Outline

- Direct frequency response = slow
- Reduction principles
- <u>Reduction illustrations</u>
- <u>CMS</u>
- CMS illustrations
- Course notes : chapter 5 : model reduction methods





MS2SC PROVIR http://savoir.ensam.eu/moodle/course/view.php?id=1874 http://savoir.ensam.eu/moodle/course/view.php?id=9318

MATLAB Tutorial : direct frequency response issues

See cc_simul tuto

- Step1 : assembly, sparse matrices
- Step 2 : point load, collocated displacement, factorization strategies
- Step 3 : subspace around resonance, phase collinearity, SVD
- Step 4 : Rayleigh-Ritz, reduced FRF

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	Step 6 sparse reduced model			⇒

Direct frequency response : Zq=F

- 1. Renumbering (fill in reduction, symbolic factorization METIS, symrcm, ...)
- 2. Numerical factorization Z = LU or $Z = LDL^T$



Sparse libraries : Umfpack (lu), MA57 (chol, ldl), Pardiso, Mumps, BCS-Lib, Spooles, Taucs, ...

17589 DOF

 $[Z]{q} = [Ms^{2} + Cs + K]{q(s)} = F$

1-3: Fact+Solve	0.7s
1-2: FactMA57	0.8s
3 : Solve	0.02s
1-2: FactPardiso	0.23s
3 : Solve	0.01s

Eigenvalue computation

Sparse library choice x2.4 speedup

Main steps :

- Factor
- Iterate

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Modal frequency response : H

- 1. Renumbering, factorization of $Z(\omega_0)$ 1/2 factor (60%)
- 2. Partial eigenvalue solver (Lanczos, eigs Arnoldi, ...) 2 NM Solves (39%)
- 3. Reduction : $M_R = I$, ...

4. Modal coordinate solve

diagonal or NM^2 matrix much faster if NM<<Nw (1%)

NM² matrix/vector

$$\begin{bmatrix} Ms^{2} + Cs + K \end{bmatrix} \{q(s)\}_{Nq} = [b]\{u(s)\} \\ \{y(s)\} = [c]\{q(s)\}$$

$$\begin{bmatrix} Is^{2} + \left[\sum_{i=1}^{N} 2\zeta_{j} \omega_{j} \right] s + \left[\sum_{i=1}^{N} \omega_{j}^{2} \right] \right] \{q_{R}(s)\}_{Nqr} = [\phi_{j}^{T}b]\{u(s)\} \\ \{y(s)\} = [c\phi_{j}]\{q_{R}(s)\} \end{bmatrix}$$

Transfers : what subspace is needed ?



Reading the Abaqus documentation

Several analysis types in ABAQUS/Standard are based on the eigenmodes and eigenvalues of the system. For example, in a mode-based steady-state dynamic ... (for more information, see "Linear dynamic analysis using modal superposition," Section 2.5.3 of the ABAQUS Theory Manual).

Due to cost, usually only a small subset of the total possible eigenmodes of the system are extracted, ... it is usually the higher frequency modes that are left out. ...

... superposition can be augmented with additional modes known as residual modes. The residual modes help correct for errors introduced by mode truncation. In ABAQUS/Standard a residual mode, R, represents the static response of the structure subjected to a **nominal (or unit) load, P**, corresponding to the actual load that will be used in the mode-based analysis orthogonalized against the extracted eigenmodes,

$$R^N = (\delta^{NJ} - \phi^N_\alpha \frac{1}{m_\alpha} \phi^I_\alpha M^{IJ})(K^{-1})^{JK} P^K,$$

followed by an orthogonalization of the residual modes against each other.

If the static responses are linearly dependent on each other or on the extracted eigenmodes, ABAQUS automatically eliminates the redundant responses for the purpose of computing the residual modes.

For the Lanczos eigensolver you must ensure that the static perturbation response of the load that will be applied in the subsequent mode-based analysis (i.e.,) is available by specifying that load in a static **perturbation** step. If multiple load cases are specified in this static perturbation analysis, one residual mode is calculated for each load case.

Reduction <-> Ritz analysis

Response is approximated

within subspace containing modes and flexibility

$$T = \begin{bmatrix} \phi_1 \dots \phi_{NR} & [K_{Flex}]^{-1} [b] \end{bmatrix}$$

or modes and residual flexibility

$$[T] = \left[[\phi_1 \dots \phi_{NM}] \quad \left[[K]_{Flex}^{-1} [b] - \sum_{j=1}^{NM} \frac{\{\phi_j\} \{\phi_j\}^T [b]}{\omega_j^2} \right] \right]$$

· Prefiltering b may be necessary for numerical precision

$$T = \begin{bmatrix} \phi_{1:NM} & \left[K_{Flex} \right]^{-1} \begin{bmatrix} b - \left[M \left[\phi_{1:NM} \right] \right] \left[\left[\phi_{1:NM} \right]^T b \end{bmatrix} \end{bmatrix} \end{bmatrix}$$

Attachment modes



For free structure : static load implies deformation in a uniformly accelerating frame

$$\{q_F\} = [K]_{Flex}^{-1}[b] = \sum_{j=NB+1}^{N} \frac{\{\phi_j\}\{\phi_j^T b\}}{\omega_j^2}$$

See section 5.3.2 static response in presence of rigid body modes

Collocated transfers

- Collocated $\Leftrightarrow \{u\}^T \{\dot{y}\} = power \Leftrightarrow [c] = [b]^T$
- proof : displacement feedback $[\Delta K] = [b]k[c]$ must be energy and thus ≥ 0
- Modal contributions positive real

$$H_c(s) = \sum_{j=1}^{NM} \frac{\left(c\phi_j\right)^2}{s^2 + 2\zeta_j\omega_j s + \omega_j^2}$$

Trivial ranking of mode contributions as fractions

$$cont_{j} = \frac{\left(c\phi_{j}\right)^{2}/\omega_{j}^{2}}{\sum\left(c\phi_{j}\right)^{2}/\omega_{j}^{2}} \in [0 \ 1]$$

Residual terms critical if number of sum of kept contributions not close to 1

Sample modal contribution sorting





Unit imposed displacement

Applied load : free modes + static correction = McNeal Applied displacement : dynamic & Static/Guyan condensation

$$\begin{bmatrix} K_{II} & K_{IC} \\ K_{CI} & K_{CC} \end{bmatrix} \begin{cases} \langle q_I(s) \rangle \\ q_C(s) \end{pmatrix} + \begin{bmatrix} Ms^2 \end{bmatrix} \{q\} = \begin{cases} R_I(s) \\ \langle 0 \rangle \end{cases}$$

No interior load = dynamic condensation

$$[T(\omega)] \{q_I\} = \begin{bmatrix} I \\ -Z_{CC}(\omega)^{-1} Z_{CI}(\omega) \end{bmatrix} \{q_I\}$$

Inertia cc neglected = static/Guyan



Frequency limit -> Craig-Bampton



Application : fixed sensor mode



Use : place additional sensors to extend frequency band (IMAC 05)

Equations of motion

$FEM \Leftrightarrow Reduction$

	Finite elements	Reduction
	Continuous \rightarrow discrete full	Full \rightarrow reduced
Support	Element: line, tria, tetra,	FE mesh
Variable separ.	$w(x,t) = N_i(x)q_i(t)$	$\{q(t)\} = \{T_i\}_{N \times N_R} \{q_i(t)\}_{N_R}$
Shape functions	$\epsilon(x,t) = B_i(x)q_i(t)$	T_i simple FE solutions
Matrix comp.	$K_{ii} = \int_{\Omega} B_i^T \Lambda B_i = \sum_a B_i^T (g) \Lambda B_i w_a J_a$	$K_{ijR} = T_i^T K T_j$
Weak form	numerical integration	FEM matrix projection
Assembly	Localization matrix	Boundary continuity, CMS
Validity	Fine mesh for solution gradients	Good basis for considered loading

- Target defined by load {f}=[b]{u}
- space [b]
- time/freq {u}
- [1] O. C. Zienkiewicz et R. L. Taylor, The Finite Element Method. MacGraw-Hill, 1989
- [2] J. L. Batoz et G. Dhatt, Modélisation des Structures par Éléments Finis. Hermès, Paris, 1990
- [3] K. J. Bathe, Finite Element Procedures in Engineering Analysis. Prentice-Hall Inc., Englewood Cliffs, NJ, 1982

Interface reduction / model size / sparsity

• Craig-Bampton often sub-performant because of interfaces



- Unit motion can be redefined : interface modes Fourier, analytic polynomials, local eigenvalue 5000 -> 500 interface DOFs.
- Disjoint internal DOF subsets

Separate requirements for learning shapes :

bandwidth, inputs external & parameter truncation, sparsity

5000² = 200 MB

Multi-frontal solvers / AMLS

- Graph partitioning methods ⇒ group DOFs in an elimination tree with separate branches
- Block structure of reduction basis
- Block diagonal stiffness
- Very populated mass coupling
- Multi-frontal eigensolvers (AMLS)
 - interface modes to limit size of mass coupling





CMS current practice

- Craig-Bampton (unit displacements + fixed interface modes)
 - Very robust, guaranteed independence
- McNeal (free modes + static response to loads)
 - Tends to have poor conditioning (residual flexibility)
- Well established applications
 - structural vibrations
 - multi flexible-bodies
 - vibroacoustics
- Limits
 - Very large models
 - Large interfaces
 - Parametric design of component
 - Non local or strong coupling (reduction not independent)
 - Hybrid test/analysis
 - Ease of use



Moving complexity in the coupling part



Ritz/Galerkin reduction from full

- Basis building steps
 - FEM : cinematically admissible subspace, virtual work principle
 - Reduction : 1) learn, 2) generate basis 3) choose DOF $\{q(p,t)\}_N \approx [T]_{N \times NR} \{q_R(p,t)\}_{NR}$
 - AI terminology : 1) data driven (use response data : limited band & chosen inputs), 2) train/learn (but here direct) 3) interpret internal aspects of model
- Virtual work principle / reduction / Ritz-Galerkin Matrices $[M_R(p)] = T^T M(p)T, K_R(p) = T^T K(p)T$ Loads $\{f(p,t)\} = [b_R(p)]\{u(t)\} = [T^T b]\{u\}$ Observations $\{y(p,t)\} = [c_R(p)]\{q_R(p,t)\} = [cT]\{q_R\}$
- Solve time/freq (same model form) $[M_R]\{\dot{q_R}\} + [C_R]\{\dot{q_R}\} + [K_R]\{q_R\} = [b]\{u(t)\}$ $\{y(t,p)\} = [c_R]\{q_R\}$

Interface reduction : wave/cyclic Best interface reduction = learn from full system modes Learn using wave (Floquet)/cyclic solutions 1 2. Build basis with left/right compatibility 3. Assemble reduced model Mode 1 at 3 585 Hz Mode 2 at 6 496 Hz Mode 3 at 10 53 Hz o initial reconstructed 1.5 2 2.5 Nombre d'onde (rad/m) 10 15 20 25 Fourier Harmonic Coefficient δ 35 5 30 PhD Elodie Arlaud, 2016 PhD Hadrien Pinault. 2020 22 PhD Sternshuss 2008