

# The Real ESSI Simulator System Status Report

Boris Jeremić

University of California, Davis, CA  
Lawrence Berkeley National Laboratory, Berkeley, CA

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# Outline

## Introduction

### Motivation

## Real-ESSI Simulator System

### Real ESSI Components

### Stochastic Modeling

### High Performance Computing

## Modeling and Simulation Examples

### Seismic Motions

### Plastic Energy Dissipation

### Uncertain Inelasticity

## Conclusion

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# Motivation

- ▶ Improve modeling and simulation for infrastructure objects
- ▶ Use of numerical models to analyze statics and dynamics of soil-structure systems
- ▶ Reduction of modeling uncertainty
- ▶ Desired level of sophistication (high ↔ low) analysis
- ▶ Follow and direct the flow of seismic energy,
- ▶ Practical system for modeling and simulation of Earthquakes, Soils, Structures and their Interaction,

<http://real-essi.info/>



# Predictive Capabilities

- ▶ Prediction under Uncertainty: use of computational model to predict the state of SSI system under conditions for which the computational model has not been validated.
- ▶ Verification provides evidence that the model is solved correctly. Mathematics issue.
- ▶ Validation provides evidence that the correct model is solved. Physics issue.
- ▶ Modeling and parametric uncertainties are always present, need to be addressed
- ▶ Goal: Predict and Inform rather than (force) Fit

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# Real-ESSI Simulator System

The Real-ESSI, **Real**istic Modeling and Simulation of **E**arthquakes, **S**oils, **S**tructures and their **I**nteraction. Simulator is a software, hardware and documentation system for time domain, linear and nonlinear, inelastic, deterministic or probabilistic, 3D, finite element modeling and simulation of:

- ▶ statics and dynamics of soil,
- ▶ statics and dynamics of rock,
- ▶ statics and dynamics of structures,
- ▶ statics of soil-structure systems, and
- ▶ dynamics of earthquake-soil-structure system interaction

Used for:

- ▶ Design, linear elastic, load combinations, dimensioning
- ▶ Assessment, nonlinear/inelastic, safety margins

# Real-ESSI Simulator System

- ▶ Real-ESSI System Components
  - ▶ Real-ESSI Pre-processor (gmsh/gmESSI, X2ESSI)
  - ▶ Real-ESSI Program (local, remote, cloud)
  - ▶ Real-ESSI Post-Processor (Paraview, Python, Matlab)
- ▶ Real-ESSI System availability:
  - ▶ Educational Institutions: Amazon Web Services (AWS), free
  - ▶ Government Agencies, National Labs: AWS GovCloud
  - ▶ Professional Practice: AWS, commercial
- ▶ Real-ESSI Short Courses, online, worldwide
- ▶ System description and documentation at  
<http://real-essi.info/>

# Quality Assurance

- ▶ Full verification suit for each element, model, algorithm
- ▶ Certification process in progress for NQA-1 and ISO-90003-2014

## Real-ESSI Modeling Features

- ▶ Solid elements, dry, (un-)saturated, elastic, inelastic
- ▶ Structural elements, beams, shells, elastic, inelastic
- ▶ Contact elements, dry, coupled/saturated,
- ▶ Super element, stiffness and mass matrices
- ▶ Material models, soil, concrete, steel...
- ▶ Seismic input, 1C and 3C, deterministic or probabilistic
- ▶ Energy dissipation calculations
- ▶ Solid/Structure – Fluid interaction, full coupling
- ▶ Intrusive probabilistic inelastic modeling

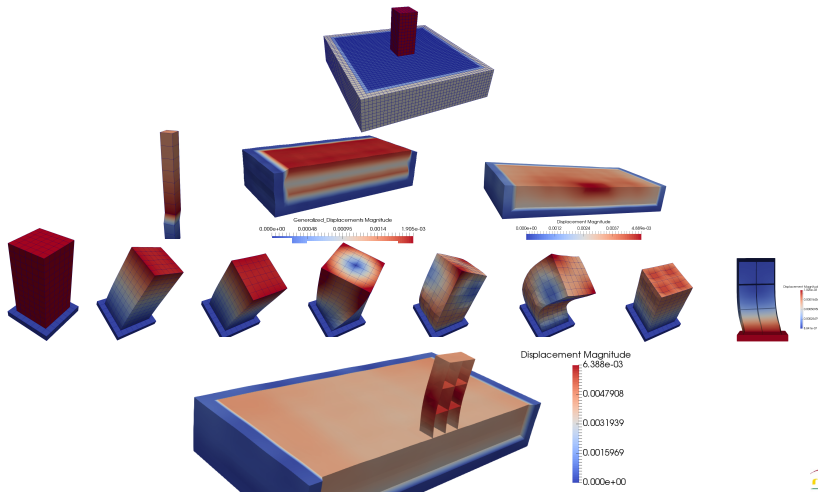
# Real-ESSI Simulation Features

- ▶ Static loading stages
- ▶ Dynamic loading stages
- ▶ Restart, simulation tree
- ▶ Solution advancement methods/algorithms, on global and constitutive levels, with and without enforcing equilibrium
- ▶ High Performance Computing
  - Fine grained, template mataprograms, small matrix library
  - Coarse grained, distributed memory parallel

# Real-ESSI Model Development

- ▶ Pre-Processing, model development gmsh/gmESSI
- ▶ Existing model translation, SASSI→Real-ESSI
- ▶ Choose level of sophistication
- ▶ Reduce modeling uncertainty
- ▶ Model developed in phases
- ▶ Verify model components
- ▶ Build confidence in inelastic modeling





# Real-ESSI Results Post Processing

- ▶ All output is saved (stress, strain, displacements, energy...)
- ▶ Time histories, scripts to plot or extract in preferred format
- ▶ 3D visualization, Paraview with pvESSI plugin

# Real-ESSI Training and Education

- ▶ Short Courses:
  - ▶ Online short course, soon
  - ▶ Professional practice
  - ▶ Examples available in lecture notes, and documentation
  - ▶ Real-ESSI Simulator system, with examples on Amazon Web Services (AWS)
- ▶ Full lecture notes (2600+ pages) available online
- ▶ Up to date information on Real-ESSI at:  
<http://real-essi.info/>

# Real-ESSI Core Functionality

- ▶ Introduction to inelastic, nonlinear analysis for practicing engineers
- ▶ Use of prescribed, required (low, medium, high) fidelity numerical models to analyze ESSI behavior
- ▶ Set of suggested modeling and simulation parameters
- ▶ Investigate sensitivity of response to model sophistication
- ▶ Investigate sensitivity of response to model parameters

# Real-ESSI Core Functionality Components

- ▶ Structural elements: Truss, Beam, Shell, Super-Element
- ▶ Soil, solids: elastic,  $G/G_{max}$
- ▶ Contacts: Bonded, Frictional, Gap open/close
- ▶ Loads: Static, Dynamic (earthquake, 1C or  $3 \times 1C$ ), Restart
- ▶ Simulation: Explicit no-equilibrium, Implicit equilibrium
- ▶ Core Functionality Application programs: APPs

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# Existing Simulation Methods for Stochastic PDEs

- ▶ Analytical, stochastic differential equation approach: difficult to solve with complex random coefficients
- ▶ Monte Carlo method : Computationally expensive
- ▶ Perturbation approach: Small variation with respect to mean, closure problem
- ▶ Stochastic collocation method: Global error minimization
- ▶ Stochastic Galerkin method: Local error minimization

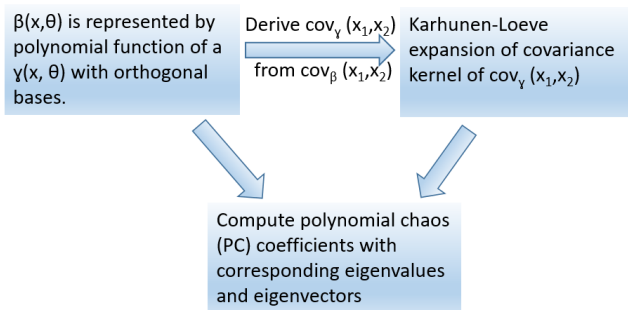
# Time Domain Stochastic Galerkin Method

- ▶ Input random field/process(non-Gaussian, heterogeneous/non-stationary)
  - Multi-dimensional Hermite Polynomial Chaos (PC) with known coefficients
- ▶ Output response process
  - Multi-dimensional Hermite PC with unknown coefficients
- ▶ Galerkin projection: minimize the error to compute unknown coefficients of response process
- ▶ Time integration using Newmark's method
  - Update coefficients following an elastic-plastic constitutive law at each time step

Note: PC = Polynomial Chaos



# Discretization of Input Random Process/Field $\beta(x, \theta)$



Note:  $\beta(x, \theta)$  is an input random process with any marginal distribution, with any covariance structure;  
 $\gamma(x, \theta)$  is a zero-mean unit-variance Gaussian random process.

# Polynomial Chaos Representation

Material random field:  $D(x, \theta) = \sum_{i=1}^{P_1} a_i(x) \psi_i(\{\xi_r(\theta)\})$

Motion random process:  $f_m(t, \theta) = \sum_{j=1}^{P_2} f_{mj}(t) \psi_j(\{\xi_k(\theta)\})$

Displacement response:  $u_n(t, \theta) = \sum_{k=1}^{P_3} d_{nk}(t) \psi_k(\{\xi_l(\theta)\})$

where  $a_i(x)$ ,  $f_{mj}(t)$  are known PC coefficients, while  $d_{nk}(t)$  are unknown PC coefficients.

# FEM and Stochastic Elastic-Plastic FEM, SEPFEM

$$\sum_e \left[ \int_{D_e} N_m(x) \rho(x) N_n(x) d\Omega \ddot{u}_n(t) + \int_{D_e} \nabla N_m(x) E(x) \nabla N_n(x) d\Omega u_n(t) - f_m(t) \right] = 0$$

$$\begin{aligned} & \sum_{n=1}^N \sum_{k=1}^{P_3} \langle \psi_k \psi_l \rangle \int_{D_e} N_m(x) \rho(x) N_n(x) d\Omega \ddot{d}_{nk}(t) + \\ & \sum_{n=1}^N \sum_{k=1}^{P_3} \sum_{i=1}^{P_1} \langle \psi_i \psi_k \psi_l \rangle \int_{D_e} B_m(x) a_i(x, t) B_n(x) d\Omega d_{nk}(t) = \\ & \sum_{j=1}^{P_2} \langle \psi_j \psi_l \rangle f_{mj}(t) \end{aligned}$$

# SEPFEM

Matrix form:

$$\mathbf{M}\ddot{\mathbf{d}} + \mathbf{K}\mathbf{d} = \mathbf{f}$$

For damped systems:

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



Newmark's method to solve in time domain

where  $\mathbf{M}$ ,  $\mathbf{C}$  and  $\mathbf{K}$  are generalized mass, damping and stiffness matrices,  
 $\mathbf{f}$ ,  $\mathbf{d}$ , and  $\ddot{\mathbf{d}}$  are generalized force, displacement, and acceleration vectors.

# Stochastic Elastic-Plastic Response

Governing equation:  $d\sigma_{ij} = E_{ijkl}d\epsilon_{kl}$

$$E_{ijkl} = \begin{cases} E_{ijkl}^{el} & \text{for elastic} \\ E_{ijkl}^{el} - \frac{E_{ijmn}^{el} m_{mn} n_{pq} E_{pqkl}^{el}}{n_{rs} E_{rstu}^{el} m_{tu} - \xi_* h_*} & \text{for elastic-plastic} \end{cases}$$

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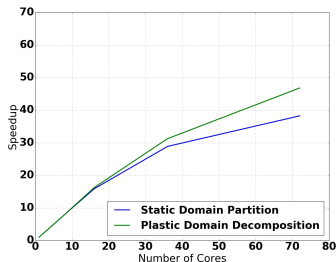
Plastic Energy Dissipation

Uncertain Inelasticity

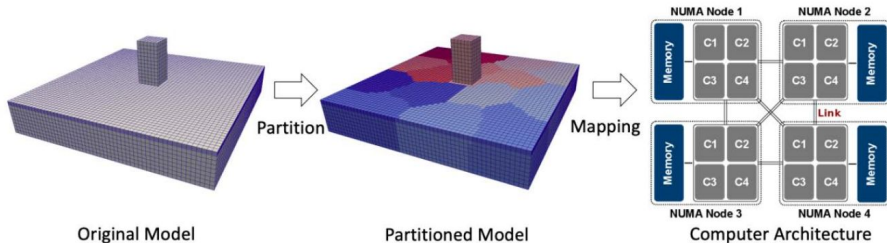
Conclusion

# Course and Fine Grained HPC

- ▶ Hardware Aware Plastic Domain Decomposition (HAPDD) Method
- ▶ Small Tensor Library

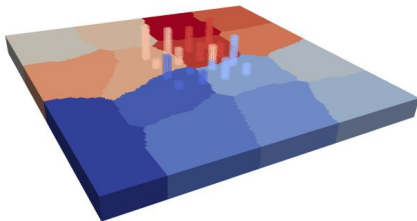


# HAPDD

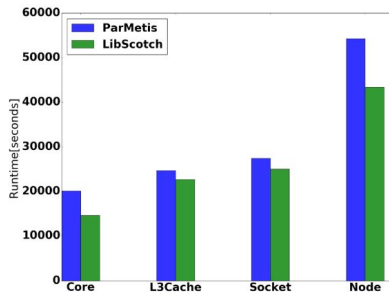




# HAPDD



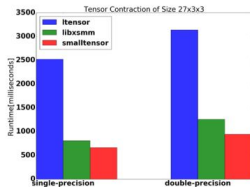
Partitioned Domains



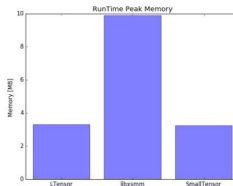
Performance on  
Different Architectures

# Small Tensor Library

- Benchmark Libraries
  - **LTensor** – Target library
  - **LIBXSMM** – State-of-Art Small Linear Algebra for Machine Learning.
  - **SmallTensor** – Our Small Tensor Library for Computational Mechanics.
- Runtime Performance Comparison



Runtime Performance



Peak Memory Usage

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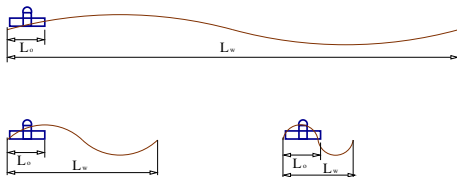
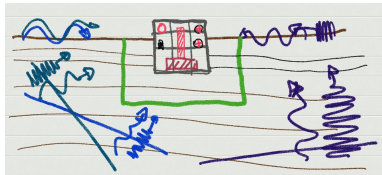
### Plastic Energy Dissipation

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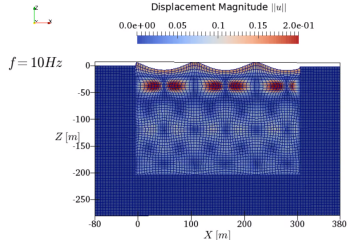
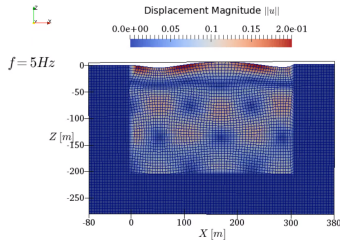
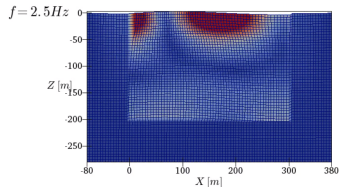
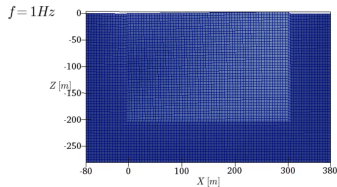
## Conclusion

# Seismic Motions

- ▶ Variation in inclination, frequency, energy, duration...
- ▶ Deterministic and Probabilistic
- ▶ Stress test the soil-structure system



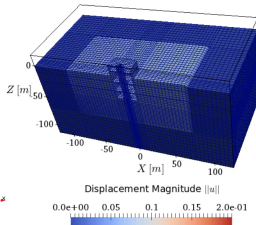
# Free Field, Variation in Input Frequency, $\theta = 60^\circ$



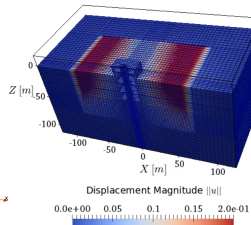
(MP4)

# SMR ESSI, Variation in Input Frequency, $\theta = 60^\circ$

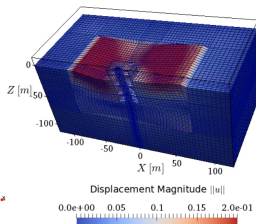
$f = 1\text{Hz}$



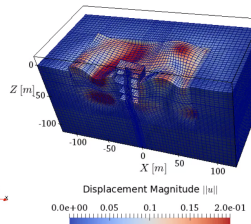
$f = 2.5\text{Hz}$



$f = 5\text{Hz}$

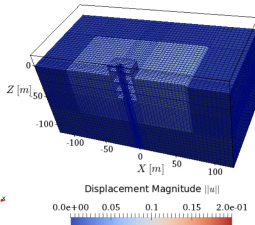
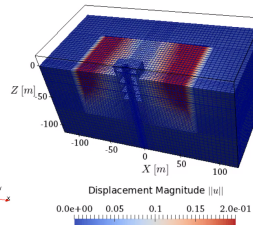
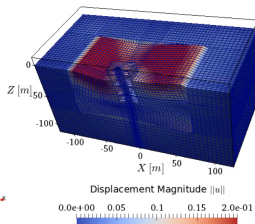
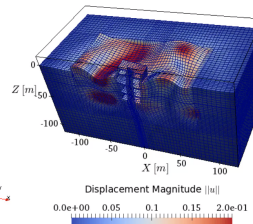


$f = 10\text{Hz}$



(MP4)

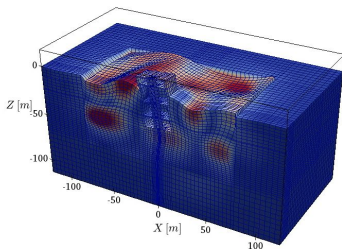
# SMR ESSI, Variation in Input Frequency, REAL TIME

 $f = 1\text{Hz}$ 

 $f = 2.5\text{Hz}$ 

 $f = 5\text{Hz}$ 

 $f = 10\text{Hz}$ 


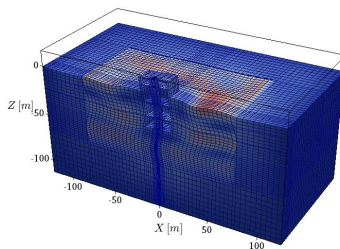
(MP4)

# SMR ESSI, 3C vs 3×1C

3C



3 × 1C



(OGV)





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# Energy Input and Dissipation

Energy input, dynamic forcing

Energy dissipation outside SSI domain:

- SSI system oscillation radiation

- Reflected wave radiation

Energy dissipation/conversion inside SSI domain:

- Inelasticity of soil, contact zone, structure, foundation, dissipators

- Viscous coupling with internal/pore fluids, and external fluids

Numerical energy dissipation/production

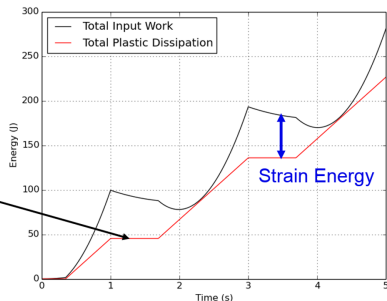
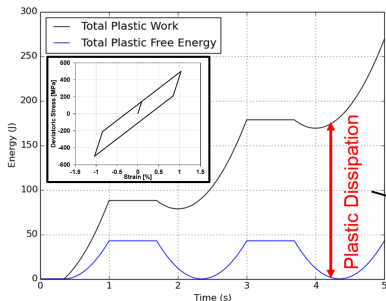
# Plastic Energy Dissipation

Single elastic-plastic element under cyclic shear loading

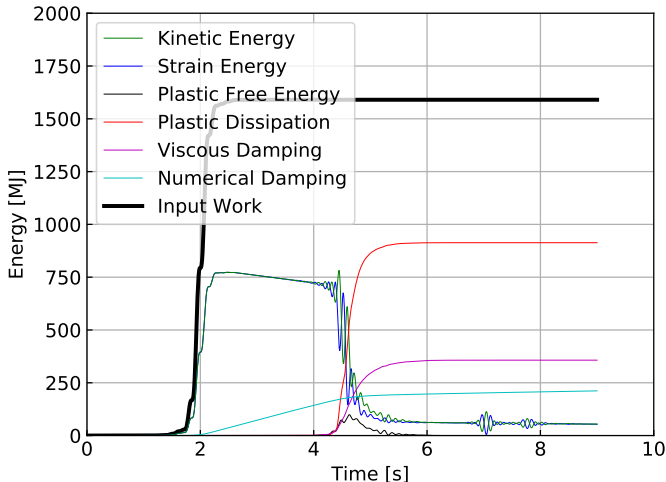
Difference between plastic work and plastic dissipation

Plastic work can decrease

Plastic dissipation always increases



# Energy Dissipation Control

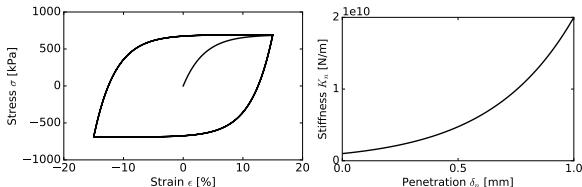


# Inelastic Modeling of Soil Structure Systems

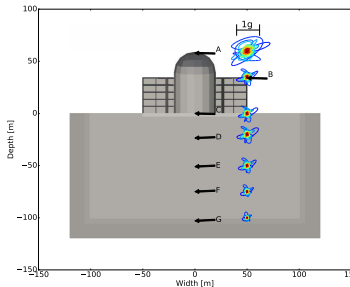
- ▶ Soil, inelastic, elastic-plastic
  - Dry, single phase
  - Unsaturated, partially saturated
  - Fully saturated
- ▶ Contact, inelastic, soil/rock – foundation
  - Dry, single phase,
    - Normal, hard and soft, gap open/close
    - Friction, nonlinear
  - Fully saturated, suction, excess pressure, buoyant force
- ▶ Structure, inelastic, damage, cracks
  - Nonlinear/inelastic 1D reinforced concrete fiber beam
  - Nonlinear/inelastic 3D reinforced concrete solid element
  - Alcali Silica Reaction concrete modeling

# Inelastic Soil and Inelastic Contact

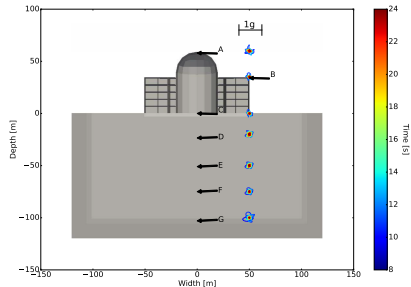
- ▶ Shear velocity of soil  $V_s = 500 \text{ m/s}$
- ▶ Undrained shear strength (Dickenson 1994)  
 $V_s [\text{m/s}] = 23(S_u [\text{kPa}])^{0.475}$
- ▶ For  $V_s = 500 \text{ m/s}$  Undrained Strength  $S_u = 650 \text{ kPa}$  and Young's Modulus of  $E = 1.3 \text{ GPa}$
- ▶ von Mises, Armstrong Frederick kinematic hardening ( $S_u = 650 \text{ kPa}$  at  $\gamma = 0.01\%$ ;  $h_a = 30 \text{ MPa}$ ,  $c_r = 25$ )
- ▶ Soft contact (concrete-soil), gaping and nonlinear shear



# Acceleration Traces, Elastic vs Inelastic



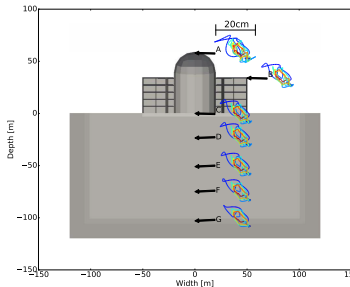
Elastic



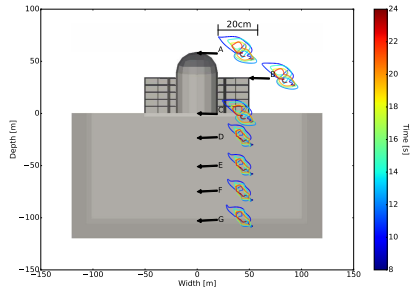
Inelastic

## Plastic Energy Dissipation

## Displacement Traces, Elastic vs Inelastic



Elastic

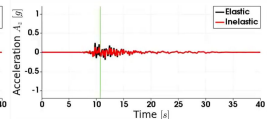
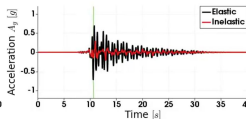
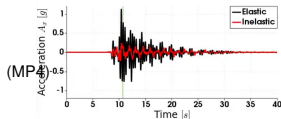
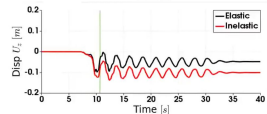
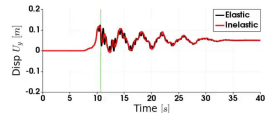
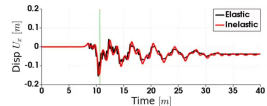
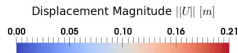
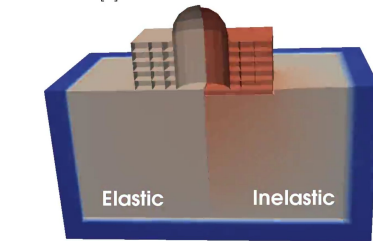


Inelastic



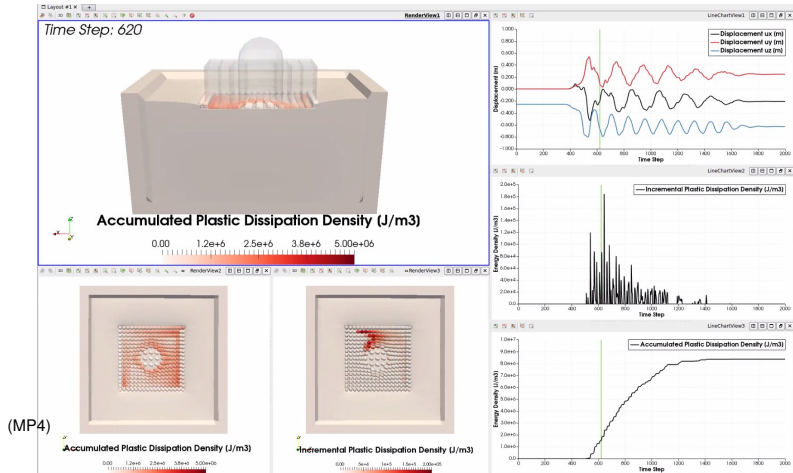
# Elastic and Inelastic Response: Differences

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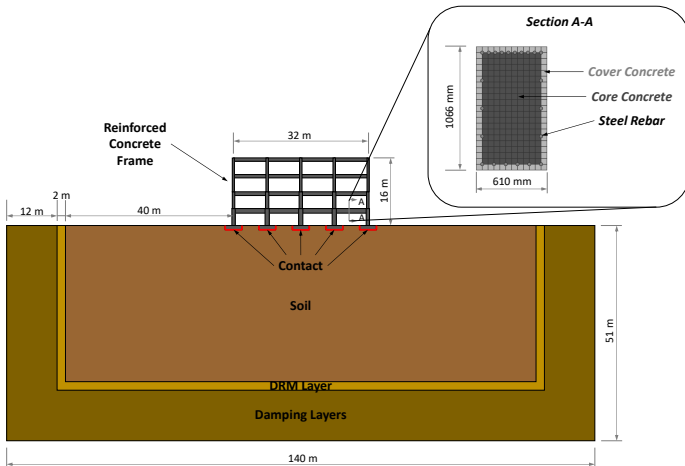


## Plastic Energy Dissipation

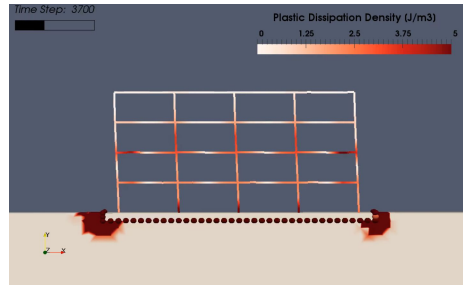
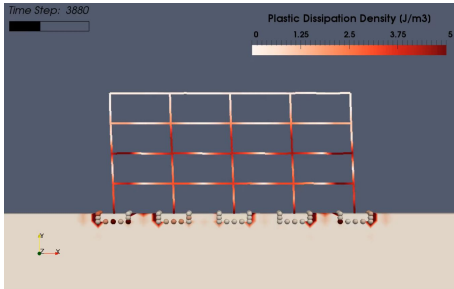
## Energy Dissipation in a Large-Scale Model



# Energy Dissipation for Design

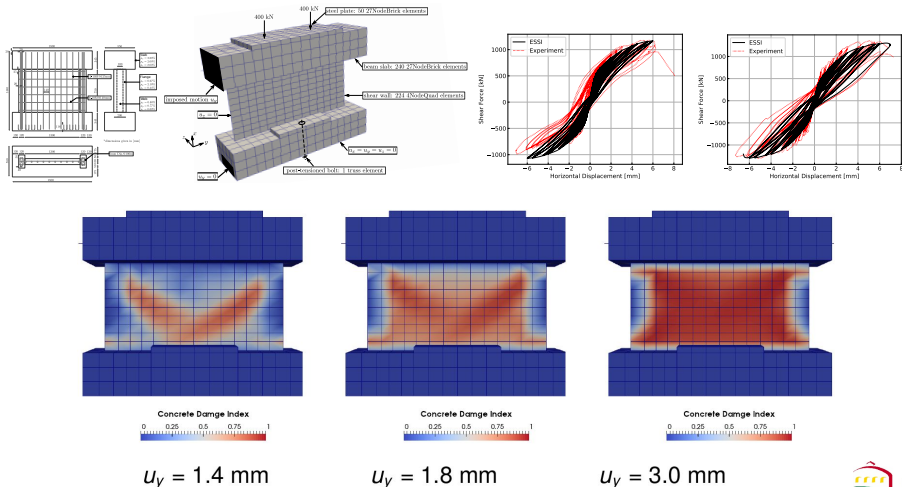


# Design Alternatives

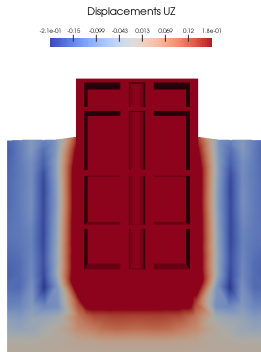
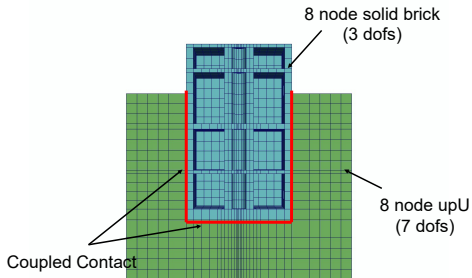


## Plastic Energy Dissipation

## Wall, Regular and ASR Concrete



# Buoyant Force Simulation



# Solid, Structure-Fluid Interaction: gmFoam

## Mesh separation

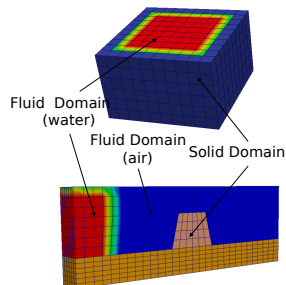
integrated geometry model  
FEM & FVM mesh conversion  
handle discontinuous mesh

## Incorporate gmESSI

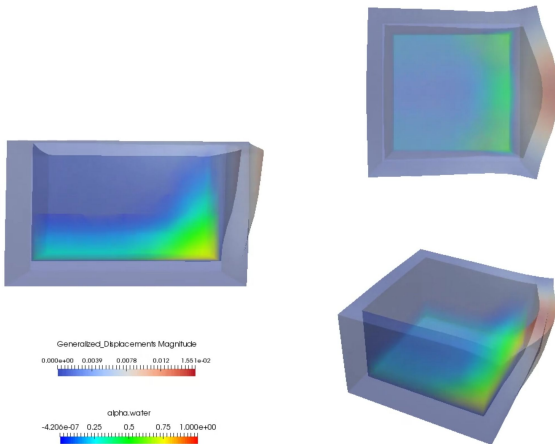
Interface geometry extraction

Interface class **SSFI** in Real-ESSI

Real-ESSI ↔ SSFI ↔ OpenFoam



# Solid, Structure-Fluid Interaction, Example



(MP4)



# Outline

## Introduction

### Motivation

## Real-ESSI Simulator System

### Real ESSI Components

### Stochastic Modeling

### High Performance Computing

## Modeling and Simulation Examples

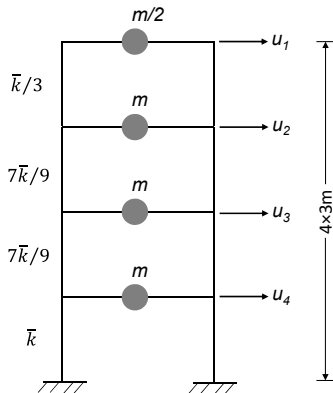
### Seismic Motions

### Plastic Energy Dissipation

### Uncertain Inelasticity

## Conclusion

# Uncertain Stiffness



Lognormal random field for stiffness  $\bar{k}$ :

Marginal mean: 9.84 MN/m

Marginal COV: 10%

Correlation structure:

$$\begin{bmatrix} 1.0 & 0.6 & 0.3 & 0.2 \\ 0.6 & 1.0 & 0.5 & 0.2 \\ 0.3 & 0.5 & 1.0 & 0.7 \\ 0.2 & 0.2 & 0.7 & 1.0 \end{bmatrix}$$

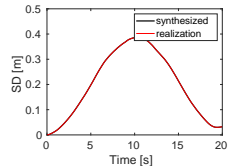
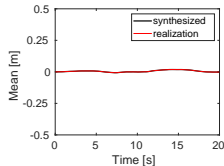
PC rep: dimension 4 order 2

# Uncertain Motion

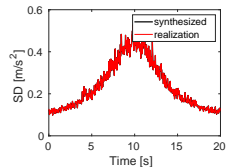
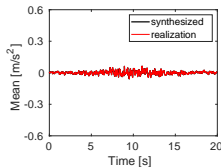
Uncertain bedrock seismic motion:

- Stochastic ground motion modeling
- Marginal PDF: Gaussian  $\rightarrow$  order 1
- PC dimension 150 order 1 to quantify motion random process

PC synthesized statistics  $\Leftarrow$   
of bedrock motion



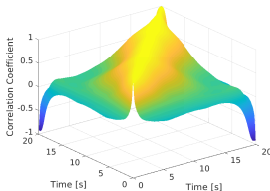
(a) Displacement



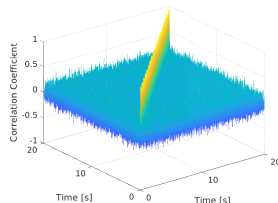
(b) Acceleration

# Uncertain Motion: Non-stationary Correlation Structure

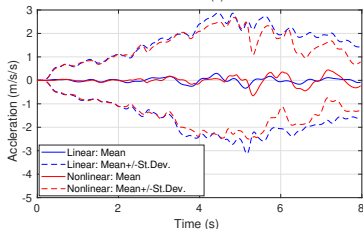
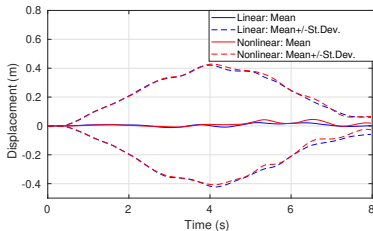
## Displacement



## Acceleration

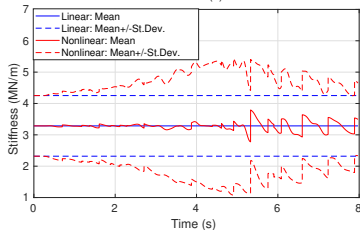
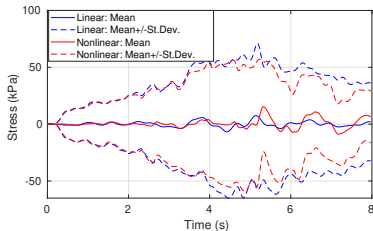


# Uncertain Response on Top



- ▶ Smaller St.Dev. for nonlinear case
- ▶ Magnitude of mean is negligible compared to standard deviation

# Evolution of Stress and Stiffness at Top Floor



- ▶ Smaller St.Dev. of stress for nonlinear case
- ▶ Larger St.Dev. of stiffness introduced by nonlinearity

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# Summary

- ▶ Numerical modeling to predict and inform, rather than fit
- ▶ Sophisticated inelastic/nonlinear modeling and simulations need to be done carefully and in phases
- ▶ Education and Training is the key!
- ▶ Collaborators: Wang, Feng, Yang, Behbehani, Sinha, Wang, Pisanó, Abell, Yang, Cheng, Jie, Tafazzoli, Preisig, Tasiopoulou, Watanabe
- ▶ Funding from and collaboration with the US-DOE, US-NRC, US-NSF, CNSC-CCSN, UN-IAEA, and Shimizu Corp. is greatly appreciated,
- ▶ <http://real-essi.info/>