

# Lecture 4 – Part I

## Circular Economy Compatible Power Electronics

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# Topics

## ■ Global Context and Challenges

- Net-Zero CO<sub>2</sub> by 2xxx
- Renewables & Storage
- Hard-to-Abate Sectors
- Raw Material Constraints
- The Net Energy Cliff

## ■ Power Electronics 4.0: Do More with Less

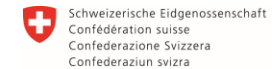
## ■ Power Electronics 5.0: Zero Waste

- The Elephant in the Room
- Multi-Objective Optimization incl. LCA
- Circularity

## ■ Conclusion & Outlook

## Acknowledgments

Prof. Dr. Uwe Drofenik, TU Wien  
Franz Musil, Fronius



Swiss Federal Office of Energy SFOE



## *The Challenge*

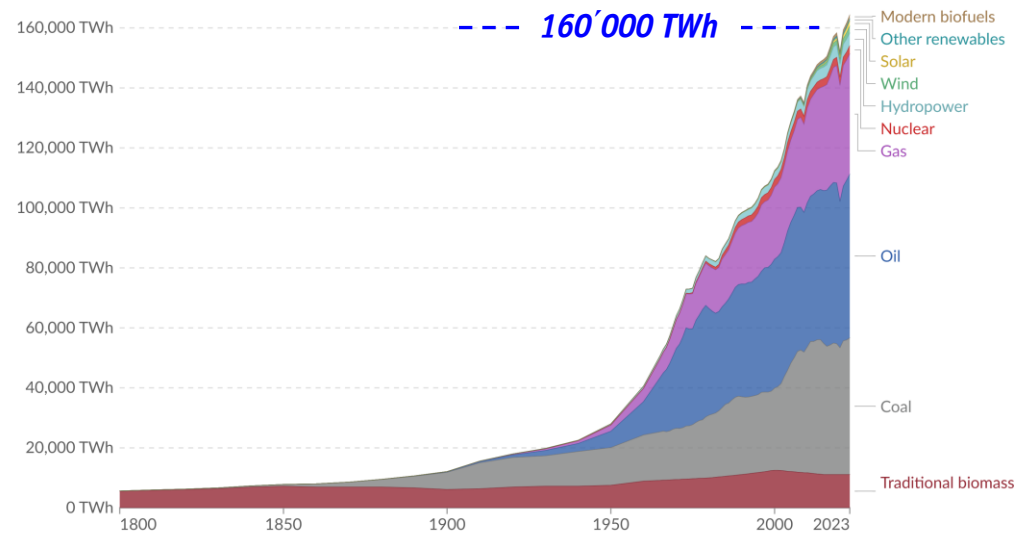
————— *Still Increasing Use of Fossil Fuels* —————  
*Increasing CO<sub>2</sub> Emissions / Global Warming*  
*Net-Zero by 2XXX / \$\$\$\$*

# Industrial Revolution 1 – 4

- *Technological / Economic Advances Linked to Exponential Increase of Fossil Fuel Consumption*
- *Continuous “Energy Addition” — Adoption of Larger Share of Higher Energy Density Fuels — Wood → Coal → Oil & Gas*

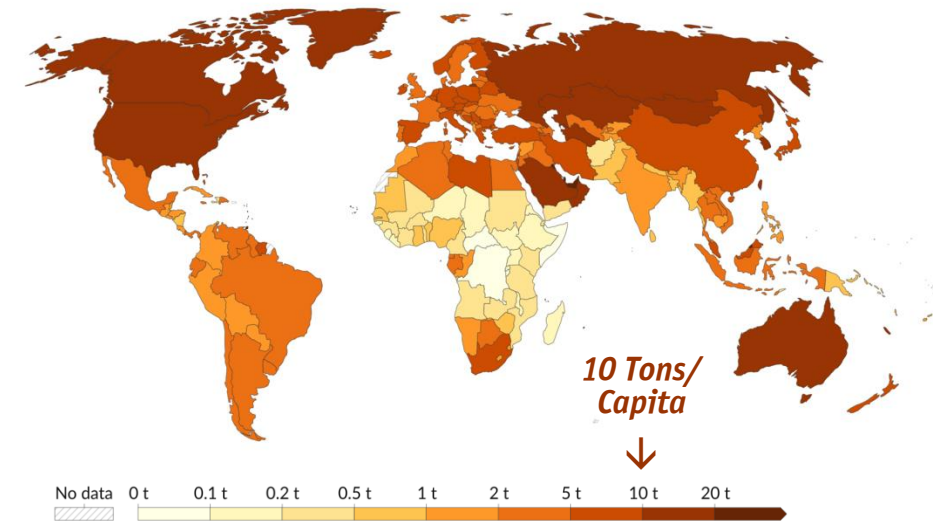
## Global direct primary energy consumption

Energy consumption is measured in terawatt-hours<sup>1</sup>, in terms of direct primary energy<sup>2</sup>. This means that fossil fuels include the energy lost due to inefficiencies in energy production.



## Per capita CO<sub>2</sub> emissions, 2022

Carbon dioxide (CO<sub>2</sub>) emissions from fossil fuels and industry. Land-use change is not included.



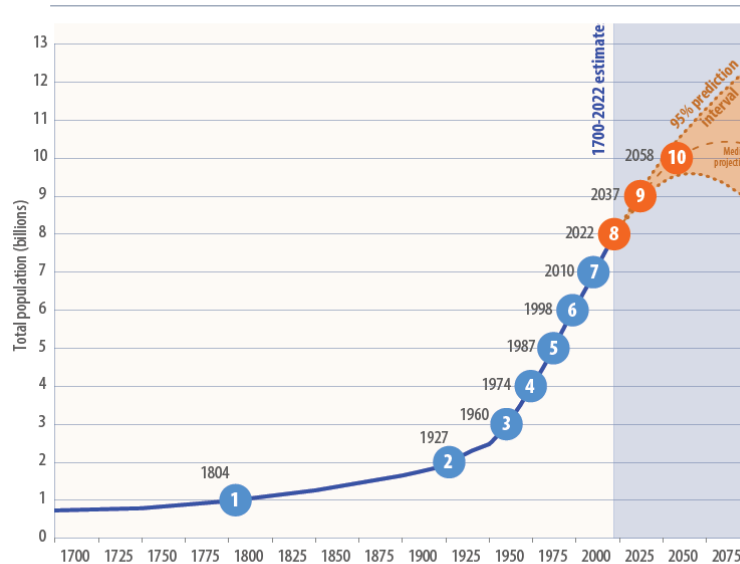
- *2024 % of Global CO<sub>2</sub> Emissions / % Global Population — China 32%/18% | USA 13%/4% | India 8%/18%*
- *Poorest Countries Contributed Least to Historic CO<sub>2</sub> Emissions/Climate Change BUT Are Most Vulnerable to Impacts*



# Growth of Population & Energy Demand

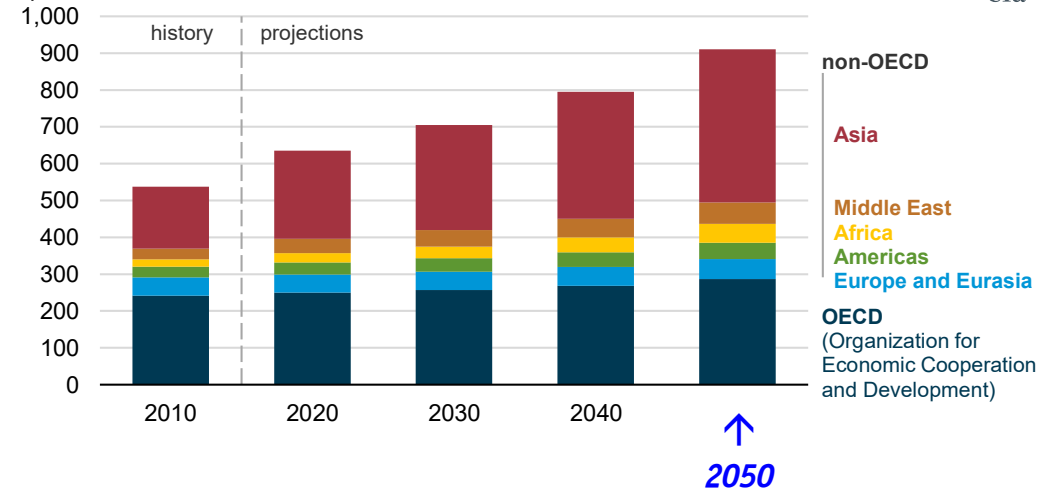
- *Growth of World Population / Increasing Energy Use in Developing Non-OECD Countries*
- *1980 — 4.4 Billion |  $\approx 10$  TW.yr  $\rightarrow$  2022 —  $\approx 8$  Billion | 20.4 TW.yr  $\rightarrow \approx 2.6$  kW Continuous/Capita*

Global population size: estimates for 1700-2022 and projections for 2022-2100



Source: United Nations, DESA, Population Division (2022). World Population Prospects 2022.

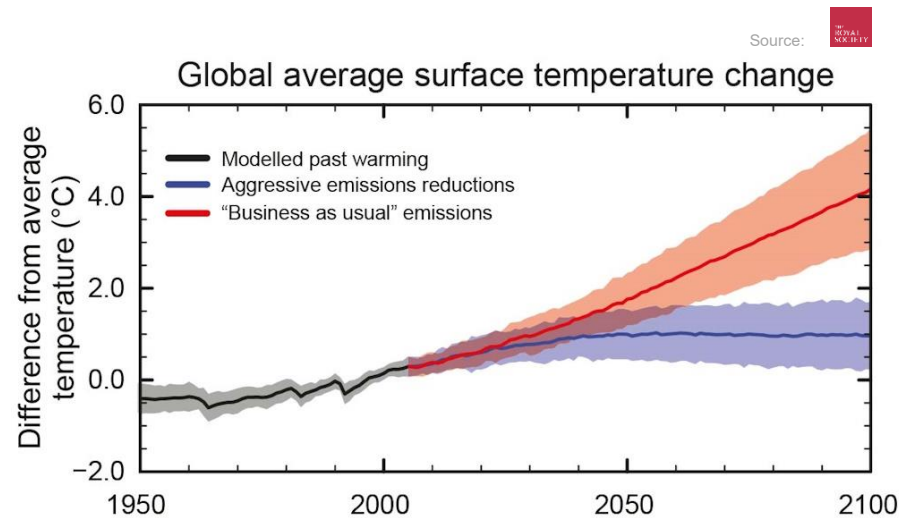
Global primary energy consumption by region (2010-2050)  
quadrillion British thermal units



- *Direct Relation of Energy Use & GDP/Capita — There are No Low-Energy Intensity Rich Countries (!)*
- *Lower Energy Intensity (Energy per Unit of GDP) Pot. Resulting from Offshoring Energy-Intense Manufacturing*

# Global Warming

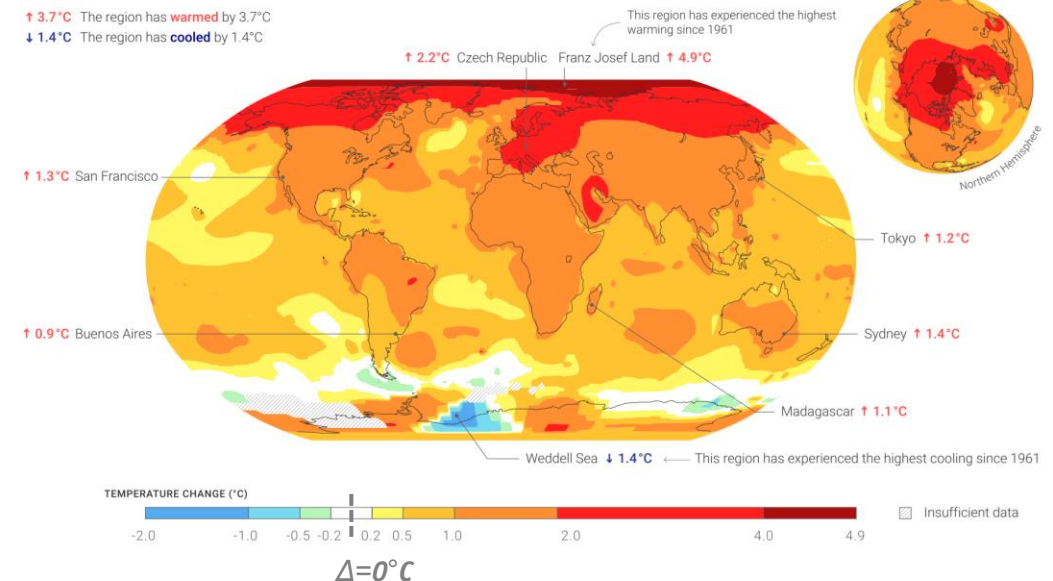
- **Combustion of Fossil Fuels – Increasing Atmospheric CO<sub>2</sub> Concentration / +50% Since Industrial Revolution**
- **Gradual Increase of Tropospheric Temperature of  $\approx +1^{\circ}\text{C}$  since 1960**



## MAP OF TEMPERATURE CHANGES (1961–2019)



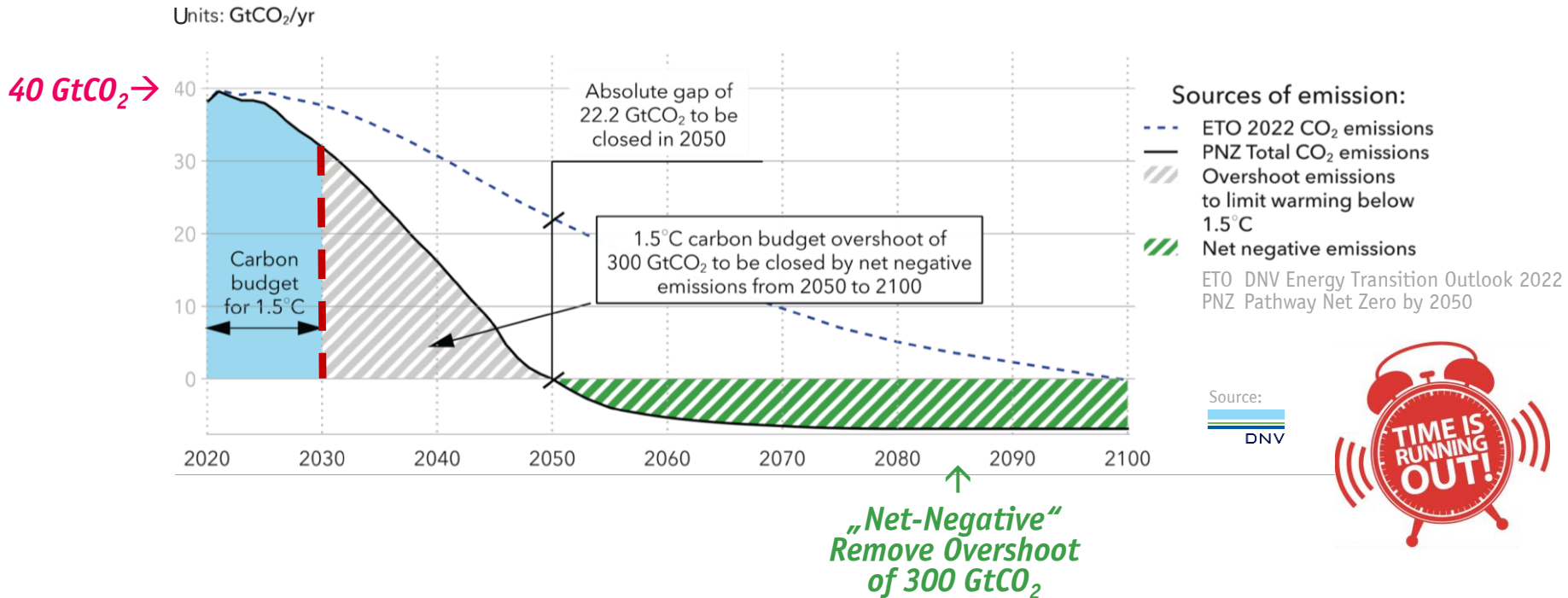
The speed of climate change is not the same around the globe. For example, when compared to oceans, continents warm approximately twice as fast.



- **Different Warming Rates for Different Locations / Land is Warming Faster than Oceans (+0.8°C)**
- **Due to Climate System Feedback Loops Arctic Ocean Shows Highest Warming / +4°C since 1960 (!)**

# Decarbonization / Defossilization

- **"Net-Zero" Emissions by 2050 & Gap to be Closed**
- **50 GtCO<sub>2eq</sub> Global Greenhouse Gas Emissions / Year → 280 GtCO<sub>2</sub> Budget Left for +1.5°C Limit**



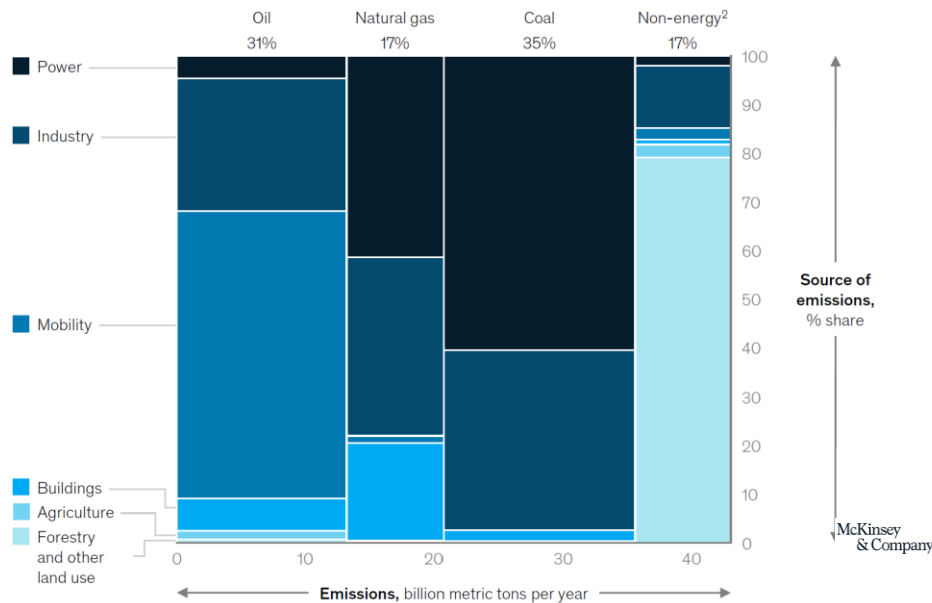
- **Challenge of Stepping Back from Oil & Gas**

# Energy Transition Costs

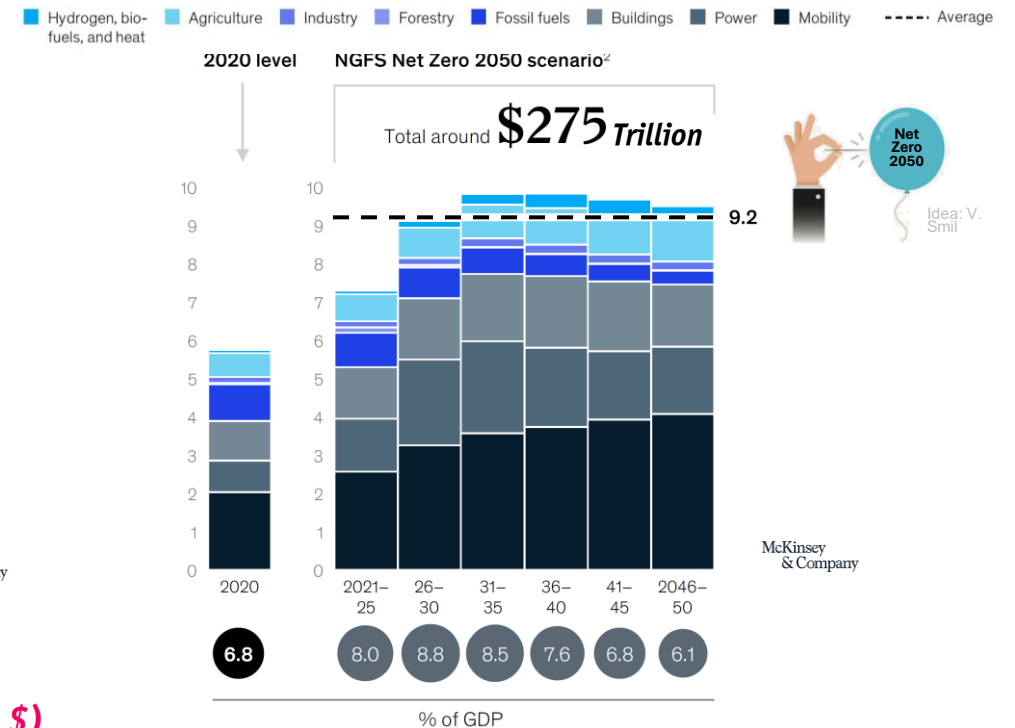
- **≈ 9 Trillion USD Annual Spend on Physical Assets for Energy & Land-Use Systems in NGFS NZ 2050 Scenario**
- **Power | Industry | Mobility | Buildings | Agriculture | Forestry | Etc.**

NGFS — Network for  
Greening the Financial  
System, 114 Central  
Banks, 2017

Energy use accounts for 83 percent of the CO<sub>2</sub> emitted across energy and land-use systems.  
CO<sub>2</sub> emissions per fuel and energy and land-use system, 2019, share<sup>1</sup>



Annual spend on physical assets for energy and land-use systems,<sup>1</sup> \$ trillion per year



- **Total Cost of U.S. “Moonshot” ≈300 Billion USD (in 2020 \$)**

## *Utilizing Renewable Energy*

*Renewable Energy Sources  
Long-Distance Transmission  
Short & Long-Term Storage*



# The Opportunity

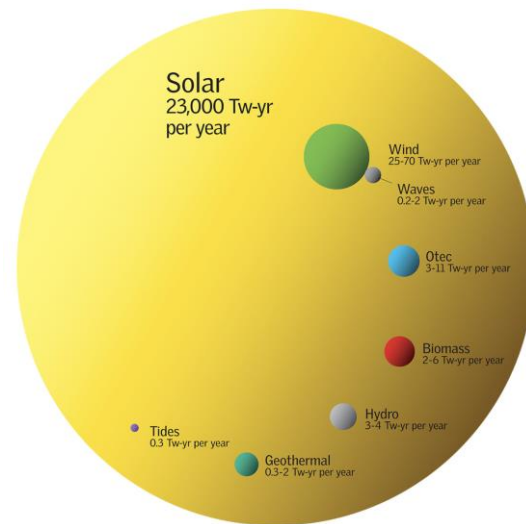
(2009) 16 TW-yr

16 Tw-yr  
per year

27 TW-yr (2050)

Renewable energy resources per year

100% Conv. Efficiency  
Excl. Oceans



Note: Graphical  
Representation Assumes  
Spheres Not Circles

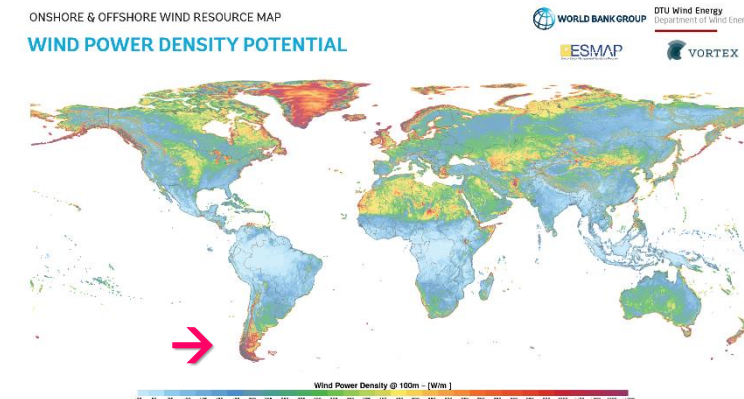
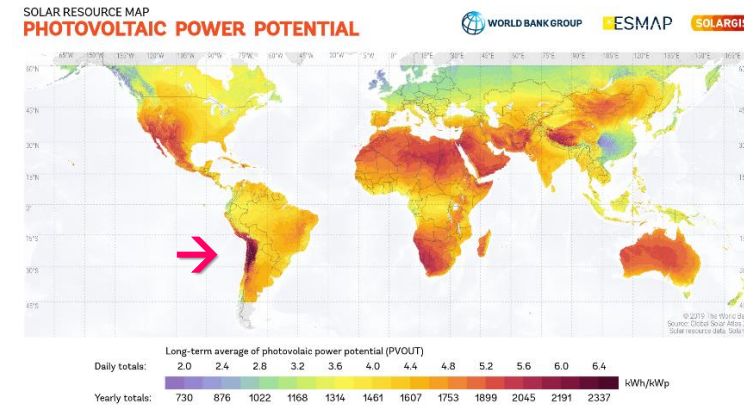
Primary Consumption:  
16TW-yr → 27TW-yr  
Final Consumption:  
11TW-yr → 15TW-yr

Source: R. Perez et al.,  
IEA SHC Program Solar  
Update (2009)

Fossil energy resources - total reserve left on earth



## Global Distribution of Solar & Wind Resources

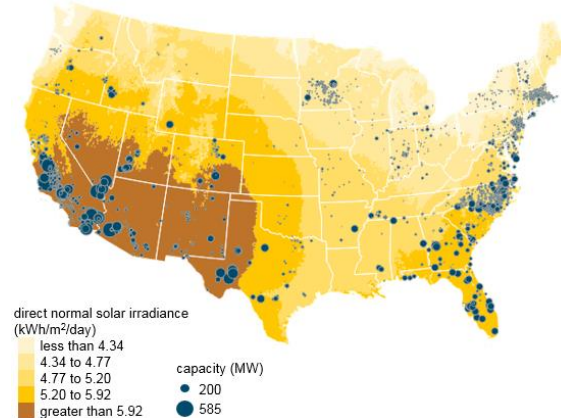


# Challenge #1 – Low PV/Wind Capacity Factors

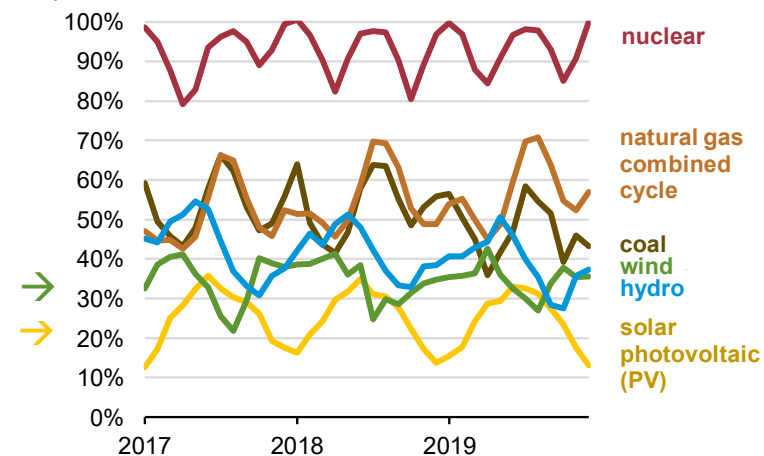
- Ratio of Actual Energy Output Over Given Period of Time to Theoretical Maximum @ Full Nameplate Cap.

$$\text{Capacity factor} = \frac{\text{Annual generation MW}\cdot\text{h}}{(365 \text{ days}) \times (24 \text{ hours/day}) \times (\text{Nameplate capacity MW})}$$

U.S. solar PV capacity and direct normal solar irradiance



Monthly capacity factors for select utility-scale generators (Jan 2017-Dec 2019)



- Capacity Factor of Renewables Dependent on Geogr. Location & Day/Night & Summer/Winter & Transm. Capacity
- PV & Wind Partly Complementary — Typ. Annual Avg.  $\approx 30\%$  for U.S. Wind |  $\approx 20\%$  for U.S. Solar (12% in Germany)

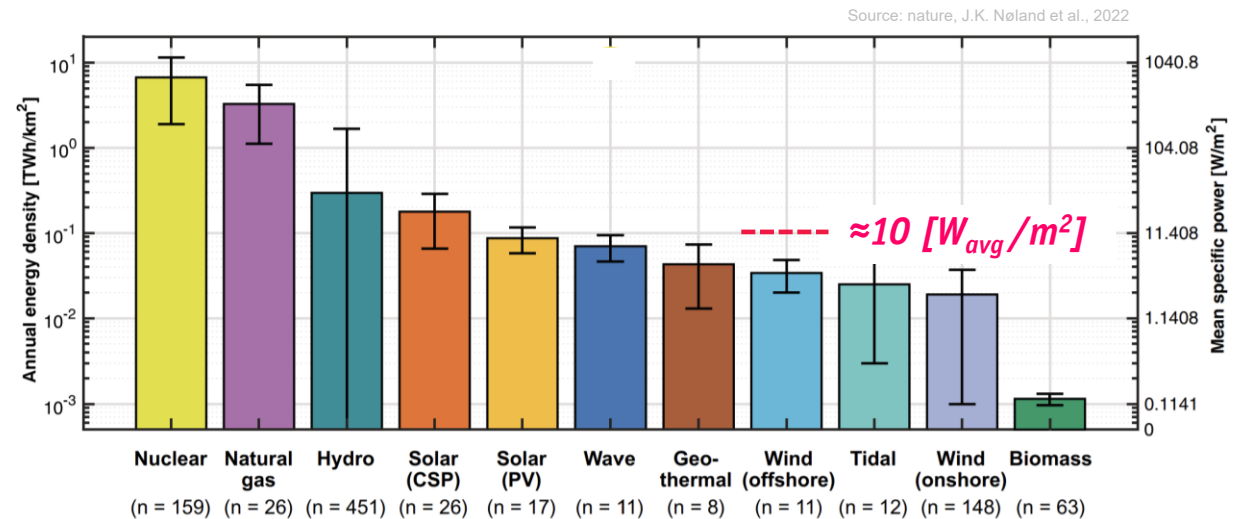
## Challenge #2 – Low PV/Wind Areal Energy Density

- **Energy Density** — Determined by Power Density | Intermittency &/or Capacity Factor | Buffer Zones | Storage | etc.
- **Land Footprint of Renewable Energy Sources Massively Larger Compared to Fossil Fuel / Nuclear Power Plants**

Annual Generation of 1 TWh (Smaller City)



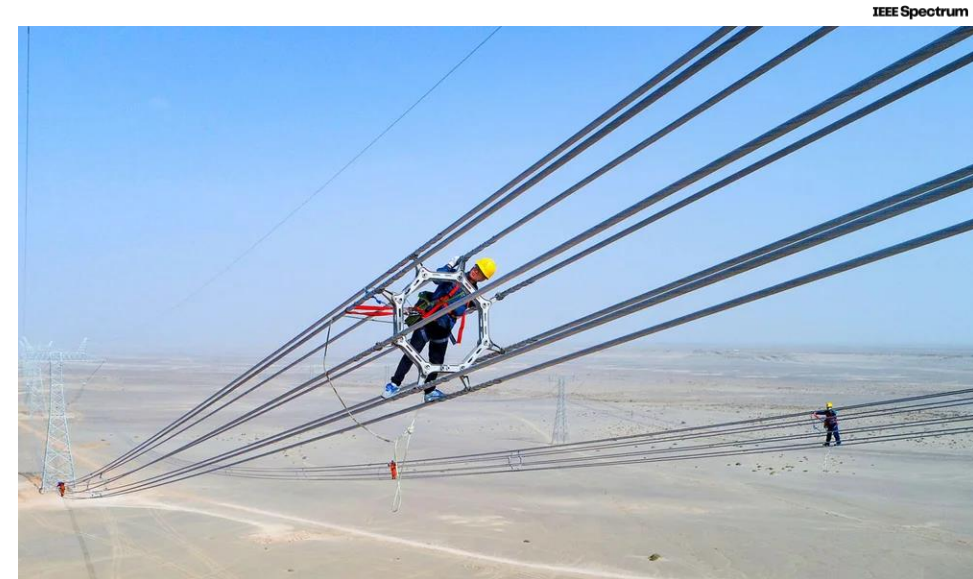
Source: <https://www.sciencenorway.no/>  
J. K. Nøland, NTNU, 2023



- **Low Energy Density of RES** — Large Land Use / Collection Grid / Long Distance Transmission for Powering Load Centers
- $\approx 1.7 \cdot 10^5$  TWh of World's Annual Energy Consumption (2023) — PV @  $\approx 0.09$  TWh/km²  $\rightarrow 1.9 \cdot 10^6$  km²  $\approx$  Algeria

## Challenge #3 — Long Distance Transmission

- *Growth of Transmission in Line w/ Growth of Electricity Generation Capacity | 10 TW → ≈10 Million km HV Lines*
- *U-HVDC Transmission Lines Connecting Megacities to Remote Wind & Coal-Fired Power Plants / Solar Farms etc.*

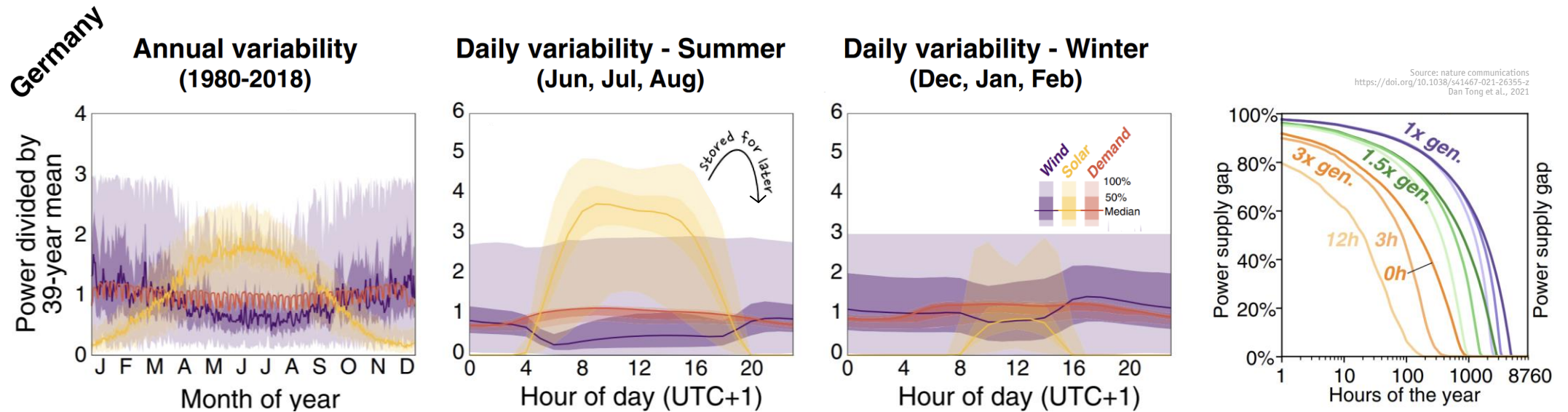


- *30'000 km U-HVDC Links Built Over Last Decade in China / Emerging Nationwide Super-Grid Interconn. Reg. Grids*



## Challenge #4 – Storage Requirements 1/3

- **Variability of Renewables & “Dunkelflaute”** — Batt. Storage | HVDC-Links | Sector Coupling | Gas/Coal/Hydro Plants
- **World’s Largest Battery Storage / Pumped Hydro Storage** — 3.3 GWh @ 0.875 GW / 40 GWh @ 3.6 GW

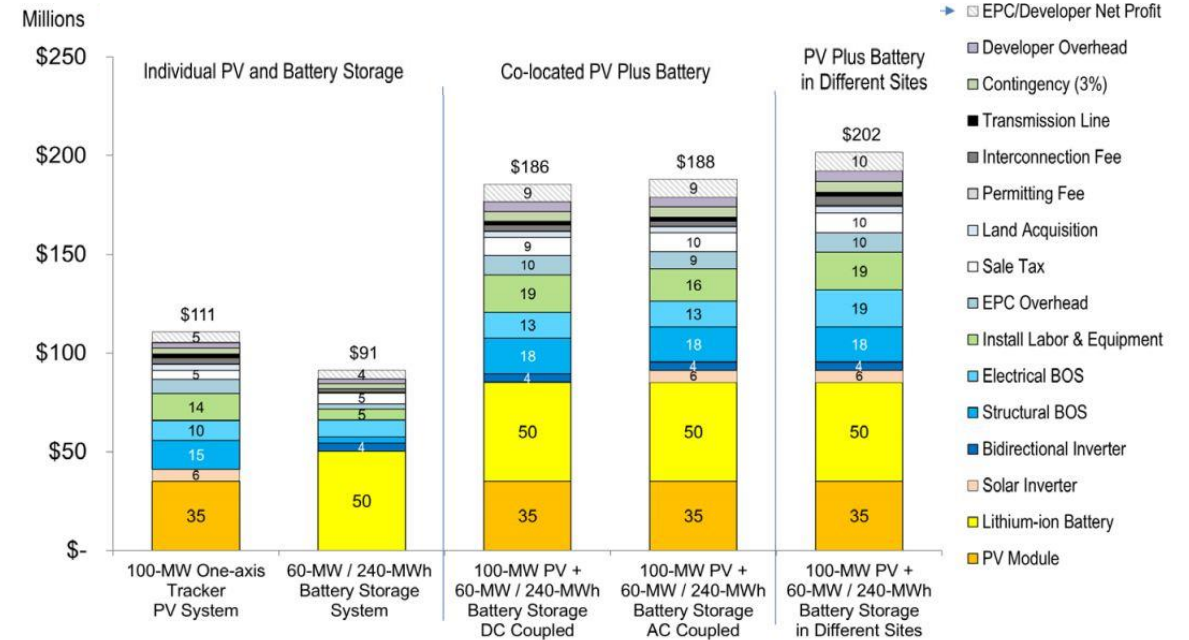


- **Considerable Overdesign of Optimal PV & Wind & 12 Hours Storage Still Leaves Considerable Power Supply Gap (Germany)**
- **Islanded Megacity** → Power Supply of 10 Million People x 2.6 kW x 1 Hour = 26 GWh → 86'000 Tons of 300 Wh/kg Batteries



## Challenge #4 – Storage Requirements 2/3

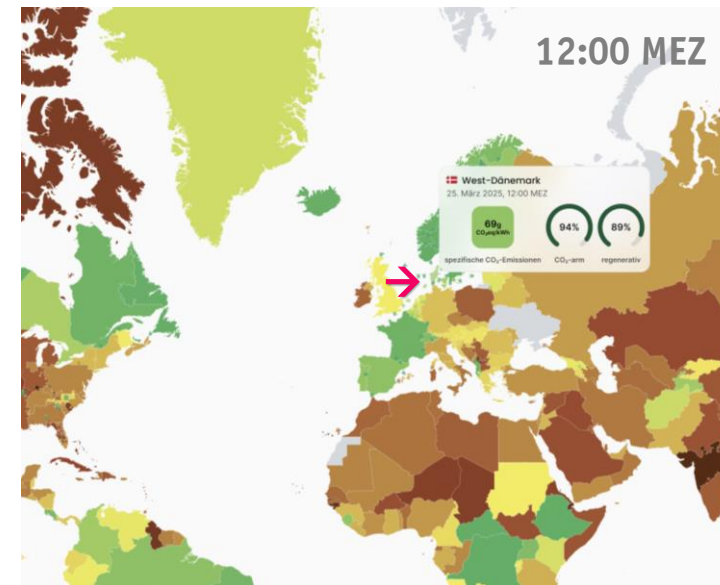
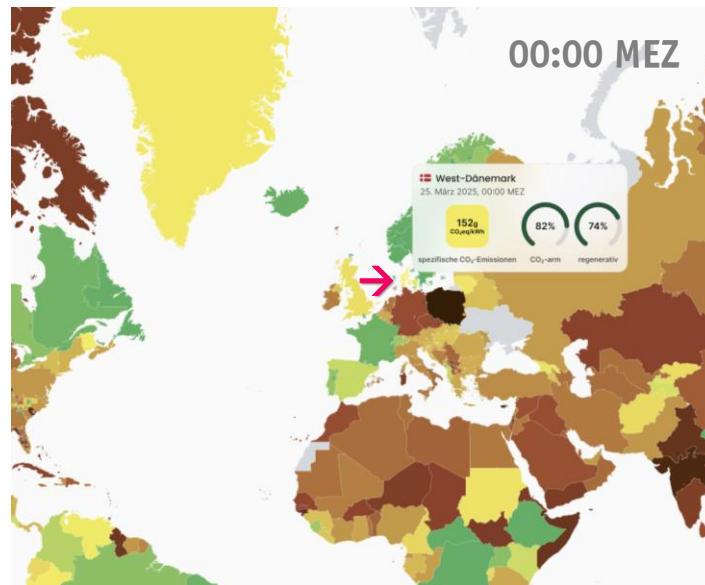
### ■ U.S. Cost Benchmarks for Utility-Scale PV-Plus-Storage Systems (4 Hours) / DC-Coupled or AC-Coupled



### ■ Comparison of PV & Fossil Fuel Power Gen. Must be Based on “LCOE” (Panels/Inverter/Cap. Factor/ Storage/Transmission etc.)

## Challenge #4 – Storage Requirements 3/3

- *Ensure Reliable Supply @ High Share of Intermittent RES — Power Balance on Different Time Scales*
- *Accurate Forecast / Local Storage / **HVDC Interconnectors to Neighboring Countries** / Sector Coupling*

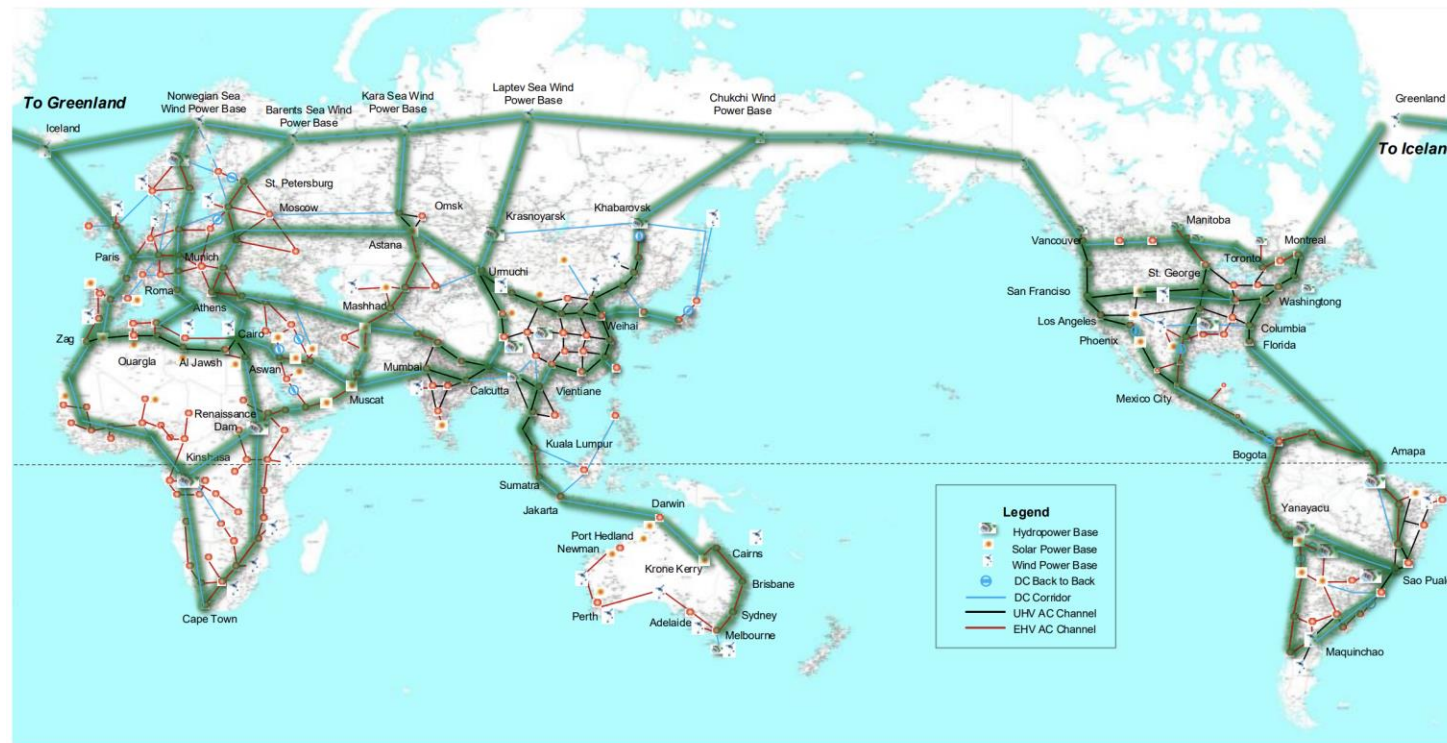


Source:  
<https://app.electricitymaps.com/map/72h/hourly>

- *Opt. Use of Cross-Energy Sector Flexibility — Coupling of El. Power / Heating / Nat. Gas or H<sub>2</sub> or Methane*
- *Direct or Indir. Storage — Grid Conn. Batteries / CHP & Heat Storage / H<sub>2</sub> → Methane – Long Term Gas Store*

# Remark The Global Grid

- *“Super/Mega/Overlay Grid”- Concepts Proposed since 1950s — GENESIS (1994), DESERTEC (2003), etc.*
- *U-HVDC Trans-Continental or Multi-National Supply & Trade of Clean Electricity*

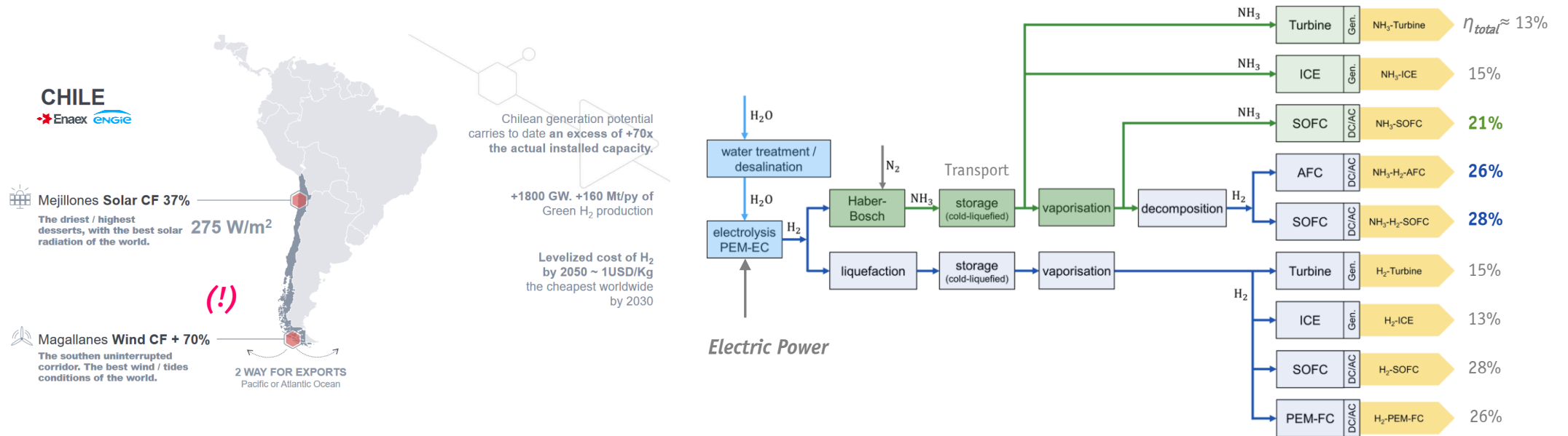


Source: GEIDCO 2018

- *Example of the “Global Energy Interconnection Backbone Grid” (GEIDCO) Proposed by China in 2015*

# Remark Power-to-X-to-Power

- Hydrogen Economy —  $H_2$  Produced & Used Directly or in Synthesis w/ Nitrogen or Carbon (Ammonia, Methanol, etc.)
- Prod. @ High RES Intensity Locations —  $NH_3$  Transp. by Ships — Use for Long-Term Storage & Hard-to-Abate Sectors



- Hydrogen Hype — A Story of Energy Loss (?) / Direct Use of Electricity Clearly Superior if Possible (!)
- Low-Efficiency Processes — 60% Electrolysis / 70% Liquefying Hydrogen / 60% Fuel Cells / etc.

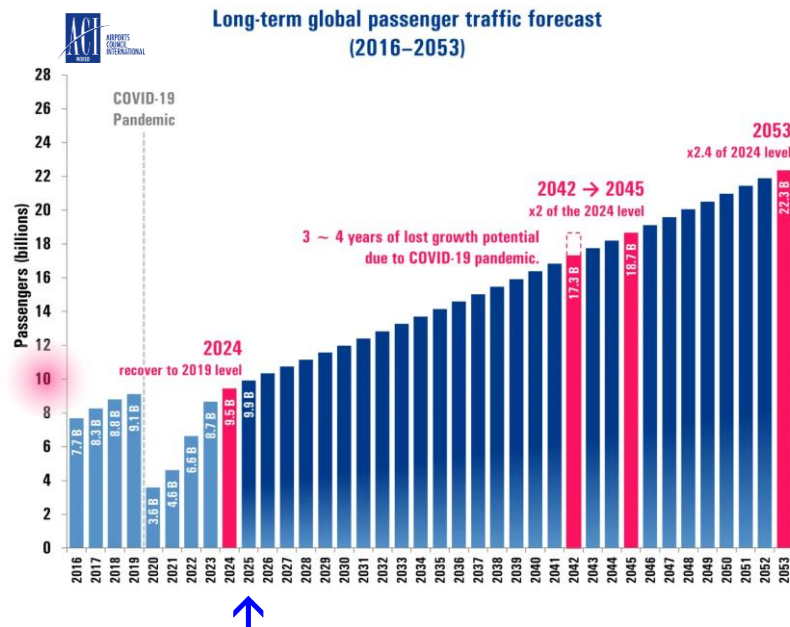
## ***Multi-Carrier Energy System***

————— ***Electricity / Heat / H<sub>2</sub> / E-Fuels / CO<sub>2</sub> Infrastructure  
Aviation etc. / Green Steel / Cement / Chemicals*** —————



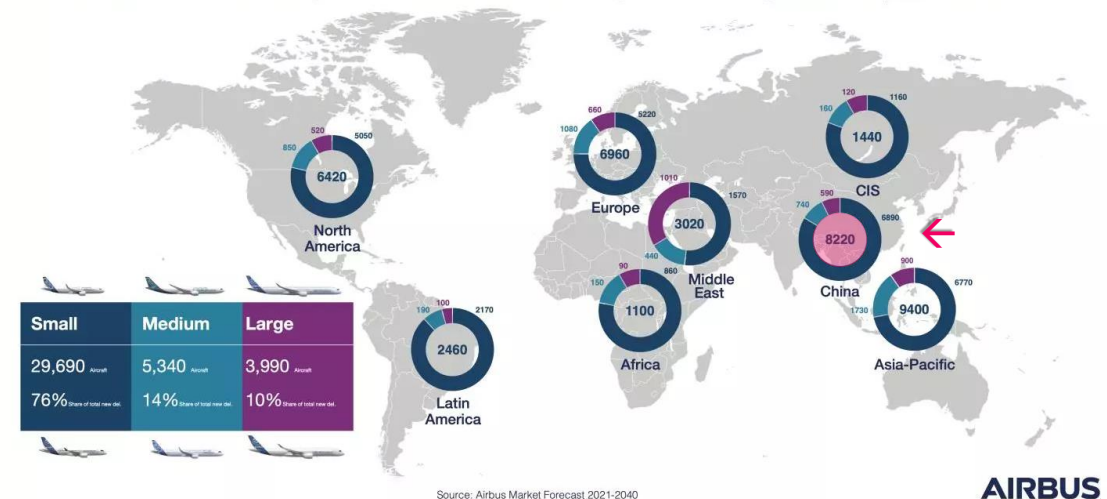
# Hard-to-Abate Sector #1 – Aviation

- **2.5% of Global CO<sub>2</sub> Emissions / ≈1.2 Billion Liters of Aviation Fuel/Day in 2024 / ≈35% SAF by 2050**
- **30'000 New Commercial Aircraft & Freighters in 2021–2040 incl. Replacements — 4.8 Trillion USD**



## Commercial Aircraft demand 2021-2040

Asia-Pacific, China, Europe and US continue to be major drivers for growth & replacement



- **Growing Air Travel Demand Driven by Growing Middle-Class & Desire to Explore / Connect Globally**
- **E-Commerce Drives ≈5%/Annum Growth in the Freight Sector — 200 Million Tons of Global Air Cargo**

## Hard-to-Abate Sector #2 – Shipping

- *2.8% of Global CO<sub>2</sub> Emissions / ≈85% of World Trade Carried by Sea / 12.3 Billion Tons / 100'000 Vessels*
- *IMO Strategy on NZ shipping around 2050 incl. Green H<sub>2</sub> & Derivatives (E-Ethanol, E-Ammonia)*



Source: <https://www.ship-technology.com/>

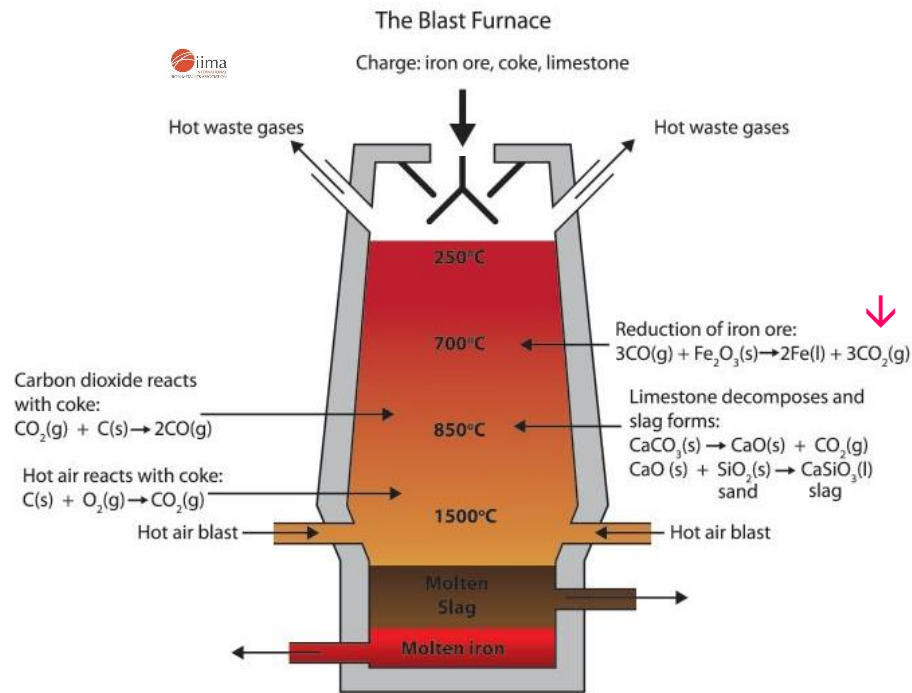


<https://www.shipsnostalgia.com/>

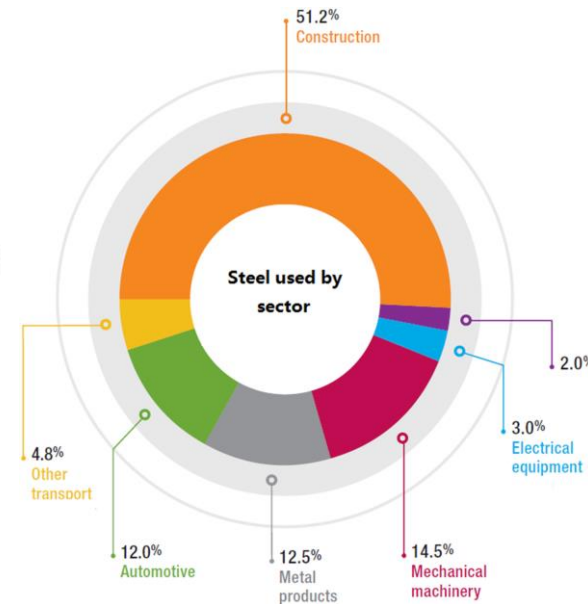
- *Ultra-Large Container Vessels (ULCVs) — 20'000 Twenty Foot Containers / 15'000 Liters of Heavy Fuel Oil per Hour*
- *80 MW @120 rpm / 2'300 Tons Largest Diesel Engine Used in ULCVs*

## Hard-to-Abate Sector #3 – Iron & Steel

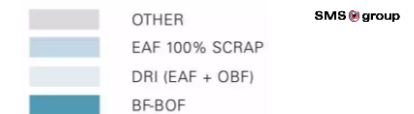
- *Crude Iron Production in Blast Furnaces Reliant on Coal/Coke as Reducing Agent to Extract Iron from Ore/ $\text{Fe}_2\text{O}_3$*
- *Basic Oxygen Converter Turns Crude Iron into Easily Formable Steel / Electric Arc Furnaces Recycle Steel Scrap*



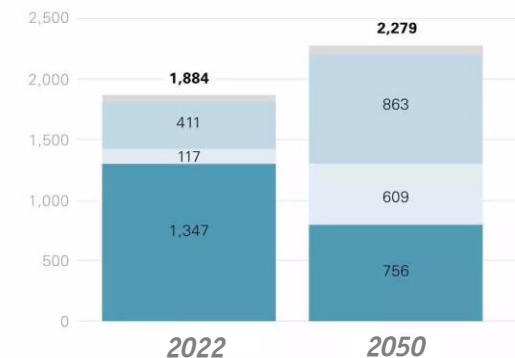
K. Hea / Li Wang (2016)  
<http://dx.doi.org/10.1016/j.rser.2016.12.007>



Steel production in 2050 (in million t/year at constant a steel consumption per capita)



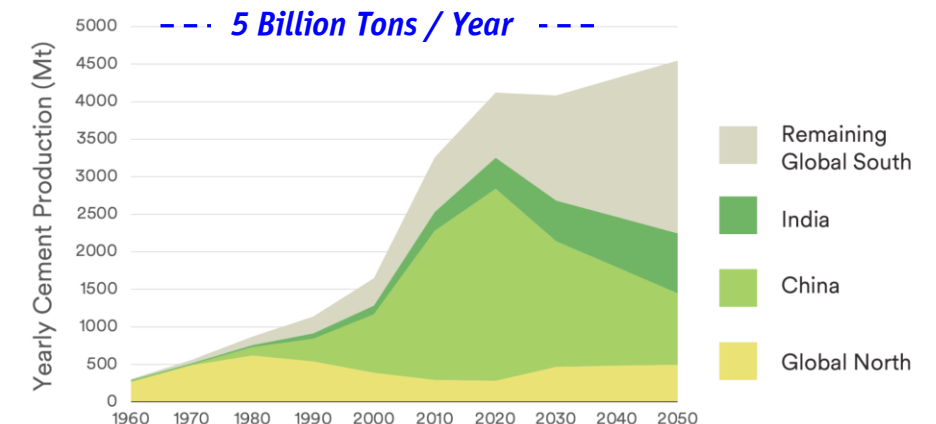
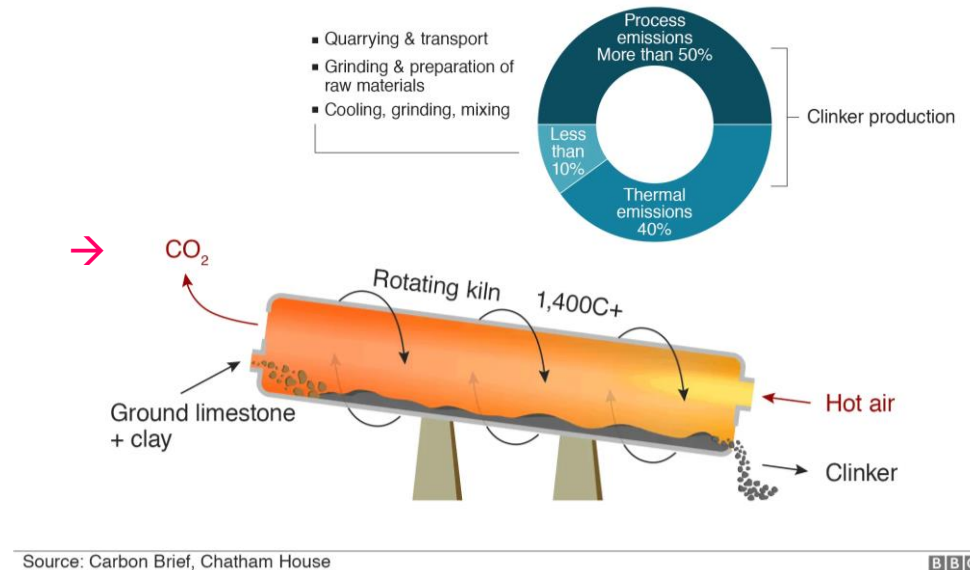
Steel production in 2050 (in million t/year at constant a steel consumption per capita)



- *Steel Production Responsible for  $\approx 8\%$  of All Global Direct Emissions From Fossil Fuels*
- *Global Steel Demand Expected to Increase from  $\approx 1.9$  Billion Tons/a in 2021 to Over  $\approx 2.3$  Billion Tons/a by 2050*

## Hard-to-Abate Sector #4 – Cement

- **Cement — Key Ingredient in Concrete / Chemical Process & High Heat / 8% of Global CO<sub>2</sub> Emissions**
- **Concrete is the Most-Consumed Human-Made Material on Earth / Buildings & Infrastructure etc.**

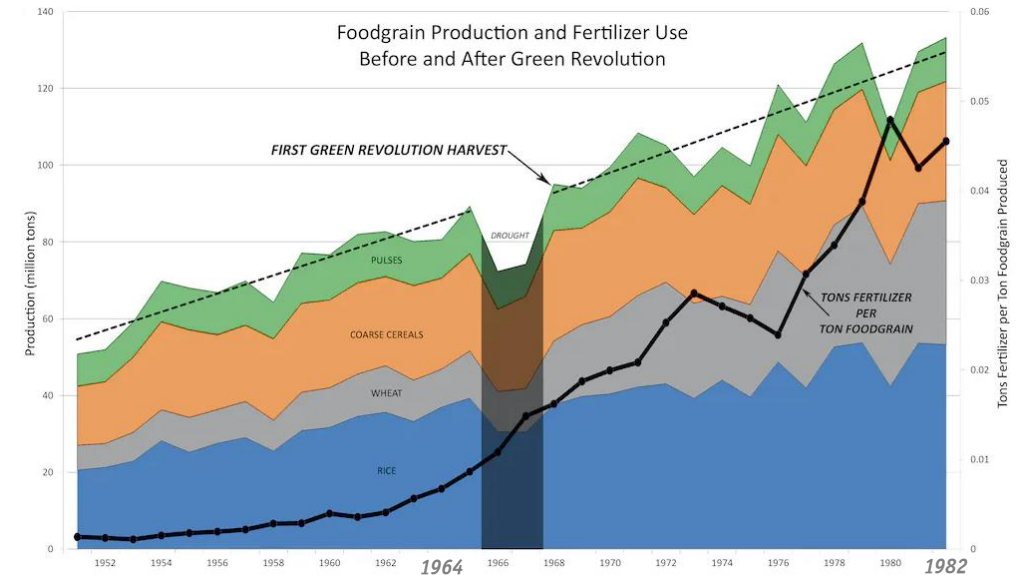
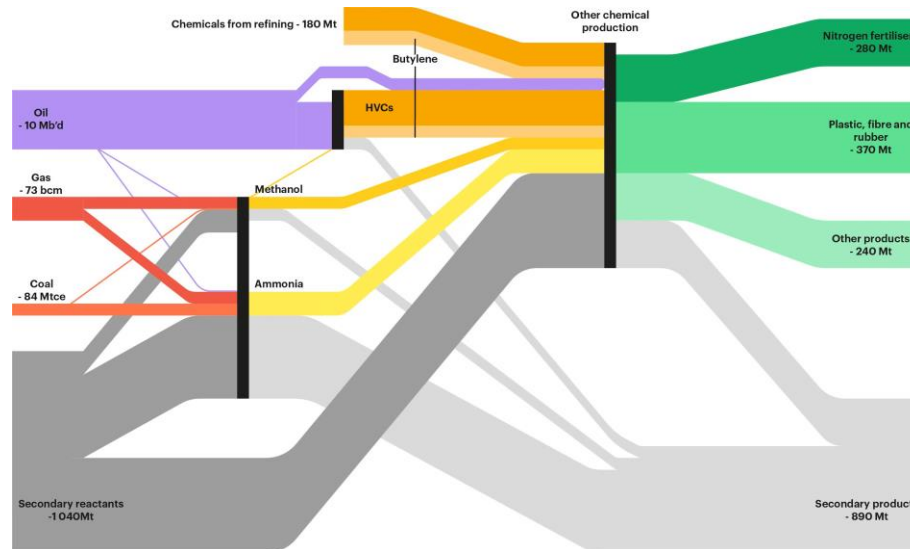


- **China & India Account for Around 50% of Global Cement Production**
- **Intensity of Cement Use Declines After Initially Rising w/ Increasing GDP/ Capita**



## Hard-to-Abate Sector #5 – Chemicals

- **11%/8% Global Oil/Gas Used for Production of Chemicals — Fertilizers, Pharmaceuticals, Plastics etc.**
- **50+% of Energy Input as “Feedstock” Finally Embedded in Products (Globally ≈1 Mio PET Bottles Sold/Minute)**

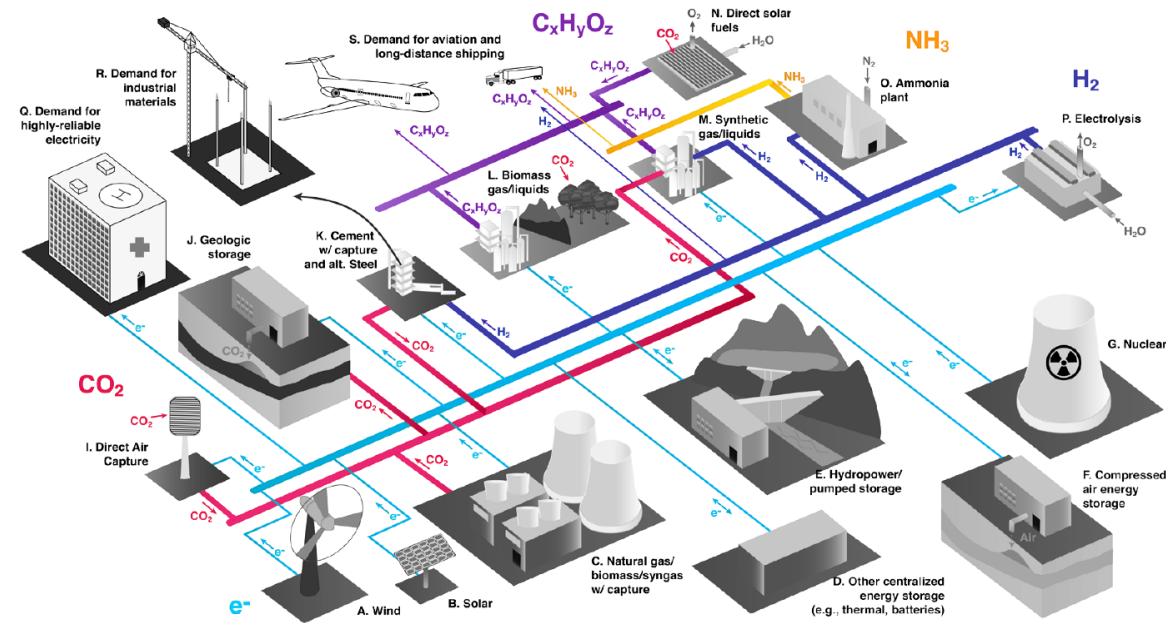
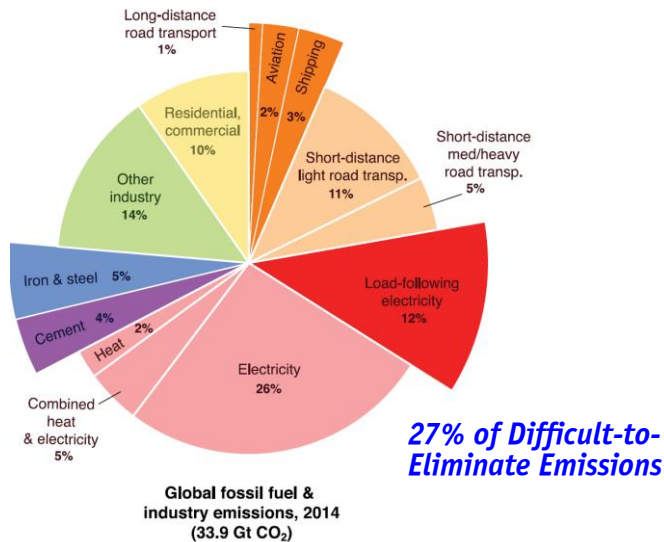


- **“Green Revolution” in Mid-20<sup>th</sup> Century — Higher Yield Due to Use of Fertilizers & Pesticides & Mechanization**
- **Chemical Sector — Largest Industrial Energy Consumer / 3<sup>rd</sup> Largest CO<sub>2</sub> Emissions after Steels & Cement**



# Multi-Carrier Energy Society

- **CO<sub>2</sub>-Free Electricity / Electrification** — Viable Pathway for Reducing Emissions !&! Costs (Long Term)
- **E-Fuels & P2X for Long-Haul Transport / Aviation / etc. & Short Term / Seasonal Storage**



Science  
S.J. Davis et al.  
(2018)

- **Integrated Net-Zero Multi-Carrier Energy System** — E-Energy | Heat & Cold | etc. | Storage | CO<sub>2</sub>C&S
- **Missing Multi-Discipl. Research on Cross-Sector Converters / Technologies / Geogr. Diversity / Economics etc.**

## *Critical Raw Materials*

*“Blind Spot” of Clean Transition  
Requirements & Geopolitical Dependencies  
Mining Constraints*

# „Peak Minerals/Metals“ of Net-Zero Scenario 1/2

- **Minerals/Metals-Intensive Clean Energy Transition will Potentially Face Supply Deficits**
- **USD 2.1 Trillion Investment to Meet Net-Zero 2050 Demand / 6.5 Billion Tons of End-Use Materials**

BloombergNEF

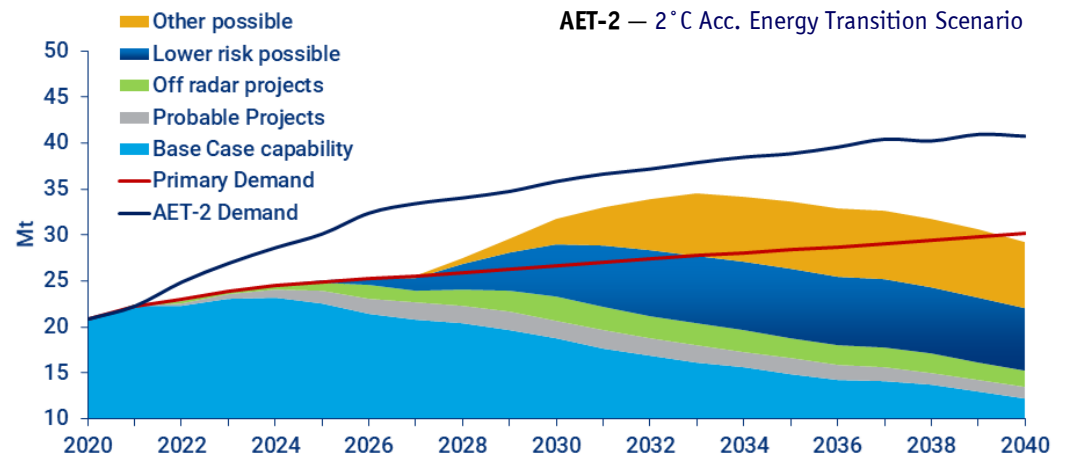
Figure 1: Market balances for energy transition metals under BNEF's Economic Transition Scenario and Net Zero Scenario – expected supply surplus and supply deficits

Metal	Scenario	2024-2030	2031-2040	2041-2050
Steel	ETS	2024		
	NZS	2024		
Aluminum	ETS	2024		
	NZS	2024		
Copper	ETS	2024		
	NZS	2024		
Lithium	ETS	2025		
	NZS	2025		
Graphite	ETS	2028		
	NZS	2026		
Nickel	ETS		2030	
	NZS	2028		
Cobalt	ETS			2050
	NZS		2034	
Manganese	ETS			
	NZS			

Source: BloombergNEF. Note: Year is the first year in which a given metal is expected to enter a supply deficit. Only primary supply is considered in this table. All supply is mined nameplate capacity, apart from that for aluminum, graphite, and steel.

Primary copper demand scenarios versus mine supply potential

Wood Mackenzie

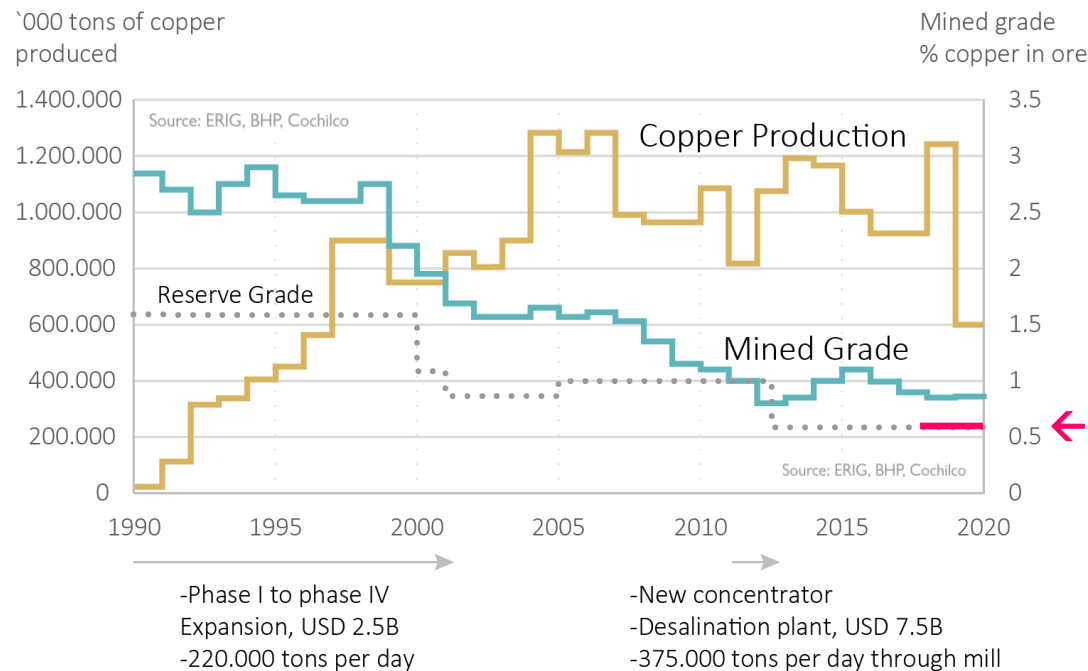


Source: Wood Mackenzie

- **50 New Lithium / 60 Nickel / 17 Cobalt Mines Required to Meet 2030 EV Battery Demand**
- **Development of a New Mine Takes 5...15 Years / x100 Million USD (!) – “Valley of Death”**

# „Peak Minerals/Metals“ of Net-Zero Scenario 2/2

- *Declining Ore Body Grades Require Ever-Increasing Tonnage to be Moved & Processed*
- *Higher Production Costs / Declining Amount of Economically Extractable Mineral*

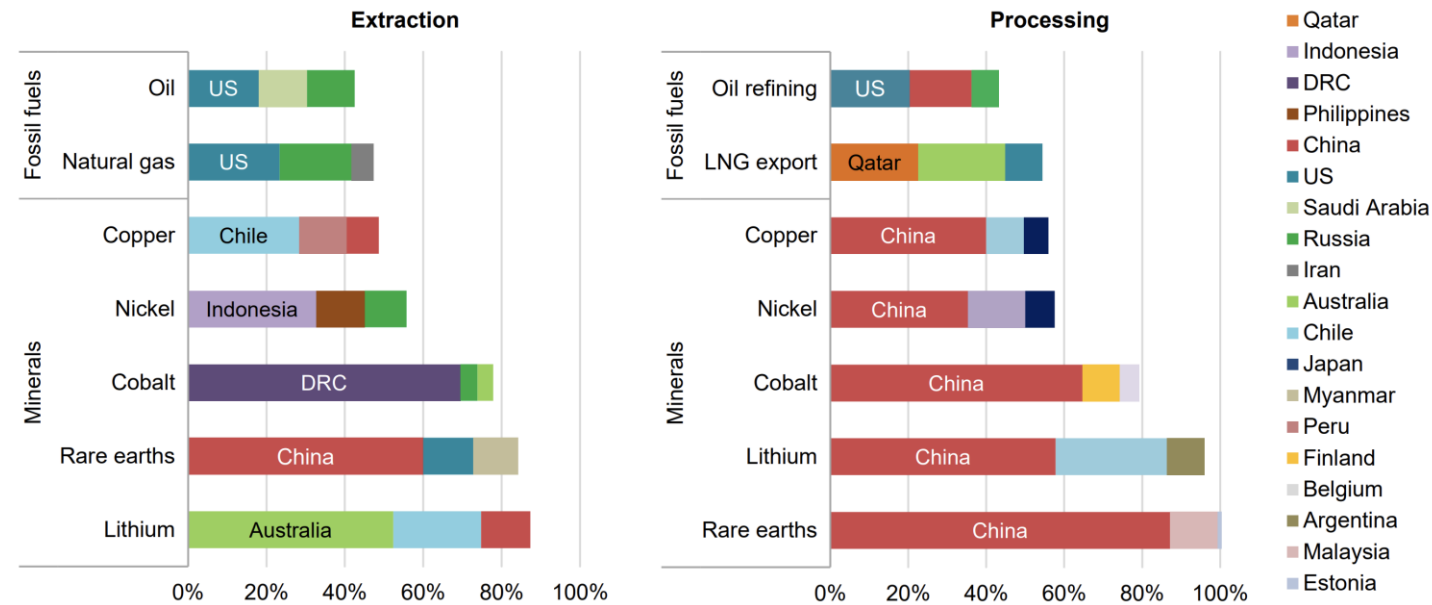


Caterpillar 797F — 350 tons payload / 3 MW

- *Higher Diesel Consumption of Truck/Shovel Fleet | Higher Energy Effort for Grinding/Extraction per Unit Metal*

# Remark Critical Mineral Dependencies

## Production of Selected Minerals Critical for the Clean Energy Transition



Source: IEA /  
The Role of Critical  
Minerals in Clean Energy  
Transitions (2021)

Shares of top three producing countries, 2019

## Extraction & Processing More Geographically Concentrated than for Oil & Nat. Gas (!)

## *The “Net Energy Cliff”*

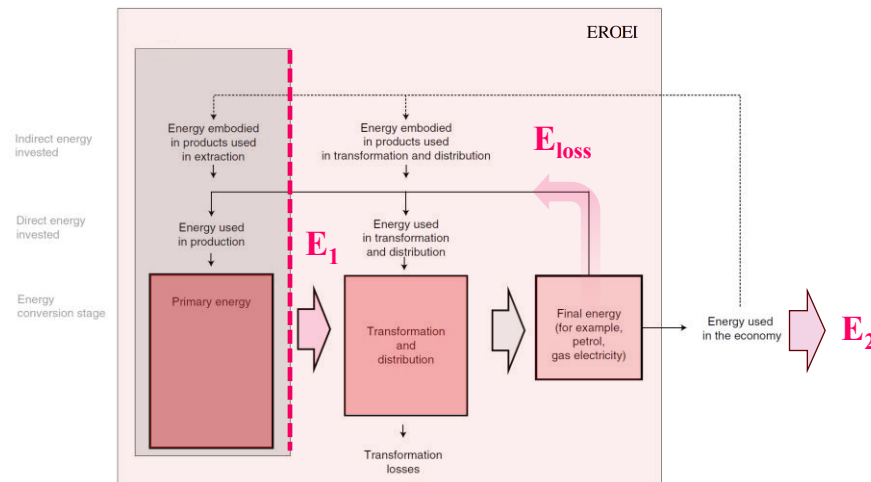
————— *Energy Return on Energy Invested* —————  
*Fossil Fuels vs. Renewables*



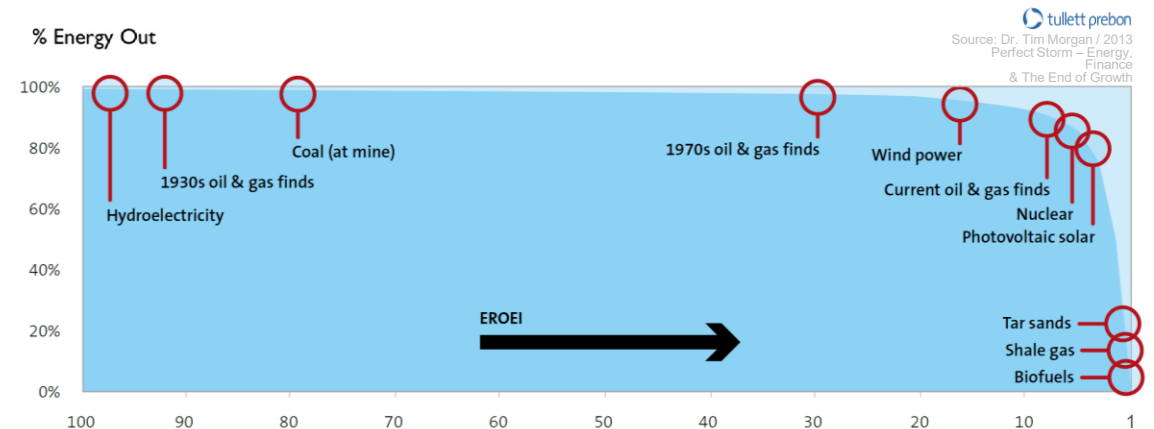
# Energy Return on Energy Invested (EROEI)

- **Energy Supply Must Provide Sufficient Energy Surplus after Accounting for Own Energy Requirements**
- **Energy Invested for Production / Transformation / Transportation**

$$\text{EROEI} = \frac{\text{Energy Obtained}}{\text{Energy required to obtain that energy}} = \frac{E_1}{E_{\text{loss}}} \rightarrow E_2 = \text{Net Energy} = \text{Energy Obtained} \cdot \left(1 - \frac{1}{\text{EROEI}}\right)$$



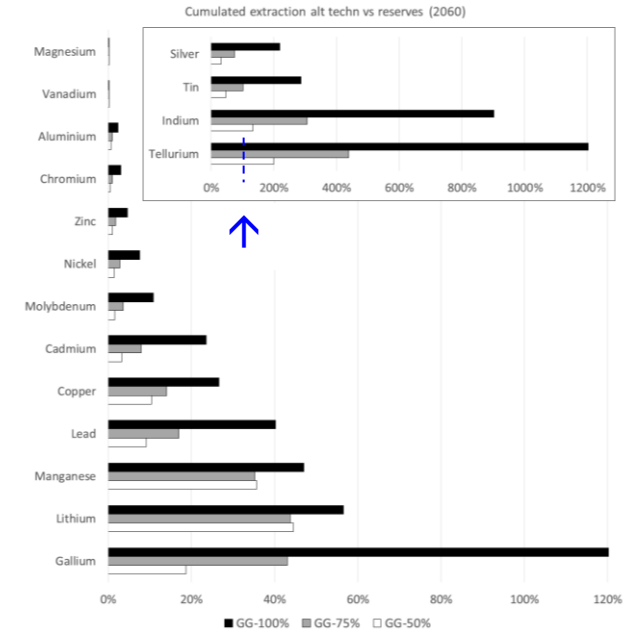
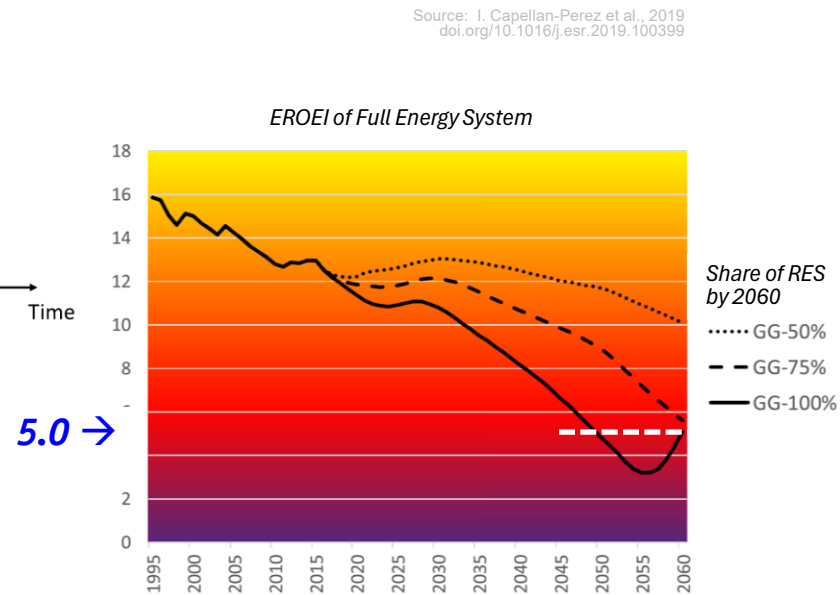
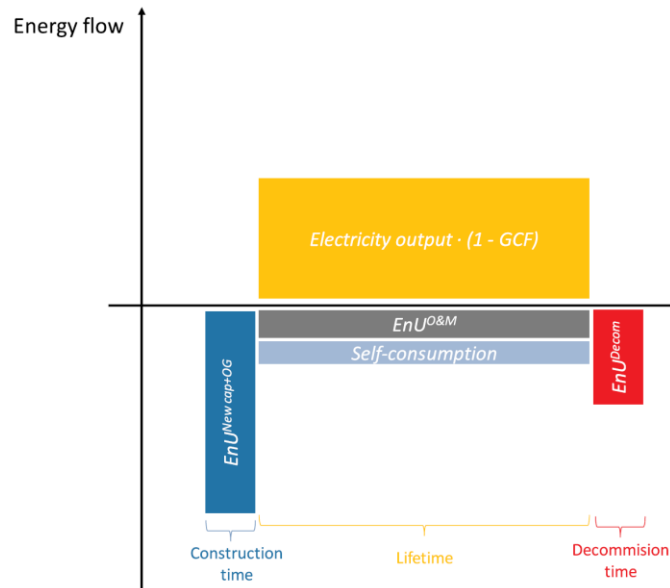
Source: K. Zhao et al. / 2021  
doi.org/10.1007/s41247-021-00094-7



- **“Pyramids of Energy Needs” — Higher EROEI Values Enable Medical Care/Education/Technology Innovation/Art etc.**
- **The “Net Energy Cliff” Indicates the Minimum  $\text{EROEI} = 5 \dots 10$  Required to Maintain a Complex Industrial Society**

# Falling-Off the „Net Energy Cliff“ (?)

- Analysis of Energy & Material Investments for **Global Transition from Fossil Fuels to RES in Electricity Sector**
- Transition to 100% RES by 2060 Could Decrease **EROEI** from 12:1 to 3:1 by 2050 / Stabilizing @ 5:1



- Resulting EROEI Level Potentially Below Threshold Required to Sustain Complex Industrial Society
- Transition Could Drive Substantial Re-Materialization of the Economy / Deplete Critical Mineral Resources

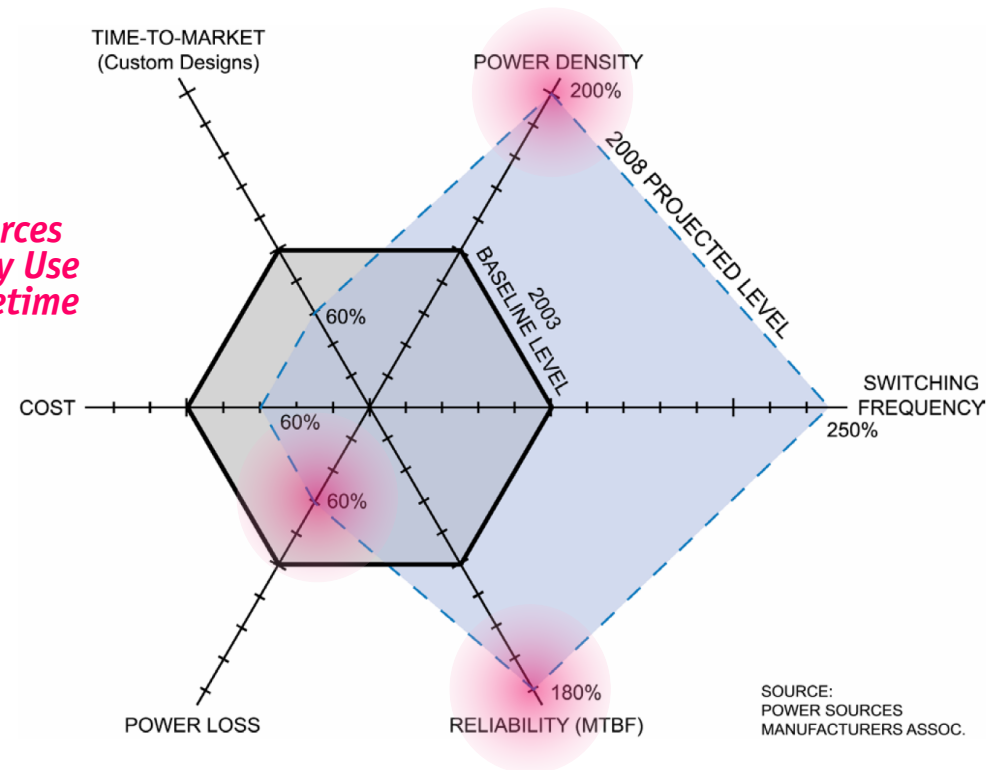
# Power Electronics 4.0

“Do More with Less”

# Power Electronics 4.0 — “Reduce-to-the-Max”

- *Today's Power Electronics Innovation Inherently Contributes to Lower Environmental Impact*

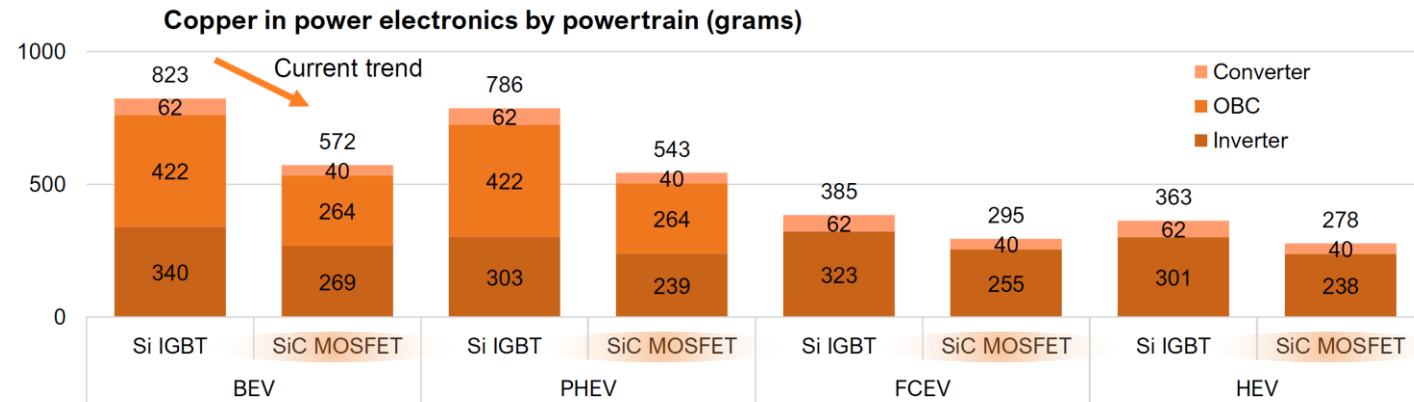
- **Power Density** → *Red. of Resources*
- **Efficiency** → *Red. of Energy Use*
- **Robustness** → *Increased Lifetime*



- *New Set of Key Performance Indicators Mandatory to Meet Future Environmental Compatibility Objectives*

## Remark Copper Used in xEVs

- Cu Used for Traction Motors, Energy Storage, Power Electronics, HV & LV Distribution, Etc.
- ICE (2023) — 29.5kg | BEV Robotaxi in 2034 — 73kg (7.8kg Motor & Power Electronics)



Source: IDTechEx

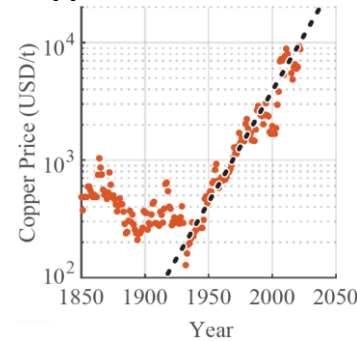
- Transition Si IGBTs → SiC MOSFETs — 25...30% Decrease of Power Electronics Cu Intensity



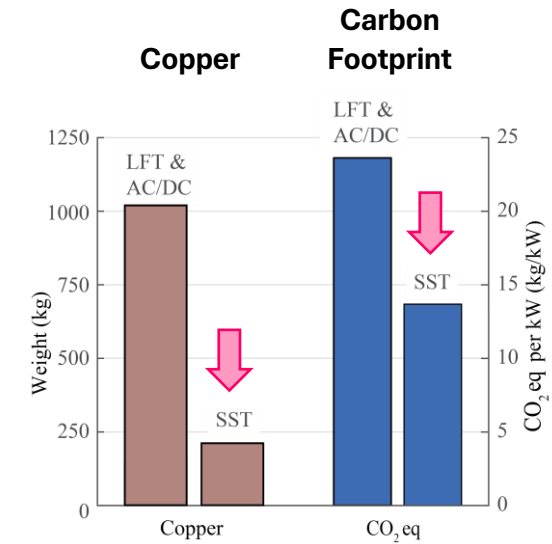
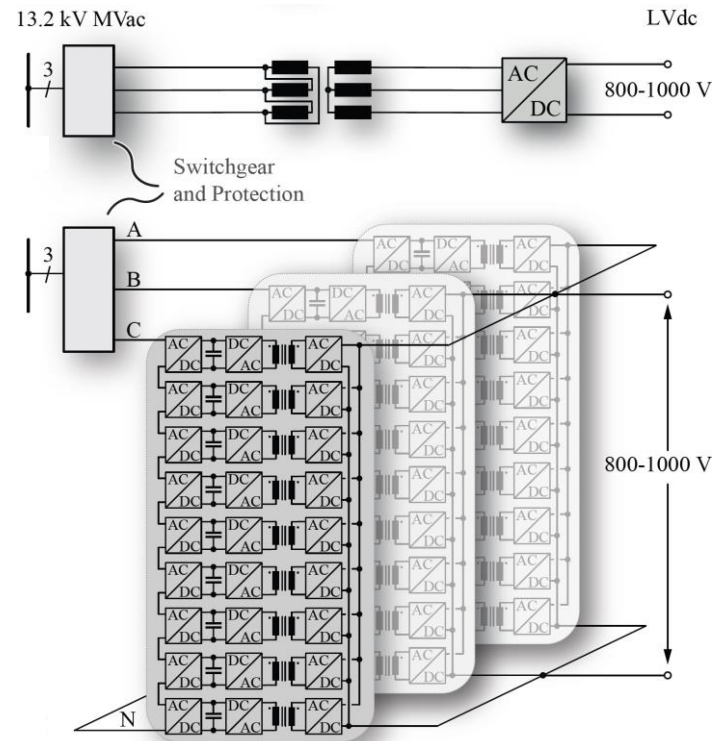
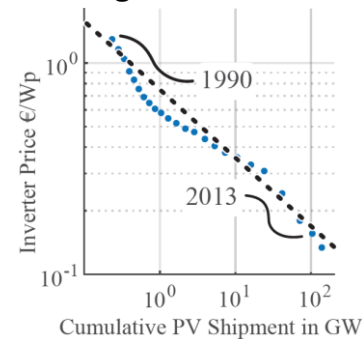
# Remark Solid-State Transformers for MVac-LVdc Convers.

- Three-phase ac-dc **1.2 MW fully-modular solid-state transformers (SST)** with HF-isol. stages
- Comparative evaluation vs. conventional realization – 50 Hz transformer (LFT) & LV ac-dc converter

Copper Price



LV Power Electron.  
Learning Curve

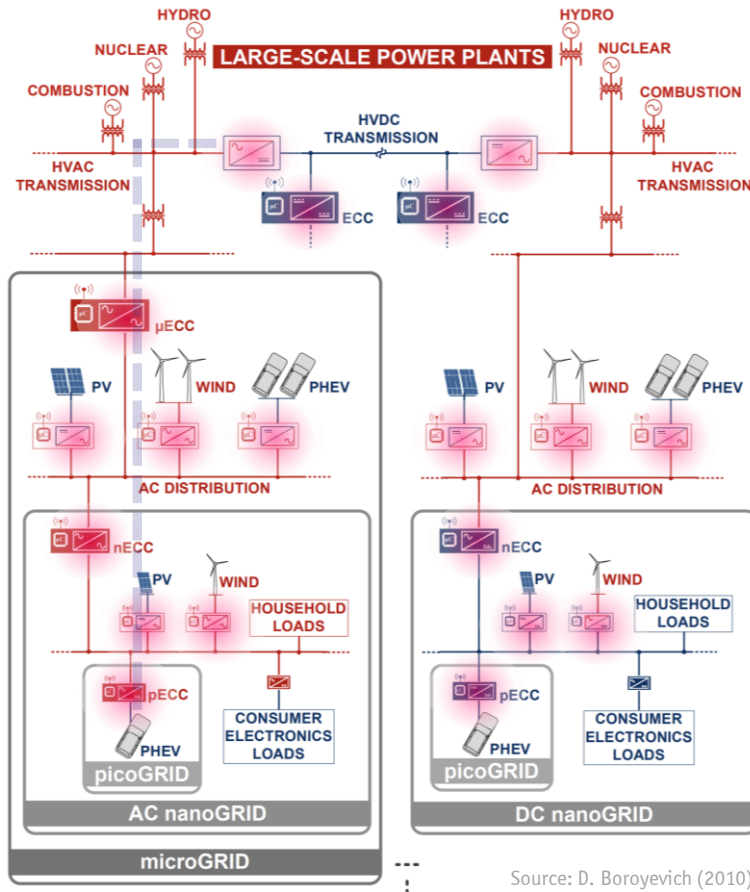


- **Lower raw material effort / Lower impact of increasing raw material costs / Lower carbon footprint**


# Power Electronics 5.0

“Zero-Waste” Paradigm

# The in the Room



Source: D. Boroyevich (2010)

- Global Population by 2050 — 10bn  2.5 kW/Capita
- 25'000 GW Installed Ren. Generation in 2050
- 4x Power Electr. Conversion btw Generation & Load
- 100'000 GW of Installed Converter Power
- 20 Years of Useful Life

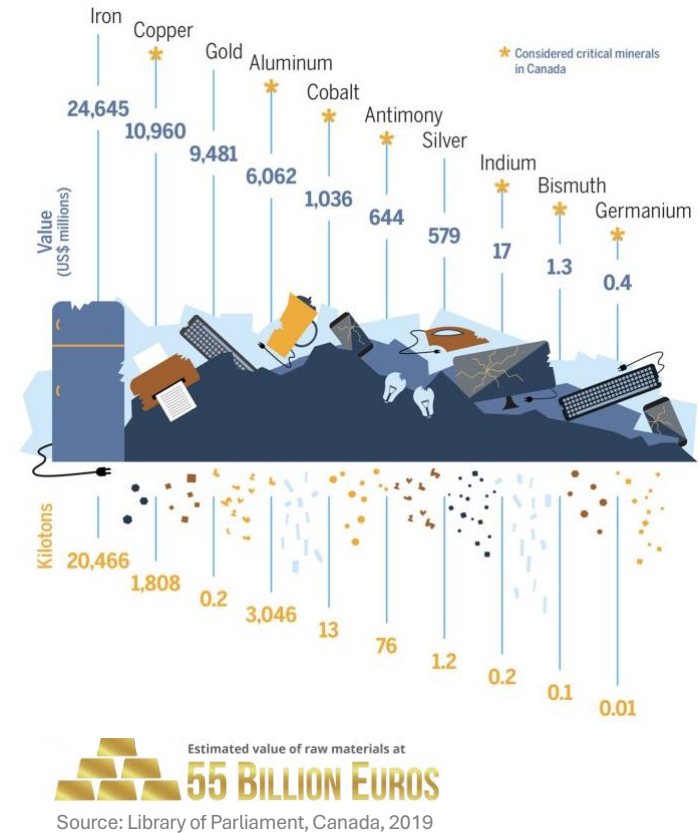
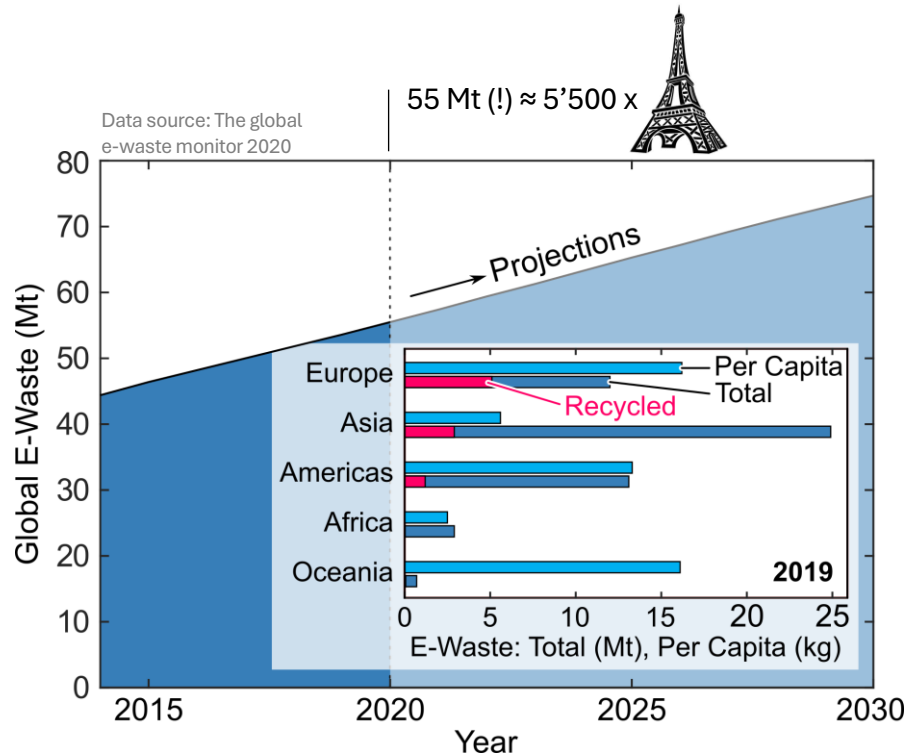


Source: [www.e-waste-recyclers.co.in](http://www.e-waste-recyclers.co.in)

- 5'000 GW<sub>eq</sub> = 5'000'000'000 kW<sub>eq</sub> of E-Waste / Year (!)
- 10'000'000'000 \$ of Potential Value

# Growth of Global E-Waste (1)

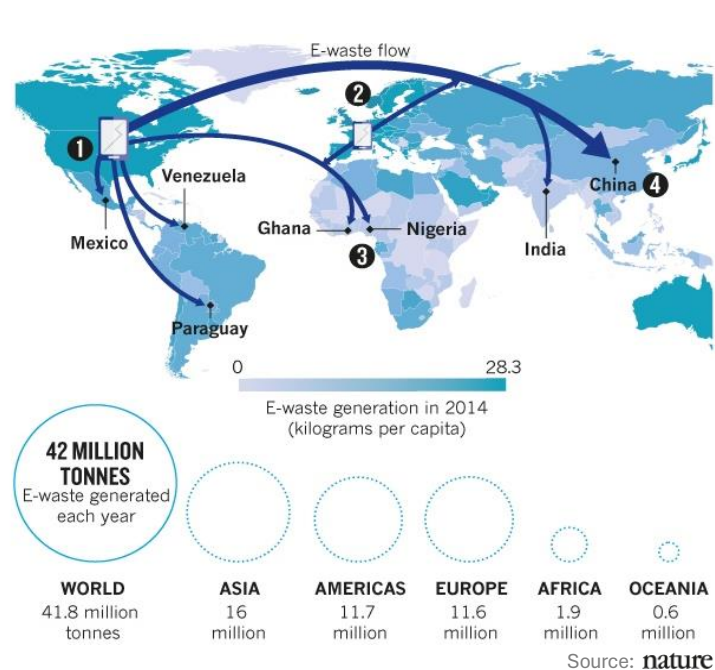
- Growing global e-waste streams / < 20% recycling!
- 120'000'000 tons of global e-waste in 2050



- E-waste represents an “urban mine” with great economic potential

## Growth of Global E-Waste (2)

- Growing global e-waste streams → 120'000'000 tons of global e-waste in 2050
- Increasingly complex constructions → Little repair or recycling



Source: Green IT Solution



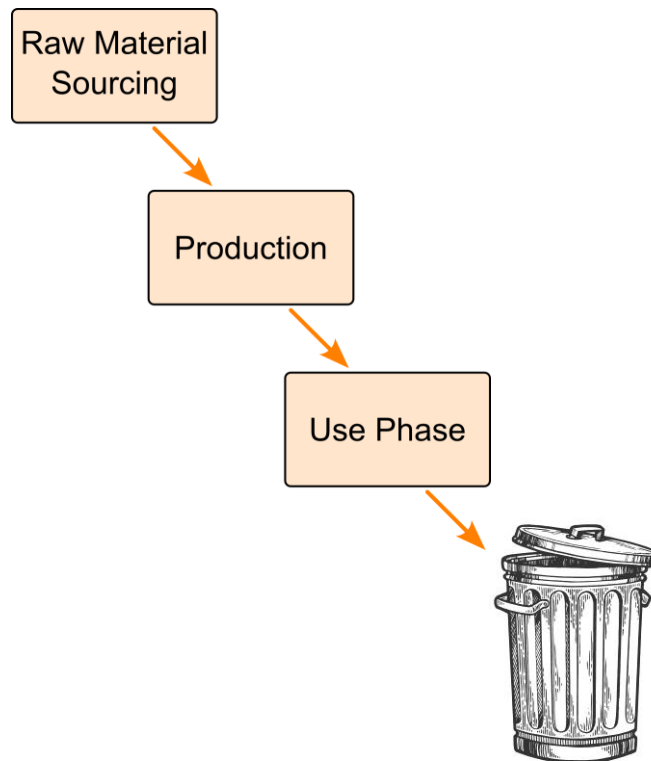
- Growing global e-waste streams → Regulations mandatory (!)



# The Paradigm Shift

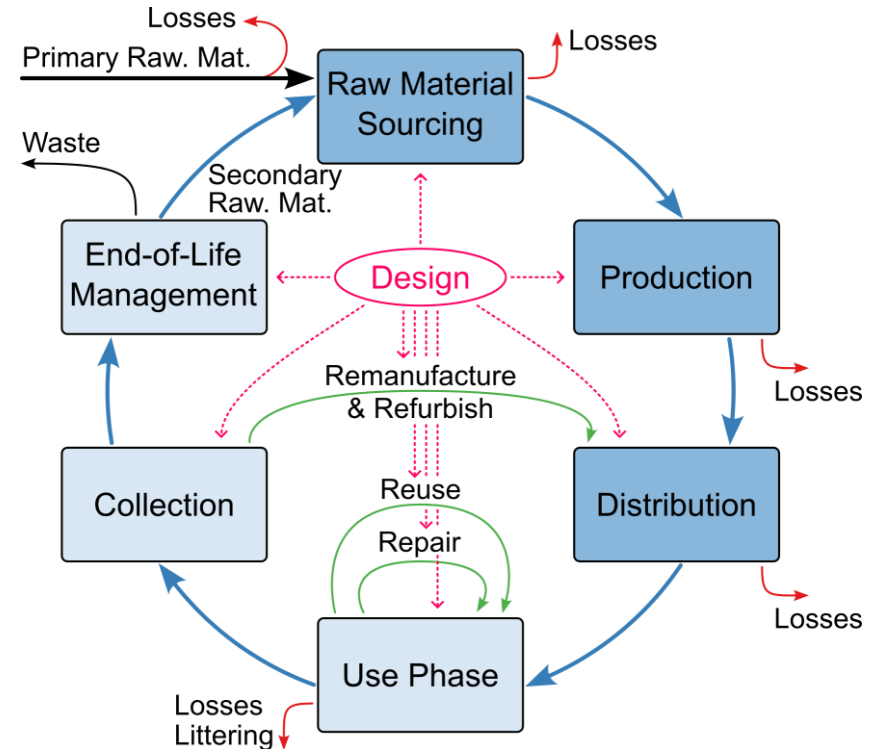
## ■ Linear Economy

- Take – make – dispose



## ■ Circular Economy

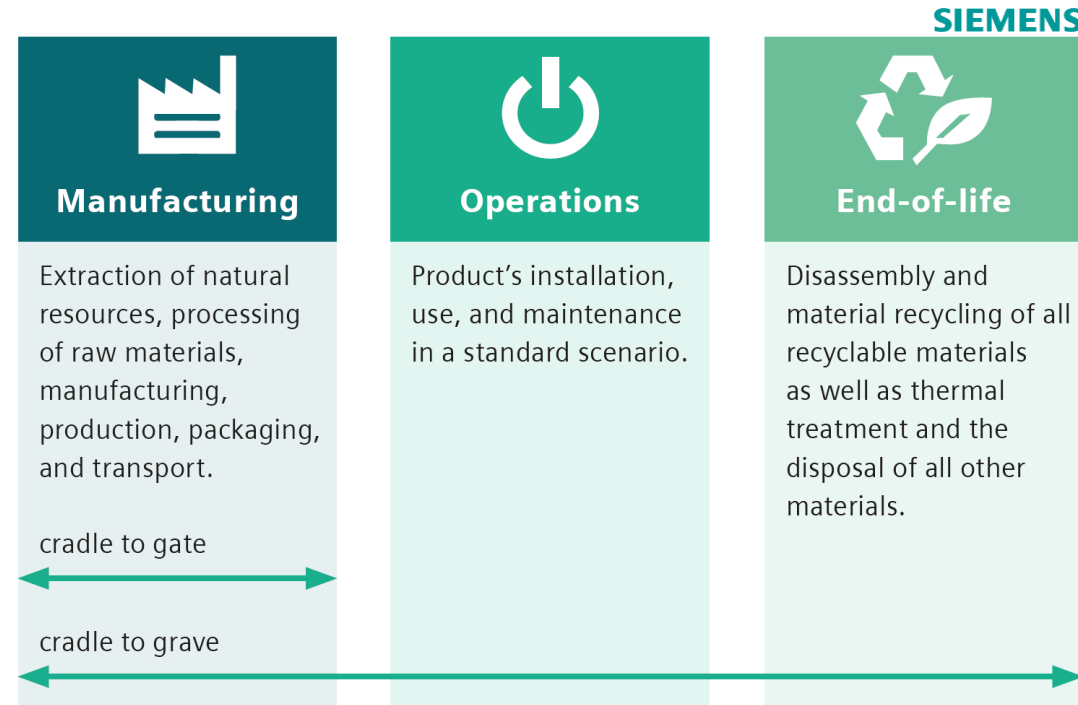
- Perpetual flow of resources



- Resources returned into the product cycle at end of life

# LCA: Life Cycle Assessment (1)

- Quantification / **benchmarking** of **eco-design** & circular economy approaches

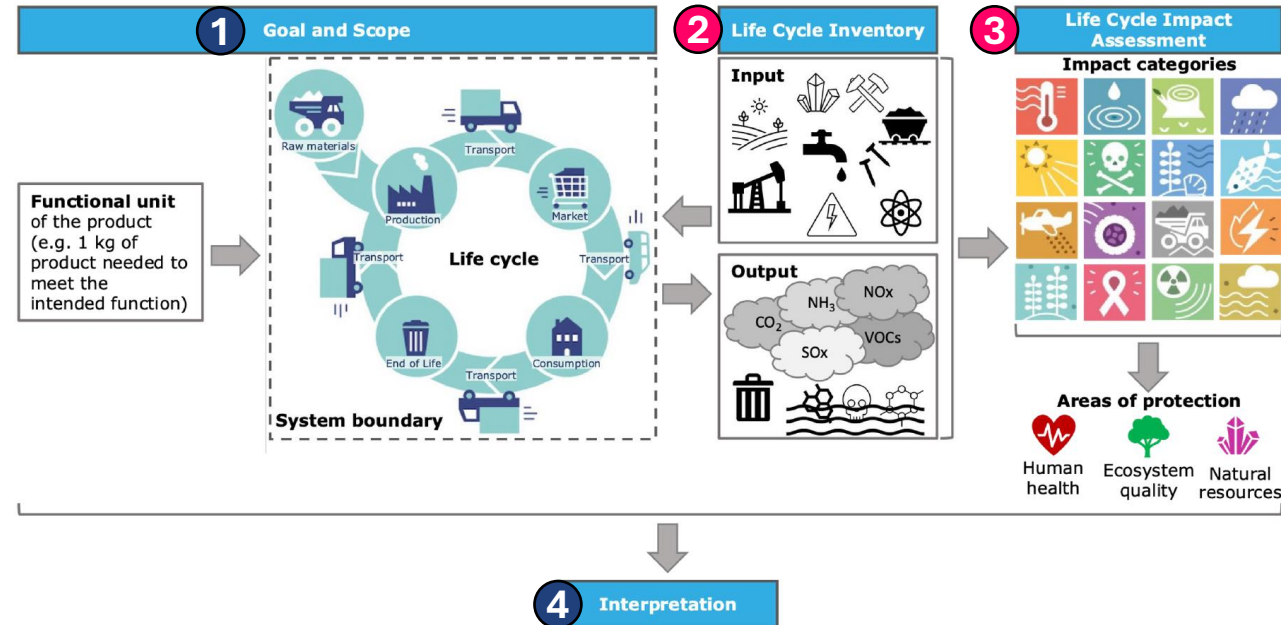


- **Scope of LCA can include**

- **All** life-cycle phases (**cradle to grave**) or
- **Individual** life-cycle phases (**cradle to gate** or gate to gate)

# LCA: Life Cycle Assessment (2)

- Quantification / benchmarking of eco-design & circular economy approaches



- 2 LCI – Life Cycle Inventory**  
Compilation & quantification of inputs and outputs for a product throughout its life cycle

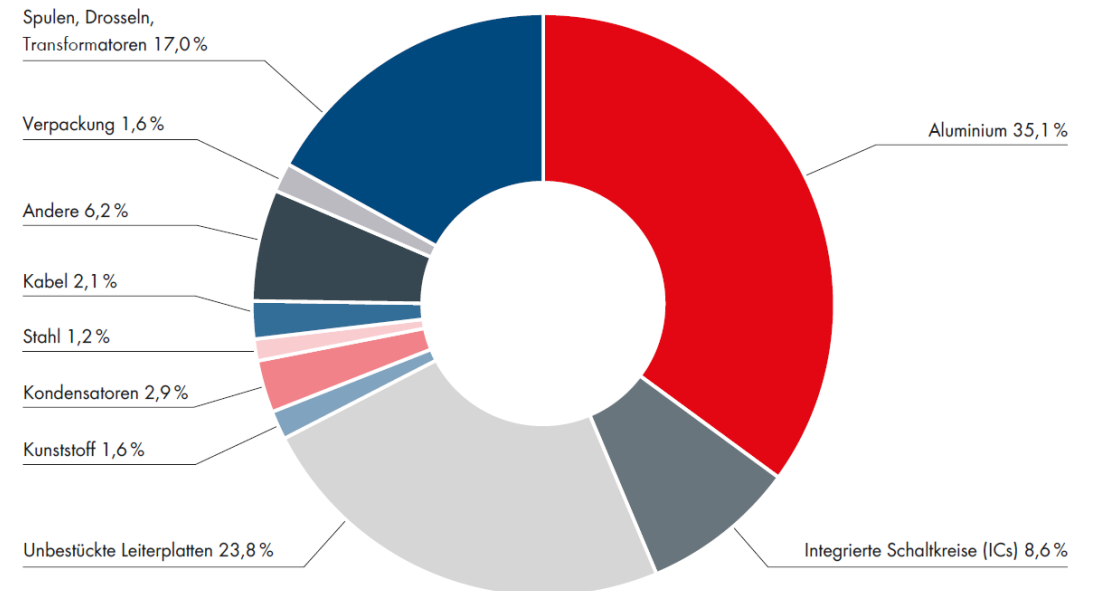
- 3 LCIA – Life Cycle Impact Assessment**  
Assignment of LCI results to (environmental) impact categories / Aggregation involves weighting factors & value choices

# LCA Example: Carbon Footprint of a 150-kW PV Inverter

- **Production phase** / embodied carbon footprint of **903 kg CO<sub>2</sub>eq** (15...20% of life-cycle carbon footprint)
- **Use phase** contributes **>80% to life-cycle carbon footprint** (conversion losses & standby/night consumption)



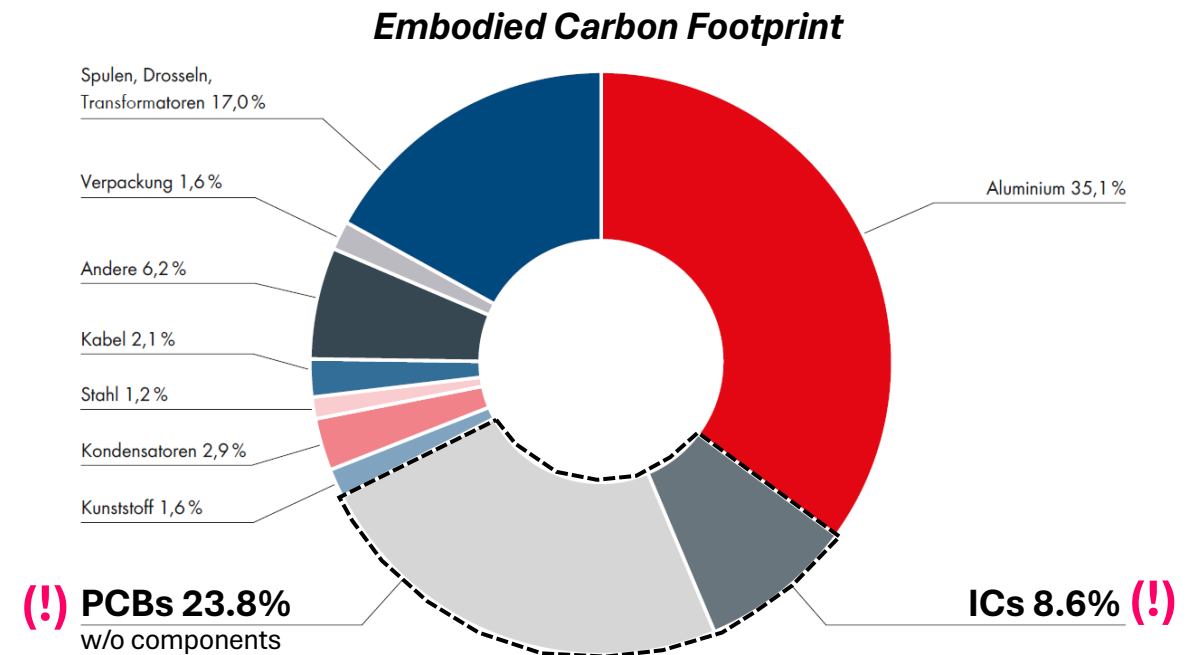
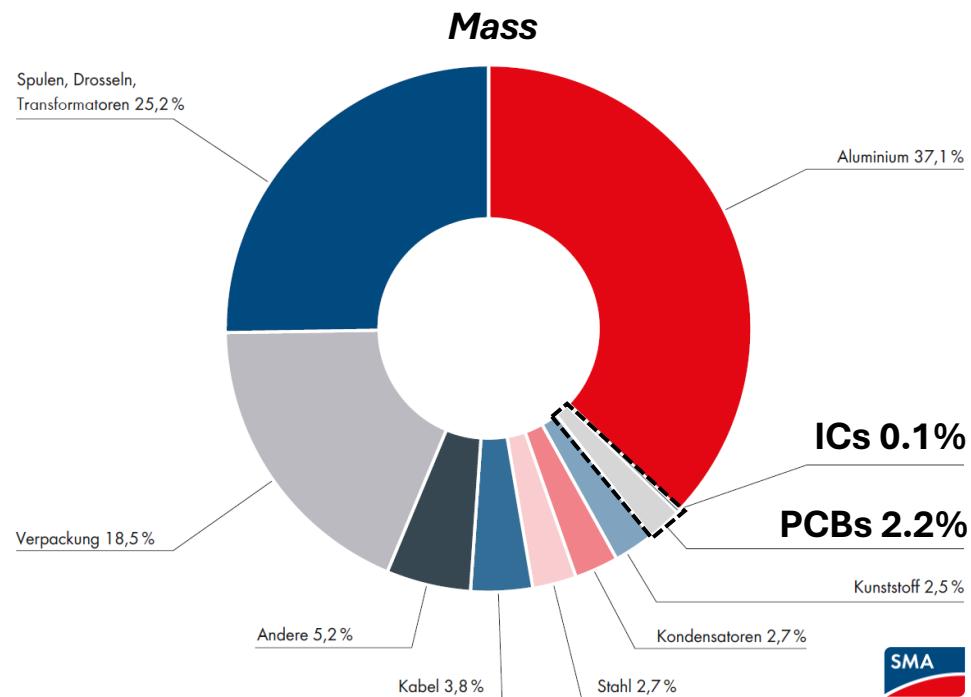
*Embodied Carbon Footprint*



- **150 kW rated power for typ. 225 kW<sub>p</sub> PV system**

# LCA Example: Carbon Footprint of a 150-kW PV Inverter

- **Production phase** / embodied carbon footprint of **903 kg CO<sub>2</sub>eq** (15...20% of life-cycle carbon footprint)
- **Use phase** contributes **>80% to life-cycle carbon footprint** (conversion losses & standby/night consumption)



- **Small / lightweight components with large contributions to carbon footprint (!)**



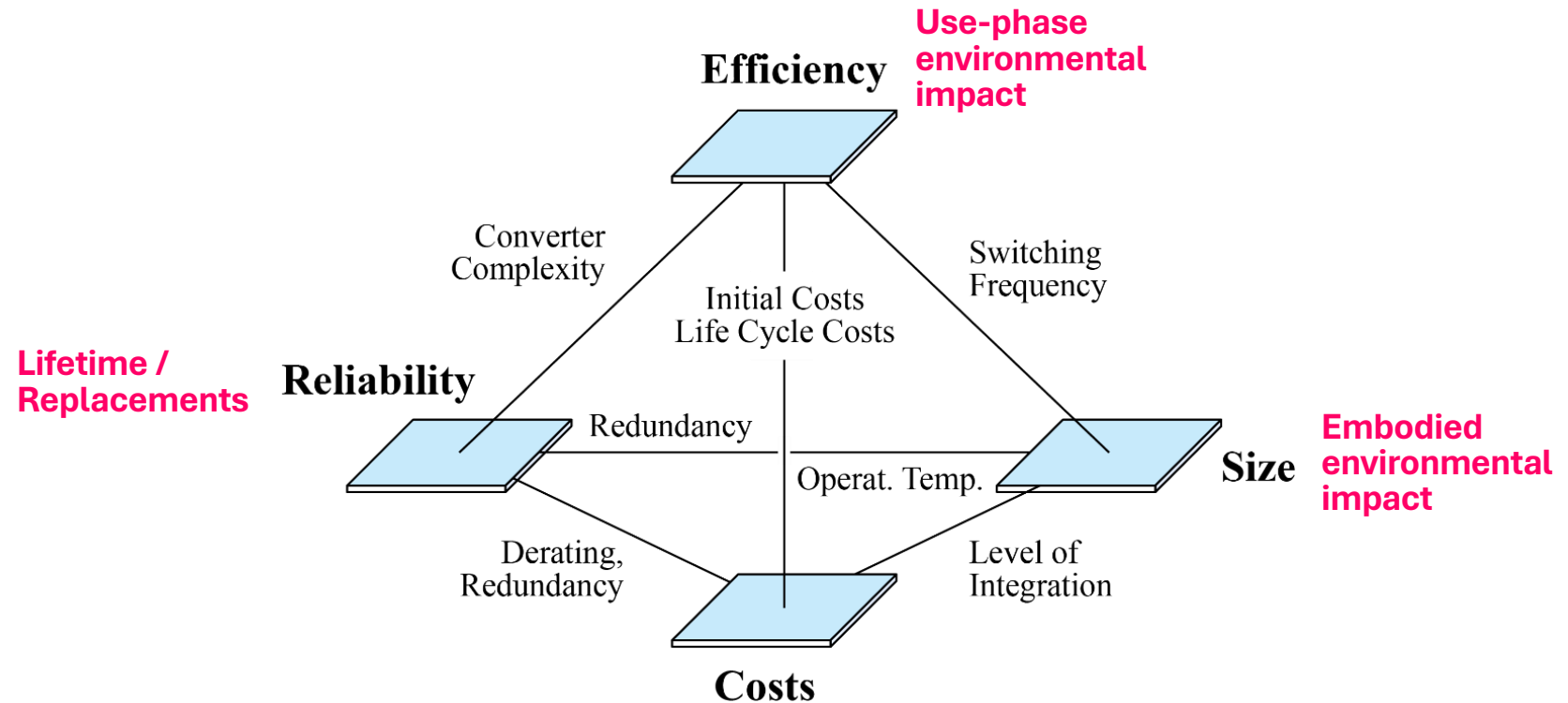
# New Holistic Design Procedure



Multi-Objective Optimization with Environmental Impacts as New Performance Indicators

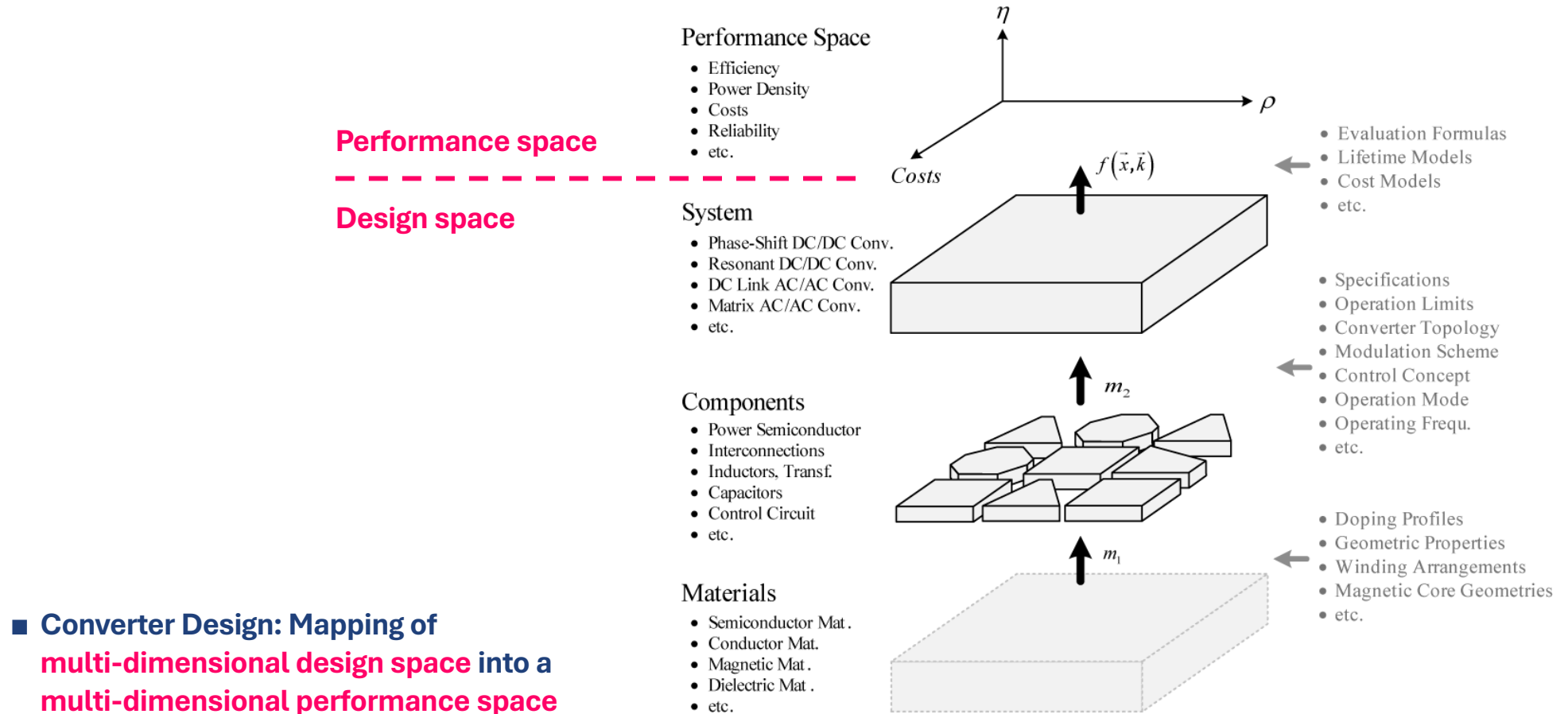
# System Design Challenge

- Mutual coupling of performance indicators → Trade-off analysis!



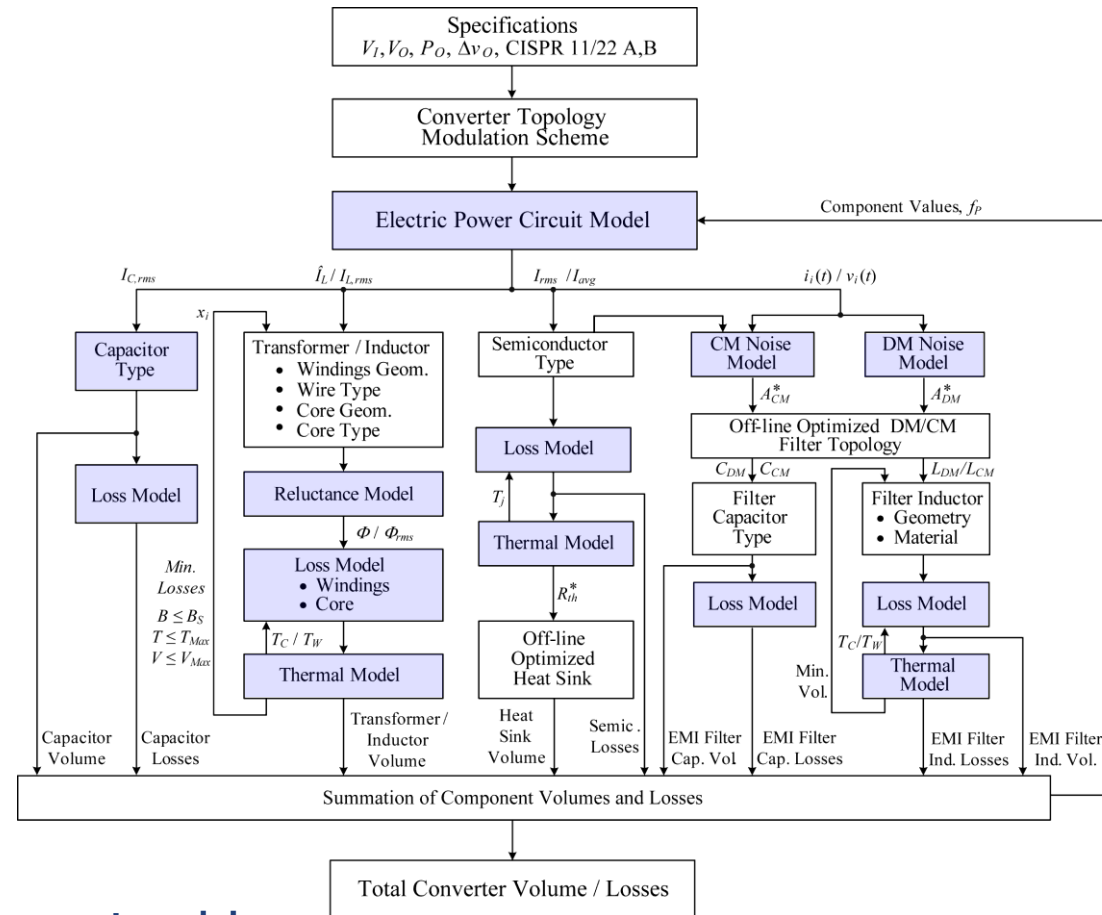
- For optimized systems, it is not possible to improve several perf. indicators *simultaneously*

# Abstraction of Power Converter Design



- **Converter Design: Mapping of multi-dimensional design space into a multi-dimensional performance space**

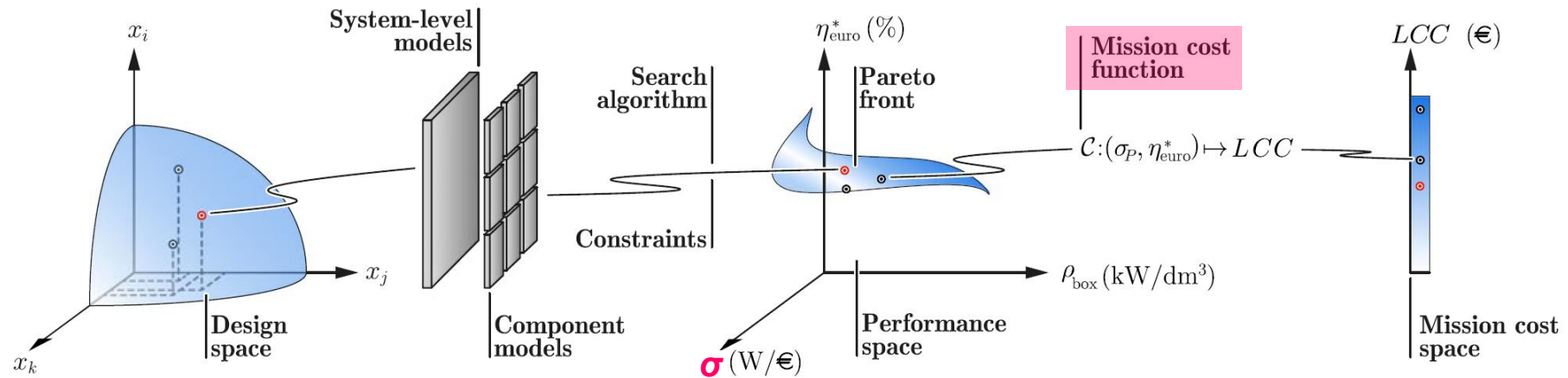
# Modeling of Converter Designs



- System/circuit & component models
- Iteration over all combinations of design degrees of freedom

# Multi-Objective Optimization of Converter Designs

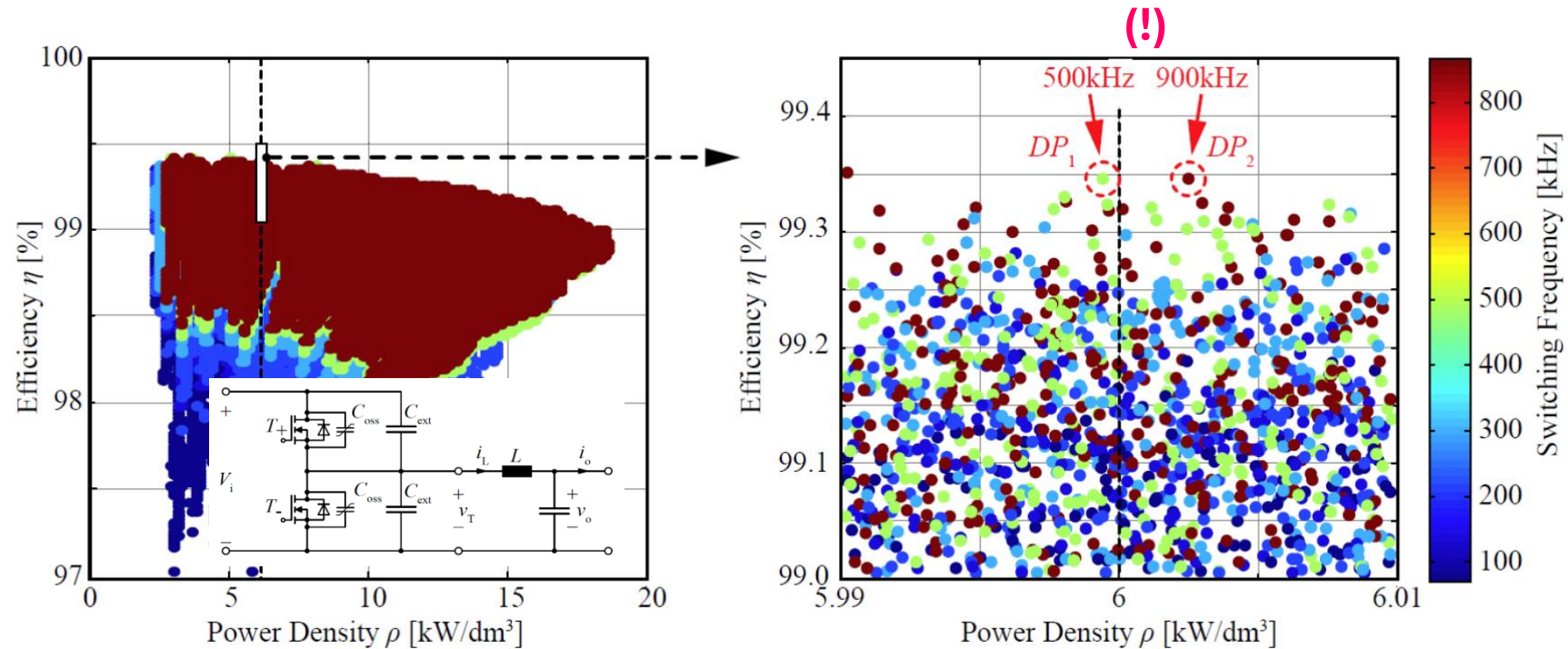
- **Pareto front:** Boundary of the feasible performance space
- **Mission profiles:** Power loss  $\rightarrow$  Energy loss / **Life-cycle cost (!)**



- **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 W/€**

# Design Space Diversity

- Very different design space coordinates map to very similar performance space coordinates



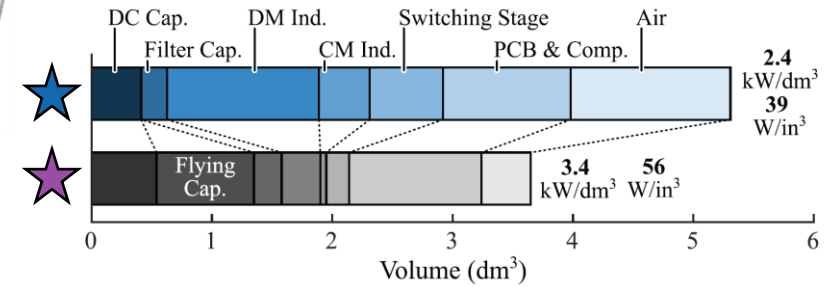
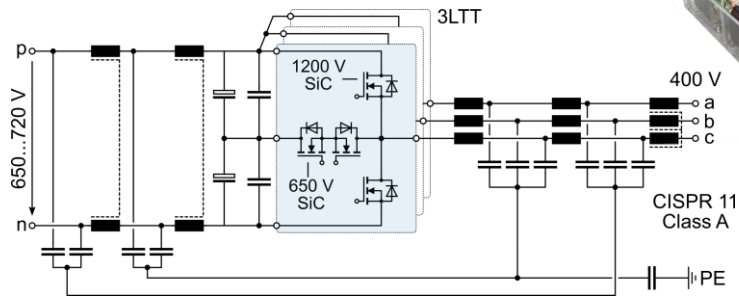
- Example: Google Littlebox design optimization w. PWM operation / Mutual comp. of HF and LF loss contrib.



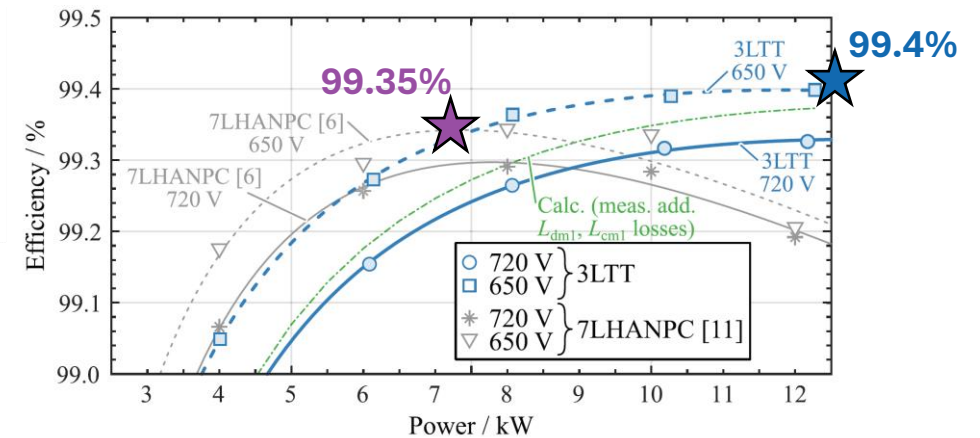
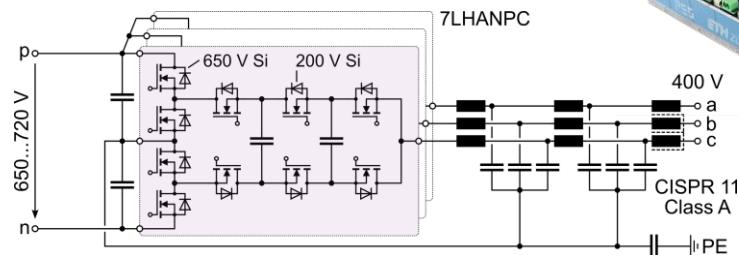
# Design Space Diversity: 3L & 7L PV Inverters

■ Two concepts / similar specs — 12.5 kW, 650...720 V DC, CISPR 11 Class A — Similar perf. ( $\eta_{CEC} = 99.1\%$ )

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



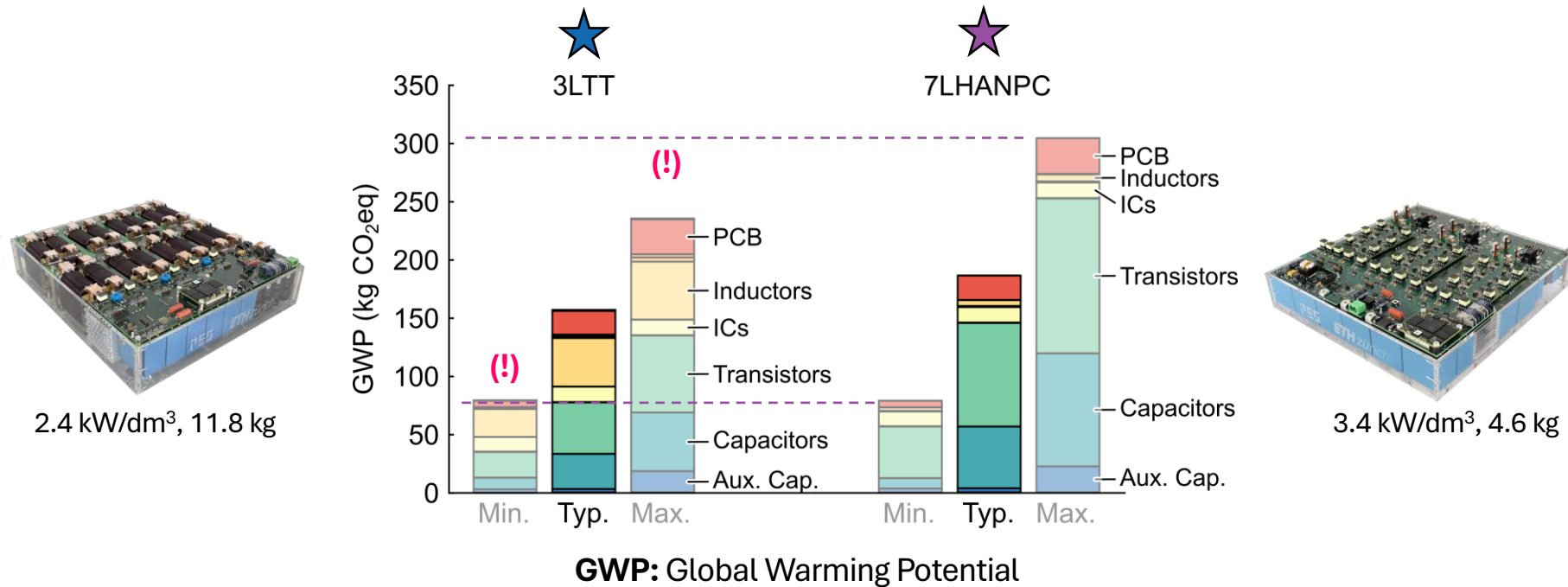
**7-Level All-Si HANPC PV Inverter** ★  
99.35%, 3.4 kW/dm<sup>3</sup>



■ Differences in environmental impact?

# A Posteriori LCA of 3L & 7L PV Inverters (1)

■ Two concepts / similar specs — 12.5 kW, 650...720 V DC, CISPR 11 Class A — Similar perf. ( $\eta_{CEC} = 99.1\%$ )



■ Generic comp. models / ecoinvent database & lit. → Widely varying embodied carbon footprint (GWP) res. (!)

■ Data availability / quality as key challenge!

# Carbon Footprint is Not Enough!

- Life cycle **impact** assessment (**LCIA**) phase of LCA — **Environmental profile w. wide range of perf. indicators**

- Example: ReCiPe 2016

Three areas of protection / endpoint categories

- **Human Health**

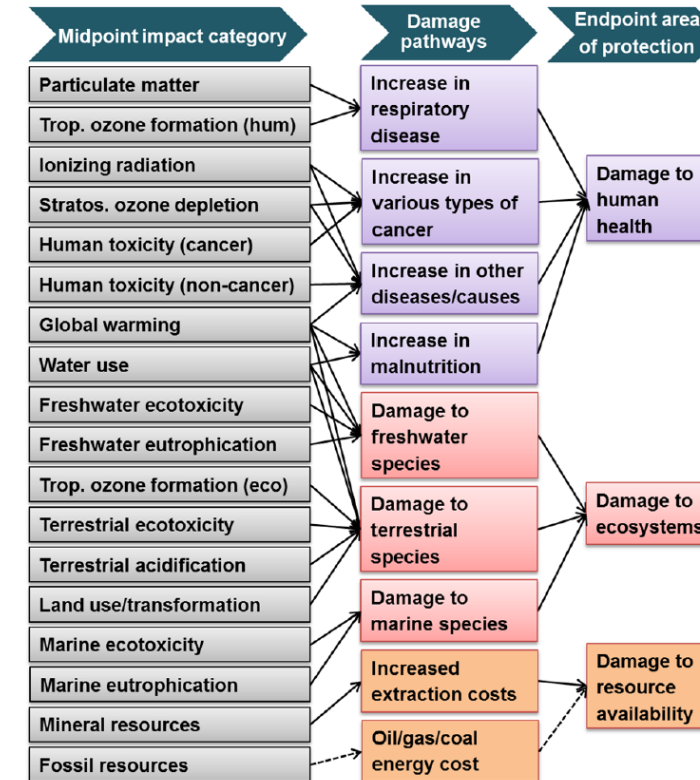
Damage to Human Health (DHH)  
in Disability-Adjusted Loss of Life Years (DALY)

- **Ecosystem Quality**

Damage to ecosystem quality (DESQ)  
in Time-Integrated Species Loss (species · yr)

- **Resource Scarcity**

Damage to resource availability (DRA)  
in surplus cost / dollars (\$)

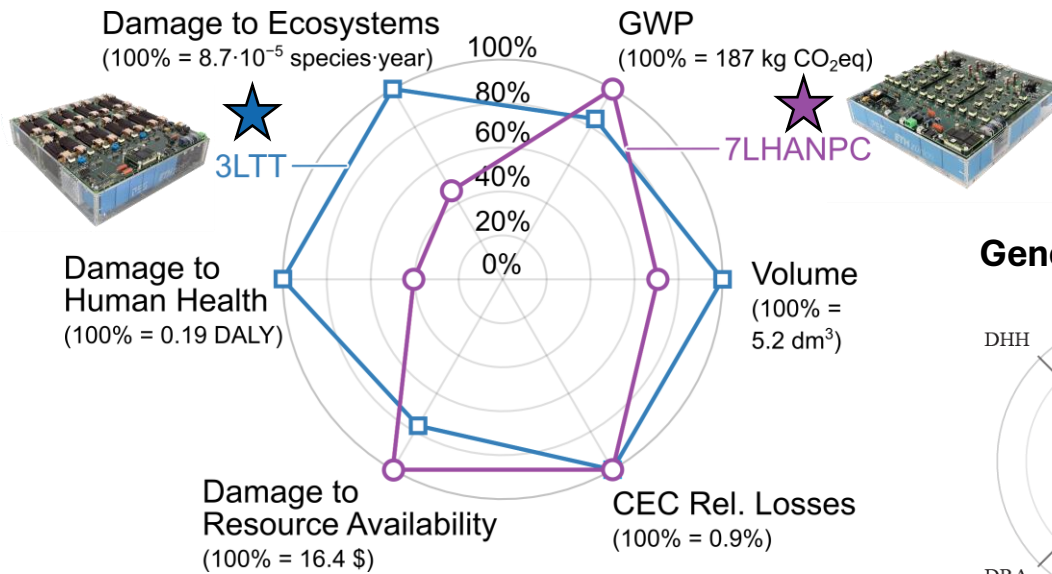


Source: Huijbregts et al., ReCiPe 2016 v1.1 Report

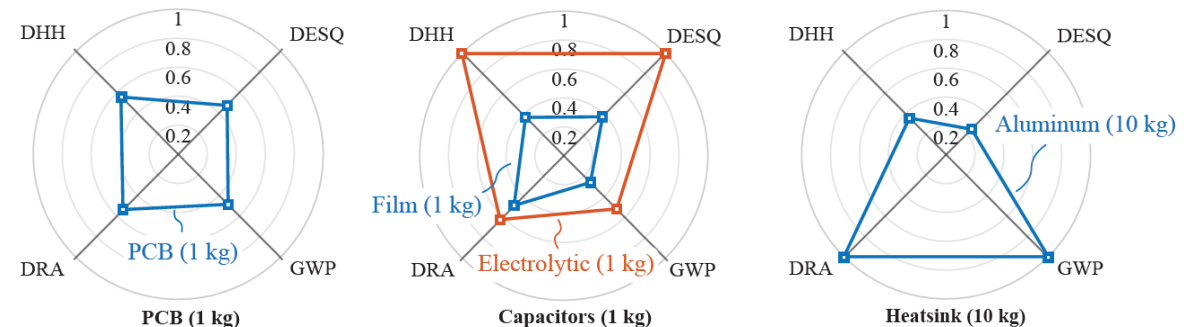
- Value choices (**individualist** / **hierarchist** / **egalitarian**) affect time horizon, included effects, etc.
- Alternative frameworks like **EU Environmental Footprint (EF 3.1)** exist

## A Posteriori LCA of 3L & 7L PV Inverters (2)

- **Two concepts / similar specs** — 12.5 kW, 650...720 V DC, CISPR 11 Class A — **Similar perf.** ( $\eta_{CEC} = 99.1\%$ )
- **Life Cycle Impact Assessment (LCIA) w. ReCiPe framework:**
  - Damage to ecosystems (DESQ) | Damage to human health (DHH) | Damage to resource availability (DRA)



### Generic Comp. Mod.



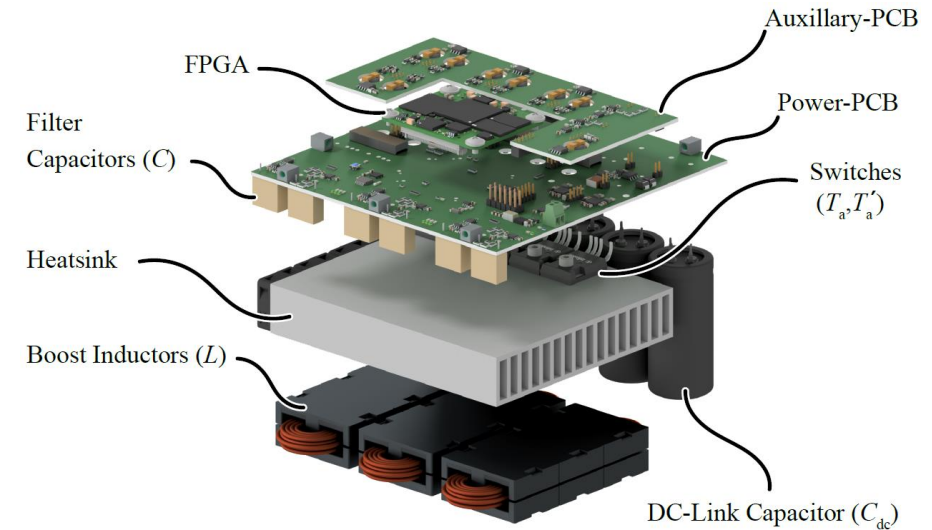
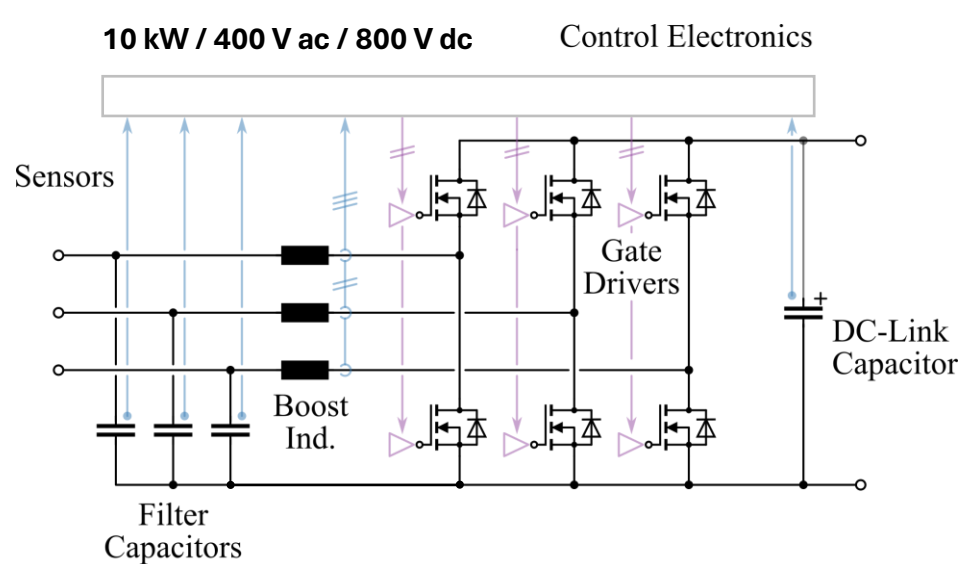
Normalized scales due to ecoinvent licensing restrictions.

- **Environmental footprint of converter as aggregate of components' environmental footprints**

**A Priori** Consideration of Environmental Impacts in the Design Process? 

# A Priori LCA Example: 10-kW Three-Phase AC-DC PEBB

## ■ Key power electronic building block (PEBB) for three-phase PFC rectifiers & inverters

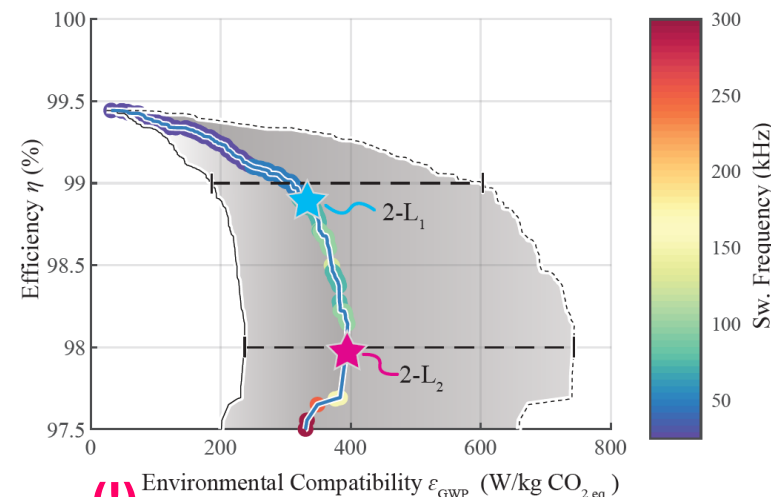
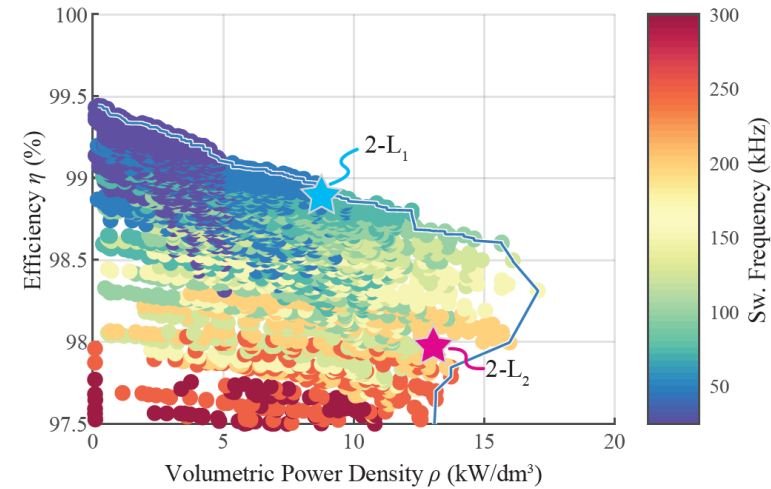
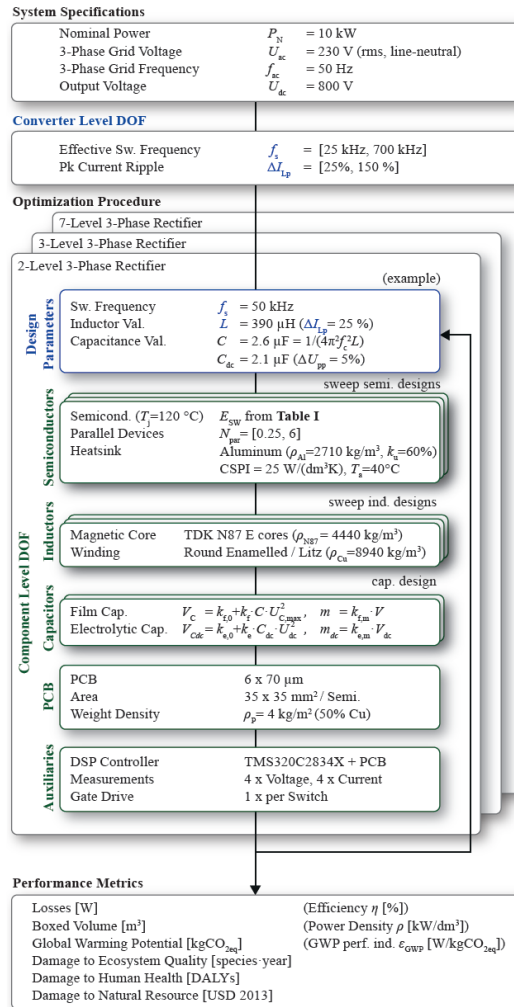


- **Degrees of freedom:**
- Switching freq. [25...700 kHz]
  - Rel. Ind. Peak cur. ripple [0.25...1.5]
  - Var. transistor chip area
  - Variable ind. size (N87; solid/litz)

- **Assumptions:**
- Junction temp. @ 120 °C
  - Ambient temp. 40 °C
  - Necessary heat sink vol. via CSPI = 25 W/(K dm<sup>3</sup>)



# Multi-Objective Optimization Including Env. Impacts (1)

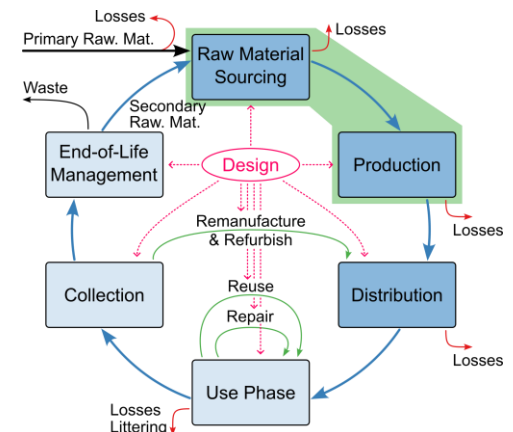


(!) Environmental Compatibility  $\varepsilon_{GWP}$  ( $\text{W/kg CO}_2\text{eq}$ )

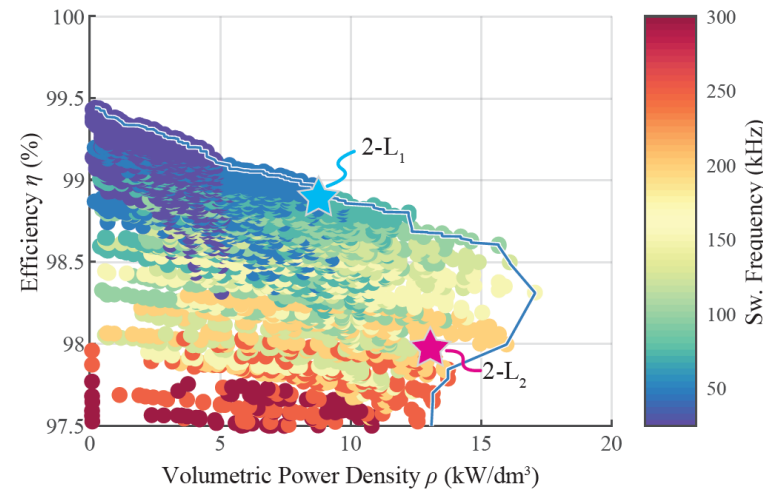
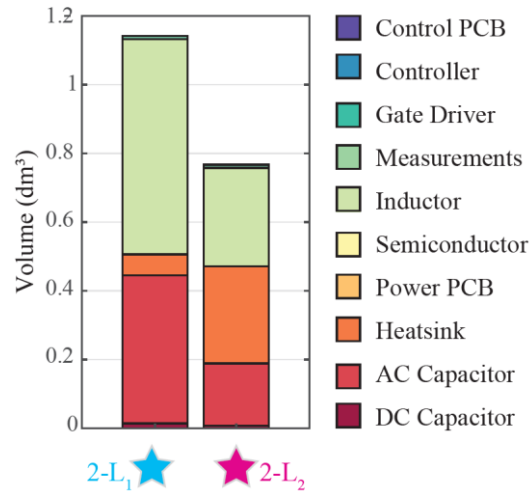
## Trade-Offs

- Efficiency vs. power density
- Efficiency vs. environmental compatibility regarding embodied GWP (carbon footprint)

## Env. Impacts with high uncertainties due to data availability/quality



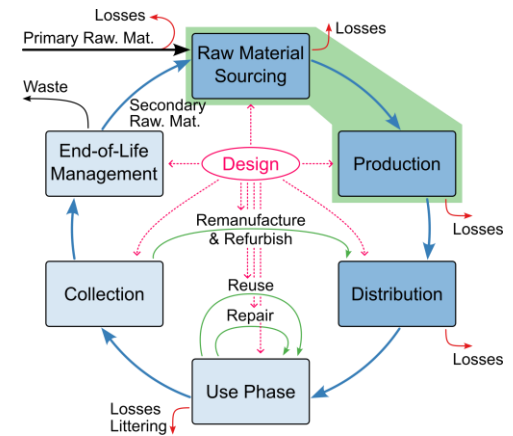
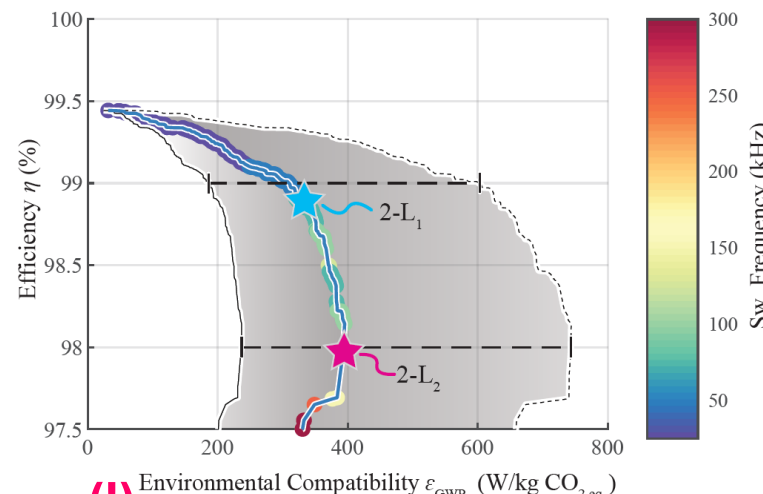
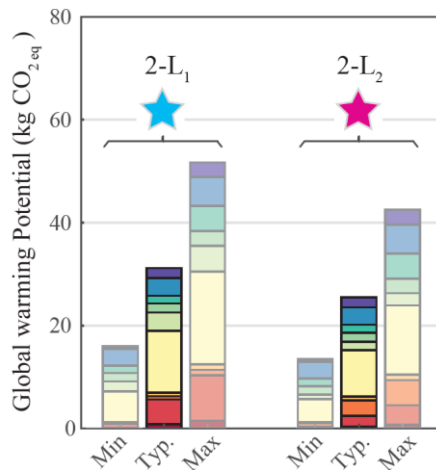
## Multi-Objective Optimization Including Env. Impacts (2)



### Trade-Offs

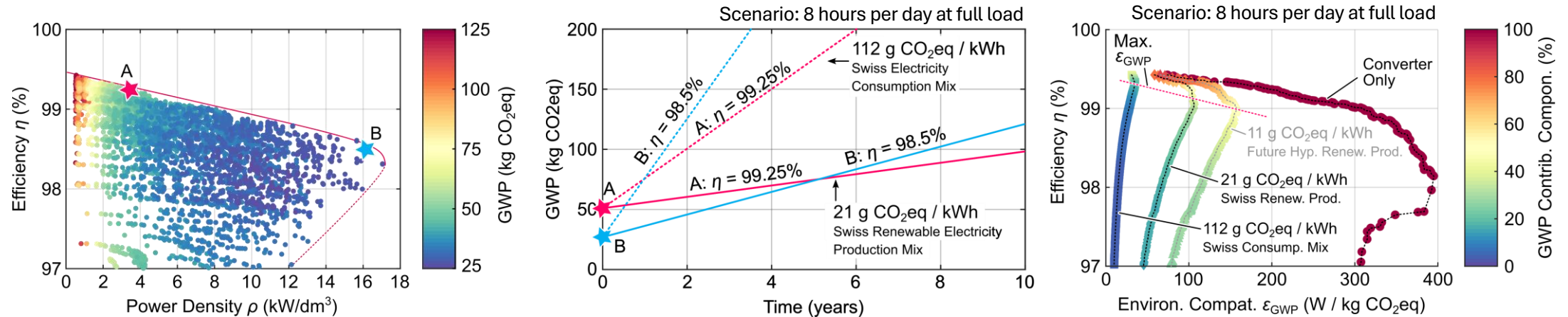
- Efficiency vs. power density
- Efficiency vs. environmental compatibility regarding embodied GWP (carbon footprint)

### Env. Impacts with high uncertainties due to data availability/quality



# Multi-Objective Optimization Including the Use Phase

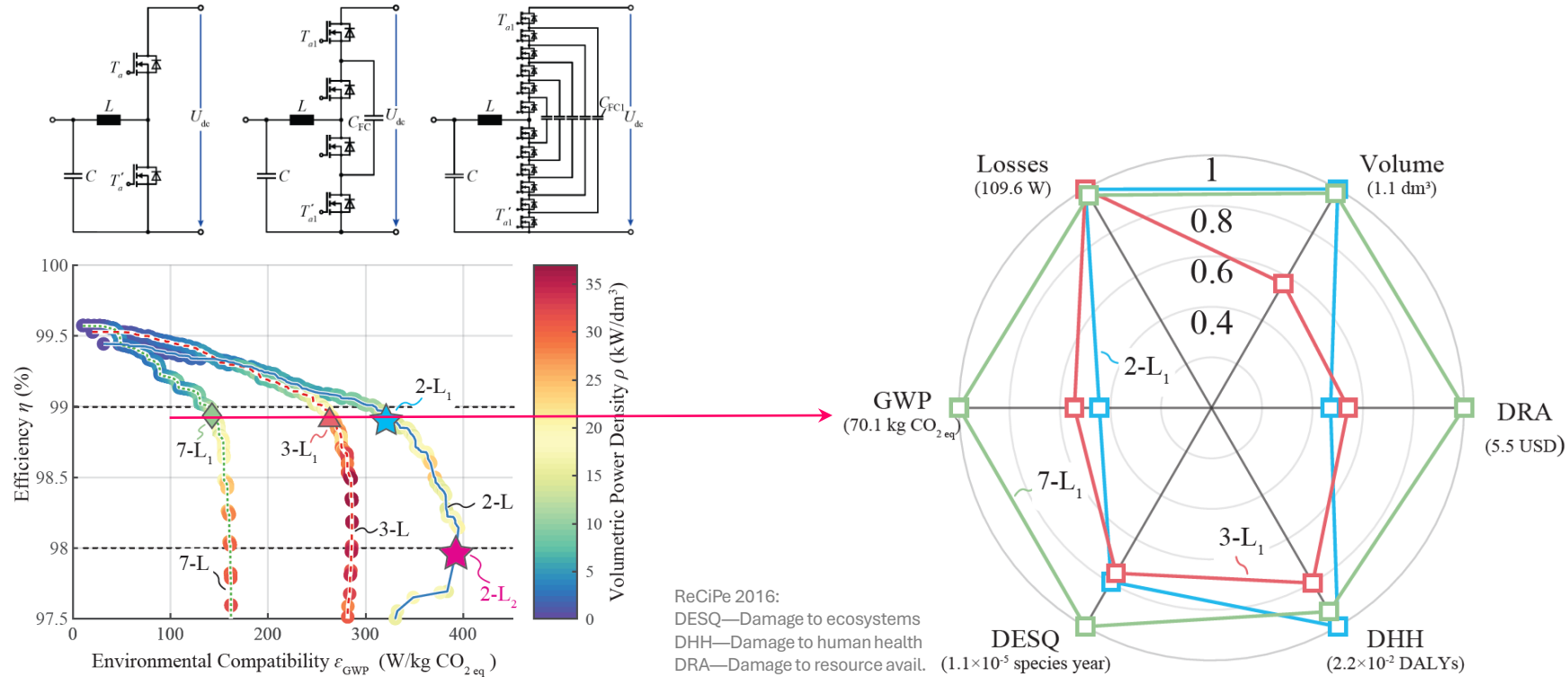
- Life-cycle carbon footprint strongly depends on electricity mix and mission profile / usage intensity



- Design should consider use phase for best life-cycle performance
- Analogy to total cost of ownership (TCO) perspective

# Comprehensive Environmental Impact Profiles

■ Different bridge-leg topologies — 2-Level (1200-V SiC) | 3-Level (650-V SiC) | 7-Level (200-V Si)



■ Embod. env. footprint of 2L/3L/7L-designs with  $\eta \approx 99\%$  and max. env. compat.  $\epsilon_{GWP}$  in W / kg CO<sub>2eq</sub>

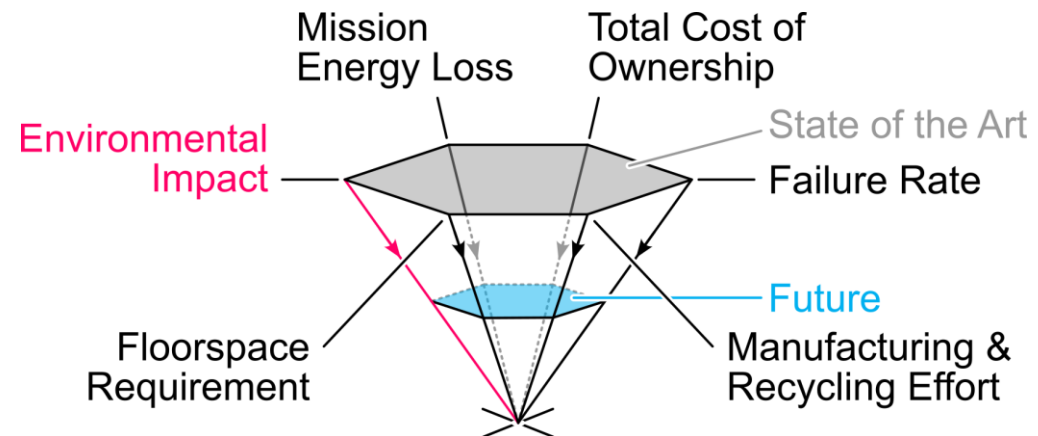
■ Same efficiency via different usage of act./pass. components — Different environmental impact profile!

# Future Performance Indicators

- Assuming 20+ years lifetime → **Systems installed today reach end-of-life by 2050 (!)**
- Life cycle assessment (**LCA**) mandatory for all future system designs

- **Complete set of new performance indicators**

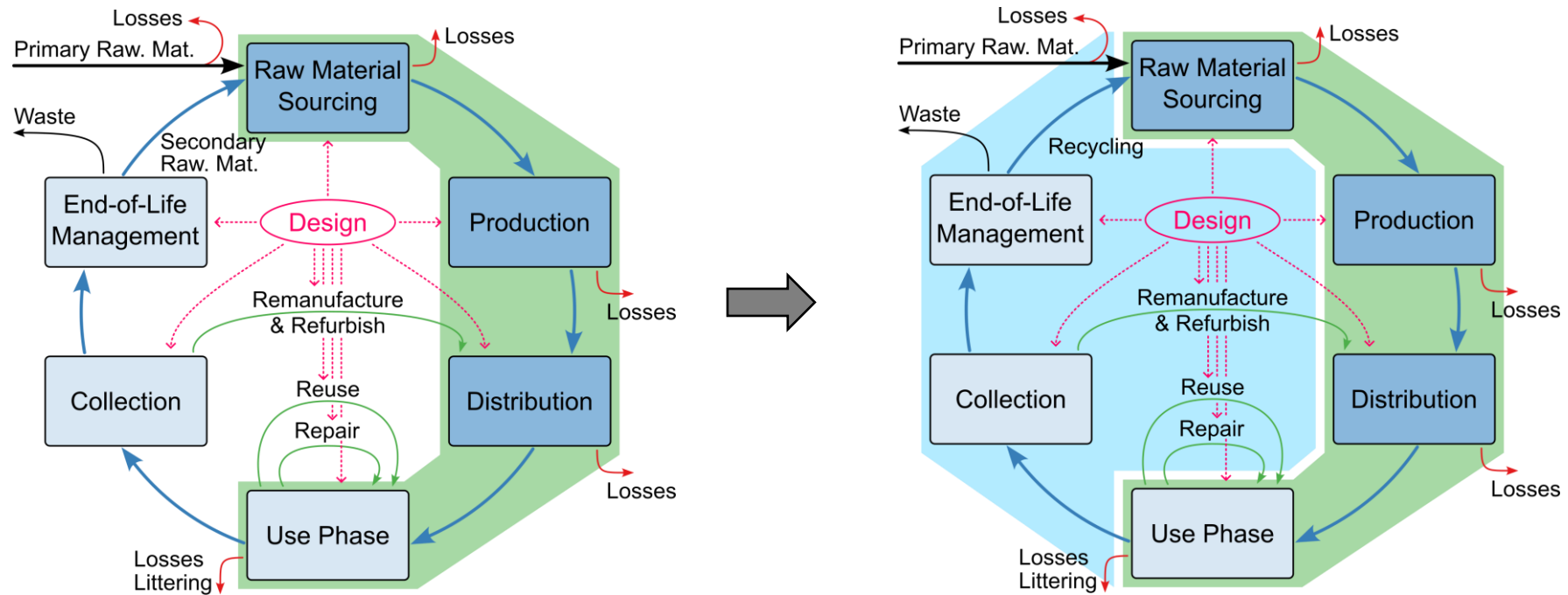
- Environmental impact [kg CO<sub>2</sub>eq / kW, ...]
- Resource efficiency [kg<sub>xx</sub> / kW]
- Embodied energy [kWh / kW]
- TCO [\$ / kW]
- Power density [kW/dm<sup>3</sup>, kW/dm<sup>2</sup>]
- Mission efficiency [%]
- Failure rate [h<sup>-1</sup>]



- Mission/location-specific **trade-off** betw. **embod. vs. life-cycle environ. impact** — **Losses / Reliability / Lifetime**
- Compatibility with a circular economy (!) — **Repairability / Reusability / Recyclability**

# Power Electronics 5.0: “Zero Waste”

- Including **4R** into the design process — **Repair / Reuse / Refurbish / Recycle**
- **Lifetime extension / reliability** considerations are a key design aspect

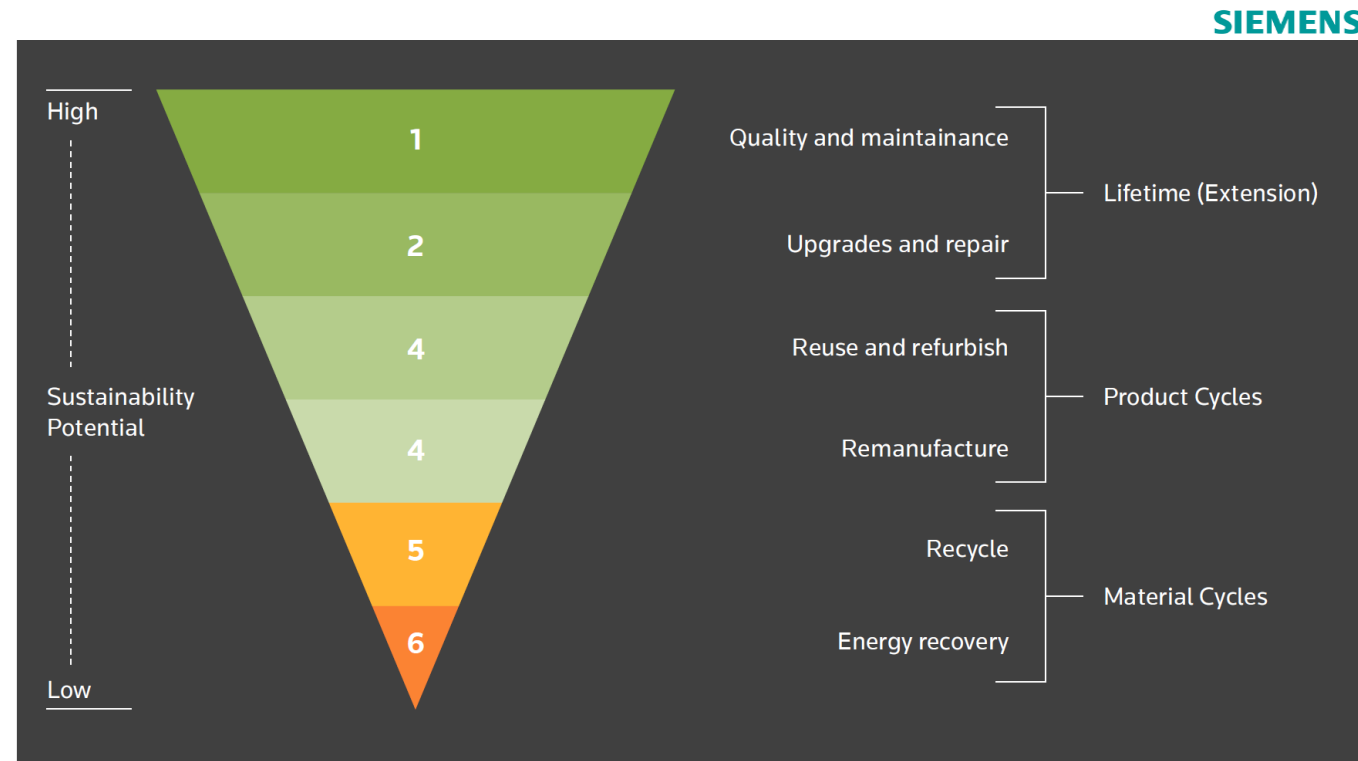


- **Life-cycle cost perspective** — Potentially advantageous for suppliers & customers



# Sustainability Potential

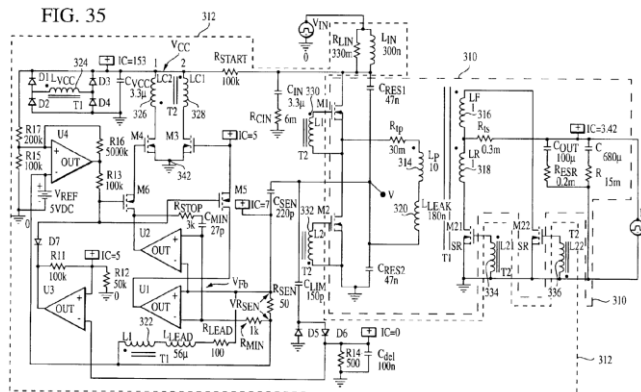
■ 2<sup>nd</sup> ELLEN MACARTHUR FOUNDATION circular economy principle: Circulate products and materials at their highest values



■ High reliability / lifetime extension → Lifetime / aging modeling

# Integration: Minimize Size / Initial Resource Usage

- **Maximum integration facilitates extreme power densities (10...100 x conv.)**
- Example: **30 kW** non-isolated fixed-ratio conversion (**400 V to 800 V**)  
in 92 x 80 x 7.4 mm<sup>3</sup> — **550 kW/dm<sup>3</sup>** and 130 kW/kg
- **Low initial material usage** ↔ **Difficult material separation**
- **Importance of recyclability?**

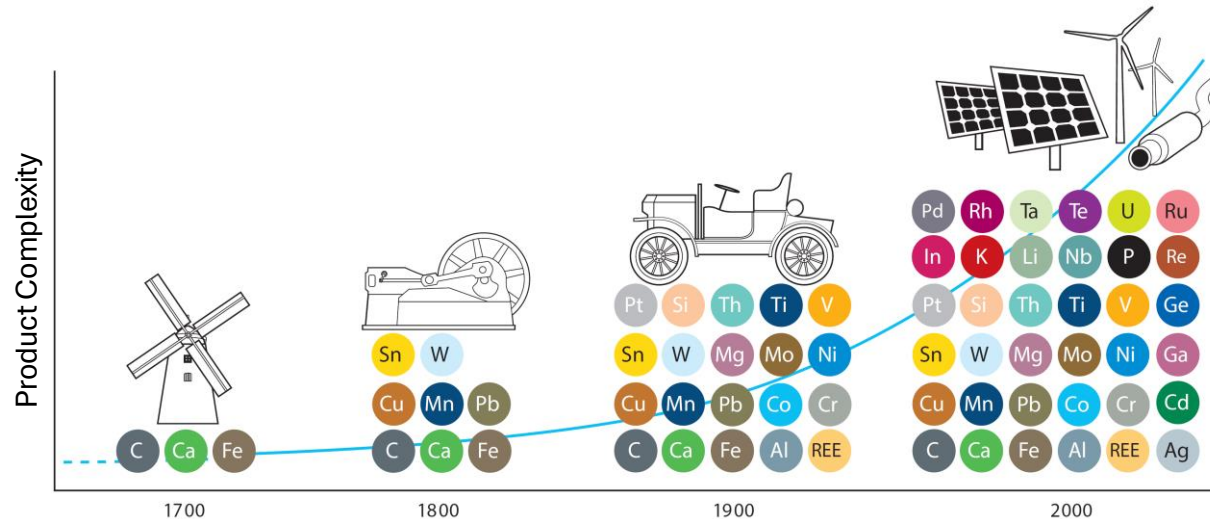


Example: Isolated dc-dc



# The Complexity Challenge

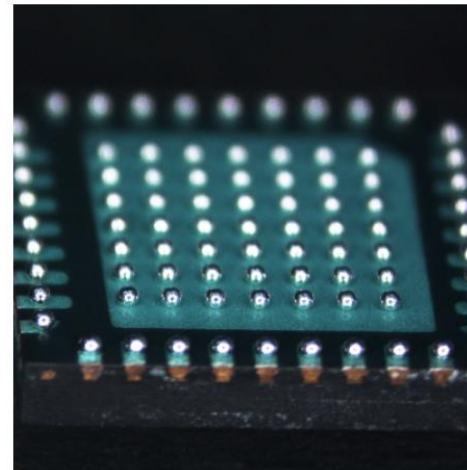
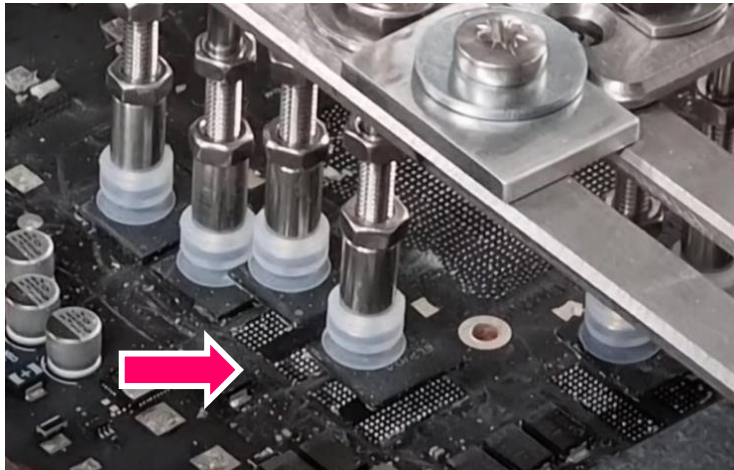
- Technological **Innovation** — Increasing level of complexity & diversity of modern products
- Exponentially accelerating technological advancement (R. Kurzweil)



- More than 60 Metallic Elements Involved in Pathways for Substitution of Conv. Energy Systems
- **Ultra-compact systems / functional integration** — **Major obstacle for material separation!?**

## Remark: Electronic Component Reclaim / Reuse

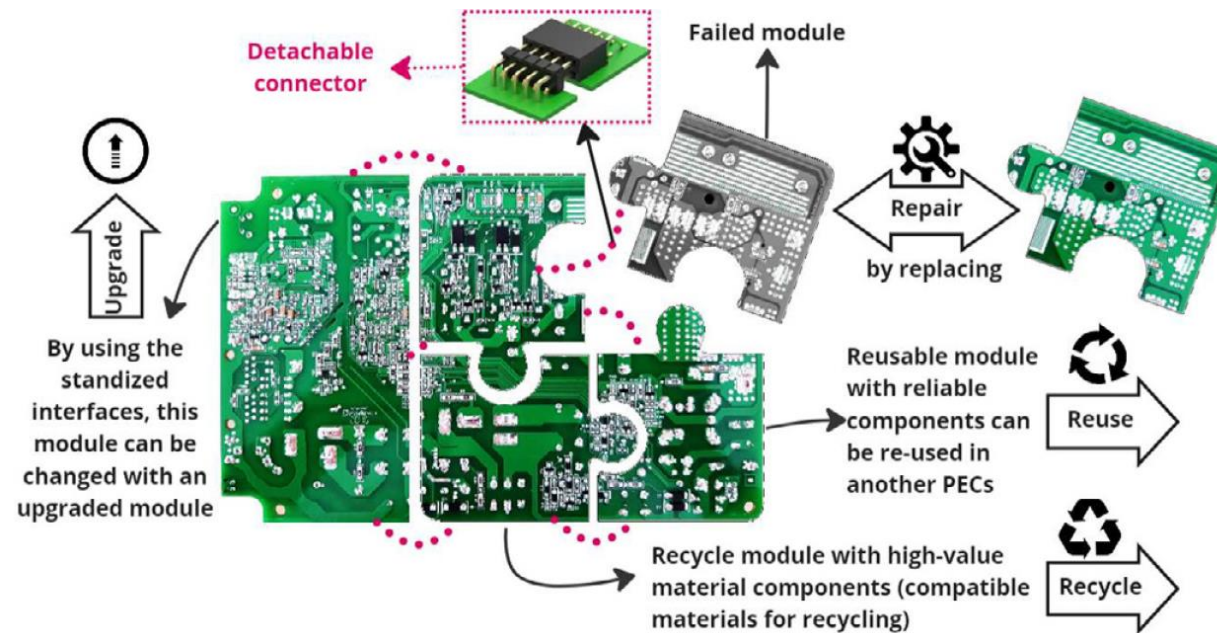
- Electronic waste recycling today: Shred / incinerate / extract most valuable resources — if at all!
- Alternative: **Reclaim & refurbish** / Desolder & re-ball



- Challenging logistics etc. for reclaiming PCBs from customers / Circular economy thinking needed
- Business case today especially for **scarce / valuable components**

# Modularity: Upgrade, Reuse, Repair, ...

- Module design for ease of disassembly: **Maintainability, upgradability, repairability, reusability, recyclability**



- **Grouping of components** according to reliability level and expected lifetime / level of reusability or recyclability / ...
- Standardized interfaces / **Mechanically loose connections** ↔ **Electrical characteristics**
- Potential for leveraging economies of scale to compensate interface costs



# Design for Repairability & Circularity

- **Eco-design** — Reduce environmental impact of products, incl. life-cycle energy consumption
- **Re-pair / Re-use / Re-cycle** / disassembly / sorting & max. material recovery, etc. considered
- EU eco-design directive (!)



Source:  
[www.ligman.com/](http://www.ligman.com/)

Source: <https://de.ifixit.com/>



Source: Life Cycle Assessment of the Framework Laptop 2022, Fraunhofer IZM

- **FAIRPHONE** — Modular design / man. replaceable parts / 100% recycl. of sold products / fairtrade materials
- **framework laptop** “You should be able to fix your stuff.” — Modular design / man. replaceable parts
- “80% of environmental impact of products are locked-in at the design stage” —

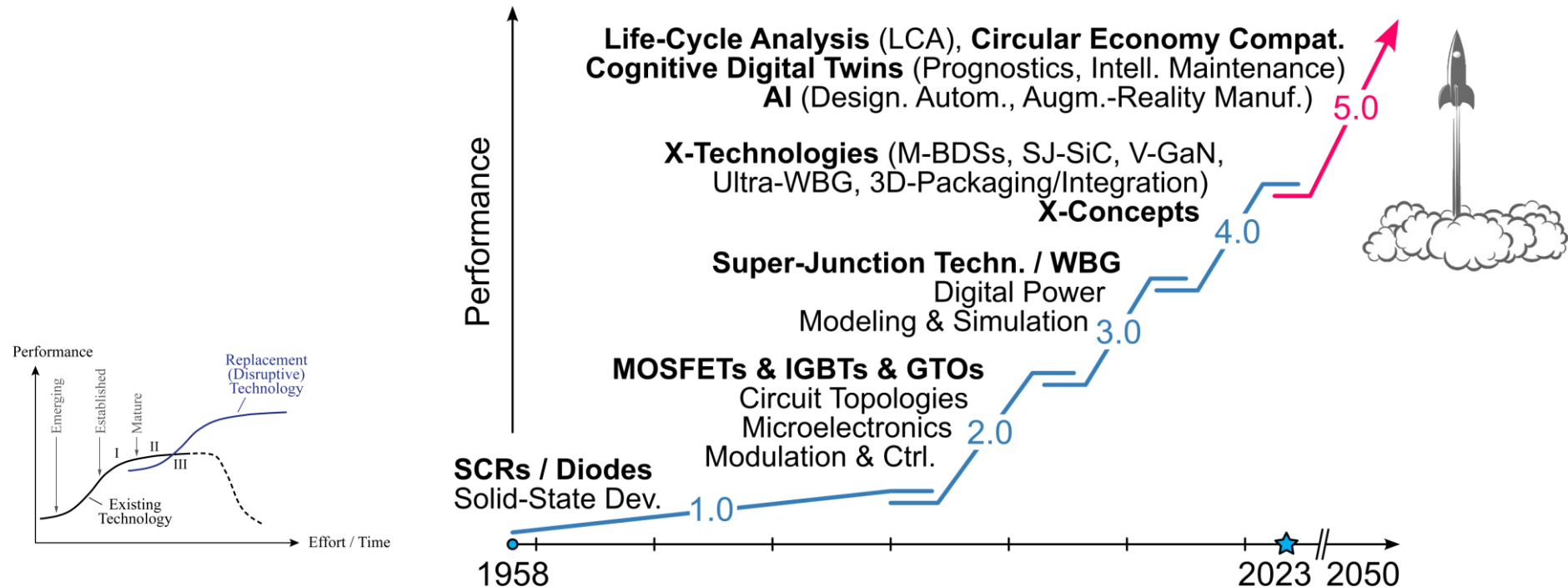
J. Thackara, *In the bubble: Designing in a complex world*. Cambridge, MA, USA: The MIT Press, 2006.



# Conclusion & Outlook

# Power Electronics 5.0

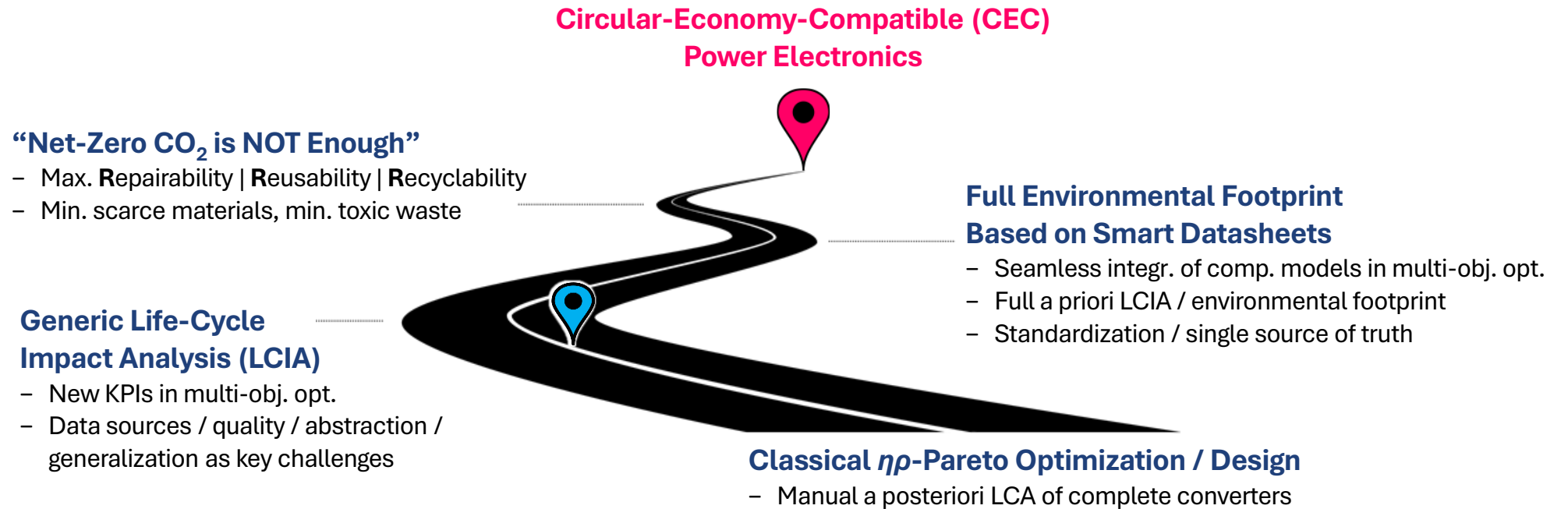
- Power Electronics 1.0 → Power Electronics 5.0
- X-Technologies & X-Concepts
- New main performance indicators (!)



- Life-cycle analysis / circular economy compatibility are key for sustainable Power Electronics 5.0

# CEC Power Electronics Roadmap

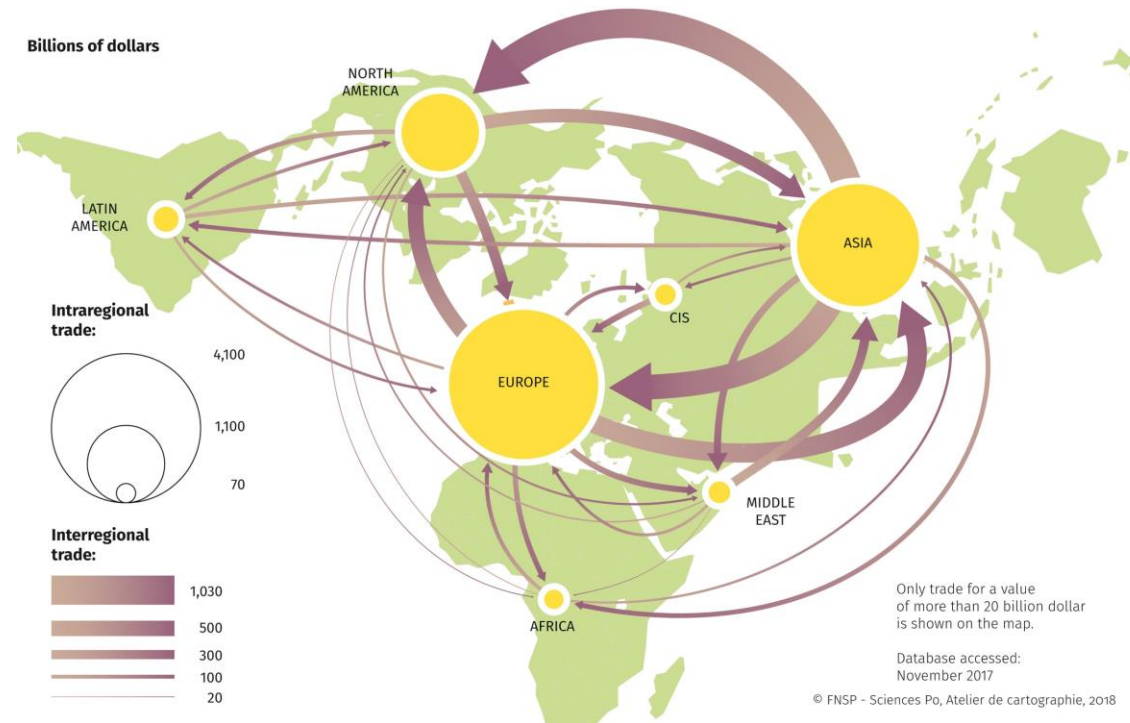
- **Environmental awareness** as integral part of **environmentally conscious power electronics design**



- **Automated design** | **On-line monitoring** | **Preventive maintenance** | **Digital product passport**

# Economic Challenges of NZ by 2050

- *Globalization / Global Trade — Complex Couplings / Interdependencies of Main Economies*
- *No Immediate Reward BUT Massive Costs / Political Challenges of NZ-by-2050 Trajectories*

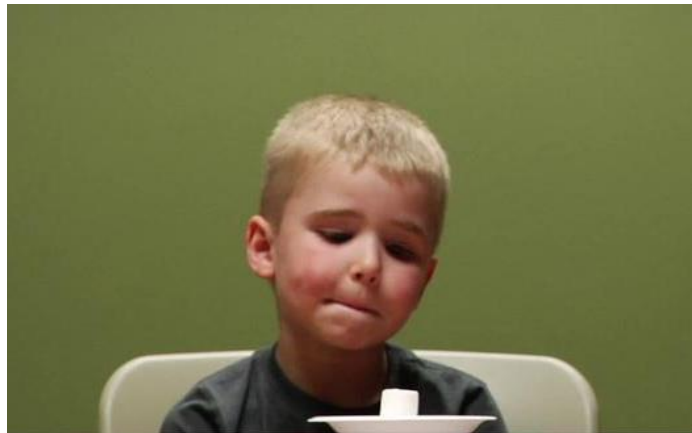


- *Environmental Impact Aggregates Over Time — No Serious \$\$\$-Consequences / “Tragedy of Commons”*
- *“Prisoner’s Dilemma” — Why Take Action If You Can’t Be Sure Other Countries Will Act As Well?*

## **Remark** The NZ-by-2050 “Marshmallow Test”

- *“You Can Have One Marshmallow Now, OR, If You Wait, You Can Have Two” (!)*
- *Experiment Measuring Children’s Ability to Self-Control / Delay Gratification (W. Mischel / Stanford / 1960s)*

Source: <https://www.edbatista.com/>



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- *“You Can Have One Marshmallow Now, OR, If You Wait, Others Will Take It” (!)*
- *“Instant-Effortless-Everything”- Society Might Face Serious Challenges Passing the NZ-by-2050 Marshmallow Test*

# Develop a Global “Clean Energy Moonshot Spirit”



- *Aim for a Net-Zero/Environmentally-Neutral Integrated Multi-Carrier Energy System*
- *Full “Circularity” (Closed Carbon Cycle & Raw Materials Cycle, etc.) / Sustainability / etc.*



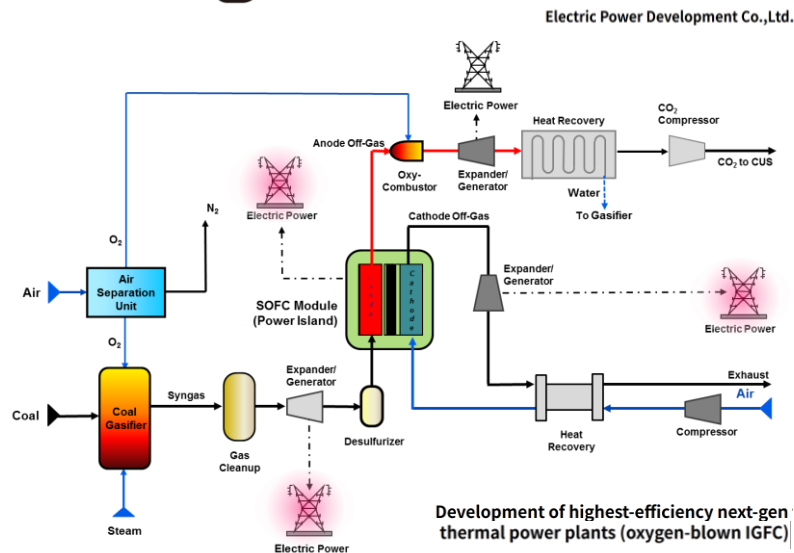
*„We choose to go to the Moon in this decade, ..., **not because they are easy, but because they are hard**; because that goal will serve to organize and measure the best of our engineers and skills – **because that challenge is one we are willing to accept, one we are unwilling to postpone, and one we intend to win!**“*

- *Power Electronics Engineers are the Rocket Scientists of the 2020's (!)*
- *“Transformational Industrial Clusters” (El. Energy, Chemistry, Microbiology, etc.) & “First Mover Coalitions”*



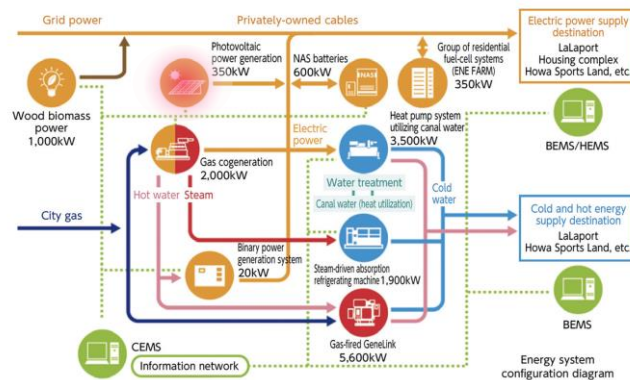
# Challenge Zero & “Green Growth” Strategy Japan

- **“Challenge Zero” — A New Action by Japanese Industry in the Field of Climate Change (2020)**
- **200 Members / 400 Projects on Zero Emission & Transition Technologies**



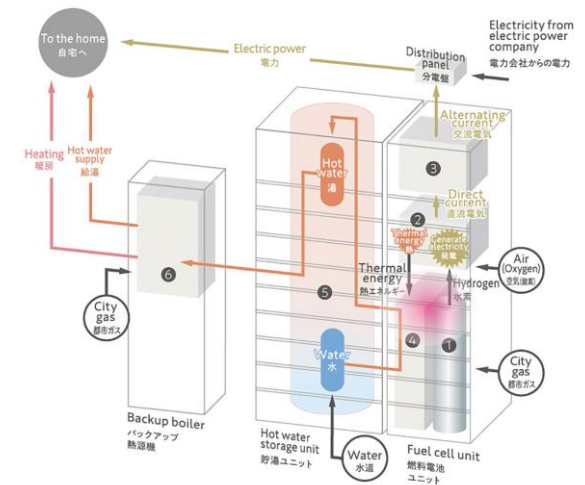
Establishment of both advanced energy management a energy and distributed power sources

Toho Gas Co., Ltd.



Residential Fuel Cell ENE-FARM

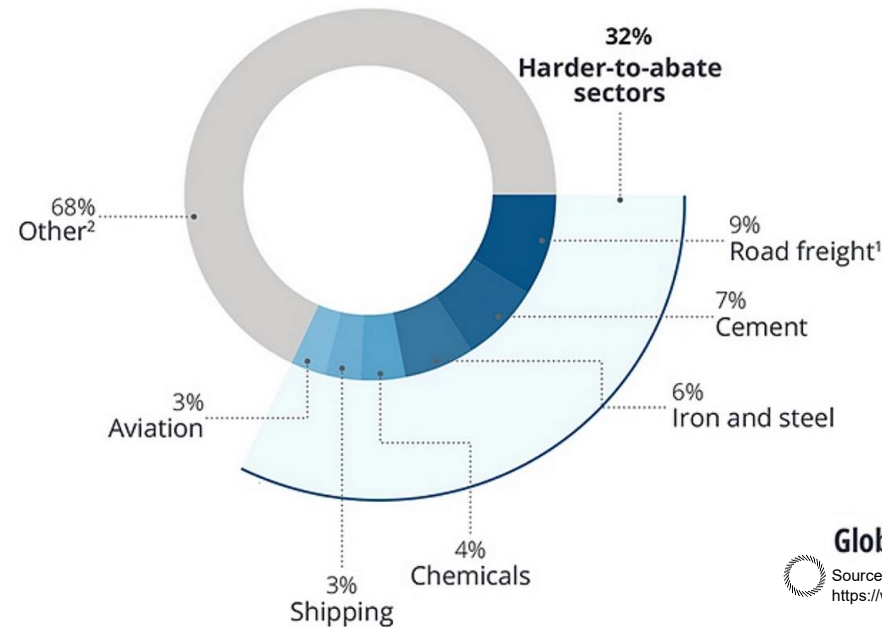
Tokyo Gas Co., Ltd.



- **Very Wide Range of Topics — WBG Power Semiconductors / Power-to-Chemicals / Red.-CO<sub>2</sub> Steel etc.**
- **“Green Growth” Strategy — 14 Focus Areas Announced (2021) – Asia Zero Emission Community (2023)**

# Power Electronics for New / “Hard-to-Abate” Sectors

- Sometimes Named “Horseman of the Climate Apocalypse” — 30 Trillion USD to Achieve NZ by 2050
- Collectively Responsible for ≈30% of World’s CO<sub>2</sub> Emissions (Cement, Steel, Chemicals, Aviation etc.)



Global carbon dioxide emissions by sector in 2018

Source:  
<https://www.innovationen>

- Highly Interdisciplinary BUT Fascinating Opportunities for Future Power Electronics Applications (!)
- High-Eff./High-Dyn. Chemistry — Plasma Techn., Microwave Reactors, Pulsed Power, Cryog. Power Electr., etc.



**Thank You!**

## Further Reading

- L. Imperiali, R. Wang, A. Anurag, P. Barbosa, J. W. Kolar, and J. Huber, “Comparative analysis of carbon footprints and material usage of solid-state transformers and low-frequency-transformer-based MVac-LVdc interfaces for high-power EV charging,” in *Proc. Appl. Power Electron. Conf. Expo. (APEC)*, Atlanta, GA, USA, Mar. 2025.
- J. Huber, L. Imperiali, D. Menzi, F. Musil, and J. W. Kolar, “Life-cycle carbon footprints of low-voltage motor drives with 600-V GaN or 650-V SiC power transistors,” in *Proc. Int. Conf. Integr. Power Syst. (CIPS)*, Düsseldorf, Germany, Mar. 2024.
- J. Huber, L. Imperiali, D. Menzi, F. Musil, and J. W. Kolar, “Energy efficiency is not enough!,” *IEEE Power Electron. Mag.*, vol. 11, no. 1, pp. 18–31, Mar. 2024.
- L. Imperiali, D. Menzi, J. W. Kolar, and J. Huber, “Multi-objective minimization of life-cycle environmental impacts of three-phase AC-DC converter building blocks,” in *Proc. IEEE Appl. Power Electron. Conf. Expo. (APEC)*, Long Beach, CA, USA, Feb. 2024.
- J. W. Kolar, L. Imperiali, D. Menzi, J. Huber, and F. Musil, “Net zero CO<sub>2</sub> by 2050 is NOT Enough (!),” *Keynote at the 25th Europ. Conf. Power Electron. Appl. (EPE)*, Aalborg, Denmark, Sep. 2023.

