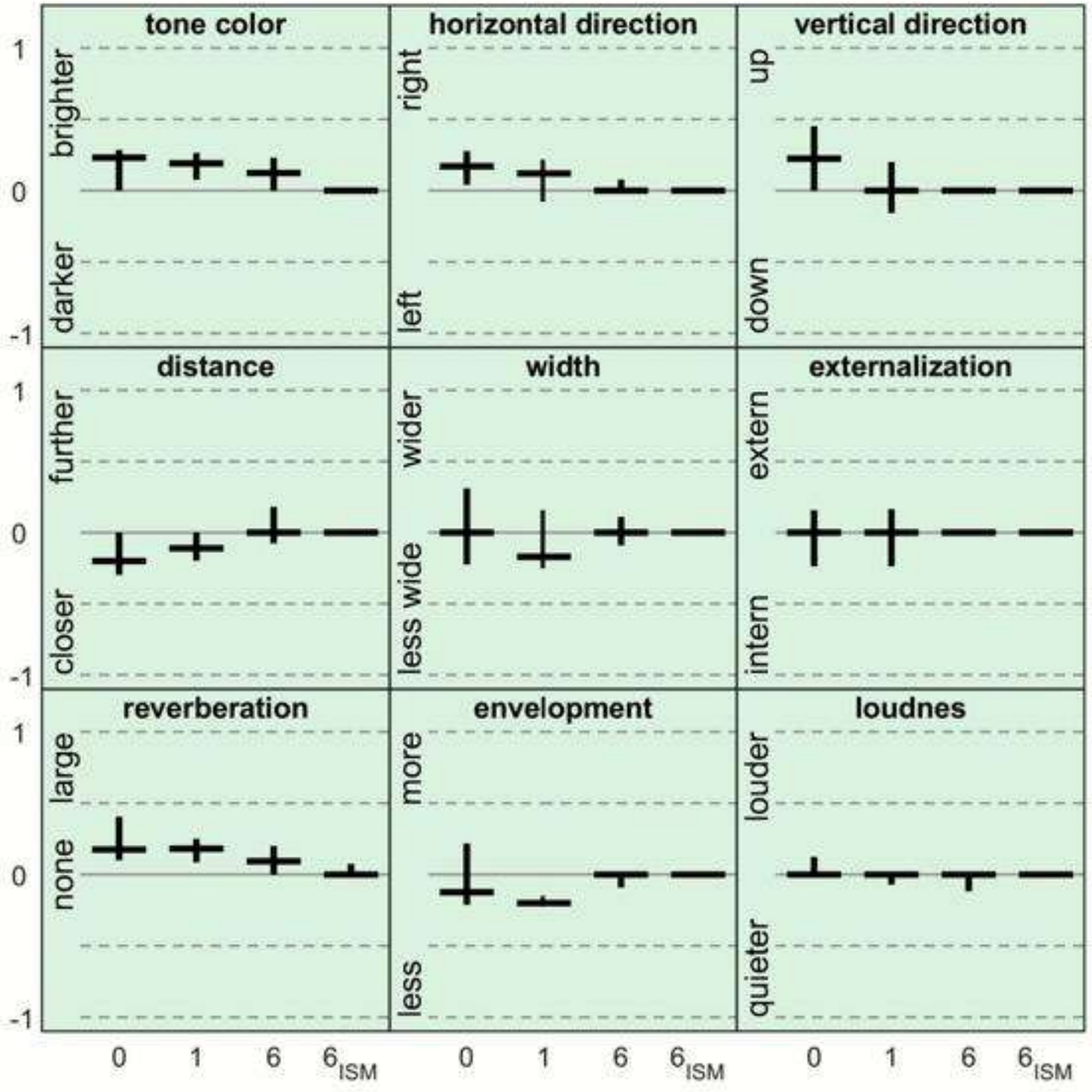
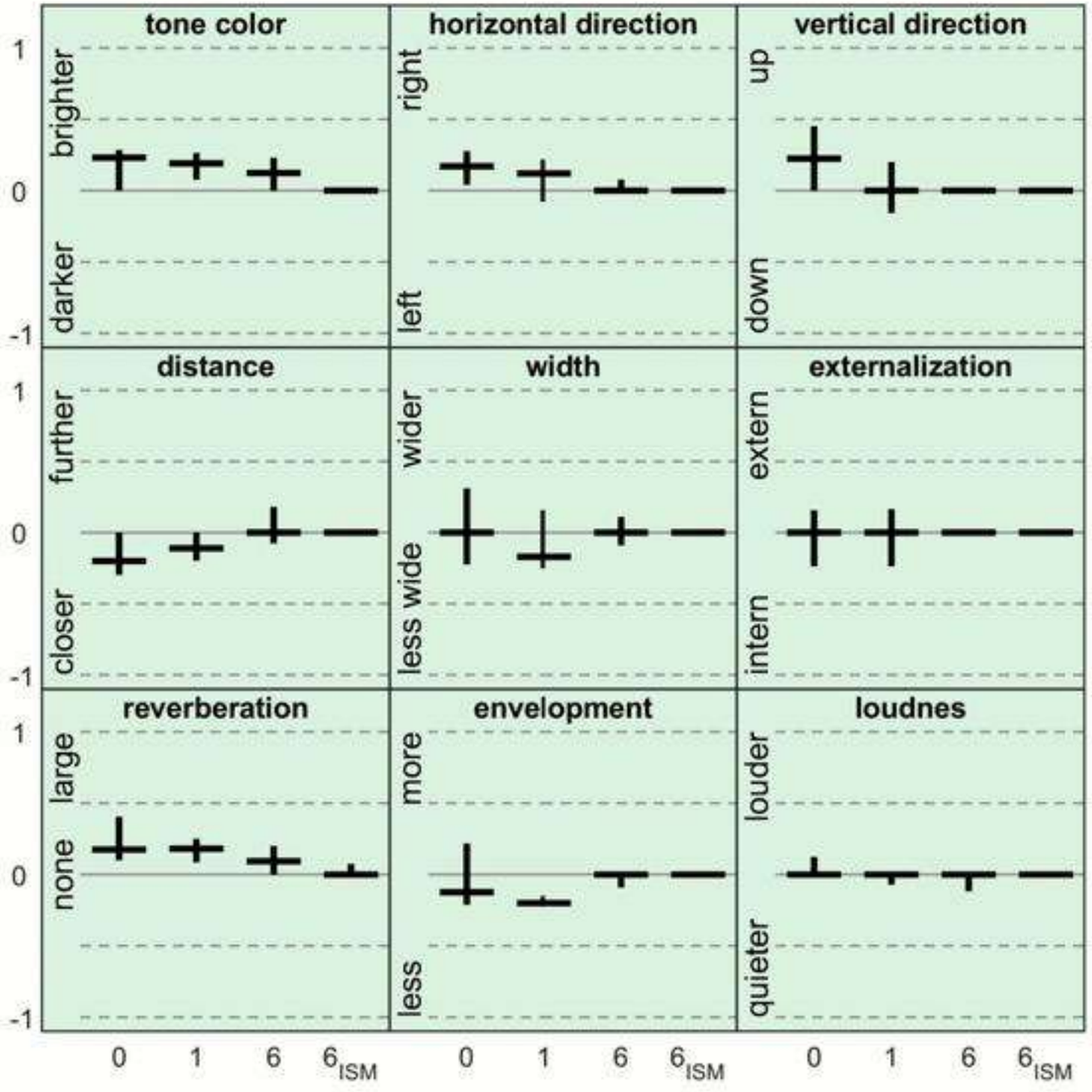


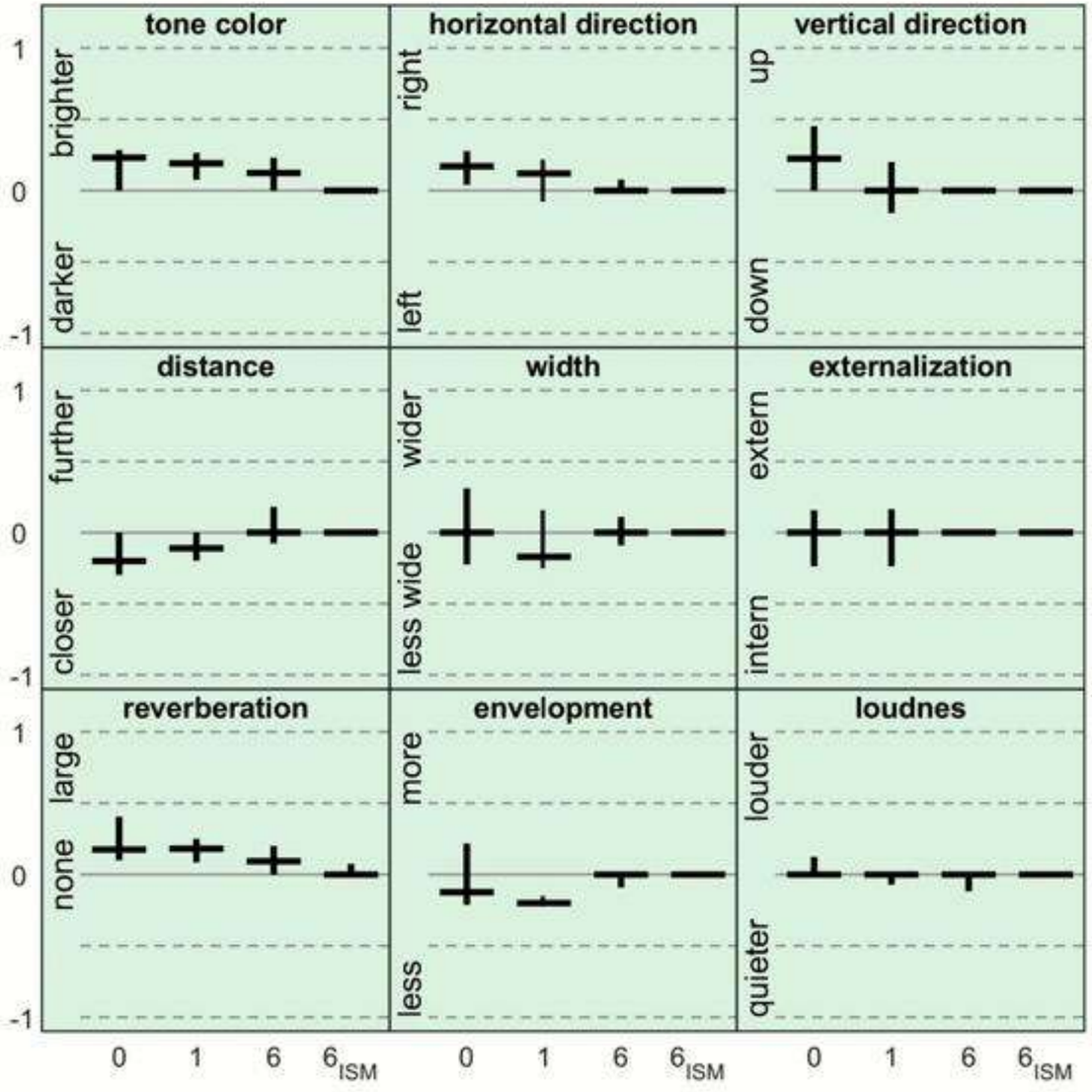
- Differences decrease with **N**
- 6_{ISM} is always rated 0
- 6 Cis overlap with 0

PERCEPTUAL EVALUATION



- Differences decrease with **N**
- 6_{ISM} is always rated 0
- 6 Cis overlap with 0
- Small differences in every tested Quality

PERCEPTUAL EVALUATION



- Differences decrease with **N**
- 6_{ISM} is always rated 0
- 6 Cis overlap with 0
- Small differences in every tested Quality
- Loudness not problematic

INTRODUCTION

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SUMMARY

- End-to-end parametric audio system including early reflections

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- Early reflections important in large and dry rooms
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- 6 early reflections sufficient in most cases

SUMMARY

- End-to-end parametric audio system including early reflections
- Evaluated on two different models
- Detected reflections agree across models
- Early reflections important in large and dry rooms
- Differences decrease with increasing reflections
- 6 early reflections sufficient in most cases
- Floor reflections seems important

CONTRIBUTIONS

- Detecting and selecting early reflections

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- Double sloped parametric late reverberation

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- It doesn’t take to much (early reflections) to trick the brain

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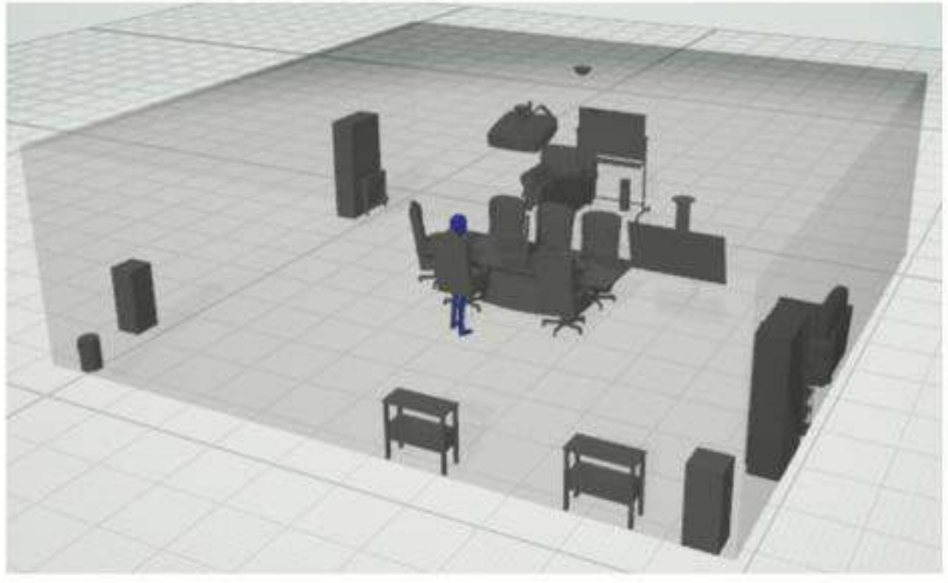
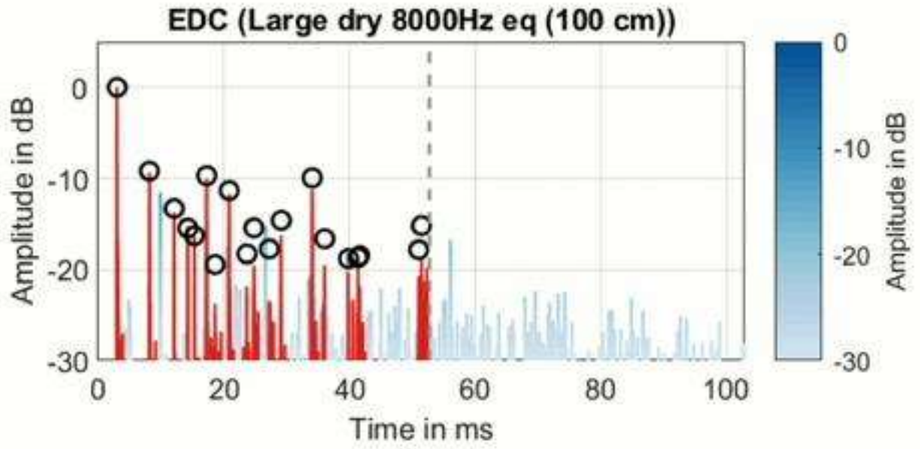
- Detecting and selecting early reflections
- Double sloped parametric late reverberation
- It doesn’t take to much (early reflections) to trick the brain
- Inclusion into Triton work-flow possible
- Currently FIR for late reverberation, new approach allows IIR

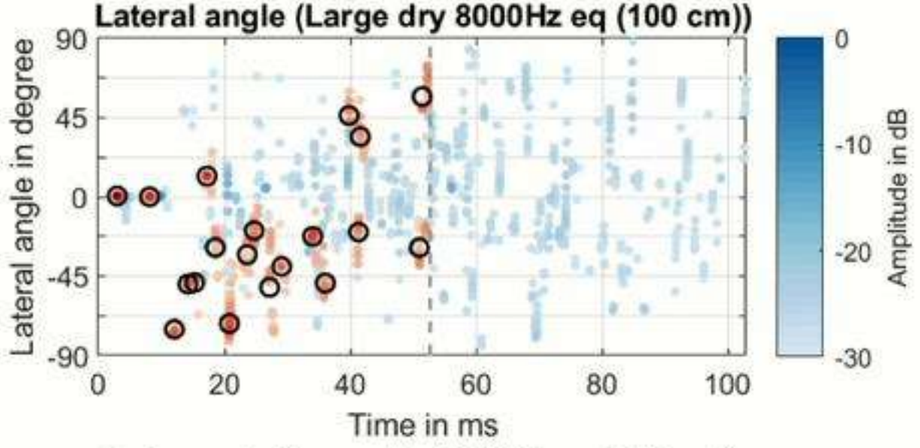
➢ More efficient, and higher perceptual quality

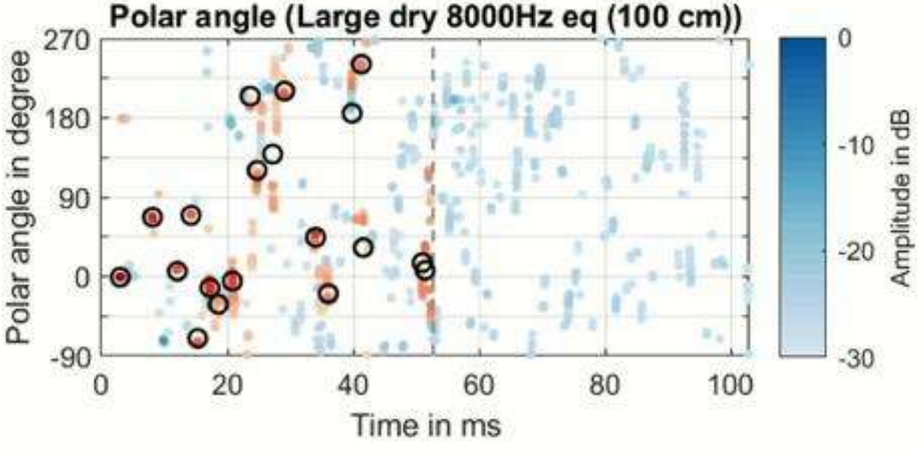
OUTLOOK

- Non-empty rooms



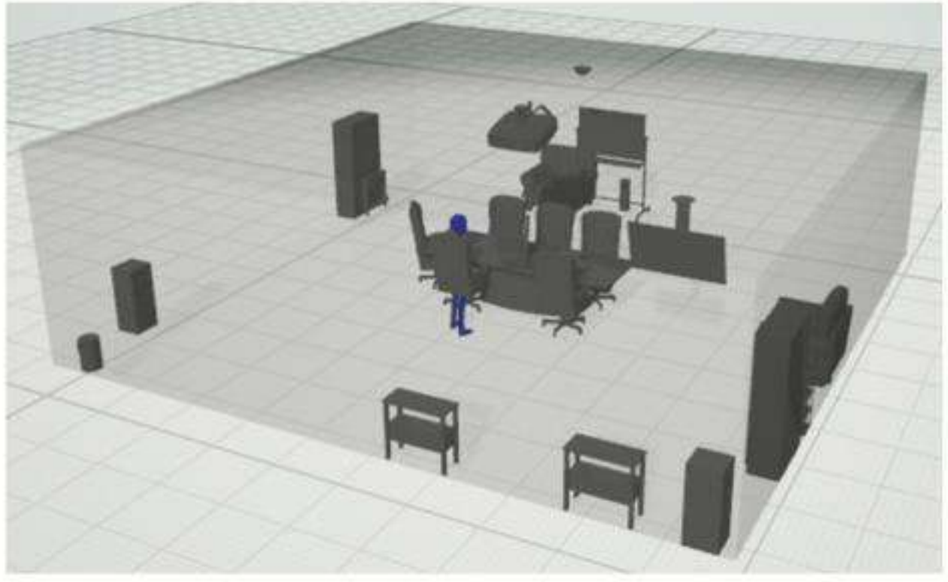


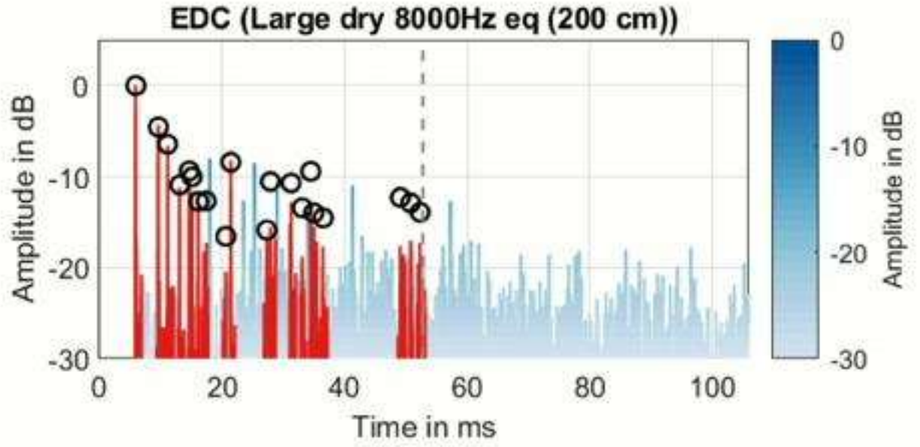


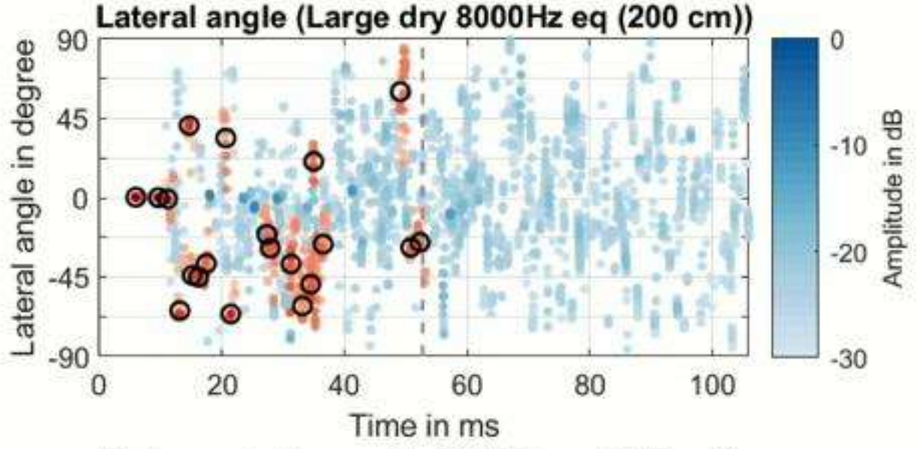


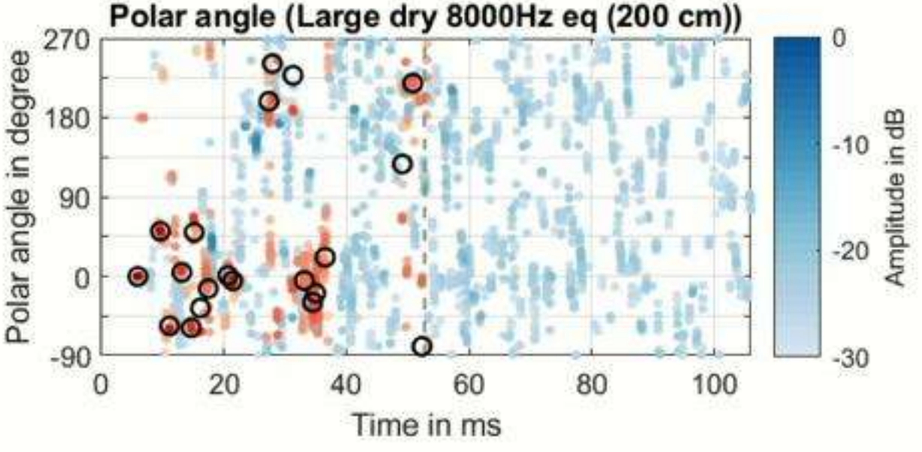
OUTLOOK

- Non-empty rooms
- Spatial smoothness



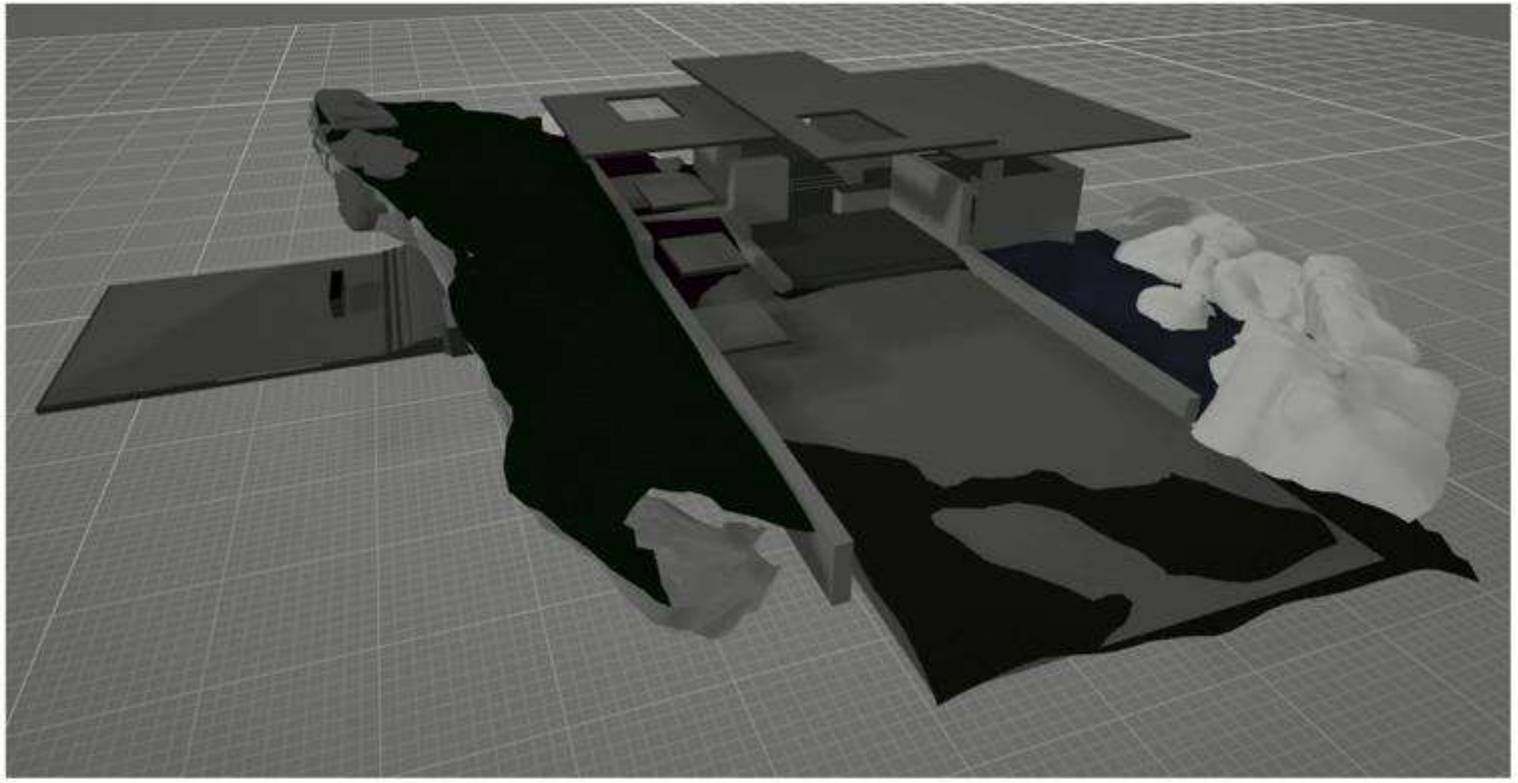






OUTLOOK

- Non-empty rooms
- Spatial smoothness
- Outdoor Environments



OUTLOOK

- Non-empty rooms
- Spatial smoothness
- Outdoor Environments
- Parametric rendering
  - Discover first order reflections

OUTLOOK

- Non-empty rooms
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  - Detect reflections with short memory

OUTLOOK

- Non-empty rooms
- Spatial smoothness
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- Parametric rendering
  - Discover first order reflections
  - Detect reflections with short memory
  - Room dependent search time

OUTLOOK

- Non-empty rooms
- Spatial smoothness
- Outdoor Environments
- Parametric rendering
  - Discover first order reflections
  - Detect reflections with short memory
  - Room dependent search time
  - Directional variance

OUTLOOK

- Non-empty rooms
- Spatial smoothness
- Outdoor Environments
- Parametric rendering
  - Discover first order reflections
  - Detect reflections with short memory
  - Room dependent search time
  - Directional variance
  - Frequency dependent rendering

OUTLOOK

- Non-empty rooms
- Spatial smoothness
- Outdoor Environments
- Parametric rendering
  - Discover first order reflections
  - Detect reflections with short memory
  - Room dependent search time
  - Directional variance
  - Frequency dependent rendering
  - Directional reverberation

THANKS!

Ivan Tashev for having me

Hannes Gamper for mentoring, critical feedback and help

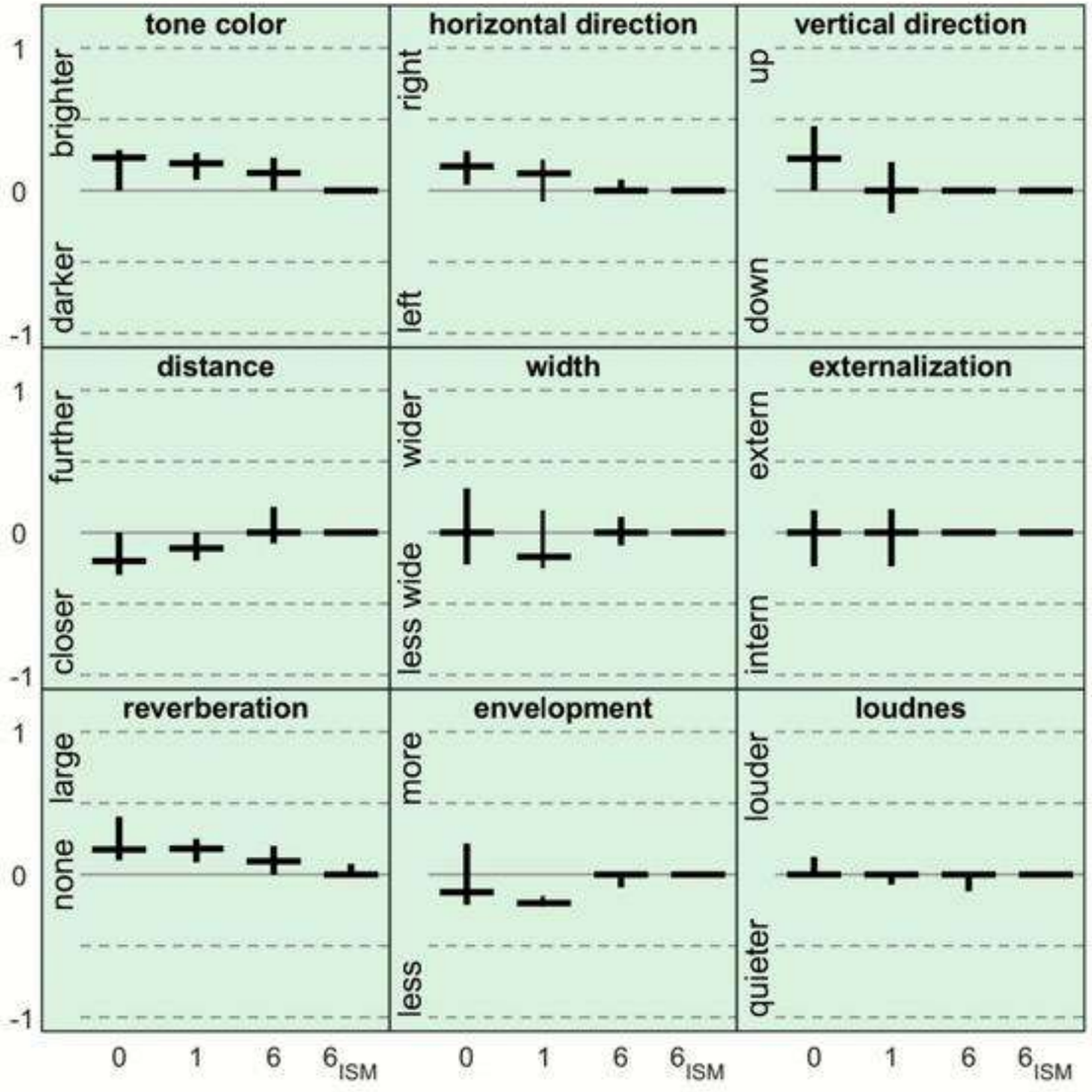
Nikunj Raghuvanshi for critical feedback and help

Acoustics Team for help with Triton

Audio and Acoustics Group for the warm welcome

All subjects that participated in the listening test

PERCEPTUAL EVALUATION



- Differences decrease with **N**
- 6_{ISM} is always rated 0
- 6 Cis overlap with 0
- Small differences in every tested Quality
- Loudness not problematic

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