

Three-dimensional site characterization (SC) using full-waveform inversion (FWI) –A Garner Valley case study

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MUSE

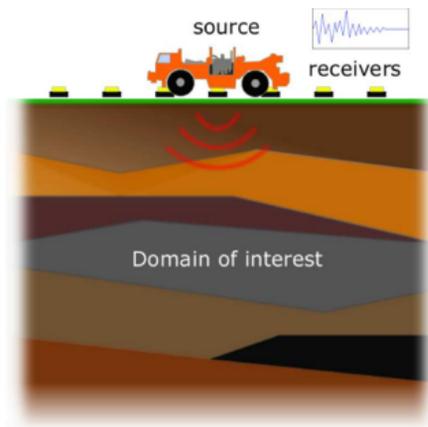
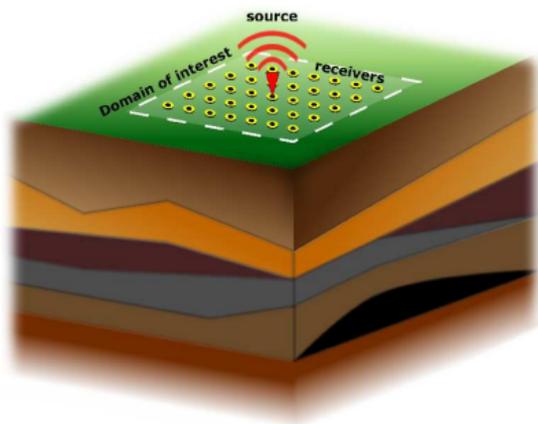
THE UNIVERSITY OF TEXAS AT AUSTIN - COCKRELL SCHOOL OF ENGINEERING
DEPARTMENT OF CIVIL, ARCHITECTURAL AND ENVIRONMENTAL ENGINEERING
MECHANICS, UNCERTAINTY, AND SIMULATION IN ENGINEERING



Site Characterization (SC) by Full-Waveform Inversion (FWI)

(earth tomography; imaging; geophysical probing)

Technical goal: to construct the material profile of a probed, **semi-infinite**, **arbitrarily heterogeneous**, near-surface, geologic formation, using **elastic waves** for interrogation, and records of the **complete** waveforms of the formation's response in the **time-domain**



Three-dimensional site characterization (SC) - Challenges

- SC is an inverse-medium problem
 - ▶ Ill-posed (solution multiplicity), sensor-driven (data uncertainty / quality)
- SC focuses on near-surface deposits
 - ▶ Physical domain is semi-infinite
 - ▶ Computational domain must be finite
 - ▶ → domain truncation is needed
- Sensor/source deployment is hindered (...by the earth)
 - ▶ → data are limited
- Sought properties are spatially distributed
 - ▶ A $100\text{m} \times 100\text{m} \times 30\text{m}$ box → $2 - 10 \times 10^6$ unknown properties post discretization

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→ The SC imaging problem is similar to medical imaging, but the SC problem is considerable more complex/challenging.

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- The SC imaging problem is similar to medical imaging, but the SC problem is considerable more complex/challenging.
- Robustness/complexity, scale issues, algorithmic challenges

Three-dimensional site characterization by FWI - In pictures

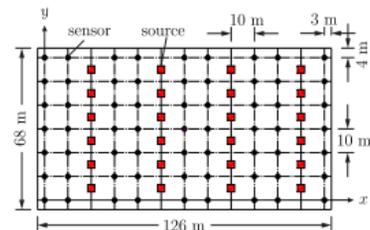
From the site...



...using...



...and planning...



Three-dimensional site characterization by FWI - In pictures

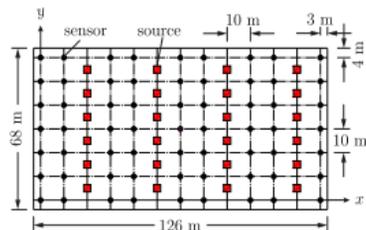
From the site...



...using...



...and planning...



...through modeling...

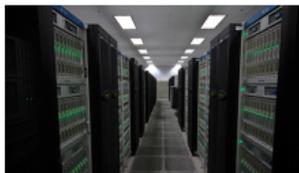
$$\mathcal{L}^l(\mathbf{u}, \mathbf{S}, \mathbf{w}, \mathbf{T}, \lambda, \mu)(\tilde{\mathbf{w}}, \tilde{\mathbf{T}}) = 0$$

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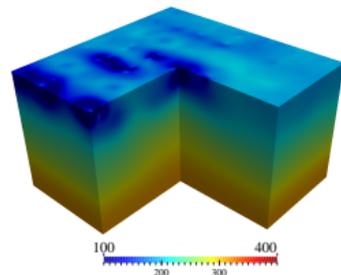
$$\mathcal{L}^l(\mathbf{u}, \mathbf{S}, \mathbf{w}, \mathbf{T}, \lambda, \mu)(\tilde{\lambda}) = 0$$

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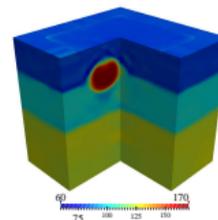
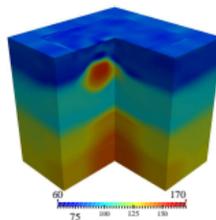
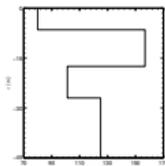
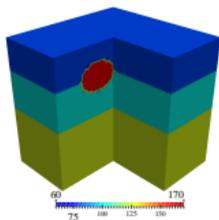
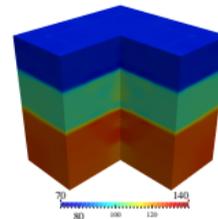
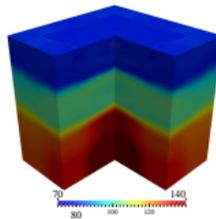
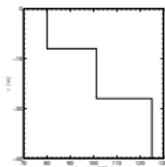
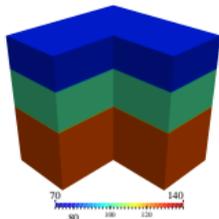
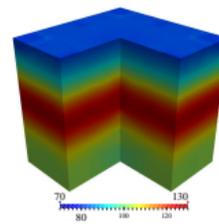
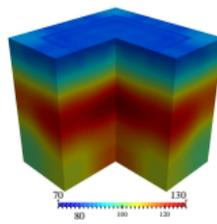
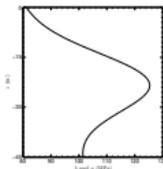
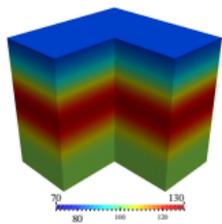
...and computing...



...to imaging



3D SC by FWI - Synthetic targets and inverted profiles (summary)



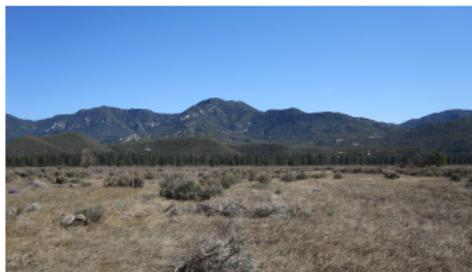
Target

cross-section

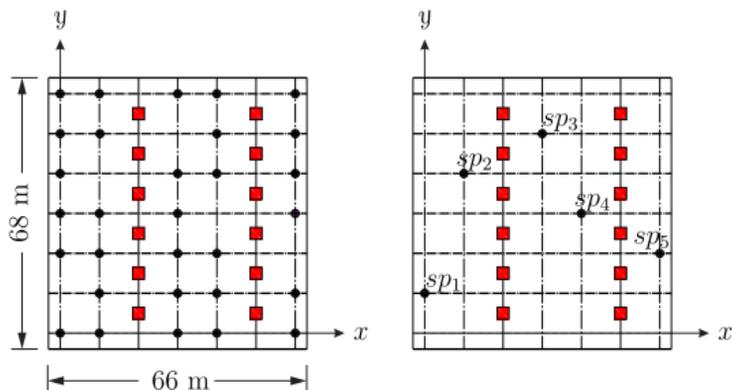
inverted λ

inverted μ

3D SC by FWI at GV - The field experiment



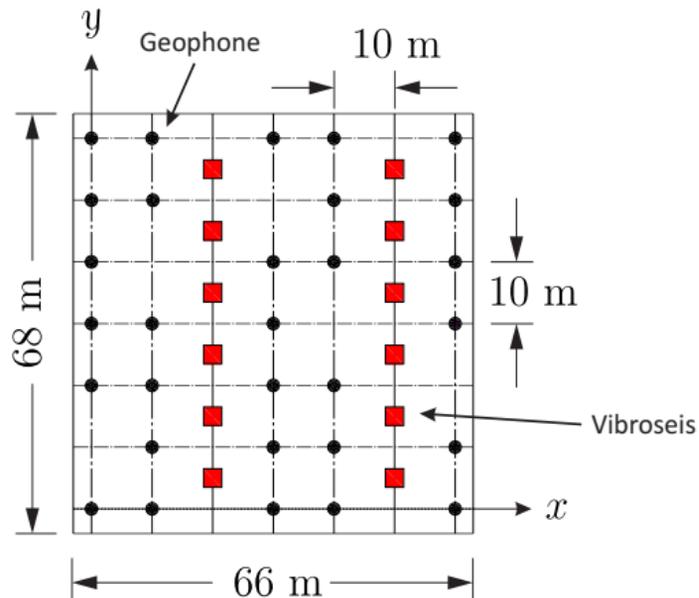
(a) Garner Valley



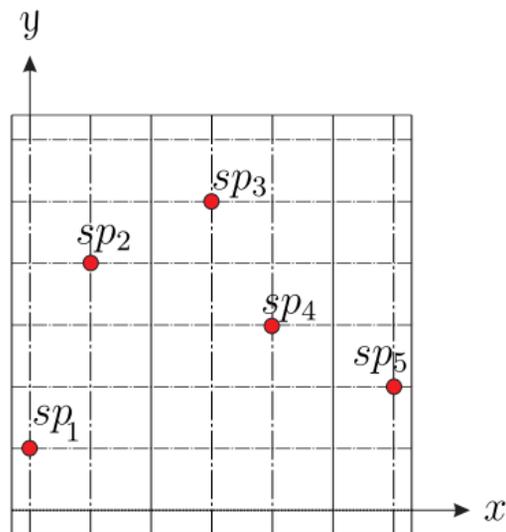
(b) Experiment layout; sensors (dots) - sources (squares); control sensors

computational domain: $66 \text{ m} \times 68 \text{ m} \times 40 \text{ m} + 10 \text{ m-thick PML}$
unknown material parameters: 379,086
state unknowns: 2,433,408

3D SC by FWI at GV - The experiment layout



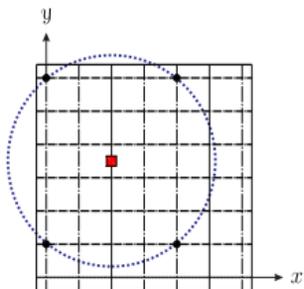
30 single-component geophones
12 Vibroseis source locations



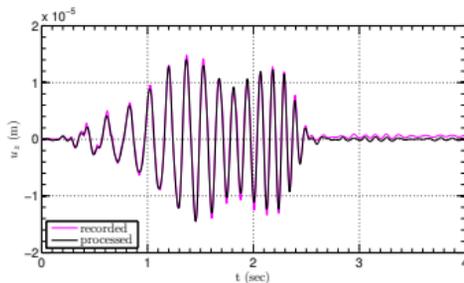
Control geophones not used for FWI

Source signals are 3-10Hz chirps, total duration of 2.5s

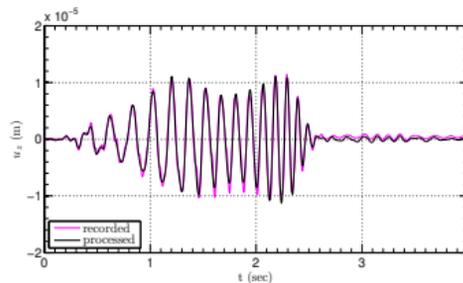
3D SC by FWI at GV - Evidence of heterogeneity



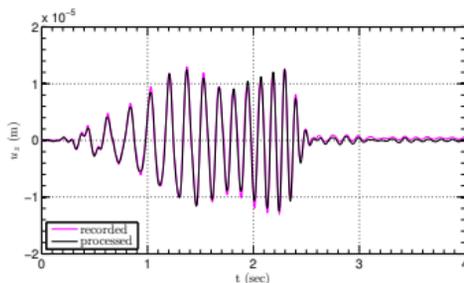
Source and equidistant
sensors



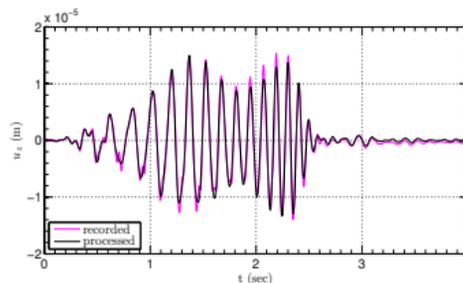
(b) $(x, y) = (0, 60)$ m



(c) $(x, y) = (40, 60)$ m

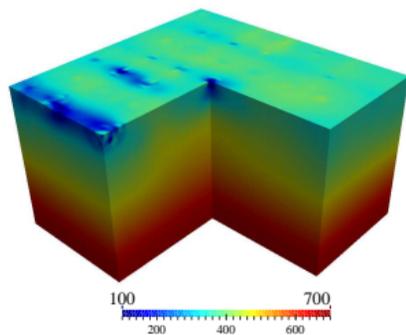


(d) $(x, y) = (0, 10)$ m

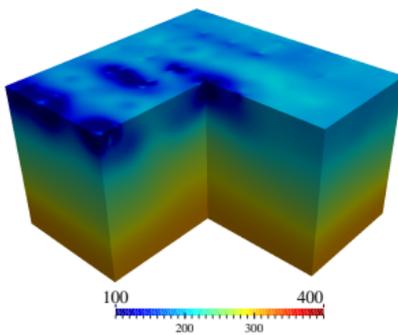


(e) $(x, y) = (40, 10)$ m

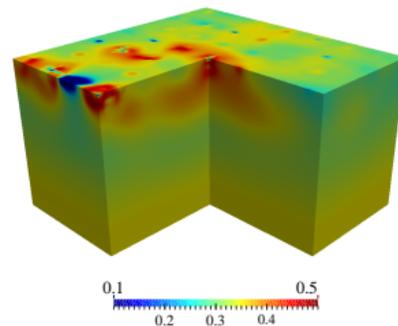
3D SC by FWI at GV - Inverted Garner Valley profiles



P-wave velocity c_P

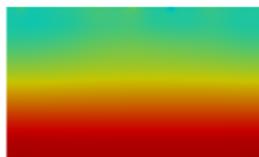


S-wave velocity c_S

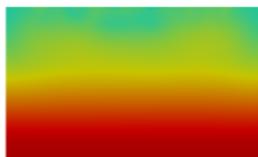


Poisson's ratio
(range is mostly
0.30-0.35)

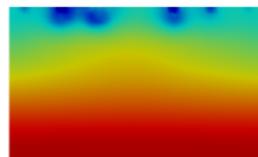
3D SC by FWI at GV - Cross-sectional profiles



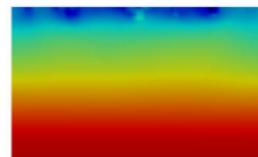
(a) c_p at $x = 0\text{m}$



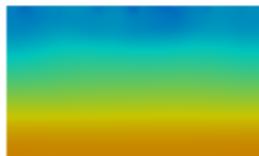
(b) c_p at $x = 20\text{m}$



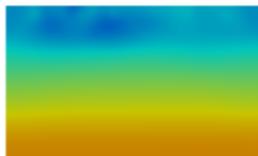
(c) c_p at $x = 40\text{m}$



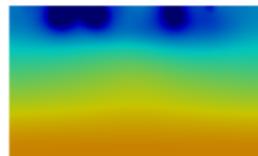
(d) c_p at $x = 60\text{m}$



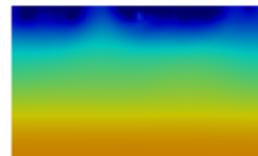
(e) c_s at $x = 0\text{m}$



(f) c_s at $x = 20\text{m}$

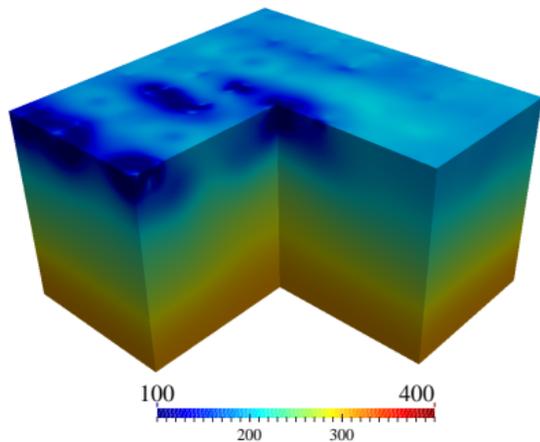


(g) c_s at $x = 40\text{m}$

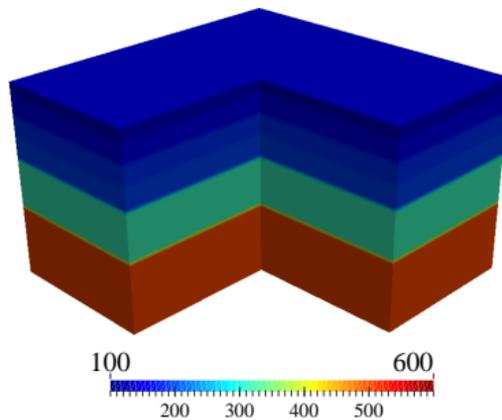


(h) c_s at $x = 60\text{m}$

3D SC by FWI at GV - FWI vs SASW



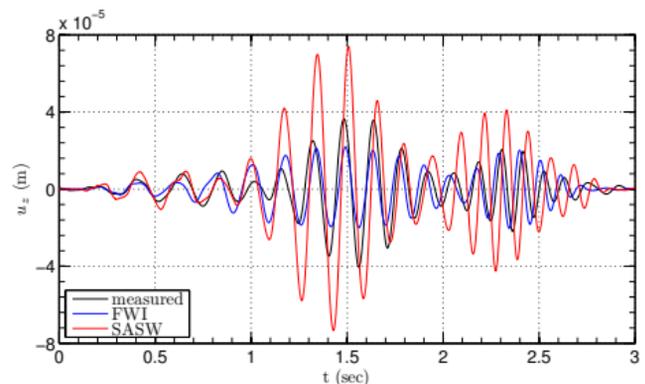
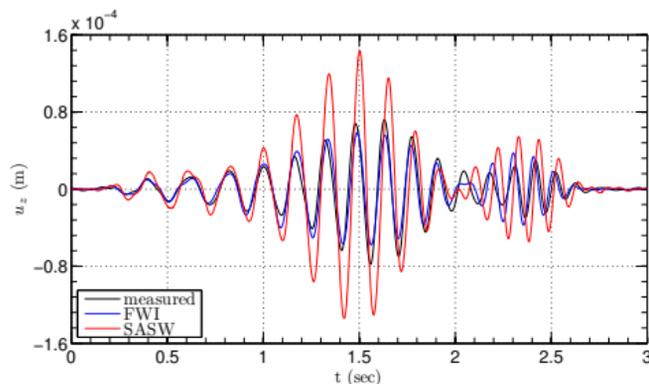
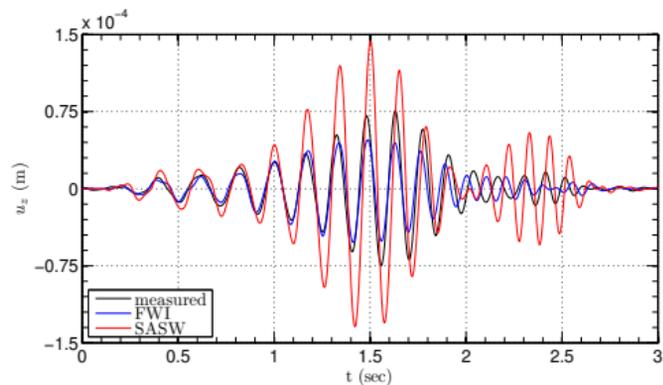
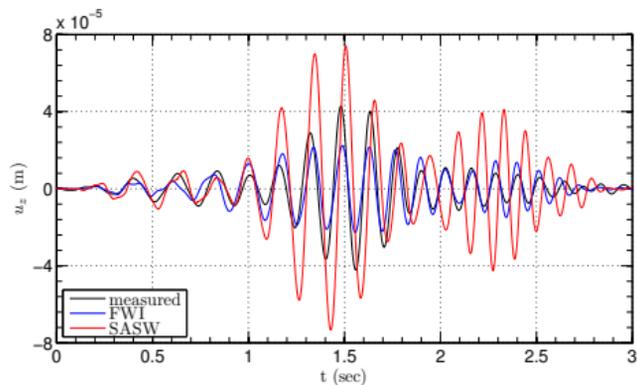
(a) FWI-based S wave velocity



(b) SASW-based S wave velocity

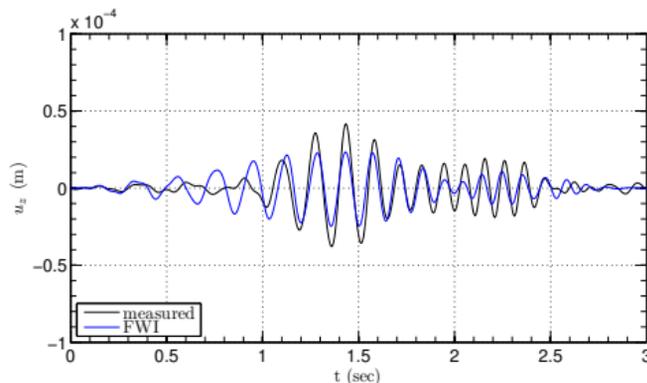
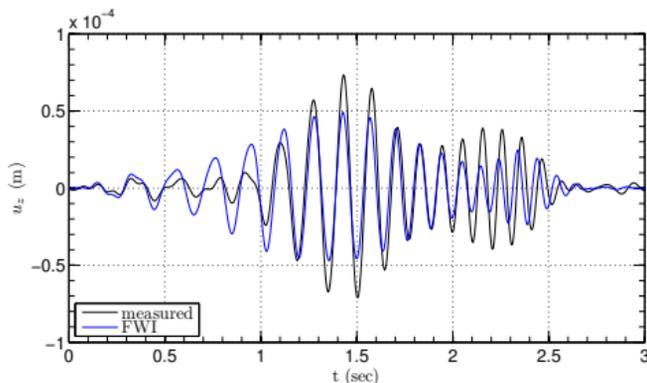
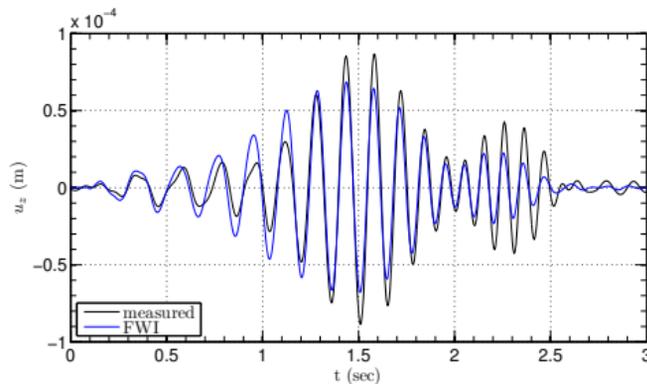
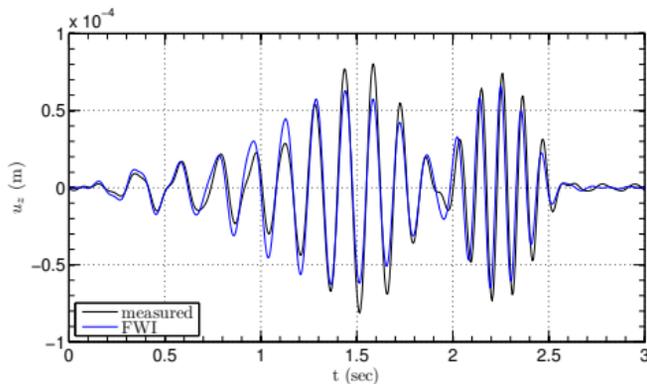
3D SC by FWI at GV - FWI vs SASW

Vertical component time-history comparisons at $x = 0\text{m}$ (various y)



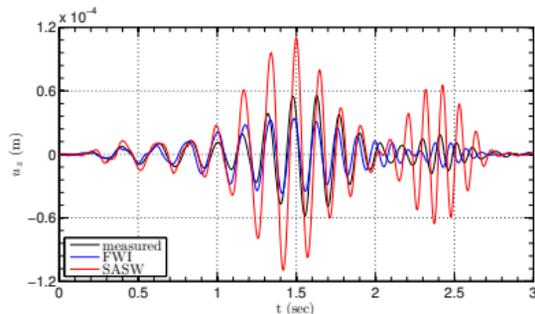
3D SC by FWI at GV - FWI vs measurements

Vertical component time-history comparisons at $x = 10\text{m}$ (various y)

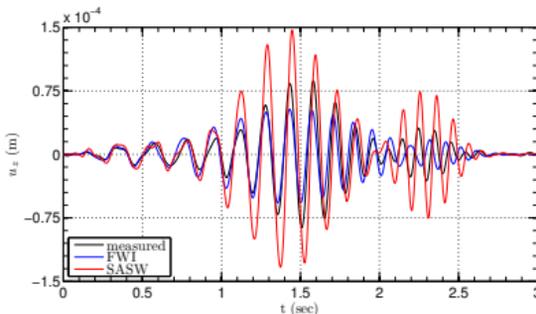


3D SC by FWI at GV - Control geophones response

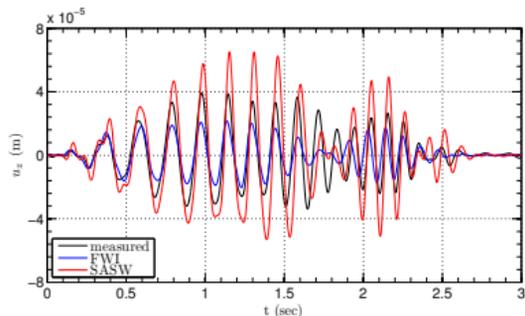
Control geophones were not used for FWI



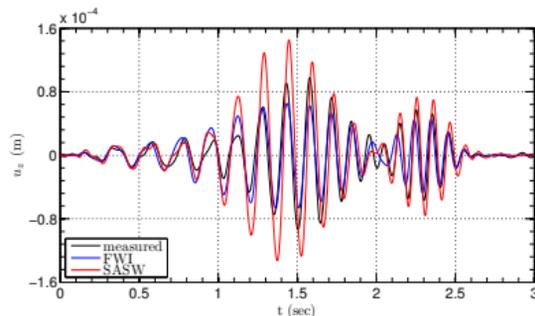
(a) sensor $sp_1(x, y) = (0, 10)\text{m}$



(b) sensor $sp_2(x, y) = (10, 40)\text{m}$



(c) sensor $sp_3(x, y) = (30, 50)\text{m}$



(d) sensor $sp_5(x, y) = (60, 20)\text{m}$

Summary

- A systematic framework for near-surface imaging
- Development of a 3D, parallel, explicit, hybrid, unsplit-field PML, forward wave simulator, where a displacement-stress formulation for the PML is coupled with a standard displacement-only formulation for the regular domain, leading to optimal computational cost
- Several algorithmic refinements (continuation and biasing schemes) to allow for robust 3D inversion
- Numerical results using synthetic and field data quite encouraging

Related articles

-  **A. Fathi, B. Poursartip, K.H. Stokoe II, L.F. Kallivokas**
Three-dimensional P- and S-wave velocity profiling of geotechnical sites using full-waveform inversion driven by field data, *Soil Dynamics and Earthquake Engineering*, 87, 63–81, 2016
-  **A. Fathi, B. Poursartip, Loukas F. Kallivokas**
Time-domain hybrid formulations for wave simulations in three-dimensional PML-truncated heterogeneous media, *International Journal for Numerical Methods in Engineering*, 101(3), 165–198, 2015
-  **A. Fathi, L.F. Kallivokas, B. Poursartip**
Full-waveform inversion in three-dimensional PML-truncated elastic media, *Computer Methods in Applied Mechanics and Engineering*, 296, 39–72, 2015
-  **S. Kucukcoban and L.F. Kallivokas**
A symmetric hybrid formulation for transient wave simulations in PML-truncated heterogeneous media, *Wave Motion*, 50 (1), 57–79, 2013
-  **L. F. Kallivokas, A. Fathi, S. Kucukcoban, K. H. Stokoe II, J. Bielak, O. Ghattas**
Site characterization using full waveform inversion, *Soil Dynamics and Earthquake Engineering*, 47, 62–82, 2013
-  **J.W Kang and L.F. Kallivokas**
The inverse medium problem in PML-truncated domains using scalar probing waves, *Computer Methods in Applied Mechanics and Engineering*, 200 (1-4), 265–283, 2011
-  **S-W. Na and L.F. Kallivokas**
Direct time-domain soil profile reconstruction for one-dimensional semi-infinite domains, *Soil Dynamics and Earthquake Engineering*, 29, 1016–1026, 2009