

Modal filtering data reduction

and subspace detection

for handling the temperature effect in SHM

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Introduction

- Usefulness of global vibration-based SHM methods
- Limitations due to temperature effects on the dynamics of civil engineering structures
- A statistical subspace-based damage detection algorithm: null space of a matrix built on reference modes/modeshapes

Non parametric version:

null space of a matrix built on reference data set

- Limitations: large sensors arrays
- For handling large sensors arrays and temperature effect: no temperature measurement, data reduction using modal filtering, empirical merging of non parametric null spaces

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Parametric subspace-based damage detection

$$\begin{cases} X_{k+1} = F X_k + V_k & F \varphi_\lambda = \lambda \varphi_\lambda \\ Y_k = H X_k & \phi_\lambda \triangleq H \varphi_\lambda \end{cases}$$

$$R_i \triangleq E(Y_k Y_{k-i}^T), \quad \mathcal{H} \triangleq \begin{pmatrix} R_0 & R_1 & R_2 & \dots \\ R_1 & R_2 & R_3 & \dots \\ R_2 & R_3 & R_4 & \dots \\ \vdots & \vdots & \ddots & \vdots \end{pmatrix}$$

$$R_i = H F^i G \implies \mathcal{H} = \mathcal{O} \mathcal{C}$$

$$\mathcal{O} \triangleq \begin{pmatrix} H \\ HF \\ HF^2 \\ \vdots \end{pmatrix}, \quad \mathcal{C} \triangleq (G \quad FG \quad F^2G \quad \dots)$$

$$G \triangleq E(X_k Y_k^T)$$

$$\mathcal{H} \longrightarrow \mathcal{O} \longrightarrow (H, F) \longrightarrow (\lambda, \phi_\lambda)$$

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Canonical parameter : $\theta \triangleq \begin{pmatrix} \Lambda \\ \text{vec } \Phi \end{pmatrix}$ modes
mode shapes

Observability in modal basis : $\mathcal{O}_{p+1}(\theta) = \begin{pmatrix} \Phi \\ \Phi \Delta \\ \vdots \\ \Phi \Delta^p \end{pmatrix}$

θ_0 : reference parameter for safe structure

Left null space: $S^T S = I_s$, $S^T \mathcal{O}_{p+1}(\theta_0) = 0$

Y_k : N -size sample of new measurements

Residual for SHM:

$$\zeta_N(\theta_0) \triangleq \text{vec}(S^T(\theta_0) \hat{\mathcal{H}})$$

$\mathcal{J}(\theta_0)$: sensitivity of residual ζ w.r.t. modal changes

$$\chi^2\text{-test: } \zeta_N^T \Sigma^{-1} \mathcal{J}(\mathcal{J}^T \Sigma^{-1} \mathcal{J})^{-1} \mathcal{J}^T \Sigma^{-1} \zeta_N \geq h$$

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Merging multiple data sets at different temperatures

J reference data sets : $\bar{\mathcal{H}}_{p+1,q}^{(0)} \triangleq 1/J \sum_{j=1}^J \bar{\mathcal{H}}_{p+1,q}^{(0),j}$

Global empirical null space: $\bar{S}_0^T \bar{\mathcal{H}}_{p+1,q}^{(0)} = 0$

Y_k : N -size sample of new measurements

Residual for SHM:

$$\bar{\zeta}_N \triangleq \text{vec}(\bar{S}_0^T \hat{\mathcal{H}})$$

$\bar{\Sigma}$: covariance of $\bar{\zeta}$

$$\chi^2\text{-test: } \bar{\zeta}_N^T \bar{\Sigma}^{-1} \bar{\zeta}_N \geq h \quad \text{Robust subspace detection}$$

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Non parametric version: empirical null space

Reference data set for safe structure

Left null space: $\hat{S}_0^T \hat{S}_0 = I_s$, $\hat{S}_0^T \hat{\mathcal{H}}^{(0)} = 0$

Y_k : N -size sample of new measurements

Residual for SHM:

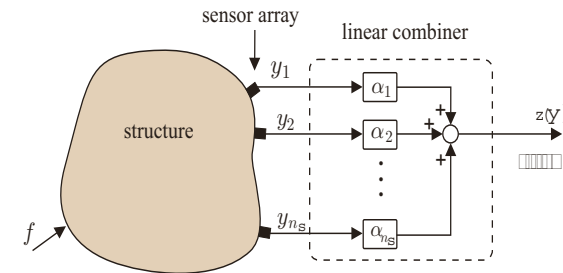
$$\zeta_N \triangleq \text{vec}(\hat{S}_0^T \hat{\mathcal{H}})$$

Σ : covariance of ζ

$$\chi^2\text{-test: } \zeta_N^T \Sigma^{-1} \zeta_N \geq h \quad \text{Non param. subspace detection}$$

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Data reduction using modal filtering



z_l orthogonal to the N modes in a frequency band of interest except mode l . More sensors than modes.

$$\Phi^T \alpha = I ; \Phi^T \text{ rank deficient} \rightarrow \text{SVD}$$

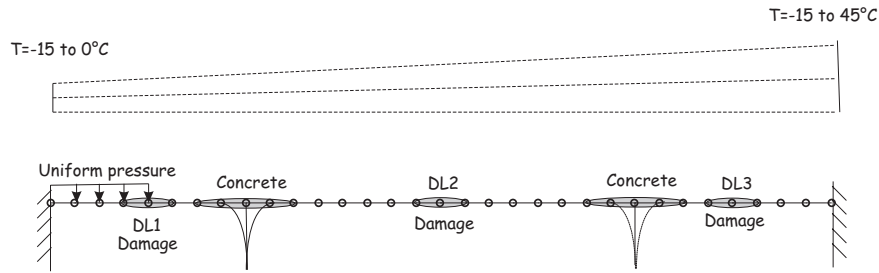
$$Z = \alpha Y , \quad \dim(Z) < \dim(Y)$$

Non parametric & robust subspace detection on Z .

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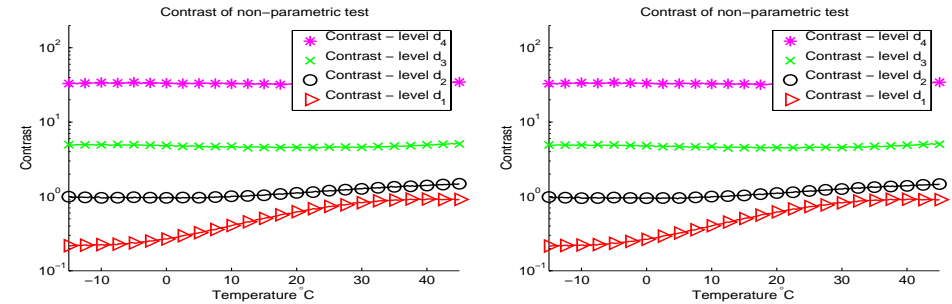
Example - Simulated **three-span bridge**

- A simulator provided by ULB
 - Two materials: steel and concrete
 - Excitation: uniform pressure on the first span
 - Motion restricted to in-plane vibrations
- Both hand sides subject to different **temperature gradients**
- **Four damage scenarios**: stiffness reduction at three locations



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Non parametric subspace detection

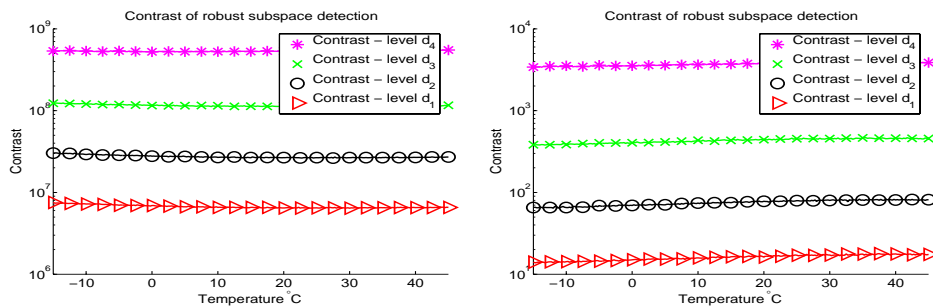


Contrast between the undamaged and the four damage levels.

Using 29 sensors (left). Using 10 filters (right).

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Robust subspace detection



Contrast between the undamaged and the four damage levels.

Using 29 sensors (left). Using 10 filters (right).

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Conclusion

Temperature effect & large sensors arrays in vibration-based SHM

Statistical non parametric approach

Statistical **subspace-based damage detection** algorithm

Empirical null space merging data at \neq temperatures

Modal filters for data reduction

Example: simulated three span bridge

Ongoing: **sensor noise effect**

Future: **in-operation** examples, comparison with other methods

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