

# Design Optimization for Six-Sigma Quality

by

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## Agenda

- Introduction to DFSS, Robust Design, PIDO
- Example 1: HEV Battery
- Example 2: BIW Door assembly
- Example 3: Turbine - Integration into Product Development
- Workflow
- Recommendations

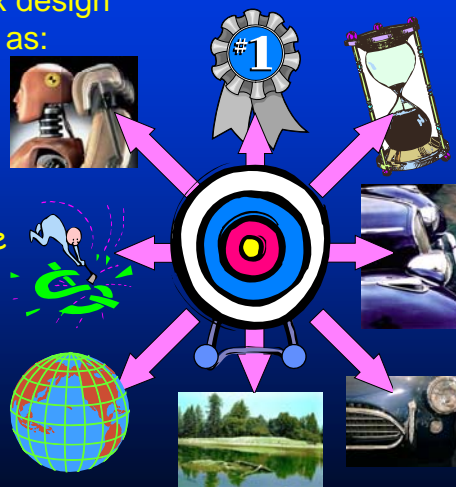
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## Contradicting Design Requirements

The need for innovative tools is apparent now more than ever as more complex design requirements are surfacing such as:

- Cost
- Performance & safety
- Quality
- Time to market & short life cycle
- Environmental impacts
- Aesthetics



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## Statistical Design Performance Simulation?

“ You ‘ve got to be passionate lunatics about the *quality issue* ...”  
Jack Welch

“U.S. autos fight *poor quality* reputation ...”  
Joe Miller / The Detroit News

“ *Product quality requires managerial, technological and statistical concepts throughout all the major functions of the organization ...*”

Josheph M. Juran

Variation (thickness, properties, surface finish, loads, processes etc.) is ... **THE ENEMY**

DOE, Design for Six Sigma (DFSS), Statistical FEA, Behavioral Modeling is ... **THE DEFENCE**

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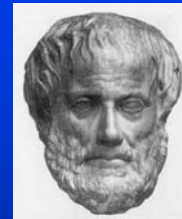
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## Design Optimization -DFSS - PIDO

“*For the goal is not the last, but the best*”  
Aristotle (384-322 BCE)

Design Optimization is the selection of the best alternative within the available means

Design Optimization can be addressed with:  
Knowledge, Tradition and Experience  
Numerical Optimization Methods  
Design Space exploration Methods



DFSS is set of tools and methods for Analyzing, Allocating, and Optimizing Variability

PIDO Process Integration & Design Optimization

Processes Automation ->

Design Exploration ->

Design Optimization ->

Robust Design

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## Quality - Robust Design

- **Variation** exists in all systems, subsystems, components and processes
- **Definition of Robust Design:**  
Deliver customer expectations at profitable cost regardless of:
  - customer usage
  - variation in manufacturing
  - variation in supplier
  - variation in distribution, delivery & installation
  - degradation over product life
- **Goals of Robust Design (shrink and shift)**
  - Shift performance mean to the target value
  - Shrink product's performance variability



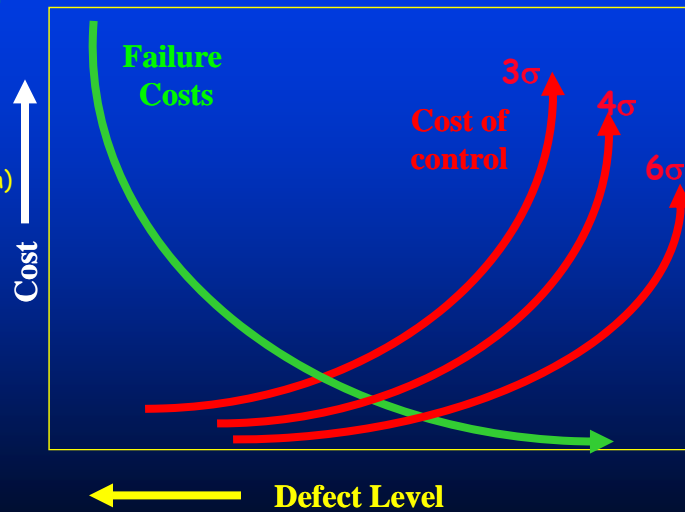
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## Improved Quality and Reduced Total Cost

### Cost of Defect or Failure

- Lost Customers
- Liability ( R&D )
- Recalls (production)
- Rework



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## Noise & Control Parameters

- Noise parameters:  
Factors that are beyond the control of the designer
  - material property variability
  - manufacturing process limitations
  - Environment: temperature & humidity
  - component degradation with time
  - ...
- Control Parameters:  
Factors that the designer can control
  - geometric design variables
  - material selections
  - design configurations
  - manufacturing process settings
  - ...

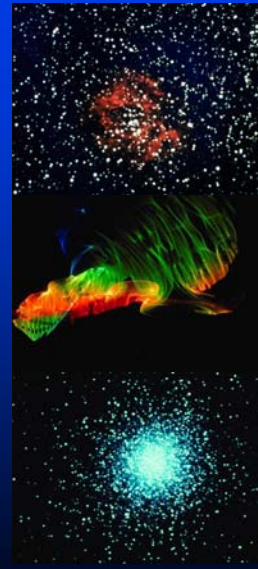


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## Tools for Robust Design

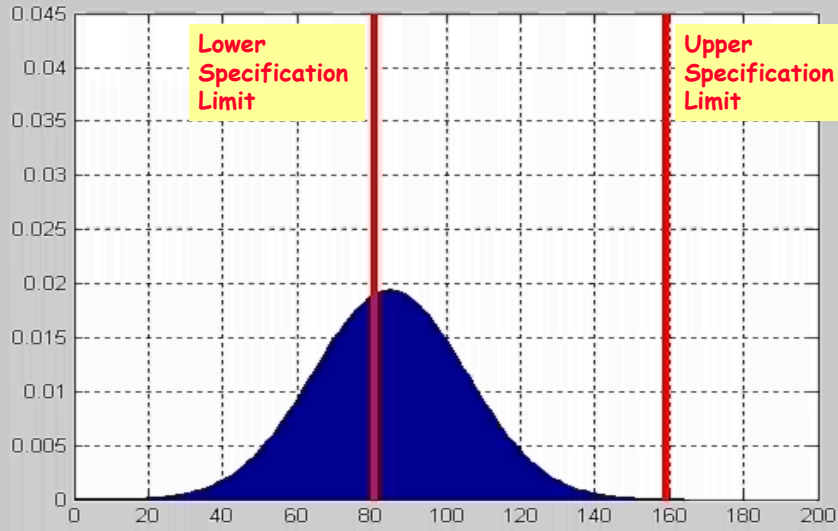
- Design Of Experiments
  - Exploits nonlinearities and interactions between noise & control parameters to reduce product performance variability
  - full factorial, fractional factorial, Monte-Carlo, LHC
- Response Surface Methods
  - Central Composite Design
  - Box-Behnken Design
- 6-sigma design
  - Identifying & qualifying causes of variation
  - Centering performance on specification target
  - Achieving Six Sigma level robustness on the key product performance characteristics with respect to the quantified variation



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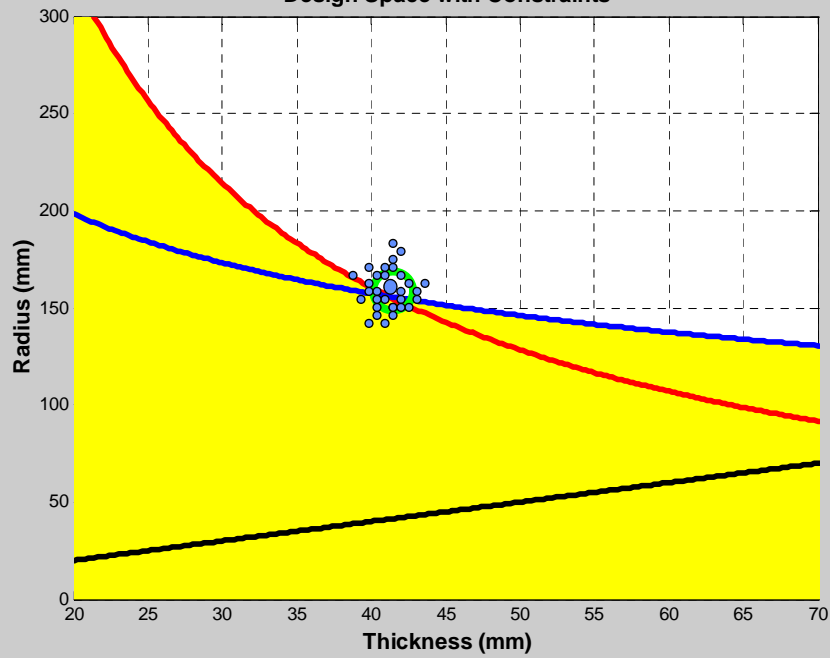
# Shift and Shrink



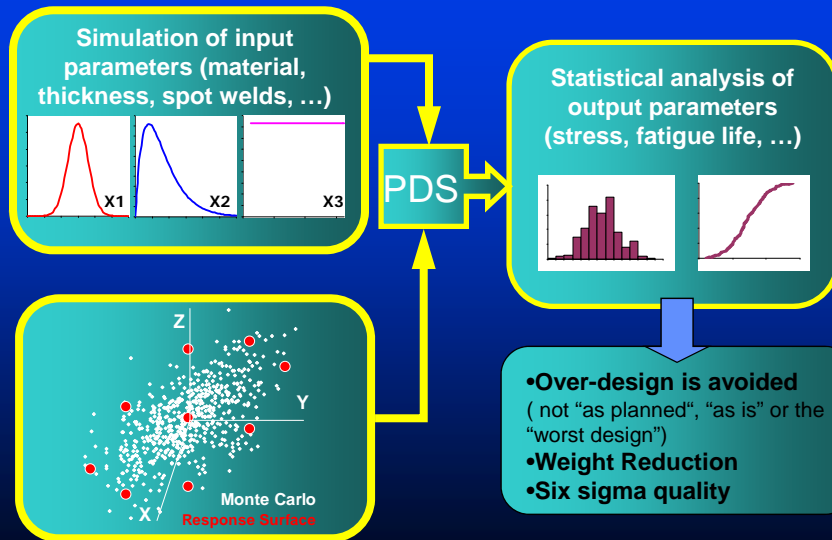
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### Design Space with Constraints



# Statistical Design Performance Simulation



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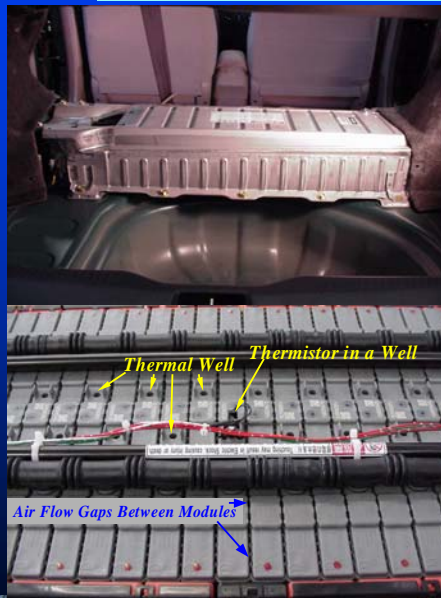
## Example # 1

Applying Six Sigma Design Process to HEV Battery Thermal Management

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# HEV Battery Pack

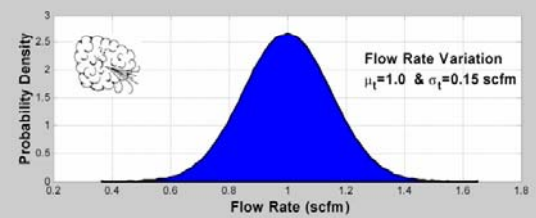
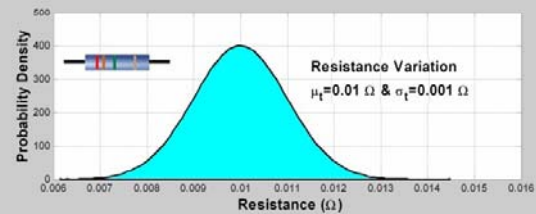
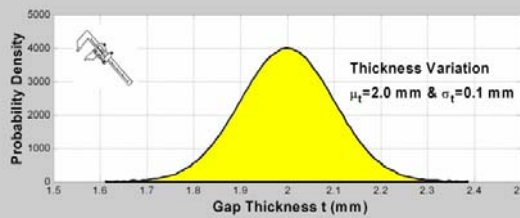


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## Inputs with Variation

- Gap Thickness
  - Cell Resistance
  - Flow Rate
  - Six input parameters:
1.  $\mu_{t_{gap}}$
  2.  $\sigma_{t_{gap}}$
  3.  $\mu_R$
  4.  $\sigma_R$
  5.  $\mu_{F_{rate}}$
  6.  $\sigma_{F_{rate}}$



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## Outputs / Goals

### Outputs - variation

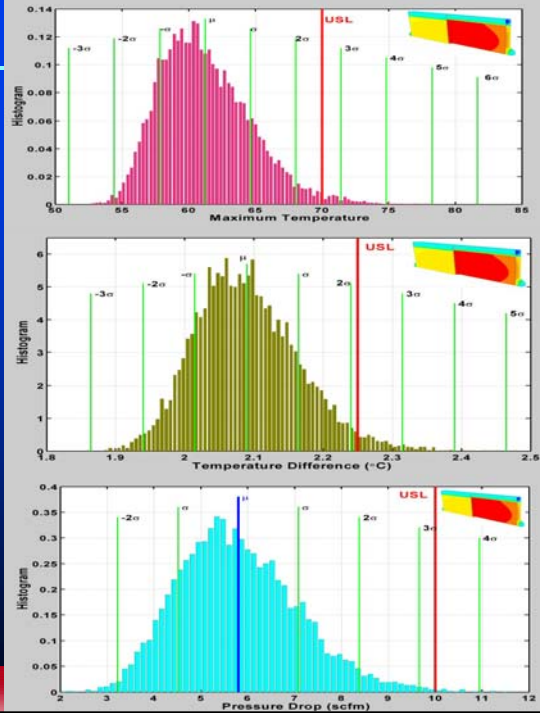
- max temperature
- differential temperature
- pressure drop

### Six output parameters:

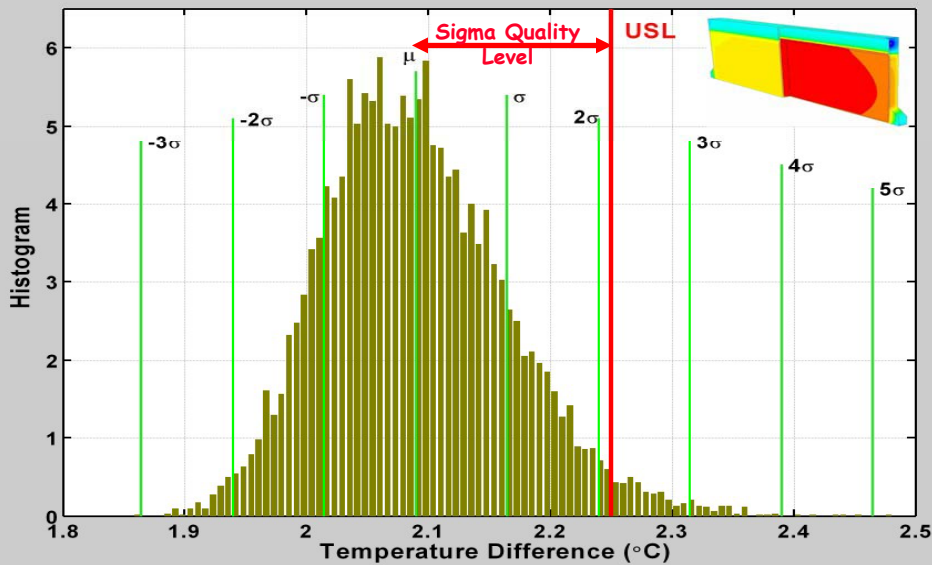
1.  $\mu_{T_{max}}$
2.  $\mu_{dT}$
3.  $\mu_{dP}$
4.  $\sigma_{T_{max}}$
5.  $\sigma_{dT}$
6.  $\sigma_{dP}$

### Three Upper Specification Limits (USL)

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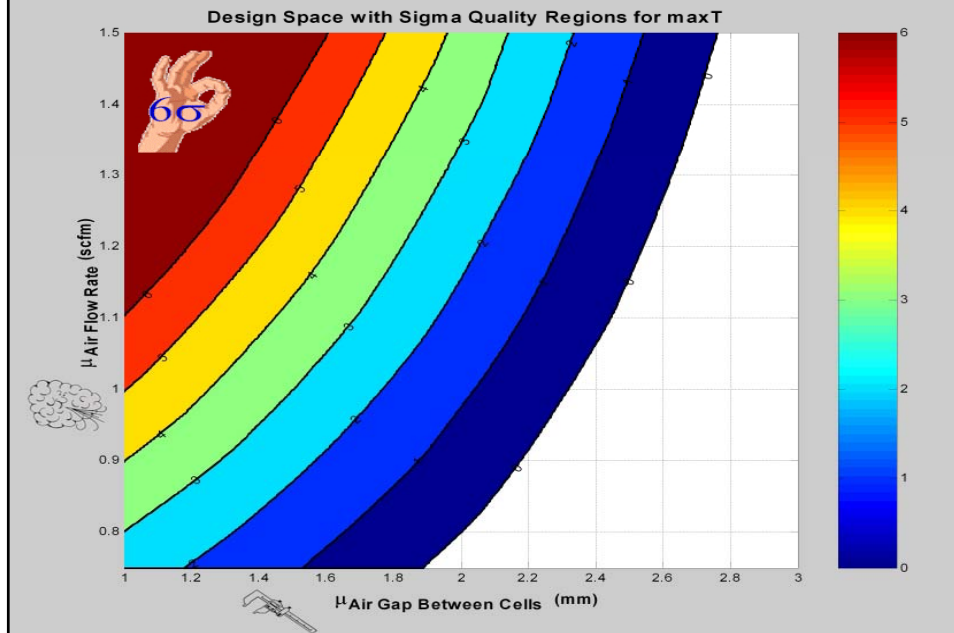
## Histogram of Temperature Differential and Sigma Quality Levels



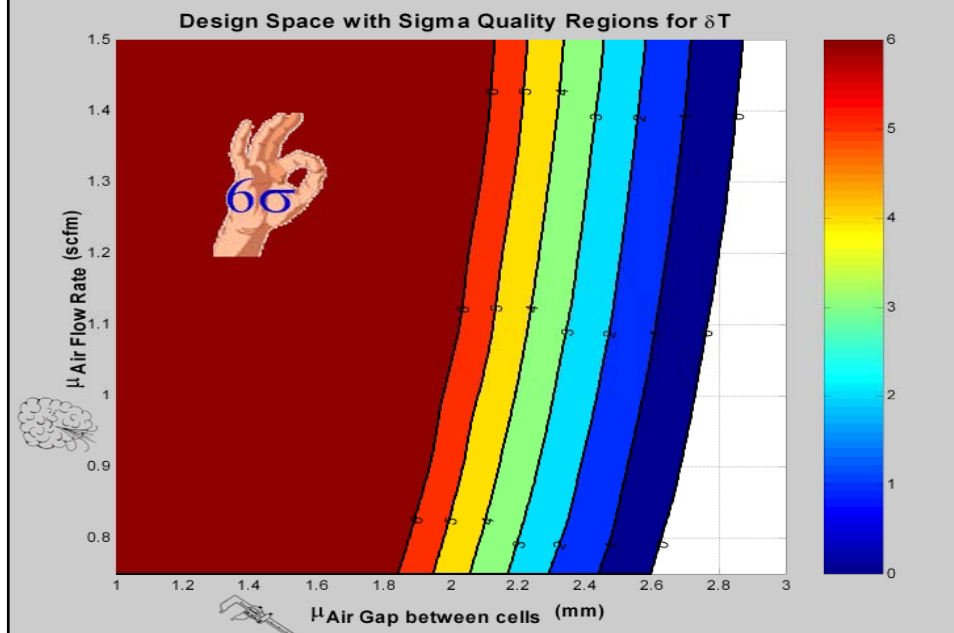
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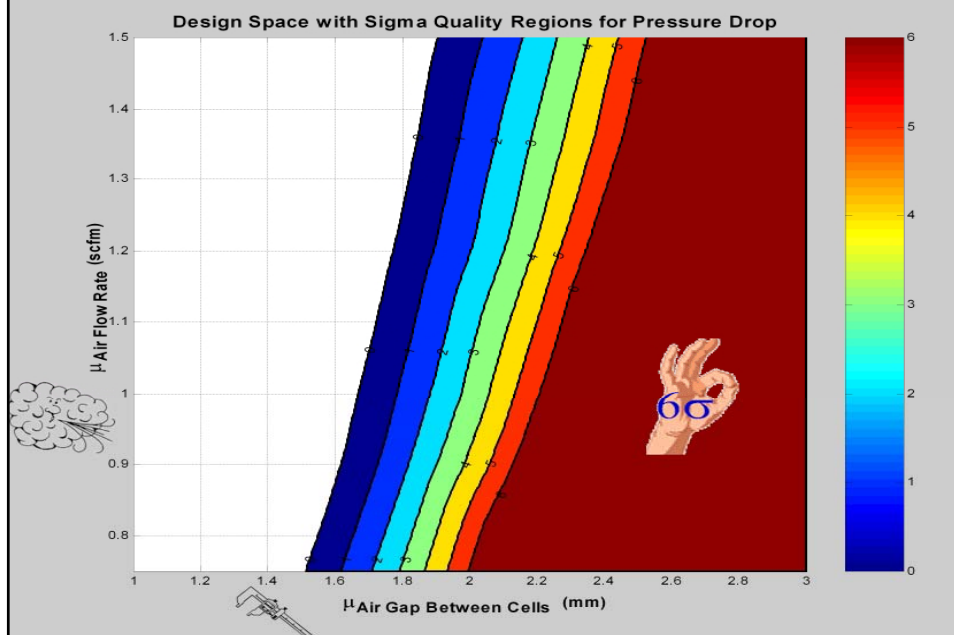
## Design Space with $\sigma$ Quality Regions $T_{max}$



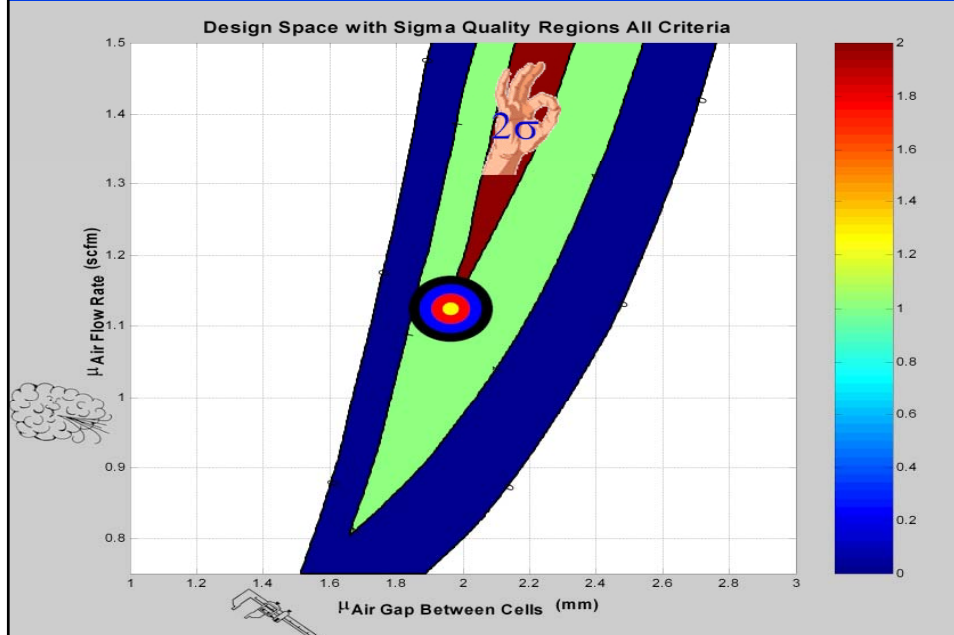
## Design Space with $\sigma$ Quality Regions $dT$



## Design Space with $\sigma$ Quality Regions dP



## Design Space with $\sigma$ Quality Regions All



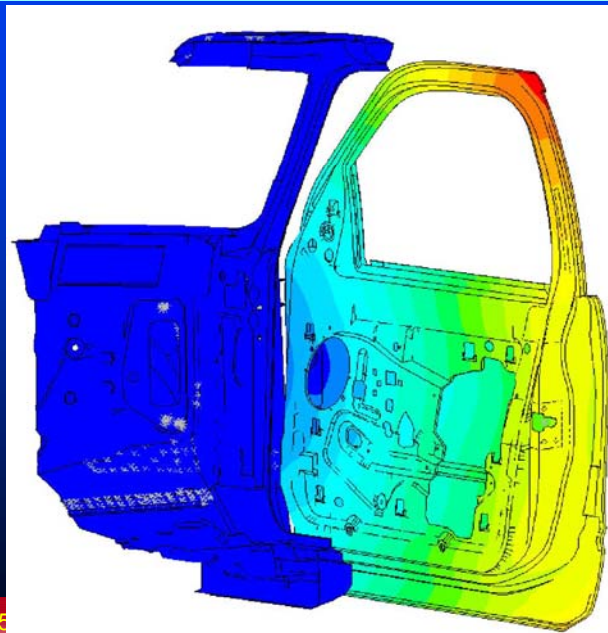
## Example # 2

Effect of thickness and material variation on six-sigma performance targets of a door assembly

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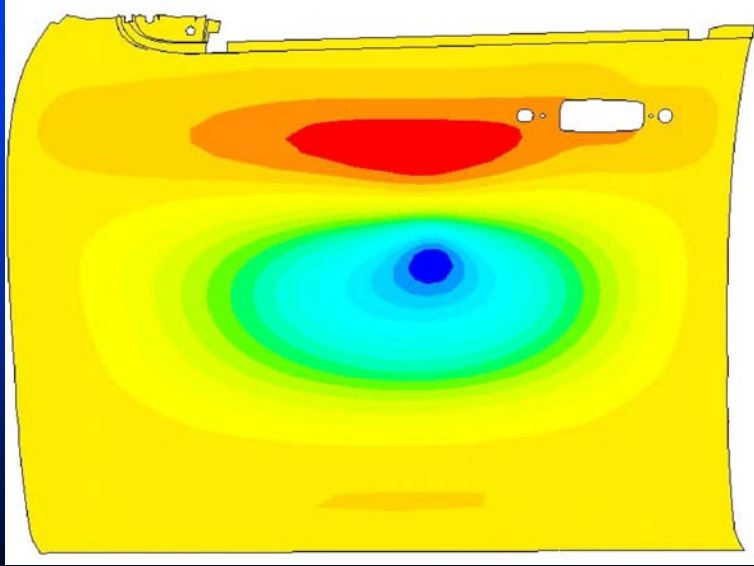
## Door Sag Displacement Distribution



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## Oil-Canning Deflection Distribution

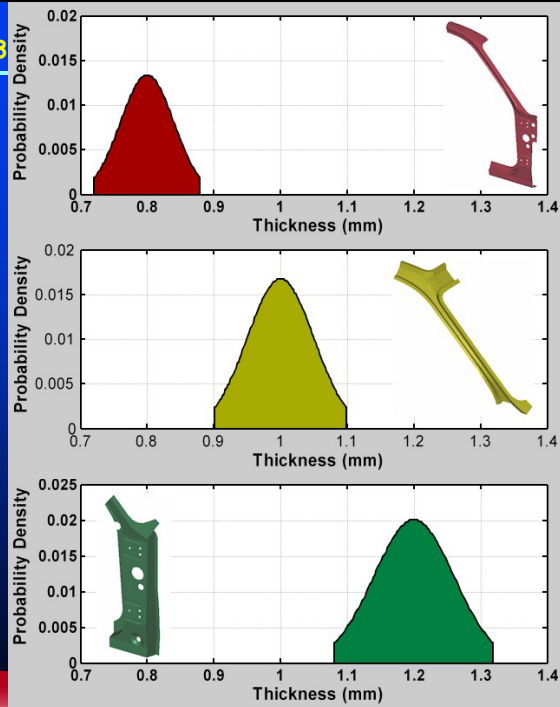


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## Input variables 1-3

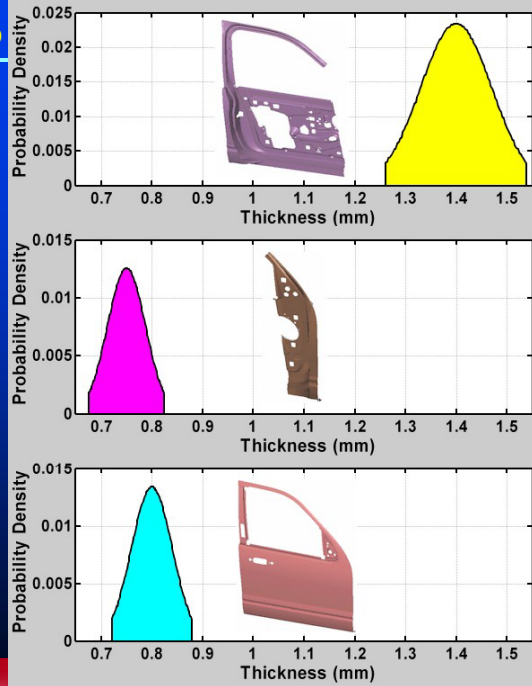
- Thicknesses of A-pillar Components



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## Input variables 4-6

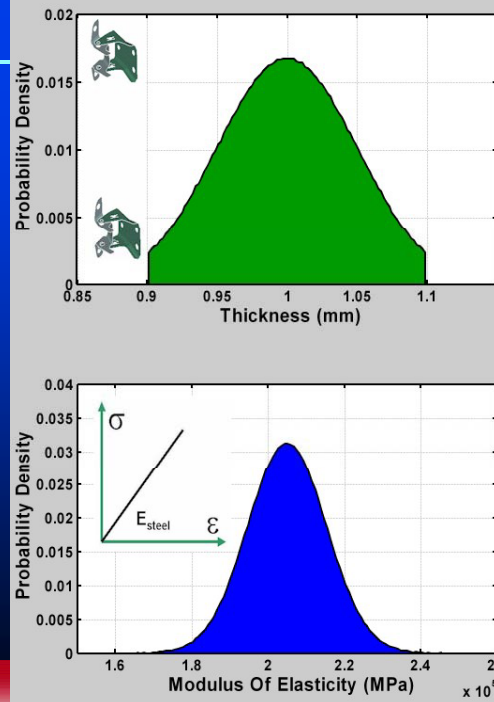
### Thicknesses of Door Components



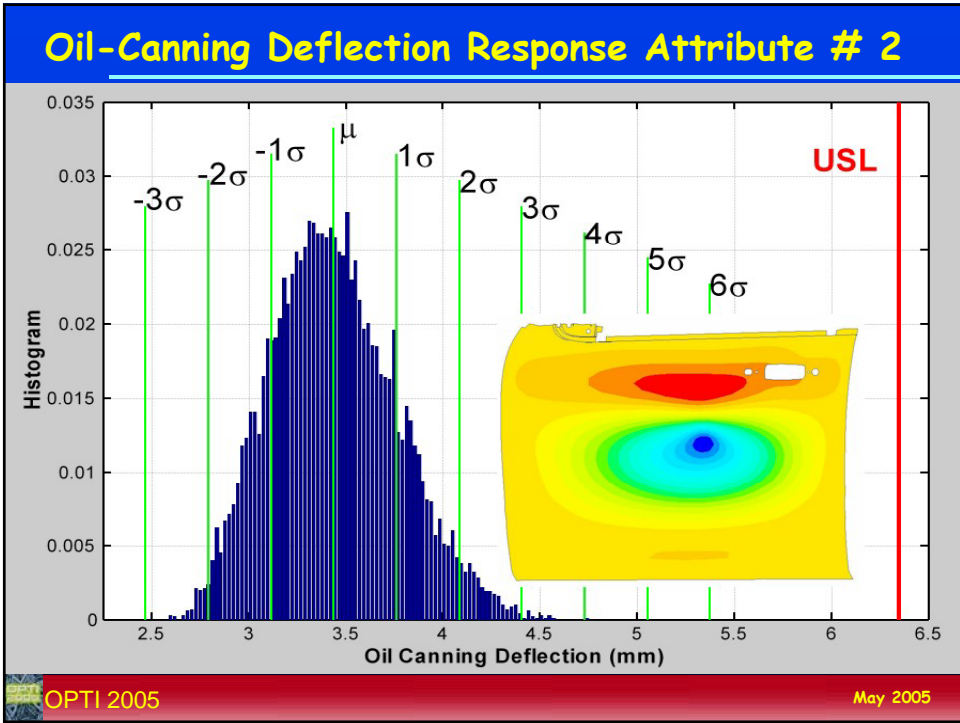
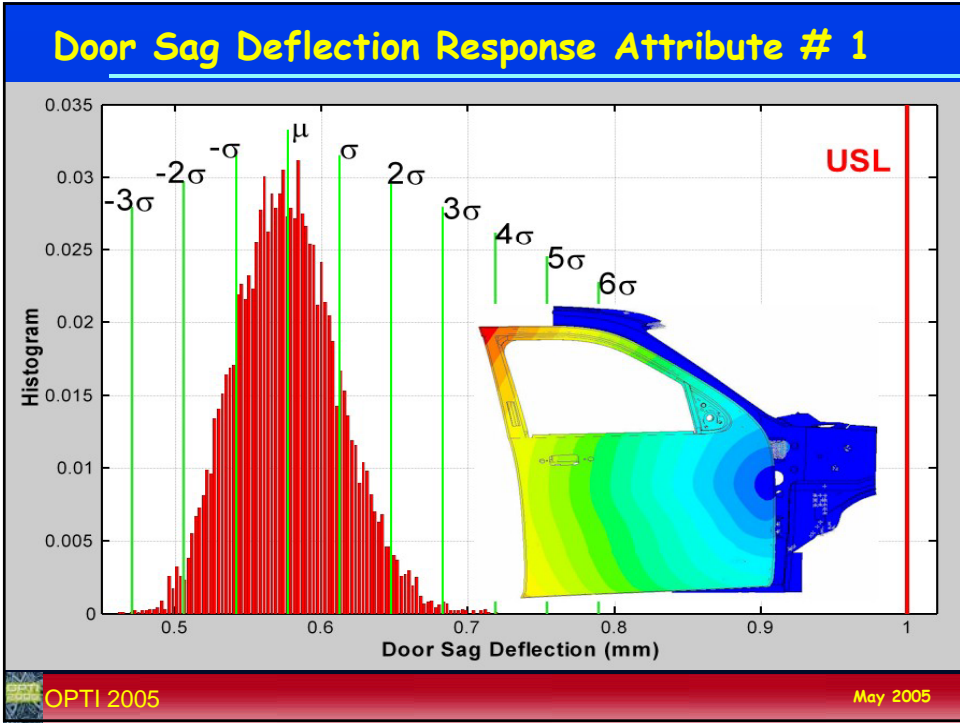
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## Input variables 7-8

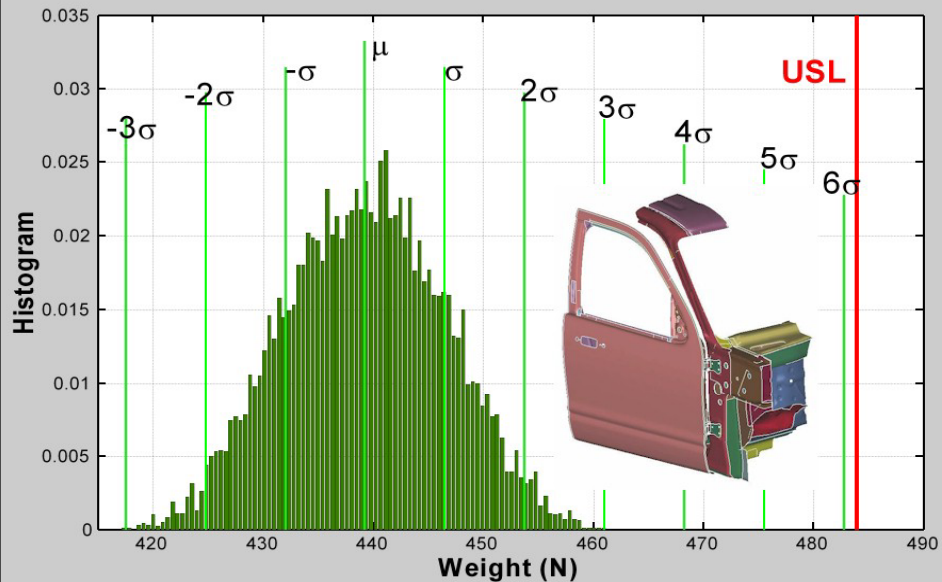
- Thicknesses of Door Hinges
- Modulus of elasticity



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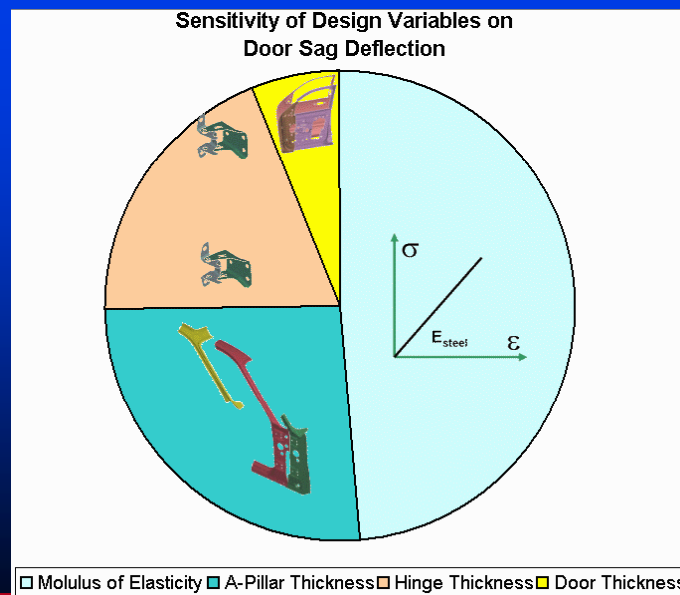
## Assembly Weight Response Attribute # 3



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## Sensitivity of Design Variables on Door Sag Deflection



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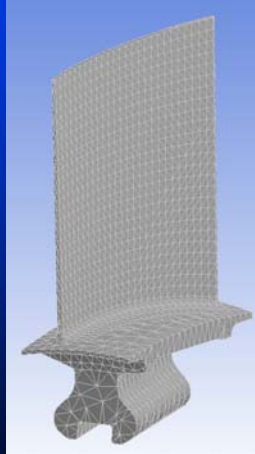


# CAD FEM Post Integration

CAD Geometry



FEM Mesh



FEM Boundary Conditions

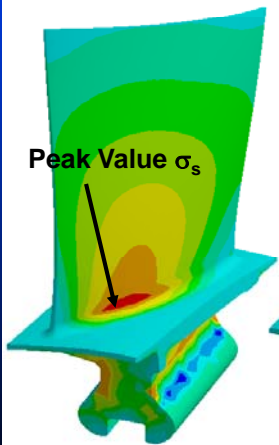


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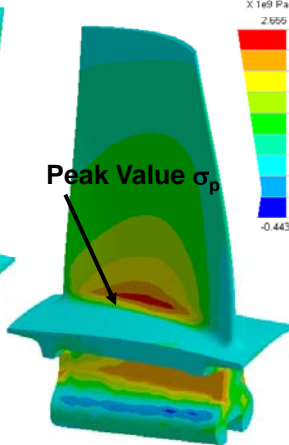
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# CAD FEM Post Integration

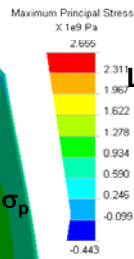
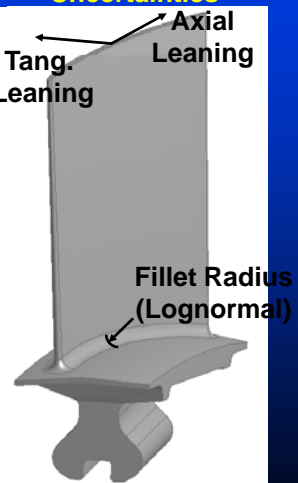
Results for Maximum Principal Stress  
Pressure Side



Suction Side



Design Variables and  
Uncertainties



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# Enabling Parameterization with Workbench

**ANSYS Workbench [ANSYS Multiphysics]**

Project Outline for "Complade":

- Model
  - Geometry
  - Mesh
  - Environment
    - Rotational Velocity
    - Frictionless Support
    - Given Displacement
  - Solution
    - Maximum Principal Stress
    - Maximum Principal Stress
    - Total Deformation
- Engineering Data
  - Titanium Alloy
  - Thermal C

**Total Deformation** X 1e-2 m

0.499
0.444
0.398
0.353
0.278
0.222
0.167
0.111
0.056
0.001

**Structural Properties**

Young's Modulus	2.e+011 Pa
Poisson's Ratio	0.3
Mass Density	7850. kg/m³
Thermal Expansion Coefficient	1.2e-005 1/°C

**Results**

Minimum	6.428e-006 m
Maximum	4.992e-003 m

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# DesignXplorer manages parameters & uncertainties

**ANSYS Workbench [ANSYS Multiphysics]**

DesignXplorer: ds\_AirFoilFilletRadius

Simulation Parameter Type:

Uncertainty Variable:

Parameter Type:

Distribution Type:

Distribution Attributes:

Attribute	Value
Mean	0.25
Standard Deviation	1.25e-002
Lower Bound	0.21
Upper Bound	0.29

Parameter Properties:

Statistic	Value
Lower Bound	0.21
Upper Bound	0.29
Mean	0.25
Standard Deviation	1.24041e-002
Skewness	0
Kurtosis	0

Sample Set 4: Parameter Statistics

Statistic	Value
Mean	1.200e+03
Standard Deviation	1.150e+07
Skewness	-0.286
Kurtosis	-0.019e+02
Minimum Energy Compliance	40.02
Signal-to-Noise Ratio (Center to Better)	20.3
Signal-to-Noise Ratio (Normal to Best)	21.35
Signal-to-Noise Ratio (Larger is Better)	20.2
Maximum	0.00e+00
Minimum	1.00e+00

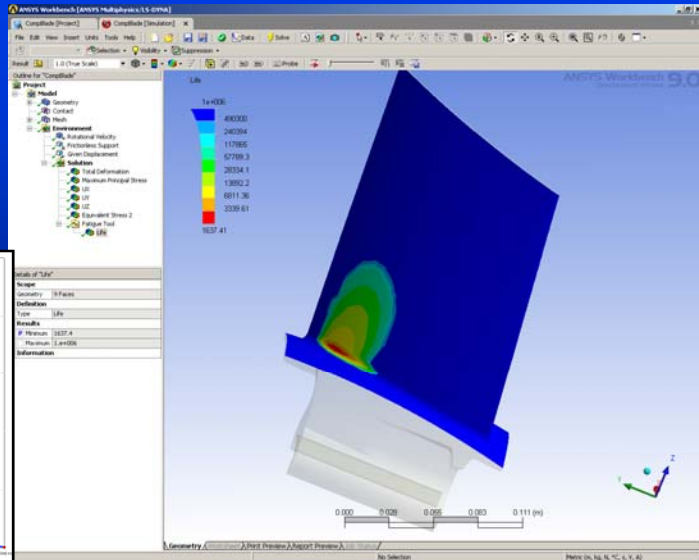
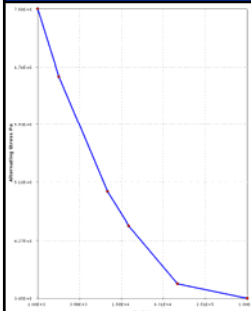
Histogram: SquaredStressDifference

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# Deterministic Optimization for Fatigue Life

Initial Design:  
Fatigue Life  
1,637 Cycles

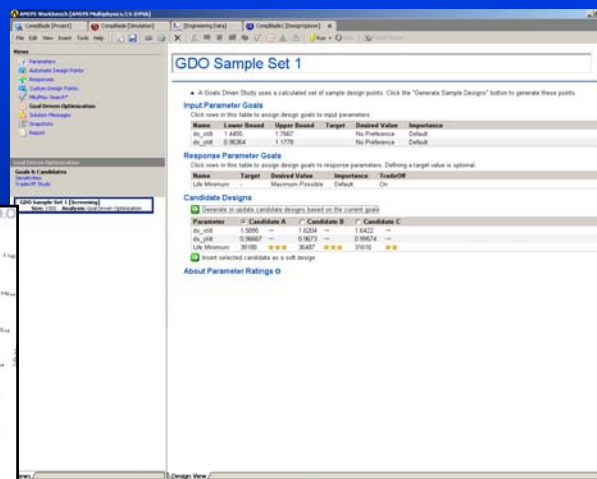
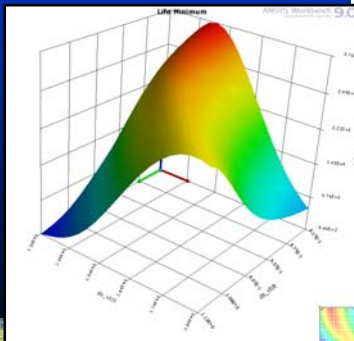


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# Deterministic Optimization for Fatigue Life

- Optimize Tilt and Lean; Fatigue Life = 38,118



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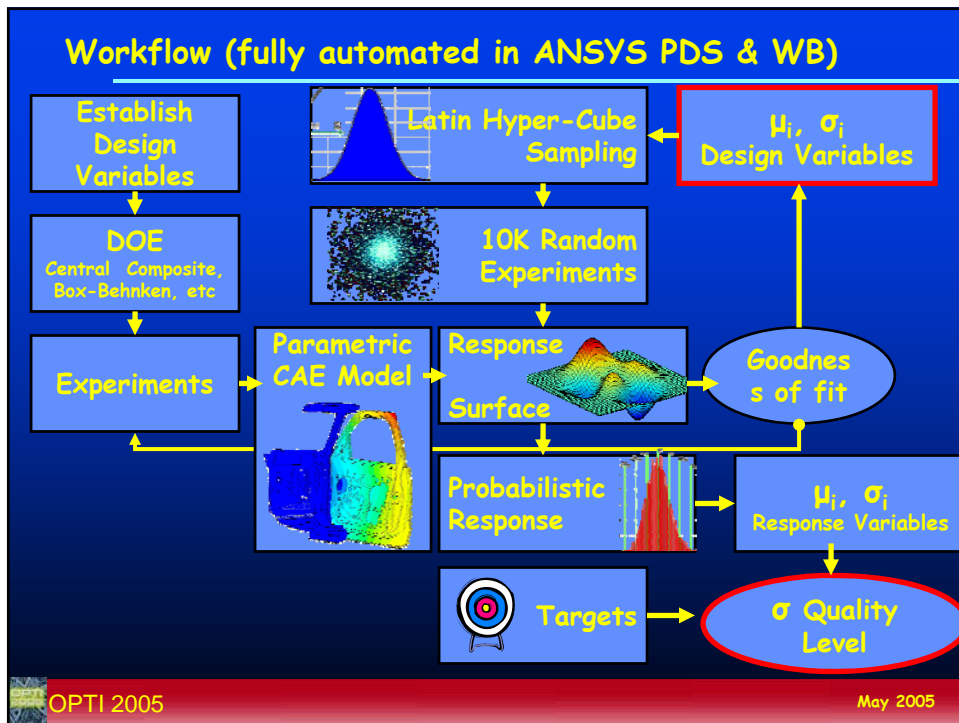
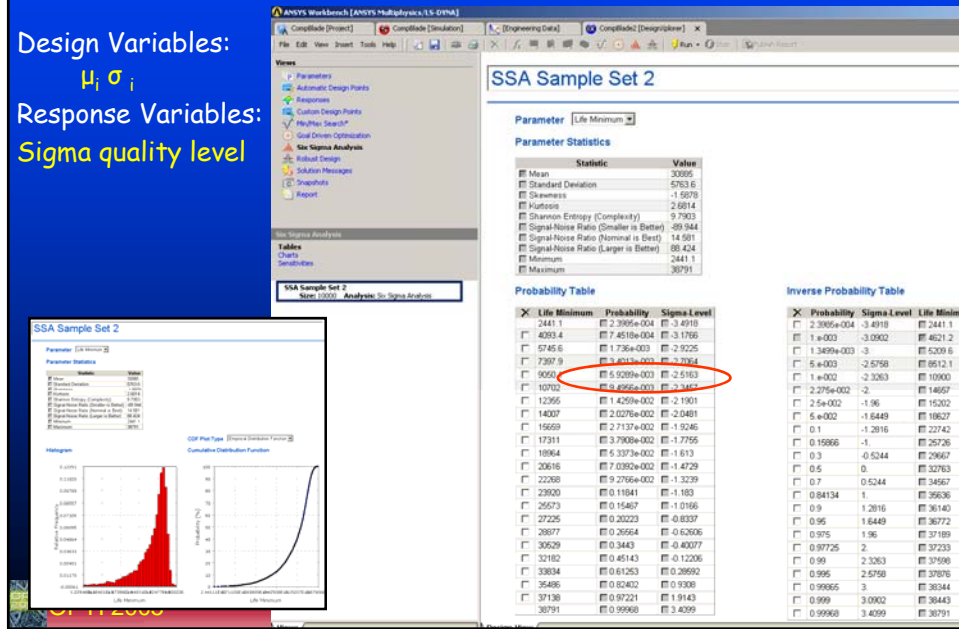
# Optimization for Quality with Probabilistic Constraints

Design Variables:

$$\mu_i, \sigma_i$$

Response Variables:

Sigma quality level



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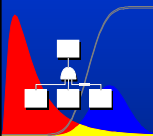
## Seven Habits of Highly Effective Design Process

1. Clarify and document the desired design decision process
2. Create a design environment tailored to the desired design process with workflow management
3. Develop a repository of design & manufacturing rules to govern the design process
4. Simplify and automate tool usage for standard analyses
5. Automate and simplify data integration (get the right data the first time)
6. Augment the experts by automating large portions of the design process (Workbench wizards)
7. PIDO ( DesignXplorer, Noesis, VisualDOC, iSIGHT, mode Frontier, hyperStudy, model center, RDCS, BMX, ...)

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## Recommendations for DFSS Implementation



- Make the cost of poor quality part of the design equation

$$\begin{aligned} \text{Cost} = & C_{\text{Product Development}} + C_{\text{Warranty}} + \\ & C_{\text{Liability}} + C_{\text{Recalls}} + C_{\text{Lost Customers}} + \\ & C_{\text{Rework}} + \dots \end{aligned}$$

- CAE analyses should include a robustness assessment for known sources of variation
- Place the power of DFSS in the hands of every designing engineer not just those with advanced engineering degrees
- Automate - Incorporate DFSS into your design process

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Design-for-Six Sigma strategies are transforming our methodologies for improving quality **from** inspecting defects **to** *building quality in*

