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# Integration of Energy System Modelling and Multi-criteria Analysis

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- Introduction
- Methodology
- Multi-criteria analysis of global energy system scenarios
  - Economic indicators
  - LCA-based indicators
  - Other societal indicators
  - Security of supply indicators
- External cost assessment of global energy system scenarios
- Multi-criteria optimisation in the global energy system model
- Outlook

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# Introduction



Island<sup>[4]</sup>



Europe<sup>[2]</sup>



Japan<sup>[5]</sup>



Africa<sup>[3]</sup>



China<sup>[1]</sup>

<sup>[1]</sup>[www.chinadialogue.net](http://www.chinadialogue.net), <sup>[2]</sup>[www.utilities-me.com](http://www.utilities-me.com), <sup>[3]</sup>[www.lightingafrica.org](http://www.lightingafrica.org), <sup>[4]</sup>[www.whoj.edu](http://www.whoj.edu), <sup>[5]</sup>[www.energyandcapital.com](http://www.energyandcapital.com)

## Motivation

- Today's global energy system is characterized by the **dominant use of fossil resources**. Thus, there are growing concerns about **climate change**.
- **But there are also but also other environmental, economic, and social aspects related to the energy system** such as air pollution, energy access, and energy supply security.
- For the transformation to more sustainable energy systems we must consider all these aspects along with their spatial and temporal dimensions.

## Goals of my PhD thesis

- Multi-dimensional analysis of energy systems
  - Identification of sustainability trade-offs from the transformation of energy systems
  - Support decision-making
- Integration of energy system modelling and multi-criteria analysis

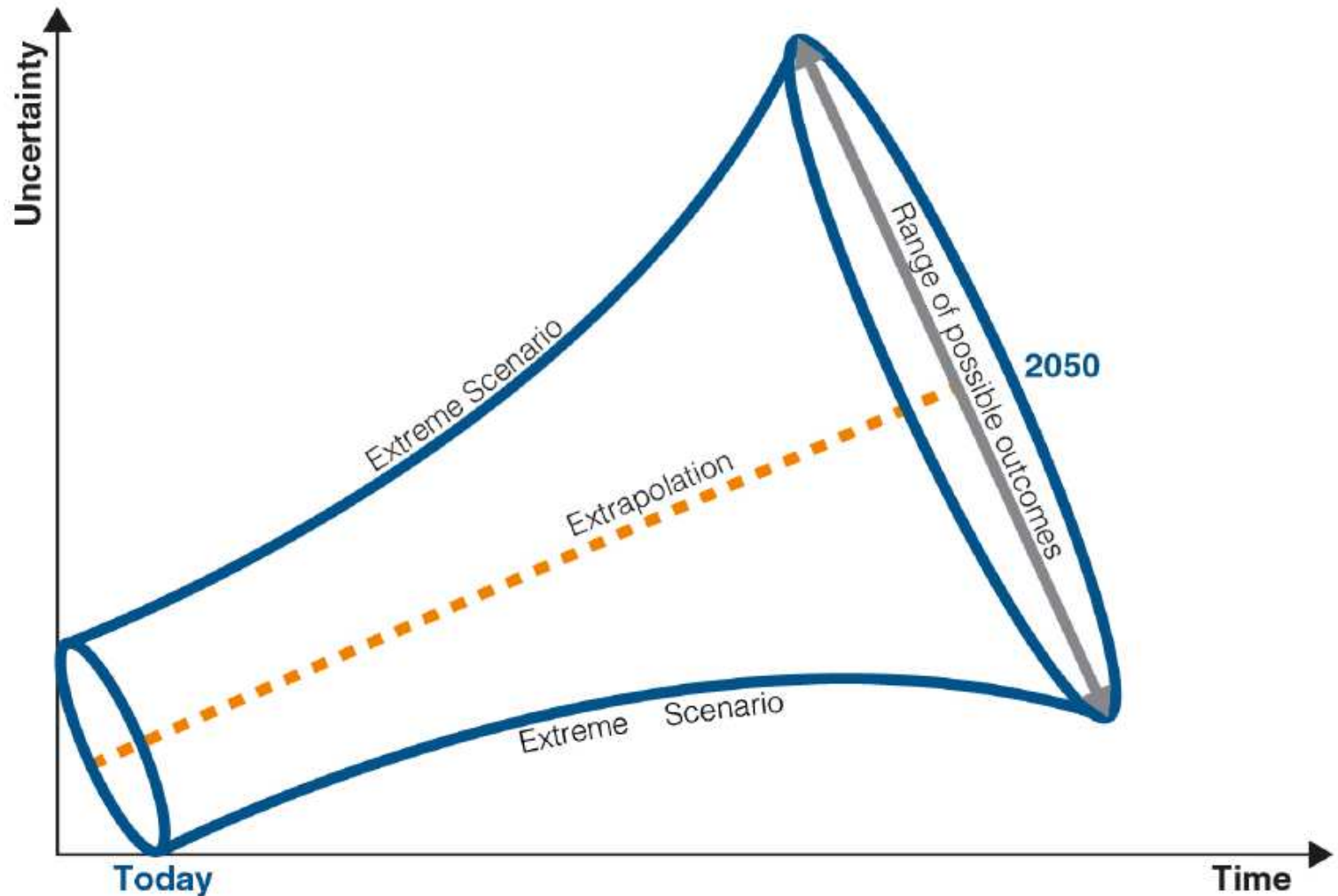
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- Energy system modelling
- Multi-criteria analysis



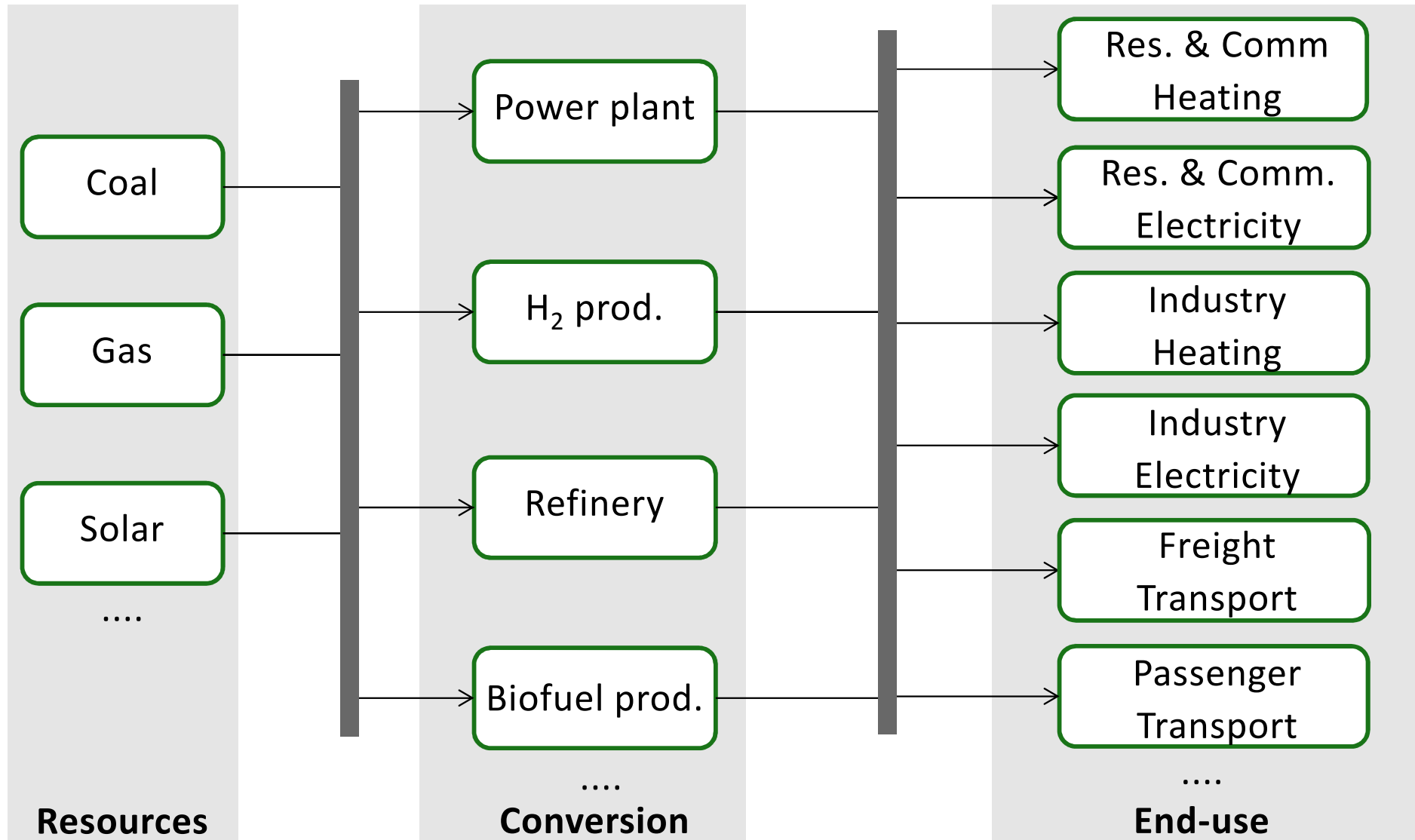
## Energy-economic system modelling



WEC/PSI (2013)



## Energy-economic system modelling @PSI





# Methodology

- Energy system modelling
- Multi-criteria analysis

## Multi-criteria analysis of energy technologies

**Environment**



**Economy**



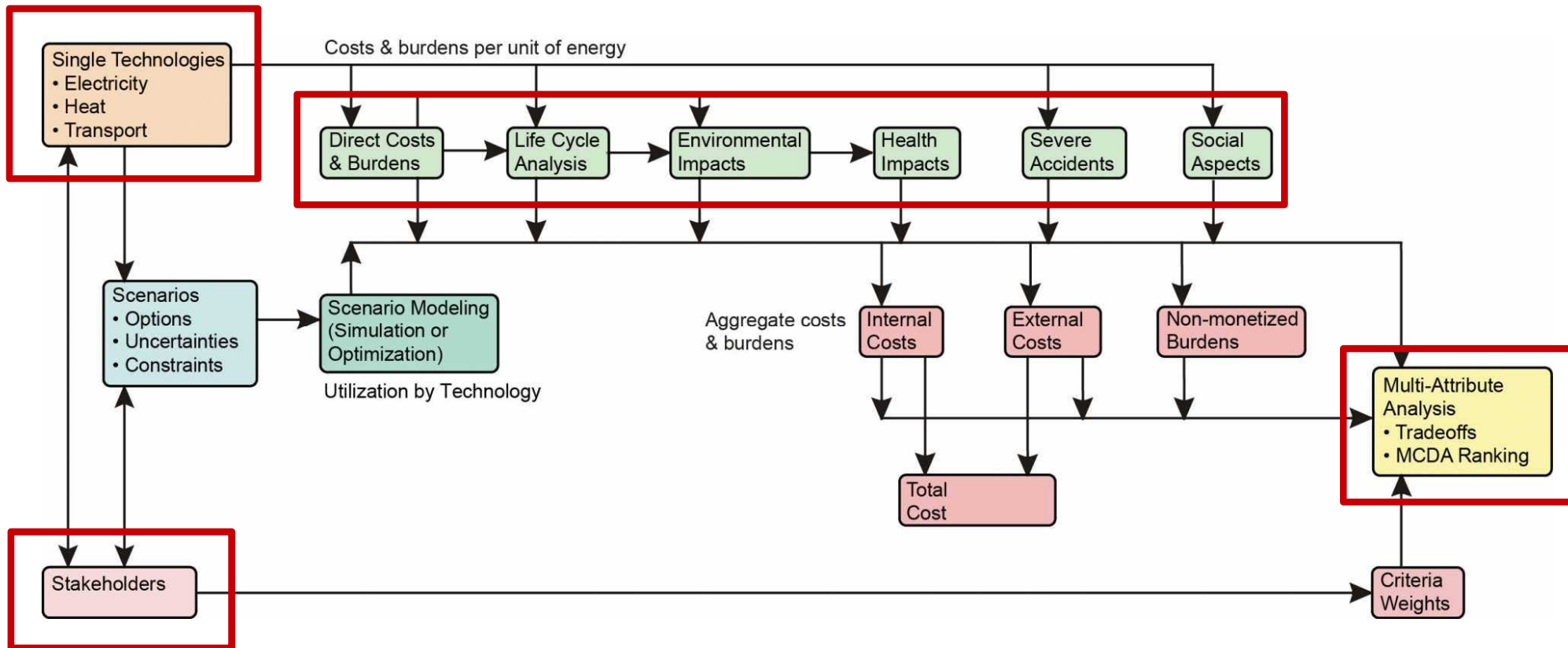
**Society**



**Security of Supply**

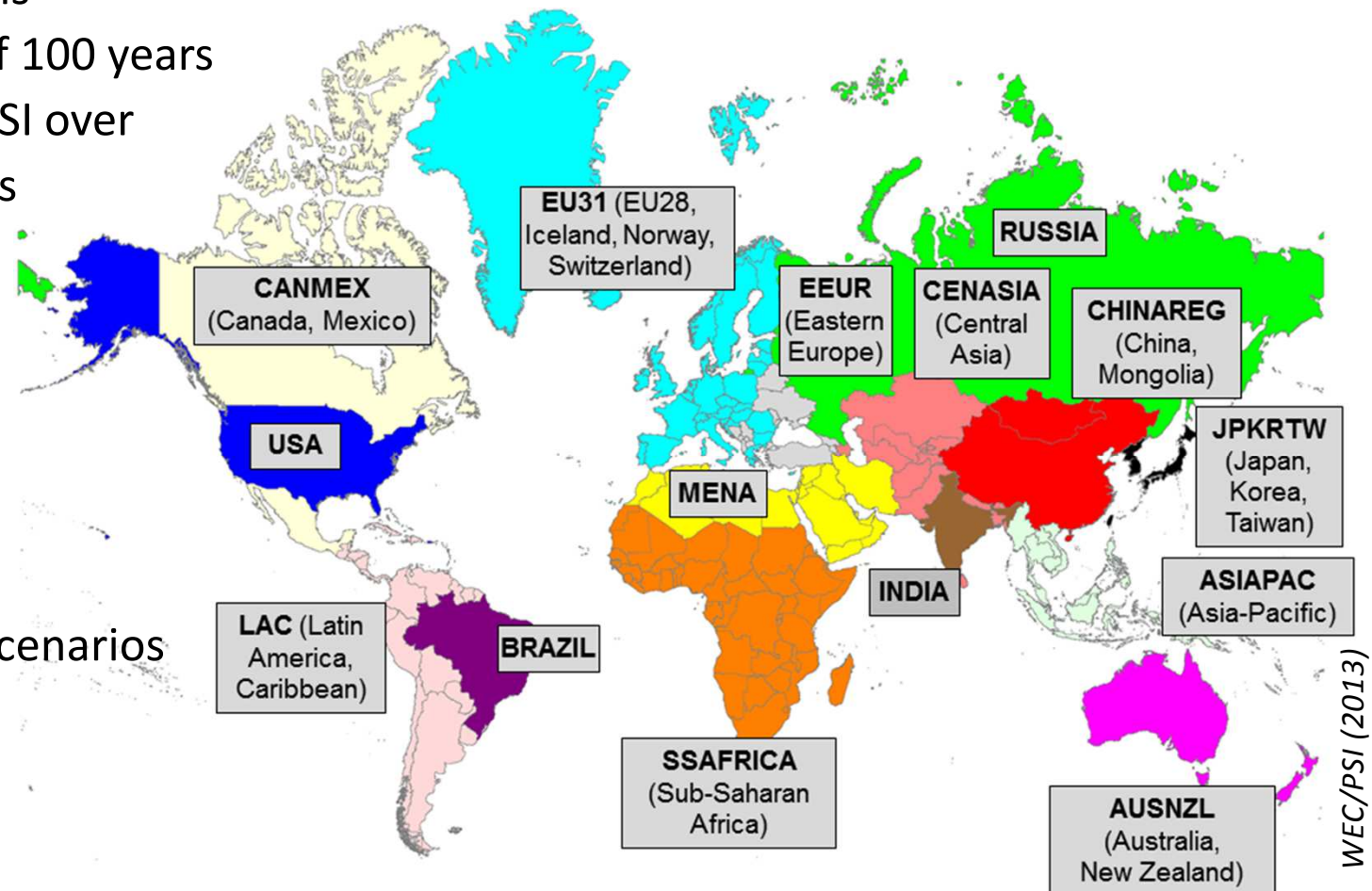


## Multi-criteria analysis of energy technologies @PSI



## Global Multi-regional MARKAL (GMM) model

- Energy system model (partial equilibrium)
- 15 world regions
- Time horizon of 100 years
- Developed at PSI over the last 15 years



- WEC/PSI  
World Energy Scenarios
  - JAZZ
  - SYMPHONY

# World Energy Council (WEC)

- Formed in 1923
- UN-accredited global energy body
- More than 3000 member organisations located in over 90 countries
- representing the entire energy spectrum from governments, private and state corporations, academia, NGOs and energy-related stakeholders.
  
- Network of leaders and practitioners **promoting an affordable, stable and environmentally sensitive energy system** for the greatest benefit of all.
- Informs global, regional and national energy strategies by hosting high-level events, **publishing authoritative studies**, and working through its extensive member network to facilitate the world's energy policy dialogue.
  
- Regular reports:
  - World Energy Resources
  - World Energy Trilemma
  - World Energy Issues Monitor
  - **World Energy Scenarios**



*All information from [www.worldenergy.org](http://www.worldenergy.org)*



# WEC/PSI World Energy Scenarios (2013)

	Scenario JAZZ	Scenario SYMPHONY
<b>Goals</b>	<ul style="list-style-type: none"> <li>• Affordable access to energy through free markets</li> <li>• High income</li> <li>• Mainly adaptation to environmental damages</li> </ul>	<ul style="list-style-type: none"> <li>• Secure access to energy</li> <li>• Targeted regulation through states and international organizations</li> <li>• Mainly avoidance of environmental damages</li> </ul>
<b>Economic Growth</b> (Gross Domestic Product, GDP)	GDP growth has priority (3.5% annual average to 2050)	Less GDP growth (3.1% annual average to 2050)
<b>Population</b>	Increase (8.7 billion in 2050)	Strong increase (9.3 billion in 2050)
<b>Climate Policy</b>	CO <sub>2</sub> markets develop slowly (CO <sub>2</sub> price in 2050: 23–45 \$/tCO <sub>2</sub> )	Rapid state control (CO <sub>2</sub> price in 2050: 70–80 \$/tCO <sub>2</sub> )
<b>Energy Efficiency / Intensity</b>	Efficiency increases based on economic criteria	State promotion of measures for efficiency and energy savings
<b>Unconventional Resources</b> (Shale oil/gas, oil sands)	Expanded opening of markets. High incentives for use due to high energy demand.	Regulation (regarding water use, market access). Fewer incentives due to lower demand.
<b>Renewable Energy</b>	Limited promotion. “The market” selects the technologies.	Selective state promotion
<b>Non-renewable Energy</b>	Limited support: <ul style="list-style-type: none"> <li>• CCS market driven, pilot plants by 2030</li> <li>• Nuclear plants under construction partially not in operation</li> </ul>	State support: <ul style="list-style-type: none"> <li>• CCS available from 2020</li> <li>• Nuclear energy</li> </ul>



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## Environment

- Greenhouse gas emissions
- Resources (metal, fossil)
- Ecosystem damages



## Economy

- Energy system cost
- Energy cost
- Pollution tax



## Society

- Human health impacts
- Chemical waste
- Expected mortality in accidents
- Maximum consequences of accidents (conflict potential)



## Security of Supply

- Diversity of energy supply
- Import dependency
- Energy intensity, TFC/TPES
- Reserves-to-production ratio
- Refining capacity
- Renewable / Oil share in TPES

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# Integration of LCA-based indicators

## Environment

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- Resources (metal, fossil)
- Ecosystem damages



## Economy

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## Society

- Human health impacts
- Waste
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## Security of Supply

- Diversity of energy supply
- Import dependency
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## Life-cycle assessment (LCA)

- Evaluation of environmental impacts associated with all the stages of a product's life from cradle to grave, i.e., raw material extraction, materials processing, manufacture, distribution, use, repair and maintenance, and disposal or recycling.
- Life-cycle inventory datasets in background database ecoinvent



## Research questions

- How can LCA-based indicators be integrated in existing energy system models without double-counting of impacts?
- What are the environmental impacts of the global energy system from a life-cycle perspective?

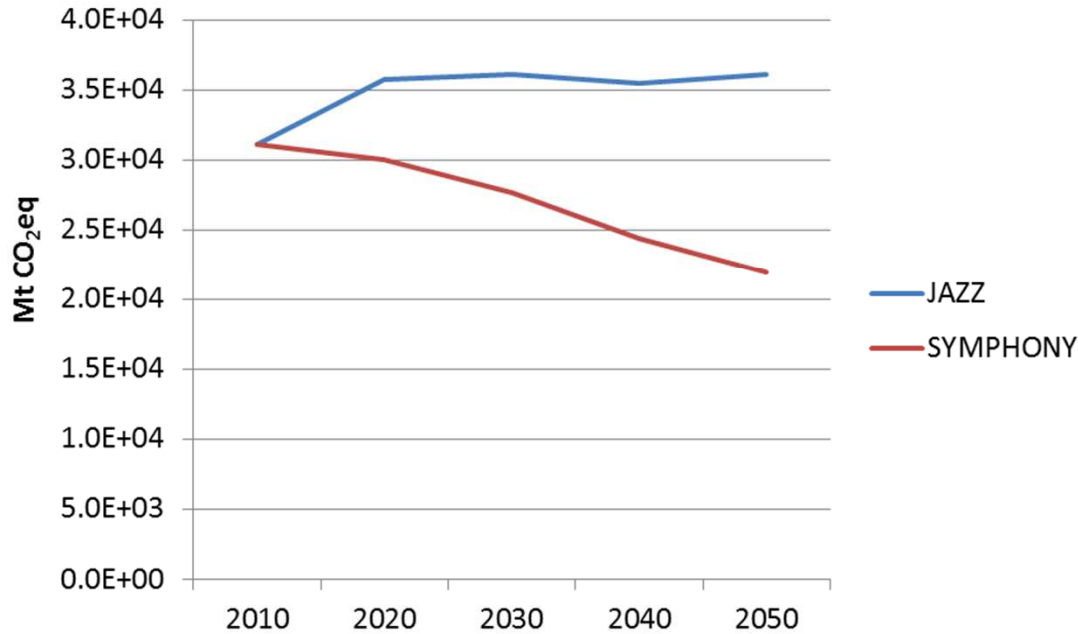
## Collaborators

- Chris Mutel
- Martin Densing, Evangelos Panos

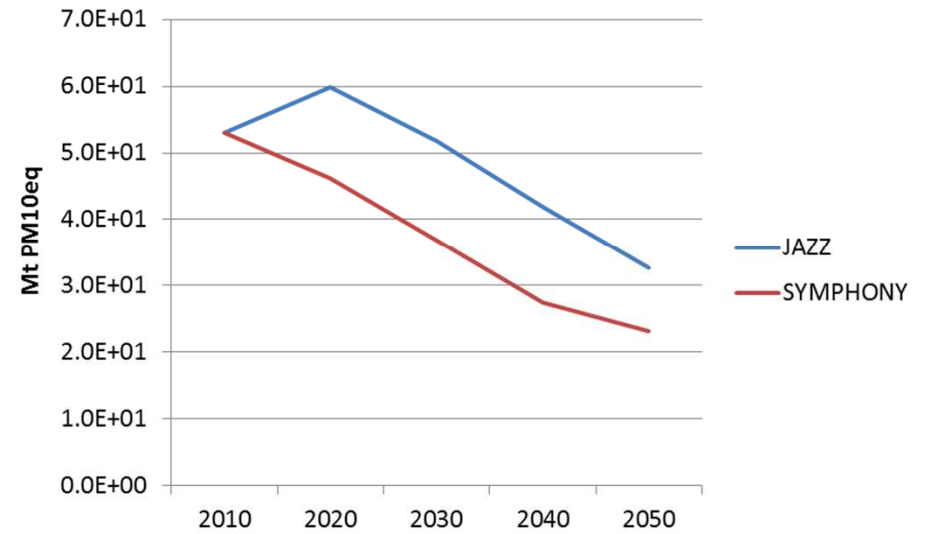


# Preliminary Results

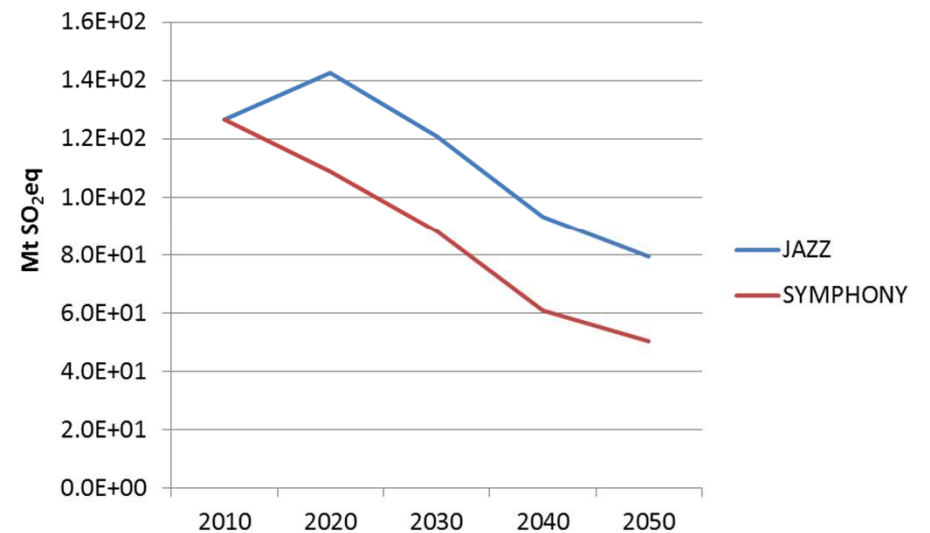
### Global Warming Potential



### Particulate Matter Formation



### Terrestrial Acidification



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# Integration of other societal indicators

## Environment

- Greenhouse gas emissions
- Resources (metal, fossil)
- Ecosystem damages



## Economy

- Energy system cost
- Energy cost
- Pollution tax



## Society

- Human health impacts
- Chemical waste
- Expected mortality in accidents
- Maximum consequences of accidents (conflict potential)



## Security of Supply

- Diversity of energy supply
- Import dependency
- Energy intensity, TFC/TPES
- Reserves-to-production ratio
- Refining capacity
- Renewable / Oil share in TPES

## **Risk assessment**

- Energy-related Severe Accident Database (ENSAD)
- Accidents can occur at all stages of an energy chain, i.e. extraction, transport, and plant.
- In ENSAD, data on all energy-related accidents is collected and classified into energy chains and activities within those chains.

## **Research questions**

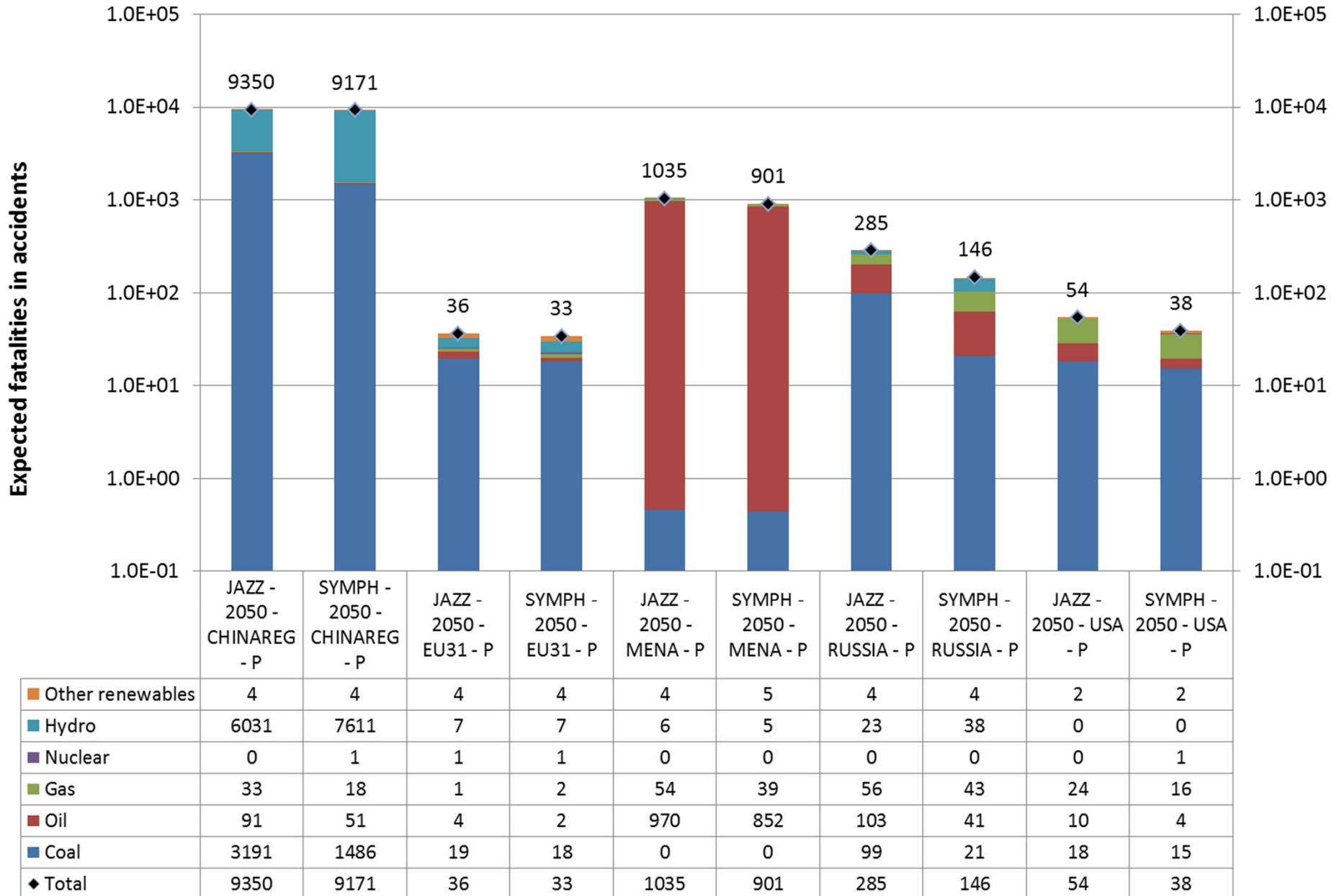
- How can accident risk assessment indicator be integrated in existing energy system models?
- What are the expected consequences from accidents in the global energy system based on historic evidence?

## **Collaborators**

- Peter Burgherr
- Martin Densing, Evangelos Panos



# Preliminary Results



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# Integration of security of supply indicators

## Environment

- Greenhouse gas emissions
- Resources (metal, fossil)
- Ecosystem damages



## Economy

- Energy system cost
- Energy cost
- Pollution tax



## Society

- Human health impacts
- Chemical waste
- Expected mortality in accidents
- Maximum consequences of accidents (conflict potential)



## Security of Supply

- Diversity of energy supply
- Import dependency
- Energy intensity, TFC/TPES
- Reserves-to-production ratio
- Refining capacity
- Renewable / Oil share in TPES

## Security of supply

- “uninterrupted availability of energy sources at an affordable price” (IEA, 2015)
  - **Long-term** energy security: timely investments in the supply of energy
  - **Short-term** energy security: ability of the energy system to react to sudden changes within the supply-demand balance

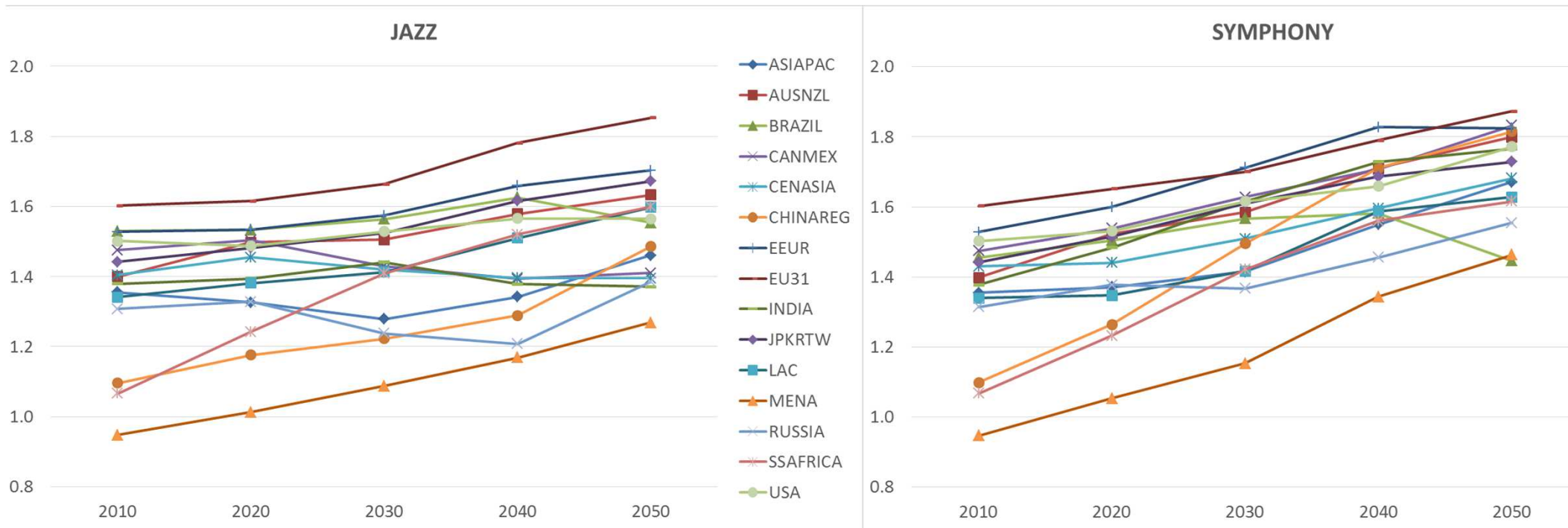
## Research questions

- What are important security of supply indicators?
- How does the security of supply of the global energy system evolve?

## Collaborators

- Moritz Köhme
- Martin Densing, Evangelos Panos

## Shannon-Wiener Index for Total Primary Energy Supply (TPES)





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## Externalities

- Costs or benefits imposed upon a third party when goods and services are produced and consumed.
  - **External costs:** Third party has a drawback.
  - **External benefits:** Third party has an advantage.

## Research questions

- What are the external costs of the global energy system?
- How do the external costs compare with the GDP in the respective period?

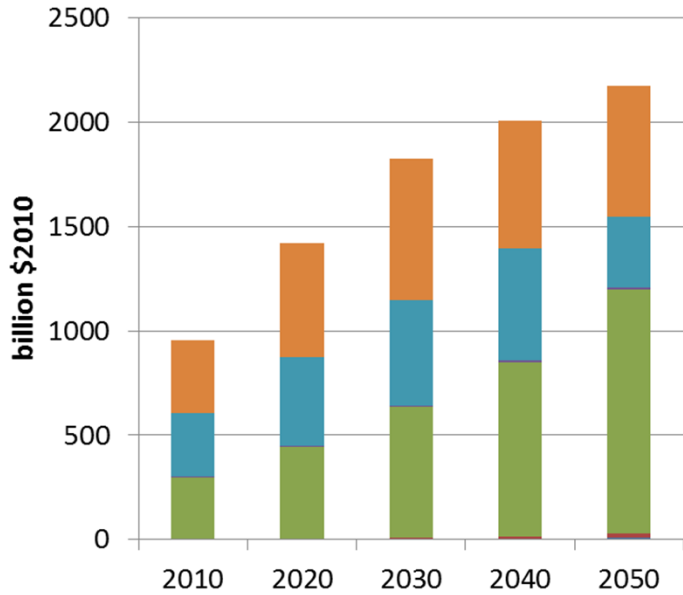
## Collaborators

- Michael Hegglin
- Chris Mutel
- Evangelos Panos
- Martin Densing

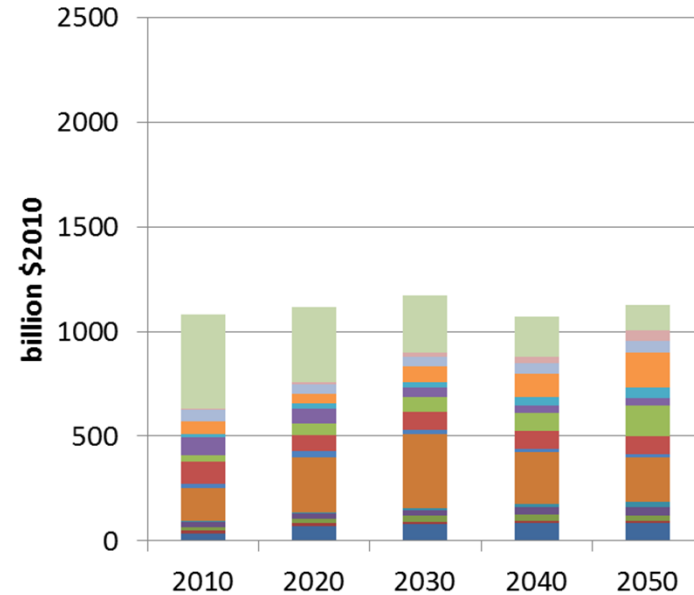
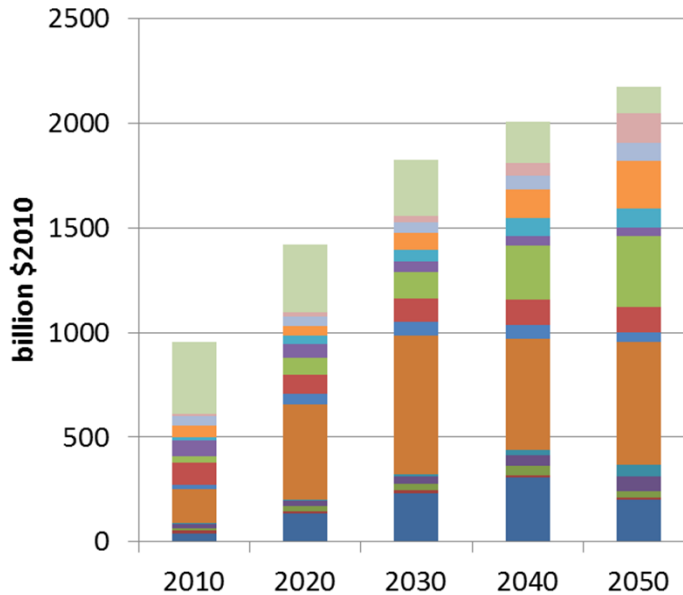
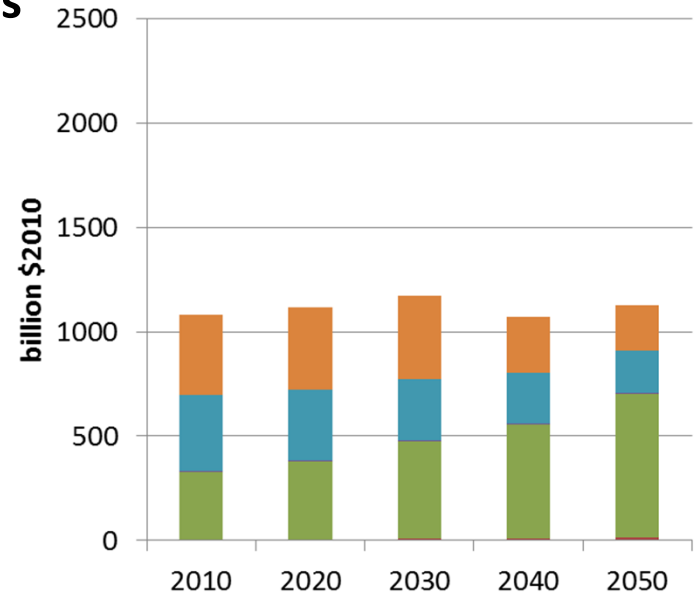


# Preliminary Results

## JAZZ



## Human Health Damages





# Outline

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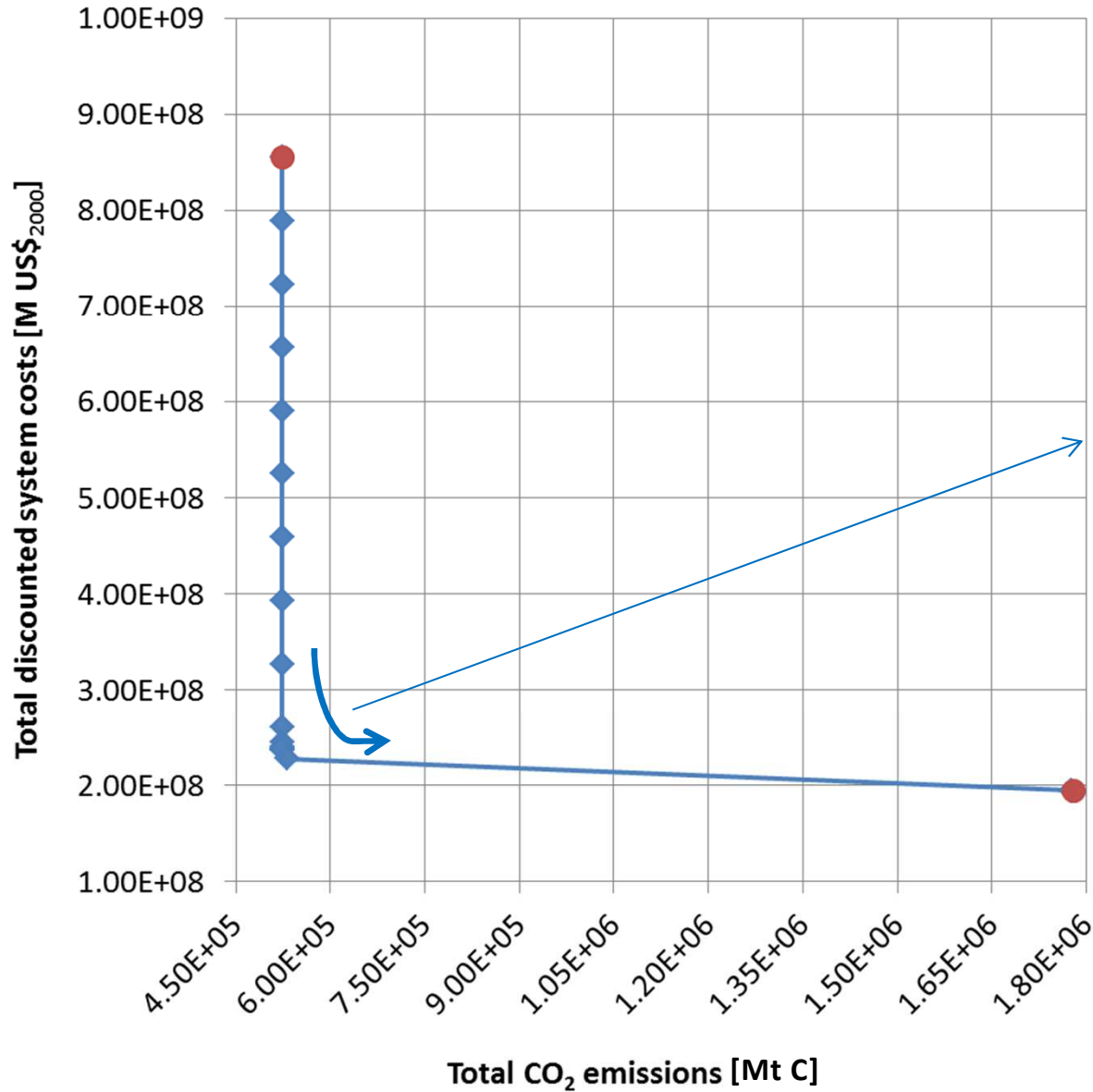
- How do energy systems look which are optimized for other indicators than cost or weighted combinations of indicators?
- How much does achieving other sustainability goals cost?

## Collaborators

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- Nagore Sabio
- Evangelos Panos



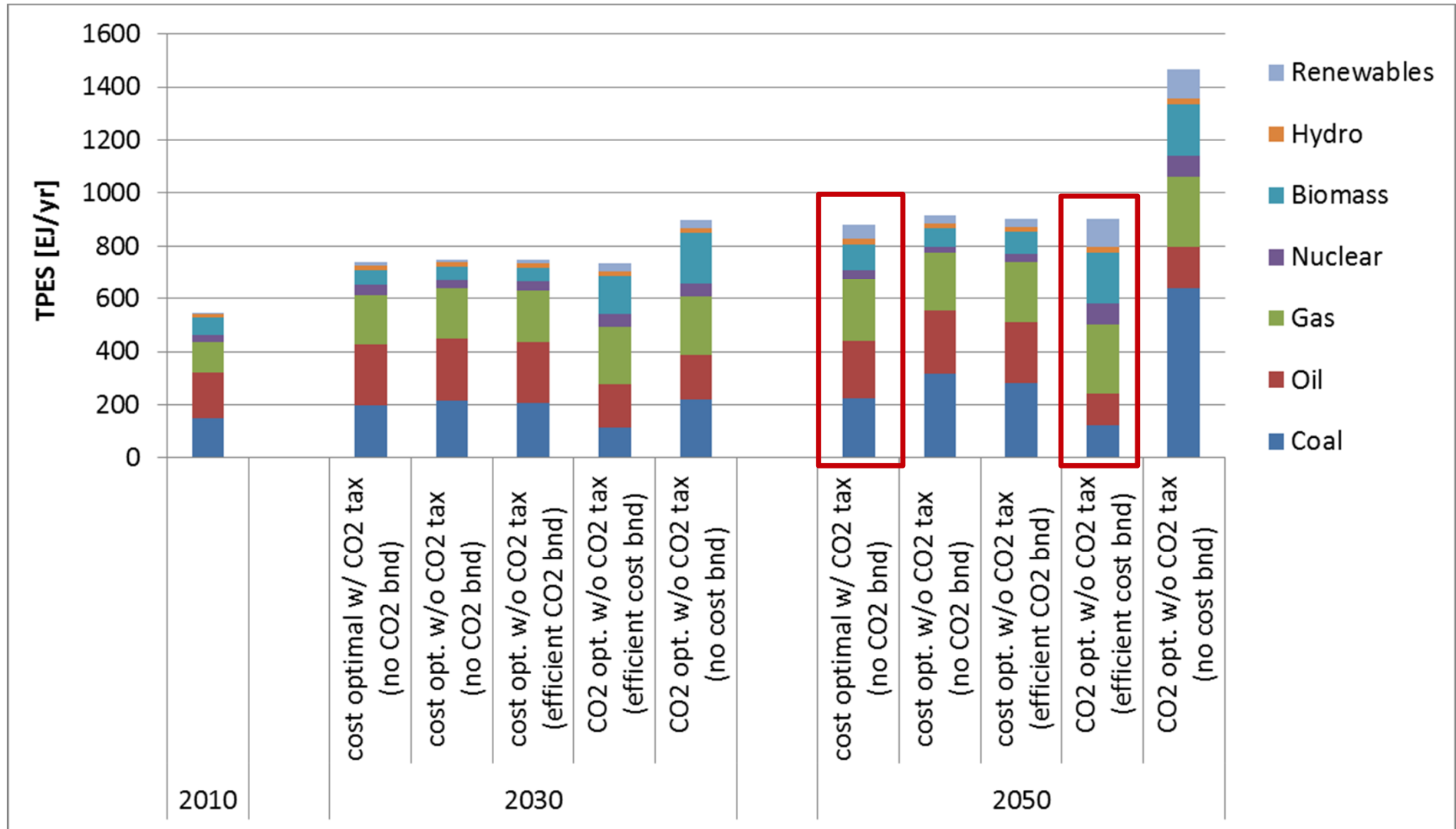
# Preliminary Results: Epsilon constraint approach



	COST	CO2	COMMENT
JAZZ_20	8.55E+08	5.24E+05	min CO2 @8.55E8 cost bnd
JAZZ_21	7.89E+08	5.24E+05	
JAZZ_22	7.23E+08	5.24E+05	
JAZZ_23	6.57E+08	5.24E+05	
JAZZ_24	5.91E+08	5.24E+05	
JAZZ_25	5.25E+08	5.24E+05	
JAZZ_26	4.59E+08	5.24E+05	
JAZZ_27	3.93E+08	5.24E+05	
JAZZ_28	3.27E+08	5.24E+05	
JAZZ_29	2.61E+08	5.24E+05	
JAZZ_32	2.44E+08	5.24E+05	
JAZZ_34	2.40E+08	5.24E+05	
JAZZ_35	2.38E+08	5.24E+05	
JAZZ_36	2.37E+08	5.24E+05	efficient solution
JAZZ_33	2.36E+08	5.25E+05	
JAZZ_31	2.28E+08	5.32E+05	
JAZZ_30	1.95E+08	1.78E+06	min CO2 @1.95E8 cost bnd
JAZZ_14	1.95E+08	1.78E+06	min cost @no CO2 bnd
JAZZ_15	8.55E+08	5.24E+05	min CO2 @no cost bnd



# Preliminary Results: Epsilon constraint approach





## I would like to thank:

- Martin Densing
- Evangelos Panos
- Chris Mutel
- Nicolas Weidmann
- Christian Bauer
- Peter Burgherr  
(all from PSI)
  
- Michael Hegglin
- Moritz Köhme  
(both from ETHZ)
  
- Nagore Sabio
- Neil Strachan  
(both from UCL)

**Thank you for the  
attention!**

