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Summary

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## On Earthquake Soil Structure Interaction Modeling and Simulation

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NTUA Seminar, June 12th, 2013

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#### Outline

#### Motivation

Problem - Solution

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Uncertainty in Modeling Ground Motions Uncertainty in Modeling Material Errors in Scientific Software

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## The Problem

- Seismic response of Soil/Rock Structure systems
- ► 3D, inclined seismic motions, body and surface waves
- Inelastic (elastic, damage, plastic) behavior of materials: soil, rock, concrete, steel, rubber, etc.)
- Full coupling of pore fluids (in soil, rock, concrete, etc.) with porous material skeleton
- Buoyant effects (foundations below water table)
- Uncertainty in seismic sources, path, soil/rock response and structural response

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Problem - Solution

## Solution

- Physics based modeling and simulation of seismic behavior of Soil/Rock – Structure systems
- Development and use of high fidelity time domain, nonlinear numerical models, in deterministic and probabilistic spaces
- Accurate following of the flow of seismic energy (input and dissipation) within Soil/Rock – Structure system
- Directing, in space and time, with high (known) confidence, seismic energy flow in the soil-foundation-structure system



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Uncertainty in Modeling Ground Motions

# Modeling Uncertainty

- Simplified (or inadequate/wrong) modeling: important features are missed (seismic ground motions, etc.)
- Introduction of uncertainty and (unknown) lack of accuracy in results due to use of un-verified simulation tools (software quality, etc.)
- Introduction of uncertainty and (unknown) lack of accuracy in results due to use of un-validated models (due to lack of quality validation experiments)



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Uncertainty in Modeling Ground Motions

# Complexity of and Uncertainty in Ground Motions

- 6D (3 translations, 3 rotations)
- Vertical motions usually neglected
- Rotational components usually not measured and neglected
- Lack of models for such 6D motions (from measured data))
- Sources of uncertainties in ground motions (Source, Path (rock), soil (rock))



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## Material Behavior Inherently Uncertain

 (a) Spatial variability

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 Point-wise uncertainty:
 (b) testing error,
 (c) transformation error



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### SPT Based Determination of Shear Strength



Transformation of SPT *N*-value  $\rightarrow$  undrained shear strength,  $s_u$  (cf. Phoon and Kulhawy (1999B)

Histogram of the residual (w.r.t the deterministic transformation equation) undrained strength, along with fitted probability density function (Pearson IV)

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### SPT Based Determination of Young's Modulus



Transformation of SPT *N*-value  $\rightarrow$  1-D Young's modulus, *E* (cf. Phoon and Kulhawy (1999B))

Histogram of the residual (w.r.t the deterministic transformation equation) Young's modulus, along with fitted probability density function

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Errors in Scientific Software

## Errors in Scientific Software: The T Experiments

- Les Hatton, Kingston University (formerly of Oakwood Comp. Assoc.)
- "Extensive tests showed that many software codes widely used in science and engineering are not as accurate as we would like to think."
- "Better software engineering practices would help solve this problem,"
- "Realizing that the problem exists is an important first step."
- Large experiment over 4 years measuring faults (T1) and failures (T2) of scientific and engineering codes

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## The T2 Experiments

- Specific application area: seismic data processing (inverse analysis)
- Echo sounding of underground and reconstructing "images" of subsurface geological structure
- Nine mature packages, using same algorithms, on a same data set!
- 14 primary calibration points for results check
- Results "fascinating and disturbing"



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T2: Disagreement at Calibration Points



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## **ESSI Simulator System**

- The ESSI-Program is a 3D, nonlinear, time domain, parallel finite element program specifically developed for Hi-Fi modeling and simulation of Earthquake Soil/Rock Structure Interaction problems on ESSI-Computer.
- The ESSI-Computer is a distributed memory parallel computer, a cluster of clusters with multiple performance processors and multiple performance networks.
- The ESSI-Notes represent a hypertext documentation system detailing modeling and simulation of ESSI problems.



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### **ESSI Simulator Program**

- Based on a Collection of Useful Libraries (modular, portable)
- Library centric software design
- ► Various public domain licenses (GPL, LGPL, BSD, CC)
- Verification (extensive) and Validation (not much)
- Program documentation (part of ESSI Notes)
- Target users: US-NRC staff, CNSC staff, IAEA, LBNL, INL, DOE, Professional Practice and Academia collaborators, expert users



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## Collection of Useful Libraries (Modeling Part)

- Template3D-EP libraries for elastic and elastic-plastic computations (UCD, CC)
- FEMTools finite element libraries provide finite elements (solids, beams, shells, contacts/isolators, seismic input) (UCD, CC)
- Loading, staged, self weight, service loads, seismic loads (the Domain Reduction Method, analytic input (incoming/outgoing) of 3D, inclined, un-correlated seismic motions) (UCD, CC)
- Domain Specific Language for input (UCD, CC)



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# Collection of Useful Libraries (Simulation Part)

- Plastic Domain Decomposition (PDD) for parallel computing (UCD, CC)
- PETSc (ANL, GPL-like), UMFPACK (UF, GPL), ProfileSPD (LBNL, GPL) solvers
- Modified OpenSees Services (MOSS) for managing the finite element domain (UCD, CC; UCB, GPL?)
- nDarray (UCD, CC), LTensor (CIMEC, GPL), BLAS (UTK, GPL) for lower level computational tasks,
- Message Passing Interface (MPI, openMPI, new BSD license)



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# **ESSI Simulator Computer**

A distributed memory parallel (DMP) computer designed for high performance, parallel finite element simulations

- Multiple performance CPUs and Networks
- Most cost-performance effective
- Source compatibility with any DMP supercomputers
- Current systems: 208CPUs, and 40CPUs (8+32) and 160CPUs (8x5+2x16+24+64)





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# ESSI Computer Version April 2012

Operating System: Ubuntu Kernel: 3.2

Controller: 1 node + Compute: 8 Nodes

- CPU: 2 x 12 cores Opteron 6234 = 24 cores
- RAM: 32GB (8 x 4GB)
- NICs:
  - GigaBit: Intel 82576 (Controller)
  - InfiniBand: ConnectX-2 QDR IB 40Gb/s (Controller+Compute)
- Disk: 8 × 2TB Toshiba MK2002TSKB (Controller)
- Disk: 1TB Toshiba MK1002TSKB (Compute)

Network (dual):

- ► GigaBit: HP ProCurve Switch 1810-48G 48 Port
- InfiniBand:: Mellanox MIS5030Q-1SFCA 36-port QDR

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## **ESSI Simulator Notes**

- A hypertext documentation system describing in detail modeling and simulations of ESSI problems
  - Theoretical and Computational Formulations (FEM, EL-PL, Static and Dynamic solution, Parallel Computing)
  - Software and Hardware Platform Design (OO Design, Library centric design, API, DSL, Software Build Process, Hardware Platform)
  - Verification and Validation (code V, Components V, Static and Dynamic V, Wave Propagation V)
  - Application to Practical Earthquake Soil/Rock Structure Interaction Problems (ESSI with 3D, inclined, uncorrelated seismic waves, ESSI with foundation slip, isolators. liquefaction)



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# ESSI: High Fidelity Modeling

- Seismic energy influx, body and surface waves, 3D, inclined
- Mechanical dissipation outside of SSI domain:
  - Radiation of reflected waves
  - Radiation of oscillating SSI system
- Mechanical dissipation inside SSI domain:
  - Plasticity of soil/rock subdomain
  - Viscous coupling of porous solid with pore fluid (air, water)
  - Plasticity and viscosity of foundation soil/rock contact
  - Plasticity/damage of the structure
  - Viscous coupling of structure/foundation with fluids
- Numerical energy dissipation/production

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## ESSI: High Performance, Parallel Computing

- The ESSI Program can be used in both sequential and parallel modes
- ► For high fidelity models, parallel is really the only option
- High performance, parallel computing using Plastic Domain Decomposition Method
- Developed for multiple/variable capability CPUs and networks (DMP and SMPs)



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### **ESSI:** Finite Elements

- Linear and nonlinear truss element
- Linear and nonlinear beam (disp. based), variable BC el.
- Linear shell Triangle and Quad with drilling DOFs
- Single phase solid bricks (8, 20, 27, 8-20, 8-27 nodes)
- ► Two phase (fully coupled, porous solid, pore fluid) solid bricks (8, 20 and 27 node: u - p - U, u - p)
- Dry friction slip and gap element
- Saturated gap and slip element
- Seismic isolator (latex rubber, neoprene rubber, rubber with lead core, friction pendulum)



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## ESSI: Material Models for Solids and Structures

- Small deformation elastic: linear, nonlinear isotropic, cross anisotropic
- Small deformation elastic-Plastic: von Mises, Drucker–Prager, Cam–Clay, Rounded Mohr–Coulomb, Parabolic Leon, SaniSand2004, SaniSand2008, SaniClay, Pisanò; Gens normal contact and Coulomb shear contact model; 1D concrete and steel models
- Large deformation elastic and elastic-plastic: Ogden, neo-Hookean, Mooney-Rivlin, Logarithmic, Simo-Pister, von Mises, Drucker-Prager



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# ESSI: Earthquake Ground Motions

Realistic earthquake ground motions

- Body: P and S waves
- Surface: Rayleigh, Love waves, etc.
- Lack of correlation (incoherence)
- Inclined waves
- 3D waves
- Seismic input: Domain Reduction Method (Bielak et al.)
  - Dynamically consistent replacement seismic source
  - The only outgoing waves are from dynamics of the structure
  - Material can be elastic-plastic
  - All types of seismic waves (body, surface...) are properly modeled

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## Verification, Validation and Prediction

- Verification: the process of determining that a model implementation accurately represents the developer's conceptual description and specification. Mathematics issue. Verification provides evidence that the model is solved correctly.
- Validation: The process of determining the degree to which a model is accurate representation of the real world from the perspective of the intended uses of the model. Physics issue. Validation provides evidence that the correct model is solved.
- Prediction: use of computational model to foretell the state of a physical system under consideration under conditions for which the computational model has not been validated

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#### Role of Verification and Validation



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Oden et al.



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Verification and Validation Suite

#### Importance of V&V

- V & V procedures are the primary means of assessing accuracy in modeling and computational simulations
- V & V procedures are the tools with which we build confidence and credibility in modeling and computational simulations



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### V & V for ESSI Modeling and Simulations

- Material modeling and simulation (elastic, elastic-plastic...)
- Finite elements (solids, structural, special...)
- Solution advancement algorithms (static, dynamic...)
- Seismic input and radiation
- Finite element model verification



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## Mesh Size Effects on Seismic Wave Propagation Modeling

- Finite element mesh "filters out" high frequencies
- Usual rule of thumb: 10-12 elements needed per wave length
- 1D wave propagation model
- 3D finite elements (same in 3D)
- Motions applied as displacements at the bottom

case	model height [m]	<i>V<sub>s</sub></i> [m/s]	El.size [m]	f <sub>max</sub> (10el) [Hz]
3	1000	1000	10	10
4	1000	1000	20	5
6	1000	1000	50	2

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#### Cases 3, 4, and 6, Ormsby Wavelet Input Motions



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#### Cases 3, 4, and 6, Surface Motions



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#### Cases 3, 4, and 6, Input and Surface Motions, FFT



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#### Seismic Body and Surface Waves

- Both body (P, SV and SH) and surface (Rayleigh, Love, etc.) waves are present
- Surface waves carry most seismic energy
- Analytic (Aki and Richards, Trifunac and Lee, Hisada et al., fk, etc.) and numerically generated, 3D, inclined (plane) body and surface waves are used in tests
- Seismic moment from a point source at 2km depth used
- Stress drop at the source: Ricker and/or Ormsby wavelets



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#### Seismic Source Mechanics

Stress drop, Ormsby wavelet



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### Middle (Structure Location) Plane, Top 2km



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### Verification: Displacements, Top Middle Point



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#### Verification: Disp. and Acc., Out of DRM



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## Uncertainty Propagation through Constitutive Eq.

• Incremental el-pl constitutive equation  $\Delta \sigma_{ij} = D_{ijkl} \Delta \epsilon_{kl}$ 

$$D_{ijkl} = \left\{ egin{array}{ll} D^{el}_{ijkl} & ext{for elastic} \ D^{el}_{ijkl} - rac{D^{el}_{ijmn}m_{mn}n_{pq}D^{el}_{pqkl}}{n_{rs}D^{el}_{rstu}m_{tu} - \xi_*r_*} & ext{for elastic-plastic} \end{array} 
ight.$$

- What if all (any) material parameters are uncertain
- PEP and SEPFEM methods for spatially variable and point uncertain material

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## Probabilistic Stress Solution: Eulerian–Lagrangian form of FPK Equation

$$\begin{aligned} \frac{\partial P(\sigma_{ij}(x_{t},t),t)}{\partial t} &= \frac{\partial}{\partial \sigma_{mn}} \left[ \left\{ \left\langle \eta_{mn}(\sigma_{mn}(x_{t},t), E_{mnrs}(x_{t}), \epsilon_{rs}(x_{t},t)) \right\rangle \right. \\ &+ \int_{0}^{t} d\tau Cov_{0} \left[ \frac{\partial \eta_{mn}(\sigma_{mn}(x_{t},t), E_{mnrs}(x_{t}), \epsilon_{rs}(x_{t},t))}{\partial \sigma_{ab}}; \right. \\ &\left. \eta_{ab}(\sigma_{ab}(x_{t-\tau},t-\tau), E_{abcd}(x_{t-\tau}), \epsilon_{cd}(x_{t-\tau},t-\tau) \right] \right\} P(\sigma_{ij}(x_{t},t),t) \right] \\ &+ \left. \frac{\partial^{2}}{\partial \sigma_{mn}\partial \sigma_{ab}} \left[ \left\{ \int_{0}^{t} d\tau Cov_{0} \left[ \eta_{mn}(\sigma_{mn}(x_{t},t), E_{mnrs}(x_{t}), \epsilon_{rs}(x_{t},t)); \right. \\ &\left. \eta_{ab}(\sigma_{ab}(x_{t-\tau},t-\tau), E_{abcd}(x_{t-\tau}), \epsilon_{cd}(x_{t-\tau},t-\tau)) \right] \right\} P(\sigma_{ij}(x_{t},t),t) \right] \end{aligned}$$

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# Eulerian–Lagrangian FPK Equation and (SEP)FEM

Advection-diffusion equation

$$\frac{\partial P(\sigma_{ij}, t)}{\partial t} = -\frac{\partial}{\partial \sigma_{ab}} \left[ N_{ab}^{(1)} P(\sigma_{ij}, t) - \frac{\partial}{\partial \sigma_{cd}} \left\{ N_{abcd}^{(2)} P(\sigma_{ij}, t) \right\} \right]$$

- Complete probabilistic description of response
- Second-order exact to covariance of time (exact mean and variance)
- ► Any uncertain FEM problem ( $M\ddot{u} + C\dot{u} + Ku = F$ ) with
  - ► uncertain material parameters (stiffness matrix K),
  - uncertain loading (load vector F)

can be analyzed using PEP and SEPFEM to obtain PDFs of DOFs, stress, strain...

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#### Probabilistic Elastic-Plastic Response



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#### Probabilistic Elastic-Plastic Response



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#### Spectral Stochastic Elastic–Plastic FEM

 Minimizing norm of error of finite representation using Galerkin technique (Ghanem and Spanos 2003):

$$\sum_{n=1}^{N} \mathcal{K}_{mn}^{ep} d_{ni} + \sum_{n=1}^{N} \sum_{j=0}^{P} d_{nj} \sum_{k=1}^{M} C_{ijk} \mathcal{K}_{mnk}^{'ep} = \langle F_m \psi_i[\{\xi_r\}] \rangle$$
$$\mathcal{K}_{mn}^{ep} = \int_{D} B_n E^{ep} B_m dV \qquad \mathcal{K}_{mnk}^{'ep} = \int_{D} B_n \sqrt{\lambda_k} h_k B_m dV$$
$$C_{ijk} = \langle \xi_k(\theta) \psi_i[\{\xi_r\}] \psi_j[\{\xi_r\}] \rangle \qquad F_m = \int_{D} \phi N_m dV$$

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#### "Uniform" CPT Site Data



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### Full PDFs of all DOFs (and $\sigma_{ij}$ , $\epsilon_{ij}$ , etc.)

- Stochastic Elastic-Plastic Finite Element Method (SEPFEM)
- Dynamic case
- Full PDF at each time step ∆t



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### PDF at each $\Delta t$ (say at 6 s)



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### $\text{PDF} \rightarrow \text{CDF}$ (Fragility) at 6 s



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## Probability of Unacceptable Deformation (50cm)



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- High fidelity, time domain, nonlinear, earthquake soil structure interaction (ESSI) modeling and simulations (deterministic and probabilistic)
- The ESSI Simulator System (Program, Computer, Lecture Notes)
- Educational effort is essential (US-NRC, CNSC, IAEA, UCD, LBNL, INL, companies), seminars, short courses
- Funding from the US-NRC, DOE, NSF, and CNSC is much appreciated



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