

# **Energy transitions at all scales - an introduction to energy systems analysis and energy systems optimization models**

**Manuel Wetzel, Institute of Networked Energy Systems, Energy Systems Analysis  
University of Canterbury, guest lecture  
February 22nd 2024**





**Deutsches Zentrum  
für Luft- und Raumfahrt**  
German Aerospace Center



**Institute  
of Networked Energy Systems**

- Space Administration
- **Research institution**
- Project Management Agency

- Aviation
- Space
- Transport
- **Energy**
- Security (cross-topic)



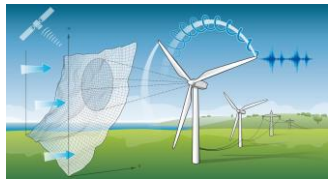
Energy Systems  
Analysis



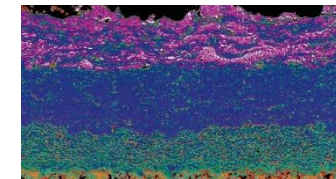
Energy System  
Technologies



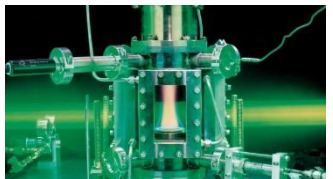
Solar Energy



Wind Energy



Energy Storage



Energy Converters



Image: Nonwarit/Fotolia



# Institute of Networked Energy Systems



## Buildings and districts

Technologies, operation and economics of small scale systems



## Stable grids and markets

Technologies, operation and economics of large scale systems



## Hydrogen in the energy system

Hydrogen networks and storage for sector coupling

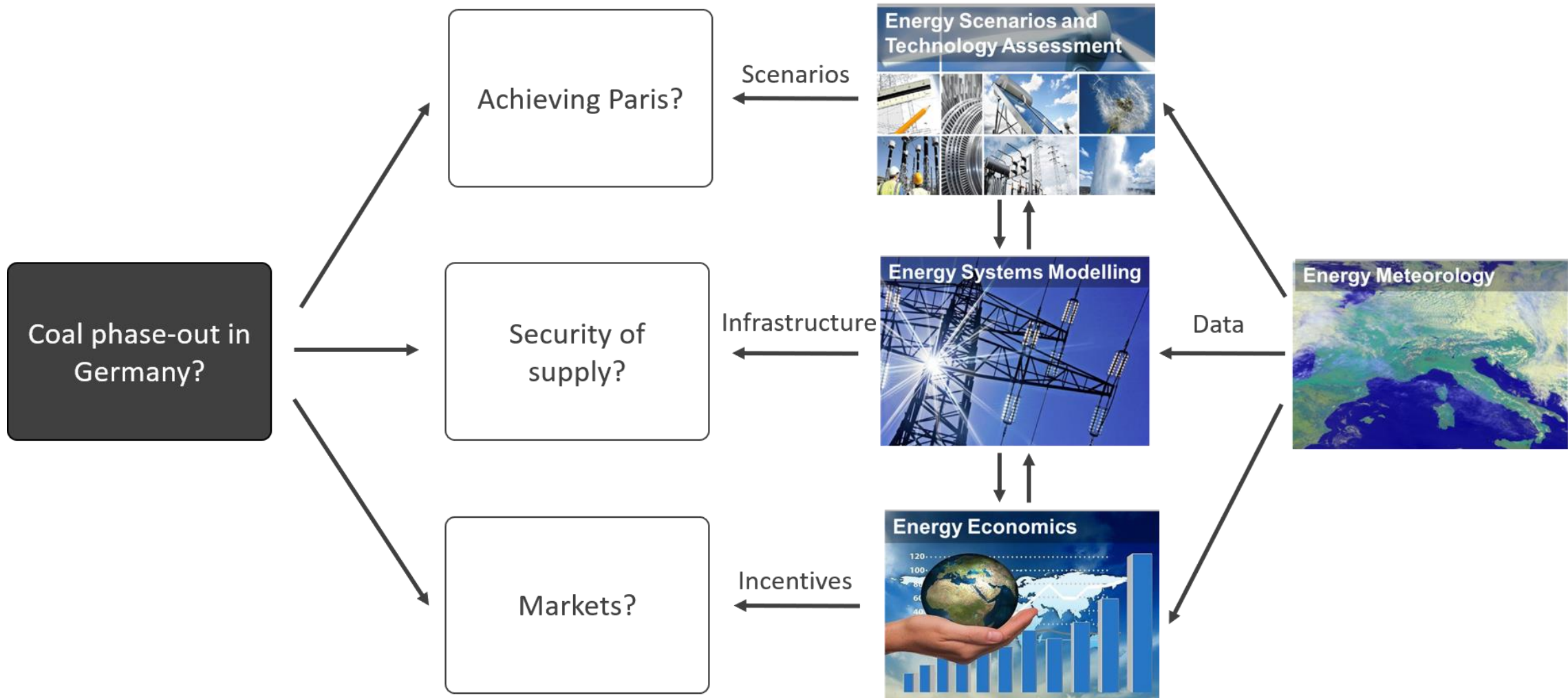


## Sustainable supply systems

Systems modelling, transformation scenarios, technology assessment

Research and development of **technologies and concepts** for future sustainable energy systems

# Energy Systems Analysis department



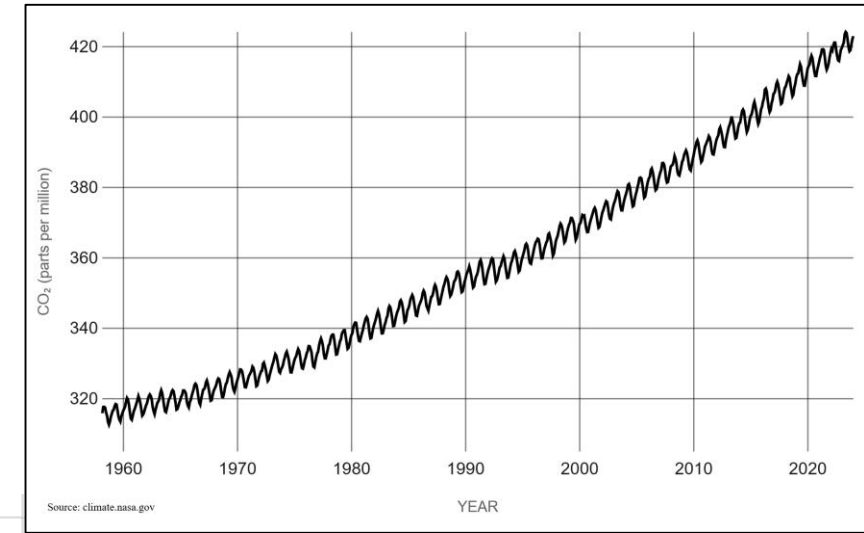
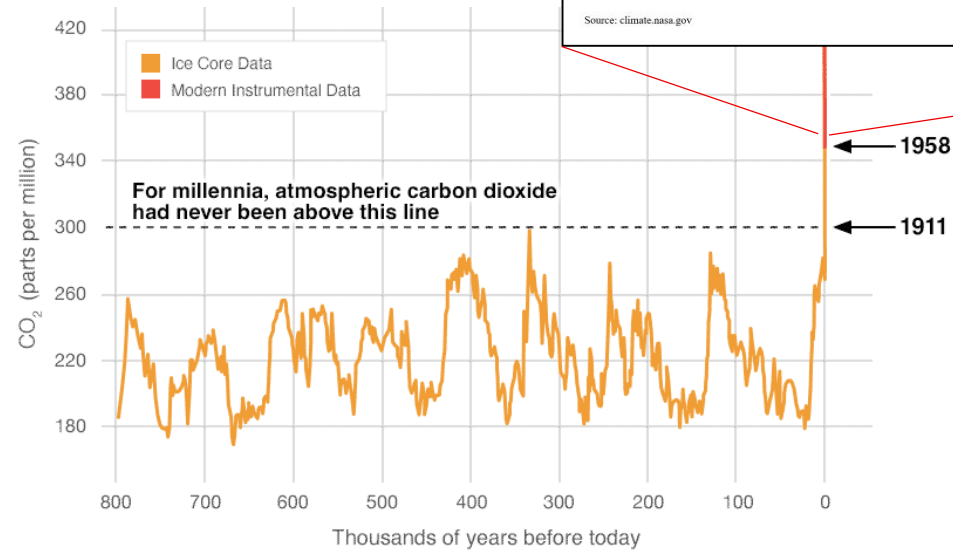
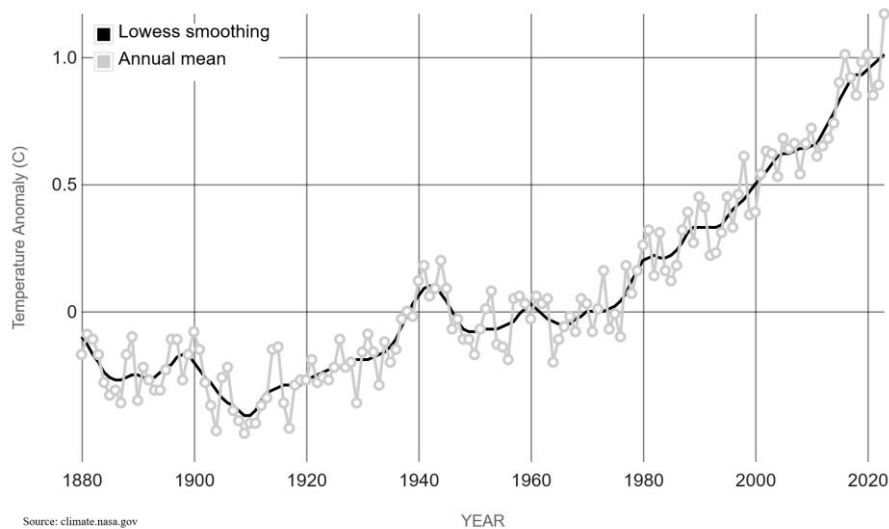


# CLIMATE CHANGE AND THE ENERGY TRANSITION

# Carbon dioxide and global warming



- Increase in green house gas (GHG) emissions causes rise in global temperature
- Carbon dioxide (CO<sub>2</sub>) is one of the main contributors to GHG accumulation in the atmosphere

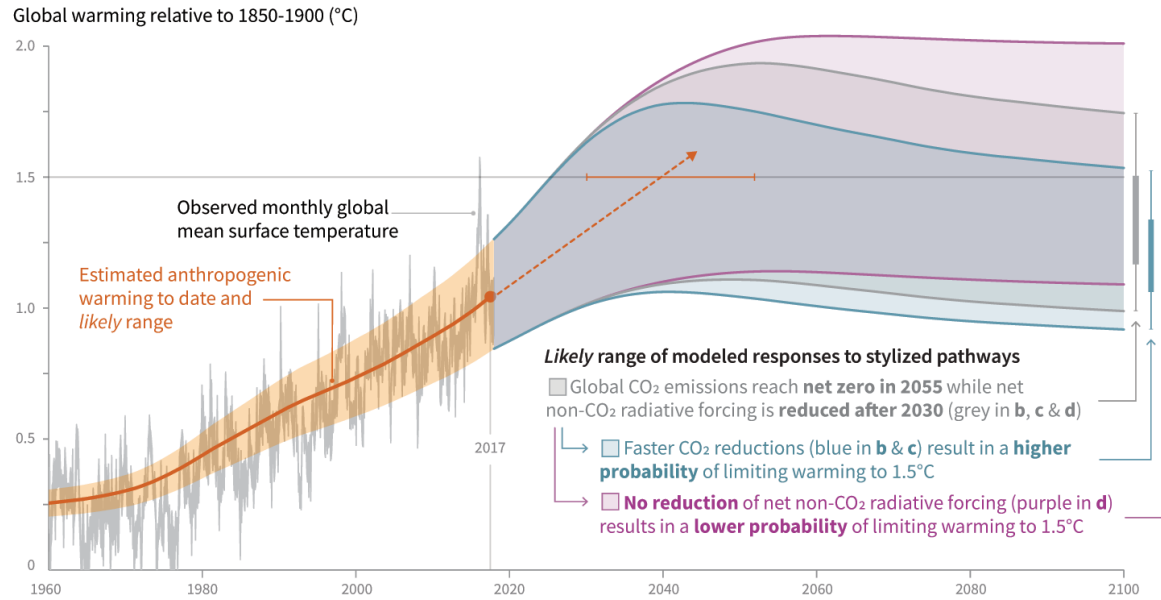


Sources: <https://climate.nasa.gov/evidence>  
<https://climate.nasa.gov/vital-signs>

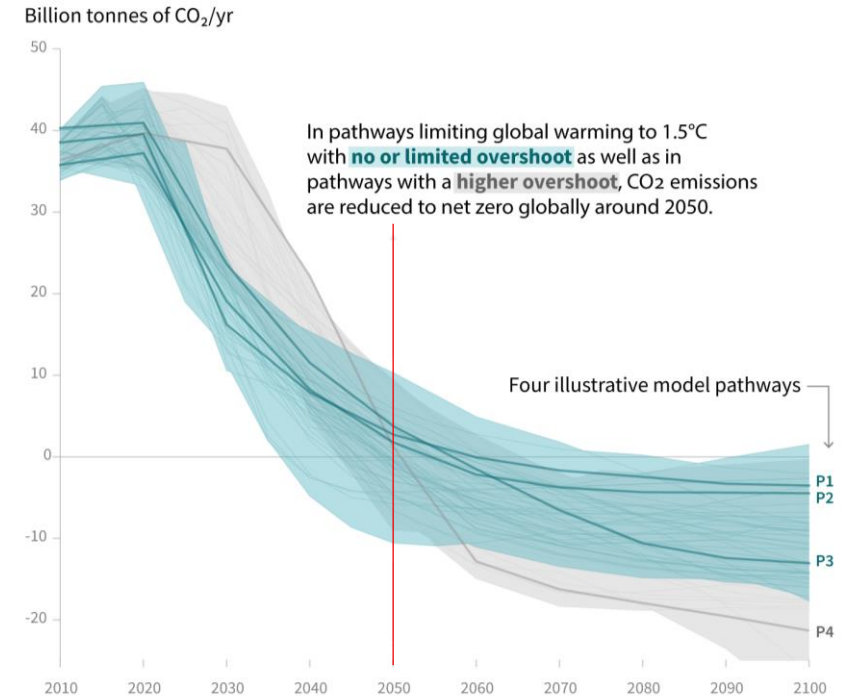


# Reducing carbon emissions to net zero

## a) Observed global temperature change and modeled responses to stylized anthropogenic emission and forcing pathways



## Global total net CO<sub>2</sub> emissions



- Climate modelling allows scenario-based assessment of the future impact of GHG
- Reaching net-zero emissions by mid-century is a key milestone
- Paris Agreement as the first legally binding international treaty on global warming

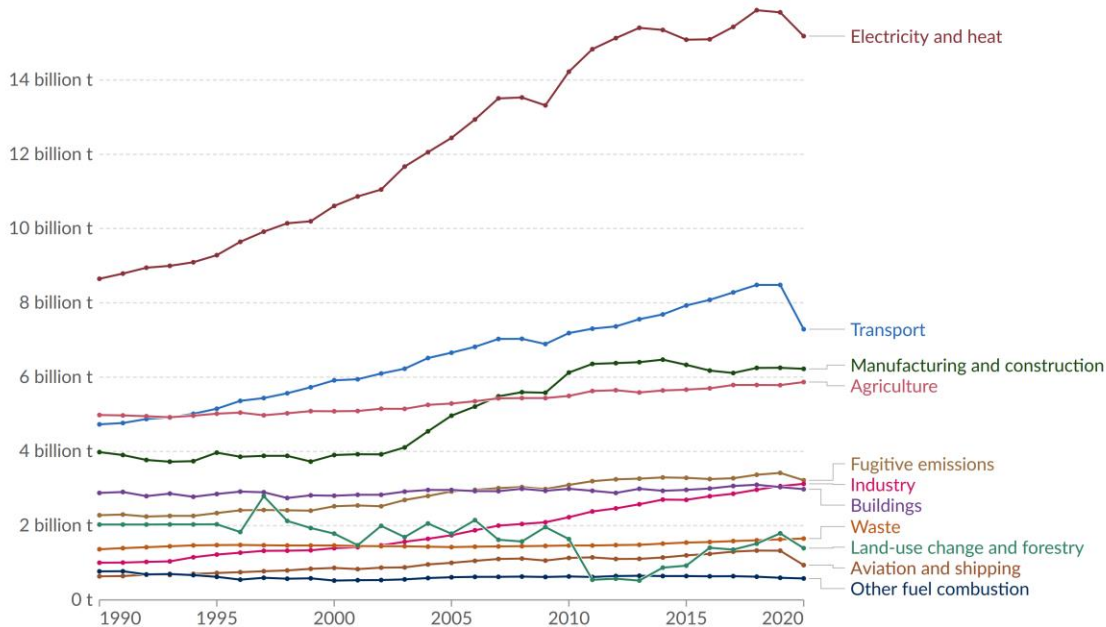
Sources: <https://www.ipcc.ch/sr15/chapter/spm>

# Where does it come from?

## Greenhouse gas emissions by sector, World

Greenhouse gas emissions<sup>1</sup> are measured in tonnes of carbon dioxide-equivalents<sup>2</sup> over a 100-year timescale.

Our World in Data



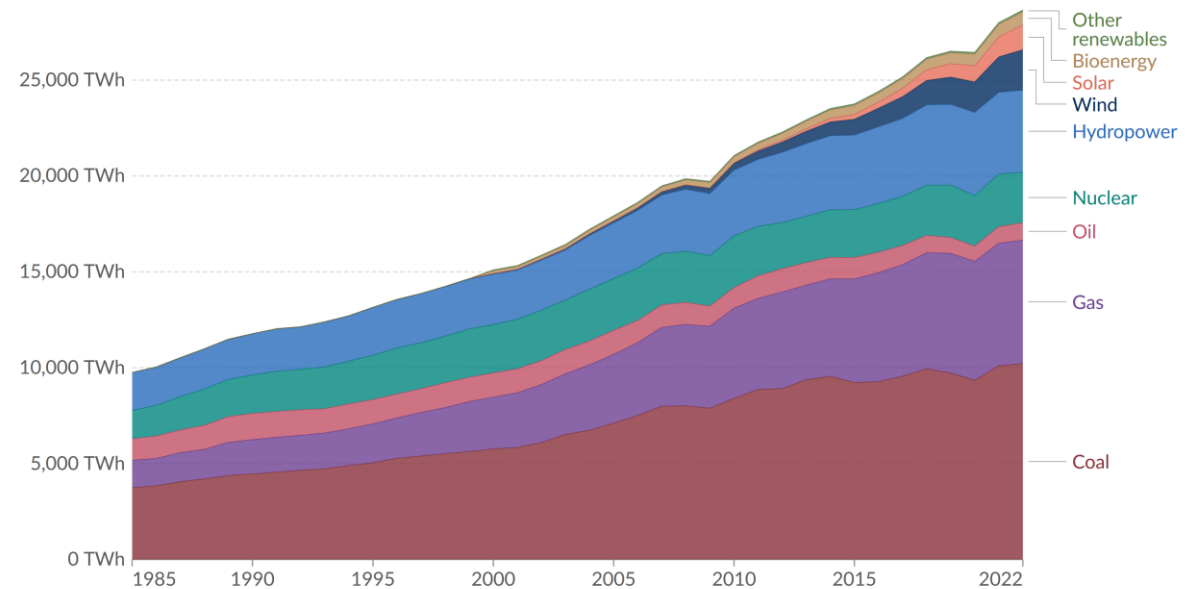
Data source: Climate Watch (2023)

OurWorldInData.org/co2-and-greenhouse-gas-emissions | CC BY

## Electricity production by source, World

Measured in terawatt-hours<sup>1</sup>.

Our World in Data



Data source: Ember - Yearly Electricity Data (2023); Ember - European Electricity Review (2022); Energy Institute - Statistical Review of World Energy (2023)

- Highest share of GHG comes from burning fossil fuels for electricity, heating, transport
- Reduction requires rapid and systematic transformation of these sectors

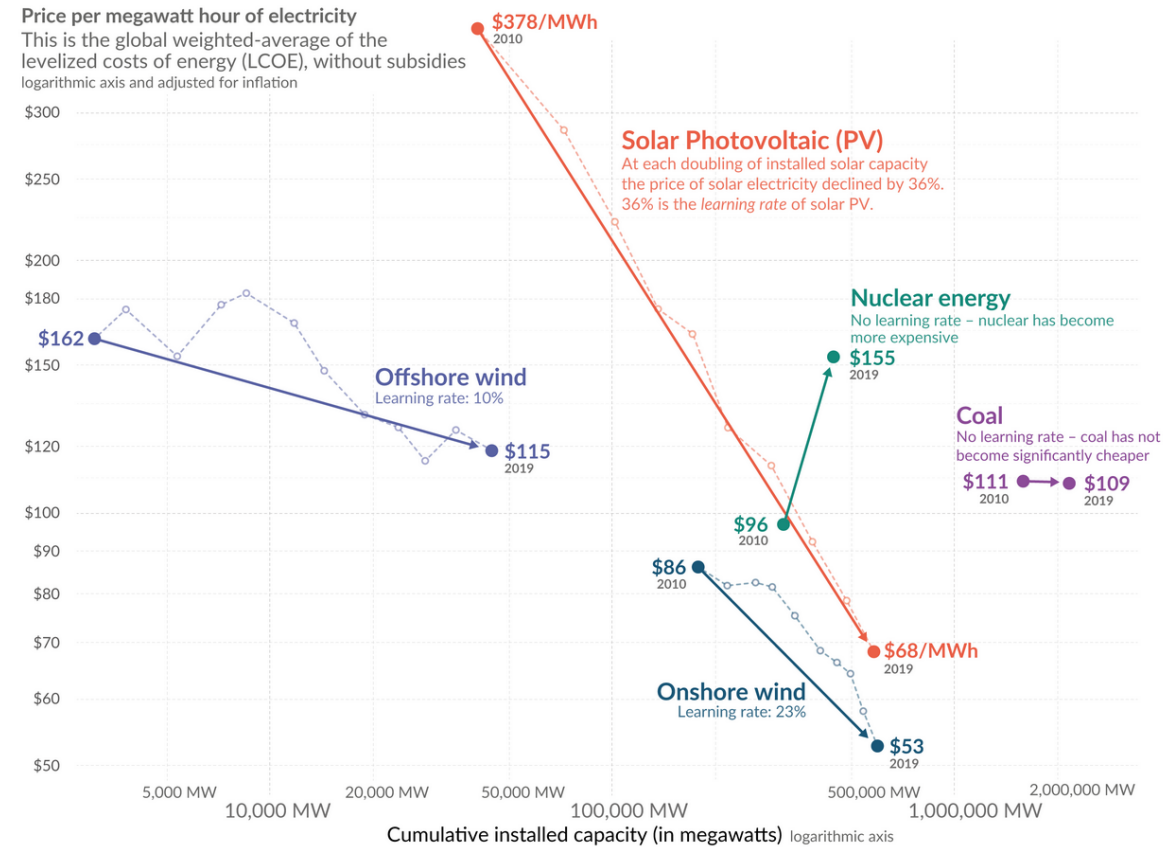
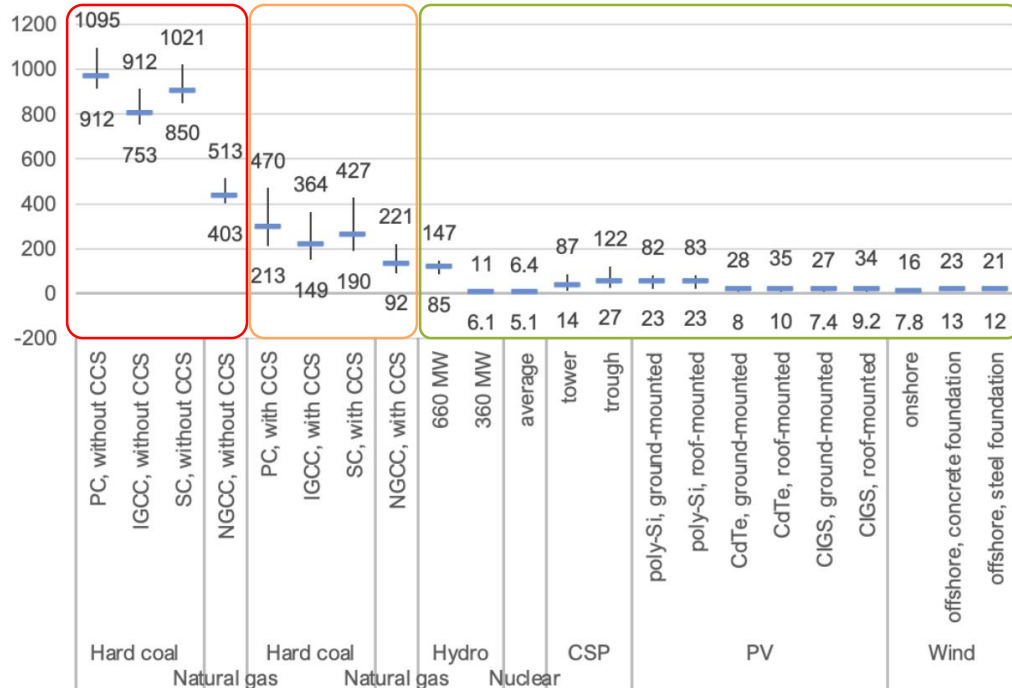
Sources: <https://ourworldindata.org/emissions-by-sector>  
<https://ourworldindata.org/energy>



# Sustainable energy technologies



Lifecycle GHG emissions, in g CO<sub>2</sub> eq. per kWh, regional variation, 2020



- Renewable energy technologies have no direct emissions and low indirect ones
- Feed-in tariffs have kick-started the learning rates for wind and PV

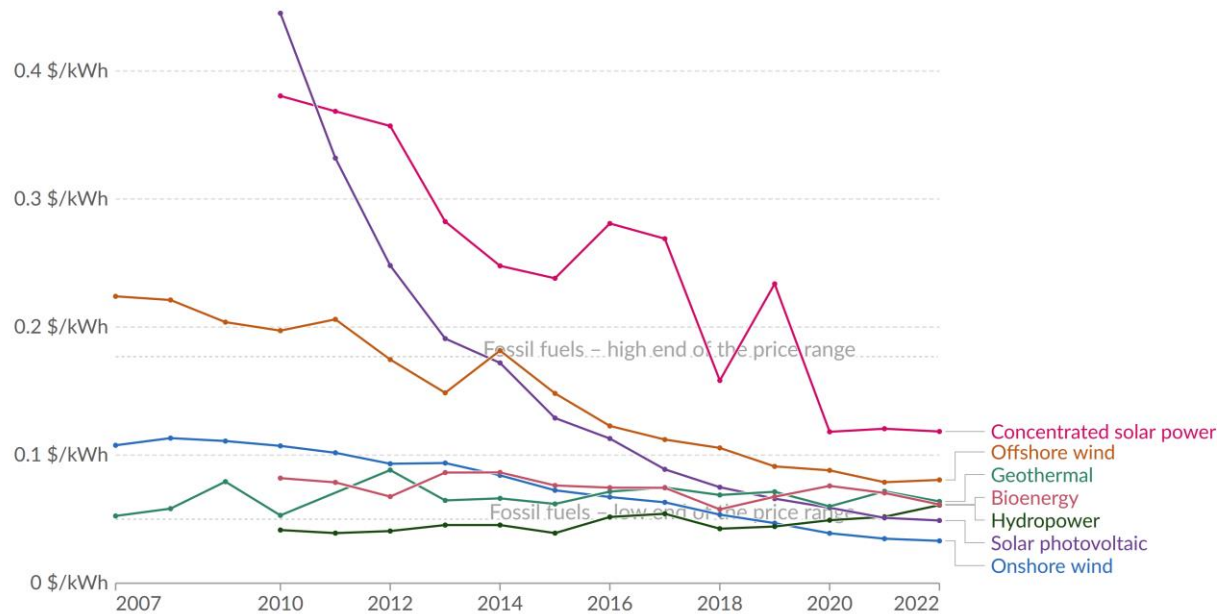
Sources: <https://unece.org/sed/documents/2021/10/reports/life-cycle-assessment-electricity-generation-options>  
<https://ourworldindata.org/cheap-renewables-growth>

# Bringing it all together

## Levelized cost of energy by technology, World

The average cost per unit of energy generated across the lifetime of a new power plant. This data is expressed in US dollars per kilowatt-hour<sup>1</sup>. It is adjusted for inflation but does not account for differences in the cost of living between countries.

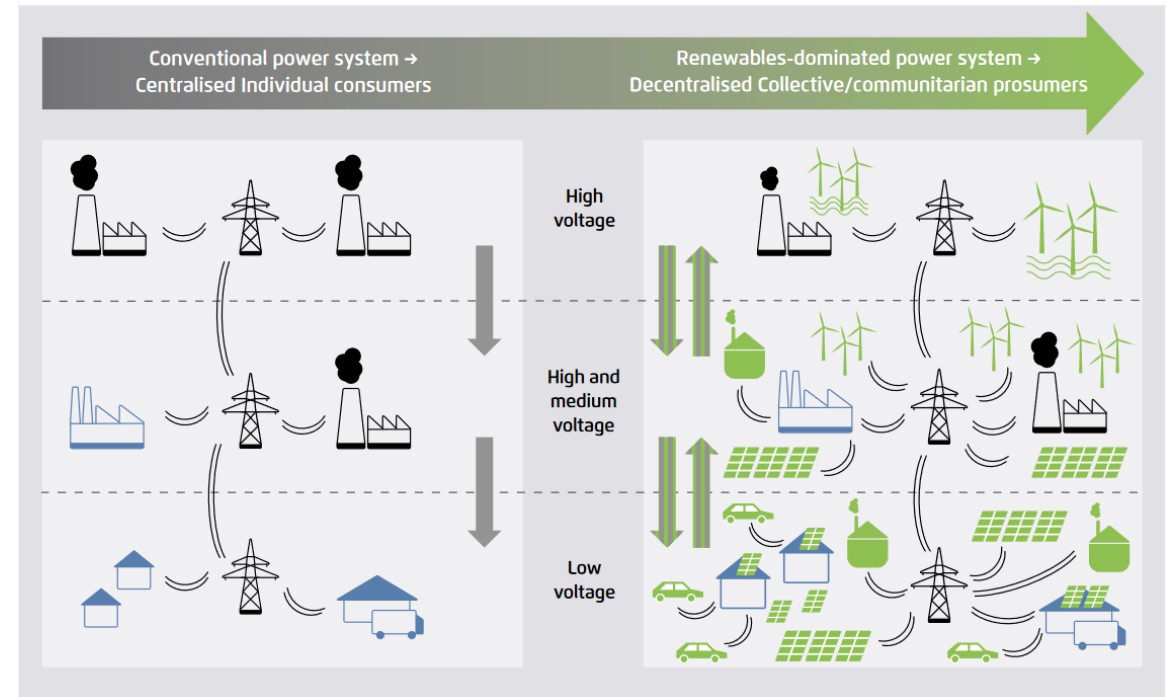
Our World in Data



Data source: International Renewable Energy Agency (2023)

Note: Data is expressed in constant 2022 US\$.

OurWorldInData.org/energy | CC BY



- Renewable energy technologies have become the cheapest option
- Capacity expansion and integration of renewables now the main challenge

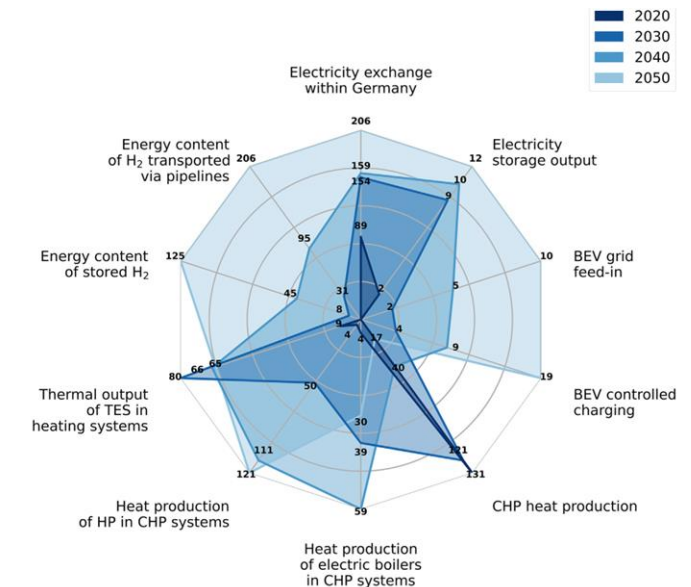
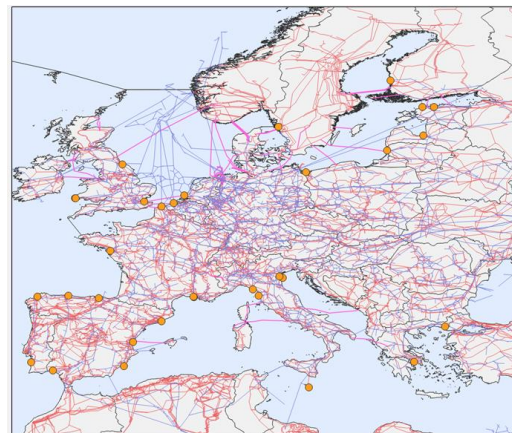
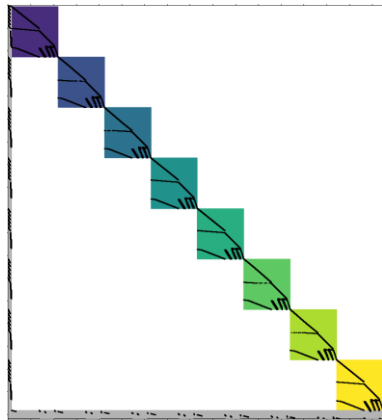
Sources: <https://ourworldindata.org/grapher/levelized-cost-of-energy>  
<https://www.agora-energiende.de/en/publications/european-energy-transition-2030-the-big-picture>



# ENERGY SYSTEMS MODELLING

## Modelling robust pathways to a sustainable, economic and secure energy system

- Improving energy system models and data
- Comprehensively modelling sector coupling and flexibility
- Deriving policy recommendations for the implementation

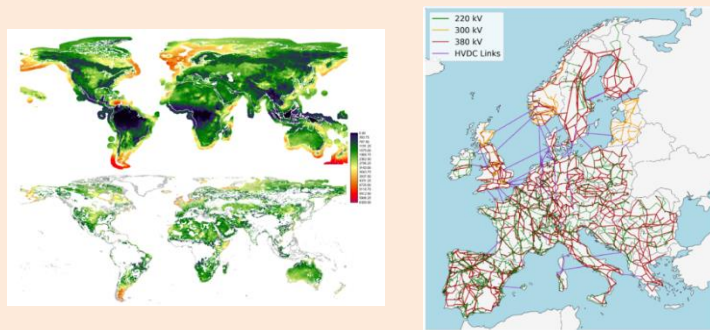




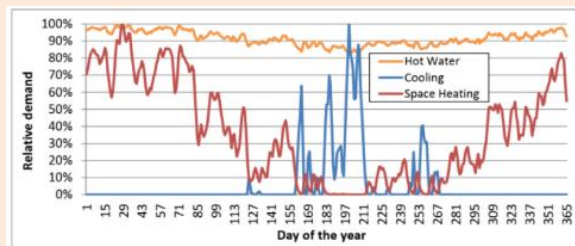
# Research areas of the Energy Systems Modelling group



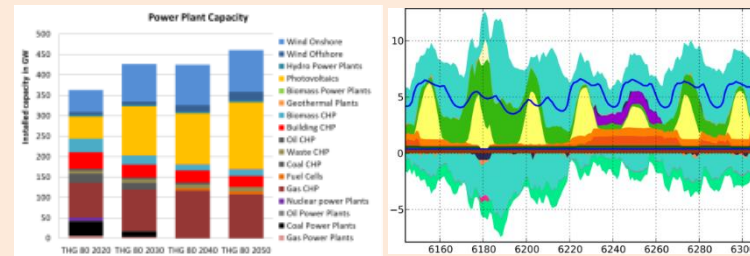
## Improvement of the data basis for energy systems modelling



- Energy infrastructure data
- Renewable energy potentials
- Future energy demand profiles
- Demand side flexibility



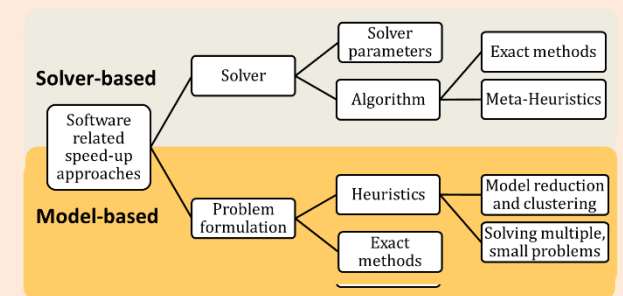
## Investigation of energy system transformation pathways



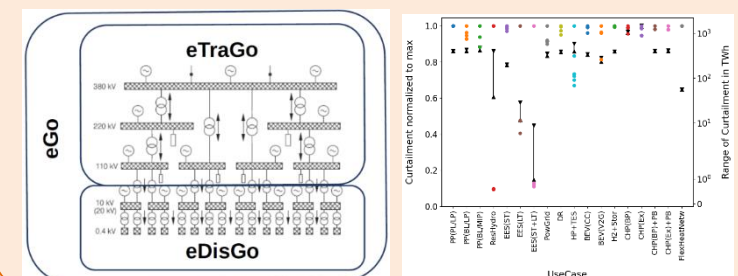
- Modelling systems: district to continental
- Storage, transmission, sector coupling
- Robust transformation pathways
- Resilience and security of supply
- Climate impact and system adaptation



## Enhancement of methodological competence



- Reduction of model solution times
- Model coupling and comparison
- Remote sensing and machine learning
- Data management (metadata, ontology)
- Quantum Computing





# REMix

Renewable Energy Mix

- Algebraic modelling using  G A M S
- Data management and interfaces using  python™
- Flexible spatial, temporal & technological scope
- Capacity expansions and dispatch of all infrastructures
- System integration of power, heat, gas, transport sectors

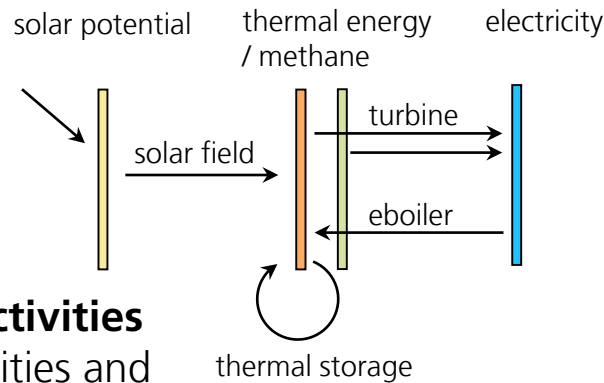
## Multi-activity converters

- Linear combinations
- Partial and minimum loads

## Multi-input multi-output activities

- Free definition of commodities and accounting variables

## Multi-criteria optimization



## Power grid

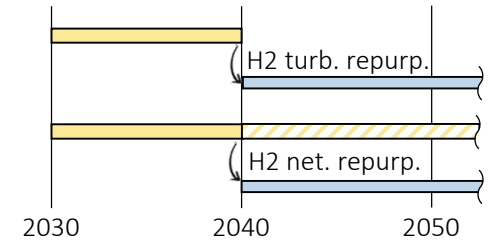
- LOPF power angles and Kirchhoff formulation
- Security-constrained transmission expansion planning

## Gas sector modelling

- Pipeline and storage repurposing for H<sub>2</sub>
- Hydrogen admixture for methane networks

## System transformation pathways

- Limited and perfect foresight
- Carbon budgets



## MIP capacity expansion and unit commitment

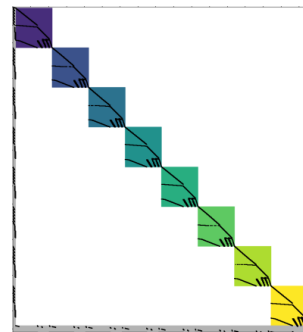
## Resilience and outage modelling

- Rolling horizon with multiple outage events

## Modelling to generate alternatives methods

## HPC ready via PIPS-IPM++ link

- EMP reformulation for stochastic optimization



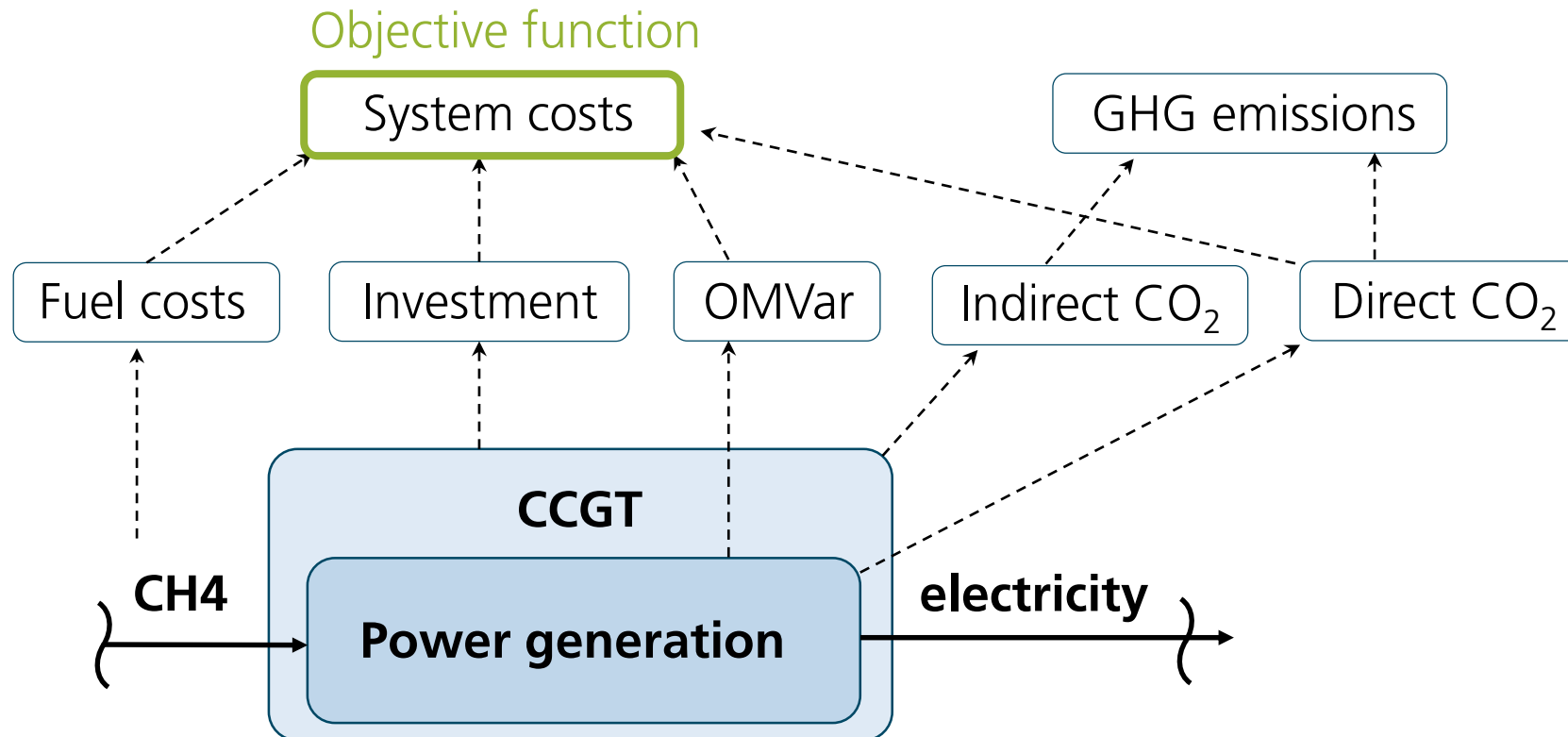
open source code available [here](#)



# Commodities and hierarchical indicators

**Commodities** trace physical flows in the system (e.g. fuels, electricity, heat, etc.)

**Indicators** account for additional information (e.g. costs, firmCaps, land use, CO<sub>2</sub>, etc.)





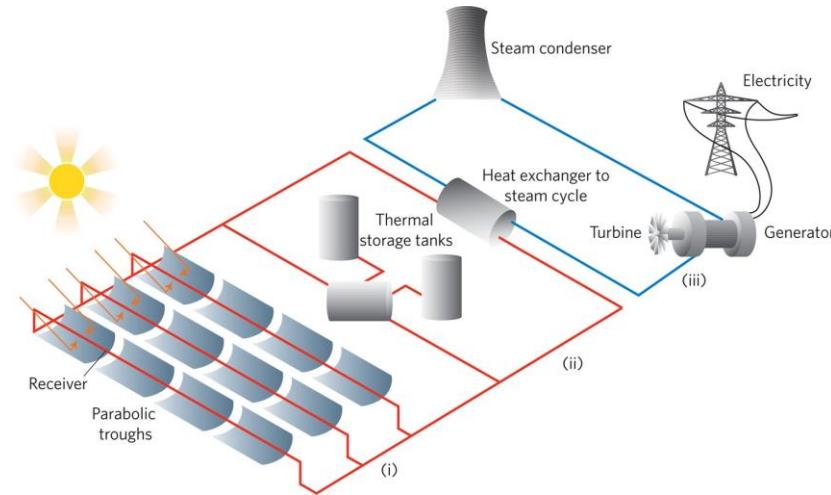
# Modelling real systems

## Real-world system

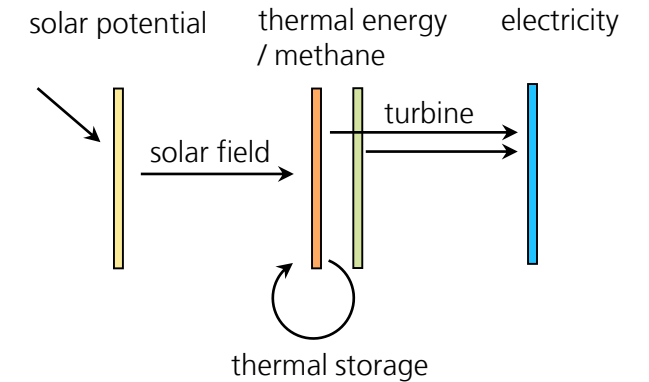


SENER

## Plant design and engineering



## Energy systems analysis

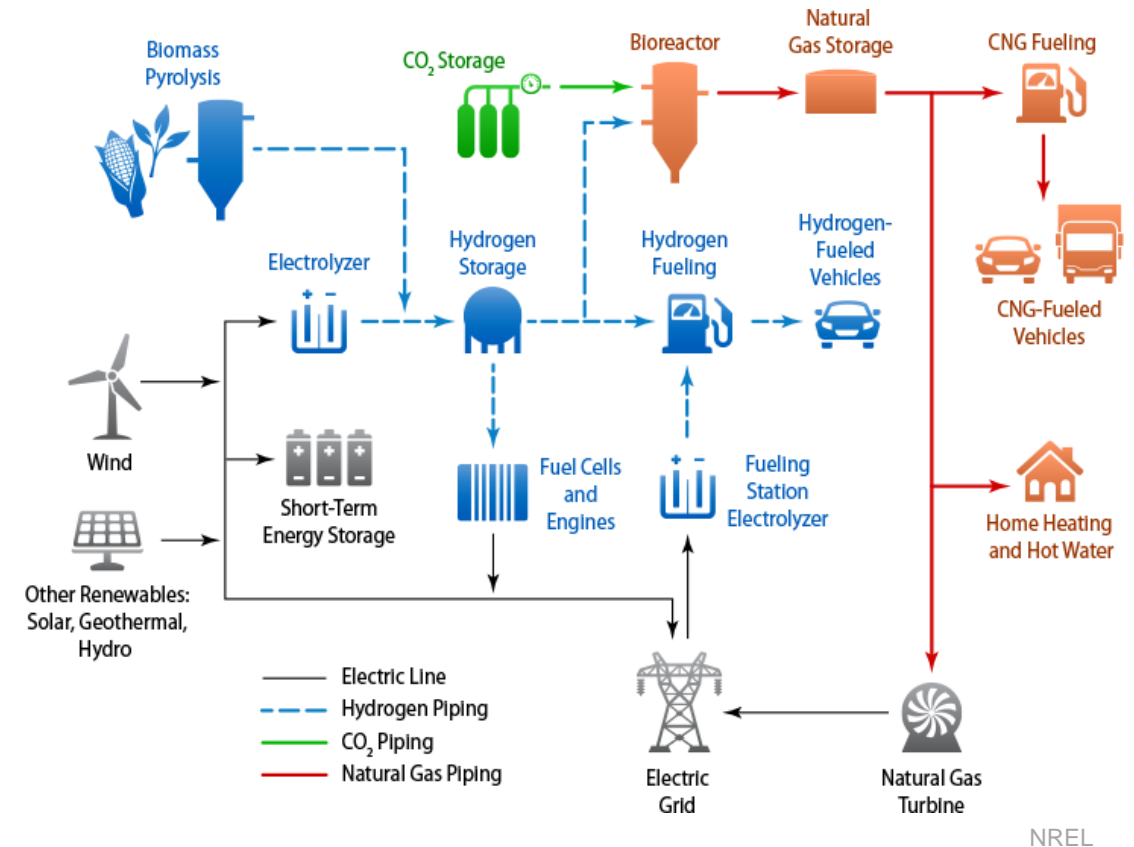
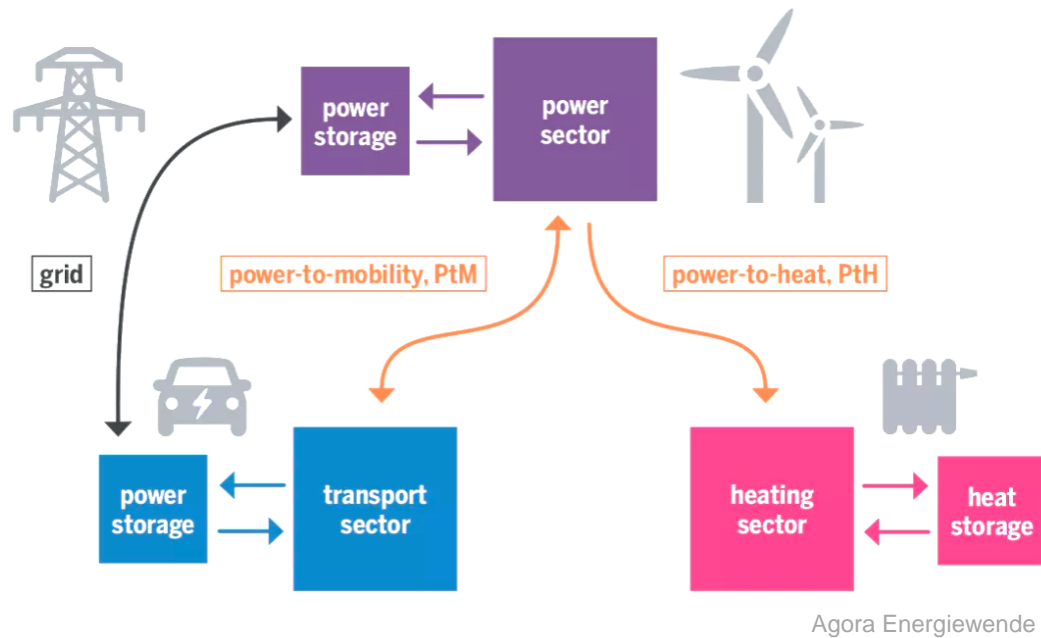


- The same system can be viewed from different perspectives
- Level of abstraction changes data requirements (cost, temperature levels, LCOE, efficiencies)

# Sector integration and the role of hydrogen

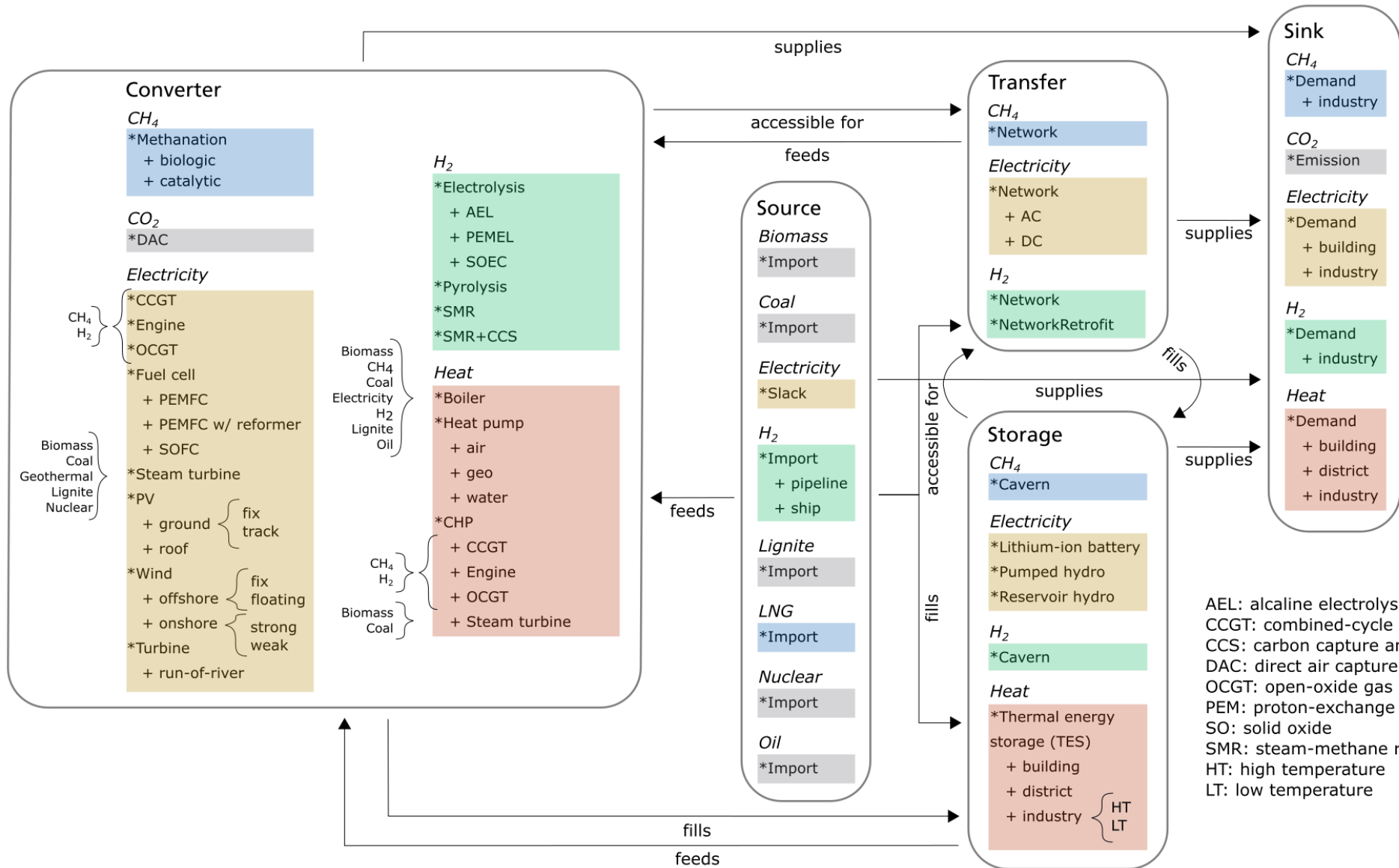
## TRANSFORMATION IN JOINING UP SECTORS

Scheme of coupled sectors and major linking "power-to-X" technologies



- Direct electrification is the most efficient option, but energy can only be stored short term
- Hydrogen can provide long-term storage option and can be used in industrial applications

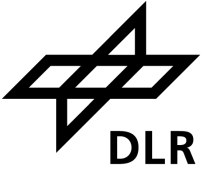
# Modelling integrated energy systems



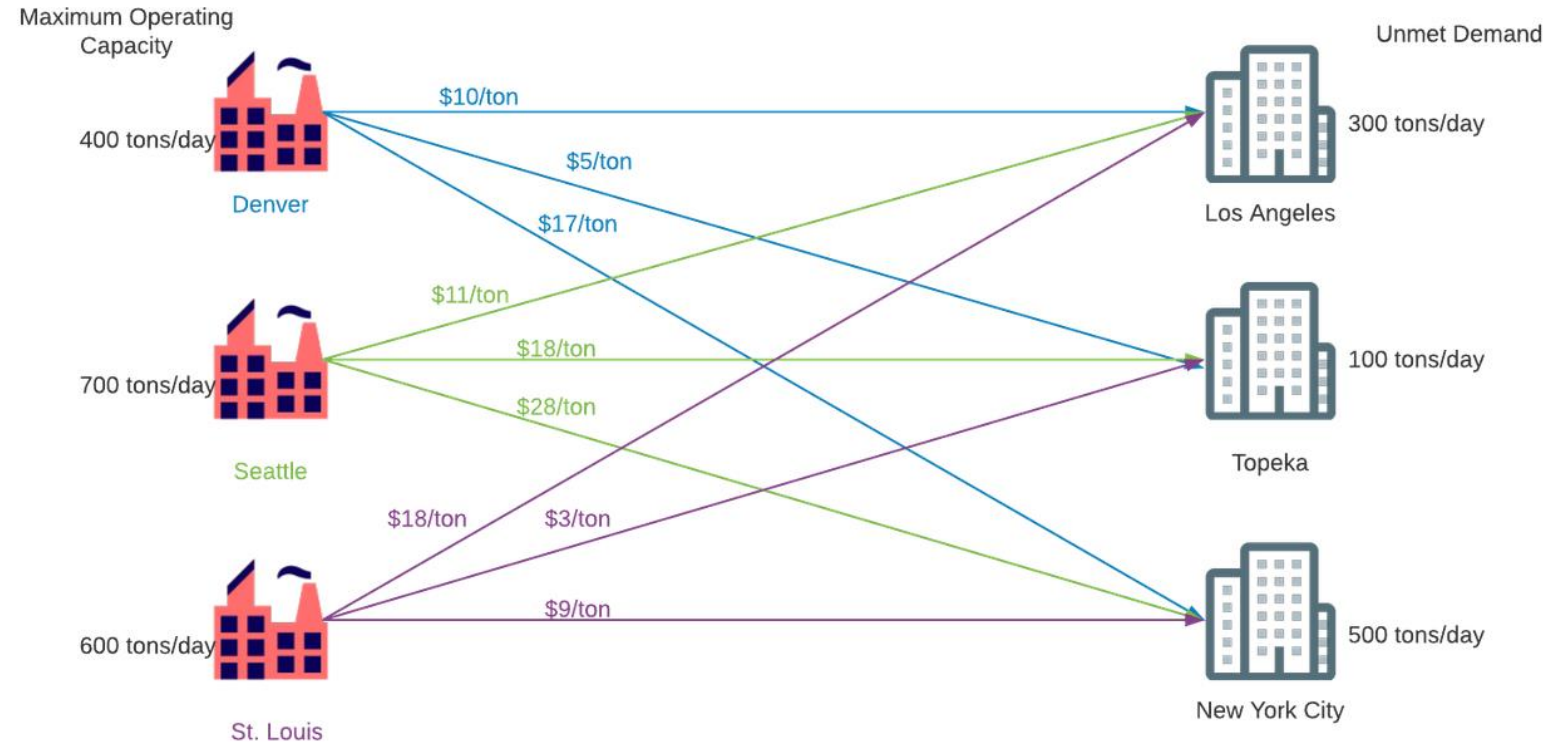
AEL: alkaline electrolyser  
 CCGT: combined-cycle gas turbine  
 CCS: carbon capture and storage  
 DAC: direct air capture  
 OCGT: open-oxide gas turbine  
 PEM: proton-exchange membrane  
 SO: solid oxide  
 SMR: steam-methane reforming  
 HT: high temperature  
 LT: low temperature



# Linear Programming (LP)



$$\begin{aligned} \min \quad & c^T x \\ \text{s.t.} \quad & Ax = b \end{aligned}$$



[https://optimization.cbe.cornell.edu/index.php?title=Facility\\_location\\_problem](https://optimization.cbe.cornell.edu/index.php?title=Facility_location_problem)

- Linear programming can be used to solve large optimization problems
- “All models are wrong, some are useful” - George Box

# Energy system optimization models (ESOMs)



## Objective function

$$C_{total} = \sum_{y,r,p} c_{invest,y,r,p} * n_{build,y,r,p} + \sum_{s,t} c_{var,p} (act_{t,y,r,p,a} + flow_{t,y,r',r,p,c} + import_{t,y,r,c})$$

## Capacity expansion planning

- Unit balance for converters, transport and storage

$$P_{y,r,p} = p_{rated} * n_{total,y,r,p}$$

$$n_{total,y,r,p} = n_{total,y-1,r,p} + n_{build,y,r,p} - n_{decom,y,r,p}$$

## Economic dispatch

- Dispatch of power plants, transport and storage

$$act_{t,y,r,p,a} \leq P_{y,r,p}$$

$$stor_{t,y,r,p,a} \leq P_{y,r,p}$$

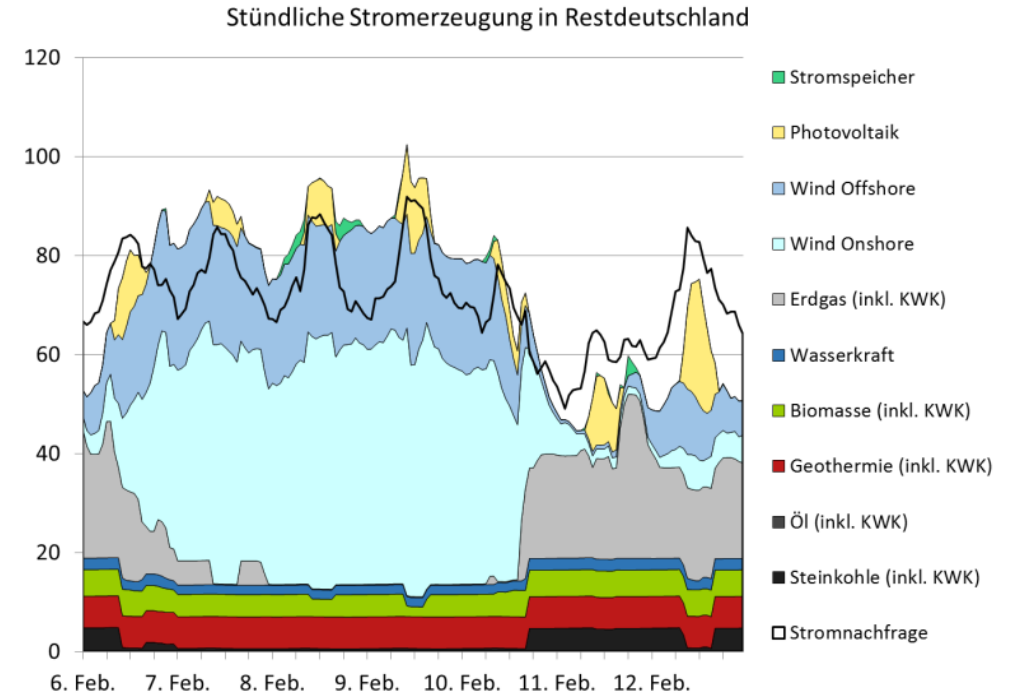
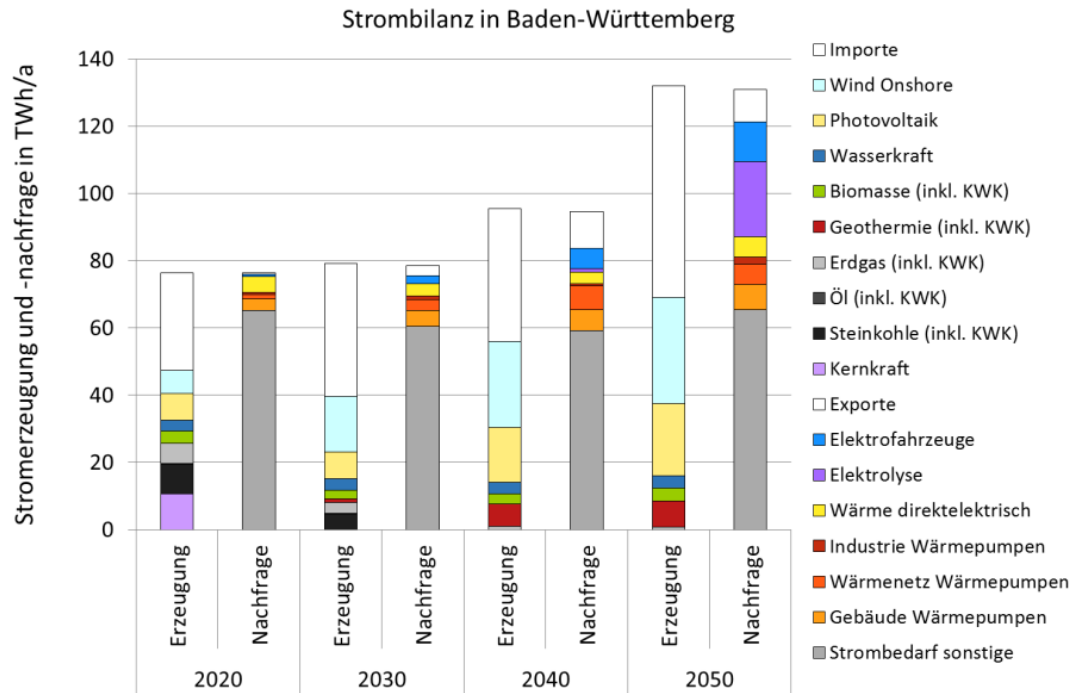
$$flow_{t,y,r,r',p,a} \leq P_{y,r,p}$$

- Hourly energy and commodity balance

$$act_{t,y,r,p,a} * coef_{p,a,c} + stor_{t,y,r,p,c} - stor_{t-1,y,r,p,c} + flow_{t,y,r',r,p,c} - flow_{t-1,y,r,r',p,c} + import_{t,y,r,c} - demand_{t,y,r,c} = 0$$

$t$	time step
$y$	year
$r$	region
$p$	type
$a$	activity
$c$	commodity

# Typical results from ESOMs



- Economically viable share of renewable energies
- Investment into new power plants, electrical transmission grid and flexibility options
- Annually transmitted energy on a European scale
- Impact of CO2 emission prices and annual limits

- Hourly dispatch of individual generation technologies as well as flexibility options
- Hourly security of supply and reserve capacities can be evaluated



A photograph of an offshore wind farm at sea. The sky is a clear, light blue, and the water is a darker blue. Several wind turbines are visible, with one in the foreground being significantly larger and more detailed than the others in the background. The turbines are silhouetted against the sky.

# ENERGY TRANSITION IN EUROPE AND GERMANY

# Challenges in European energy strategy



## Climate risk and geopolitical crises drive the urgency for transformation:

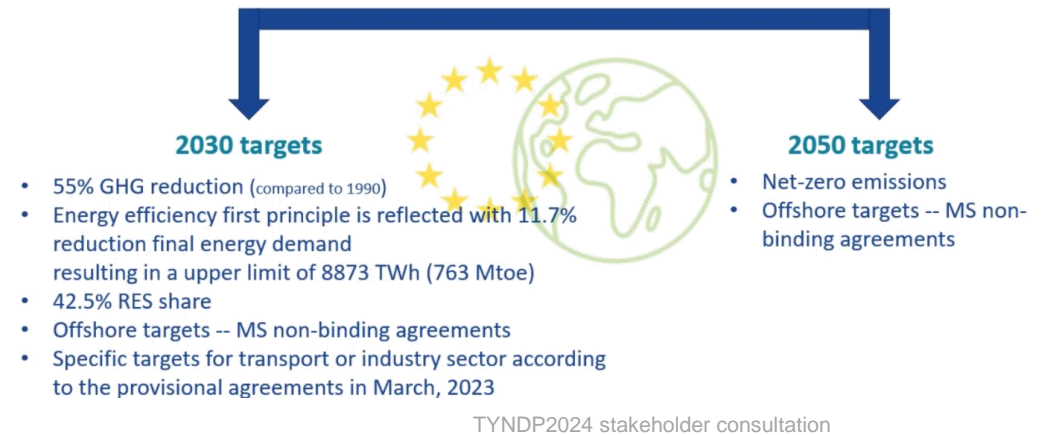
- Decarbonizing the energy supply systems across sectors
- Providing security of energy supply

## How can the system be transformed to reach these goals?



- What is the optimal timing for switching to hydrogen and green energy carriers?
- How can electrolyzers be ramped up efficiently for increasing demand of hydrogen?
- What are the implications for power grids and pipeline networks and their respective topology?

## Compliance with EU energy and climate targets

All scenarios will be aligned with the Union's 2030 targets for energy and climate and its 2050 climate neutrality objective and will include a carbon budget assessment.



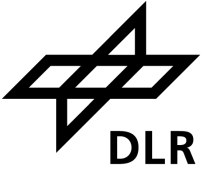
Tab. 1 – Strategic choices in the European clean hydrogen value chain

 European Union	<b>40 GW</b> <b>10 MtH<sub>2</sub></b>	<ul style="list-style-type: none"> <li>• Push for renewables</li> <li>• Promotes a “Hydrogen Valley” approach to facilitate local integration and growth</li> <li>• By 2024: <b>6 GW</b> electrolyzers, <b>1 MtH<sub>2</sub></b></li> <li>• By 2030: <b>40 GW</b> electrolyzers, <b>10 MtH<sub>2</sub></b></li> <li>• 2030-2050: large-scale deployment across all hard-to-abate sectors</li> </ul>
 Germany	<b>10 GW</b> <b>3 MtH<sub>2</sub></b>	<ul style="list-style-type: none"> <li>• Push for renewables</li> <li>• Emphasis on imports of hydrogen (low-carbon hydrogen not excluded)</li> <li>• €8bn of public budget has already been allocated to 62 pre-selected projects</li> <li>• Up to €3.4bn to build refuelling stations</li> </ul>

Deloitte 2022 The European hydrogen economy

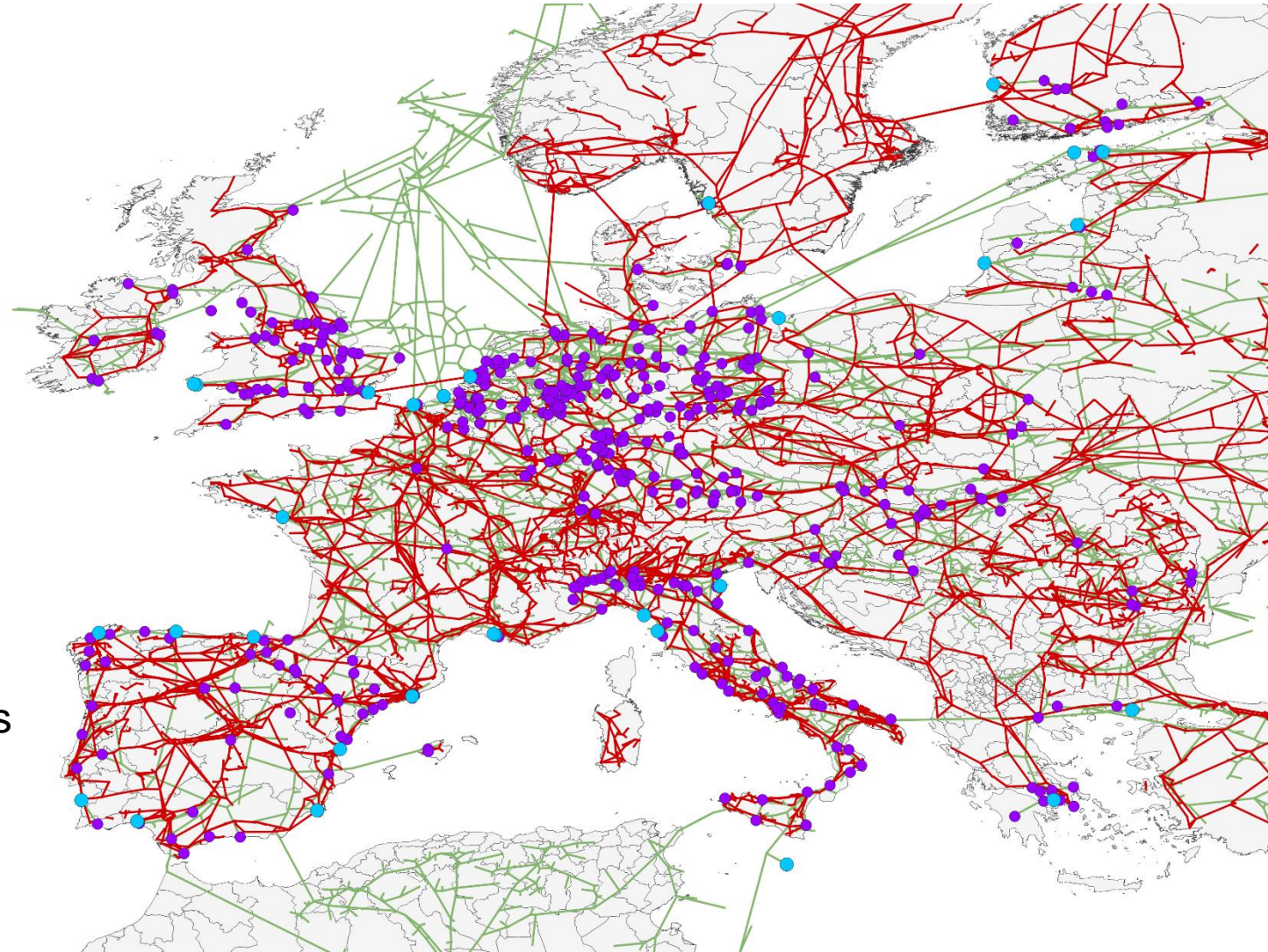


# European power and gas infrastructure



- One model region per country
- Increased spatial resolution
- Integration of high res power grid
- Integration of high res gas network
- Integration of LNG terminals
- Power and gas network with LNG terminals and gas power plants

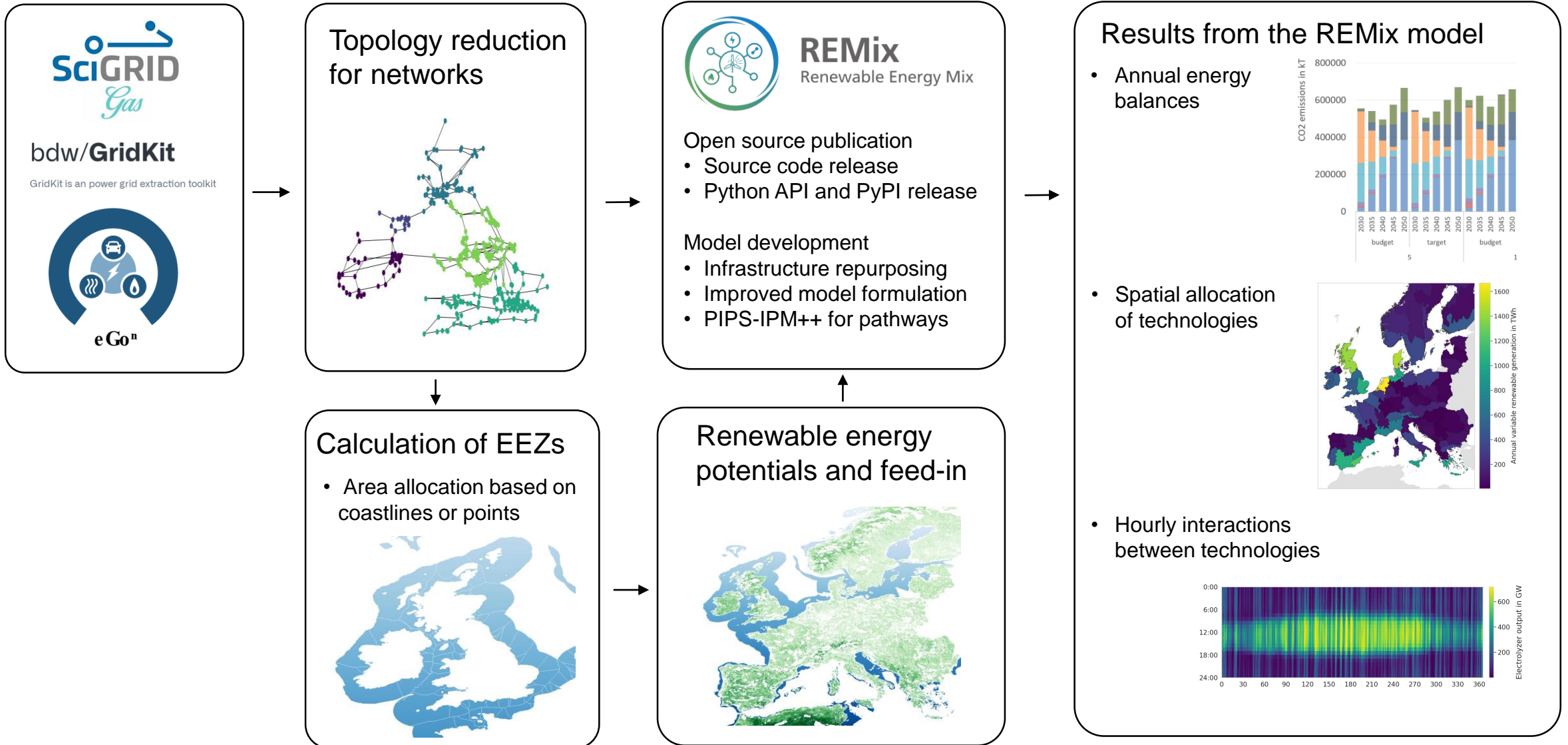
→ European infrastructure modelling requires high spatial and temporal resolution



Own depiction based on ENTSO-E GridKit and SciGrid\_gas IGGIELGN

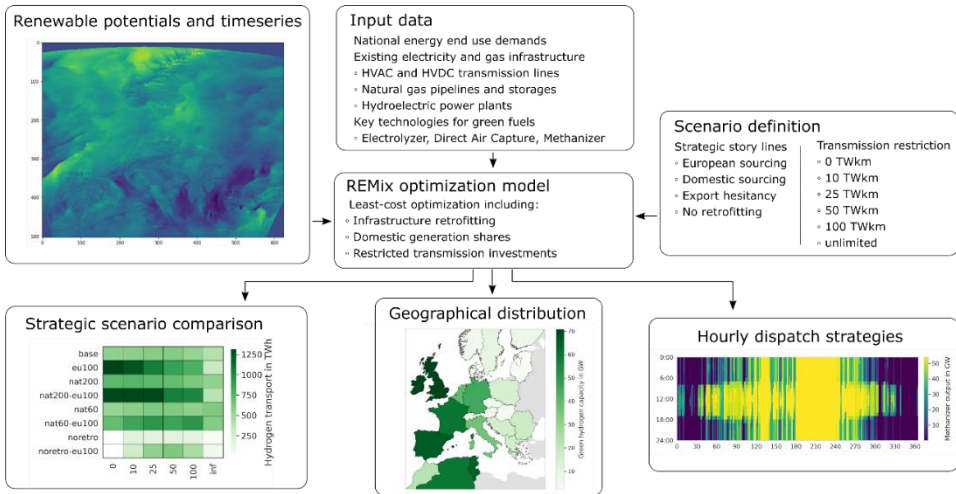


# Modelling toolchain

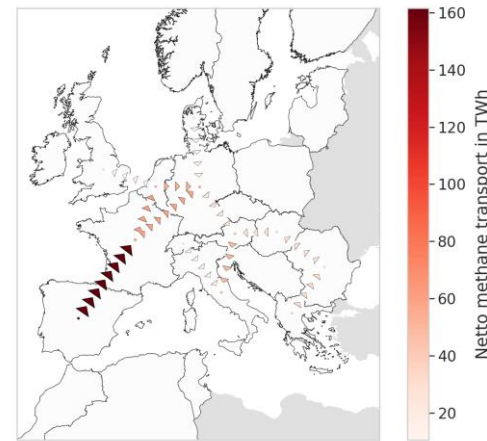
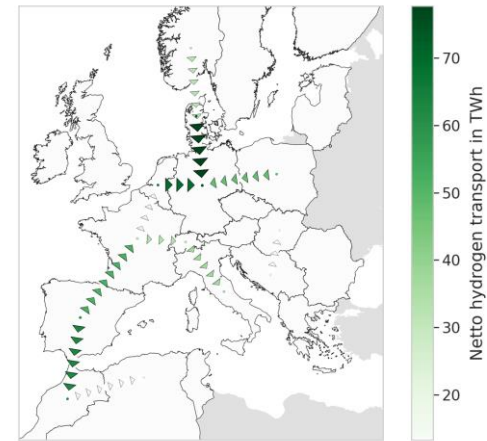


# The role of green hydrogen and methane

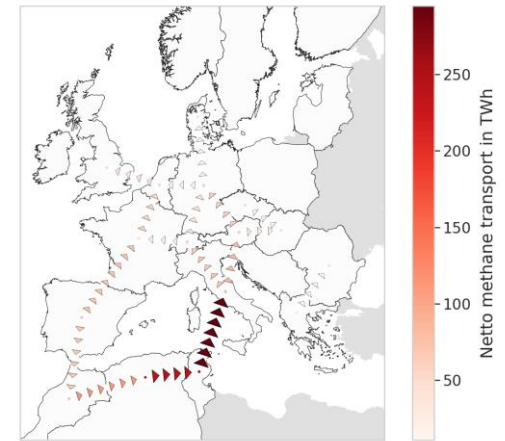
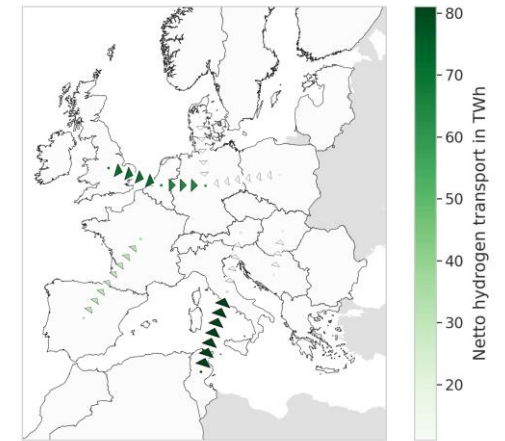
- Climate neutral energy system in 2050
- Scenarios on energy partnerships, domestic sourcing, network expansion limits



Continental Europe

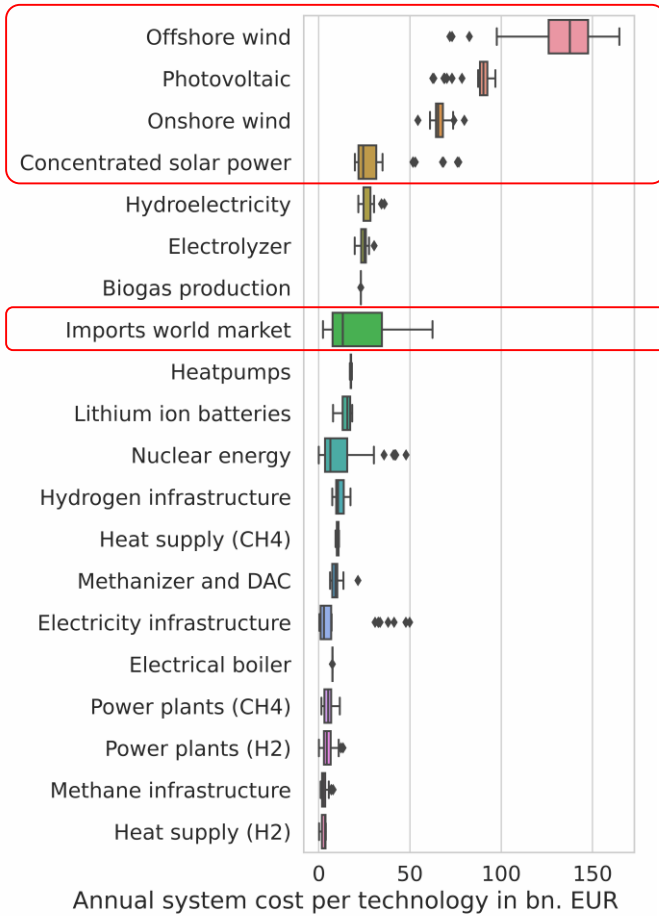


Energy Partnerships



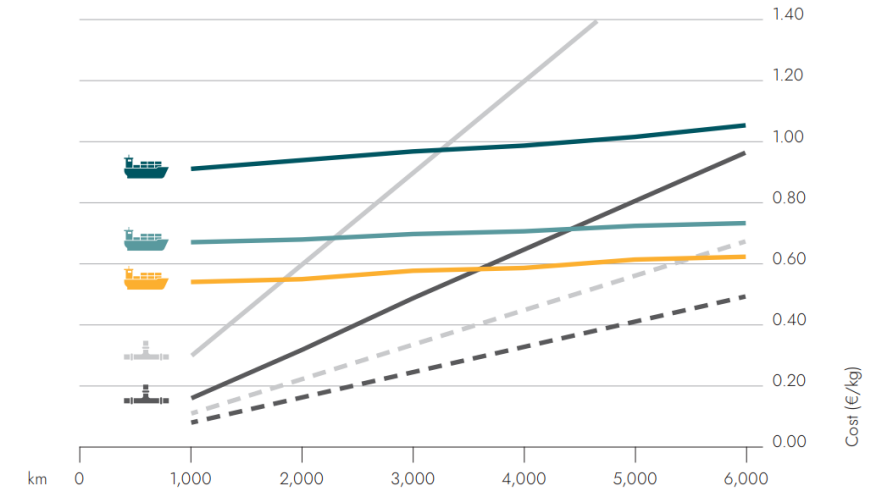
Wetzel, M., Gils, H.C., Bertsch, V., 2023, Green energy carriers and energy sovereignty in a climate neutral European energy system, Renewable Energy

# The uncertainty of future energy imports

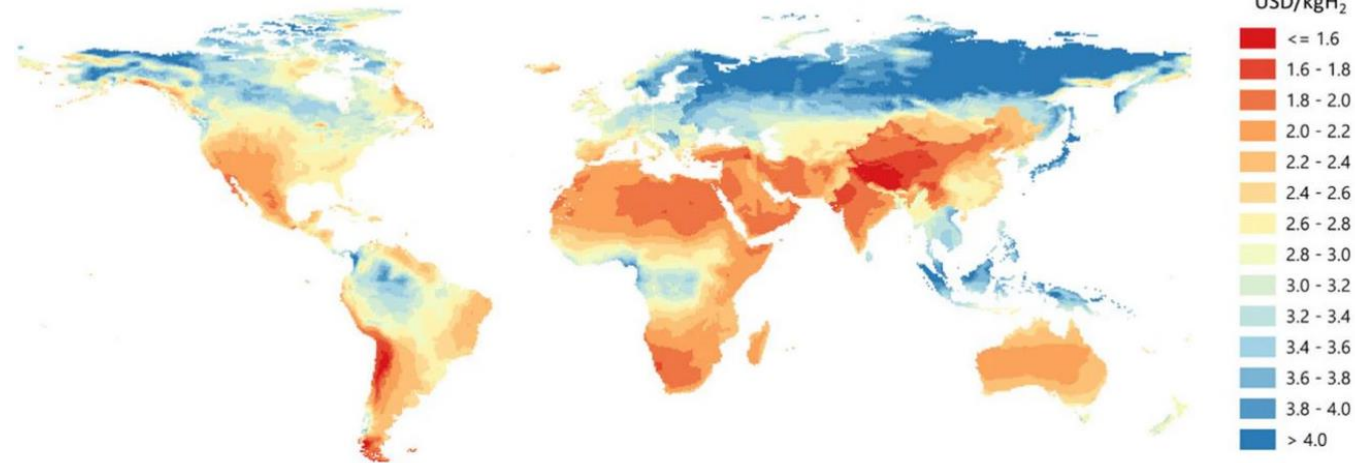


Investments into renewable energy becomes main driver of system costs

Large uncertainty about imports from global energy markets



Guidehouse 2021, Future demand, supply and transport of hydrogen

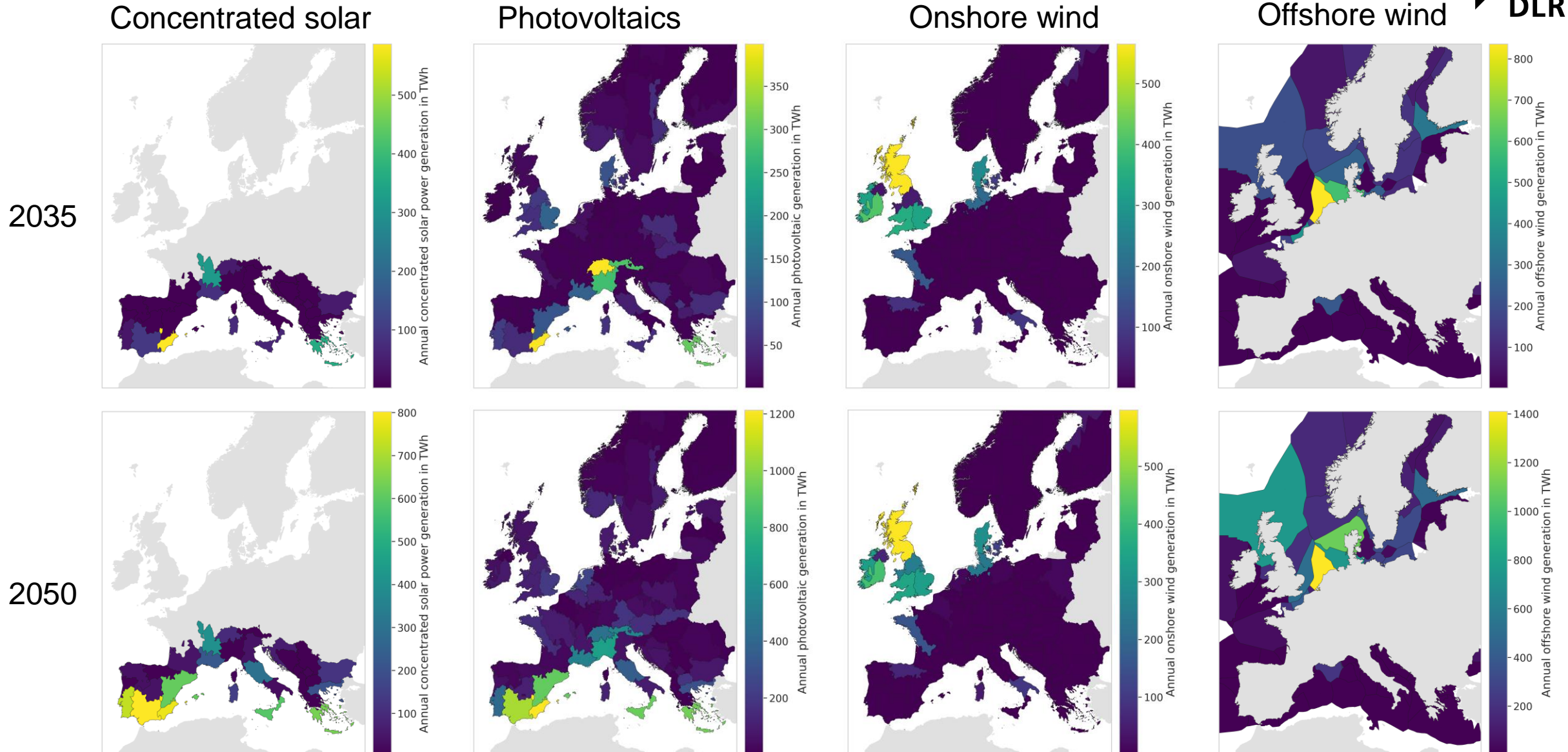
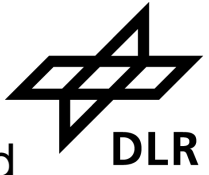


IEA 2020, The Future of Hydrogen

Wetzel, M., Gils, H.C., Bertsch, V., 2023, Green energy carriers and energy sovereignty in a climate neutral European energy system, Renewable Energy

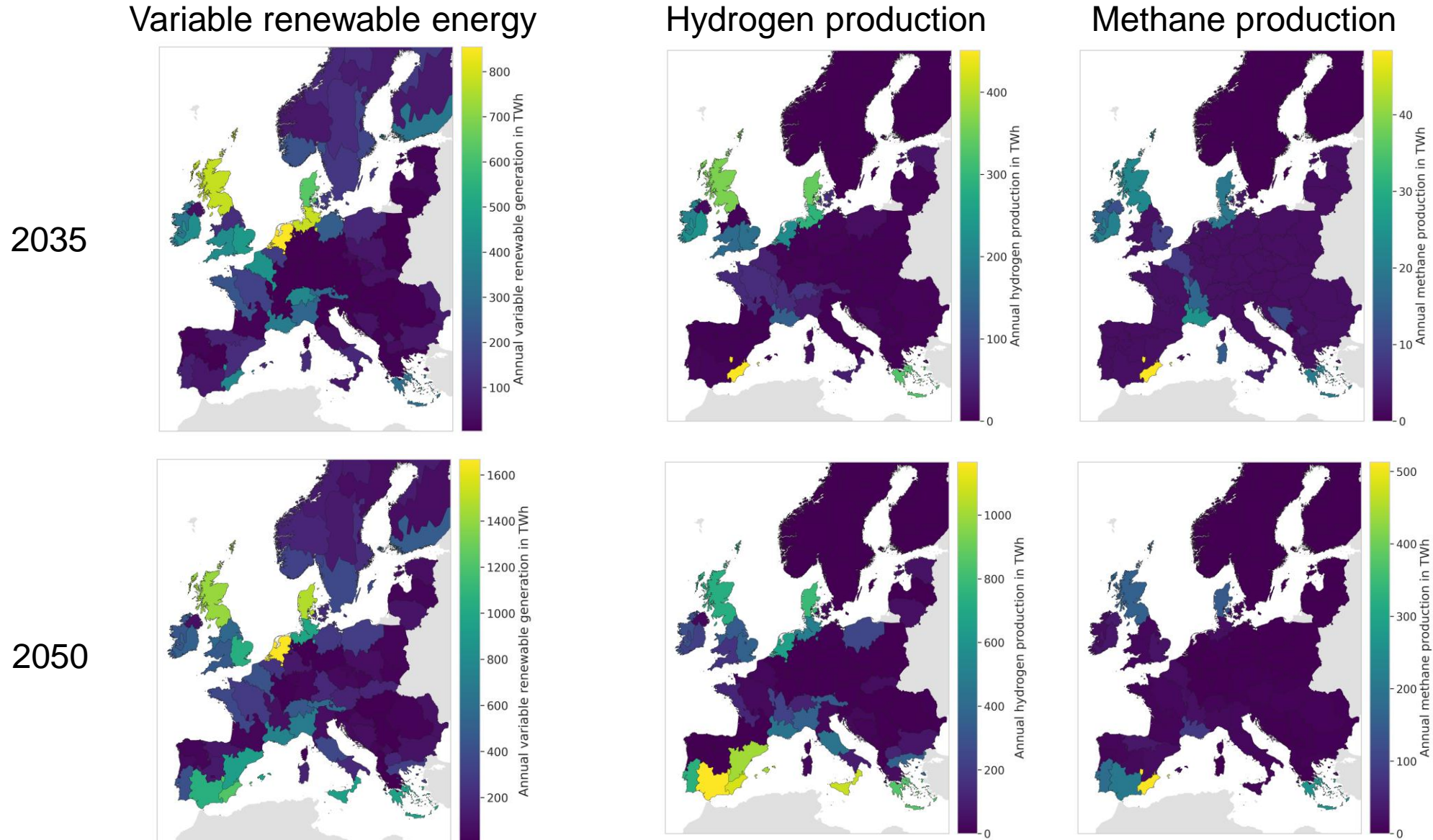


# Electricity production sites – preliminary results





# Hydrogen and methane sites – preliminary results



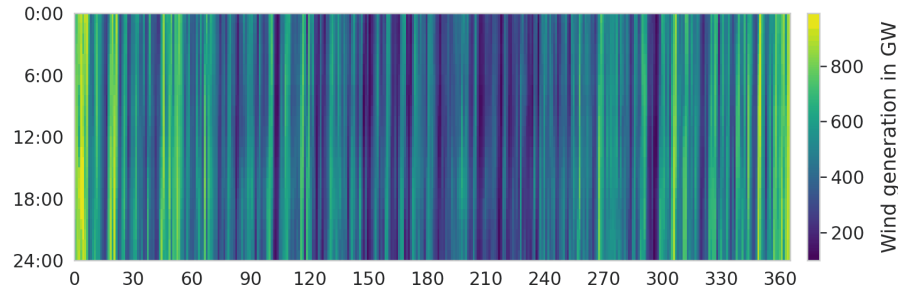
# Temporal technology correlations – preliminary results



## Onshore and offshore wind



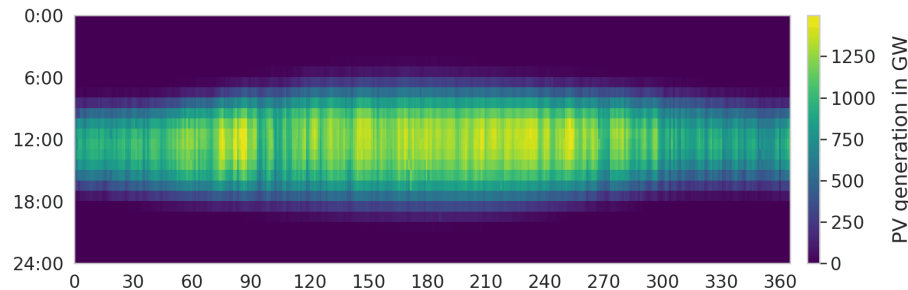
pexels



## Photovoltaics



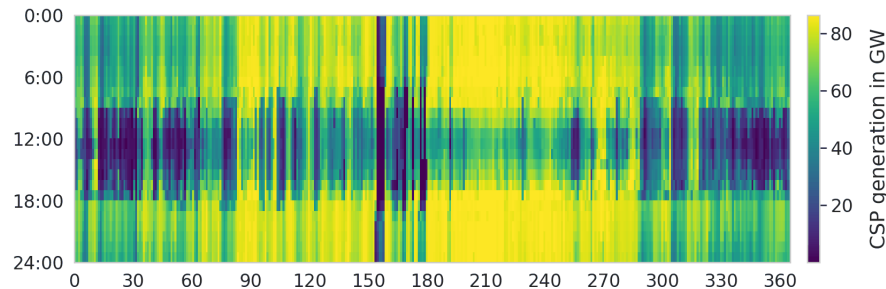
pexels



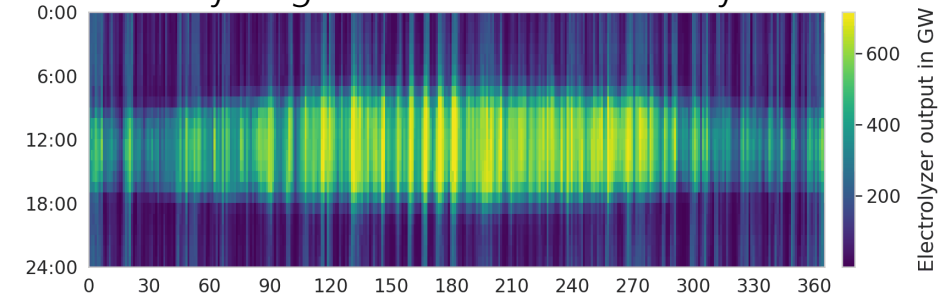
## Concentrated solar power



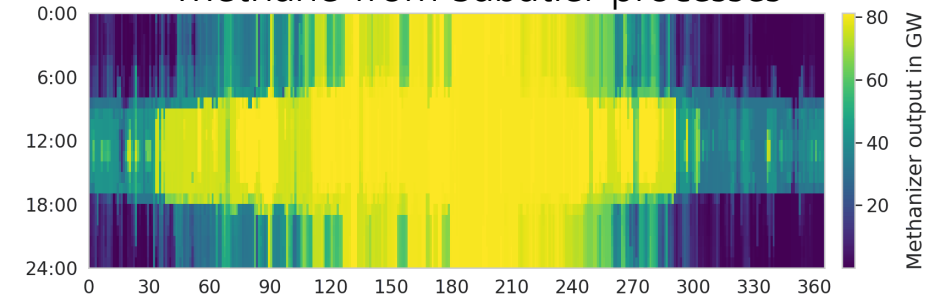
SENER



## Hydrogen from water electrolysis



## Methane from Sabatier processes



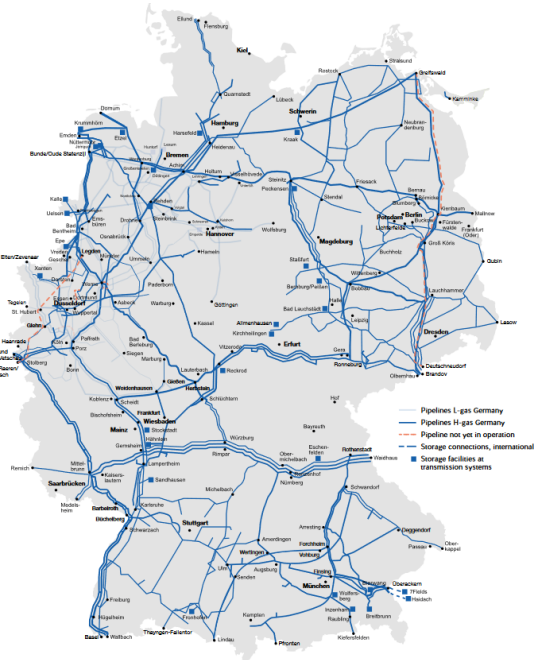
- Electrolyzers offer demand side flexibility
- Green methane requires seasonal storage

# Infrastructure repurposing – preliminary results

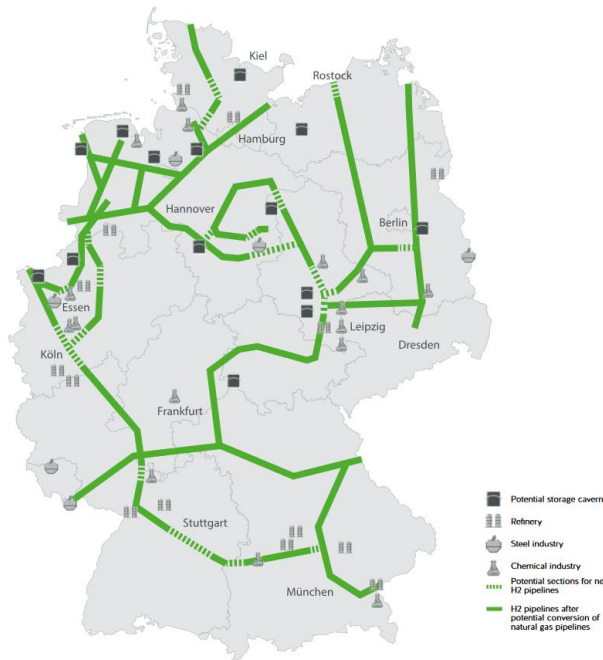


- Integration of European infrastructure data
- Reduction of network topology for path optimization (myopic / perfect foresight)
- (Modelling of infrastructure repurposing)

Current H-gas network

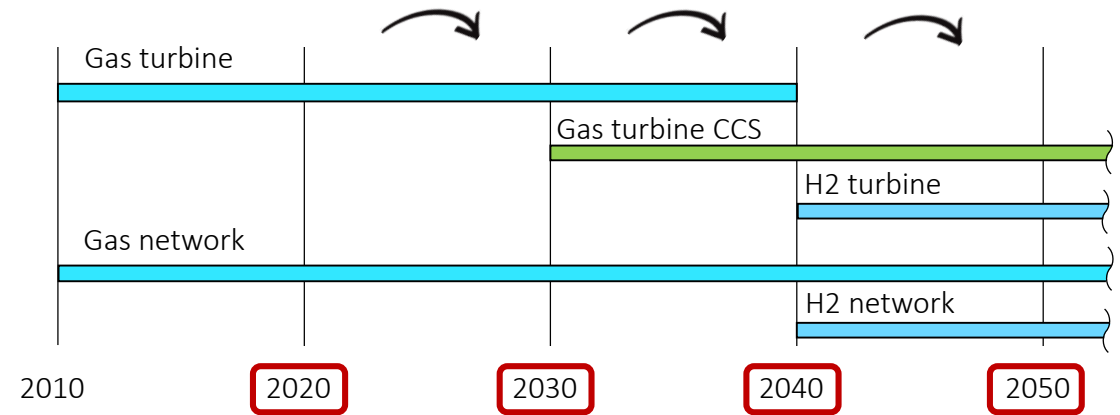


Envisioned hydrogen network

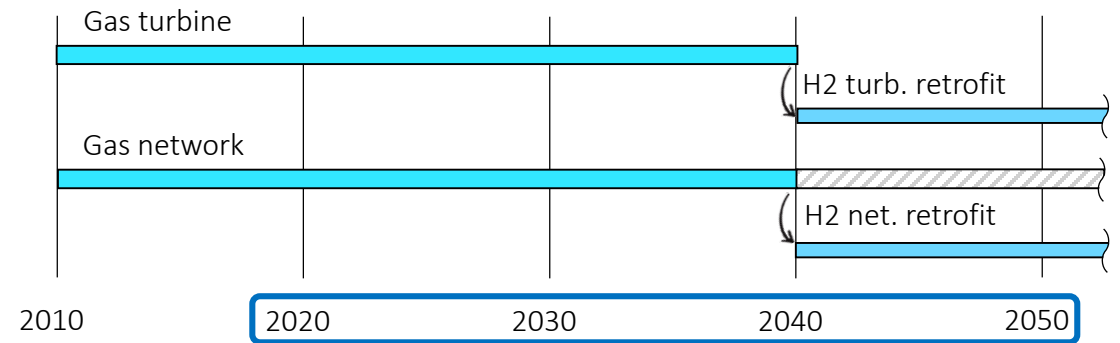


Gas Network Development Plan 2020 - 2030

Myopic foresight



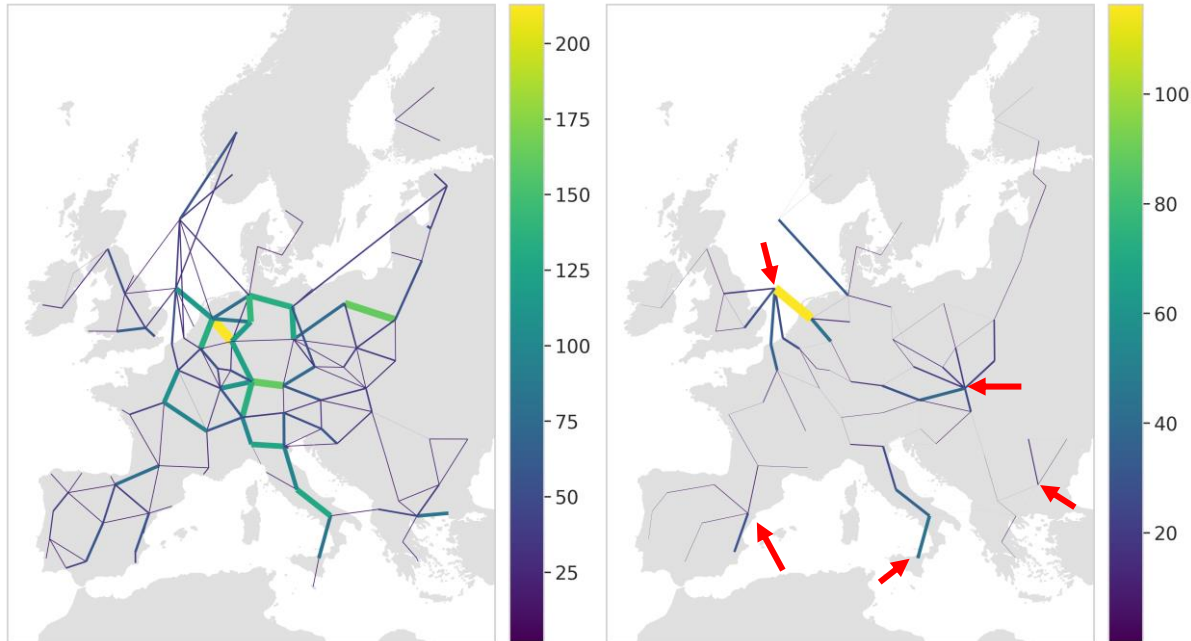
Perfect foresight



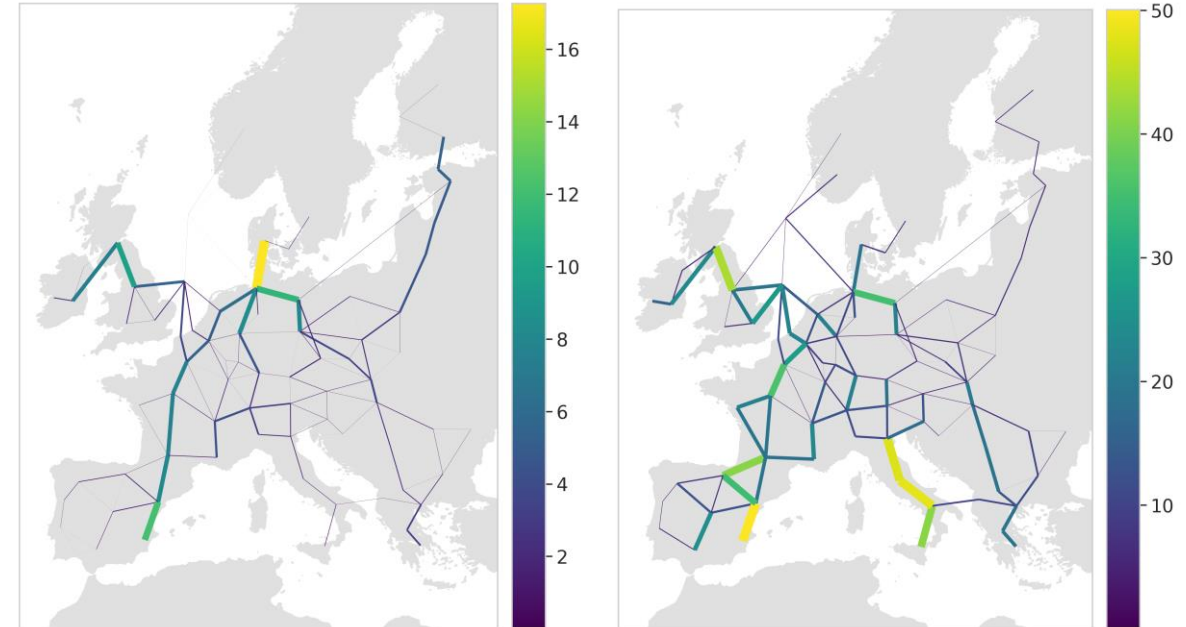


# Future network topology – preliminary results

## Methane network capacities 2025 - 2035



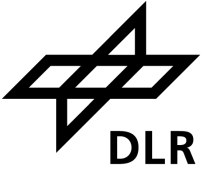
## Hydrogen network capacities 2030 - 2050



- Current network topology is focused on imports from Russia, Turkey and North Africa
- Future network topology will be driven by linking centres of supply and centres of demand



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