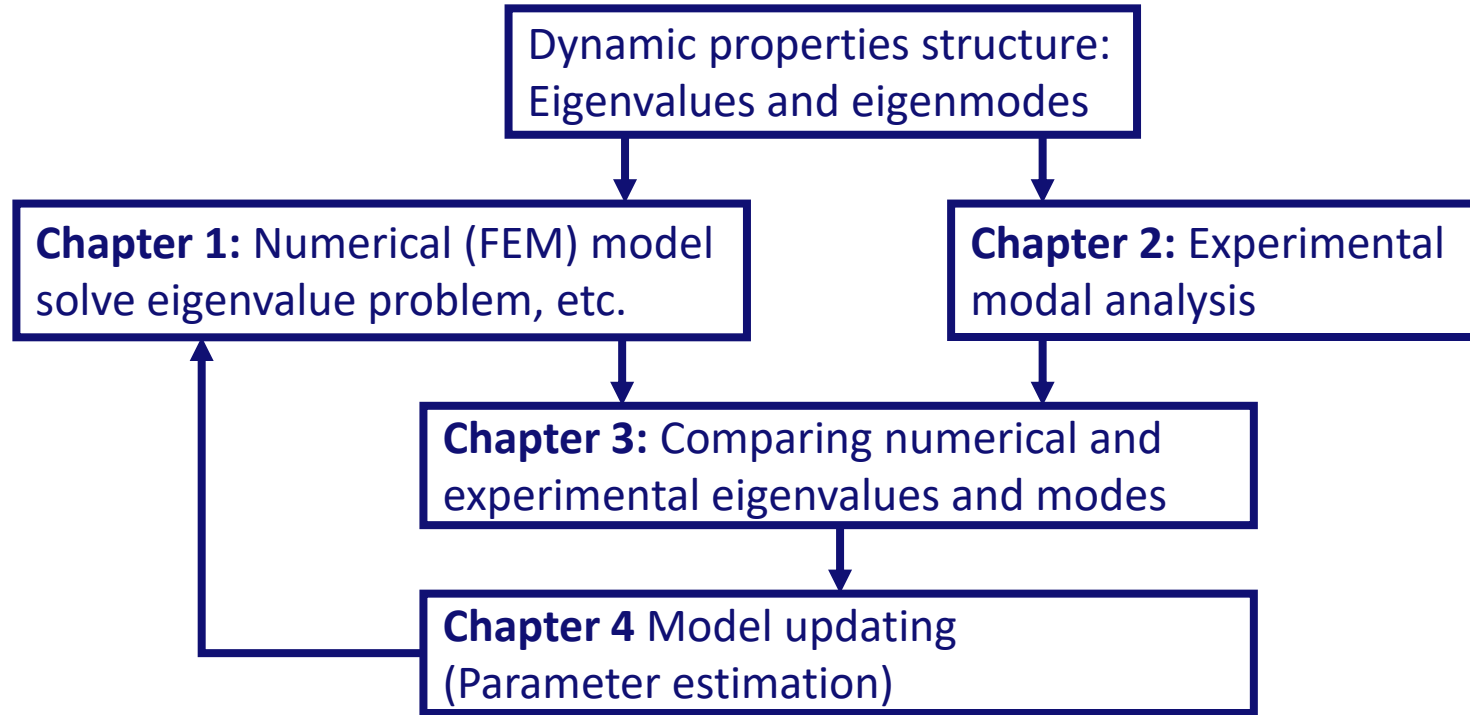


## 13. Model updating

Structural Dynamics part of 4DM00

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# Structure of the course (SD part)



# System error matrices

Find the parts of the numerical model which could be responsible for differences between numerical and experimental data.

Undamped orthogonality properties:

$$\begin{aligned}U^\top M U &= I &\Rightarrow M &= (U^\top)^{-1} U^{-1} &\Rightarrow M^{-1} &= U U^\top \\U^\top K U &= \Omega^2 &\Rightarrow K &= (U^\top)^{-1} \Omega^2 U^{-1} &\Rightarrow K^{-1} &= U \Omega^{-2} U^\top\end{aligned}$$

In practice we only have  $e$  measured modes  $U_{ne}$  and measured eigenfrequencies:  $\Omega_{ee}^2$ .

$$\begin{aligned}\text{Pseudo-inverses:} \quad (M_{nn}^N)^{-1} &\approx U_{ne}^N (U_{ne}^N)^\top & (K_{nn}^N)^{-1} &\approx U_{ne}^N (\Omega_{ee}^N)^{-2} (U_{ne}^N)^\top \\(M_{nn}^E)^{-1} &\approx U_{ne}^E (U_{ne}^E)^\top & (K_{nn}^E)^{-1} &\approx U_{ne}^E (\Omega_{ee}^E)^{-2} (U_{ne}^E)^\top\end{aligned}$$

Intuition: there is a good match between numerical and experimental data when  $(M^N)^{-1} \approx (M_{nn}^E)^{-1}$  and  $(K^N)^{-1} \approx (K_{nn}^E)^{-1}$ .

# System error matrices

Define the error stiffness matrix:

$$\Delta K = K^E - K^N$$

Note: we cannot compute  $\Delta K$  because only the pseudo inverse of  $K^E$  is available.

We can also write:

$$K^E = K^N(I + (K^N)^{-1}\Delta K), \quad \Rightarrow \quad (K^E)^{-1} = (I + (K^N)^{-1}\Delta K)^{-1}(K^N)^{-1}.$$

We use a Taylor series expansion for  $(I + (K^N)^{-1}\Delta K)^{-1}$ :

$$(K^E)^{-1} = (K^N)^{-1} - (K^N)^{-1}\Delta K(K^N)^{-1} + ((K^N)^{-1}\Delta K)^2(K^N)^{-1}$$

If all eigenvalue of  $(K^N)^{-1}\Delta K$  have sufficiently small magnitudes ( $\Delta K$  sufficiently small), the higher order terms can be neglected:

$$\Delta K \approx K^N((K^N)^{-1} - (K^E)^{-1})K^N$$

# System error matrices

$$\Delta K \approx K^N ((K^N)^{-1} - (K^E)^{-1}) K^N$$

- $(K^E)^{-1}$  is calculated by  $U_{ne}^E (\Omega_{ee}^E)^{-2} (U_{ne}^E)^\top$
- $(K^N)^{-1}$  is calculated by  $U_{ne}^N (\Omega_{ee}^N)^{-2} (U_{ne}^N)^\top$

Note: when the number of measured dof  $m$  is smaller than  $n$ , the matrix  $K^N$  of dimension  $(n, n)$  should be reduced to dimension  $(m, m)$

# System error matrices

A similar procedure can be used to find the error mass matrix  $\Delta M$

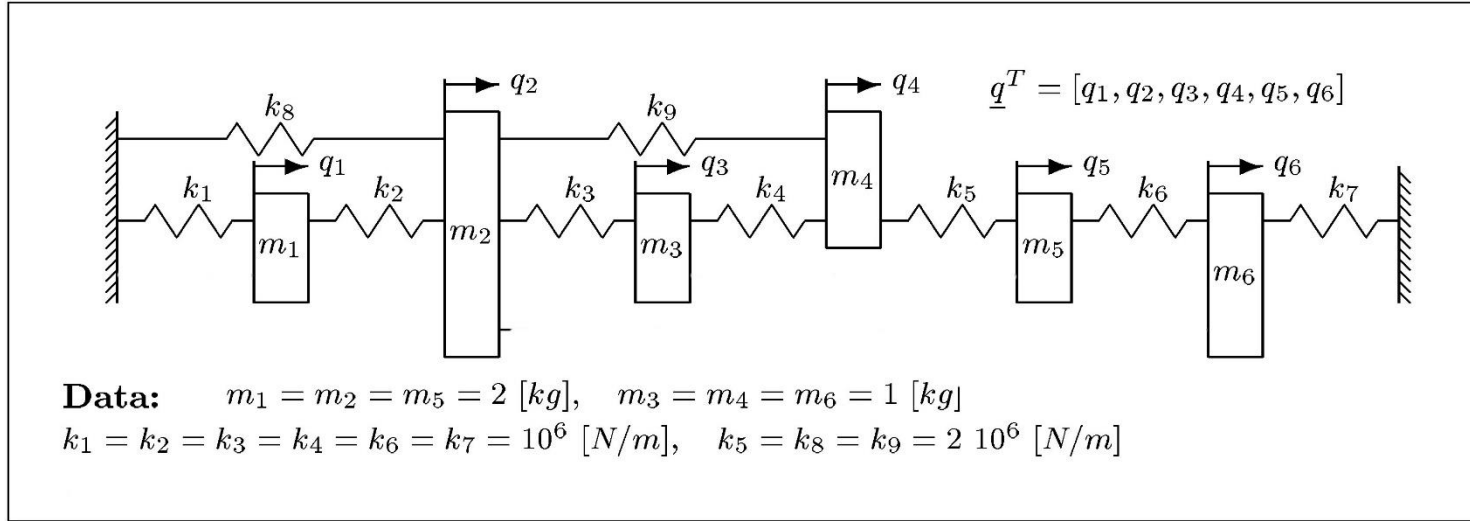
Often, errors in  $K^N$  are larger than errors in  $M^N$ :

modelling of stiffness usually is more complicated than modelling of mass

$\Delta K$  and  $\Delta M$ :

- could be seen as correction matrices to directly update  $K^N$  and  $M^N$ , but due to limited accuracy and interpretations problems they rather....
- give indications of DOFs in the FE model where modelling should be improved (identifying candidate parameters for model updating)

## Example 1: 6 dof model



‘Experimental’ modes are obtained by setting  $k_1 = 2 \cdot 10^6 \text{ N/m}$ ,  $k_7 = 0.5 \cdot 10^6 \text{ N/m}$ .

All DOFs are ‘measured’:  $m = n = 6$

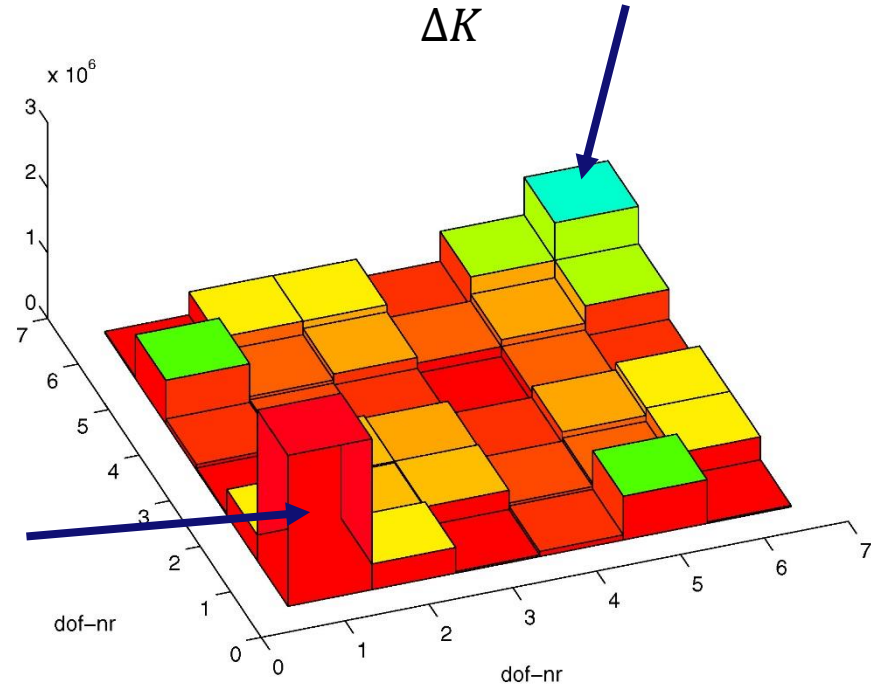
$e = 2$  (the first 2 eigenfrequencies and eigenmodes are both calculated and measured)

# Example 1: 6 dof model

Numerical eigenfrequencies	Experimental eigenfrequencies
$\omega_1^n = 585.5 \text{ rad/s}$	$\omega_1^e = 552.1 \text{ rad/s}$
$\omega_2^n = 940.1 \text{ rad/s}$	$\omega_2^e = 1031.5 \text{ rad/s}$

The largest elements of  $\Delta K$  are related to DOFs 1 and 6.

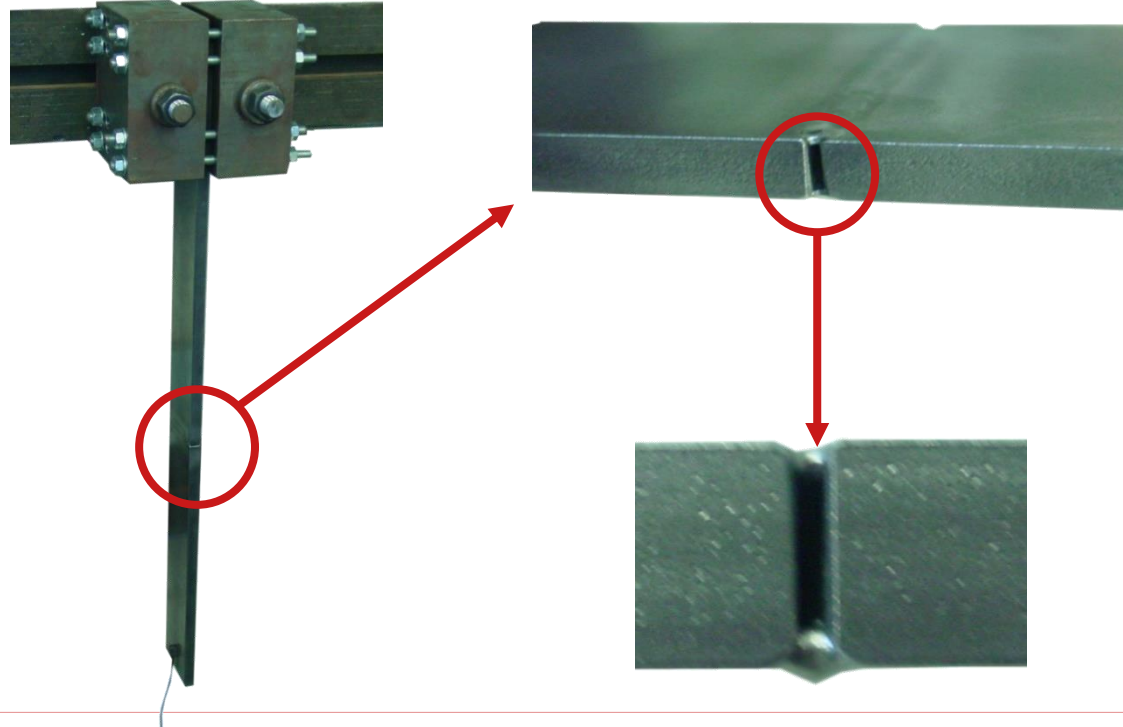
These are also DOFs at which stiffness was modified for the 'experimental' eigenmodes.





## Example 2: Clamped-Free beam with weld

Experimental setup



## Example 2: Clamped-Free beam with weld

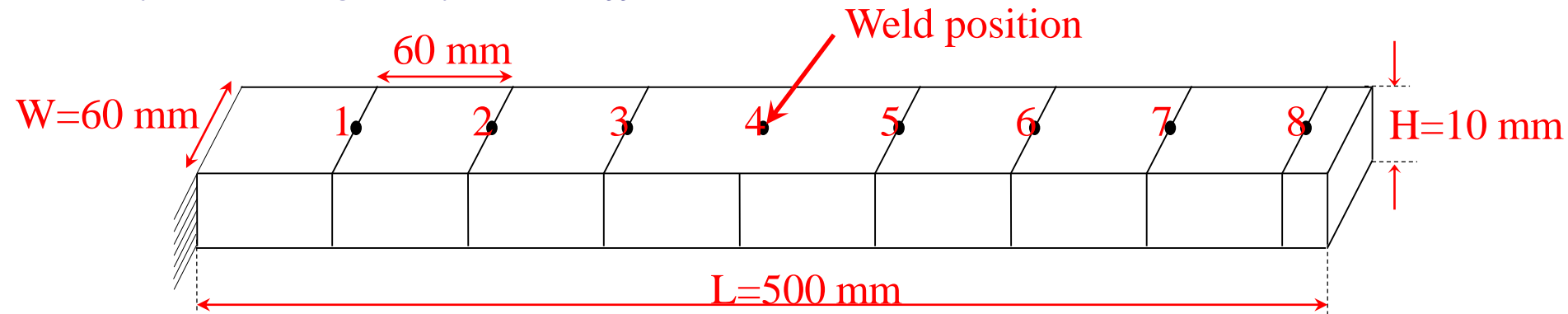
### Experimental Modal Analysis:

Number of sensor positions:  $m = 8$

Lowest 5 eigenfrequencies/eigenmodes (bending) measured:  $e = 5$  ( $e \leq m$ )

Experimental eigenmodes:  $U_{me}^E$  (8,5), each mode mass-normalized  $m_k^E = 1$

Experimental eigenfrequencies:  $\Omega_{ee}^E$  (5,5)

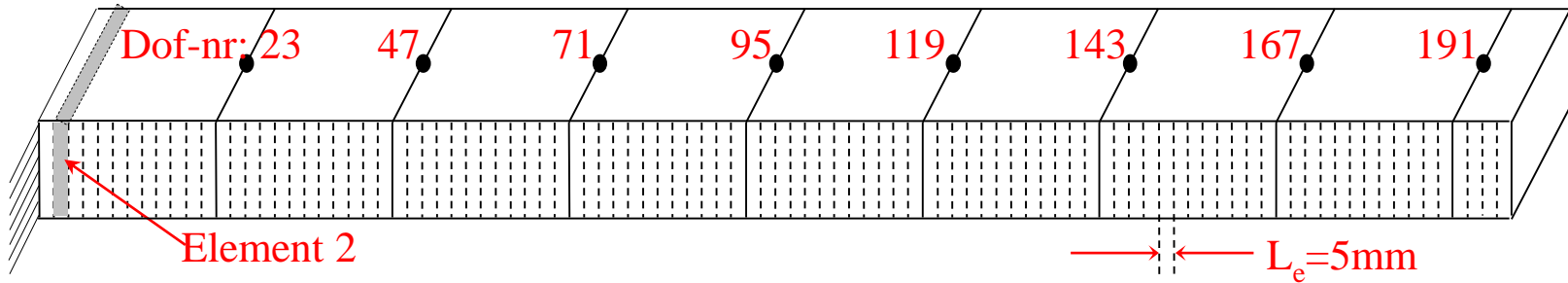


## Example 2: Clamped-Free beam with weld

### Finite Element model

Beam is assumed to be homogeneous!

100 Euler beam elements (only bending, no shear): 200 DOFs



Original FE-model:  $M^N \ddot{x}(t) + K^N x(t) = 0$

Eigenvalue problem  $(-\omega_{0,i}^2 M^N + K^N) u_{0,i} = 0$  is solved for the lowest  $m = 8$  eigenfrequencies

Corresponding eigenmodes:  $U_{nm}^N: (200,8)$

Mass-normalized:  $(U_{nm}^N)^T M^N U_{nm}^N = I_{mm}$ .

## Example 2: Clamped-Free beam with weld

### Reduction of numerical mass and stiffness matrices

To compute  $\Delta M$  and  $\Delta K$ , the (200,200)-matrices  $M^N$  and  $K^N$  are reduced to (8,8)-matrices.

1. Approximate the state  $x(t)$  in terms of the 8 lowest eigenmodes:

$$x(t) = U_{nm}^N p(t) \quad (8,1)\text{-column } p(t) \text{ contains generalized dof.}$$

2. Obtained matrices based on the measured DOFs  $x_m(t)$ :

$$x_m(t) = U_{mm}^N p(t) \quad p(t) = (U_{mm}^N)^{-1} x_m(t)$$

So $x_m(t)$ contains the dof's: 23,47,71,95,119,143,167,191
--

Resulting transformation matrix  $T$  is (200,8)

$$x(t) = U_{nm}^N (U_{mm}^N)^{-1} x_m(t) = T x_m(t)$$

Reduced (8,8)-matrices:

$$M_{mm}^N = T^T M^N T, \quad K_{mm}^N = T^T K^N T$$

## Example 2: Clamped-Free beam with weld

### Error stiffness and mass matrices

Error stiffness matrix:

$$\Delta K = K^E - K^N \approx K_{mm}^N [(K_{mm}^N)^{-1} - (K_{mm}^E)^{-1}] K_{mm}^N$$

where:

$$(K_{mm}^E)^{-1} \approx U_{me}^E (\Omega_{ee}^E)^{-2} (U_{me}^E)^\top$$

$$(K_{mm}^N)^{-1} \approx U_{me}^N (\Omega_{ee}^N)^{-2} (U_{me}^N)^\top$$

Error mass matrix:

$$\Delta M = M^E - M^N \approx M_{mm}^N [(M_{mm}^N)^{-1} - (M_{mm}^E)^{-1}] M_{mm}^N$$

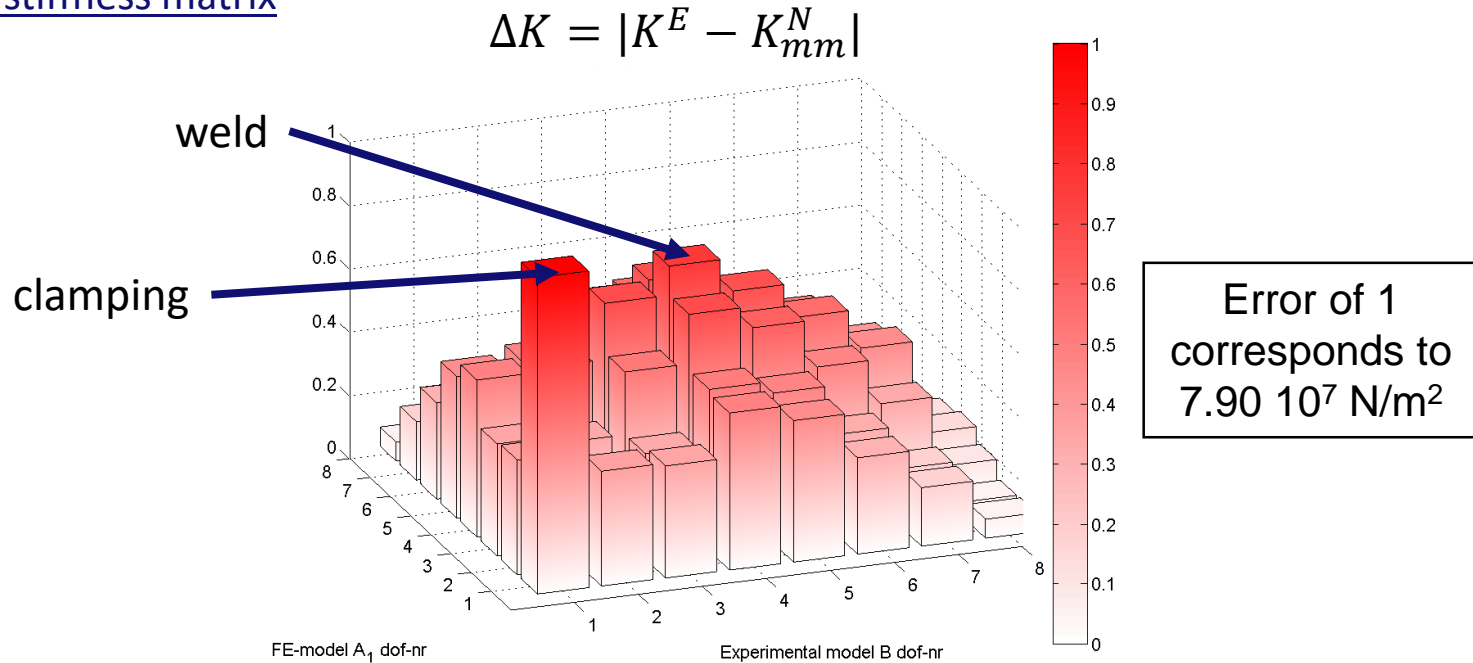
where:

$$(M_{mm}^E)^{-1} \approx U_{me}^E (U_{me}^E)^\top$$

$$(M_{mm}^N)^{-1} \approx U_{me}^N (U_{me}^N)^\top$$

## Example 2: Clamped-Free beam with weld

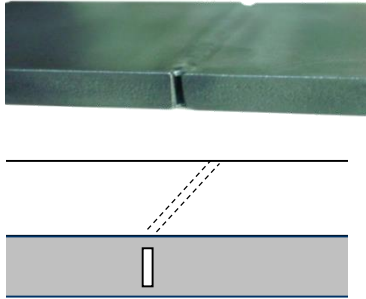
Error stiffness matrix



# Example 2: Clamped-Free beam with weld

## Improvement of the FE model

### 1. Better modelling of the weld



Use a beam element to model the weld

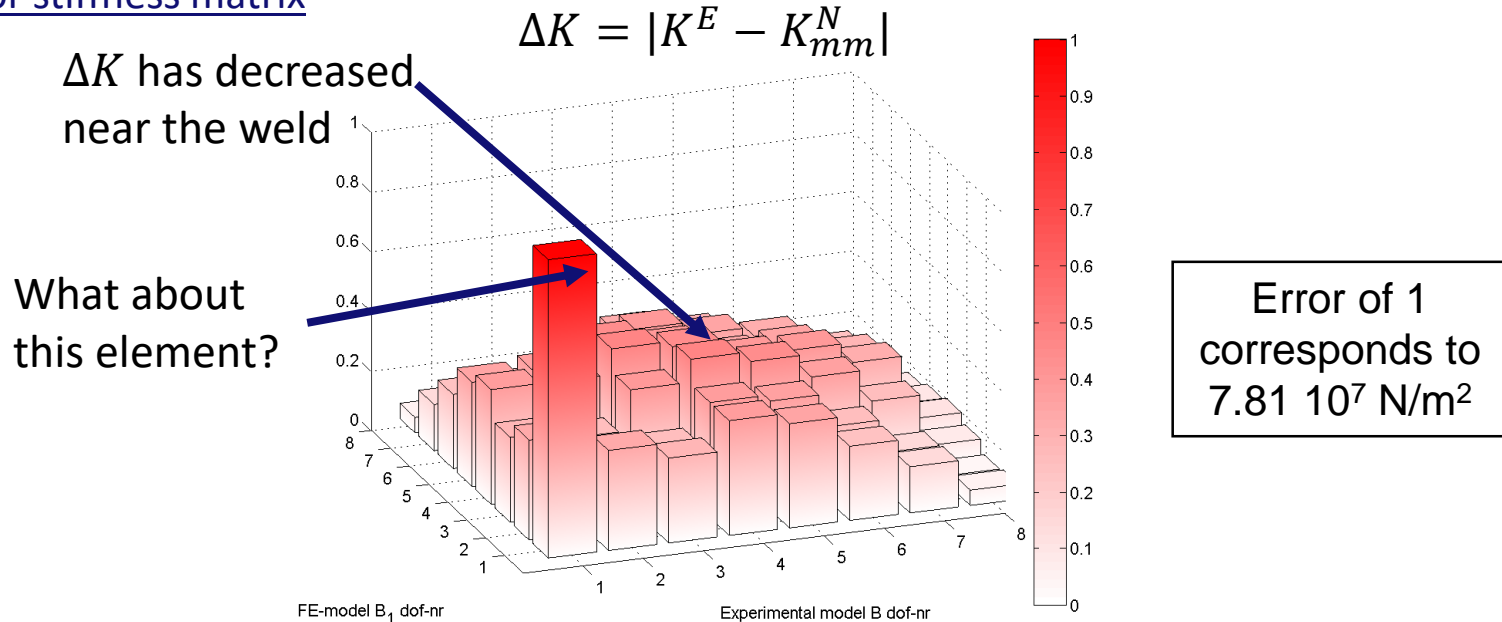
This element has different properties than the other elements, e.g. lower secondary moment of area

### 2. Including shear (Timoshenko beam elements instead of Euler beam elements)

Clamping is still modelled as infinitely stiff... ☹️

## Example 2: Clamped-Free beam with weld

### Error stiffness matrix





# Model updating using eigenvalue sensitivity

**Given:**  $\lambda_e$ , a column of  $e$  experimentally measured eigenvalues.

**Given:** a numerical model  $(\lambda_k C(p) + D(p))v_k = 0$   
depending on a vector of  $q$  parameters  $p$ .

**Note:** typically,  $q < 2e$ .

**Problem:** find/adapt the parameter values  $p$  such that  $\lambda_n = \lambda_n(p)$ , a vector containing  $e$  eigenvalues of the numerical model, match with  $\lambda_e$ .

**Note:** Corresponding eigenmodes should be similar.

# Model updating using eigenvalue sensitivity

**Iterative approach:**  $p_{(i)}$  denotes the parameter values at iteration  $i$

For small parameter variations  $\Delta p_{(i)}$  around  $p_{(i)}$

$$\lambda_n(p_{(i)} + \Delta p_{(i)}) \approx \lambda_n(p_{(i)}) + \left. \frac{\partial \lambda_n}{\partial p} \right|_{p=p_{(i)}} \Delta p_{(i)} =: \lambda_{n(i)} + S_{(i)} \Delta p_{(i)},$$

where

$$\lambda_{n(i)} := \lambda_n(p_{(i)}), \quad S_{(i)} = \left. \frac{\partial \lambda_n}{\partial p} \right|_{p=p_{(i)}}.$$

Note:  $S_{(i)}$  is computed using sensitivity analysis.

Introduce

$$\Delta \lambda_{(i)} := \lambda_e - \lambda_{n(i)} - S_{(i)} \Delta p_{(i)}$$

Note:  $\Delta \lambda_{(i)} \neq \lambda_e - \lambda_n(p)$ , but  $\Delta \lambda_{(i)} \approx \lambda_e - \lambda_n(p)$  for small  $\Delta p_{(i)}$ .

# Model updating using eigenvalue sensitivity

The number of parameters  $q$  is typically small (i.e.  $q < 2e$ ).  
 $\Rightarrow$  it is typically impossible to achieve  $\lambda_n(p) = \lambda_e$ .

**Least squares approach:** Minimize

$$\varepsilon_{(i)} = \Delta \lambda_{(i)}^H W \Delta \lambda_{(i)}$$

- $\varepsilon_{(i)}$  is a scalar-valued cost function
- $\Delta \lambda_{(i)} = \lambda_e - \lambda_{n(i)} - S_{(i)} \Delta p_{(i)}$
- $W$  is a real, positive definite, symmetric (often diagonal) weighting matrix.

**Optimal  $\Delta p_{(i)}$ :**  $\frac{\partial \varepsilon}{\partial \Delta p_{(i)}} = 0, \quad \text{Re}(S_{(i)}^H W S_{(i)}) \Delta p_{(i)} = \text{Re}(S_{(i)}^H W (\lambda_e - \lambda_{n(i)}))$

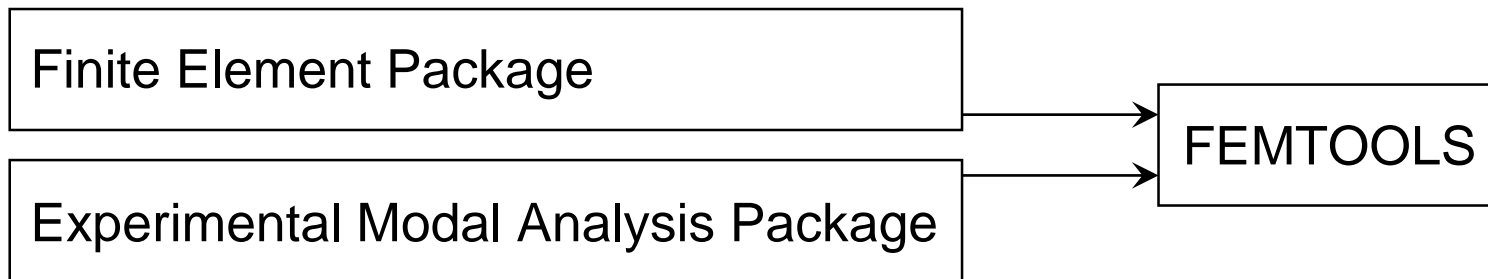
**Update:** Parameter update  $p_{(i+1)} = p_{(i)} + \Delta p_{(i)}$  and model update  $\lambda_{n(i+1)}$  and  $S_{(i+1)}$ .

**Stop** when  $\varepsilon_{(i)}$  and/or the relative changes  $\Delta p_{\alpha(i)} / p_{\alpha(i)}$  ( $\alpha = 1, \dots, q$ ) are small enough.

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# FEMTOOLS

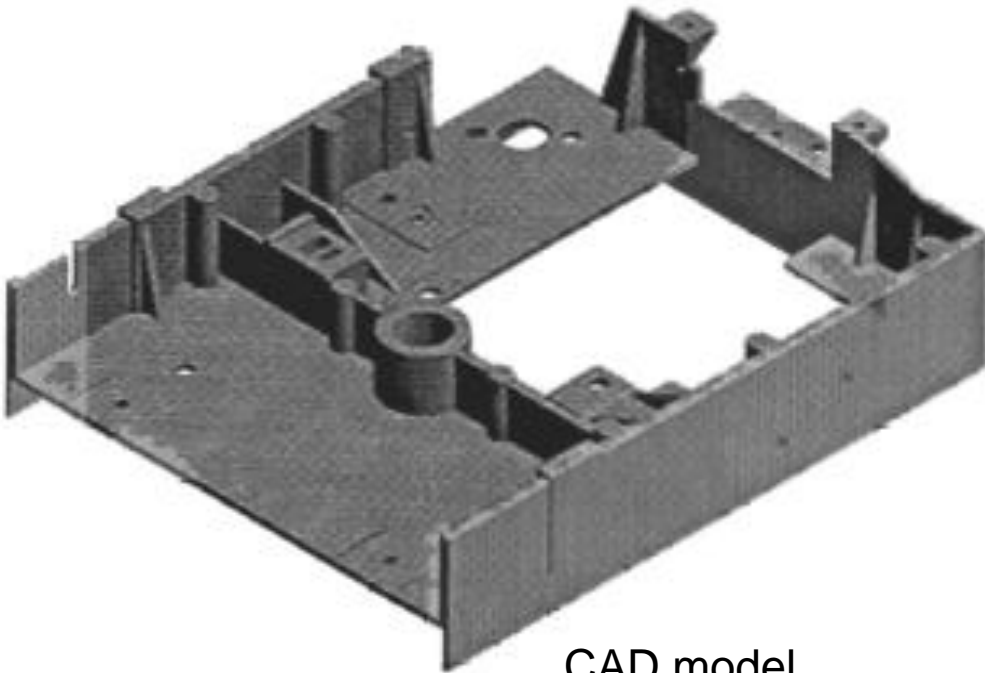
Developed by Dynamic Design Solutions (DDS), Leuven (B)



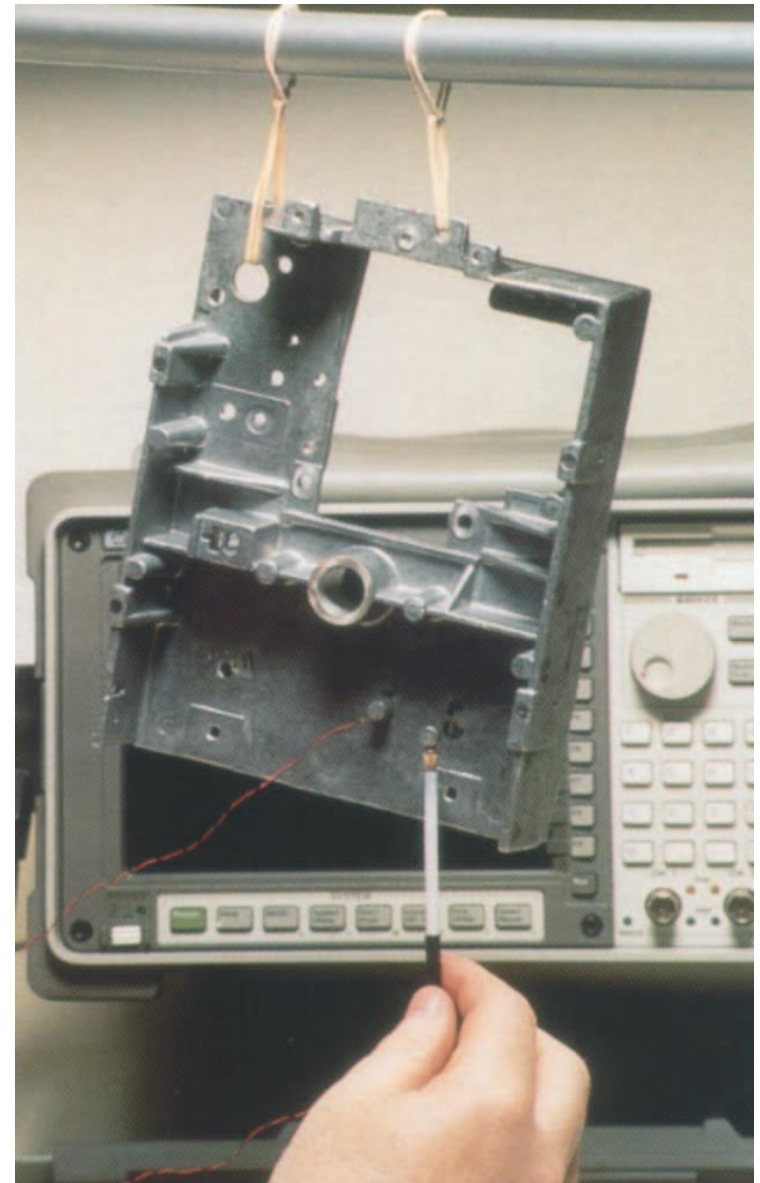
FEMTOOLS (<http://www.femtools.com/>) offers among others:

- Sensor position selection
- FE-EMA correlation (e.g. MAC)
- Finite Element Model Updating

# Example Model Updating: Housing of Hard Disk



CAD model

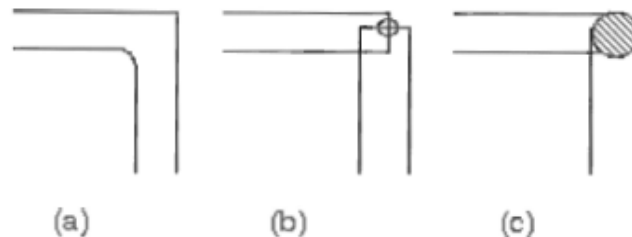


Modal test setup

# Housing of Hard Disk - FE model uncertainties/errors

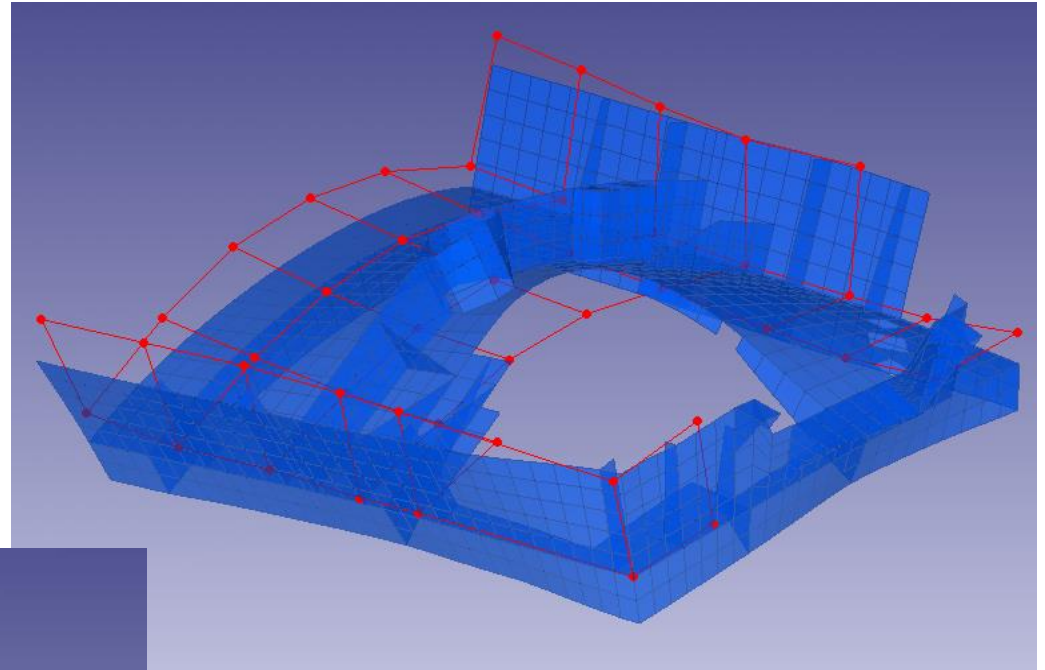
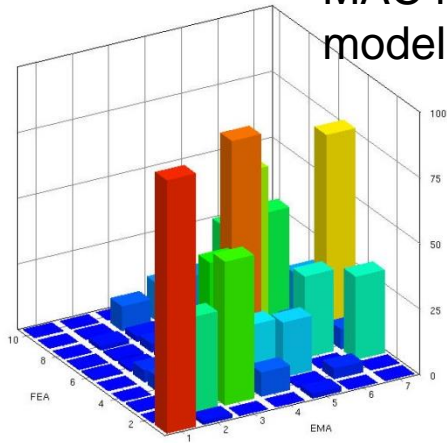
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- Use of plate and beam elements (actual structure is 3D)
- Uncertainty in plate thickness
  - Coarse measurements
  - Variation of thickness
- Errors in modeling of fillets (see figure below)
- Uncertainty about mass density (injection moulding)
- Errors due to geometrical simplifications (small holes not modeled)

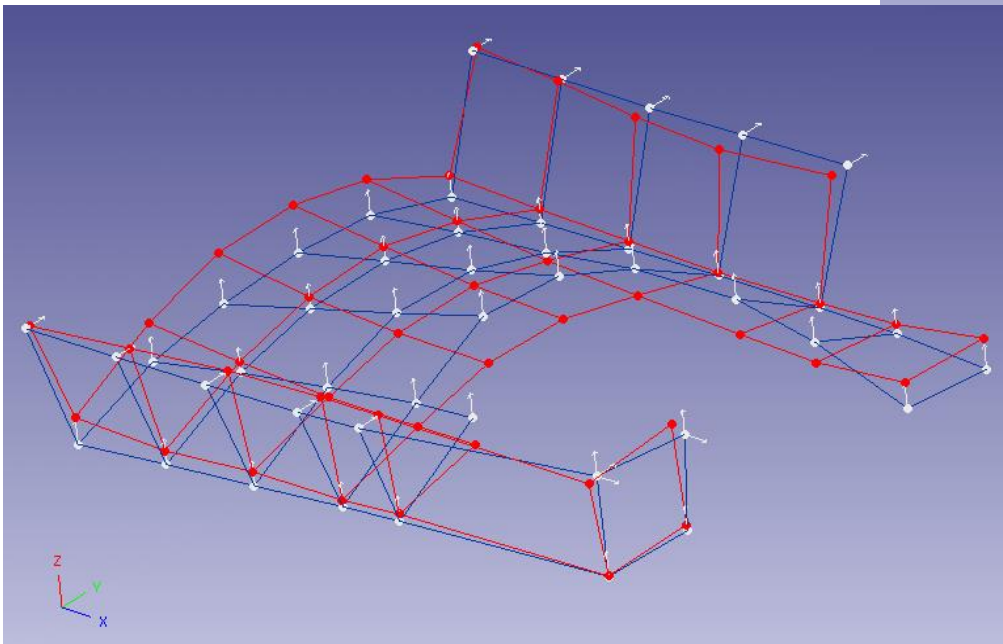


# Housing of Hard Disk – Correlation of theor. and exp. modes

MAC matrix prior to  
model updating



Mode shapes (FEA + EMA)



Mode shapes (FEA + EMA) reduced to  
measured dof's

# Housing of Hard Disk – Correlation prior to model updating

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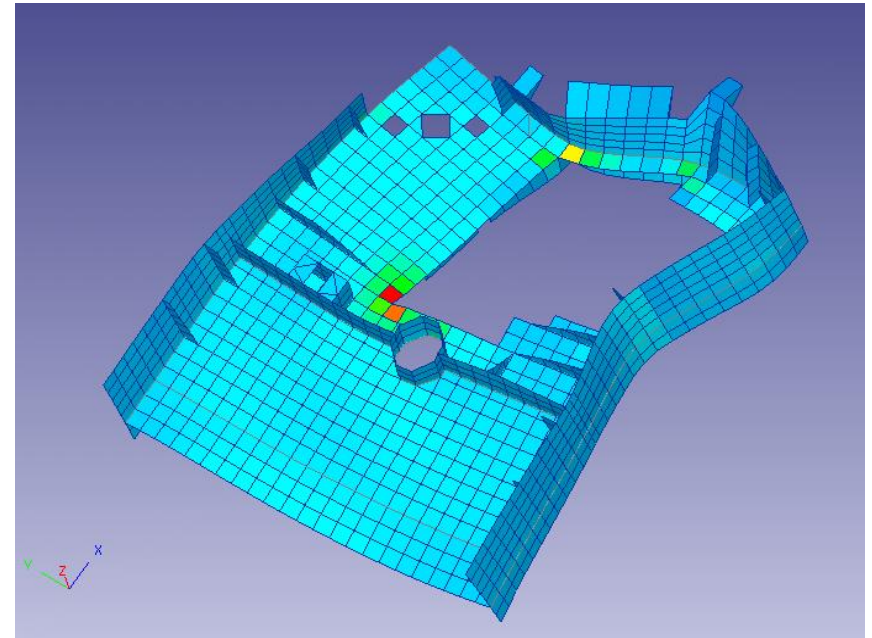
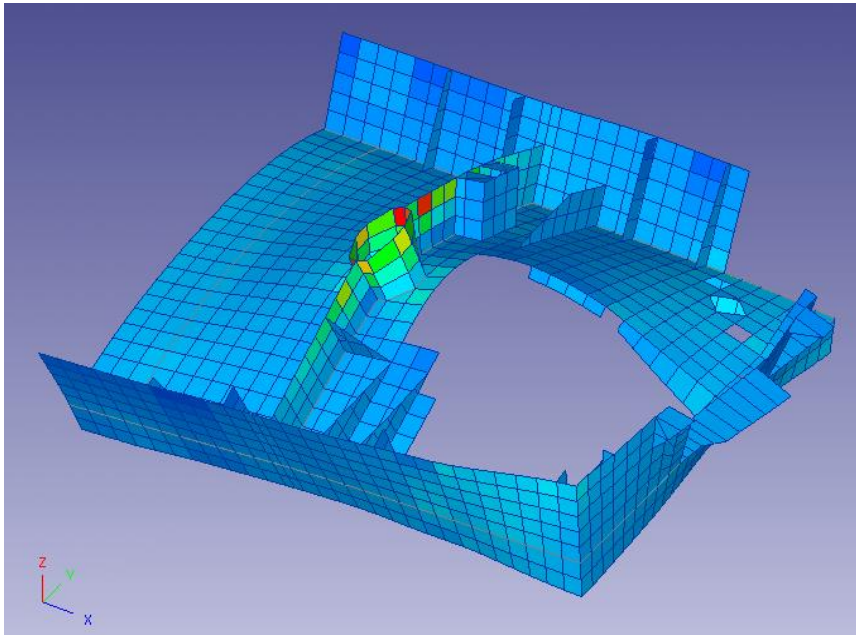
**FEA-EMA correlation of eigenfrequencies and mode shapes**  
**Start values prior to model updating**

#	FEA	Hz	EMA	Hz	Diff.(%)	MAC(%)
1	1	391.13	1	372.93	4.88	96.4
2	2	1284.48	3	1569.81	-18.18	54.7
3	4	1961.58	4	1772.64	10.66	89.3
4	5	2209.86	7	2224.44	-0.66	77.5
5	6	2414.55	5	1978.92	22.01	65.6
6	7	2532.22	6	2119.41	19.48	42.7



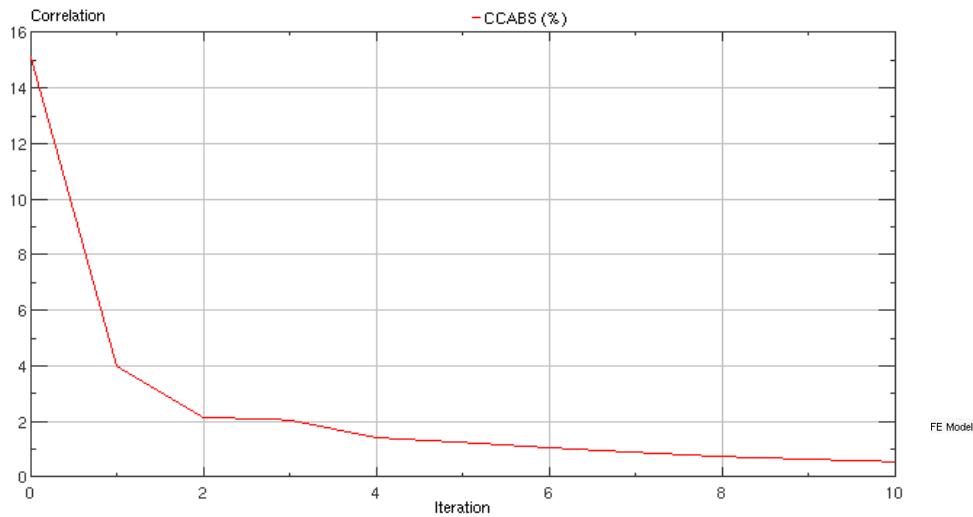
# Housing of Hard Disk – Sensitivity analysis

- Local plate thickness as updating parameters
- Eigenfrequencies as target quantities



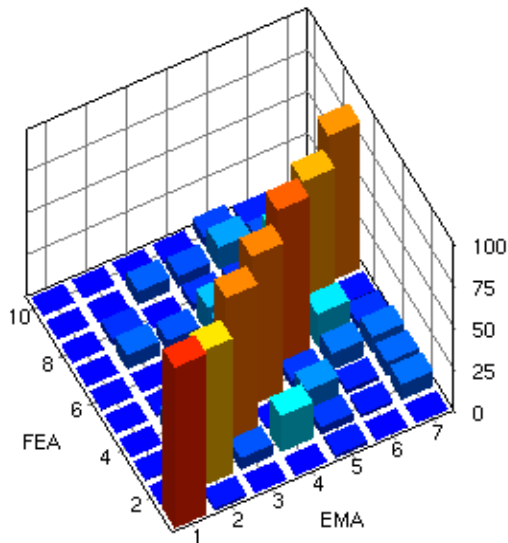
Colors indicate sensitivities of eigenfrequencies w.r.t. local plate thickness

# Housing of Hard Disk – Model updating

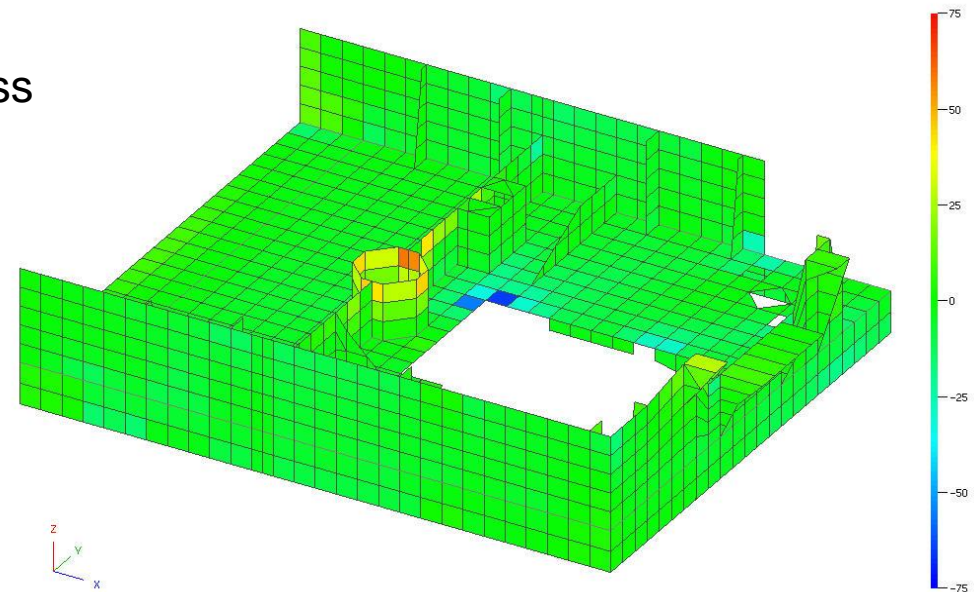


Convergence in model updating iteration process

**Model updating by using measured eigenfrequencies**



MAC after model updating



Required model modifications

# Housing of Hard Disk – Correlation after model updating

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**FEA-EMA correlation of eigenfrequencies and mode shapes after model updating**

#	FEA	Hz	EMA	Hz	Diff.(%)	MAC(%)
1	1	376.26	1	372.93	0.89	96.1
2	2	1379.30	2	1373.77	0.40	80.1
3	3	1566.80	3	1569.81	-0.19	89.8
4	4	1772.40	4	1772.64	-0.01	83.8
5	5	1984.82	5	1978.92	0.30	90.9
6	6	2146.99	6	2119.41	1.30	82.9
7	7	2195.90	7	2224.44	-1.28	87.7