

Interactive Sound Rendering

Sound Synthesis

Numerical Acoustic Simulation

Interactive Sound Propagation

Application Demonstration

Themes

- Exploiting analytical solutions using Modal Analysis to accelerate numerical simulation and reducing runtime computation
- Capture only perceptually important auditory cues to perform real-time sound synthesis and acoustic propagation on complex 3D scenes

Overview

- Interactive Sound Synthesis
- Efficient Numerical Acoustic Simulation
- Interactive Sound Propagation
- Conclusion and Future Work

Overview

- Interactive Sound Synthesis
 - Modal Analysis
 - Perceptually-based acceleration techniques
 - Hundreds of sounding objects
 - Sound from image textures
- Efficient Numerical Acoustic Simulation
- Interactive Sound Propagation
- Conclusion and Future Work

Physically-based Sound Synthesis

- Aim: Take object geometry and material as input and produce sound
- Current trend: Recorded sounds
- Problems with recorded sounds:
 - Difficult, expensive or dangerous to record (eg. Explosions)
 - Repetitiveness
 - Complex interactions (impact/rolling)



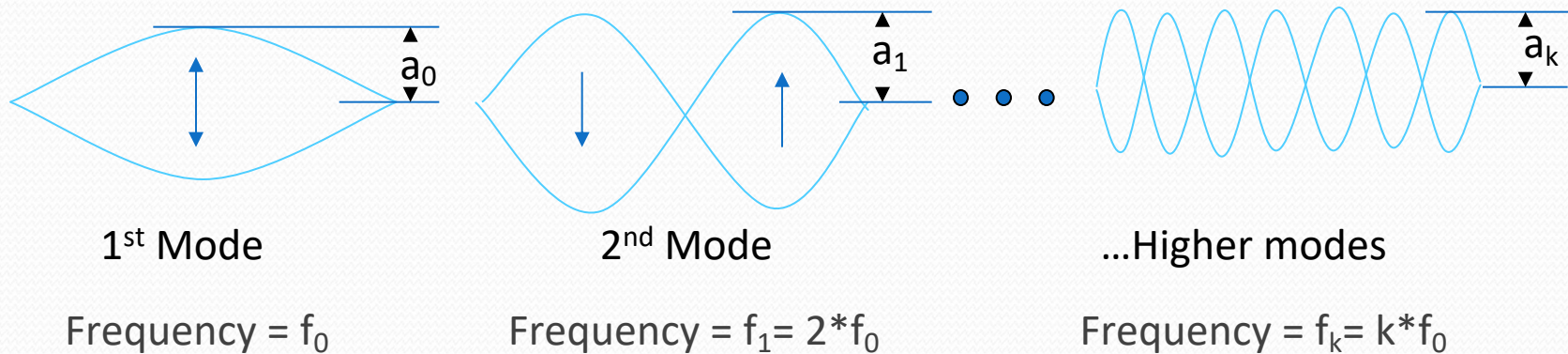
A typical foley studio*

* Image taken from: <http://www.marblehead.net/foley/index.html>

Physical Simulation

- Elastic deformable model
- Typical simulation time-steps must be $\sim 10^{-5}$ s
- Direct simulation infeasible
- Efficient method: Modal Analysis

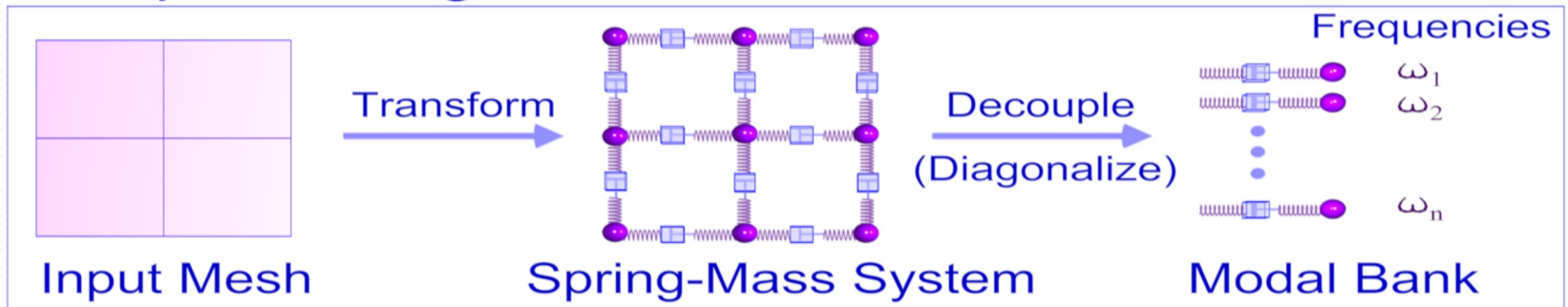
Modal Analysis



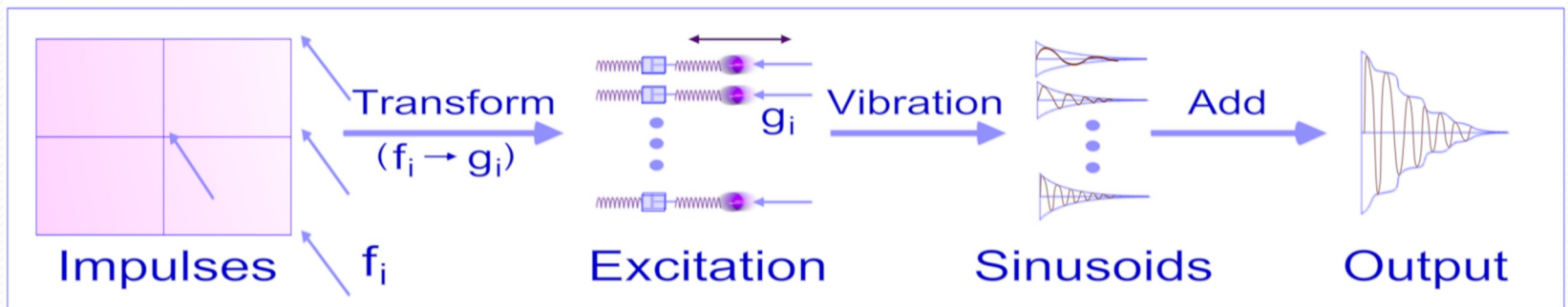
- Each mode represents a resonant mode of vibration
- Frequency of a mode is fixed
- Applying impulse excites modes of vibration
- Position of impact determines relative amplitude of modes

Overview of Technique

Pre-processing



Runtime



Approach

Simpler model: Spring-mass system

Fast: Supports hundreds of sounding objects

Runs in real-time, low CPU utilization (~10%), graceful degradation in quality with limited computation

Exploit human auditory perception

- Mode Compression

- Mode Truncation

- Quality Scaling

Modal Analysis

Deformation modeling

Vibration of surface generates sound

Sound sampling rate: 44100 Hz

Impossible to calculate the displacement of the surface at sampling rate

Represent the vibration pattern by a bank of damped oscillators (modes)

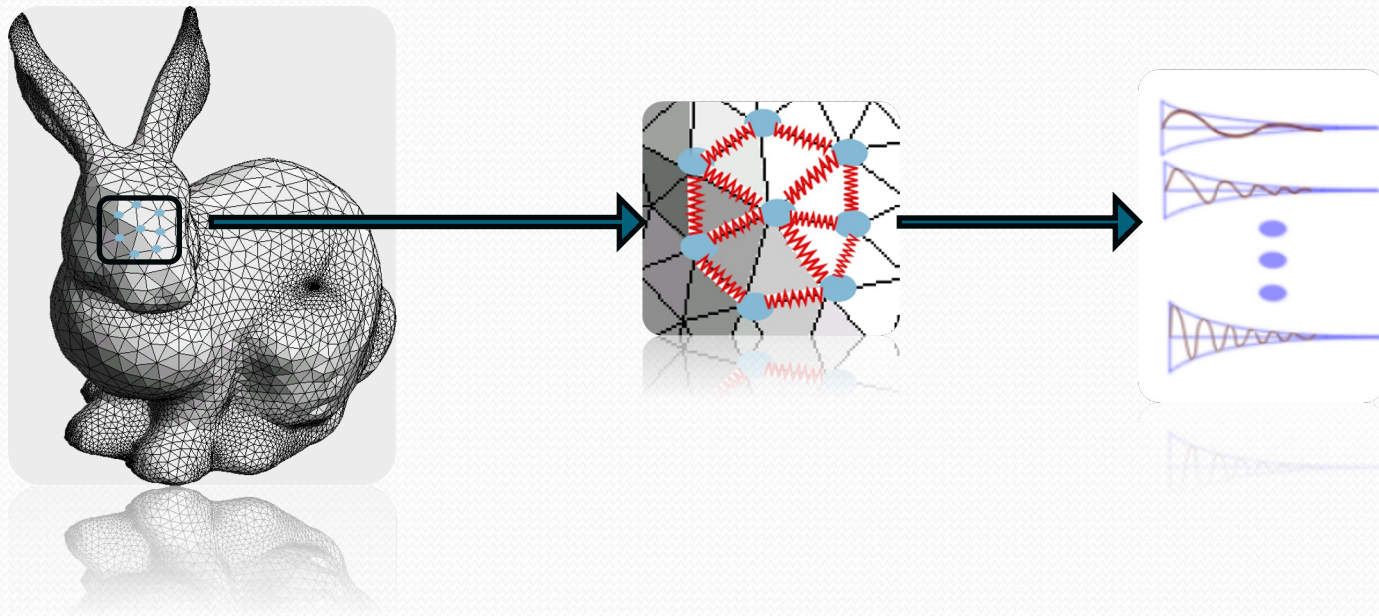
Standard technique for real-time sound synthesis

Modal Analysis

Discretization

An input triangle mesh \rightarrow a spring-mass system

A spring-mass system \rightarrow a set of decoupled modes

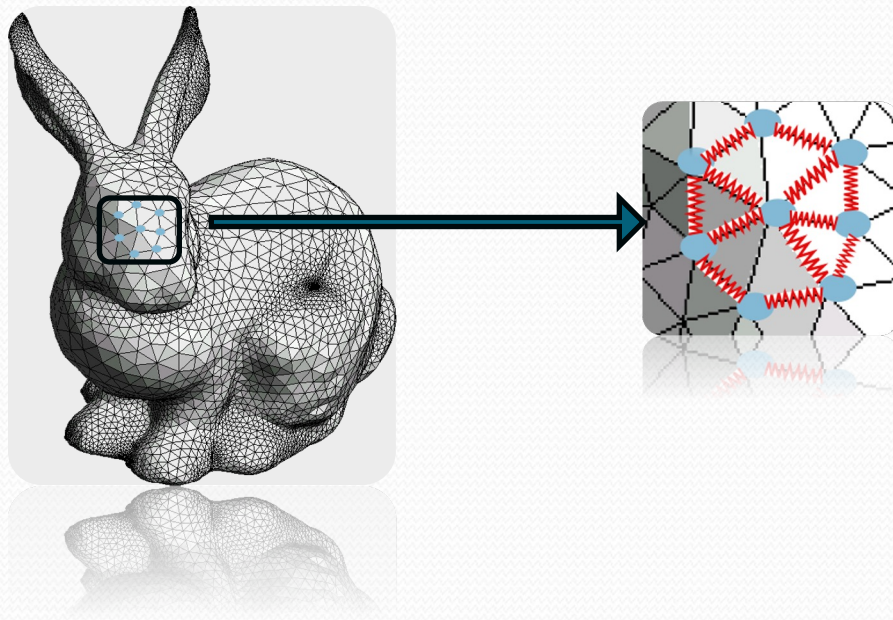


Modal Analysis

The spring-mass system set-up

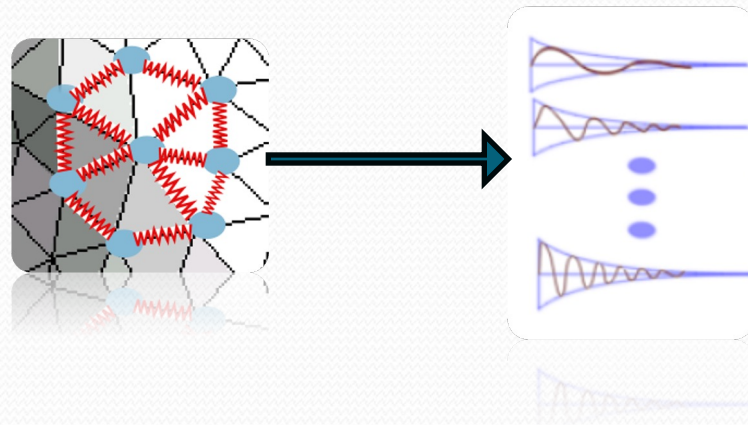
Each vertex is considered as a mass particle

Each edge is considered as a damped spring



Modal Analysis

Coupled spring-mass system to a set of decoupled modes



Modal Analysis

A discretized physics system

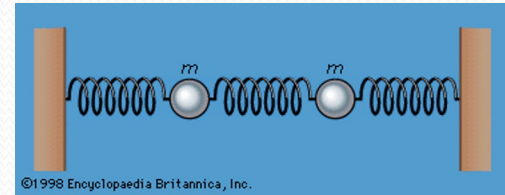
We use spring-mass system

$$\boxed{K}(d) + \boxed{C}(d, \dot{d}) + \boxed{M}(\ddot{d}) = f$$

Stiffness

Damping

Mass



Small displacement, so consider it linear

$$\boxed{K}d + \boxed{C}\dot{d} + \boxed{M}\ddot{d} = f$$

Stiffness

Damping

Mass

Modal Analysis

Solve the Ordinary Differential Equation (ODE)

$$Kd + C\dot{d} + M\ddot{d} = f$$

Rayleigh damping

$$Kd + (\gamma M + \eta K)\dot{d} + M\ddot{d} = f$$

And diagonalizing

$$K = GDG^{-1}$$

Now, solve this ODE instead

$$DG^{-1}d + (\gamma G^{-1}M + \eta DG^{-1})\dot{d} + G^{-1}M\ddot{d} = G^{-1}f$$

Modal Analysis

Solve the ODE

$$DG^{-1}\dot{d} + (\gamma G^{-1}M + \eta DG^{-1})\dot{d} + G^{-1}M\ddot{d} = G^{-1}f$$

Substitute $z = G^{-1}d$ (the modes)

Now, solve this ODE instead

$$Dz + (\gamma M + \eta D)\dot{z} + M\ddot{z} = G^{-1}f$$

Modal Analysis

General solution

$$z_i = c_i e^{\omega_i^+ t} + \bar{c}_i e^{\omega_i^- t}$$

$$\omega_i^\pm = \frac{-(\gamma\lambda_i + \eta) \pm \sqrt{(\gamma\lambda_i + \eta)^2 - 4\lambda_i}}{2}$$

External excitation defines the initial conditions

Modal Analysis

Assumptions

In most graphics applications, only surface representations of geometries are given

A surface representation is used in modal Analysis

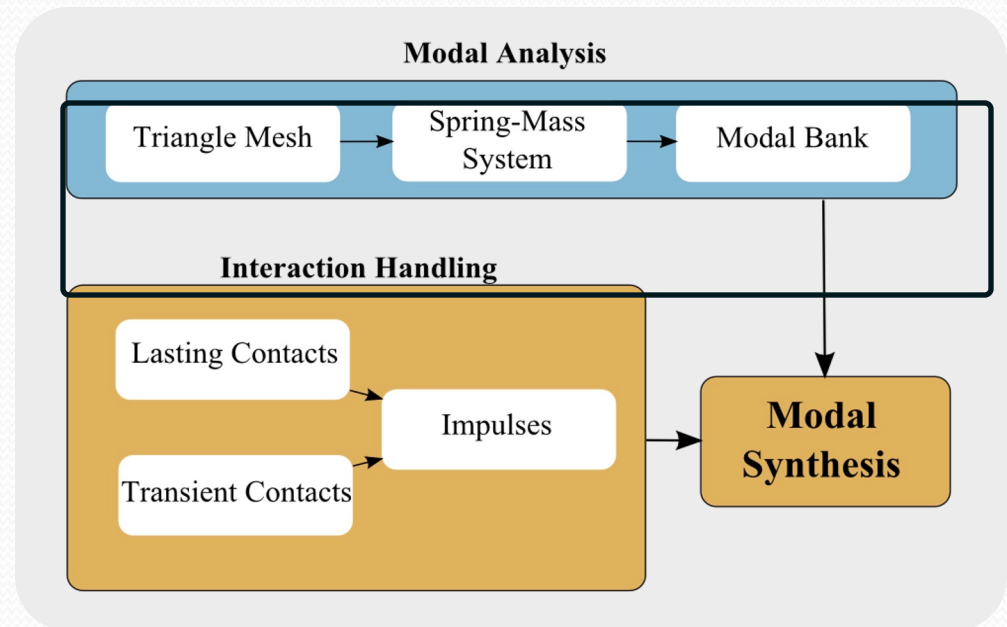
Synthesized sound appears to be “hallow”

Modal Analysis Summary

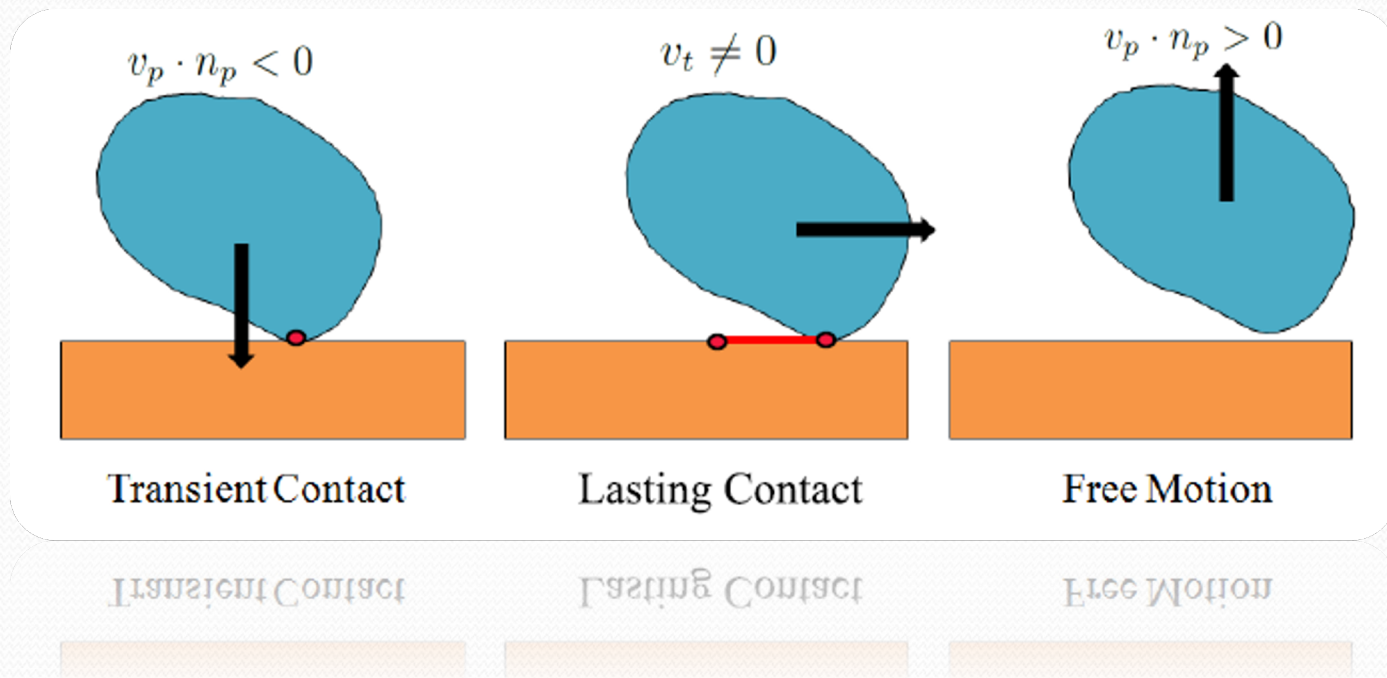
An input triangle mesh ->

A spring-mass system ->

A set of decoupled modes



State Detection



State Detection

Distinguishing between lasting and transient contacts

In contacts?

$$\begin{cases} v_p \cdot n_p < 0 & \text{in contact} \\ v_p \cdot n_p > 0 & \text{not in contact} \end{cases}$$

In lasting contacts?

$$\begin{cases} v_t \neq 0 & \text{lasting contact} \\ v_t = 0 & \text{not in lasting contact} \end{cases}$$

Interaction Handling

Lasting contacts -> a sequence of impulses

Transient contacts -> a single impulse

Impulse Response

Dirac Delta function as impulse excitation

General solution

$$z_i = c_i e^{\omega_i^+ t} + \bar{c}_i e^{\omega_i^- t}$$

with initial condition given by the impulse,

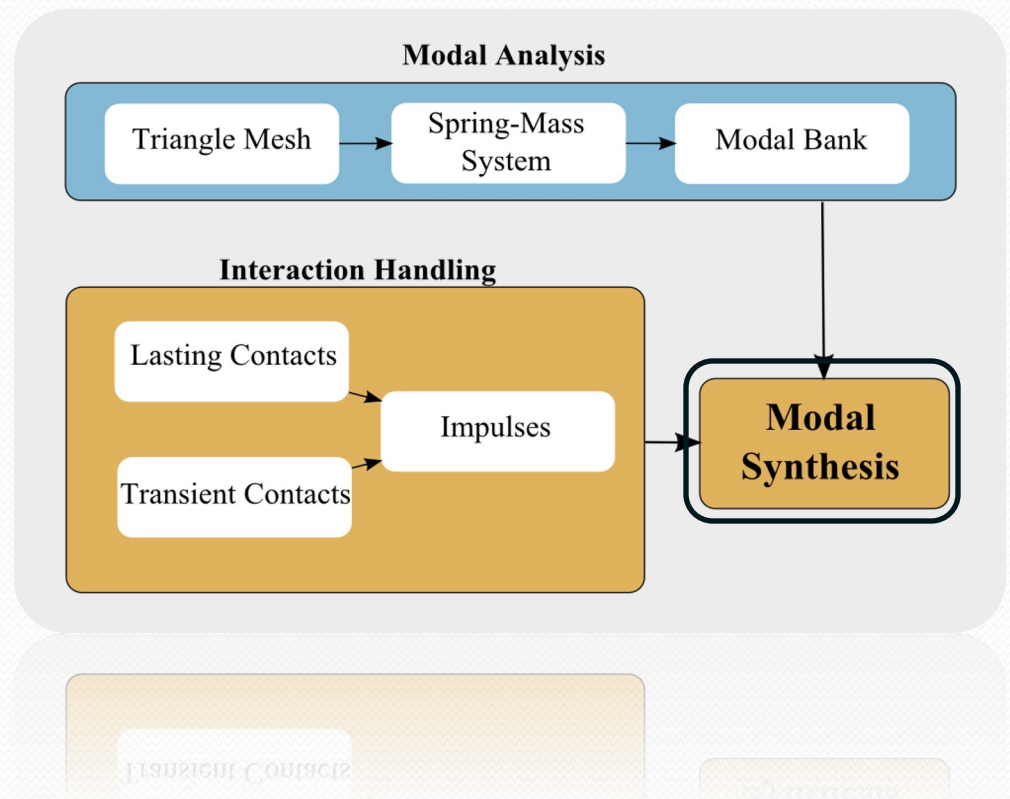
we have:

$$c'_i = c_i e^{\omega_i^+ t_0} + \frac{g_i}{m_i(\omega_i^+ - \omega_i^-)}$$

$$\bar{c}'_i = \bar{c}_i e^{\omega_i^- t_0} - \frac{g_i}{m_i(\omega_i^+ - \omega_i^-)}$$

Impulse Response

$$z_i = c_i e^{\omega_i^+ t} + \bar{c}_i e^{\omega_i^- t}$$



Handling Lasting Contacts

The interaction simulation has to be stepped at the audio sampling rate: 44100 Hz

The update rate of a typical real-time physics simulator: on the order of 100's Hz

Not enough simulation is provided by the physics engine

An customized interaction model for sound synthesis

Mode Compression: Principle

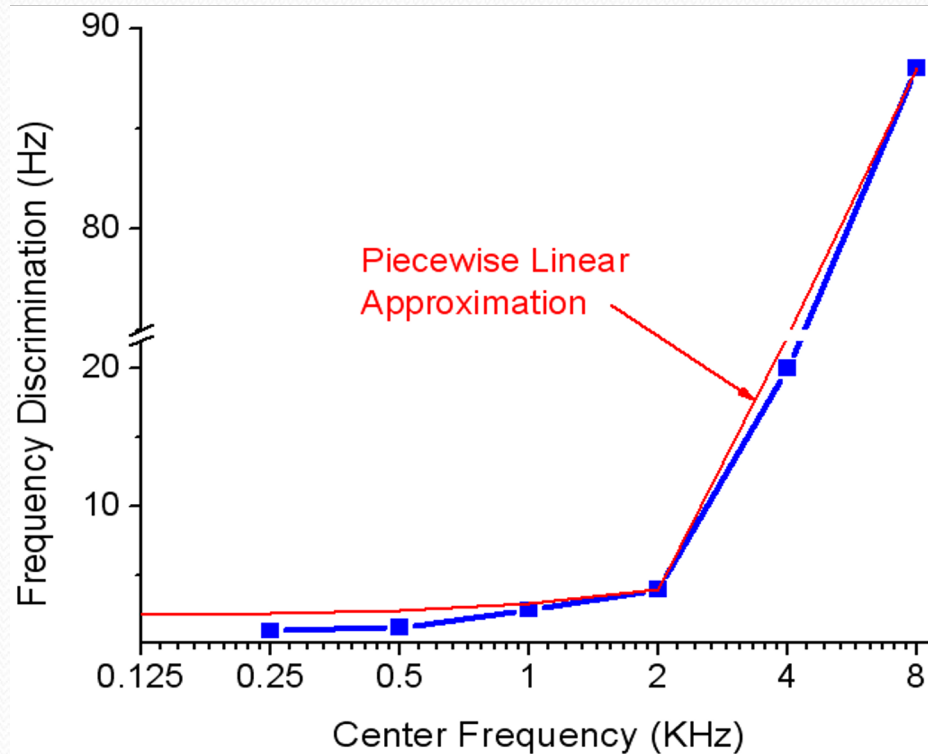
Humans can't distinguish two frequencies arbitrarily close to each other [Sek et. al., 1995*]

Accuracy in discriminating frequencies depends on the frequency in question

Different frequencies were played in succession to find if the subject could distinguish between them

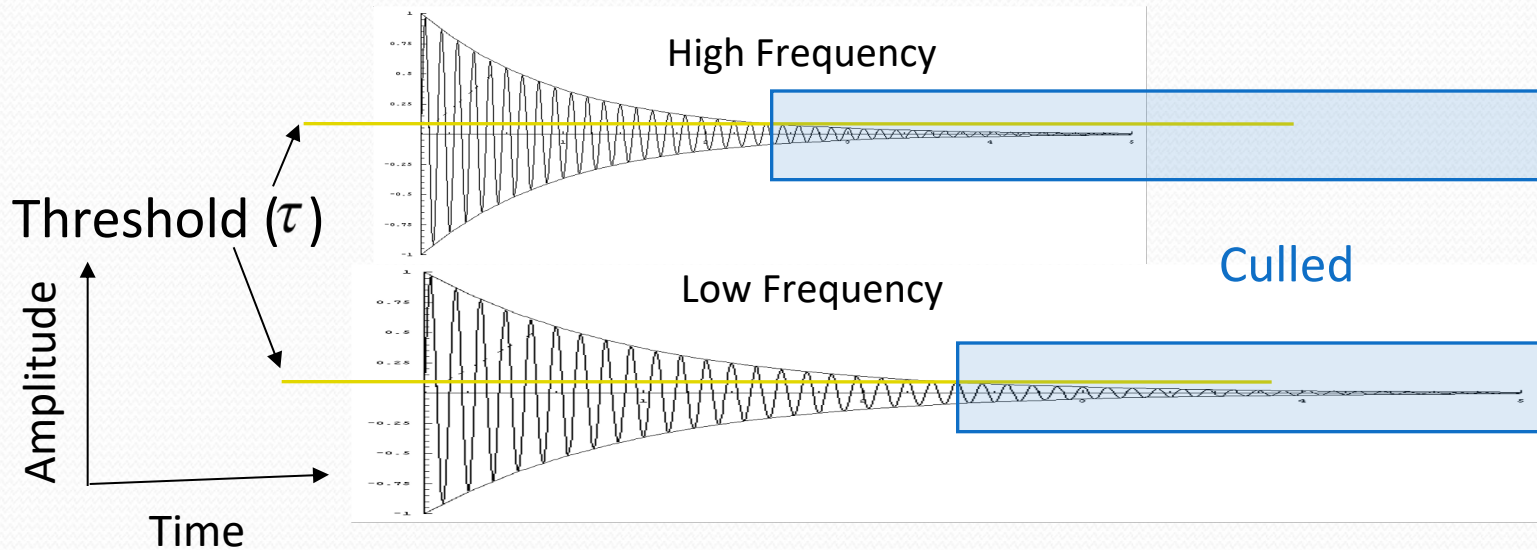
*Sek, A., and Moore, B. C. 1995. Frequency discrimination as a function of frequency, measured in several ways. *J. Acoust. Soc. Am.* 97, 4 (April), 2479–2486.

Mode Compression: Auditory Perception



Frequency Discrimination at 2 KHz is about 4 Hz -- We can't tell apart frequencies within the range 1998 - 2002 Hz -> *playing many sinusoids of different frequencies together*

Mode Truncation



Impact Sounds: Attack + Decay

Key Point: Critical to capture attack properly

Stop mixing mode when its contribution falls below a prescribed threshold, τ (typically -60 to -80 dB of initial level)

Quality Scaling

A typical audio scene consists of foreground and background sounds

Higher intensity sounds are considered to be foreground

Idea: *Give more importance to foreground sounds*

Provides a graceful way to adapt to variable time constraints

System Demonstration

VIDEO

Sound from Image Textures

VIDEO

Limitations

Implementation: Model only the surface (not an inherent limitation of the approach)

More approximate than an FEM-based formulation

Some tuning is required

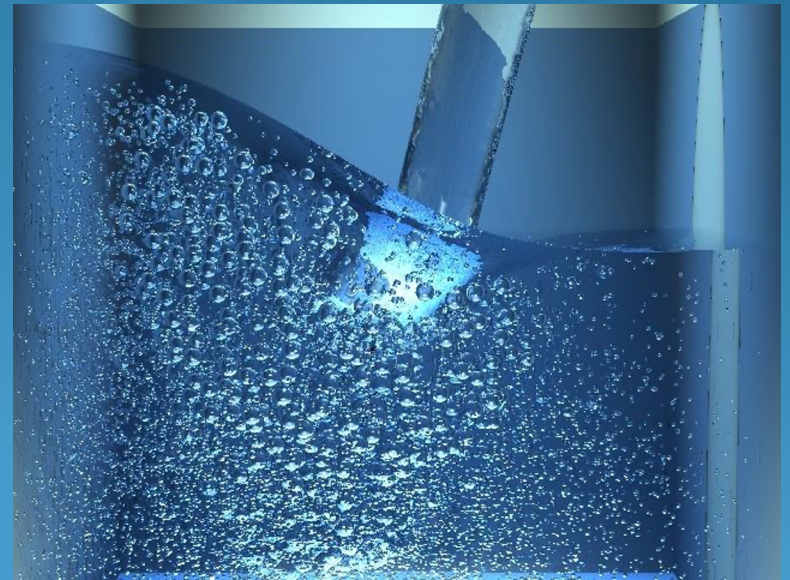
All sound synthesis techniques relying on Modal Analysis:
Can only use linear damping models

Sounding Liquids [Moss et al. 2009]

- Work in physics & engineering literature since 1917
 - Sound generated by resonating bubbles
- *Physically-based Models for Liquid Sounds* (van den Doel, 2005)
 - Spherical bubble model
 - No fluid simulator coupling
 - Hand tune bubble profile

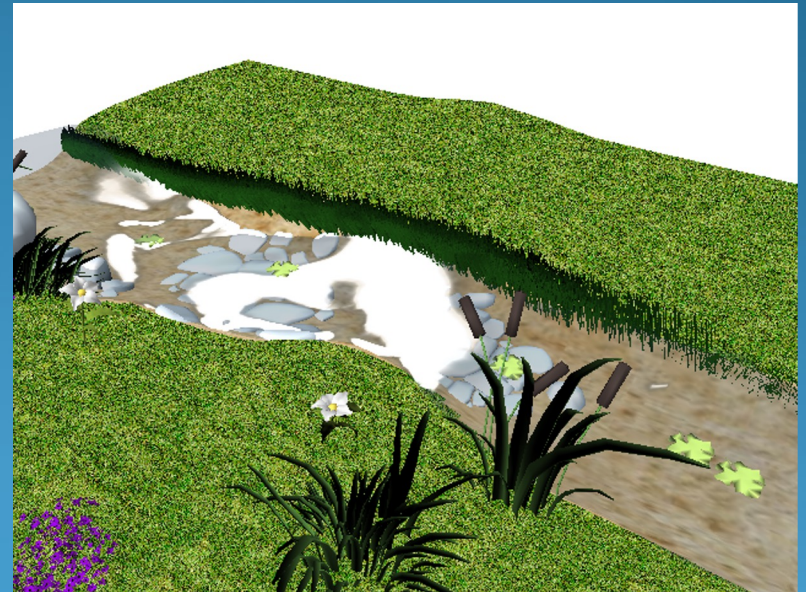
Background (Fluid)

- Grid-based methods
- Accurate to grid resolution
 - Bubbles can be smaller
 - Slow
 - Can be two-phase



Background (Fluid)

- Shallow Water Equations
 - Simulate water surface
 - No breaking waves
 - Real time
 - One phase
 - Explicit bubbles



Overview

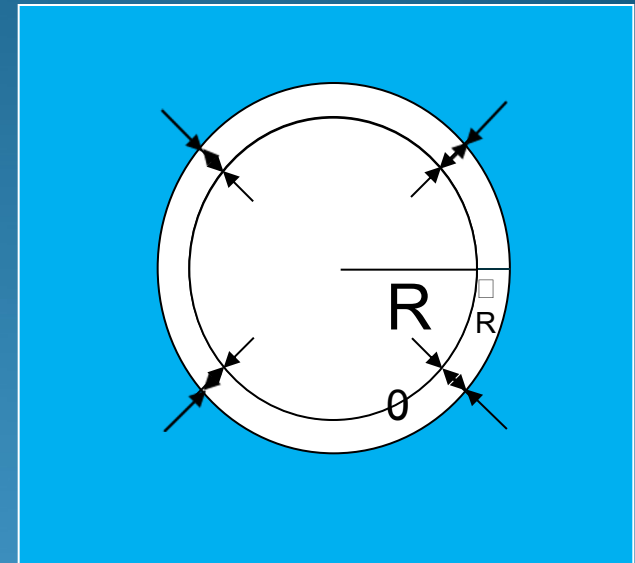
- Generate sound from existing fluid simulation
 - Model sound generated by bubbles
- Apply model to two types of fluid simulators
 - **Particle-Grid-based**
 - Extract bubbles
 - Process spherical and non-spherical bubbles
 - Generate sound
 - **Shallow Water Equations**
 - Processes surface
 - Curvature and velocity
 - Select bubble from distribution
 - Generate sound

Mathematical Formulations

Spherical Bubbles

$$f_0 = \frac{1}{2\pi} \sqrt{\frac{3\gamma p_0}{\rho R_0^2}}$$

$$\tau(t) = A \sin(2\pi f(t)t) e^{-dt}$$



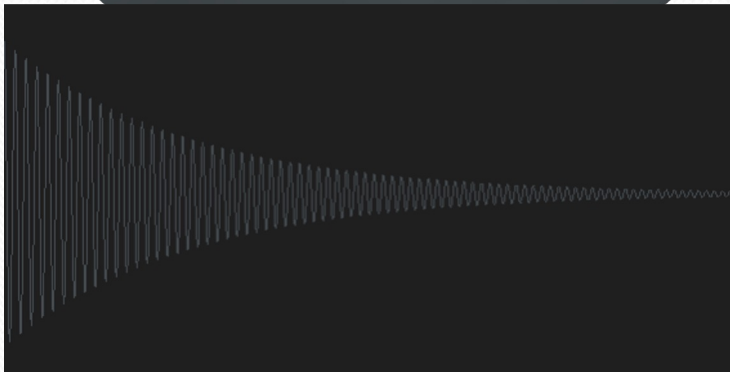
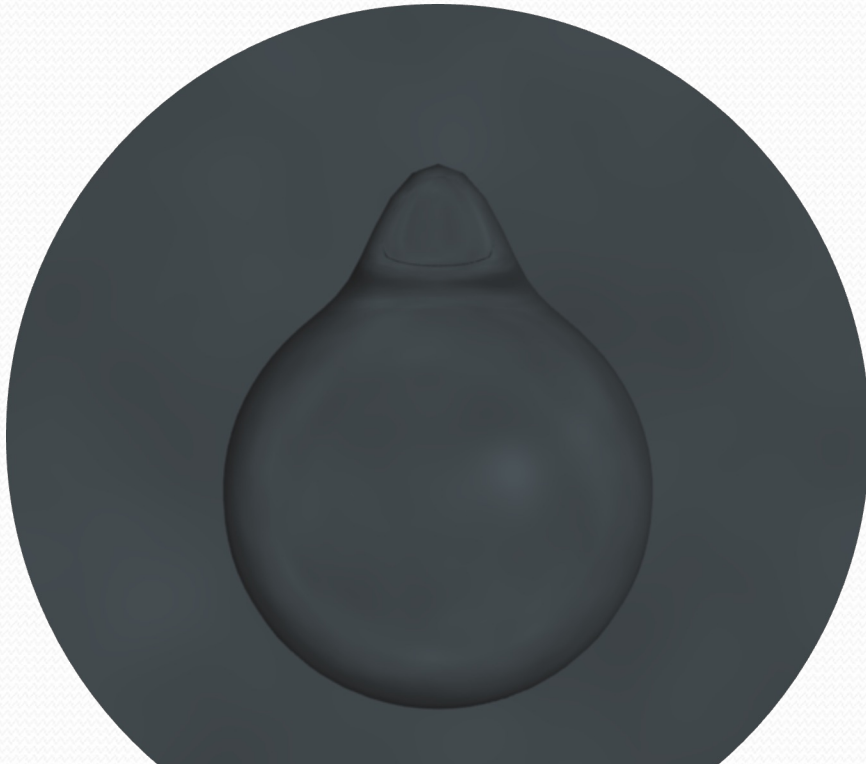
Non-spherical bubbles

- Decompose into a spherical harmonics

$$f_n^2 \approx \frac{1}{4\pi^2} (n-1)(n+1)(n+2) \frac{\sigma}{\rho R_0^3}$$

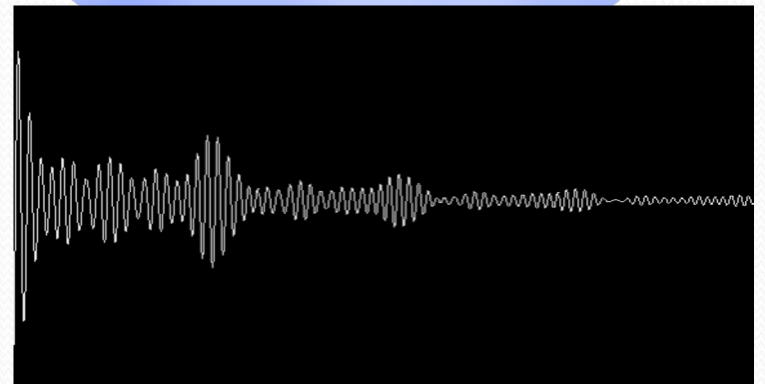
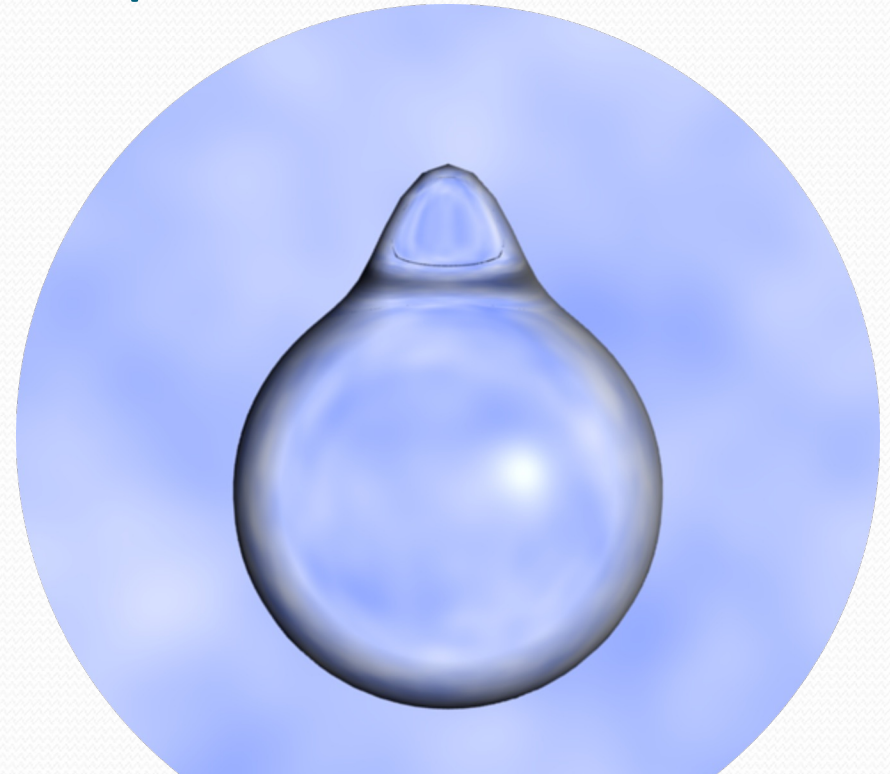
Without

Spherical Harmonics

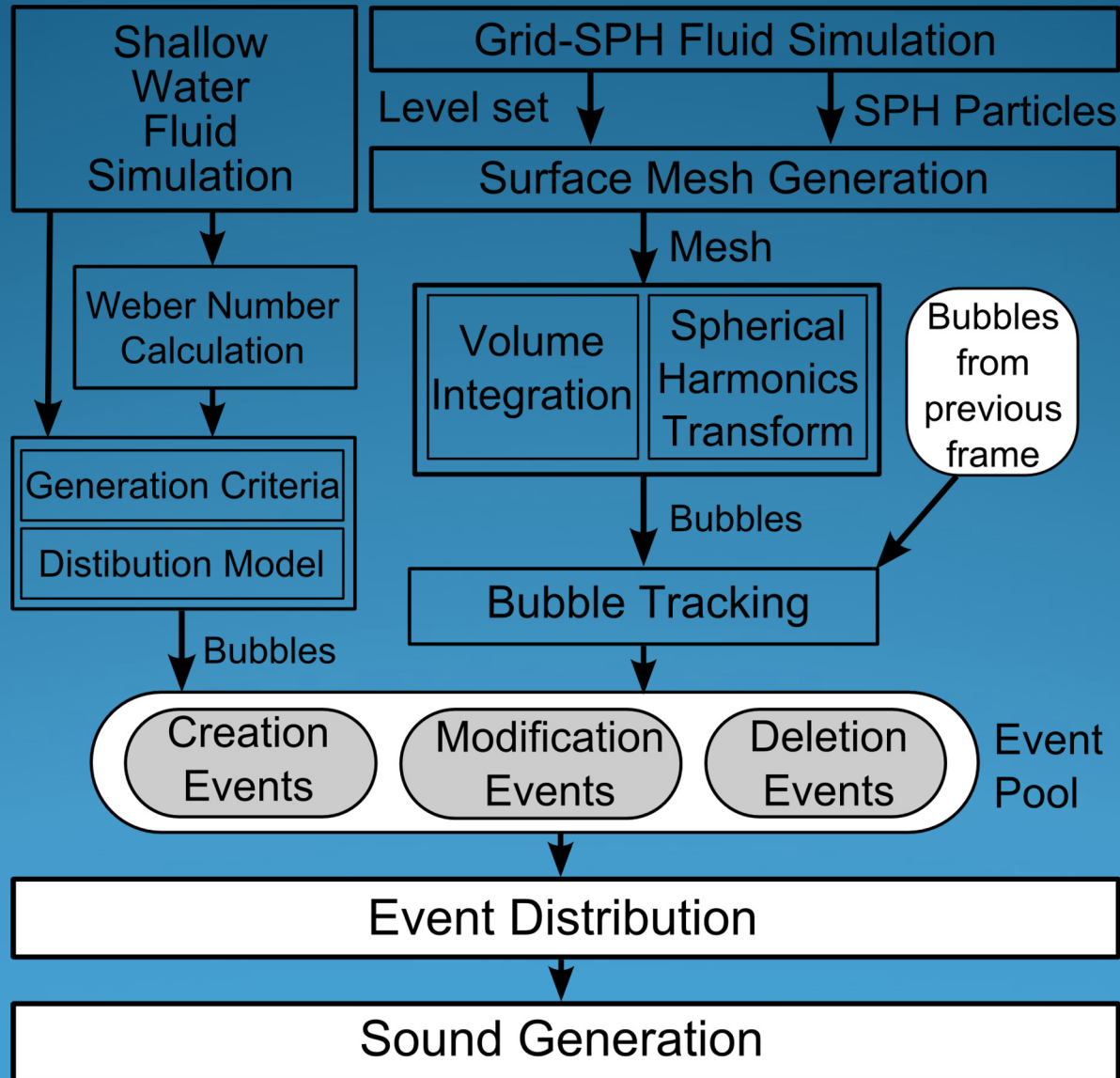


With

Spherical Harmonics

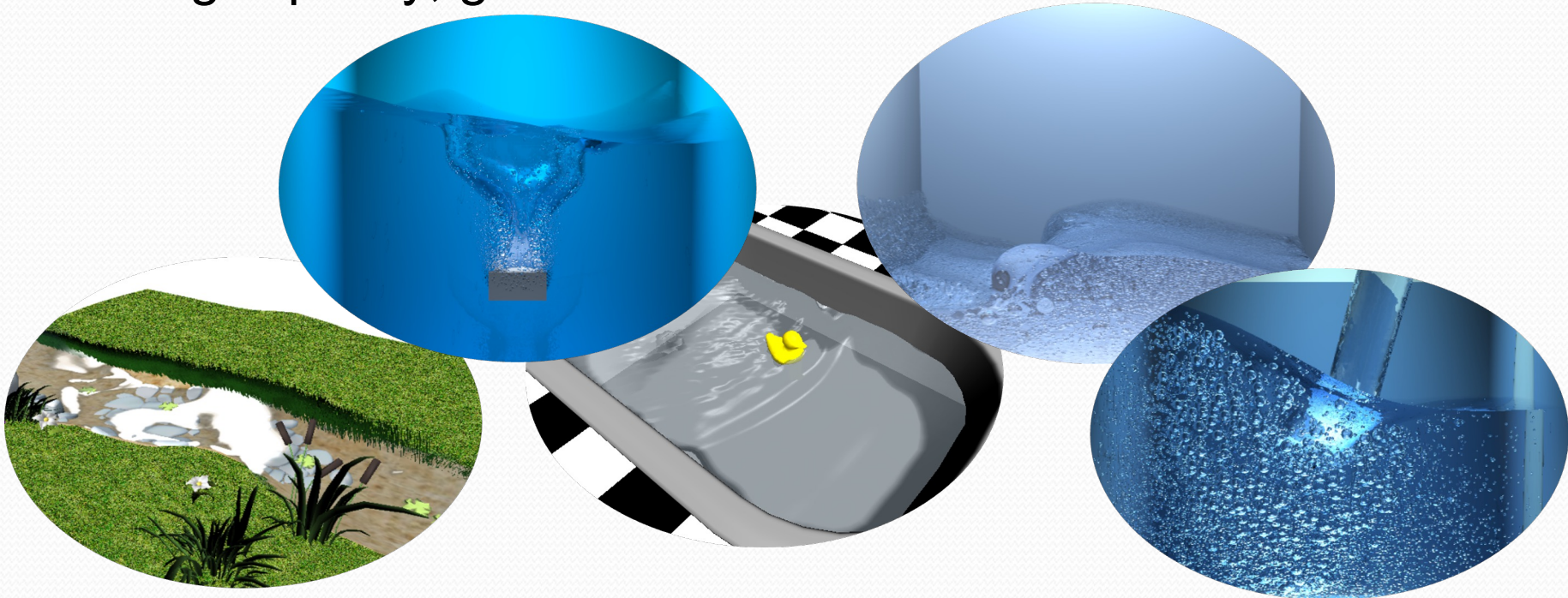


System Overview



Summary

- Simple, automatic sound synthesis
- Applied to two fluid simulators
 - Interactive, shallow water
 - High-quality, grid based



Video Demonstration

VIDEO

Overview

Interactive Sound Synthesis

Efficient Numerical Acoustic Simulation

Interactive Sound Propagation

Conclusion and Future Work

Overview

Interactive Sound Synthesis

Efficient Numerical Acoustic Simulation

Novel technique based on 3D Adaptive Rectangular
Decomposition

Hundred times faster than Finite Difference Time Domain

Interactive Sound Propagation

Conclusion and Future Work

Acoustics: Governing Equation

Solve the Linear Wave Equation:

$$\frac{\partial^2 p}{\partial t^2} - c^2 \nabla^2 p = F(\mathbf{x}, t)$$

∇^2 is the Laplacian operator in 3D

c is the speed of sound in air

p is the pressure field to solve

The RHS is the forcing term, corresponding to volume sound sources in the scene

State of the art: Room Acoustics

Geometric Techniques (e.g. Ray/Beam/Frustum Tracing) combined with explicit diffraction modeling

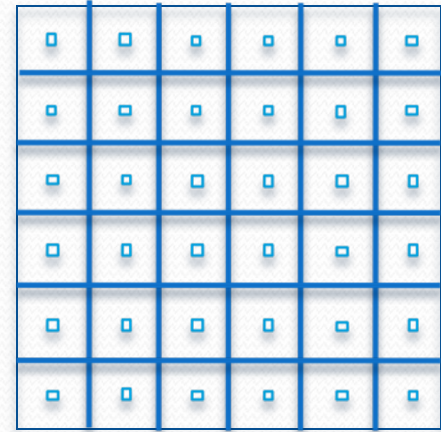
Auralization software (e.g. ODEON, CATT): Hybrid image-source and ray-tracing along with (upcoming) explicit diffraction modeling

Numerical acoustic simulation for complex 3D scenes has been explored only since mid-2000 (~2006)

Acoustics for Interactive Applications

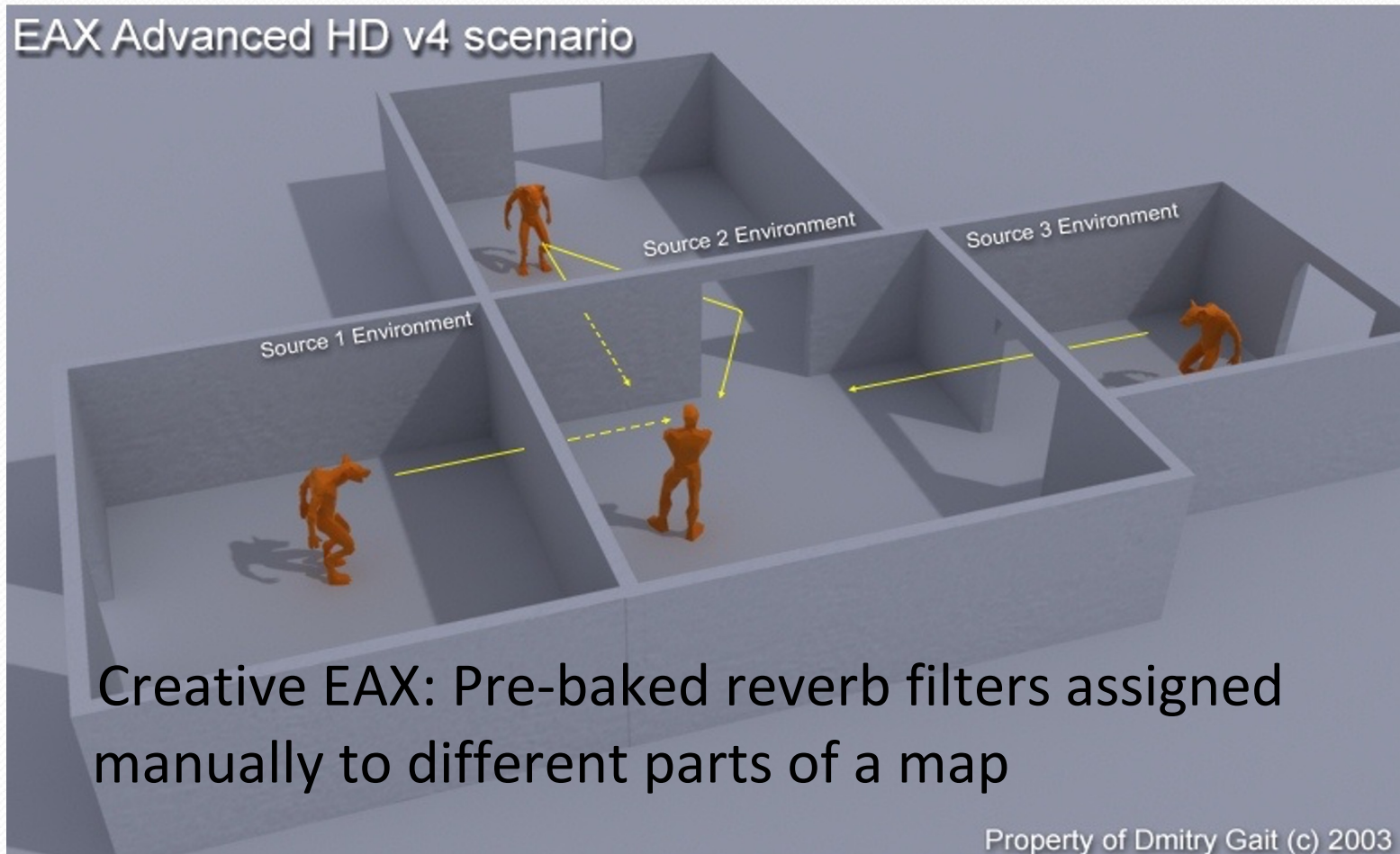
- Geometric Approaches
 - Beam Tracing (Funkhouser et. al.)
 - Phonon Tracing (Bertram and Deines et. al.)
 - Frustum Tracing (Chandak et. al.)
- Advantages: Efficient, easy to understand
- Difficulties: Diffraction / Scattering, high-order reflections

Numerical Acoustics

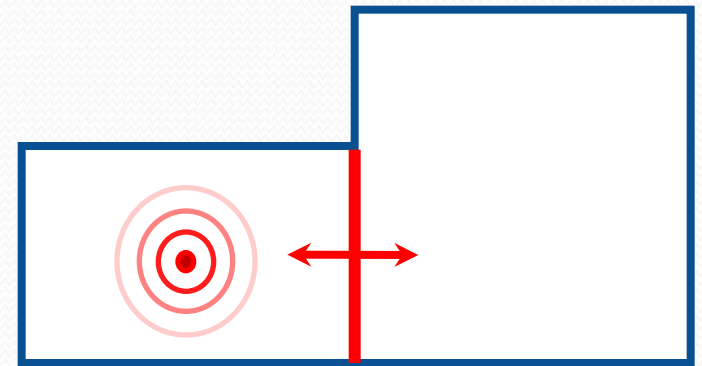
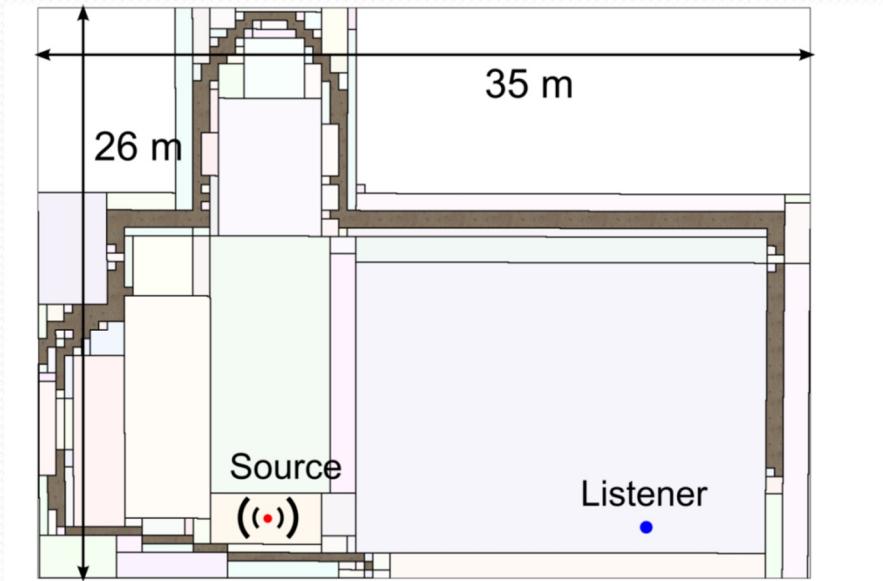


- Discretize and solve Wave Equation on a grid
- Explored for complex 3D scenes (eg. auditoria) only recently (2004 – 2006) by Sakamoto et. al.
- Disadvantage: Slow and memory-intensive
 - Simulations are band-limited
- Advantages: Diffraction / Scattering, high-order reflections

Acoustics in Games



Adaptive Rectangular Decomposition



Interface Handling

Numerical Simulation of the Wave Equation

Rectangular Decomposition of a 3D scene

Exploit analytical solutions on rectangular spaces

6th order Finite Difference for interface transmission

Solution on a Rectangular Domain

Rectangular space in 3D with size (l_x, l_y, l_z) , and perfectly reflective boundary

Modal Analysis can be done ***analytically*** –

$$p(x, y, z, t) = \sum_{i=(i_x, i_y, i_z)} m_i(t) \Phi_i(x, y, z)$$

$$\Phi_i(x, y, z) = \cos\left(\frac{\pi i_x}{l_x} x\right) \cos\left(\frac{\pi i_y}{l_y} y\right) \cos\left(\frac{\pi i_z}{l_z} z\right)$$

Leveraging GPU for Acoustics

Solution of Wave Equation within each rectangle can be done using a 3D Discrete Cosine Transform (DCT)

DCTs can be computed using FFT

Use efficient FFT implementation on GPU

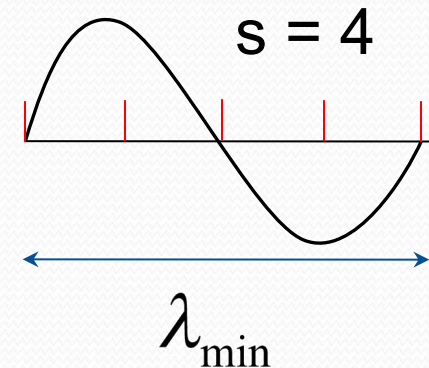
Govindaraju, N. K., Lloyd, B., Dotsenko, Y., Smith, B., and Manferdelli, J.
High-Performance Discrete Fourier Transforms on Graphics Processors. In the *Proc. of 2008 ACM/IEEE Supercomputing*

Computational Efficiency

For a scene of size L in 3D and simulation duration T –

$$\text{Memory : } \left(\frac{L s v_{\max}}{c} \right)^3$$

$$\text{Time : } T \left(\frac{L}{c} \right)^3 (s v_{\max})^4$$



Nyquist Limit: $s \geq 2$

FDTD: $s = 10$. My approach: $s = 2.6$

Speedup with my technique : $(10 / 2.6)^4 > 100$



Demo

Video

Performance Comparison

Scene Name	Volume (m ³)	Time: FDTD (CPU)	Time: My Technique (GPU)	Speedup
Corridor	375	365 min	4 min	~ 90x
House*	1,275	3.5 days	24 min	~ 200x
Cathedral	13,650	1 week (estimated)	29 min	~ 300 x

Quad-core 2.8GHz Intel Xeon CPU with 8GB RAM, NVIDIA GeForce GTX 280

* This simulation was band-limited to 2 kHz, instead of 1 kHz

Summary

- Adaptive Rectangular Decomposition yields 100x improvement in performance over FDTD and consumes 10x less memory
- Source of Speedup: Modal Analysis of rectangular spaces as well as GPU-DCT
- Can feasibly simulate acoustics for large, complex scenes, such as a Cathedral

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Efficient Numerical Acoustic Simulation

Interactive Sound Propagation

Conclusion and Future Work

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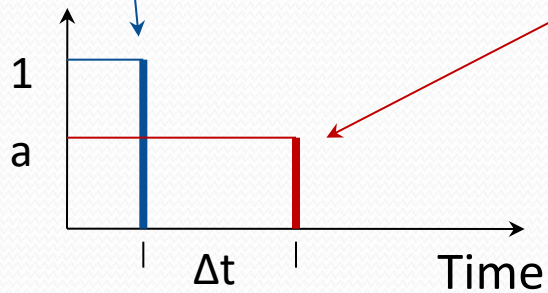
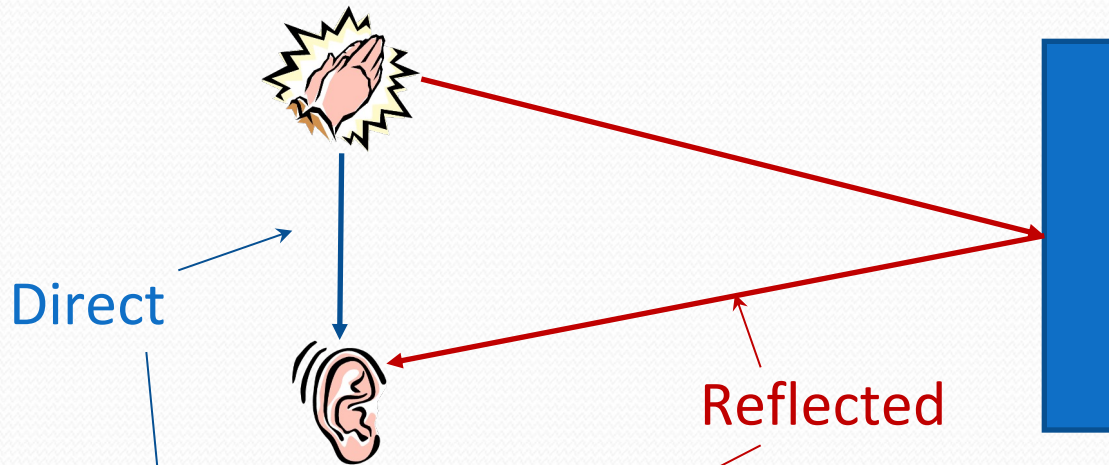
- Perceptual aspects of acoustics

- Novel perceptually-motivated techniques

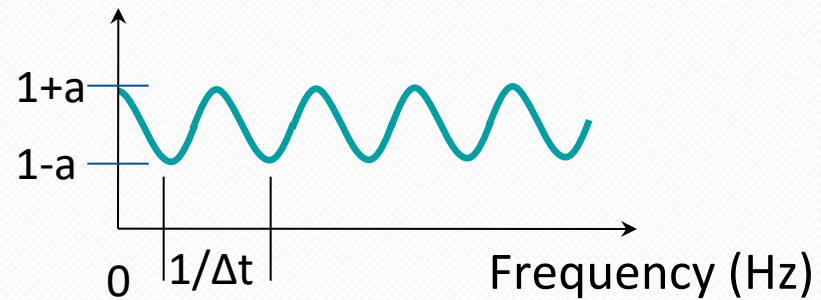
- Interactive auralization system: moving sources and listener

Conclusion and Future Work

Impulse Response (IR)



Impulse Response



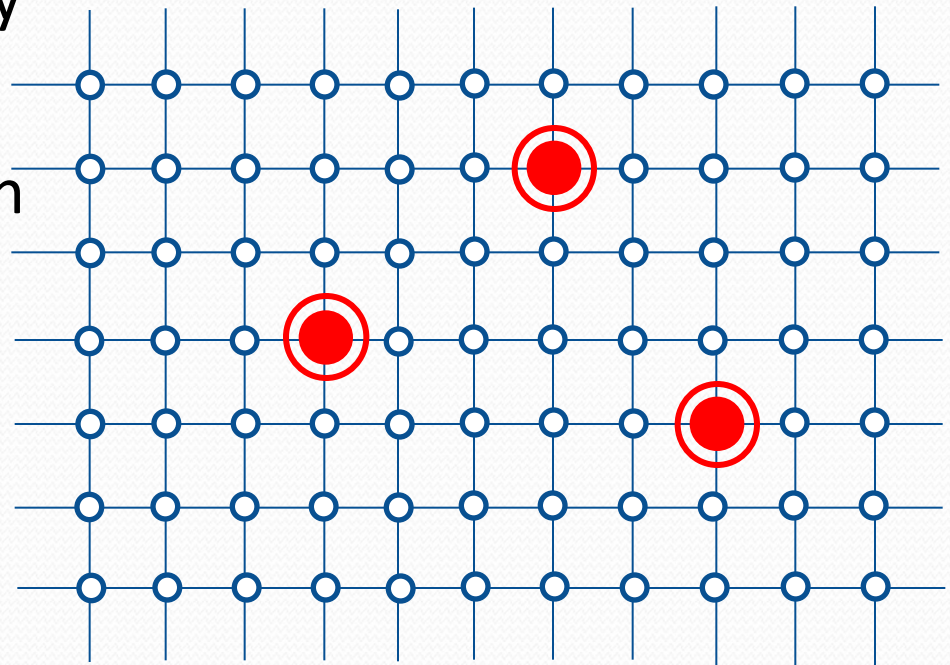
Frequency Response

Challenges

Direct approach is costly

Days of simulation (even with fast simulator)

Terabytes of storage



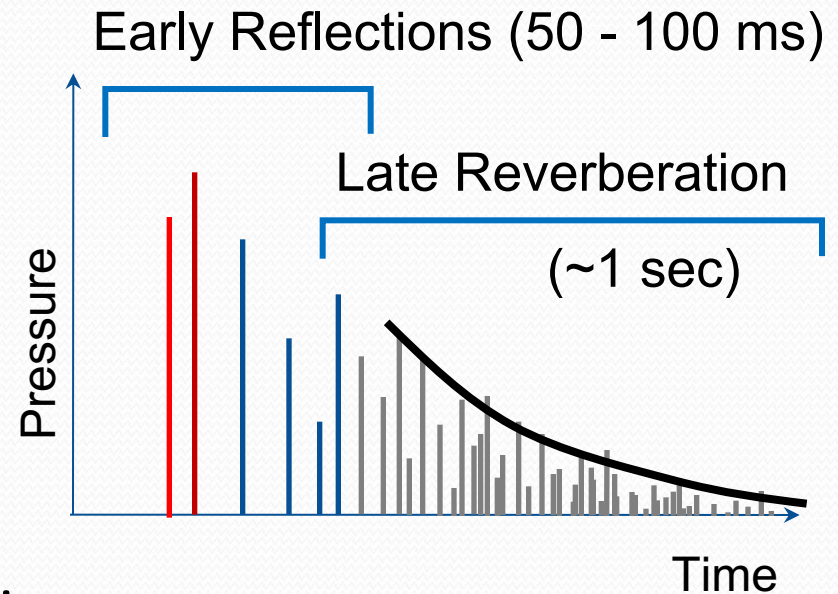
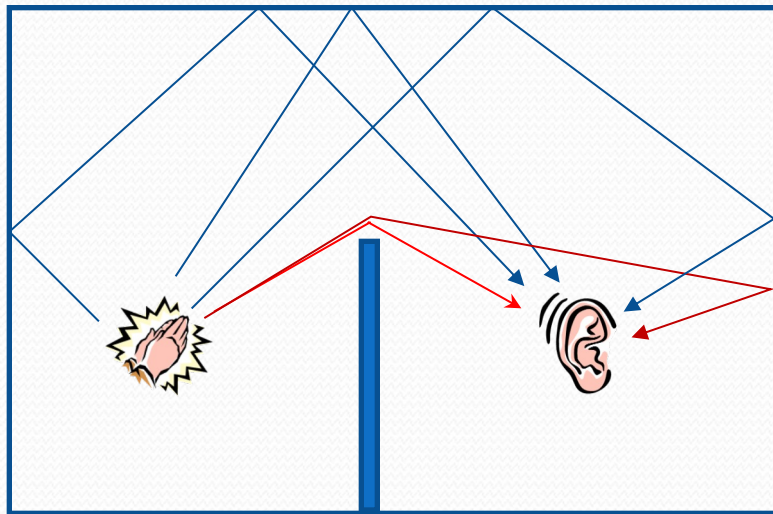
● Source locations

○ Listener locations

Contributions

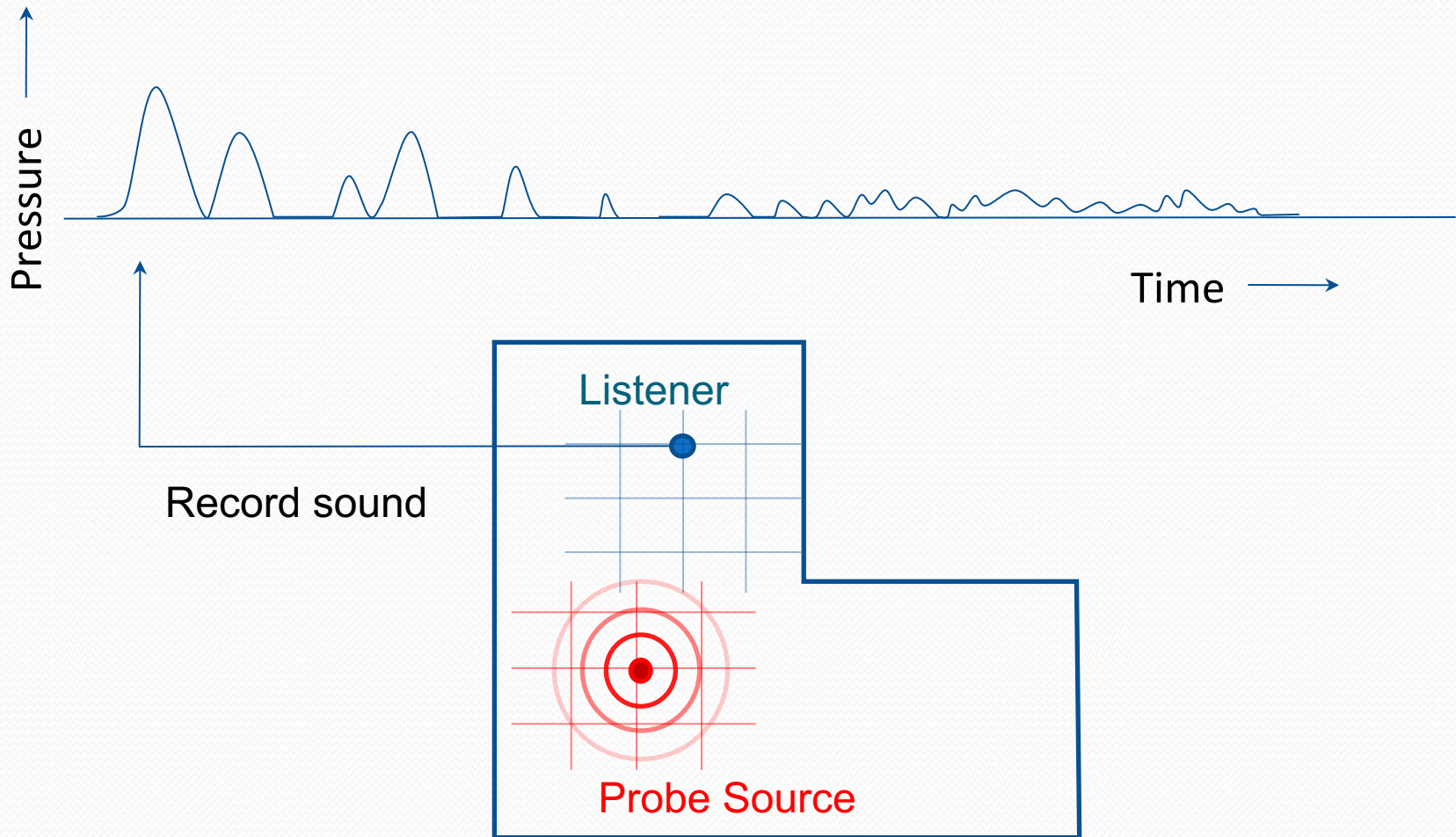
- Approach –
 - Sample data at lower resolution in space (~ 1 m)
 - Novel perceptually-based scheme: Store each Impulse Response compactly
 - Spatially-interpolate Impulse Responses
- Audio engine that uses fast frequency-domain convolutions

Auditory perception of acoustic spaces

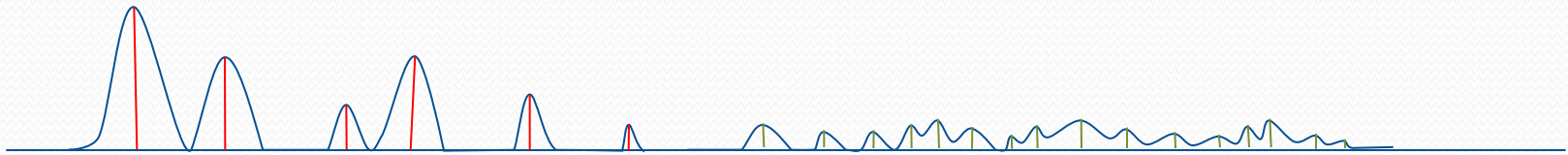


- Direct Sound: Sense of direction
- ER: Loudness, Timbre, “Envelopment”. Perceivable spatial variation.
- LR: Only statistical properties perceivable – Decay Time (RT60), Periodicities (Flutter echoes)

IR Factoring (1)



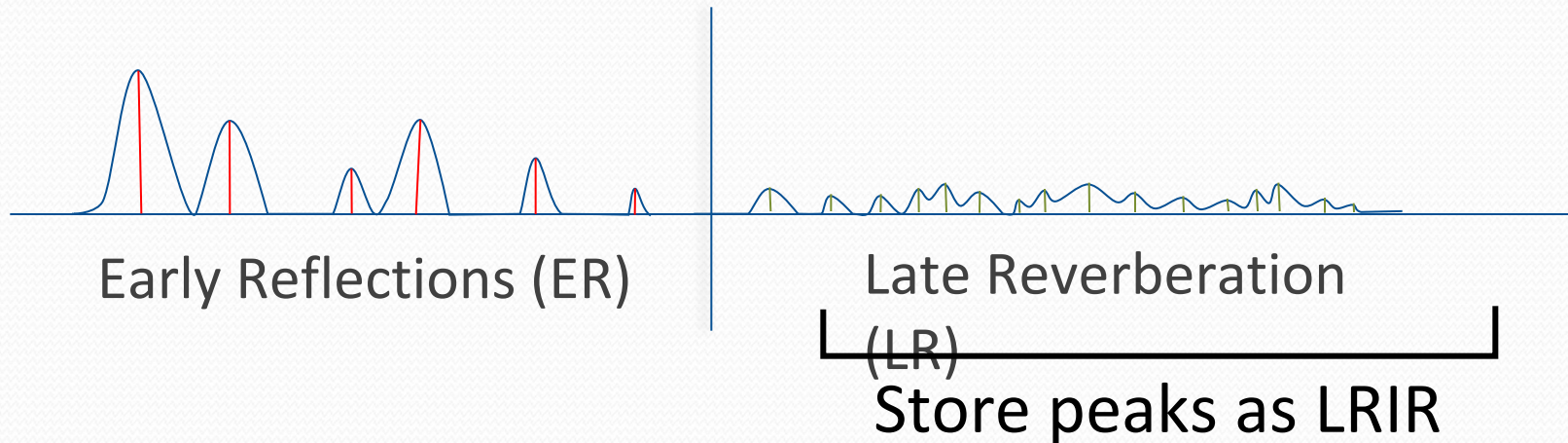
IR Factoring (2)



Peak Detection

- Finds peak delays and amplitudes

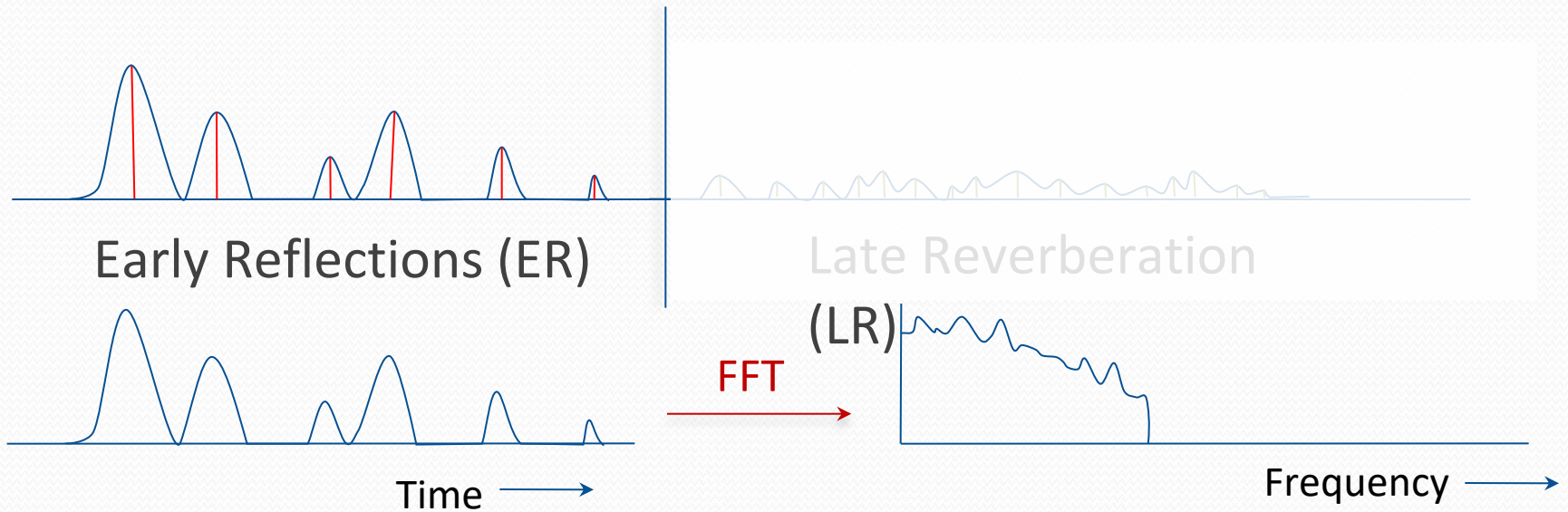
IR Factoring (3)



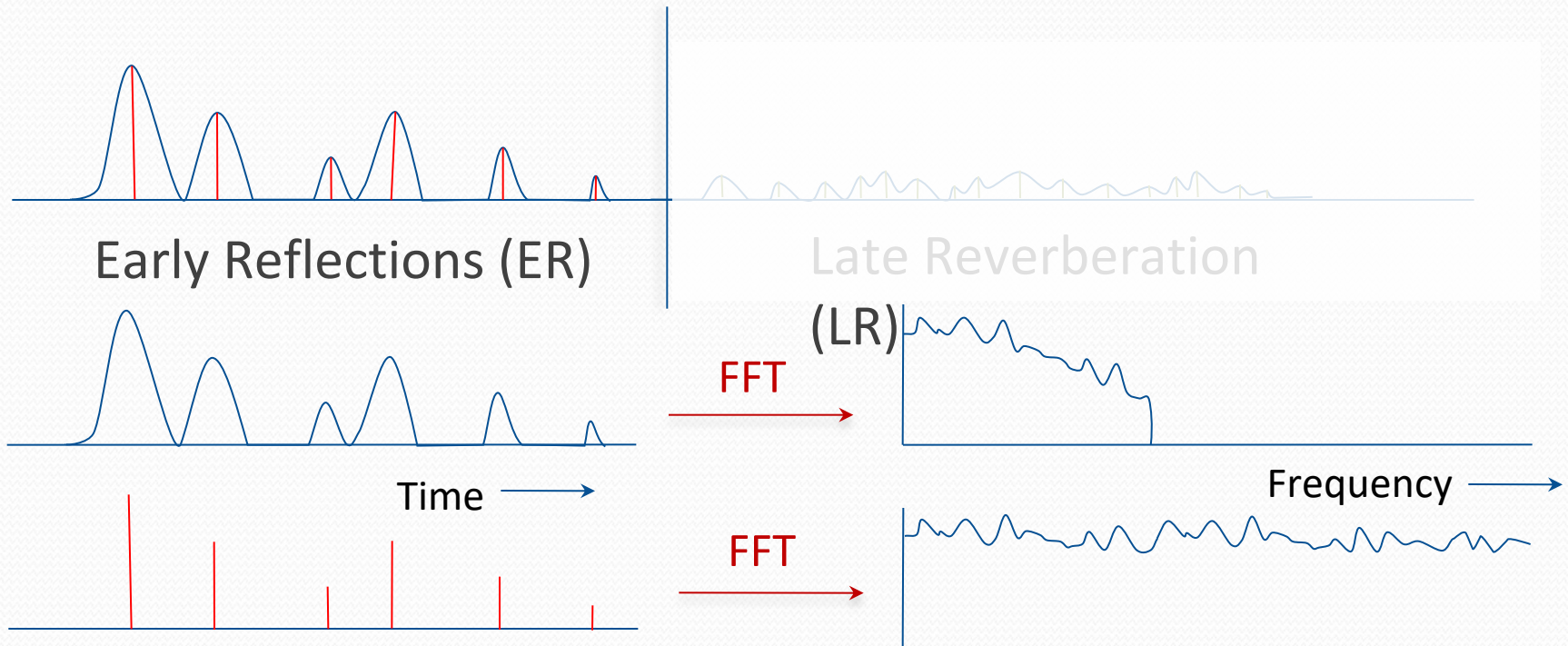
ER - LR Decomposition

- Compute and store only one Late Reverberation filter per room
- Reduces pre-computation time and runtime memory usage by 10 times

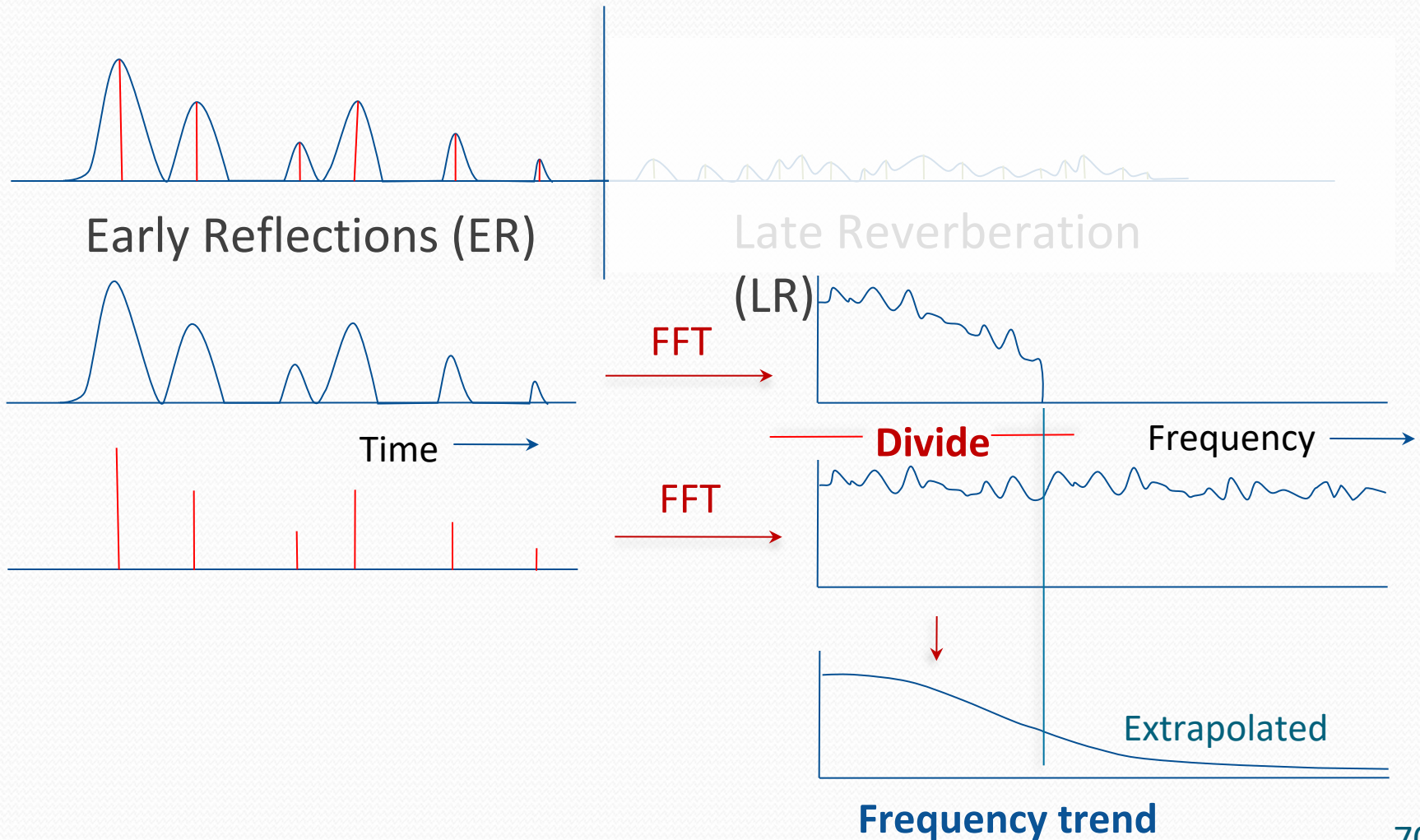
IR Factoring (4)



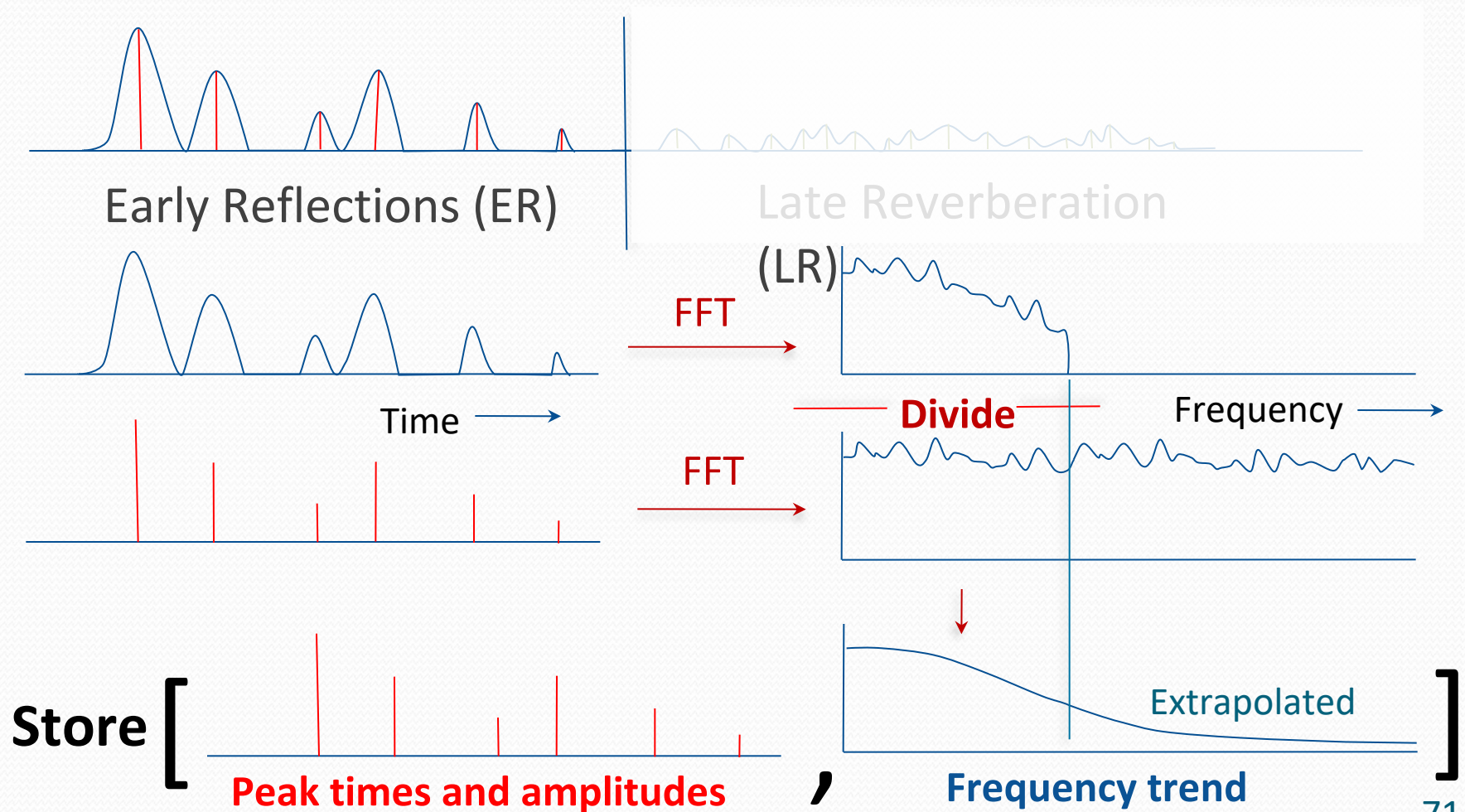
IR Factoring (5)



IR Factoring (6)

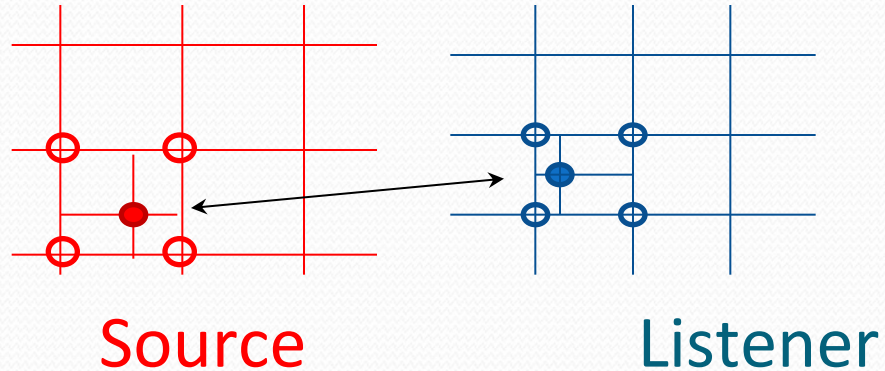


IR Factoring (7)

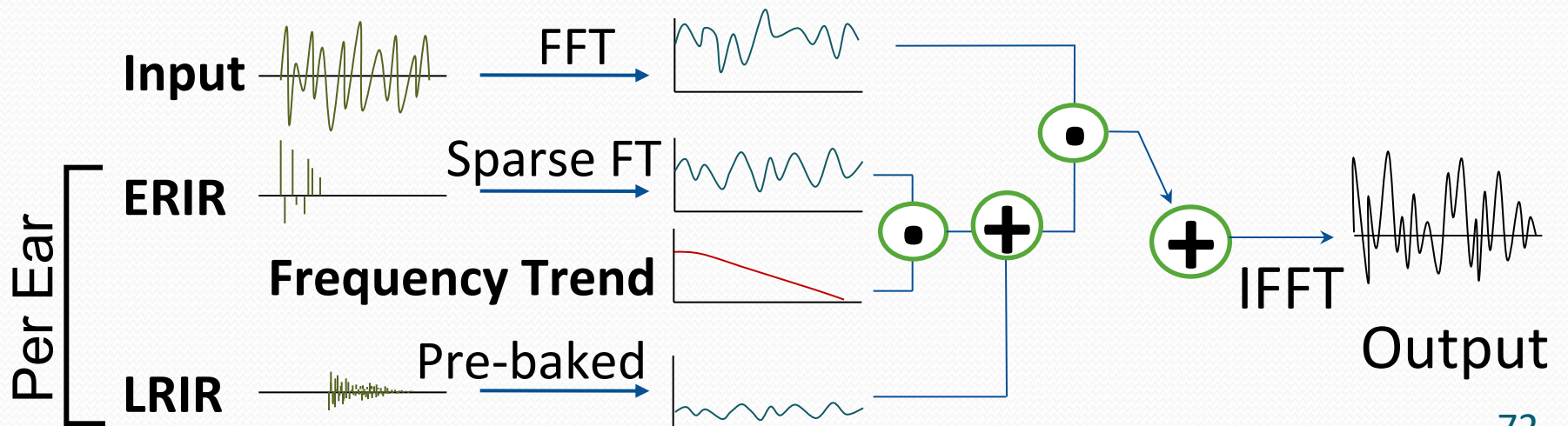


Runtime Processing

ERIR
Interpolation



Auralization



Performance

- Pre-processing times typically a few hours
- Can handle about 10 sound sources in real-time on a Quad-core Xeon system with 4 GB RAM
- Bottleneck: 1D FFT
 - Auralization system maps well to parallel processors

Walkthrough: Game Scene

“Citadel” Scene from the game Half-Life 2

Large Size: 3,500 m³

Complex geometry (fin-like structures)

System Demonstration

Video

<http://www.youtube.com/watch?v=MQt1jtDBNK4>

Summary

- The first interactive sound propagation system that leverages numerical simulation
- Can render important acoustic effects like Late Reverberation and Diffraction low-pass filtering in real-time
- Can handle multiple moving sound sources and listener
- Works for large, complex 3D scenes

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Summary

- Interactive Sound Synthesis
 - Perceptually-motivated optimizations enabling hundreds of sounding objects in real-time
- Efficient Numerical Acoustics
 - A simulator 100 times faster than Finite Difference Time Domain for constant wave speed simulations
- Interactive Sound Propagation
 - Leverage fast numerical acoustics
 - Exploit auditory perception
 - Render wave-based acoustics for multiple moving sources and listener in real-time

Conclusion

- Physically-based Sound: Complex underlying physical processes require a lot of computational power
- Combination of efficient algorithms, perceptually-motivated optimizations and fast hardware

Recent Work: Sound Synthesis

- **Ultimate goal:** Virtual Worlds with physically-based sounds for collisions, rolling, sliding, creaking, cloth, gunshots, water, automobiles, and so on
- Infer audio materials from video
- Virtual Musical Instruments using next-gen UI
- Mobile Musical Instruments

Recent Work: Sound Propagation

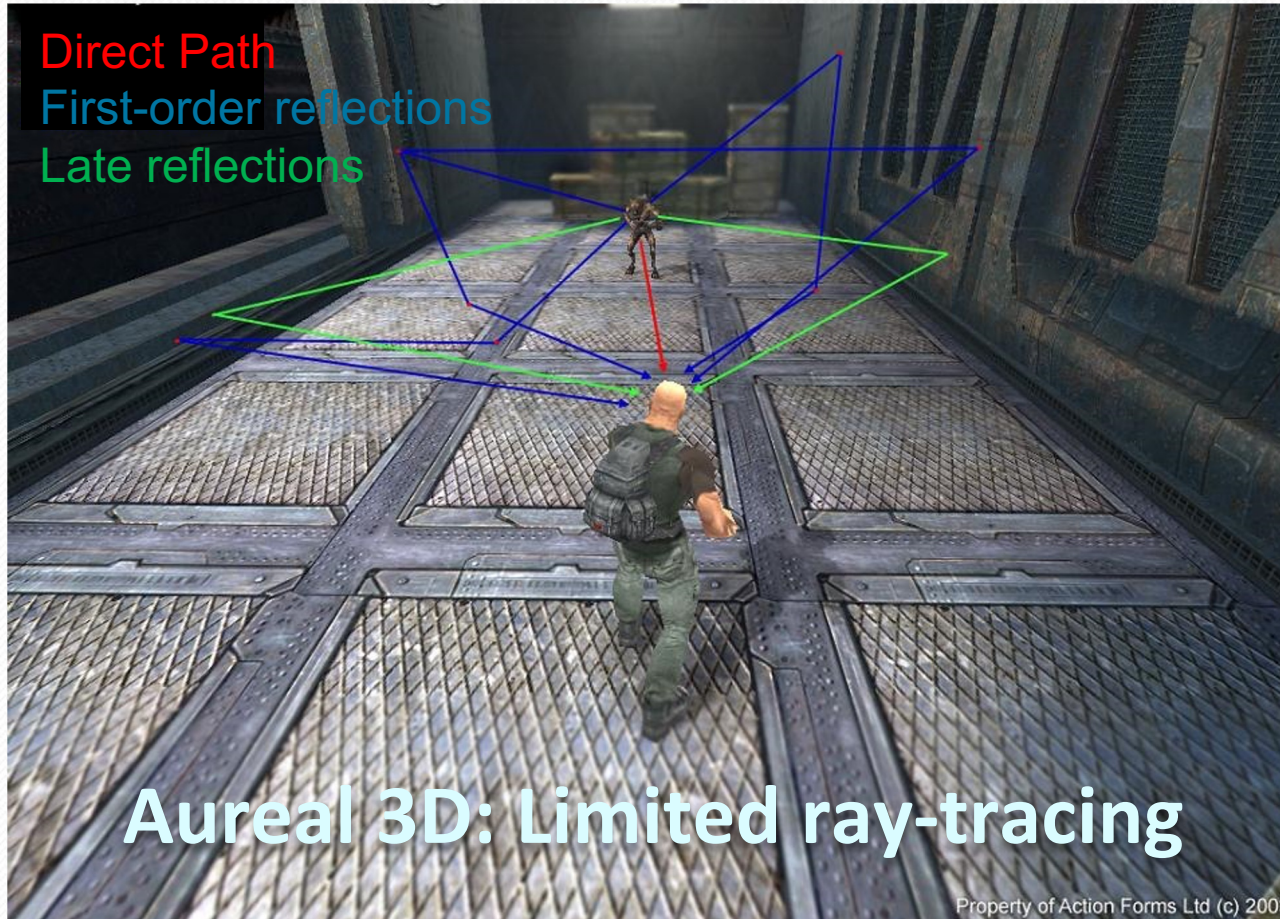
- Acoustics for Games and Virtual Worlds
- Accurate numerical predictions in auditorium design
- Efficient numerical solvers for high-performance computing applications
- Combine Sound Synthesis and Acoustics for a completely physically-based auralization system

References

- Nikunj Raghuvanshi and Ming C. Lin. **Interactive Sound Synthesis for Large Scale Environments**. In SI3D '06: Proceedings of the 2006 symposium on Interactive 3D graphics and games, 2006.
- Nikunj Raghuvanshi, Nico Galoppo, and Ming C. Lin. **Accelerated Wave-based Acoustics Simulation**. In SPM '08: Proceedings of the 2008 ACM Symposium on Solid and physical modeling, 2008.
- Nikunj Raghuvanshi, Rahul Narain, and Ming C. Lin. **Efficient and Accurate Sound Propagation using Adaptive Rectangular Decomposition**. IEEE Transactions on Visualization and Computer Graphics, December 2009.
- Nikunj Raghuvanshi, Brandon Lloyd, and Ming C. Lin. **Efficient Numerical Acoustic Simulation on Graphics Processors Using Adaptive Rectangular Decomposition**. Proc. EAA Symposium on Auralization, 2009.



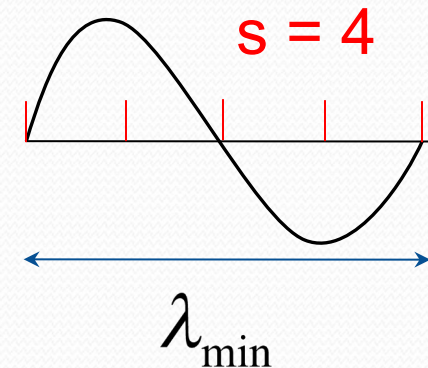
Acoustics in Games



Computational Challenges (1)

Need sufficient spatial resolution to resolve smallest wavelength of interest

$$h \sim \frac{\lambda_{\min}}{s}, \quad s > 2$$



Also, need sufficiently small time-step to resolve highest frequency

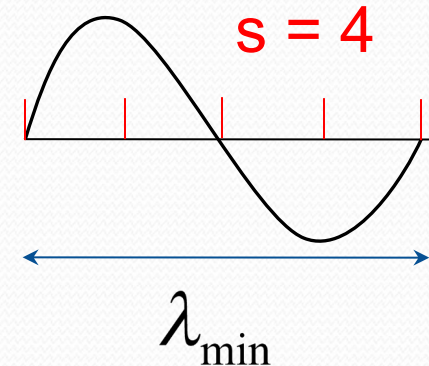
$$dt < \frac{1}{s v_{\max}}$$

Computational Challenges (2)

For a scene of size L in 3D and simulation duration T –

$$\text{Memory : } \left(\frac{L s v_{\max}}{c} \right)^3$$

$$\text{Time : } T \left(\frac{L}{c} \right)^3 (s v_{\max})^4$$



For a medium-sized room – $L = 10$ m, $T = 1$ s,
 $c = 340$ m/s, $s = 10$, $v_{\max} = 10,000$ Hz

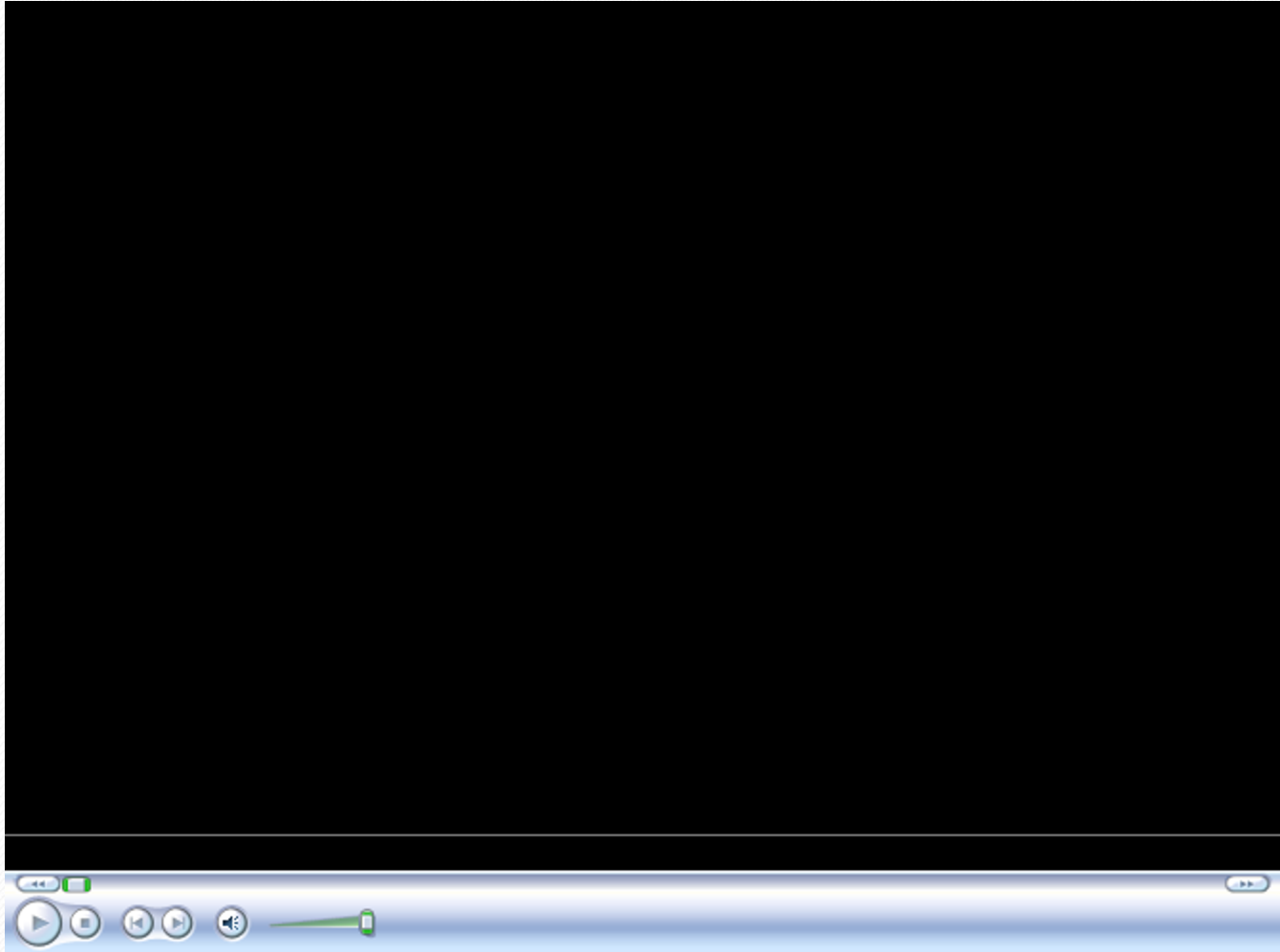
Memory : **~100 GB**

Time: **6 days**, at 100 GFLOPS

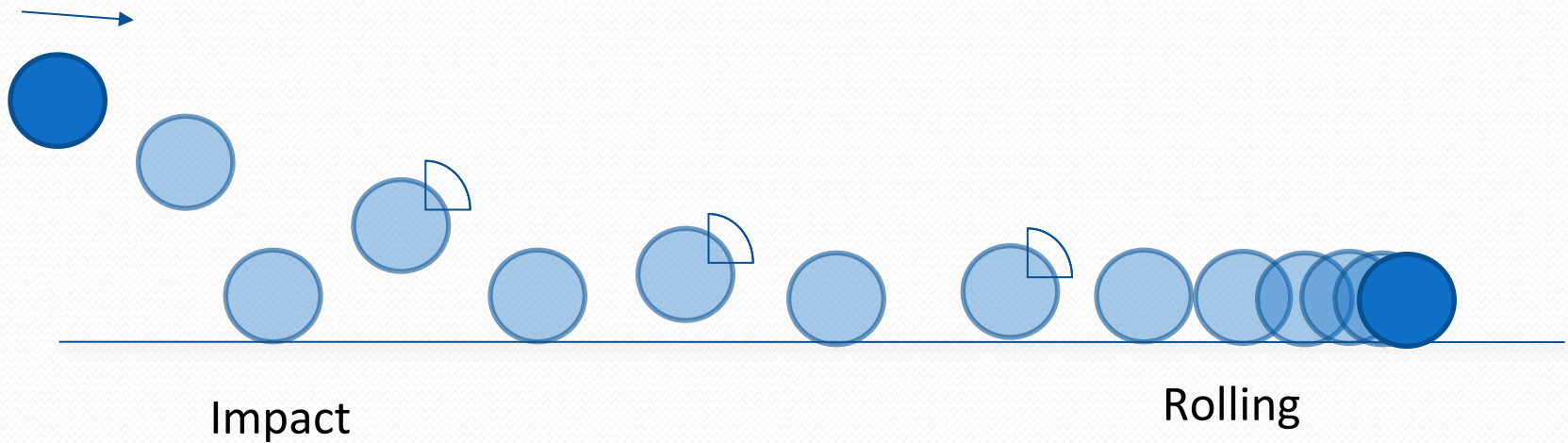
Bass Boost in small spaces



Input



A typical scenario



How do you handle this with recorded sounds?

Related/Future Work

Model-based Synthesis

Current work with Naga K. Govindaraju, Brandon Lloyd, Guy Whitmore and Christopher Melroth

Sliding Sounds

Past work in SIGGRAPH by Doel et. al.

Current work being done by Zhimin Ren at UNC

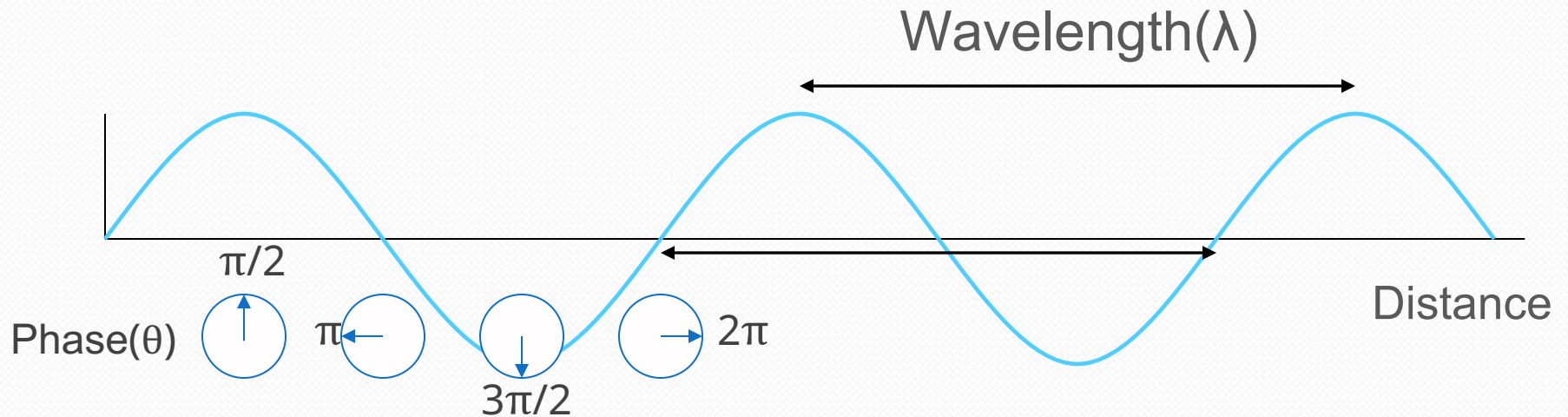
Liquid Sounds

Recent paper on “Harmonic Fluids” by Doug James at Cornell

Also, some work at UNC by Yero Yeh

Cloth Rustling

Quick primer on waves

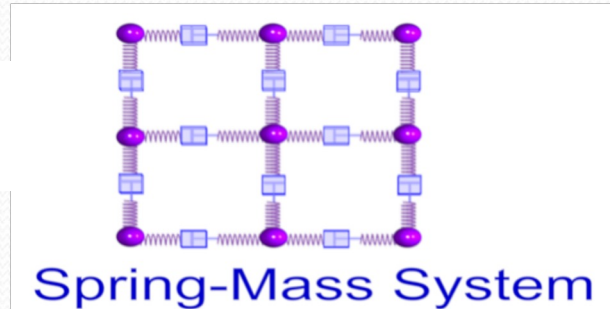


Phase (θ): Measures the progression of wave between crest and trough

Frequency: ν , Wavelength: λ

Wave Speed , $c = \nu\lambda$

Equation of Motion

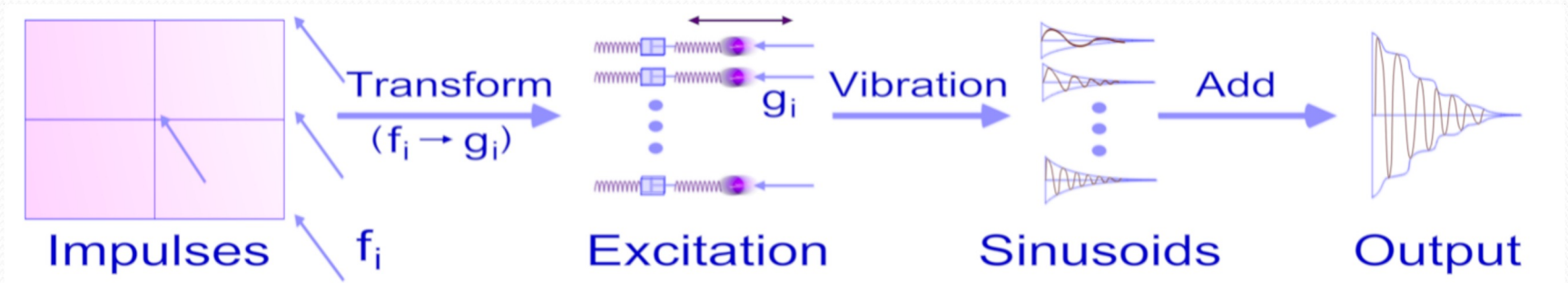


Equation of motion (linear system of coupled ODEs):

$$\underbrace{M \frac{d^2 r}{dt^2}}_{\text{Inertia}} + \underbrace{(\gamma M + \eta K) \frac{dr}{dt}}_{\text{Damping}} + \underbrace{Kr}_{\text{Elasticity}} = \underbrace{F(t)}_{\text{Force}}$$

γ, η : Fluid and Viscoelastic Damping constants

Sound Synthesis



Rigid Body Simulator provides impulses

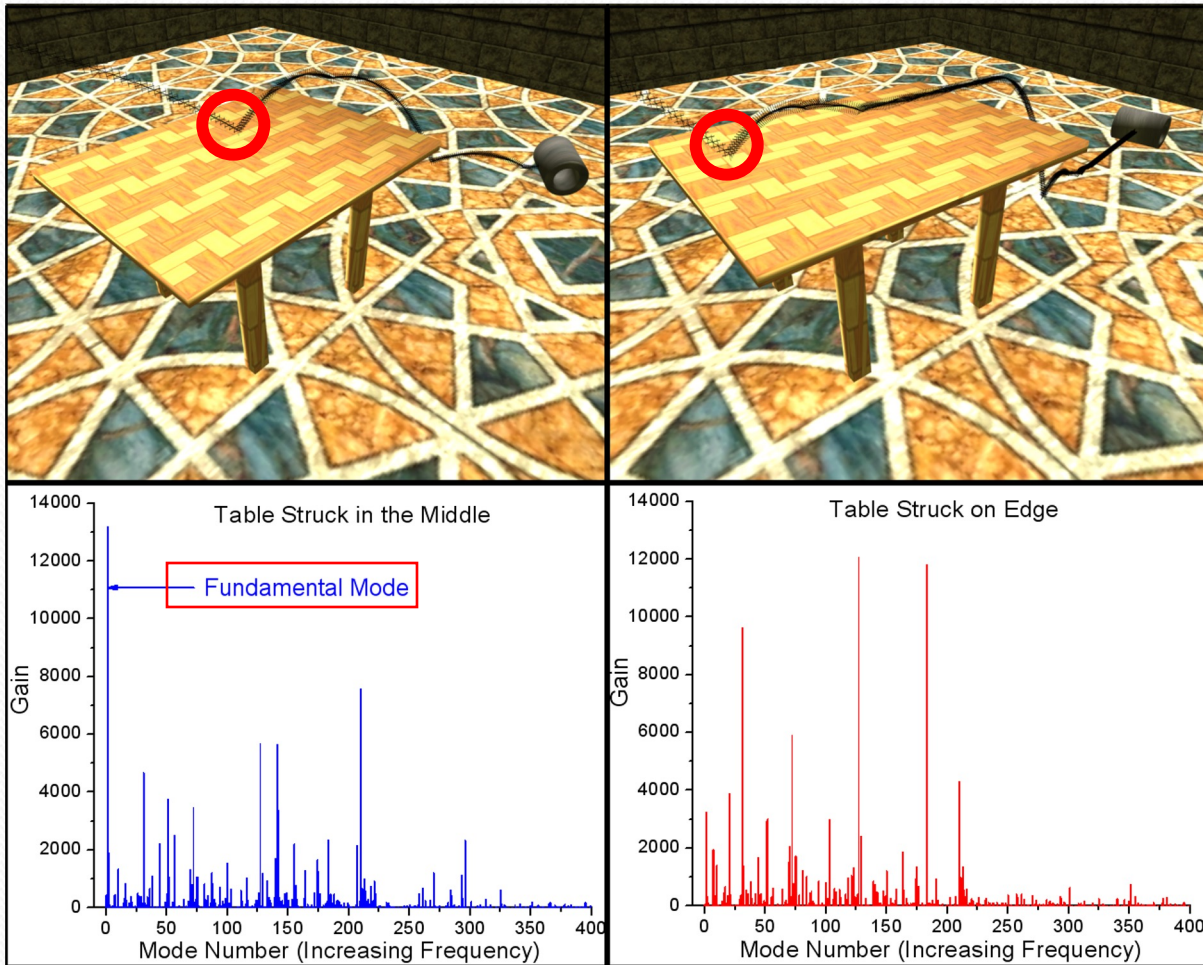
Transform to mode gains

Sound synthesized by adding the modes' sinusoids

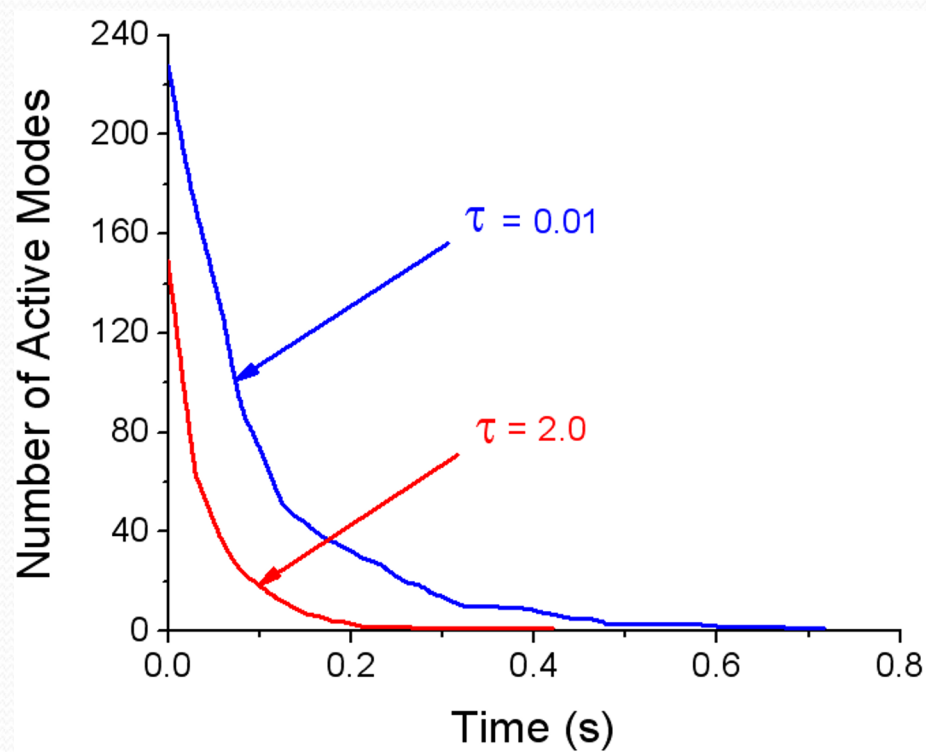
Advantage: Adding damped sinusoids is very fast

Position Dependent Sounds.

Analysis



Mode Truncation: Performance

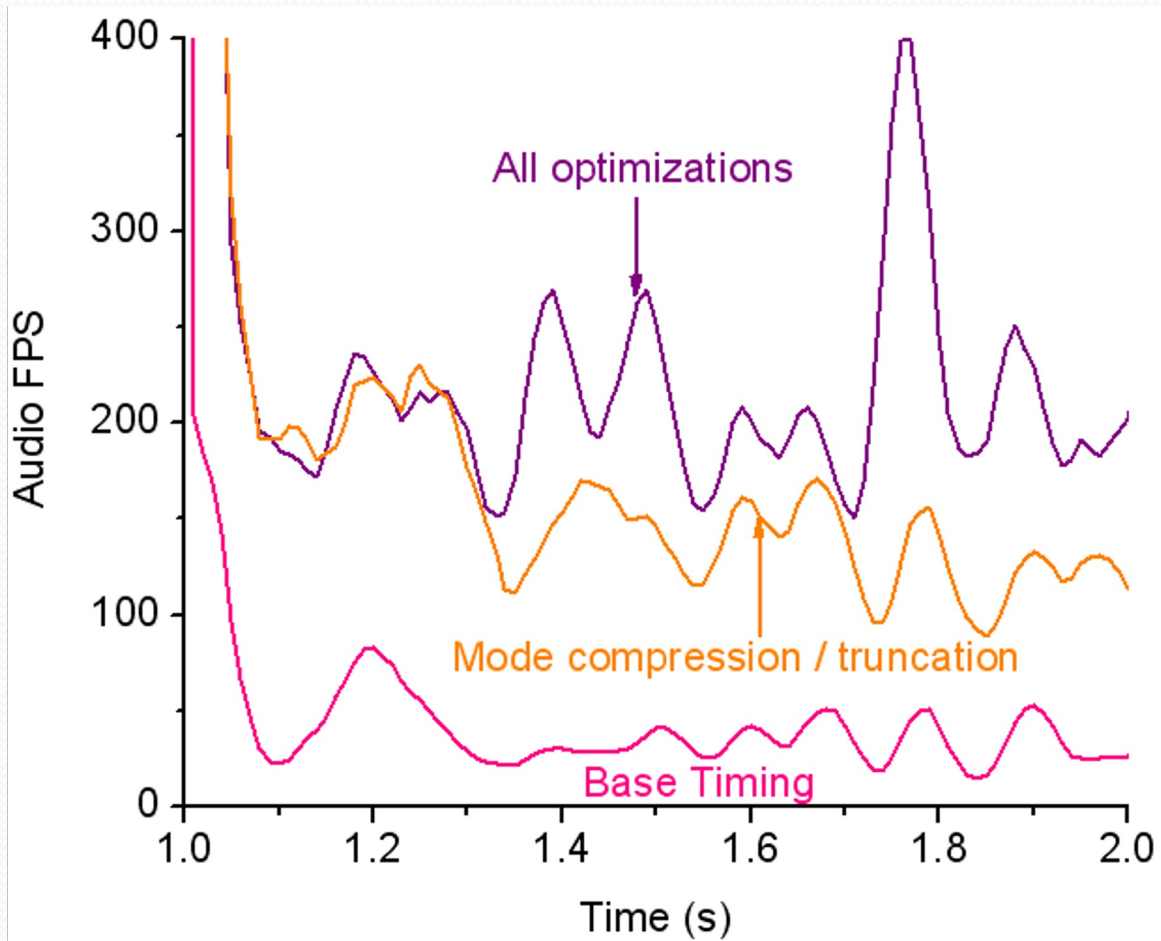


Xylophone bar struck in the middle

Higher value of τ : Modes fall off more quickly

Very little perceptual difference

Efficiency: Analysis



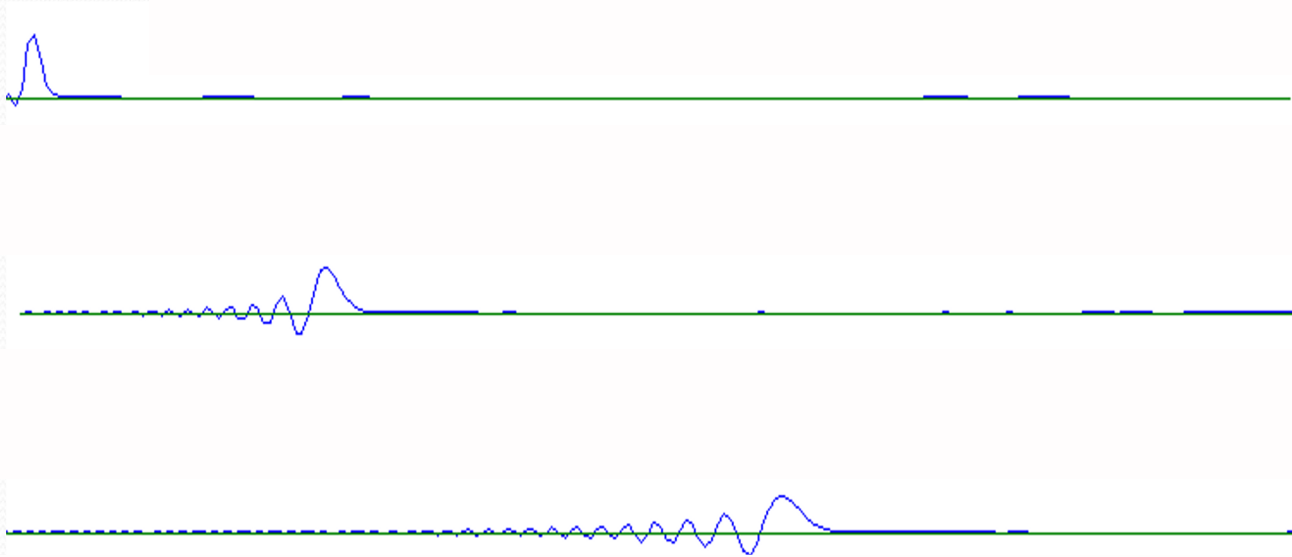
Acoustics: Computational Challenges

Multiple reflections are audible: Full time domain solution required, unlike lighting

Interference is important eg. Dead spots in auditoria

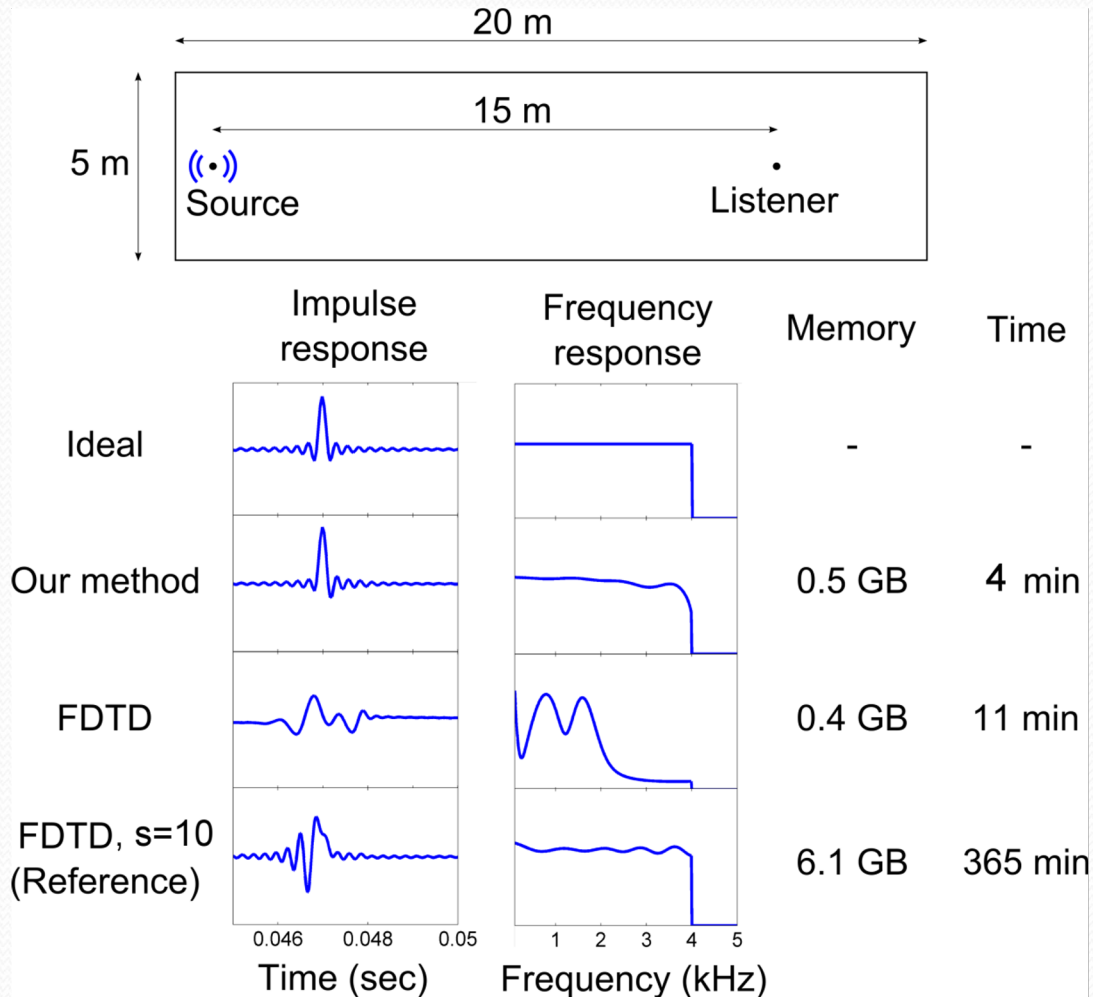
Diffraction is observable for sound and must be captured properly

Errors in FDTD: Numerical Dispersion

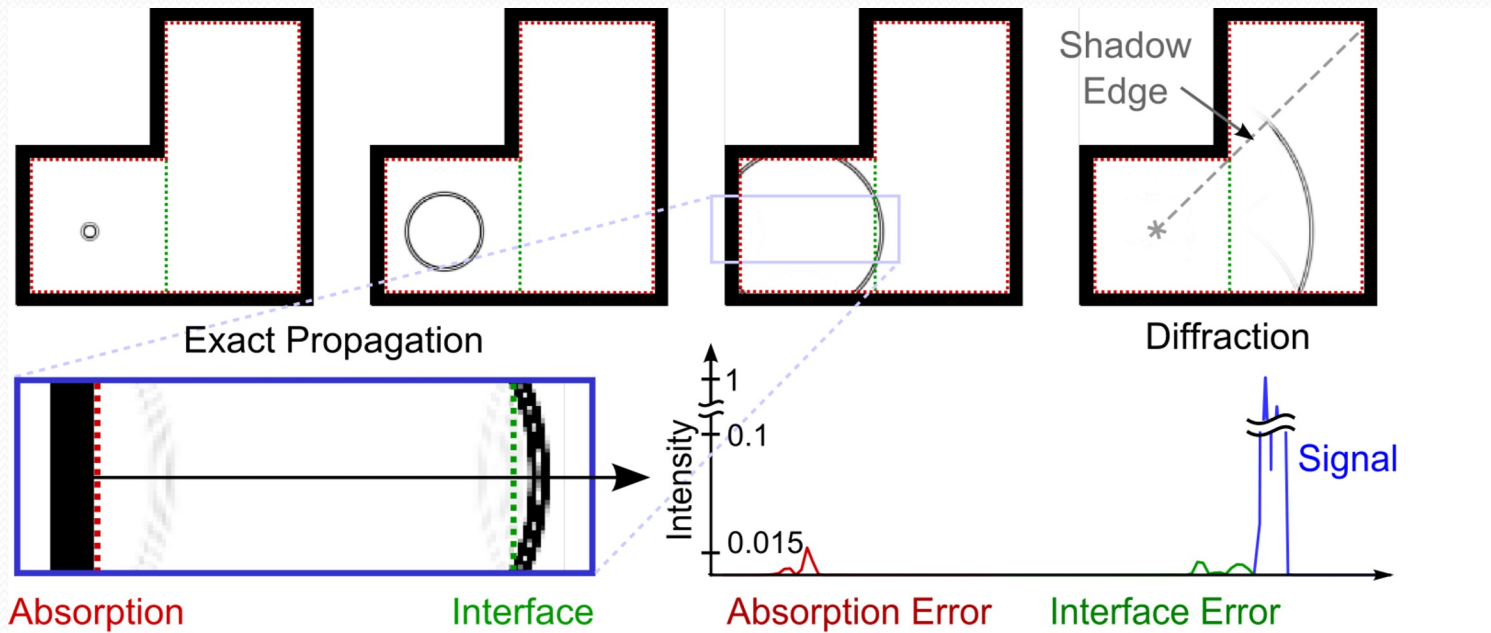


- All frequencies don't travel with the same numerical speed
- Need $s = 10$ for this

Error comparison with FDTD



Interface Errors



Frequency	Interface error	Absorption error
250 Hz	-54 dB	-21 dB
500 Hz	-42 dB	-26 dB
750 Hz	-36 dB	-26 dB
1000 Hz	-28 dB	-32 dB

Solution on a Rectangular Domain

Rectangle in 3D with size (l_x, l_y, l_z) , with sound-hard boundary

Represent pressure in Modal basis for Laplacian on the rectangular domain:

$$p(x, y, z, t) = \sum_{i=(i_x, i_y, i_z)} m_i(t) \Phi_i(x, y, z)$$

$$\Phi_i(x, y, z) = \cos\left(\frac{\pi i_x}{l_x} x\right) \cos\left(\frac{\pi i_y}{l_y} y\right) \cos\left(\frac{\pi i_z}{l_z} z\right)$$

$m_i(t)$ are time-varying mode coefficients

Φ_i are eigen-functions of Laplacian

Solution in Spectral Basis using DCT

The transformation from real space and spectral space can be done using 3D DCT and inverse DCT

$$\{m_i\} = DCT\{p_i\}, \quad \{p_i\} = iDCT\{m_i\}$$

Wave Equation in spectral space (decoupled):

$$\frac{\partial^2 m_i}{\partial t^2} + c^2 k_i^2 m_i = iDCT(F(t)),$$

Analytical solution in time:

$$k_i^2 = \pi^2 \left(\frac{i_x^2}{l_x^2} + \frac{i_y^2}{l_y^2} + \frac{i_z^2}{l_z^2} \right)$$

$$M_i^{n+1} = 2M_i^n \cos(\omega_i \Delta t) - M_i^{n-1} + \frac{2\widetilde{F}^n}{\omega_i^2} (1 - \cos(\omega_i \Delta t))$$

Modeling partially absorbing surfaces

Numerical absorbers for Wave Equation is a tough challenge

Perfectly Matched Layer (**PML**) was developed in the Electromagnetic simulation community

We adapt a time-domain formulation described in

Y. S. Rickard, N. K. Georgieva, and W.-P. Huang, "Application and optimization of pml abc for the 3-d wave equation in the time domain," *Antennas and Propagation, IEEE Transactions on*, vol. 51, no. 2, pp. 286-295, 2003

Summary (contd..)

Automatically handles interference and diffraction

Parallelizable at multiple granularities: Source positions, Partitions, DCT

Axis-aligned simulation grid, easy to obtain using voxelization

Current Progress

- Compression scheme is nearly finished, can handle a medium-sized Lecture hall
- Extracting diffraction information still needs to be tested and tweaked
- Late reverb interpolation needs to be implemented
- Real-time auralization system is also near completion. IR interpolation needs to be tested properly.

Finite Difference Time Domain (FDTD)

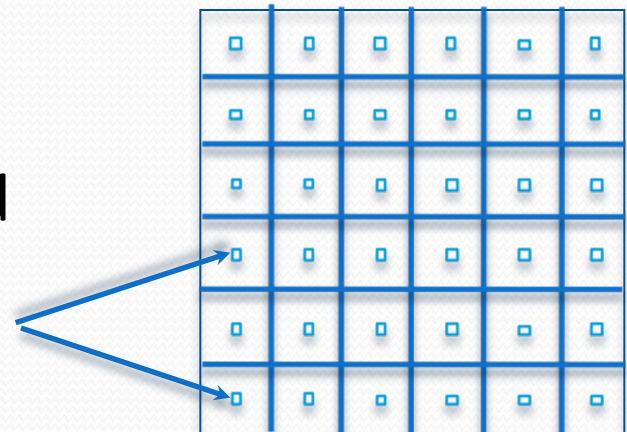
Discretize continuum derivative operators:

$$\frac{P_{t+dt} - 2P_t + P_{t-dt}}{dt^2} + KP_t + O(h^6) + O(dt^2) = F_t$$

Spatial cell size: h , time-step: dt

Works on a uniform Cartesian grid

Pressure sampled at cell centers



Summary

Simple formulation and easy to implement

Works on arbitrary surface meshes

Acceleration techniques exploiting auditory perception

- Mode Compression

- Mode Truncation

- Quality Scaling

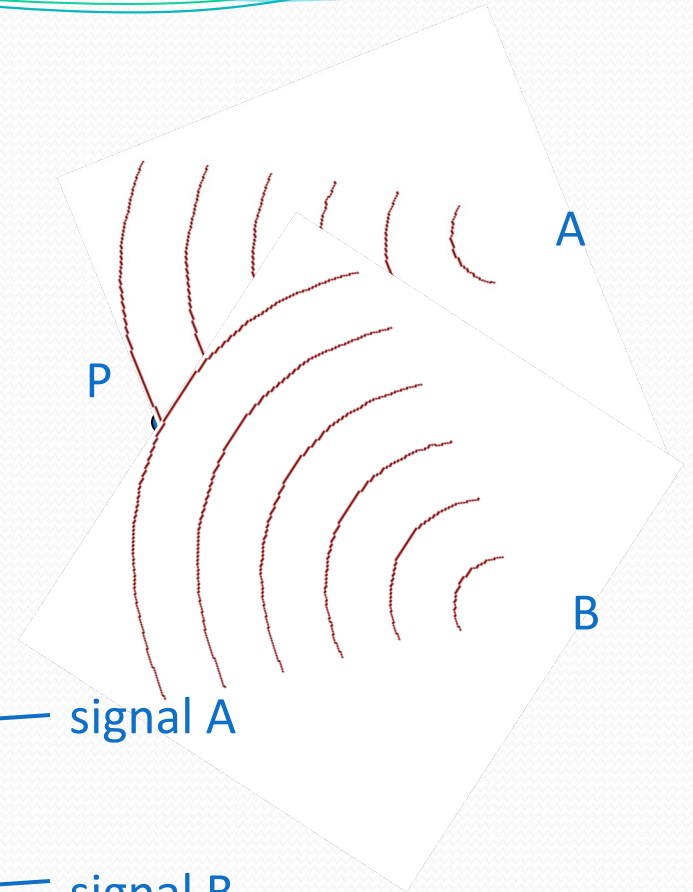
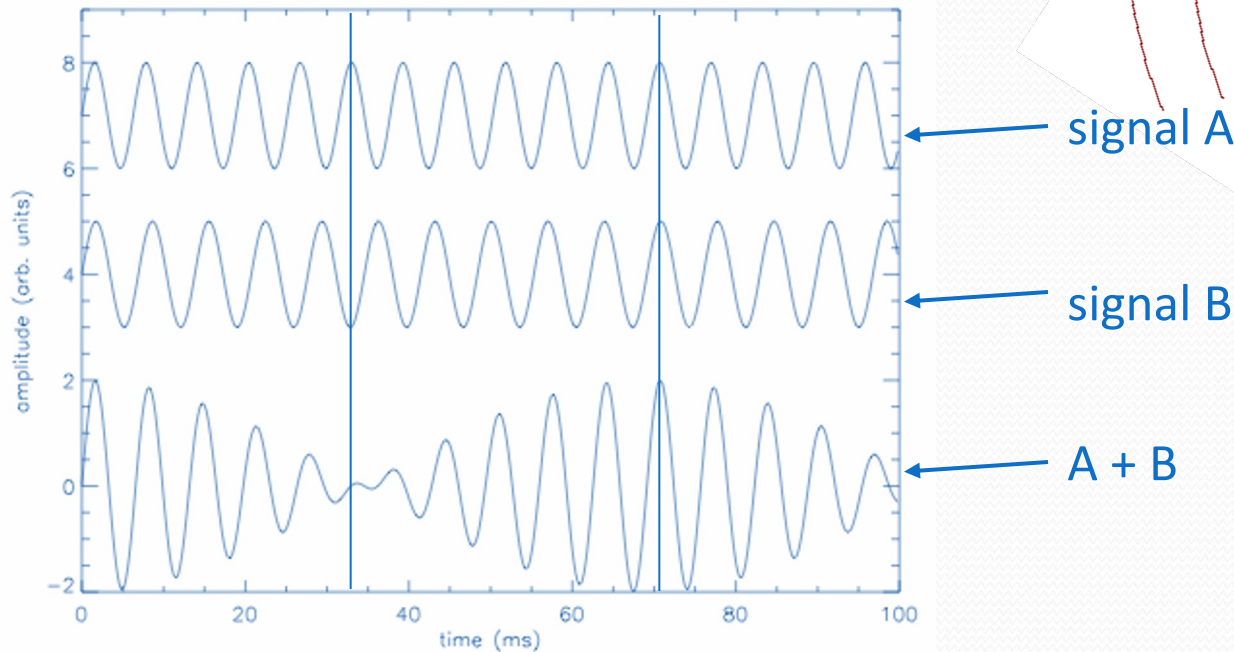
Well suited for large-scale, real-time applications with stringent time constraints, like games

Interference

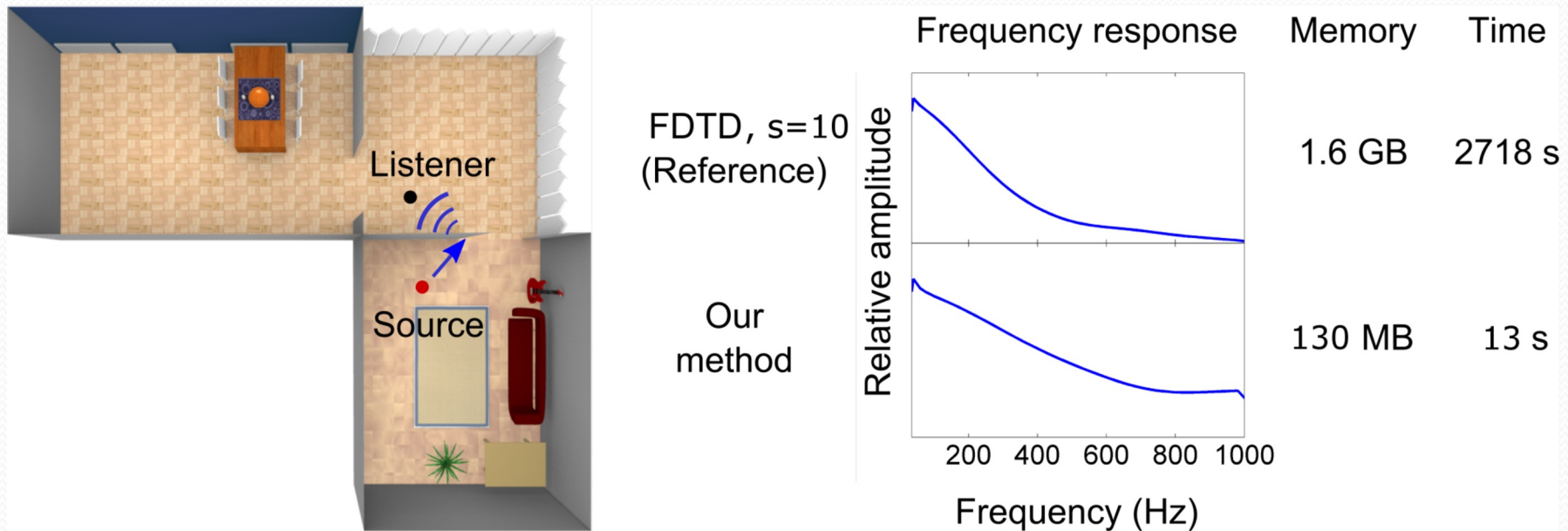
The resultant pressure at P due to two waves is their sum

Phase is crucial

out of phase - cancel in phase - add



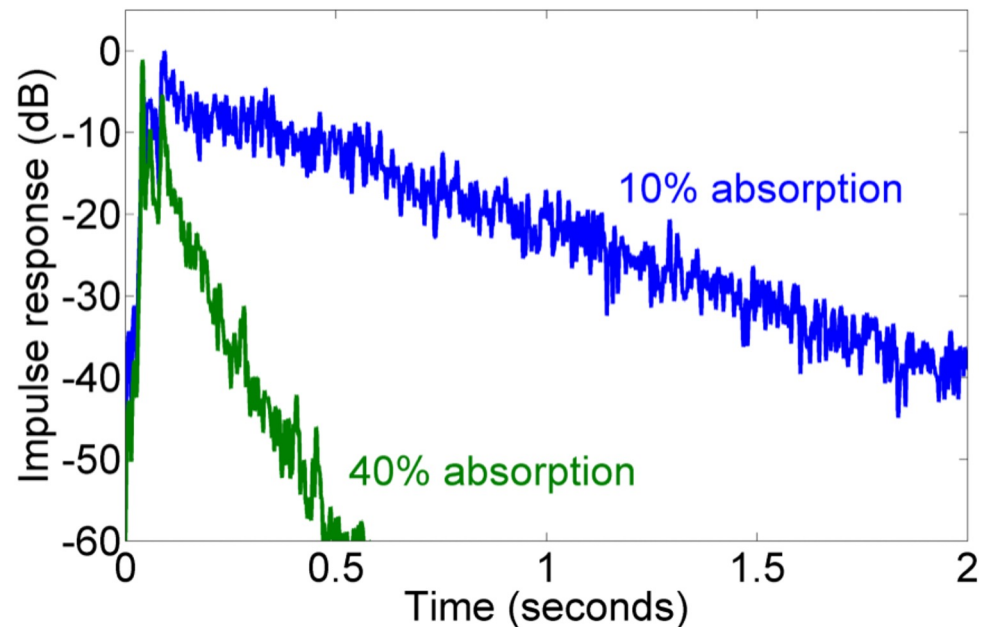
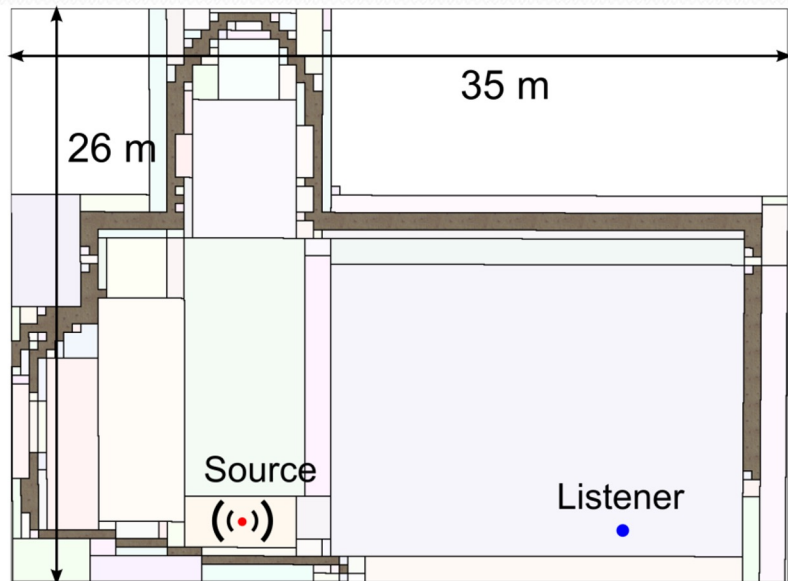
Performance: House



Dimensions: 17m x 15m x 5 m

Auralization: 24 minutes to generate a .4 second long
Impulse Response (< **2 kHz**)

Performance: Cathedral



Dimensions: 35m x 15m x 26 m

29 minutes to generate a 1-second long Impulse Response (< 1 kHz)