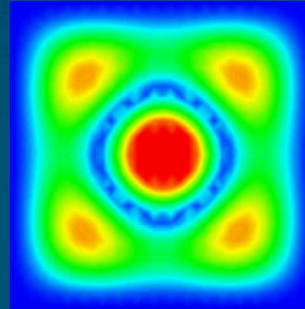
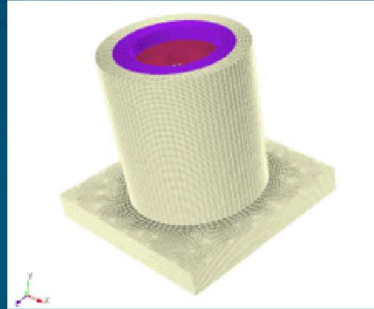
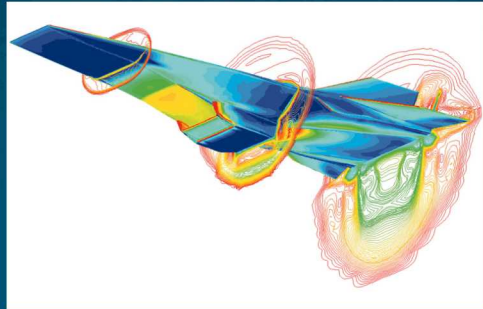


# Model Order Reduction in Linear and Nonlinear Structural Dynamics



PRESENTED BY

Robert J. Kuether, Sandia National Laboratories

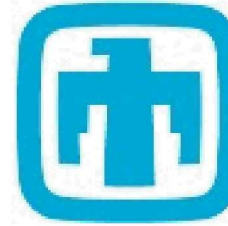
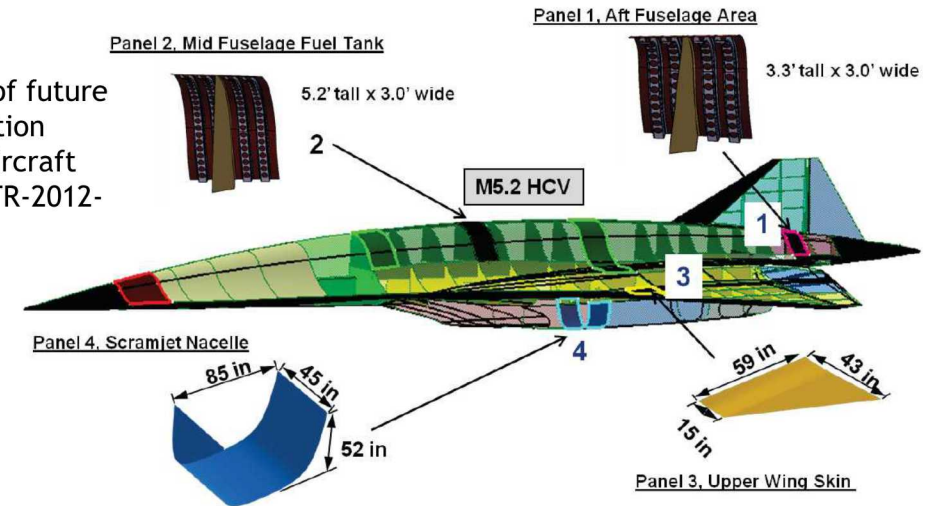
Presented at NMSU on April 5, 2019

- B.S., M.S. and Ph.D in Engineering Mechanics at University of Wisconsin
  - Focused on computational methods in structural dynamics
  - “Nonlinear Modal Substructuring of Geometrically Nonlinear Finite Element Models”
- Joined Sandia in 2015 as Technical Staff
  - Component Science & Mechanics
  - Research and application work in computational structural dynamics
  - Exploring new nonlinear physics

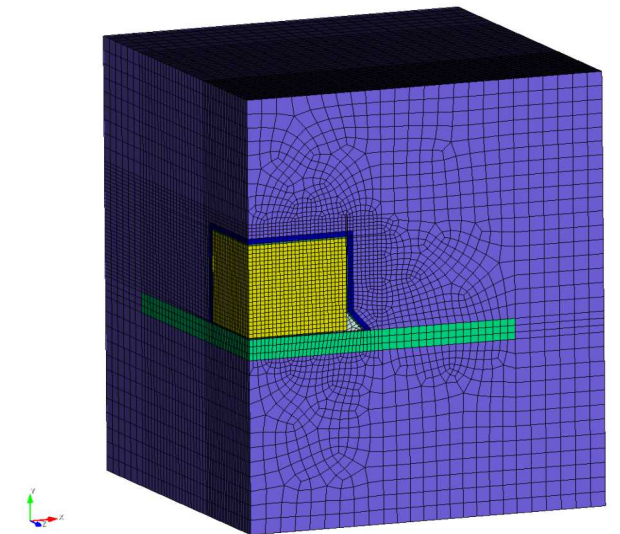
### Keywords:

Structural dynamics; reduced order modeling; nonlinear dynamics and vibrations; test-analysis correlation; interface mechanics

Exploratory design of future reusable, long duration cruise high-speed aircraft from AFRL-RQ-WP-TR-2012-0280

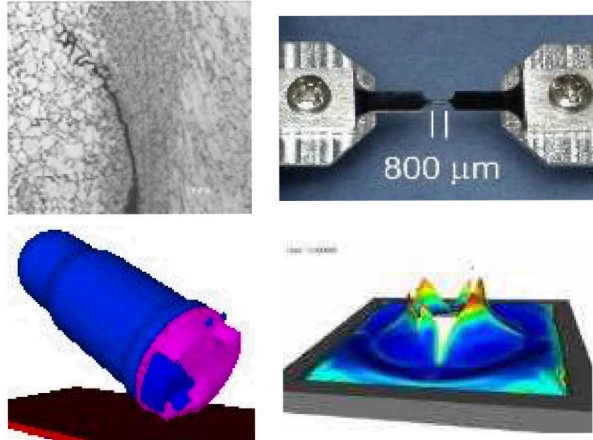


Vibration sensitive electronics potted in foam or polymer to mitigate damaging shock and vibrations

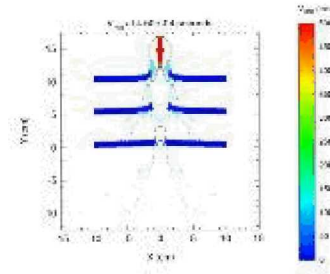


# Engineering Sciences Core Technical Areas

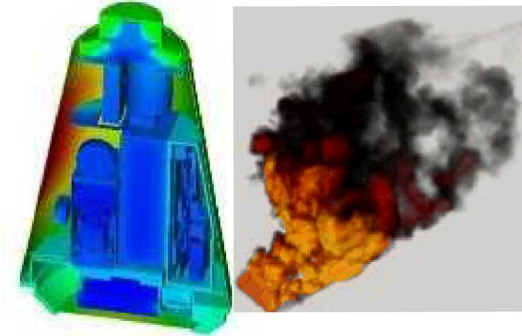
## Solid Mechanics



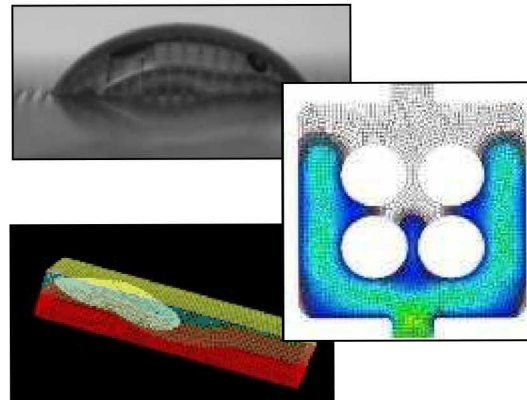
## Shock Physics and Energetics



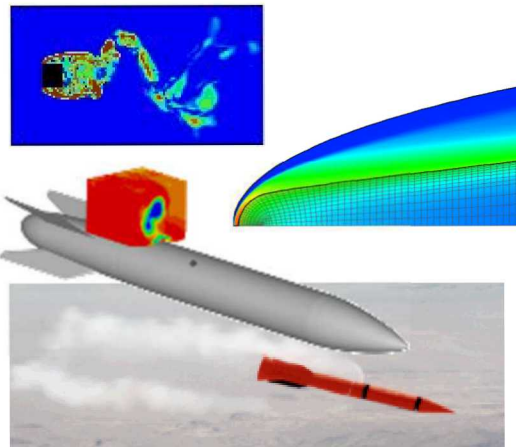
## Thermal & Fire Sciences



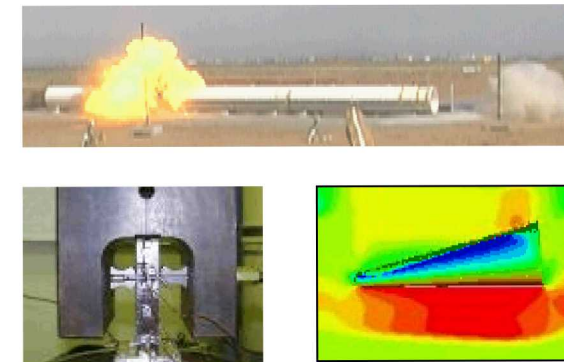
## Fluid Mechanics



## Aerosciences



## Structural Dynamics





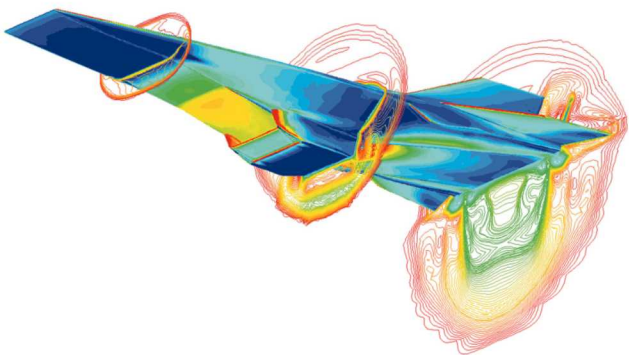
# Engineering Sciences Core Technical Areas

<https://www.youtube.com/watch?v=o1qAjLSEv0A>

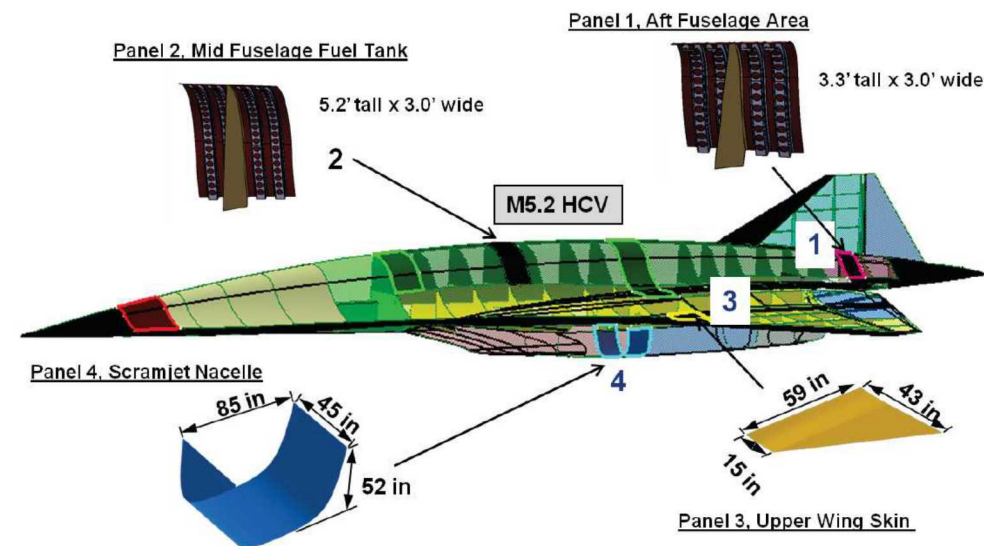


# Motivation and Existing Challenges

- Future flight systems seek to push performance envelope
  - High-speed vehicles
  - Spacecraft and satellites
- Harsher Environments / Lighter Designs
  - Less opportunity to overdesign structure
- Design option: operate in nonlinear response regime
  - Need engineering tools to **understand and predict** nonlinear dynamic behavior of large-scale models



NASA X-43A experimental unmanned hypersonic vehicle (left) CFD simulation of Mach 7 flight (right) Mach 7 wind tunnel test full-scale X-43A. Images courtesy of [www.dfrc.nasa.gov/Gallery/Photo/X-43A/Large/](http://www.dfrc.nasa.gov/Gallery/Photo/X-43A/Large/)



Exploratory design of future reusable, long duration cruise hypersonic aircraft from AFRL-RQ-WP-TR-2012-0280 "Predictive Capability for Hypersonic Structural Response and Life Prediction: Phase II - Detailed Design of Hypersonic Cruise Vehicle Hot-Structure"

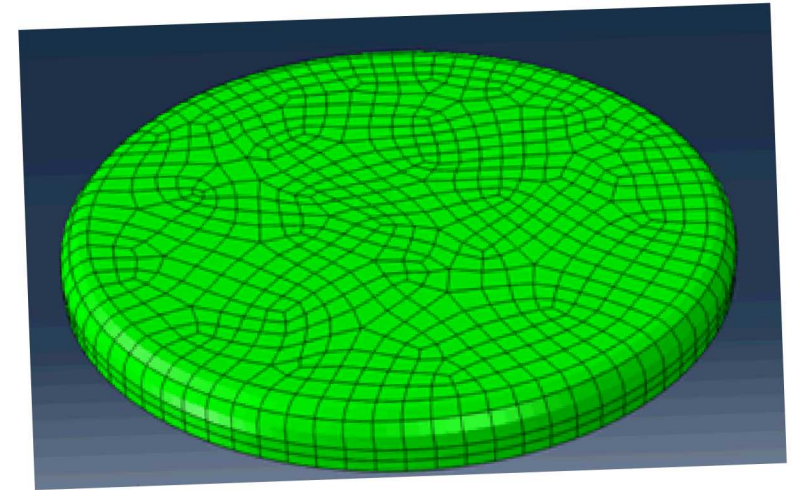
# What is a model?

Simplified Models

CAD Models

Finite Element Models

Reduced Order Models





# Current Approach for Finite Element Models

- Computational simulation capabilities at Sandia
  - High Performance Computing platforms
  - Highly parallelizable, in-house developed finite element software

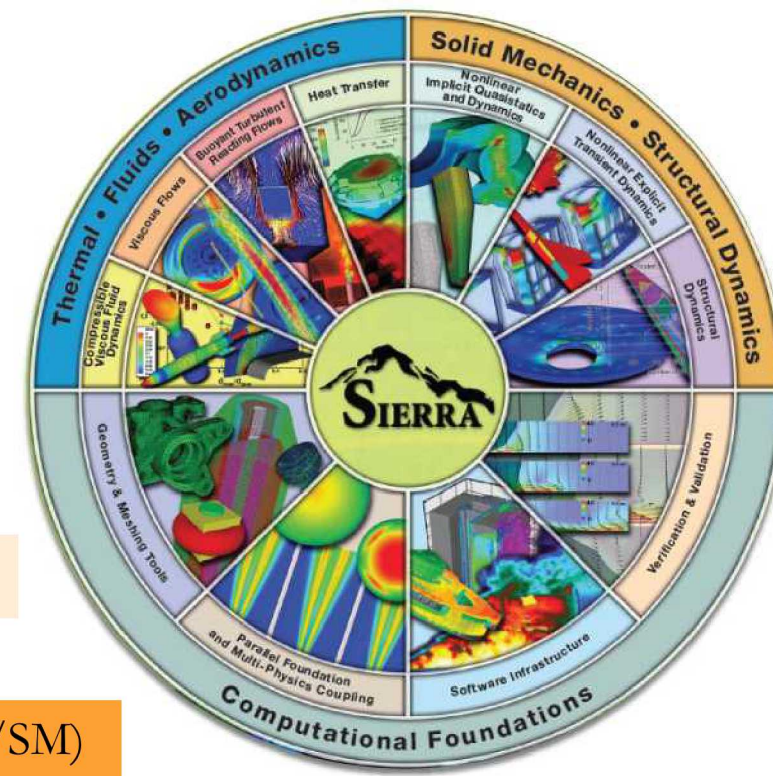
## Current approach to predict structural dynamic response

### Sierra Structural Dynamics (Sierra/SD)

- Environmental responses predicted as superposition of linear mode solutions
- Modal analysis assumes linearity (linear elastic, small deflections, no frictional contact, etc..)
- Highly efficient but sacrifices nonlinear physics

### Sierra Solid Mechanics (Sierra/SM)

- Captures complex nonlinear phenomena (frictional contact, advance constitutive models, large deflections/rotations, etc..)
- Environmental responses predicted via direct time integration (implicit or explicit)
- Highly representative of physics but lacks efficiency





Reduced order models provide a framework that is highly efficient and representative of nonlinear physics

Model order reduction is a technique for reducing the computational complexity and large dimensionality of mathematical models of real-life processes in numerical simulations.

## Modal superposition of undamped MDOF systems

$$\mathbf{M}\ddot{\mathbf{x}}(t) + \mathbf{K}\mathbf{x}(t) = \mathbf{f}(t) \quad \bullet \text{ Undamped MDOF system}$$

$$(\mathbf{K} - \omega_r^2 \mathbf{M})\boldsymbol{\phi}_r = \mathbf{0} \quad \bullet \text{ Real eigenvalue problem}$$

$$\boldsymbol{\Phi} = [\boldsymbol{\phi}_1 \quad \boldsymbol{\phi}_2 \quad \cdots \quad \boldsymbol{\phi}_{\hat{N}}] \quad \bullet \text{ Collect modes in modal matrix}$$

- Mode superposition introduces the transformation between physical and modal coordinate space

$$\mathbf{x}(t) = \sum_{i=1}^{\hat{N}} \boldsymbol{\phi}_i q_i(t) = \boldsymbol{\Phi} \mathbf{q}(t)$$

- Substitute into equations-of-motion and pre-multiply by  $\boldsymbol{\Phi}^T$

$$\boldsymbol{\Phi}^T \mathbf{M} \boldsymbol{\Phi} \ddot{\mathbf{q}}(t) + \boldsymbol{\Phi}^T \mathbf{K} \boldsymbol{\Phi} \mathbf{q}(t) = \boldsymbol{\Phi}^T \mathbf{f}(t)$$

- Orthogonality properties of the real eigenvectors result in decoupled SDOF equations

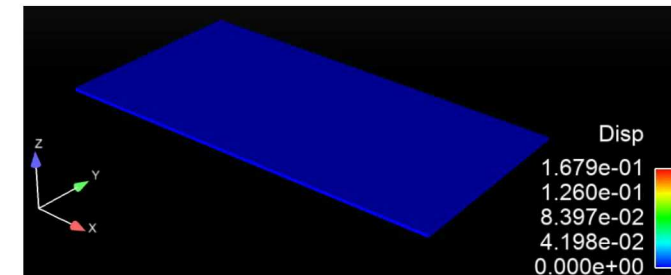
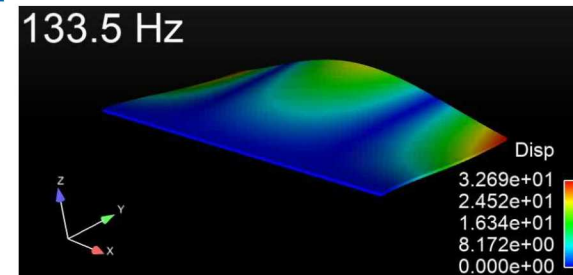
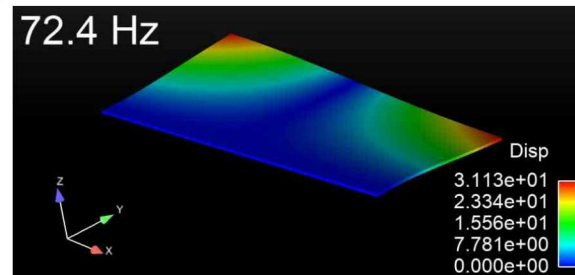
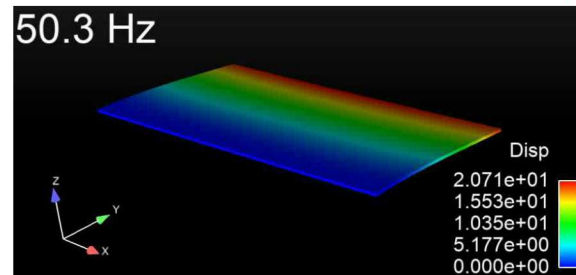
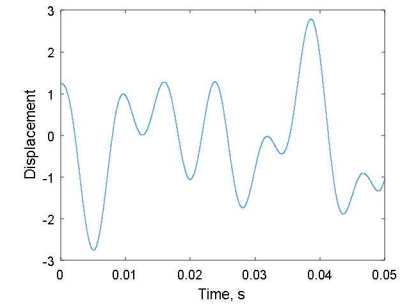
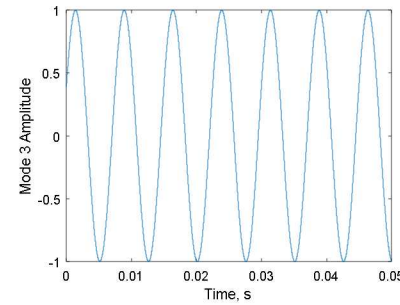
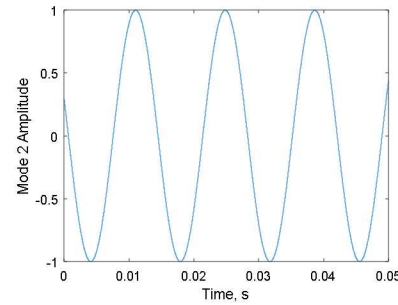
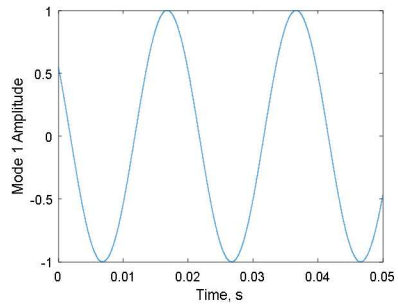
$$\ddot{q}_r(t) + \omega_r^2 q_r(t) = \boldsymbol{\phi}_r^T \mathbf{f}(t)$$

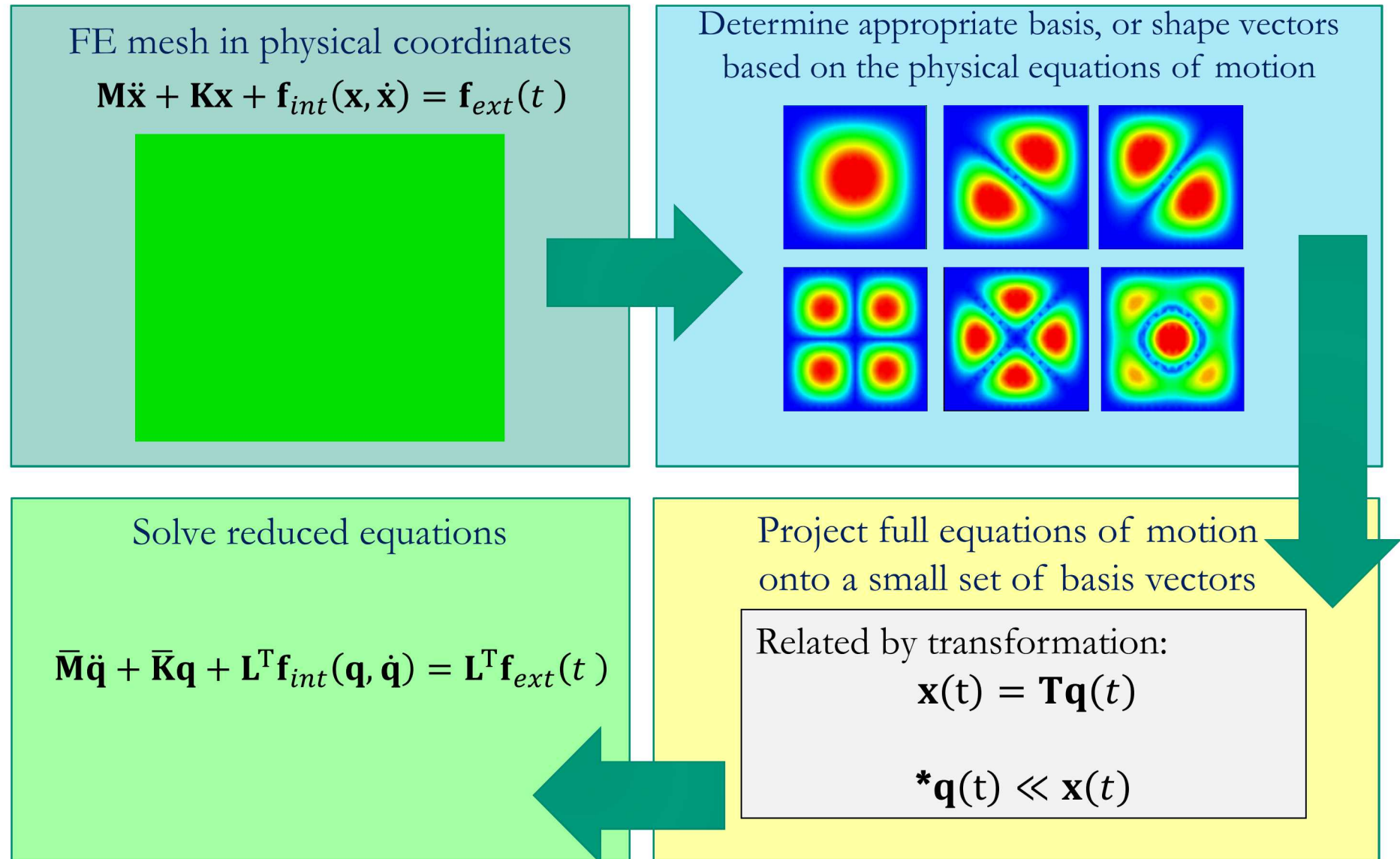


# Modal superposition of undamped MDOF systems

Linear Superposition

$$\mathbf{x}(t) = \sum_{i=1}^{\hat{N}} \boldsymbol{\Phi}_i q_i(t)$$





## Model order reduction with nonlinearities

Galerkin vs Petrov-Galerkin [1]

Direct or indirect reduction

Proper Orthogonal Decomposition vs Eigenvalue Analysis [2]

Linear subspace vs nonlinear manifold subspace

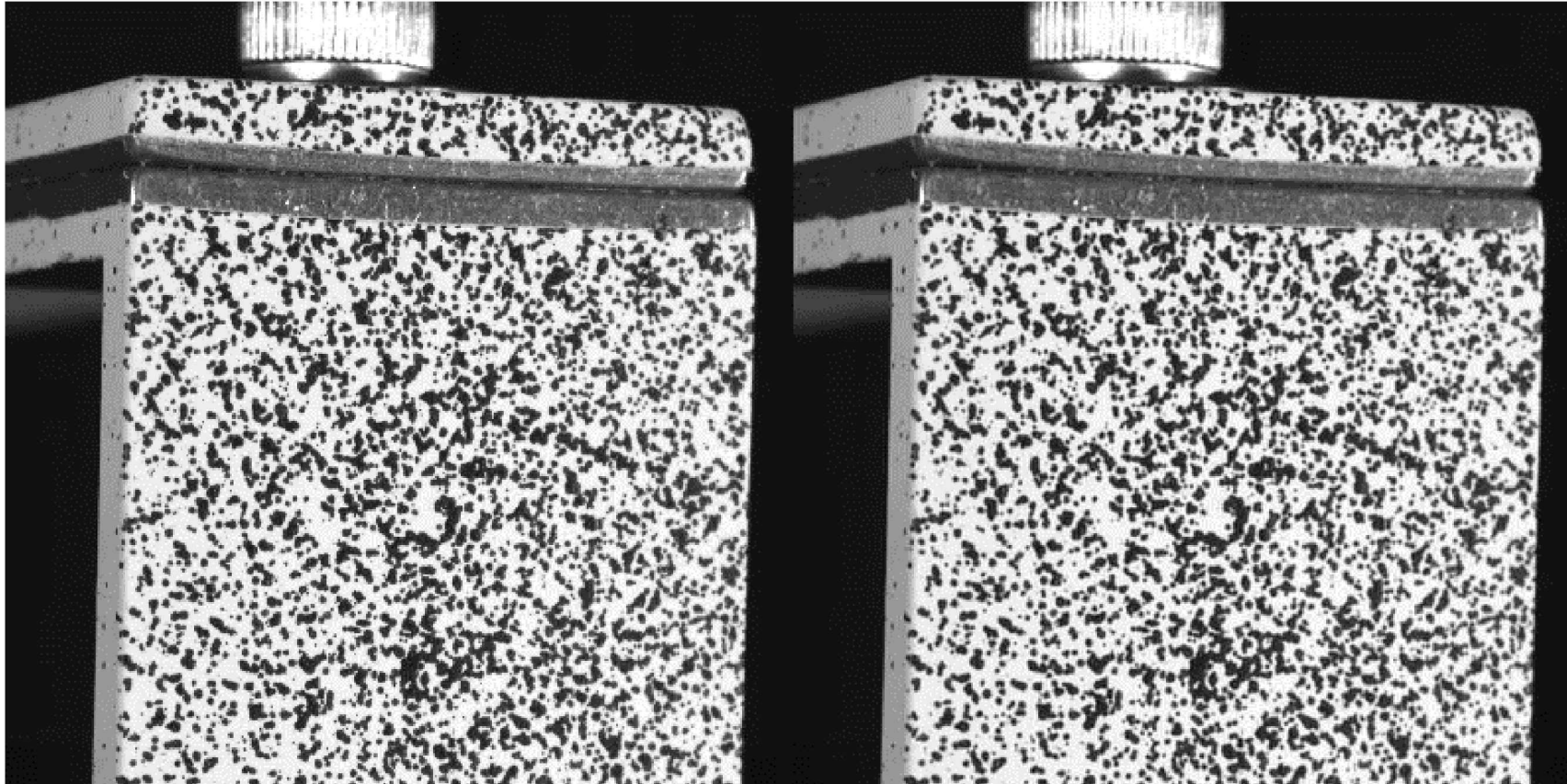
[1] Carlberg, Kevin, Charbel Bou-Mosleh, and Charbel Farhat. "Efficient non-linear model reduction via a least-squares Petrov-Galerkin projection and compressive tensor approximations." *International Journal for Numerical Methods in Engineering* 86.2 (2011): 155-181.

[2] LülF, Fritz Adrian, Duc-Minh Tran, and Roger Ohayon. "Reduced bases for nonlinear structural dynamic systems: A comparative study." *Journal of Sound and Vibration* 332.15 (2013): 3897-3921.



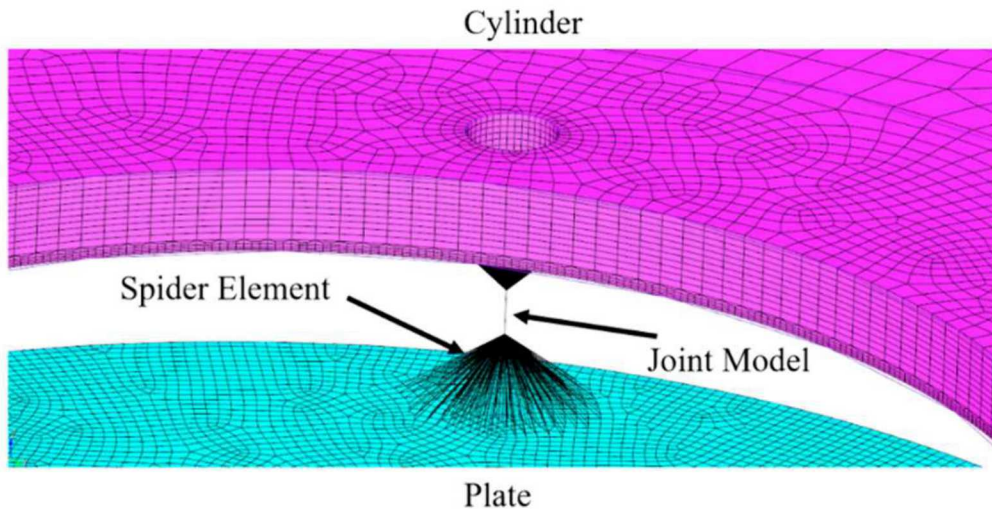
### Nonlinear frictional contact at mechanical interfaces

- Whole joint modeling
- Interface reduction



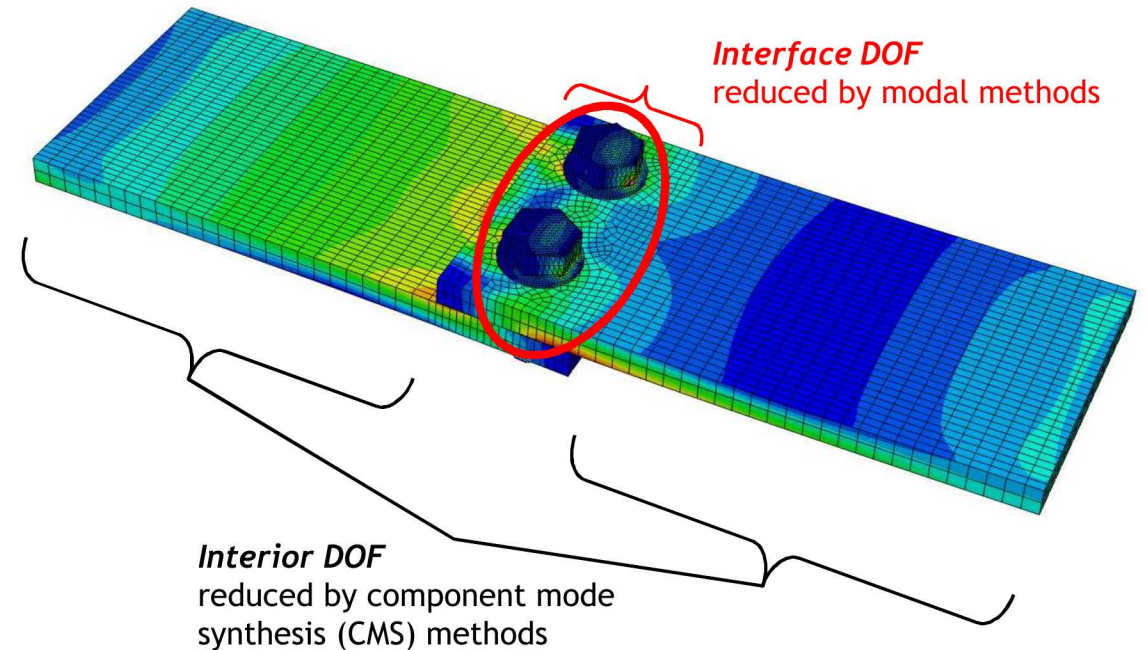
- Two philosophies to develop efficient reduced order models

### Whole Joint Modeling (Rigid Interfaces)



- Goal: Estimate/calibrate the joint parameters in the whole joint reduced order models to match response from high-fidelity models and/or experiments

### Interface Reduction (Flexible Interfaces)



- Goal: keep full kinematics and nonlinear elements, and apply interface reduction



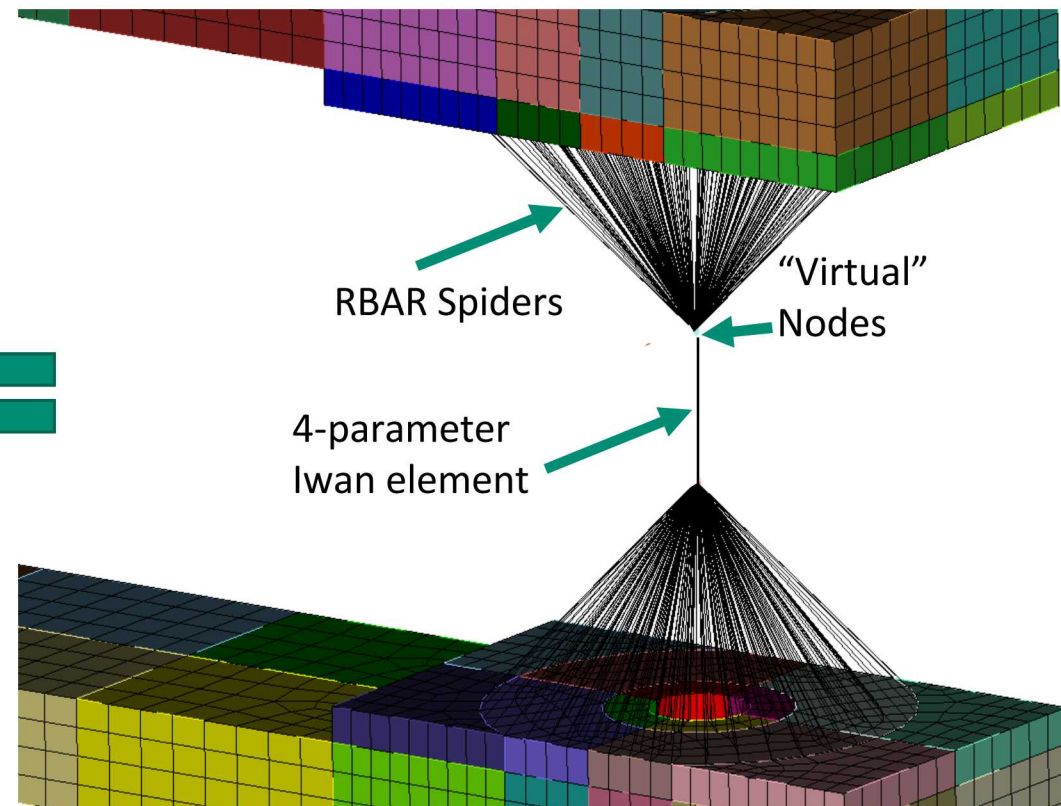
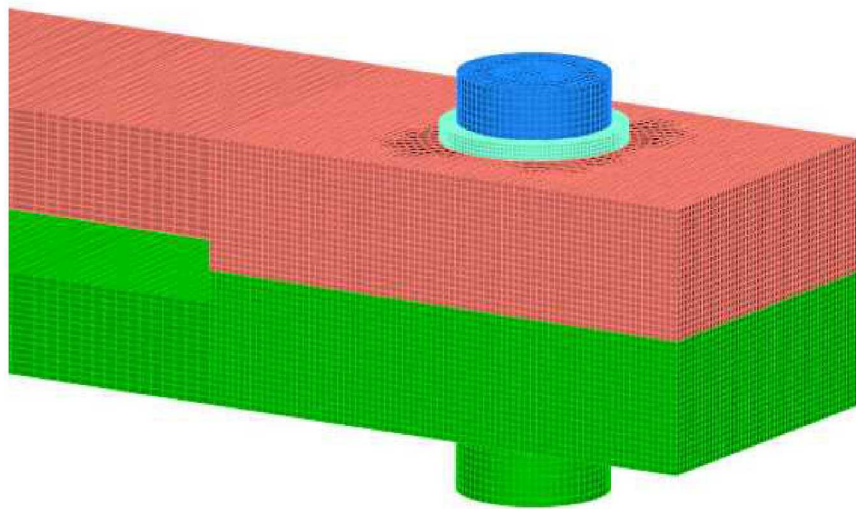
## Nonlinear frictional contact at mechanical interfaces

- Whole joint modeling
- Interface reduction

## Objectives of whole joint modeling R&D

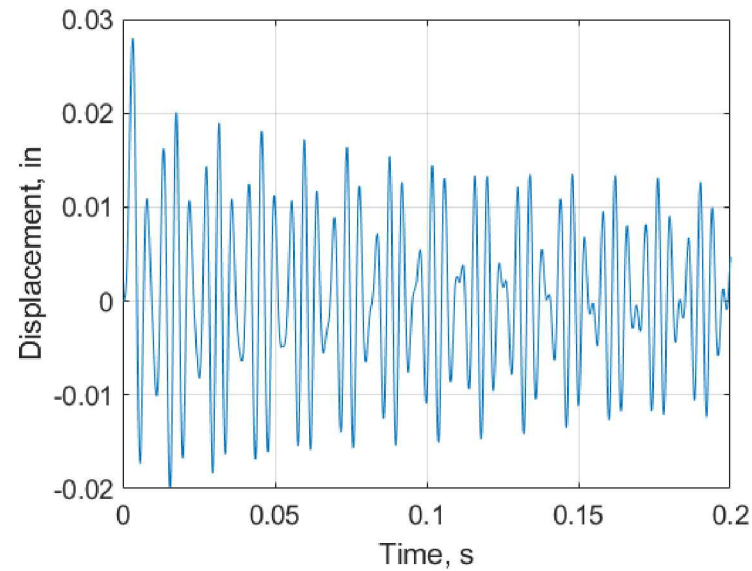
Contact areas in high fidelity finite element models simplified by “spidering” surface to a single node and modeling joint forces as a 1D constitutive law

Global optimization to calibrate whole joint parameters to match global response

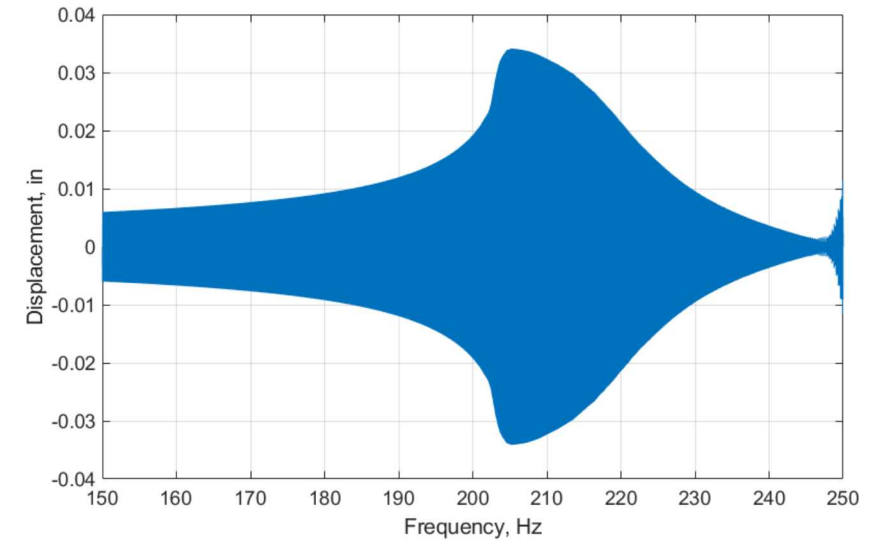


# What global response metrics should be preserved?

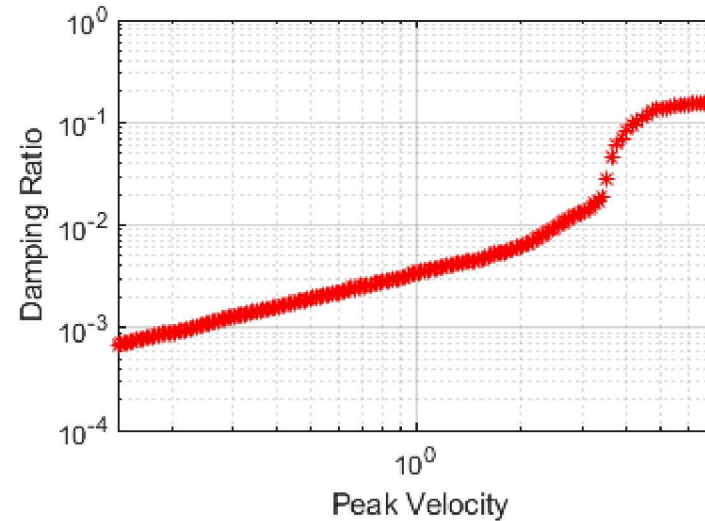
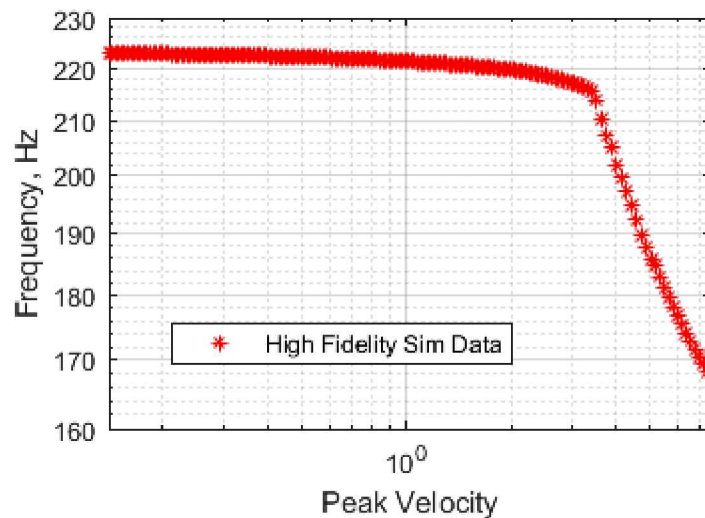
Transient  
Response?



Swept/Stepped  
Sine Response?



Amplitude dependent natural frequency and damping ratio



### Quasi-static Modal Analysis of Full-order Model

#### Nonlinear Preload Analysis

$$\mathbf{K}\mathbf{x} + \mathbf{f}_{NL}(\mathbf{x}, \boldsymbol{\theta}) = \mathbf{f}_{pre}$$

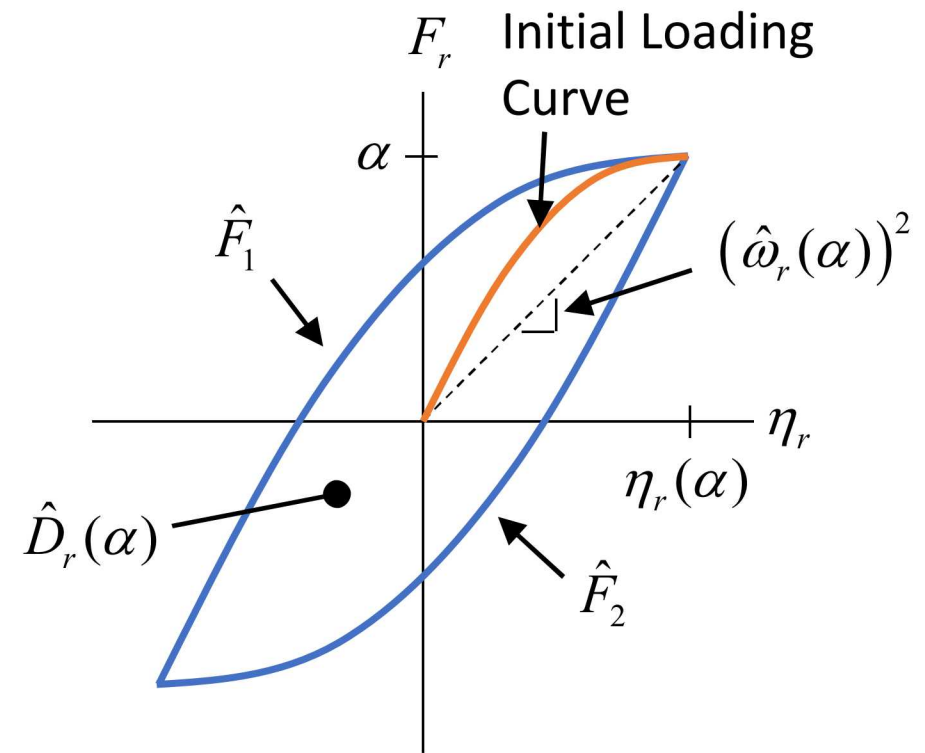
#### Linearized Modal Analysis

$$\left( \mathbf{K} + \left. \frac{d\mathbf{f}_{NL}(\mathbf{x}, \boldsymbol{\theta})}{d\mathbf{x}} \right|_{\mathbf{x}=\mathbf{x}_{pre}} - \omega_r^2 \mathbf{M} \right) \boldsymbol{\phi}_r = \mathbf{0}$$

#### Quasi-static Modal Analysis

$$\mathbf{K}\mathbf{x} + \mathbf{f}_{NL}(\mathbf{x}, \boldsymbol{\theta}) = \mathbf{f}_{pre} + \mathbf{M}\boldsymbol{\phi}_r\alpha$$

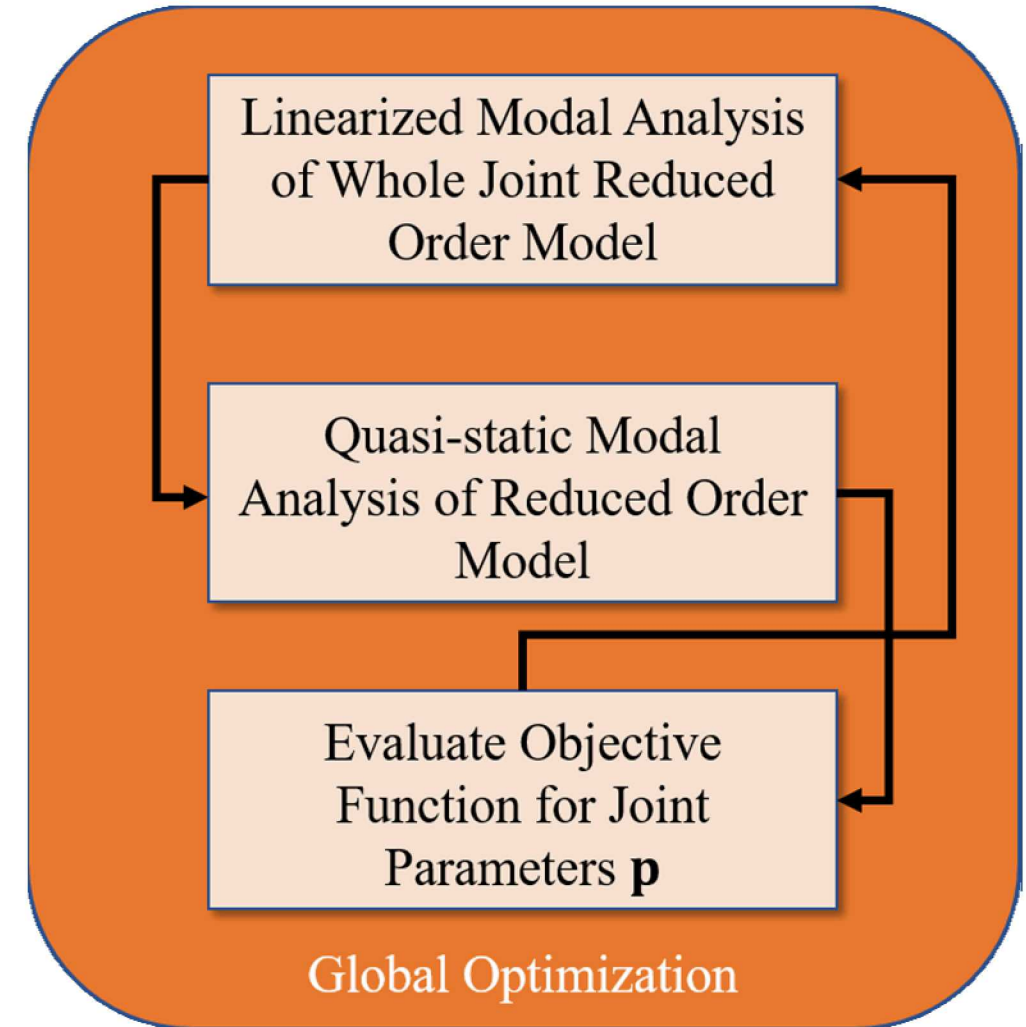
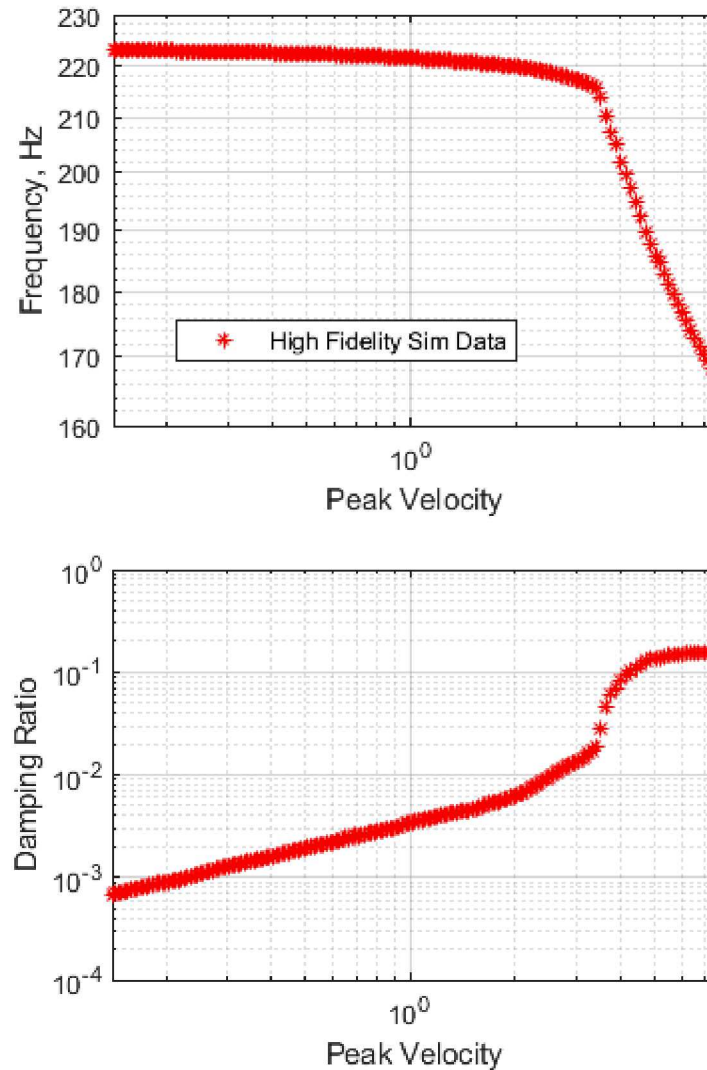
Estimate modal amplitude dependent natural frequencies,  $\omega_r(\alpha)$ , and damping ratios,  $\zeta_r(\alpha)$ , of high-fidelity model and reduced models with whole joints [1]



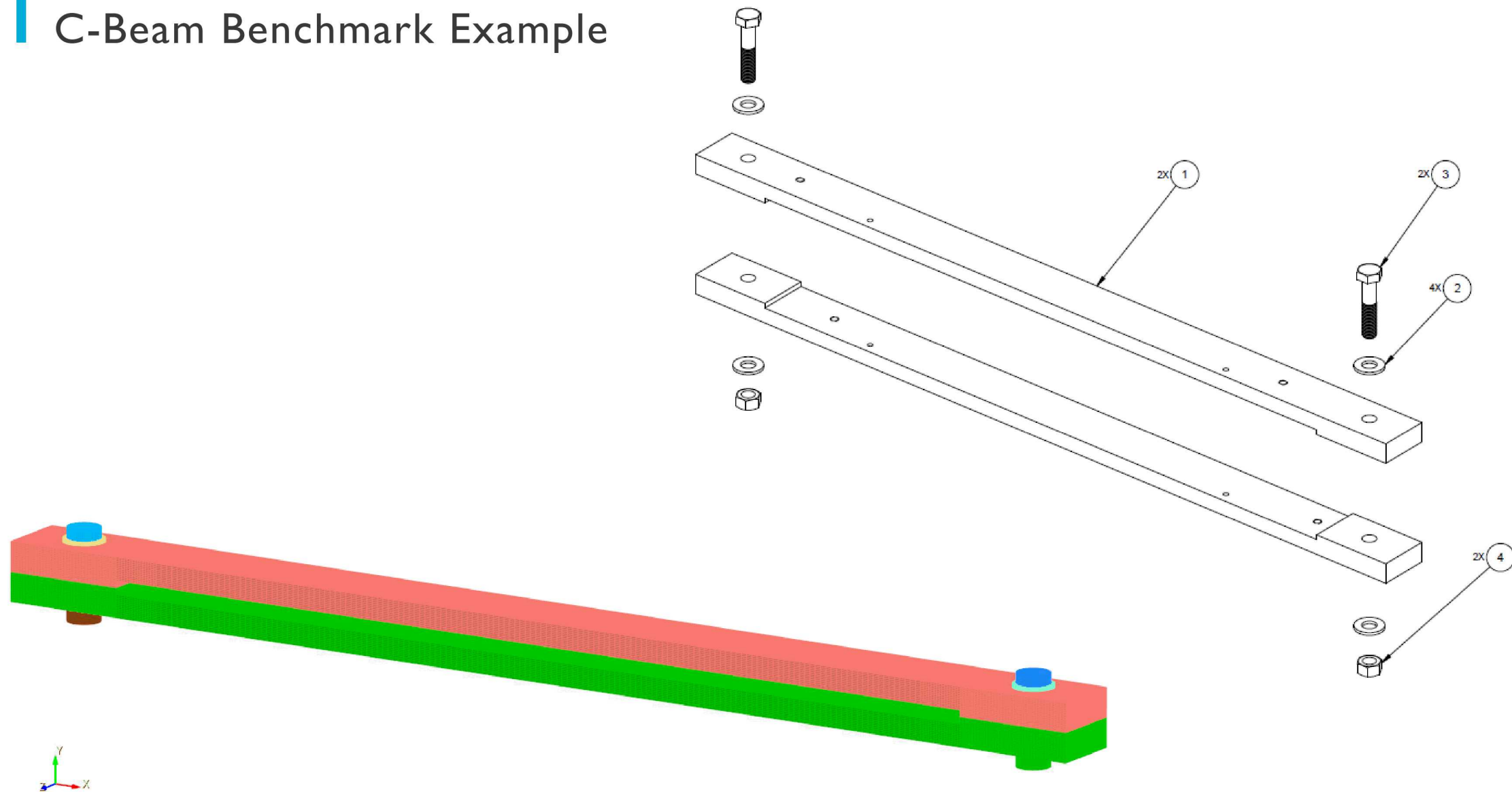
[1] M. S. Allen, R. M. Lacayo, and M. R. W. Brake, "Quasi-static Modal Analysis based on Implicit Condensation for Structures with Nonlinear Joints," presented at the ISMA2016 - International Conference on Noise and Vibration Engineering, Leuven, Belgium, 2016.



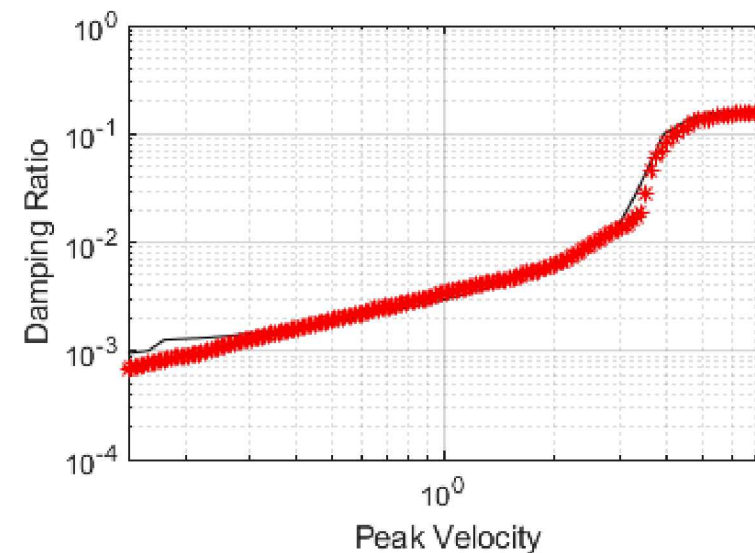
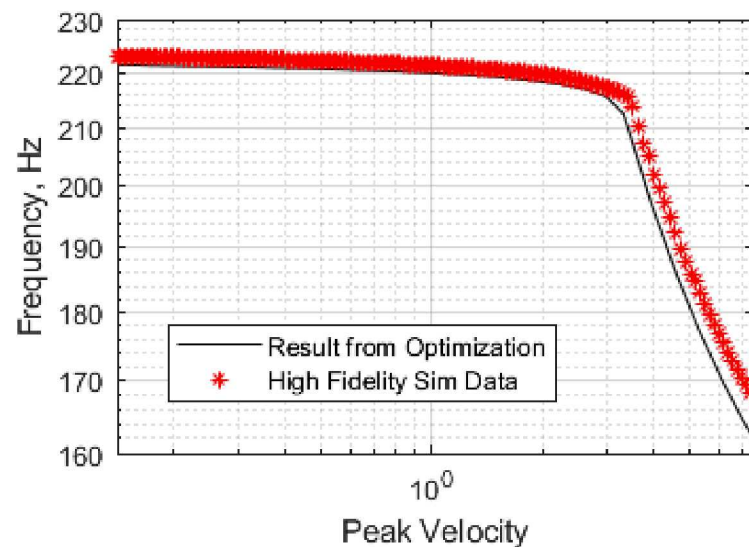
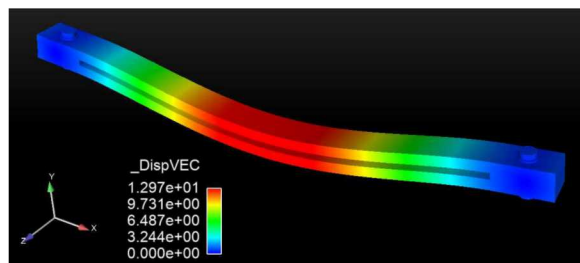
# Whole joint calibration via multi-objective optimization [1]



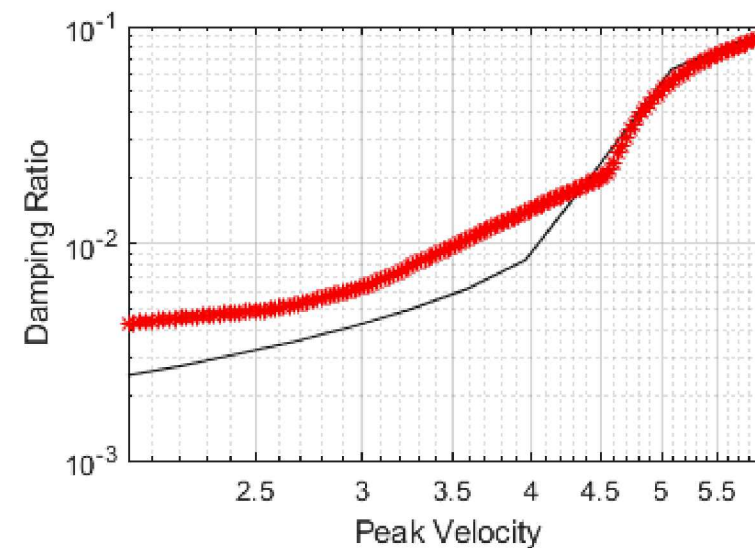
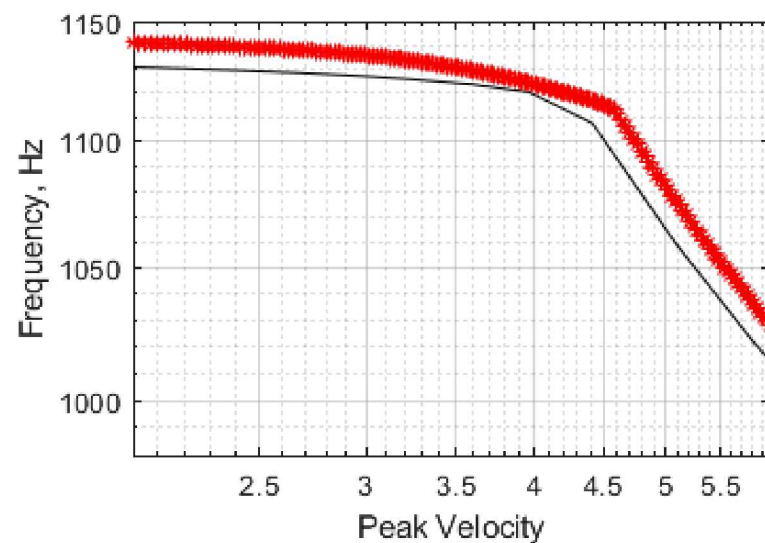
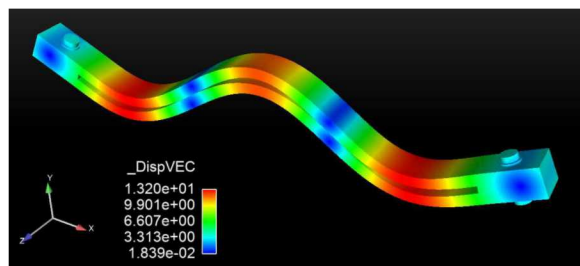
# C-Beam Benchmark Example



Mode 1 223 Hz



Mode 8 1142 Hz

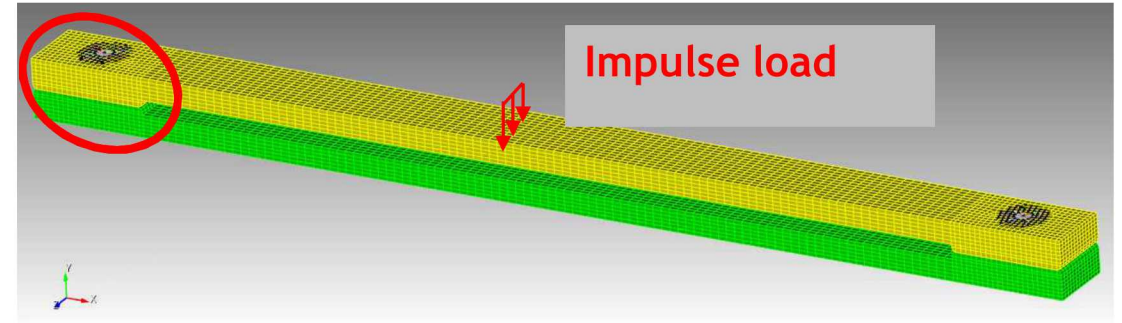
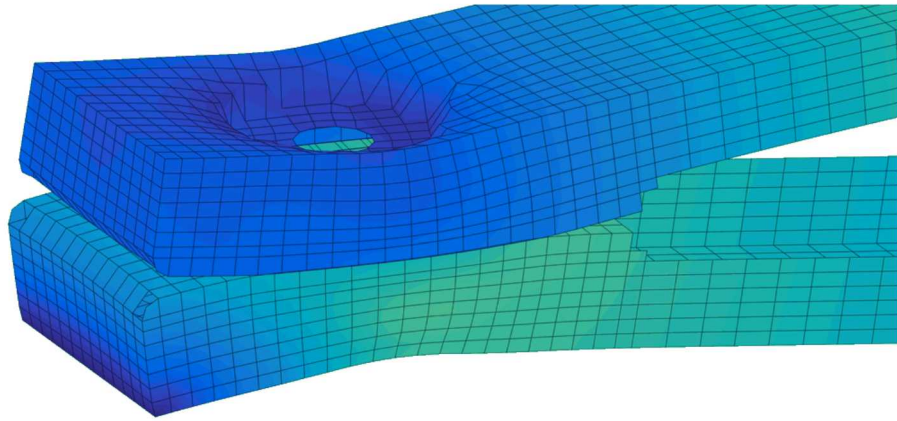


Nonlinear frictional contact at mechanical interfaces

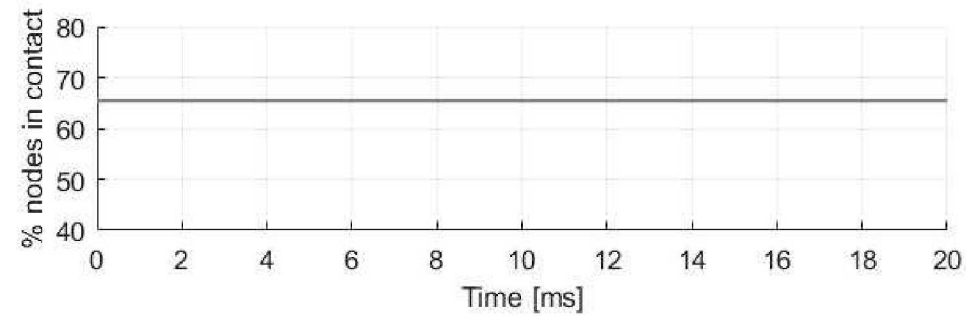
- Whole joint modeling
- Interface reduction



# What if the joint is flexible?



Nodes in contact: 66%

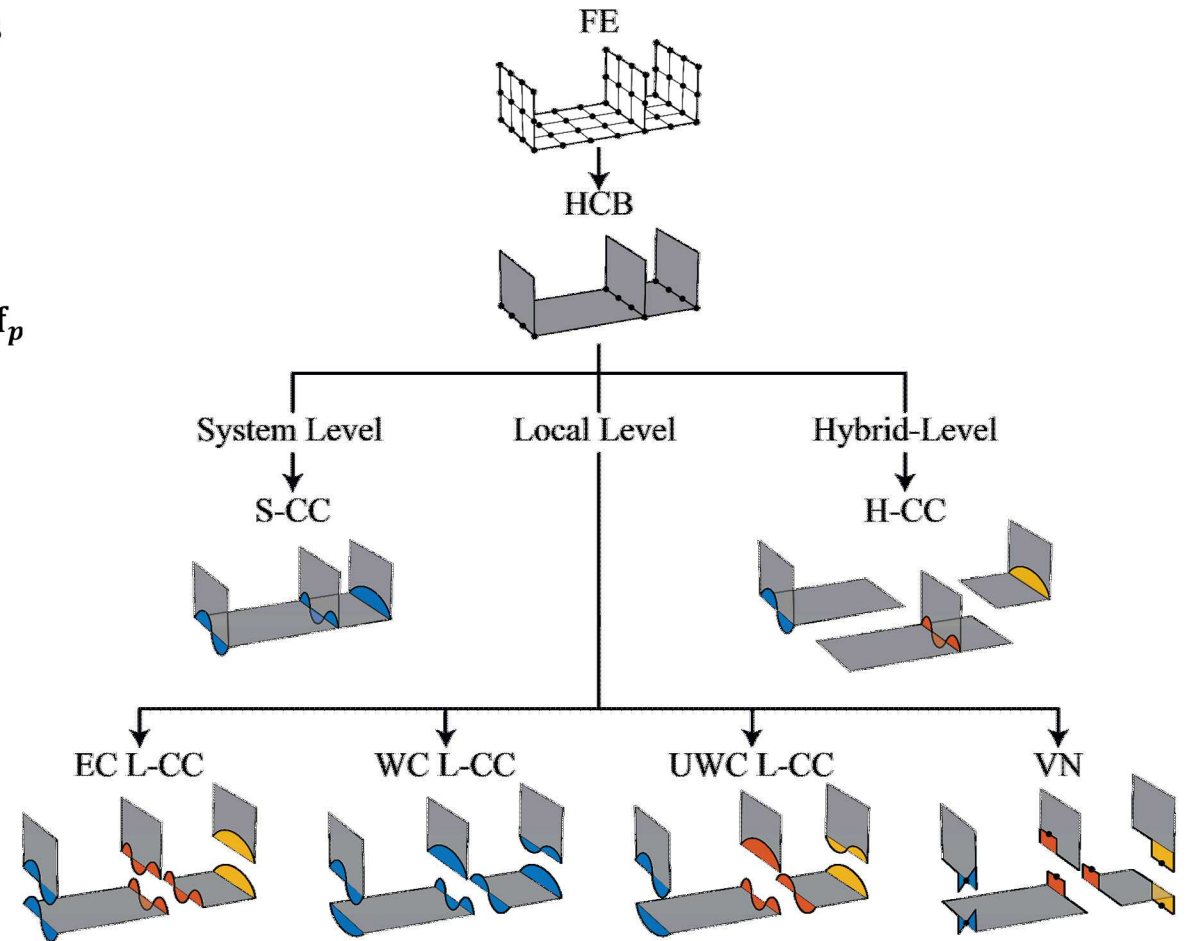


HCB reduced model dominated by potentially thousands of r-set DOF

$$\begin{bmatrix} \mathbf{I}_{ii} & \mathbf{M}_{ir}^{\text{HCB}} & \mathbf{M}_{ip}^{\text{HCB}} \\ \mathbf{M}_{ri}^{\text{HCB}} & \mathbf{M}_{rr}^{\text{HCB}} & \mathbf{M}_{rp}^{\text{HCB}} \\ \mathbf{M}_{pi}^{\text{HCB}} & \mathbf{M}_{pr}^{\text{HCB}} & \mathbf{M}_{pp}^{\text{HCB}} \end{bmatrix} \begin{Bmatrix} \ddot{\mathbf{q}}_i \\ \ddot{\mathbf{u}}_r \\ \ddot{\mathbf{u}}_p \end{Bmatrix} + \begin{bmatrix} \mathbf{\Lambda}_{ii}^{\text{FI}} & \mathbf{0} & \mathbf{0} \\ \mathbf{0} & \mathbf{K}_{rr}^{\text{HCB}} & \mathbf{K}_{rp}^{\text{HCB}} \\ \mathbf{0} & \mathbf{K}_{pr}^{\text{HCB}} & \mathbf{K}_{pp}^{\text{HCB}} \end{bmatrix} \begin{Bmatrix} \mathbf{q}_i \\ \mathbf{u}_r \\ \mathbf{u}_p \end{Bmatrix} + \begin{Bmatrix} \mathbf{0} \\ \mathbf{f}_r(\mathbf{u}_r) \\ \mathbf{0} \end{Bmatrix} = \begin{Bmatrix} \mathbf{f}_p \end{Bmatrix}$$

Research challenge: how can we further reduce these equations?

Explored the extension of interface reduction techniques [1] to problems involving nonlinear contact [2,3]



[1] Krattiger, D. et al. "Interface reduction for Hurty/Craig-Bampton substructured models: Review and improvements," *Mechanical Systems and Signal Processing*, 114, pp 579-603, 2019.

[2] Kuether RJ, Coffin PB, Brink AR "On Hurty/Craig-Bampton Substructuring With Interface Reduction on Contacting Surfaces," *ASME International Design Engineering Technical Conferences and Computers and Information in Engineering Conference, Volume 8: 29th Conference on Mechanical Vibration and Noise*.

[3] Hughes, P.J. et al. "Interface Reduction on Hurty/Craig-Bampton Substructures with Frictionless Contact," *2018 International Modal Analysis Conference (IMAC) XXXVI*, Orlando, FL, 2018.

Solve the quasi-static version of the HCB model for preloaded equilibrium

$$\begin{bmatrix} \Lambda_{ii}^{FI} & 0 & 0 \\ 0 & \mathbf{K}_{rr}^{HCB} & \mathbf{K}_{rp}^{HCB} \\ 0 & \mathbf{K}_{pr}^{HCB} & \mathbf{K}_{pp}^{HCB} \end{bmatrix} \begin{Bmatrix} \mathbf{q}_i \\ \mathbf{u}_r \\ \mathbf{u}_p \end{Bmatrix} + \begin{Bmatrix} 0 \\ \mathbf{f}_r(\mathbf{u}_r) \\ 0 \end{Bmatrix} = \begin{Bmatrix} 0 \\ 0 \\ \mathbf{f}_{pre} \end{Bmatrix}$$

Apply a secondary reduction about the preloaded equilibrium such that

$$\mathbf{v} = \begin{Bmatrix} \mathbf{q}_i \\ \mathbf{u}_r \\ \mathbf{u}_p \end{Bmatrix} = \mathbf{v}_{pre} + \begin{bmatrix} \mathbf{I} & 0 & 0 \\ 0 & \Phi^{SCC} & \Psi^{SCCe} \\ 0 & 0 & \mathbf{I} \end{bmatrix} \begin{Bmatrix} \mathbf{q}_i \\ \mathbf{q}_r \\ \mathbf{u}_p \end{Bmatrix} = \mathbf{v}_{pre} + \mathbf{T}^{SCCe} \mathbf{w}$$

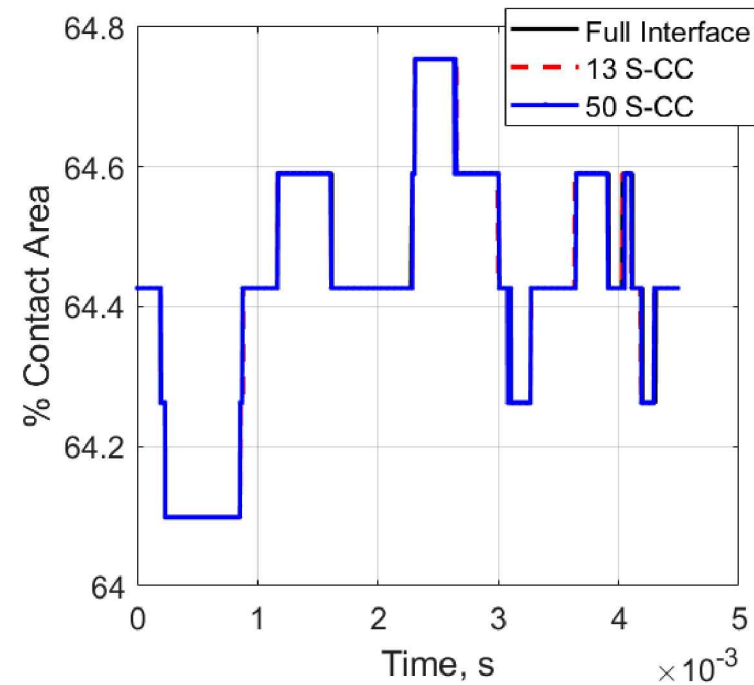
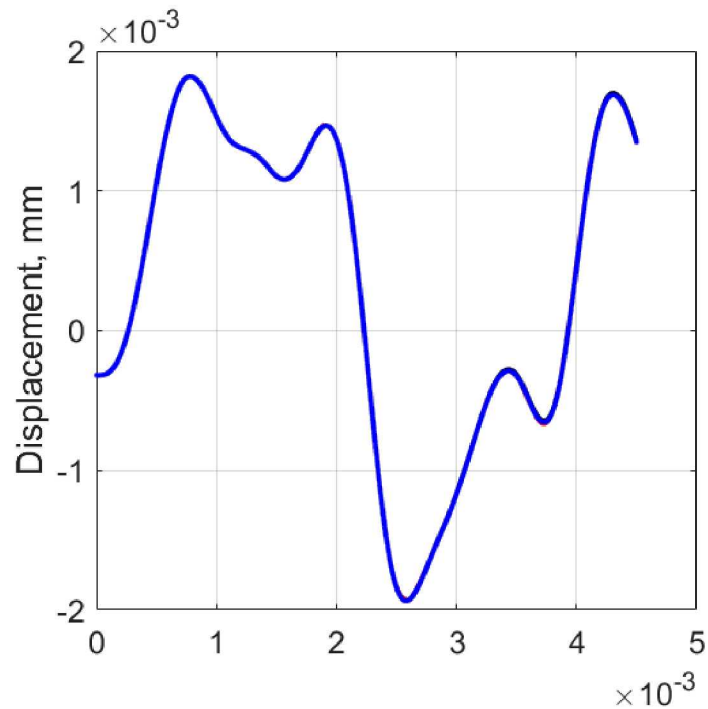
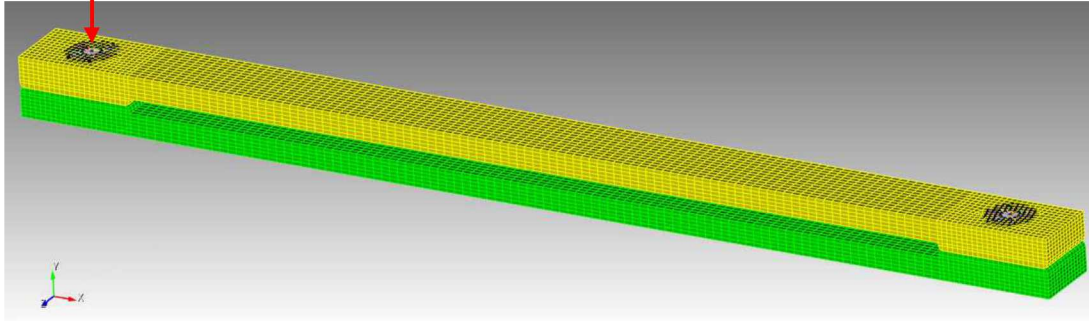
where the tangent S-CC modes and static constraint modes computed about preloaded state

$$\left[ \mathbf{K}_{rr}^{HCB} + \underbrace{\frac{\partial \mathbf{f}_r(\mathbf{u}_r)}{\partial \mathbf{u}_r}}_{\text{Tangent stiffness contributions about deformed state}} \bigg|_{\mathbf{v}_{pre}} - (\omega^{SCC})^2 \mathbf{M}_{rr}^{HCB} \right] \Phi_s^{SCC} = 0 \quad \Psi^{SCCe} = - \left( \mathbf{K}_{rr}^{HCB} + \underbrace{\frac{\partial \mathbf{f}_r(\mathbf{u}_r)}{\partial \mathbf{u}_r}}_{\text{Tangent stiffness contributions about deformed state}} \bigg|_{\mathbf{v}_{pre}} \right)^{-1} \mathbf{K}_{rp}^{HCB}$$

Tangent stiffness contributions  
about deformed state

## Time-domain simulations due to impulse load

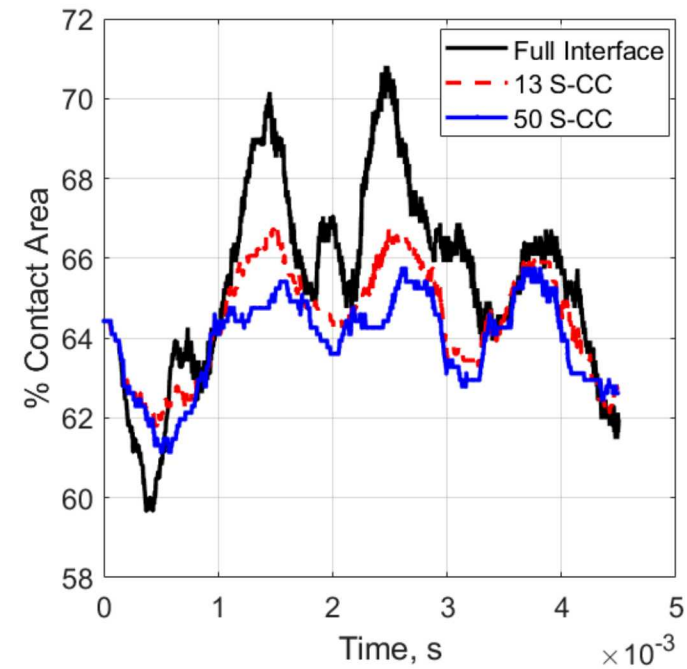
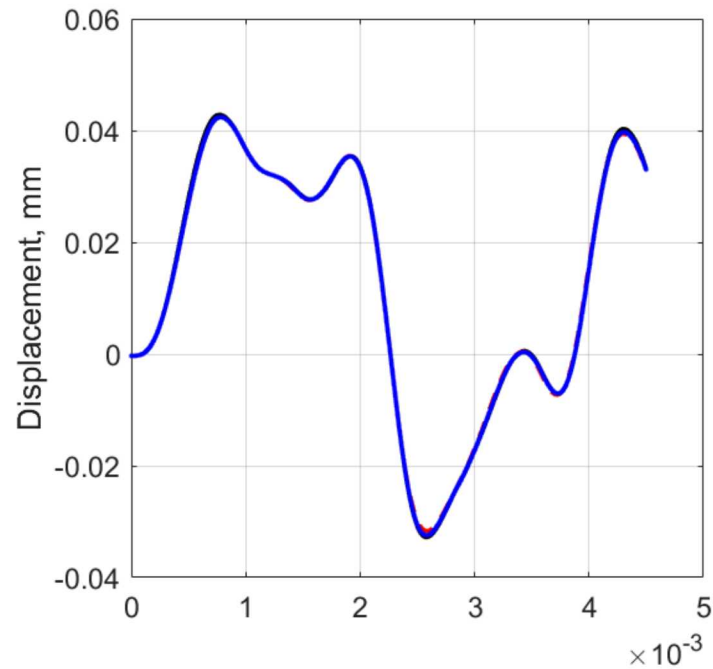
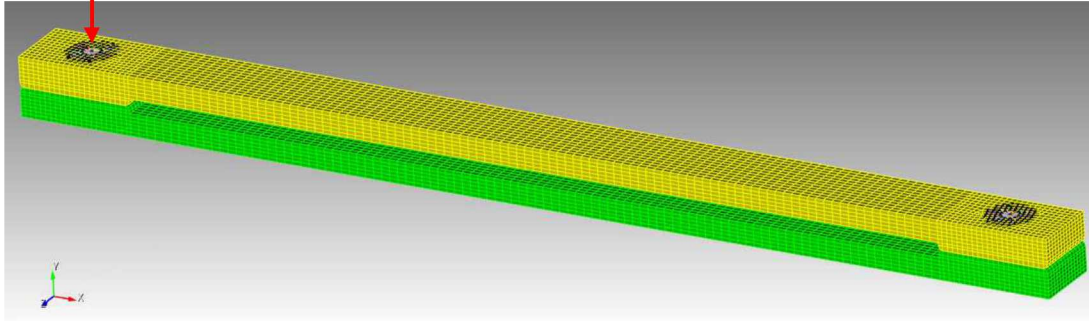
Impulse load A = 100 N





## Time-domain simulations due to impulse load

Impulse load  $A = 2000$  N



Using the S-CC modes from the initial reduction on the interface

$$\mathbf{v} = \begin{Bmatrix} \mathbf{q}_i \\ \mathbf{u}_r \\ \mathbf{u}_p \end{Bmatrix} = \mathbf{v}_{\text{pre}} + \begin{bmatrix} \mathbf{I} & 0 & 0 \\ 0 & \boldsymbol{\Phi}^{\text{SCC}} & \boldsymbol{\Psi}^{\text{SCCe}} \\ 0 & 0 & \mathbf{I} \end{bmatrix} \begin{Bmatrix} \mathbf{q}_i \\ \mathbf{q}_r \\ \mathbf{u}_p \end{Bmatrix} = \mathbf{v}_{\text{pre}} + \mathbf{T}^{\text{SCCe}} \mathbf{w}$$

Take Taylor series expansion around preloaded configuration to get modal derivatives

$$\mathbf{T}_{i(\mathbf{w})} = \mathbf{T}_i|_c + \underbrace{\sum_{j=1}^{n_w} \frac{\partial \mathbf{T}_i}{\partial w_j} \bigg|_c}_{\text{Describe how modes change for a given modal amplitude of response}} (w_j - w_j(\text{PL})) + \text{H. O. T.}$$

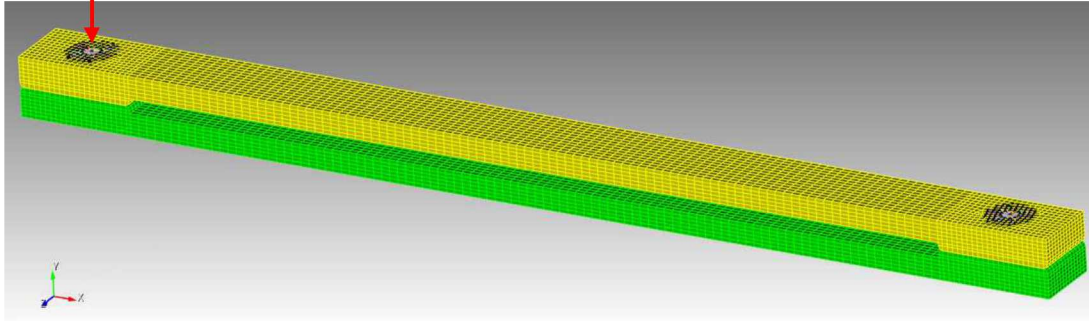
Describe how modes change for a given modal amplitude of response

Take Taylor series expansion around preloaded configuration to get modal derivatives

$$\mathbf{T}^{\text{TVD}} = \begin{bmatrix} \mathbf{T}^{\text{SCCe}} & \frac{\partial \mathbf{T}^{\text{SCCe}}}{\partial \mathbf{w}} \end{bmatrix}$$

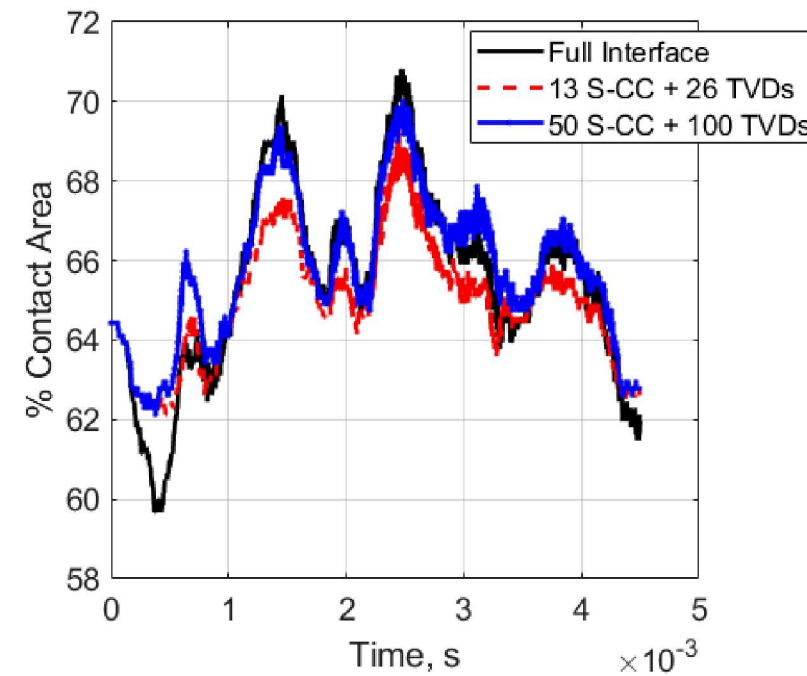
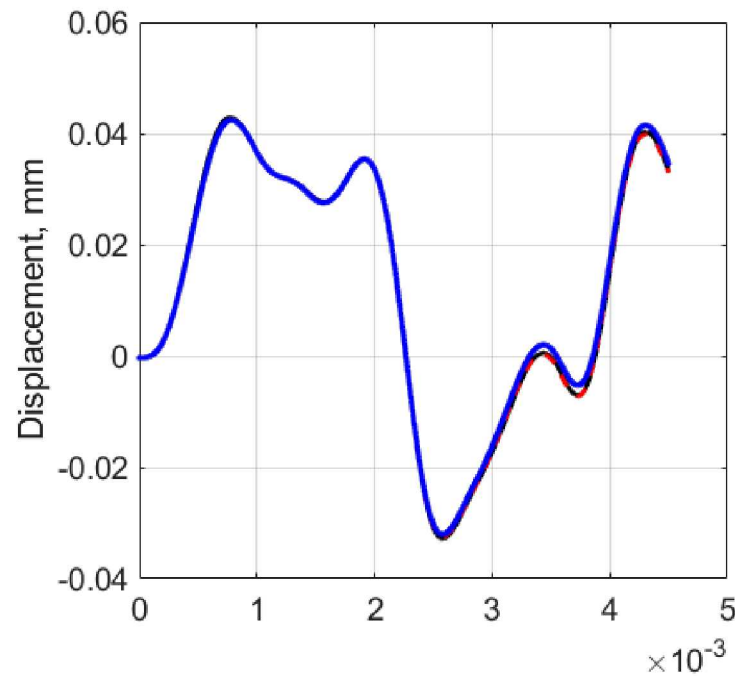
## Time-domain simulations due to impulse load

Impulse load A = 2000 N



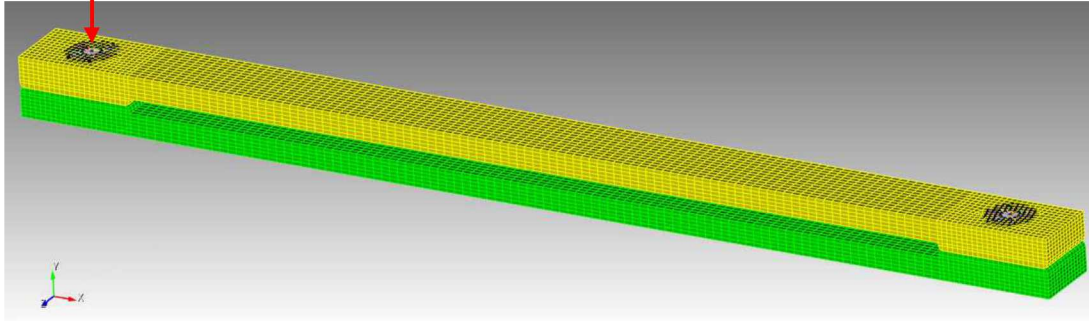
\*Full interface ~ 90 minutes

\*\* IR ROMs - 2 minutes



## Time-domain simulations due to impulse load

Impulse load A = 2000 N



HCB-SCCe-TVD ROM

272 DOF

2.0 min





## Concluding remarks

Covered NLRMs of structures with contact and friction at interfaces

- Whole joint modeling approach and calibration
- Interface reduction to maintain kinematics of joint

Many considerations required for performing model order reduction of nonlinear systems

- What type of modes?
- How many modes?
- Introducing stability/convergence issues?

Future challenges/investigations

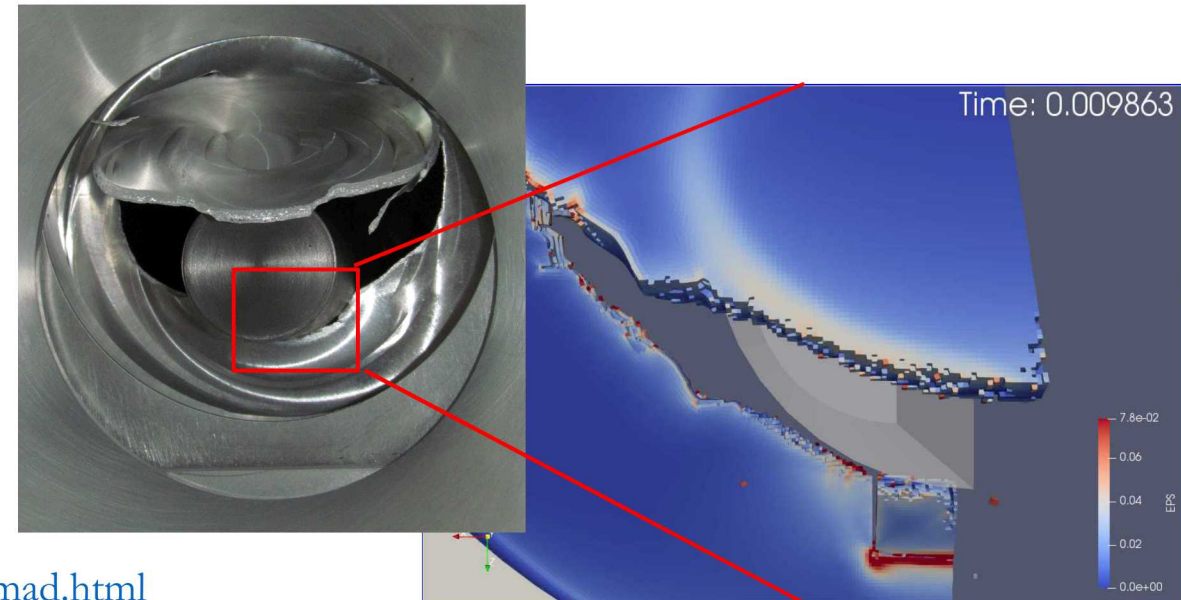
- Simulation code implementation
- Unifying ROM strategy for all types of nonlinearities (i.e. nonlinear normal modes)?

## Research collaboration opportunities for students and professors

- Hosted by Sandia National Laboratories and University of New Mexico
- Collaborative opportunity to work on research in topic areas across nonlinear mechanics and dynamics
- 7 week program held in Albuquerque, New Mexico; open to graduate and highly qualified undergraduate level students



[nomad@sandia.gov](mailto:nomad@sandia.gov)

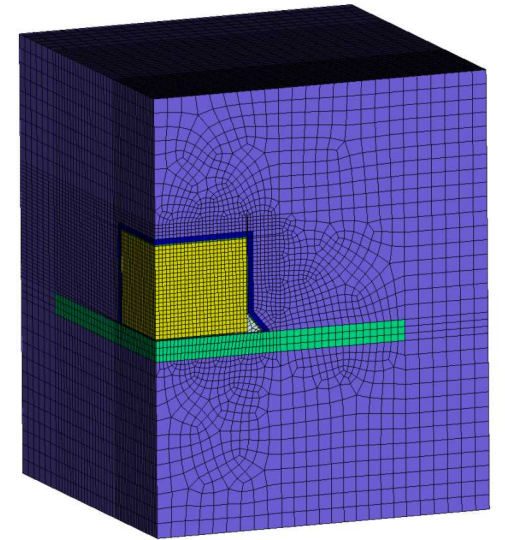
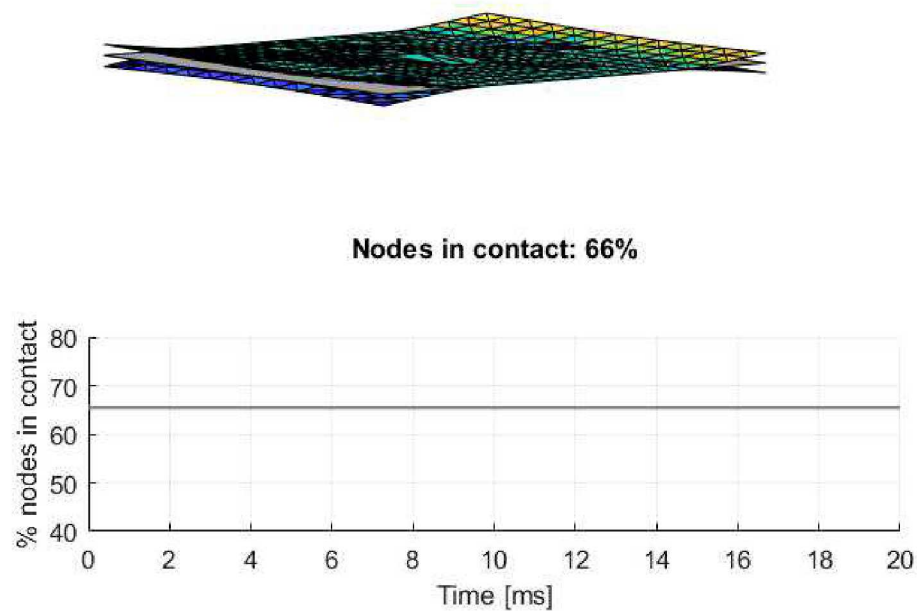
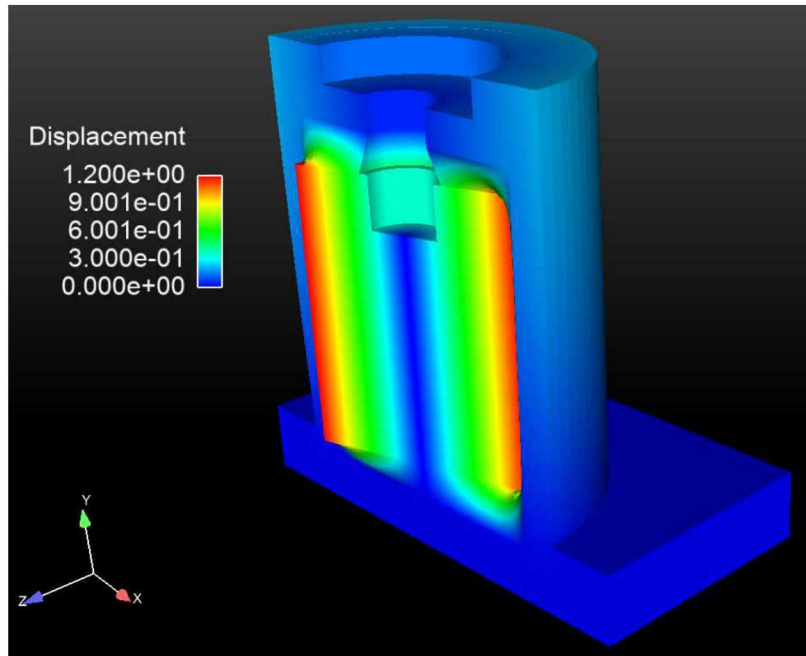


For more information, please visit:

[http://www.sandia.gov/careers/students\\_postdocs/internships/institutes/nomad.html](http://www.sandia.gov/careers/students_postdocs/internships/institutes/nomad.html)

## Contact information

- Robert Kuether, [rjkueth@sandia.gov](mailto:rjkueth@sandia.gov)



## Nonlinear frictional contact at mechanical interfaces

- Whole joint modeling
- Interface reduction

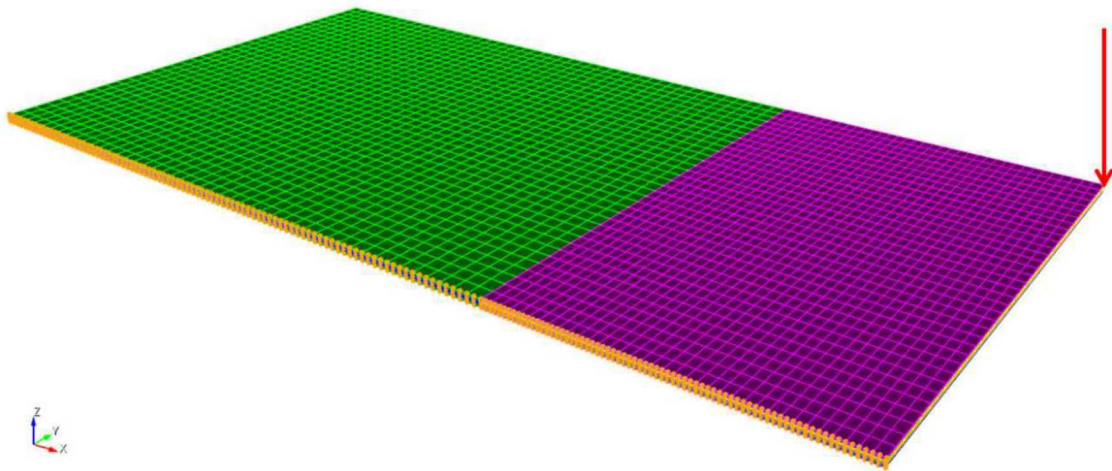
## Linear viscoelastic material behavior

- Composite sandwich plates
- Encapsulate electronics

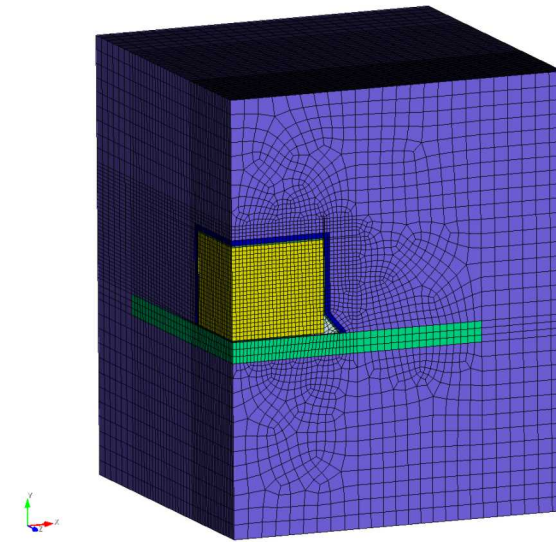


## Model order reduction for linear viscoelastic FEA models

- Finite element models with linear viscoelastic materials require direct time integration
  - ROMs provide solver efficiency while preserving accuracy
  - Limited to lightly damped, linear elastic materials
- Developed a ROM framework for viscoelastic material constitutive laws
  - E.g. low density PMDI foam, cellular silicone, etc..



Sandwich layer damping treatments

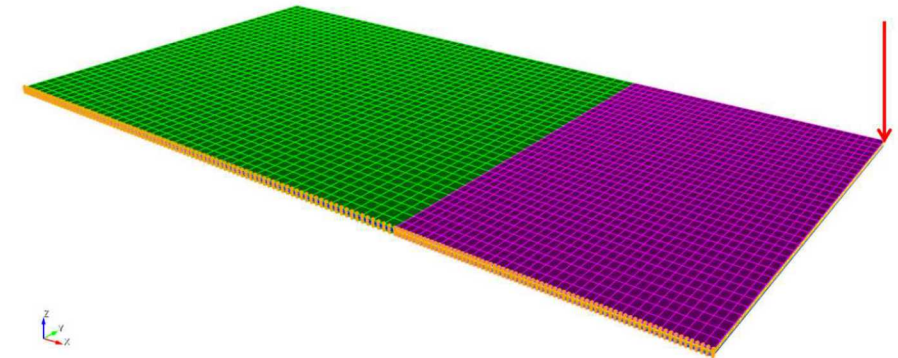


Vibration sensitive electronics  
potted in foam or polymer

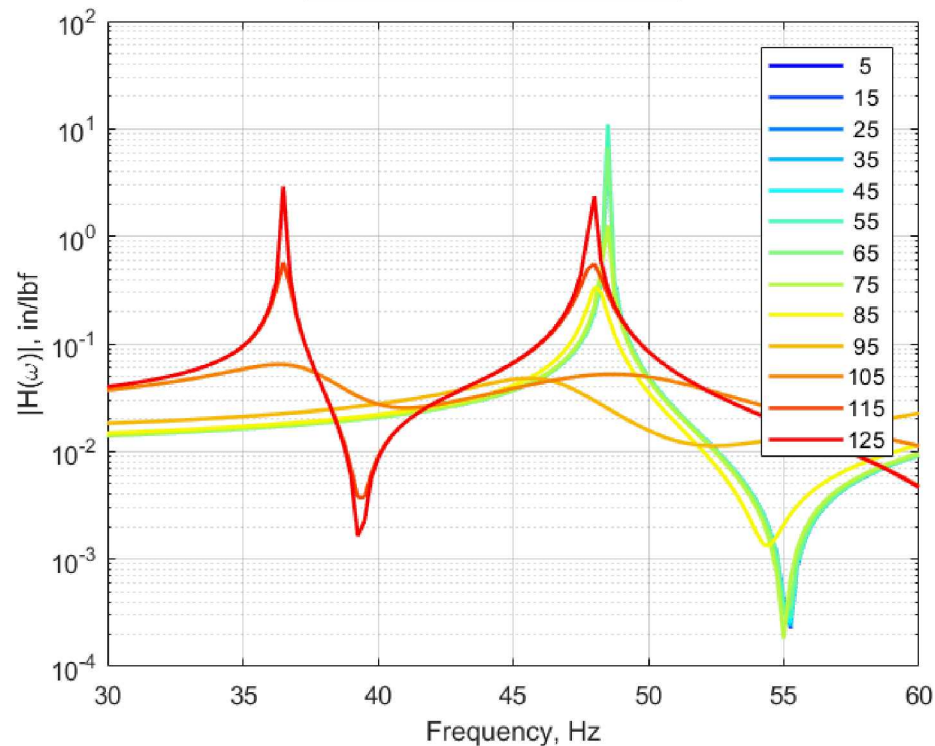
# How does viscoelastic material behavior influence the global response?

## Model reduction of linear viscoelastic FEMs

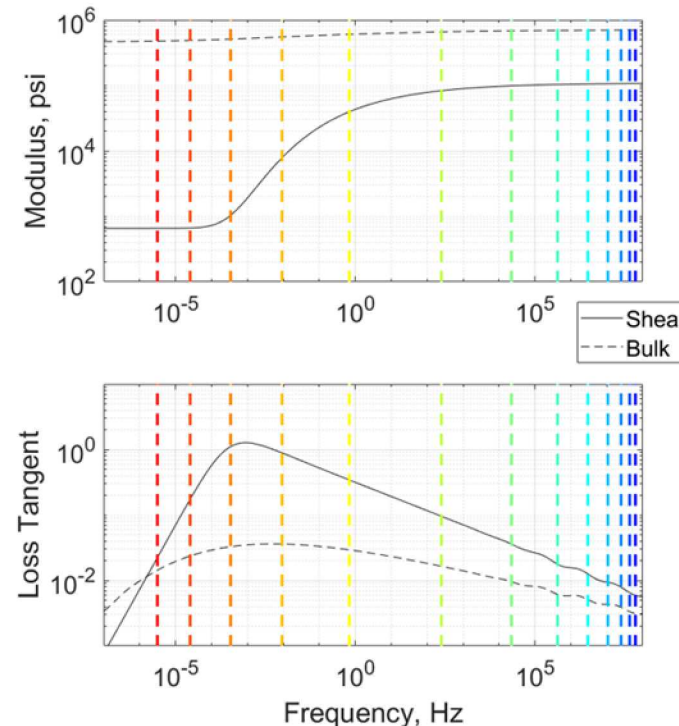
- Frequency-dependent material properties
- Obeys time-temperature superposition
- Results in nonlinear eigenvalue problem



## Transfer Function



## 828 DEA Master Curves



Stiffness and damping change as a function of operating temperature!

# Governing equations of motion

Governing equations-of-motion can be reduced using Galerkin approach with a variety of modal bases [1]

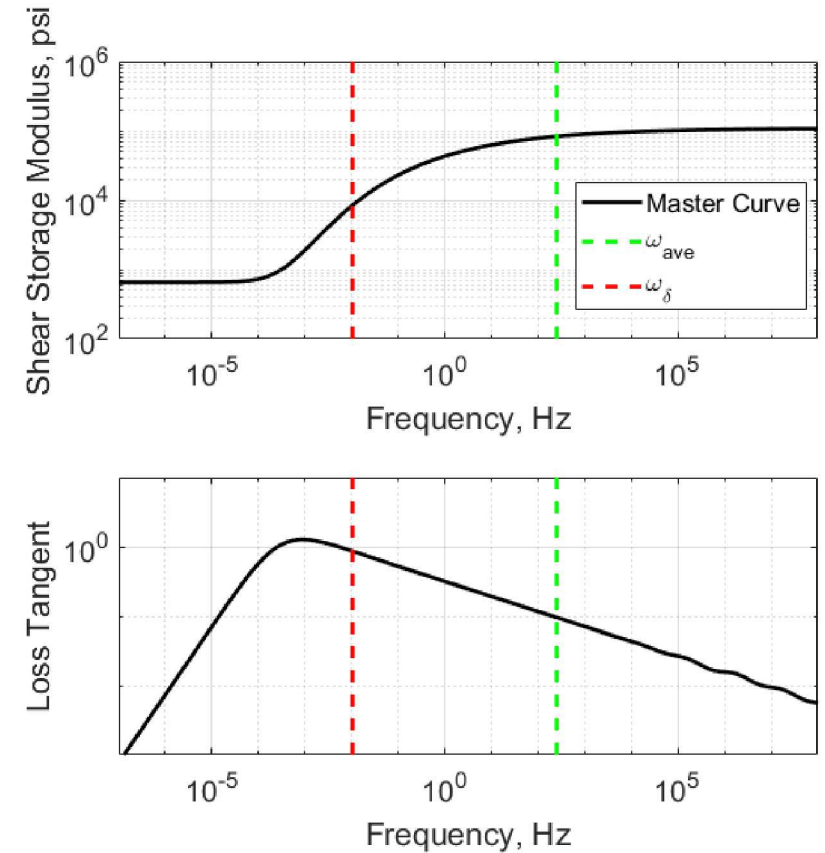
$$\mathbf{M}\ddot{\mathbf{x}} + \mathbf{C}\dot{\mathbf{x}} + \mathbf{K}_K \int_0^t \zeta_K(t-\tau)\dot{\mathbf{x}}(\tau)d\tau + \mathbf{K}_G \int_0^t \zeta_G(t-\tau)\dot{\mathbf{x}}(\tau)d\tau + \mathbf{K}_\infty \mathbf{x} = \mathbf{f}(t)$$

Laplace transformation produces a nonlinear eigenvalue problem

$$\left( \lambda_r^2 \mathbf{M} + \lambda_r \mathbf{C} + \lambda_r \mathbf{K}_K \sum_{i=1}^{N_K} \frac{\hat{K}_i}{\lambda_r + 1/\tau_{K,i}} + \lambda_r \mathbf{K}_G \sum_{i=1}^{N_G} \frac{\hat{G}_i}{\lambda_r + 1/\tau_{G,i}} + \mathbf{K}_\infty \right) \boldsymbol{\phi}_r^* = 0$$

Accurate but expensive – two-tier reduction developed to reduce cost of nonlinear eigensolver [2]

- Step 1: Multi-model Approach [3]
- Step 2: Exact complex modes via iterative Newton solver



[1] L. Rouleau, J.-F. Deü, and A. Legay, "A comparison of model reduction techniques based on modal projection for structures with frequency-dependent damping," *Mechanical Systems and Signal Processing*, vol. 90, pp. 110-125, 2017.

[2] Kuether, R.J., "Two-tier Model Reduction of Viscoelastically Damped Finite Element Models", *Computers & Structures*, (in review).

[3] E. Balmès, "Parametric Families of Reduced Finite Element Models. Theory and Applications," *Mechanical Systems and Signal Processing*, vol. 10, no. 4, pp. 381-394, 1996.



## Step 1: Multi-model approach [1]

Starting from the nonlinear eigenvalue problem

$$\left( \lambda_r^2 \mathbf{M} + \lambda_r \mathbf{C} + \lambda_r \mathbf{K}_K \sum_{i=1}^{N_K} \frac{\hat{K}_i}{\lambda_r + 1/\tau_{K,i}} + \lambda_r \mathbf{K}_G \sum_{i=1}^{N_G} \frac{\hat{G}_i}{\lambda_r + 1/\tau_{G,i}} + \mathbf{K}_\infty \right) \boldsymbol{\Phi}_r^* = 0$$

Linearize Prony series about  $\lambda_r = r + i\omega$ , perform some mathematical manipulation, and ignore the damping terms to get a real, frequency dependent eigenvalue problem

$$\left( \lambda_r^2 \mathbf{M} + \mathbf{K}_K \sum_{i=1}^{N_K} \frac{\hat{K}_i \tau_{K,i}^2 \omega^2}{1 + (\omega \tau_{K,i})^2} + \mathbf{K}_G \sum_{i=1}^{N_G} \frac{\hat{G}_i \tau_{G,i}^2 \omega^2}{1 + (\omega \tau_{G,i})^2} + \mathbf{K}_\infty \right) \boldsymbol{\Phi}_r = 0$$

Solve for a set real eigenmode bases by sampling at various linearized frequencies,  $\omega$

- The extreme limits bound the problem when  $\omega \rightarrow 0$  and  $\omega \rightarrow \infty$

$$\boldsymbol{\Phi}_{MM} = [\boldsymbol{\Phi}_\infty \quad \boldsymbol{\Phi}_g \quad \boldsymbol{\Phi}_\delta \quad \mathbf{R}_\infty \quad \mathbf{R}_g \quad \text{Re}(\mathbf{R}_\delta^*) \quad \text{Im}(\mathbf{R}_\delta^*)]$$



## Step 2: Exact complex modes

Now rewriting the nonlinear eigenvalue problem in the tier 1 reduced space

$$\left( \lambda_r^2 \bar{\mathbf{M}} + \lambda_r \bar{\mathbf{C}} + \lambda_r \bar{\mathbf{K}}_K \sum_{i=1}^{N_K} \frac{\hat{K}_i}{\lambda_r + 1/(\tau_{K,i} a_T)} + \lambda_r \bar{\mathbf{K}}_G \sum_{i=1}^{N_G} \frac{\hat{G}_i}{\lambda_r + 1/(\tau_{G,i} a_T)} + \bar{\mathbf{K}}_\infty \right) \bar{\boldsymbol{\Phi}}_r^* = 0$$

Newton's method [1] used to iteratively solve for each  $\bar{\boldsymbol{\Phi}}_r^*$  and  $\lambda_r$

$$\begin{Bmatrix} \bar{\boldsymbol{\Phi}}_{r,k+1}^* \\ \lambda_{r,k+1} \end{Bmatrix} = \begin{Bmatrix} \bar{\boldsymbol{\Phi}}_{r,k}^* \\ \lambda_{r,k} \end{Bmatrix} - \left[ \frac{\partial \mathbf{h}}{\partial \bar{\boldsymbol{\Phi}}_r^*} \bigg|_{\bar{\boldsymbol{\Phi}}_{r,k}^*, \lambda_{r,k}} \quad \frac{\partial \mathbf{h}}{\partial \lambda_r} \bigg|_{\bar{\boldsymbol{\Phi}}_{r,k}^*, \lambda_{r,k}} \right]^{-1} \mathbf{h}_k(\lambda_{r,k}, \bar{\boldsymbol{\Phi}}_{r,k}^*)$$

where the residual equation is defined as

$$\mathbf{h}_k(\lambda_{r,k}, \bar{\boldsymbol{\Phi}}_{r,k}^*) = \begin{Bmatrix} \left( \lambda_{r,k}^2 \bar{\mathbf{M}} + \lambda_{r,k} \bar{\mathbf{C}} + \lambda_{r,k} \bar{\mathbf{K}}_K \sum_{i=1}^{N_K} \frac{\hat{K}_i}{\lambda_{r,k} + 1/(\tau_{K,i} a_T)} + \lambda_{r,k} \bar{\mathbf{K}}_G \sum_{i=1}^{N_G} \frac{\hat{G}_i}{\lambda_{r,k} + 1/(\tau_{G,i} a_T)} + \bar{\mathbf{K}}_\infty \right) \bar{\boldsymbol{\Phi}}_{r,k}^* \\ \bar{\boldsymbol{\Phi}}_{r,k}^{*H} \bar{\mathbf{M}} \bar{\boldsymbol{\Phi}}_{r,k}^* - 1 \end{Bmatrix}$$

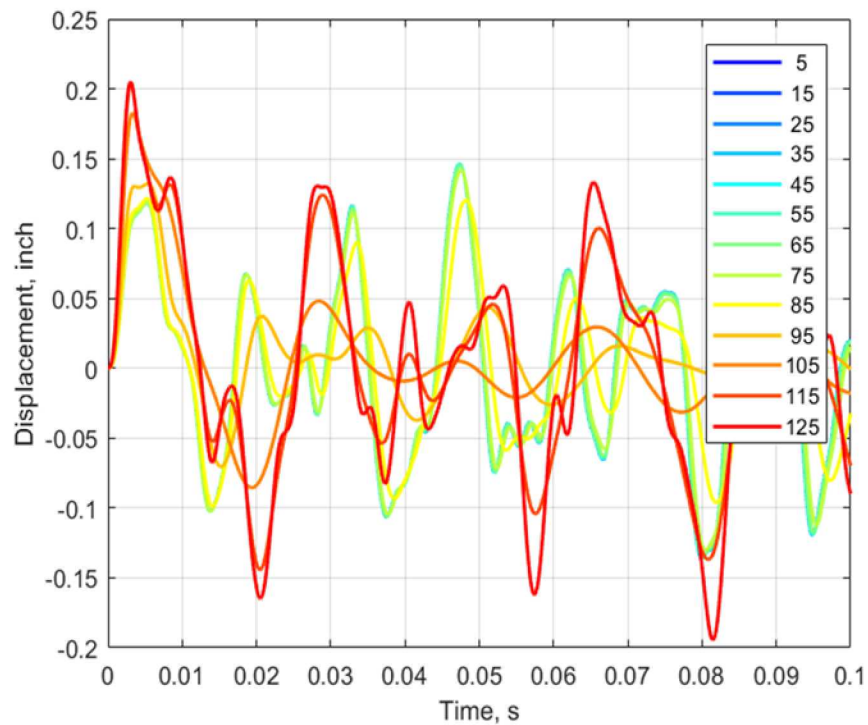
Advantage: solving this equation in a reduced space much more computationally efficient compared to solving it on the full-scale model

## Example demonstration of visco-ROM approach

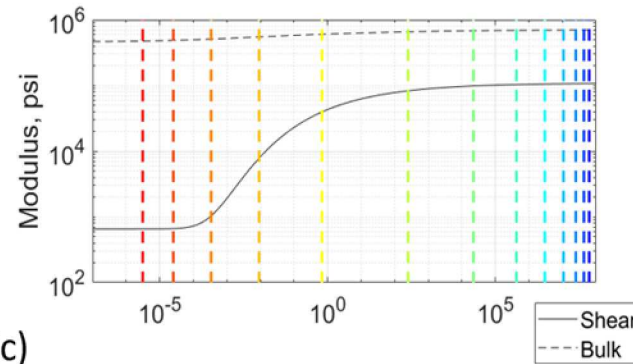
Sandwich plate structure with haversine impulse applied at the corner

- 130,000 DOF

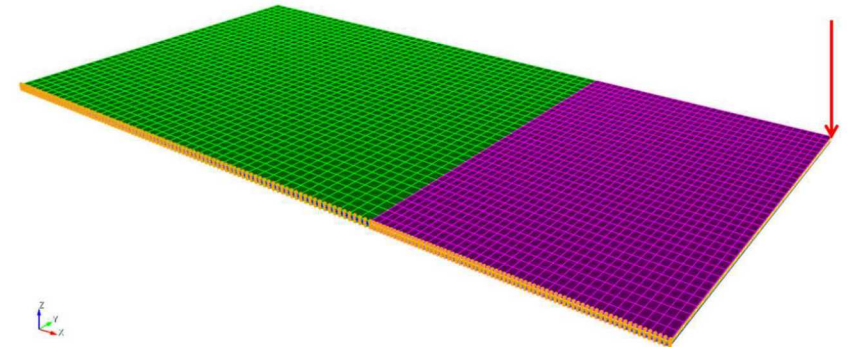
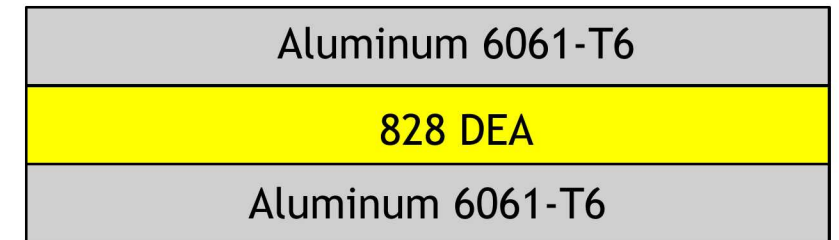
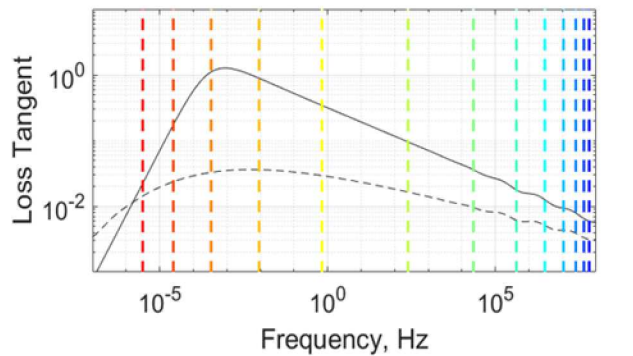
(a)



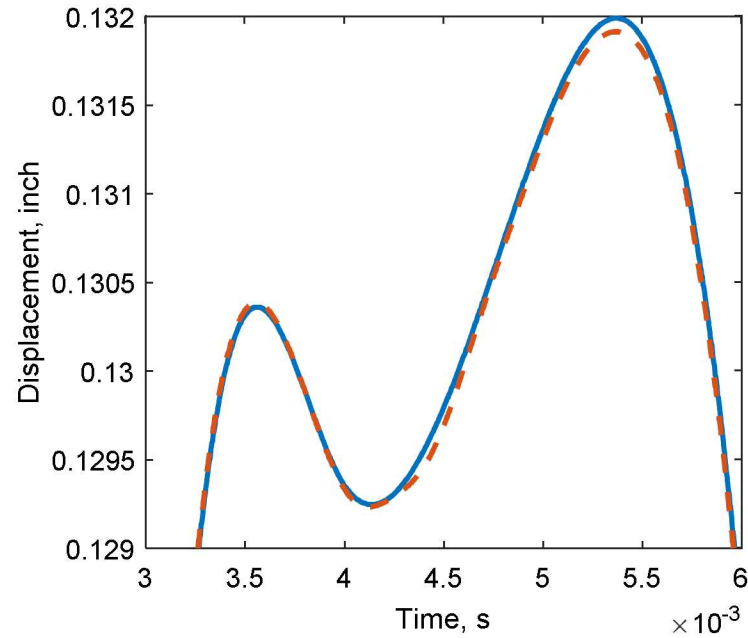
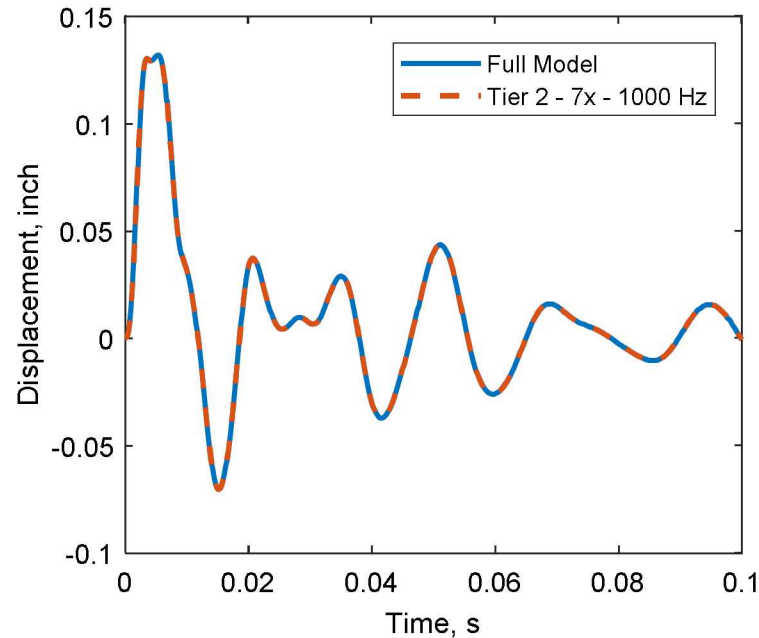
(b)



(c)



# Example demonstration of visco-ROM approach



Five orders of magnitude in  
online simulation costs

Global relative error 0.08 %

$$GRE = \frac{\sqrt{\sum_{t \in P} (\mathbf{x}(t) - \hat{\mathbf{x}}(t))^T (\mathbf{x}(t) - \hat{\mathbf{x}}(t))}}{\sqrt{\sum_{t \in P} \mathbf{x}(t)^T \mathbf{x}(t)}}$$

ROM	Total DOF	Tier-one mode calculation	Tier-two mode calculation	Offline cost (mode calculation)	Online cost (numerical simulation)
Full-order Model	130,305	-	-	0 s	4.51E+06 s
Tier-2 7x-1000 Hz	38	832.4 s	16.4 s	848.8 s	12.8 s