

# LCA, computers and a sea of data to navigate

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Leiden**

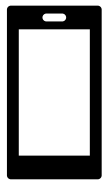
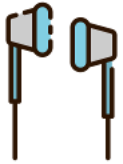
The Netherlands

78th Jubilee Swiss LCA forum:  
Life Cycle thinking = Lower Footprint?

A look into the future: LCA in 2030

# A look into the future: Technology

2021



# A look into the future: Data

Industry 4.0

Internet of things

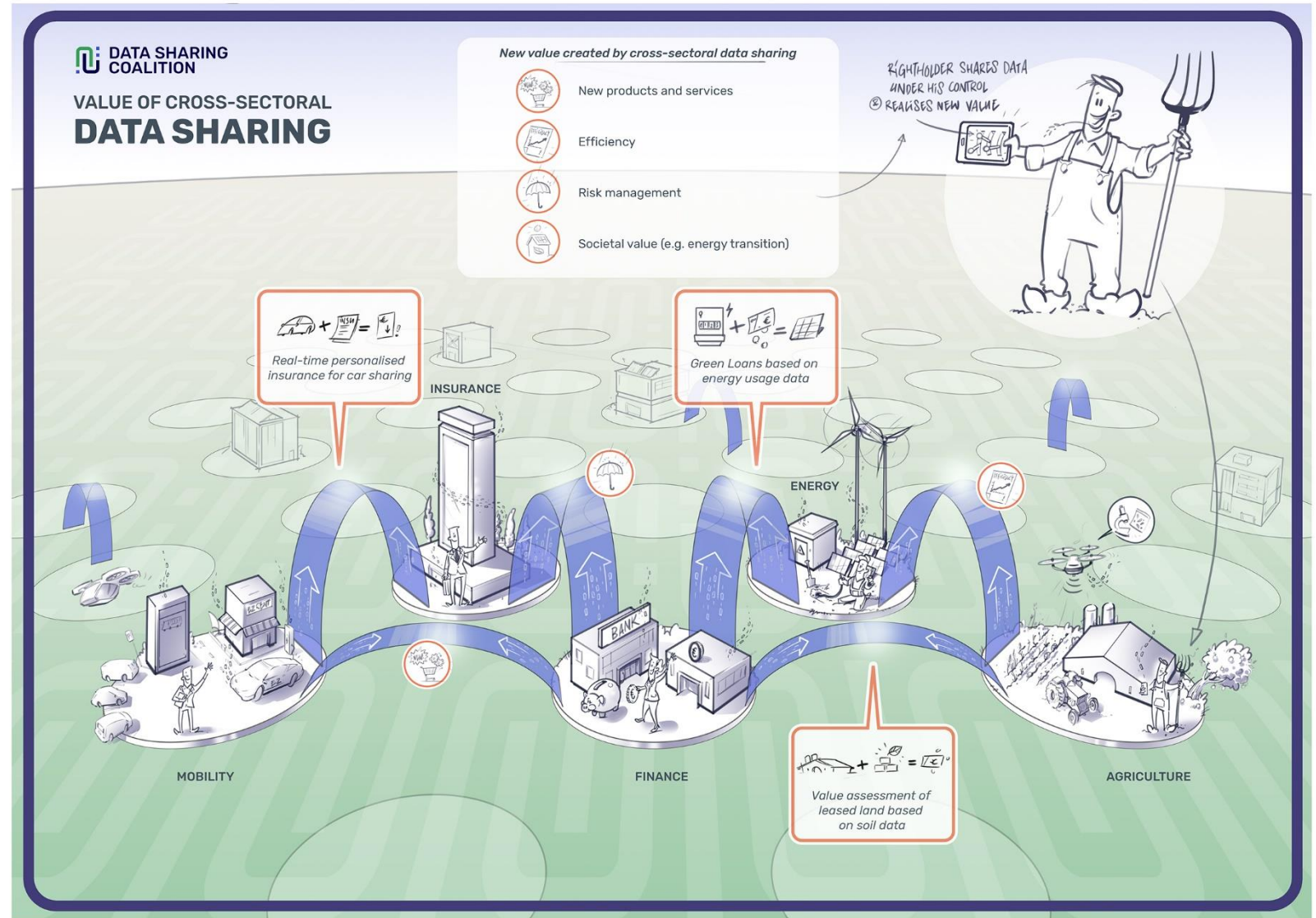
Internet of services

Automation

Artificial Intelligence

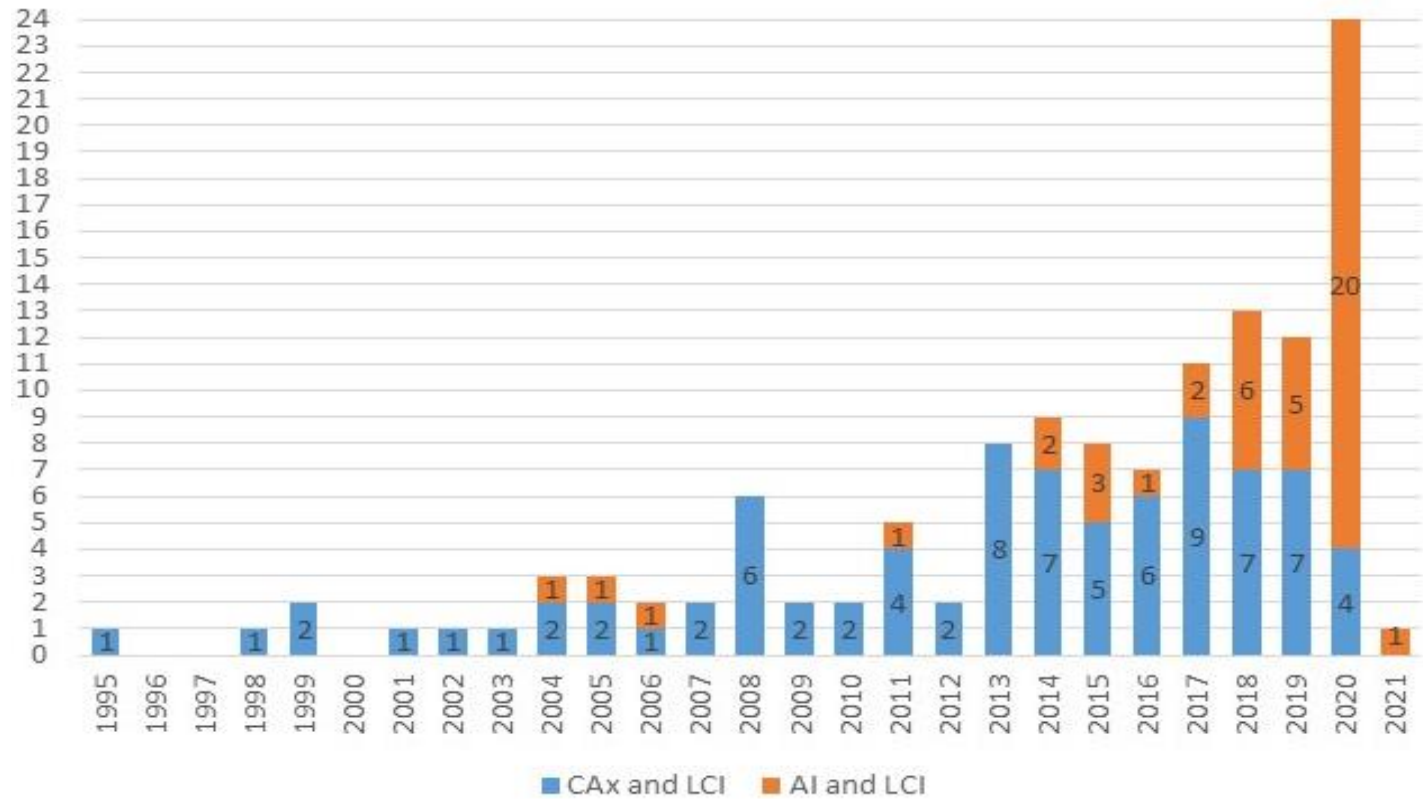
Digital twins

Big data



# How can computer aided technologies and AI applications be used to compile LCIs?

Published papers on the use of computer aided technologies (CAx) and AI for lifecycle data in the period 1995-2020



Donati et al. [Submitted]

# Machine learning and data mining

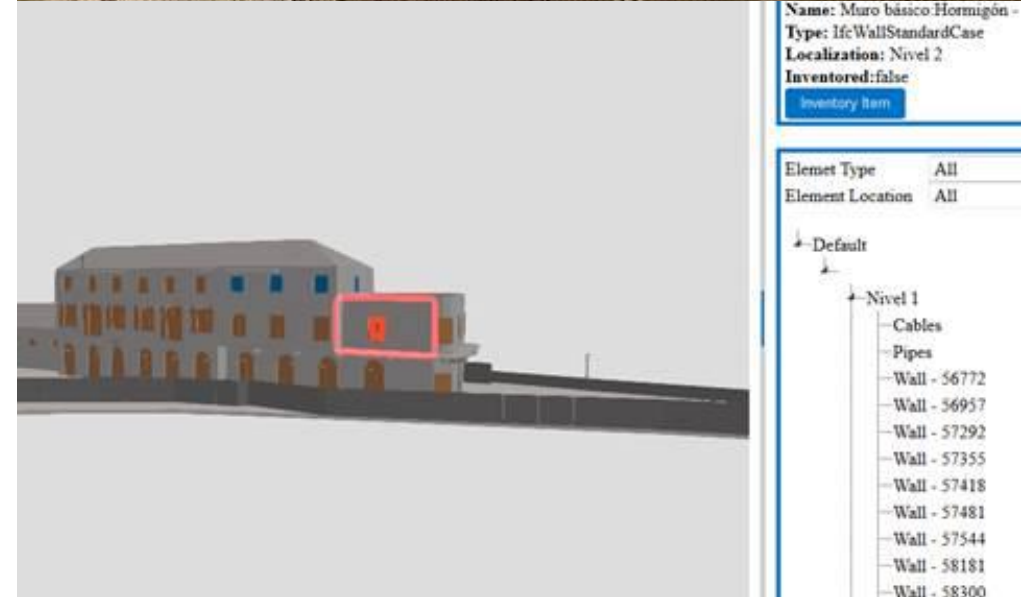
	Resource extraction	Manufacturing & co	Distribution	Use,	Recycling & waste
Machine learning	<p>1. Improve expert systems through collected data.</p> <p>2. Project alternative LCIs compilations based on endogenous and exogenous counterfactual operating conditions.</p>	<p>3. Automate flowsheet compilation through reinforcement learning (e.g., Göttl, Grimm and Burger, 2021)</p> <p>4. See ML no 1 and 2</p>	<p>5. Identify optimal distribution mode and explore possible alternatives (e.g, Li, Xu and Cele, 2019)</p>	<p>6. Estimate assignment of parts to middle-of-life and end-of-life treatments (e.g., Gao, Zhou and Caudill, 2002)</p> <p>7. Other applications similar to CAx</p>	
Data mining	<p>1. Identify, prioritize and fill data gaps through data pattern recognition and clustering in a LCI database</p> <p>2. Identify possible alternative flows and processes based on similarities to other LCIs or CAx models</p> <p>3. Discover rules in ancillary data used to create expert systems (e.g. farmer, operation and consumer surveys)</p> <p>4. Support calculation of uncertainty distribution based on ES and alternative LCI generated with ML.</p>				

Abbreviated from Donati et al. [Submitted]

# Building information modelling



Source: ACCIONA 2020



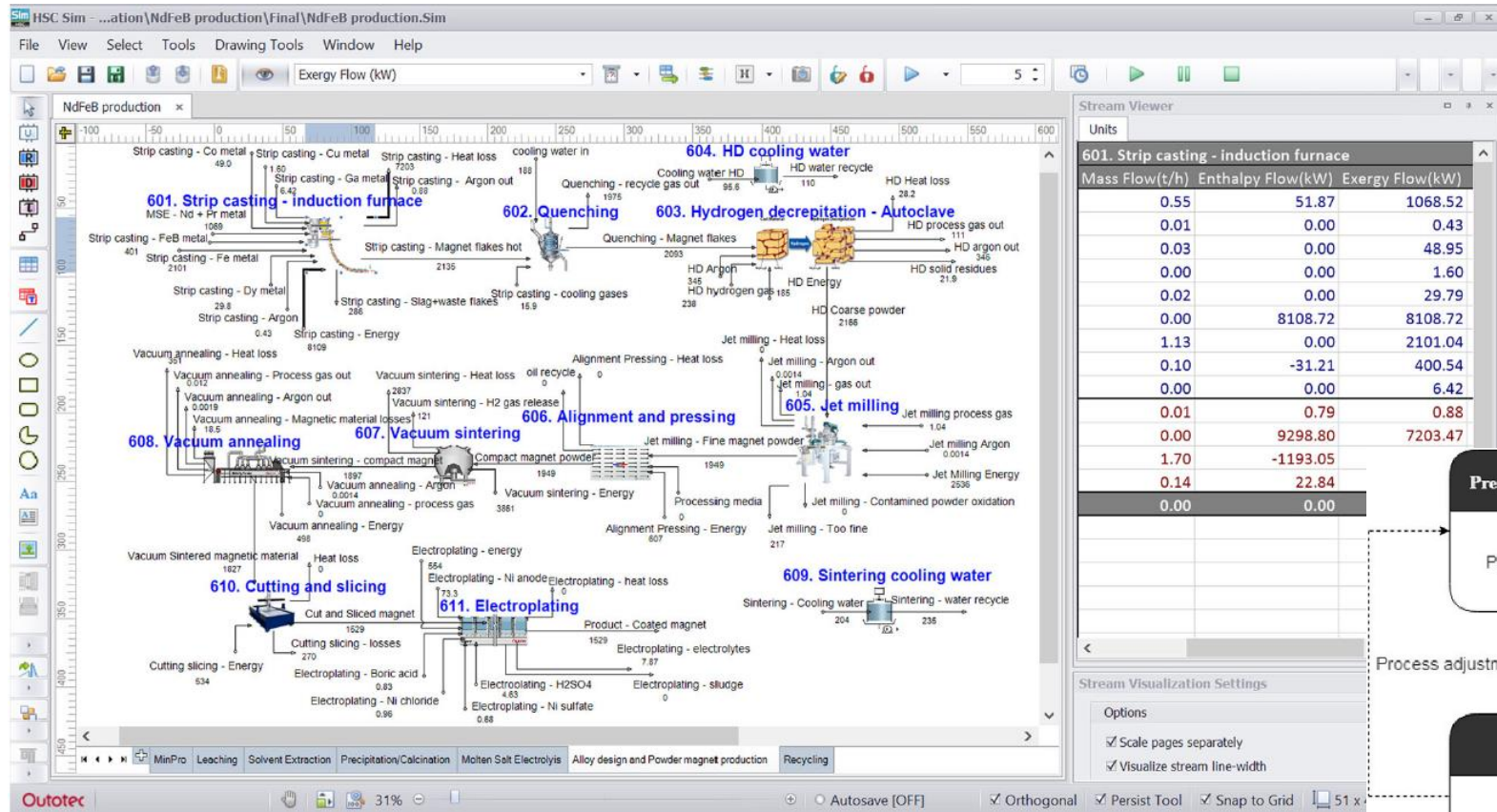
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Type: IfcWallStandardCase  
Localization: Nivel 2  
Inventored:false  
Inventory Item

Element Type All  
Element Location All

- Default
- Nivel 1
  - Cables
  - Pipes
  - Wall - 56772
  - Wall - 56957
  - Wall - 57292
  - Wall - 57355
  - Wall - 57418
  - Wall - 57481
  - Wall - 57544
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  - Wall - 58300

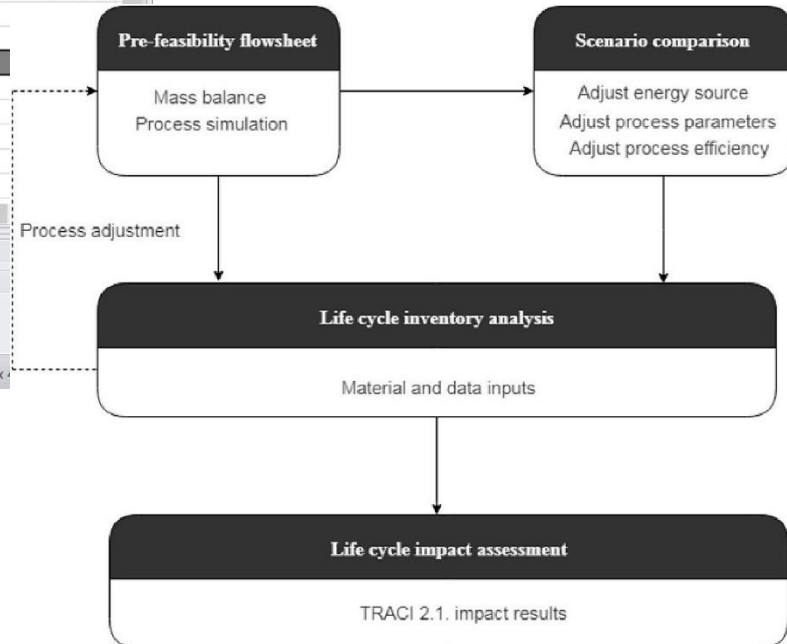
Source: HISER 2018

# CAD: Process simulation



Pell et al. 2019

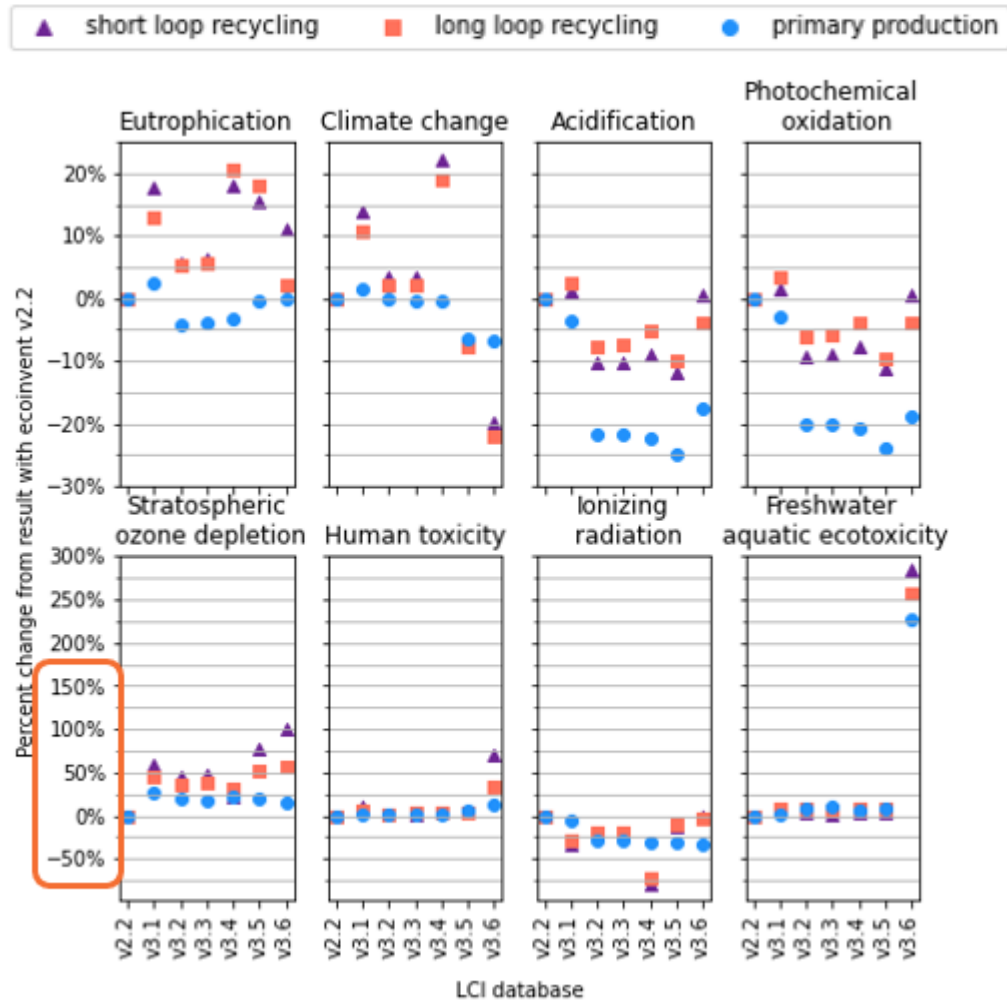
**Outotec**  
HSC Chemistry



Fernandes et al. 2020

**thinkstep**  
**GaBi**

# LCI databases evolve

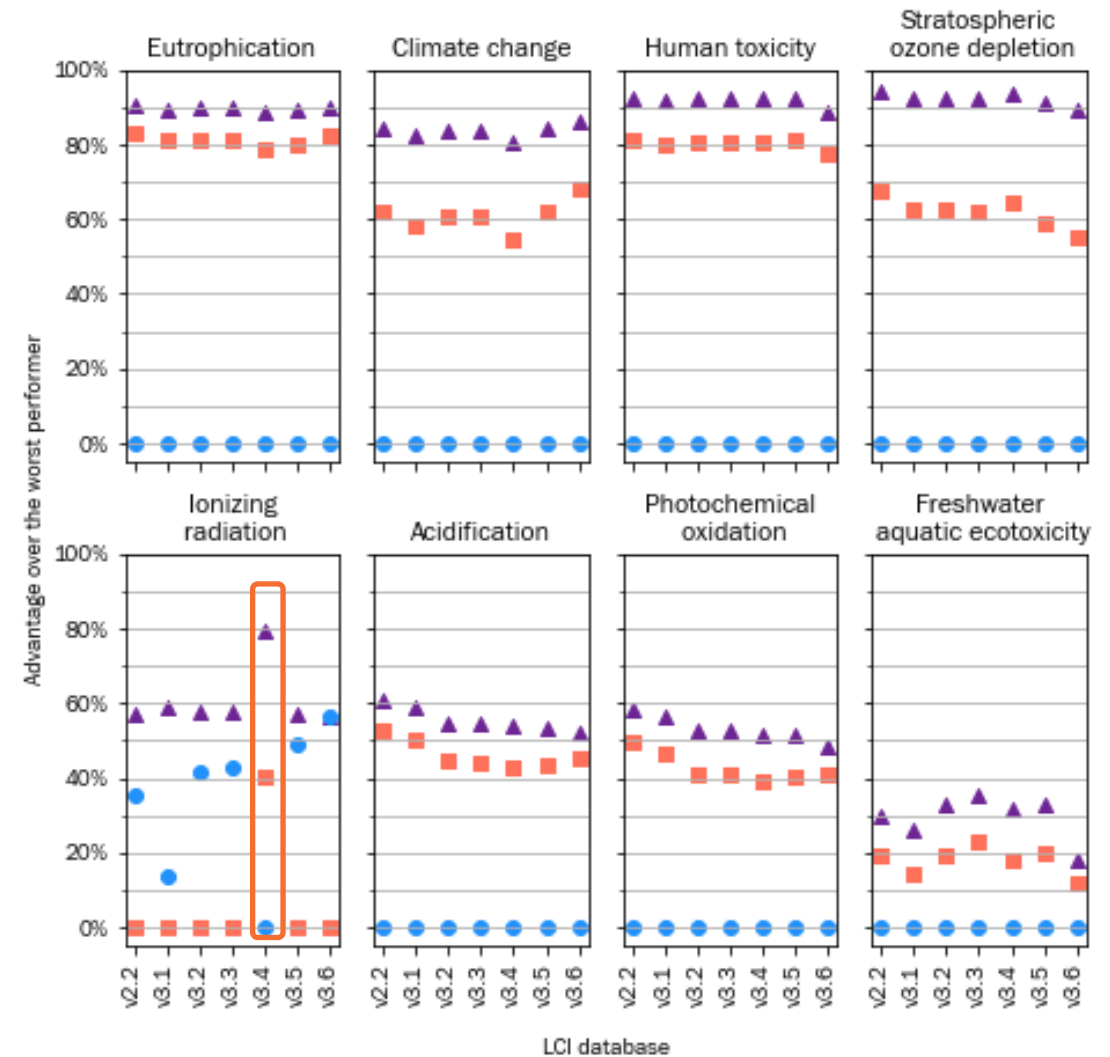
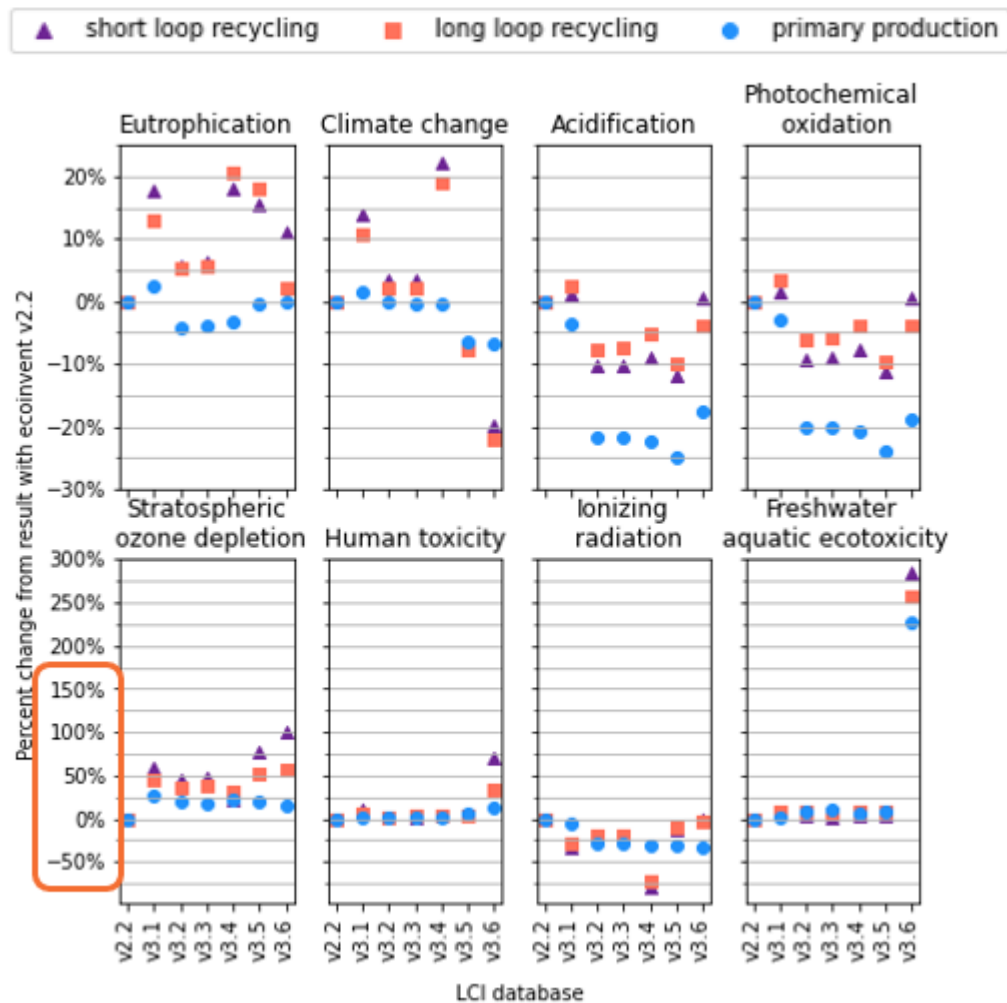


$$\text{Advantage over the worst performer(\%)} = 100 \times \left(1 - \frac{x}{x_{max}}\right)$$

Miranda Xicotencatl, et al. [In preparation]

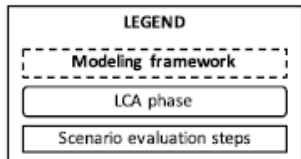
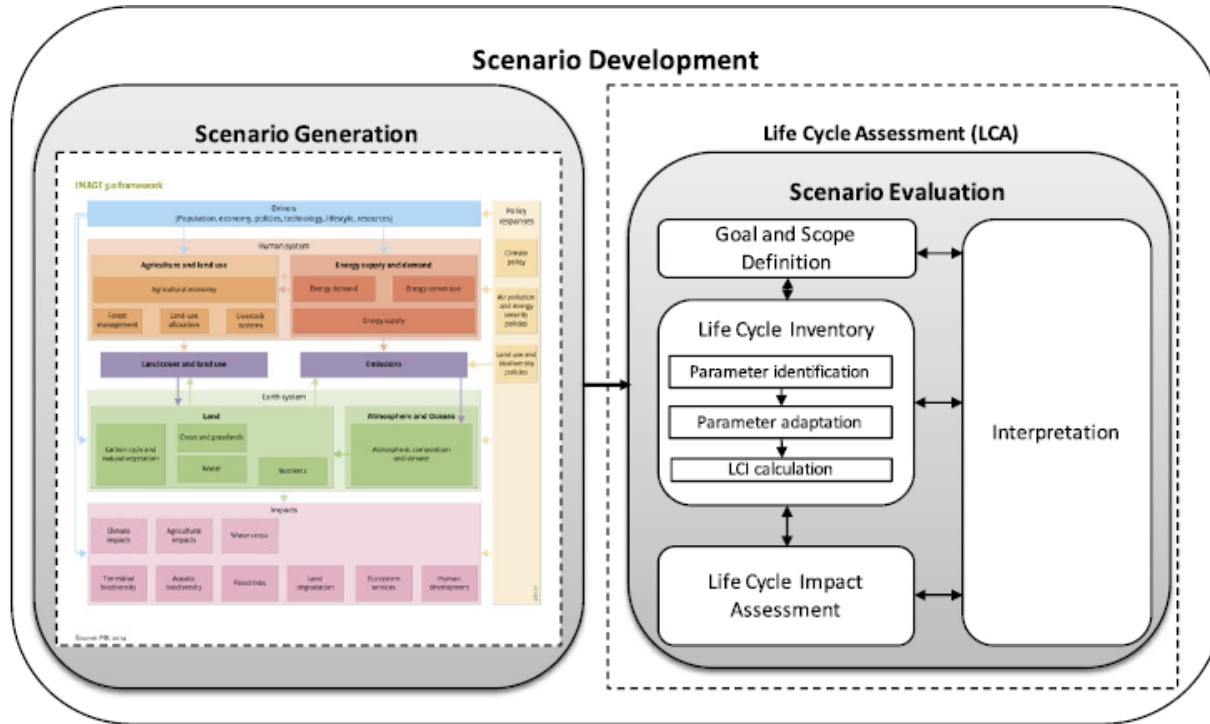


# LCI databases evolve



Miranda Xicotencatl, et al. [In preparation]

# Databases in the future



Mendoza Beltran et al. 2018

Environmental impacts of key metals' supply and low-carbon technologies are likely to decrease in the future

Carina Harpprecht ✉, Laurant van Oers, Stephen A. Northey, Yongxiang Yang, Bernhard Steubing

First published: 05 September 2021 | <https://doi.org/10.1111/jiec.13181>



From slide 3

# Challenges

Differing levels of data literacy-> Streamlining of tools?

Transparency vs intellectual property protection

Navigating the sea of data:

- Cognitive load and communication of insights and limitations
- Is a high level of resolution always better?

# Signposts

The future of AI is human

FAIR guidelines for research:

Findable, Accessible, Interoperable, Reusable



@ChelseaParlett

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**Thank you for your attention!**

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