Progress in Parametric Model Reduction



Fraunhofer Institut Techno- und Wirtschaftsmathematik

J. Mohring, Paris, 15.12.2009

Overview

- Need for parametric model reduction
- Optimal H₂ controller for LMS concrete car benchmark
- The LBF acoustic aquarium
- Numerical improvements in Fraunhofer model reduction toolbox
- New theoretical results





Need for parametric model reduction





Need for parametric model reduction

- Fitting FE-models to measurements
- Treatment of **non-linear** boundary conditions
- Sensitivity analyses
- Model based controller design
- Simulation based design optimization

Whenever evaluating large FE-models

- must be **repeated** many times (e.g. optimization)
- is very **expensive** (e.g. frequency response)





Optimal H₂ controller for LMS concrete Car benchmark





Optimal model based H₂ controller of LMS concrete car



Inputs: piezo voltage & volume velocity of loudspeaker

Outputs: SPL at passengers' heads

Optimization parameters: Controller gains + Patch coordinates

FE Model: multi-field, ~100.000 DOFs





Step 1: create reduced parametric model using Fraunhofer model reduction toolbox







How to generate a parametric reduced model with MRT





	Model Reduction Exterface
	🚛 🗃 🖫 🌂 🗸) 3. Start reduction 🔹 🔹
	environment
How to generate a parametric rec	save file C:\Documents and Settings\mitv\Application Data\mrt\projects\Imscar.mat
now to generate a parametric rec	APDL script D: \moras\share\soft\samples\concreteCar\concreteCar.inp
	working directory C:\Documents and Settings\mtv\Application Data\mrt
APDL script describing	results directory C:\Documents and Settings\mtv\Application Data\mrt\models
Read and modify parametric fully coupled multi-field ANSYS [®] model	is automatically modified ttsamplestconcreteCar
	Ansys version 110
	Ansys product ANSYS Academic Research
MATLAB [®] toolbox MRT (Fraunhofer	Bereremeter
Model Reduction Call In Batch mode multiphysics	parameter type order transform values E
	fSpeaker load - 0 1 0
write	ANSYS is automatically called in batch $\frac{2}{0}$
	mode and system written to full-file
Set reduction ANSYS [®] full file	
parameters, with original	nodal input
ANSYS [®] model	component label E
assignment	
Reduced	- nodal output
parametric atota among ANSVS model is automatical	daughter PRES 0
model and	father PRES 0
info on I/O and reduced to state space r	NOCE mother PRES 0
	daughter PRES
	method redMechatronic -
ІТѠМ	nRed fRef s0 toISVD toISchur nExtra maxiter statCor
Fraunhofer Institut	40 100 0.01 0.0001 1e-013 40 200 1
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How to generate a parametric reduced model with MRT







How to get reduced models for new parameters ?



x-coordinate of patch center [mm]

- Needs another ANSYS license
- Needs calculations taking minutes to hours
- Does not use reductions created before

→NO !

New reduced model is **interpolated** from existing ones

- without ANSYS
- within fractions of a second

y-coordinate of patch center [mm]





Step 2: Form optimal H2 controller



LBF acoustic aquarium





LBF acoustic aquarium



- Matthias Kurch (Fraunhofer LBF-Darmstadt) provides Ansys FE-model and measurements of "acoustic aquarium" via Tiziana and me.
- Plans: Common paper on fitting damping and stiffness of screw-rubber layer to measurements using parametric reduced model. (LBF: M. Kurch, ITWM: J. Mohring, S. Lefteriu, A. Wirsen)





LBF acoustic aquarium : aluminum-plate

- Dimensions: 300x280x2 mm³
- 3 x 2 actuators (A1, A2, A3)
- PIC 155 50x25x0.5
- 3 sensors (S1, S2, S3)
- PIC 155 10x10x0.1

×

With permission of M. Kurch (LBF)





LBF acoustic aquarium: laser-scanning-vibrometer

- 99 measurement positions
- 3 measurements per excitation: microphone, vibrometer, piezo-sensor S2
- 298 frequency responses
- Hammer excitation







With permission of M. Kurch (LBF)







With permission of M. Kurch (LBF)





LBF acoustic aquarium: need for fitting parameters of screwrubber-layer



621,30 Hz

ΆΝS NODAL SOLUTION STEP=1 SUB =7 RFRQ=655.515 DEC 2 2009 18:26:53 PLOT NO. 1 IFRO=0 MODE Real part PRES (AVG) RSYS=0 NSIS-0 DMX =.005756 SMN =-4534 SMX =4580 -483.247 529.464 -4534 -2509 1542 3568 -3521 2555 -1496 4580

655,51 Hz

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Numerical improvements in Fraunhofer model reduction toolbox





Numerical improvements

Parallel version

- Depending on number of parameters and order of polynomial we have to build and reduce several 10 or 100 FE models
- This can be done in parallel without any communication, if enough cores and Ansys licenses are available
- Full parametric LMS car model takes about **45 min** (12 evaluations, 32 cores, 5 Ansys licenses)





Numerical improvements

Efficient reduction of thermal problems with many inputs (area sources)

- Continuation of common work with Julian
- **Goal:** reduce $E\dot{x} = Ax + Bu$, y = Cx
- Instead of standard moment matching, i.e. computing

$$V = \operatorname{orth} \left[A^{-1}B, A^{-1}EA^{-1}B, (A^{-1}E)^2 A^{-1}B, \cdots \right]$$

form incomplete SVD of operator T without forming matrix explicitly

$$T\xi = \left[A^{-1}B, A^{-1}EA^{-1}B, \cdots, (A^{-1}E)^{k}A^{-1}B\right]\xi$$

U essential states to project on.







New theoretical results on parametric reduction via matrix matching





Idea of matrix matching













Success of matrix matching

- Poles move correctly with the parameters, even in case of eigenvaluecrossing
- FE-mesh may change topology







For illustration

Quality of interpolation depends strongly on chosen realization

Example 1

Consider linear interpolation of one-parametric class of standard state space systems

 $\Sigma_p = (A(p), B(p), C(p)): \quad \dot{x} = A(p)x + B(p)u, \quad y = C(p)x, \quad p \in [0,1]$

Models are already reduced, i.e. typical state space dimension < 100.

Assume $\Sigma_1 = \Sigma_0 = (A, B, C)$. Expect $\Sigma_{0.5} = \Sigma_0 = \Sigma_1$. Keep Σ_0 , but replace realization of Σ_0 equivalent one: $\Sigma'_1 = (X^{-1}AX, X^{-1}B, CX)$ with X = -I, i.e. $\Sigma'_1 = (A, -B, -C)$. Linear interpolation of matrices yields nonsense: $\Sigma'_{0.5} = 0.5(A, B, C) + 0.5(A, -B, -C) = (A, 0, 0)$





For illustration

Quality of interpolation depends strongly on chosen realization

Example 2

Consider linear interpolation of one-parametric class of standard state space systems

 $\Sigma_p = \left(A(p), B(p), C(p) \right): \quad \dot{x} = A(p)x + B(p)u, \ y = C(p)x, \quad p \in \left[0, 1 \right]$

Models are already reduced, i.e. typical state space dimension < 100.

Assume $\Sigma_1 = \Sigma_0 = \left(\begin{bmatrix} \alpha & 0 \\ 0 & \beta \end{bmatrix}, \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}, \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} \right)$. Expect $\Sigma_{0.5} = \Sigma_0 = \Sigma_1$ Keep Σ_0 , but replace realization of Σ_0 equivalent one: $\Sigma'_1 = \left(\begin{bmatrix} \beta & 0 \\ 0 & \alpha \end{bmatrix}, \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix}, \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix} \right)$ Linear interp. is not minimal $\Sigma'_{0.5} = \left(\begin{bmatrix} (\alpha + \beta)/2 & 0 \\ 0 & (\alpha + \beta)/2 \end{bmatrix}, \begin{bmatrix} 1/2 & 1/2 \\ 1/2 & 1/2 \end{bmatrix}, \begin{bmatrix} 1/2 & 1/2 \\ 1/2 & 1/2 \end{bmatrix} \right)$

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Known :

Interpolating transfer functions works fine for *s* away from poles

Idea: compare this interpolation with transferfunction of interpolated matrices at "save" *s*

Difference can be estimated

$$H_{i}(s) = C_{i}M_{i}B_{i}, \quad M_{i} = (sI - A_{i})^{-1}, \quad i = 1, 2$$

$$\tilde{H}_{p}(s) = (1 - p)H_{0}(s) + pH_{1}(s), \quad \text{i.e. with } \Delta B = B_{1} - B_{0}$$

$$= (1 - p)C_{0}M_{0}B_{0} + p(C_{0} + \Delta C)(M_{0} + \Delta M)(B_{0} + \Delta B)$$

$$H_{p}(s) = (C_{0} + p\Delta C)(M_{0} + p\Delta M)(B_{0} + p\Delta B)$$

$$\tilde{H}_{p}(s) - H_{p}(s)$$

$$= p(1 - p)(\underbrace{C_{0}\Delta M\Delta B + \Delta CM_{0}\Delta B + \Delta C\Delta M B_{0}}_{\Delta}) + O(\Delta^{.3})$$

$$\|\Delta\| \le \alpha \|M_{1} - M_{0}\|^{2} + \beta \|B_{1} - B_{0}\|^{2} + \gamma \|C_{1} - C_{0}\|^{2},$$
with $\alpha = \frac{\|B_{0}\|\|C_{0}\|}{\|M_{0}\|}, \beta = \frac{\|M_{0}\|\|C_{0}\|}{\|B_{0}\|} \text{ etc.}$





For (almost) unitary X this is (almost) equivalent to minimizing

Claiming necessary cond. with Frobenius-norm leads to generalized Sylvester equation for X

$$\tilde{J}(X) = \alpha \left\| X^{-1} M_1 X - M_0 \right\|^2 + \beta \left\| X^{-1} B_1 - B_0 \right\|^2 + \gamma \left\| C_1 X - C_0 \right\|^2$$

$$J(X) = \alpha \|M_1 X - XM_0\|^2 + \beta \|B_1 - XB_0\|^2 + \gamma \|C_1 X - C_0\|^2$$
$$J'(X)[H] = 0 \quad \forall H$$
$$\|A\| = \|A\|_F = tr(A^*A), \quad \|AB\| = \|BA\|, \quad \|A\| = \|A^*\|$$

$$\left(\alpha M_{1}^{*}M_{1} + \gamma C_{1}^{*}C_{1}\right)X + X\left(\alpha M_{0}M_{0}^{*} + \beta B_{0}B_{0}^{*}\right) -\alpha \left(M_{1}XM_{0}^{*} + M_{1}^{*}XM_{0}\right) = \beta B_{1}B_{0}^{*} + \gamma C_{1}^{*}C_{0}$$





Open questions

Stability



- Assume Σ_{p_i} are **stable**. Are so the interpolated systems?
- Answered by Sanda





Open questions

Unitarity

- True error bound
 - $\tilde{J}(X) = \alpha \left\| X^{-1}M_1 X M_0 \right\|^2 + \beta \left\| X^{-1}B_1 B_0 \right\|^2 + \gamma \left\| C_1 X C_0 \right\|^2$ and the one used for finding optimal Transformation X $J(X) = \alpha \left\| M_1 X - XM_0 \right\|^2 + \beta \left\| B_1 - XB_0 \right\|^2 + \gamma \left\| C_1 X - C_0 \right\|^2$ coincide only, if X is **unitary**.
- If some modes enter/leave with changing parameters, then X might become singular
- Robust construction of X by claiming unitarity explicitly
- Answered by Sanda





Open questions

Influence of interpolation scheme ?

- global polynomial
- piecewise polynomial
- spline
- Answered by Sanda

How to scale different i/o's (e.g. pressures, voltages)

under investigation





To be continued by Sanda





Introduction

It is demonstrated

- How to optimize a smart structures application modeled by ANSYS[®] (e.g. optimal position of piezo patch on firewall)
- which requires many expensive evaluations (e.g. frequency responses)
- by parametric reduced models
- using our Model Reduction Toolbox for ANSYS® / Matlab®





Sample problem: optimal patch position for concrete car


Sample problem: optimal patch position for concrete car



Sample problem: optimal patch position for concrete car



Sample problem: optimal patch position for concrete car











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Slide 42















Need for parametric reduced model



- In general, patch position must be **uniformly effective** on a whole **frequency range**
- Evaluating position requires computing frequency response of transfer function loudspeaker → driver's ear
- ANSYS[®] requires 160s for single frequency (Xeon 2.5 GHz)

→ We need reduced model

- Many different patch positions must be tried: several local minima, Newton iteration about each minimum
- → We need parametric model which can be evaluated at new positions without creating and reducing new ANSYS[®] models

















$$\begin{cases} s^{2}M(p_{1}) + sR(p_{1}) + K(p_{1}) \end{pmatrix} \xi = L(p_{1})u$$

$$y = P(p_{1})\xi$$

reduce
state space model for parameters $p_{1} = (X_{1}, y_{1})$
 $\dot{\xi} = A(p_{1})x + B(p_{1})u$

$$y = C(p_{1})x + D(p_{1})u$$

 $y = C(p_{1})x + D(p_{1})u$
 $y = coordinate of patch center [mm]$
x-coordinate of patch center [mm]









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$$\int_{10^{4}}^{10^{4}} \left(s^{2}M(p_{2}) + sR(p_{2}) + K(p_{2})\right)\xi = L(p_{2})u$$

$$y = P(p_{2})\xi$$
reduce
state space model for parameters $p_{2} = (X_{2},Y_{2})$

$$\dot{\xi} = A(p_{2})x + B(p_{2})u$$

$$y = C(p_{2})x + D(p_{2})u$$





























• Consider multi-field Ansys model of concrete car for fixed parameter set

$$(s^2M + sR + K)\xi = Lu$$
 $y = C \begin{bmatrix} \xi \\ s\xi \end{bmatrix}$





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$$(s^2M + sR + K)\xi = Lu$$
 $y = C\begin{bmatrix} \xi\\ s\xi \end{bmatrix}$

• Built-in reduction schemes of Ansys and Matlab fail due to non-symmetric/singular matrices or non-Rayleigh damping and size (~100.000 DOFs), respectively.



Solution

• Turn 2nd order system into 1st order system

$$sEx = Ax + Bu y = Cx + Du$$

$$x = \begin{bmatrix} \xi \\ s\xi \end{bmatrix}$$
$$E = \begin{bmatrix} I & 0 \\ 0 & M \end{bmatrix}$$
$$A = \begin{bmatrix} 0 & I \\ -K & -R \end{bmatrix}$$
$$B = \begin{bmatrix} 0 \\ L \end{bmatrix}$$





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$$B = \begin{bmatrix} 0 \\ L \end{bmatrix}$$

• Turn to shift and invert form (largest eigenvalues correspond to those of original system close to shift s₀). With $T = A - s_0 E$:

 $\Delta s Gx = x + Fu$ y = Cx with $\Delta s = s - s_0$ $G = T^{-1}E$ $F = T^{-1}B$



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• Project on nxk matrices V,W with W*V=I, k<<n from modal analysis or Arnoldi process

 $s G' x = (\mathbf{I} + \mathbf{s}_0 \mathbf{G}') x + F' u$ y = C' x with $G' = W^* G V$ $F' = W^* F$ C' = C V





Contribution by fellows

- Sanda: structure preserving reduction: Reduced model is again of 2nd order.
- Julian: hybrid reduction scheme for systems with many inputs and outputs combining modal truncation and moment matching.





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- Sanda: structure preserving reduction: Reduced model is again of 2nd order.
- Julian: hybrid reduction scheme for systems with many inputs and outputs combining modal truncation and moment matching.

J. Stoev and J. Mohring. Hybrid reduction of non-symmetric mimo systems. Submitted to Systems & Control Letters (Status: second revision)





Polynomial interpolation

Polynomial interpolation of scalar function (example: 1 parameter *x*, 2nd order) $f(x) \approx f(0) + [-3f(0) + 4f(0.5) - f(1)] x + [2f(0) - 4f(0.5) + 2f(0)] x^2$





Polynomial interpolation

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System matrices may be interpolated in exactly the same way:

$$A(x) \approx A(0) + [-3A(0) + 4A(0.5) - A(1)]x + [2A(0) - 4A(0.5) + 2A(0)]x^{2}$$

:
$$D(x) \approx D(0) + [-3D(0) + D(0.5) - D(1)]x + [2D(0) - 4D(0.5) + 2D(0)]x^{2}$$





How to choose realizations?

• Realizations $\Sigma = (A, B, C, D)$ and $\Sigma' = (T^{-1}AT, T^{-1}B, CT, D)$

have same transfer function $H(s) = C (sI - A)^{-1} B + D$

i.e. they describe same system.

• Interpolating badly chosen realizations may completely fail:

Consider one-parametric family of single state SISO systems

 $\Sigma(+1) = (-1, 1, 1, 0)$ $\Sigma(-1) = (-1, -1, -1, 0)$

Realizations of same system (T=-1), but linear interpolation gives $\Sigma(0) = (-1, 0, 0, 0)$





Looking for way out

• Interpolate (unique) transfer function







Linear interpolation of transfer functions Looking for way out 10³ Interpolate (unique) transfer function 10² amplitude [1] 01 __ 10[°] 10⁻¹∟ 0.5 frequency [rad/s]



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original ---- interpolated

used for interpolation

1.5

Looking for way out







Looking for way out







Looking for way out







New approach

- Select arbitrary realization $\Sigma(p) = (A, B, C, D)$ or first parameter as reference
- Choose realizations $\Sigma(p') = (A', B', C', D')$ for other parameters as close as possible to reference





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- Formally: find transform *T* minimizing

$$J(T) = \alpha \|TA - A'T\|^{2} + \beta \|TB - B'\|^{2} + \gamma \|C - C'T\|^{2}$$





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$$J(T) = \alpha \|TA - A'T\|^{2} + \beta \|TB - B'\|^{2} + \gamma \|C - C'T\|^{2}$$

leading to matrix equation for T

 $\left(\alpha A'^*A' + \gamma C'^*C'\right)T + T\left(\alpha AA^* + \beta BB^*\right) - \alpha \left(A'TA^* + A'^*TA\right) = \beta B'B^* + \gamma C'C$






- ANSYS® model is created and reduced at 9 positions
- Reduced models are interpolated bilinearly
- Efficiency function $\mathcal{E} = |$

$$\int_{\leq \omega_{\max}} \left| h_{piezo}(i\omega_k) / h_{speaker}(i\omega_k) \right|^2 \right|^{-1} \text{ is evalutaed at}$$

>1/2

50x50=2500 positions, which takes 100s altogether





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instead of Conclusion: Request for collaboration

Are there fellows interested in optimizing their smart structures design with MRT, possibly at Kaiserslautern?



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