



# Self-Sensing Systems and Smart Structures to Secure Safety



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> Khaje Nasir Toosi University of Technology December 30, 2014

# **Overview:**

- 1) Motivation
- 2) Reference-free corrosion diagnosis in prestressed steel strands using GUW
- 3) Acoustic emission monitoring of concrete shear walls
- 4) Advanced visual inspection through fractal analysis of crack patterns
- 5) Complementary projects
- 6) Conclusions



Motivation Corrosion-Ultrasonic Shear walls-Acoustics Fractal-Visual Complementary Conclusions

# Health Monitoring, a critical component of safe structures



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# Steps for a comprehensive evaluation



## Localization

Highlighting the location of damage



# Diagnosis

Identifying the nature, cause, or extent of damage



# Prognosis

A prediction about how damage will develop and what will be the remaining life given the current damage state

Localization Diagnosis Prognosis Comprehensive Evaluation 4







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- More than 25% of bridges built in USA are pre-stressed (e.g., OR 50%., FL 48%, WA 42%)
- PS strands are the main load-carrying components
- PS strands are prone to corrosion defects which may lead to loss of prestress (tendon failures in Hampshire 1967, Berlin 1980, Wales 1985, Florida 1999 and 2000, North Carolina 2001)
- Considerable savings in bridge maintenance if repairs would be implemented in a timely manner.



## Motivation Corrosion-Ultrasonic Shear walls-Acoustics Fractal-Visual Complementary Conclusions

# **Guided Ultrasonic Waves (GUWs)**



<u>GUIDED WAVES:</u> are stress waves generated from the constructive interference of Longitudinal and Shear bulk waves

WAVEGUIDE: Rods, Plates, Tubes...



# ADVANTAGES:

- The use of transducers that are permanently attached to the structural element to perform real-time SHM and routine inspection with the same sensing system,
- The ability to probe a large area of the structure, locating cracks and notches from only a few monitoring points
- The capability to detect both active cracks and pre-existing cracks by toggling between the modes of "passive" acoustic emission testing and "active" ultrasonic testing.







Motivation Corrosion-Ultrasonic

Shear walls-Acoustics Fractal-Visual

-Visual Complementary Conclusions



Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011



## **Numerical Modeling**



Numerical Modeling



Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011

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## **Numerical Modeling**



Effect of corrosion on dispersion curves

Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011

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# **Numerical Modeling** Effect of corrosion on dispersion curves Velocity [m/sec] Frequency-diameter [kHz-mm]

Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011







Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011

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A Farhidzadeh (2014), Application of Pattern Recognition Algorithms and Nondestructive Evaluation Techniques for the Structural Health Monitoring of Civil Structures, PhD dissertation, Department of Civil, Structural, and Environmental Engineering, University at Buffalo, Buffalo, NY

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Sensor layout: Pitch-catch configuration



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Visual Inspection, load and mass loss monitoring

No corrosion (Mass loss = 0.0%)



Light corrosion (Mass loss = 0.19%)

# Pitting (Mass loss = 1.26%)

Heavy Pitting (Mass loss = 2.72%)

Cross section loss (Mass loss = 8.38%)





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Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011

Wire breakage

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Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011

**Corrosion-Ultrasonic** Motivation



Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011

**Corrosion-Ultrasonic Motivation** 

Fractal-Visual



Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011





Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011

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Motivation Corro

**Corrosion-Ultrasonic** 

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Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, doi:10.1016/j.ultras.2014.11.011



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## Motivation Corrosion-Ultrasonic Shear walls-Acoustics Fractal-Visual Complementary Conclusions

## Visual inspection



Motivation





## Motivation Corrosion-Ultrasonic Shear walls-Acoustics Fractal-Visual Complementary Conclusions

Visual inspection







Motivation Corrosion-Ultrasonic Shear walls-Acoustics Fractal-Visual Complementary Conclusions



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# **Acoustic Emission (AE)**





Motivation

Japan Construction and Material Standard (JCMS)



Aggelis, D G, et al (2012), Ohtsu , M (2010)



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# Crack mode identification



**A. Farhidzadeh,** A. C. Mpalaskas, T. E. Matikas, et al, (2014), Fracture Mode Identification in Cementitious Material using Supervised Pattern Recognition of Acoustic Emission Features, Construction and Building Materials, 67: 129-138.







The open questions: "What is the best discriminant line?" "Is the decision boundary a line?" "Is there really two clusters?"



A. Farhidzadeh, S. Salamone, P. Singla, (2012), "A Probabilistic Approach ...", J Intelligent Material Systems and Structures, 24 (14), 1722-1735.

**Gaussian Mixture Model** (GMM) is a parametric probability density function represented as a weighted sum of M component Gaussian densities.

$$p(\vec{x} \mid \lambda) = \sum_{i=1}^{M} \omega_i \,\mathcal{N}_i \,(\vec{x} \mid \vec{\mu}_i \,, \sum_i) \qquad i=1, \, ..., \, \mathbf{M},$$

 $\vec{x}$ : *D*-dimensional feature (observation) vector, in this study  $\lambda = \{\omega_i, \vec{\mu}_i, \sum_i\}, \quad i = 1, ..., M$  Model Parameters, weight, mean, covariance  $\omega_i$ : mixture weights

 $\mathcal{N}_i(\vec{x} \mid \vec{\mu}_i, \sum_i)$ : unimodal component Gaussian (Normal) densities




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A. Farhidzadeh, S. Salamone, P. Singla, (2012), "A Probabilistic Approach ...", J Intelligent Material Systems and Structures, 24 (14), 1722-1735.







A Farhidzadeh et al., (2013) Gaussian mixture modeling of acoustic emissions for structural health monitoring of reinforced concrete structures, SPIE Smart Structures/NDE, doi:10.1117/12.2008705



# Likelihood Ratio Test



A. Farhidzadeh, S. Salamone, P. Singla, (2012), "A Probabilistic Approach ...", J Intelligent Material Systems and Structures, 24 (14), 1722-1735.



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Ultrasonic Shea



A. Farhidzadeh, S. Salamone, P. Singla, (2012), "A Probabilistic Approach ...", J Intelligent Material Systems and Structures, 24 (14), 1722-1735.



Motivation Corrosion-Ultrasonic



**A. Farhidzadeh**, S. Epackachi, S. Salamone, A. Whittaker, (2014), Bayesian Decision and Mixture Models for Multi-scale Damage Interrogation in Composite Shear Walls Using Acoustic Emission, to be submitted to an ASCE Journal



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#### IIs-Acoustics Fractal-Visual Complementary Conclusions

## Numerical modeling of damage

LS-DYNA keyword deck by LS-PrePost Time = 0.208 Contours of Effective Strain (v-m)-Infinitesimal min=7.07208e-07, at elem# 56080 max=0.00210166, at elem# 11545 max displacement factor=2 Number of elements cracked=10



S. Epackachi (2014)

Z Y X



Damage localization using acoustic emission









**A. Farhidzadeh**, S. Epackachi, S. Salamone, A. Whittaker, (2014), Bayesian Decision and Mixture Models for Multi-scale Damage Interrogation in Composite Shear Walls Using Acoustic Emission, to be submitted to an ASCE Journal







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## **Engineering Challenge**





1<sup>st</sup> EQ: Sep 2010, M=7.1 2<sup>nd</sup> EQ: Feb 2011, M=6.3

Canterbury television building, Christchurch, New Zealand 2011



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Fractal-Visual









Motivation **Fractal-Visual** 



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# Damage grade assessment based on International Atomic Energy Agency guidebook (IAEA)

<0.2 mm	Hairline, Non-structural	slight	No
0.2 mm~1.0 mm	Medium, structural	moderate	Yes
>1.0 mm	Wide, structural	Critical	Yes



**A. Farhidzadeh**, et al (2013), Damage assessment of reinforced concrete structures using fractal analysis of residual crack patterns, *Experimental Mechanics*, 53(2):1607–1619.

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MotivationCorrosion-UltrasonicShear walls-AcousticsFractal-VisualComplementary ConclusionsEuclidean dimensionD=2D=3D=3

The term "Fractal" was first introduced by Mandelbrot in 1975 to indicate objects whose complex geometry cannot be characterized by an integer dimension.



**Electrical Flow** 

Tree branches

Romanesque broccoli 56 **University at Buffalo** The State University of New York

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A fractal dimension is a ratio providing a statistical index of complexity comparing how detail in a pattern changes with the scale at which it is measured.

Intuitive example for understanding Fractal dimension:







The first four iterations of the Koch snowflake

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# **Box counting algorithm:**

The object is covered with a collection of square boxes, and the number of elements of a given size r is counted to see how many of them are necessary to completely cover the object N(r).

$$D = \lim_{r \to 0} \left( \frac{\log N(r)}{\log(1/r)} \right)$$

Estimation of D:  $\log(N(r)) = D \log(1/r) + C$ 



**A. Farhidzadeh**, et al. (2013), Damage assessment of reinforced concrete structures using fractal analysis of residual crack patterns, *Experimental Mechanics*, 53(2):1607–1619.



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**A. Farhidzadeh**, et al. (2013), Damage assessment of reinforced concrete structures using fractal analysis of residual crack patterns, *Experimental Mechanics*, 53(2):1607–1619.





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**A. Farhidzadeh**, et al. (2013), Damage assessment of reinforced concrete structures using fractal analysis of residual crack patterns, *Experimental Mechanics*, 53(2):1607–1619.

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Three distinct regions can be identified:

- 1) An initial region of sharp increase in the fractal dimension
- 2) The middle region that forms a plateau of slowly evolving changes
- 3) The final region that shows a further increase in the fractal dimension.

SW1



**A. Farhidzadeh**, et al. (2013), Damage assessment of reinforced concrete structures using fractal analysis of residual crack patterns, *Experimental Mechanics*, 53(2):1607–1619.

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# SW2



**A. Farhidzadeh**, et al. (2013), Damage assessment of reinforced concrete structures using fractal analysis of residual crack patterns, *Experimental Mechanics*, 53(2):1607–1619.

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# Damage Index:

$$DI = \frac{D_i - D_1}{2 - D_1}, \ 0 \le DI < 1$$

 $D_i$ : the fractal dimension of the current status of visible cracks, (e.g., in the  $i^{th}$  inspection);

 $D_1$  is the base line fractal dimension (fractal dimension of the first time cracks become visible)

Relative Stiffness Loss (RSL) :  

$$RSL = 1 - \frac{K_i}{K_1}$$

 $K_i$  is the lateral secant stiffness of the wall at the *i*<sup>th</sup> load step  $K_1$  is the initial stiffness of the wall

**A. Farhidzadeh**, et al. (2013), Damage assessment of reinforced concrete structures using fractal analysis of residual crack patterns, *Experimental Mechanics*, 53(2):1607–1619.





**A. Farhidzadeh**, et al. (2013), Damage assessment of reinforced concrete structures using fractal analysis of residual crack patterns, *Experimental Mechanics*, 53(2):1607–1619.

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**A. Farhidzadeh**, et al. (2013), Damage assessment of reinforced concrete structures using fractal analysis of residual crack patterns, *Experimental Mechanics*, 53(2):1607–1619.



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### Impact and damage localization in composite panels



## Impact and damage localization in composite panels



E. Dehghan-Niri, **A. Farhidzadeh**, S. Salamone, (2013), Nonlinear Kalman Filtering for Acoustic Emission Source Localization in Anisotropic Panels, Ultrasonics, 54 (2): 486–501.



# Wind turbine impact localization and damage monitoring






Motivation

Shear walls-Acoustics Fractal-Visual Complementary Conclusions



A. Farhidzadeh et al. (2014), Post-Earthquake Evaluation of Pipelines Rehabilitated with Cured in Place Lining Technology using Acoustic Emission, Construction and Building Materials, 54: 326-338.





**A. Farhidzadeh** et al. (2014), Post-Earthquake Evaluation of Pipelines Rehabilitated with Cured in Place Lining Technology using Acoustic Emission, Construction and Building Materials, 54: 326–338.

#### Unwrapped Cartesian Coordinates たり AE Theoretical Cut Lip Source Theoretical Cut Line Theoretical Cut Line Sor S<sub>1</sub> Theoretical Cut Lin A10 S2 S E 10 3/ 6/9 **Time of Flight Measurements** z [cm] $\widetilde{\boldsymbol{Z}} = \left[\widetilde{\Delta t}_{mi}\right]_{(n-1)\times 1}$ A11 y long $\overline{S}_2$ -5 -10 200 180 160 140 Mesh Gridding and Evaluating 120 100 20 x [cm] Time of Flight at each grid point $\boldsymbol{Z} = [\Delta t_{mi}]_{(n-1)\times 1}$ **Uncertain Parameters** AE Location $(x_s, y_s)$ True Covariance Mean **Evaluating the Objective Function** Covariance With Uncertainty Considerations **AE Source** Localization O AE Source Location Estimation Algorithm

#### 4) Leak detection in pipelines using acoustic emission

E. Dehghan-Niri, **A. Farhidzadeh**, S. Salamone, (2013), Determination of the Probability Zone for Acoustic Emission Source Location in Cylindrical Shell Structures, Mechanical Systems and Signal Processing, under review.

True -Mean

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Ultrasonic inspection of pipelines for corrosion detection and localization



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Ultrasonic inspection of pipelines for corrosion detection and localization



E. Dehghan-Niri, **A. Farhidzadeh\***, S. Salamone, Toward permanently installed pipeline monitoring systems, Pipeline and Hazardous Materials Safety Administration, Chicago, IL, USA, 6-7 August 2014. (\* presenter)

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#### Infrared thermography for inspection of steel-concrete shear walls







A. Farhidzadeh, S. Salamone, (2012), Structural Health Monitoring of Composite Shear Walls Using Infrared Thermography and Acoustic Emission, SSRL report to SEESL, University at Buffalo, Buffalo, NY.



#### Infrared thermography for inspection of steel-concrete shear walls



A. Farhidzadeh, S. Salamone, (2012), Structural Health Monitoring of Composite Shear Walls Using Infrared Thermography and Acoustic Emission, SSRL report to SEESL, University at Buffalo, Buffalo, NY. 79

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#### Corrosion diagnosis

- A small-scale experiment was designed to investigate the characteristics of ultrasonic waves in loaded 7-wire steel strands under corrosion.
- Load and mass loss were measured during the experiment to monitor the extent of corrosion.
- Continuous wavelet transform and a numerically derived function were used to estimate the diameter of wires
- Uncertainty propagation to diameter measurements originated from Heisenberg principle was studied.
- The results conformed very well to the diameter measurements.



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#### Acoustic emission monitoring of concrete shear walls

- Two full-scale concrete shear walls (one reinforced and the other composite) were monitored to investigate the behavior of acoustic emission
- A unsupervised pattern recognition algorithm based on Gaussian Mixture Modeling, Bayesian decision boundary and likelihood ratio test was proposed to classify the cracking modes.
- The population and energy of clusters were used to identify the critical state of damage (onset of yielding)
- An acoustic imaging technique was developed to identify the location of damage behind the steel plate of composite shear wall.





## Advanced visual inspection through crack pattern quantification

- Two reinforced concrete shear walls were tested and visually inspected.
- The width of cracks resulted in erroneous decisions in case of closed cracks
- The pattern of cracks has been found as informative as their width.
- Fractal analysis was proposed to quantify the crack patterns.
- A novel vision-based damage index (DI) based on fractal dimension was defined
- It could successfully estimate the lateral stiffness loss just by using crack patterns





## **Closing remarks**

Benefits of Smart Structures:

1- Maximizing and shortening shutdowns by preparing other NDT/SHM works in advance for targeted areas

2- Minimizing manual labor to access and prepare for tedious inspection

3- Alert facility operators on the need to repair before imminent failure

## Acknowledgement

#### **UB Faculty:**

Dr. Salvatore Salamone, PhD advisor Prof. Andrew S Whittaker, PhD committee member Prof. Amjad Aref, PhD committee member Prof. Andre Filiatrault



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- Performance-Based Design of Squat Reinforced Concrete Shear Walls (CMMI-0829978) PI: Prof. Andrew S Whittaker
- Earthquake Response and Rehabilitation of Critical Lifelines (CMS-421142) PI: Prof. Amjad Aref, Co-PI: Prof. Andre Filiatrault
- A Vision-Based Technique for Damage Assessment of Civil Structures (CMMI-1333506) PI: Dr. S Salamone

#### **US Department of Transportation**

- Corrosion Damage Assessment of Post-Tensioned Concrete Structures, USDOT through the University Transportation Research Center, PI: Dr. S Salamone
- Toward Permanently Installed Pipeline Monitoring Systems, USDOT through Pipeline & Hazardous Materials Safety Administration, PI: Dr. S Salamone

#### **SUNY Research Foundation**

 Collaborative Research to Advance Scientific Knowledge of the Mechanism of Corrosion in Civil Infrastructures (Grant No.: 1107907-1-63576) PI: Dr. Salvatore Salamone

#### Staff of SEESL laboratory at UB:

· Chris, Duane, Scott, Jeff, Louie



hank you







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Motivation Corrosion-Ultrasonic Shear walls-Acoustics Complementary Conclusions Outlook

#### 1) Laser ultrasound for damage assessment of steel strands





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#### **Bayesian Decision Boundary**



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rasonic Shear

# Uncertainty Zone for the Bayesian Decision Boundary







**A. Farhidzadeh**, S. Epackachi, S. Salamone, A. Whittaker, (2014), Bayesian Decision and Mixture Models for Multi-scale Damage Interrogation in Composite Shear Walls Using Acoustic Emission, to be submitted to an ASCE Journal

0.2





0.06

0.04

A. Farhidzadeh, S. Epackachi, S. Salamone, A. Whittaker, (2014), Bayesian Decision and Mixture Models for Multi-scale Damage Interrogation in Composite Shear Walls Using Acoustic Emission, to be submitted to an ASCE Journal

Motivation





## 3) Damage assessment of concrete cross-ties and rails





#### 1. Pre-processing

Shadow removal Morphology-based Operations





## 2. Edge Detection

2.1. Discrete Wavelet Transform

#### 2.2. Pruning

2.2.1. Hysteresis (strong, weak, non-edge)

2.2.2. Non-maximal suppression (weak  $\rightarrow$  strong, non-edge)





#### **Boundary Tracking**



Crack width measurement







#### Multi-fractal analysis to incorporate crack width

 $\rightarrow$  fusing the crack pattern and width for more accurate decision making







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5) Automated visual inspection of concrete structures

### **Multi-fractal analysis**





#### Unmanned autonomous systems







# **Backup slides**





- Fiber-optic strain sensors
- Modal analysis
- Magnetic permeability
- Guided Ultrasonic Waves

#### **Estimating cross-section loss**

- Modal analysis
- Guided Ultrasonic Waves
  - X-ray scanning

#### Short-term projects (< 3 years):

- <u>Developing non-destructive evaluation technologies for monitoring the real-time behavior and long-term health of</u> structures such as post-tensioning strands in metal ducts.
  - o Oregon Department of Transportation
  - Oregon Transportation Research and Education Consortium
  - Federal Highway Administration (FHWA)
  - $\circ~$  National Institute of Standards and Technology (NIST)
  - o Prestressed Concrete Institute (PCI)
- Leak and corrosion detection in Pipelines (water and oil) designing suitable rehabilitation strategies
  - Department of Energy
  - o Pipeline and Hazardous Materials Safety Administration
  - US DOT
- Damage assessment of concrete cross-ties and rails
  - Federal Railroad Administration (FRA)

#### Damage assessment of Subsurface structures (e.g., Corrosion in soil nails, cracking in piles)

#### Long-term projects (>= 3 years):

- Application of hybrid simulation technique for monitoring of large structures
- Automated Visual Inspection of Civil Structures
  - National Science Foundation
    - Hazard Mitigation and Structural Engineering (HMSE)
    - Sensors and Sensing Systems
    - Natural hazard Engineering Research Infrastructure (NHERI)
    - Crosscutting and NSF-wide Active Funding Opportunities
- Monitoring wind turbines (wind power accounted for 12.4% of total electricity generated in Oregon)
  - o Bonneville Power Administration, Portland General Electric



#### Department of Defense Multidisciplinary University Initiative (*MURI*) <u>Department of Homeland Security, Science & Technology (DHS)</u>

## U.S. Department of Commerce

Damage Prognosis (Estimating the future loading environments for that system, predicting through simulation and past experience the remaining useful life of the system.

Integration of many technology areas including both

measurement/processing/telemetry hardware and a variety of

deterministic and probabilistic predictive modelling capabilities, as well as the ability to

quantify the uncertainty in these predictions. The multidisciplinary and challenging

nature of the DP problem, its current embryonic state of development, and its tremendous potential for life-safety and economic benefits qualify DP as a 'grand challenge' problem for engineers in the twenty-first century.

## GreenSTEP model – the greenhouse gas estimation software developed by Oregon Department of Transportation

#### Outlook



FR Rofooei, **A Farhidzadeh** (2011) Investigation on the seismic behavior of steel MRF with shape memory alloy equipped connections, Procedia Engineering 14, 3325-3330

#### Improving Visual inspection through crack pattern quantification

Visual inspection of concrete structures

Standards, codes, guidelines:

. . .

International Atomic Energy Agency guidebook (IAEA) Federal Highway Administration code National Bridge Inspection Standards FEMA 306: Evaluation of Earthquake Damaged Concrete and Masonry Wall Buildings

They usually categorize damage condition in terms of visible distress attributes such as


# Corrosion diagnosis in prestressing steel strands using ultrasonic waves



# Corrosion diagnosis in prestressing steel strands using ultrasonic waves





 $\beta$ =Lay angle of helical wire  $\overline{p}$ =Radius of curvature of the axis of helical wire s=Arc Length of helical wire R=Radius of strand (radius of reference cylinder) p=Pitch of helical wire A=cross sectional area of wire d=Wire diameter

Subscripts c (core wire) and h (helical wire)





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**Numerical Modeling** 

## **Optimum frequency**



Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, revised and resubmitted



# Sensor layout Specimen 2





Motivation

**Corrosion-Ultrasonic** 

**Cracking-Visual** 

# Load and mass loss monitoring



Continuous wavelet transform

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Uncertainty quantification

Heisenberg principle:

$$\sigma_t \sigma_f \geq \frac{1}{2}$$

If mother wavelet is complex Morlet



Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, revised and resubmitted

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#### Uncertainty quantification



Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, revised and resubmitted



#### Uncertainty quantification



Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, revised and resubmitted

## Uncertainty quantification



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Farhidzadeh A., Salamone, S. (2014), Reference-free Corrosion Damage Diagnosis in Steel Strands Using Guided Ultrasonic Waves, Ultrasonics, revised and resubmitted



Geometrical Characteristics		Mechanical Characteristics	
Core wire diameter d <sub>c</sub> [mm]	5.2	Young's modulus E [GPa]	196
Helical wire diameter d <sub>h</sub> [mm]	5.0	Poisson's ratio [v]	0.29
Strand diameter D [mm]	15.2	Yielding load [KN]	203
Pitch of helical wire p [mm]	230	Ultimate tensile strength [MPa]	1860
Lay angle β [deg]	7.9	Linear weight [kg/m]	1.10

Optimum number of hidden clusters

Bayesian Information Criterion (BIC)

 $BIC = -2\ln(L) + k \times \ln(T)$ 



## BIC change ratio



Percentage of reduction in BIC by adding one cluster to the previous number of clusters. The bars represent the 120 standard deviation.

A. Farhidzadeh, S. Salamone, P. Singla, (2012), "A Probabilistic Approach ...", J Intelligent Material Systems and Structures, 24 (14), 1722-1735.

Motivation



A. Farhidzadeh, S. Epackachi, S. Salamone, A. Whittaker, (2014), Bayesian Decision and Mixture Models for Multi-scale Damage Interrogation in Composite Shear Walls Using Acoustic Emission, to be submitted to an ASCE Journal