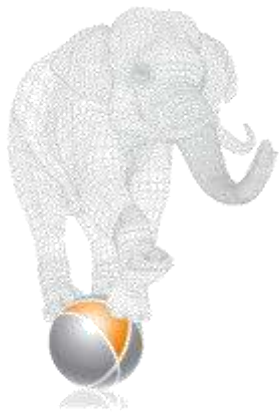


The ANSYS logo is displayed in a black rectangular box. The word "ANSYS" is written in a bold, sans-serif font. The letters "AN" are white, and "SYS" is yellow.

# Statistical Analysis of Mistuned Compressor Wheels by Model Order Reduction

Johannes Einzinger



# Outline



**What is Mistuning?**



**Simulation & FSI-Coupling**



**Mistuning - Modelling**

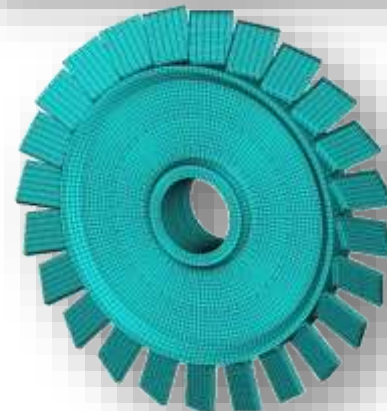


**Mistuning - Application**

# What is Mistuning?

- Why does Blade x break?
  - Local Production Error?
  - Local Material Error?
  - Local Overload?
  - Local Erosion?
  - ...
- Non cyclic System due to
  - Allowed Production Tolerances
  - Small Erosion
  - ...
- → Mistuned System

## Rotor Damage at Blade x

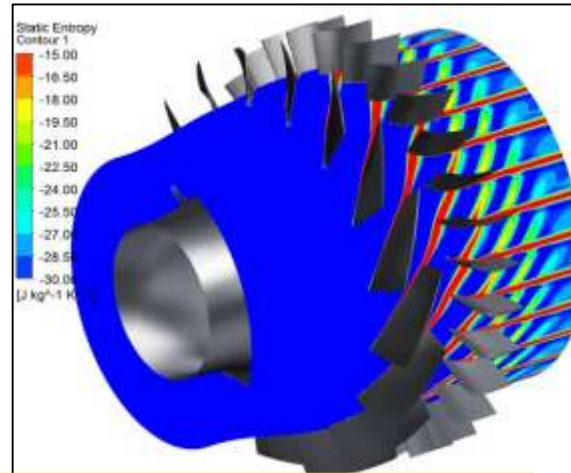
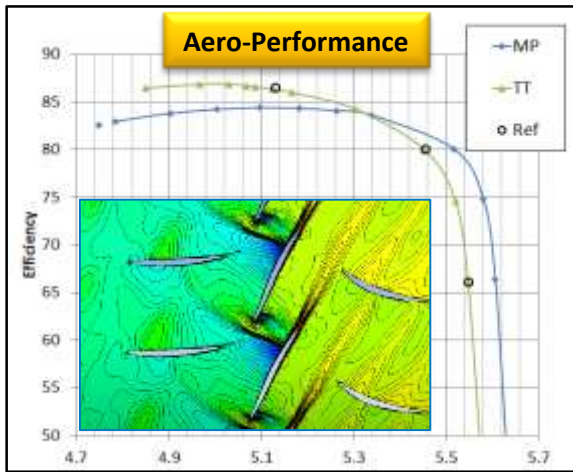


**CAD-Model  
(=Tuned System)**

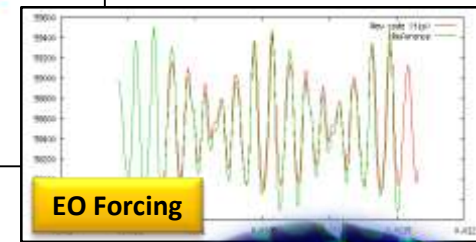


**Real-Model  
(=Mistuned)**

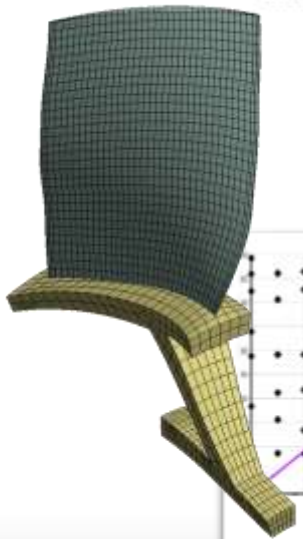
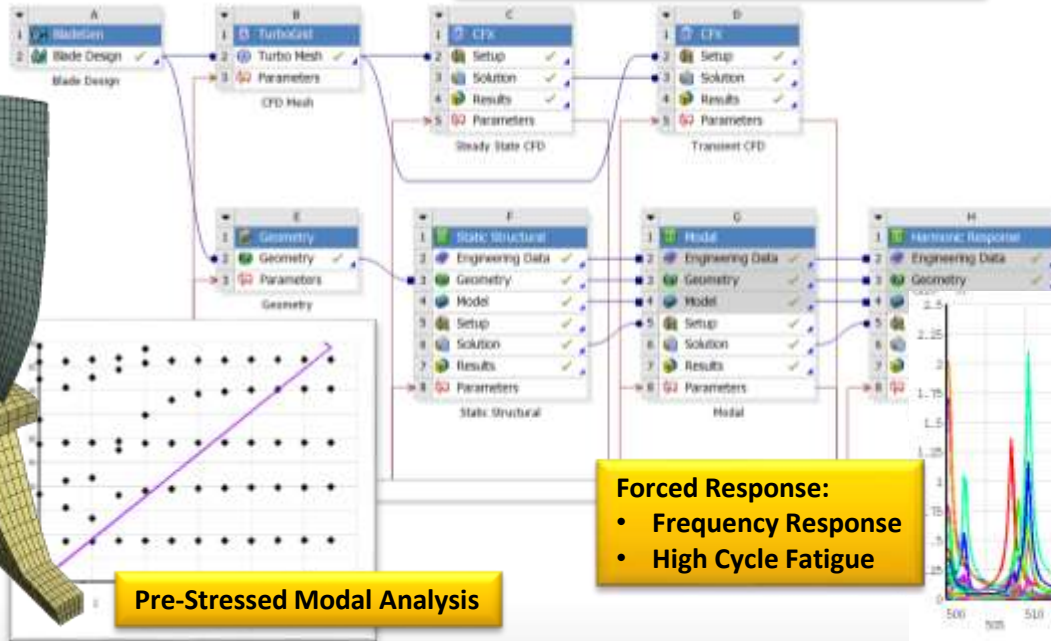
# Simulation Model – Overview



**Transient Blade Row Interaction/Flutter**



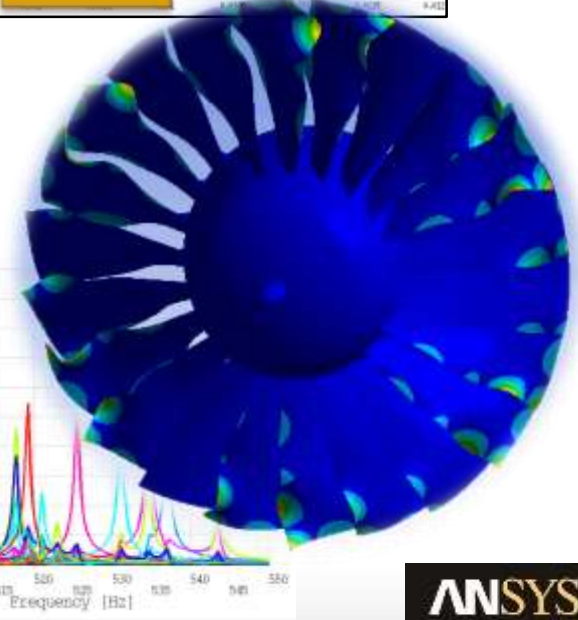
**EO Forcing**



**Pre-Stressed Modal Analysis**

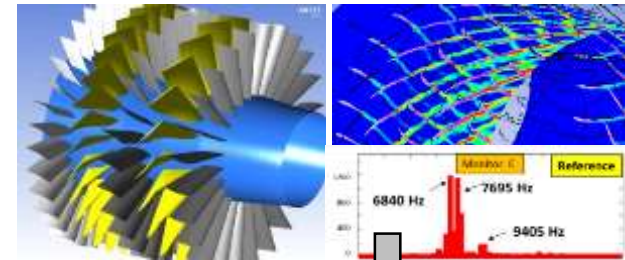
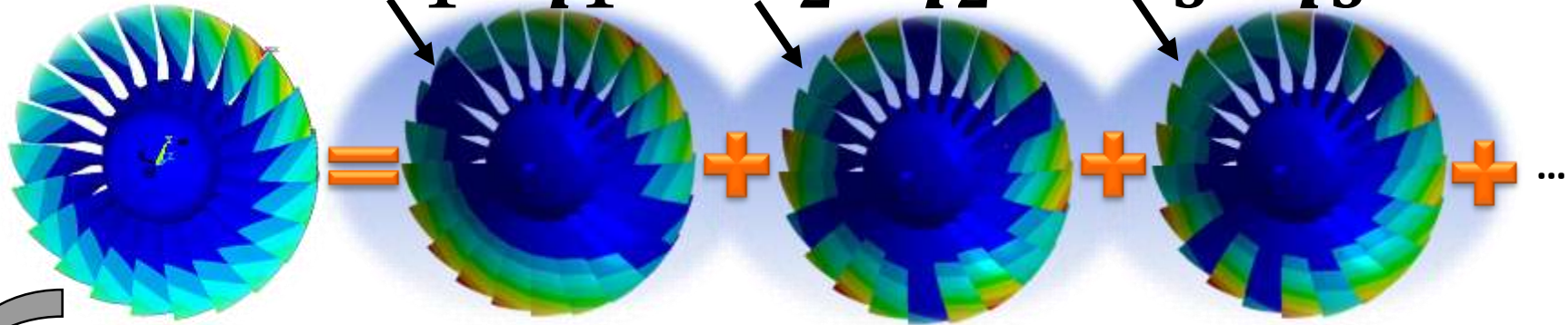
**Forced Response:**

- Frequency Response
- High Cycle Fatigue



# Mechanical - Reduced Order Model

$$\mathbf{u} = \Phi_1 \cdot q_1 + \Phi_2 \cdot q_2 + \Phi_3 \cdot q_3 + \dots$$

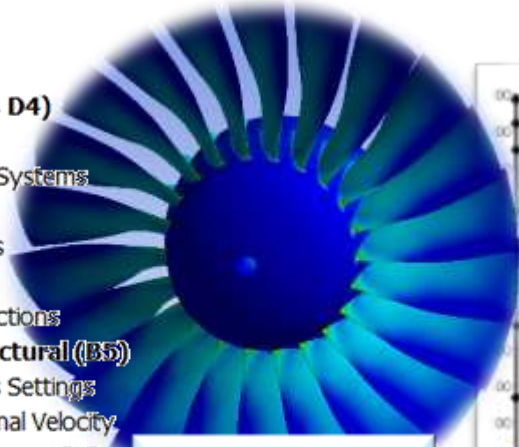


$$\left\{ \underbrace{-\Omega^2 \mathbf{I}}_{\text{Excitation frequency}} + i\Omega \left[ \underbrace{\left( \beta + \frac{1}{\Omega} g \right) \Lambda^s}_{\text{Reduced mass}} + \underbrace{\alpha \mathbf{I}}_{\text{Reduced damping}} \right] + \underbrace{\Lambda^s}_{\text{Reduced stiffness}} \right\} \underbrace{\mathbf{a} e^{i\omega t}}_{\text{CFD-Flutter Simulation} \rightarrow \text{Aero stiffness}} = \underbrace{\left\{ \sum_n F_{n,EO}^T \tilde{\Phi}_h^T \mathbf{F} e^{i\phi(n-1)} \right\}}_{\text{Projection to modal space and expansion from cyclic domain}} e^{i\omega t}$$

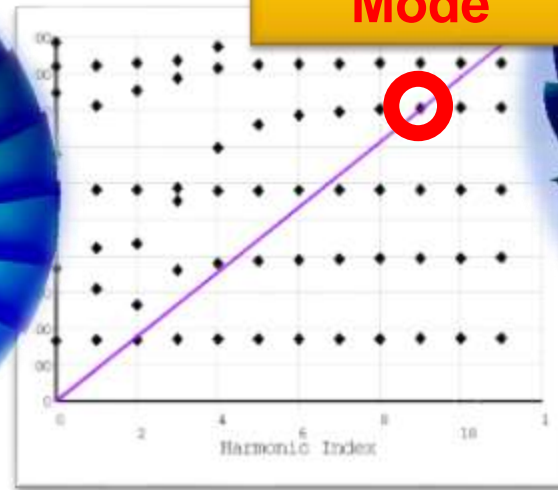
Single sector engine order forcing

# Results – Tuned Rotor

- Project
  - Model (B4, C4, D4)
    - Geometry
    - Coordinate Systems
    - Symmetry
    - Connections
    - Mesh
    - Named Selections
    - Static Structural (B5)
      - Analysis Settings
      - Rotational Velocity
      - DisplacementPHI
      - DisplacementRAD
      - R160\_STATIC\_MAP
    - Solution (B6)
      - Solution Information
      - Total Deformation
      - Equivalent Stress
      - Equivalent Stress 2
  - Modal (C5)
    - Pre-Stress (Static Structural)
    - Analysis Settings
    - Solution (C6)
  - Harmonic Response (D5)
    - Modal (Modal)
    - Analysis Settings
    - R160\_HARM\_Analysis Settings Load
    - R160\_HARM\_Mistuning
  - Solution (D6)
    - Solution Information
    - R160\_HARM\_PostProcessing



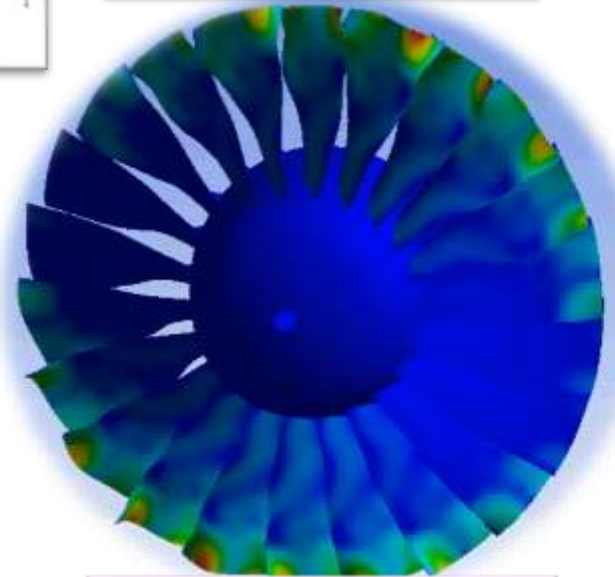
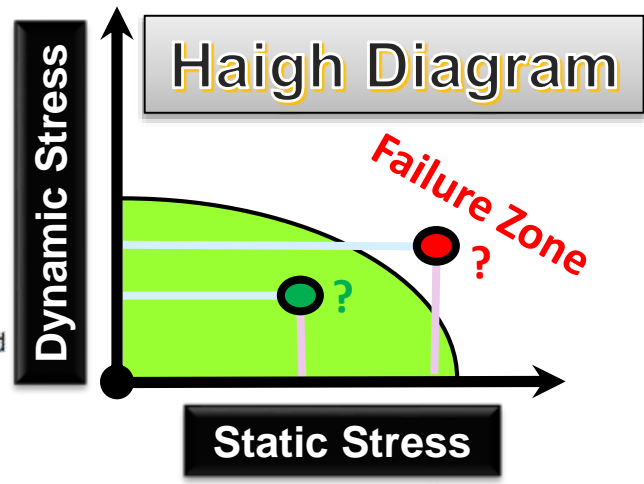
**Static Stress**



**Resonance Mode**



**Mode Shape**



**Dynamic Stress**



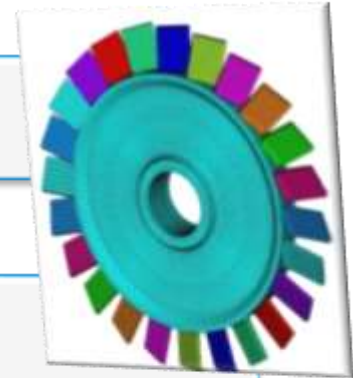
# Mistuning - Modelling

*1 DOF Minimal Modell*

*2 Sector Modell with Point Mass*

**CMS Modell (on 1 Sector!)**

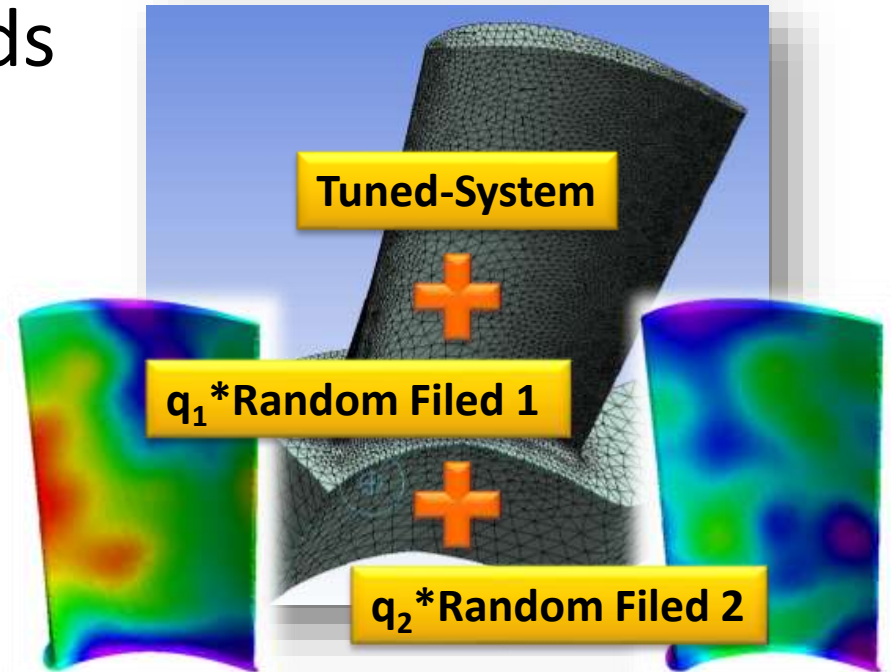
*Full Model with Random Fields*



# Full Model - Random Fields



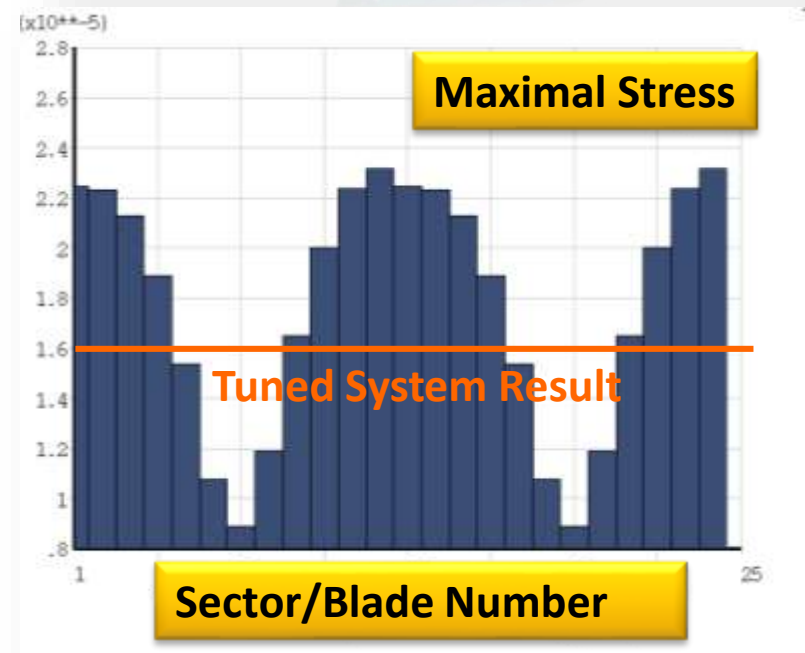
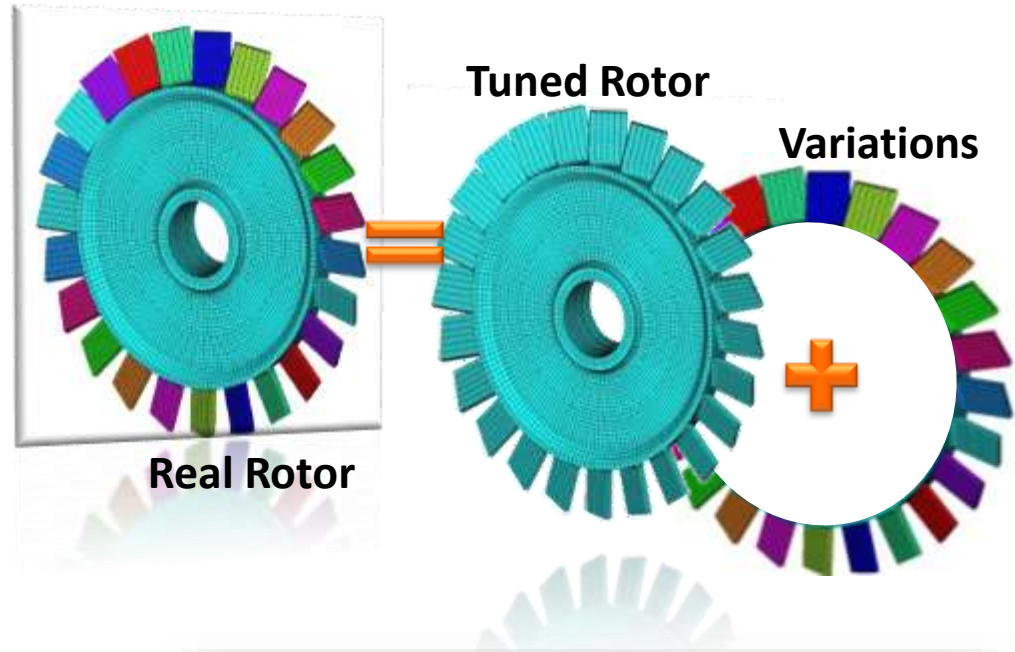
- Measured / Assumed Variation  $\rightarrow$  Random Fields (=Eigenvectors of Correlation Matrix)
- Random Field is morphed on tuned System Mesh
- Pro:
  - Model for large Mistuning
  - efficient handling of statistics
- Con:
  - computational effort



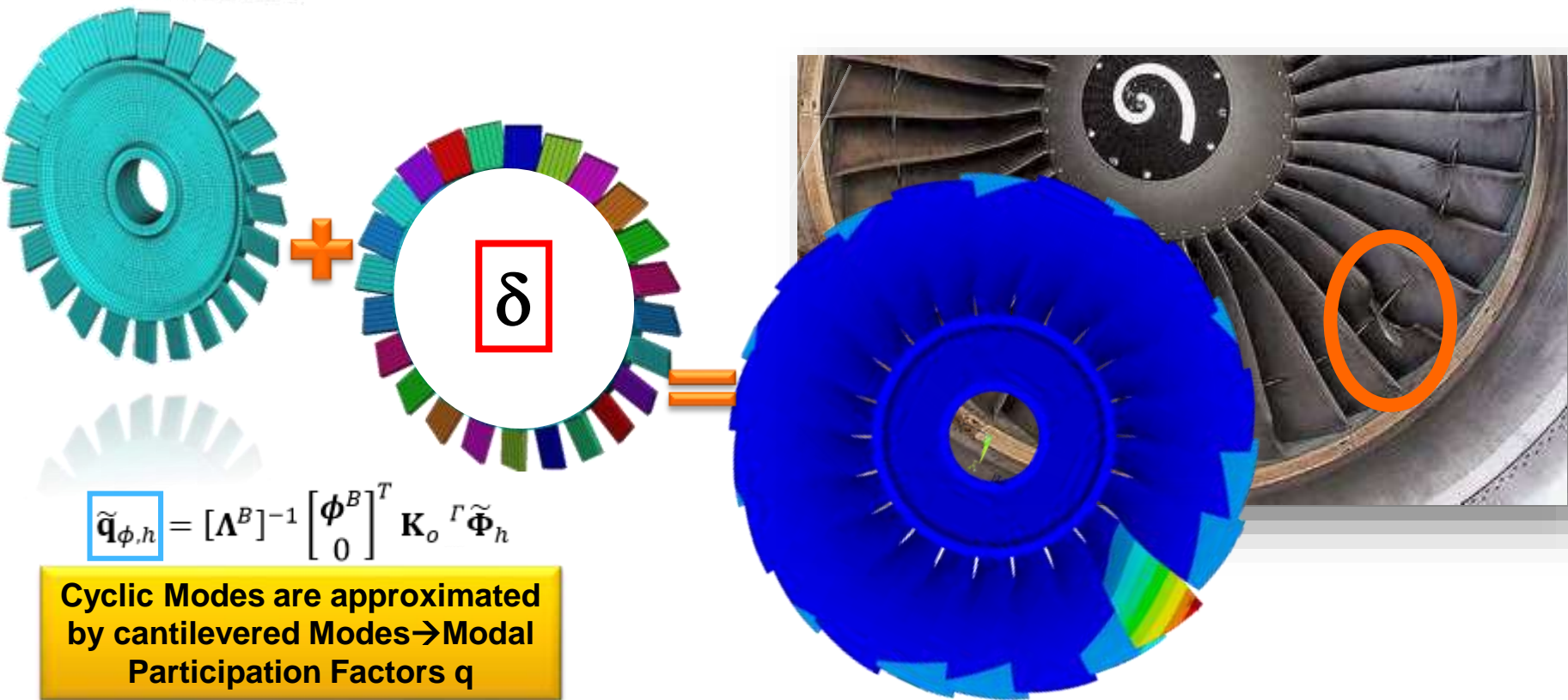


# CMS Model

- Cyclic Model + non-cyclic Mistuning
  - Proportional Mistuning
  - Intended Mistuning
  - ...
- Different Stress Levels on Sectors/Blades
- Pro:
  - efficient: single sector mesh required
- Con:
  - small Mistuning



# Mistuning - Reduced Order Model



$$\tilde{\mathbf{q}}_{\phi,h} = [\Lambda^B]^{-1} \begin{bmatrix} \phi^B \\ 0 \end{bmatrix}^T \mathbf{K}_o \mathbf{r} \tilde{\Phi}_h$$

**Cyclic Modes are approximated by cantilevered Modes  $\rightarrow$  Modal Participation Factors  $q$**

$$\left\{ -\Omega^2 \mathbf{I} + i\Omega \left[ \left( \beta + \frac{1}{\Omega} g \right) \Lambda^s + \alpha \mathbf{I} \right] + \Lambda^s + \sum_n \mathbf{q}_n^T \delta_n \mathbf{K}_c \mathbf{q}_n + \mathbf{K}_a \right\} \mathbf{a} e^{i\omega t} = \left\{ \sum_n F_{n,EO}^T \tilde{\Phi}_h^T \mathbf{F} e^{i\phi(n-1)} \right\} e^{i\omega t}$$

Excitation frequency    Reduced mass    Reduced damping    Reduced stiffness    Mistuning terms    Aero stiffness    Projection to modal space and expansion from cyclic domain    Single sector engine order forcing



# optiSLang Strategy

## General Procedure:

- Design Optimization
  - Gradient Based
  - Generic
  - Evolutionary
  - ...

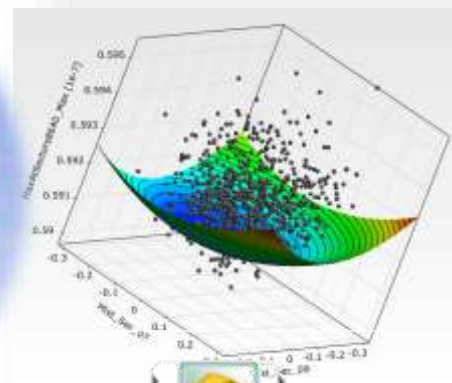
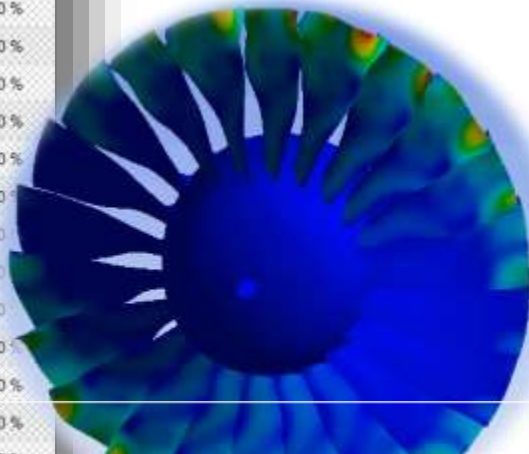


- Design of Experiments
  - Data Sampling
  - Detecting Correlations
  - **Detecting Important Parameters**
  - **Parameter Space Reduction**
  - Response Surface: MoP
  - **Reliable Measure of Prediction Quality: CoP**
- Design Optimization
  - ...

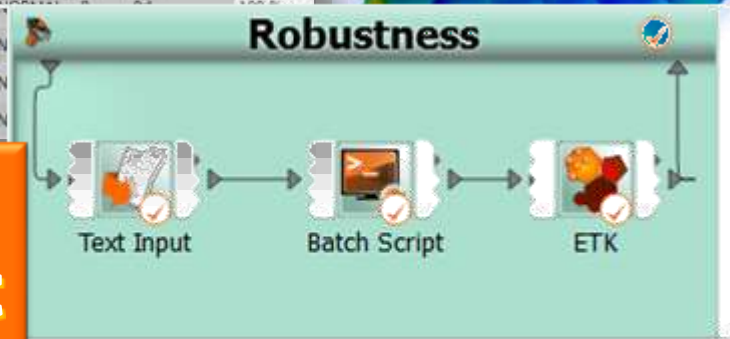
# optiSLang Set-Up

- Reference=Mean Value=0, i.e. Tuned
- 22 Blades → 22 Random Variables
- Standard Deviation=0.1% 1.0% 10% 100%
- DoE with 400 and 800 dps
- Objective: Variation of Meximal Stress

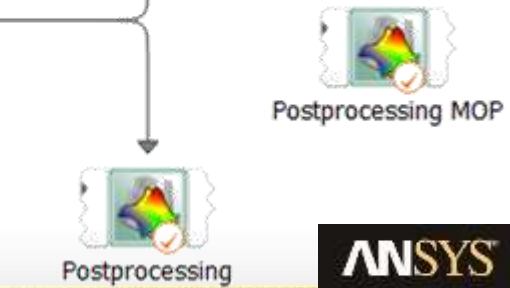
	Name	Parameter type	Reference value	Constant	PDF	Type	Mean	Std. Dev
1	Mist_Sec_01	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
2	Mist_Sec_02	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
3	Mist_Sec_03	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
4	Mist_Sec_04	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
5	Mist_Sec_05	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
6	Mist_Sec_06	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
7	Mist_Sec_07	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
8	Mist_Sec_08	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
9	Mist_Sec_09	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
10	Mist_Sec_10	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
11	Mist_Sec_11	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
12	Mist_Sec_12	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
13	Mist_Sec_13	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
14	Mist_Sec_14	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
15	Mist_Sec_15	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
16	Mist_Sec_16	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
17	Mist_Sec_17	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
18	Mist_Sec_18	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
19	Mist_Sec_19	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
20	Mist_Sec_20	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
21	Mist_Sec_21	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1
22	Mist_Sec_22	Stochastic	0	<input type="checkbox"/>		NORMAL	0	0.1



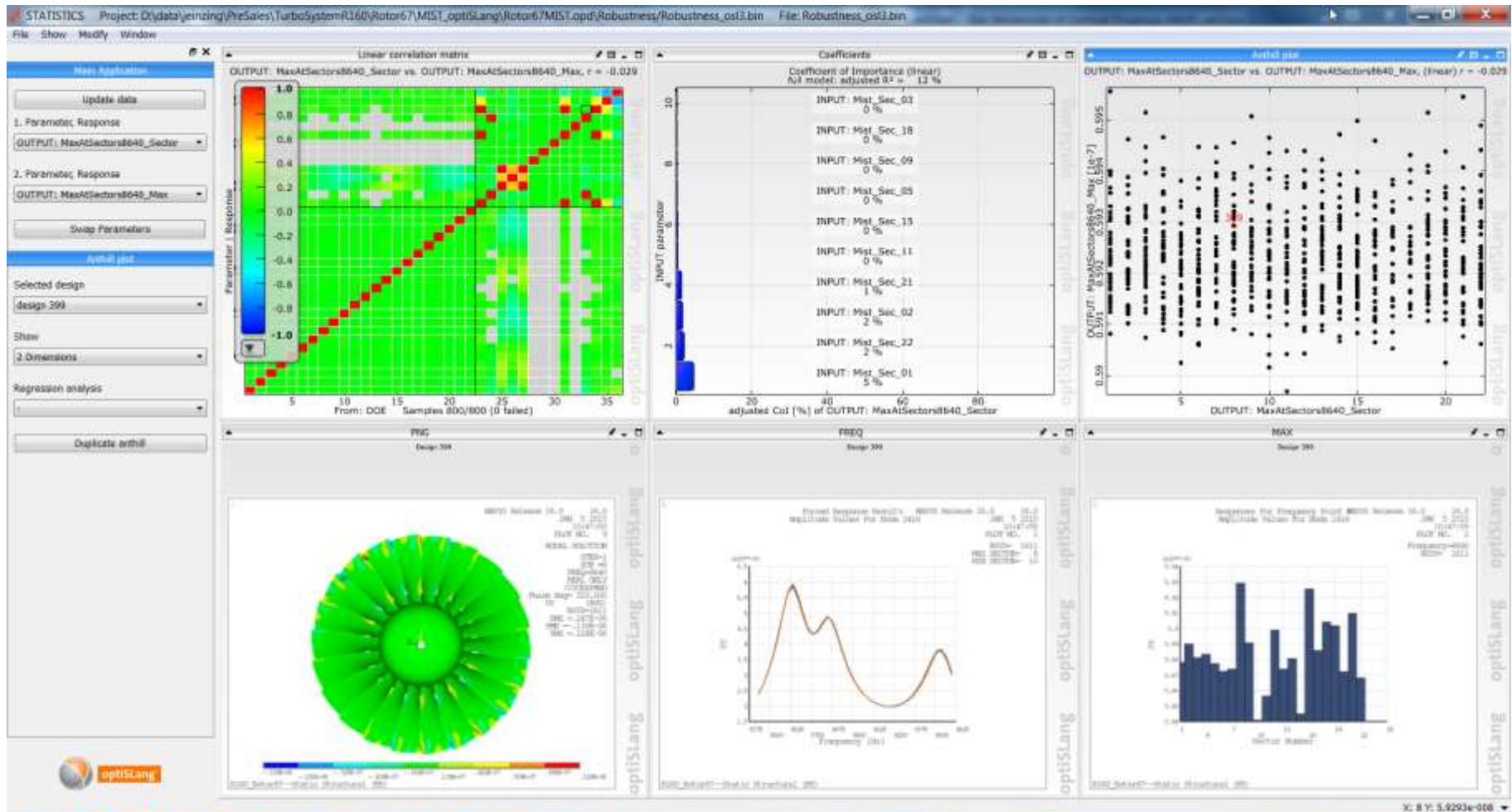
**Which Blades  
have dominant  
impact???**



Metamodel of Optimal Prognosis (MOP)



# optiSLang DoE Monitoring



# Meta Modell of Optimal Prognosis

Increasing Coefficient of Prognosis



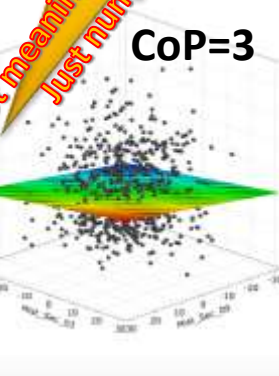
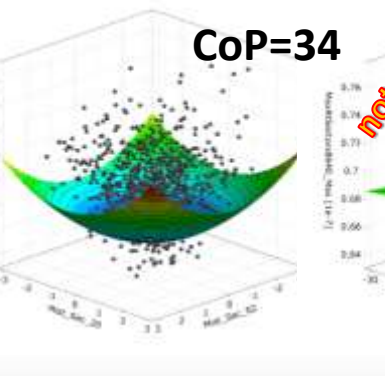
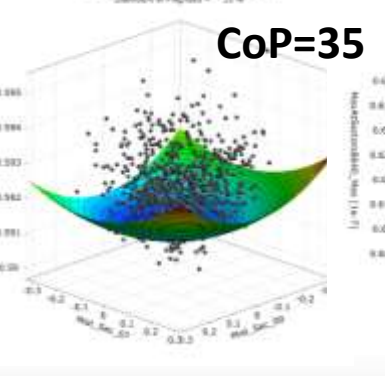
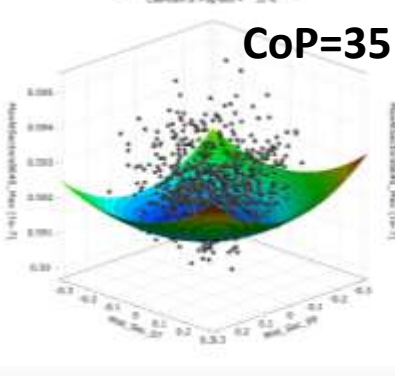
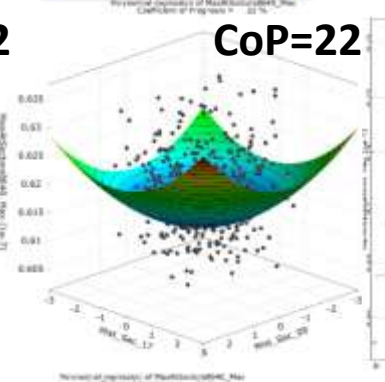
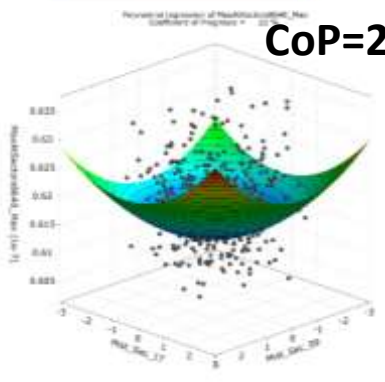
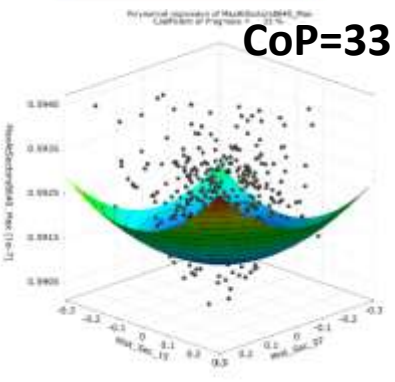
**Bad CoP!! WHY??**

Std. Dev.  $\delta$  =0.1%

Std. Dev.  $\delta$  =1.0%

Std. Dev.  $\delta$  =10%

Std. Dev.  $\delta$  =100%



*not meaningful, wrt to Modell  
Just numerical check!*

400 Design Points



800 Design Points



# Important Parameters

Increasing Coefficient of Prognosis

Important Parameters not detected properly!! WHY??

Std. Dev.  $\delta$  = 0.1%

Std. Dev.  $\delta$  = 1.0%

Std. Dev.  $\delta$  = 10%

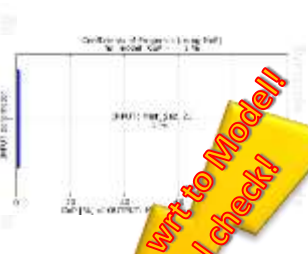
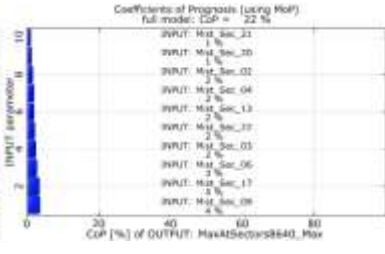
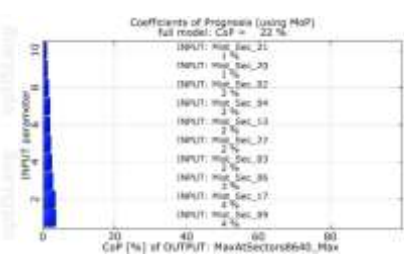
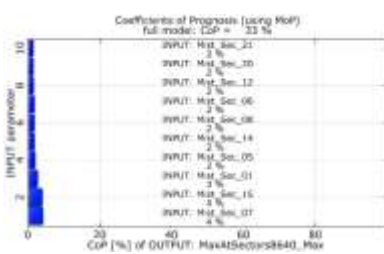
Std. Dev.  $\delta$  = 100%

CoP=33

CoP=22

CoP=22

CoP=1

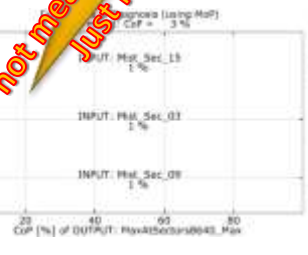
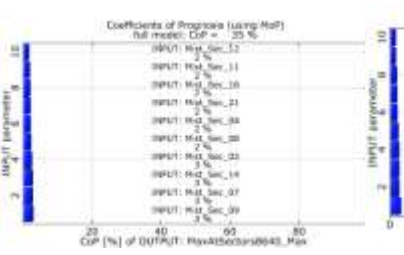
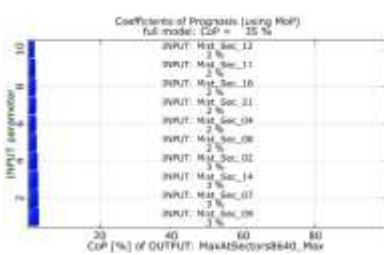


CoP=35

CoP=35

CoP=34

CoP=3



not meaningful, wrt to Model!  
Just numerical check!

400 Design Points

800 Design Points

# Best-Practice Guide Lines

- Reason for small Coefficient of Prognosis:
  - Number Design Points
  - Numerical Error
  - Model Error
  - Multiple Mechanism
  - Bad Parameterization (TWC vs. discrete)
  - Post-Processing Output (SOS vs. single Value or Signal)
- Number of Design Points for Meta-Model depends on:
  - Number of important parameters, here: all parameter!!
  - Nonlinearity of Response Surface

Objective for Meta-Model:  
Maximal Coefficient of  
Prognosis



# Summary and Outlook

- Summary
  - Mistuning has significant Influence to Bladed-Rotors (and other cyclic structures)
  - Efficient Mistuning Models are available
  
- Outlook
  - Further Investigation with more Design Points
  - TWC Parameterization
  - Post-Processing by SOS
  - Large Mistuning: Application of Random Fields

Use Simulation and Statistical Analysis...



...to avoid:

