

# Robust Design and Optimization of Thick Film Accelerometers in COMSOL Multiphysics with OptiY

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**Abstract:** Optimization of the design parameters with regard to the tolerances is an important purpose of the design process. We used a COMSOL Multiphysics structural mechanics model with the OptiY tool for finding an optimized design of a thick film accelerometer conforming to our sensitivity and cross sensitivity requirements, inclusive of resonance frequency. We calculated the probability of a system failure due to relevant tolerances of the design parameters, previously found out in a sensitivity analysis. In the final step, a robust design of the ceramic thick film accelerometer was calculated. As a result we obtained a design optimized with concern to a set of functional requirements and design tolerances.

**Keywords:** Tolerance Analysis, Robust Design, Probabilistic Design, Optimization

## 1. Introduction

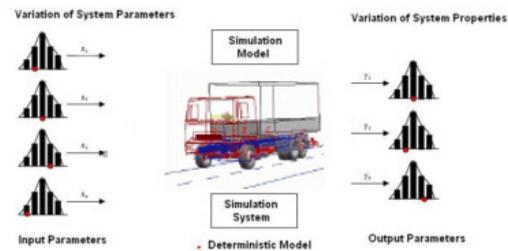
In virtual design and development of technical products, all design parameters must be specified so that requirements of manufacturing, the customer, and services are met. A serious problem is the variability or uncertainty of design parameters, called tolerance, caused by manufacturing inaccuracy, process uncertainty, environmental influences, abrasion, human factors etc. Classical simulation cannot predict all variations of the system behavior, due to tolerances. A tolerance analysis calculates the probability distributions of functional variables from any type of the probability distributions of the design parameters. This enables the reliability of the system to be deduced. Generally, the ideal design found by way of a nominal optimization is not insensitive to tolerances of the optimized design parameters. In order to find a robust design, i. e. a design the functional behavior of which is only little affected by tolerances, an optimization for robustness has to be performed.

These methods are provided by the analysis and optimization tool OptiY [1]. We have used these methods for optimizing the design of a new

accelerometer made of low temperature cofired ceramics (LTCC).

## 2. Tolerance Analysis for Robust Design

Any design parameter can be modeled as a nominal value and a probabilistic distribution in a tolerance range. Most physical variables and design parameters may thus be viewed as random variables have to be controlled for reliable products [2][3]. Classical deterministic simulations deal only with the mean or nominal values of the design parameters, whereas a tolerance analysis or a probabilistic design study takes into account their probability distributions too.



**Figure 1.** Principle of a tolerance analysis.

This is shown in figure 1. The probabilistic distributions of the system properties are deduced from the distributions of the system parameters via a deterministic system model. This makes it possible to design the system for needs of reliability in conformity to the specifications, and hence to maximize safety, quality, and to minimize rejections and costs.

### 2.1 Numerical Basics

State of the art for all software systems available on the market is the Monte-Carlo-simulation [6]. In this method, for every input parameter a sample size is generated. With each of the samples, a deterministic simulation is carried out to get output variables. Finally, a statistical evaluation of these calculations provides the desired probabilistic distributions of the output

parameters. It is harmful that the Monte-Carlo-method is computationally intensive if a representative sample size should be calculated.

As an example, figure 2 shows different kinds of Monte-Carlo-Simulations with four random parameters. The standard deviation of the output probability distribution converges again for a sample size of approximately 1000. However, the sample size required for acceptable results increases exponentially with the number of random variables. In practice, the computing power for Monte-Carlo-simulations is often insufficient.

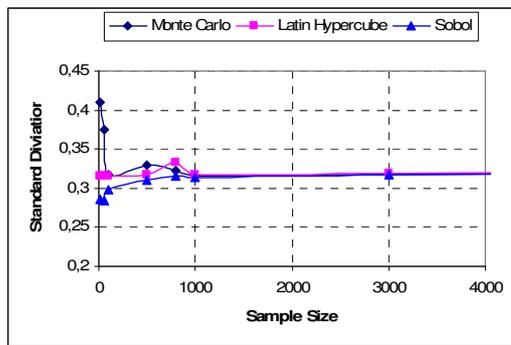


Figure 2. Monte-Carlo-Simulation [1]

A way out is the use of analytical methods, which are faster compared to Monte-Carlo-Simulation. One of those is the Second-Order-Simulation based on the second order Taylor-Series:

$$f = f_0 + \sum_{j=1}^n \frac{\partial f}{\partial x_j} (x_j - x_{j0}) + \frac{1}{2} \sum_{j=1}^n \frac{\partial^2 f}{\partial x_j^2} (x_j - x_{j0})^2$$

It deals with an analytical calculation of the probabilistic distribution of the output variables, i.e. their center moments (mean, variance, kurtosis and skewness) are deduced from the center moments of the input variables. Based on these center moments the probability distributions of the output variables are approximated. For calculating the Taylor-Series-coefficients, the number of calculations is  $2n^2+1$ , where  $n$  is the number of random input variables. For four random variables, only 33 model runs are needed, compared to about 1000 calculations of a Monte-Carlo-Simulation.

## 2.2 Sensitivity Analysis

With a sensitivity analysis, the system complexity can be reduced and the cause-and-effect

chain can be explained. In particular it can be found:

- The contribution of each design parameter to the function variability,
- Insignificant parameters for eliminating them from the final model,
- Interaction between the parameters.

The partial derivatives averaged over the tolerance interval are sometimes regarded as local sensitivities. Due to that they are calculated only at the upper and the lower boundary of the tolerance interval their significance to the influence of a model variable is pretty small. Generally, the influence of a design parameter is not constant over the tolerance interval. Therefore, a global variance-based sensitivity method with Sobol's index has to be considered. The main and the total effect are calculated. The latter includes the interactions between the tolerances of the input variables too, calculated by a pairwise combination in OptiY.

## 2.3 Reliability Analysis

Often the variability of the design parameters causes an inoperable system. The constraint boundary violations of the output variables due to tolerances are investigated in a reliability analysis (Figure 3). The reliability requirement is met, if all of the functional properties are inside the acceptable ranges even if the design parameters scatter. The ratio of inoperable solutions to all of the scattering solutions is called failure probability. For a design found by a nominal optimization a failure probability about 50% has to be expected if the optimum is located on a boundary. Such a design has to be changed in such a manner that a lower failure probability is achieved, at best it will be about zero. This is performed by a robustness analysis.

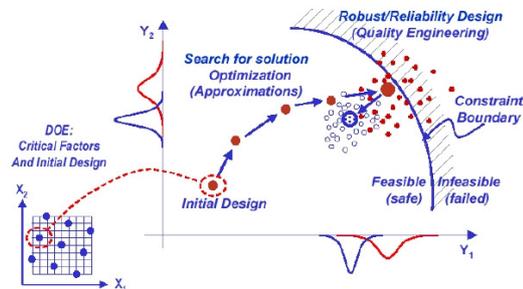


Figure 3. Reliability Analysis [6]

## 2.4 Robustness Evaluation

To find a so called robust design solution with a low failure probability which is effected by tolerances only little, this is the aim of a robustness evaluation (Figure 4).

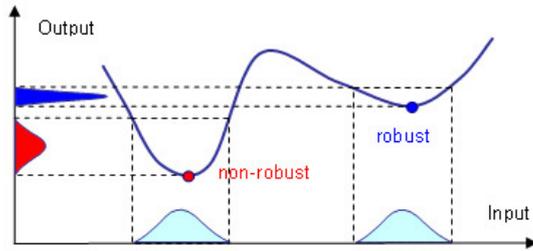


Figure 4. Robustness Evaluation

For this purpose the influences of the tolerance of each design variable to each functional variable has to be estimated. It is advantageous if only the main effects, found in the sensitivity analysis, have to be considered. That allows to apply the reduced second order analysis for computing the output variances and to reduce the computational effort. The design solution is robust if the output variance is small. It represents a consistent quality of the product for all conditions.

## 3. Robust Design of a Thick Film Accelerometer

Today's accelerometers made in thin-film technology offer a sufficient functionality in a cost-effective way. However, thick-film accelerometers made of Low Temperature Cofired Ceramics (LTCC) are of interest, since they promise a higher temperature range and lower costs in small-series production. The working principle is based on a seismic mass  $M$  disposed on two parallel leaf springs  $S$  which carry piezo-resistors  $P$  connected to form a measuring bridge (Figure 5). An acceleration in the  $z$ -direction to be measured is transformed into a change of the bridge voltage  $U_b$ .

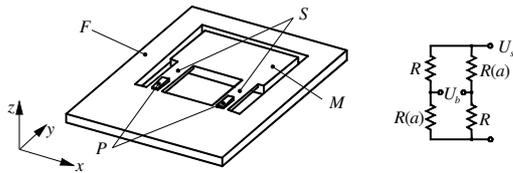


Figure 5. Basic Design of the Thick Film Accelerometer

The LTCC technology and all its specific problems of structuring, printing, stacking, laminating, and firing remains out of consideration in this article. We focus on the best design of the accelerometer with regard to the dimensional accuracy of LTCC.

## 3.1 COMSOL Multiphysics Model

A COMSOL Multiphysics structural mechanics script model contains all those elements, except the electrical connections of the circuit of the bridge (Figure 6). All material properties are constant. In practice the accelerometer is bonded at the lower surface of the frame. In the model we fixed this boundary whereas all other boundaries were unfixed.

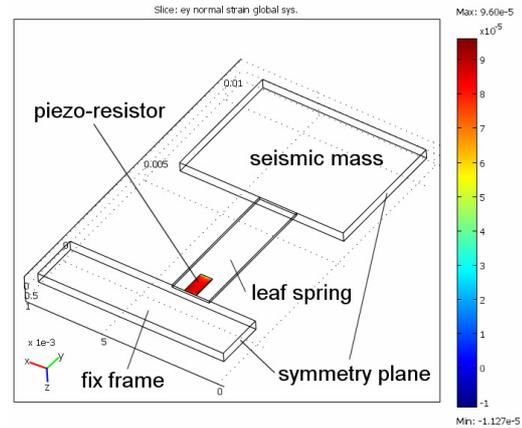


Figure 6. COMSOL Multiphysics Model of the LTCC-Accelerometer

For simplification we consider mirror symmetry of the geometry that includes the tolerances. So only the half of the sensor is modeled. Furthermore it should work far from resonance, therefore the electrical output can be calculated from a static model. The mean normal strain in  $y$ -direction in the piezo-resistors  $e_{ym}$  is a measurement for the change of the resistance of the piezo-resistors  $\Delta R$  multiplied by a constant factor  $k$ . Therefore we obtain for the sensitivity of the accelerometer  $S$  under an acceleration in  $z$ -direction  $a_z$  depending on the bridge voltage  $U_b$  and the feeding voltage  $U_s$ :

$$S = \frac{U_b}{U_s \cdot a_z} = \frac{\Delta R}{2R \cdot a_z} = \frac{e_{ym} \cdot k}{2a_z}$$

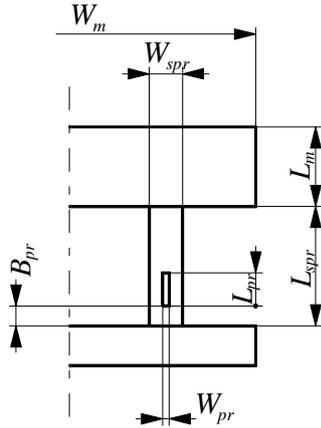
Likewise we get the cross sensitivity  $CS$  for accelerations in the  $x$ - and the  $y$ -directions, where the acceleration in the direction of  $y$  is more critical:

$$CS = \frac{U_b}{U_s \cdot a_y} = \frac{\Delta R}{2R \cdot a_y} = \frac{e_{ym} \cdot k}{2a_y}$$

The model calculates both  $S$  and  $CS$ , and the first resonance frequency  $f_R$  as a further essential property. It has about 40.000 DOF's.

### 3.2 Nominal Optimization

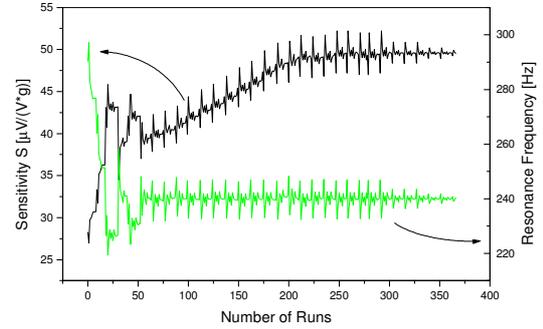
In the first step, we used the COMSOL Multiphysics model with the OptiY tool for finding an optimized design conforming to our sensitivity and cross sensitivity requirements, inclusive of resonance frequency. For these purposes the following design parameters are set as input variables for the optimization process (Figure 7):



**Figure 7.** Input variables for the nominal optimization of the LTCC-Accelerometer

- length  $L_{spr}$  and width  $W_{spr}$  of the leaf springs,
- length  $L_m$  and width  $W_m$  of the mass,
- length  $L_{pr}$  of the piezo-resistor and distance  $B_{pr}$  between it and the frame.

After about 350 runs of the FE-model inside of the Hooke-Jeeves-algorithm the optimization converges. Figure 8 shows the development of  $C$  and  $f_R$  over the number of iterations.

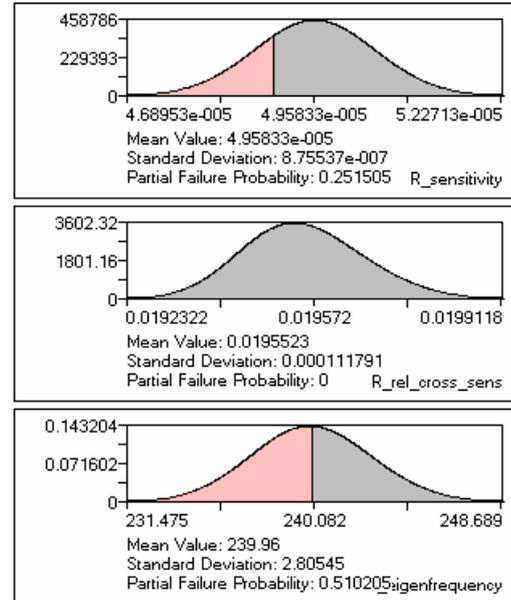


**Figure 8.** COMSOL Multiphysics Model of the LTCC-Accelerometer

As a result we get the set of design parameters that fulfill the restrictions and functional demands at optimum.

### 3.3 System Failure Analysis

As an example the tolerances of the design parameters  $W_{spr}$ ,  $L_{spr}$ , and  $B_{pr}$  have to be defined for the sensitivity analysis. We assume normal distributions, however, any distribution can be considered. The sensitivity analysis calculates the distribution densities of the functional parameters  $C$ ,  $CS$ , and  $f_R$  (Figure 9) by the second order analysis method. Any red area stands for a behavior outside the acceptable range.



**Figure 9.** Distribution Densities of  $S$ ,  $CS$ ,  $f_R$

It is obviously seen that the tolerances of the design parameters have a fatal influence to the sensitivity and the resonance behavior, solely the cross sensibility stays in the tolerable range. The probability is about 50% that the accelerometer works outside of the specified properties. Such a behavior is typical since the optimum design is normally located on the boundary of the permissible design parameter space.

With the pareto charts the importance of the design tolerances included into the calculations for the functional parameters can be seen (Figure 10).

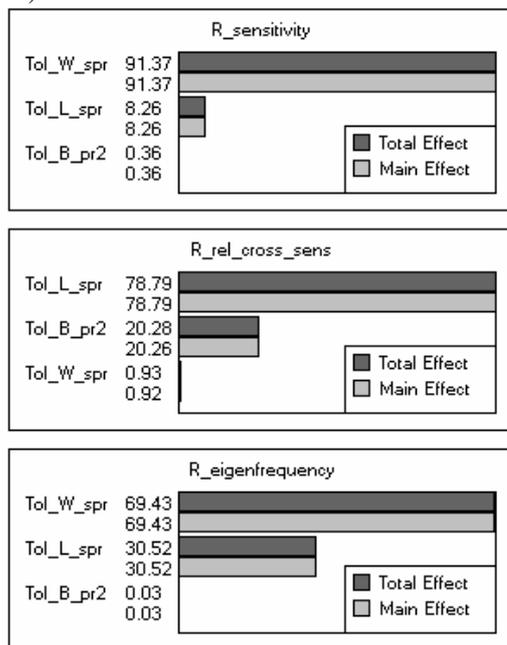


Figure 10. Pareto Charts of  $S$ ,  $CS$ ,  $f_R$

E.g. the spread of the sensitivity is essentially caused by the tolerance of the width of the spring  $W_{spr}$  whereas the influence of the tolerance of the distance  $B_{pr}$  is negligible. Evidently the total effects of influence comes from the main effects alone in all of the calculated interrelations. That allows to neglect the terms resulted from the pairwise combination of the tolerances. Therefore a reduced second order analysis with only linear dependence of the computational effort from the number of the variables is sufficient for the calculation of the robust design in the following subsection.

In a following step, a robust design of the ceramic thick film accelerometer can be calculated.

As a result we will obtain a design optimized with concern to a set of functional requirements and design tolerances.

## 4. Conclusions

OptiY and COMSOL Multiphysics are easy to connect at the script interface. The OptiY tool allows to perform different numerical experiments, e.g. a nominal optimization, tolerance analysis including a sensitivity analysis and a failure probability estimation, and a probability based design optimization as well, e.g. the design for robustness.

If the solution time of the COMSOL multiphysics model is about five minutes, a nominal optimization requires less than one day on a standard PC. The computational effort of the tolerance analysis increases with the squared number of the tolerances if it based on a second order analysis, but linearly if it based on a reduced second order analysis. Depending on the number of tolerances included in the computations this causes solution times between some minutes or one day. The optimization of the tolerances of the design for robustness requires the computational effort of the tolerance analysis for every single step of the optimization process. That makes clear, that the applicability is limited by today's computing power.

As an example the nominal design optimization of a thick film accelerometer was performed. The pre-conditions for a design for robustness were developed by a sensitivity and a system failure analysis. Using OptiY an improvement of the design of the accelerometer could be achieved for which an eminent greater effort would be necessary without it.

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