

# Anticipatory LCA

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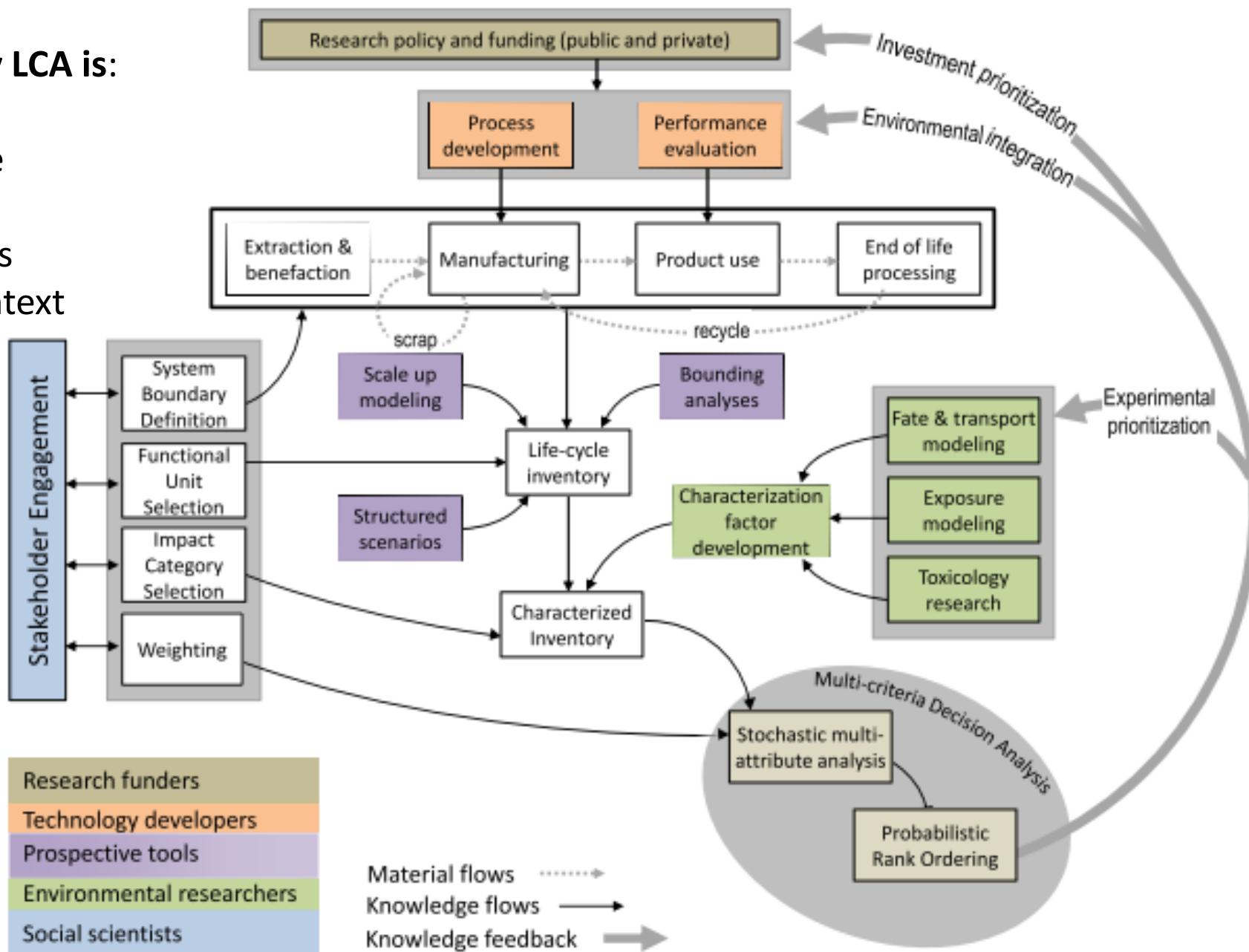
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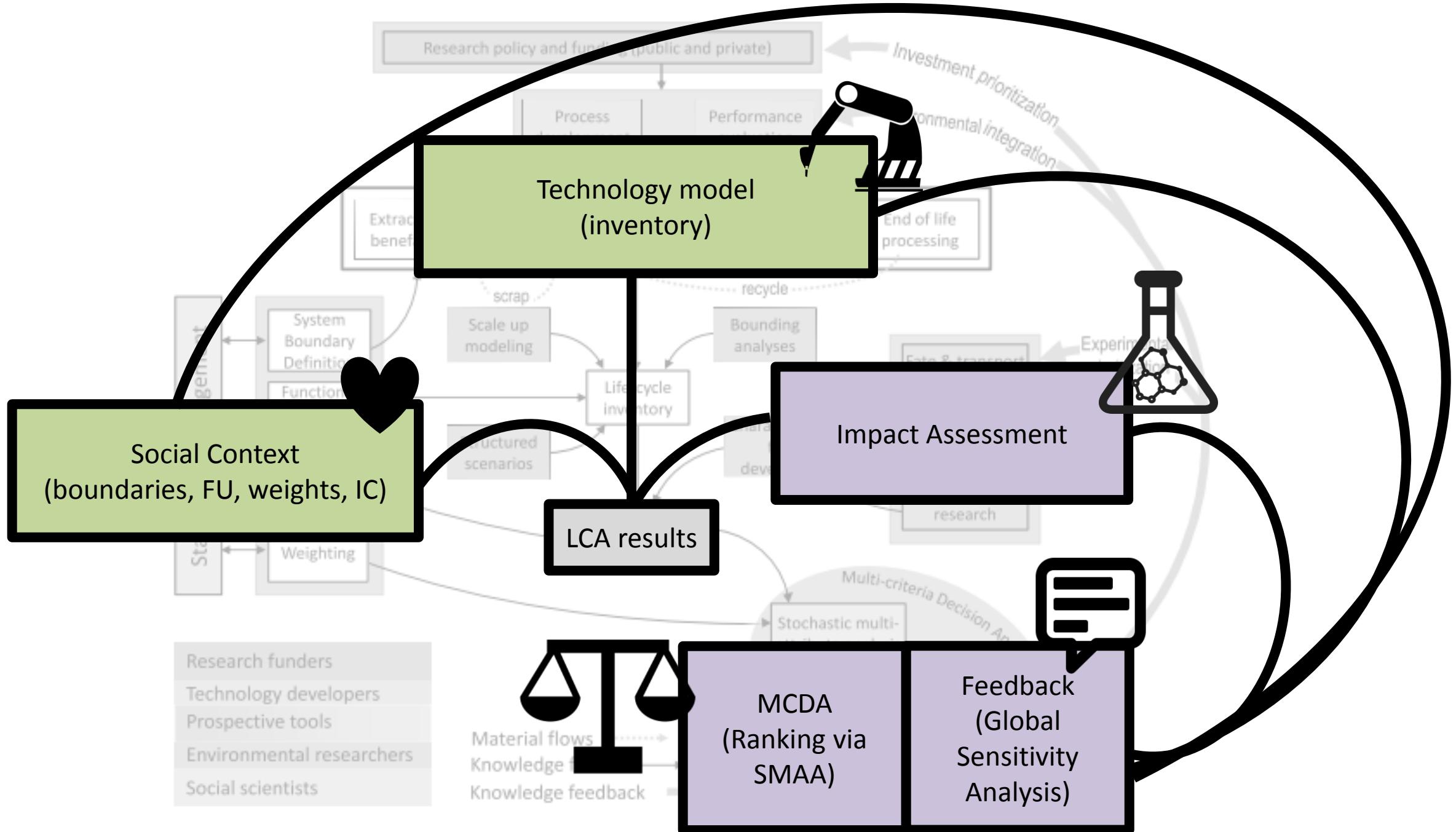
**ASU**  
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LCA Forum, Zurich  
30<sup>rd</sup> March 2017

**Anticipatory LCA is:**  
 Explorative  
 Comparative  
 Design  
 Stoch. Values  
 Decision context





[Open ASUseTox Folder](#)**To Run Analysis:**

1. Follow USEtox guidance and available literature to enter parameter estimates for fate, exposure and effect calculation
2. Build distributions from variable data or assume + or - one order of magnitude uniform uncertainty about midpoint values

**How many samples?**

1000

**Substance Name**

benzene test

**K<sub>ow</sub>****K<sub>ow</sub>**

[none]

Uniform

13.5

1350

**K<sub>oc</sub>****K<sub>oc</sub>**L.kg<sup>-1</sup>

Uniform

**K<sub>H2</sub>****K<sub>H</sub>25C**Pa.m<sup>3</sup>mol<sup>-1</sup>

Uniform

**P<sub>vap</sub>****P<sub>vap</sub>25**

Pa

Uniform

Max

560

**Sol****Sol25**mg.L<sup>-1</sup>

Uniform

Max

5600

**Fate**

Min

Max

1.2e3

1.2e5

1.79e2

1.79e4

In progress...

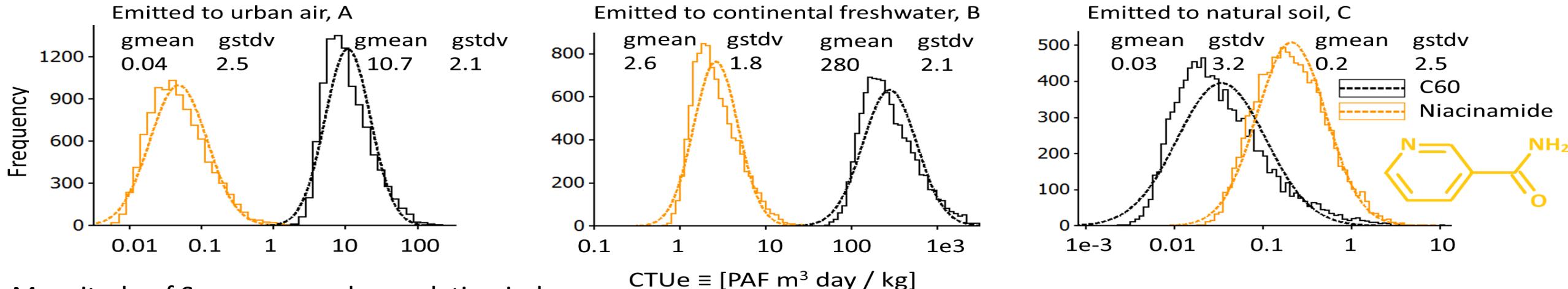
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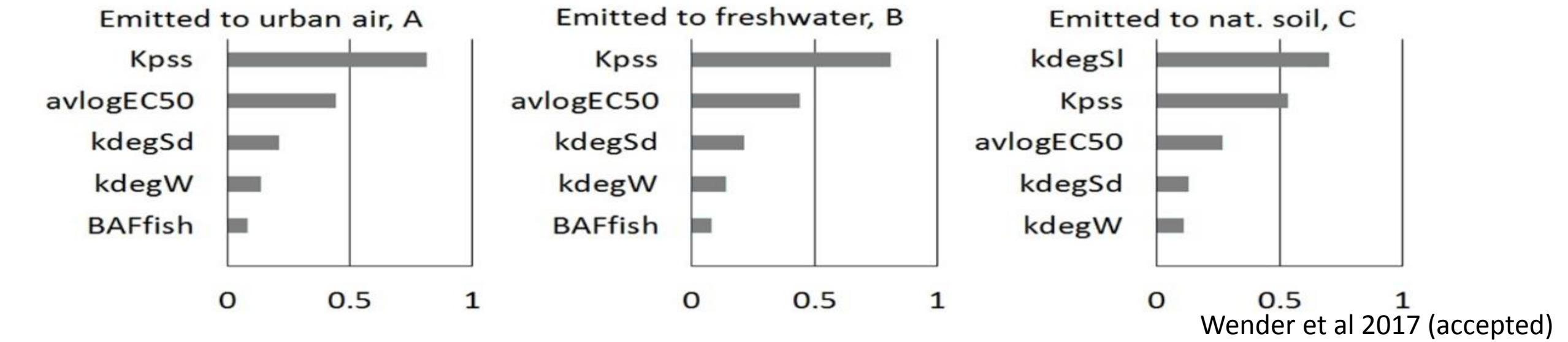
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# Illustration of Stochastic Characterization factors and sensitivity of parameters

## Characterization factors



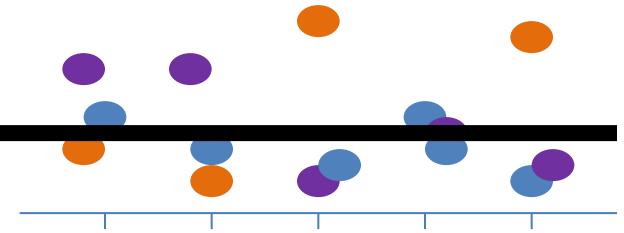
## Magnitude of Spearman rank correlation index





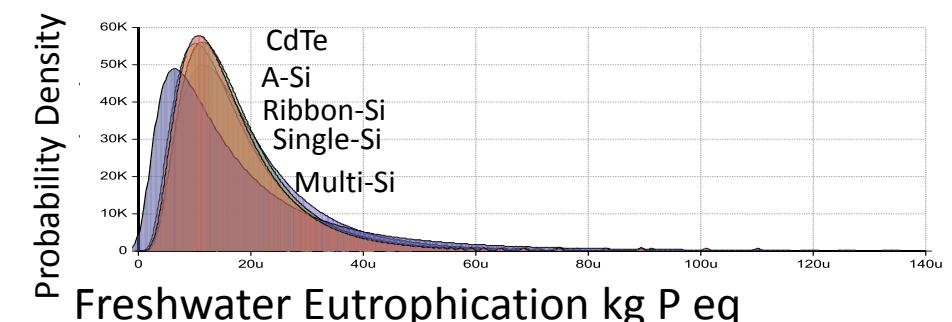
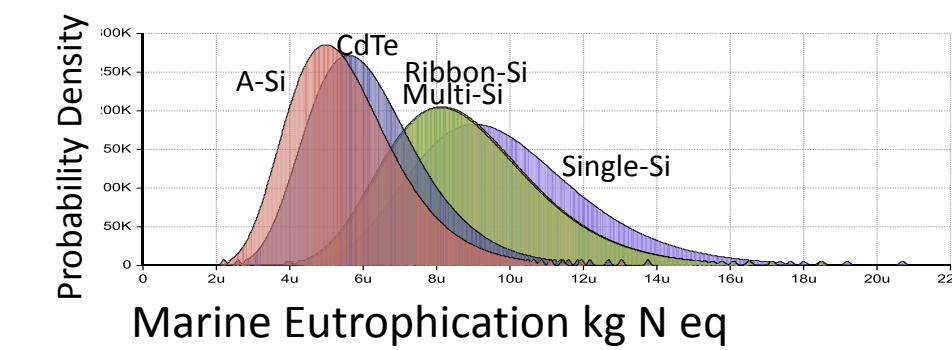
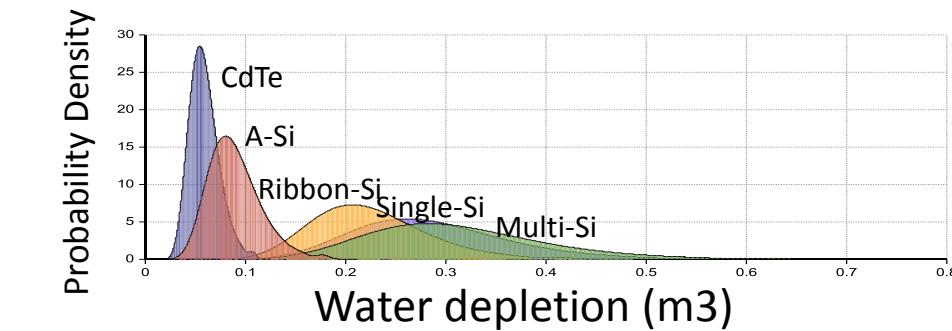
| Impact Category         | Unit         | a-Si   |        | CdTe   |        | Multi- Si |        | Ribbon-Si |        | 1      |
|-------------------------|--------------|--------|--------|--------|--------|-----------|--------|-----------|--------|--------|
|                         |              | Mean   | SD     | Mean   | SD     | Mean      | SD     | Mean      | SD     |        |
| Agricultural land       | m2a          | 4.9E-4 | 1.9E-4 | 6.9E-4 | 2.0E-4 | 1.2E-3    | 3.6E-4 | 1.0E-3    | 3.0E-4 | 1.0E-3 |
| Climate change          | kg CO2 eq    | 1.6E-2 | 4.1E-3 | 1.3E-2 | 2.5E-3 | 1.9E-2    | 4.0E-3 | 1.7E-2    | 3.6E-3 | 2.2E-2 |
| Fossil dep              | kg oil eq    | 4.1E-3 | 1.1E-3 | 3.3E-3 | 6.8E-4 | 5.0E-3    | 1.1E-3 | 4.4E-3    | 9.1E-4 | 5.8E-3 |
| Freshwater ecotox       | kg 1,4-DB eq | 7.3E-6 | 2.4E-6 | 7.7E-6 | 2.3E-6 | 9.4E-6    | 2.8E-6 | 9.6E-6    | 2.7E-6 | 9.5E-6 |
| Freshwater eutroph      | kg P eq      | 1.7E-5 | 1.0E-5 | 2.0E-5 | 2.1E-5 | 1.9E-5    | 1.0E-5 | 1.7E-5    | 1.1E-5 | 1.0E-5 |
| Human toxicity          |              |        |        |        |        |           |        |           |        |        |
| Ionising radiation      |              |        |        |        |        |           |        |           |        |        |
| Marine ecotox           |              |        |        |        |        |           |        |           |        |        |
| Marine eutroph          |              |        |        |        |        |           |        |           |        |        |
| Metal Dep               |              |        |        |        |        |           |        |           |        |        |
| Natural land trans      |              |        |        |        |        |           |        |           |        |        |
| Ozone Dep               |              |        |        |        |        |           |        |           |        |        |
| Particulate matter      |              |        |        |        |        |           |        |           |        |        |
| Photochem               |              |        |        |        |        |           |        |           |        |        |
| Terrestrial acid        | kg SO2 eq    | 1.2E-4 | 3.1E-5 | 1.1E-4 | 2.3E-5 | 1.4E-4    | 2.9E-5 | 1.3E-4    | 2.7E-5 | 1.6E-4 |
| Terrestrial ecotoxicity | kg 1,4-DB eq | 2.4E-6 | 9.8E-7 | 3.0E-6 | 1.3E-6 | 3.5E-5    | 3.4E-5 | 3.9E-5    | 3.0E-5 | 3.4E-5 |
| Urban land occup        | m2a          | 1.9E-4 | 5.7E-5 | 1.8E-4 | 4.6E-5 | 2.1E-4    | 5.3E-5 | 1.9E-4    | 5.1E-5 | 2.3E-4 |
| Water Dep               | m3           | 8.9E-2 | 2.6E-2 | 5.9E-2 | 1.4E-2 | 3.1E-1    | 8.8E-2 | 2.3E-1    | 5.7E-2 | 2.9E-1 |

- Multiple indicators (& units)
- Uncertainty
- Decision Makers
- Not single optimization
- Best compromise

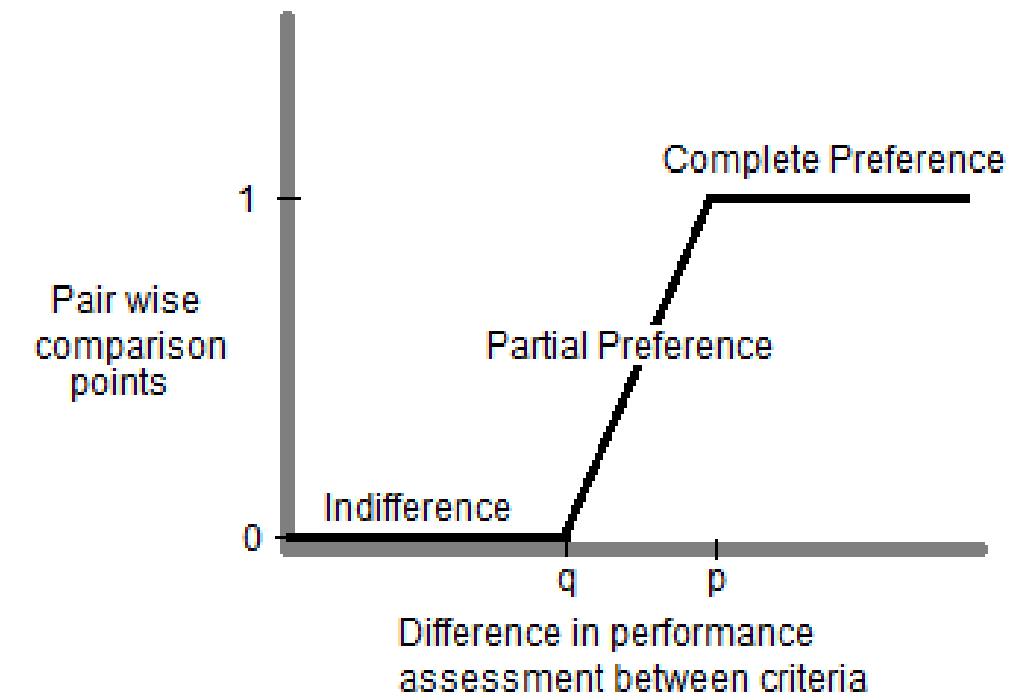
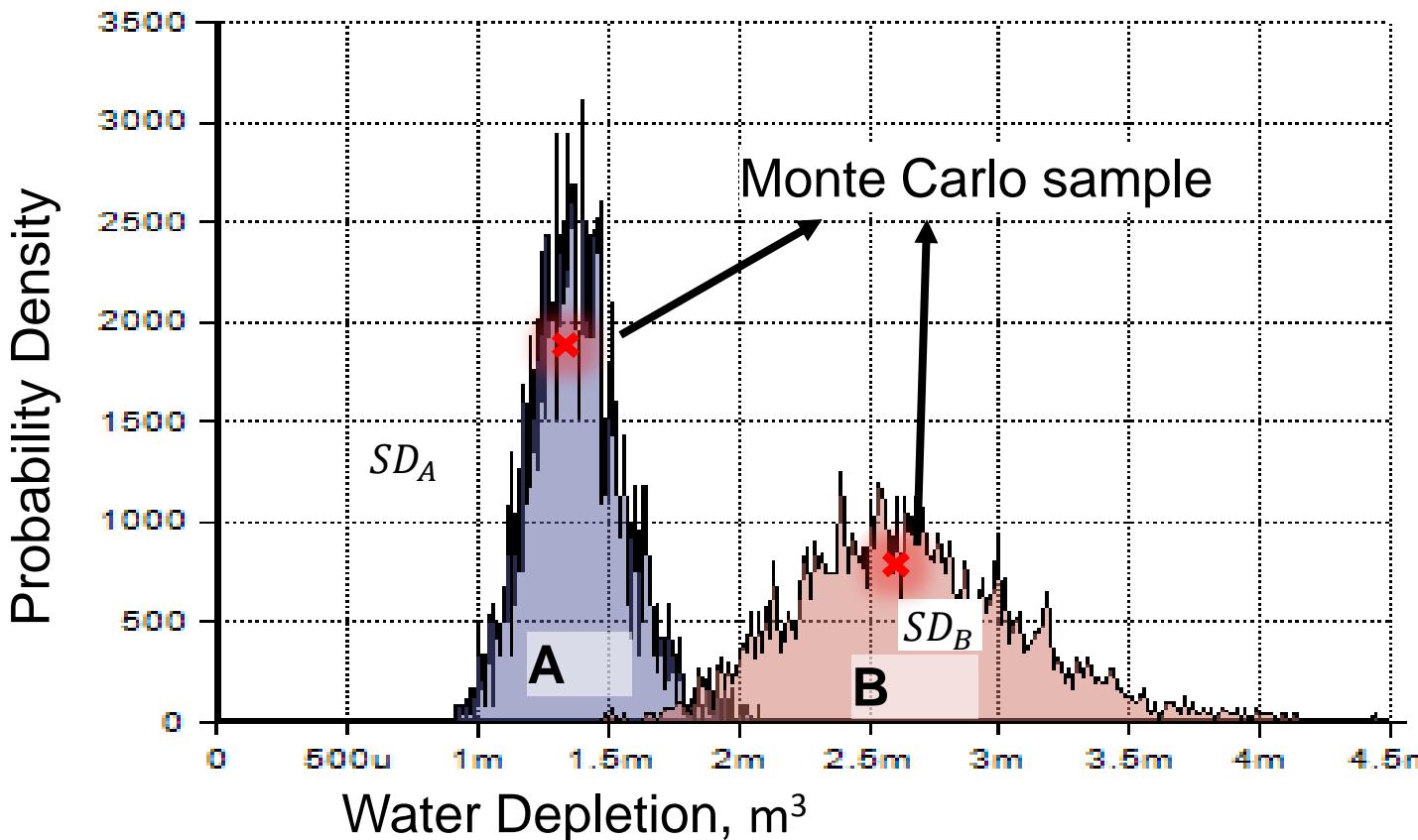


Tradeoff significance

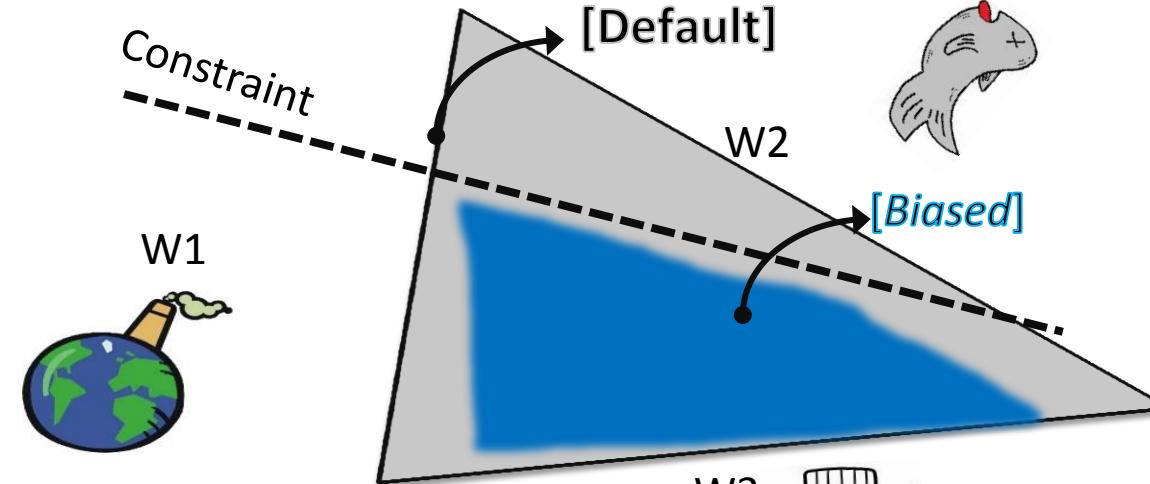
|    | Impact Category              | Avg area<br>Eq. 9 | Top<br>2              |
|----|------------------------------|-------------------|-----------------------|
| 1  | Water depletion              | 0.26              | CdTe / A-Si           |
| 2  | Terrestrial ecotoxicity      | 0.37              | A-Si / CdTe           |
| 3  | Marine eutrophication        | 0.40              | A-Si / CdTe           |
| 4  | Ozone depletion              | 0.48              | A-Si / CdTe           |
| 5  | Agricultural land occupation | 0.51              | A-Si / CdTe           |
| 6  | Photochemical oxidant        | 0.54              | CdTe / A-Si           |
| 7  | Climate change               | 0.56              | CdTe / A-Si           |
| 8  | Fossil depletion             | 0.57              | CdTe / A-Si           |
| 9  | Particulate matter formation | 0.67              | CdTe / A-Si           |
| 10 | Terrestrial acidification    | 0.73              | CdTe / A-Si           |
| 11 | Marine ecotoxicity           | 0.75              | A-Si / CdTe           |
| 12 | Metal depletion              | 0.78              | Ribbon-Si / Single-Si |
| 13 | Freshwater ecotoxicity       | 0.79              | A-Si / CdTe           |
| 14 | Urban land occupation        | 0.83              | CdTe / A-Si           |
| 15 | Human toxicity               | 0.84              | A-Si / CdTe           |
| 16 | Natural land transformation  | 0.84              | CdTe / A-Si           |
| 17 | Ionising radiation           | 0.85              | CdTe / A-Si           |
| 18 | Freshwater eutrophication    | 0.88              | A-Si / Ribbon-Si      |



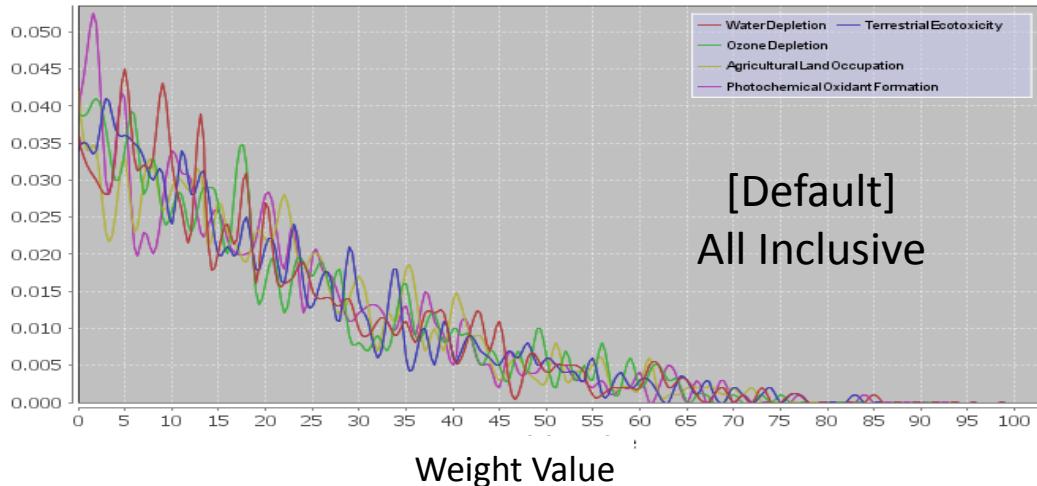
# Stochastic multi attribute analysis (SMAA): Outranking



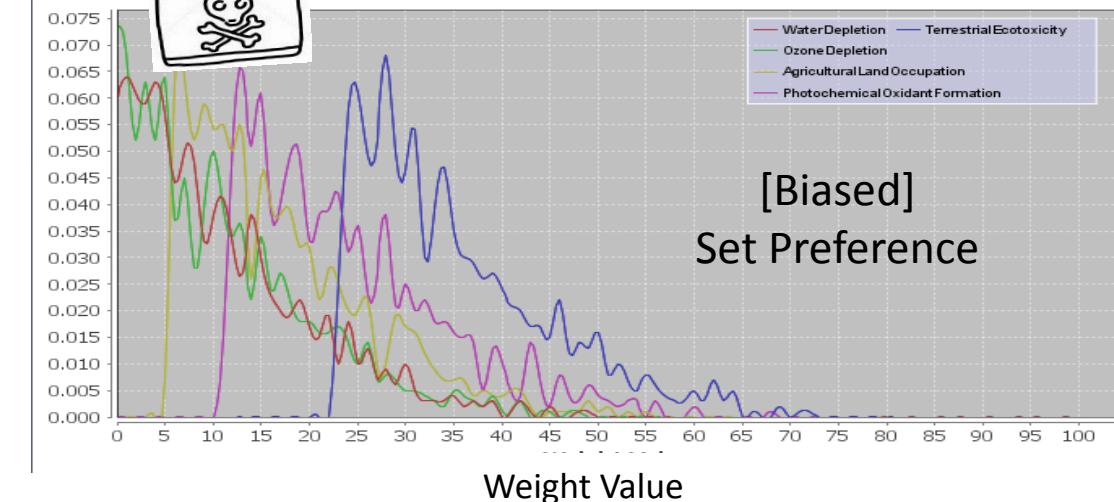
# Stochastic multi attribute analysis (SMAA): Weights



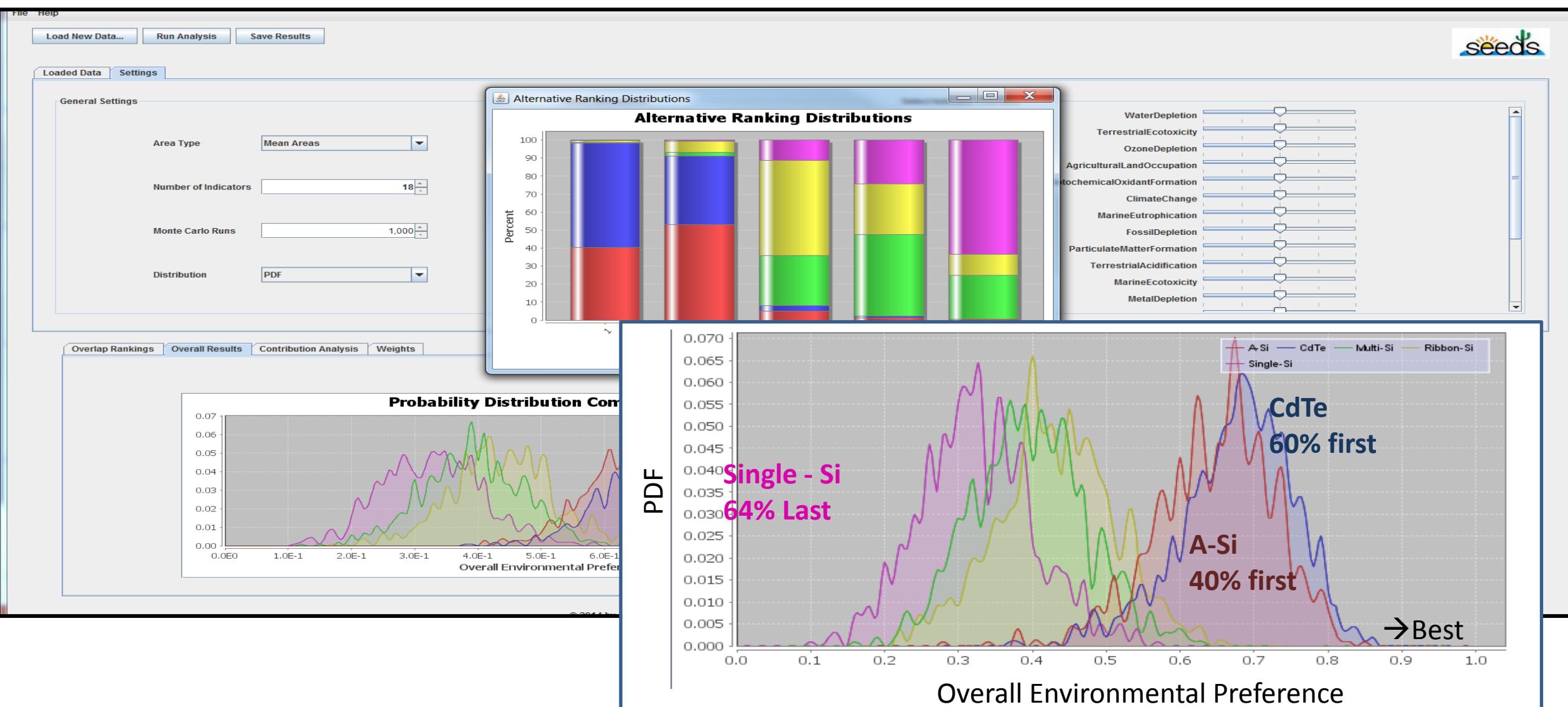
**Probability Distribution Weights**

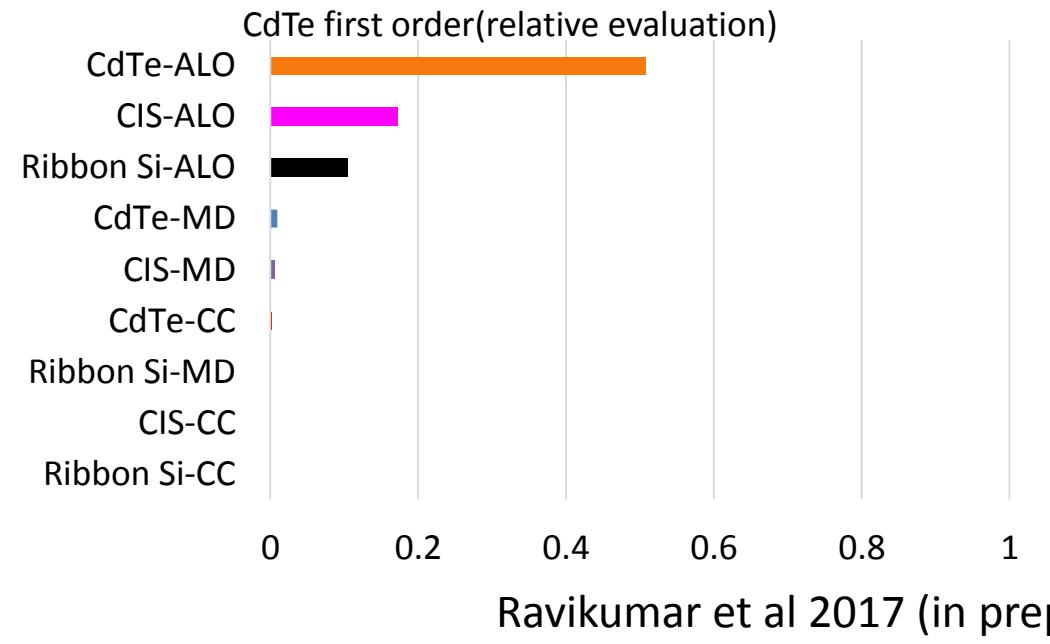
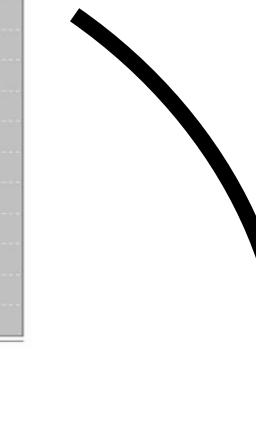
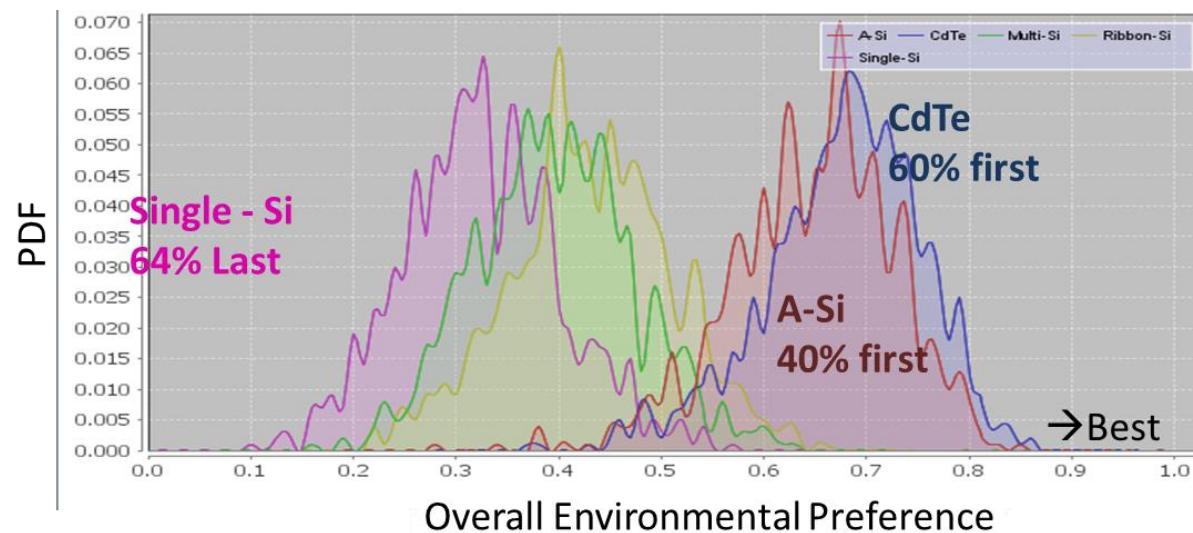
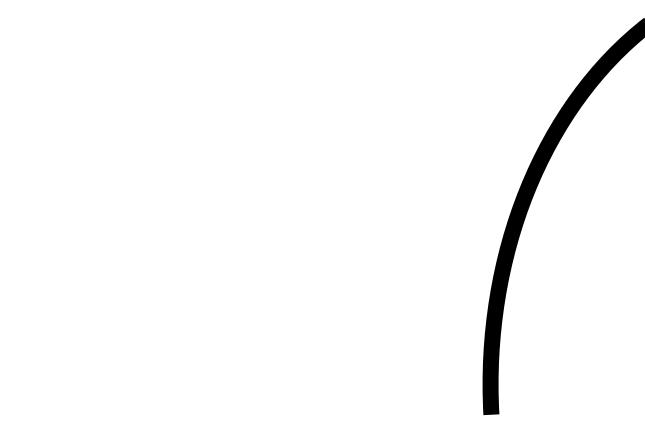


**Probability Distribution Weights**



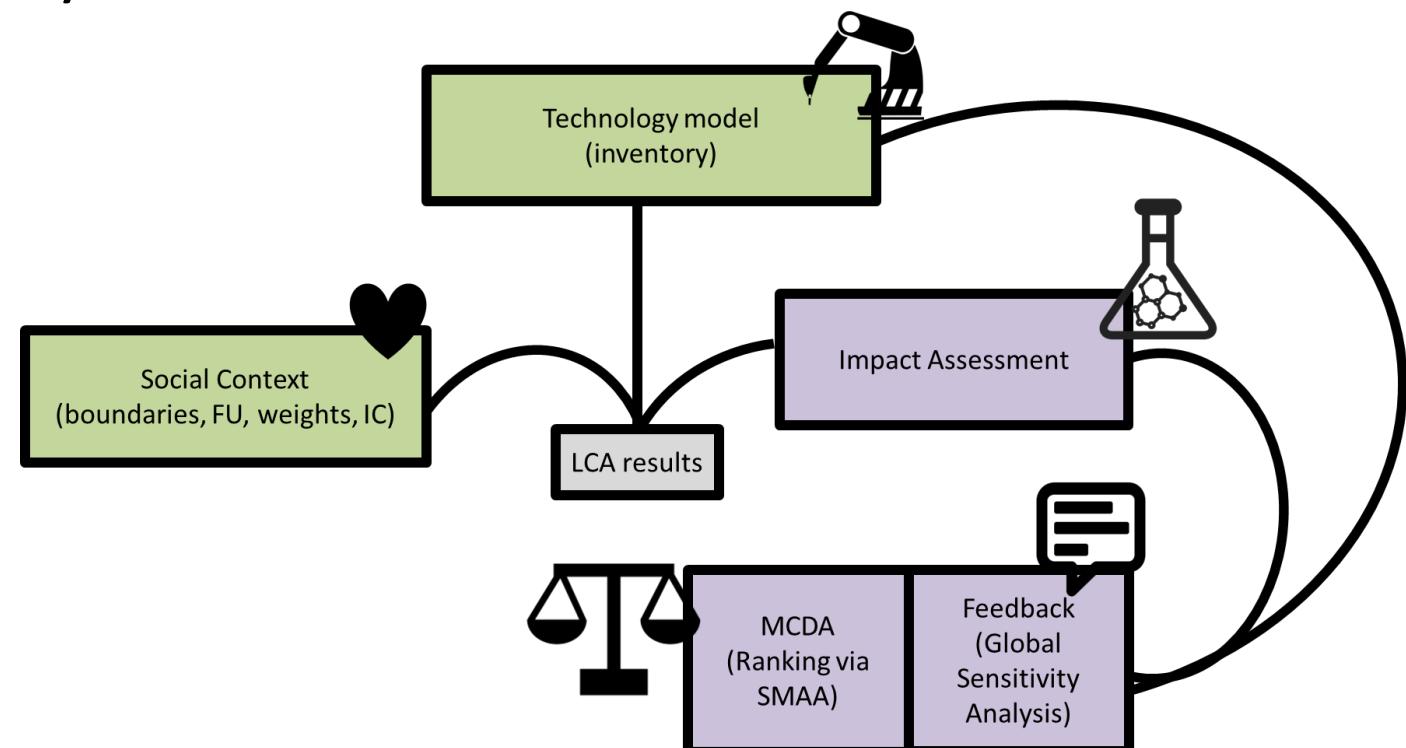
# SMAA-LCA





# Final remarks

- LCA for technology design
- Feedback: Data/experiment prioritization
- Inclusion of stakeholder values
- Incorporation of uncertainty in the decision



## References:

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