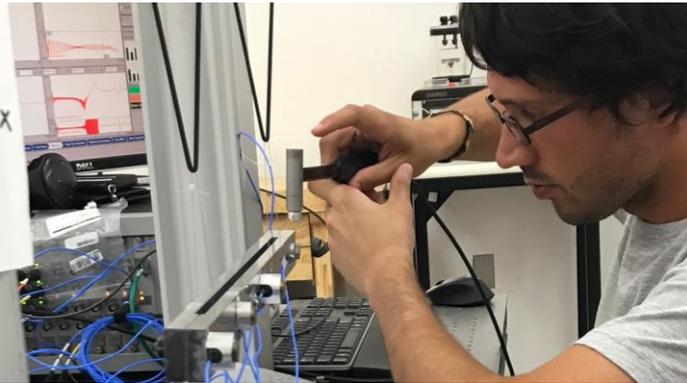
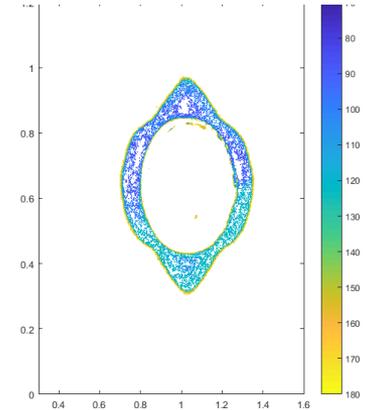
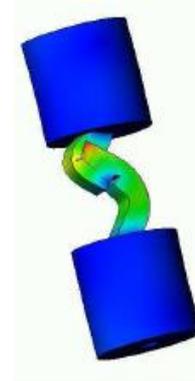


Exceptional service in the national interest



N=O=MAD



A Priori Methods to Assess the Strength of Nonlinearities for Design Applications

Craig Broadman, She'ifa Punla-Green, Edward Rojas

Agenda

1. Introduction
2. Project Overview
3. Numerical Methodology
4. Experimental Methodology
5. Characterization of Strength of Nonlinearity
6. Conclusion



Research Team

Craig Broadman

Rice University



Edward Rojas

New Mexico State University



She'ifa Punla-Green

Rensselaer Polytechnic Institute



Mentor Team

Matthew Brake

Rice University



Rob Flicek

Sandia National Laboratories

Ben Pacini



Eric Dodgen

Department of Energy's National Security Campus



Dane Quinn

University of Akron



Christoph Schwingshackl

Imperial College

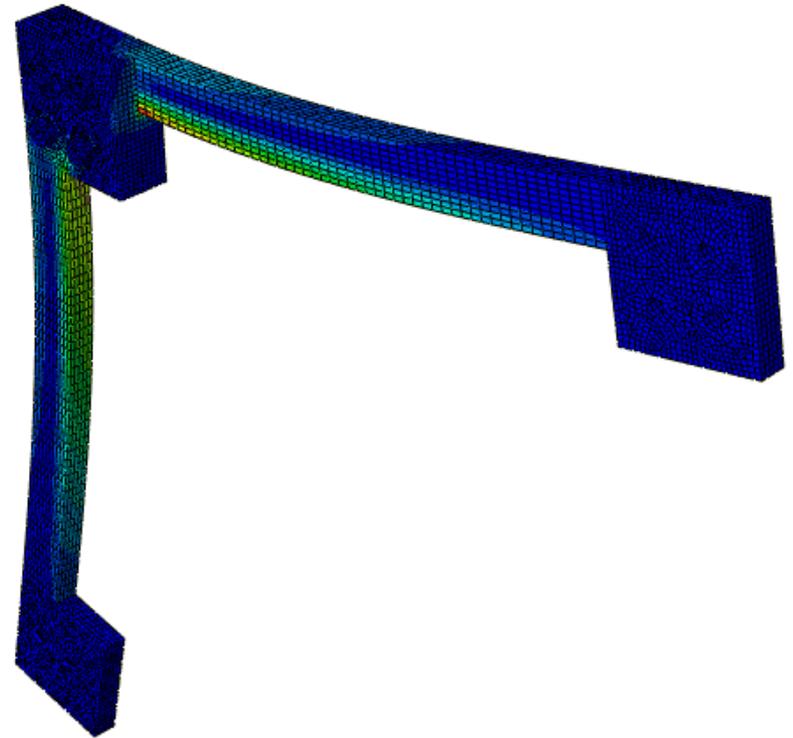


Project Overview

- It is hypothesized that the strength of a nonlinearity (SNL) in a jointed system can be predicted by quantifying the **magnitude and uniformity of contact pressure** within an interface and by assessing the **modal excitation of an interface**.

- Numerical Methods:

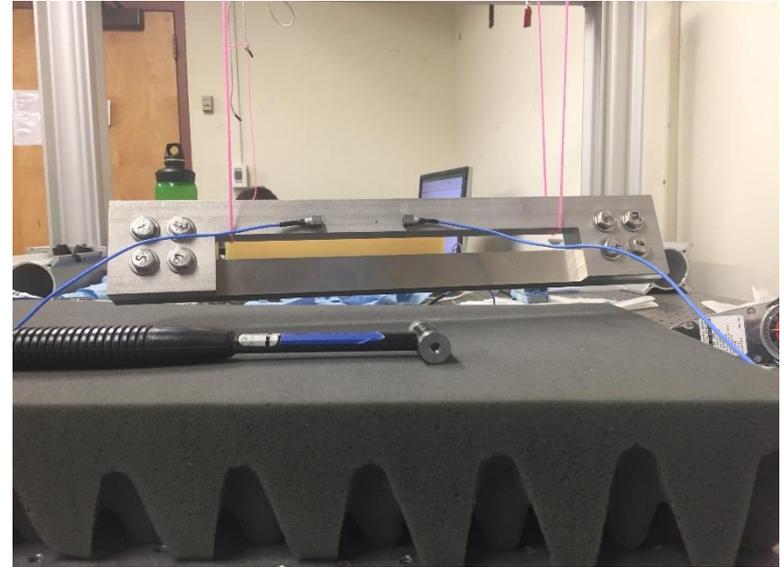
Using Abaqus, we calculated a variety of statistics regarding contact pressure and modal strain to utilize in developing a metric to predict strength of nonlinearity.



Project Overview

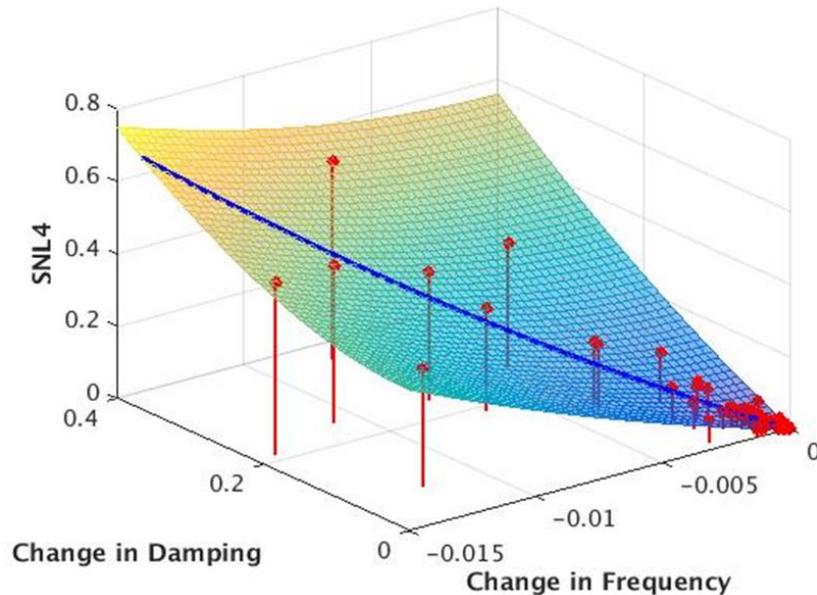
- Experimental Methods:

We obtained time response data for many beam configurations.



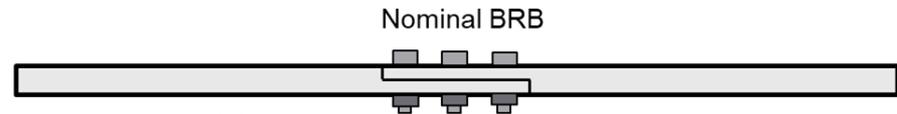
- Analysis:

We developed a definition for SNL based on change in damping ratio and change in frequency. Using machine learning, we assessed the importance of various statistics in predicting SNL and finalized a metric.

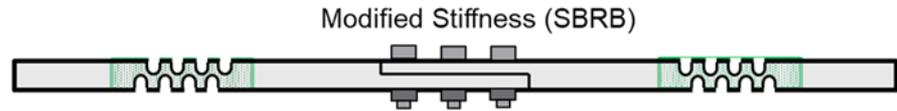


Configurations – Brake-Reuß Beam

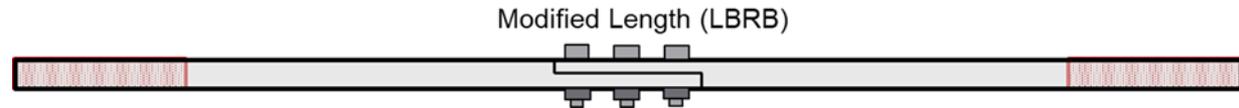
- BRB



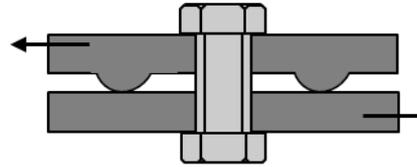
- Spring (SBRB)



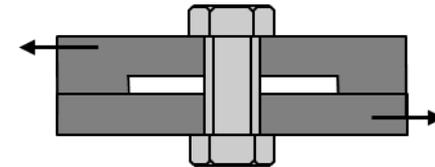
- Long (LBRB)



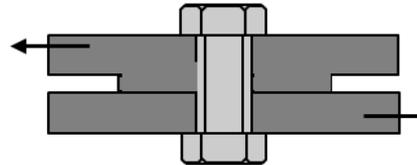
- Hertzian Contact (HZ)



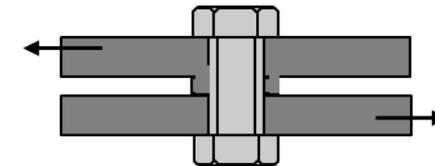
- Reverse Pad Contact (RPD)



- Large Pad Contact (LPD)

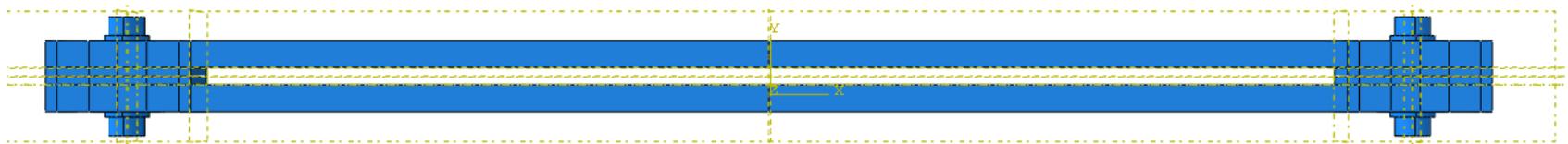
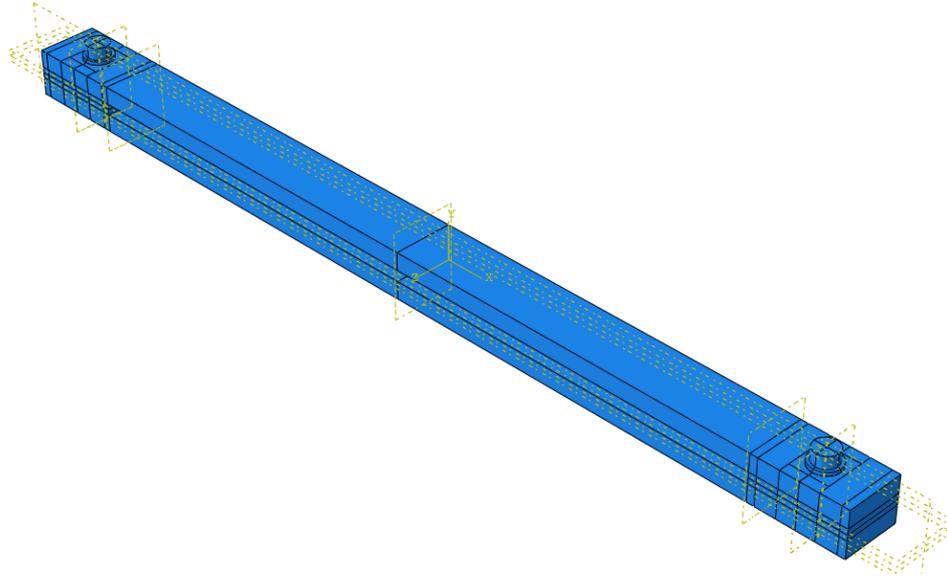


- Small Pad Contact (SPD)



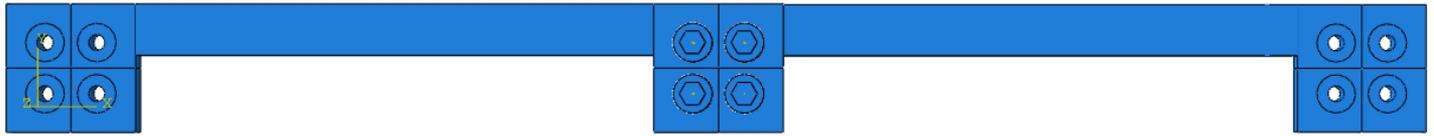
Configurations – C-Beam

- CBM (also known as the S4 or Sandwich beam)



Configurations – 4-Bolt Beam

- 4LS



(4-bolt **L**ong **S**ame-side)

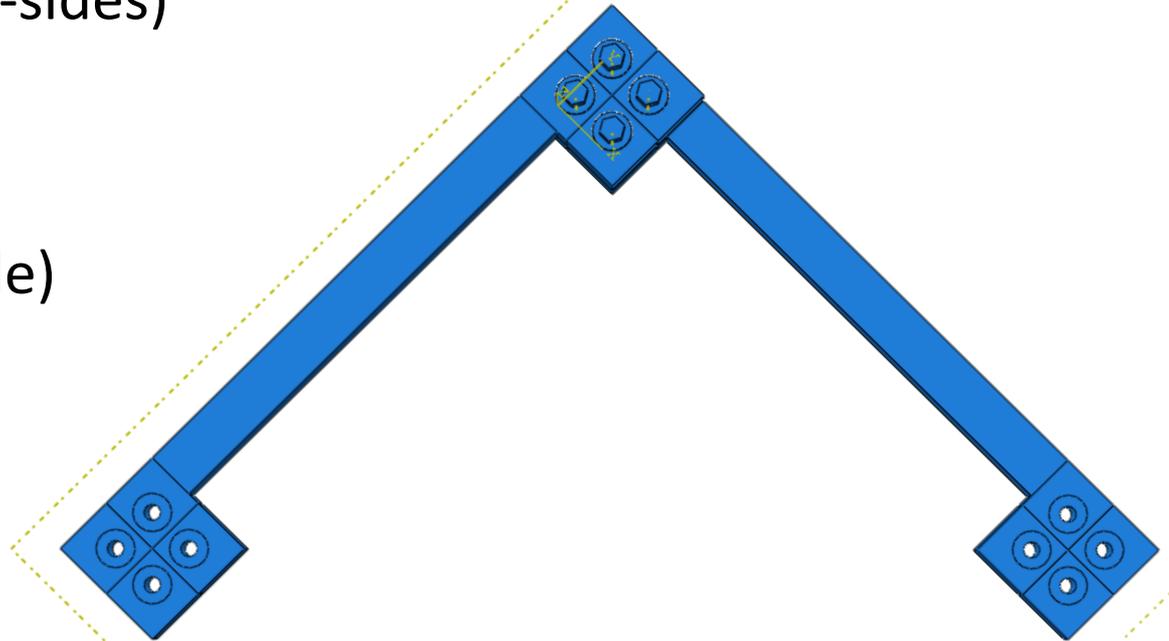
- 4SO



(4-bolt **S**hort **O**pposite-sides)

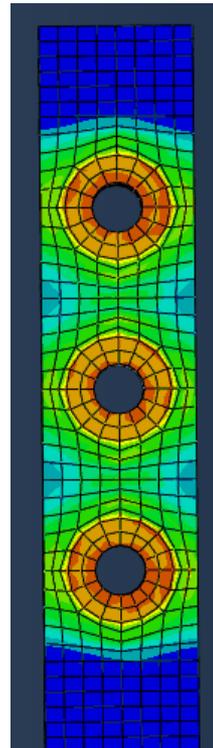
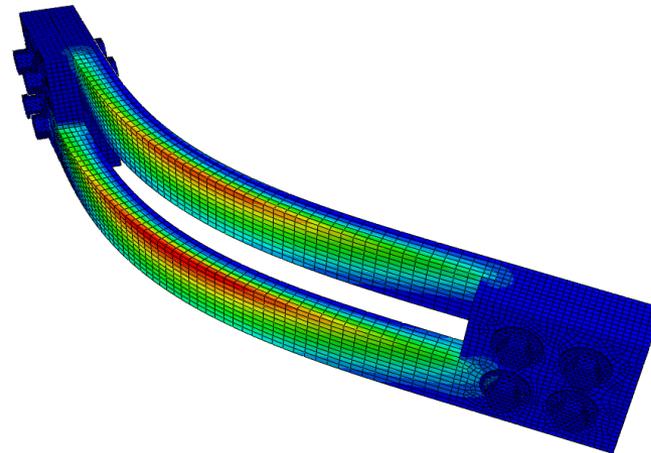
- 4VO

(4-bolt **V**-shape **O**utside)



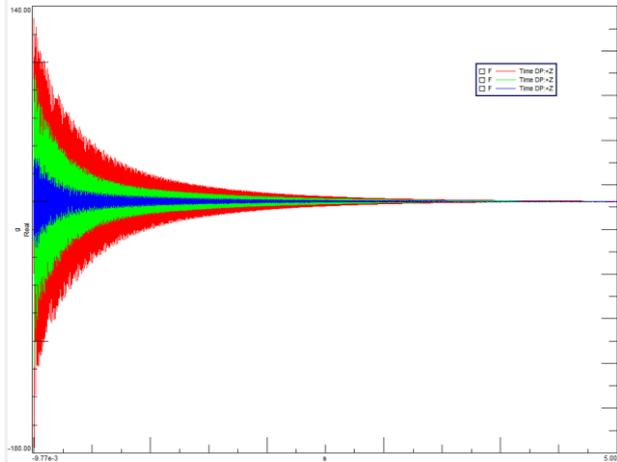
Numerical Methodology

- To develop the metric, we sought easy-to-access data from an FEA model: modal strain and contact pressure.
- A nonlinear frictionless interface implicit solver was used to determine contact pressure.
- A linearized eigen analysis was used to find mode shapes and strain.
- Various statistics were calculated based on the data:
 - Mean (Contact Pressure and Strain)
 - Max (Contact Pressure and Strain)
 - Standard Deviation (Contact Pressure and Strain)
 - Skew (Contact Pressure and Strain)
 - Kurtosis (Contact Pressure and Strain)
 - Contact Area

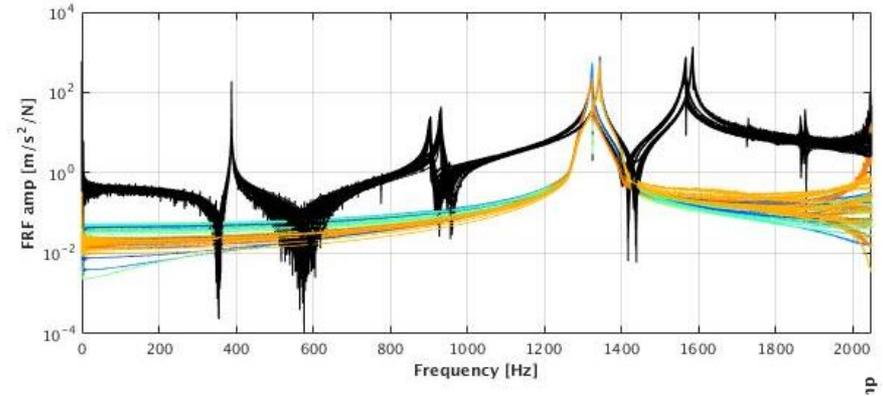


Experimental Methodology

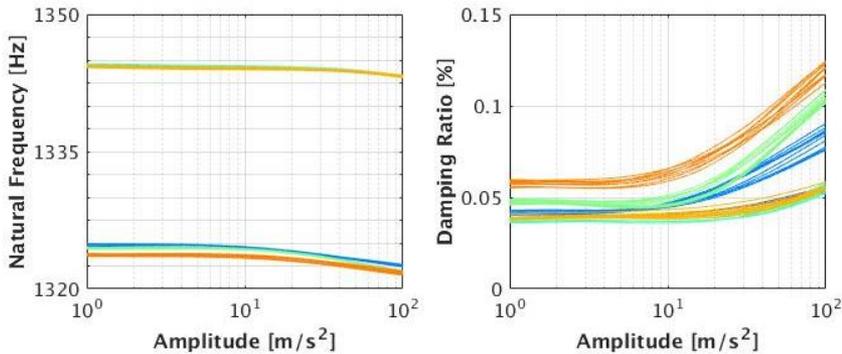
- Impact Testing



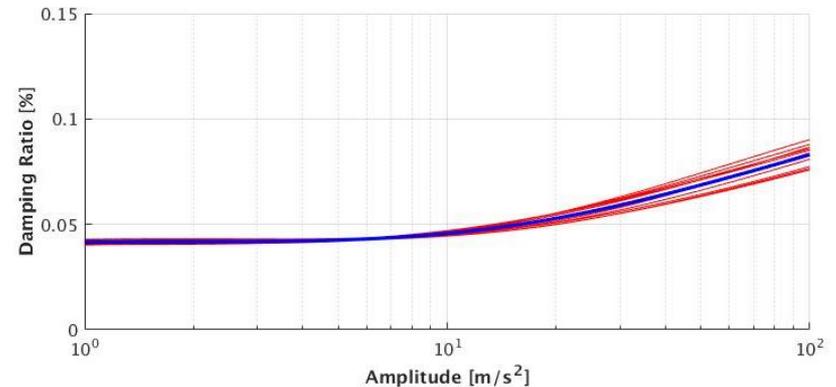
- Bandpass Filtering and Hilbert Transform



- Frequency and Damping vs Amplitude

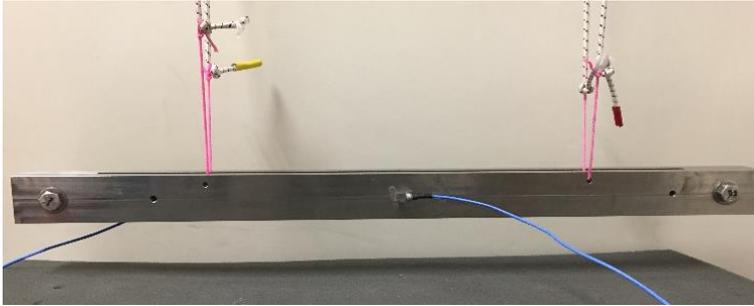


- Smooth and Average Curves

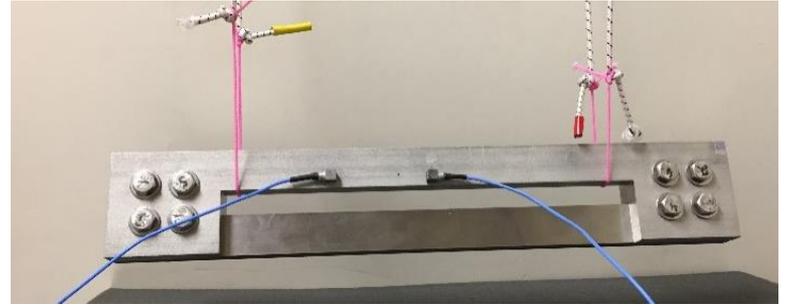


Experimental Methodology

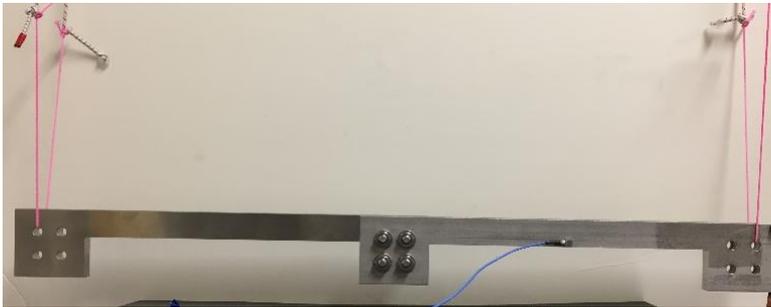
- CBM



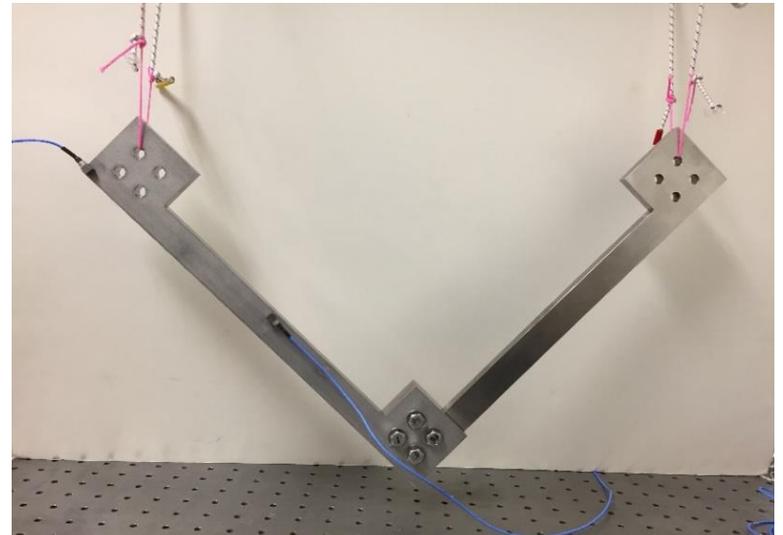
- 4SO



- 4LS

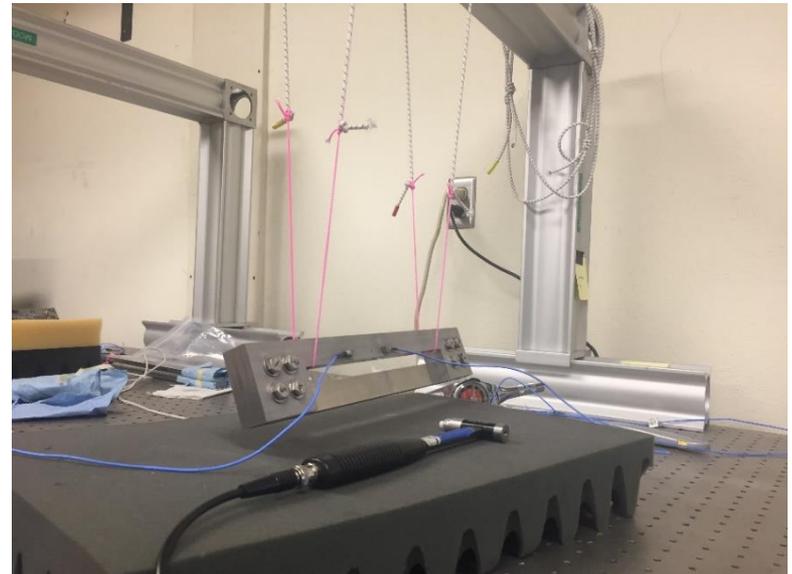
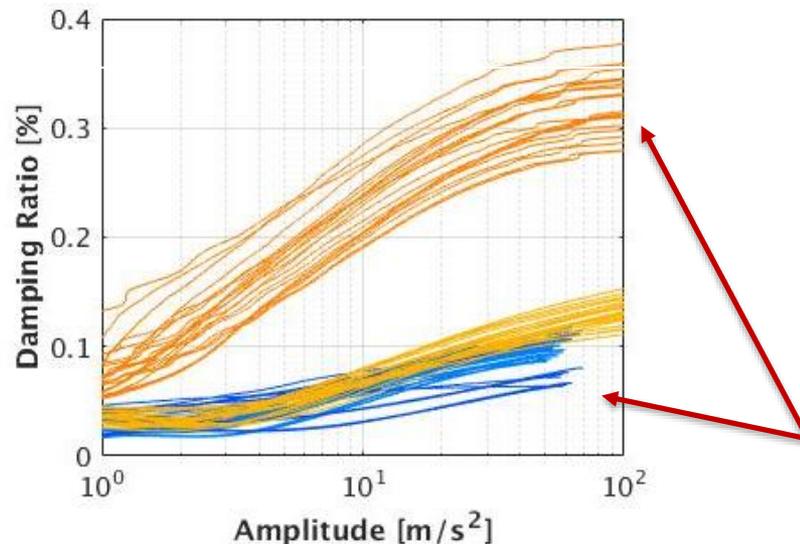


- 4VO



Experimental Methodology

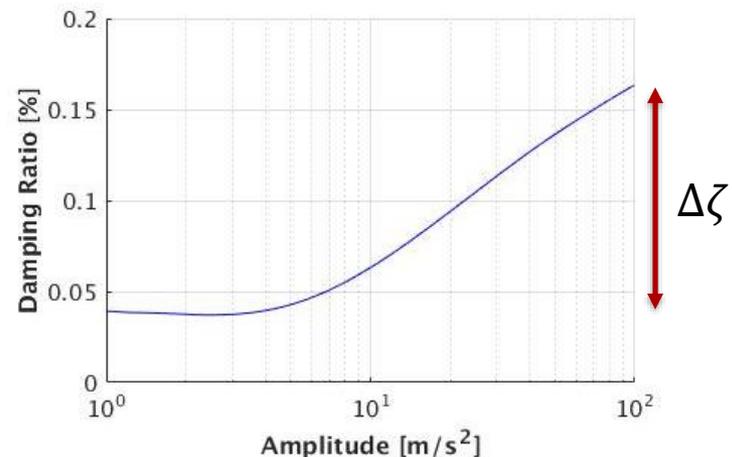
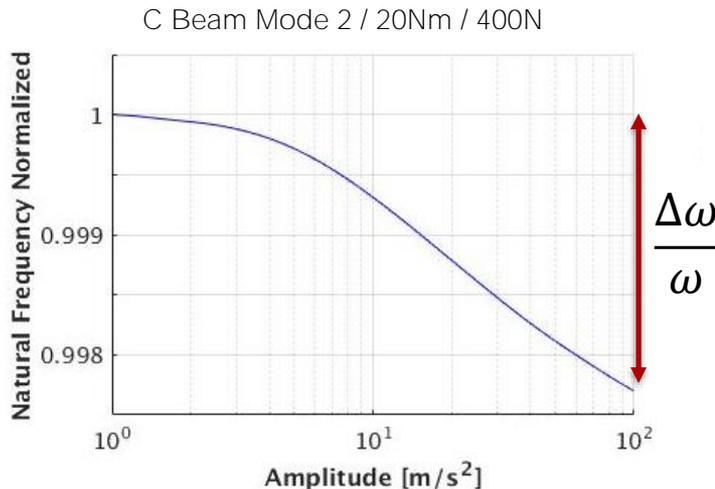
- Impact hammer testing using free-free boundary condition
- Bolt torques range from 5Nm → 20Nm
 - What is the effect of changing contact pressure within beam configurations?
- Impact Levels ranging from 60N to 900N
 - What is the effect of modal coupling?
 - How do we normalize force?
- Standardize by max mode shape



C Beam Mode 2: Extreme Modal Coupling

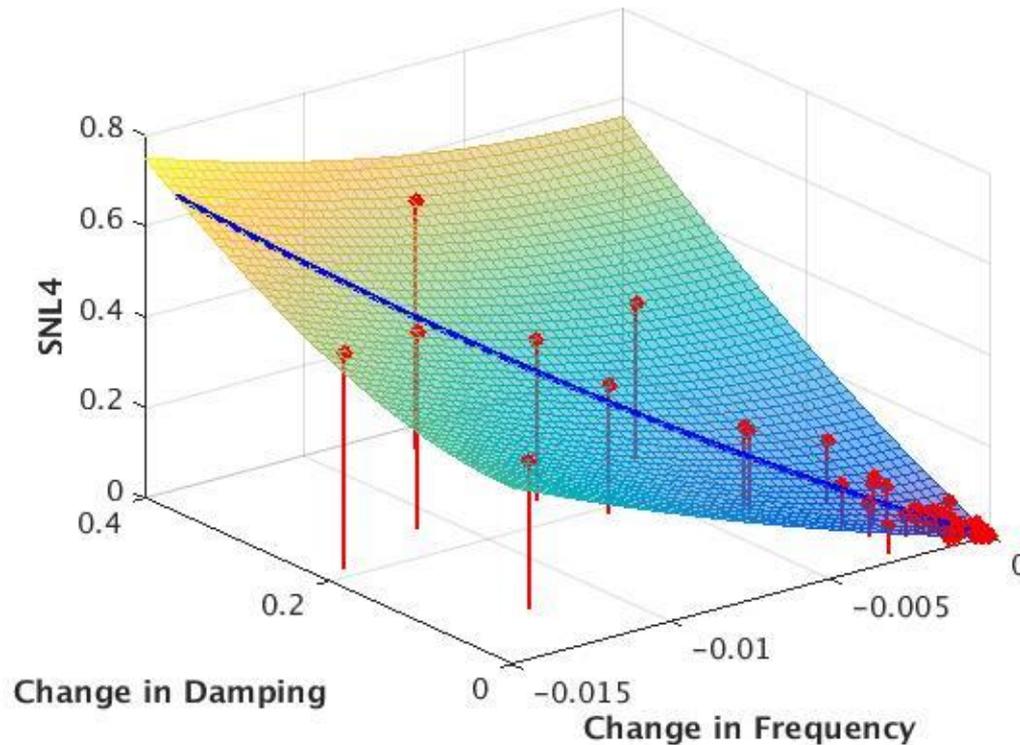
Defining Strength of Nonlinearity (SNL)

- Magnitude of shift in natural frequency and damping as the response amplitude of a structure is varied between two fixed bounds.
- $SNL = \alpha \frac{\Delta\omega}{\omega} + \beta \Delta\zeta$



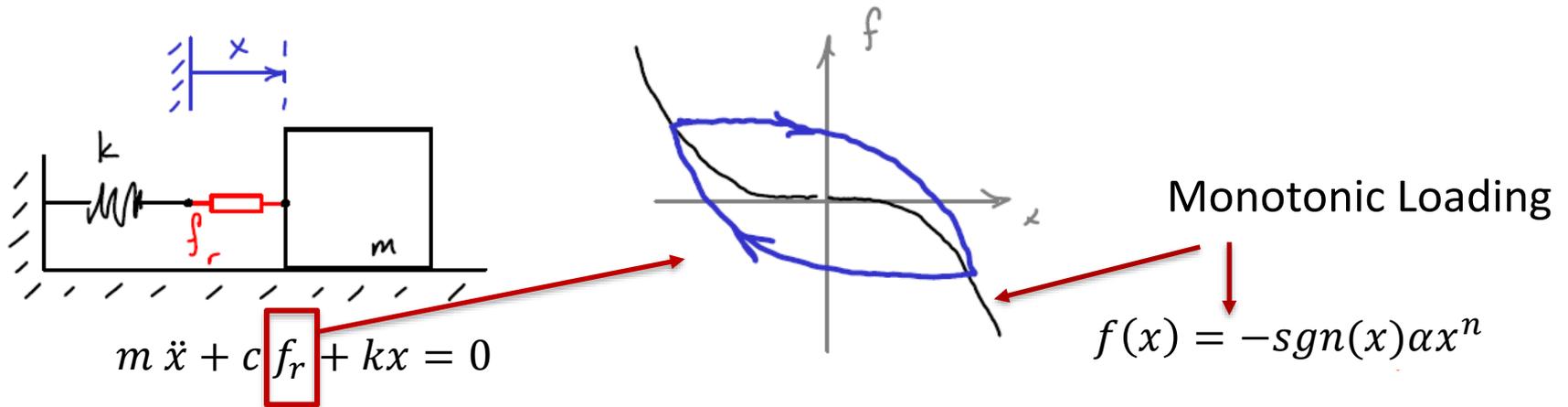
Defining SNL4

$$SNL4 = \left(\left(20 * \frac{\Delta\omega}{\omega} \right)^2 + (\Delta\zeta)^2 \right)^{\frac{1}{2}} + \left(20 * \frac{\Delta\omega}{\omega} \right)^2 + (\Delta\zeta)^2$$

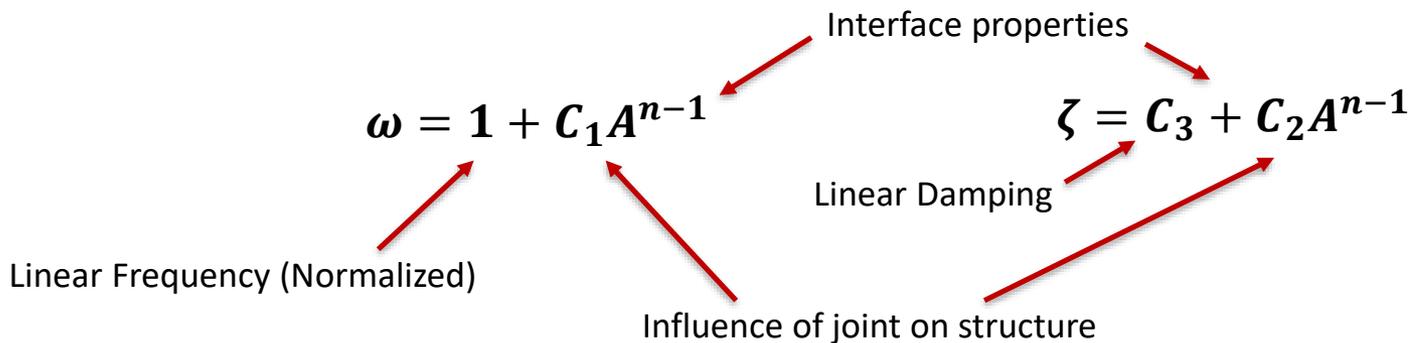


Defining SNL: Perturbations Approach

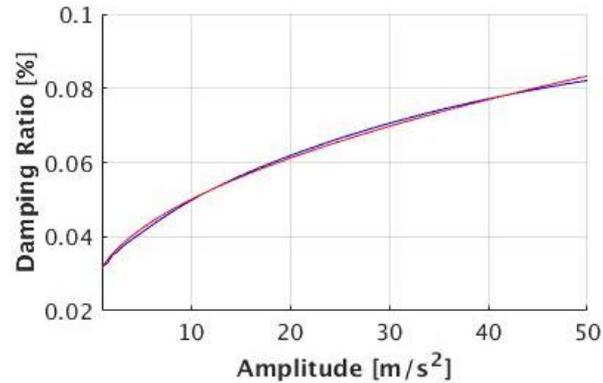
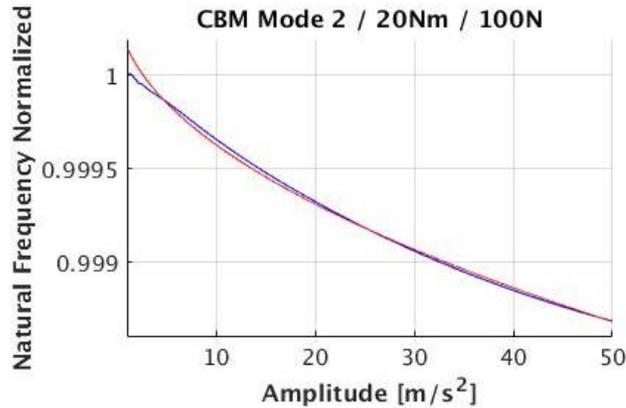
- Based off of a mass-spring-damper system



- General form of equivalent frequency and damping



Defining SNL: Perturbations Approach



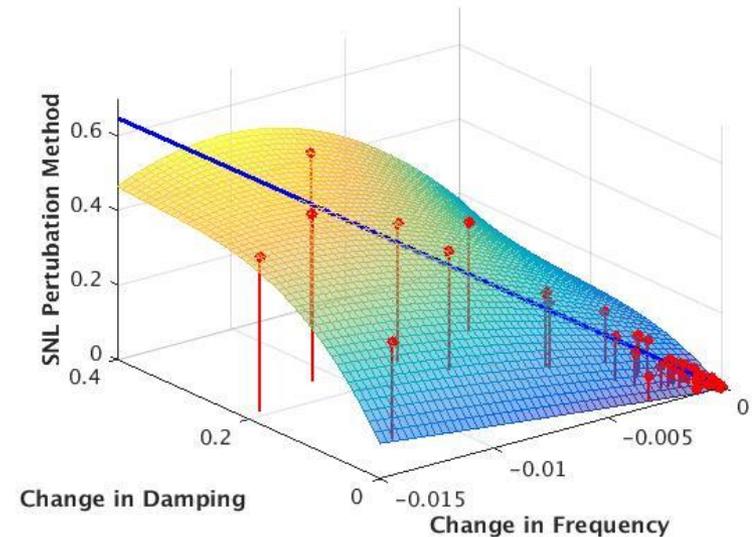
$$\zeta = -0.01 + \underline{0.0345} A^{0.25}$$

$$R^2 = 0.9931$$

$$\omega = 1.003 - \underline{9.703 * 10^{-4}} A^{0.25}$$

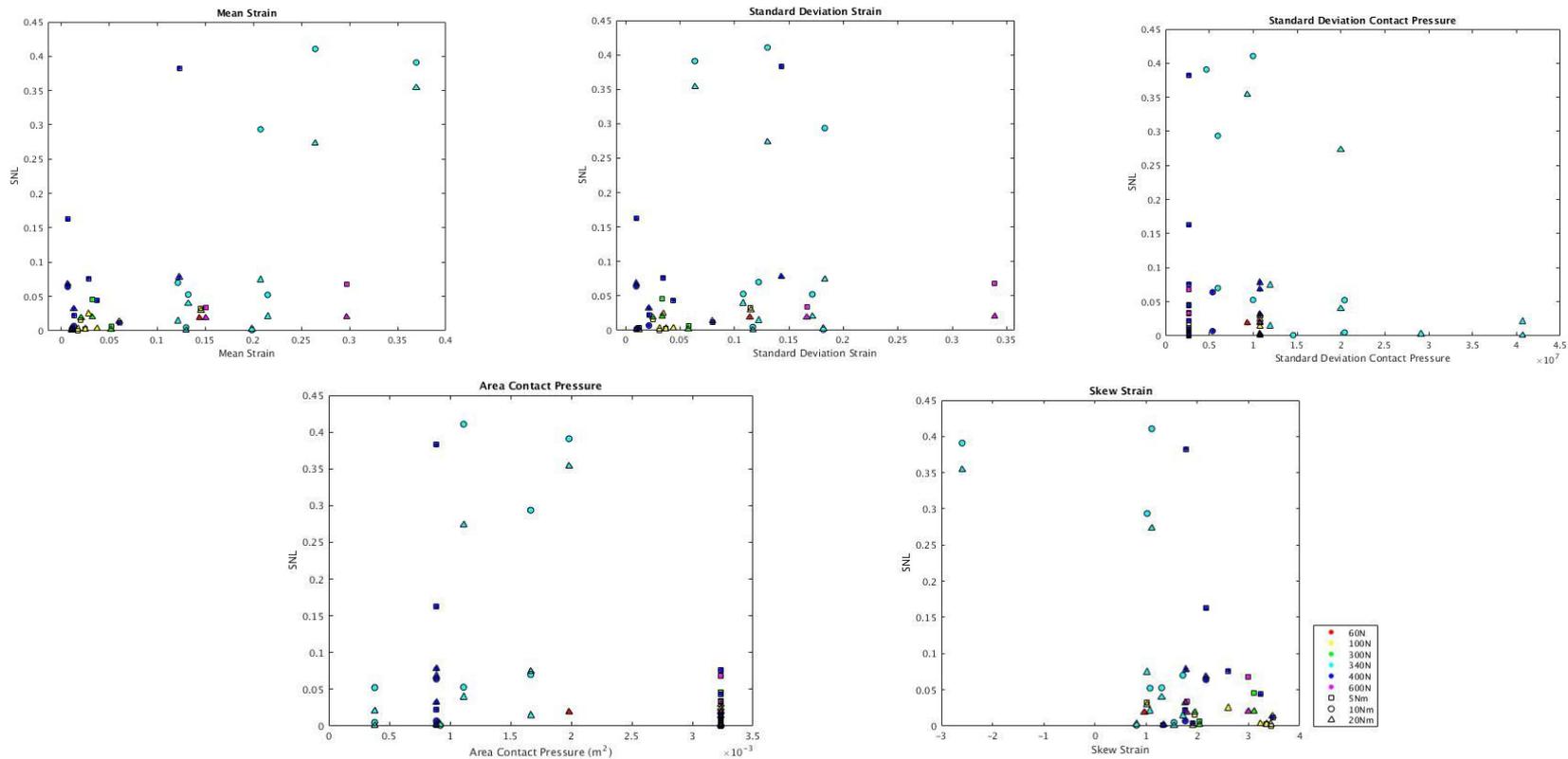
$$R^2 = 0.9757$$

Overall:
 Frequency $R^2 = 0.8434$
 Damping $R^2 = 0.7841$



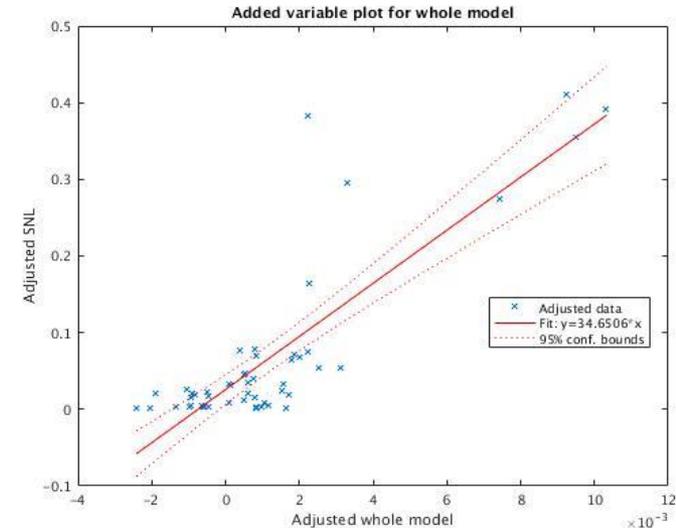
Machine Learning

- Correlation of parameters to SNL and frequency-only-based SNL by visual inspection and ANOVA
 - **70% of variance explained by 5 variables:** Mean Strain, Standard Deviation Strain, Standard Deviation Contact Pressure, Contact Area, Skew Strain



Machine Learning

- $SNL = .065802 + 1.7405MeanE - 1.3022STDE - 5.7476 * 10^{-9}STDCP - 41.301AreaCP + .041298SkewE$, p-value=1.17e-10, $R^2 = .696$
- MATLAB's built-in functions *fitlm*, *stepwiselm*, and *step* were utilized to create a linear regression model using the various statistics
 - stepwiselm* automatically tests the importance of each statistic to create the optimal metric
 - step* takes an existing model and checks whether additional terms should be added or existing terms should be removed
 - fitlm* fits a model using the parameters specified



Whole Model Parameters ($R^2=0.696$, p-value=1.17e-10)	p-value	Frequency Parameters ($R^2=0.833$, p-value=1.49e-15)	p-value
MeanE	6.5816e-08	MeanE	6.6878e-12
STDE	1.499e-05	STDE	2.8118e-10
STDCP	4.1232e-05	SkewE	2.6391e-06
AreaCP	0.00032329	STDCP	9.671e-06
SkewE	0.01428	KurtosisE	0.000461
(KurtosisE)	(0.09601)	AreaCP	.026855

Conclusions

- We were not able to produce a metric that could accurately predict the SNL metric using only contact pressure and modal strain. A future metric could possibly be determined if additional interface properties were also included.
- We were able to identify the key variables that explain variance in our SNL metric
 - Strain: Mean, Standard Deviation and Skew
 - Contact Pressure: Standard Deviation and Area
- We were able to identify areas of improvement for future research
 - Using modal acceleration instead of absolute acceleration
 - Better understand how force levels activate modal coupling
 - Implement genetic algorithms for model predictions
 - Use surface properties to explain damping variance



Acknowledgments

- This research was conducted at the 2018 Nonlinear Mechanics and Dynamics Research Institute hosted by Sandia National Laboratories and the University of New Mexico.
- This research was assisted by the research of previous NOMAD teams and research ongoing at University of Wisconsin-Madison and Rice University.
- Sandia National Laboratories is a multimission laboratory managed and operated by National Technology and Engineering Solutions of Sandia, LLC., a wholly owned subsidiary of Honeywell International, Inc., for the U.S. Department of Energy's National Nuclear Security Administration under contract DE-NA-0003525.

