

## Module 2

### Lecture 11:

- (i) Long-Term STM
- (ii) Statistical Pattern Recognition (SPR)

## SPR

Ahmed S. Naman, Farrah Debra, Ashutosh Bagchi. 2009.

Structural Health Monitoring using vibration-based methods  
and statistical pattern recognition Technique,  
Proc. 3rd Intl Workshop on Smart Materials & Structures,  
Montreal, Canada.

vibration-based damage identification is useful in interpreting local damage

But, due to complexities of the real structure under working conditions  
it is very difficult to input the accurate mode shapes &  
frequencies to FB methods for damage detection.

This may result a large human error is damage identification

### - Remedy

IF the analysis is supported by semi analytical methods such as  
- statistical pattern recognition,

then a better accuracy can be seen.

What is Pattern Recognition Technique?

- Sensors, which are used to measure strain and vibration of a structural member produce SIGNALS
- These signals are very sensitive to any change in strain/vibrations measured
- They respond sensitively to the environmental changes and operational conditions

Group these changes, associated with the environmental conditions into a separate group of data

Data base

Changes in measurements (strain, frequency) are grouped (Identified) as a pair to those environmental changes and operating conditions

→ a group

→ various groups

Each group will have a unique pair conditions which is related to changes

Strain & the corresponding operating conditions

— pattern

A pattern - arises from signature of the measured signal  
is identified  
and this is now compared with

the new pattern, which is being recorded

- once the recorded signal, change in their pattern  
matches with the existing patterns of data  
base,

then these changes are then mapped to the  
corresponding damage locations

Pattern recognition is a machine-learning process

The ability of the computer to identify and classify, whether

the observed data matches (behavior) to a specific pattern (that is already existing) in the data base

- This can now expedite the decision-making process
- This feature is very useful in case of automated STM processes.

Recognized patterns are of 2 types

(1) Supervised learning

- Where input pattern of vibration are compared with pre-defined groups in the data base

(2) Unsupervised learning

- Pattern is compared with undefined group

- If they become a new group is the data base

SPR method is a good simplification in STM

STM deals with experimental data — lot of uncertainties

— In statistical model, algorithms are used to analyze the distribution of extracted features (strain, frequency etc) to determine damage location

— These algorithms depend on availability of data of damaged states

If data are not available for damaged states to compare, then one can use Outlier analysis (Fugot et al. 2000)

one common application of Outlier Analysis, for SVM is

X-bar control chart

1) Procedure for damage identification by Statistical Model development

- 1) Measure a typical type of data
  - Steady state strain
  - Live load strain
  - Accelerations under live load
  - Temperature effects on strain

- (i) When the structure undergoes damage, mean and variance of the extracted features change significantly (accidentally)
- (ii) Auto-regression analysis will be carried out on the measured data
- Preferably, first few AR coeffs (say, upto 3) are considered to strain damage indicators,

## Procedure for Damage Identification by Pattern Recognition

To apply this method, there is a pre-requisite

- Several sample data on the damaged model, like shape, all should be measured a pattern (Group) should be formed

- First set of data on the damaged parts - reference data  
part 1 from - test data

- When new data is collected, it is compared its matches the pattern with the reference data

Statistical Pattern Recognition is useful to expedite the decision-making process in SVM.

## Long-Term STHs (Stechic process)

- long-term refers to monitoring a structure over a long period  
time (10-15 yrs)

- fibre-optic sensors

GPS

corrosion sensors

} most commonly used sensors  
for long-term monitoring

Long-term SHM — is a 7<sup>th</sup> stage process

1<sup>st</sup> stage

Identify the structures, that need long-term monitoring

- New structures, including those have innovative aspects in design, computers, material etc
- New structures, associated with unusual level of risk
  - Geotechnical conditions & the soil
  - seismic risk conditions (near-fault)
  - aggressive corrosive environment

- Structures of strategic importance (offices, st, nuclear reactors)

- Existing structures whose disruption will affect the critical network

- Important Railway / Highway bridges
- Regeneration
- 

- New structures in which their features represent a long unit of sust-nt of structures

- Existing structures with known deficiencies

- Existing structure, which are recommended for rebuilding.

2nd stage

✓ Risk Analysis

- Carryout Risk analysis on the identified structures
- to list out possible events & deterioration they can affect the structure

Example

- corrosion
- loss of pre-stress
- creep
- settlement of foundation
- earthquake risk
- Impact load
- poor execution of repair structure

3rd step : Resonance

- For the type of structures identified for each is not identified, one has to identify the corresponding consequence.

for example,

If resonance is identified as a risk by complex structure (which needs long-term study) then expected consequence could be

- chemical check
  - low/degradation of section
- Shocks  
durability

At this stage, based on 'identified risk', approximate repair of the identified structure is to be carried out

For example, if corrosion is the risk associated, then corrosion repair should be chosen

If foundation settlement is the risk associated then inclined pile should be chosen  
and repair type

At this stage, it is very important to check the service requirements to measure the expected consequences

Desired output @ this stage is

- List of quantities that need to be measured (monitored)
- their likely magnitude
- their likely location

step 4 Design of STM & sensor layout

If an inexperienced engineer comes out saying he will start from this stage

objective @ this stage is  
to select appropriate type of sensors

- Specification of sensor (operational range)
  - installation requirements (embedded, on the surface-mounted)
  - technical constraints of the sensors
  - Budget - constraints
- It is always a good practice to include sensors, based on different technology
- do not choose sensors of same technology
  - better to have a mix

- Too many data acquisition will become costlier complex
- A simple design/output is advised

### layout-3 sensors

- Different sensors can be connected to the same data logger
- Several data loggers can be connected to the same data Management system

## Data Management System

Should integrate all data sources to  
available in same data type or

SINGLE FORMAT, which  
can be forwarded

- Most importantly, all vendors & sensors & data acquisition systems provide  
own software for data management

- It is very important to have a  
SINGLE, INTEGRATED INTERFACE

A detailed design document should be prepared containing the following:

- 1) List of sensors/type of sensors
- 2) Layout Architectures
- 3) Installation plan & Cable layout
- 4) Installation procedure for every type of sensors
- 5) Budget details etc

## Stage 5

### Installation & Calibration

- we should follow the manufacturer's instructions to install  
sensors
- once they are installed and iSCM connected,  
then they need to be tested & calibrated
  - SITE Acceptance Test (SAT)
- we need also fix the threshold values, in case of  
automated Homing system
  - Check this output for its  
successful working

At this stage, a complete manual, and calibration report should be generated

### Stage #6 Data acquisition & Management

Data should be acquired and stored in the database

- appropriate backup
- access authorization / need to be checked

- major outcome of this stage is

- \* complete document of project management of Data acquisition, log of events

Step # 3

Data Assessment

At this stage, Engineer should be able to identify  
a foreseen risk & expected outcome to the risk

- A set of procedure to respond to any type of damage is to be created

For example,

- If the outcome is single degradation, the procedure called is maintenance
- If the outcome of repeated data is capacity reduction, the closure of the service.

## Summary

- SPR method
  - decision making process of SHY
  - long-term SHY
  - steps in long-term SHY
    - each step is Effective SHY