



Multi-Objective Optimization of Power Electronics Converter Systems

Johann W. Kolar

Swiss Federal Institute of Technology (ETH) Zurich
Power Electronic Systems Laboratory
www.pes.ee.ethz.ch



Outline

- ▶ Introduction
- ▶ *Multi-Objective Optimization Approach*
- ▶ *Optimization Application Examples*
- ▶ Summary

Acknowledgement

D. Bortis
R. Bosshard
R. Burkart
F. Krismer

Introduction

Power Electronics Performance Trends
Power Converter Design Challenge

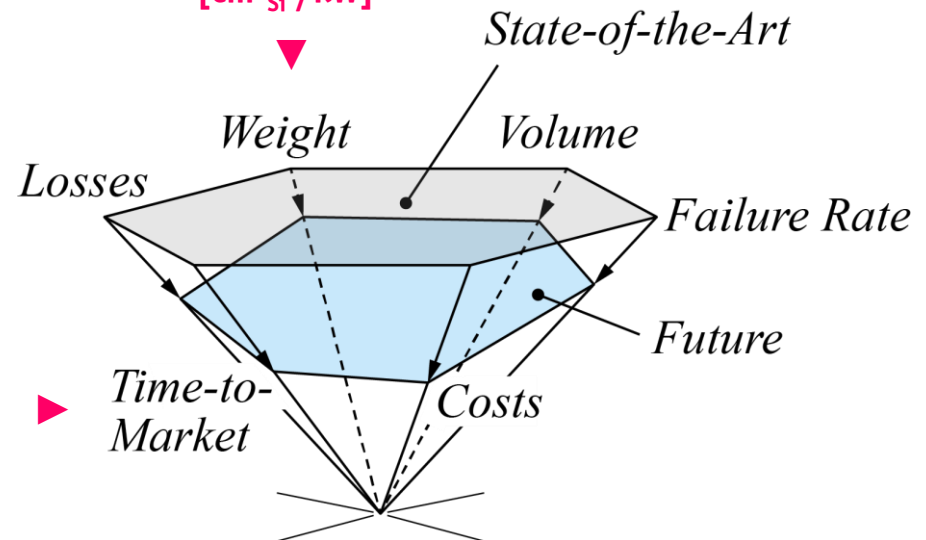
► Power Electronics Converters Performance Trends

■ Performance Indices

- Power Density [kW/dm³]
- Power per Unit Weight [kW/kg]
- Relative Costs [kW/\$]
- Relative Losses [%]
- Failure Rate [h⁻¹]

Environmental Impact...

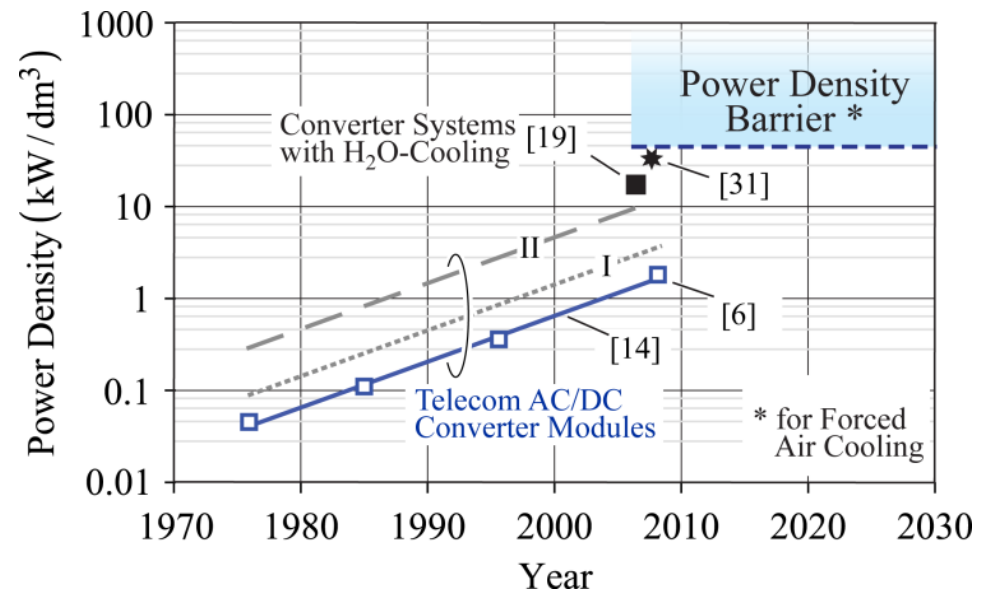
[kg_{Fe} /kW]
[kg_{Cu} /kW]
[kg_{Al} /kW]
[cm²_{Si} /kW]



► Performance Improvements (1)

■ Power Density

- Telecom Power Supply Modules:
Typ. Factor 2 over 10 Years



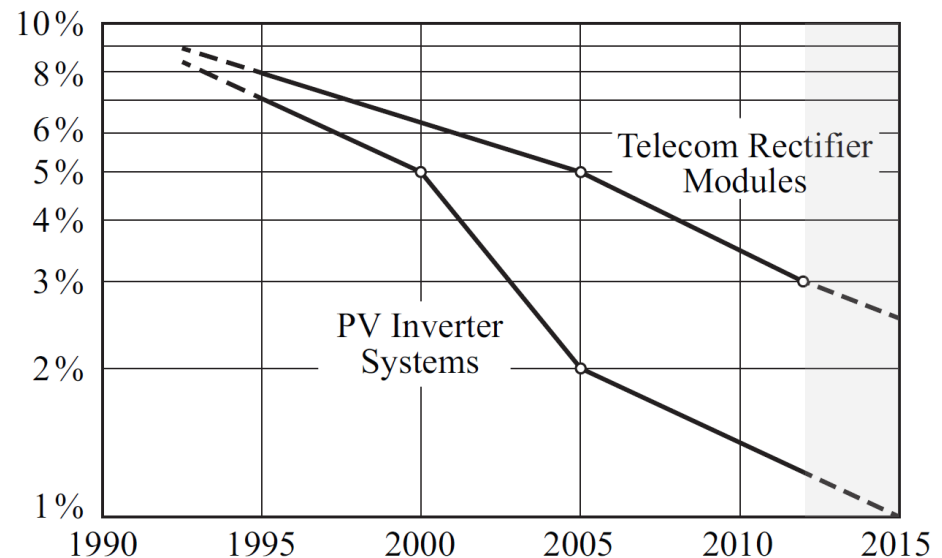
► Performance Improvements (2)

Inefficiency (Losses)...

$1-\eta$

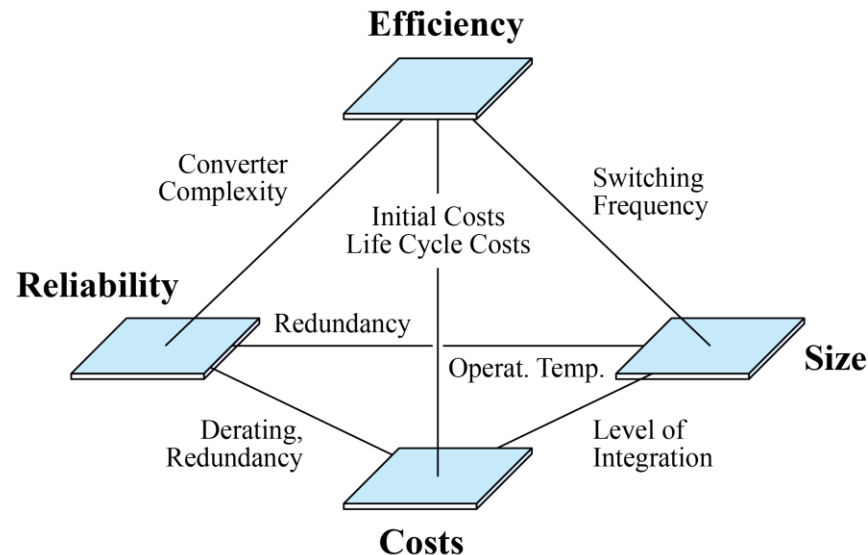
■ Efficiency

— PV Inverters: Typ. Loss Red. of
Typ. Factor 2 over 5...10 Years



► Multi-Objective Design Challenge (1)

- Performances are Approaching Physical Limits (e.g. Efficiency)
- Counteracting Effects of Key Design Parameters
- **Mutual Coupling of Performance Indices - Trade-Offs**



- Large Number of Degrees of Freedom / **Multi-Dimensional Design Space**
- Full Utilization of Design Space only **Guaranteed by Multi-Objective Optimization**

► Multi-Objective Design Challenge (2)

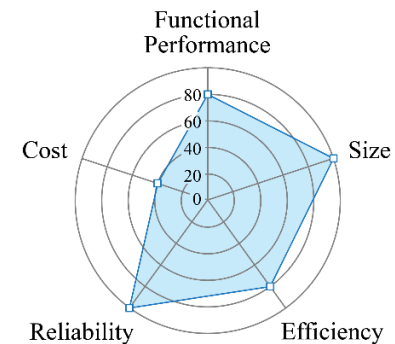
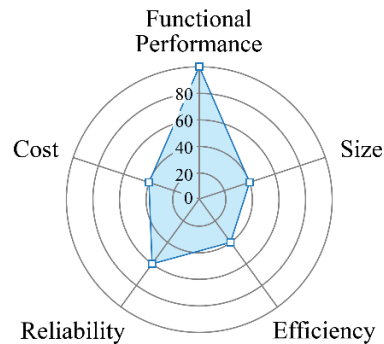
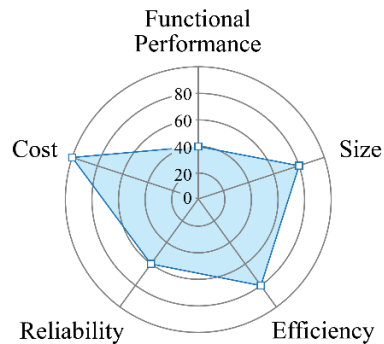
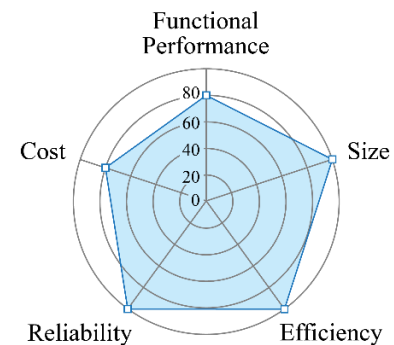
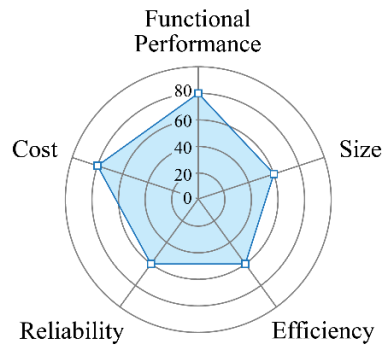
- Performances are Approaching Physical Limits (e.g. Efficiency)
- Counteracting Effects of Key Design Parameters
- **Mutual Coupling of Performance Indices - Trade-Offs**



- Large Number of Degrees of Freedom / **Multi-Dimensional Design Space**
- Full Utilization of Design Space only Guaranteed by **Multi-Objective Optimization**

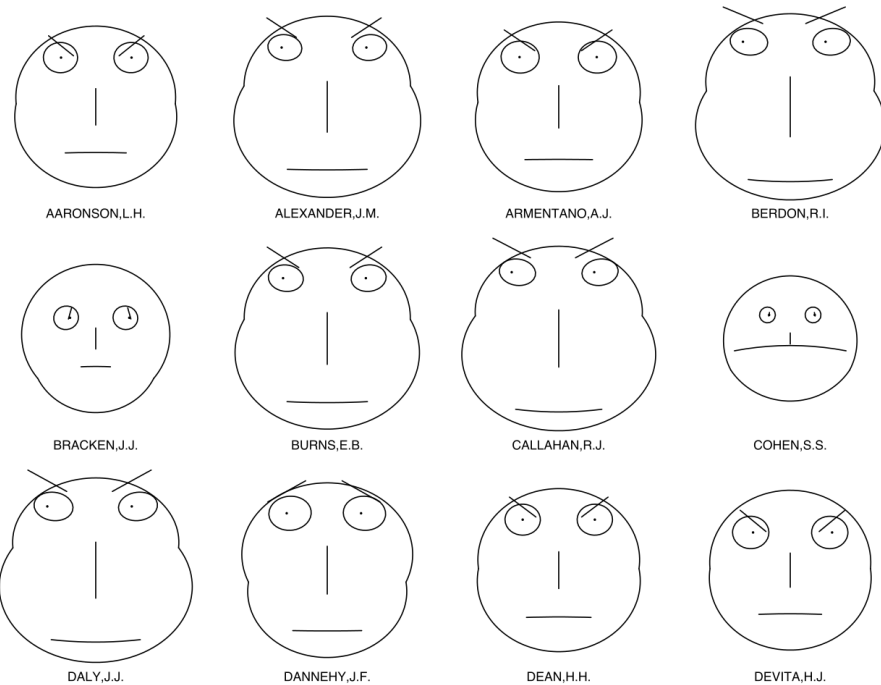
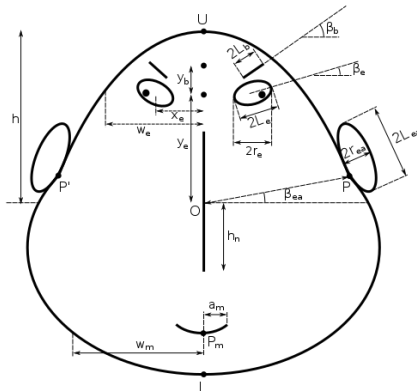
► Multi-Objective Design Challenge (3)

- **Specific Performance Profiles / Trade-Offs**
Dependent on Application



► Visualization of Multiple Performances

- Spider Charts, etc.
- Chernoff-Faces ;-)

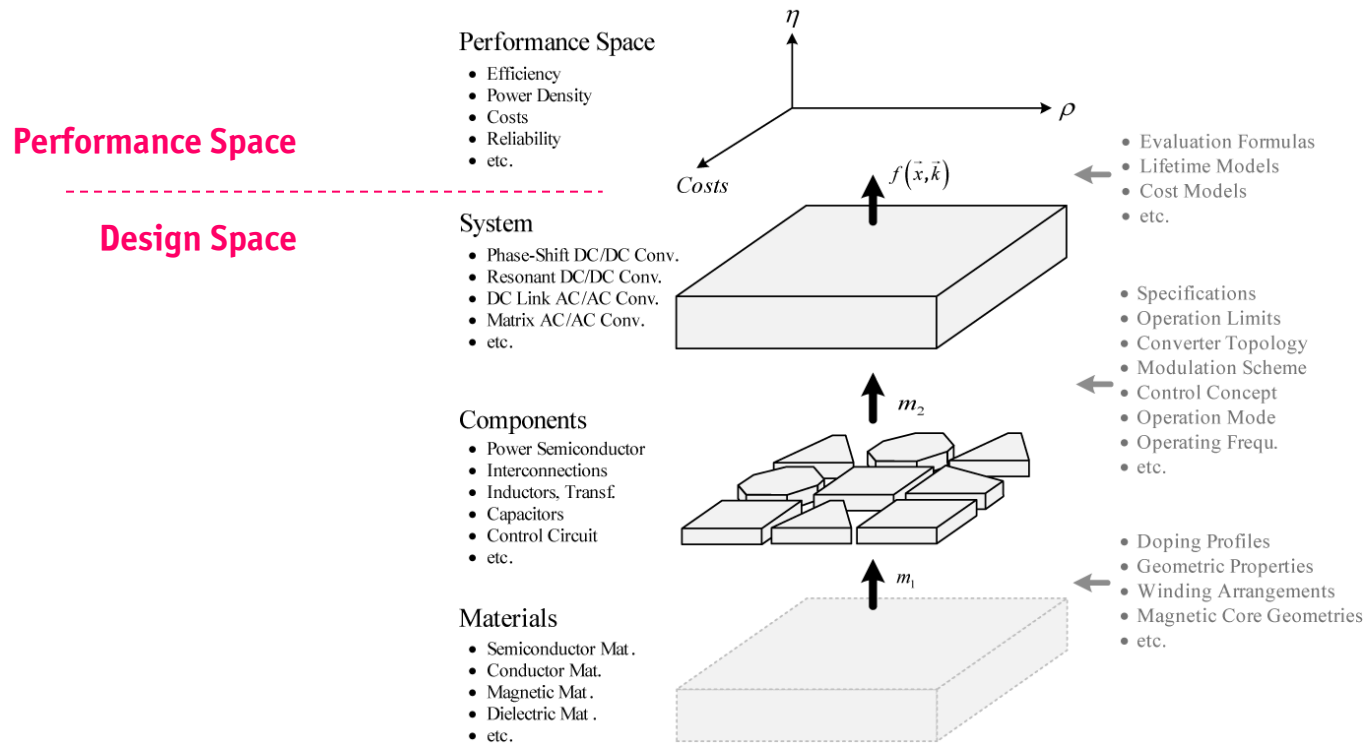


→ H. Chernoff / Stanford: “The Use of Faces to Represent Points in K-Dimensional Space Graphically”

Multi-Objective Optimization

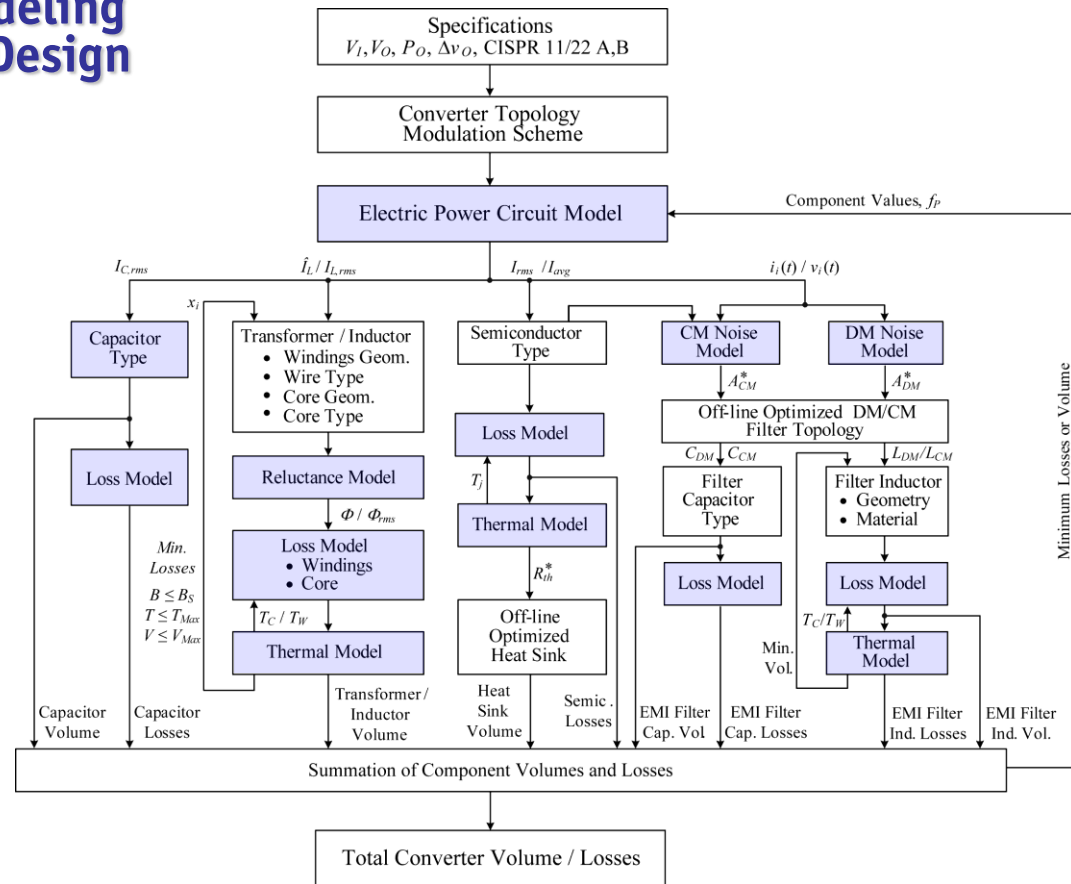
Abstraction of Converter Design
Design Space / Performance Space
Pareto Front
Sensitivities / Trade-Offs

► Abstraction of Power Converter Design



→ Mapping of "Design Space" into System "Performance Space"

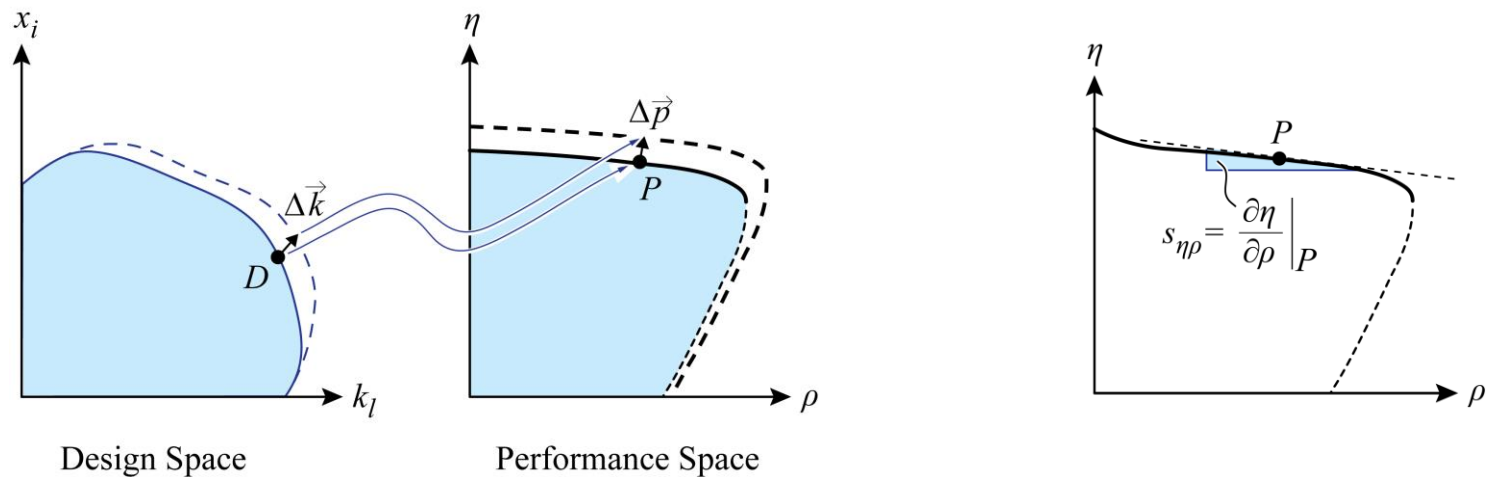
► Mathematical Modeling of the Converter Design



→ Multi-Objective Optimization – Best Utilization of All Degrees of Freedom

► Multi-Objective Optimization (1)

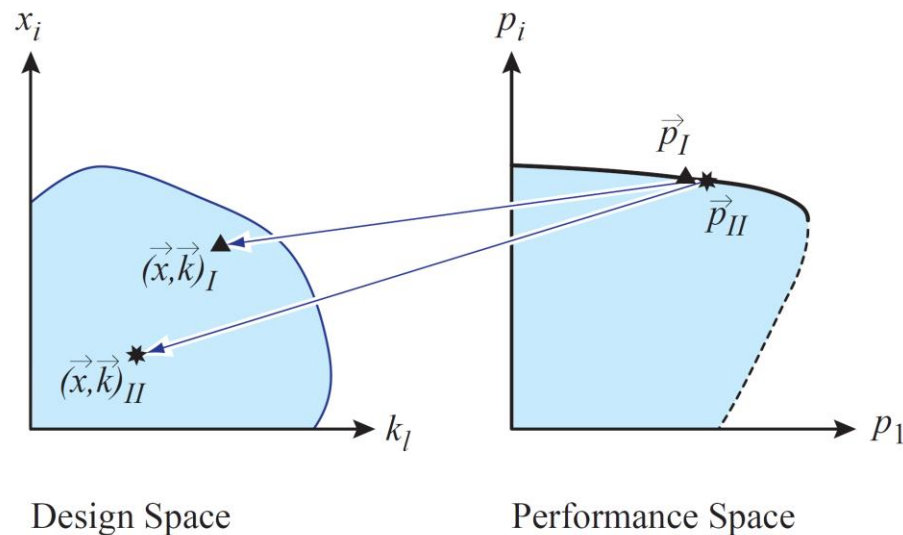
- Ensures **Optimal Mapping** of the “Design Space” into the “Performance Space”
- Identifies **Absolute Performance Limits** → **Pareto Front / Surface**



- Clarifies **Sensitivity** $\Delta \vec{p} / \Delta \vec{k}$ to Improvements of Technologies
- **Trade-off Analysis**

► Multi-Objective Optimization (2)

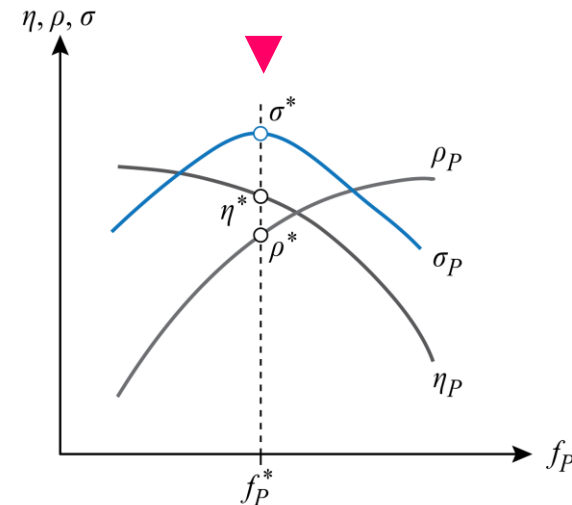
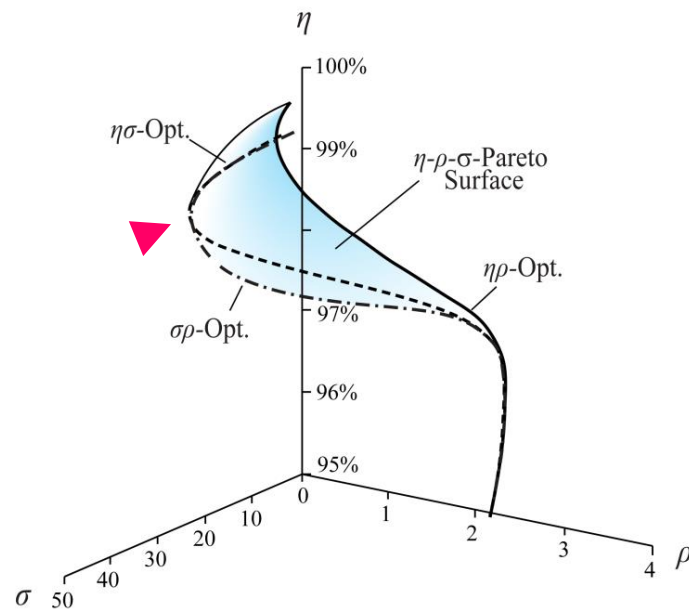
- Design Space Diversity
- Equal Performance for Largely Different Sets of Design Parameters



- E.g. Mutual Compensation of Volume and Loss Contributions (e.g. Cond. & Sw. Losses)
- Allows Optimization for Further Performance Index (e.g. Costs)

► Converter Performance Evaluation Based on η - ρ - σ -Pareto Surface

- Definition of a Power Electronics “Technology Node” $\rightarrow (\eta^*, \rho^*, \sigma^*, f_P^*)$
- Maximum σ [kW/\$], Related Efficiency & Power Density



- Specifying Only a Single Performance Index is of No Value (!)
- Achievable Perform. Depends on Conv. Type / Specs (e.g. Volt. Range) / Side Cond. (e.g. Cooling)

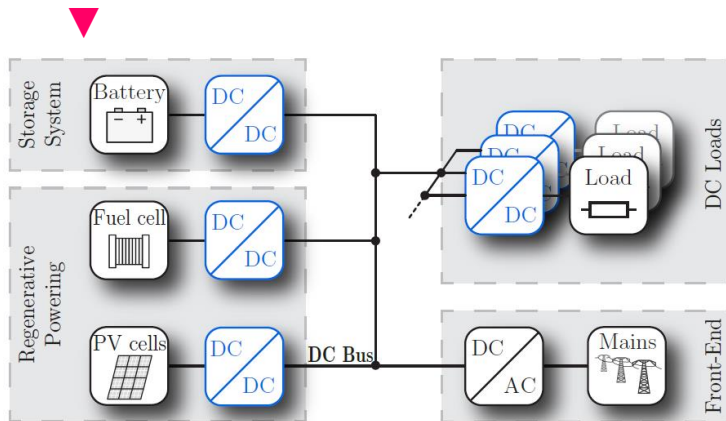
Multi-Objective Optimization Application Examples

Comparative Converter Evaluation
Impact of Technology Progress
Design Space Diversity

*Comparative
Converter Evaluation* →

► Wide Input Voltage Range Isolated DC/DC Converter

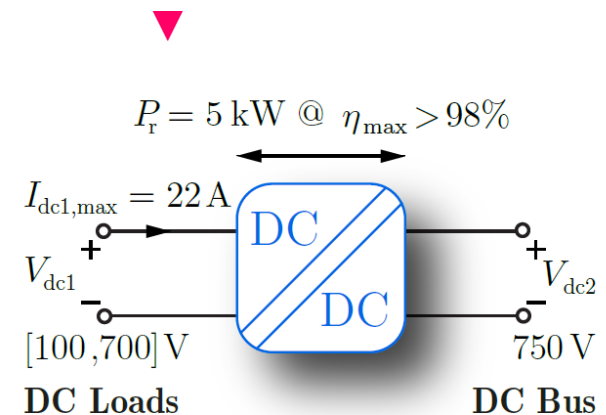
Structure of "Smart Home" DC Microgrid



■ Universal Isolated DC/DC Converter

- Bidirectional Power Flow
- Galvanic Isolation
- Wide Voltage Range
- High Partial Load Efficiency

Universal DC/DC Converter

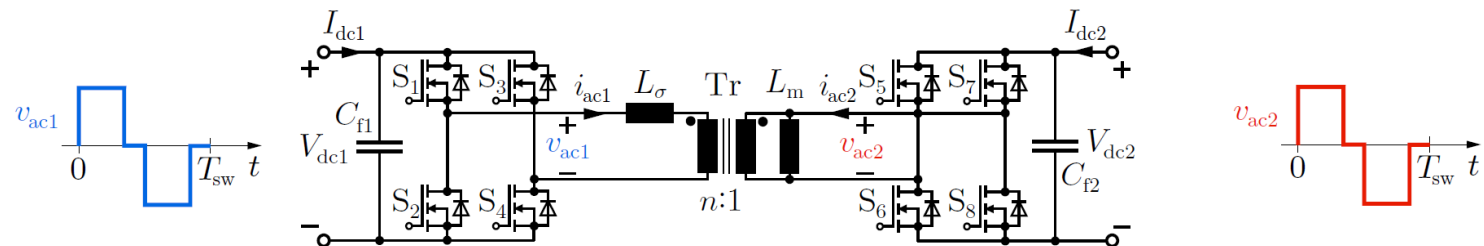


■ Advantages

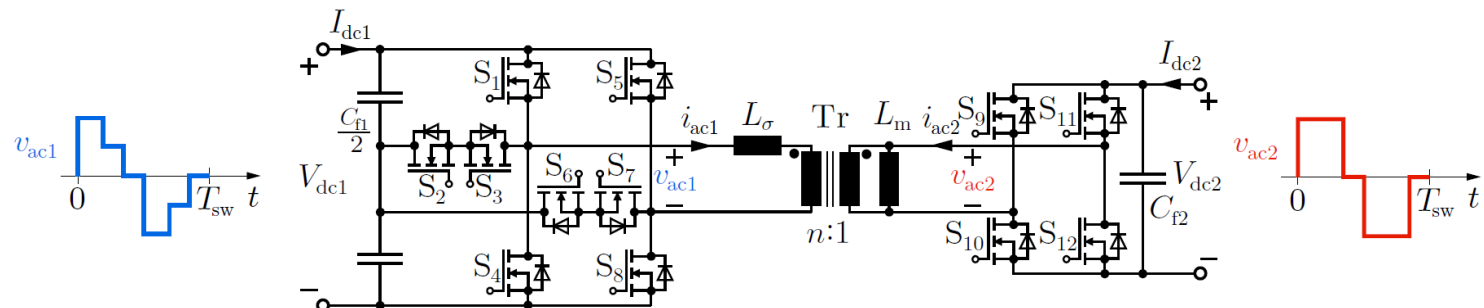
- Reduced System Complexity
- Lower Overall Development Costs
- Economies of Scale

► Comparative Evaluation of Converter Topologies

■ Conv. 3-Level Dual Active Bridge (3L-DAB)



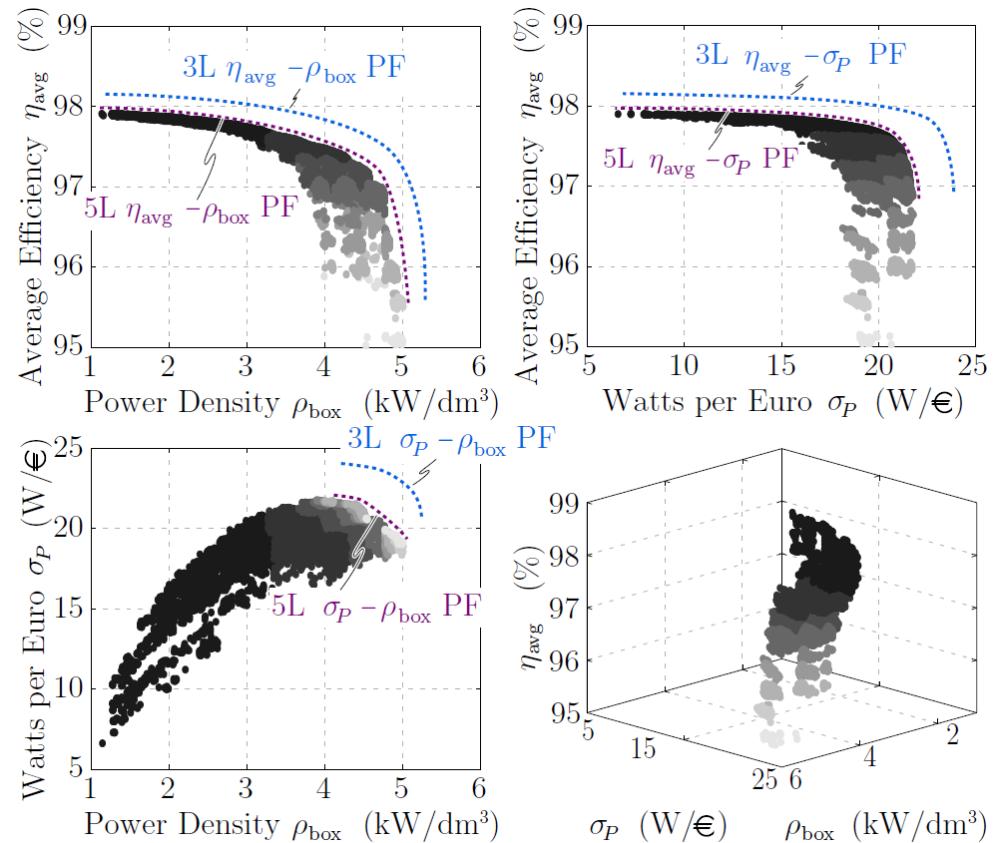
■ Advanced 5-Level Dual Active Bridge (5L-DAB)



► Optimization Results - Pareto Surfaces

- 3-Level Dual Active Bridge
- 5-Level Dual Active Bridge

50 75 100 125 150 175 200 225
Switching Frequency f_{sw} (kHz)



*Impact of Technology Progress
& Design Space Diversity* →

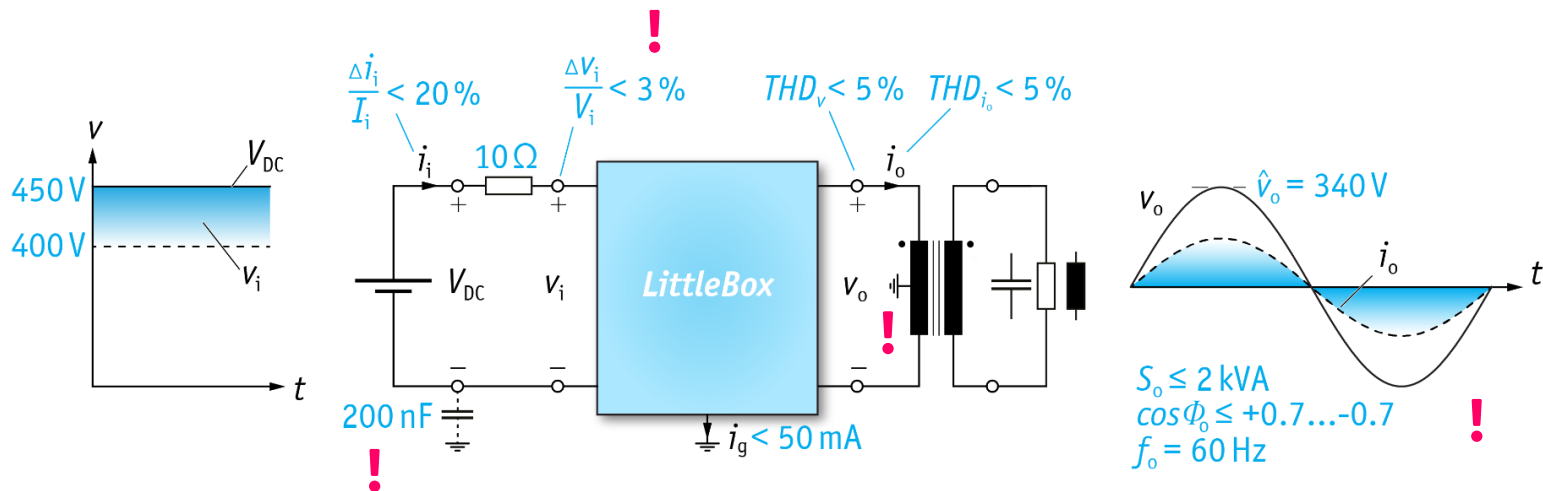




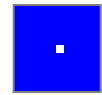
LITTLE BOX CHALLENGE



- Design / Build the 2kW 1- Φ Solar Inverter with the Highest Power Density in the World
- Power Density > 3kW/dm³ (50W/in³)
- Efficiency > 95%
- Case Temp. < 60°C
- EMI FCC Part 15 B

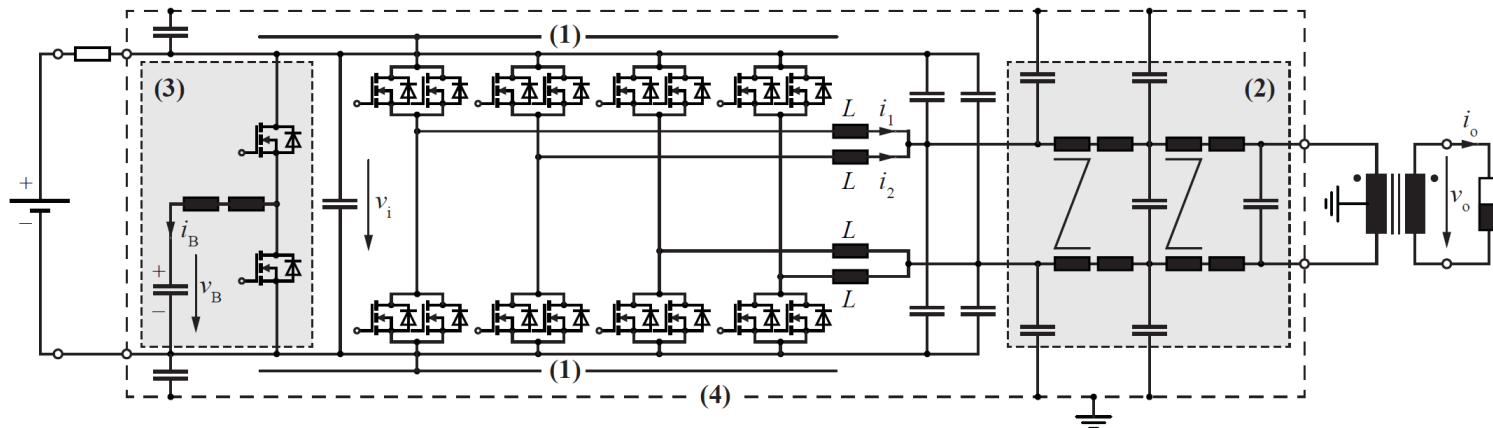


→ Push the Forefront of New Technologies in R&D of High Power Density Inverters

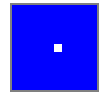


Selected Converter Topology

- Interleaving of 2 Bridge Legs per Phase
- Active DC-Side Buck-Type Power Pulsation Buffer
- 2-Stage EMI AC Output Filter



- ZVS of All Bridge Legs @ Turn-On/Turn-Off in Whole Operating Range (4D-TCM-Interleaving)
- Heatsinks Connected to DC Bus / Shield to Prevent Cap. Coupling to Grounded Enclosure



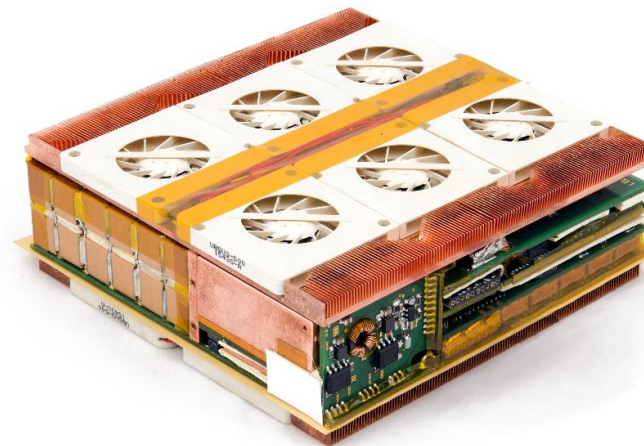
Little-Box 1.0 Prototype

■ Performance

- 8.2 kW/dm³
- 96,3% Efficiency @ 2kW
- $T_c = 58^\circ\text{C}$ @ 2kW

■ Design Details

- 600V IFX Normally-Off GaN GIT
- Antiparallel SiC Schottky Diodes
- Multi-Airgap Ind. w. Multi-Layer Foil Wdg
- Triangular Curr. Mode ZVS Operation
- CeraLink Power Pulsation Buffer

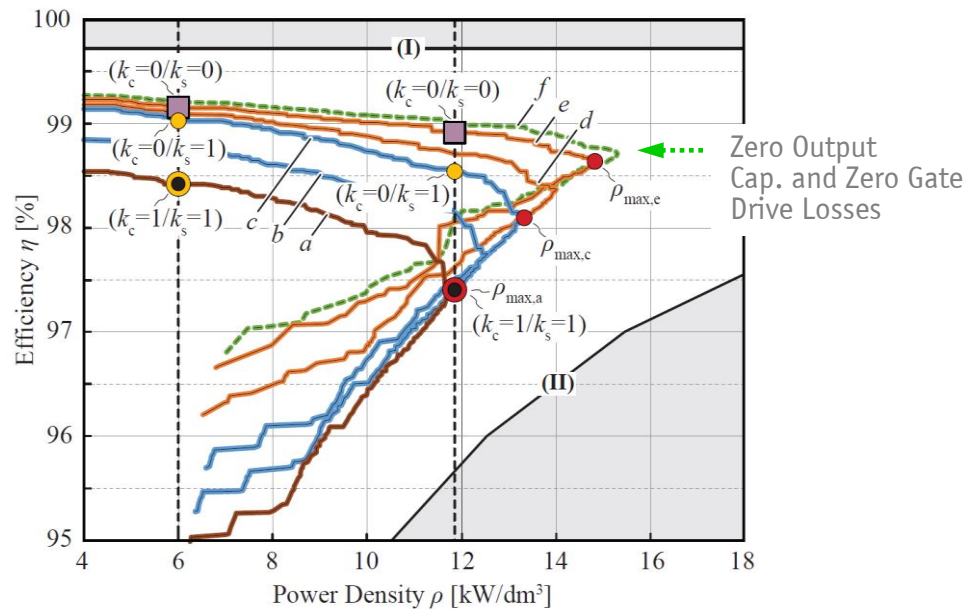
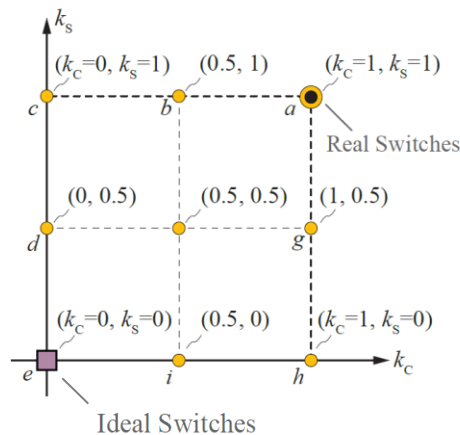


→ Analysis of Potential Performance Improvement for *Ideal Switches*



Little Box 1.0 @ Ideal Switches (TCM)

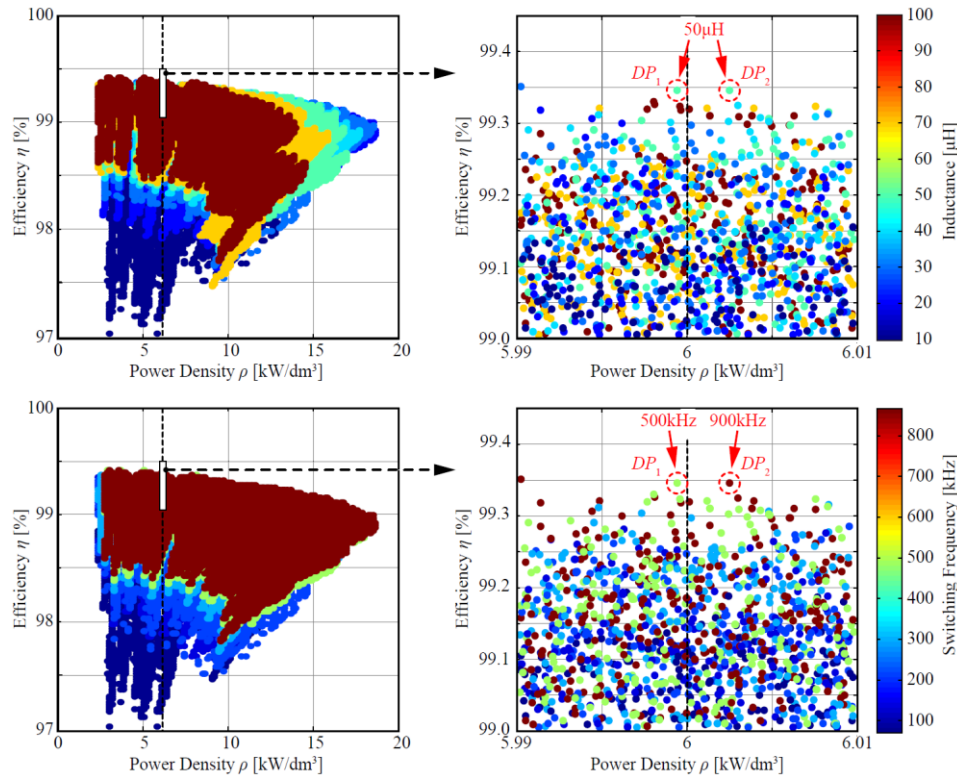
- Multi-Objective Optimization of Little-Box 1.0 (X6S Power Pulsation Buffer)
- Step-by-Step Idealization of the Power Transistors
- Ideal Switches: $k_c = 0$ (Zero Cond. Losses); $k_s = 0$ (Zero Sw. Losses)



→ Analysis of Improvement of Efficiency @ Given Power Density & Maximum Power Density
→ The Ideal Switch is NOT Enough (!)



Little Box 1.0 @ Ideal Switches (PWM)



$$\rho = 6\text{ kW/dm}^3$$

$$\eta \approx 99.35\%$$

$$L = 50\mu\text{H}$$

$$f_s = 500\text{kHz or } 900\text{kHz}$$

- L & f_s are Independent Degrees of Freedom
- Large Design Space Diversity (Mutual Compensation of HF and LF Loss Contributions)

Summary

Future Developments/Design Process

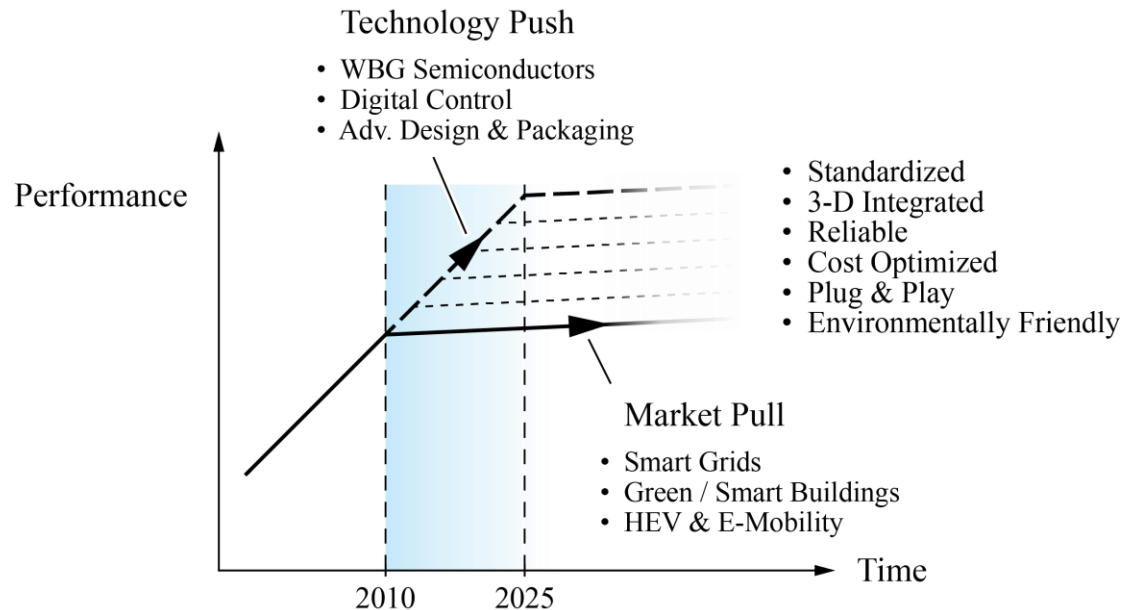
Future Research Topics

Power Electronics 2.0

Appendix

► Future Developments

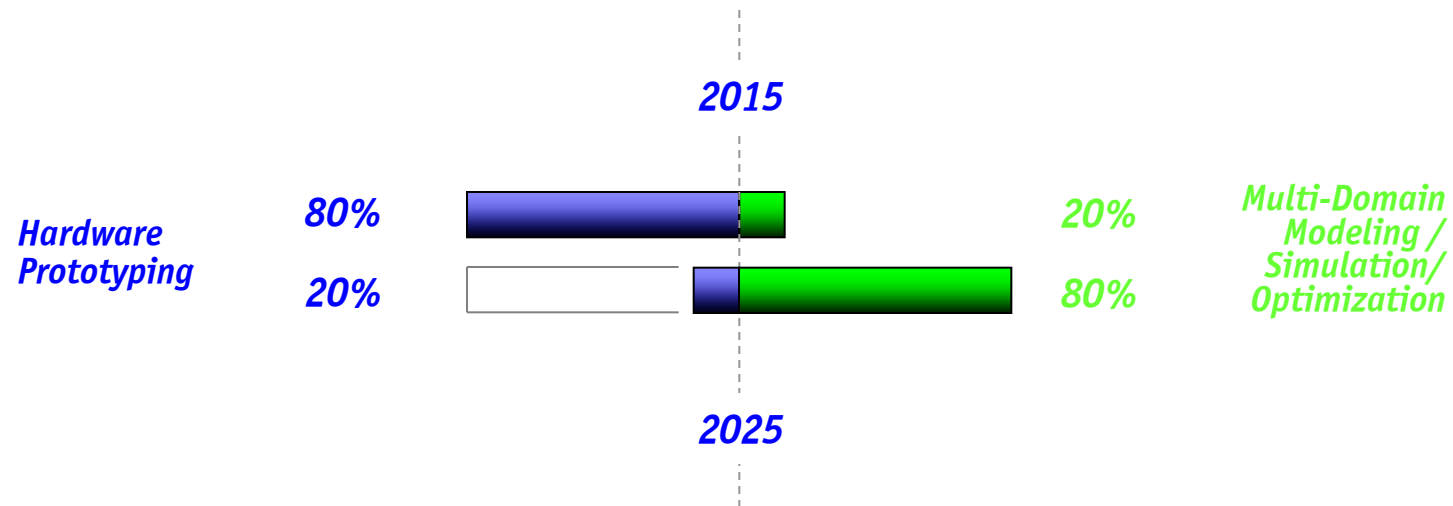
- **Megatrends – Renewable Energy / Energy Saving / E-Mobility / “SMART” XXX**
- **Power Electronics will Massively Spread in Applications**



- **More Application Specific Solutions**
- **Mature Technology – Cost Optimization @ Given Performance Level**
- **Design / Optimize / Verify (in Simulation) - Cheaper / Faster / Better**

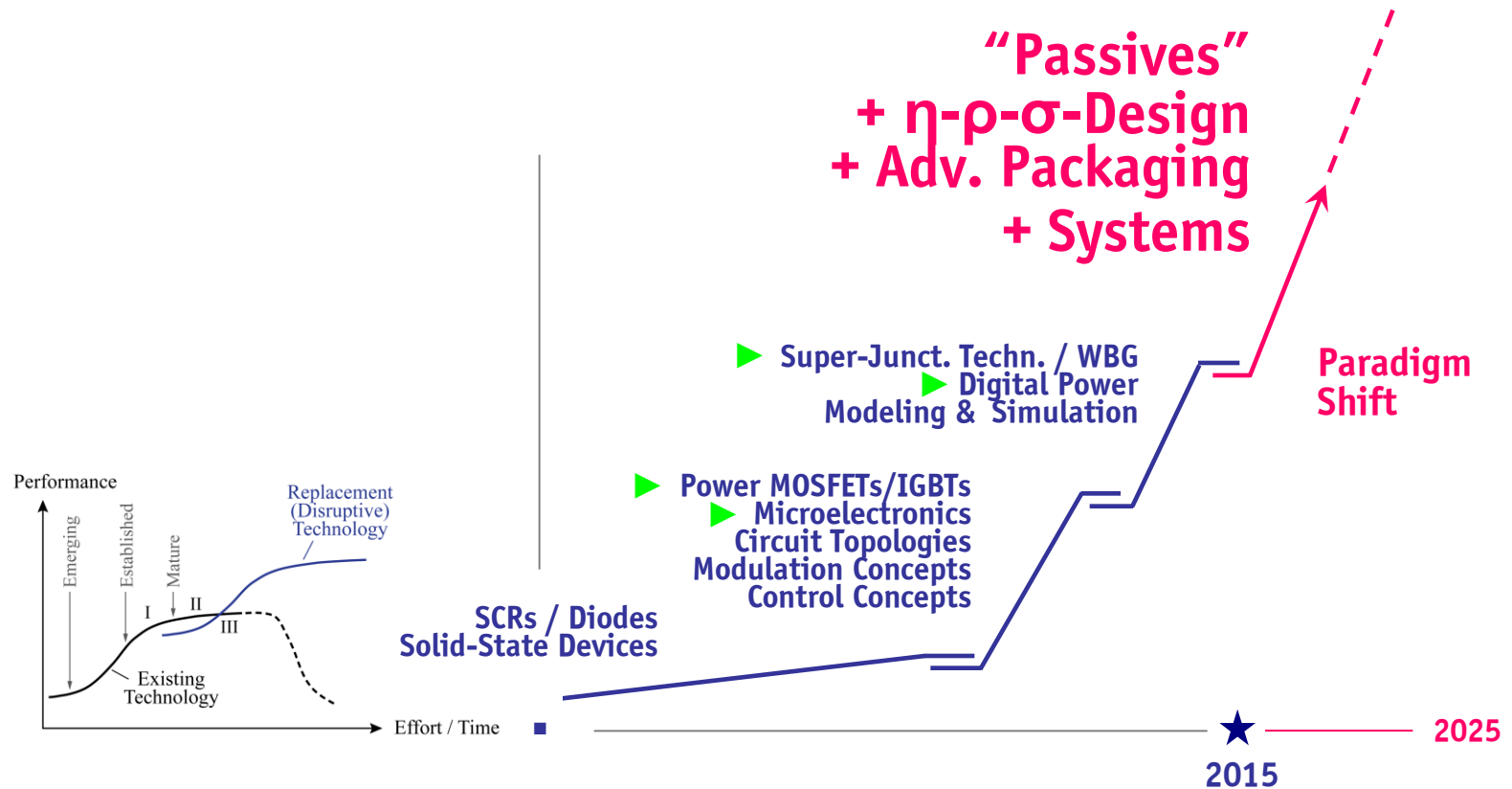
► Future Design Process

- Main Challenges: Modeling (EMI, etc.) & Implementation in Industry



- Reduces Time-to-Market - Cheaper / Faster / Better
- Allows to Understand Mutual Dependencies of Performances / Sensitivities (!)
- Simulate What Cannot Any More be Measured (High Integration Level)

► Power Electronics Technology S-Curve



► Summary

■ Advantages

- Design / Optimize / Verify - All in Simulation
- Provide a *Fully Virtual Design* for *Fully Automated Manufacturing*
- Reduce Design Period from Weeks to Hours (Factor >100)
- Directly Build Systems from Optimiz. Results (3D Printing etc.)
- Pre-Analyze Improvement by New Technologies ("Research Efficiency")
- Optimize over Extreme Span (Semicond. Doping to Conv. Mission Profile)
- Free Adjustment of Optimization Criteria (Design on Demand)

■ Research Topics

- Reduced Order Models / Model Accuracy
- Opt. Combination of Analytical & FEM Models
- Partitioning of Optimiz. (Local/Global Variables & Optimiz. etc.)
- Selection of Abstraction Level / Timescale /
- Translation of Geometries into Model Parameters (e.g. EMI)
- Consideration of Geometric Limitations (Design for Manufact.)
- New Models for Highly Integr. Converters (Strong EM & Therm. Coupl.)
- Convergence of Simulations & Measurements (Autom. Param. Adj.)
- Visualization of Optim. Results / Interfaces (Programming & Results)

■ Challenges

- Introduction in Industry (and Academia ;-))
- Company-Wide Updates / Maintenance
- Integration in "Virtual Prototyping" Environment

■ Limitations

- Simulation Extends the Knowledge Space ... **But,...**
Cannot Create Fundamentally New Concepts (!)

*Future
Paradigm
Shift*



► Power Electronics 2.0

- Design Considering Converters as “Integrated Circuits” (PEBBs)
- Extend Analysis to Converter Clusters / Power Supply Chains / etc.

- “Converter” → “Systems” (Microgrid) or “Hybrid Systems” (Automation / Aircraft)
- “Time” → “Integral over Time”
- “Power” → “Energy”

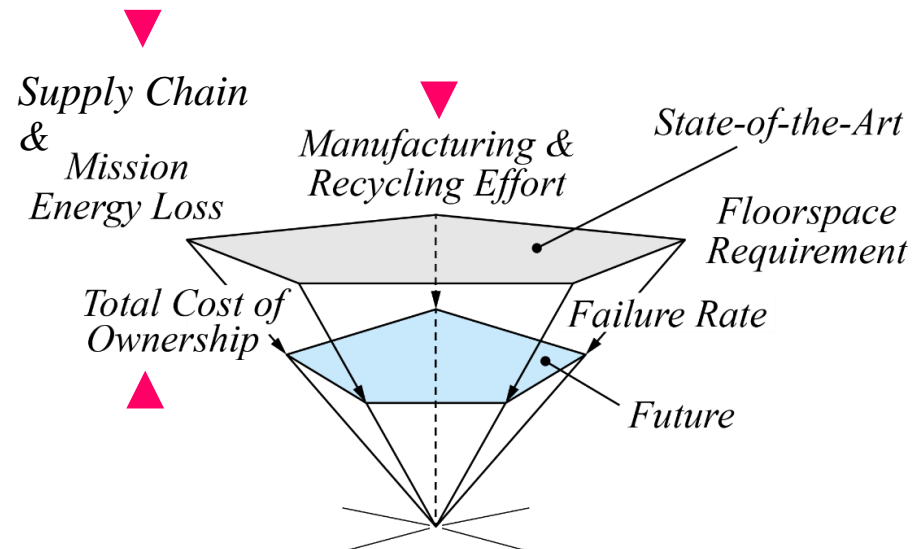
$$p(t) \rightarrow \int_0^t p(t) dt$$

- Power Conversion → Energy Management / Distribution
- Converter Analysis → System Analysis (incl. Interactions Conv. / Conv. or Load or Mains)
- Converter Stability → System Stability (Autonom. Cntrl of Distributed Converters)
- Cap. Filtering → Energy Storage & Demand Side Management
- Costs / Efficiency → Life Cycle Costs / Mission Efficiency / Supply Chain Efficiency
- etc.

► New Power Electronics **Systems** Performance Figures/Trends

■ Complete Set of New Performance Indices

- Power Density [kW/m²]
- Environm. Impact [kW_s/kW]
- TCO [\$/kW]
- Mission Efficiency [%]
- Failure Rate [h⁻¹]



Thank You !



Appendix #1

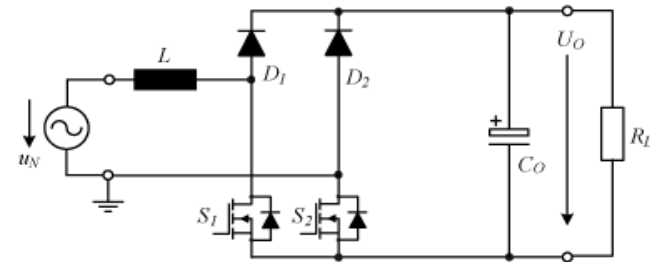
*Determination of the
 η - ρ -Pareto Front*



► Determination of the η - ρ -Pareto Front (1)

■ Comp.-Level Degrees of Freedom of the Design

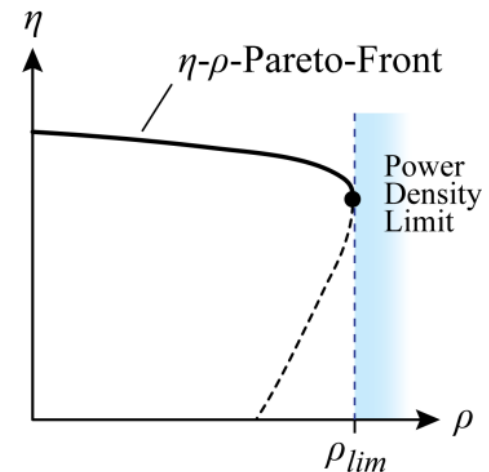
- Core Geometry / Material
- Single / Multiple Airgaps
- Solid / Litz Wire, Foils
- Winding Topology
- Natural / Forced Conv. Cooling
- Hard-/Soft-Switching
- Si / SiC
- etc.
- etc.
- etc.



■ System-Level Degrees of Freedom

- Circuit Topology
- Modulation Scheme
- etc.
- etc.
- etc.

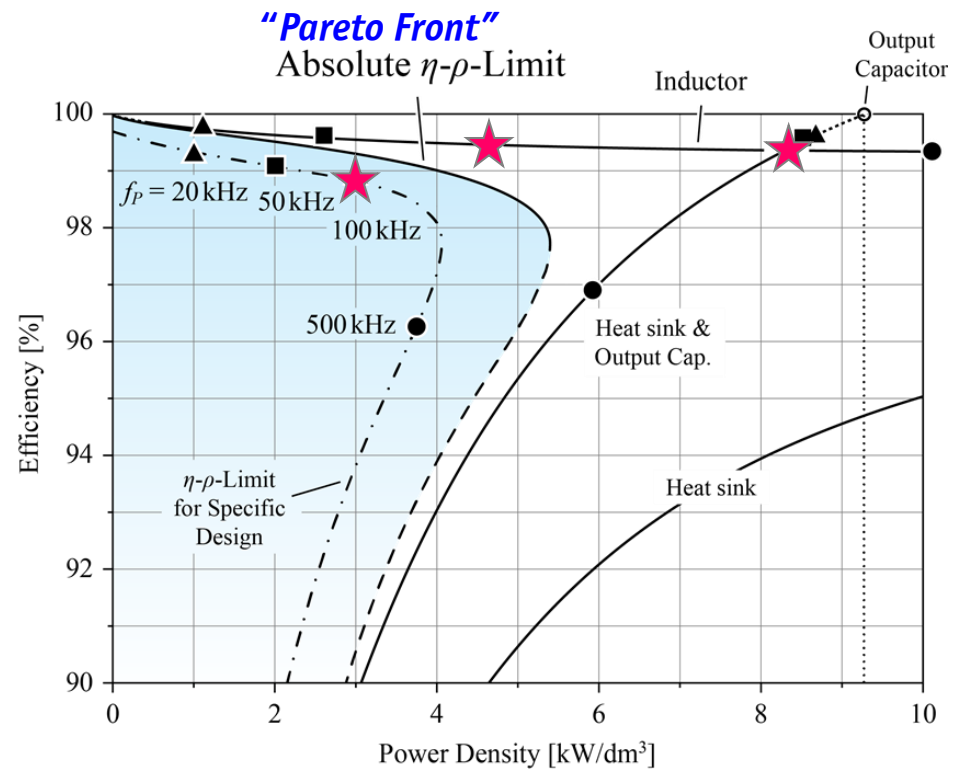
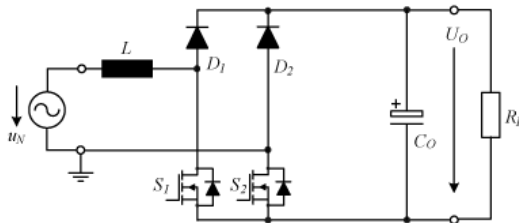
■ Only η - ρ -Pareto Front Allows Comprehensive Comparison of Converter Concepts (!)



► Determination of the η - ρ -Pareto Front (1)

- Specific Design \rightarrow Only f_p as Variable Design Parameter
- Only the Consideration of All Possible Designs / Degrees of Freedom Clarifies the Absolute η - ρ -Performance Limit

★ $f_p = 100\text{ kHz}$



Appendix #2

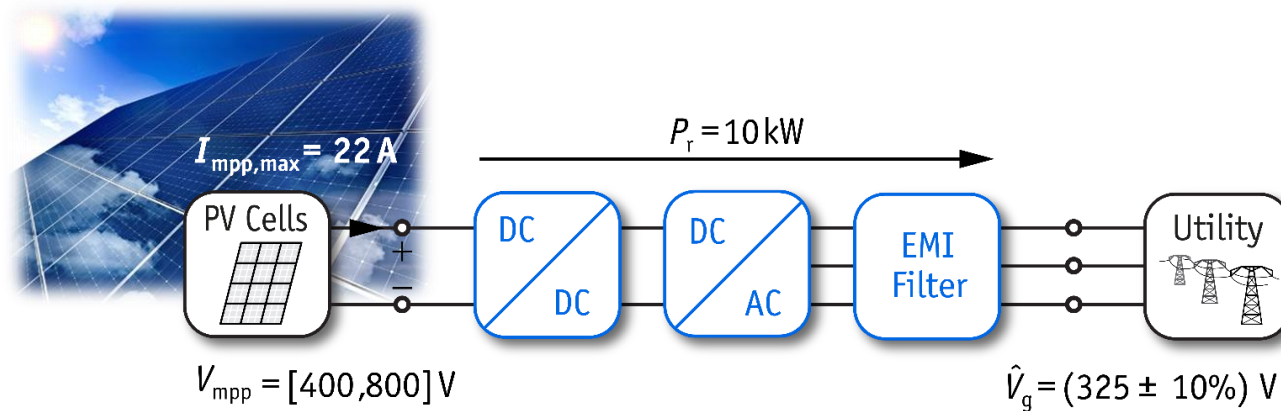
*Performance & Life-Cycle-
Costs of SiC vs. Si*



► Multi-Objective η - ρ - σ -Comparison of *Si* vs. *SiC*

■ Three-Phase PV Inverter System

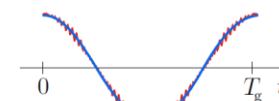
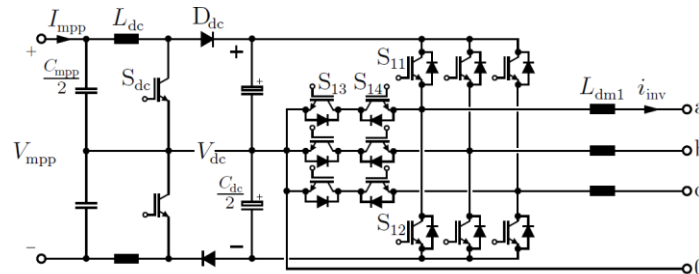
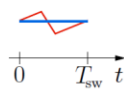
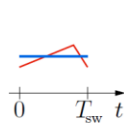
- Single-Input/Single-MPP-Tracker Multi-String PV Converter
- DC/DC Boost Converter for Wide MPP Voltage Range
- Output EMI Filter
- Typical Residential Application



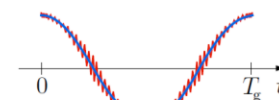
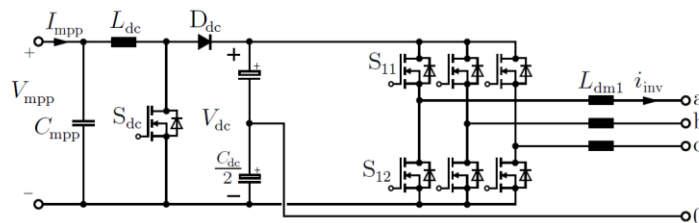
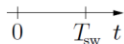
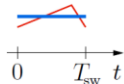
- Exploit Excellent Hard- AND Soft-Switching Capabilities of SiC
- Find Useful Switching Frequency and Current Ripple Ranges
- Find Appropriate Core Material

► Topologies - Converter Stages

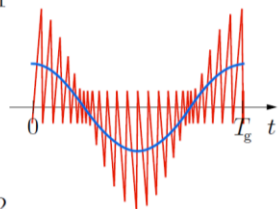
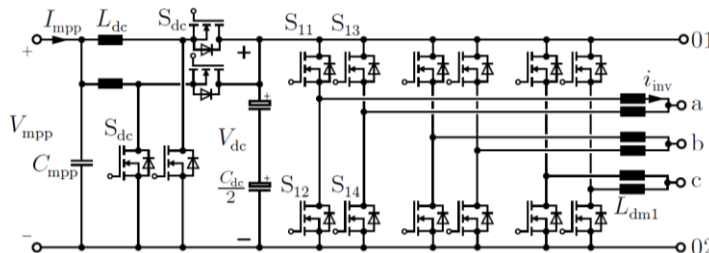
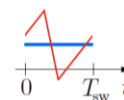
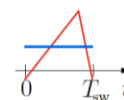
■ Si IGBT 2L-PWM Inverter



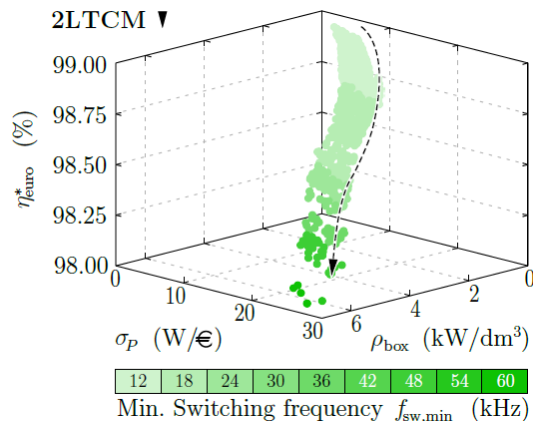
■ SiC MOSFET 2L-PWM Inverter



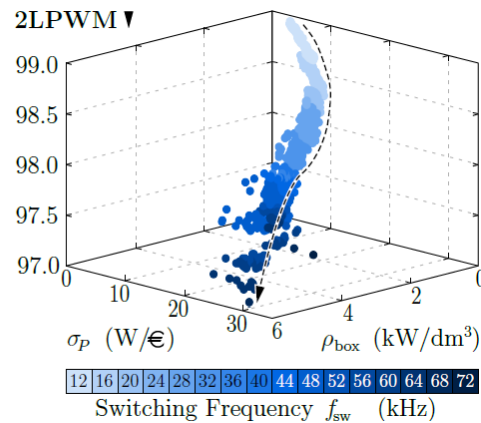
■ SiC MOSFET Interleaved 2L-TCM Inverter



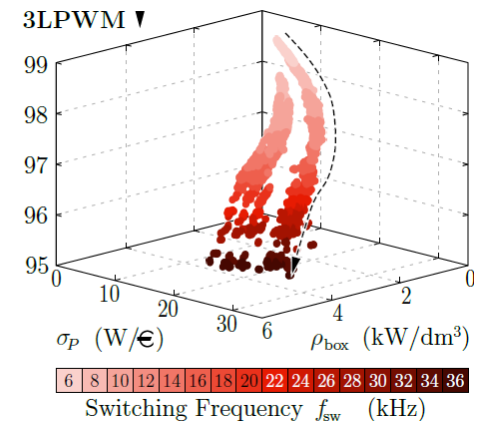
► Optimization Results - Pareto Surfaces



- No Pareto-Optimal Designs for $f_{\text{sw,min}} > 60$ kHz
- No METGLAS Amorphous Iron Designs



- Pareto-Optimal Designs for Entire Considered f_{sw} Range
- No METGLAS Amorphous Iron Designs



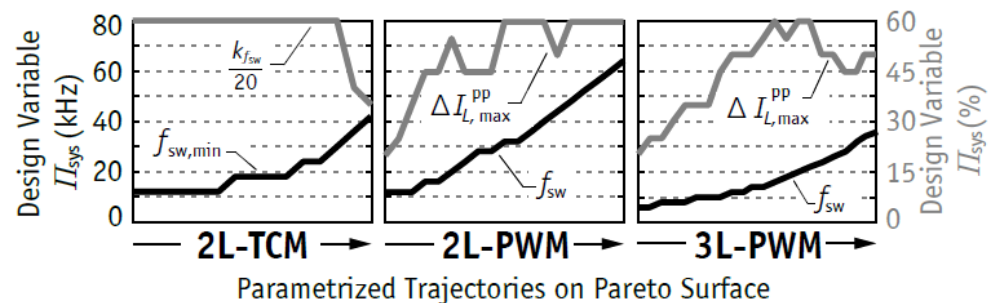
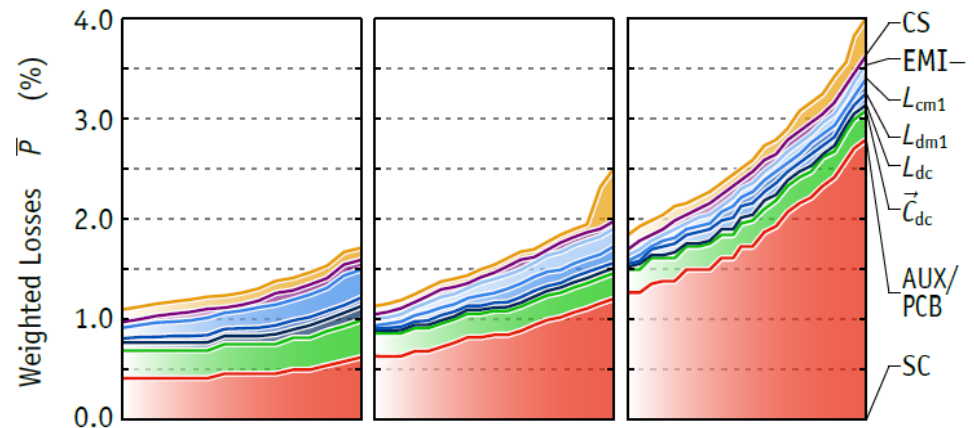
- Pareto-Optimal Designs for Entire Considered f_{sw} Range
- METGLAS Amorphous Iron and Ferrite Designs

► Optimization Results – Investigations Along Pareto Surfaces

■ Comparison of the Inverter Concepts

	η	ρ	σ
• 2L-TCM			
• 2L-PWM			
• 3L-PWM			

→ Semiconductor Losses
Clearly Dominating
(35...70%)



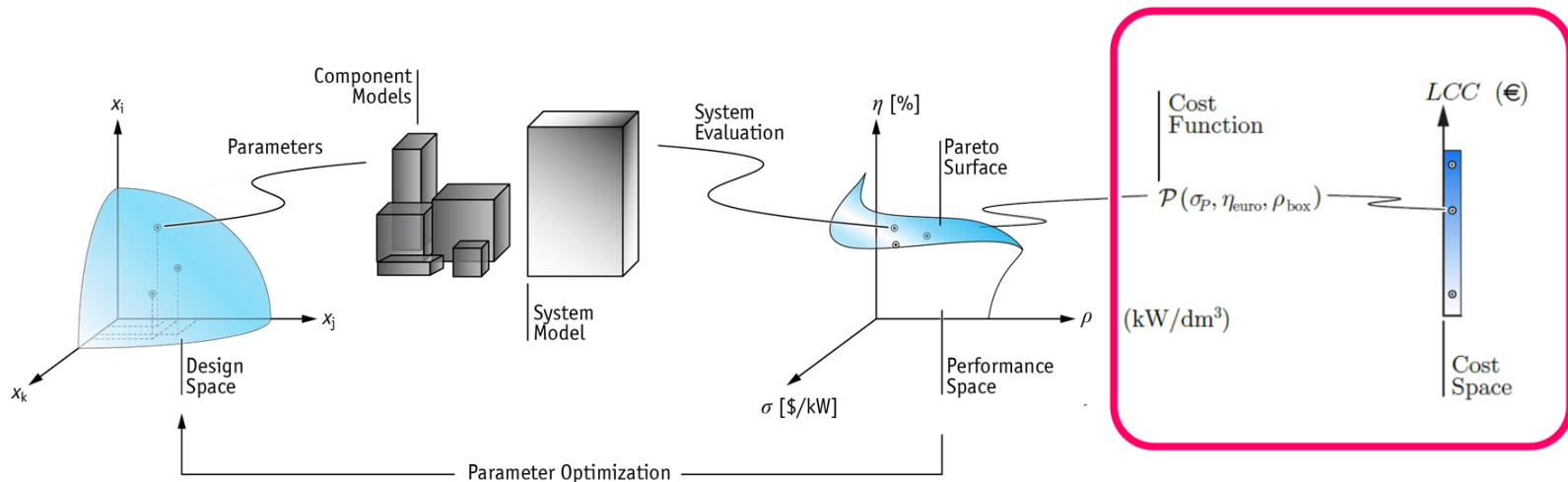
► Extension to *Life-Cycle Cost (LCC) Analysis*

■ Performance Space Analysis

- 3 Performance Measures: η , ρ , σ
- Reveals Absolute Performance Limits / Trade-Offs Between Performances

■ LCC Analysis

- Post-Processing of Pareto-Optimal Designs
- Determination of Min.-LCC Design
- Arbitrary Cost Function Possible



- Which is the Best Solution Weighting η , ρ , σ , e.g. in Form of Life-Cycle Costs (LCC)?
- How Much Better is the Best Design?
- Optimal Switching Frequency?

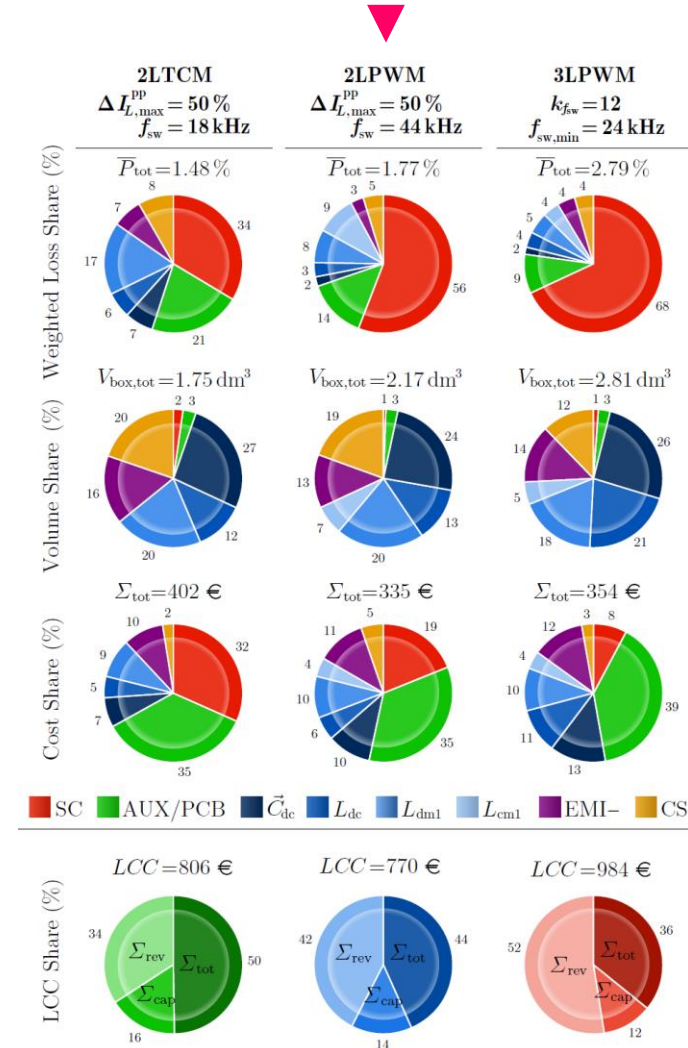
► Post-Processing

■ LCC – Analysis

■ Best System - 2L-PWM SiC Converter @ 44kHz & 50% Ripple

- 22% Lower LCC than 3L-PWM
- 5% Lower LCC than 2L-TCM
- Simplest Design
- Probably Highest Reliability
- Lower Vol. (Housing) Not Yet Considered!

→ Application of SiC Justified on “System Level”





■ End