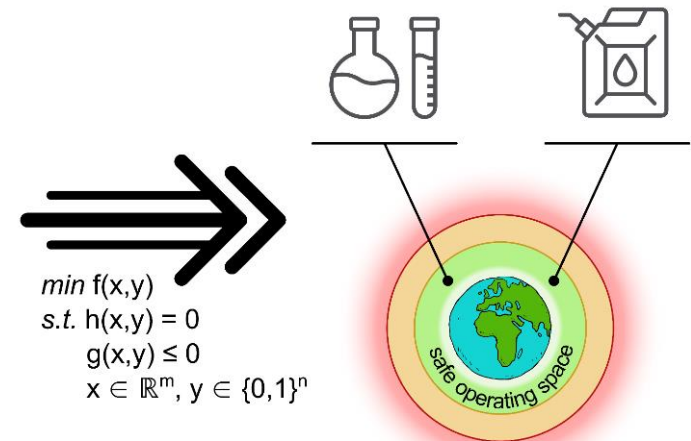


Process Systems Engineering for sustainable chemicals within planetary boundaries

Gonzalo Guillén-Gosálbez

ICB Institute for Chemical and Bioengineering

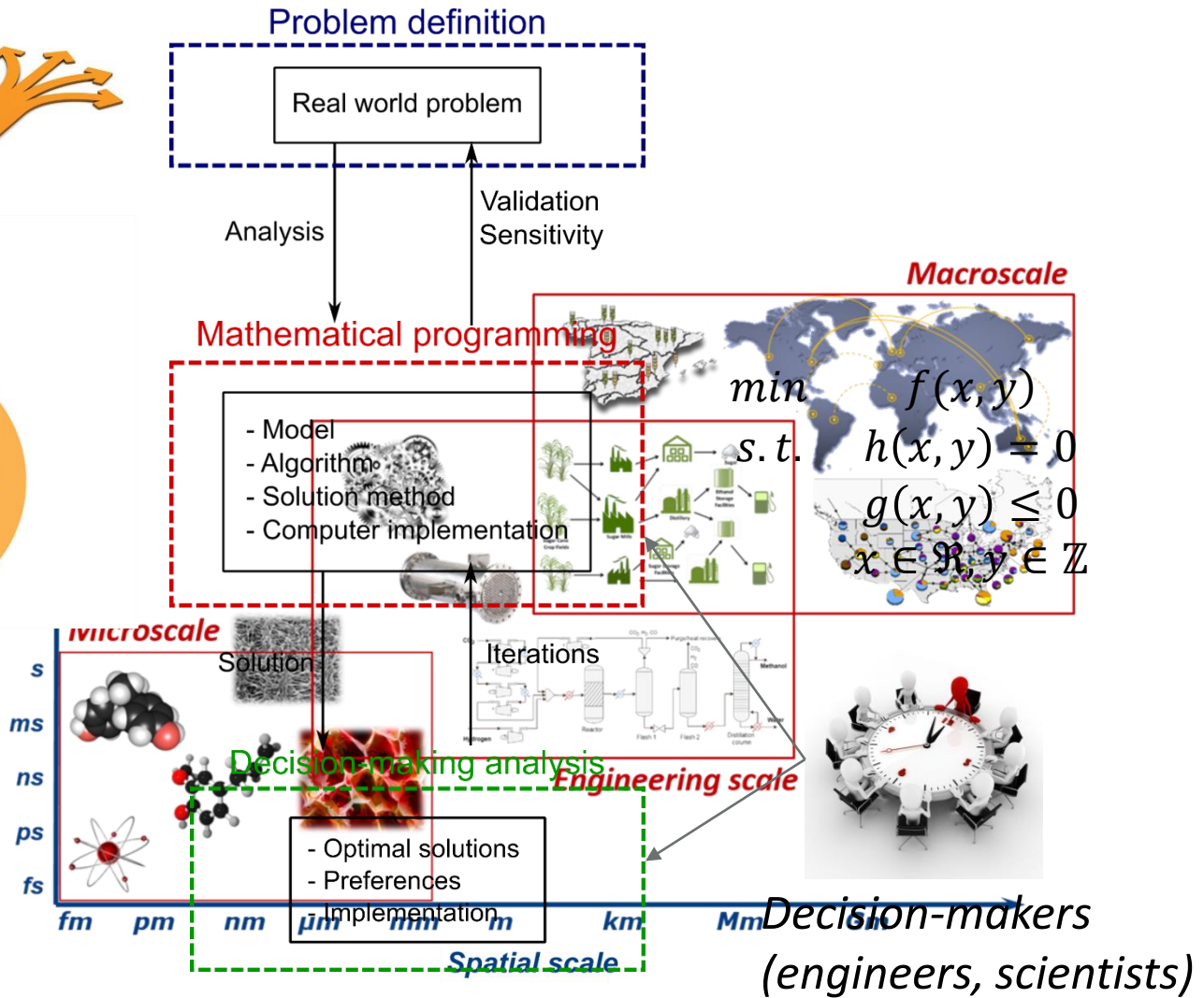
Department of Chemistry and Applied Biosciences



Sustainable decision-making process



Temp



Mathematical programming

$$\min \quad f(x, y)$$

Objective function (e.g., cost, environmental impact, safety)

$$\text{s. t.} \quad h(x, y) = 0$$

Process equations (e.g., mass & energy balances)

$$g(x, y) \leq 0$$

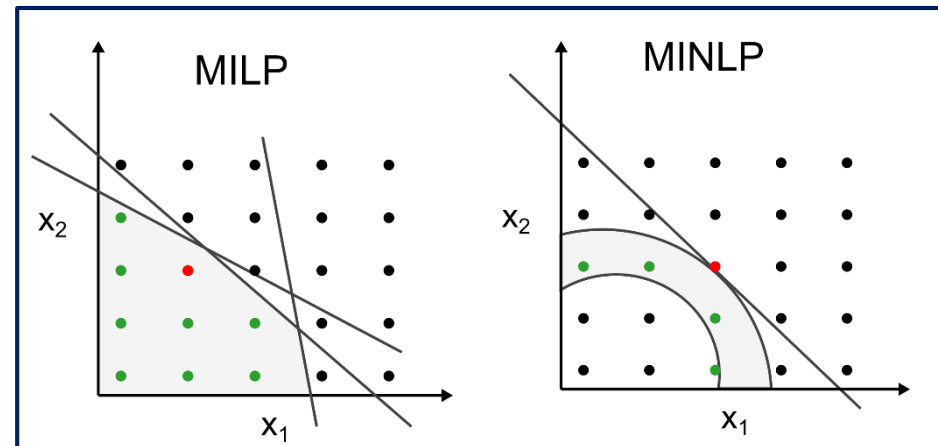
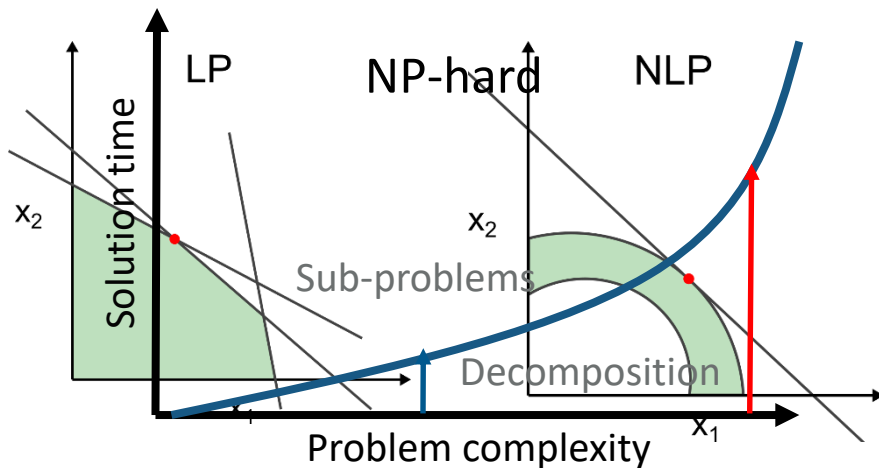
Specifications

$$x \in \mathbb{R}^n$$

Continuous variables (e.g., pressures, temperatures, flows)

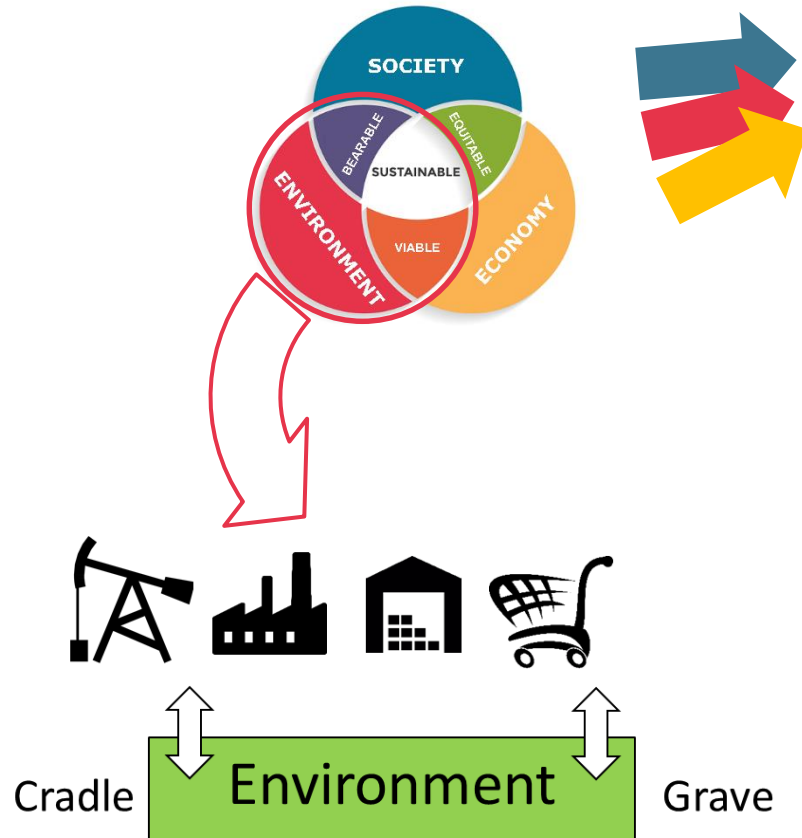
$$y \in \{0,1\}^m$$

Discrete variables (logic decisions)



Multi-objective optimization

1. Several objective functions



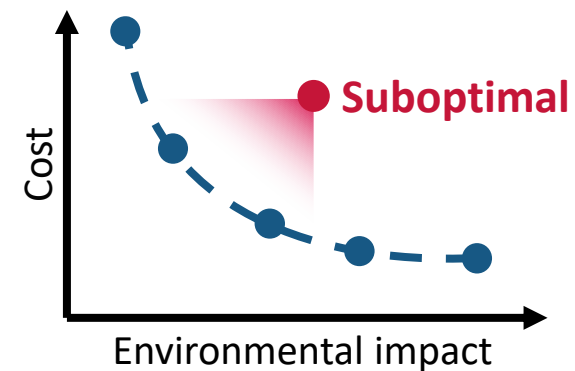
$$\min f_1(x, y), \dots, f_k(x, y)$$

$$\text{s. t.} \quad h(x, y) = 0$$

$$g(x, y) \leq 0$$

$$x \in \mathbb{R}^n, y \in \{0,1\}^m$$

Optimal



2. Life cycle sustainability assessment

3. Pareto optimal solutions

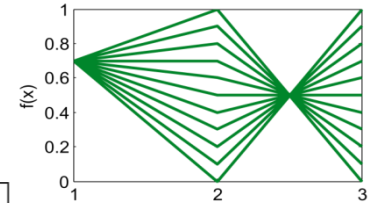
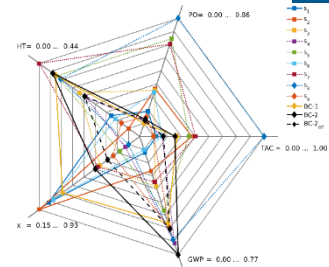
A. Azapagic, R. Clift, *Computers & Chemical Engineering* **23**, 1509-1526 (1999).

I. E. Grossmann, G. Guillén-Gosálbez, *Computers & Chemical Engineering* **34**, 1365-1376 (2010).

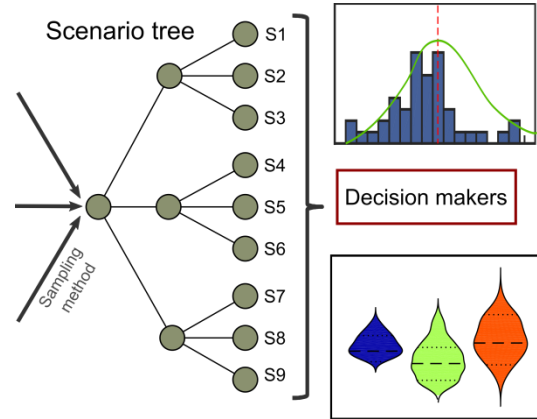
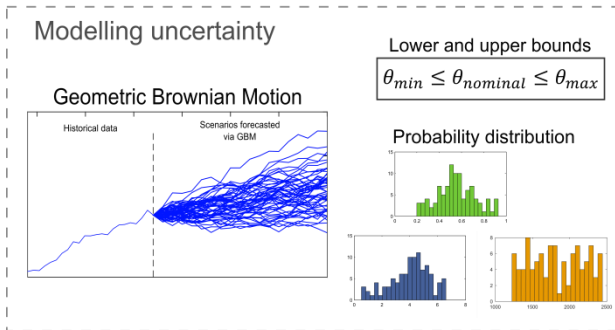
Complexity and solution algorithms

1. How to reduce the **number of objectives**?

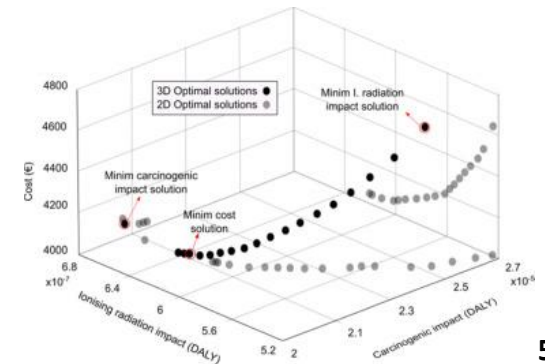
$$\min f_1(x, y), f_2(x, y), f_3(x, y), f_4(x, y), f_5(x, y), f_6(x, y) \quad \longrightarrow \quad \min f_2(x, y), f_4(x, y)$$



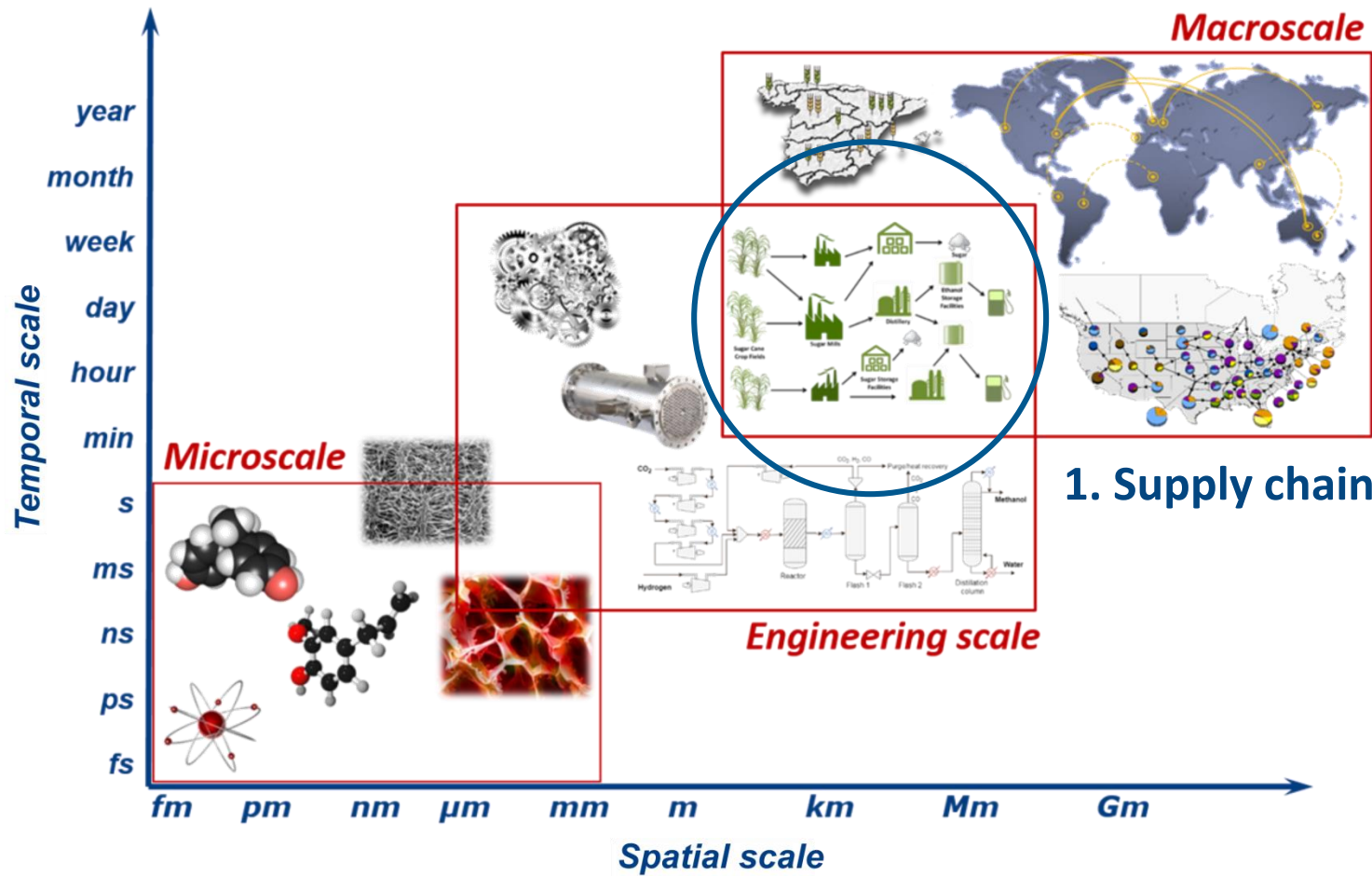
2. How to deal with **uncertainties**?



3. How to select **Pareto solutions**?

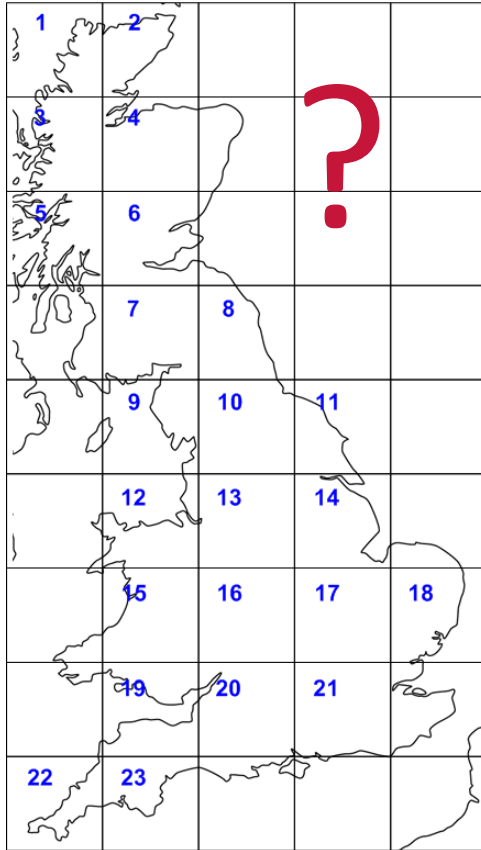


1. G. Guillén-Gosálbez, *Computers & Chemical Engineering* **35**, 1469-1477 (2011).
2. G. Guillén-Gosálbez, I. E. Grossmann, *AIChE Journal* **55**, 99-121 (2009).
3. P. Limleamthong, G. Guillén-Gosálbez, *Journal of Cleaner Production* **164**, 1602-1613 (2017).



1. Supply chains

Supply chains: Hydrogen Supply Chains



Given are:

- Hydrogen demand
- Available **technologies** and potential locations (i.e. grids)
- Investment and operating costs
- GHG emissions



The task is to determine:

- The optimal SC in terms of **cost & environmental impact**



Production

- CH₄ reforming
- Coal gasification
- Biomass gasification



Transportation

- Liquid H₂
- Compressed-gaseous H₂



Storage

- Liquid H₂
- Compressed gas



$$\min_{x, X, N} (TDC(x, X, N), DAM(x, X, N))$$

$$s. t. \quad g(x, X, N) \leq 0$$

$$h(x, X, N) = 0$$

$$x \in \mathbb{R}, X \in \{0,1\}, N \in \mathbb{N}$$

Multi-objective MILP

Mass balance equations

Capacity constraints

Objective function equations

1. Emissions and feedstock requirements: **LCI from cradle to grave**



$$LCI_b = \sum_i \sum_g \sum_p \sum_t PR_{igt} (\omega_{bp}^{PR} + \omega_{bi}^{ST}) + \sum_i \sum_g \sum_{g' \neq g} \sum_{l \in LI_i} \sum_t Q_{igg'lt} \omega_b^{TR} \quad \forall b$$

Production (raw materials, energy consumption and direct emissions)

Storage (compression of hydrogen)

Transportation tasks



2. Translate LCI into damage (CML 2001, Recipe 2008, etc.): **Eco-indicator 99**

$$DAM = \sum_b v_b LCI_b$$

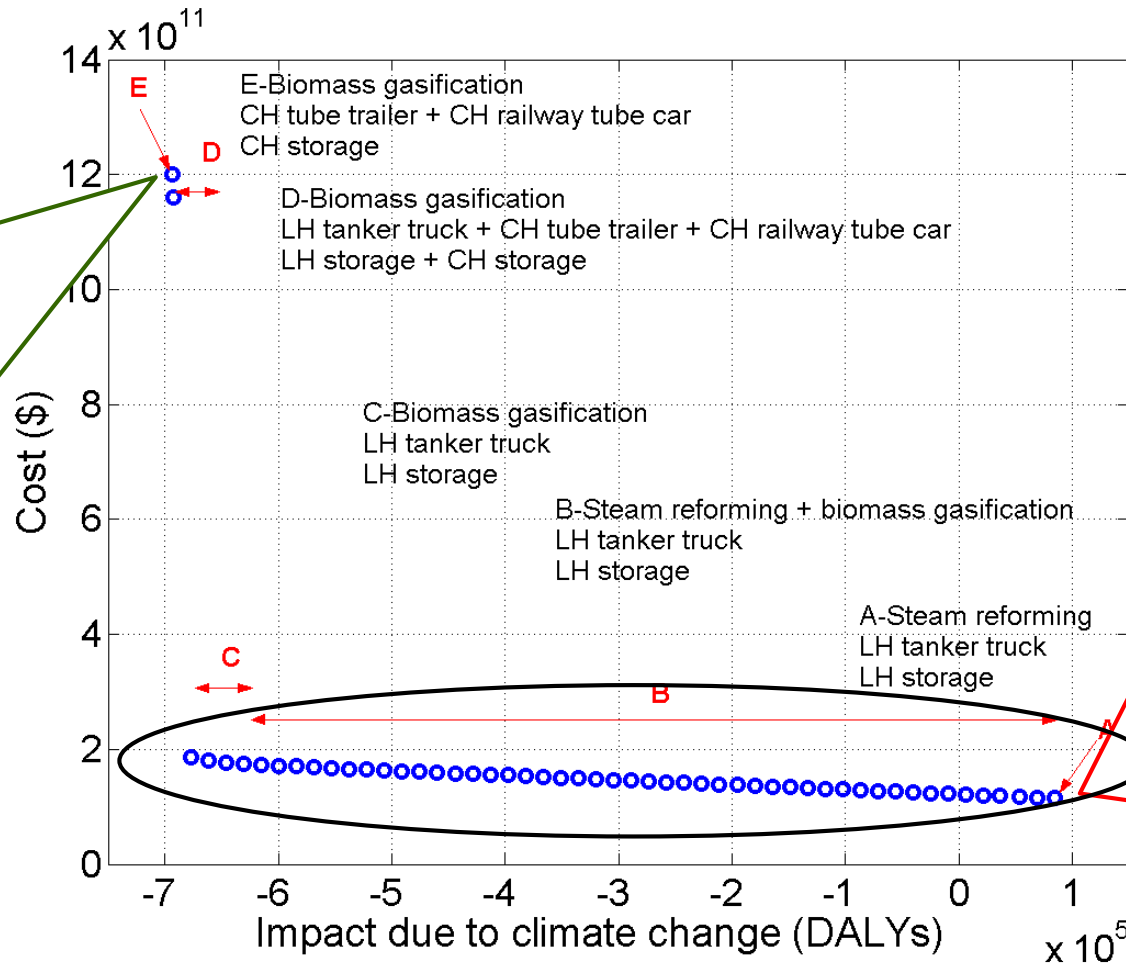
Damage factors translate life cycle inventory into impact



Binary 10,580
 Discrete 940
 Continuous 12,701
 Equations 35,491

Bi-level decomposition + B&B (CPLEX)

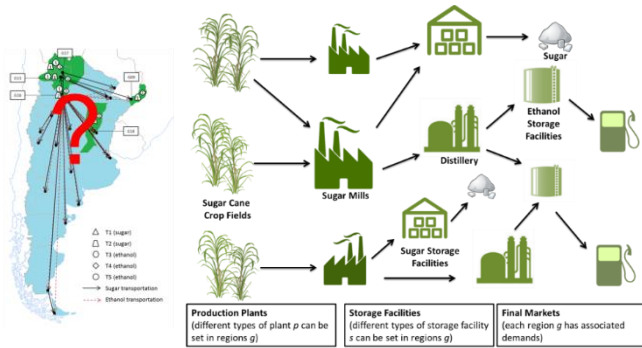
Minimum impact



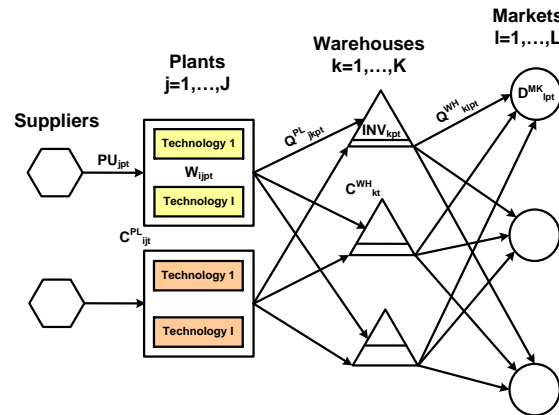
Minimum cost

Other applications

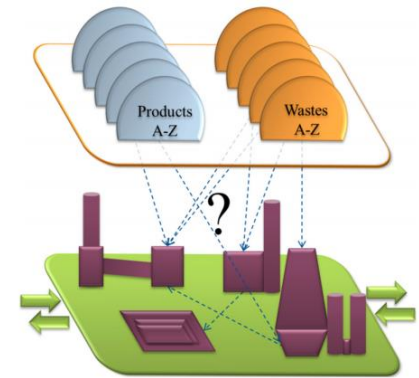
Biomass supply chains¹



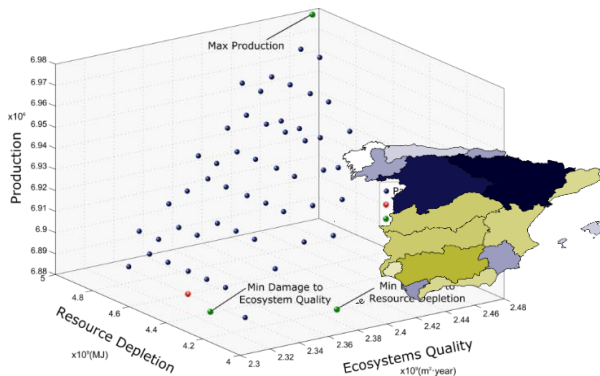
Petrochemicals²



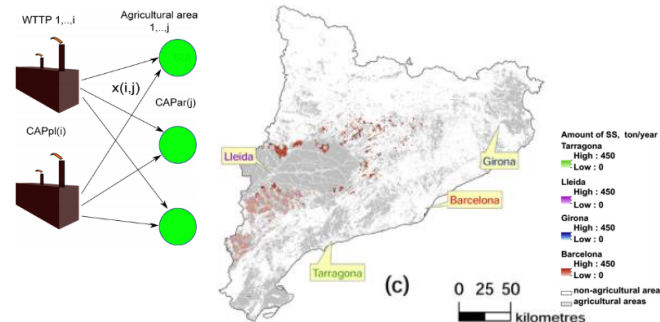
Waste management³



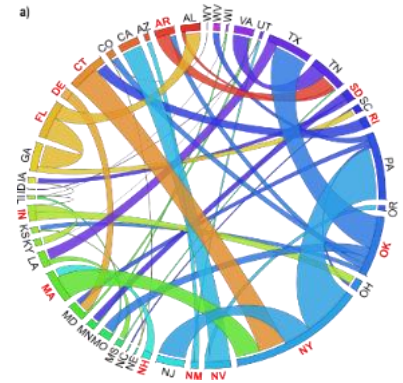
Agriculture planning⁴



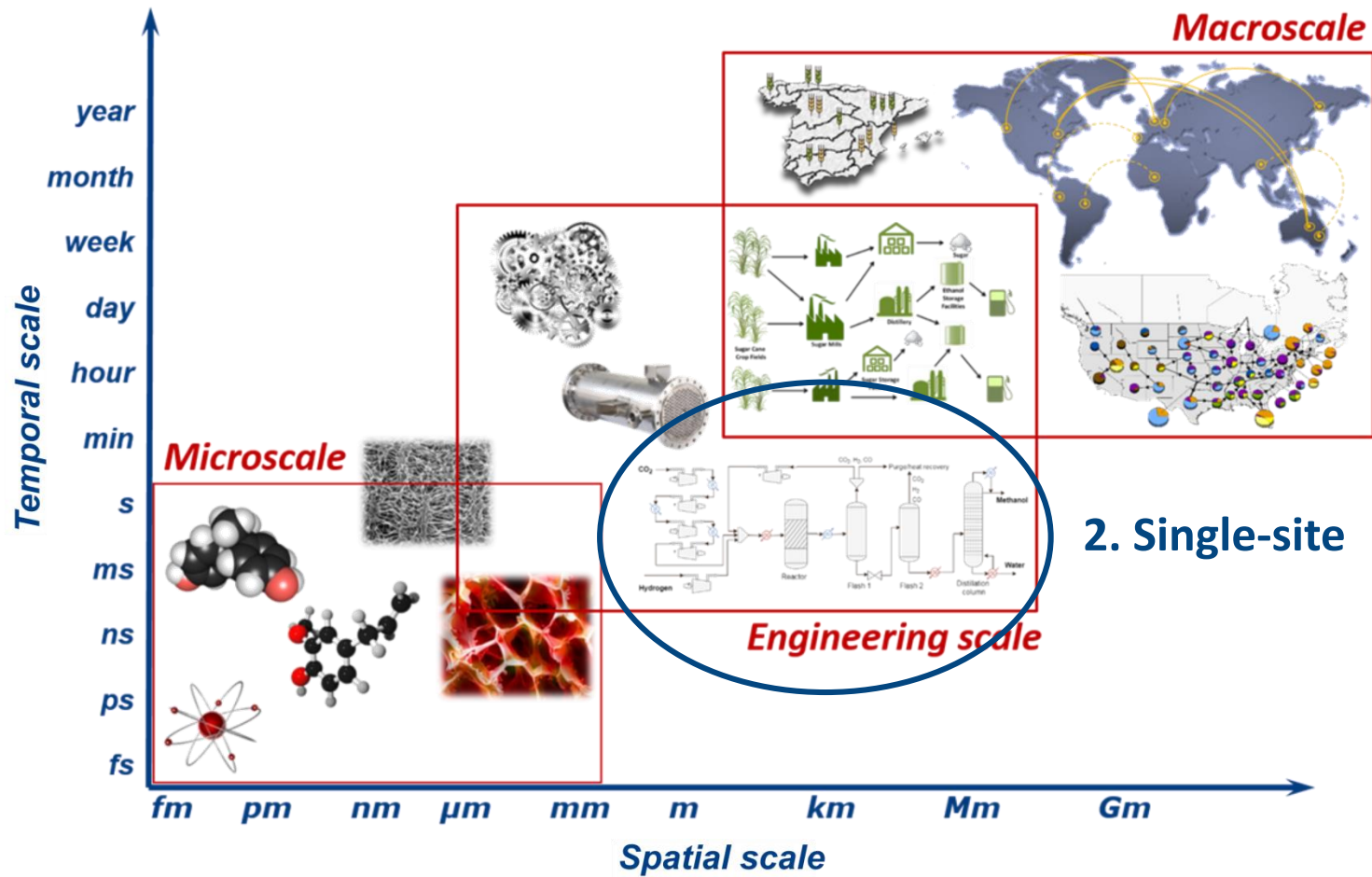
Geographical Information Systems⁵



Input-output analysis⁶



1. F. Mele *et al.*, *Industrial & Engineering Chemistry Research* **50**, 4939-4958 (2011).
2. G. Guillén-Gosálbez, I. E. Grossmann, *AIChE Journal* **55**, 99-121 (2009).
3. C. Vadenbo, S. Hellweg, G. Guillén-Gosálbez, *Conservation and Recycling* **89**, 41-51 (2014).
4. A. Galán-Martín *et al.*, *Journal of Cleaner Production* **140**, 816-830 (2017).
5. P. Vaskan *et al.*, *Environmental Modelling & Software* **46**, 163-169 (2013).
6. D. Cortés-Borda *et al.*, *Energy Policy* **77**, 21-30 (2015).



Hydro-dealkylation of toluene (HDA) process

Given are:

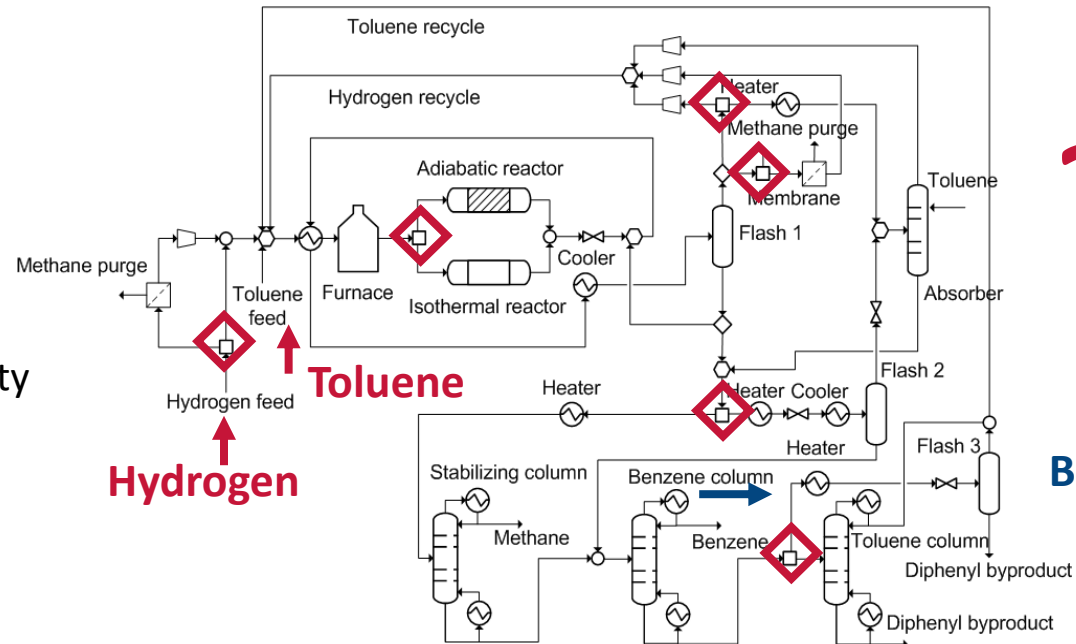
- Product demands and quality
- Cost data
- Environmental LCA data

The task is to determine:

- Topology
- Operating conditions

So as to:

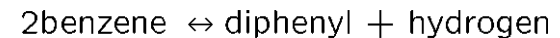
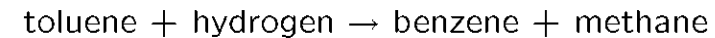
- Minimize the total cost
- Minimize the environmental LCA impact



Toluene
Hydrogen

Benzene

- Single choice stream splitter
- Multiple choice stream splitter
- Single choice stream mixer
- Multiple choice stream mixer



Superstructure optimization using MINLP: HDA process

$$\min (TC(x, y), ECO_{99}(x, y))$$

$$s. t. \quad h(x, y) = 0$$

$$g(x, y) \leq 0$$

$$x \in \mathbb{R}^n, y \in \{0,1\}^m$$

Multi-objective mixed-integer nonlinear program (MINLP)

Mass & energy balances constraints

Thermodynamic constraints

Short-cut methods LCA

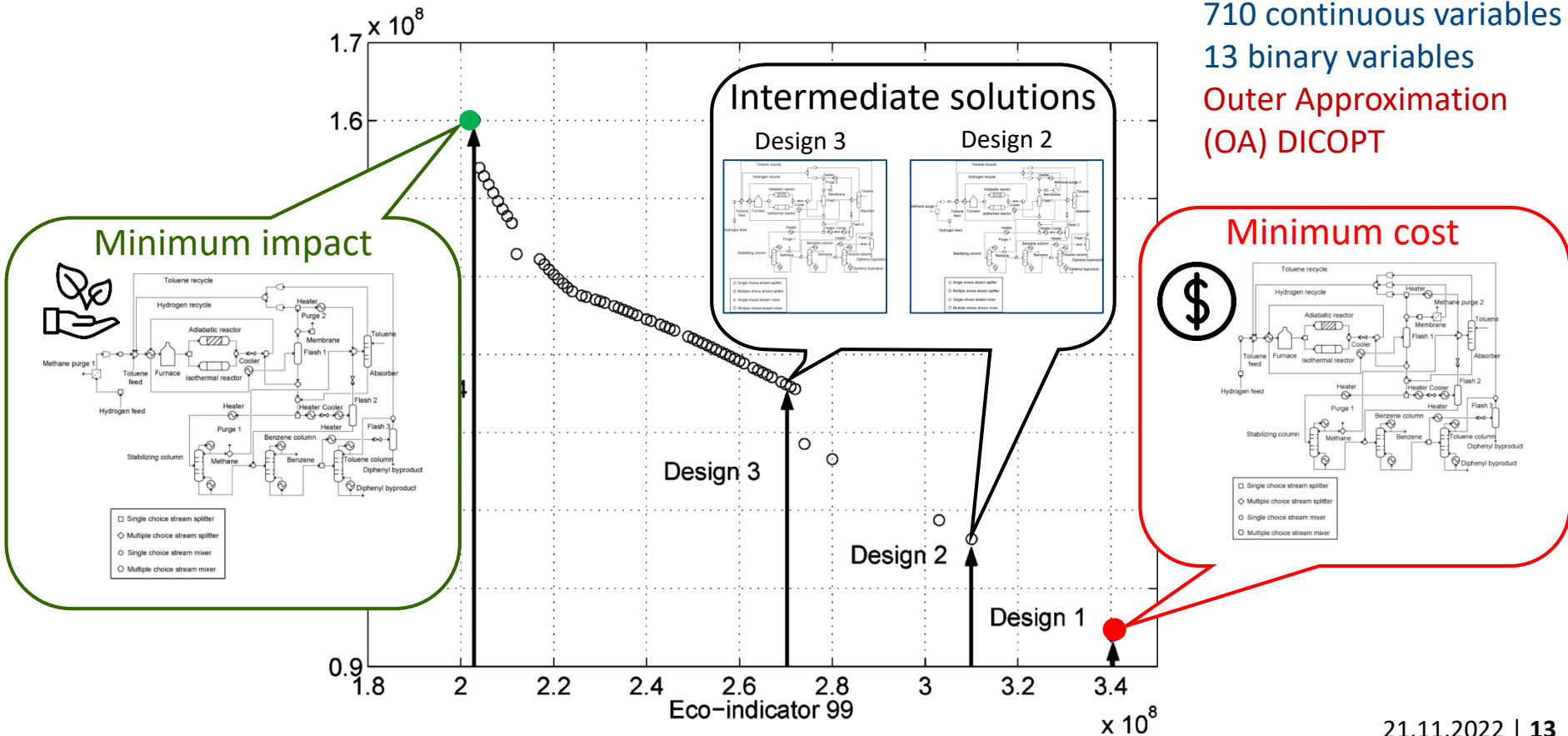
MINLP

724 constraints

710 continuous variables

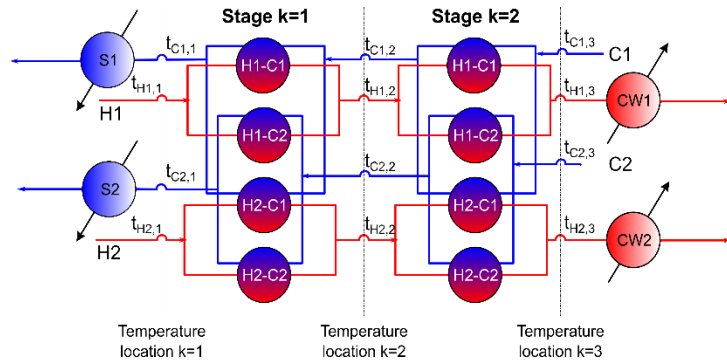
13 binary variables

Outer Approximation (OA) DICOPT

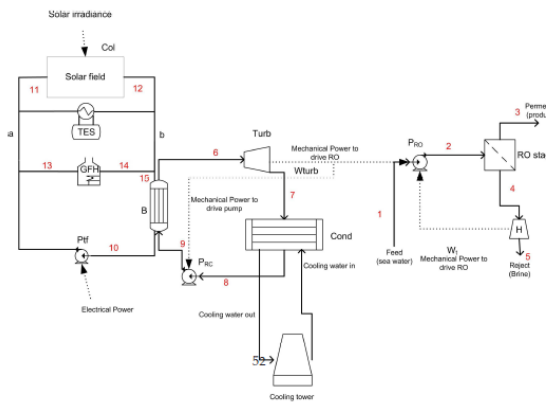


Other applications

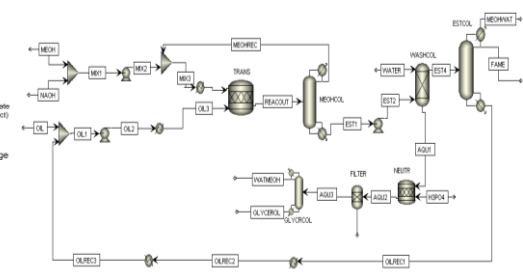
Heat exchangers¹



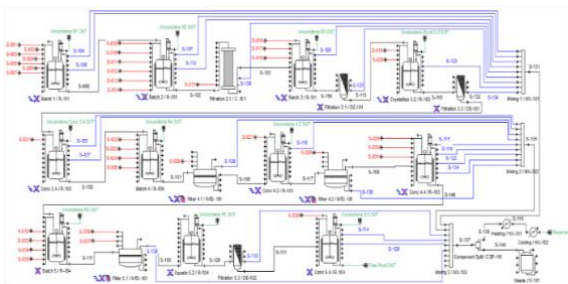
Thermodynamic cycles²



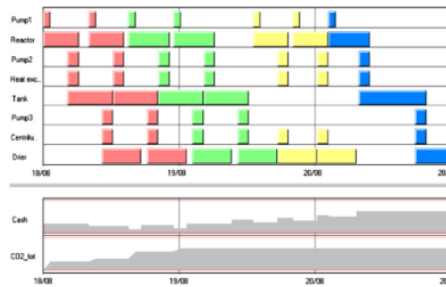
Biofuels³



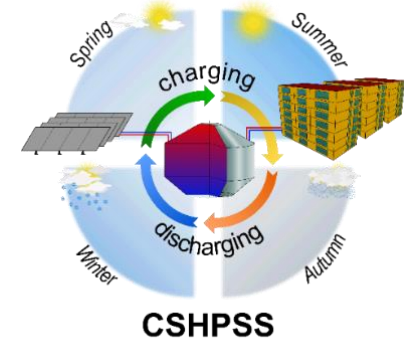
Pharmaceutical processes⁴



Scheduling⁵

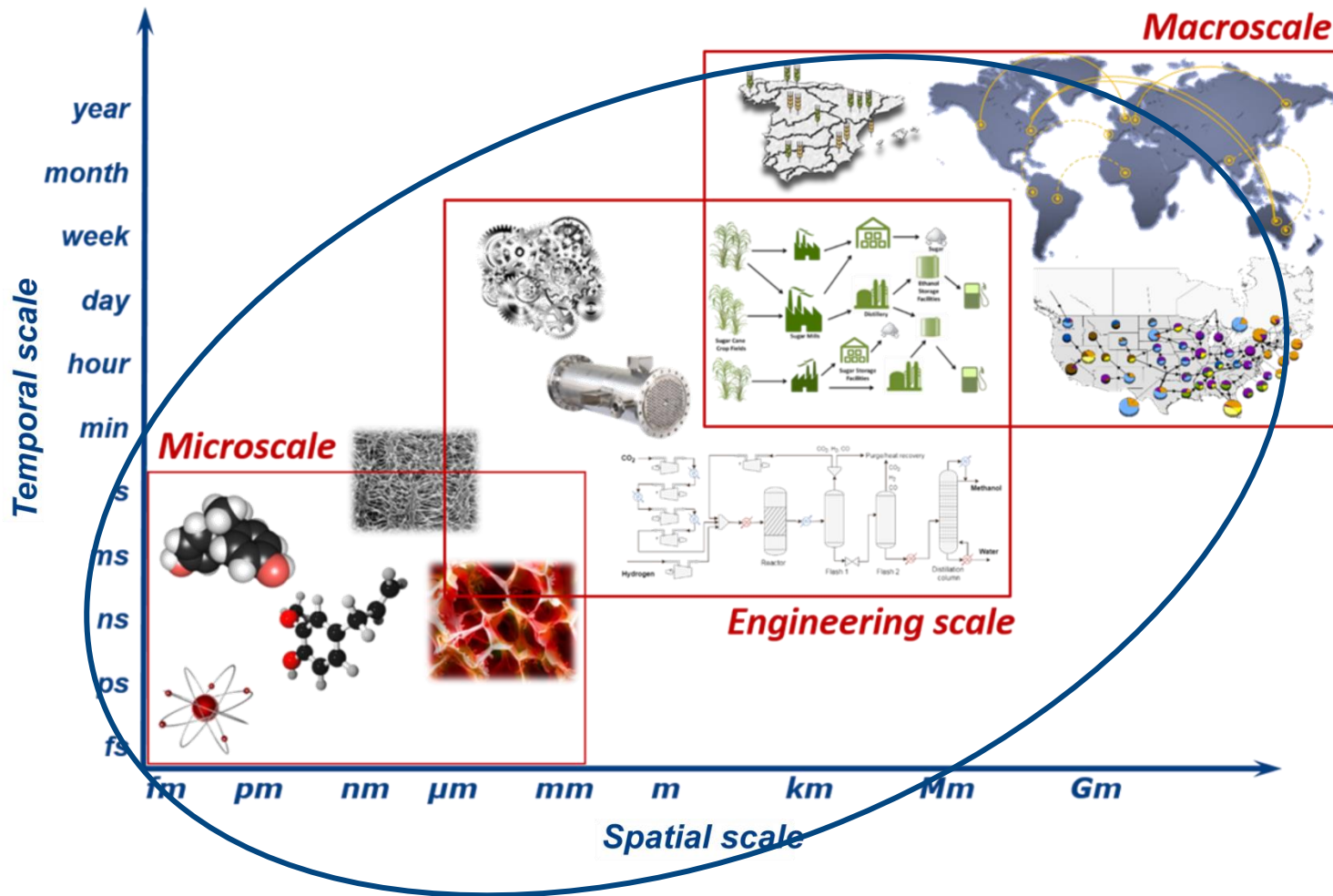


Buildings⁶



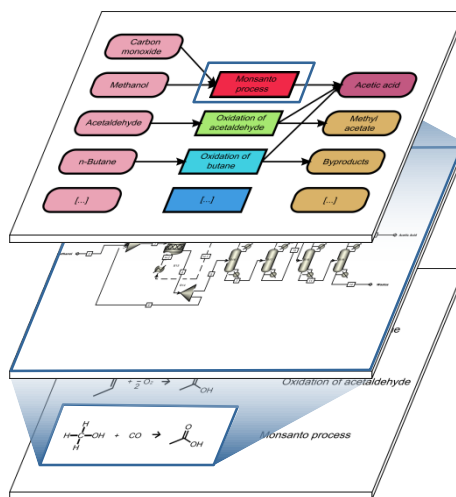
1. P. Vaskan, G. Guillén-Gosálbez, L. Jiménez, *Applied Energy* **98**, 149-161 (2012).
2. R. Salcedo *et al.*, *Desalination* **286**, 358-371 (2012).
3. R. Brunet *et al.*, *Chemical Engineering Research & Design* **93**, 203-212 (2015).
4. R. Brunet, G. Guillén-Gosálbez, L. Jiménez, *Journal of Cleaner Production* **76**, 55-63 (2014).
5. M. J. Arbiza *et al.*, *Journal of Cleaner Production* **16**, 233-244 (2008).
6. V. Tulus *et al.*, *Applied Energy* **181**, 549-561 (2016).

PSE tools for a more sustainable chemical industry

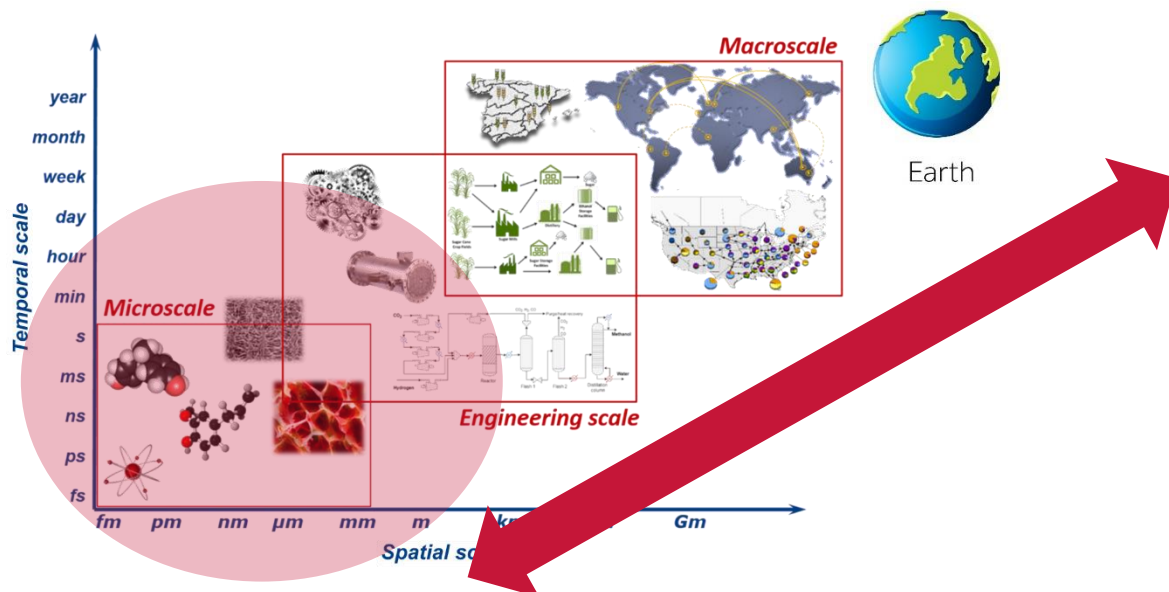


Impact quantification based on process modelling

3. Sector level/LCA
2. Process flowsheets
1. Chemical routes



A proper assessment of chemical routes requires a **multi-scale approach**

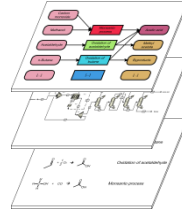


Streamlined LCA methods for chemicals

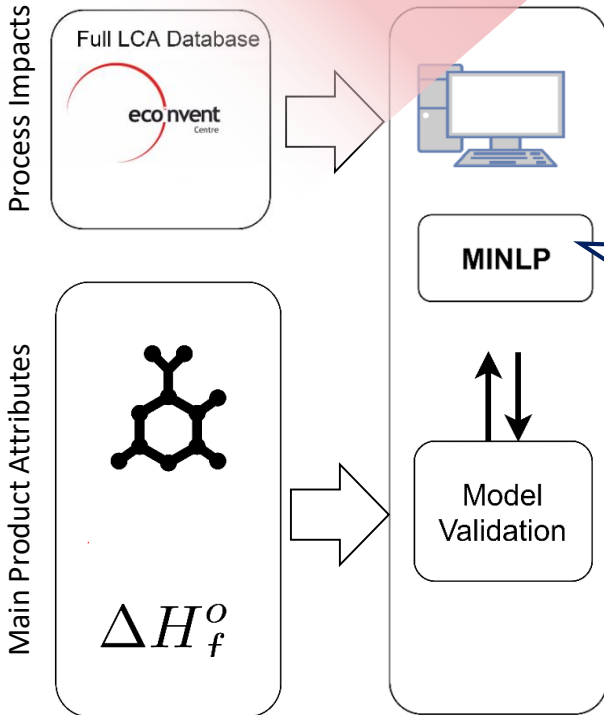
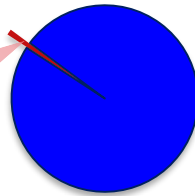
1 → 3 Streamlined LCA methods

~1 Million registered chemicals

LCA data of only a few thousand chemicals

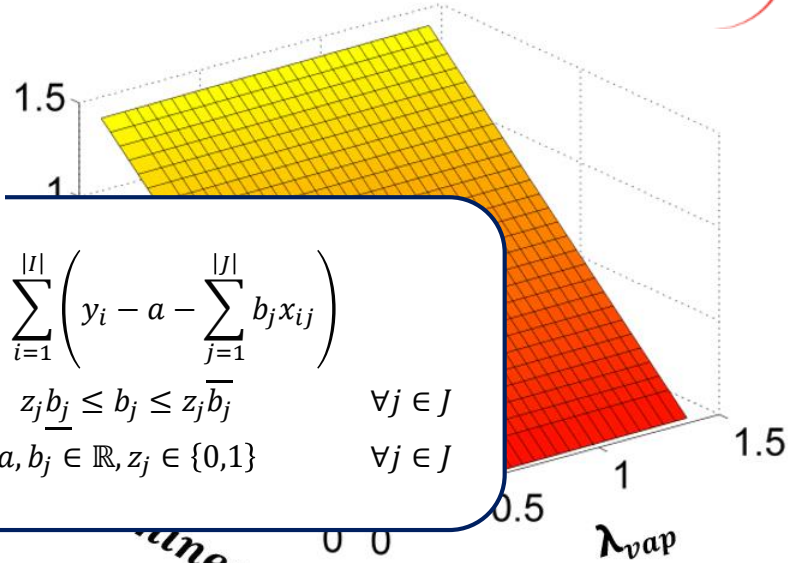


Automatic Data Regression
+ Feature Selection



$$\begin{aligned}
 \text{Min } F & \sum_{i=1}^{|I|} \left(y_i - a - \sum_{j=1}^{|J|} b_j x_{ij} \right) \\
 \text{s. t. } & z_j \underline{b}_j \leq b_j \leq z_j \overline{b}_j \quad \forall j \in J \\
 & a, b_j \in \mathbb{R}, z_j \in \{0,1\} \quad \forall j \in J
 \end{aligned}$$

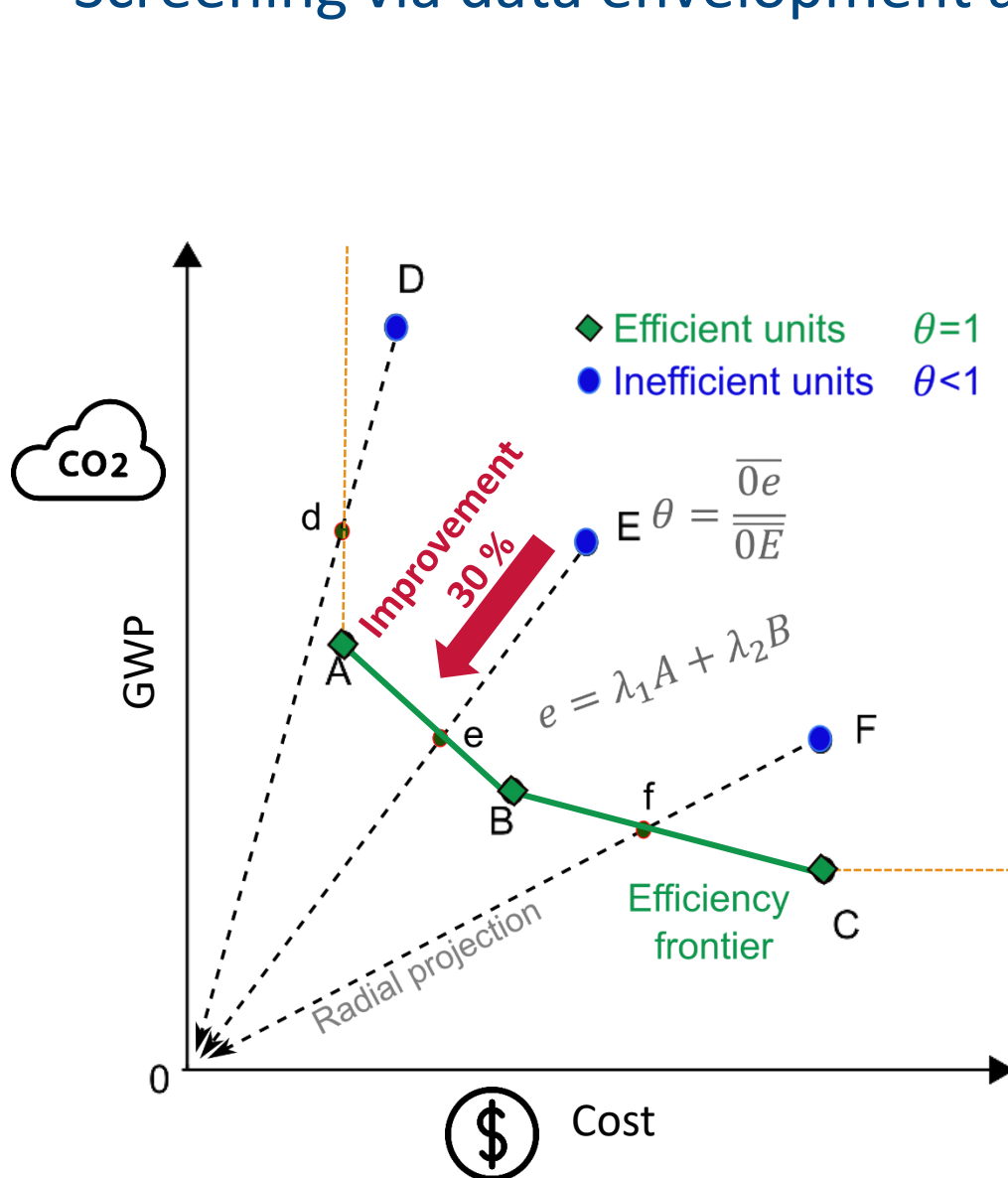
MIQCP
200 continuous
32 binary
315 equations
CPLEX



$$\begin{aligned}
 \mathbf{GWP} &= 75.2 + 0.786 \cdot \mathbf{amines} \\
 &+ 3.1 \cdot 10^{-8} \cdot \lambda_{vap}
 \end{aligned}$$

~30% error

Screening via data envelopment analysis

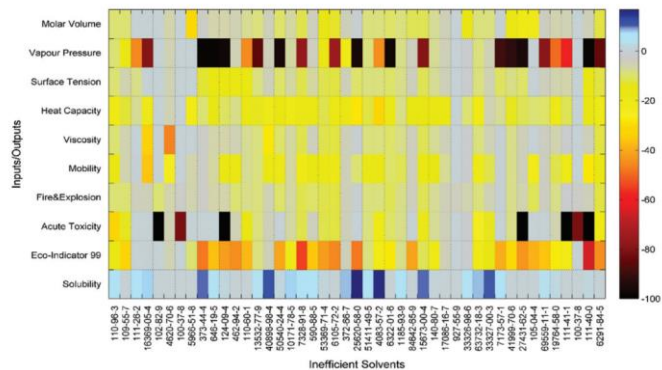
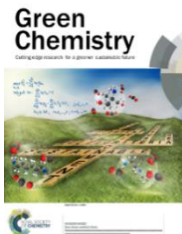


How to improve?

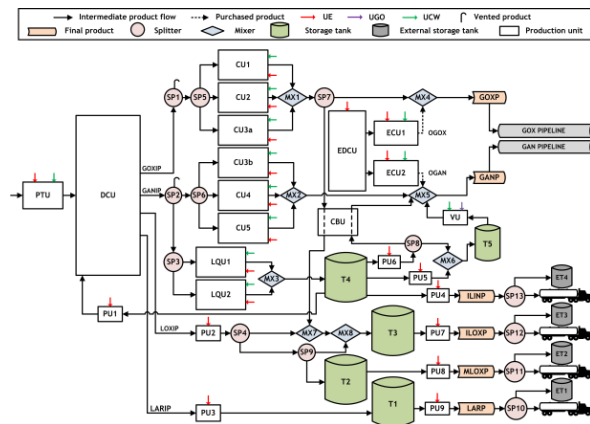
- A
- B
- C
- D
- E
- F

$$\begin{aligned}
 Z &= \min \theta_o - \varepsilon \left(\sum_{r \in R} S_r^+ + \sum_{i \in I} S_i^- \right) \\
 \text{s. t. } & \sum_{j \in J} \lambda_j x_{ij} + S_i^- = \theta_o x_{io} \quad \forall i \in I \\
 & \sum_{j \in J} \lambda_j y_{rj} - S_r^+ = y_{ro} \quad \forall r \in R \\
 & \lambda_j, S_i^-, S_r^+ \geq 0 \quad \forall j \in J, i \in I, r \in R
 \end{aligned}$$

Screening of chemicals for CO₂ capture¹

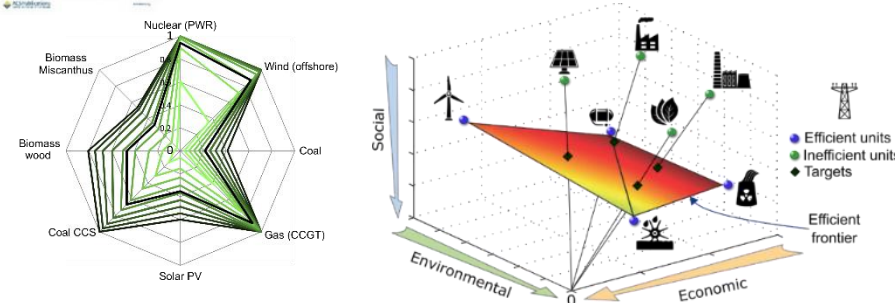
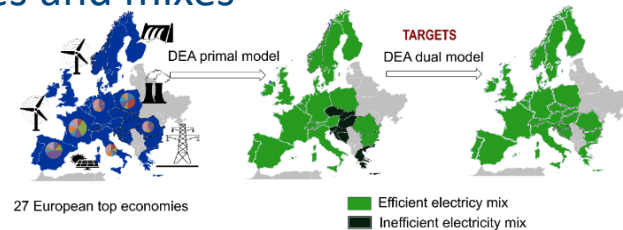


Efficiency assessment of industrial gases facilities³

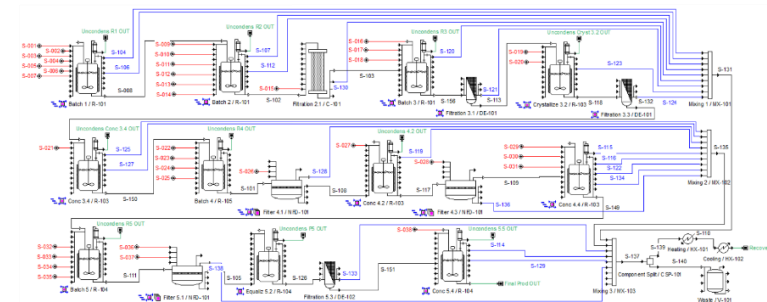


1. P. Limleamthong *et al.*, *Green Chemistry* **18**, 6468-6481 (2016).
2. A. Ewertowska *et al.*, *Journal of Cleaner Production* **116**, 13-22 (2016).
3. D. Fernández *et al.*, *Applied Energy* **212**, 1563-1577 (2018).
4. A. Mio *et al.*, *Industrial & Engineering Chemistry Research* **57**, 7946-7960 (2018).

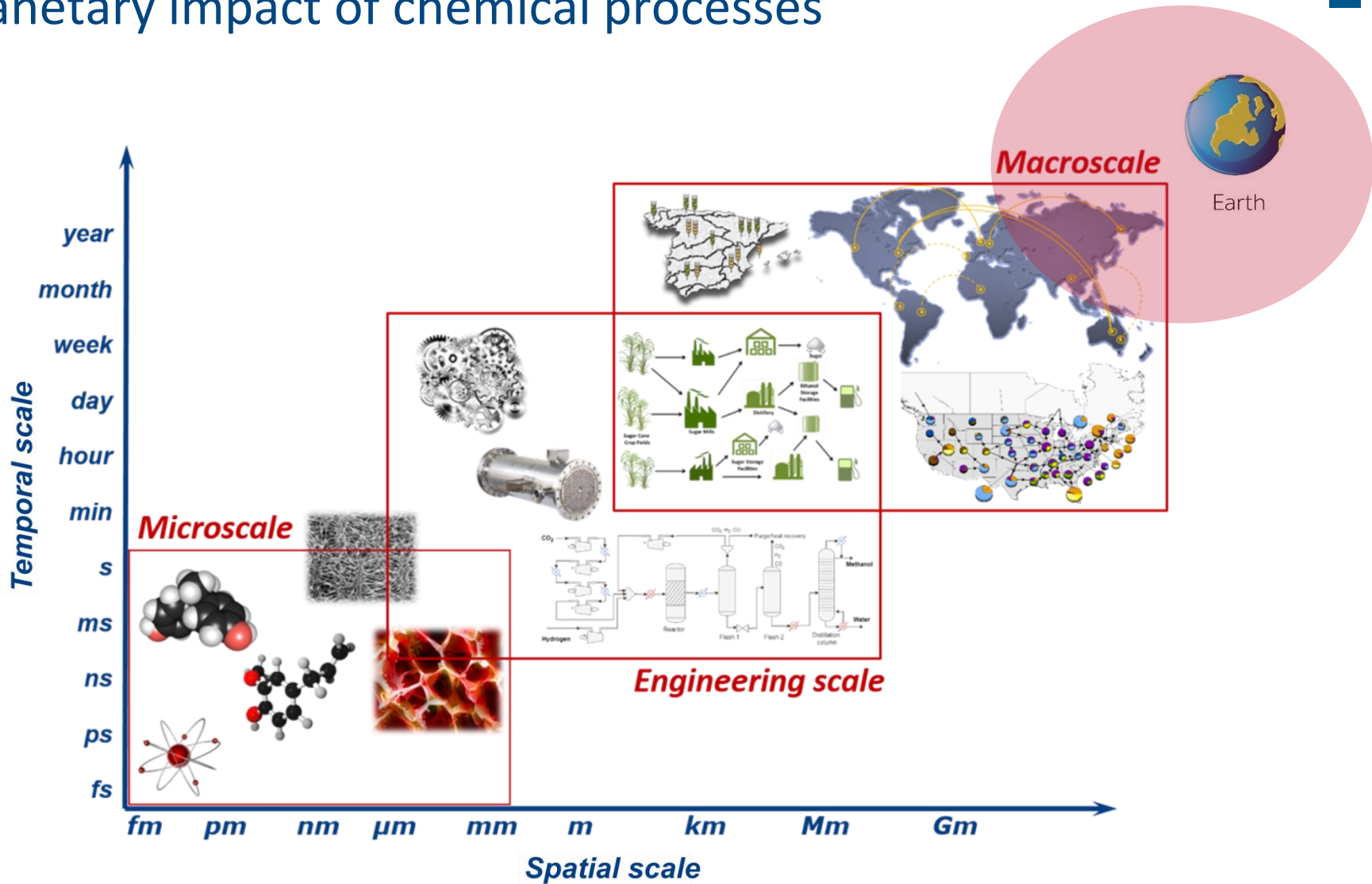
Eco-efficiency assessment of energy technologies and mixes²



Eco-efficiency assessment of pharma processes⁴



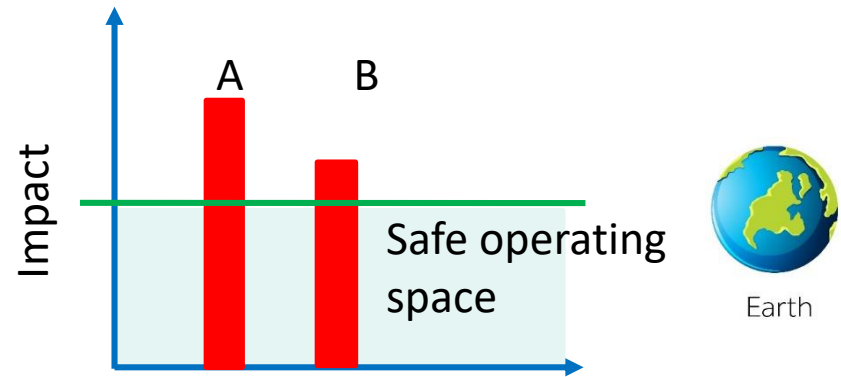
Planetary impact of chemical processes



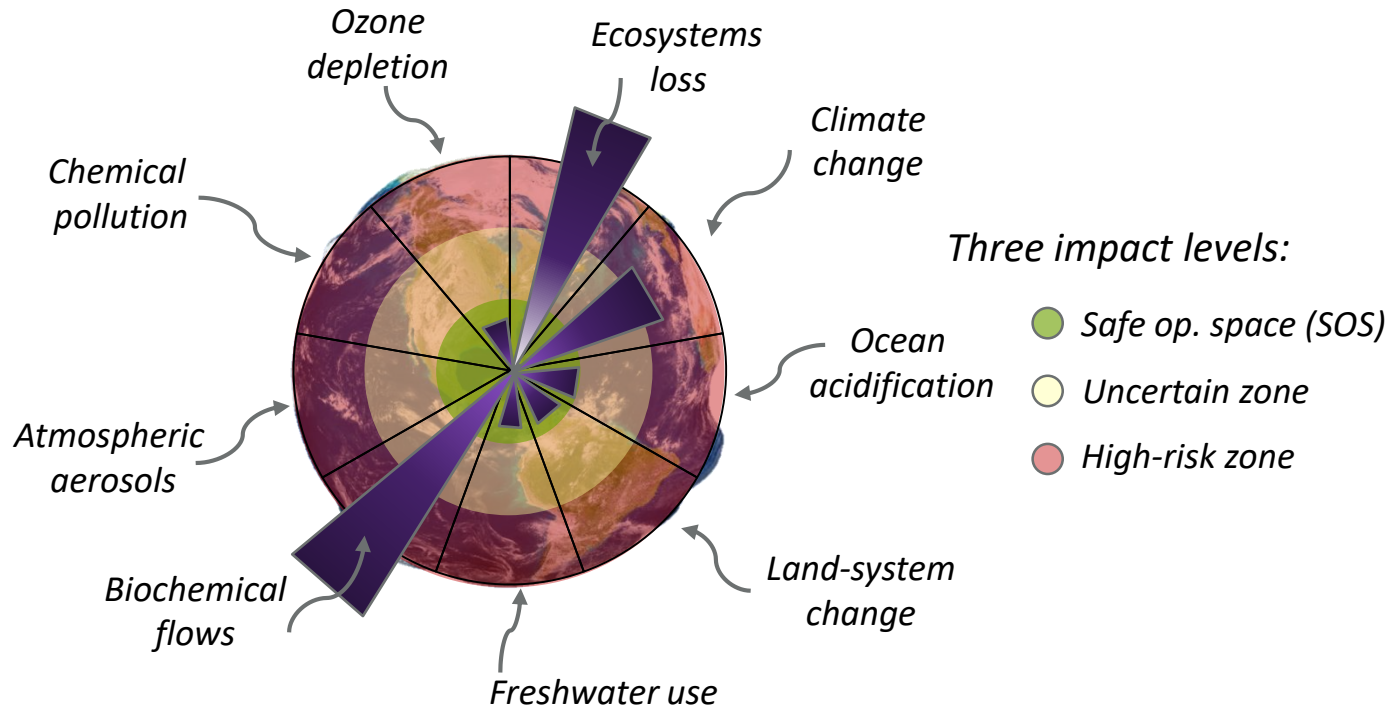
Earth

How to quantify the impact?

Current metrics hard to interpret



Planetary boundaries (PBs) defined on nine **Earth-system processes** key for resilience*



Computing the planetary impact of industrial systems

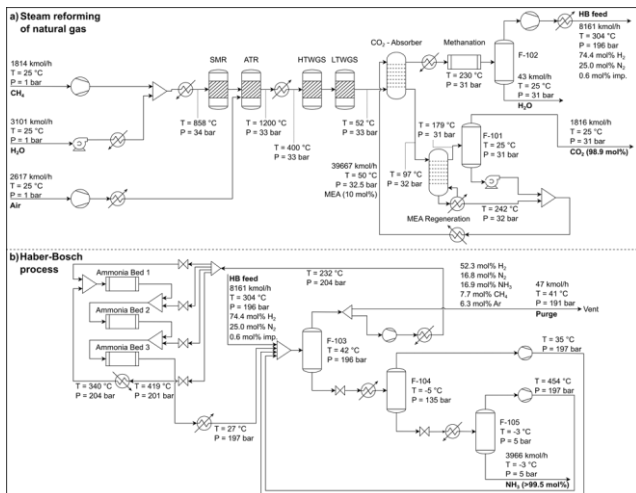
Evaluate the impact of a chemical process relative to the Earth's ecological limits:

1. Downscale the PBs to the industrial system



$$\text{SoS}_p \cdot \frac{\text{GVA}^{\text{Process}}}{\text{GVA}^{\text{Total}}} = \text{SoSOS}_p \quad \forall p$$

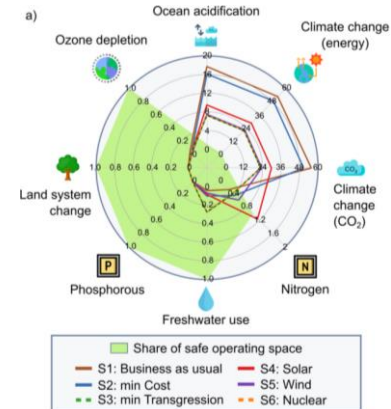
2. Link emissions and waste (life cycle inventory entries) to the associated planetary impact



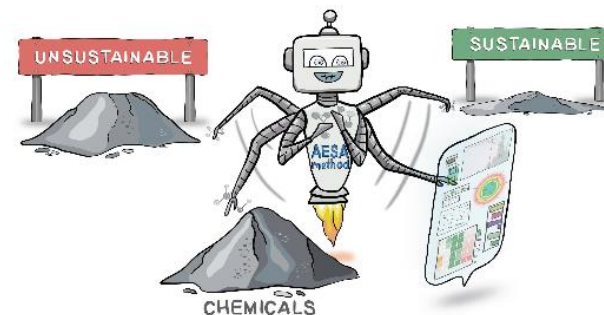
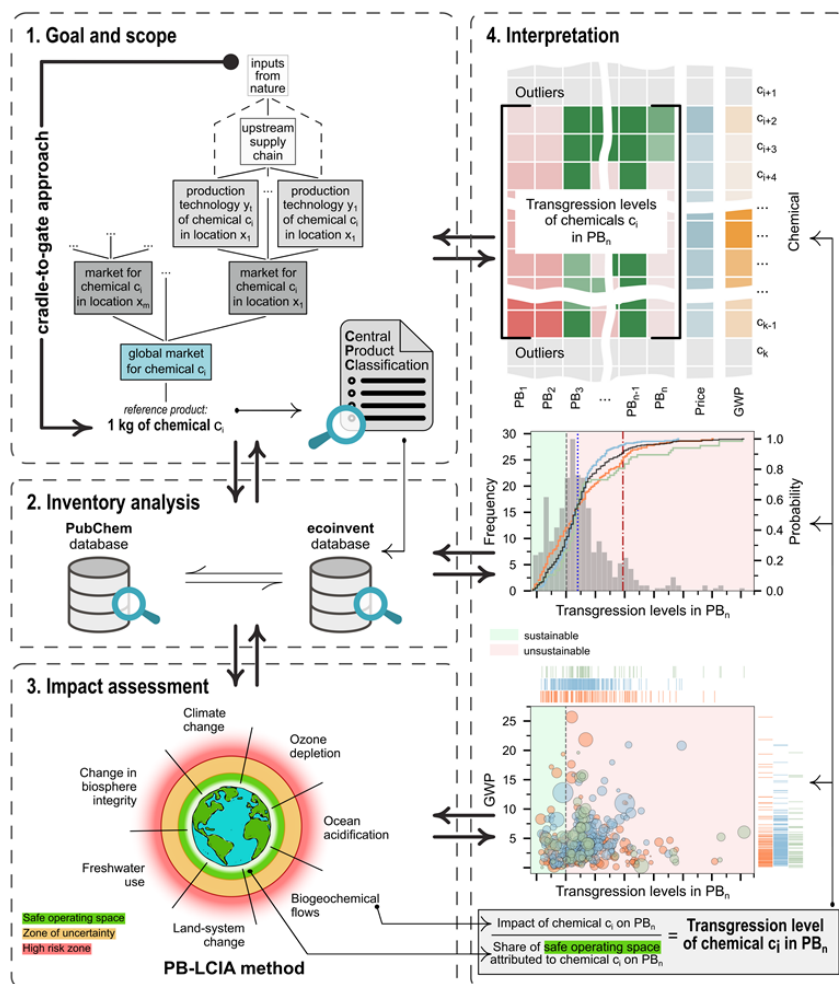
$$\text{IMP}_p = \sum_i \text{CF}_{ip} \text{LCI}_i \quad \forall p$$

$$\text{Trangression}_p = \frac{\text{IMP}_p}{\text{SoSOS}_p}$$

$$\text{Trangression}_p \begin{cases} < 1 \rightarrow \text{Sustainable} \\ > 1 \rightarrow \text{Unsustainable} \end{cases} \quad \forall p$$



Are current fossil-based chemicals sustainable?

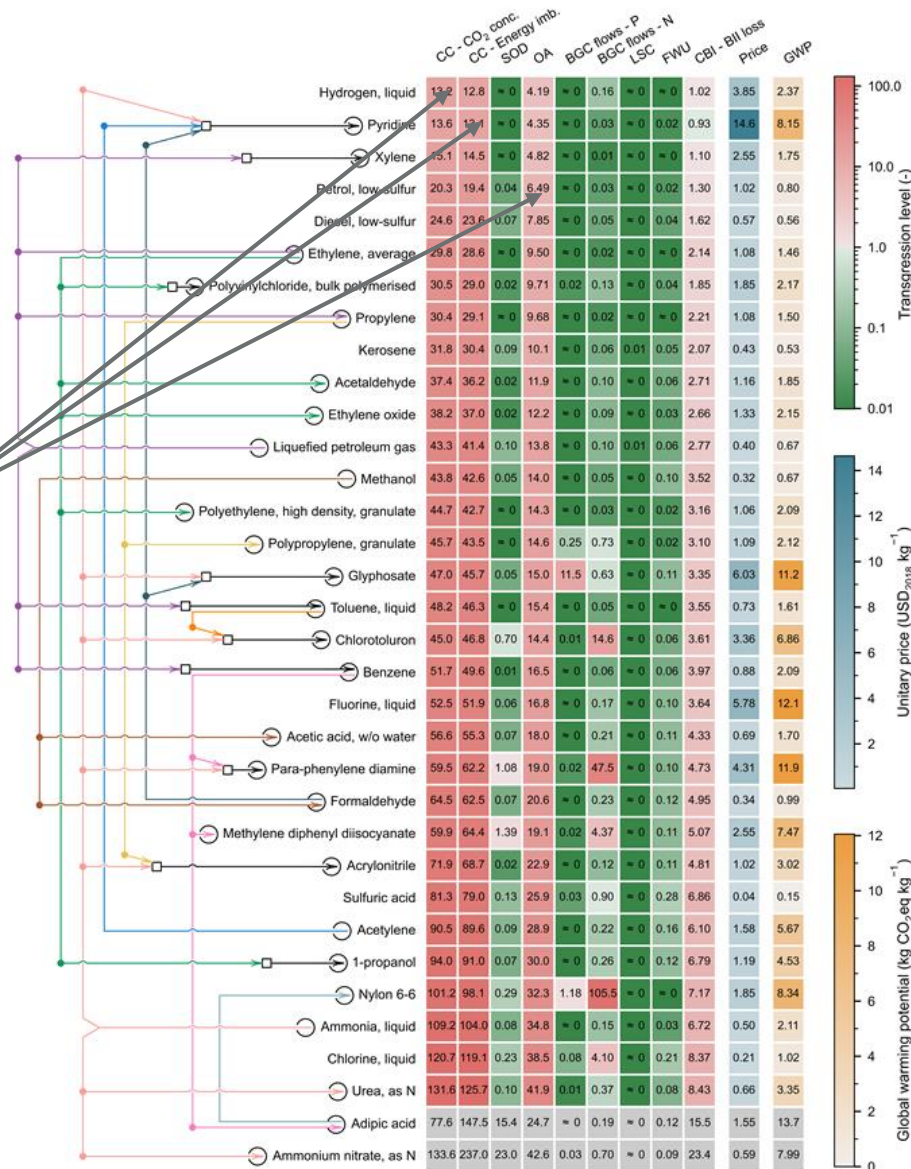


- **492** Chemicals (organic, inorganic, petroleum-derived, fertilizers, pesticides, plastics and rubber, pharmaceutical products, and perfumes)
- **9** Planetary boundaries

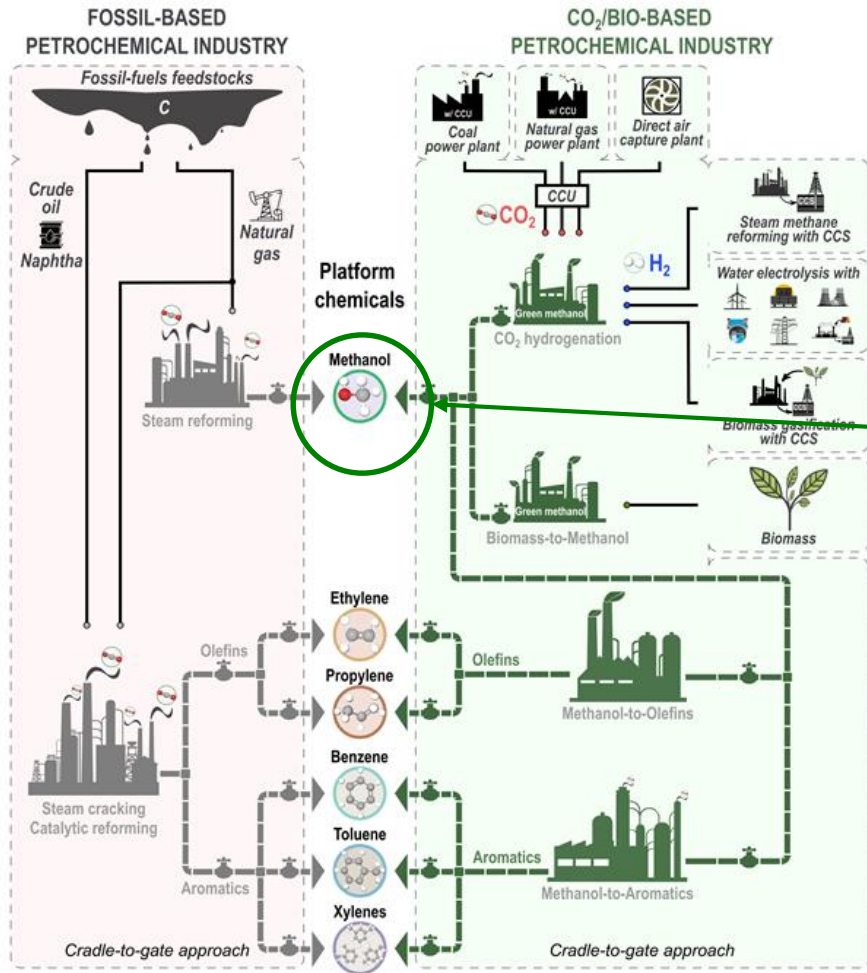
Planetary footprints of widespread chemicals

• **99.4%** are unsustainable

• **Carbon-related PBs** are more heavily transgressed



Could renewable-carbon help to operate within the PBs?



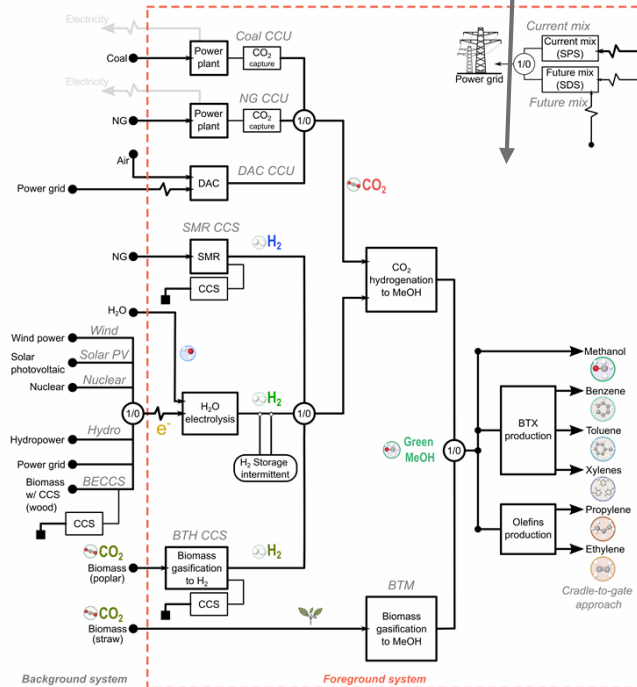
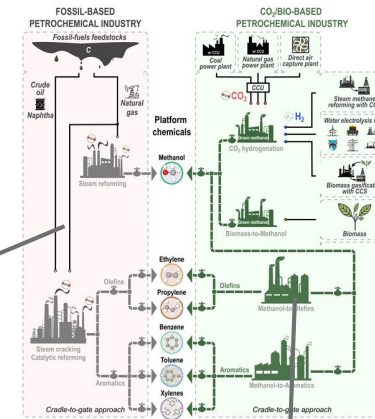
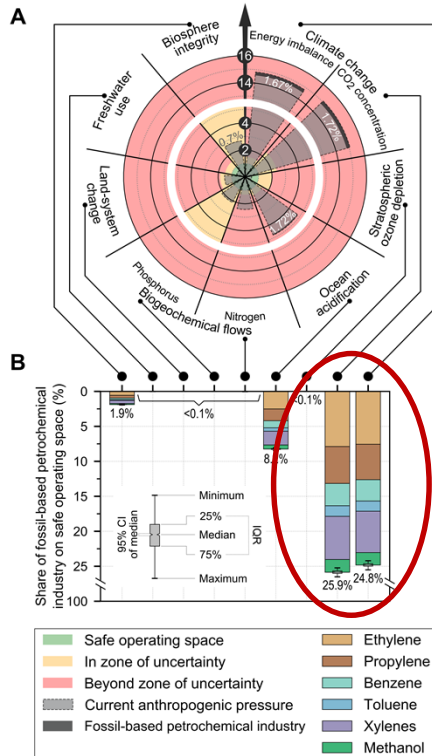
Á. Galán-Martín *et al.*, *One Earth* **4**, 565-583 (2021).

A. González-Garay *et al.*, *Energy & Environmental Science* **12**, 3425-3436 (2019).

A. Kätelhön *et al.*, *PNAS* **116**, 11187-11194 (2019).

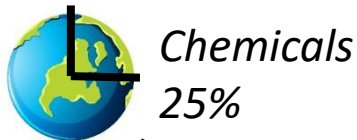
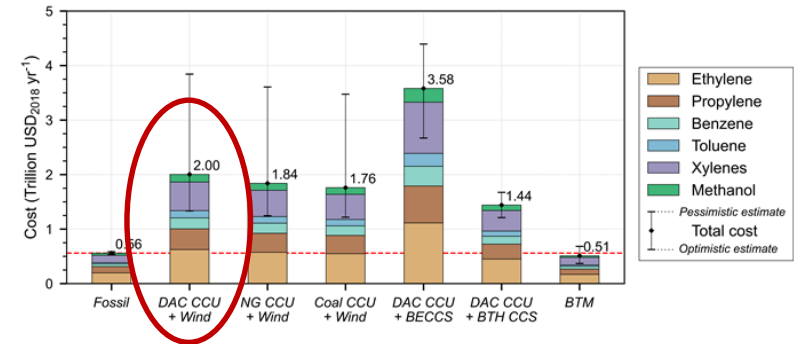
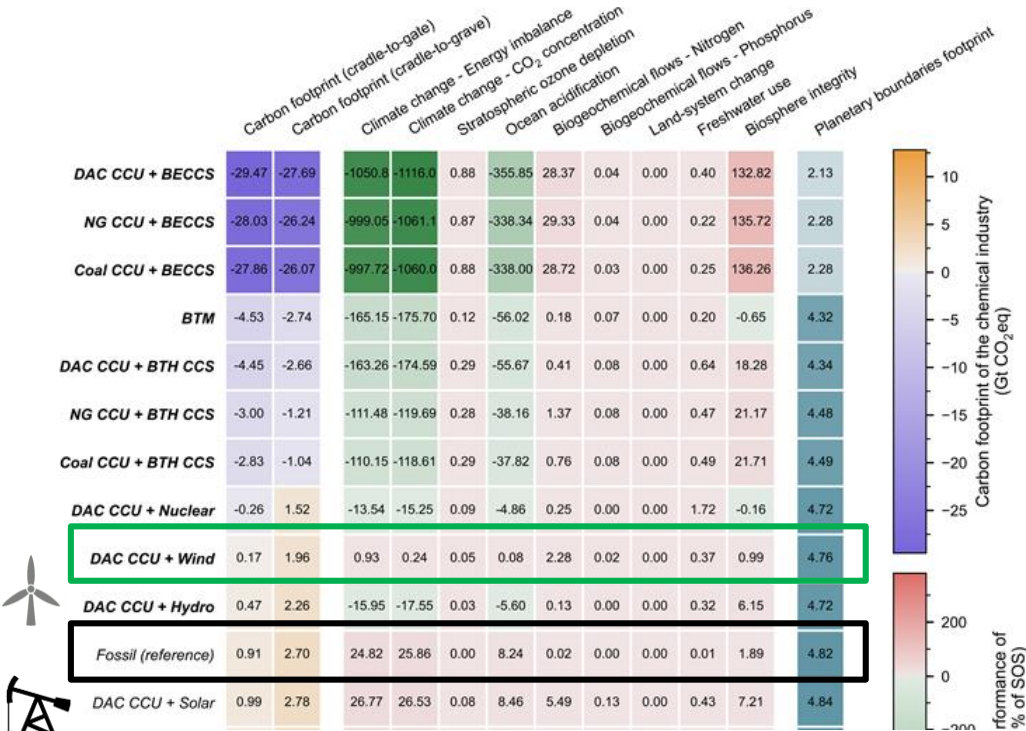
Would a green methanol chemical industry be sustainable?

- Fossil chemicals consume **25% of the planet**
- 54 alternative scenarios based on green methanol



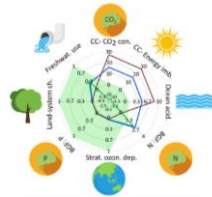
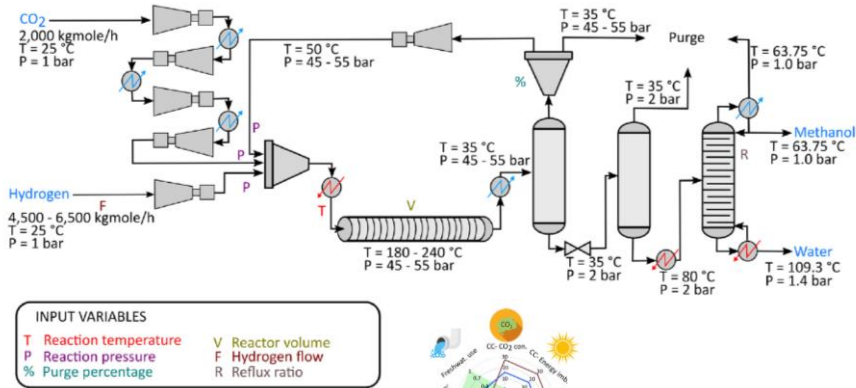
Assessing the chemical sector's impact based on the PBs

- From **25% (fossil carbon)** to **1% (renewable carbon)** of the planet
- Renewable carbon routes are too expensive: **4-fold** increase in cost

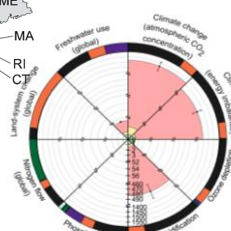
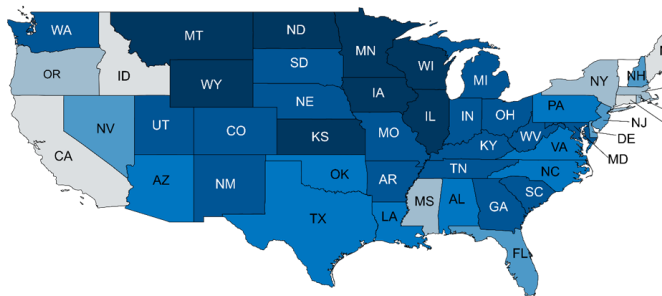
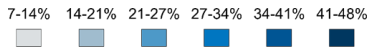


Other applications

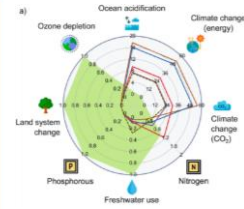
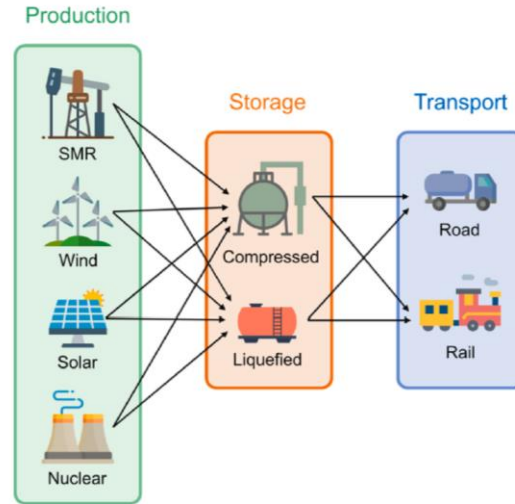
Process design¹



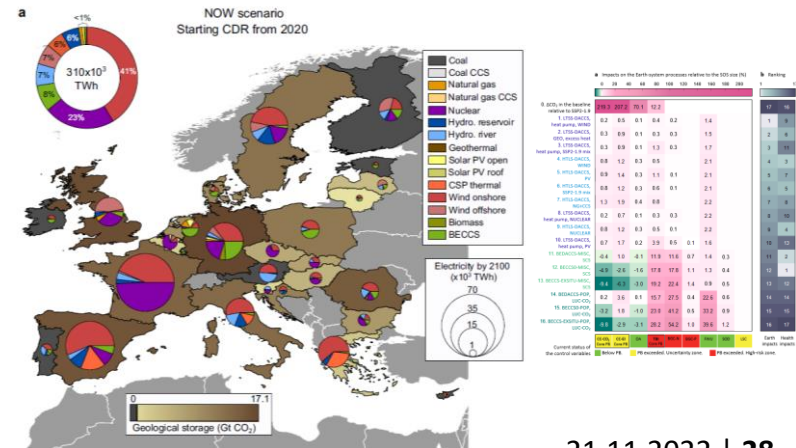
Power systems³



Supply chain design²



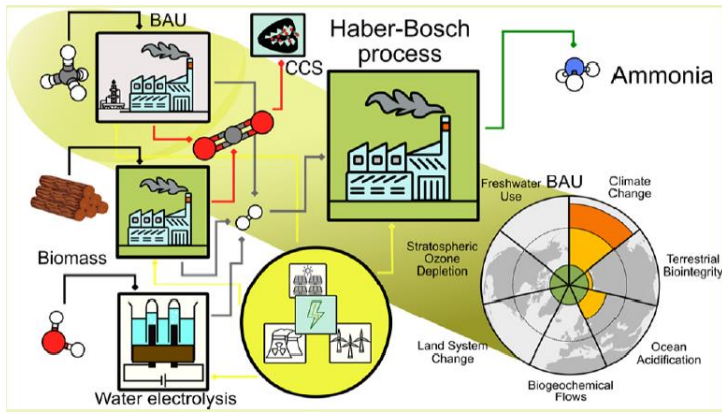
Negative emissions technologies^{4,5}



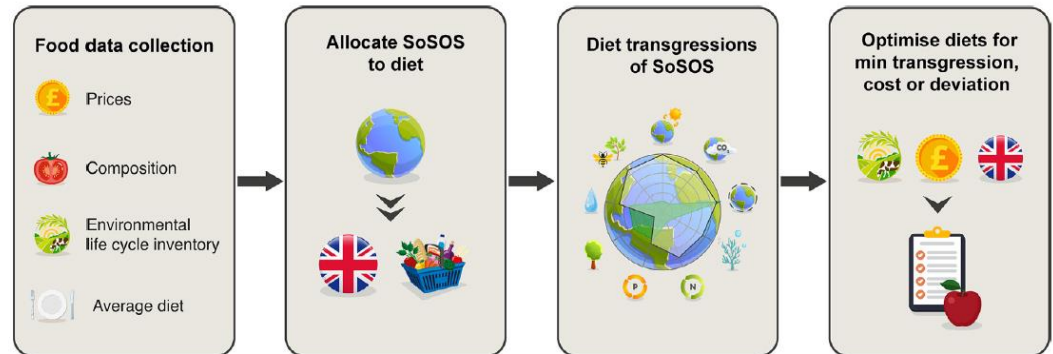
1. D. Vázquez, G. Guillén-Gosálbez, *Chemical Engineering Science* **246**, 116891 (2021).
2. M. Ehrenstein *et al.*, *Applied Energy* **276**, 115486 (2020).
3. M. Algunaibet *et al.*, *Energy & Environmental Science* **12**, 1890-1900 (2019).
4. S. Cobo *et al.*, *Nature Communications* **13**, 1-11 (2022).
5. Á. Galán-Martín *et al.*, *Nature Communications* **12**, 1-12 (2021).

Other applications

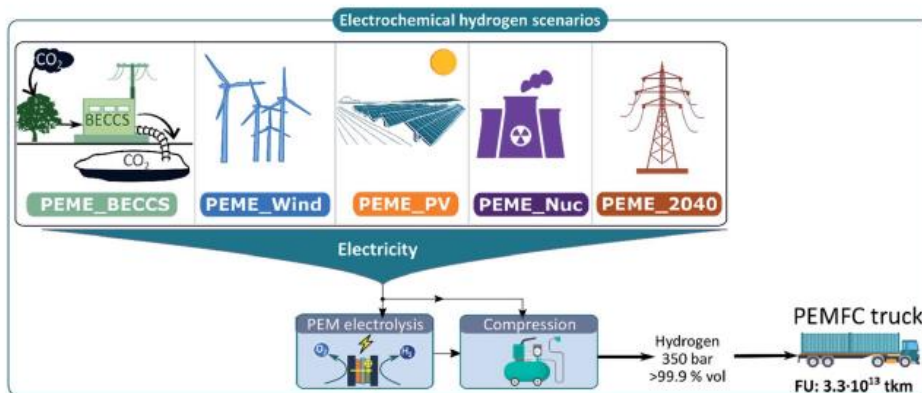
Process design¹



Diets²



E-fuels³



1. SC D'Angelo *et al.*, *ACS Sustainable Chemistry & Engineering* **9**, 9740-9749 (2021).
2. E. Lucas, M. Guo, G. Guillén-Gosálbez, *Sustainable Production and Consumption* **28**, 877-892 (2021).
3. A. Valente *et al.*, *Sustainable Energy & Fuels* **5**, 4637-4649 (2021).

Future steps: Sustainable Development Goals optimization

Carbon neutral chemical industry under the lens of five SDGs

Power technologies



Fossil resources



Fossil carbon



Direct air capture



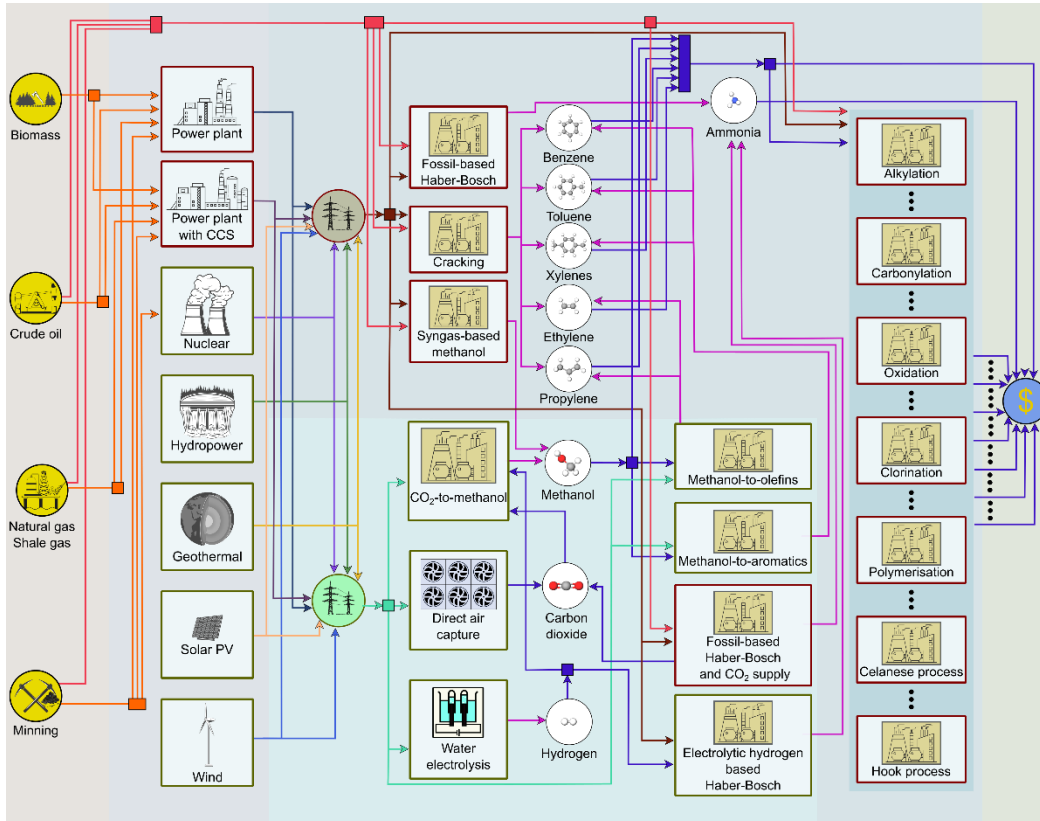
CHEMZERO

$$\begin{aligned} & \min\{f(x)\} \\ & \text{s.t.} \\ & g_j(x) \leq 0, \quad j = 1, \dots, n \\ & h_i(x) = 0, \quad i = 1, \dots, m \\ & GW(x) = 0 \\ & x \in \mathbb{R} \end{aligned}$$



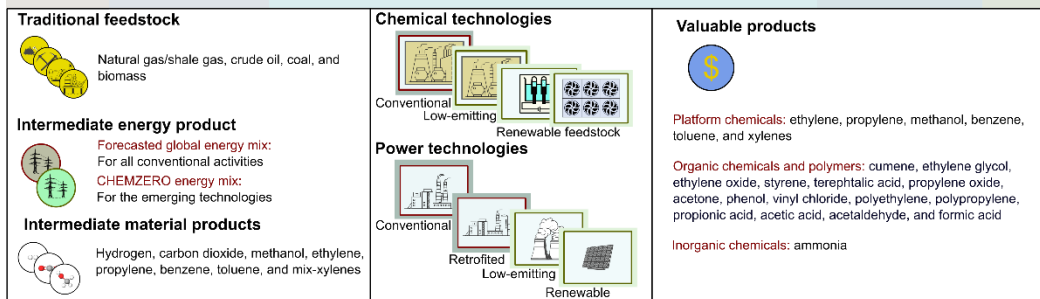
2030 Agenda for Sustainable Development

Future steps: Sustainable Development Goals optimization

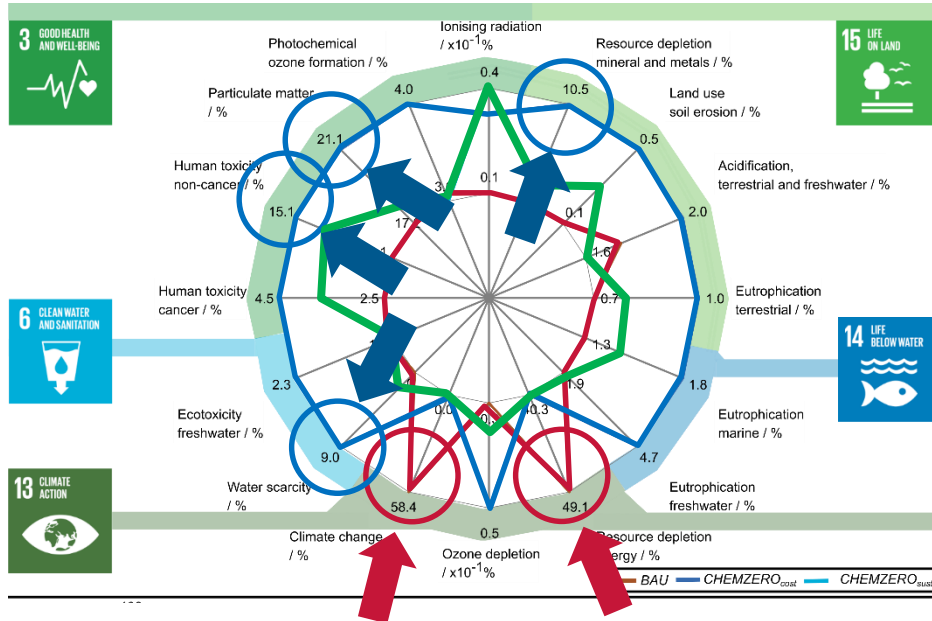


- **Superstructure** of technologies encompassing thousands of alternatives

$$\begin{aligned} \min_x \quad & f(x) = 0 \text{ Objective function} \\ \text{s. t.} \quad & h(x) = 0 \text{ Mass \& energy balances} \\ & g(x) \leq 0 \text{ Capacity constraints} \end{aligned}$$

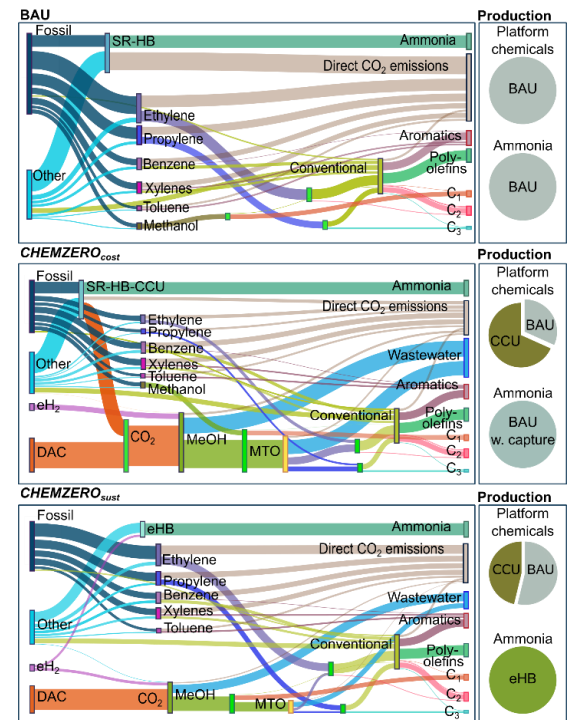


Future steps: Sustainable Development Goals optimization



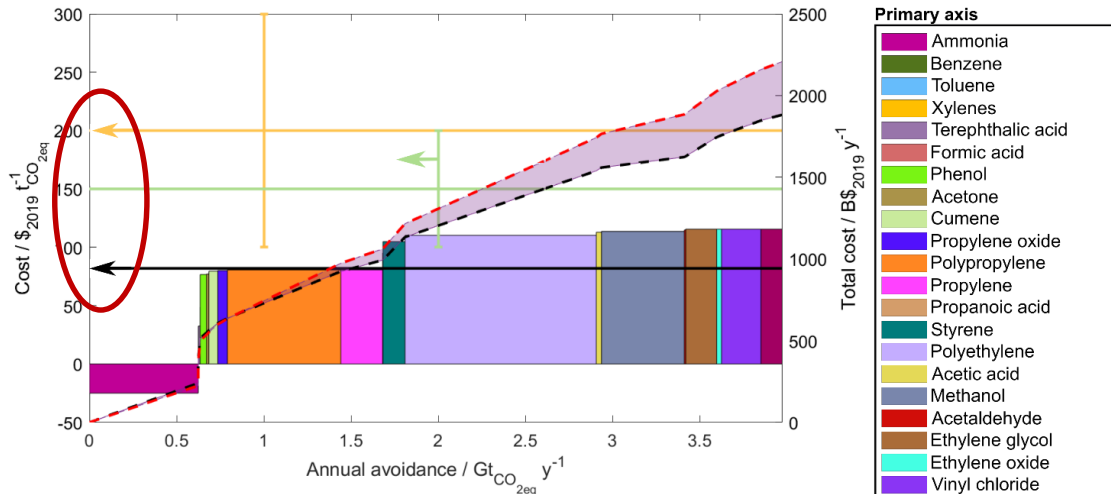
- Fossil chemicals
- Carbon neutral at minimum cost leads to burden-shifting
- Carbon neutral optimizing SDGs performance

- **Hybrid production** patterns are required to produce chemicals sustainably



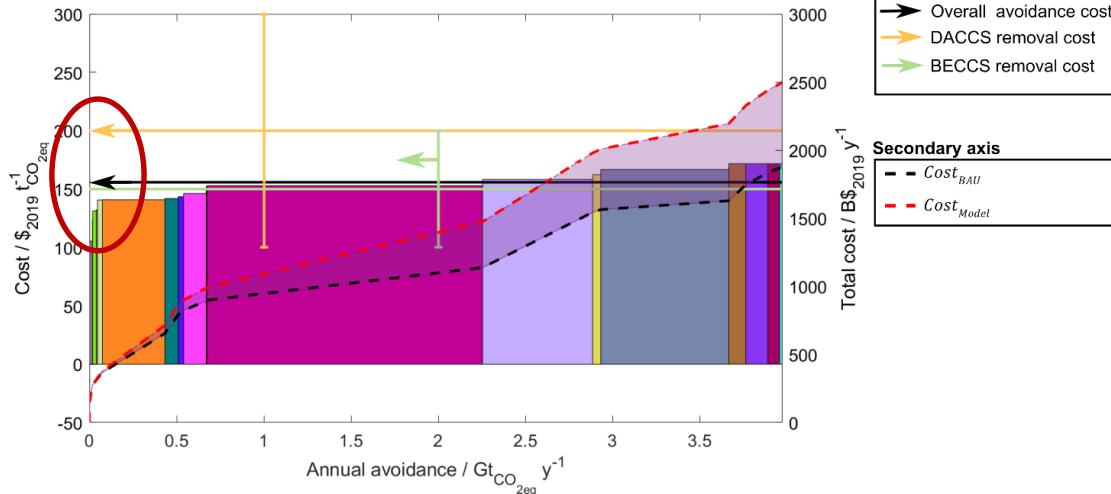
Future steps: Sustainable Development Goals optimization

CHEMZERO_{cost} Carbon neutrality at minimum cost



- **Mitigation** cheaper than carbon removal

CHEMZERO_{sust} Carbon neutrality with overall sustainability

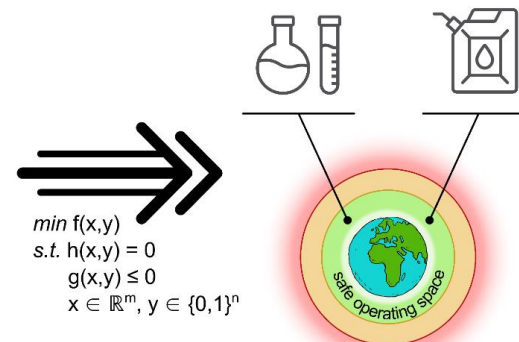


Conclusions

- Process Systems Engineering can be applied to a wide range of sustainability problems
- Main applications at the multi-site and single-site levels
- Combining systems thinking, optimization and life cycle thinking leads to sustainability gains
- Future directions: planetary boundaries optimization

Take-home message

PSE concepts and tools provide a general framework to address a wide variety of relevant problems related to our sustainable development



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NCCR Catalysis (grant 180544), a National Centre of Competence in Research, Swiss National Science Foundation

Process Systems Engineering for sustainable chemicals within planetary boundaries

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ICB Institute for Chemical and Bioengineering

Department of Chemistry and Applied Biosciences

