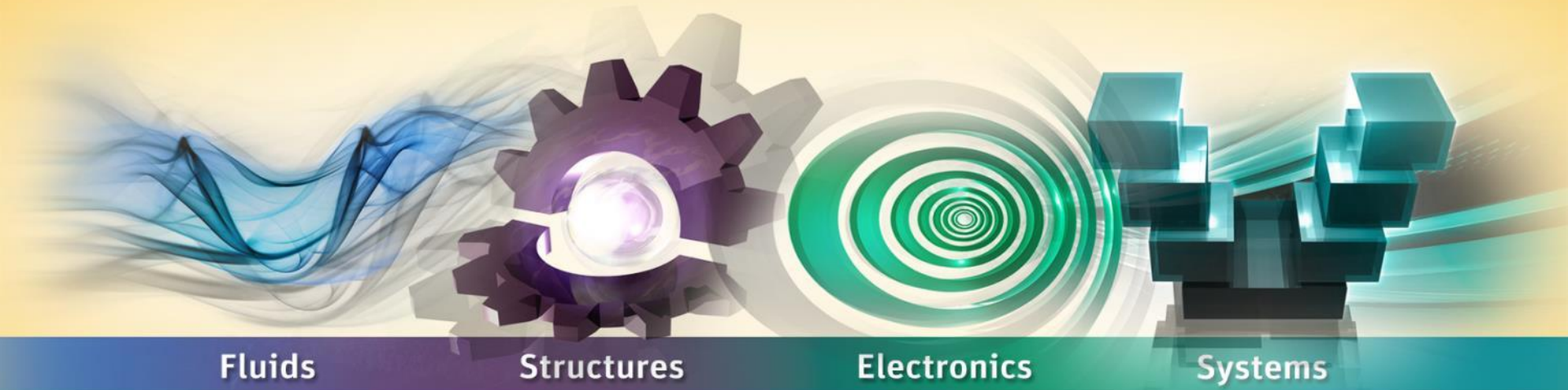


# NAFEMS – Séminaire Simulation des Systèmes - 3 juin 2015

Hôtel Novotel – Marne la Vallée – Noisy le Grand



## An Integrated Approach for Model-Based Systems and Software Engineering ROMs-Based Systems Analysis

03/06/2015

*Jacques DUYSSENS*

# Our Strengths

## FOCUSED

This is all we do.  
Leading product technologies in all physics areas  
Largest development team focused on simulation



## TRUSTED

**96** of the top 100  
FORTUNE 500 Industrials  
ISO 9001 and NQA-1 certified

## CAPABLE

**2,600+**  
employees

**75**  
locations

**40**  
countries

## PROVEN

Recognized as one of the world's **MOST INNOVATIVE AND FASTEST-GROWING COMPANIES\***

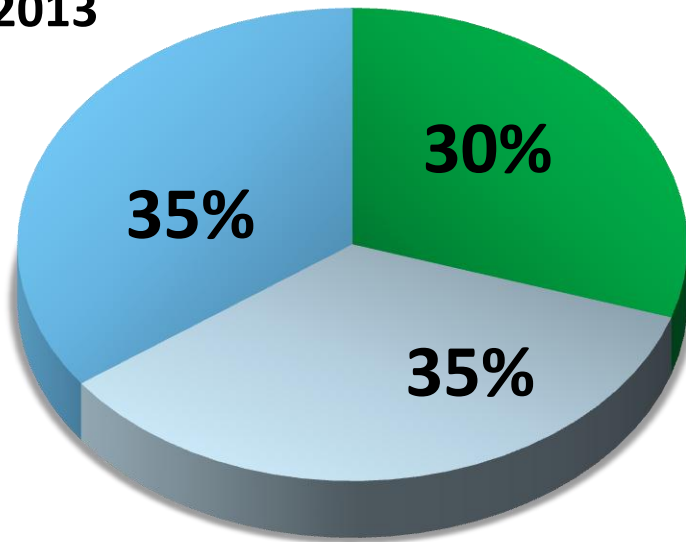
## INDEPENDENT

Long-term financial stability  
CAD agnostic

# Diversified Portfolio Structured for Success

## Sales by Geography

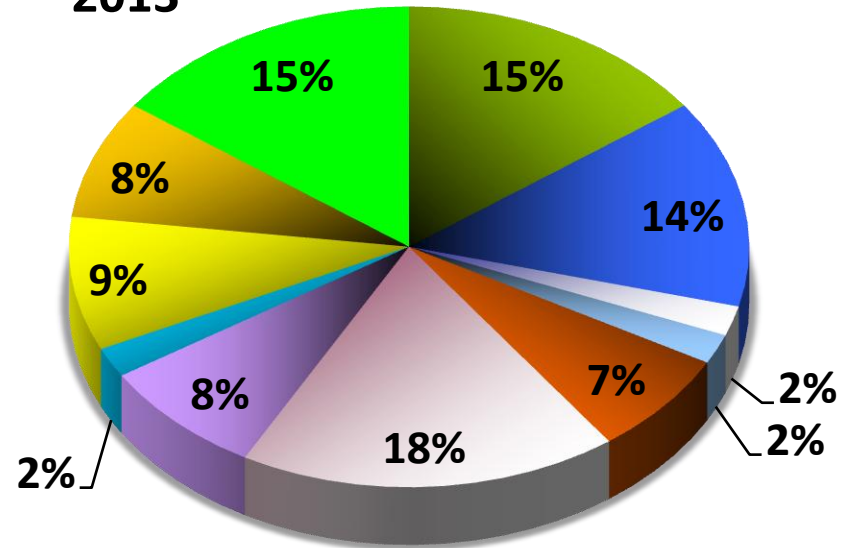
2013



■ GIA   ■ North America   ■ Europe

## Sales by Industry

2013\*

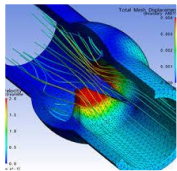


■ Automotive   ■ Aerospace & Defense  
 ■ Construction   ■ Consumer Products  
 ■ Academic   ■ Electronics  
 ■ Energy   ■ Bio-Med  
 ■ Industrial Equipment   ■ Materials & Chemical  
 ■ Semiconductors

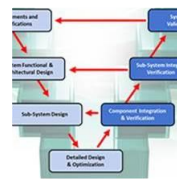
\* Non-GAAP

# Scaling the deployment of simulation requires a platform strategy

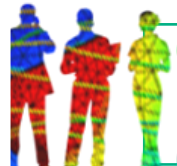
## Simulation Trends



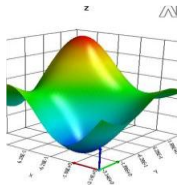
**Multiphysics Simulation**



**Systems Engineering**

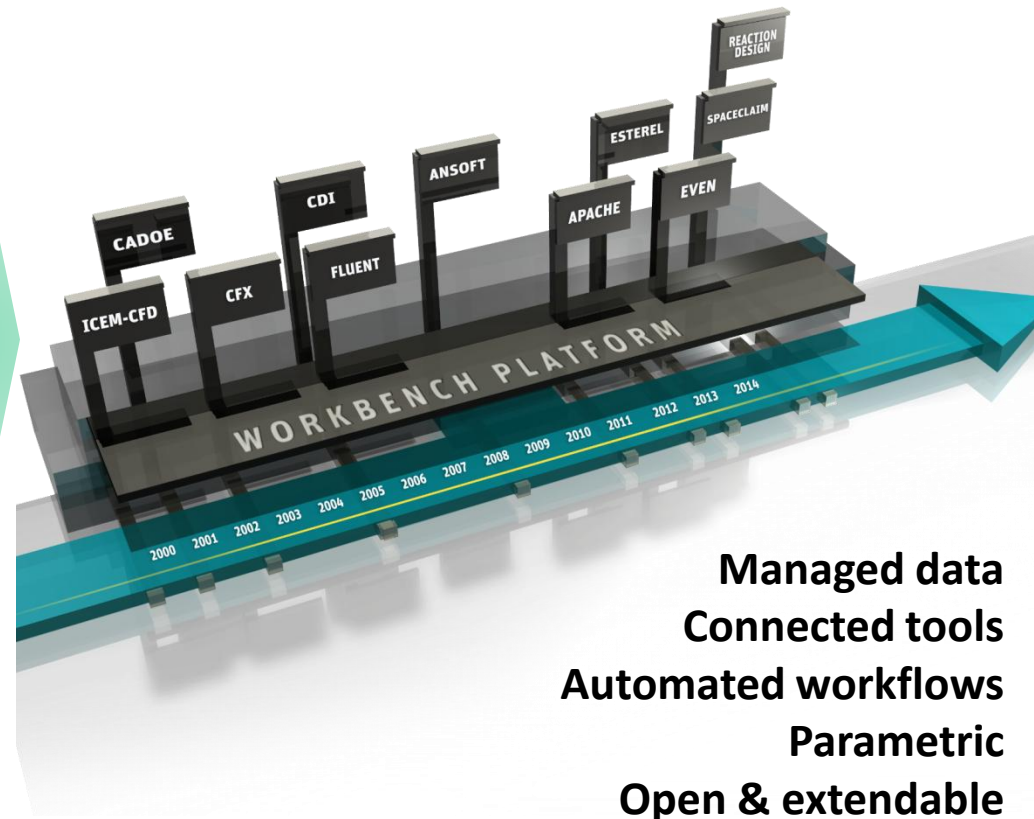


**Simulation Democratization**



**Robust Design**

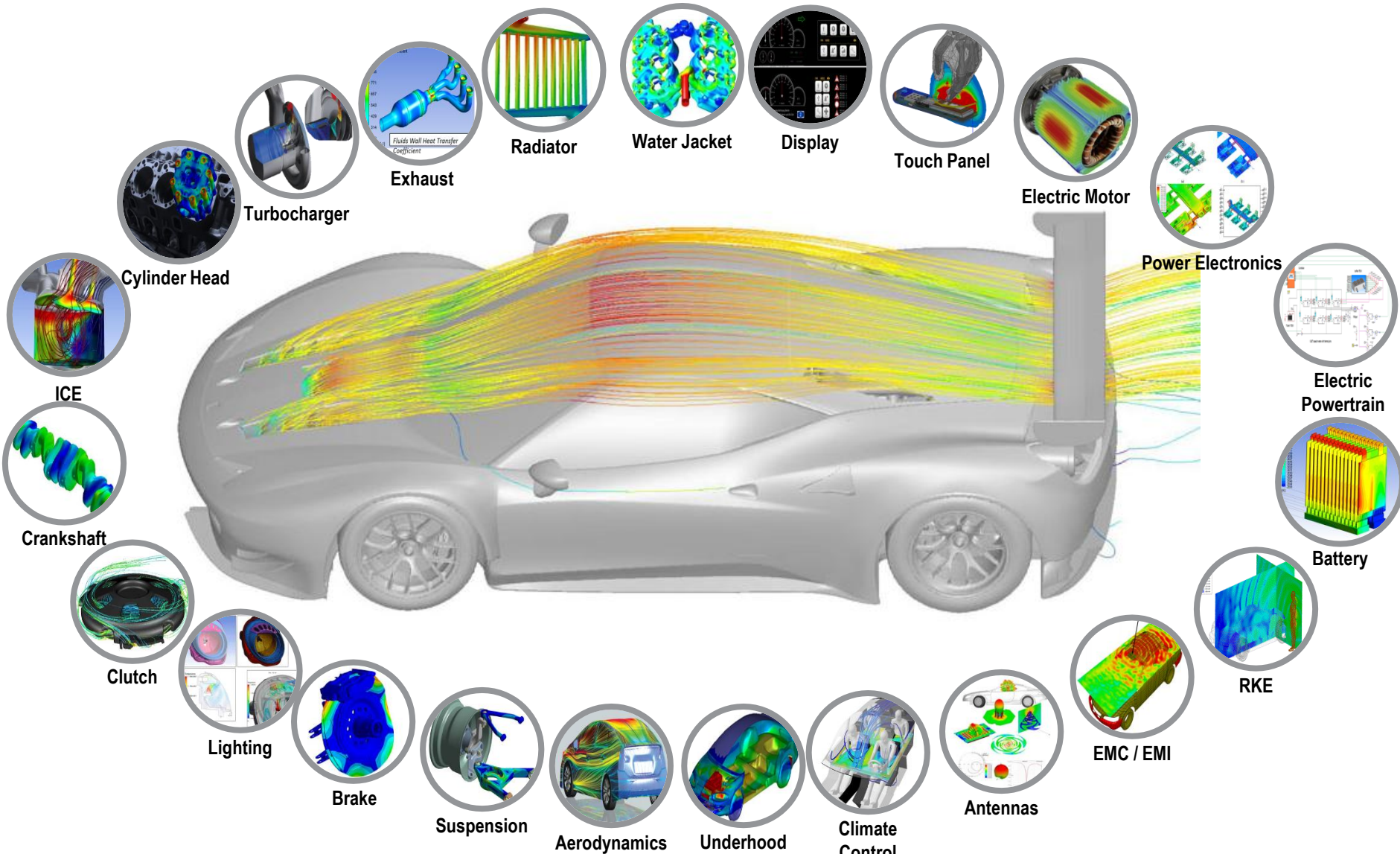
## Integrated Platform



**Managed data**  
**Connected tools**  
**Automated workflows**  
**Parametric**  
**Open & extendable**

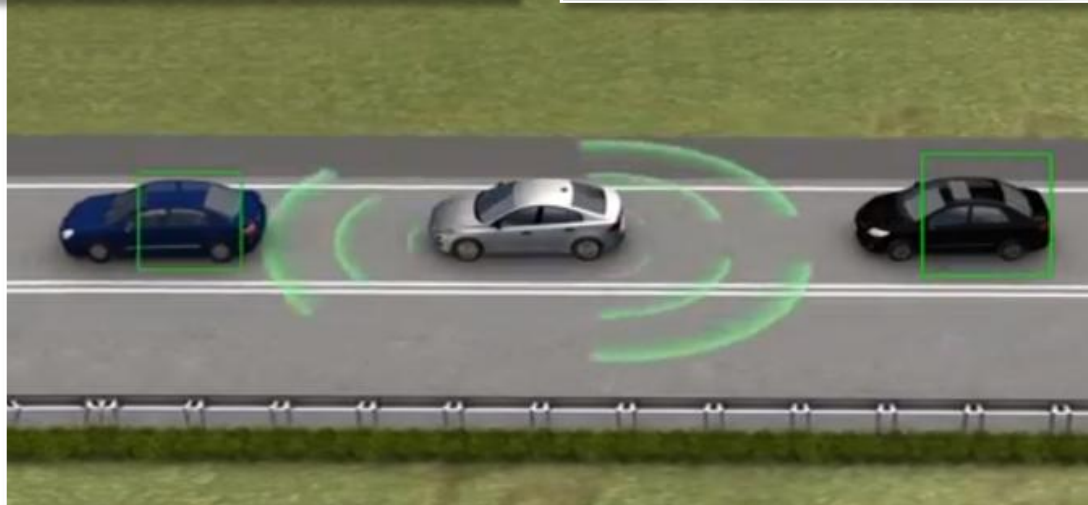
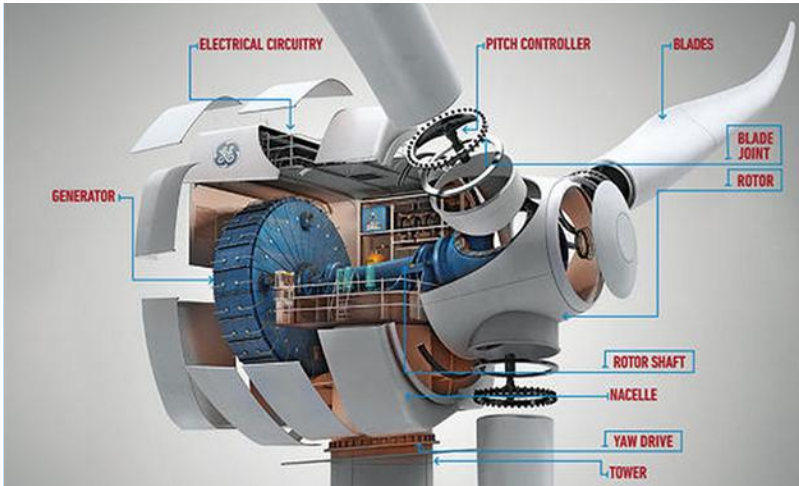


# Example: ANSYS in the Automotive Industry



# Model Based Systems & Software Engineering

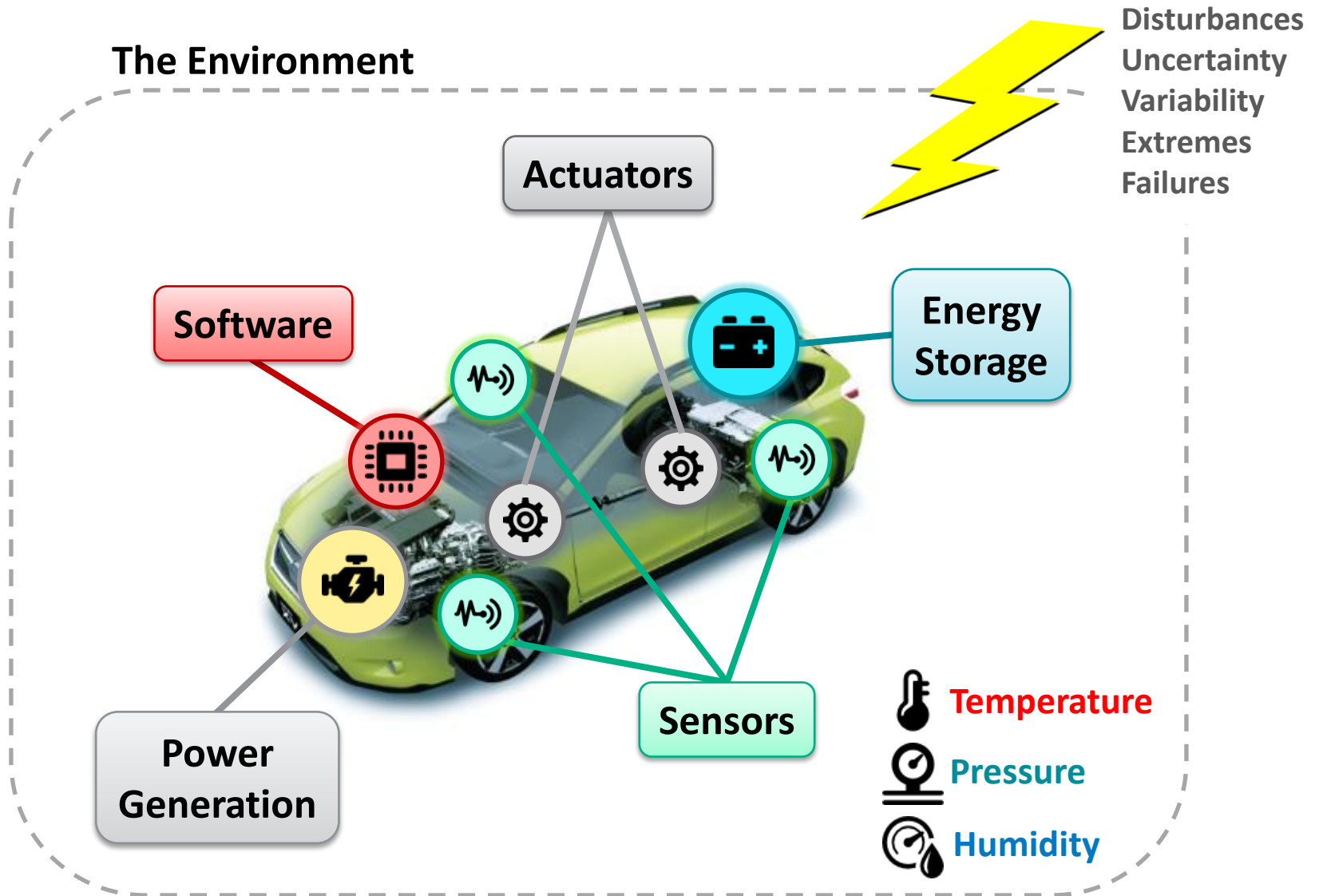
# Why Care about Systems?



**In every industry major innovations are based on electronics and embedded software.**



# What is a System?





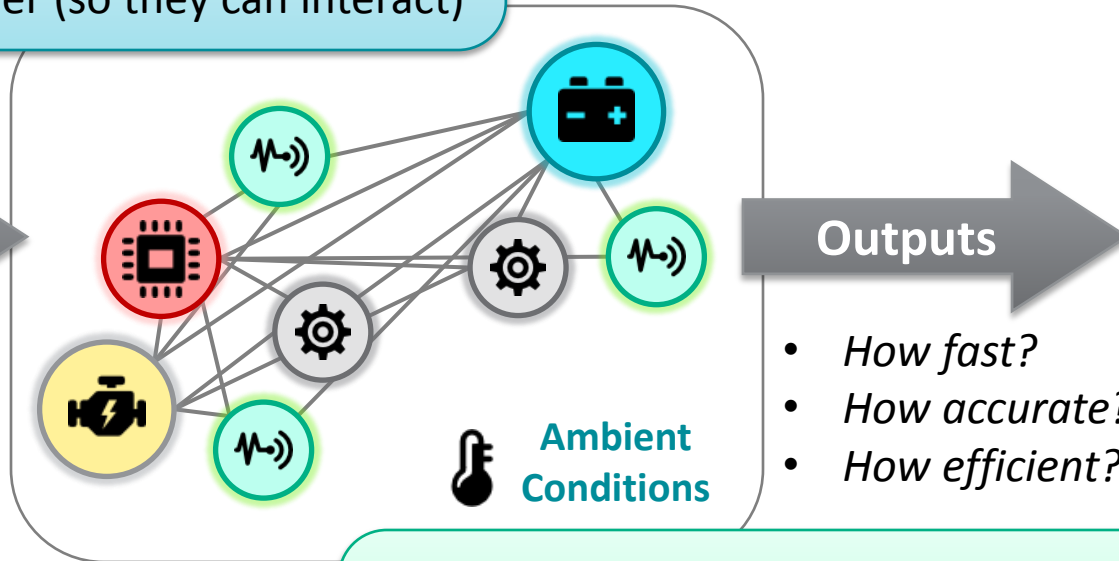
# Modeling & Simulating a System

## System Modeling

- Mathematical descriptions of behavior
- Captured in a formal modeling language
- Connected together (so they can interact)

## Inputs

- *Turn on / off*
- *Speed up*
- *Follow a Profile*
- ...



## Outputs

- *How fast?*
- *How accurate?*
- *How efficient?*

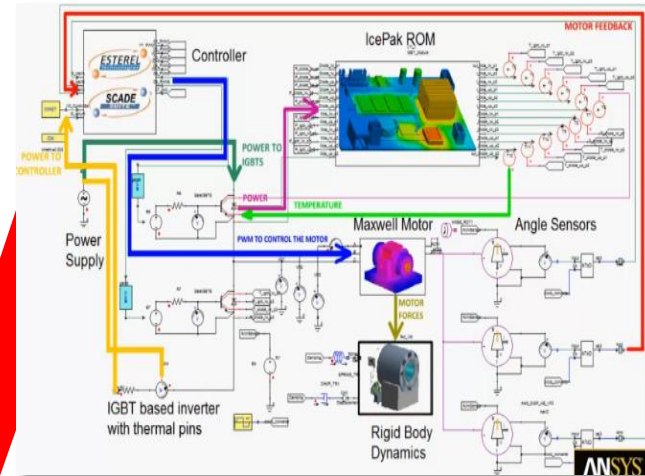
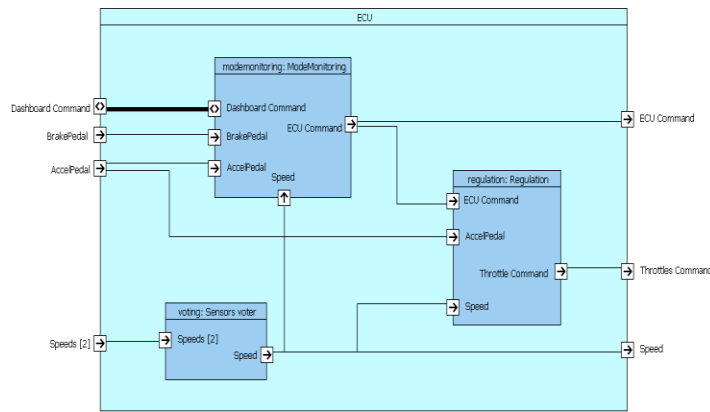
## System Simulation

- Injects inputs and sets conditions
- Calculates the response of the system
- Produces outputs to evaluate performance

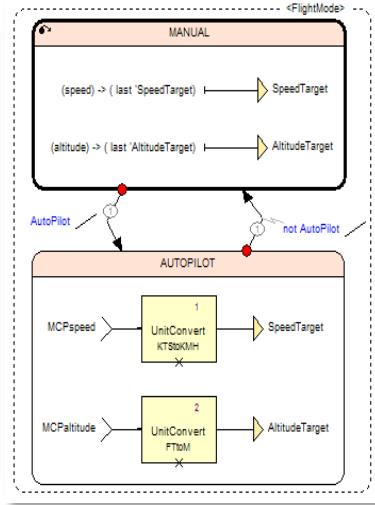
# Complete Model Based Engineering Solution

## Complete Virtual Prototypes of E/E Systems (Simplorer)

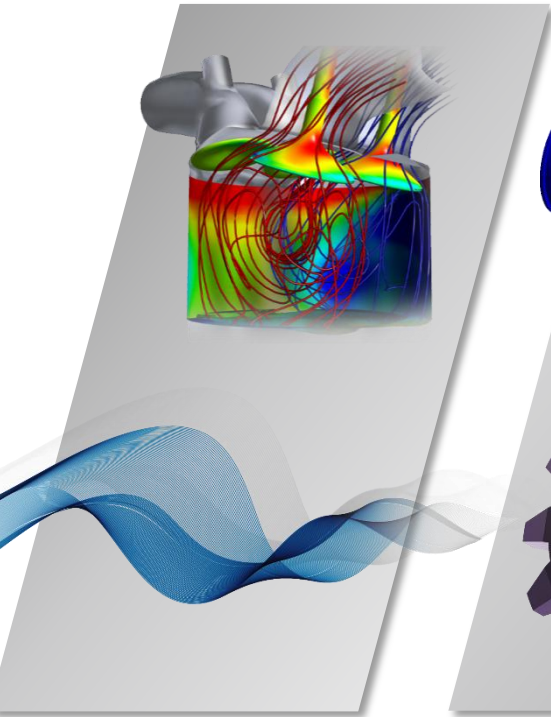
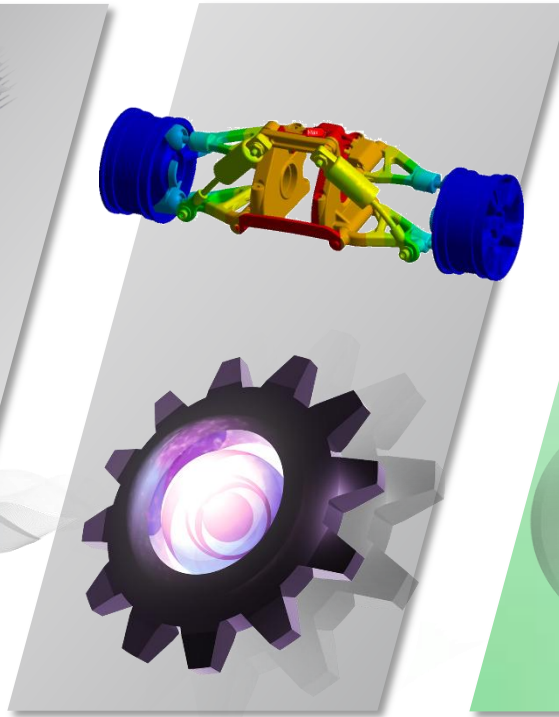
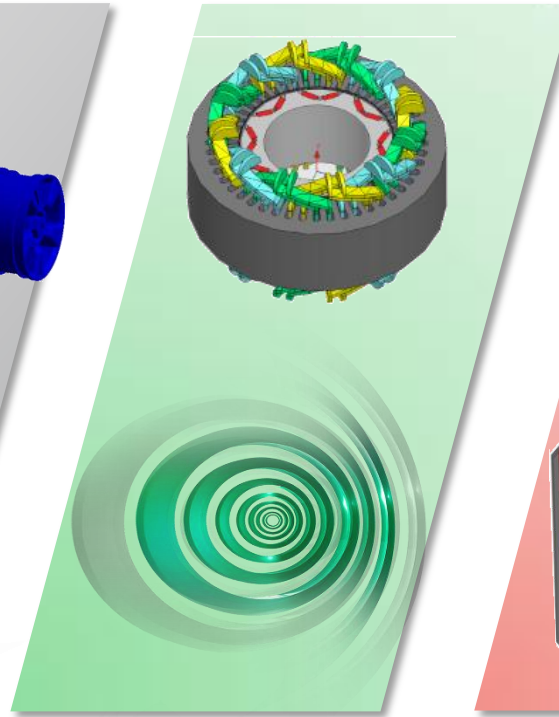
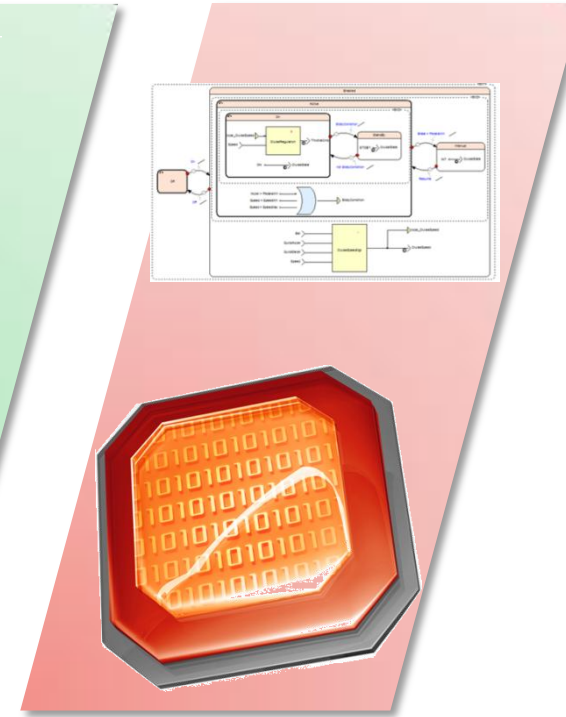
### Functional & Architectural Design (SCADE System)



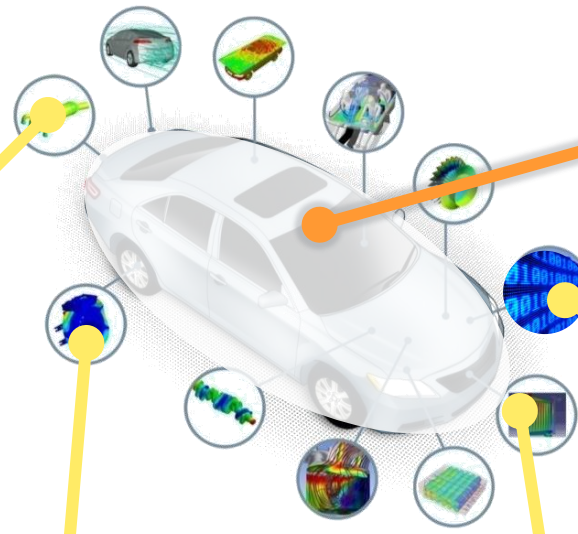
### Model Based Embedded Software Development (SCADE Suite, Display, Test & LifeCycle)



# Comprehensive Component-Level Design

**Fluids****Structures****Electronics****Software**

# ANSYS Solutions for Detailed Design



Need to optimize & verify interactions of multi-domain components and embedded software

**Fluids**

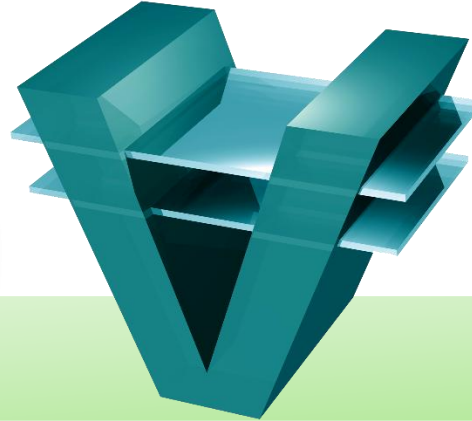
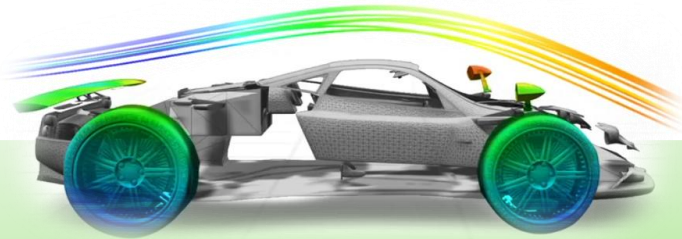
**Structures**

**Electronics**

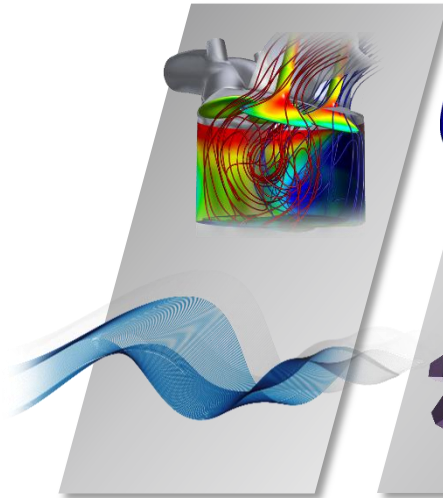
**Embedded Software**



# The Next Level: Virtual Prototypes of Complete Systems



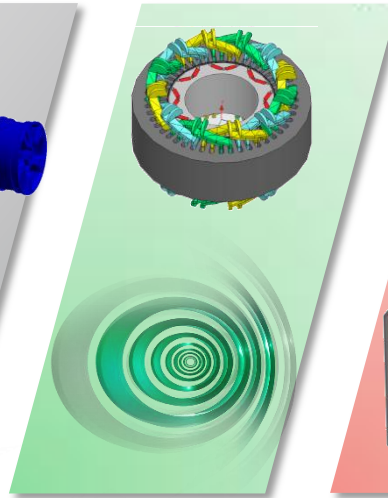
**Systems**



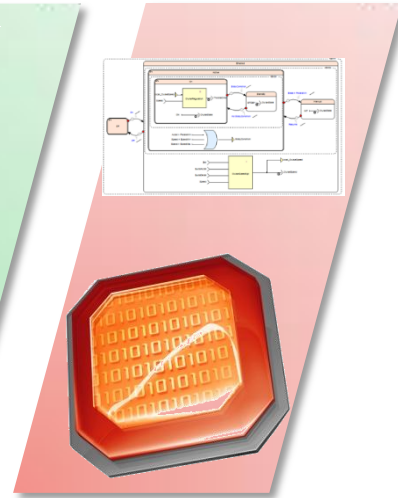
**Fluids**



**Structures**



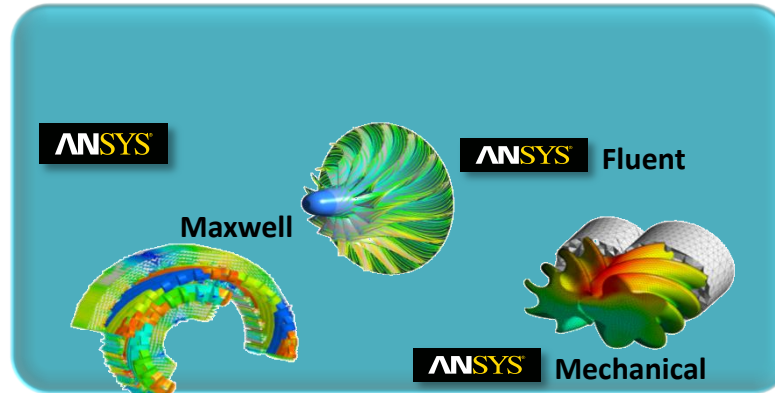
**Electronics**



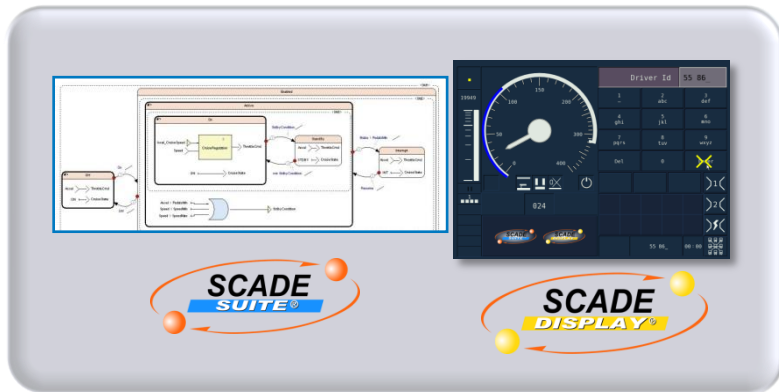
**Software**

# Our Systems Vision

## Detailed 3D Multiphysics



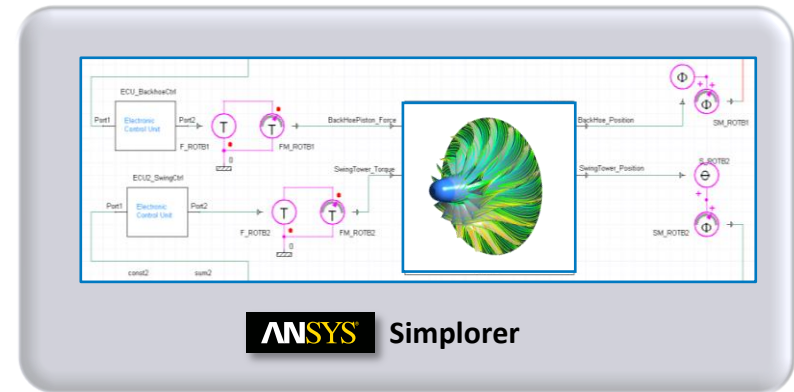
### Software Engineering



### ROM

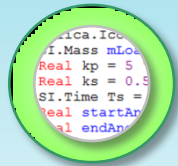


### System Simulation

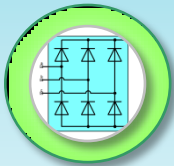


# Modeling the System

*Powerful Capabilities for Assembly and Reuse*



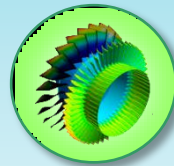
**Language-Based Modeling**



**Multi-Domain Model Libraries**



**Co-simulation with 3D Physics**



**Reduced Order Model Creation**



**Embedded Software Integration**



**Functional Mockup Interface (FMI)**



**VHDL-AMS**  
**C/C++**  
**SPICE**  
**SML**  
**Modelica**

Multi-Domain  
 Analog  
 Digital  
 Power Systems  
 Manufacturers  
 App-Specific

**ANSYS 3D Physics**

EM

Fluid

Thermal

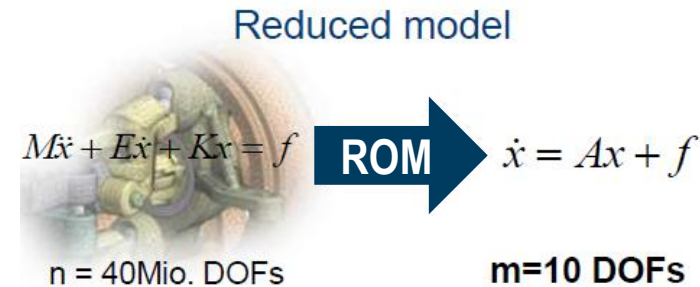
Mech

**ANSYS SCADE**

**Simulink**  
**C Code**

**3rd Party System Modeling tools**  
 (AMESim, Simulink, Dymola, GT Suite etc.)

# ROM Introduction



## The Webster Definition:

*A methodology to transform a high dimensional subspace of ordinary differential equations (typically arising from FEM, FVM, etc) with a low-dimensional approximation for the purpose of reducing solution time or solving a larger or more complex model.*

- The accuracy trade-off for ROMs is to obtain the time response of large systems which otherwise would be computationally impractical
- ROMs are compute and license intensive to create but very fast to simulate once they are built
- ROMs are design specific and multiple ROMs are required for a single design



# Modèles Réduits

## Philosophie

**Construire le modèle de plus petite dimension qui capture l'effet dominant du système étudié**

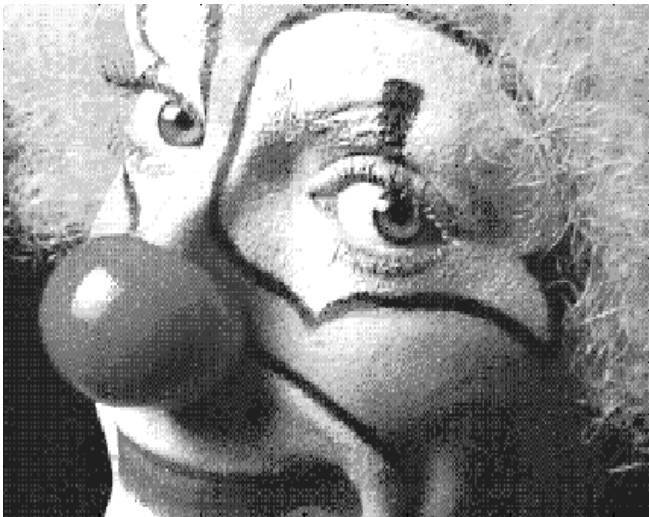
## Ce n'est pas:

- **Le modèle le plus simple**
- **Un modèle à fidélité variable**
- **Le modèle ayant le maillage le plus grossier**
- **Un modèle obtenu par sous-structuration**

# Modèles Réduits

## Philosophie

Construire le modèle de plus petite dimension qui capture le comportement dominant du système en projetant le modèle haute fidélité sur un sous-espace bien choisi



# Three Types of ROM Usage

## ROM Usage Types

### Single Discipline ROMs

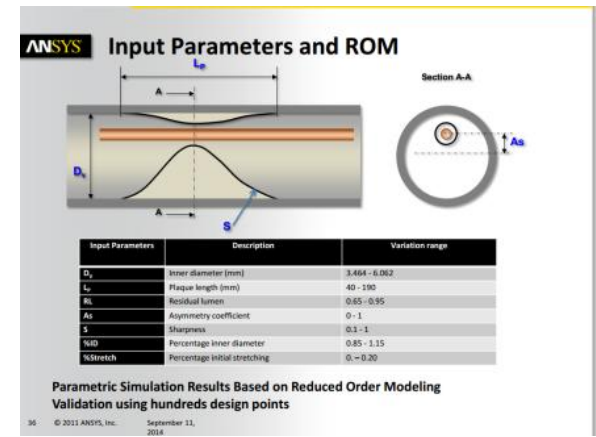
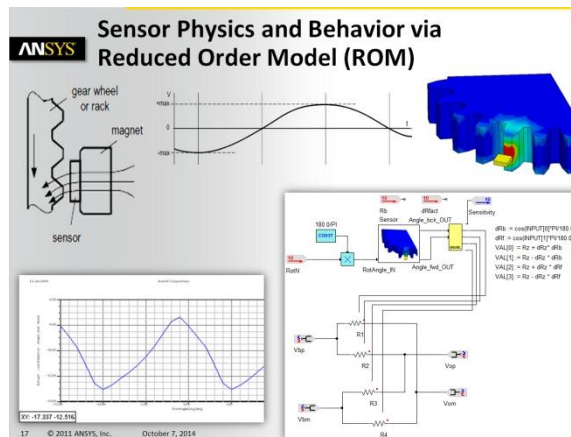
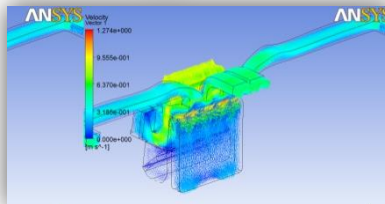
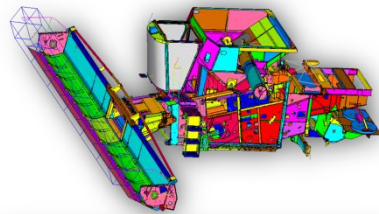
A system of ROMs which are largely homogeneous with respect to an engineering discipline, e.g. mechanical, electronics, or thermal management.

### System Simulation ROMs

A system of interconnected heterogeneous ROMs (and other component models) where both the system and interface responses are of interest.

### Simulation Democratization ROMs

A ROM created for non-traditional users to explore the design space. System response and internal field data if of interest.



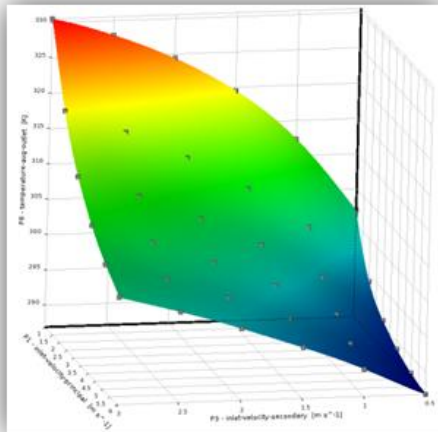
Electronics Example

# Methodology - Design of experiments

Table de Schéma B2: Plan d'expériences (Personnalisé + remplissage : Nombre total de points = 20)

1	A	B	C	D	E	F	G	H	I	J
	Nom	P1 - inlet velocity principal (m s <sup>-1</sup> )	P2 - inlet temperature principal (C)	P3 - inlet velocity secondary (m s <sup>-1</sup> )	P4 - inlet temperature secondary (C)	P5 - pressure drop principal (Pa)	P6 - pressure drop secondary (Pa)	P7 - tempera... max -outlet (C)	P8 - tempera... avg-outlet (C)	P9 - temperature point-outlet (C)
2	1	3,5	5	3,5	60	13024	12850	321,67	296,4	319,76
3	2	5,9006	9,6517	1,1516	79,393	8165,6	10938	330,88	290,47	330,48
4	3	5,7226	0,027105	1,0477	78,264	7313,6	9808,1	326,15	281,3	325,7
5	4	5,6995	0,32343	1,2792	40,448	8886,2	11851	301,85	278,32	301,63
6	5	1,2177	9,7172	5,7538	40,102	11945	5939,5	307,67	302,93	296,64
7	6	5,4229	9,9254	5,9732	79,814	34653	32514	338,08	310,26	335,27
8	7	5,9893	0,14884	5,8574	76,168	37042	36532	333,68	300,98	331,42
9	8	1,1292	9,4721	1,0421	77,542	1260,7	1282	335,86	306,4	332,91
10	9	5,9489	9,8079	5,7246	42,337	35913	35971	309,26	294,9	308,25
11	10	5,722	9,6062	1,1193	41,703	7700,1	10306	304,89	286,29	304,71
12	11	1,1901	8,7326	1,088	40,263	1384,9	1413,1	306,55	292,83	305,21
13	12	1,318	0,23442	5,564	40,576	11810	6114,3	305,1	299,39	292,52
14	13	1,5358	0,47407	5,7694	79,703	13473	7258,7	335,08	323,43	313,71
15	14	5,8859	0,42115	5,8085	40,941	36142	35419	305,42	288,36	303,79
16	15	1,2046	0,29695	1,0611	47,395	1365,3	1410,1	310,35	289,46	308,45
17	16	1,1244	9,576	5,693	79,866	11330	5515,4	341,18	329,82	313,97
18	17	1,8403	1,2284	1,1031	78,849	2155,8	2484	335,99	295,12	334,71
19	18	5,6622	5,1409	3,4435	79,261	20332	23548	337,52	298,35	336,7
20	19	5,9416	5,229	1,0888	60,731	7880,8	10579	315,97	284,15	315,65
21	20	3,4149	9,8548	3,2845	77,009	11885	11912	338,06	307,16	333,69
*	Nouveau point de conception									

The values of **output parameters** as a function of **input parameters** are obtained on the **design points** defined in the **design of experiments**

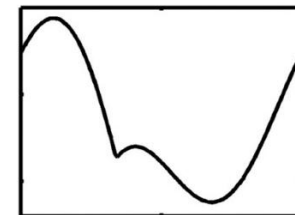
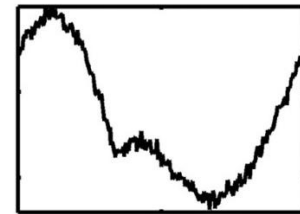


In order to get the values of **output parameters** for any value of the **input parameters**, ANSYS DesignXplorer gives access to a large number of **interpolation methods**

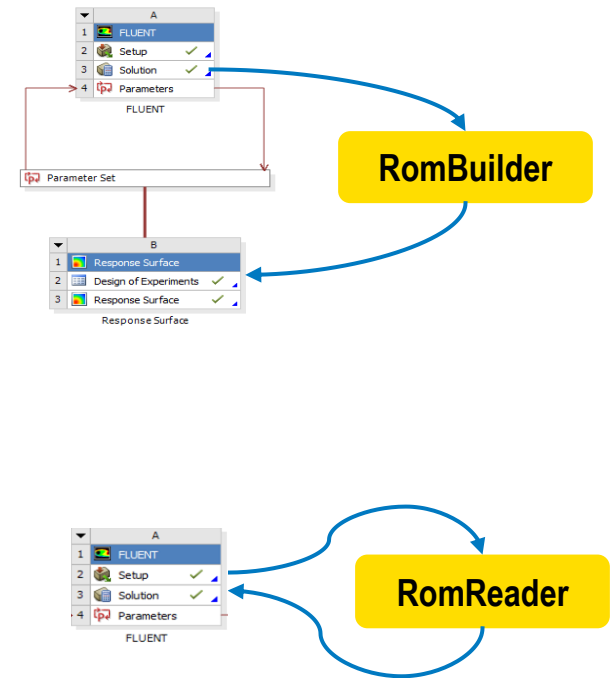


# ROM Technology - A new approach

- We will propose you a different usage of the calculations done to overcome today's limitations
- **Data compression and interpolation based on Singular Value Decomposition (SVD)**
- SVD works more or less like a Fourier Reconstruction of a signal :
  - The model is a summation of modes
  - The lower modes contains most of the signal energy
  - The higher modes contains noise



- Two working stages :
  - Offline stage: from a few calculated design points, it is possible to extract a few solution modes (from SVD)
  - Online stage: for any given parameter values of the DoE, the full solution can be “instantaneously” shown as a linear combination of the basis modes



# RomBuilder - The general model - POD

- The solution  $U$  is expressed as :

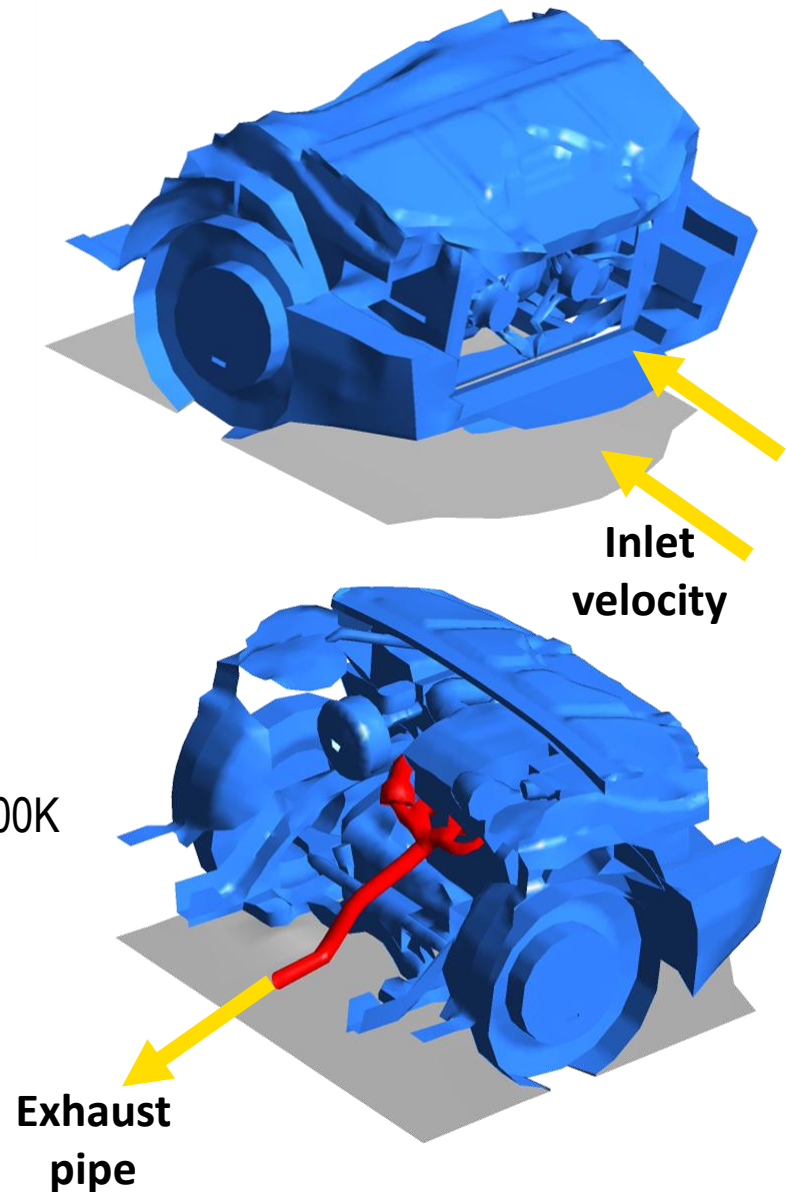
$$U(\mu) = \sum_{i=0}^n x_i(\mu) Q_i$$

where:

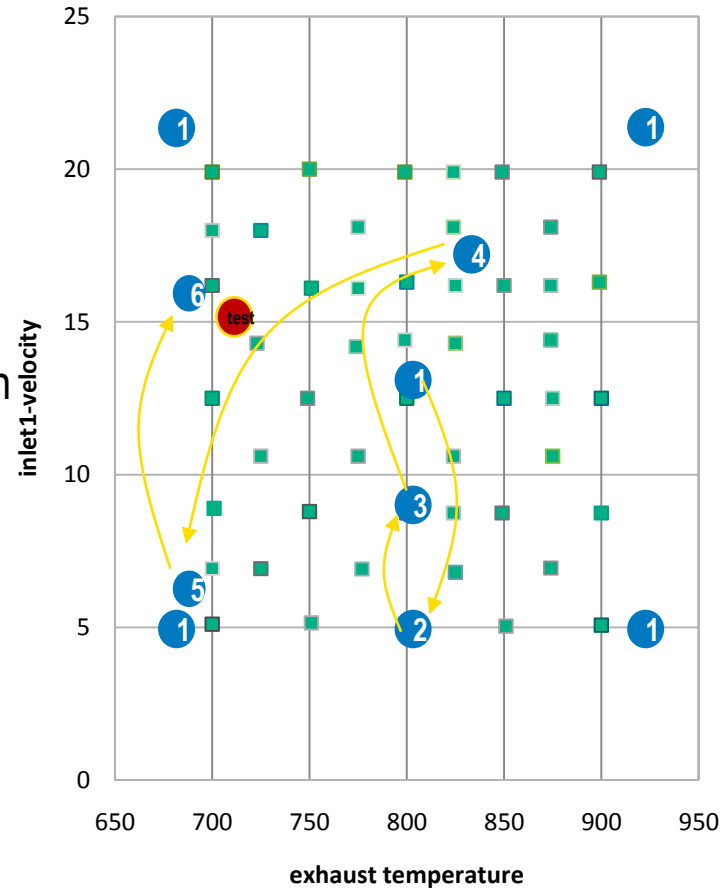
- $n$  is the size of the reduced basis
- $Q_i$  is the  $i$ th element of a reduced basis
- $x_i$  is the corresponding coefficient
- $\mu$  is the parameters vector, it may include the time for 4D models

# Generic underhood test case

- 3D thermoaerodynamic coupled with radiation
- DO model for radiation
- 500,417 tetraedral cells without boundary layers
- Standard k-e model with standard wall-functions
- 2 parameters :
  - Inlet velocity from 5 m/s to 20 m/s
  - Exhaust Temperature from 700K to 900K

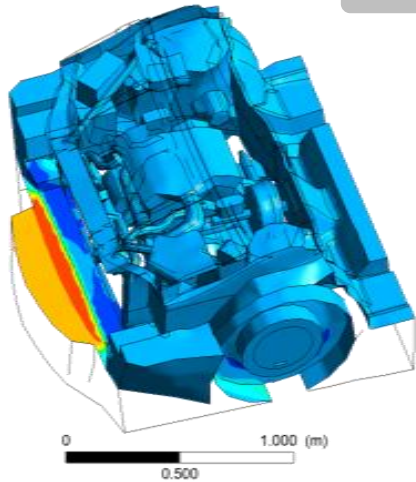
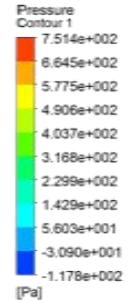


- 50 calculation were done
  - 10 were used to create the model
  - 40 other were made to verify its precision
  - ROM Model creation is 9 seconds
  - ROM Model is precision is access by comparison with the 40 verification points
  - Average error on velocity : 0,06 m/s
  - Average error on temperature : 0,49 K
- 
- Quantitative differences in between Fluent calculation and ROM model are presented on the worse verification point

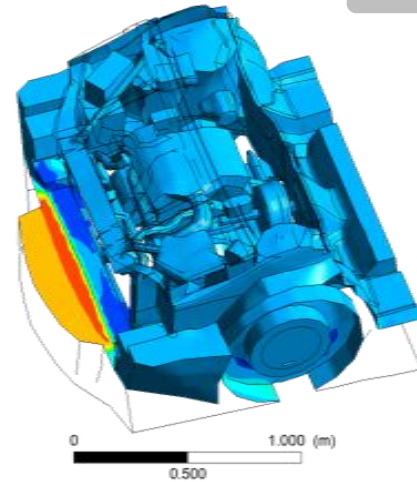
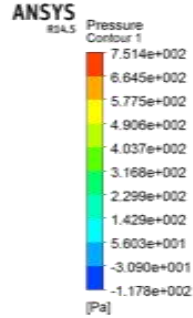




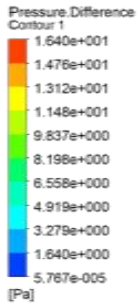
# Static Pressure Comparison



Fluent

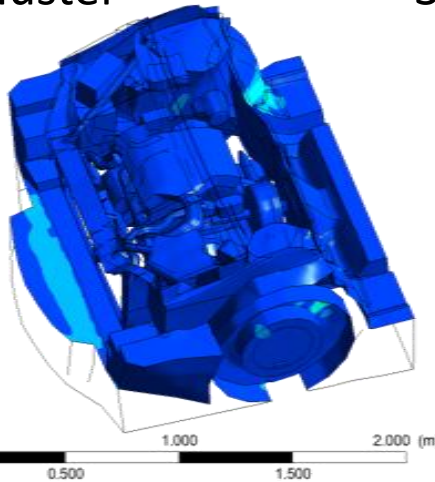


ROM



Absolute Difference

2 hours on 16 cores cluster



3 seconds on this laptop

$$T_{\text{exhaust}} = 723\text{K}$$

$$V_{\text{car}} = 14,3\text{ m/s}$$

# Methodologies - Summary

- **DOE + meta-modeling techniques (response surface, Kriging, ...) including the non-linear scalar case.**
- **Linear Case – LTI method (modal approach – Linear Time Invariant)**
- **LTI + LPV (Linear Parameter Varying)**
- **Modal approach for non-linear steady-state case (intrusive) + limitation to quasi-linear transient case**
- **Parametrized field-data compression and interpolation**
- **Research on transient ROM building methods during a learning transient simulation**

# ROM open door to future Design Exploration



Fluids

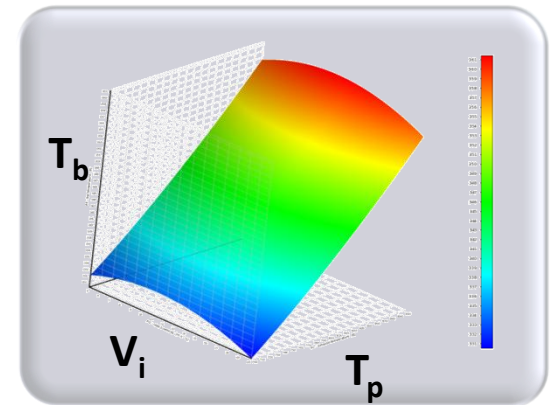
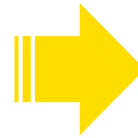
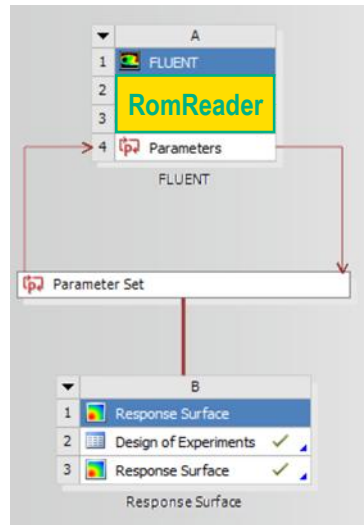
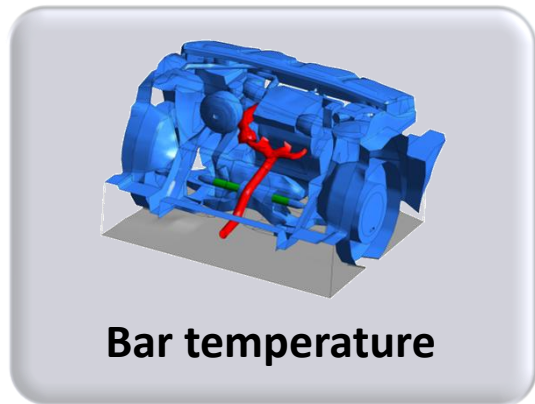
Structures

Electronics

Systems

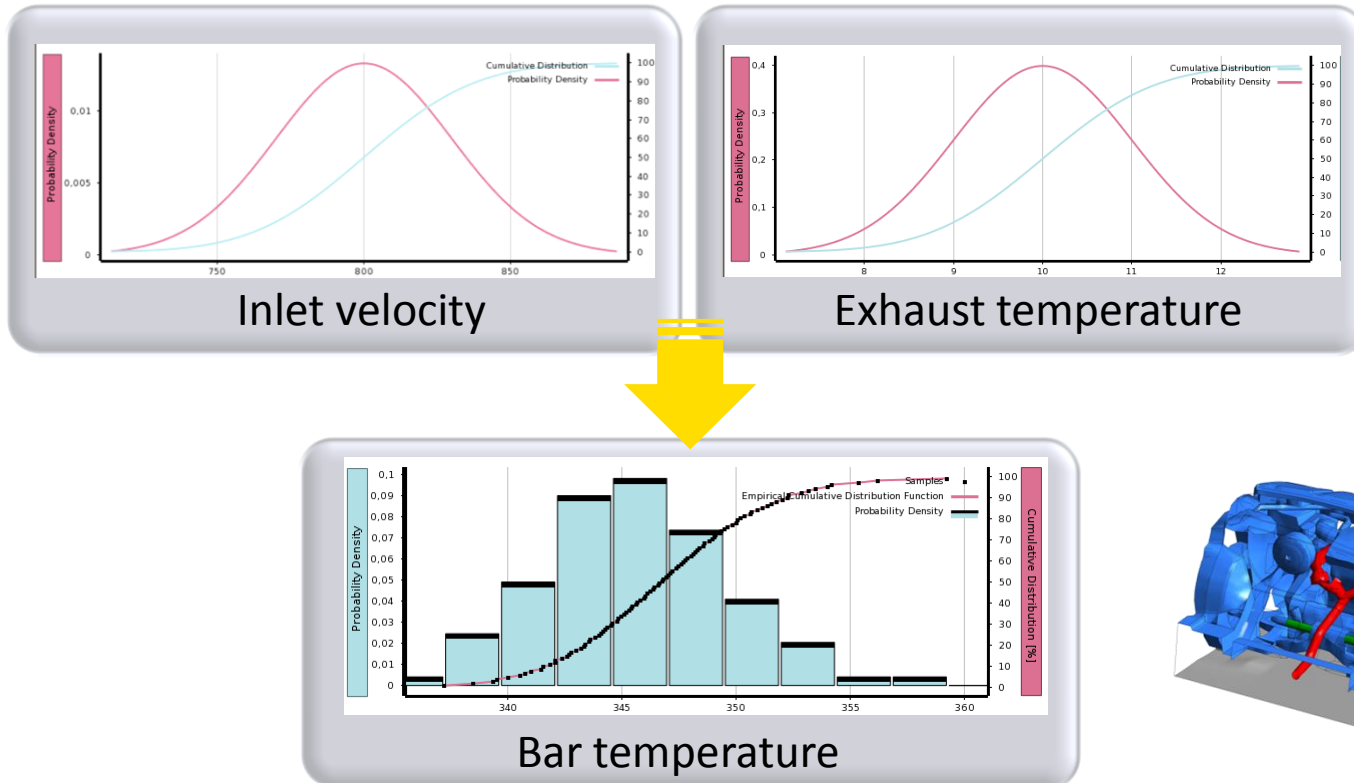
# Rom can replace solver everywhere

- Fluent is used as a platform for the created ROM
- With 10 points classical composite design :
  - 21 hours on 16 cores with Fluent Solver
  - 9 minutes on one laptop with ROM



# 6 $\sigma$ in Design Explorer

- Fluent is used as a platform for the created ROM
- 2 normal distribution on input parameters :
  - 23 hours on 16 cores with Fluent Solver
  - 13 minutes on one laptop with ROM





# ROMs-Based Systems Models Industrial Applications



Fluids

Structures

Electronics

Systems

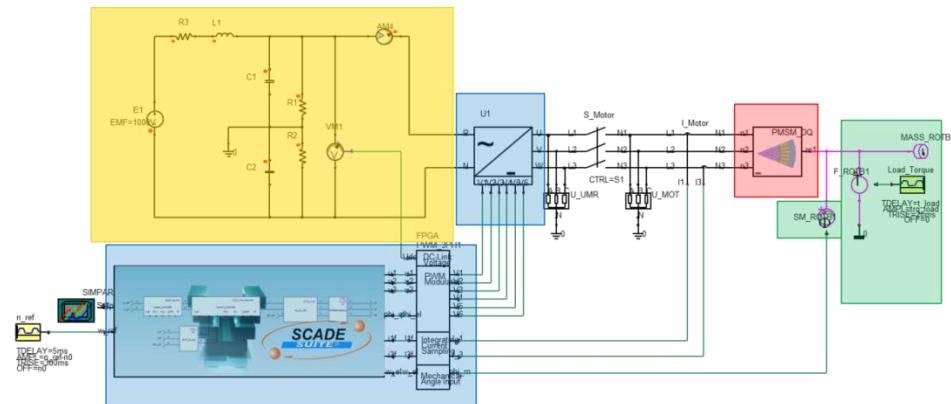
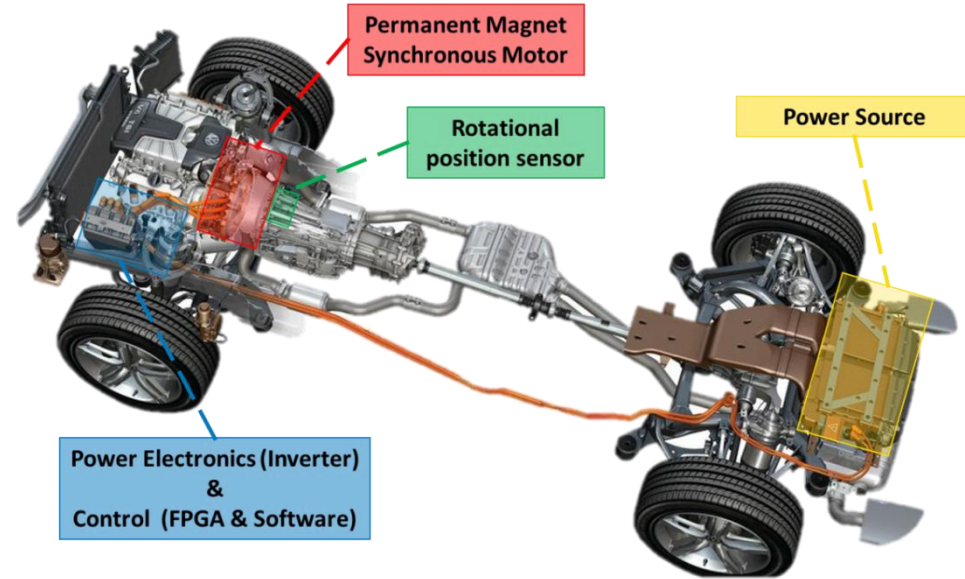
# Hybrid Electric Powertrain Control

## Key System-Level Models

- **Maxwell:** Permanent magnet synchronous machine extracted as ROM
- **Q3D:** high-voltage bus bar parasitics
- **SCADE:** Motor control software
- **Simplorer:** High-power electronics (inverter), behavioral multi-domain sensors

## System-Level Value

- Evaluate architectural selections and component choices to optimize fuel economy and cost
- Verify control strategies and calibrate control parameters
- Assess system reliability (worst-case analysis, fault injection)

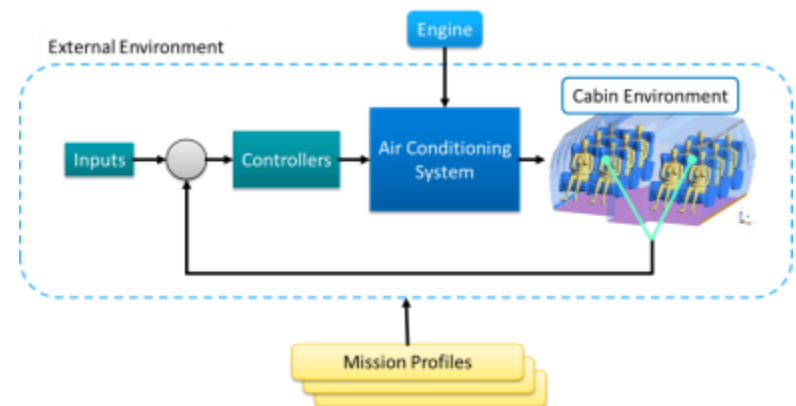
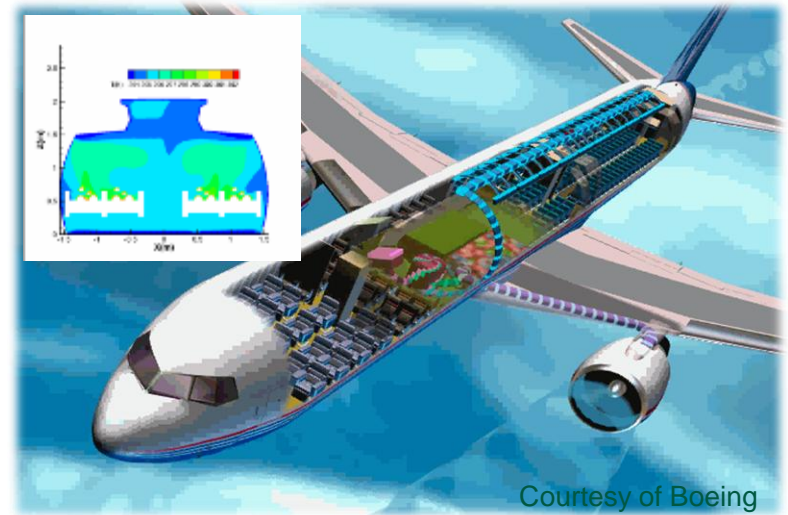


## System-Level Objectives

- Optimize component selection, sensor placement, and control strategies to improve fuel efficiency (lower emissions)
- Tune & optimize controller parameters to improve passenger comfort across a range of mission profiles and conditions

## Key System-Level Models

- **Fluent**: Detailed cabin airflow model extracted as ROM
- **SCADE**: Cabin pressure / temperature control software
- **Modelica**: A/C system components (actuators, sensors, etc.)
- **Simplorer**: External conditions, mission profiles



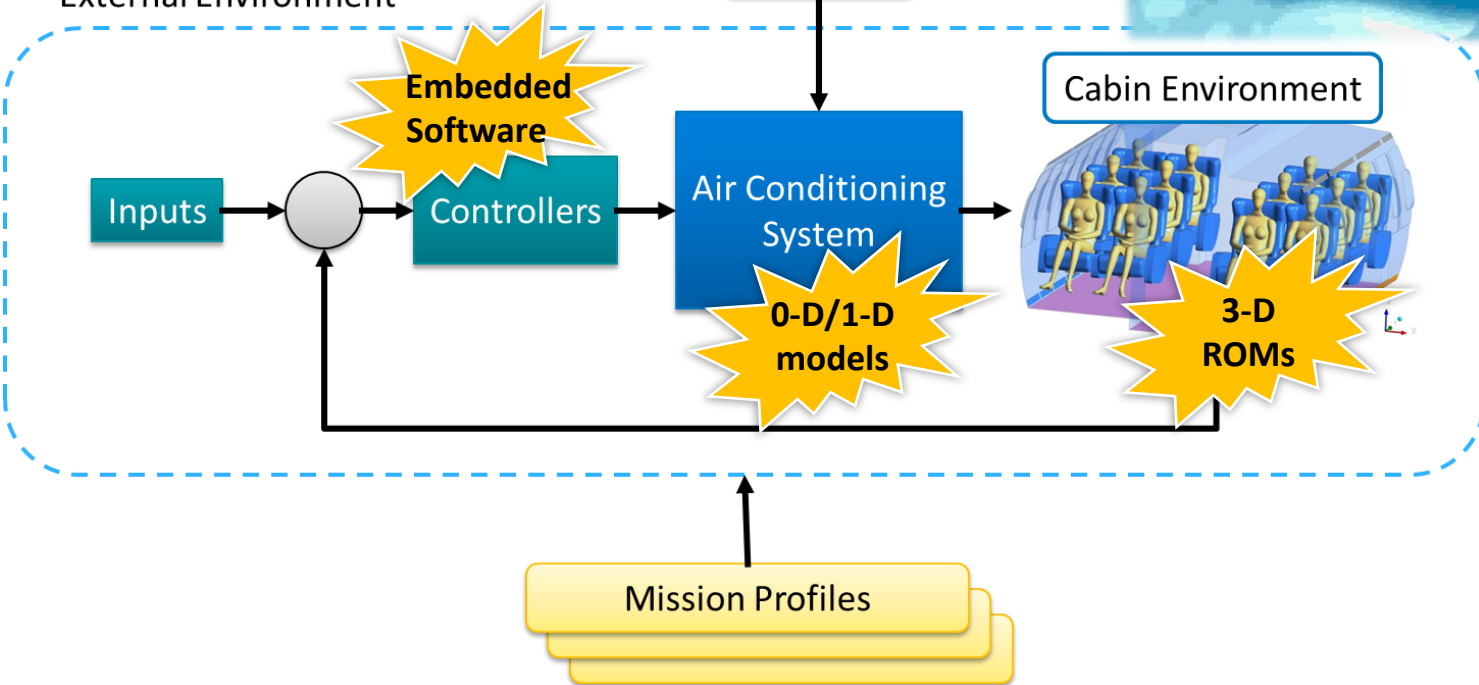
# Complete System Virtual Prototyping

## *Environmental Control Systems*

Optimize component selection, sensor placement, and control strategies



External Environment



# Electromechanical Flight Controls

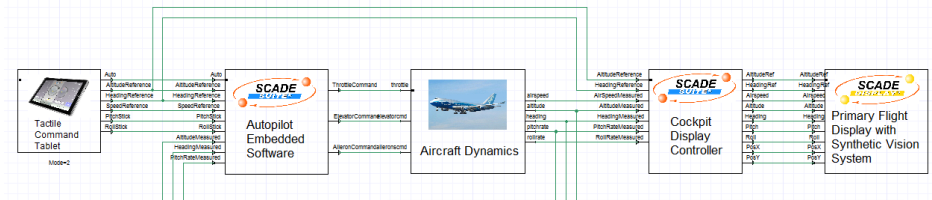
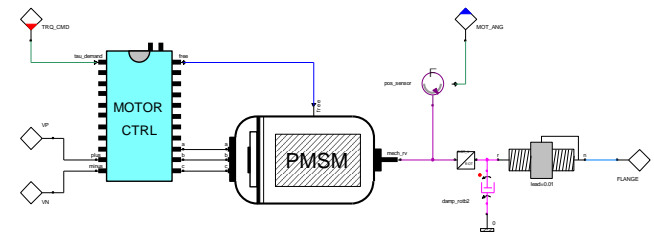
## Key System-Level Models

- **Maxwell:** Permanent magnet synchronous machine extracted as ROM
- **SCADE:** Autopilot control software, cockpit display
- **Simplorer:** Behavioral multi-domain sensors, mechanical assemblies



## System-Level Value

- Verify control strategies and calibrate control parameters
- Optimize performance and robustness to external disturbances
- Assess system reliability (worst-case analysis, fault injection)



### Other Electrified Aircraft Systems:

- Electric Green Taxiing
- Electric Braking
- Electric Engine Start

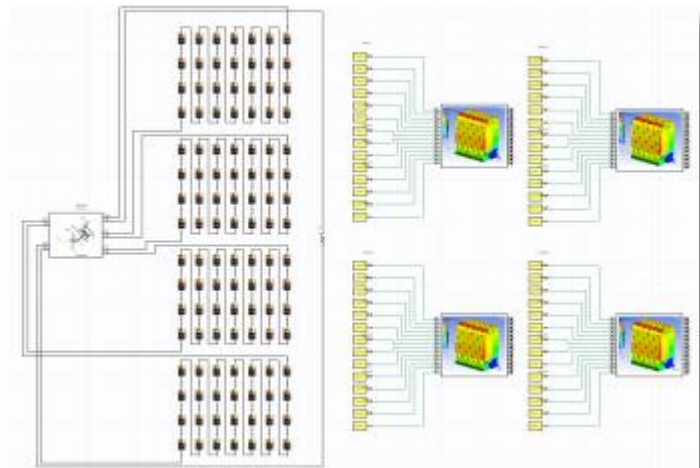
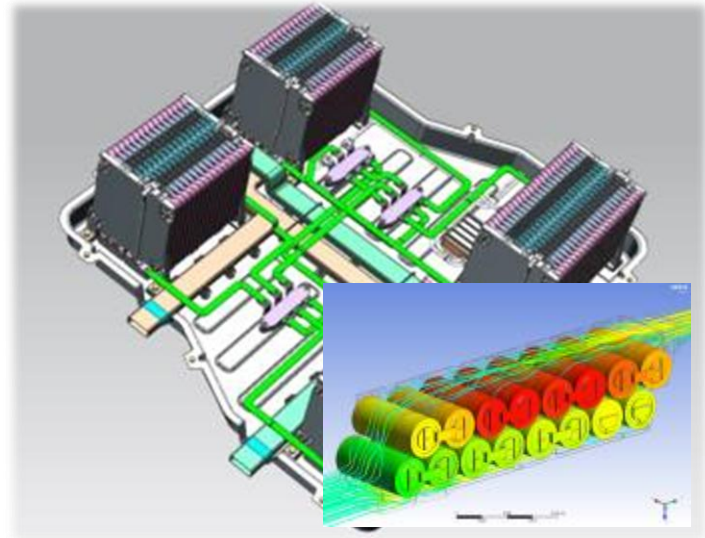


## System-Level Objectives

- Predict and optimize battery life based on electrical and thermal performance
- Assess battery pack safety across a range of mission profiles

## Key System-Level Models

- **Fluent**: equivalent electrical circuits and thermal behavior of cells extracted as ROMs
- **Modelica**: ...
- **Simplorer**: Electronics and multi-domain sensors
- **SCADE**: Power management and control

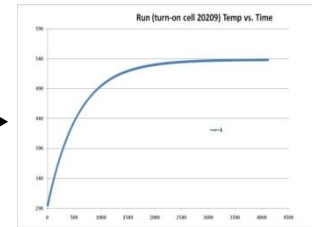
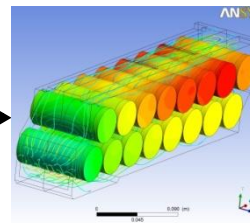
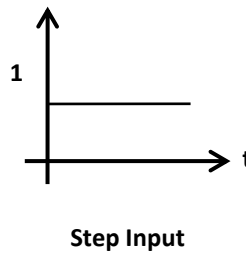
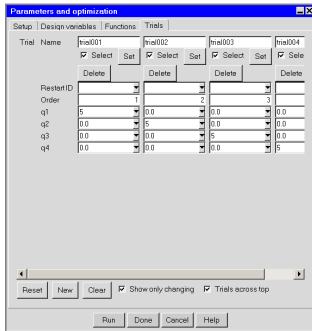
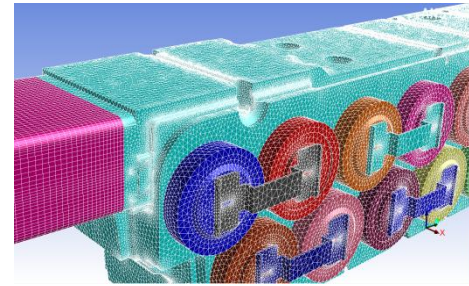




# Model Order Reduction Creation

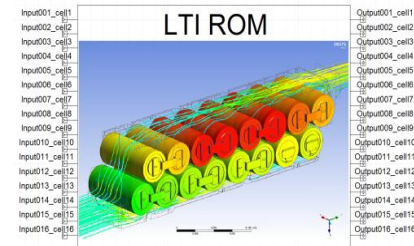
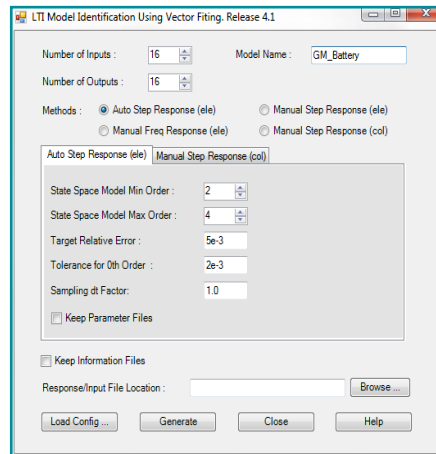
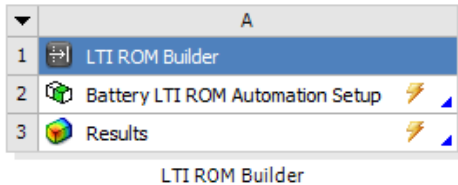
→ Create CFD Model

→ Generate Step Responses



Step Response

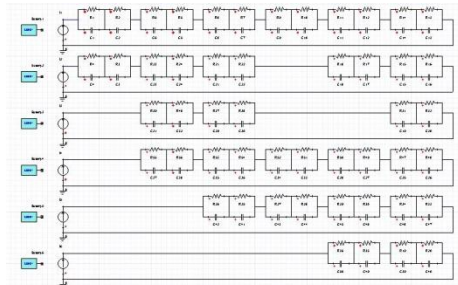
→ Extract ROM



# Model Order Reduction Types

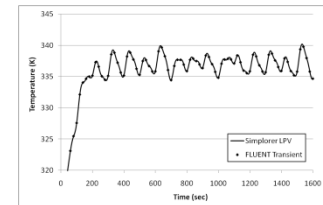
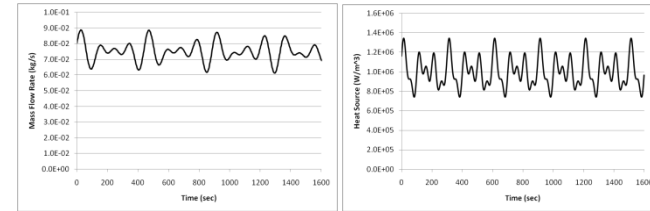
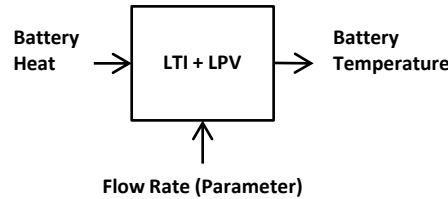
## → Foster Network – LTI (Linear Time Invariant)

- Average or local temperatures
- One single flow rate
- Physical comprehension



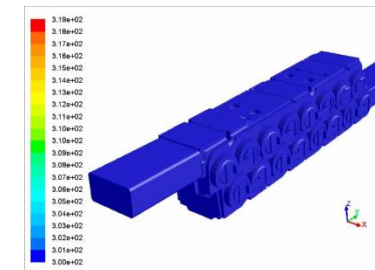
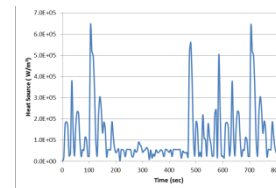
## → LTI+LPV (Linear Parameter Varying) ROM

- Average or local temperatures
- Varying flow rates

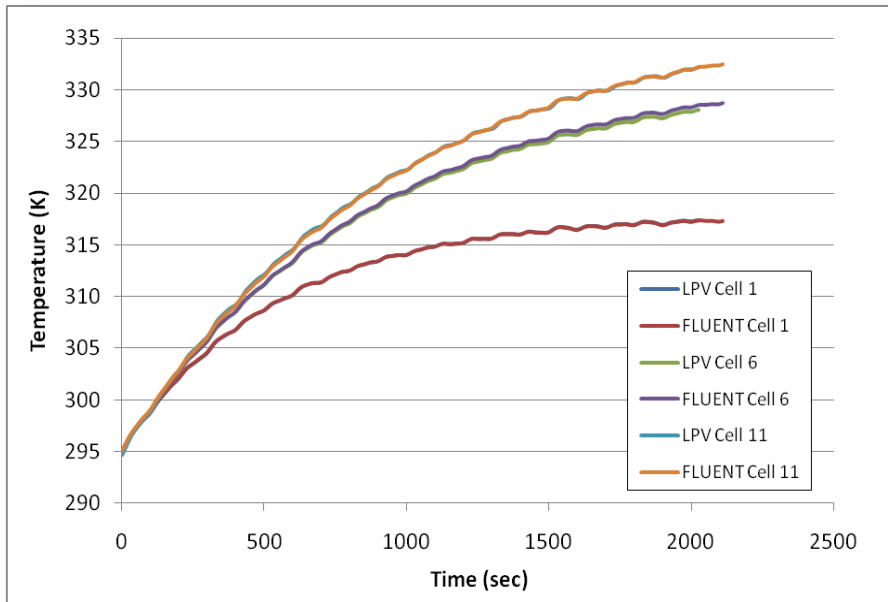
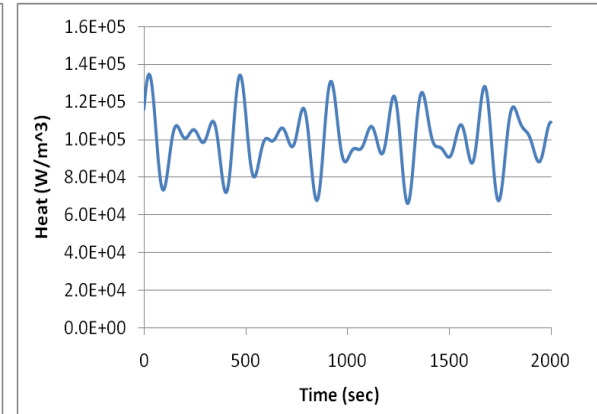
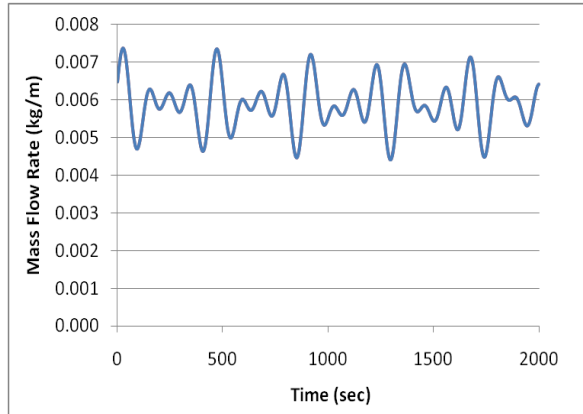
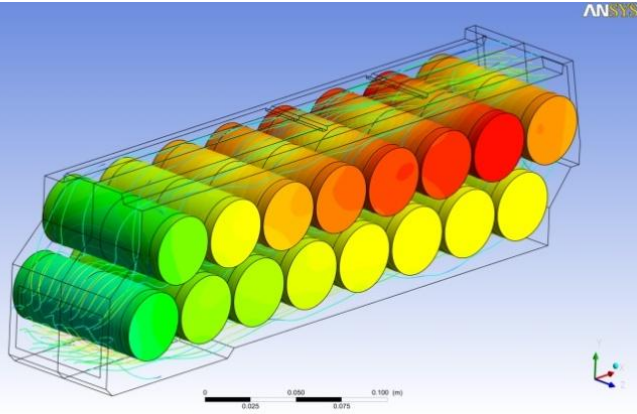


## → SVD (Singular Value decomposition)

- allows for quick temperature distribution



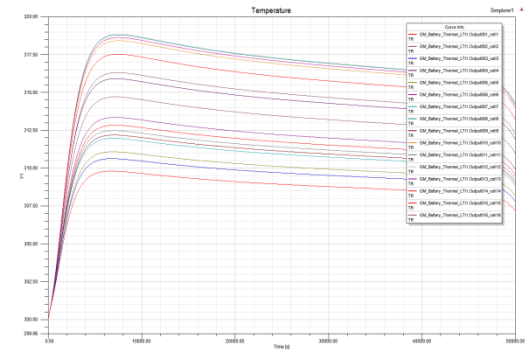
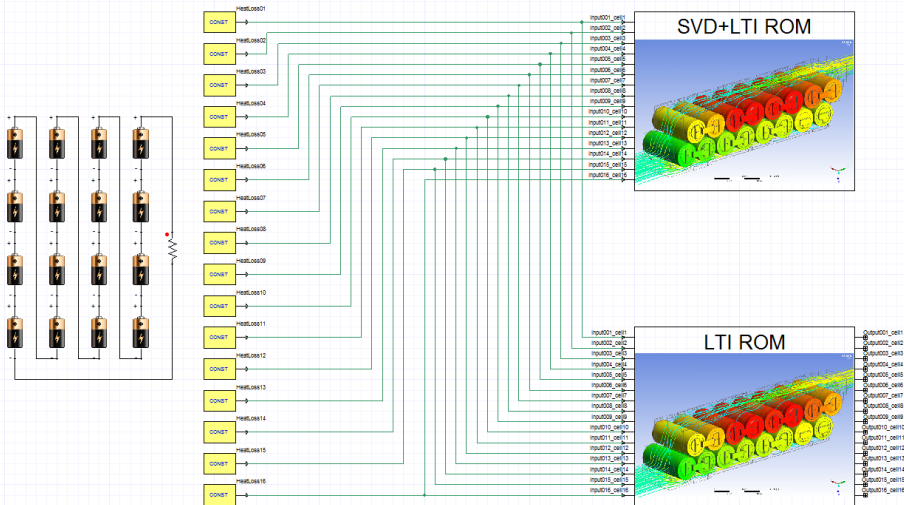
# LPV ROM for GM Battery Module



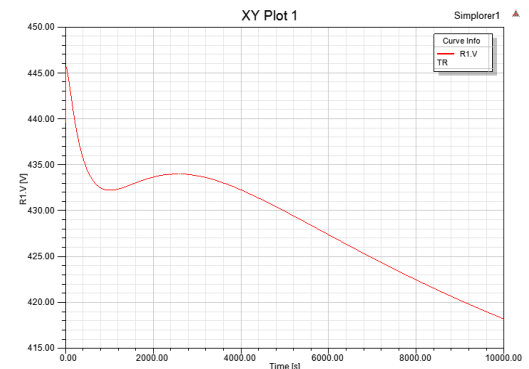
The model gives similar results as CFD. The model runs in less than 20 seconds while the CFD runs a couple of days on 6 CPUs.

# GM Battery Module – ECM Coupled with ROMs

- ECM calculates heat source and sends it to the two ROMs
- LTI ROM calculates average temperature and sends it to ECM
- SVD+LTI ROM calculates temperature distribution

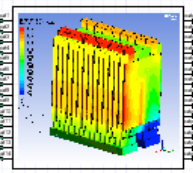
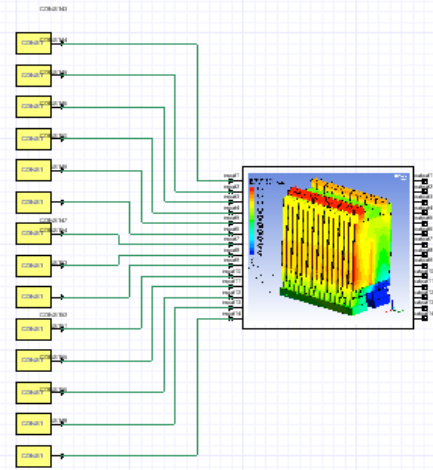
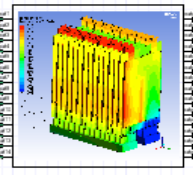
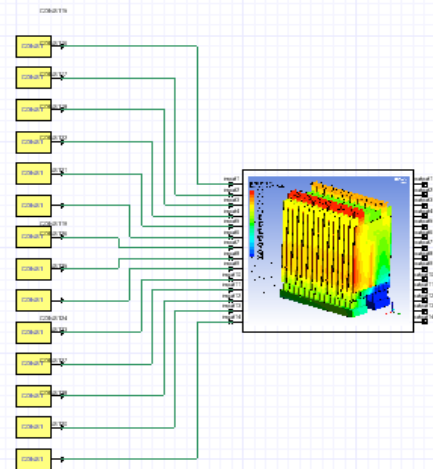
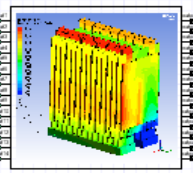
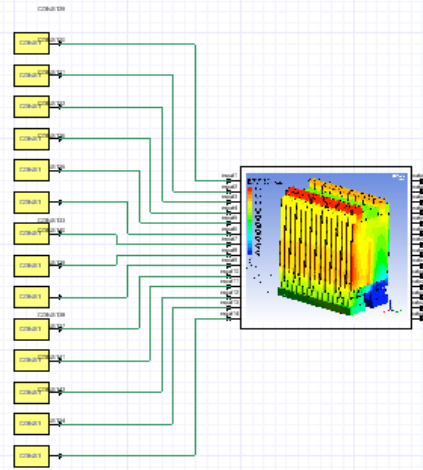
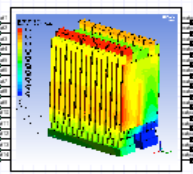
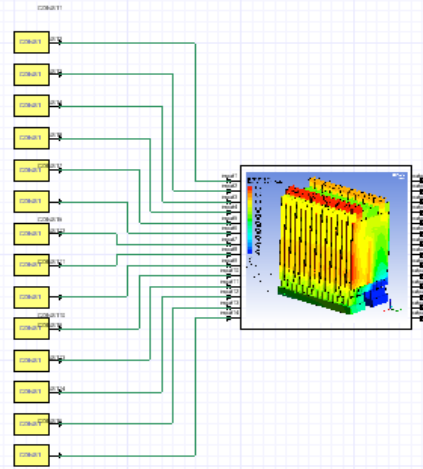
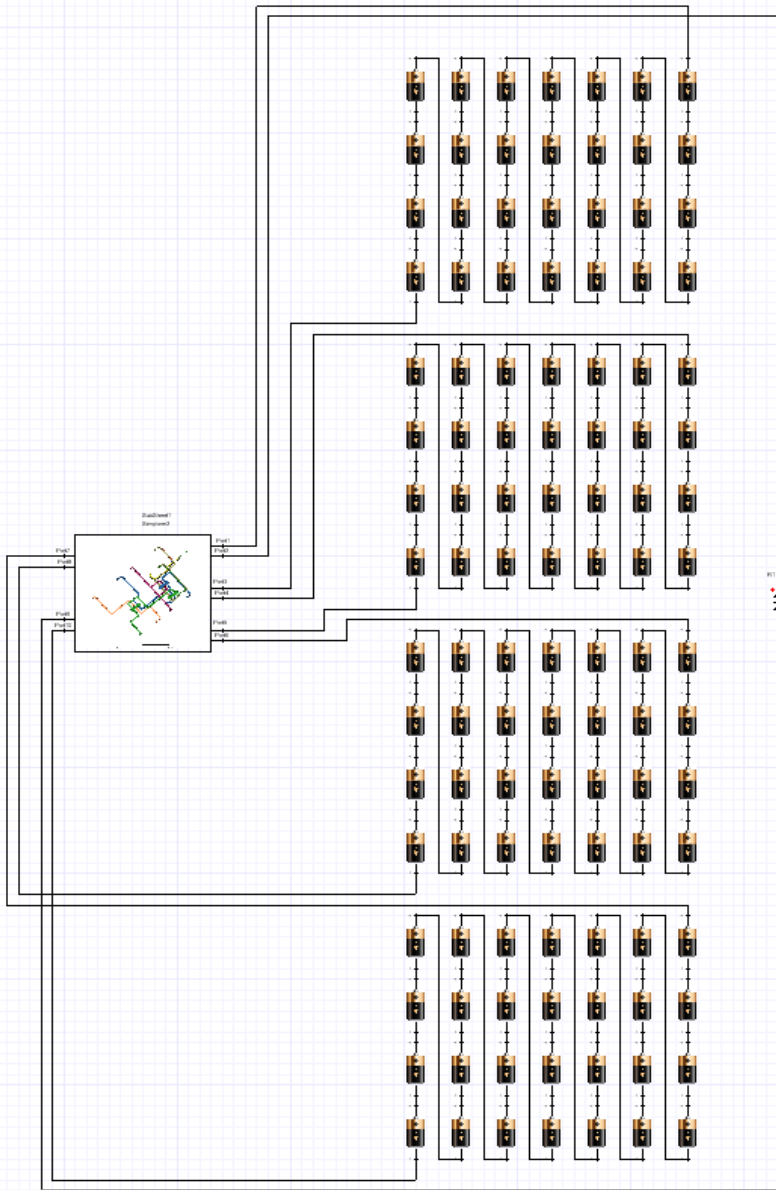


Average Cell Temperature




Battery Voltage as a Function of Time

# Full Battery Simulation



# Full system simulation



Fluids

Structures

Electronics

Systems



# Hybrid Electric Vehicle (HEV) Example

## System Modeling with ROM Models

Compiled Control

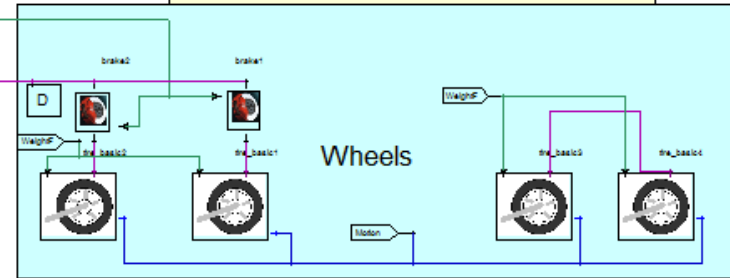
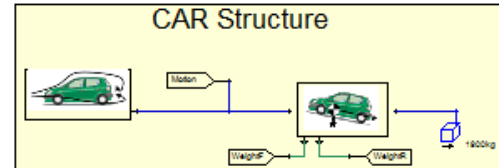
Electronic Control Unit



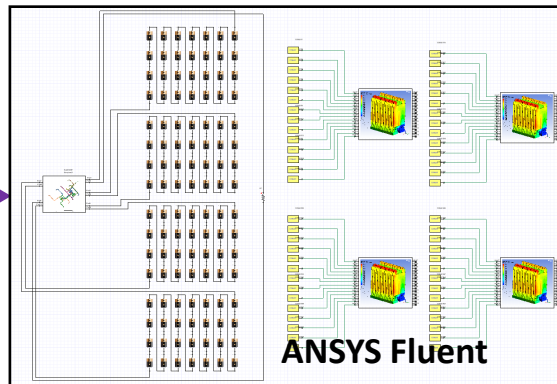
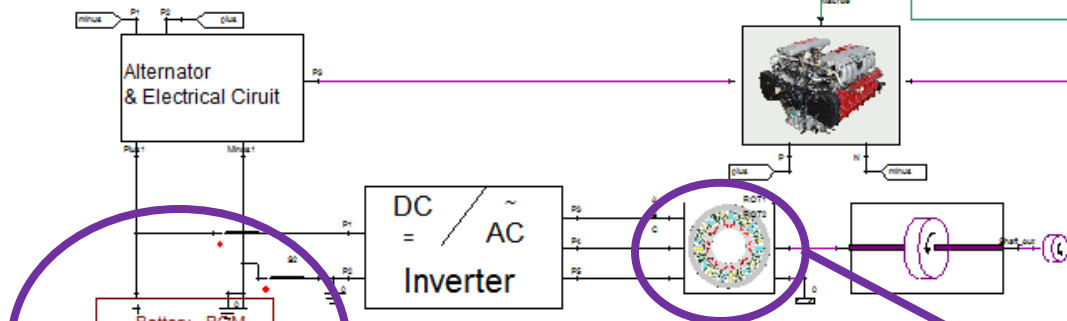
Driver



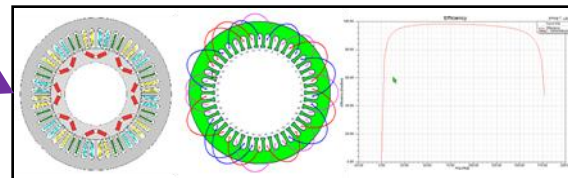
CAR Structure



Wheels



ANSYS Fluent



ANSYS RMxprt

# Summary

Control software modeling is achieved by using a **formally defined deterministic notation**

Embedded software implementation is performed by using a **ISO 26262 qualified toolchain**

**Multi-disciplinary simulation (electrical, mechanical, fluid, software):**

- Through appropriate languages (VHDL/AMS, Modelica, SCADE)
- In an appropriate environment (Simplorer)
- Via appropriate interfaces (FMI, 2D & 3D ROMs)

**Multi-order simulation** is performed via coupling with 3D co-simulation and reduced order models (ROM)

Multi-physics & software model **performances can be optimized via batch simulation campaigns**