

# **YIELD ANALYSIS OF MICROSYSTEMS USING ENHANCED WCAS**

**M. Desmulliez  
MISEC, Heriot Watt University, UK**

**Presented on behalf of:**

**S. P. Vudathu, R. Laur  
ITEM, University of Bremen, Bremen, Germany**

# Purpose

- Address the growing needs of the MEMS design community for **faster and accurate methods of parametric yield calculation**
- Define **a quantifiable yield metric** for MEMS devices in terms of their design / statistical parameters
- Provide the designers with **'WCAS' – a parametric yield analysis suite** for performing enhanced worst-case analysis of MEMS devices
- Demonstrate the capabilities of the **enhanced worst-case analysis** using a generic MEMS device

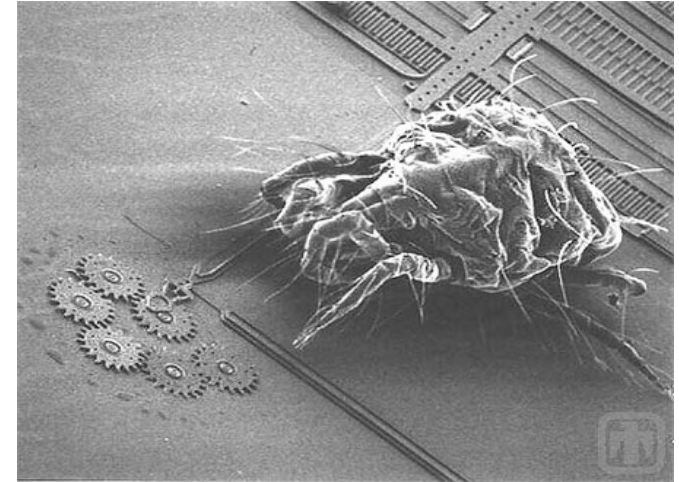
# Outline

- **Introduction: yield loss in microsystems**
- **Worst-case methods and their limitations**
- **Non-linear metamodels and DOE**
- **Enhancement in the accuracy of yield analysis in microsystems**
- **Demonstration of the enhanced worst-case based yield analysis methods**
- **Summary**

# Introduction

## Yield loss in microsystems:

- Decreasing feature sizes cause increasing difficulties at the fabrication site (fab)
- Process variations remain inevitable even with the state-of-the-art process techniques
- A strong mismatch exists between the scaling of device feature sizes and the effects due to process variations



Courtesy: Sandia National Laboratories, SUMMITTM Technologies, [www.mems.sandia.gov](http://www.mems.sandia.gov)



**Statistical yield analysis is a must !**

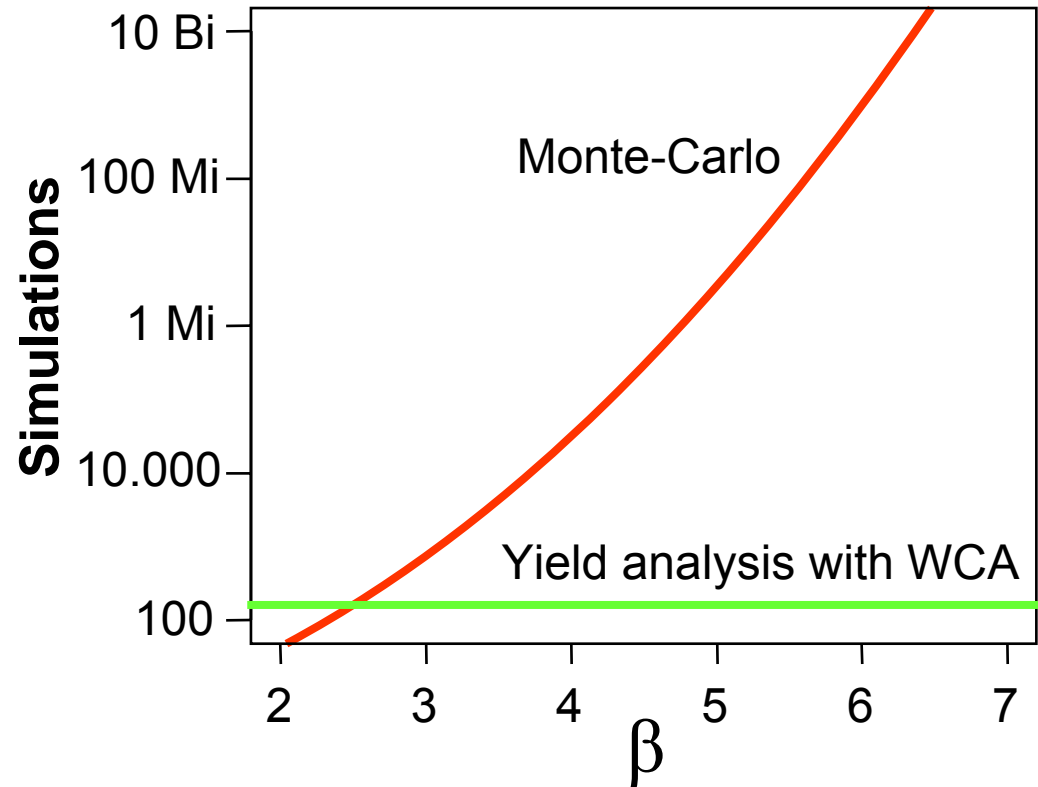


## Methods for statistical yield analysis:

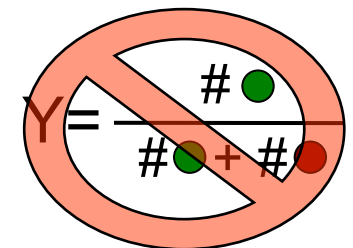
- Monte Carlo Analysis (MCA)
- Statistical Process Control (SPC) – at fab site
- Worst-case methods

# Why worst-case methods?

- One of the Intelligent Statistical Analysis (ISA) methods
- Advantages over conventional techniques:
  - reduced number of simulations (for  $3\sigma$  and above designs)
  - existence of a parametric yield metric, unlike MCA



More efficient than MCA for designs with yields  $> 3\sigma$



# Worst-Case Analysis (WCA)

- **Essential Glossary:**

- Worst-Case point (WCP): A set of parameters that leads to the maximum of the performance objective for the chosen confidence level
- Worst-case distance ( $\beta$ ): Euclidean norm between the nominal point and the WCP that serves as a yield metric

- **Yield Calculation from  $\beta$ :**

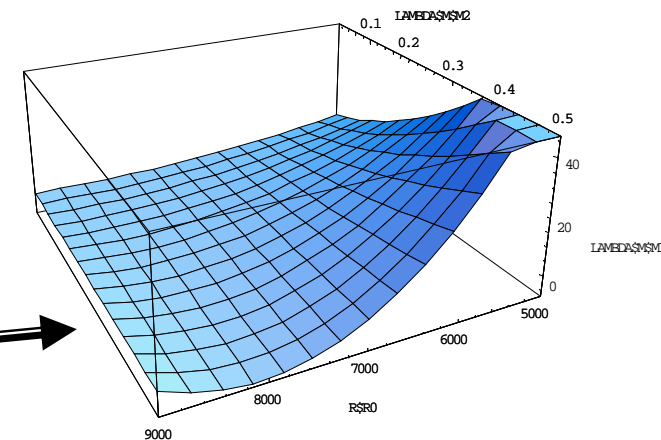
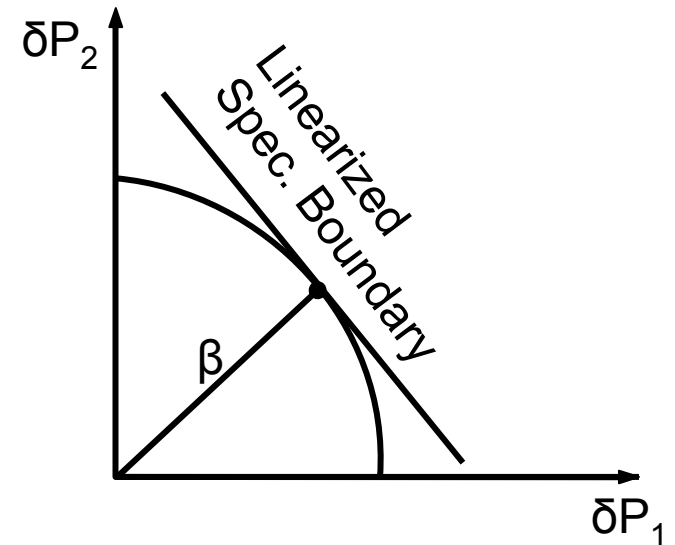
$$Yield = \frac{1}{2} \left( 1 + erf \left( \frac{\beta}{\sqrt{2}} \right) \right) \times 100$$

# Limitations in worst-case methods

- Most microelectronics circuitry (with exceptions) exhibit linear characteristics around the operating point which might assert that the loss of accuracy is insignificant
- WC methods linearly approximate the performance specification (spec) around the operating point

$$f(\bar{d}) = f(\bar{d}_0) + \nabla f(\bar{d}_0)(\bar{d} - \bar{d}_0)$$

**Some of the assumptions are not widely valid in microsystem design and specific microelectronic circuitry**



# Consideration of higher order metamodels

The previous and the state of the art WCA only consider linear and first order models and neglect all other higher order terms.

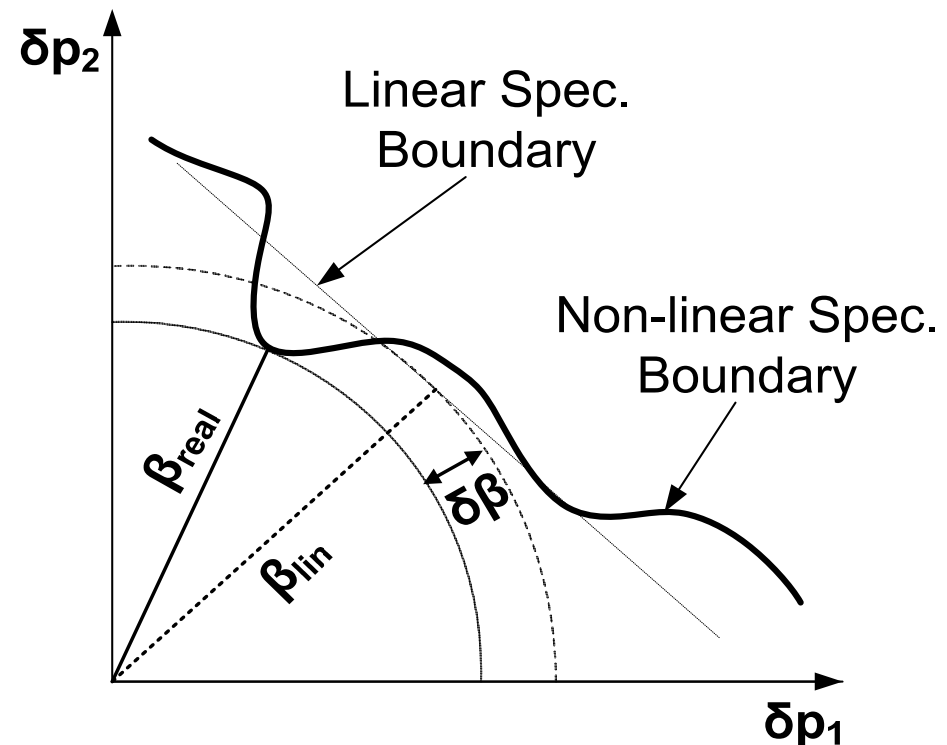
$$\begin{aligned}
 f(\bar{d}) &= f(\bar{d}_0) + \nabla f(\bar{d}_0)(\bar{d} - \bar{d}_0) && \left. \vphantom{f(\bar{d})} \right\} \text{first order terms} \\
 &+ \frac{1}{2}(\bar{d} - \bar{d}_0)' \nabla^2 f(\bar{d}_0)(\bar{d} - \bar{d}_0) + \dots && \left. \vphantom{f(\bar{d})} \right\} \text{second / higher order terms}
 \end{aligned}$$

One could consider second and higher order metamodels. A typical second order model with interaction effects looks like:

$$f(\bar{d}) = \varphi_0 + \sum_{i=1}^k \varphi_i d_i + \sum_{i < j} \sum_{j=2}^k \varphi_{ij} d_i d_j + \sum_{i=1}^k \varphi_{ii} d_i^2$$

# Enhanced WCA

- The state of the art WCA considers linearized spec. boundaries
- When the  $WCP_{real}$  is placed:
  - closer than the  $WCP_{lin}$  it represents a pessimistic approach
  - farther from the  $WCP_{lin}$  it represents an optimistic approach
- Linearization of spec boundary throws the design either into the optimistic or pessimistic approaches of yield calculation



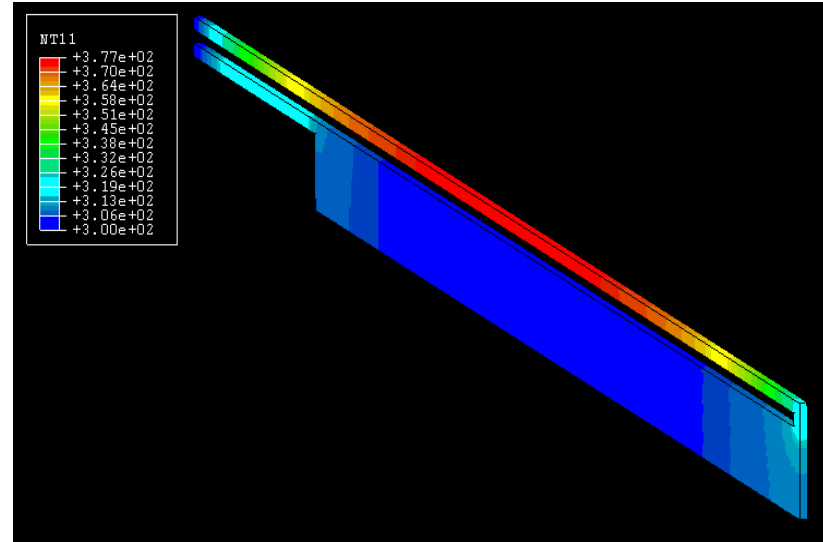
Pessimistic approach of yield calculation using worst-case methods

**Enhanced WCAS avoids this pitfall completely!**

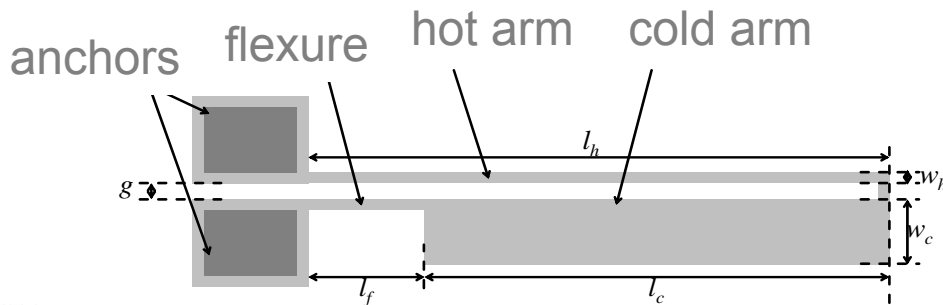
# Demonstration with a U-Shaped Electro Thermal Actuator

## Operation:

- Current circulation in the structure results in unequal thermal expansion caused by ohmic heating of varied dimensions
- Higher current density in the hot beam causes it to expand more than the cold beam, thus producing a lateral motion
- Flexure arm helps to restore the original position in the structure



FEM View



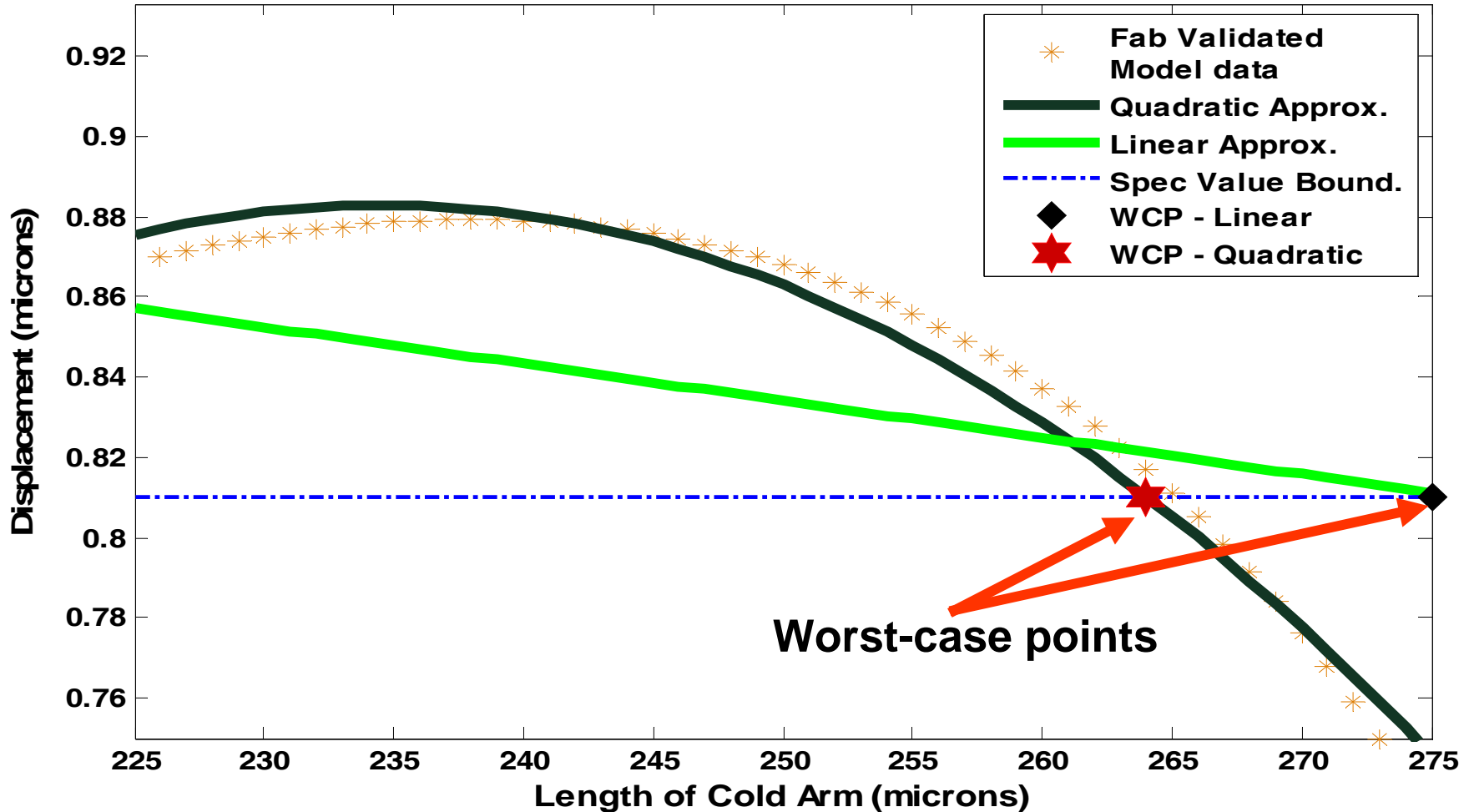
Schematic View



SEM View

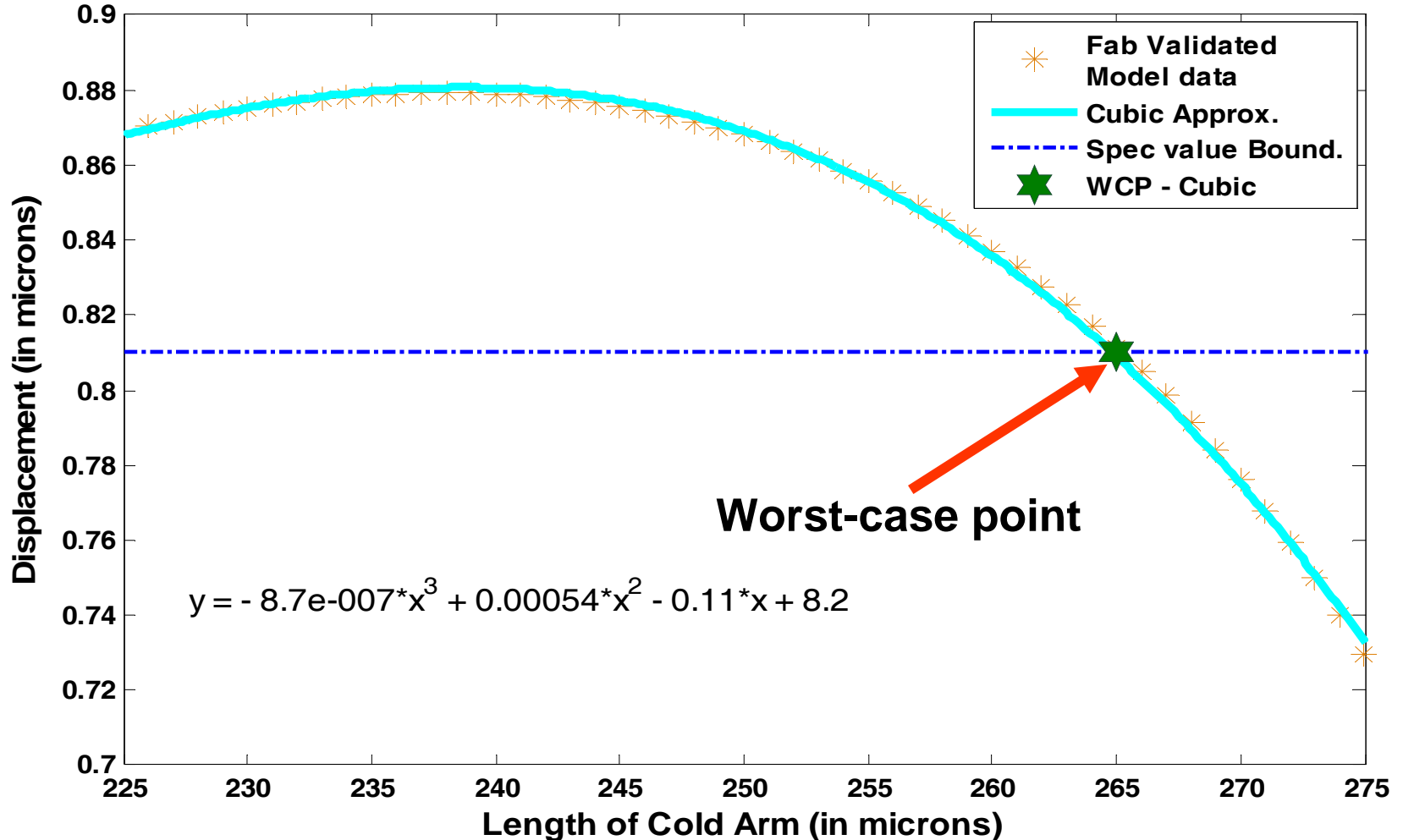
# Demonstration of WCAS (1)

Variation of Actuator Displacement for an applied current of 1.5mA



# Demonstration of WCAS (2)

Variation of Actuator Displacement for an applied current of 1.5mA



# Results obtained using WCAS

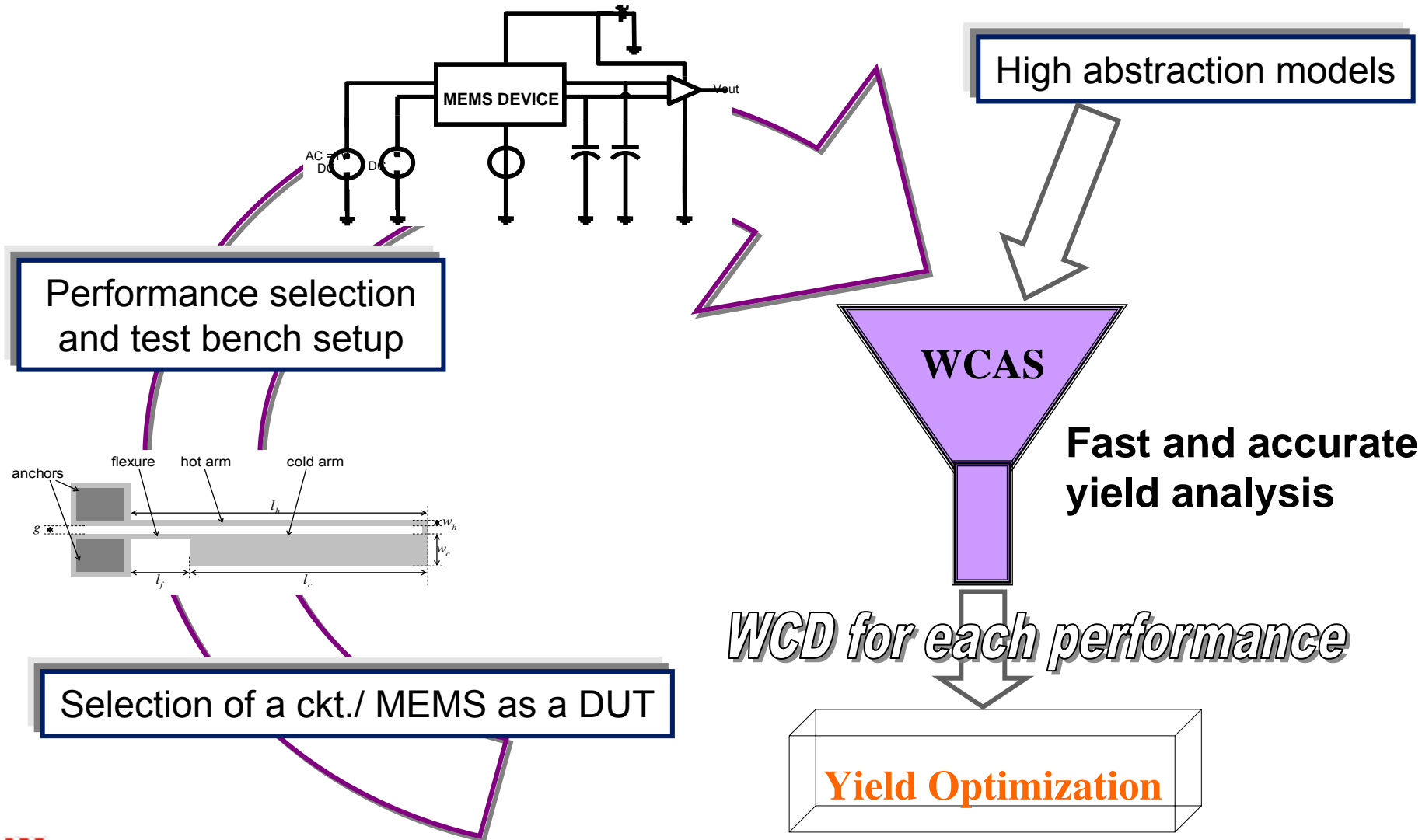
Yield Calculation Technique	Calculated Yield	Relative Error
Monte Carlo Analysis (with 10,000 simulations)	<u>89.85%</u>	<u>Ref. value</u>
Worst-Case Analysis (with linearized spec. boundaries)	98.139%	9.225%
Worst-Case Analysis (with simple non-linear spec. boundaries)	87.833%	2.244%
Worst-Case Analysis (with cubic non-linear spec. boundaries)	89.435%	0.461%

Enhancements achieved in WCA by an error percentage of **8.76%**

**The enhanced version of WCA can now be productively applied for the yield analysis of microsystems!**



# Statistical analysis of microsystems with WCAS



# Summary

- A time efficient and accurate yield analysis is becoming important as it is a key aid in yield optimization
- WCA in the yield analysis of microsystems is vital because of:
  - faster yield calculations
  - the presence of a quantifiable parametric measure for yield
- A critical enhancement in the yield analysis of microsystems and specific microelectronic circuitry has been presented and demonstrated with help of a generic MEMS device
- The enhancement in the accuracy has been achieved by considering non-linear metamodels for spec. boundaries
- An important pre-requisite for yield optimization of MEMS and other microsystems has been accomplished

# A Brief Overview of the Proposal

- As a proposal to the next phase, we intend to use these worst-case methods for achieving Design for Yield and Design for Reliability in MEMS
- These methods also find applications in specific MEMS reliability problems where critical operational parameters are required to analyze the reliability issues of the devices
- We intend document a best practice method for inducing DfY and DfR requirements in the design cycles of MEMS devices