

# Efficiency is Not Enough!

## Environmental Impacts as New Dimensions in Multi-Objective Optimization of Power Electronic Systems

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Expert Discussion  
Sustainability in Power Electronics

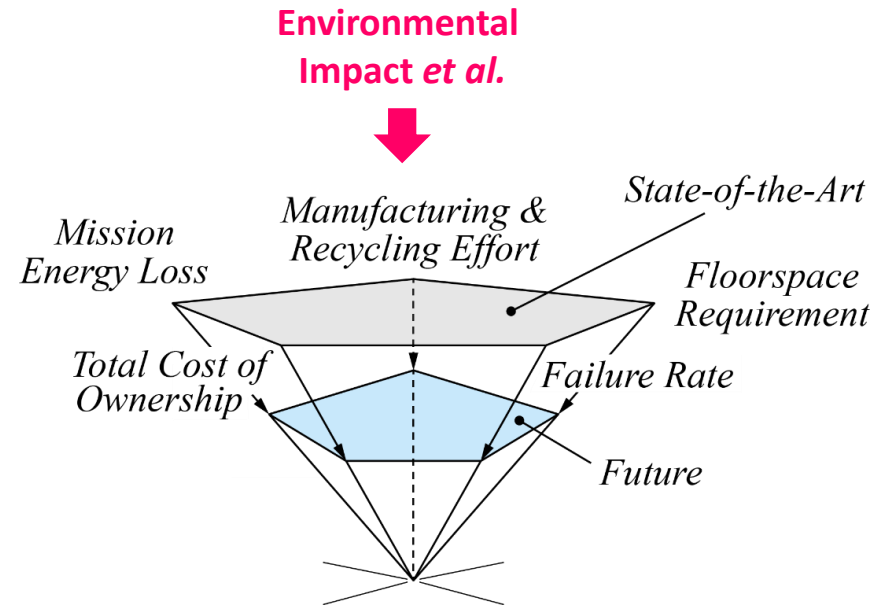


# The Future

- Assuming 20+ Years Lifetime → Systems Installed Today Reach End-of-Life in 2050 (!)
- Life-Cycle Analysis (LCA) Mandatory for All Future System Designs

## ■ Complete Set of New Performance Indicators

- Environmental Impact [kg CO<sub>2eq</sub>/kW], [species.yr/kW], ...
- Human Health [DALY/kW]
- Resource Efficiency [kg<sub>xx</sub>/kW]
- Resource Scarcity [\$/kW]
- Embodied Energy [kWh/kW]
- TCO [\$/kW]
- Power Density [kW/dm<sup>3</sup>]
- Mission Efficiency [%]
- Failure Rate [h<sup>-1</sup>]



## Outline

- **The Future**
- **The Opportunity**  
*Design Space Diversity*
- **The Tool**  
*Multi-Objective Optimization with  
Environmental Impacts as New Dimensions*
- **The Roadmap**

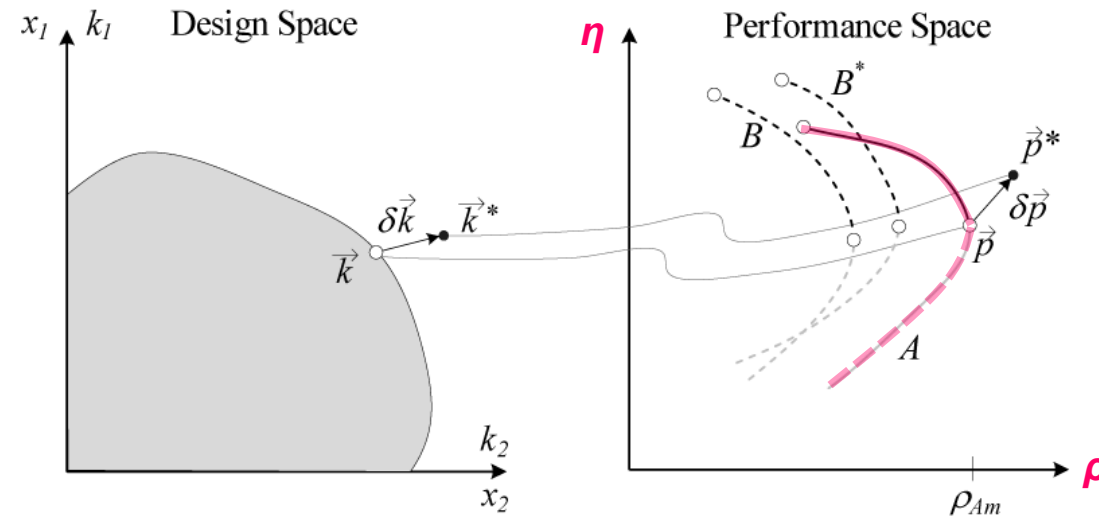


# The Opportunity

## *Design Space Diversity*

# Multi-Objective Optimization (1)

- Converter Design: Mapping of **Multi-Dimensional Design Space** into a **Multi-Dimensional Performance Space**
- **Pareto Front**: Boundary of the Feasible Performance Space



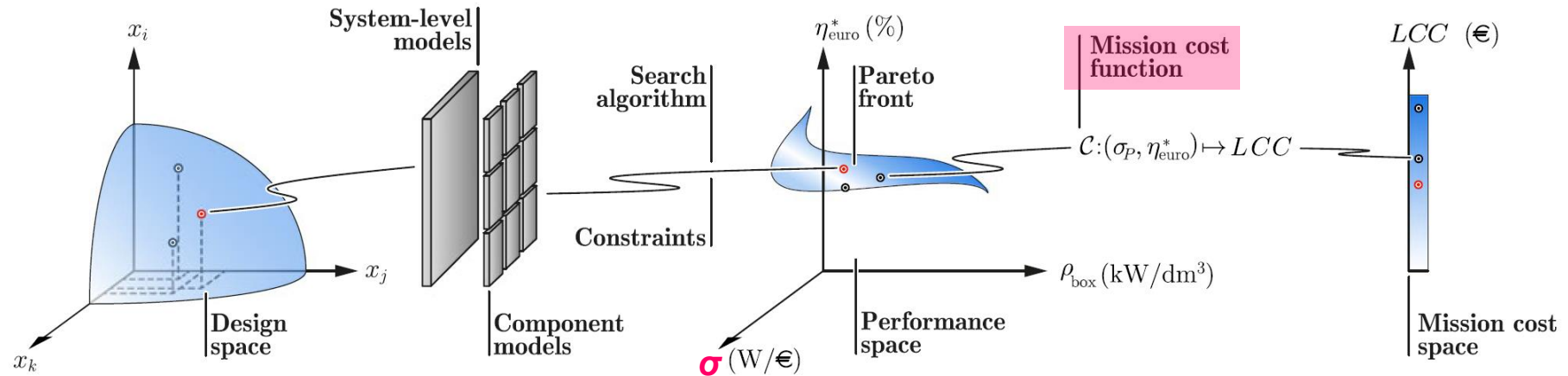
## ■ Typically Considered Performance Indices

- $\eta$  Efficiency in %
- $\rho$  Volumetric Power Density in  $\text{kW}/\text{dm}^3$
- $\gamma$  Gravimetric Power Density in  $\text{kW}/\text{kg}$

- Comparison of **Performance Limits** of Different Converter Topologies, Component Technologies

# Multi-Objective Optimization (2)

- Mission Profiles: Power Loss → Energy Loss / Life-Cycle Cost (!)



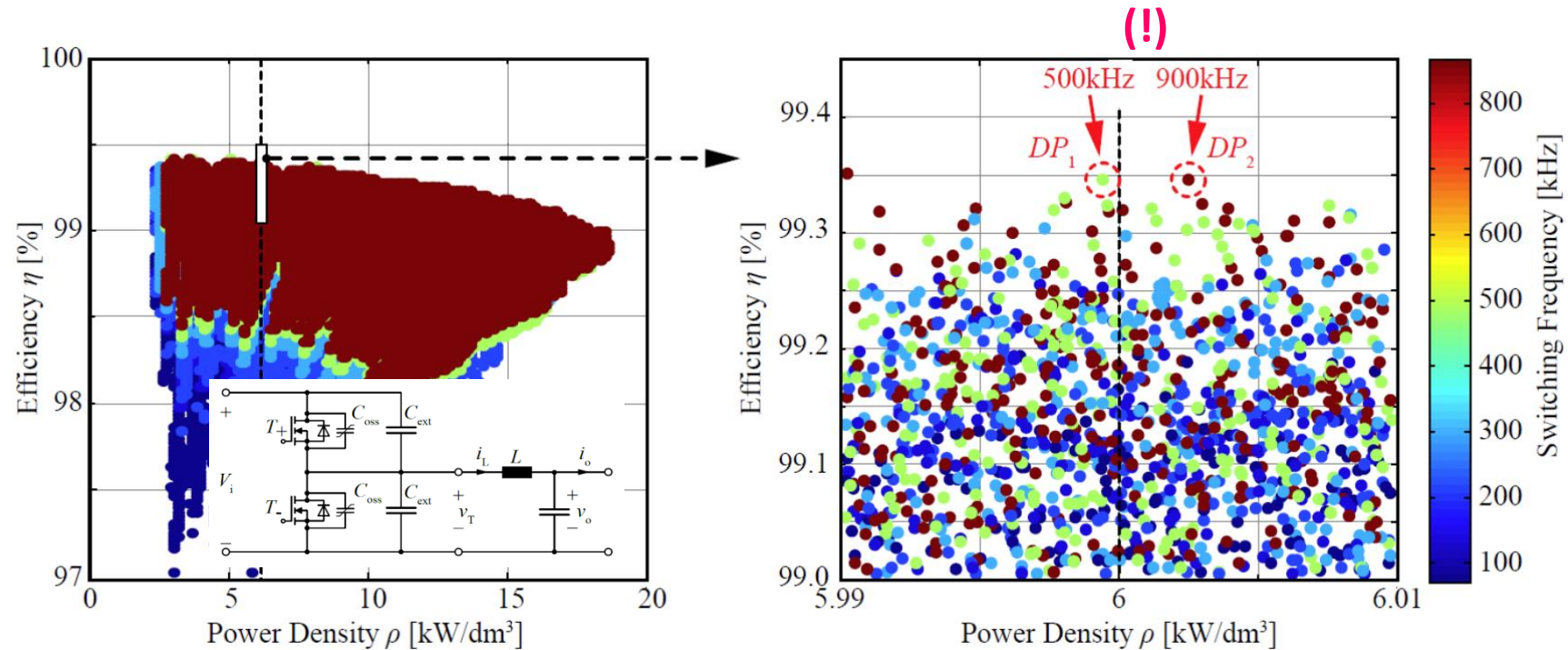
## Typically Considered Performance Indices

- $\eta$  Efficiency in %
- $\rho$  Volumetric Power Density in kW/dm<sup>3</sup>
- $\gamma$  Gravimetric Power Density in kW/kg
- $\sigma$  Cost Density in kW/€



# Design Space Diversity (1)

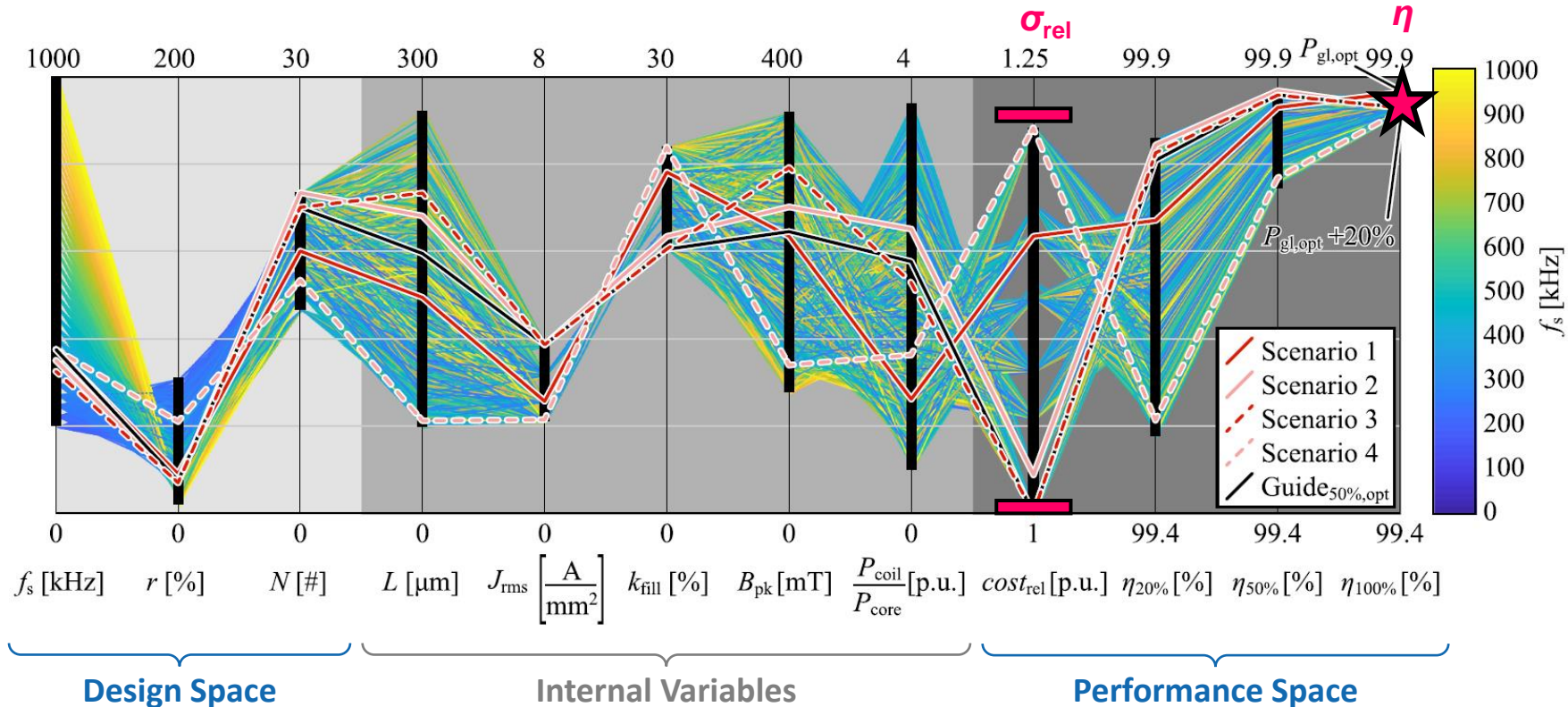
- Very Different Design Space Coordinates Map to Very Similar Performance Space Coordinates



- Example: Google Littlebox Design Optimization w. PWM Operation / Mutual Comp. of HF and LF Loss Contrib.

## Design Space Diversity (2)

- Opportunity for Adjusting Further Performance Metrics at Unchanged Efficiency (Power Density, ...)



- Example: Inductor Optimization for 2-kW, 400-V DC-DC Converter / Parallel-Coordinate Plot
- Designs with Same (Full-Load) Efficiency Differ Widely in the Cost and Part-Load Eff. Dimensions

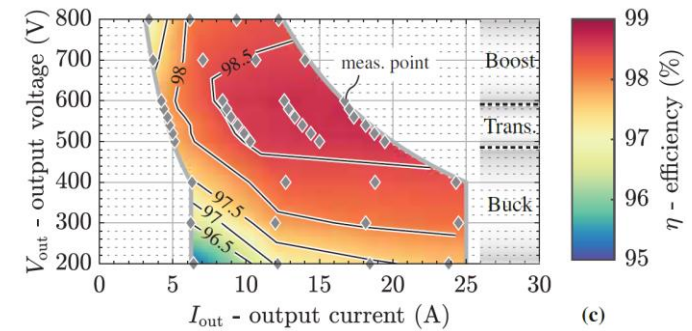
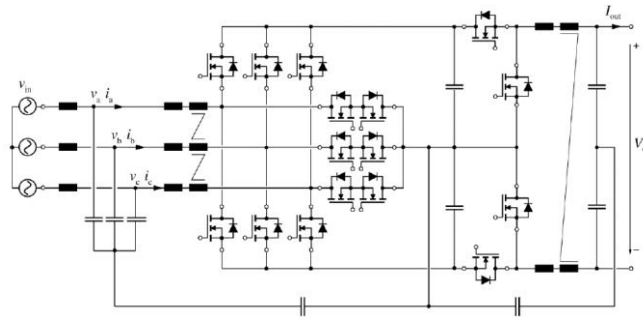
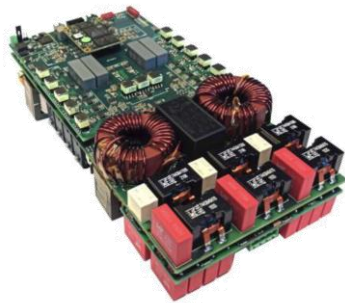


# Design Space Diversity / Topologies (1)

- Two Concepts / **Similar Spec.:** 10 kW, 400...800/1000 V DC, CISPR 11 Class A / **Similar Performance ( $\eta, \rho$ )**

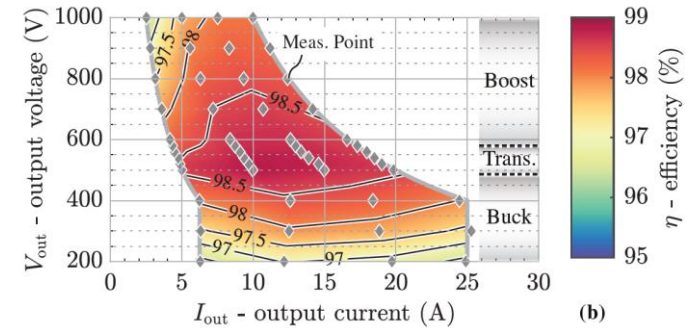
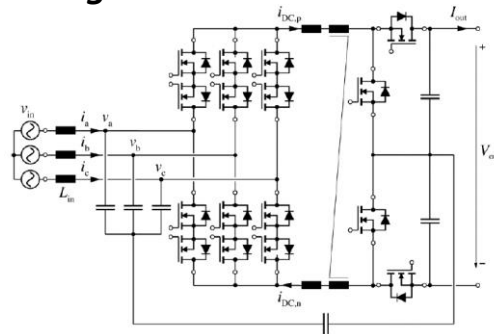
## Boost-Buck Voltage DC-Link EV Charger

98.8%, 5.4 kW/dm<sup>3</sup>



## Buck-Boost Current DC-Link EV Charger

98.6%, 6.4 kW/dm<sup>3</sup>

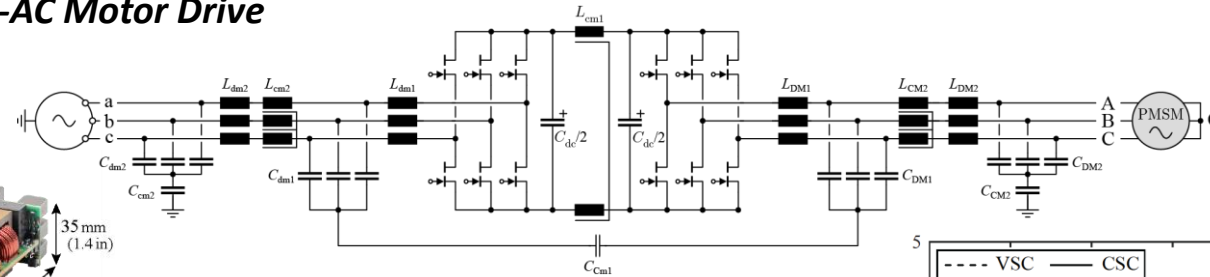
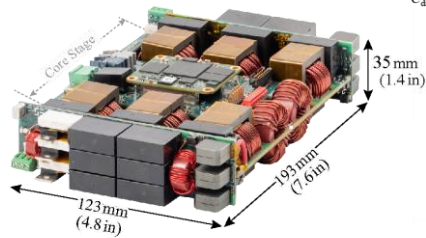


# Design Space Diversity / Topologies (2)

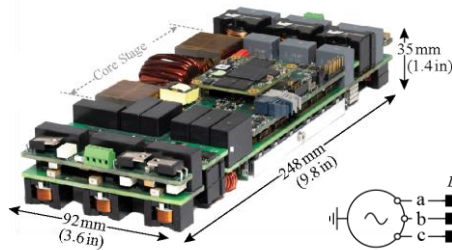
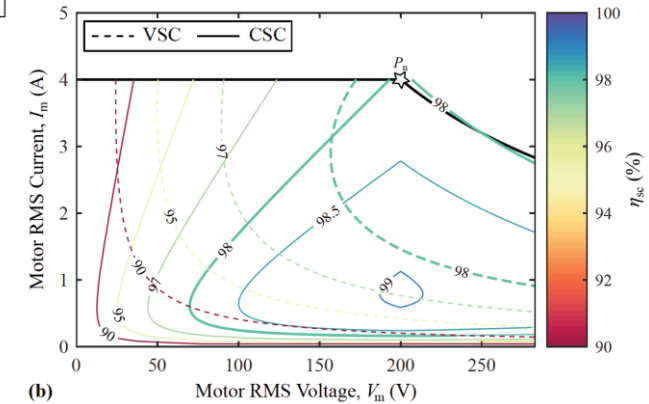
- Two Concepts / Similar Spec.: 1.4 kW, 97% Nominal Efficiency / Similar Performance ( $\eta$ ,  $\rho$ )

## Voltage-Source AC-AC Motor Drive

97%, 1.7 kW/dm<sup>3</sup>

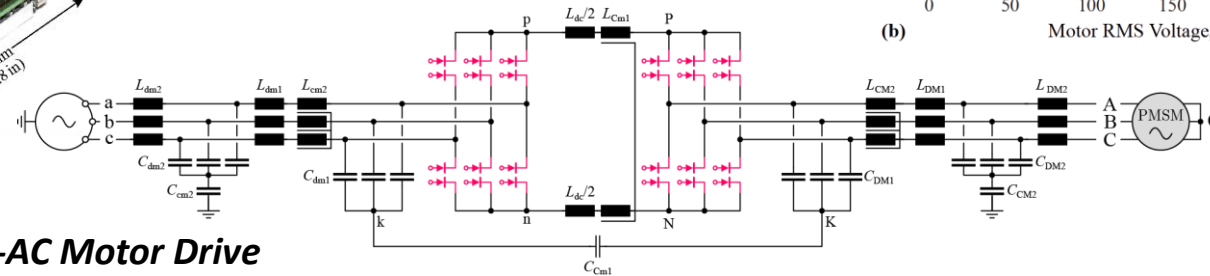


Different Part-Load Semic. Efficiency Characteristics (!)



97%, 1.8 kW/dm<sup>3</sup>

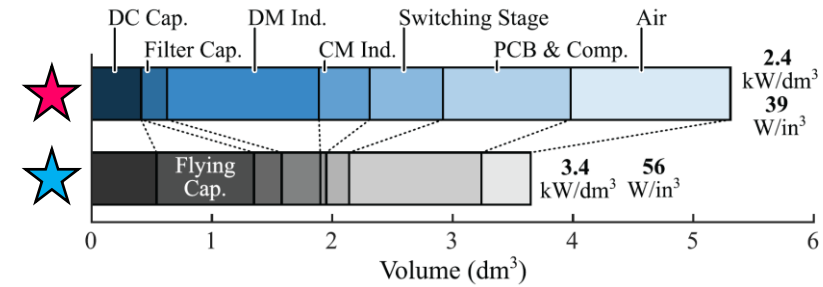
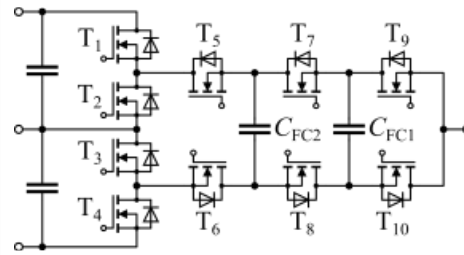
## Current-Source AC-AC Motor Drive



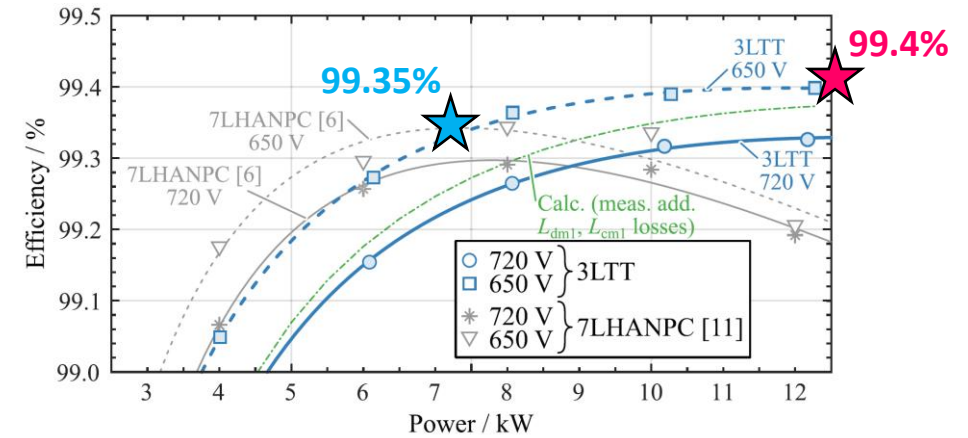
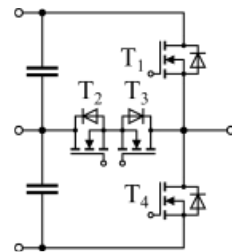
# Design Space Diversity / Topologies (3)

- Two Concepts / **Similar Spec.:** 12.5 kW, 650...720 V DC, CISPR 11 Class A / **Similar Performance** ( $\eta_{CEC} = 99.1\%$ )

**7-Level All-Si HANPC PV Inverter** ★  
99.35%, 3.4 kW/dm<sup>3</sup>



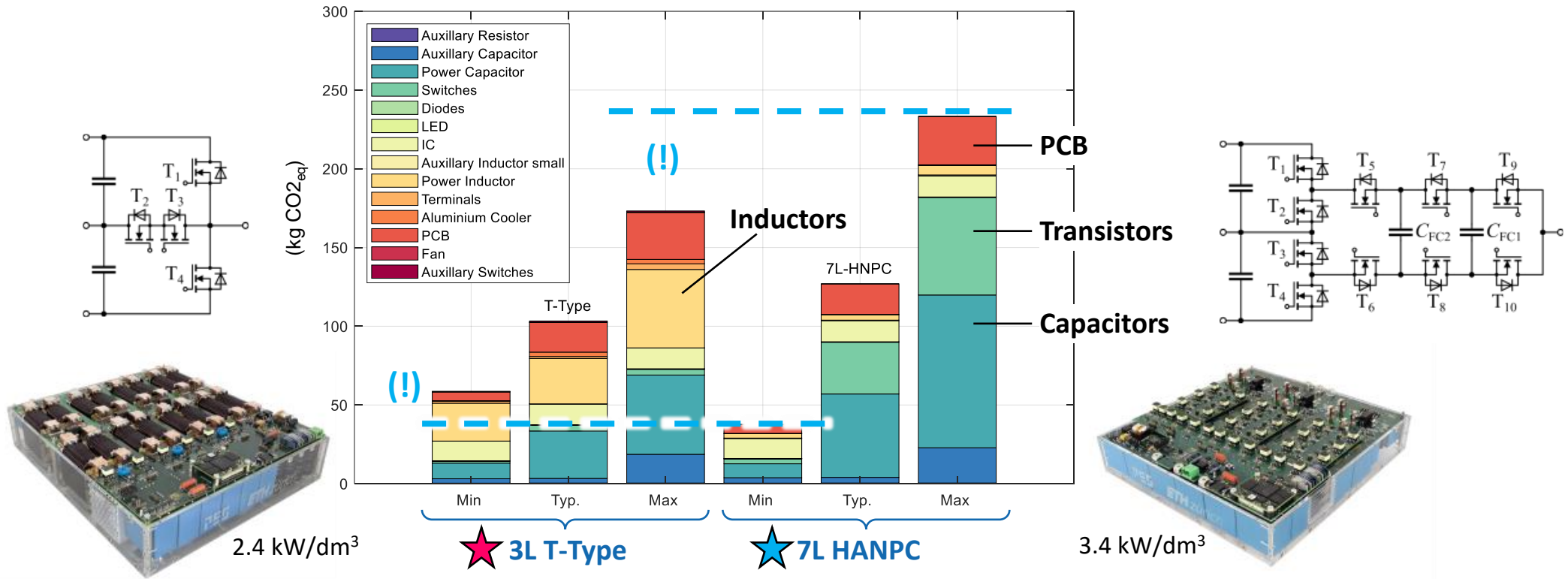
**3-Level All-SiC T-Type PV Inverter** ★  
99.4%, 2.4 kW/dm<sup>3</sup>



- Differences in Environmental Impact?**

# A-Posteriori LCA of the two PV Inverters

■ Two Concepts / **Similar Spec.:** 12.5 kW, 650...720 V DC, CISPR 11 Class A / **Similar Performance** ( $\eta_{CEC} = 99.1\%$ )



■ Generic Models / Data Source: ecoinvent & Literature => **Wide Range of Parameter Values / CO<sub>2</sub>eq Results**

■ **Challenge for Multi-Objective Optimization:** Even Further Abstraction Necessary!

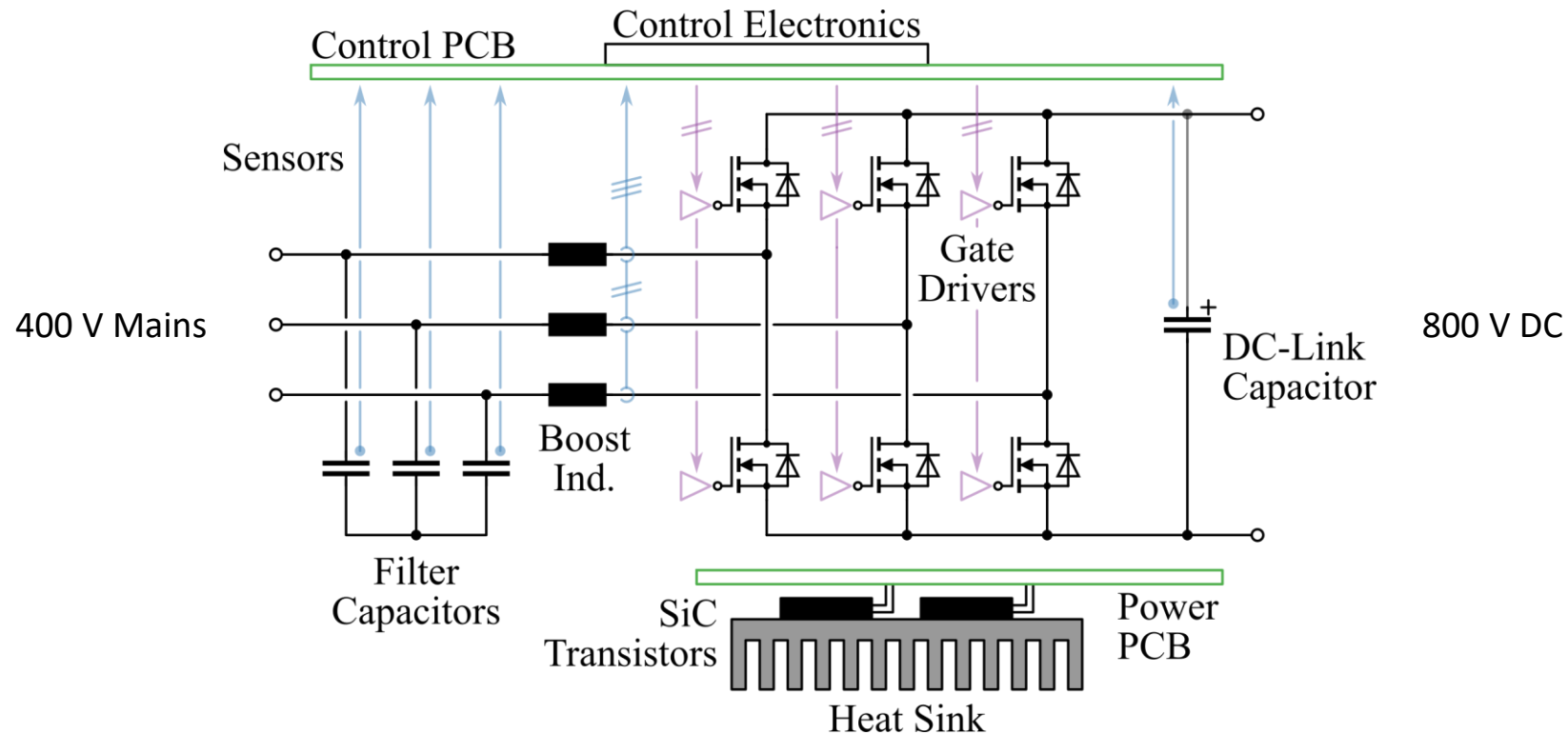
## The Tool

*Multi-Objective Optimization with  
Environmental Impacts as New Dimensions*



## Example: 3-Phase Power Electronic Building Block (PEBB)

- Key Building Block for Three-Phase Rectifiers & Inverters / 400 V Mains, 800 V DC, 10 kW, 1200 V SiC

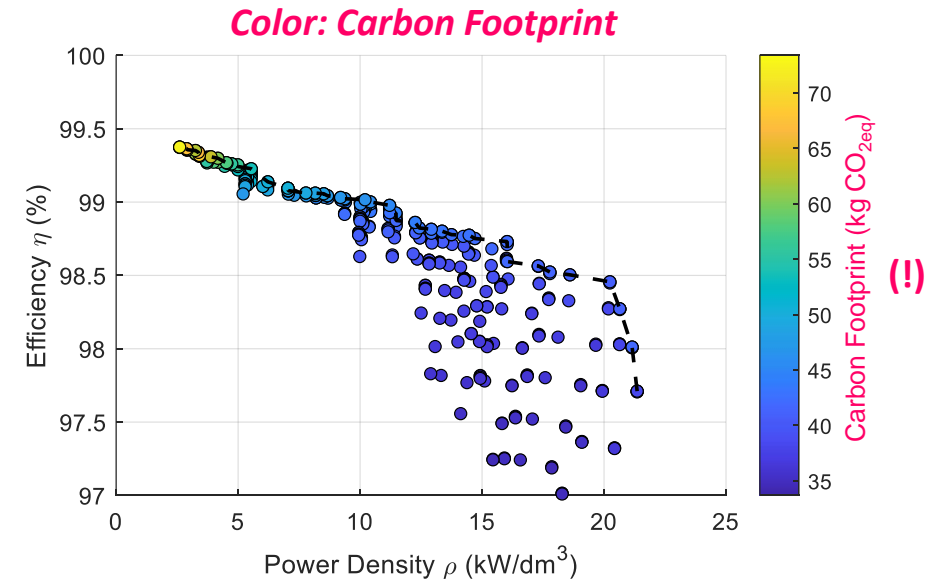
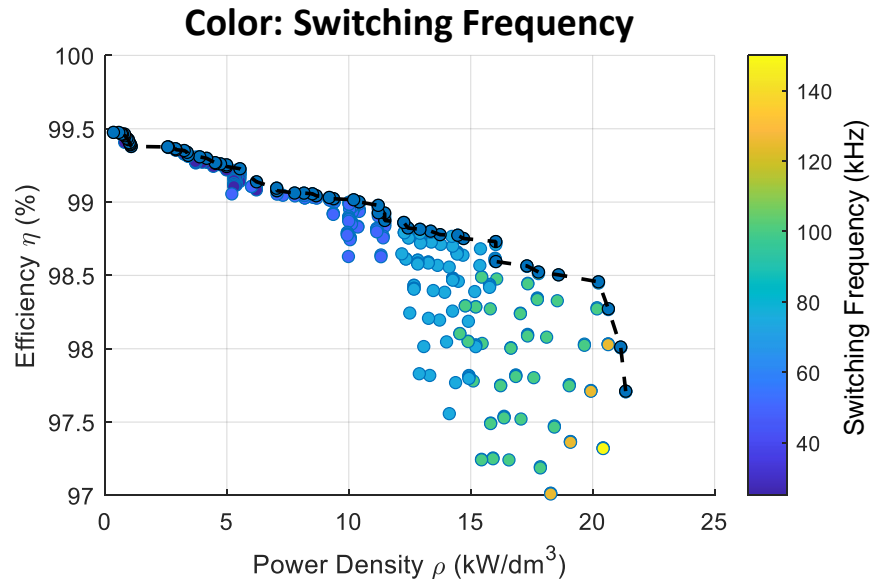


- Main Components Considered (Losses, Volume,  $\text{CO}_{2\text{eq}}$ )

Power Transistors, Heat Sink, Boost Inductors, DC-Link Capacitor, Filter Capacitors, Gate Drivers, Sensors, Control Electronics, PCBs

# Efficiency vs. Power Density Pareto Front

■ Three-Phase Two-Level AC-DC PEBB with LC Input Filter: 400 V Mains, 800 V DC, 10 kW, 1200 V SiC



## ■ Degrees of Freedom

- Switching Frequency [25...200 kHz]
- Rel. Inductor Peak Current Ripple [0.25...1]
- Variable Transistor Chip Area
- Variable Inductor Size (N87; Solid/Litz Wire)

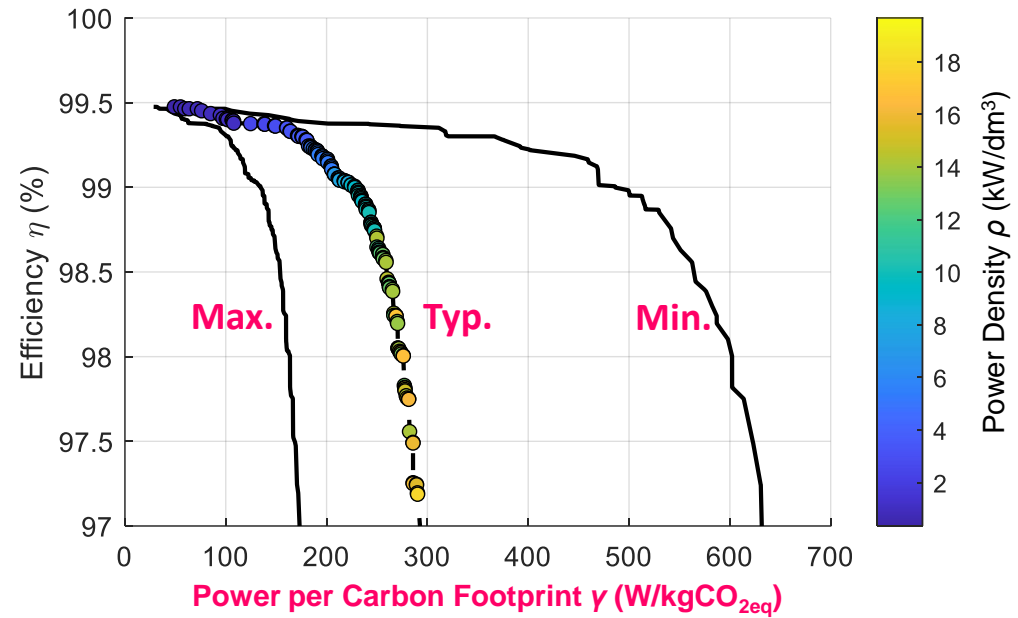
## ■ Assumptions

- Junction Temperature at 120 °C
- Necessary Heat Sink Volume via CSPI = 25 kW/(kg dm<sup>3</sup>)

## ■ CO<sub>2eq</sub> Data: ecoinvent, Literature => Typ. Val. (!)

# Efficiency vs. Carbon Footprint Pareto Front

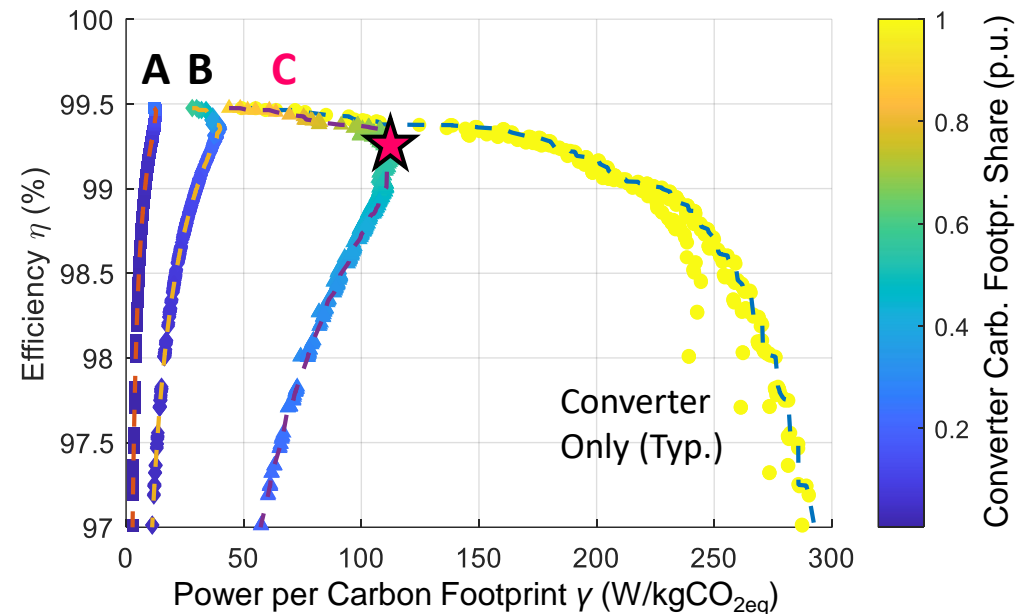
- **Data Quality** is a Major Challenge – Large Spread Between Max. / Typ. / Min. Values!
- **Pareto Front => Pareto Area** w. Probability Density (Not Shown)



- Power Density / Size Related to Carbon Footprint / **Not** a Direct Predictor

# Efficiency vs. Lifetime Carbon Footprint Pareto Front

- Converter Losses Covered with Electricity with Non-Zero Carbon Intensity
- **Mission Matters:** Example 8 Hours Full Load per Day, 10 Years Lifetime



## ■ Electricity Mix Matters: Carbon Intensity

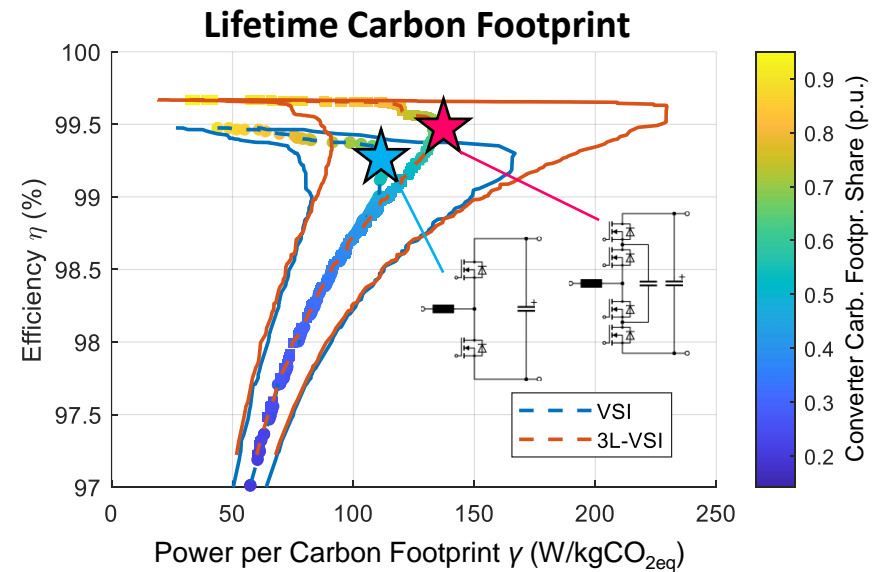
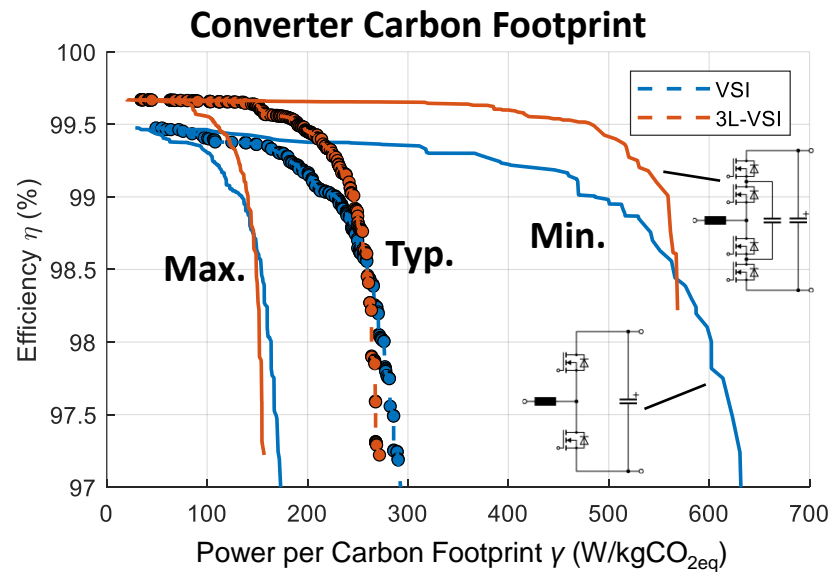
- |  |                                    |
|--|------------------------------------|
| <b>A</b> Consumption Mix Germany                     | 411 g CO <sub>2eq</sub> / kWh      |
| <b>B</b> Consumption Mix Switzerland                 | 99 g CO <sub>2eq</sub> / kWh       |
| <b>C</b> <b>Renewable Production Mix Switzerland</b> | <b>16 g CO<sub>2eq</sub> / kWh</b> |

Source: www.bafu.admin.ch



# Topology Evaluation Example: 2-Level vs. 3-Level PEBB

- 3-Level Flying-Capacitor Bridge Legs w. 650 V SiC MOSFETS / 2-Level Bridge Legs w. 1200 V SiC MOSFETS
- 400 V Mains, 800 V DC, 10 kW / LC Filter w. Same Capacitor Voltage Ripple



Scenario: 8 h/d Full Load for 10 Years, Renewable Production Mix Switzerland

- Data Quality / High Uncertainty / Largely Overlapping Performance Spaces
- Environmental Profile with Further Performance Indices?



# The Roadmap

# Life Cycle **Impact** Assessment (LCIA)

## ■ Example: ReCiPe 2016 – Three Areas of Protection / Endpoint Categories:

- **Human Health**

Damage to Human Health  
in Disability-Adjusted Loss of Life Years (DALY)

- **Ecosystem Quality**

Damage to Ecosystem Quality  
in Time-Integrated Species Loss (Species.yr)

- **Resource Scarcity**

Damage to Resource Availability  
in Surplus Cost (\$)

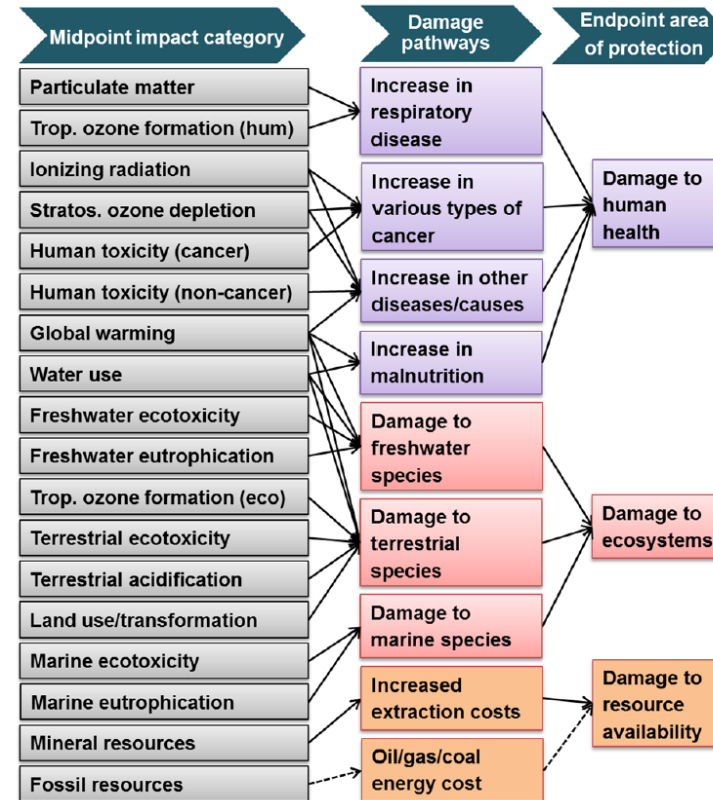
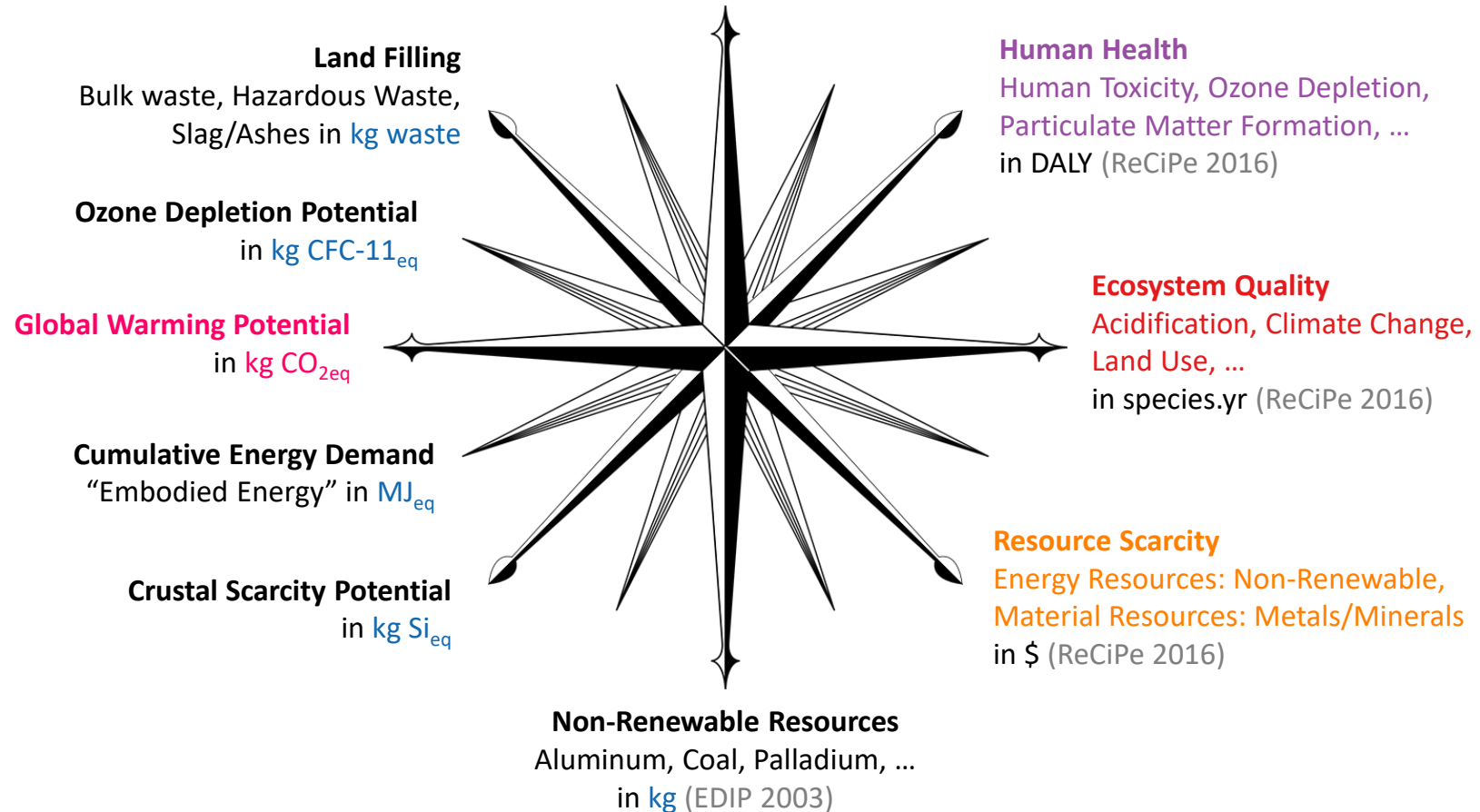


Image: ReCiPe 2016 v1.1.1 Report

## ■ Value Choices (**Individualist** / **Hierarchist** / **Egalitarian**) Affect Time Horizon, Included Effects, etc.

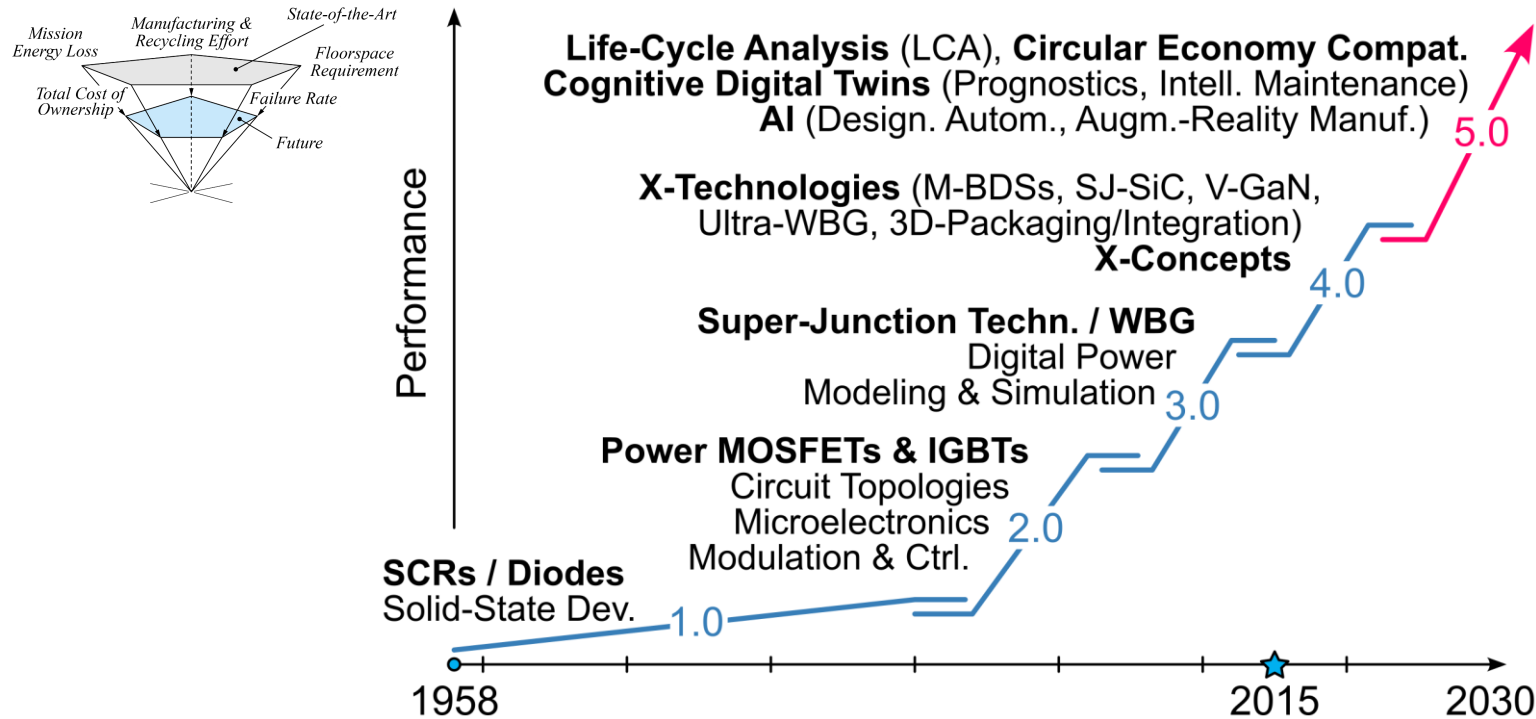
# CO<sub>2</sub> is Not Enough: New Performance Space Dimensions

- Life Cycle Impact Assessment (LCIA) Phase of LCA => Environmental Profile w. Wide Range of Perf. Indicators
- Selected Examples (Midpoints / Endpoints):



# Power Electronics Development Cycles

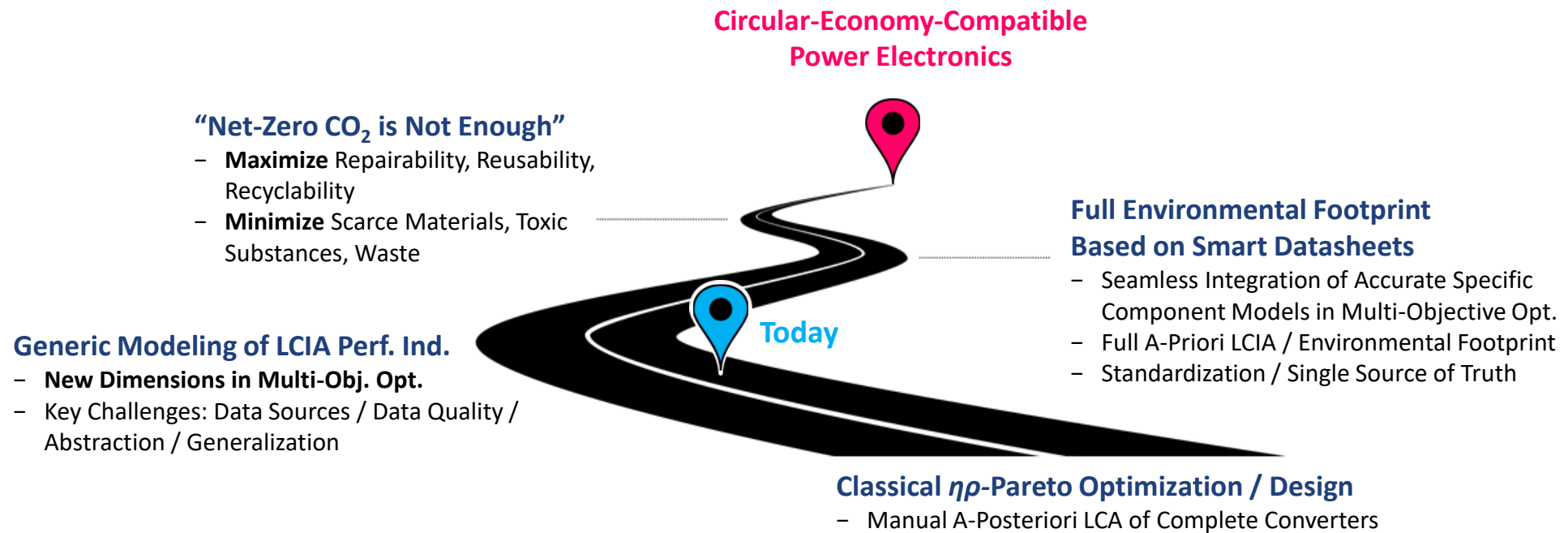
- Technology S-Curves Typ. Triggered by New Power Semiconductor Developments / Disruptive X-Technologies



- Life-Cycle Analysis / Circular-Economy-Compatibility are Key for Sustainable Power Electronics 5.0

# The Roadmap

■ **Environmental Awareness** as Integral Part of the Design Process / Circular-Economy-Compatibility by 2050



■ Up Next: Discussion *ECPE Whitepaper and Roadmap Towards Circular-Economy-Compatible Power Electronics*





# Thank You!



■ **Up Next: Discussion**

*ECPE Whitepaper and Roadmap Towards Circular-Economy-  
Compatible Power Electronics*