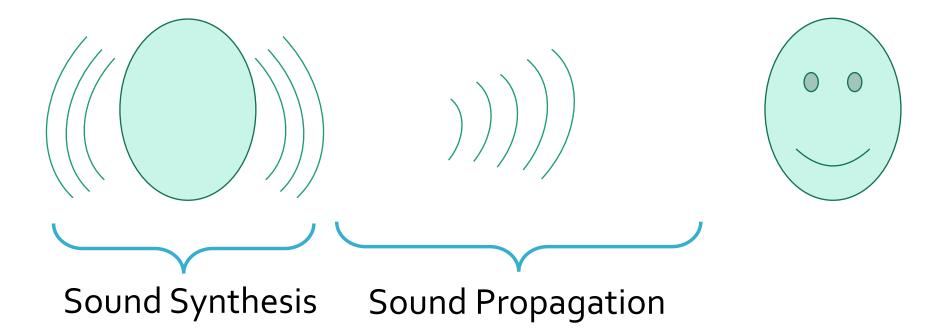
Direct and Inverse Sound Propagation Methods

Dinesh Manocha

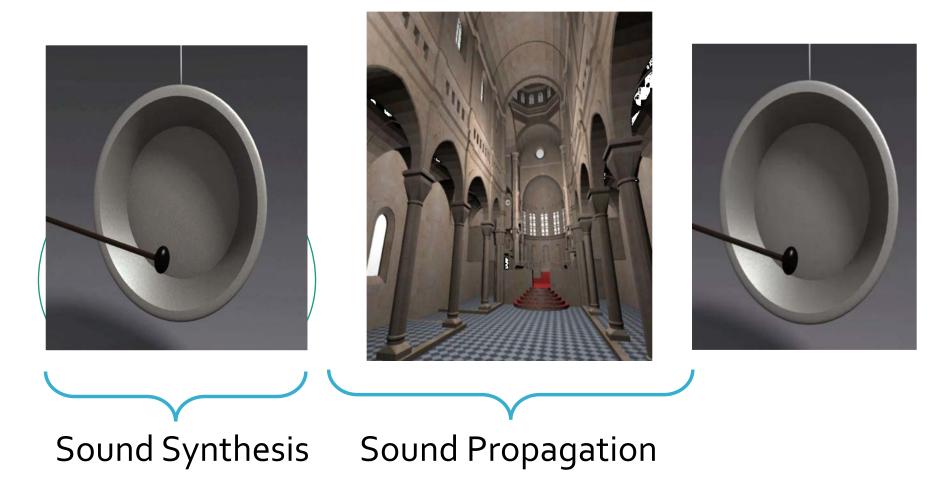
University of Maryland at College Park dm@cs.umd.edu

http://gamma.web.unc.edu/research/sound/

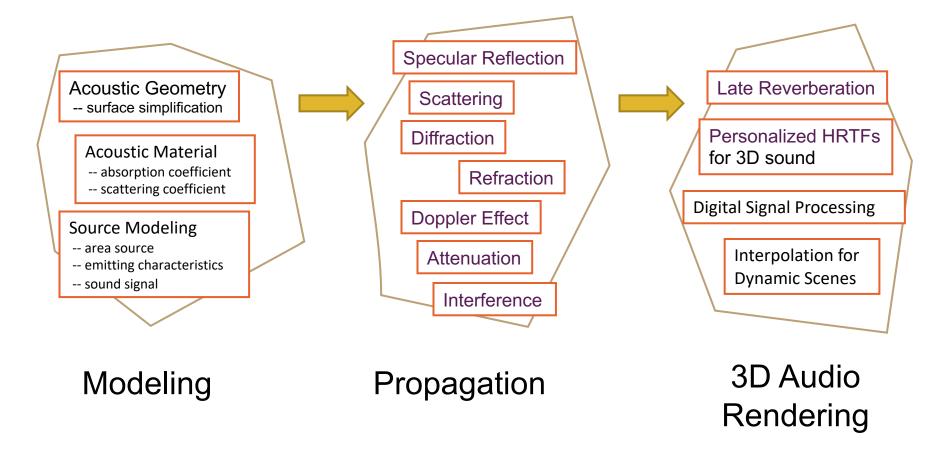
Physically Plased Sound Simulation



Physically-Based Sound Simulation

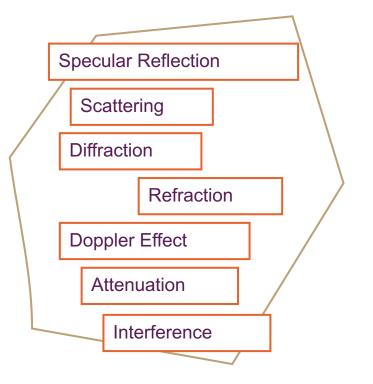


Computational Sound Simulation: An Overview



Acoustics vs. Light

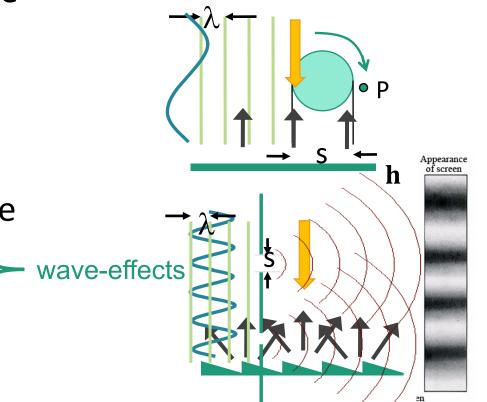
- Speed: 340 m/s vs.
 300,000,000 m/s
- Frequency: 20 to 20K Hz vs. RGB
- Wavelength: 17m to 17cm vs.
 700 to 400 nm



Propagation Effects

Acoustic effects

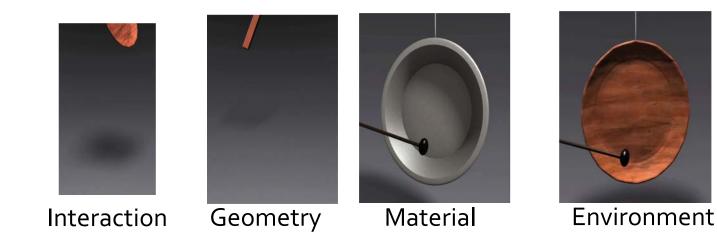
- wavelength << object size
 - specular reflection
 - scattering
- wavelength ~ object size
 - diffraction
 - interference



Physically-Based Sound Simulation

our work





Sound Propagation

The process by which sound is emitted from a source, interacts with the environment, and is received by a listener.

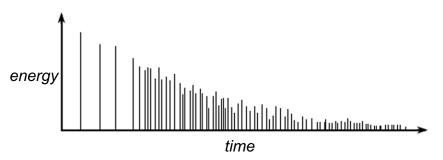
Perceptual audio cues:

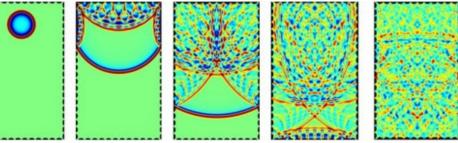
Size of environment

Shape of environment

Locations of sources

Output: Impulse response filter





Sound Propagation – Computational Methods

Numeric:	Geometric:	
Sound = wave	Sound ≈ particles, acoustic energy	
Practical for low frequencies	Better for high frequencies	
Complexity: O(volume), O(freq ⁴)	O(log(# primitives)) per ray	
Pre-computed	Interactive	
Static scenes	Dynamic scenes	

Interactive Sound Propagation

Geometric Propagation

- Ray-Approximation of Wave Equation
- High-frequency approximation
- Getting fast enough for interactive applications
- Highly dependent on the geometry details

Methods

- Ray Tracing [Allen 1958; Krokstad, 1968] [Kuttruff, 1993]
- Image Source [Borish, 1984] [Dalenback, 1992]
- Beam Tracing [Funkhouser et al.1998] [Funkhouser et al. 1999]
- Phonon Tracing [Kapralos, 2004] [Bertram, 2005]
- Frustum Tracing [Lauterbach et al. 2007] [Chandak, et al. 2008] [Taylor et al. 2009]
- Acoustic Radiance Transfer [Siltanen et al.2007][Antani et al. 2012]
- Conservative Frusta Tracing (CFT) [Chandak et al. 2009]
- Diffuse reflections/higher order diffraction [Schissler et al. 2014, 2015]
- Diffraction kernel and mobile devices [Schissler et al. 2017; Runga et al. 2018]

Interactive Propagation

1. Iterative diffuse + specular reflections

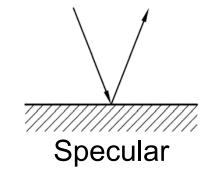
2. Diffraction

- Approximate geometric models (UTD)
- Full wave-solvers

Diffuse Reflections

Reflected sound is scattered by rough surfaces

Frequency-dependent scattering



Diffuse

Diffuse sound integral:

$$w(\vec{p},t) = \frac{1}{\pi c} \int \int_{S} \alpha(\vec{p'}) B\left(\vec{p'}, t - \frac{L'}{c}\right) \frac{\cos \varsigma''}{L'^2} dS' + w_d(\vec{p},t).$$

Office Scene

6 sources 154k triangles

10th order diffuse 10th order specular 4th order diffraction

Frame time: 33.6 ms

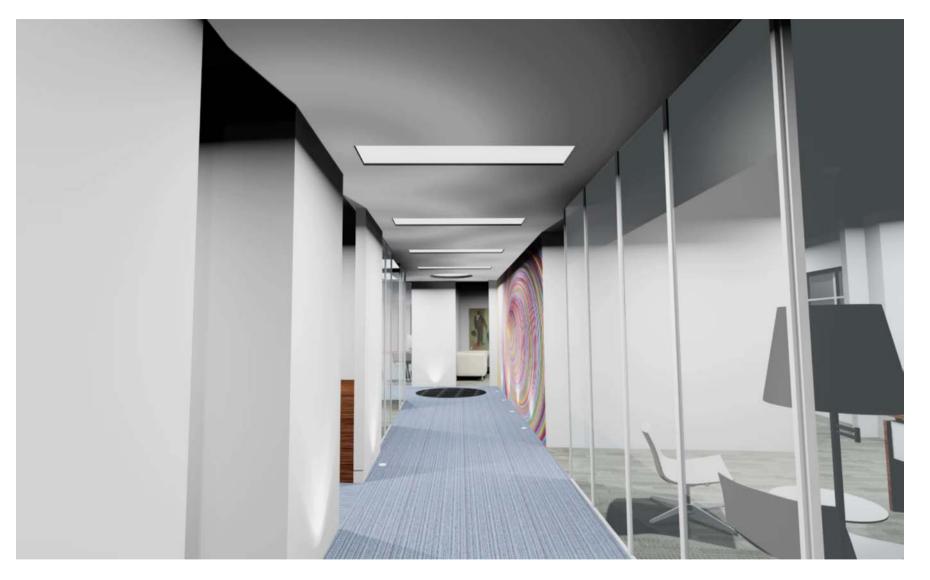
52X improvement

4-core Intel 4770k CPU

[Chandak et al. 2010; Taylor et al. 2012; Schissler et al. 2014]



Interactive Geometric Propagation



Interactive Propagation Source Clustering + multiresolution auralization

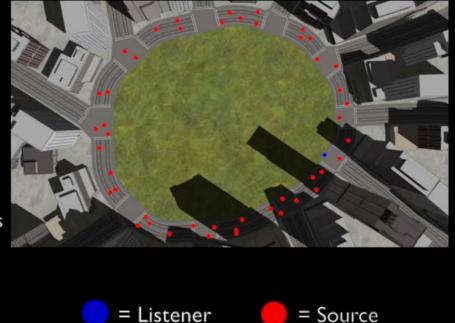
206,976 triangles

50 moving sources: cars trucks planes helicopter

10th order specular reflections 50th order diffuse reflections

~47.2 ms per audio frame

City Benchmark

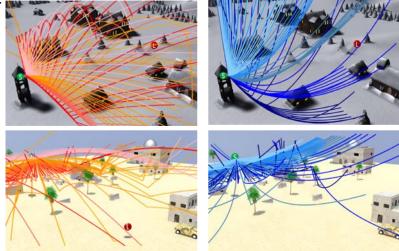


High number of sources: specular + diffuse + diffraction Source clustering+ rendering on a multi-core PC

Non-Linear Ray Tracing: Participating Media

Tracing 10k rays for 3 orders of reflections

Frame time measured on single thread



Scene	Frame time (ms)	# Surfaces	# medium points	# tetrahedral cells
Desert (median)	219	8,000	23,632	144,976
Desert (high)	369	16,000	132,742	674,434
Christmas (median)	259	8,000	44,862	227,851
Christmas (high)	443	16,000	179,382	1,169,353
Reservoir	233	4,000	34,771	248,806

Wave-Based Sound Propagation

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

- Numerical Methods
 - Solve Helmholtz Wave Equation
 - Accurate computation
 - No good computational algorithms for large spaces
- Methods
 - Finite Element Methods [Otsuru,2004]
 - Boundary Element Methods [Ciskowski,1993]
 - Finite Difference Time Domain [Kunz et al.1993]
 - Digital Waveguide Mesh (DWM) [Savioja et al. 1994]
 - Rectangular Domain Decomposition [Raghuvanshi et al. 2008,2010,2014]
 - Equivalent Source Method [Mehra et al. 2012, 2013,2014]
 - Parallel ARD Solvers on large cluster [Morales et al. 2015, 2017]

Current State of the Art: XAudio2





Distance cue only

Geometric Sound Propagation: Ray Tracing





No sound when blocked

Our Wave-Based Solution

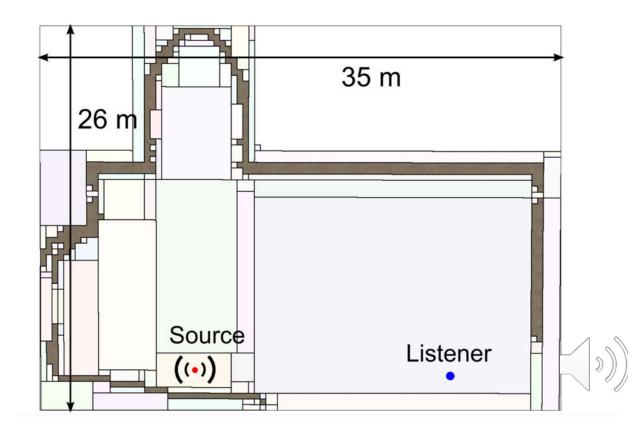




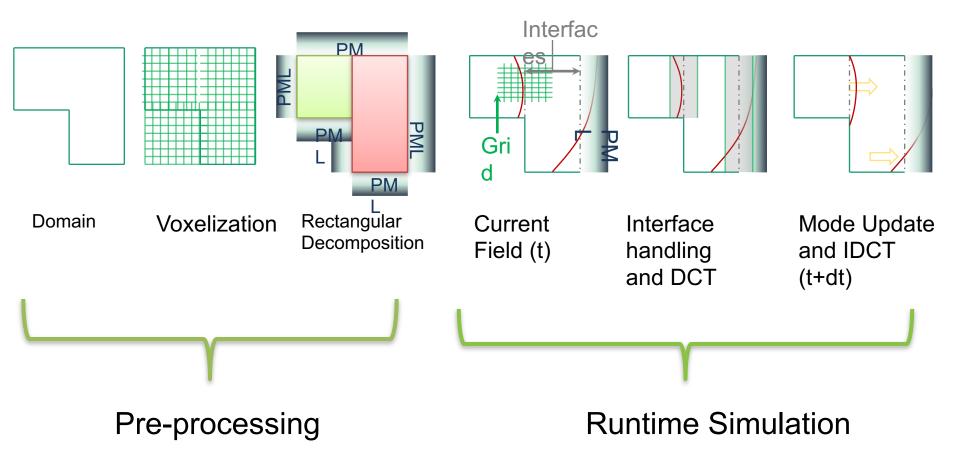
All Wave Effects: Diffraction, Scattering, etc. (our work)

Adaptive Rectangular Decomposition

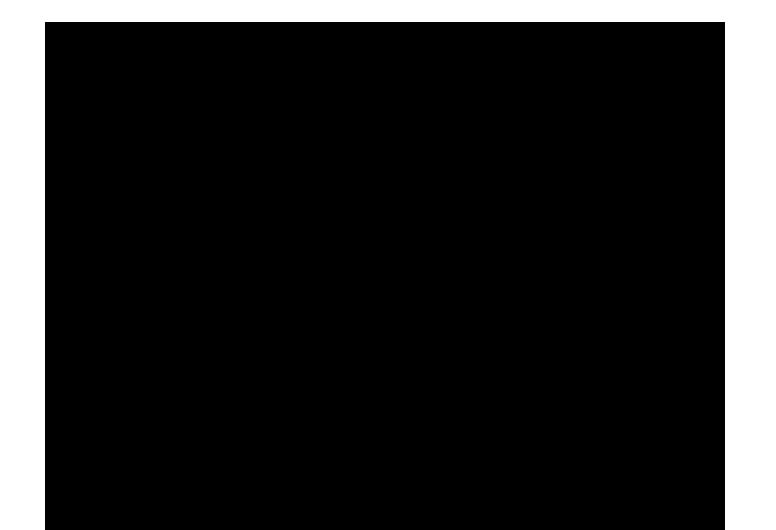
- Wave equation can be solved very efficiently on a rectangular domain
- Decompose complex domain into rectangles



Adaptive Rectangular Decomposition (ARD)



Fast Numeric Propagation

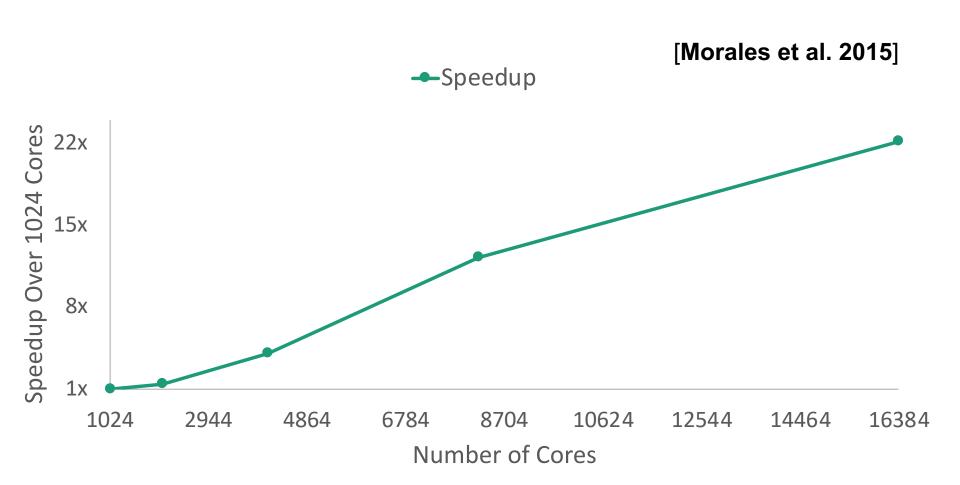


Fast Numeric Propagation

Cathedral 35m x 26m x 15m 11.9 million simulation cells



Massive Parallelization: ARD



Equivalent source technique

- Wave-based propagation in large scenes
 - scene spanning hundreds of meters
- Physically accurate propagation
 - all wave-effects e.g. diffraction, interference
- Fast, memory efficient runtime
 - 10s of ms compute, 20-60 MBs

Equivalent source technique

Helmholtz equation

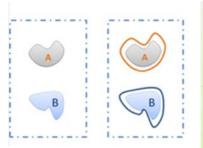
$$\nabla^2 P + \frac{\omega^2}{c^2} P = 0 + \text{B.C.}$$

 $P = P(x, \omega)$ is pressure field in frequency-domain

- B.C are boundary conditions
- ω is angular frequency
- *x* is point in 3D space

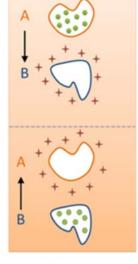
Overall Approach

Object recompetation propagation (large is menes)

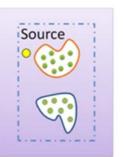


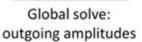


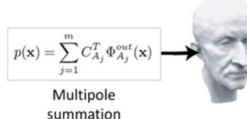
Per-Object Transfer (wave simulation)



Inter-Object Transfer (analytic)







summation

Twilight Epiphany: Validation

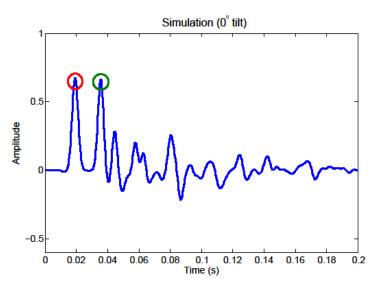
Twilight Epiphany Art installation at Rice University

Light show at dusk and sunset

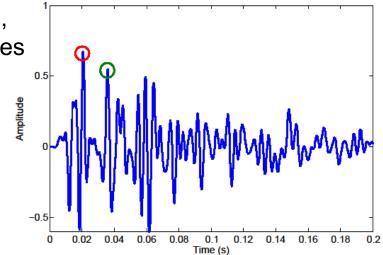
Used for musical performances, 3D sound art, and a music lab by Music conservatory at Rice University



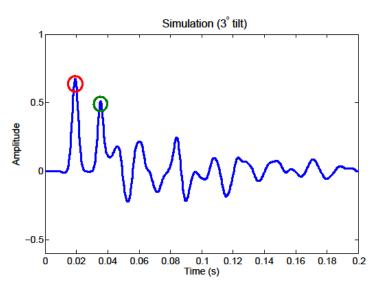
Twilight Epiphany



Without tilt, consecutive high-amplitude peaks, indicating flutter echoes



Measurement



After tilting walls, secondary peak amplitude reduced, mitigating flutter echoes

> Measured data contains secondary peak with reduced amp'itude

Technology Transfer

- <u>http://www.impulsonic.com/</u>
 - Windows PC with headphones
 - Binaural sound with Oculus Rift
 - Ported on Android and other platforms
 - Unity Plugins

- Acquired by Valve in Nov 2016
- Our technology is available as Valve Audio SDK

Sound Simulation: Direct vs. Inverse

- Direct problems: Given the scene description, source and listener location, compute the pressure field
- Inverse: Given the recorded audio signal and partial scene information, use for audio scene understanding + scene reconstruction

Sound Simulation: Direct vs. Inverse

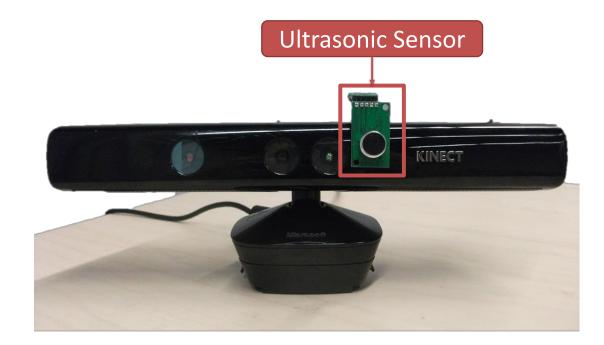
- **Direct problems**: Given the scene description, source and listener location, compute the pressure field
- Inverse: Given the recorded audio signal and partial scene information, use for audio scene understanding + scene reconstruction/analysis (<u>computer vision for sound</u>)

Sound Simulation: Direct vs. Inverse

- Direct problems: Given the scene description, source and listener location, compute the pressure field
- Inverse: Given the recorded audio signal and partial scene information, use for audio scene understanding + scene reconstruction
- The field of "acoustic scene analysis" is not new
- But we have new tools:
 - Computer vision methods
 - Computing power (GPUs, cloud computing)
 - Machine learning methods
 - Interactive acoustic simulation technology

Multi-modal Cameras

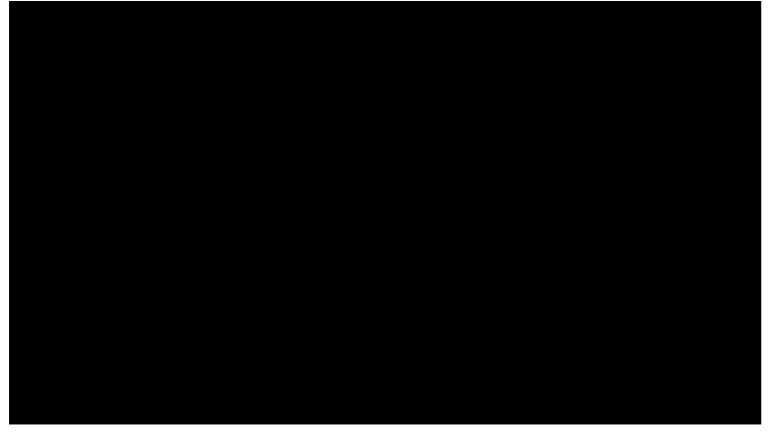
- Combine 2D cameras, depth-sensors + acoustic sensors
- Inverse acoustics: computer vision for audio



3D Reconstruction in the Presence of Glass (CVPR 2015)

Multi-modal Cameras

- Combine 2D cameras, depth-sensors + acoustic sensors
- Inverse acoustics: computer vision for audio



3D Reconstruction in the Presence of Glass (CVPR 2015)

Augmented Reality: Need Sound Effects



Virtual sounding object

Microsoft Hololens™

Acoustic Simulation Prerequisites

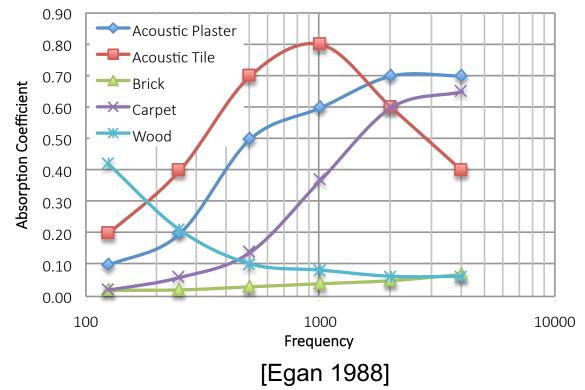
To compute sound propagation, we need at least:

- Source locations
- Listener locations
- 3D model
- Acoustic material properties

Use computer vision methods

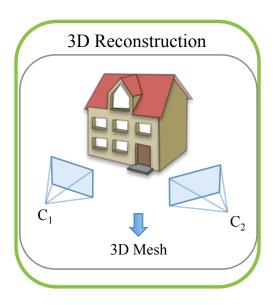
Acoustic Materials

Sound Absorption Coefficient – fraction of incident pressure absorbed



Material Pipeline - Reconstruction

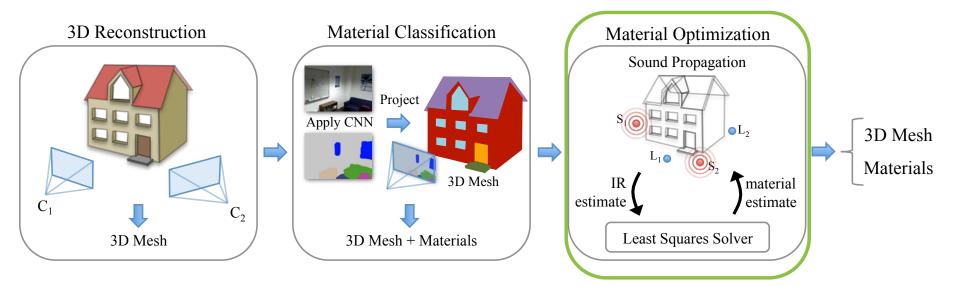
1. Reconstruct 3D mesh from multiple camera viewpoints





Material Pipeline - Optimization

3. Improve material estimates iteratively using measurements and simulation



Acoustic Material Classification for AR/VR

Noise Reduction for Speech Recognition using Simulation

- Reverberation and noise is a major challenge in Automated Speech Recognition (ASR) algorithms.
- In complicated environments, the placement of sound receivers will affect the intelligibility of speech.
- Given such a scene setup, how to find the best receiver location that maximizes the overall speech intelligibility?

Conclusions

- Sound Simulation and Propagation
 - Considerable Research in the last two decades
 - Good solutions based on geometric and wave-based methods
- Inverse Sound Propagation: Computer vision for sound
 - Scene reconstruction with audi0—visual methods
 - Capturing audio material properties
 - Ongoing Work:
 - Audio-based localization
 - Audio-Visual SLAM

Acknowledgements

- Army Research Office
- DARPA
- Intel
- Microsoft
- National Science Foundation
- NVIDIA
- Oculus
- RDECOM
- Samsung

Questions: Contact at dm@cs.umd.edu