



Error characterization in modal analysis and model updating.

An overview of tools and procedures using the Structural Dynamics Toolbox.

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SURVISHNO Lyon, July 8, 2019

Model validation and verification

CAD Model



Test, FEM, hybrid models



Tutorial objective : where is the error?

TEST CASE : drum brake plate

G. Martin, « Méthodes de corrélation calcul/essai pour l'analyse du crissement » Ph.D. CIFRE SDTools, Arts et Metiers ParisTech, Paris, 2017





Topology errors

- sensor/act position
- matching

Mode 20 at 2591 Hz



Identification error

- Noisy measurements
- Identification bias
- NL, time varying, ...



FEM error •Geometry •Material parameters •Contact properties

Direct and inverse problems in vibration

Inverse

Parameters



Family of models Optimization Data Objective

Family of models

- **FEM (necessary for geometry)**
- Linear / time invariant / band limited / fixed inputs ٠
- Non-linear : constitutive 2-3D / equivalent 0D ٠

Parameters

Direct

- Model parameters (previous direct/inverse problems) ٠
- Loading (space/time) •
- **Operating conditions**

Solver

- **Frequency / transient**
- **Reduction / component mode synthesis** ٠

Objective functions

- **Resonant frequency placement** ٠
- Displacement, stresses, ... ٠
- Max, mean, statistics, ...

Family of models

Signal coming from a system with low noise

function

Estimated data

- LTI system, non-linear, time varying, ... ٠
- Hybrid test/FEM (extended parametric LTI) ٠

Parameters

- Transfer function, non-linear kernels ٠
- Modal parameters
- Noise sources

Objective functions

- Time / frequency domain output error
- Subspace error

Solver (identification / optimization)

- H1 estimator, Hilbert transform, ...
- LSCF, NL-Optim

Experimental modal analysis : data



Assumption LTI = transfers exist



Some standard texts for the vibration community

- [1] D. J. Ewins, Modal Testing: Theory and Practice. John Wiley and Sons, Inc., New York, NY, 1984.
- [2] W. Heylen et P. Sas, Modal analysis theory and testing. Katholieke Universteit Leuven, Departement Werktuigkunde, 2006
- [3] K. G. McConnell, Vibration Testing. Theory and Practice. Wiley Interscience, New-York, 1995

LTI. Space frequency separation



Learning shapes in squeal event

Time measurement during 145-1250116-12-00116 squeal Sample time/frequency responses 포 920 Braking 10 910 event 1 Variability E 900 - influence of wheel angle 890 0 15 Time[s] 20 25 5 10 30 920 920 920 920 920 920 920 Braking Reproductibility event 2 - Multiple events 890 10 15 Time[s] 30 20 25 930 [24] ASUM Braking event 3

1900 H

890

0

5

10

15 Time[s] 20

25

30

What is expected from theory?



Mode 8 at 5047 Hz 0.03 %



2 DOF : amplitudes of each shape

Shape 2 : real mode with tangential contribution



$$[K_u] = [\boldsymbol{b}_{TAN}] \left[\ \ \boldsymbol{\mu} w_j J \frac{\partial p}{\partial q_{\boldsymbol{\lambda}}} \right] [\boldsymbol{c}_{NOR}]$$

µ=0.1 at 5052 Hz -0.13 %



G. Vermot des Roches, « Frequency and time simulation of squeal instabilities. Application to the design of industrial automotive brakes », Ph.D. ECP, CIFRE SDTools, 2011

Shapes constant / DOF (function of parameter)

- Start $\mu = 0$ small damping
- increase μ : coupling and transition towards instability





Participation of real shapes to complex modes



Subspace learning & basis selection



Details : G. Martin & al. ISMA 2018

SVDCur button in SDT



Experimental modal analysis: an inverse problem



Classical linear system Id

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Id Phases

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10

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- Initialization:
 - Pick (stab or single pole estimate [1])? -
 - Stabilization diagram [2] -
- Estimate by band (why? [1,3])

- How can problems be detected ? [3-4]
- Re-optimize poles (why?)



- E. Balmes, « Frequency domain identification of structural dynamics using the pole/residue parametrization », IMAC 1996 [1]
- P. Verboven, « Frequency-domain system identification for modal analysis », Ph.D. thesis, 2002. [2]
- G. Martin, « Méthodes de corrélation calcul/essai pour l'analyse du crissement », Ph.D. CIFRE SDTools, Arts et Metiers ParisTech, Paris, 2017 [3]
- [4] G. Martin, E. Balmes, et T. Chancelier, « Characterization of identification errors and uses in localization of poor modal correlation », MSSP 2017.

Noise induced bias



[1]

[2]

Inconsistence between data and family of models induces **bias**/variability

M. Böswald, « Analysis of the bias in modal parameters obtained with frequency-domain rational fraction polynomial estimators », Proceedings of ISMA 2016 El-kafafy, De Troyer, Peeters, Guillaume, « Fast maximum-likelihood identification of modal parameters with uncertainty intervals: A modal model-based formulation », MSSP, 2013

Quality : an error criterion

Is the model well identified?

- Superpose measured and identified FRF for each sensor, around each mode
- Compute error on Nyquist





Test/identification error



For each sensor, each mode may have strong error/noise & low contribution Test error per mode/sensor

Evaluate quality of identification

\star ld - iiplot(2) ldFrf

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Other errors : NL ≠ one system

- Non linear system : resonance dependent on input point / accurate positioning
- MMIF or identification per impact location shows significant dispersion
- Multiple identification results are not perfectly coherent





Other errors : local modes

• « Same mode » multiple times





- non structural masses generate global mode duplicates
- « small mass » ≠ « tiny peak » (if this were true proof mass dampers would not work)





Summary : experimental modal analysis

- Space/time decomposition applies very often
- Base assumption LTI (linear time invariant) should be challenged
- Inconsistent data & model family \Rightarrow bias rather than variance
- Error classification is per mode/sensor
- General handling of NL & local modes is beyond state of the art

Parametric direct problems





2473 Hz 0.00 %

Identification error

- Noisy measurements
- Identification bias
- NL, time varying, ...

Topology errors

- sensor/act position
- matching



- FEM error
- Geometry
- Material parameters
- Multi-scale problems & equivalent parameters
- Junction representation
- Design change & modal property tracking

Geometry updating

Nominal geometry

Measured geometry

• Up to 2 mm on surface • 11% error on volume E 0 -2 Inverse CAD (Geomagic, ...) Morphing (SDT) Geometry correlation

Geometry updating

- Frequency band : 0 6kHz
- Notable shape difference >3 kHz
- Frequency error
 - 2 % mean
 - 5 % max





Frequency errors of paired modes



Checking geometry should always be the first step

Geometry parametrization / morphing

- Shape optimization / morphing $P(x) = \sum_{i} \{p_i(x)\}q_{imaster}$
 - fe_shapeoptim BuildFromSel
 - fix bottom face, 2) prescribe edge motion
 deform edges (straight)
 deform faces (flat)
 deform interior (good elements ?)



Process simulation + field projection

fe_shapeoptim Interp









- [1] de Paula, Rejdych, Chancelier, Vermot, Balmes, « On the influence of geometry updating on modal correlation of brake components. », in Vibrations, Chocs & Bruit, 2012.
- [2] G. Vermot Des Roches, E. Balmes, et S. Nacivet, « Error localization and updating of junction properties for an engine cradle model », in ISMA, Leuven, Belgium, 2016, p. ID 372.
- [3] E. Blain, « Etudes expérimentales et numériques de la dispersion vibratoire d'assemblages soudés par points », Ph.D. thesis, Ecole Centrale de Paris, 2000.

Direct problems : material parameters

- \cdot Uniform
- Field
- Equivalent (at certain scales)



- Geometry
- Material parameters
- Junction representation
- Equivalent parameters



• Basic parametrization tool : dependence on constitutive parameters C_{ij}

$$K = \int_{\Omega} \{\epsilon\}^{T} [C_{ij}] \{\epsilon\} = \sum_{g} B^{T} [C_{ij}] B w_{g} = \sum_{ij} C_{ij} \left[\sum_{g} B^{T} [C_{ij}^{u}] B w_{g} \right] = \sum_{ij} C_{ij} [K_{ij}]$$

Element/model weights

$$K(p) = \sum\nolimits_e \alpha_e(p)[K^e]$$

Weighted element matrices = standard

- Element-wise (topology optimization)
- Field/groupwise
 - parameter groups ...
 - solution of eigenvalue problem (polynomial chaos, Ghanem, Soize, ...)
 - clustering





30



Clustering of Parameter Sensitivities: Examples from a Helicopter Airframe Model Updating Exercise. Shahverdi, Mottershead & All

SDT: upcom / zCoef

• Element wise $K(p) = \sum_{e} \alpha_{k}^{e}[K^{e}]$

$$mind = \begin{bmatrix} M_s & M_e & K_s & K_e & \alpha_m & \alpha_k \\ \vdots & & & & \\ elt & & & & \end{bmatrix}$$

www.sdtools.com/help/upcom.html

• Group wise $K(p) = \sum_g \alpha_g [K^g]$

www.sdtools.com/help/zCoef.html

zCoef={	'Klab',	'mCoef',	'zCoef0',	'zCoefFcn';
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	'Kv'	0	1	'par(1)'};

Updating of material properties





Direct problems : visco junction parameters

- Geometry, material
- Junction representation
- Equivalent parameters



- [1] Hammami, Balmes, Guskov, « Numerical design and test on an assembled structure of a bolted joint with viscoelastic damping », *MSSP*, v70, p.714–724, 2015
- [2] Farhat, Avery, Chapman, Cortial, « Dimensional reduction of nonlinear finite element dynamic models with finite rotations and energy-based mesh sampling and weighting for computational efficiency», *IJNME*, vol. 98, nº 9, p. 625-662, 2014.

Visco junctions a few keywords

[Pa]

-0.6 -0.4 -0.2

×10

0.2 0.4

0

Material

 σ_{z} [MPa]

- 3D finite strain (visco/hysteretic)
- Effects : Mullins, Payne, Madelung, Masing, ... Structure
- Micro/macro transition



Direct : contact/friction junction parameters



Junctions : contact / OD strategies

Typical simplification : mass & stiffness



Kinematic junctions (pivots, ...) often difficult with 2D

Equivalent spring build may require complex numeric/test identification



Sample junction problems

Master nodes for multi-body

Type B links : 82 Hz Type A links : 49 Hz



• Weld spots

Lardeur & All .: Spot weld modelling techniques and performances of finite element models for the vibrational behavior of automotive structures, ISMA 2000.

Contact around WS



G. Vermot Des Roches, E. Balmes, et S. Nacivet, « Error localization and updating of junction properties for an engine cradle model », in ISMA, Leuven, Belgium, 2016, p. ID 372.

Junction parameters : contact surface/stiffness

- Variable contact surface and stiffness
- Comparable impact frequencies and shapes



[1] G. Martin, E. Balmes, T. Chancelier, « Review of model updating processes used for brake components », in Eurobrake, 2015 [2] Y. Goth, H. Reynaud, « A bolt assembly parametric model », in ISMA, Leuven, 2016.

Equivalent stiffness : frequency/stiffness map

Sensitivity to prestress/amplitude -> tangent stiffness map

٠



Numerical methologies useful/necessary to treat 2D

StaticStatus iterate on nodes either bilateral or no contact







80 N

10-3

-3 10⁻² Ko/Kmax

• StaticModeTraj [1] series of statics with $[M]{\phi_j}$ load



 Multi-model reduction [2] Ritz analysis on a few learning points

[1] H. Festjens, G. Chevallier, et J. Dion, « A numerical tool for the design of assembled structures under dynamic loads », IJMS, vol. 75, no 0, p. 170-177, 201
[2] Hammami, Balmes, Guskov, « Numerical design and test on an assembled structure of a bolted joint with viscoelastic damping », MSSP 2015.

On the need for equivalent laws

Physical contact laws are sensitive to accuracy on

Time events



Spatial events





Equivalent 2D law needed to approximate both

Design change & pole tracking

- Choose a reference $Z(p) = (K \omega^2 M) = Z_0 + (Z(p) Z_0)$
- Compute reference modes $\{\phi_j(p_0)\}, \omega_j(p_0)\}$
- Use generalized coordinates/energies [1] rather than MAC $\begin{aligned} \alpha_j(t) &= \{\phi_j^0\}^T [M(p_0)] \{q(t)\} \\ &\{e_j(t)\} = \dot{\alpha}_j^2 + \omega_j^2 \ \alpha_j^2 \end{aligned}$
- Possibly use component modes
 - CMT [2]: free +global

$$\begin{bmatrix} \phi_A^0 & \phi_{global}^0 \\ & \phi_B^0 & \phi_{global}^0 \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & & \\ & & & & & & & & & \\ & & & & & & & & & \\ & & & & & & & & & \\ & & & & & & & & & \\ & & & & & & & & & \\ & & & & & & & & & \\ & & & & & & & & & \\ & & & & & & & & & \\ & & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & & \\ & & & & & & & \\ &$$

- Flexible with rigid global [3] in subspace

Bianchi, Balmes, Vermot, Bobillot, « Using modal damping for full model transient analysis. Application to pantograph/catenary vibration », ISMA, 2010
 G. Vermot Des Roches, « Frequency and time simulation of squeal instabilities. Application to the design of industrial automotive brakes », Ph.D ECP 2011
 G. Martin, « Méthodes de corrélation calcul/essai pour l'analyse du crissement », Ph.D. CIFRE SDTools, Arts et Metiers ParisTech, Paris, 2017

KnKt study (SDT contact)



https://youtu.be/A9V2MtKRcS8

Summary : parametric direct problems

- Geometry updating key : inverse CAD or morphing
- Material parameter classics
 - grouping/clustering/field generation
 - homogeneization & scale separation
- Junction parameters
 - 0D or 2/3D laws
 - Equivalent 2D for contact (time/space constraints)
- Parametric studies
 - Reduction is key for CPU time AND memory
 - Tracking tools needed to make sense of data

Design exploration 1000 points

- Full 80 days CPU, 22 TB
- CMT a few hours off-line learning, <1h exploration, 10 GB





Hybrid test & FEM

2473 Hz 0.08 %



Identification error

- Noisy measurements
- Identification bias
- NL, time varying, ...



3.9 2.4 0.87 0.64 2.1 8.7

Mode 20 at 2591 Hz

FEM error •Geometry •Material paramet



Basic topology correlation process

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Topology correlation process

- Initial orient (coarse)
- Give reference points & reposition

- Optimize orientation to minimize distance
- Analyze errors







Test topology objectives : view & correlate

- Connect to allow viewing
- Use regularity to avoid distortion
- Use exact topology
- Triax measurement is not the universal answer (\Rightarrow expand)



Basic shape correlation

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https://youtu.be/tVV-R2r-3M8

Correlation : mode crossing & MAC combine

- High sensitivity for close modes associated with mode crossing
- MAC can drop to 0.5
- MAC combine linear combination of close modes = stays at 1.
- Orthonormal combination of modes in a group

$$A = argmin \| [\phi_{test}]_{gA} - [c\phi_{FEM}]_{gB}[A] \|$$



MAC & sensors : historical methods

- MAC on sensor sets
 - Cocalize area of poor correlation
 - $\ensuremath{\mathfrak{S}}$ No automated set definition
- COMAC : is a specific sensor bad ?
 - correlation of multiple modes at one sensor
 - eCOMAC : allow incorrect modeshape scaling
 - Not per mode / sensor
- MACCO : does correlation improve with less sensors ?
 - © Easy to implement
 - $\ensuremath{\textcircled{\sc only}}$ Sensor sets per mode or global
 - $\ensuremath{\textcircled{\otimes}}$ No understanding of why each sensor is removed.



[1] N. A. J. Lieven, D. J. Ewins, « Spatial Correlation of Modeshapes, The Coordinate Modal Assurance Criterion (COMAC) », IMAC, 1988.

- [2] Brughmans, Leuridan, Blauwkamp, « The application of FEM-EMA correlation and validation techniques on a body-in-white », IMAC, 1993
- [3] Martin, Balmes, Chancelier, « Characterization of identification errors and uses in localization of poor modal correlation », MSSP, vol. 88, p. 62-80, may 2017

MAC & sensors : MACCo variants

MACErr : Ignore sensors with bad identification

- MACCo : sort sensors by impact on MAC Removed sensors may indicate
- Bad measurements
- Model errors





Updating : freq-MAC objective

G (Mpa)

Family : FEM with updated geom. Parameters : mat/junction Data : test modes Objective function $J_{freq-MAC}$

$$R_j(p) = \left\{ \frac{\frac{f_{EF,i} - f_{Test,j}}{f_{Test,j}}}{\beta(1 - MAC_{i,j})} \right\}$$

Associated problems

- Mixed quantity (scaling)
- Jumps on mode pairing
- Parameter choice
- Sensitive range





Parameter equivalence / conditionning



Sample clustering method

• Compute cosine distance $\cos^{-1}\left(\max \frac{\langle u | u \rangle}{\|u\| \|v\|}\right)$

$$\mathsf{A}, \mathsf{B} \rightarrow \mathsf{U}_{\mathsf{A}}, \mathsf{U}_{\mathsf{B}} \rightarrow \sigma_{max} \left(U_B - U_A (U_A^H U_B) \right)$$

 Recursively group elements with smallest distance



G3

L101

(b)

clamped

end

(a)

L113

Shahverdi, Mottershead & All, Clustering of Parameter Sensitivities: Examples from a Helicopter Airframe Model Updating Exercise.

Expansion / hybrid models



MDRE : multi-objective cost function



Expansion : robust to model error



Model error = clues for parameterization



Expansion : an old method with renewed interest

Early work : Ladeveze 72 -> [1] present Independent start : Balmes [2] 00 -> present Not much used for 40 years due to computation challenge (see [3])

Renewed interest at SDTools (last 3 years) due to reduction

- Modes / multi-model + sens $[K]^{-1}[b]$
- A few thousand DOF, a few seconds per point

Mode 1 at 6.376 Hz

4 @ 573.4 Hz, dEk 4e-07 % dY 15.60 %

Potential uses

- Updating
- Frequency domain structural dynamics modification [4]
- Time domain (extended Kalman Filtering)

- [1] Deraemaecker, A., Ladevèze, P., Leconte, P. Reduced bases for model updating in structural dynamics based on constitutive relation error. computer methods in applied mechanics and engineering. CMAME 2002
- [2] E. Balmes, « Review and Evaluation of Shape Expansion Methods », IMAC, p. 555-561, 2000.
- [3] N. Nifa, « Solveurs performants pour l'optimisation sous contraintes en identification de paramètres », Ph.D. thesis, Université Paris-Saclay, 2017
- [4] M. Corus, « Amélioration de méthodes de modification structurale par utilisation de techniques d'expansion et de réduction de modèle. », ECP, 2003.

Summary : hybrid test/FEM

- With enough sensors (extreme case field measurement)
- Reasonable match between model and reality (LTI, no local modes, ...)
 ... updating (=parametric identification) works

If it does not, don't throw the model away

- Lots of things will never be measured : hidden faces, internal loads, ...
- Many can be estimated even with somewhat wrong model
- Hybrid models have used efficiently for decades
- Reduction extends usability to vibration problems

"Digital twin" is the current hype keyword for this old idea

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