Design for real

Optimus®

MDO Methods and Tools

Roberto d'Ippolito Noesis Solutions

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### Outline

- Introduction about Noesis
- MDO Tools and methods: context & challenges
- High dimensional MDO
- Electrical Wire Harness case
- Conclusions



#### **Noesis Solutions**

who we are



















Noesis Solutions is an engineering innovation partner to manufacturers in engineering-intense industries.

We are specialized in simulation process integration & numerical optimization

and help our customers resolve their toughest multi-disciplinary engineering challenges.

#### **Noesis Solutions**

what we do: Optimus



















Our Optimus software platform enables customers to adopt an "Engineer by Objective" development strategy.

'trial-and-error' simulation based design processes

and directs simulation campaigns toward the best product designs.

#### **Optimus by Noesis Solutions**

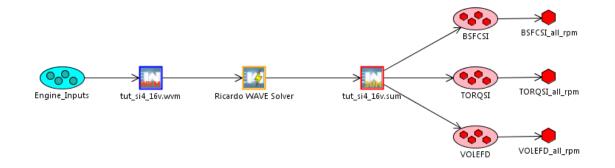
#### The leading vendor-neutral solution for engineering optimization

#### **Process Optimization**



- create automated, repeatable simulation processes
- integrate in-house tools& methods
- capture simulation knowledge
- custom applications

**FASTER** 









#### **Optimus by Noesis Solutions**

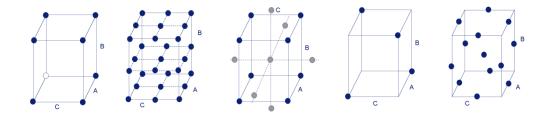
The leading vendor-neutral solution for engineering optimization

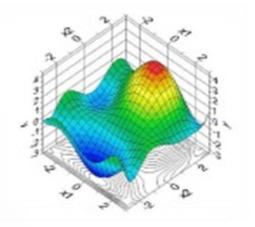
#### **Design Optimization**

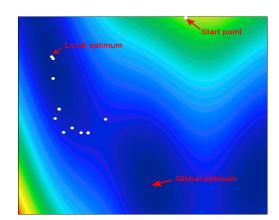


- identify influental design parameters
- gain critical engineering insights, enabling smarter decisions
- eliminate non-feasible designs, identify leading design candidates

BETTER













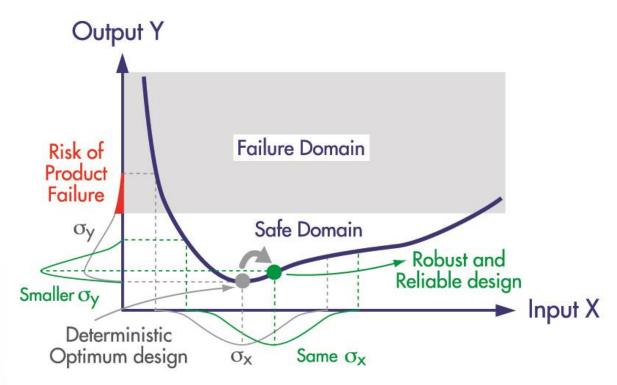
#### **Optimus by Noesis Solutions**

The leading vendor-neutral solution for engineering optimization

#### **Robust Optimization**



- develop robust & reliable products
- ensure consistent product quality throughout product lifecycle



**MORE RELIABLE** 







# Open environment with Python scripting



# Automating in-house processes



- Facilitate stress analysis
- Automate stress Report
- Formalize Simulation Process
- Reduce Human Involvement

# Crafting dedicated applications



- Improve Active/Passive Crash
- Select Dominant LC
- Simultaneous Euro / USCAP
- Speed-up Crash
   Simulation Decision

# Capturing corporate knowledge



- Support selection of best optimization algorithm
- Build method cartography
- Validate deployment of methods

Open & extendable environment to respond to any custom need

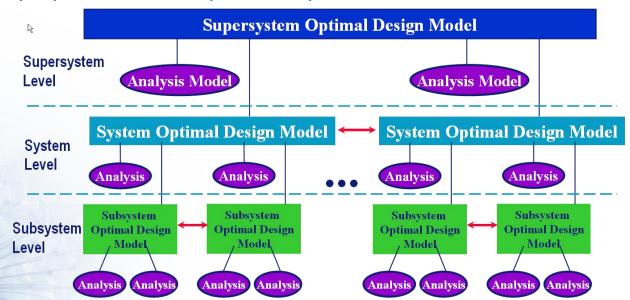






# ... with a Multi-Level approach

- Multi-Level environment:
  - Drive simulation cascaded process with OPTIMUS
  - Handle Bottom-level workflow with a Top level OPTIMUS
  - Carry Up and Down Inputs/Outputs/Constraints









Óutput2

**D**<sup>&</sup>

Optimus 1

Input1

InputArray1

#### Research and Innovation

- Multi-disciplinary problems
- Formalize interoperability solutions
- Scalable automation & execution

Solve complexity

Research & Innovation

- Capture and re-use Knowledge
- Modular SW components
- Interoperability: open and extendable

Manage Heterogene



- Distributed computations
- Virtualization & Cloud computing
- Service Oriented Architectures (SOA)

**Execute Efficiently** 









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#### Context

- Complex engineering problems use high fidelity simulation models and expensive experiments
- Ever increasing competition imposes time and budget constraints on the development of new products
- Need to infer maximum amount of information
  - from limited number of simulation runs
  - obtain competitive solutions





#### Problem

- We never achieve 100 % accurate simulation or experiments
  - if they are high fidelity, they are expensive.
- Problem scale keeps increasing
  - number of design parameters and data size
- Design is progressive
  - The user initially does not know proper parameter bounds, constraints, what to model and what to ignore





# What we can trade in for finding an "optimal solution"

- Quantitative accuracy of performance is not always of primary importance but relative merit is
- Very often a "competitive" solution is all we need, not necessarily the best possible solution
  - Especially true if the problem is multi objective or highly constrained (best difficult or expensive to achieve)
  - Overall sound solution important in safety critical applications (best too good to be true)
- The point is to have different shades of optimality





# Why accept such relaxation?

#### "Best" is capricious

- Predicting World Cup top 8 teams is easier than predicting the winner.
- Engineers can usually agree on good designs but may disagree on the "best one".

#### "Best" depends

- We are usually uncertain of what we mean by best.
- Optimization problem set up is an art, not science.

#### "Competitive" is intuitive

- Humans are good at discerning it
- We could allow human expertise and past statistical data to take part in the search for solution





# Large Scale MDO Challenges

- Large design space to explore involving heavy sampling
- Risk to linearize design space by reducing sampling
- High probability to violate constraints
- Challenge to bound a confidence region that fulfills all constraints AND improves the design
- Access to an adequate environment
  - Visualize the data and rely on metrics to validate the optimum
- Hardware path
  - Increase CPU Services with HPC Cluster
  - Increase RAM to store large matrix
- Simulation Solver Path
  - Enable analytic sensitivities directly in the solver









#### How to do it?

- Differentiate Dimensional and Domain reductions
- Identify inter-relations and use them
- Methodologies:
  - Graph decomposition
  - Feasible region identification
    - Deep Learning and SOM based adaptive sampling (SOMBAS)
  - Domain shrinkage using Sobol Indices (DSSI)
  - Interaction Indices





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### Research and Innovation tracks



#### Simulation Framework

- Web 2.0 based corporate federation toolkit
- Dynamic multi disciplinary design workflow



#### Machine Learning

- Knowledge capture and reuse,
- Optimize large, highly dimensional full scale models



#### Cloud and HPC

- Virtualize execution via cloud computing
- Web Services and access from everywhere







#### HAROS-HD

- Hybrid Adaptive Robust Optimization Strategy for High Dimensional systems
  - Optimization strategy (opposed to optimization algorithm)

- Main Objectives
  - Provide new optimization techniques suitable for large scale systems with mixed variables
  - Discover problem 'features' and use them for efficient
     optimization of subsystems





Overview of the strategy

Multiple steps involved

design space distributed simulate sample computing add build model adaptive adaptive tune extra sampling model modeling sample complexity exploration assess model & exploitation validate model surrogate model

Problem decomposition

Dimensionality reduction

Feasible region identification

Sub-system optimization

**Tuning** 







#### Main stream technologies

- Non-convex space density learning
- Unsupervised feasible region identification
- Initial space indifferently in feasible/unfeasible solution space

# Find feasible solution space

- Aggregate meta models based on confidence maps
- Estimate confidence maps with Neighborhood identification
- Learning profiles to model nonlinearities, minima/maxima, etc

Machine learning: Ensemble modeling



- Adaptive learning sampling
- Identify design space features (ex: search of non-linearities)
- Improve accuracy in optima surrounding
- Mixed variable algorithms (HAROS-HD)

# Machine learning: Sampling/optimization



- Decompose large problem in smaller and spot robust solution
- Use interaction & Sobol indices
- Measure degree of interaction between parameters
- Detect parameters independence

**Dimension reduction** 

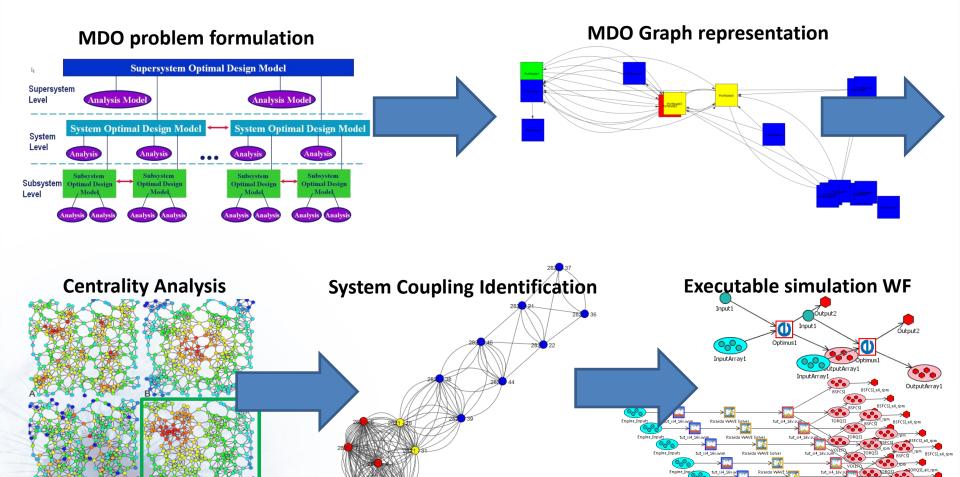








# MD Dimension reduction approach









# Advantages

- General: can be applied to all optimization problems
  - HAROS-HD will learn about the design space and employ the appropriate algorithms as it proceeds toward finding an optimized solution

#### Flexible:

 HAROS-HD will intelligently adapt the optimization strategy by selecting the most appropriate method to use

#### Scalable:

It can be used for high dimensional problems





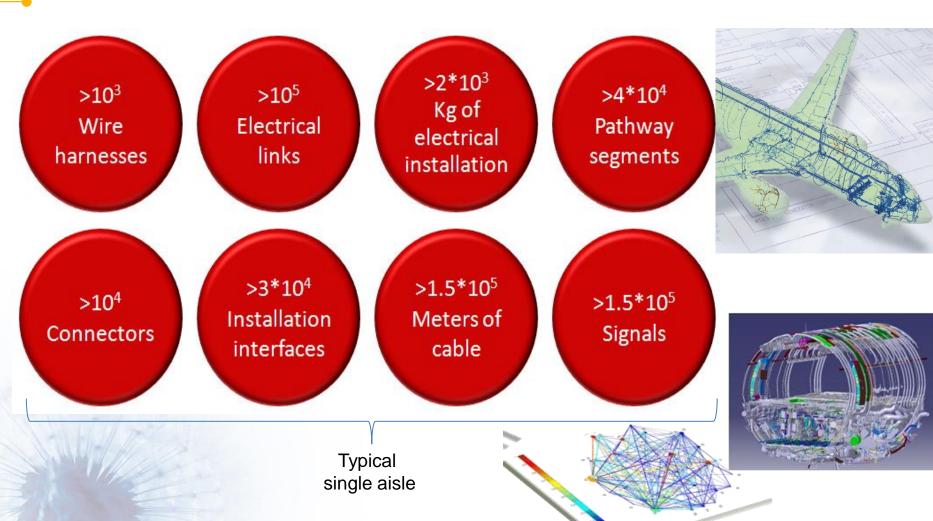
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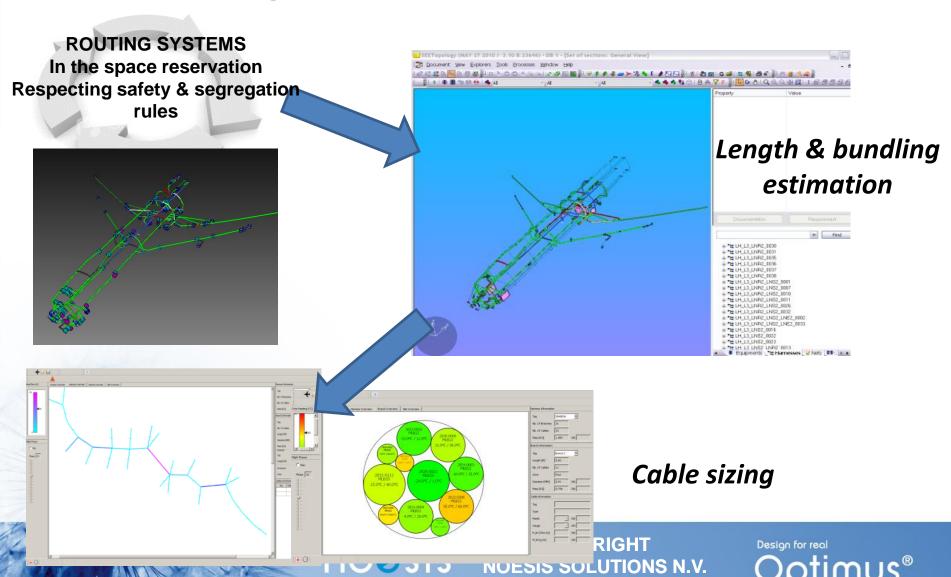
#### Context



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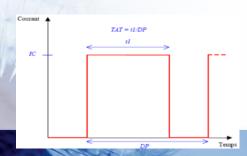
Optimus®

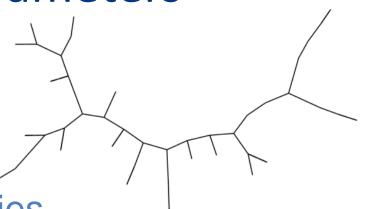
# Wire design

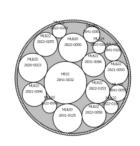


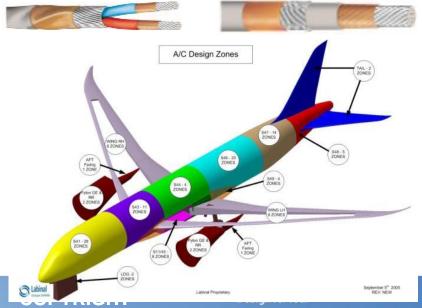
Constraints / parameters

- Harness topology
- Harness protections
- Cable properties
- Electrical link properties
- Aircraft flight phases
- Aircraft areas
- Environmental parameters





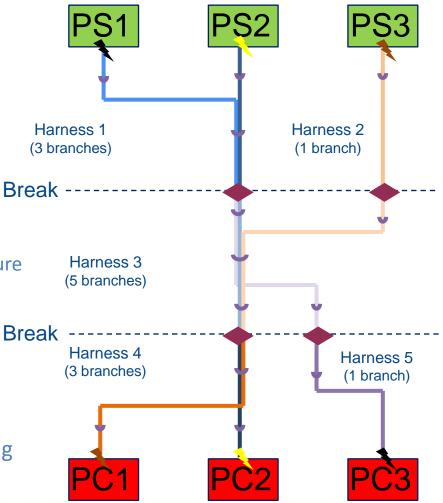






# A typical industrial case

- Wire gauge optimization
- Cable design
  - Mechanical design
    - Tensile strength
  - Electrical design
    - Maximum voltage drop
  - Thermal design
    - Maximum overheating & temperature
- Problem definition
  - Harnesses interactions
    - Voltage drop computation
  - Cables interactions
    - Overheating computation
  - Voltage drop depends of overheating
  - Discrete problem









# Optimization challenges

- Cable gauges optimization problem
- Large scale system
  - Up to 1000 wire harnesses
  - ~10000 cables optimization parameters
  - ~40000 harnesses branches thermal constraints
  - ~10000 electrical links voltage drop constraints
  - Discrete problem (categorical)





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#### Conclusions

- Complexity and heterogeneity challenges need to be addressed in MDO
- High dimensional systems soon become common
- New methods and tools exist to develop new optimization strategies for large systems
  - Paradigm shift in classical design optimization approaches





# Design for real Optimus®

Thank you!

#### Roberto d'Ippolito

Research and Innovation Manager — Noesis Solutions N.V. roberto.dippolito@noesissolutions.com



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