

Large-Scale Inverse Methods and Design of Acoustic Metamaterials in Sierra-SD

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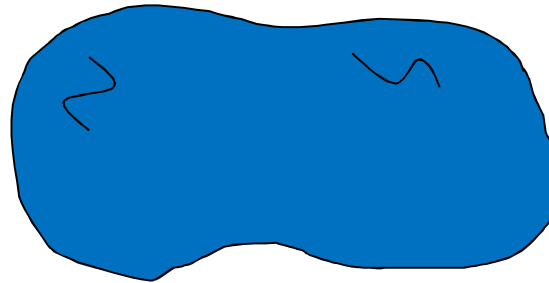
Outline

- Inverse problems in computational mechanics
- Discussion of inverse methods in Sierra-SD
- Design of acoustic metamaterials

Inverse Problems: Observing the Unobservable

Suppose we have a “black box” system in the *as-manufactured* state that has only partially known parameters

Question: can we *non-destructively* interrogate the system to “see what is inside”?



Typical quantities of interest:

- Material properties
- Loads
- Boundary conditions
- Residual stresses
- Size/shape/location of inclusions (e.g. composite materials)

Example applications:

- Seismic imaging
- Medical imaging
- Non-destructive evaluation

Categories of Inverse Problems

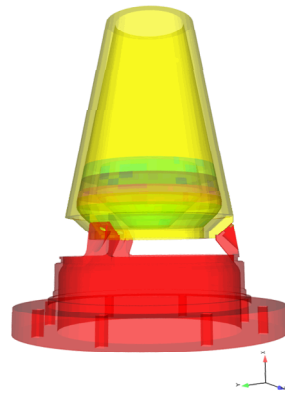
- Imaging
 - Medical ultrasound
 - Seismic exploration
- Calibration of material models
 - Structural material properties, circuits, thermal properties, etc.
- Force reconstruction
 - Sub-structuring for mechanical testing of components
- Optimal Experimental Design
 - Best placement of sensors, test fixture setups
- Shape reconstruction
 - E.g. inverse scattering

Inverse Problems - Motivation

Sierra Mechanics provides a massively parallel framework for physics simulations, but requires knowing all model parameters

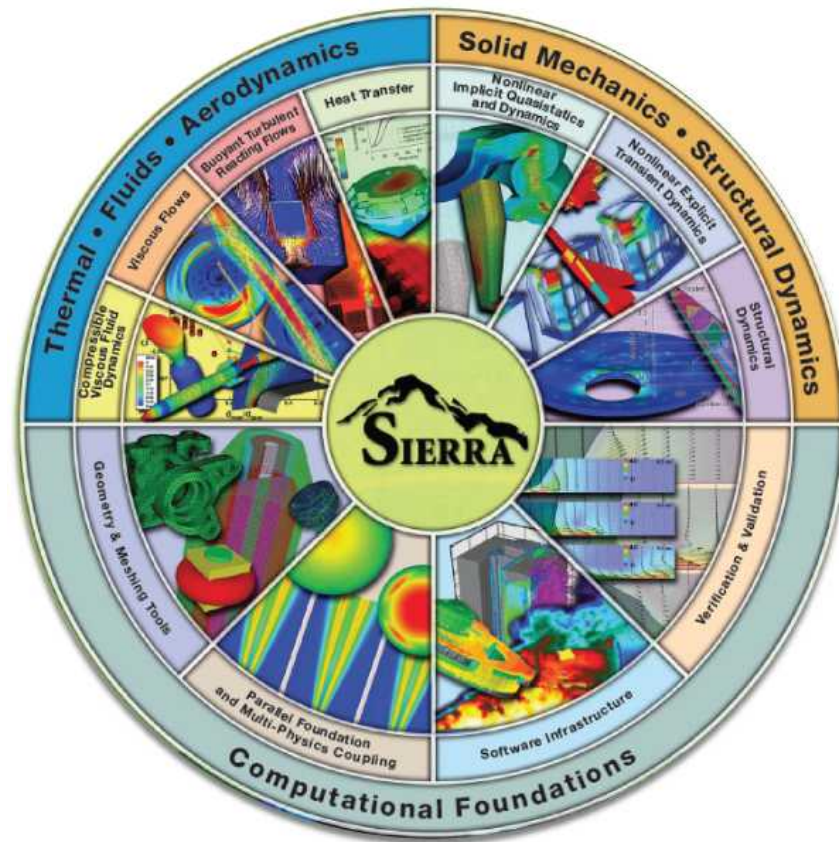
The model could be lacking information:

- material properties?
- boundary conditions?
- loading conditions?
- Internal flaws from aging?
- Preloading effects?



The missing link:

**Experimental measurements +
solution of inverse problem**



PDE-Constrained Optimization Formulation

Abstract
optimization
formulation

$$\underset{\mathbf{u}, \mathbf{p}}{\text{minimize}} \quad J(\mathbf{u}, \mathbf{p})$$

$$\text{subject to} \quad \mathbf{g}(\mathbf{u}, \mathbf{p}) = \mathbf{0}$$

$$\mathcal{L}(\mathbf{u}, \mathbf{p}, \mathbf{w}) := J + \mathbf{w}^T \mathbf{g}$$

Objective function

PDE constraint

Lagrangian

$$\begin{Bmatrix} \mathcal{L}_u \\ \mathcal{L}_p \\ \mathcal{L}_w \end{Bmatrix} = \begin{Bmatrix} J_u + \mathbf{g}_u^T \mathbf{w} \\ J_p + \mathbf{g}_p^T \mathbf{w} \\ \mathbf{g} \end{Bmatrix} = \{\mathbf{0}\}$$

First order optimality
conditions

$$\begin{bmatrix} \mathcal{L}_{uu} & \mathcal{L}_{up} & \mathbf{g}_u^T \\ \mathcal{L}_{pu} & \mathcal{L}_{pp} & \mathbf{g}_p^T \\ \mathbf{g}_u & \mathbf{g}_p & \mathbf{0} \end{bmatrix} \begin{Bmatrix} \delta \mathbf{u} \\ \delta \mathbf{p} \\ \mathbf{w}^* \end{Bmatrix} = - \begin{Bmatrix} J_u \\ J_p \\ \mathbf{g} \end{Bmatrix}$$

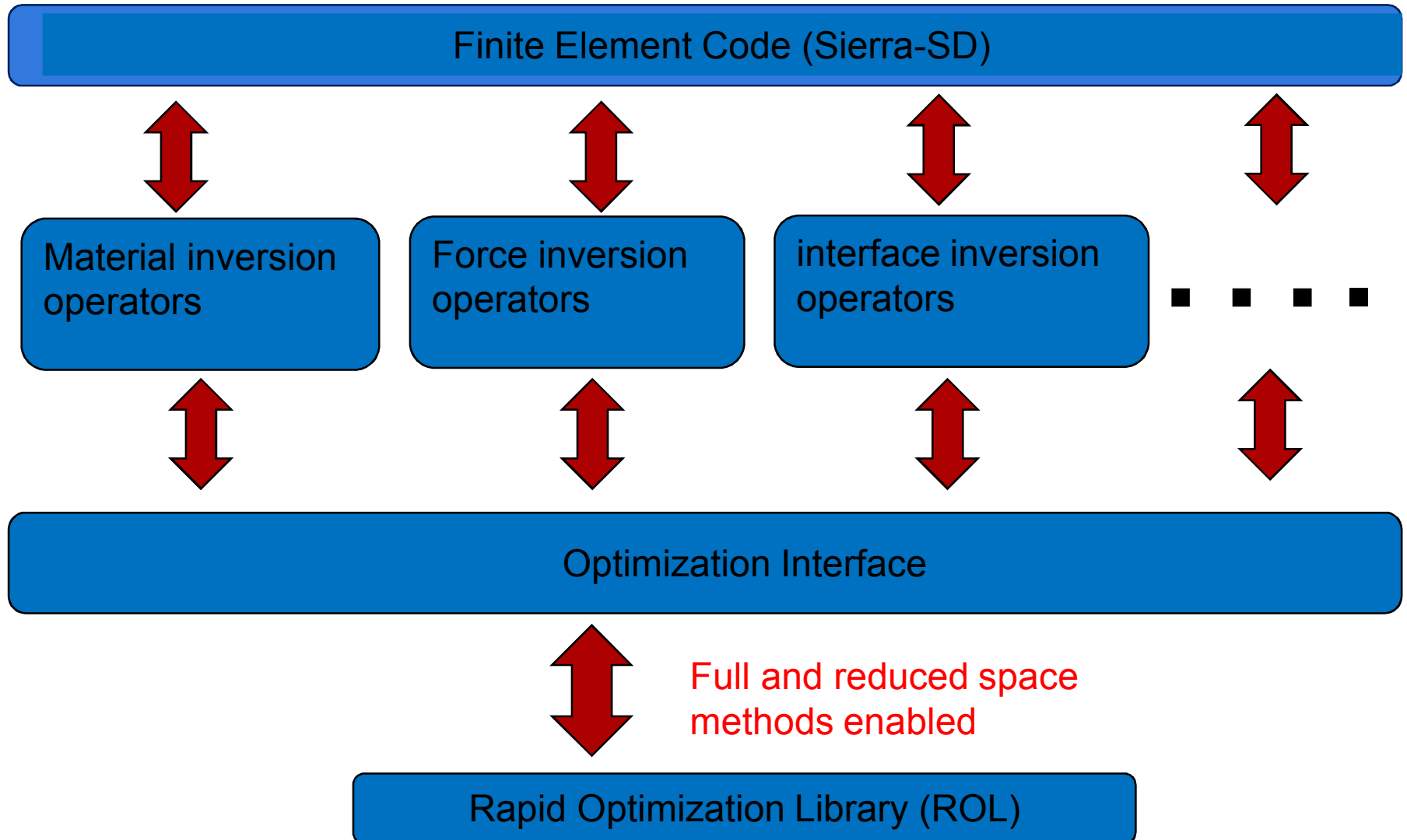
Newton iteration

$$\mathbf{W} \Delta \mathbf{p} = -\hat{J}',$$

$$\mathbf{W} = \mathbf{g}_p^T \mathbf{g}_u^{-T} (\mathcal{L}_{uu} \mathbf{g}_u^{-1} \mathbf{g}_p - \mathcal{L}_{up}) - \mathcal{L}_{pu} \mathbf{g}_u^{-1} \mathbf{g}_p + \mathcal{L}_{pp}$$

Hessian calculation

Operator-Based Inverse Problems



Examples

- Material characterization
- Delamination detection
- Residual stress characterization
- Force (source) reconstruction

- Acoustic metamaterial design
 - Transient shock isolation
 - Notch filter design
 - Steady-state vibration mitigation
 - Acoustic cloaking

Frequency-Domain Material Inversion

- Dashpot/foam calibration on mass-mock
- Full Newton with adjoint-based Hessians
- Measured displacements on foam block
- Stiffness parameters from previous slide
- **Initial guess: zero damping**

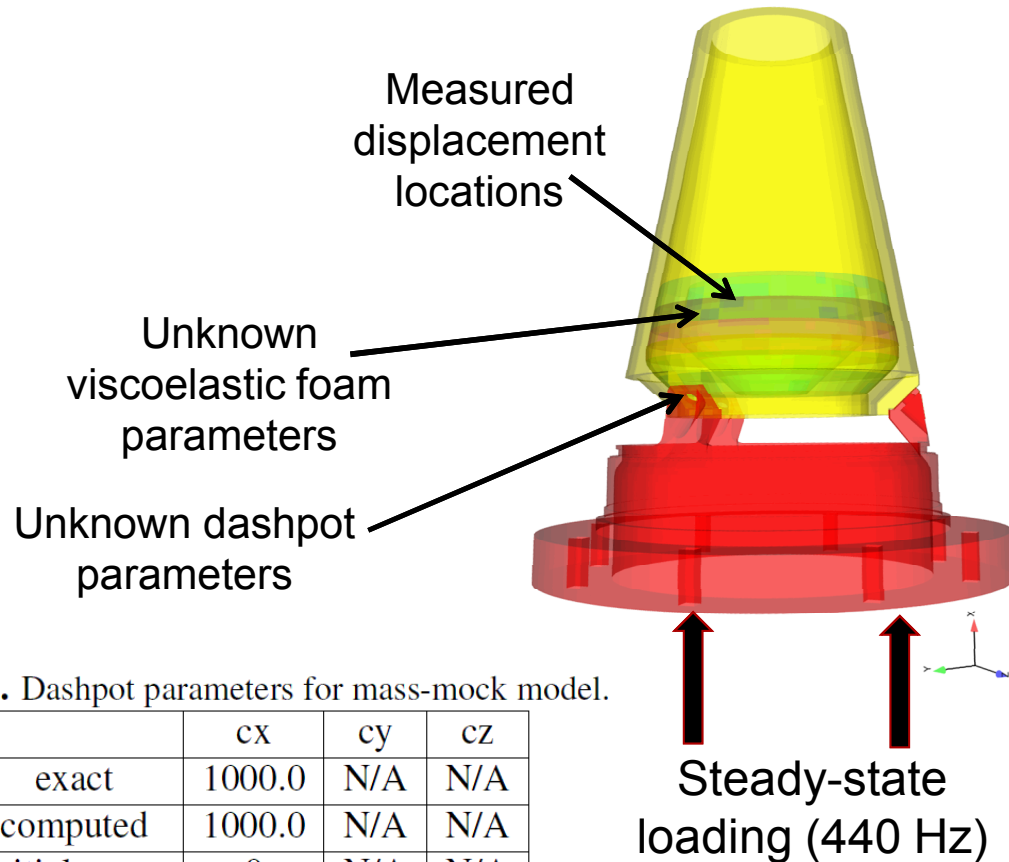
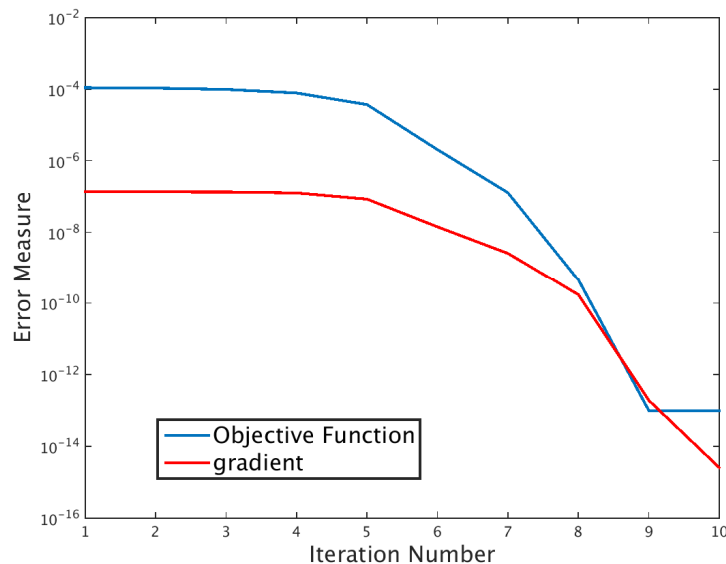


Table 3. Dashpot parameters for mass-mock model.

	cx	cy	cz
exact	1000.0	N/A	N/A
computed	1000.0	N/A	N/A
initial guess	0	N/A	N/A

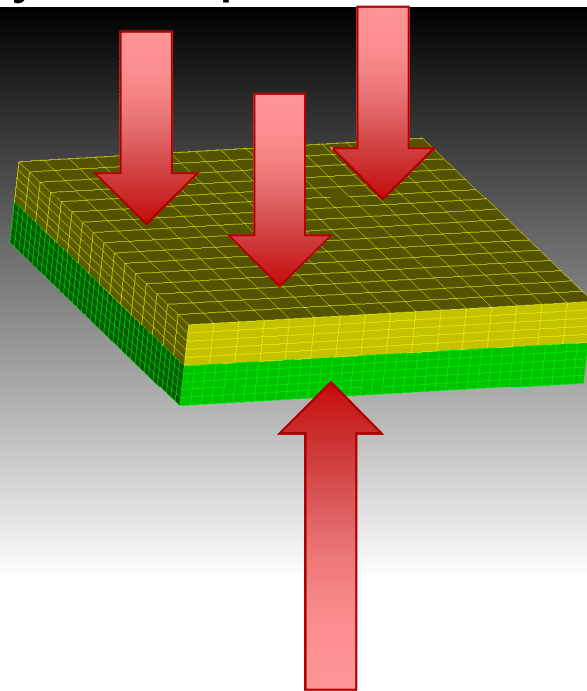
Table 4. Viscoelastic foam parameters for mass-mock model.

	Imaginary part of G	Imaginary part of K
exact	362.4	785.2
computed	362.3	785.0
initial guess	0	0

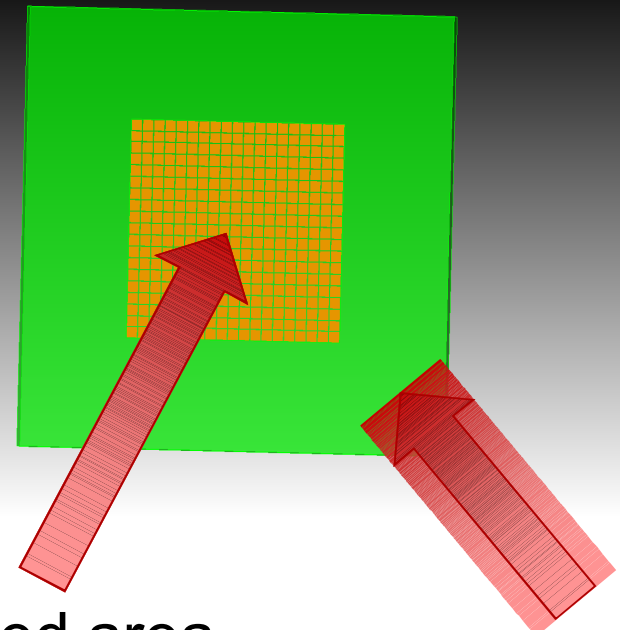
Delamination Detection

Partially-bonded plates – can we invert for the bonded/debonded regions?

Steady-state pressure load at 2000Hz



Simply supported
on bottom



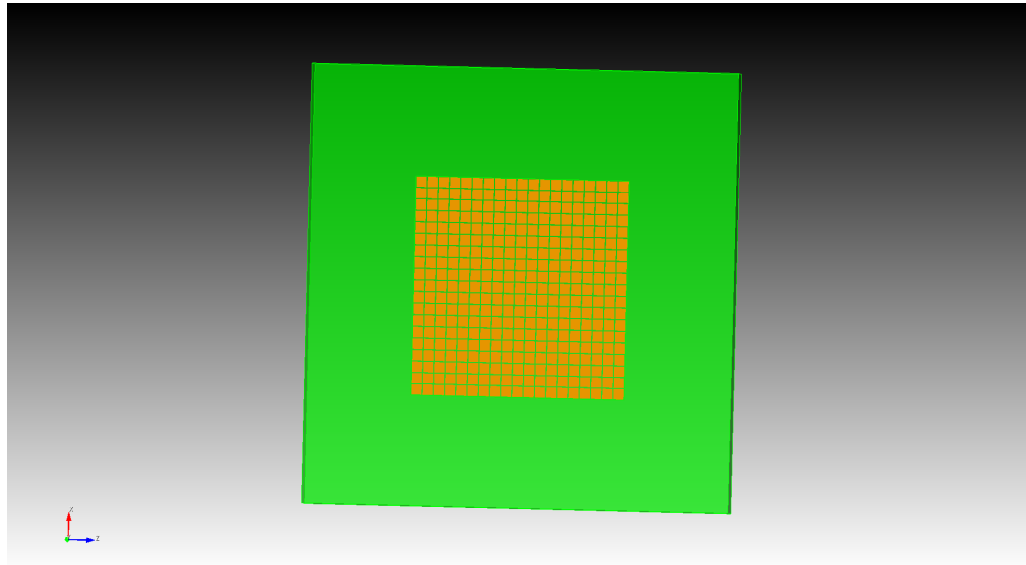
Bonded area

De-bonded
area

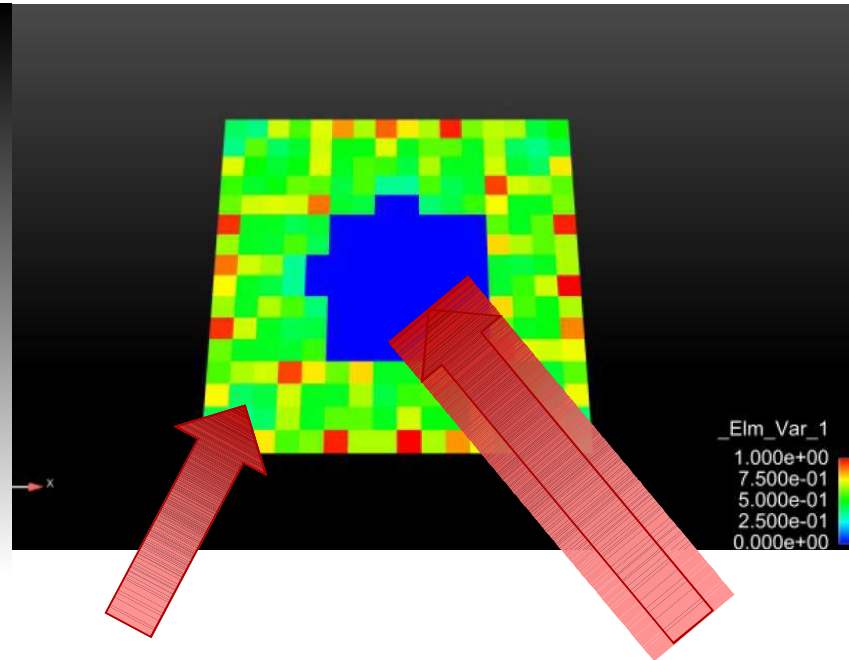
Delamination Example

Partially-bonded plates – can we invert for
the bonded/debonded regions?

Exact bonded/de-bonded areas



Initial guess for optimization:
Completely de-bonded

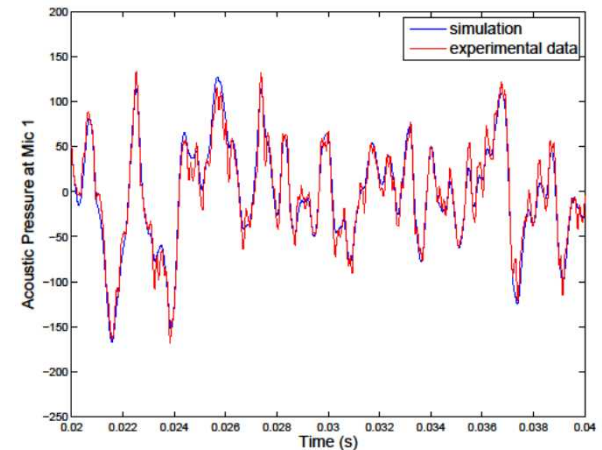
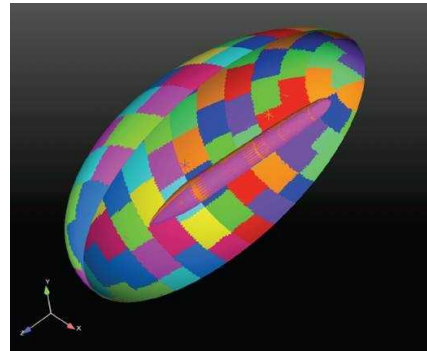
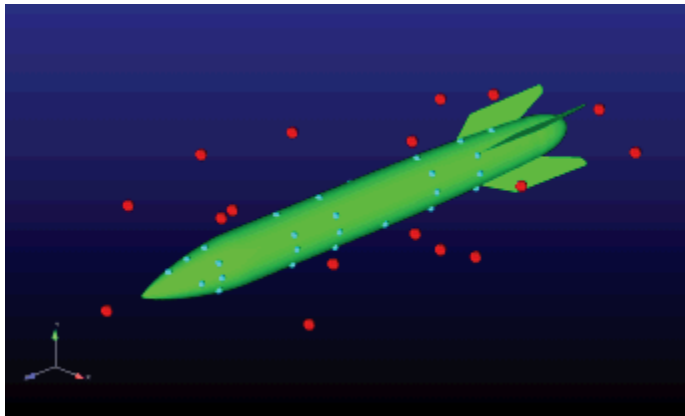


Bonded area
(penalty=1)

De-bonded
Area (penalty=0)

Source Inversion in Sierra-SD

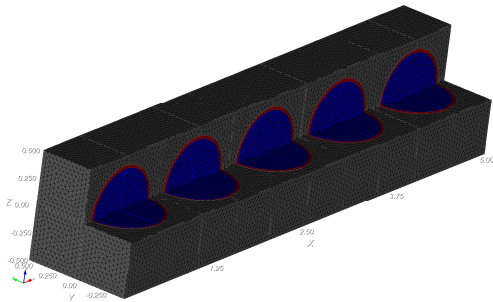
- Goal: reconstruct acoustic field using inverse problem to obtain acoustic patch inputs that produce the given microphone measurements



- Additional research on-going
- How to regularize the inverse problem – gradient regularization (penalize jumps across neighboring patches)
- How to place microphones

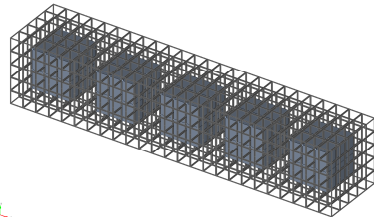
A Revolution in Acoustic Metamaterials

Breakthrough technology could allow us to **mitigate harsh vibration environments**



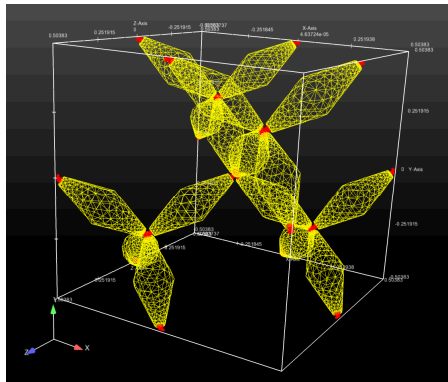
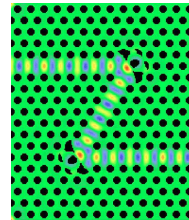
Multiphase
composite

Transformative
technology

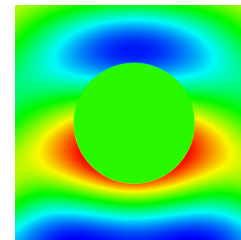


Lattice with
embedded
masses

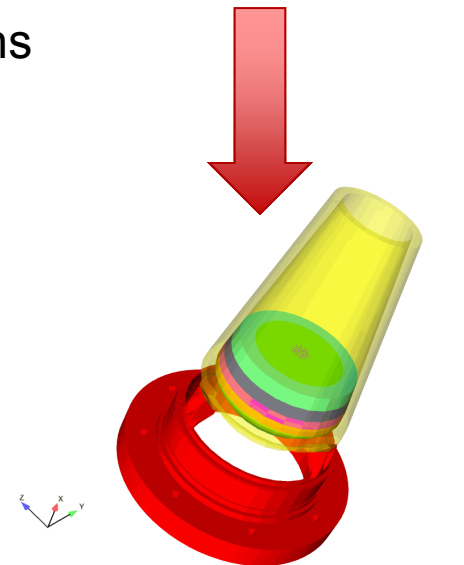
Re-directed load paths



Pentamode
lattice



cloaking

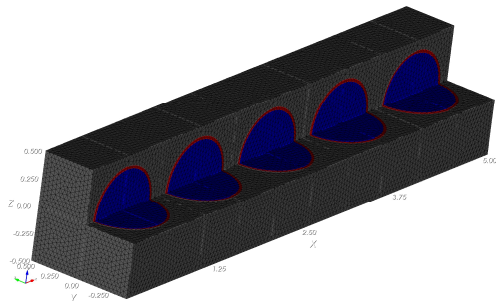


Vibration isolation

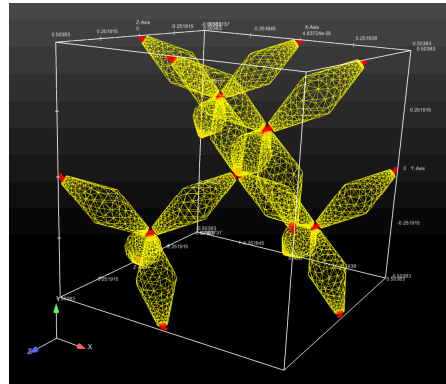
What is an acoustic metamaterial

- Acoustic metamaterials: designed to produce dynamic material properties not found in individual materials themselves
 - Negative moduli, negative density, negative refractive index, imaginary speed of sound!!! (not possible in traditional materials)
- First demonstrated in 2000 by Liu et al, *Science*

Multiphase composite



Pentamode lattice



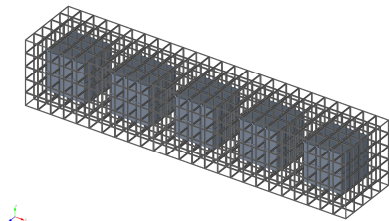
How do metamaterials work?

$$v = \sqrt{\frac{B}{\rho}}$$

where

$$B = \text{bulk modulus} = \frac{\Delta P}{-\Delta V / V} = -V \frac{dP}{dV}$$

$\rho = \text{density}$



Lattice with
embedded
masses

Exotic Material Properties

Speed of sound in a material:

$$v = \sqrt{\frac{B}{\rho}} \quad \text{where} \quad B = \frac{\text{bulk modulus}}{\text{modulus}} = \frac{\Delta P}{-\Delta V / V} = -V \frac{dP}{dV}$$

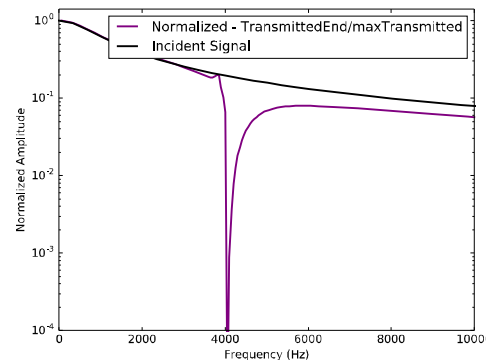
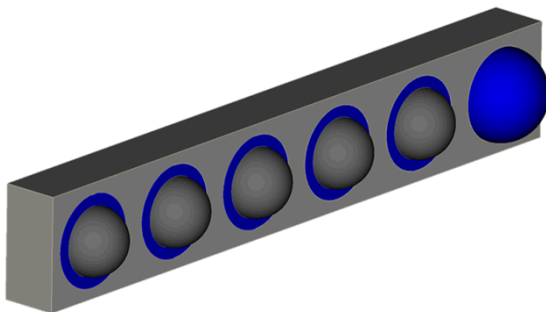
$\rho = \text{density}$

- Typically metamaterials exhibit “effective” properties such as:
 - Negative moduli, B , imaginary sound speed (no wave propagation)
 - Negative density, ρ , imaginary sound speed (no wave propagation)
 - Negative moduli and density, real sound speed (waves propagate again!)
 - We can design a mechanical filter by alternating the sign of B and ρ !

Metamaterials - Mechanical Filter Design

Uniqueness of metamaterials – allow for frequency-selective designs!

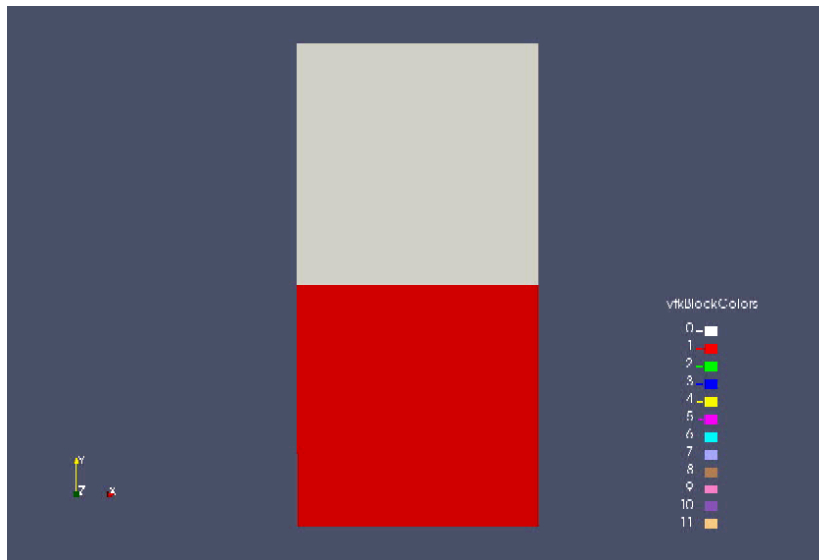
- Broadband – goal is to eliminate vibration in wide (or entire) frequency band
- Band-stop – stop energy in a specified frequency band - negative stiffness or negative density
- Band-pass – allow only a band of frequencies to propagate
- Notch – only filter at one particular frequency



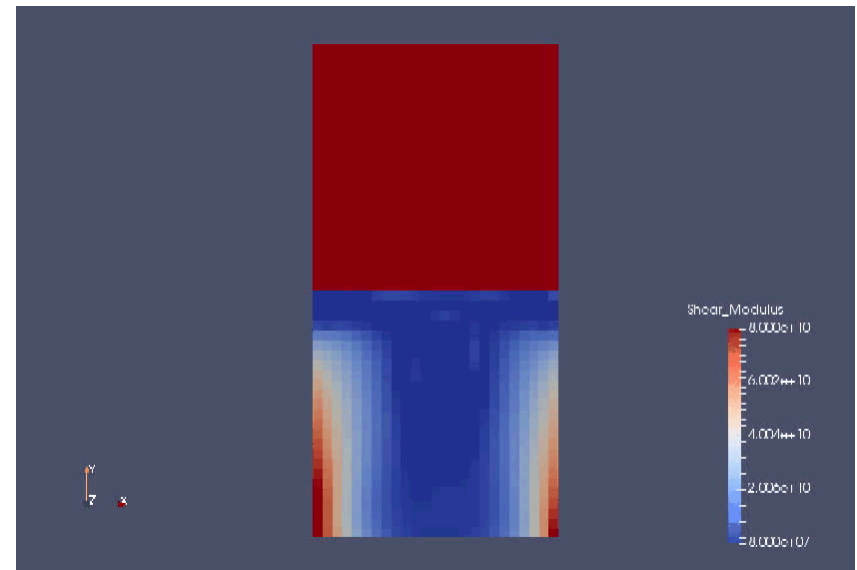
Transient Shock Isolation

Goal: Design the bottom material such that the top block does not move

Initial guess

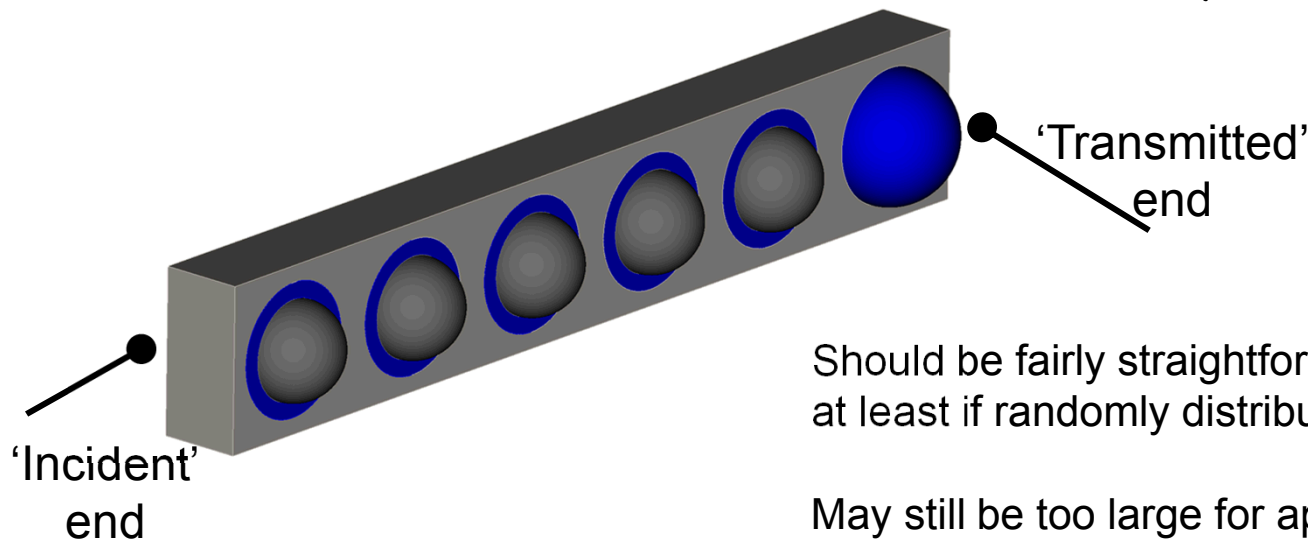
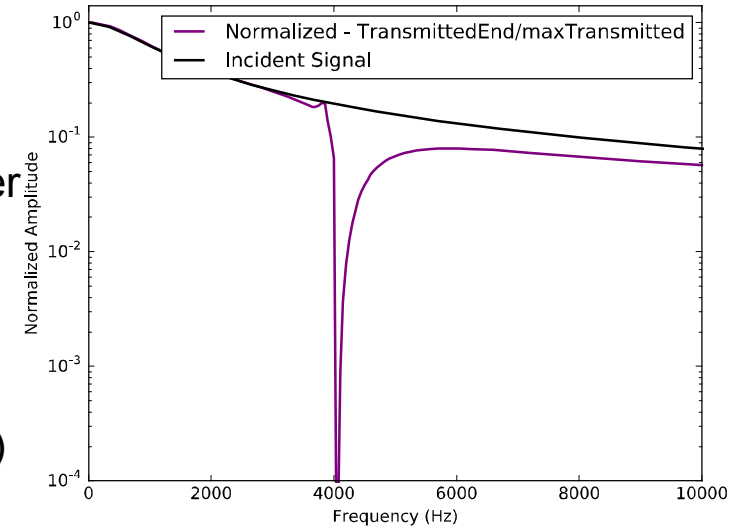
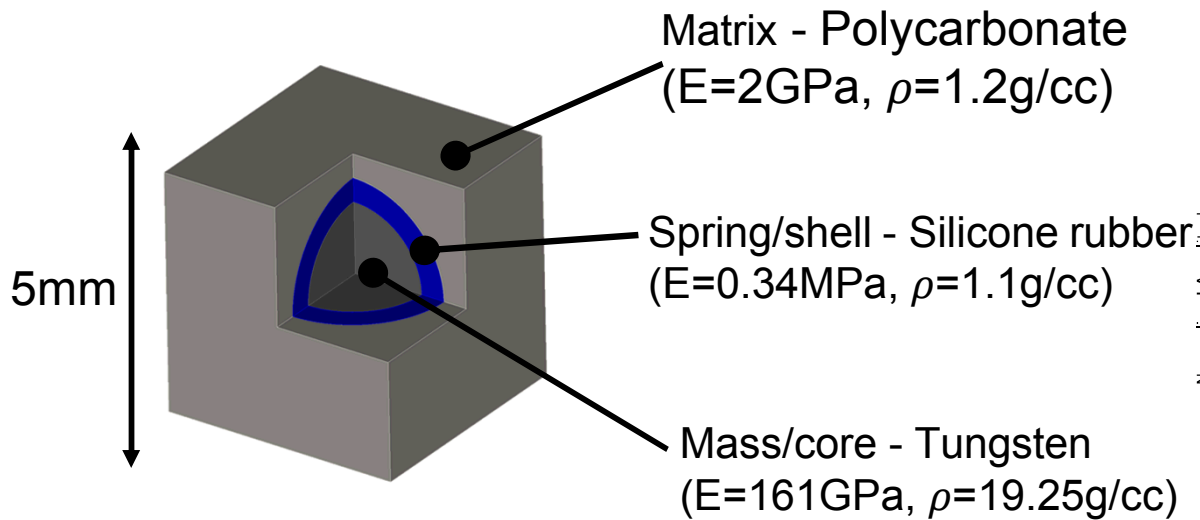


optimized



Top block: steel
Bottom block: single phase fixed, two-phase,
multi-phase

Notch Filter Design

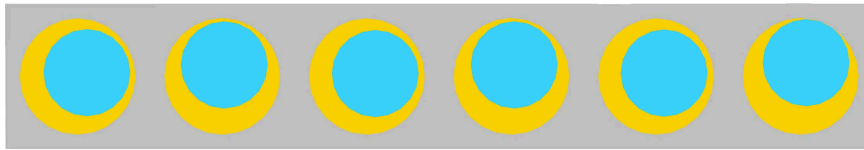


Should be fairly straightforward to manufacture,
at least if randomly distributed.

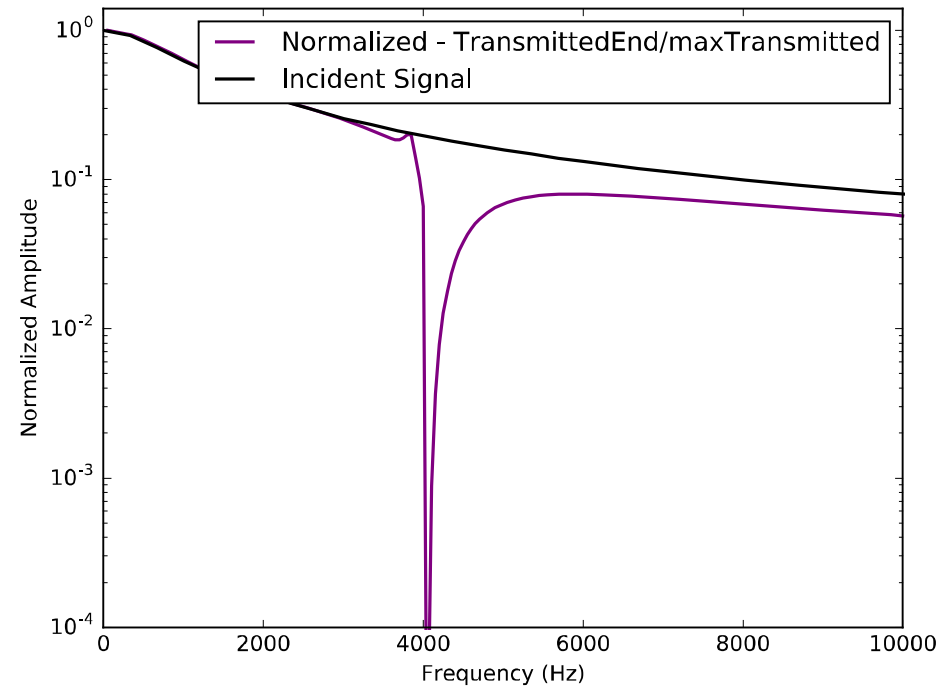
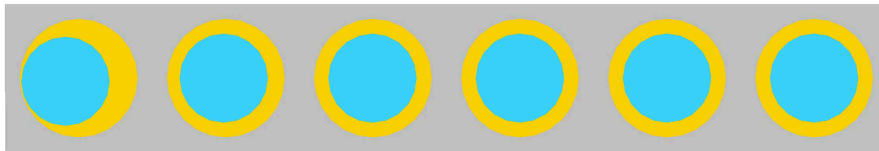
May still be too large for application.

Sphere-in-Shell Oscillators

4000Hz

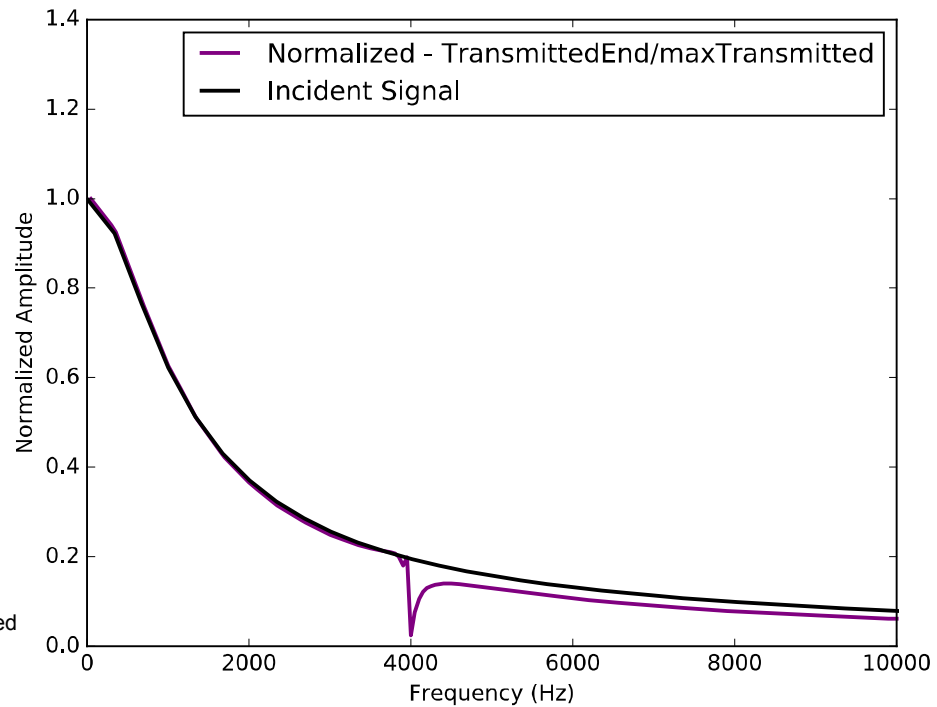
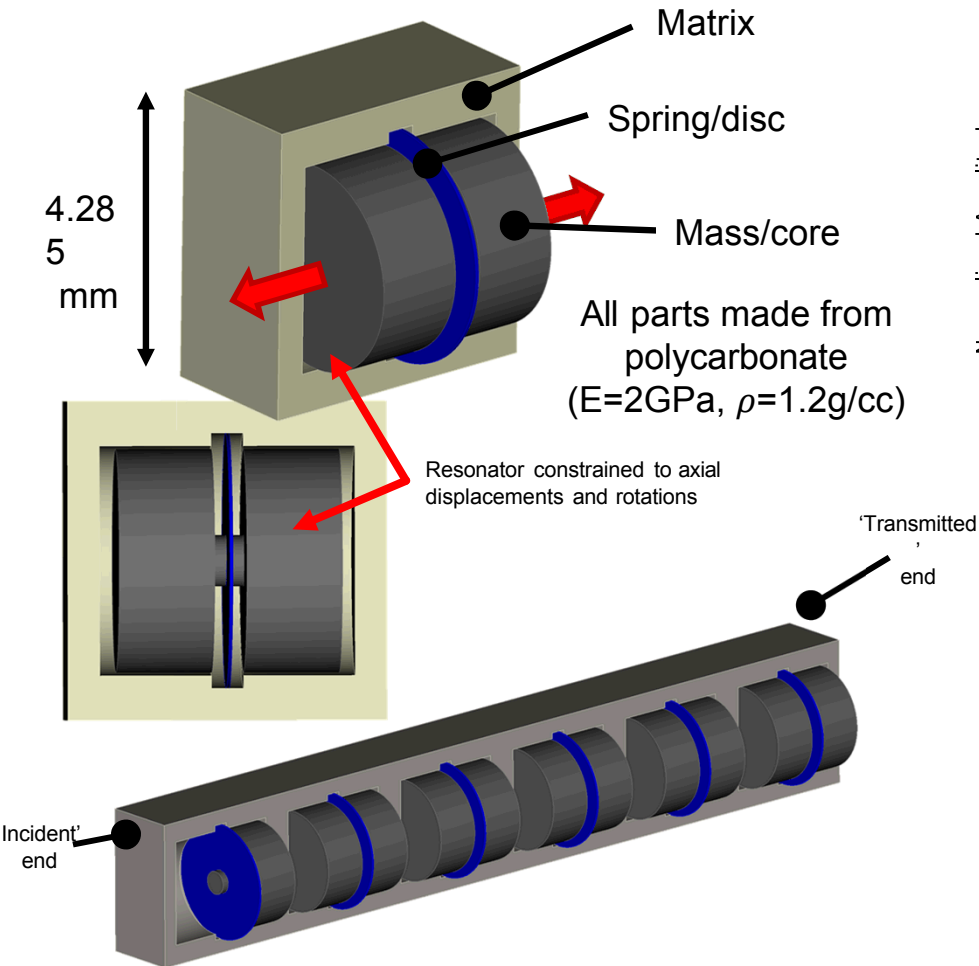


4050Hz



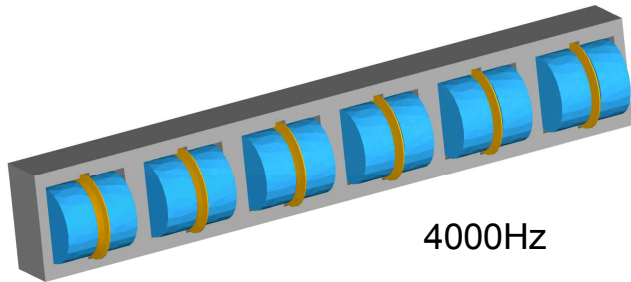
← Reduced motion at end

'Dumbbell' Resonators

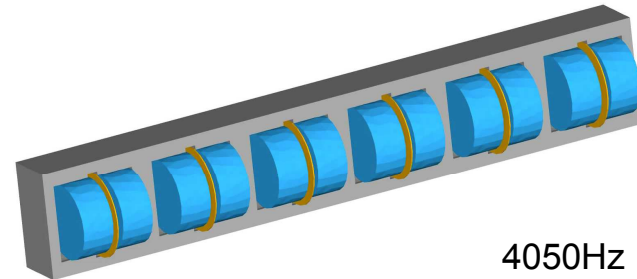
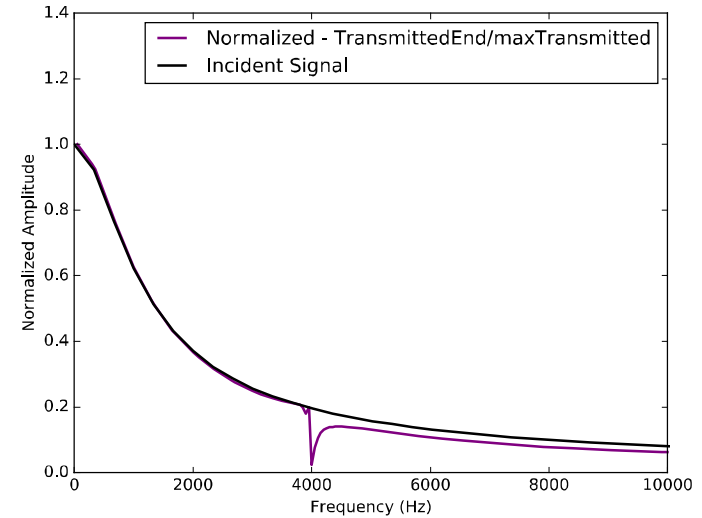
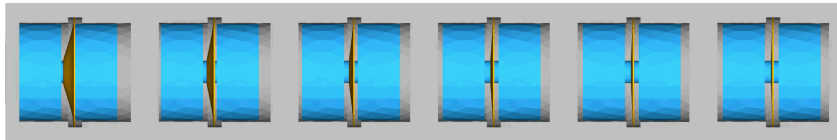


Can be 3D printed from a single material, will need to modify matrix geometry to remove material from empty spaces.

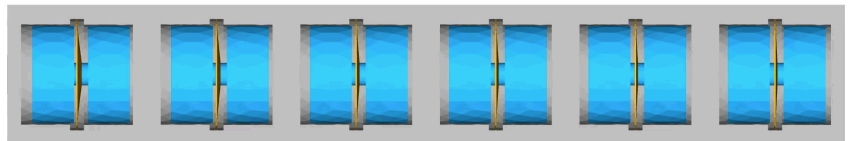
'Dumbbell' Resonators



4000Hz



4050Hz



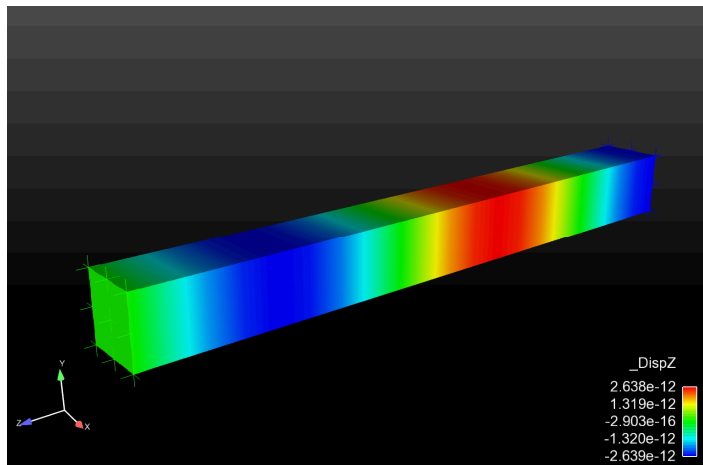
Wave Propagation in Waveguide

- $u(x) = e^{ikx}$
- $k = \frac{\omega}{c}$
- If c is purely imaginary, $u(x) = e^{\frac{-\omega x}{c}}$
- Thus a propagating wave becomes an evanescent wave when stiffness is negative

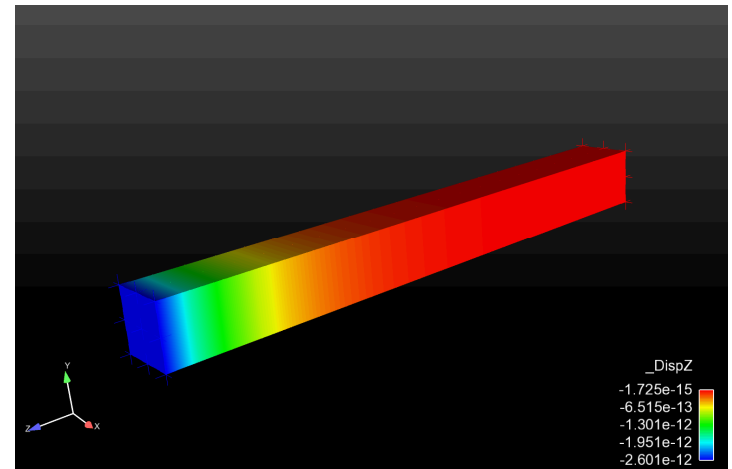
Wave Propagation in Waveguide

Steady-state wave propagation in steel bar – positive vs negative stiffness

1. Negative properties: wave propagation \rightarrow evanescent (decaying) waves
2. Makes linear Helmholtz solve easier
3. 3 order of magnitude reduction in wave amplitude in later case
4. Implications for homogenization of the metamaterial



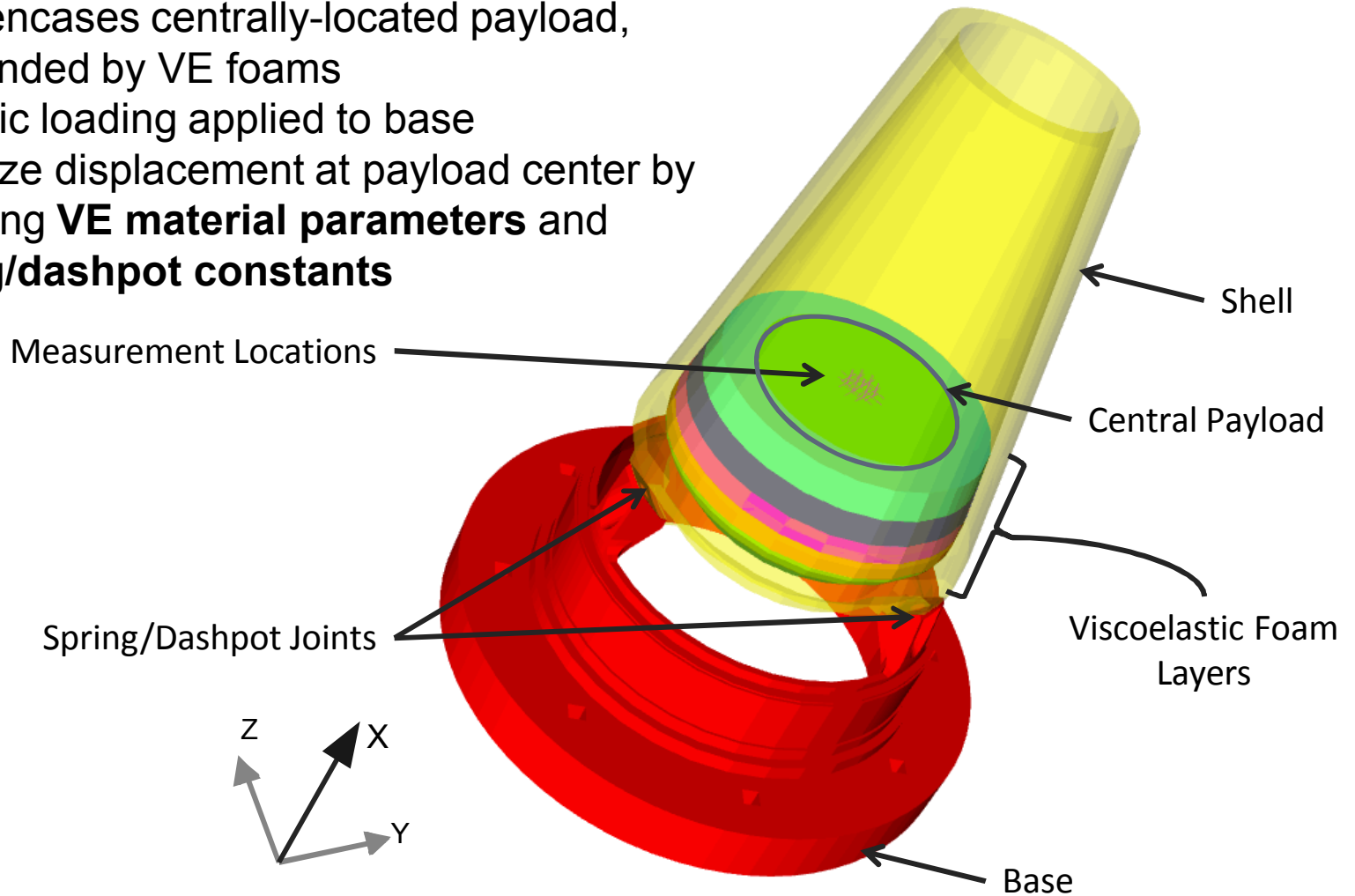
$G, K > 0$



$G, K < 0$

Inverse Problems: *Mechanical Vibration Reduction*

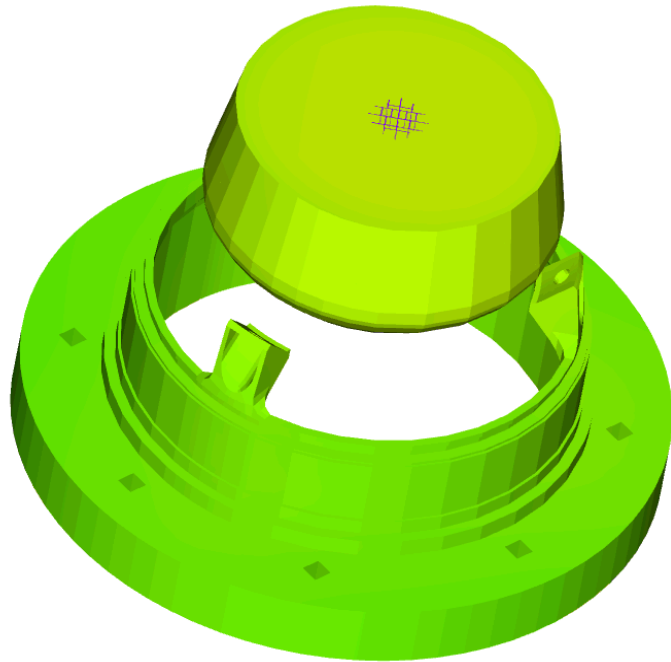
- Shell encases centrally-located payload, surrounded by VE foams
- Periodic loading applied to base
- Minimize displacement at payload center by adjusting **VE material parameters** and **spring/dashpot constants**



Case Study 1: *Mechanical Vibration Reduction*

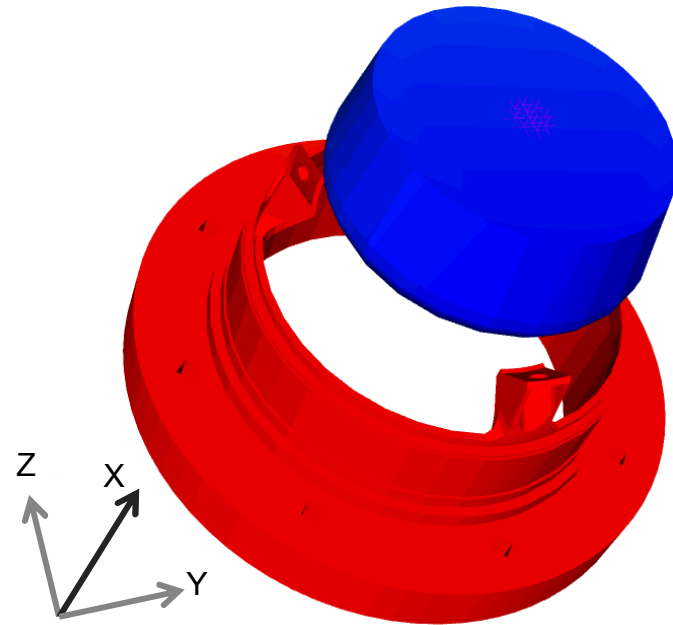
- Displacement at measurement locations minimized (dependent on frequency)

Initial Guess



_DispX
3.387e-05
1.818e-05
9.761e-06
5.240e-06
2.813e-06

Optimized



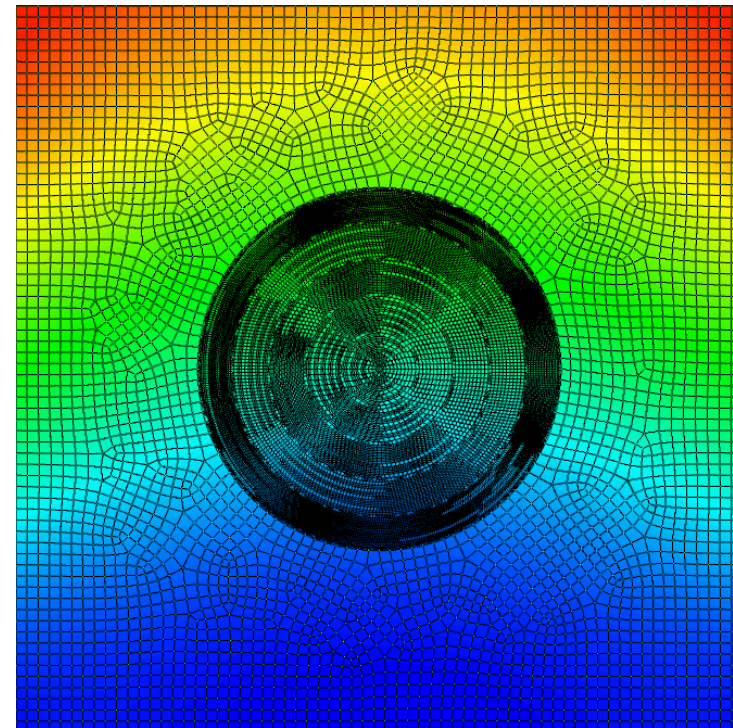
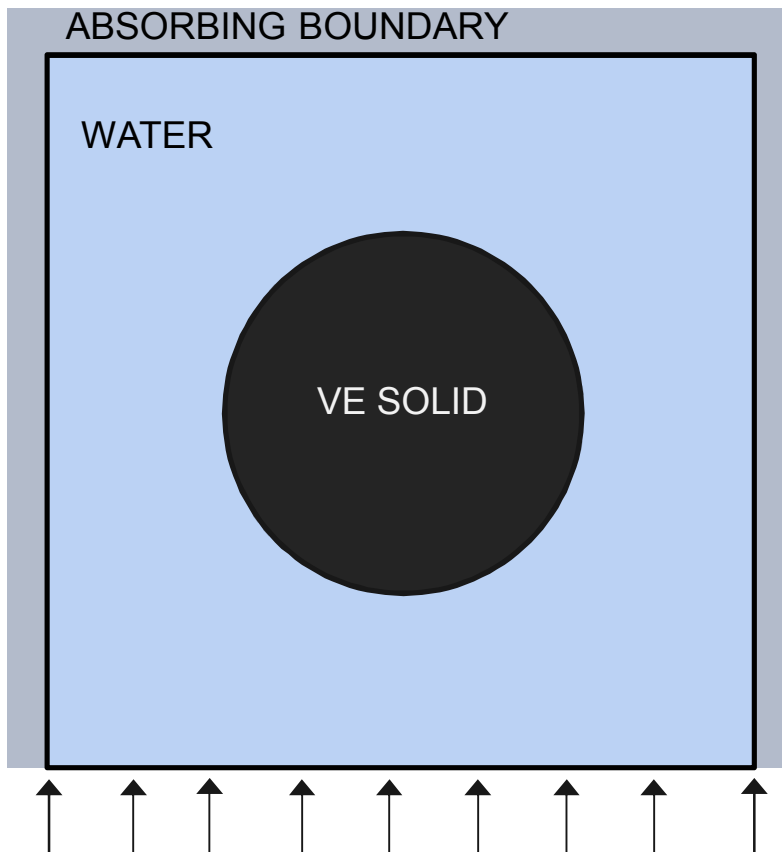
_DispX
3.387e-05
1.818e-05
9.761e-06
5.240e-06
2.813e-06

Left: X-displacement in base and payload with initial material guesses, 440 Hz loading;

Right: X-displacement in design

Inverse Problems: *Acoustic Cloaking*

- 2-D fluid region with circular VE solid inclusion
- Inclusion consists of concentric rings w/ distinct material properties
- Periodic acoustic load applied to end
- Match forward problem pressure distribution by adjusting **VE material parameters**



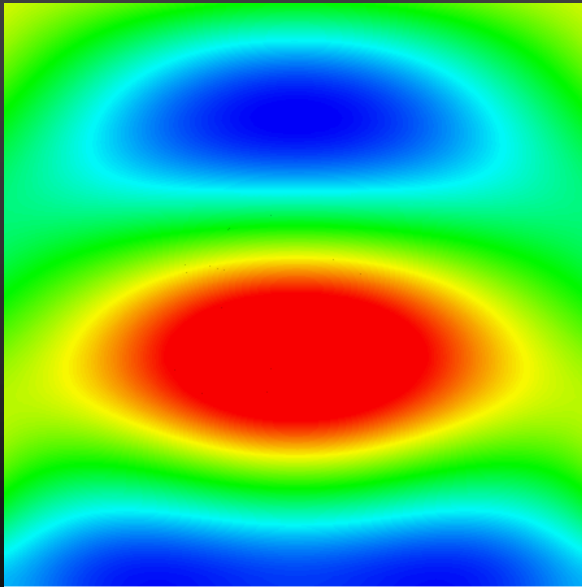
Left: Model Set up

Right: Forward problem pressure distribution (500 Hz loading) in model with 50 layers

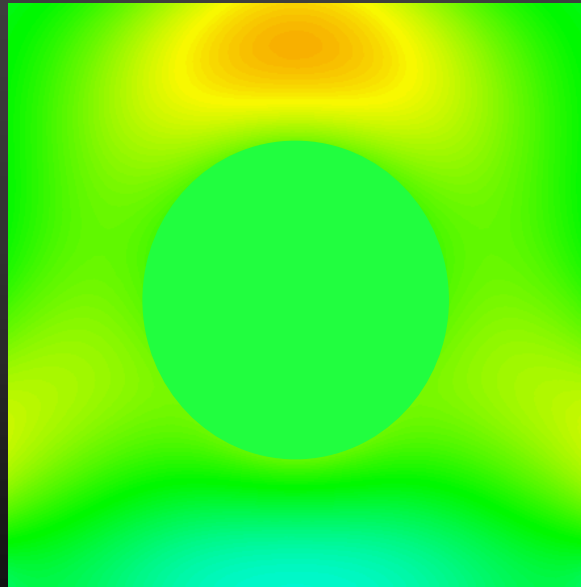
Acoustic Cloaking

- Optimized VE foams allow recovery of desired pressure distribution

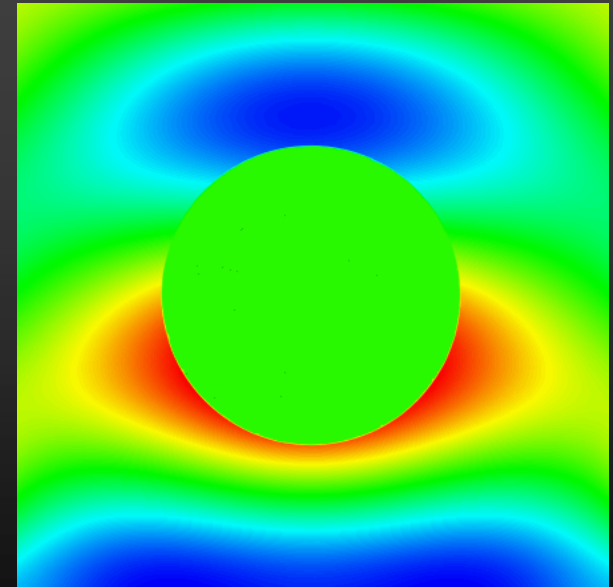
Forward



Initial Guess



Optimized



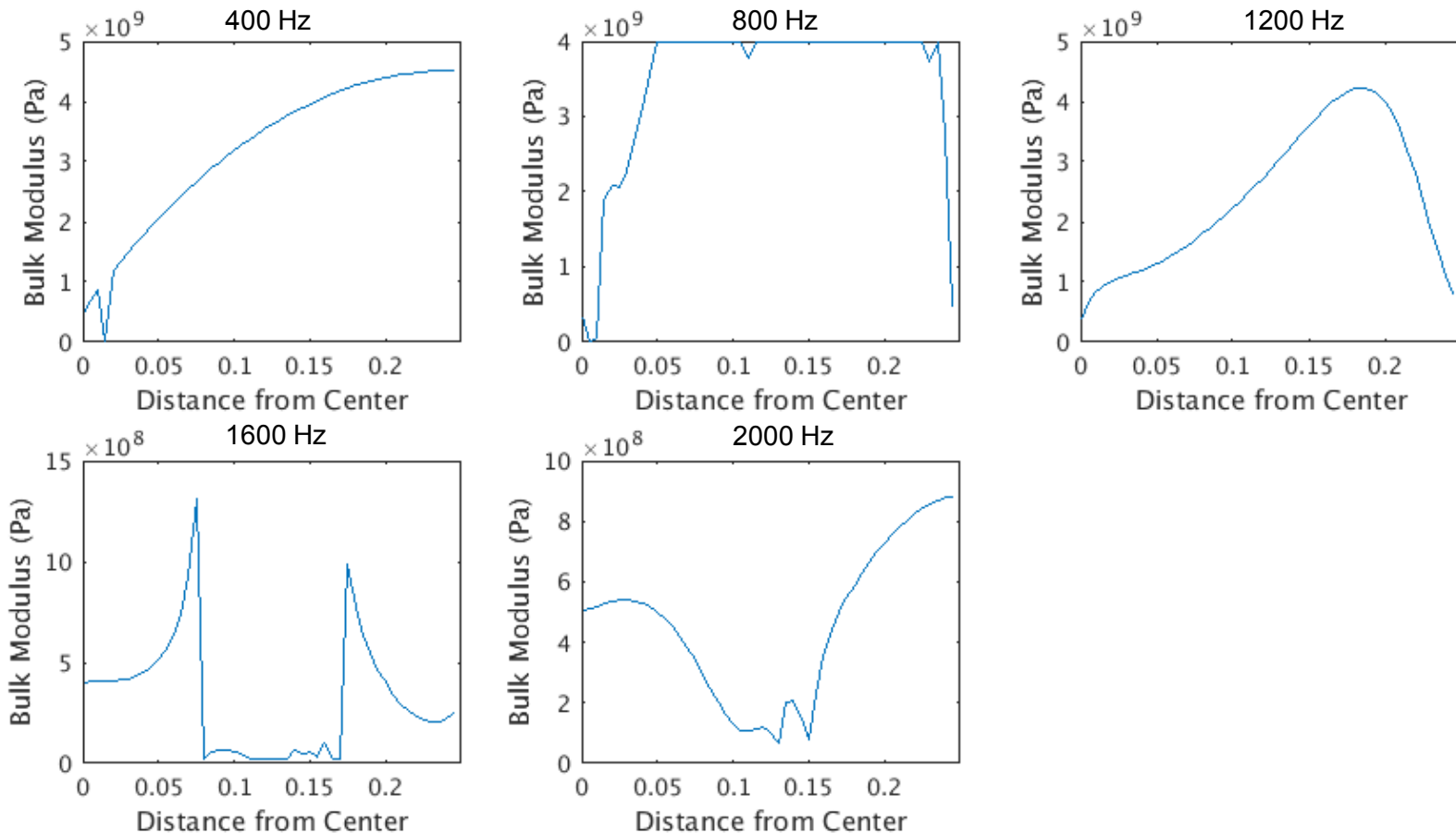
Left: Target acoustic pressure distribution, from forward problem

Center: Acoustic pressure distribution with initial material guess (2000 Hz Loading)

Right: Pressure distribution after convergence to optimized design

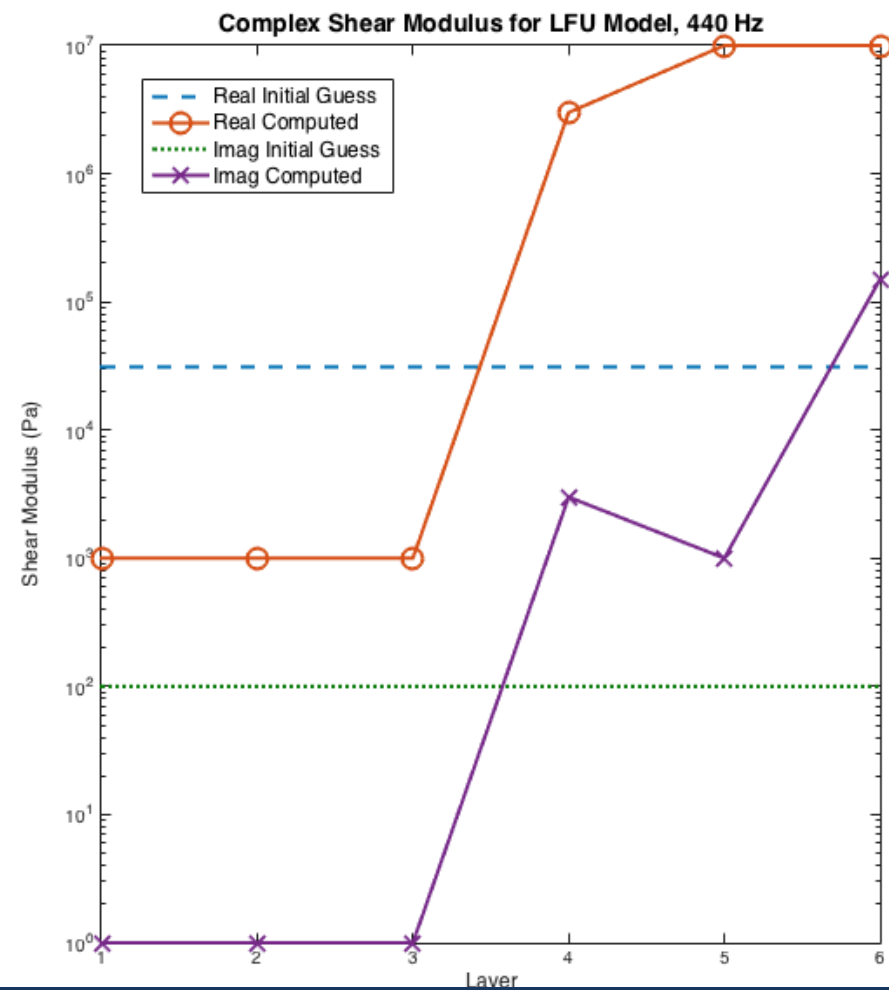
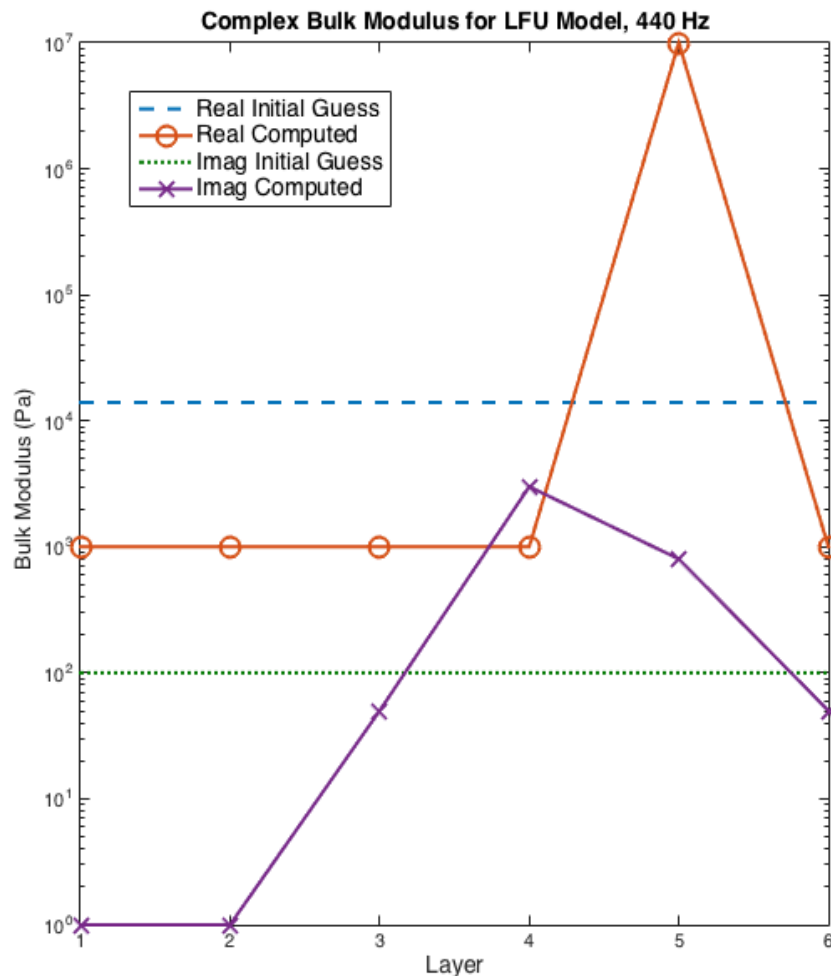
Acoustic Cloaking Results: Bulk Modulus

Bulk modulus sensitive to frequency, and varies nontrivially along disk radius



Figures: Real component of bulk modulus along radius, for various frequency

Case Study 1: *Mechanical Vibration Reduction*



OBSERVATIONS:

- Elastic Properties: Soft materials selected towards top, stiffer materials near base
- Viscous Properties: Damping is added towards base of viscoelastic region