

The DENSO logo is written in a bold, italicized, red sans-serif font.

Crafting the Core

Smart Thermal Management

Meet & Greet met KIVI Duurzame Technologie 2024

20/03/2024

Sebastian Visser

Head of Department / Senior Manager

Mobility Energy Systems / Energy Systems R&D

Agenda

1. Introduction
2. Smart Thermal Management
 1. Prediction (Connectivity)
 2. Global coordination (Supervision)
 3. Local optimization (AI Optimisation)

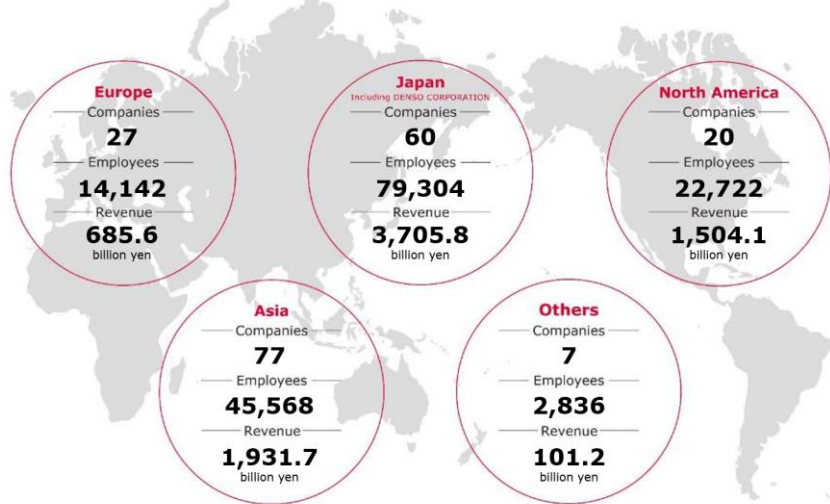
1

Introduction

DENSO and the Battery Energy Vehicle Approach

DENSO Global Overview

Employees: ~165.000

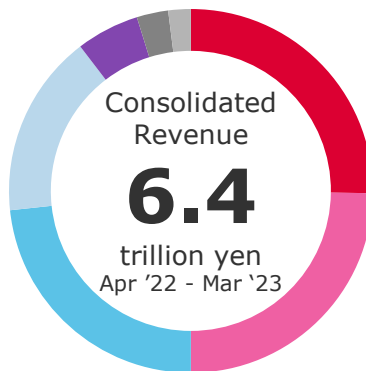


† revenue include adjustments between segments.

As of March 31, 2023

Revenue: ~ 40 Billion Euro

- Sensor, Semiconductor
- Non-automotive Business (Factory Automation / Agriculture, etc.)
- Other Automotive



- Thermal Systems
- Powertrain Systems
- Electrification Systems
- Mobility Systems



Electrification Systems: Supporting electrification in all areas of mobility to realize an enriched environment and the joy of driving



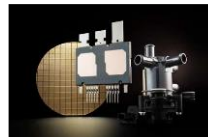
Powertrain Systems: Providing solutions that help overcome the seemingly contradictory task of balancing the joy of driving with superior environmental performance



Thermal Systems: Providing safe, comfortable systems that use the least amount of energy possible in consideration of the environment



Mobility Systems: Aiming to realize Quality of Mobility so that all people can enjoy mobility safely and comfortably



Sensor Systems & Semiconductors: Pioneering the industry through semiconductor and sensing technologies to realize an eco-friendly, comfortable, and safe mobility and society.



Industrial Solutions: Enhancing the productivity of the manufacturing industry and contributing to an improved quality of life with a commitment to our long-cultivated technologies

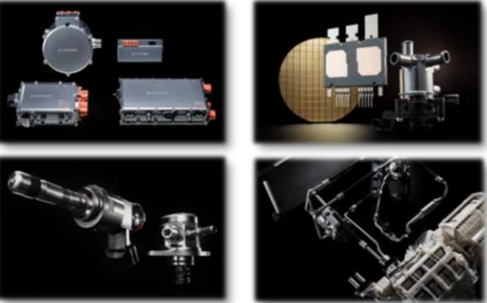


Food Value Chain: Combining technologies and ideas to contribute to an enriched society where all people can live safely and with peace of mind

DENSO European Overview



Engineering Domains



Energy Systems R&D
 Powertrain Components
 Exhaust Aftertreatment
 Electronics
 Electrification
 Production Innovation

Capabilities



R&D

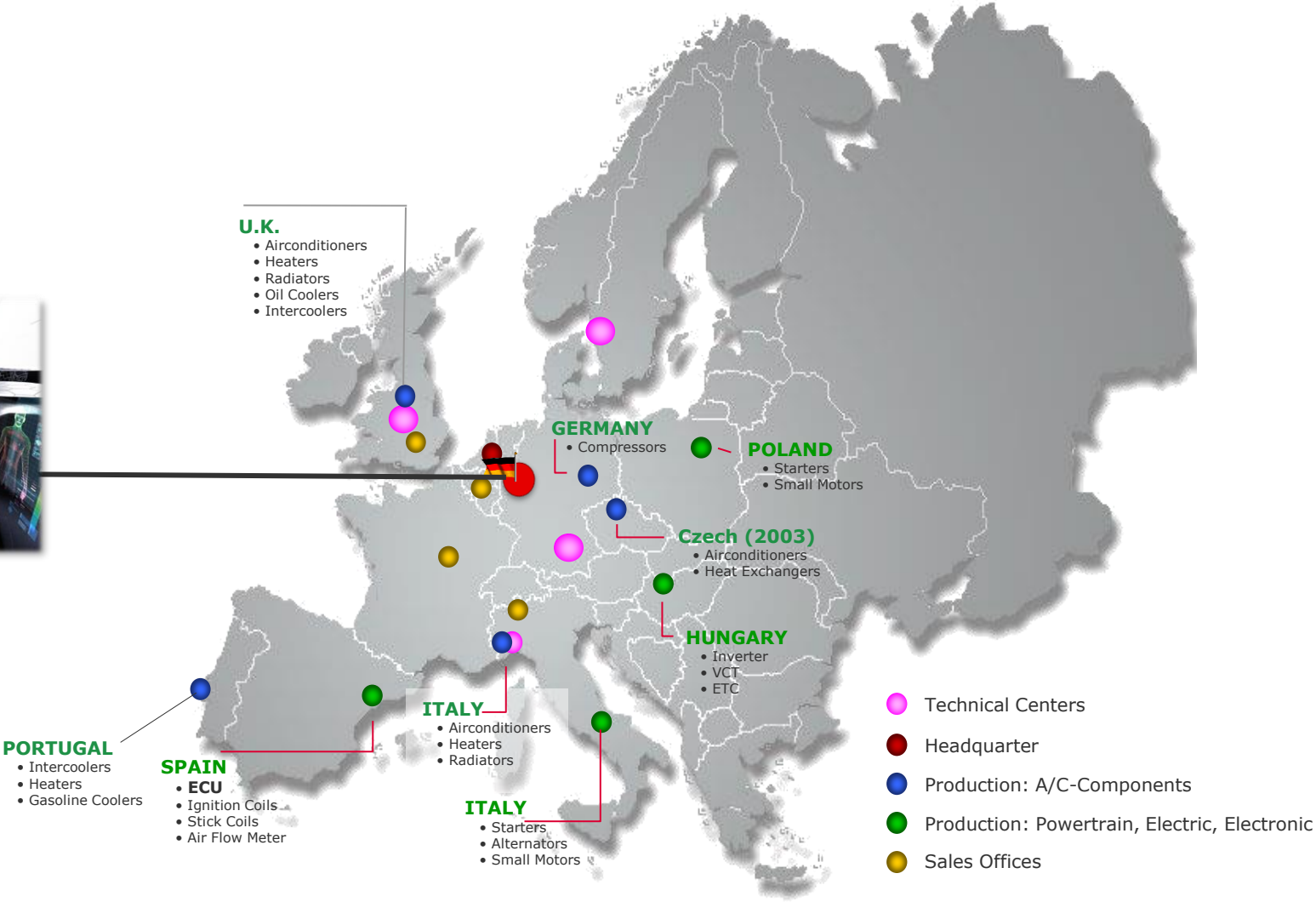
- *Benchmarking*
- *Concept Making*
- *Technology Research*

Advanced Engineering

- *System Engineering*
- *Demo Engine/Vehicle*

Testing

- *System Engineering*
- *Demo Engine/Vehicle*



Green

Aiming to Become Carbon Neutral by 2035

Monozukuri (Manufacturing)



Realize complete carbon neutrality at our plants

Mobility Products



Contribute to the electrification of cars to reduce CO₂ emissions to the greatest extent possible

Energy Use



Realize an energy-recycling society through the development and popularization of technologies that make effective use of renewable energy

Peace
of
mind

Aiming to Become a Leading
Company That Provides "Peace of
Mind" to Society

Elimination of Fatalities from Traffic Accidents



Popularize safety products through efforts focused on "depth" and "width," thereby realizing free mobility without fatalities from traffic accidents

Creation of Comfortable Spaces



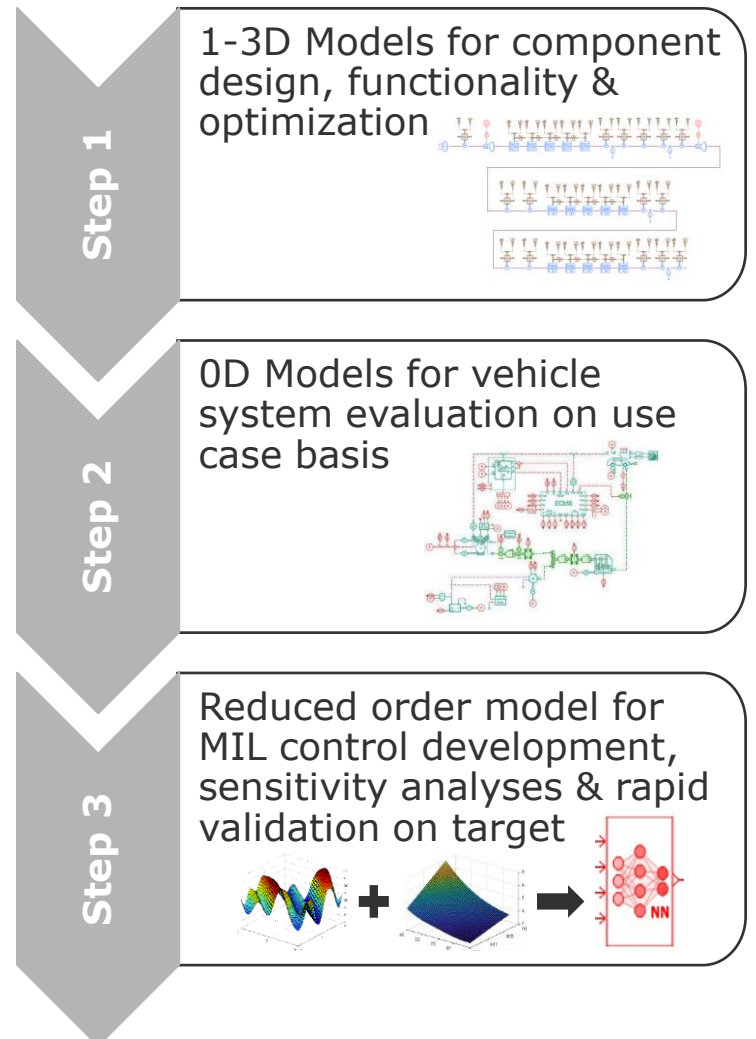
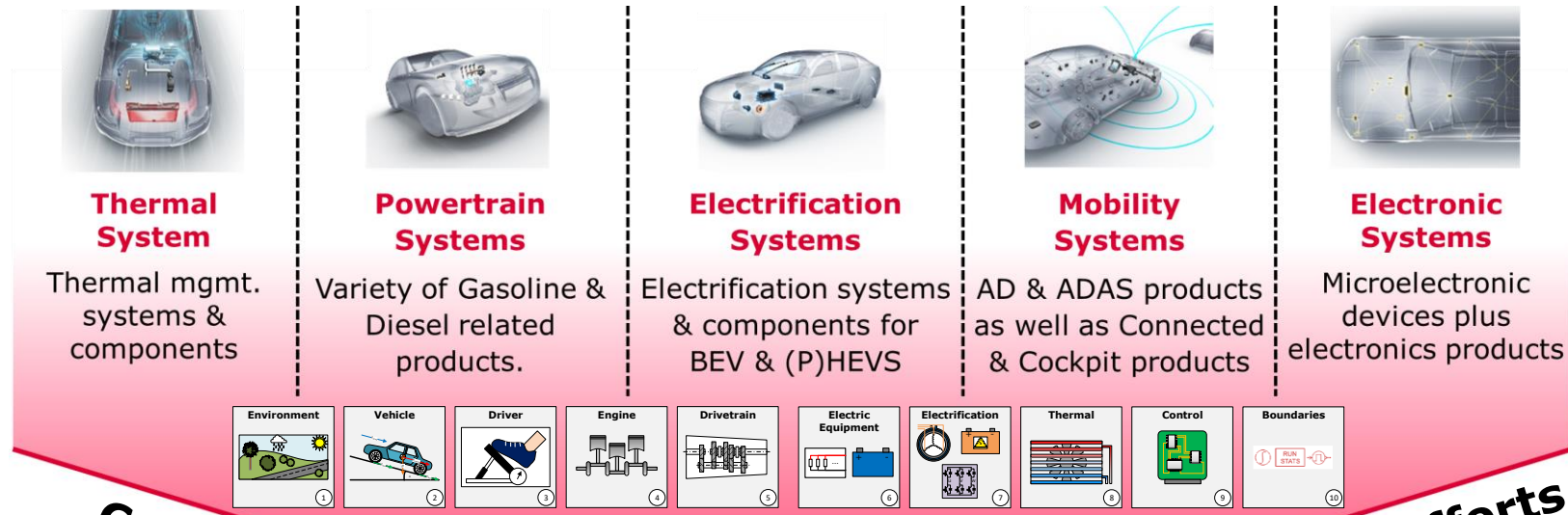
Enhance relevant technologies for creating peaceful, comfortable spaces

Support for Working People



Draw on the technologies we have calculated in the mobility domain to establish a society where people are supported and their potential is nurtured

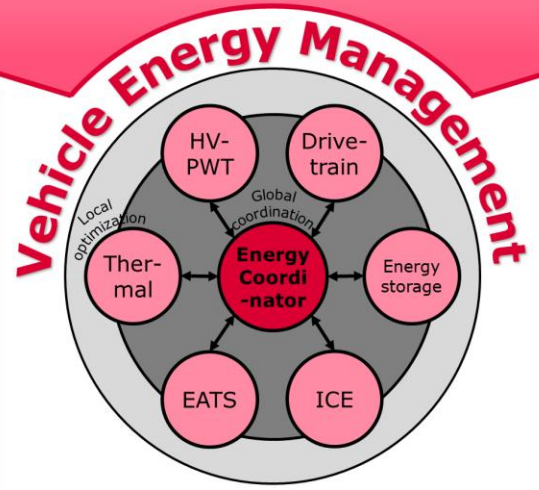
DENSO Vehicle Energy Management



Cross Divisional

Development Efforts

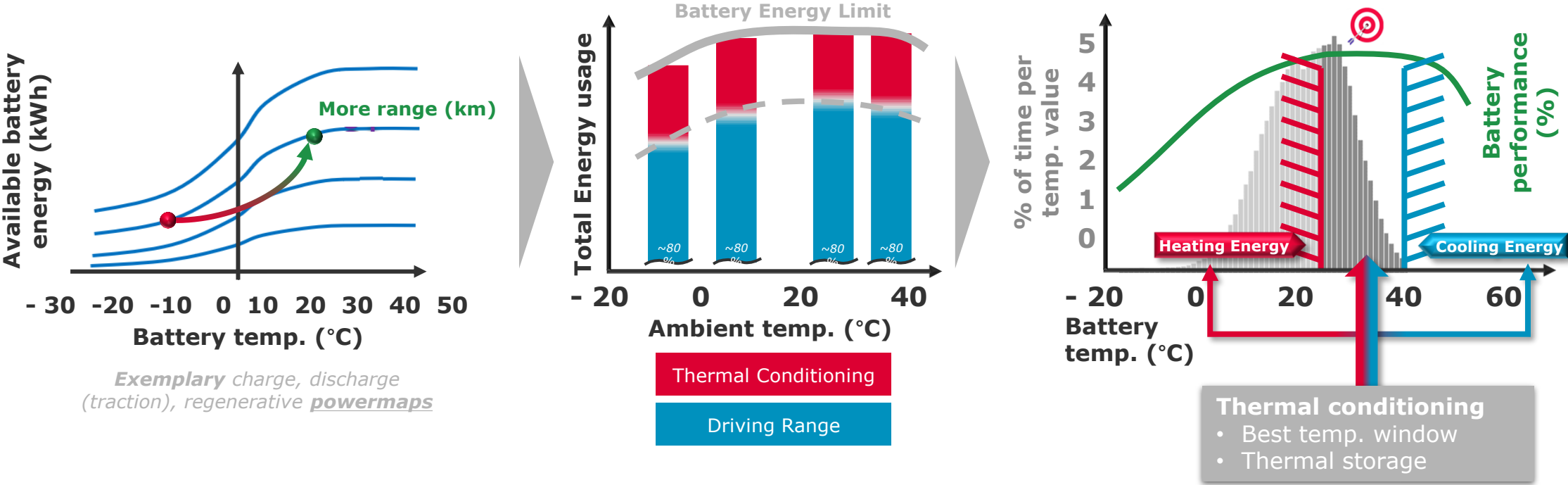
Tunable energy trade-off/ Customer Input :
Fun-To-Drive (Performance)
Comfort (Cabin)
Convenience (Range)



Component, System and Control modelling by cross divisional approach

Motivation for Smart Thermal Management for BEVs

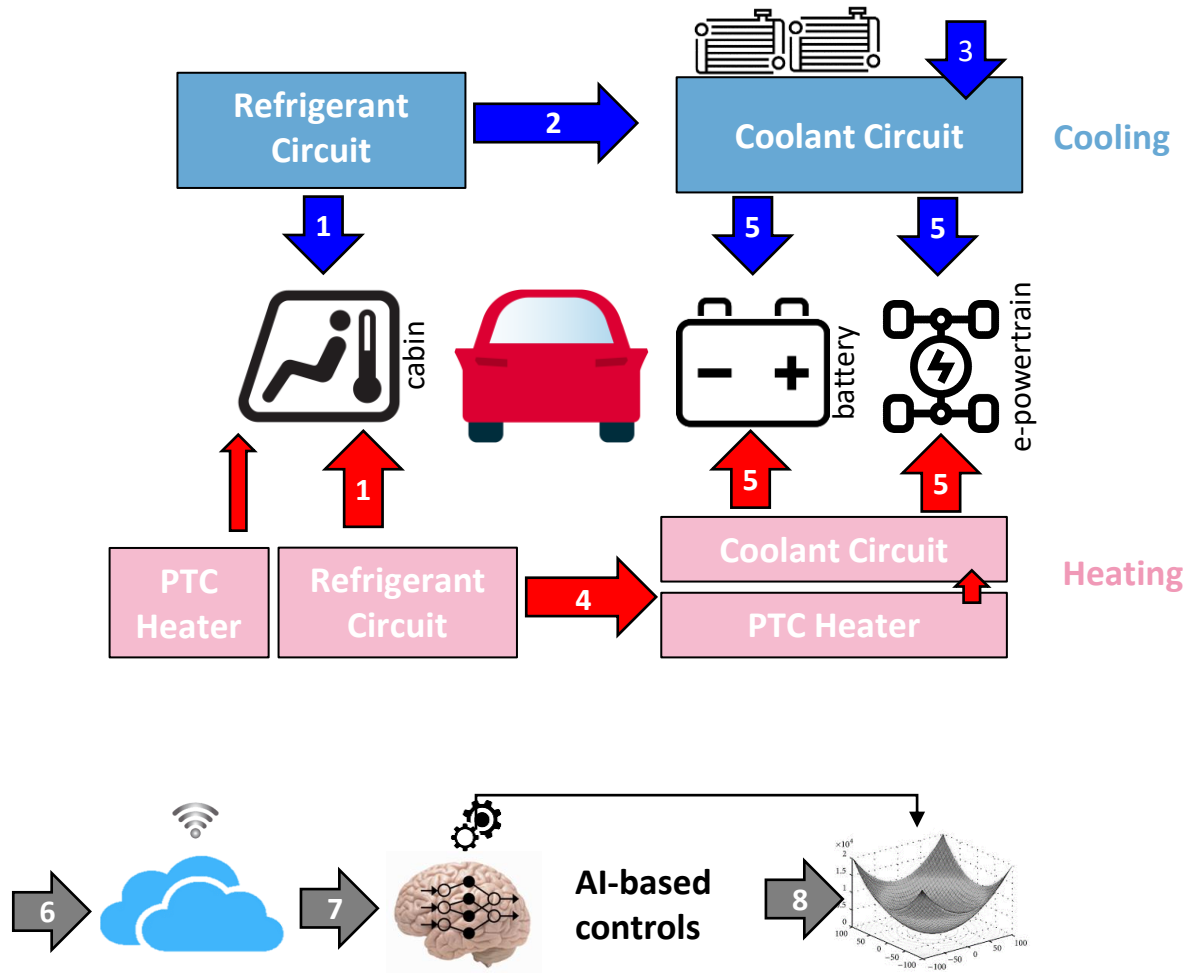
To increase the available energy of the battery, the thermal management systems (both refrigerant & coolant) must manage the required thermal energy of the battery



* BEV = Battery Electric Vehicle

"Credibility of BEV technology is achieved by the customer's confidence of having always access to the same level of autonomy, charging duration and dynamic performance, anytime & anywhere"

Smart Thermal Management

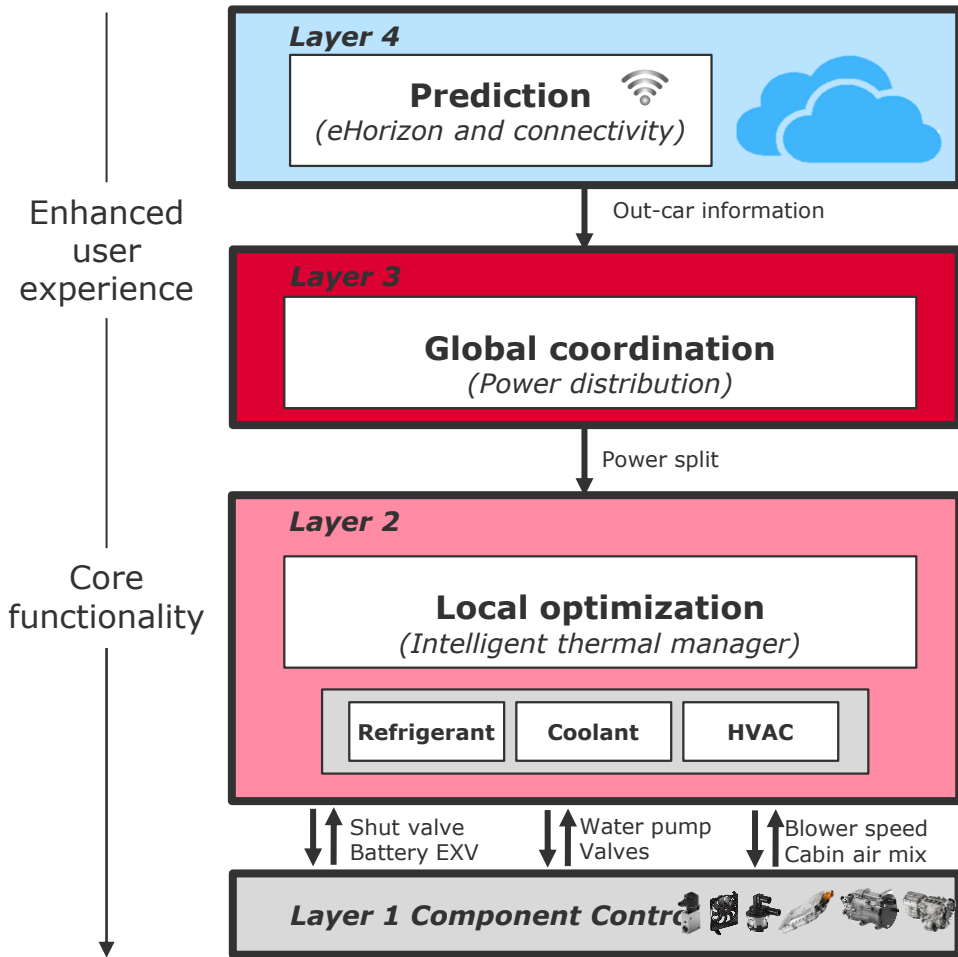


Key STM Concepts	
High performance components	
1	Enhanced cabin conditioning H/P
2	Enhanced battery cooling by H/P
3	Enhanced battery cooling by radiator
4	Enhanced battery heating by H/P
5	Enhanced energy flow distribution of coolant
State-of-the-art technology	
6	Accurate prediction using connectivity
7	Global vehicle energy coordination based on MPC methods
8	AI-based thermal management using local optimization

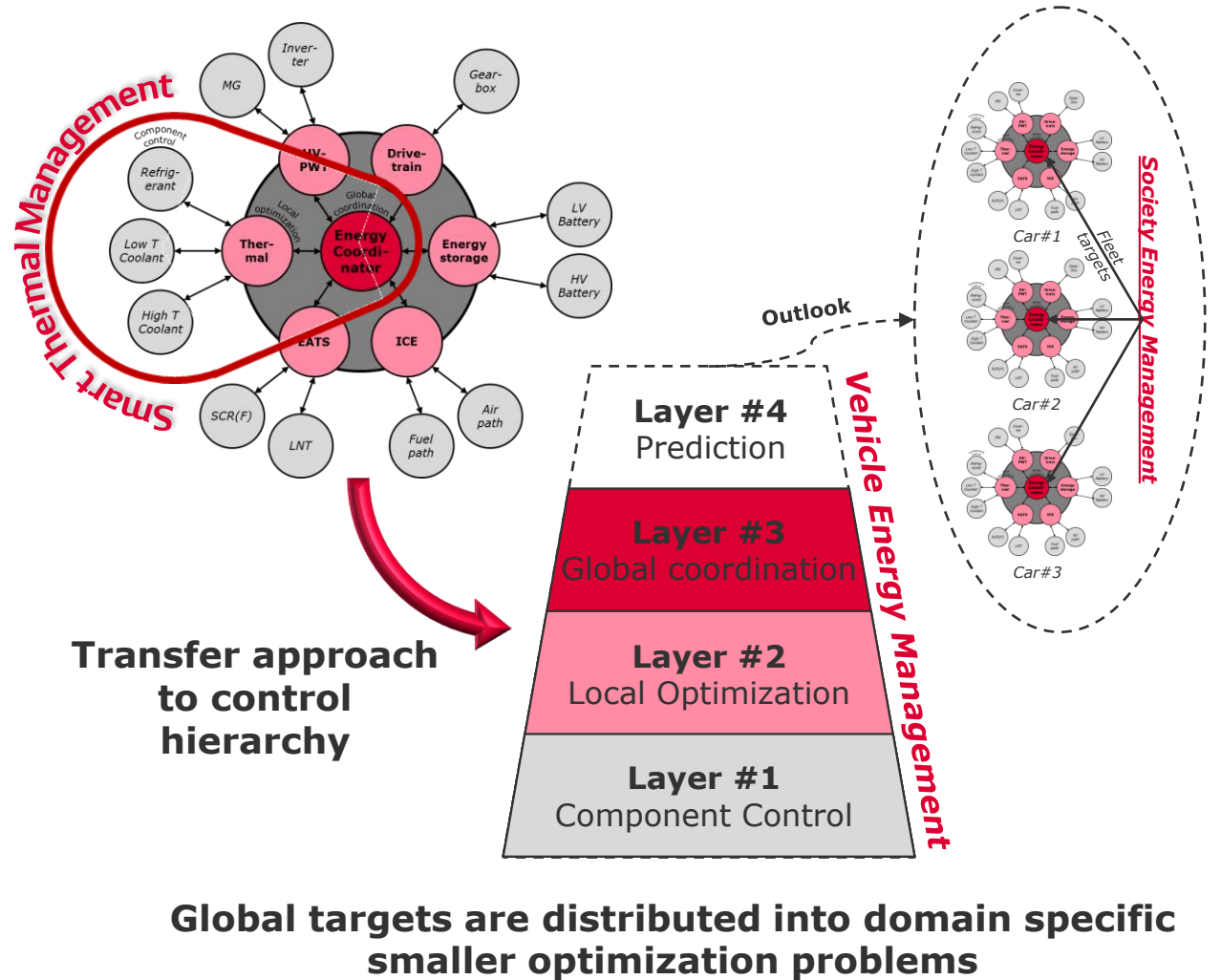
Today's focus

Enhanced vehicle performance utilizing "Smart Thermal Management" – based on high performance components and State-of-the-Art technologies

Smart Thermal Management



Modular control architecture



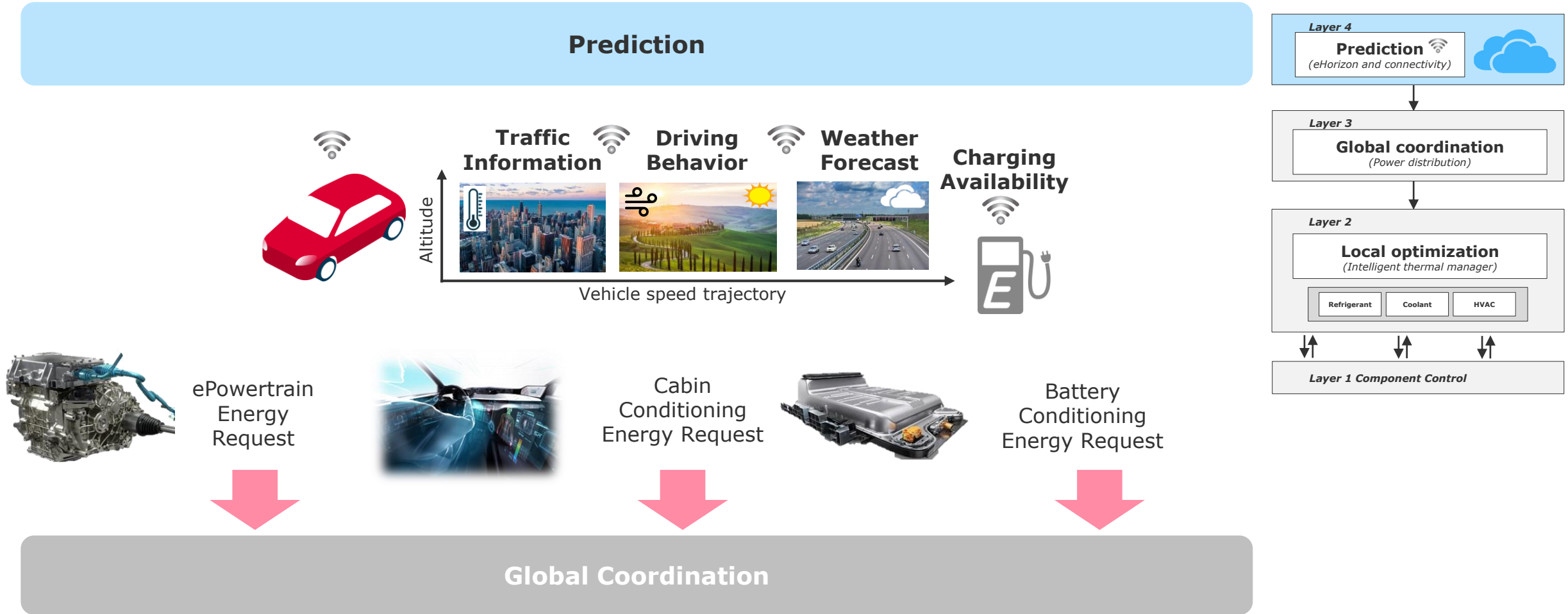
A distributed approach is taken in the control architecture

2

Smart Thermal Management

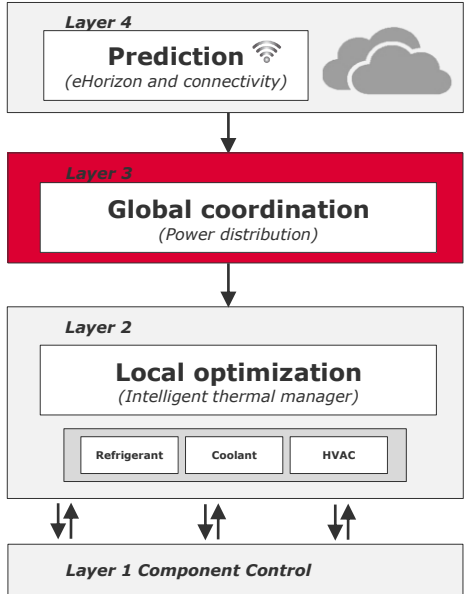
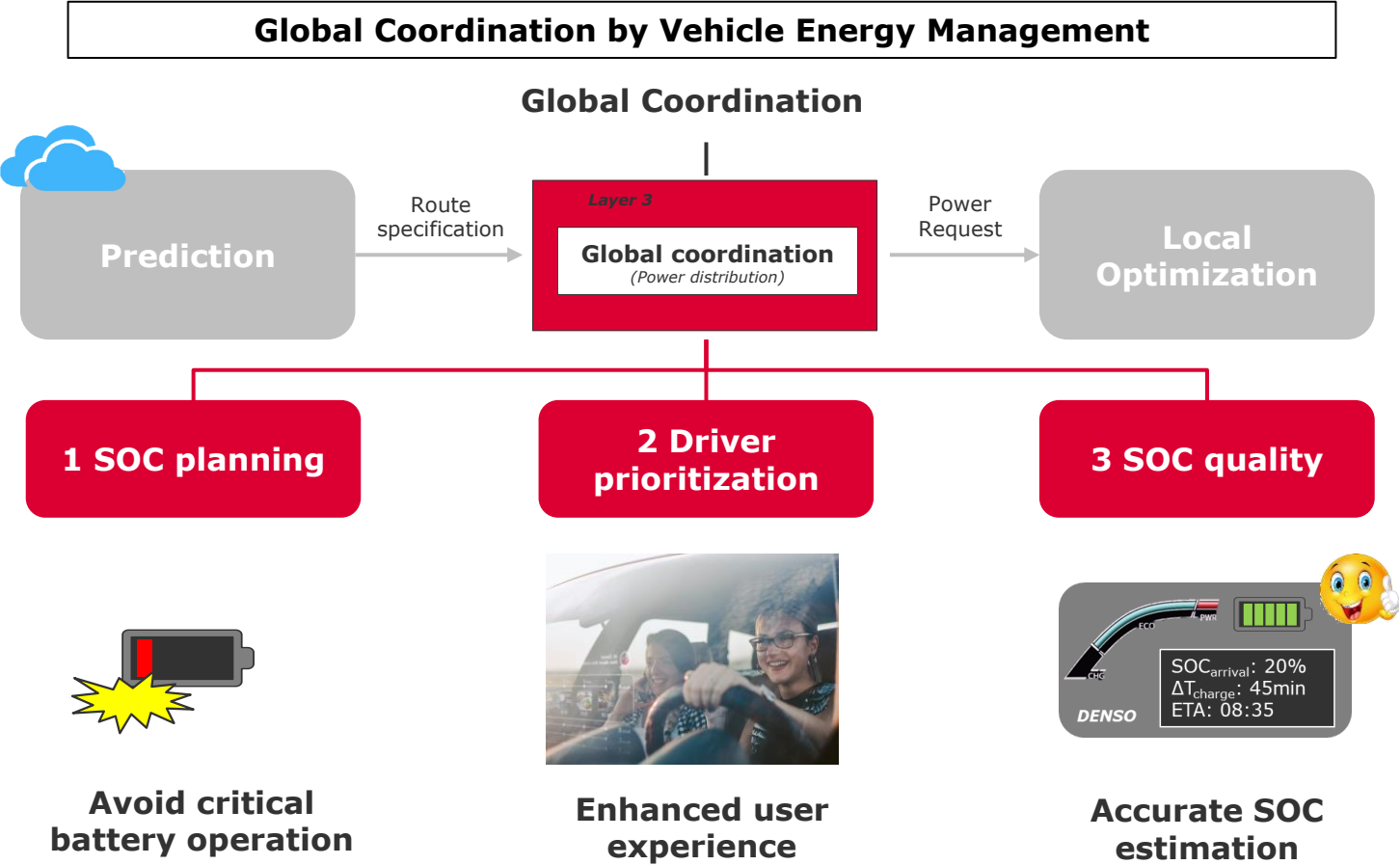
Smart Thermal Management - Prediction

Accurate route planning using smart connectivity



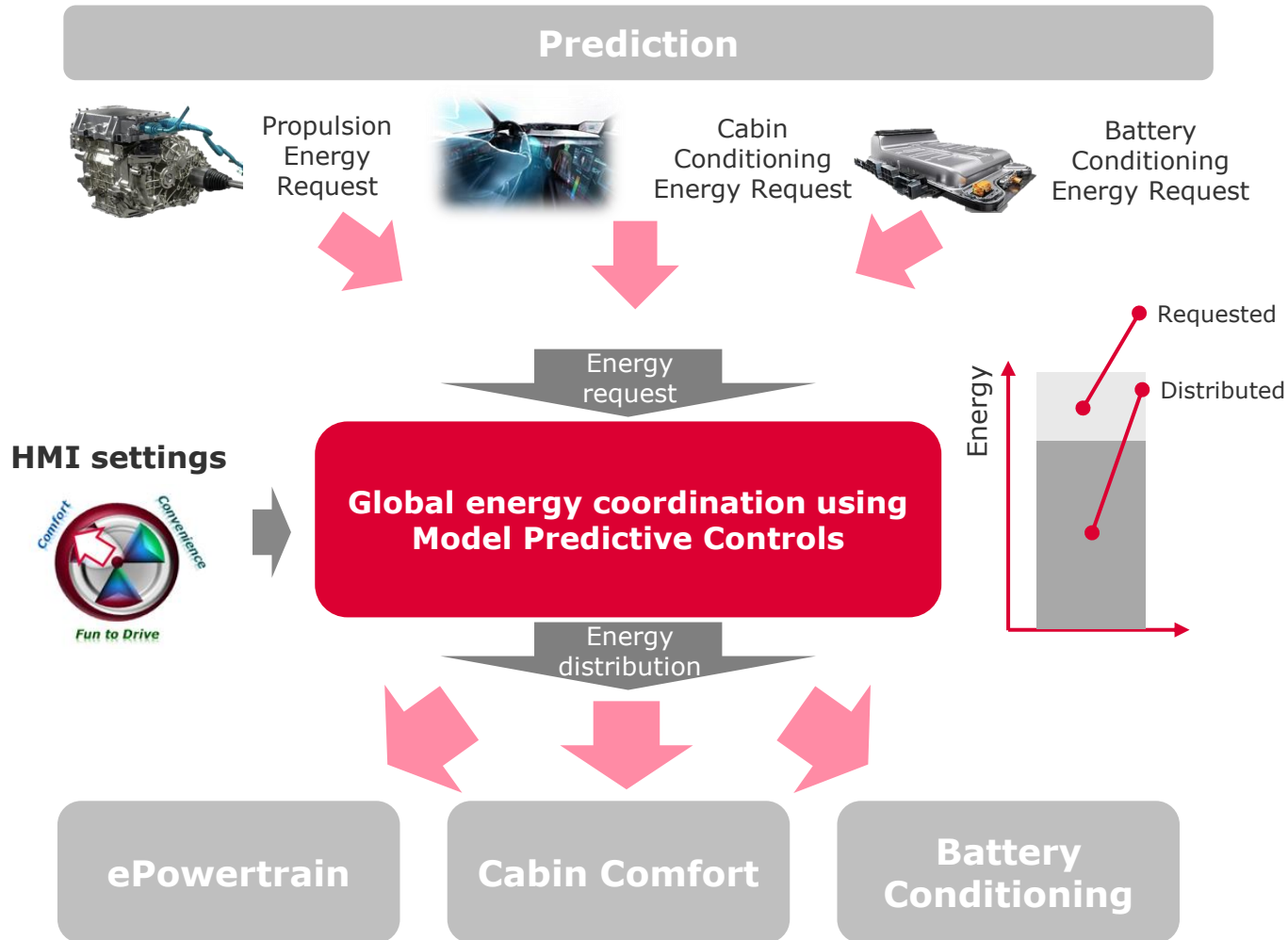
Prediction information used to estimate most probable energy requests

Global Coordination



Global coordination enables power distribution to enhance the user experience

Global Coordination – Prioritization



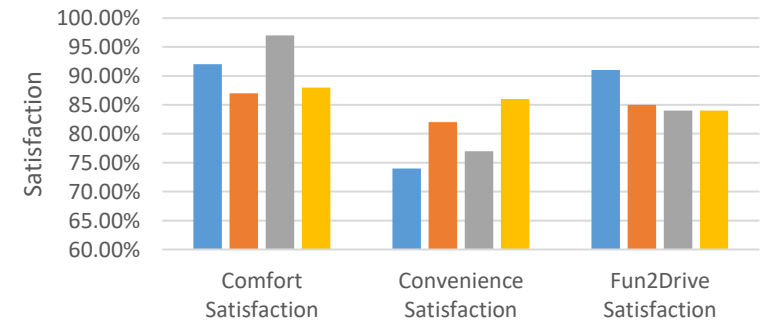
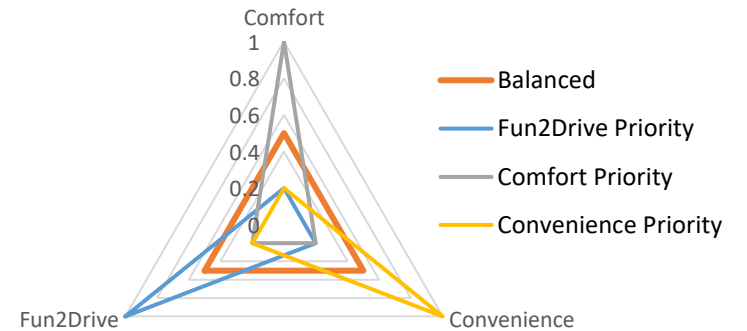
HMI Settings

Problem Formulation

Comfort Convenience Fun2Drive

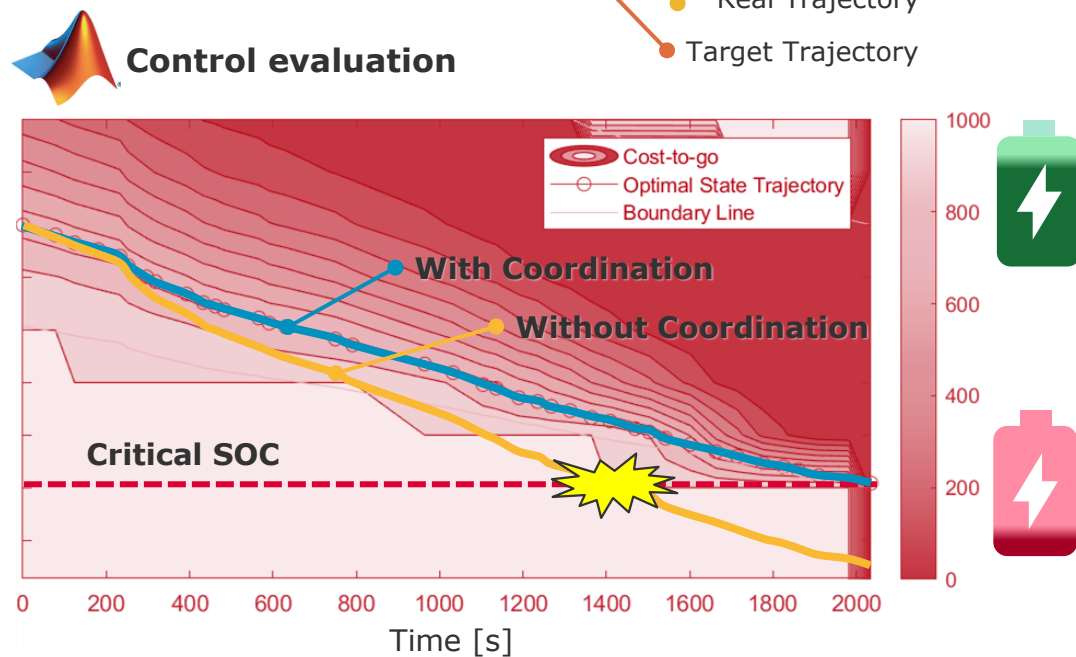
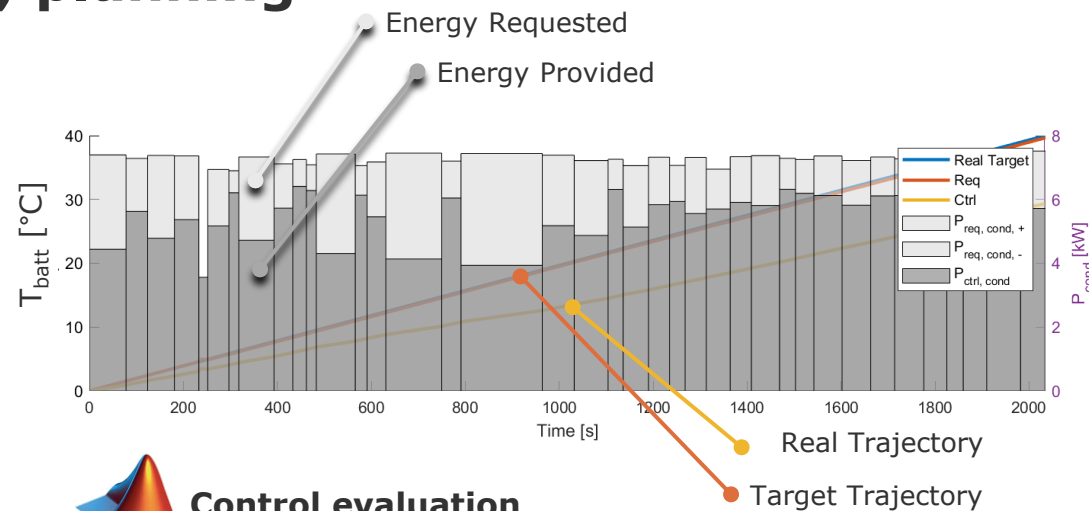
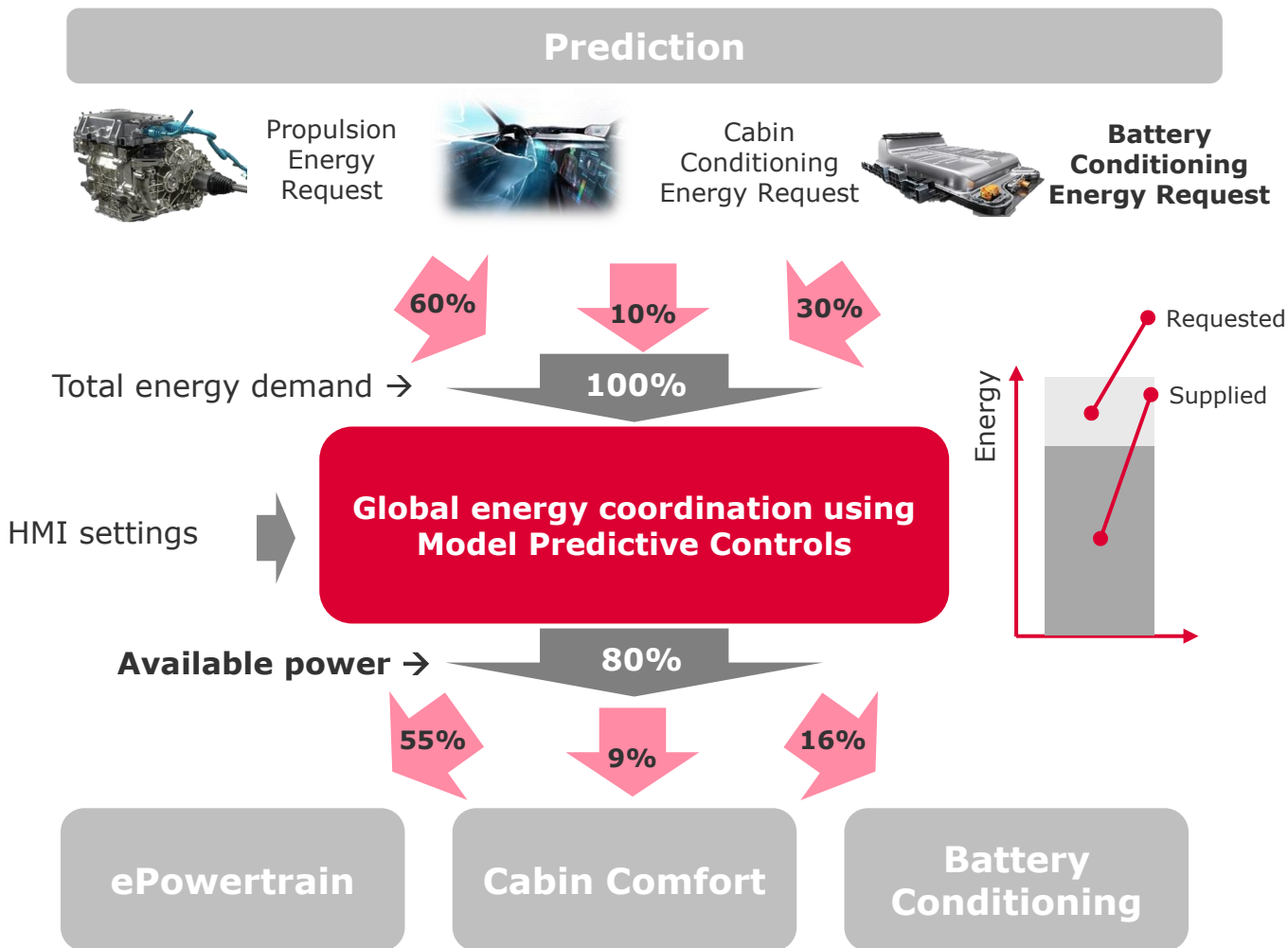


Mathematical Translation



Prioritization allows driver to select preference

Global Coordination – State Of Charge (SOC) planning



SOC planning avoids critical battery operation and optimizes towards destination

Global Coordination – State Of Charge (SOC) quality

Prediction



Propulsion Energy Request



Cabin Conditioning Energy Request



Battery Conditioning Energy Request

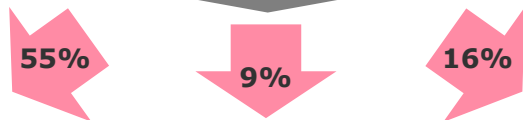
Total energy demand →



HMI settings →



Available power →

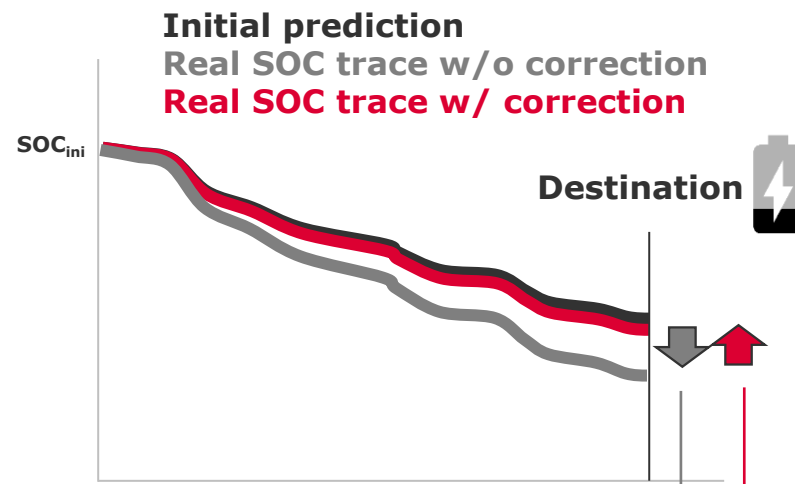


ePowertrain

Cabin Comfort

Battery Conditioning

Inaccuracy



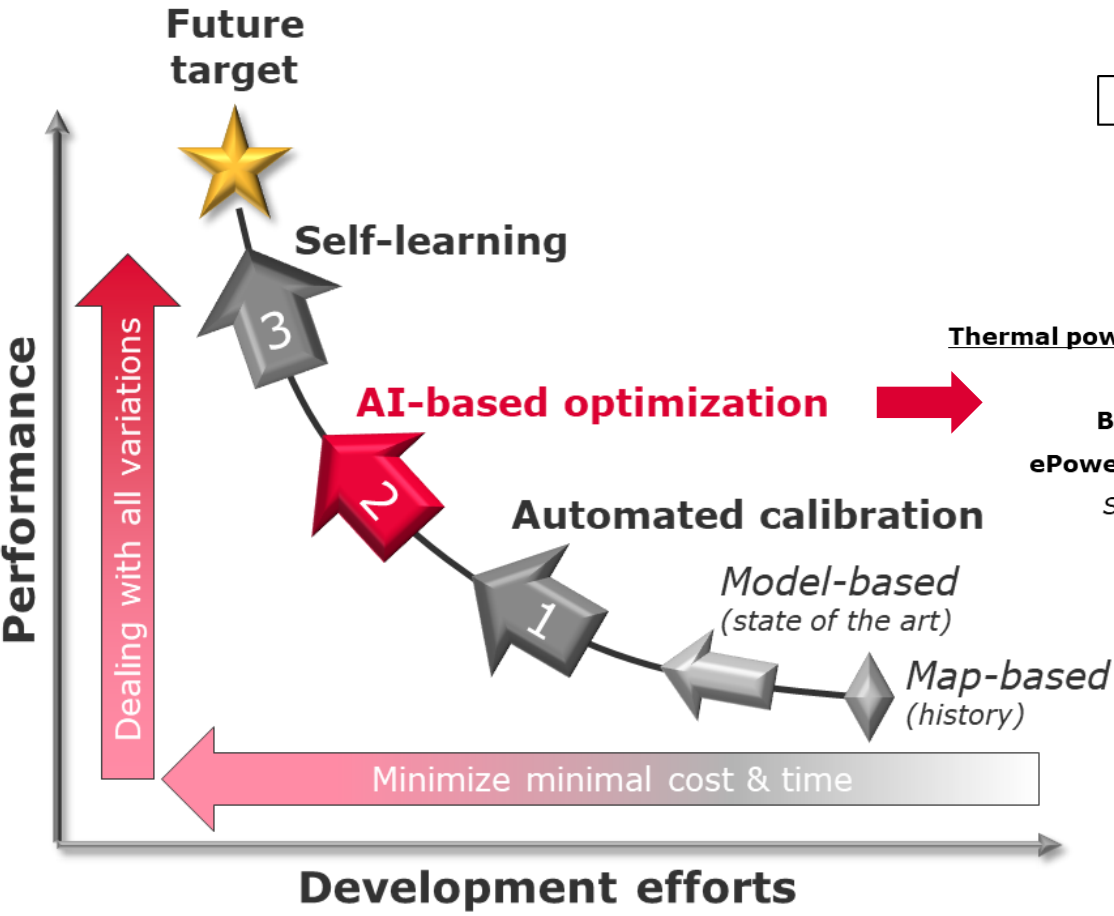
Correction

False display by inaccurate model

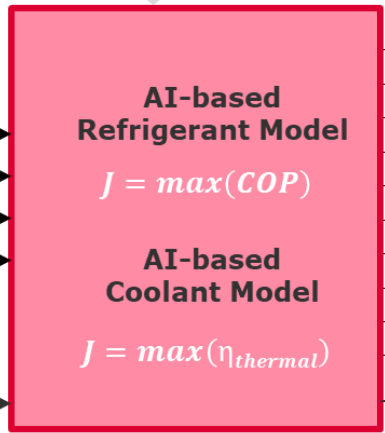
Accurate display by coordination logic

Energy coordination enhances communication to driver by energy corrections

Local optimization



Intelligent Thermal Management (ITM)

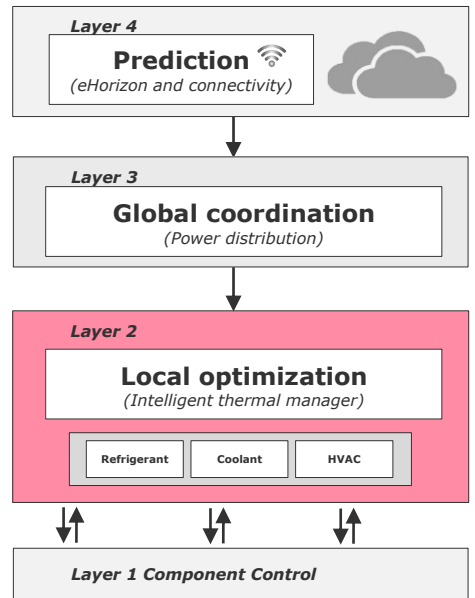
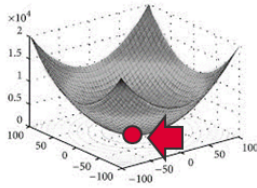


Thermal power for

- Cabin
- Battery
- ePowertrain
- Sensors

Component actuation

- Electric heater power
- Multi valve position
- ...
- ...
- ...
- ...
- ...
- ...



ITM realizes optimal control output for best efficiency

Local optimization – Machine learning by digital engineering

AI based optimization

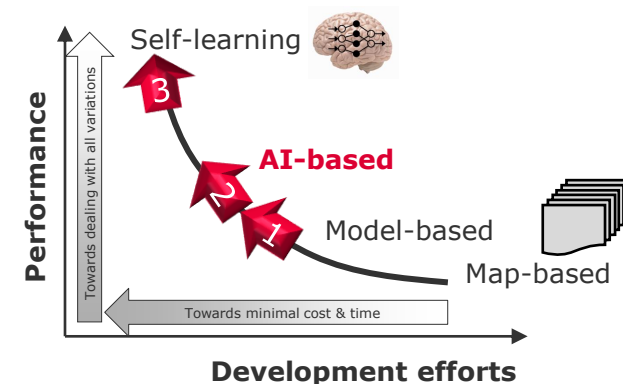
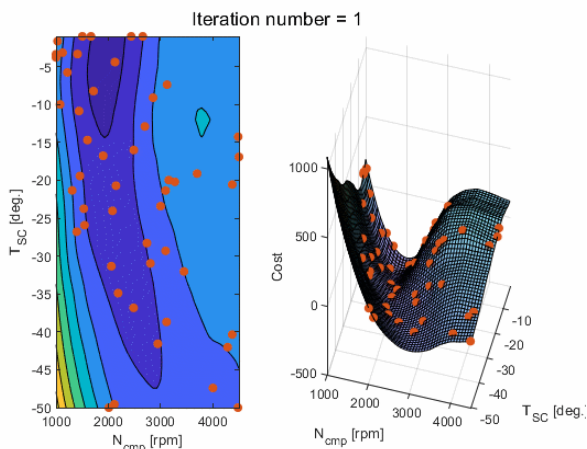
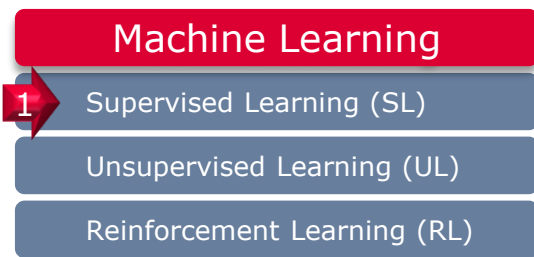
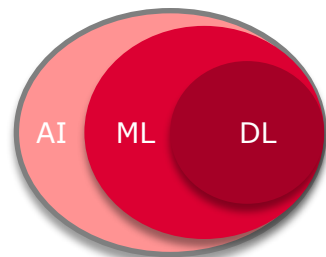
Modelization of complex problem

+ Real time optimization online

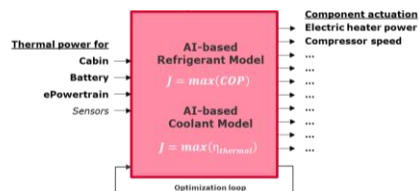
=

AI based optimization

Increased performance
And reduced dev. efforts



Complex problem with many I/O



MIL Training



AI based optimization is developed to reduce development efforts and increase vehicle performance

Optimization by Artificial Intelligence – Methods

Optimization method selection

○ Good
 ▲ Medium
 ✗ Bad

Algorithm	Function calls	Complexity	Parallelization	Implementability
Particle Swarm	▲	▲	○	○
<i>Nelder Mead</i>	✗	▲	▲	▲
<i>Powell</i>	▲	○	○	▲
<i>Conjugate Gradient</i>	▲	▲	▲	✗
<i>BFGS</i>	▲	✗	○	✗
<i>Newton-CG</i>	✗	✗	○	✗

Particle swarm seem best suitable to find the minimum
 Furthermore, the computational time is fixed for a known and defined optimization problem, which is an important criteria for real-time/ embedded applications (e.g on an ECU)

Virtual digital twin selection

Summary of supervised learning models

Model	Accuracy	Complexity	Implementability	Generalizability
<i>Linear regression</i>	▲	✗	○	▲
Neural Networks	○	○	○	○
<i>Support vector machines</i>	○	○	✗	○
<i>K-nearest neighbors</i>	▲	▲	▲	○
<i>Random forest</i>	▲	○	✗	○

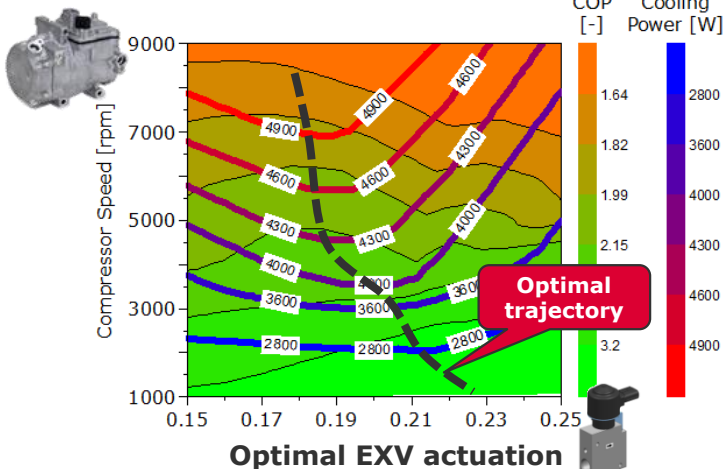
Neural network shows best modelling performance overall

Combination of Swarm Method & Neural Networks were selected as best solution

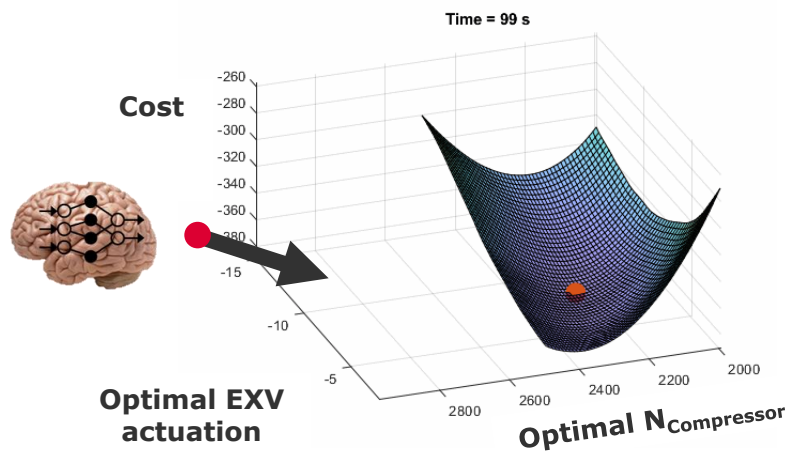
Simulation Study Heat Pump (Refrigerant) System

1. Neural Network Result

(single time instant example)



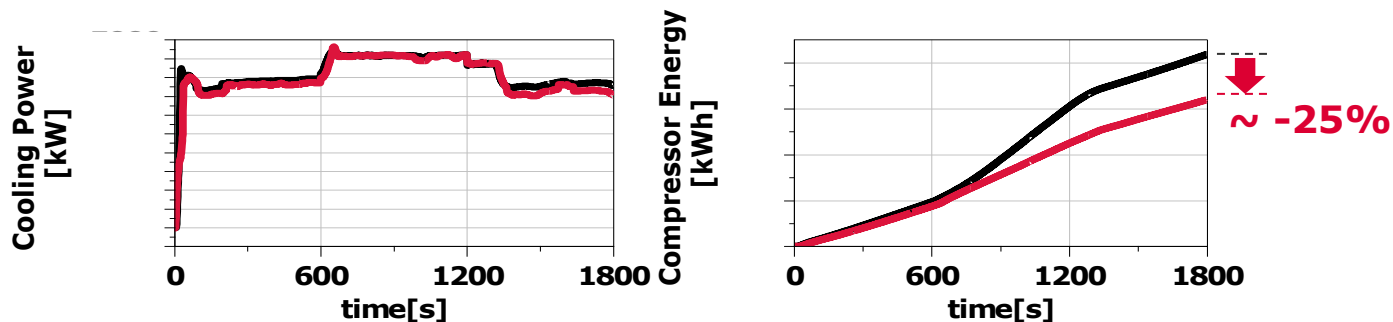
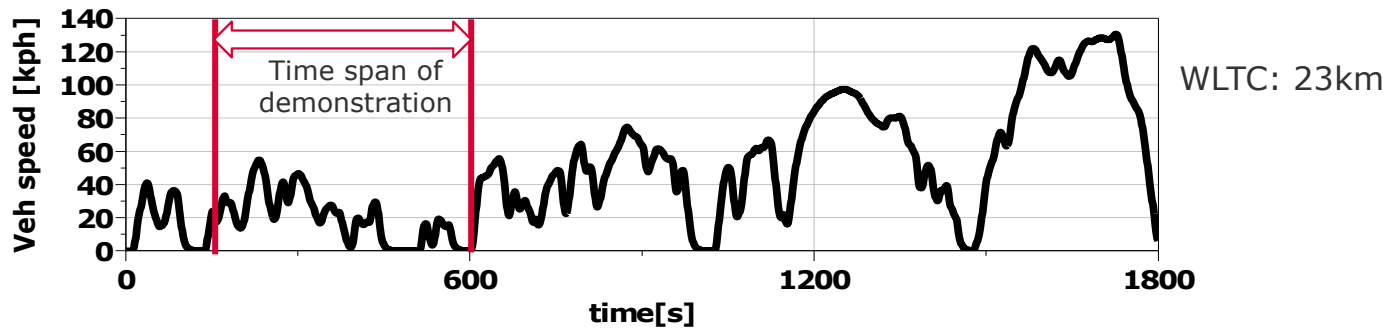
2. Demonstration real time optimization function



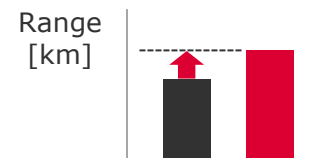
3. Benefit Quantification

$T_{amb} = 35^{\circ}C$, Rel. humidity 60%

— Baseline
— Intelligent Thermal Management

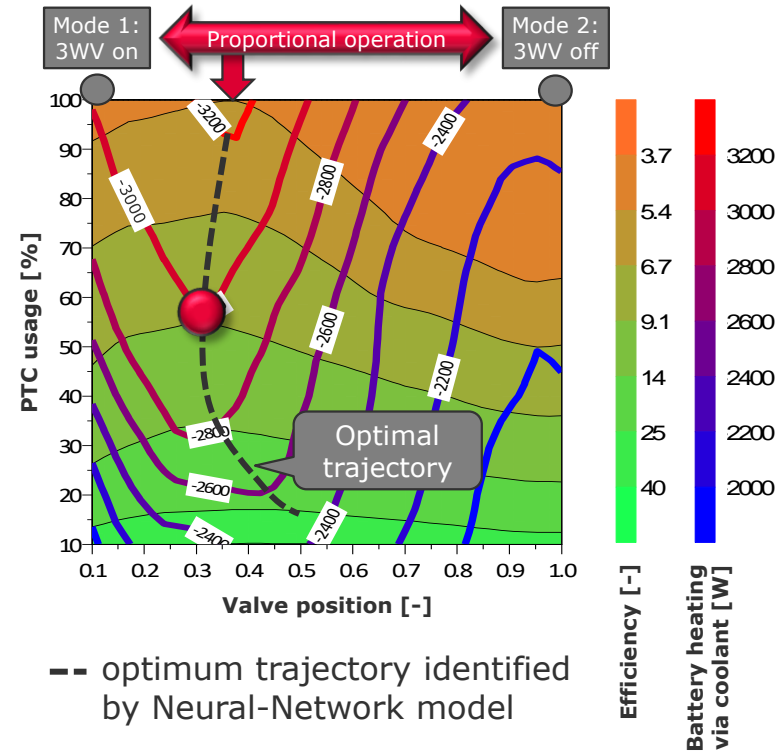
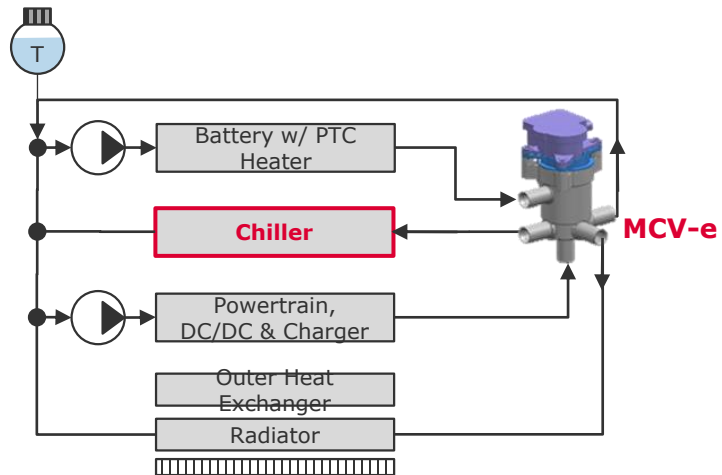
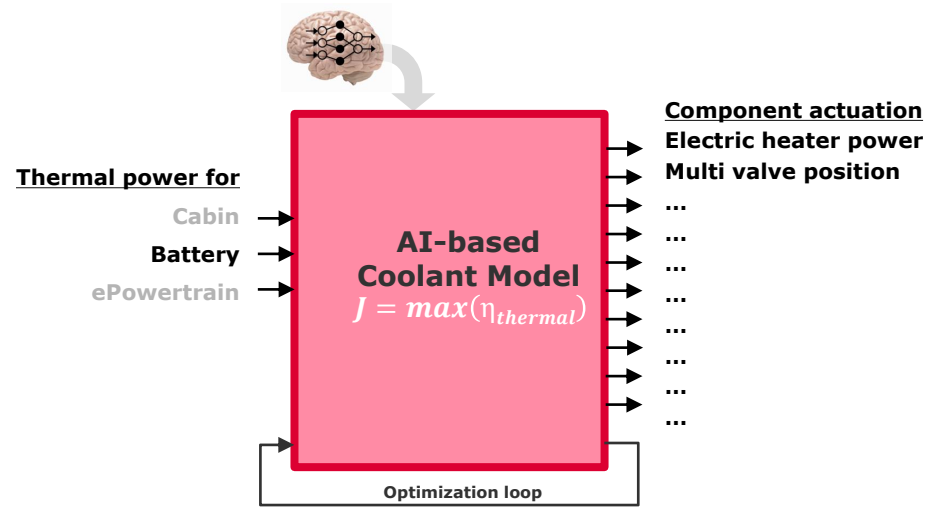


- Same cooling power
- Energy saving by smart controls



Simulation results shows range improvement by smart controls

Simulation Study Coolant System



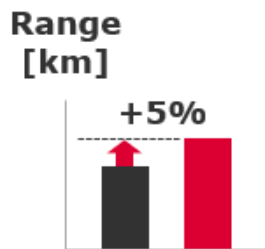
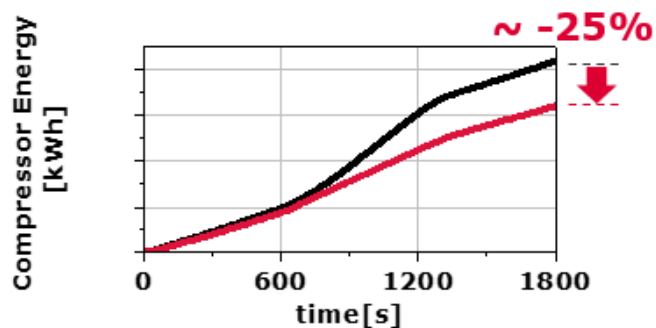
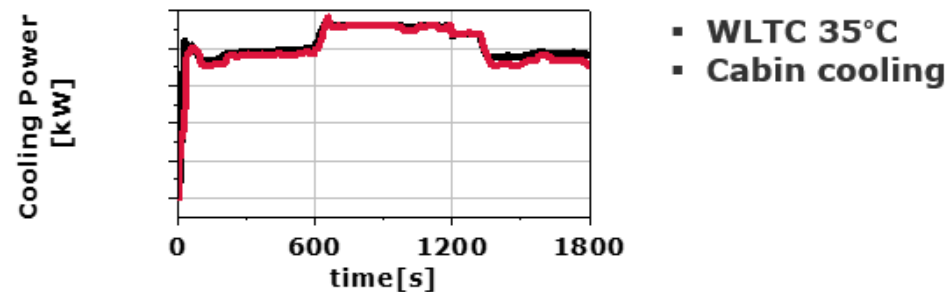
→ **Optimal efficiency found at intermediate valve position**

Optimization search is expanded to coolant system as well

Simulation Results

DENSO Heat Pump System

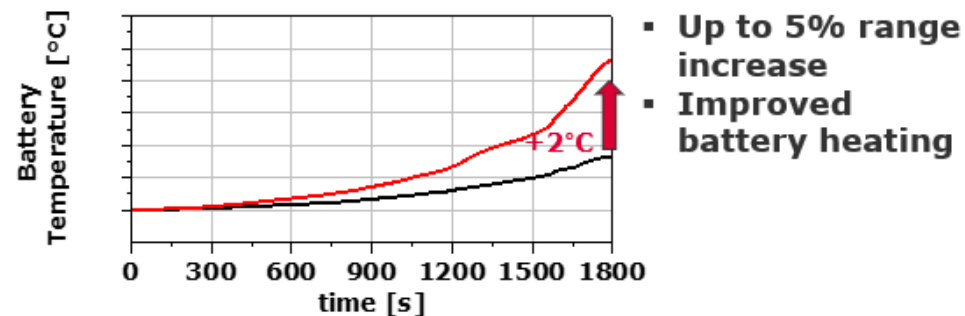
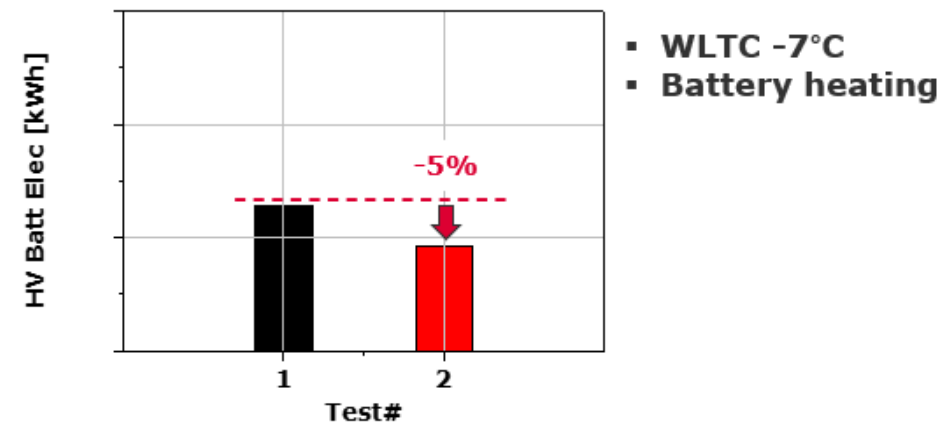
- Baseline
- **AI-BASED REFRIGERANT CONTROLS**



Requested energy to battery and cabin is same in both cases

DENSO Coolant System

- Baseline
- **AI-BASED COOLANT CONTROLS**



AI-based controls for Refrigerant & Coolant systems show promising driving range increasing potential in simulation

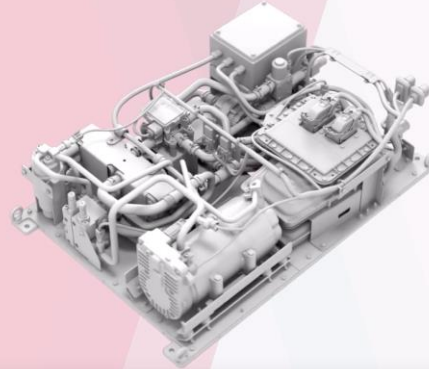
Example of Heat Pump Product in Other Domains

Battery Thermal Management System

Performances

DENSO
Crafting the Core

Refrigerant type	R1234yf
Voltage range HV / LV [VDC]	800 / 24V
Operating temperature range [°C]	-20 / +55°C
Cooling capacity (W/O PTC)	8,5 kW
Heating capacity (W/O PTC) [kW]	9 kW
Heating capacity (W PTC) [kW]	10 - 20 kW
Coolant flow rate [l/h]	1100 or more



- Stand alone device to heat and cool the battery by using heat pump system, typically used Off Road and Special Applications

Residential CO₂ Heat Pump System



- DENSO introduced CO₂ refrigerant to its Air to Water Heat Pumps in 2001, in Japan. Known as 'Eco-Cute'
- Introduced into Europe in 2009 and set a standard for compact size, light weight and low noise. It is supplied exclusively as original equipment to heat pump manufacturers.
- Our partner Vattenfall has developed a solution that incorporates a buffer system which allows the DENSO CO₂ Heat Pump to be used for space heating and domestic hot water at the same time (see Vattenfall Website)

DENSO Heat Pump Systems Towards a Sustainable Society

DENSO

Crafting the Core