

# Uncertainty analysis

Lecture

Mark Huijbregts

Department of Environmental science

Radboud University

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## Difficulties in LCA (I)

- Not every factory has the same emissions
- Emissions will differ from year to year
- Parameters may include measurement errors or may not be measured at all

 Which value should you choose?

## Difficulties in LCA (II)

- Allocation in multi-output systems can be done in many ways
- Midpoint or endpoint impact assessment?
- Choice for time horizon?
- ☞ Which method should you select?

## Difficulties in LCA (III)

How to deal with lack of spatial detail?

How to assess sum emissions?

How to deal with unrepresentative data?

👉 How to handle ignorance?

# Uncertainty versus variability

**Uncertainty:** The value of a parameter is not exactly known. Uncertainty can be reduced by additional research.

**Variability:** The value of a parameter differs between individuals (interindividual), places (spatial) or in time (temporal). Variability is inherent in the system and cannot be reduced by additional research.

# Types of uncertainty

- Statistical uncertainty
- Uncertainty due to choices
- Model uncertainty

Other terminology used:

*systematic errors, random errors, data uncertainty, completeness uncertainty, subjective judgement, contextual uncertainty, preferential uncertainty, ...*

# Qualitative assessment: life cycle impact assessment

## LCIA framework and requirements

<http://lct.jrc.ec.europa.eu/pdf-directory/ILCD-Handbook-LCIA-Framework-requirements-online-12March2010.pdf>

Defining (and applying) evaluation criteria to life cycle impact assessment methods commissioned by the JRC-Ispra

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# Qualitative assessment: LCIA (I)

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## Evaluation criteria categories

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Introduction

Completeness of scope

Environmental relevance

Scientific robustness & Certainty

Documentation & Transparency & Reproducibility

Applicability

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Stakeholder acceptance criteria

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# Qualitative assessment: LCIA (II)

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## Evaluation:

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A : full compliance

B: compliance in all essential aspects

C: compliance in some aspects (``so-so``)

D: little compliance

E: no compliance

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# Results EU-LCIA best practice project

## Recommendations of methods and factors

- ... at midpoint and at endpoint
- ... in a consistent framework, where possible

## Classification of recommendations

- I: Recommended and satisfactory
- II: Recommended, some improvements needed
- III: Interim, i.e. the most appropriate among the existing approaches but immature for recommendation

## Identification of future research needs

- Classification according to importance
- Estimation of work load

<b>Impact category</b>	<b>Recommended model Midpoint</b>	<b>Class.</b>	<b>Recommended model Mid to Endpoint</b>	<b>Class.</b>
<b>Climate change</b>	IPCC (GWP) (100 years)	I	ReCiPe	III
<b>Ozone depletion</b>	WMO (ODP) (infinite)	I	ReCiPe	III
<b>Human toxicity, carcinogenics</b>	USEtox	II/III	DALY calculation applied to USEtox midpoint	II/III
<b>Human toxicity, non- carcinogenics</b>	USEtox	II/III	DALY calculation applied to USEtox midpoint	III
<b>Particulate matter/Respiratory inorganics</b>	Not settled yet: Greco et al., 2007 or RiskPoll or ReCiPe	I/II	Adapted DALY calculation applied to midpoint	II
<b>Ionising radiation, human health</b>	Frischknecht et al., 2000	II	Frischknecht et al., 2000	III
<b>Ionising radiation, ecosystems</b>	Garnier-Laplace et al., 2008	III	PDF calculation applied to midpoint	III

<b>Impact category</b>	<b>Recommended model Midpoint</b>	<b>Class.</b>	<b>Recommended model (Mid to) Endpoint</b>	<b>Class.</b>
<b>Photochemical ozone formation</b>	LOTOS-EUROS as applied in ReCiPe	II	ReCiPe for human health, nothing for vegetation	II
<b>Acidification</b>	Accumul. Exceedance	II	ReCiPe	III
<b>Eutroph. terrestrial</b>	Accumul.Exceedance	II	None	-
<b>Eutroph. aquatic</b>	ReCiPe	II	ReCiPe for freshwater, none for marine waters	III
<b>Ecotoxicity</b>	USEtox	II/III	PDF calculation applied to USEtox midpoint	III
<b>Land use</b>	Milà i Canals	III	ReCiPe	III
<b>Resource depletion, water</b>	Swiss Ecoscarcity	III	None	-
<b>Resource depletion, mineral . fossil (and renewable)</b>	Category 1: None Category 2: EDIP97 update 2004	- II	Category 4: ReCiPe	III

# Statistical uncertainties

## Monte Carlo simulation

1. define uncertainty distributions for input parameters: lognormal, triangular, normal, uniform, etc...
2. translate input uncertainties in output uncertainties by probabilistic sampling: 1,000-10,000 runs
3. visualize and communicate uncertainty in LCA outcomes

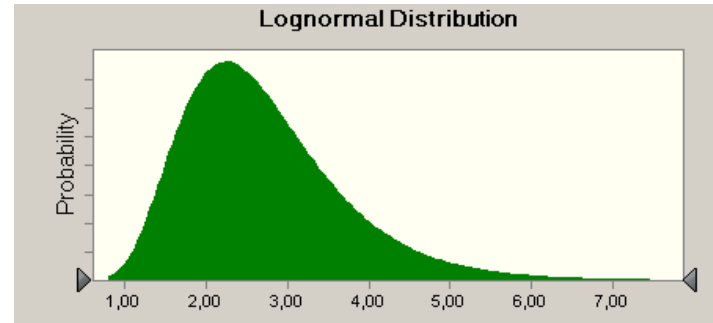
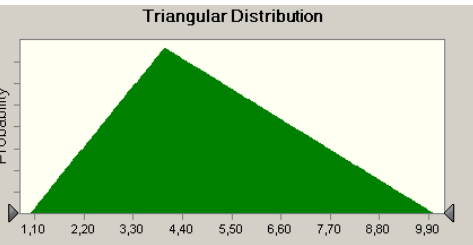
# Monte Carlo simulation

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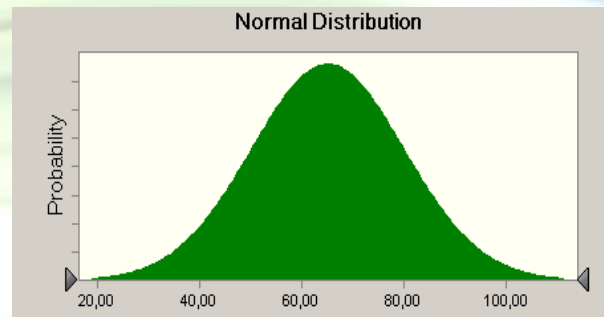
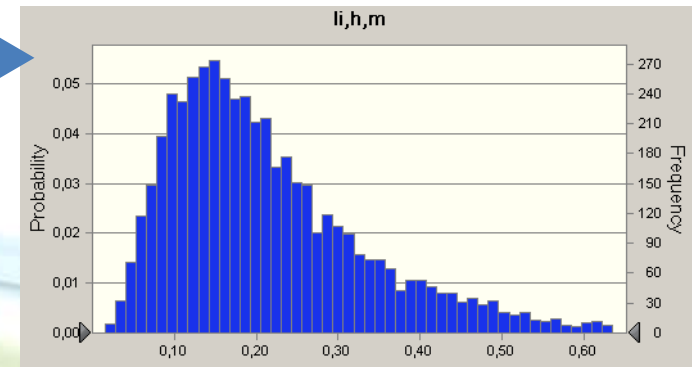
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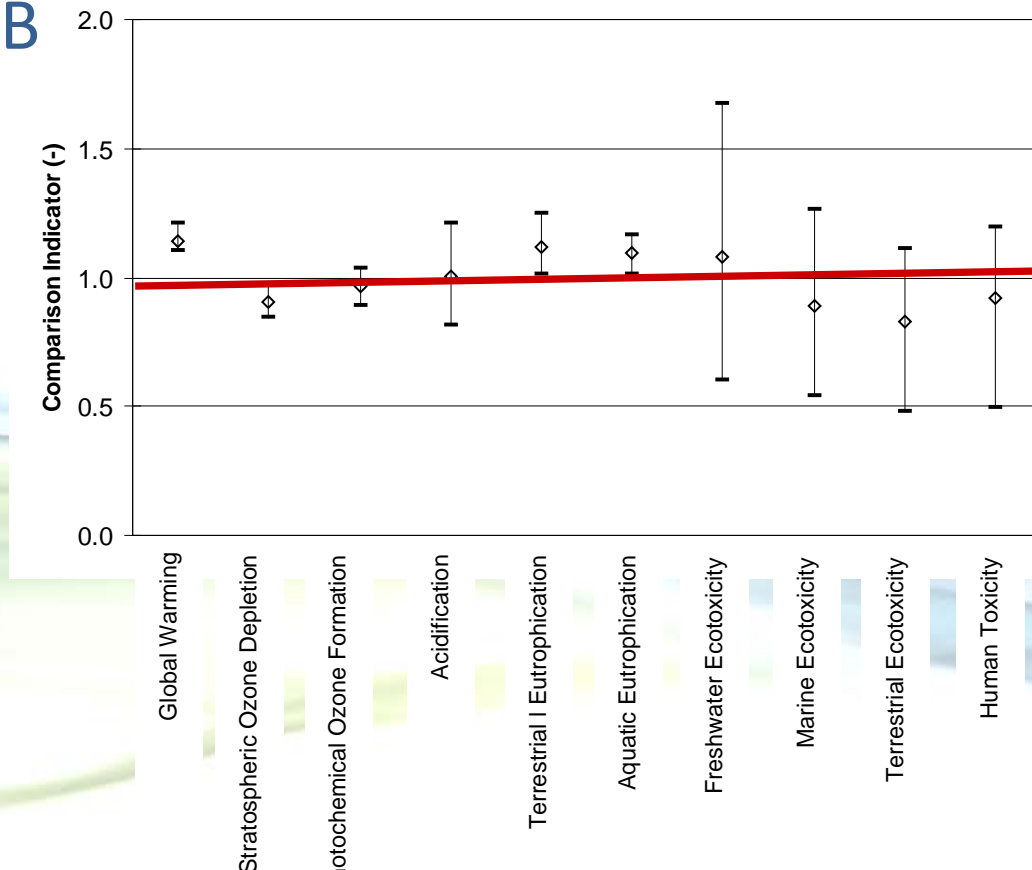


$$\frac{M_x \cdot CF_{e,x}}{NF_e} = NS_{e,x}$$



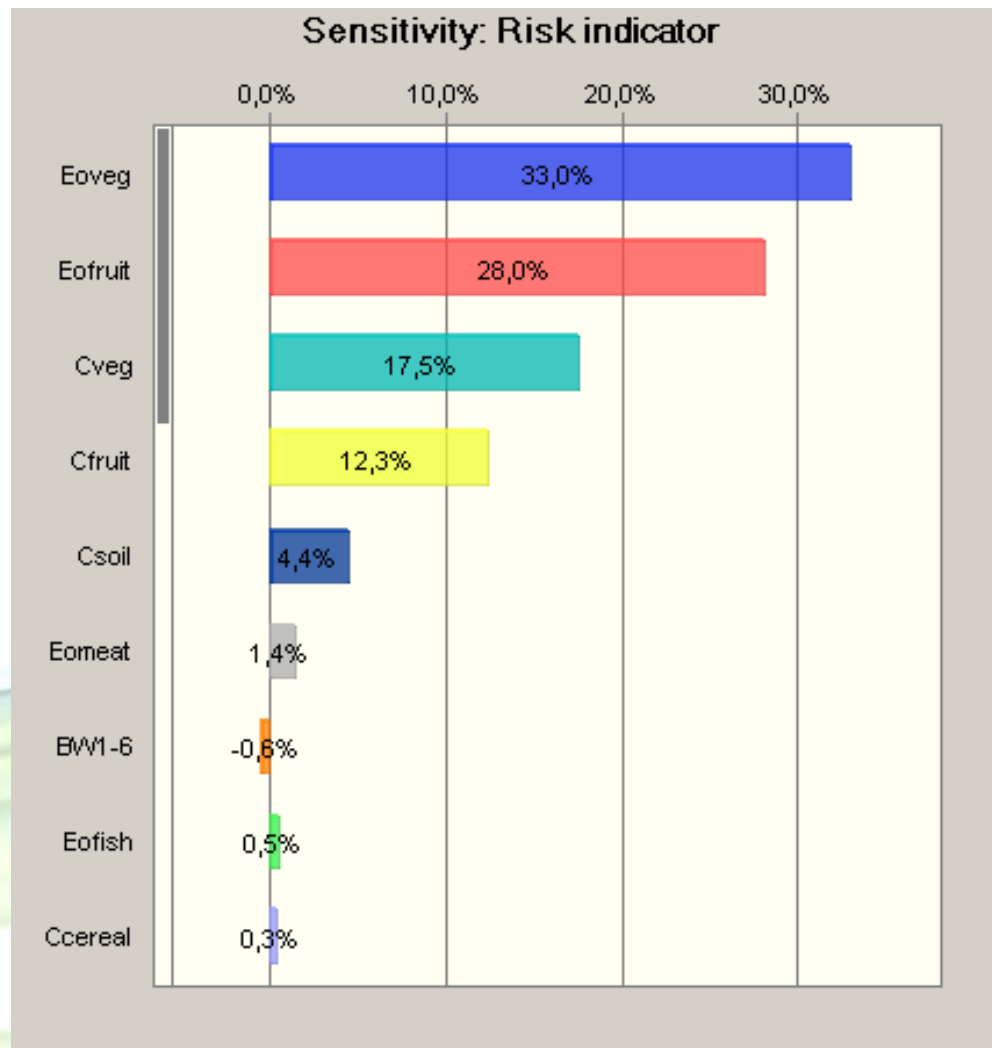
# Comparison Indicator

- Account for correlations between two product systems in MC
- How?  $\rightarrow CI = ISA/ISB$





# Uncertainty Importance



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To obtain a high score in the sensitivity chart a parameter must have:

- ➡ considerable influence on the comparison indicator
- ➡ large variance (broad range of input values)

# Model and choice uncertainty

Choice analysis

1. Identify number of options
2. Calculate outcomes per option

**Cultural Theory....**

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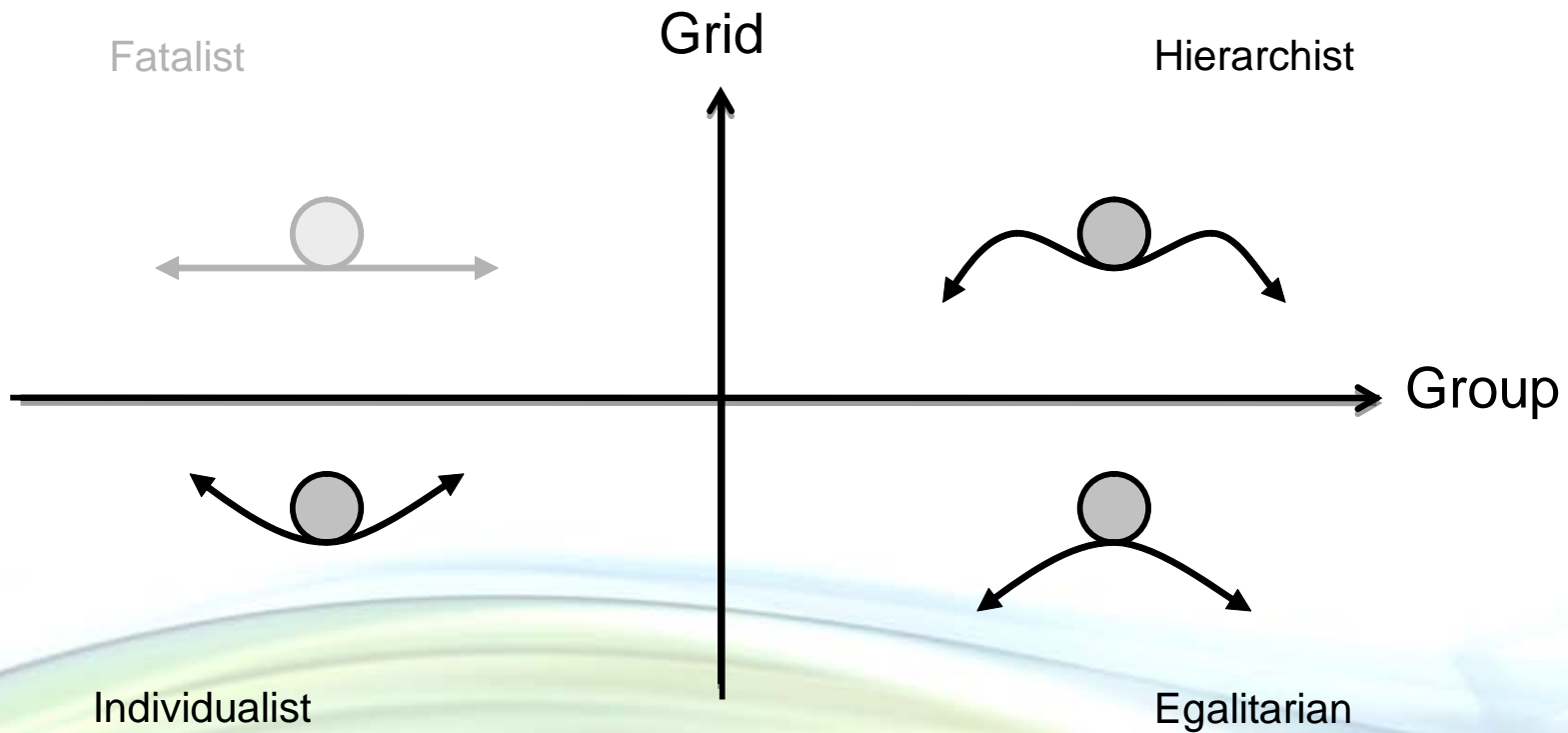
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# Cultural Theory

- Individualists: act on their own; external rules and institutions less important. Natural systems as being inherently stable and inexhaustible
- Hierarchists: aim at maintaining the system; natural systems as being stable and manageable within certain limits.
- Egalitarians: members of their group are equal. Rules imposed from outside the group will be rejected. Regard natural systems as being vulnerable
- Fatalists: Act on their own. Victims of exogenous rules. Experience the world as being governed by chance.

# Cultural Theory



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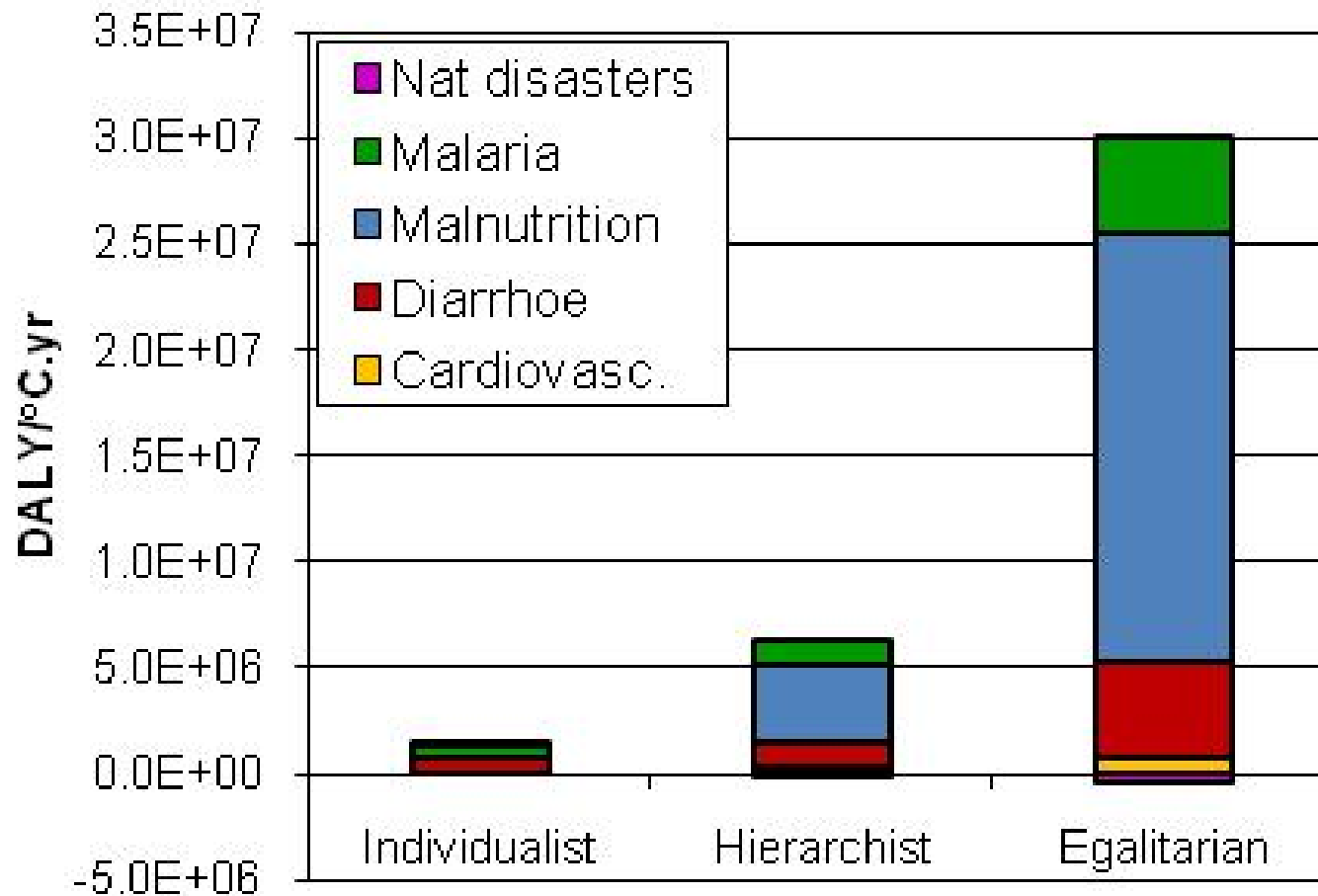
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# Cultural Theory

Impact category	Value choice	Individualist	Hierarchist	Egalitarian
All impact categories	Time horizon	20 years	100 years	Infinite
	Discount rate	5%	3%	0%
	Age weighting	Yes	No	No
	Positive effects	Yes	No	No
Climate change	Future development	Optimistic	Baseline	Pessimistic
Ozone depletion	Cataract	No	Yes	yes
Ionizing radiation	Effects included	Definite	Definite/probable/possible	All effects
Human toxicity	Carcinogenity	IARC 1	IARC 1, 2A,2B	All substances
Respiratory inorganics	Secondary PM	No	From SO <sub>2</sub>	From SO <sub>2</sub> , NH <sub>3</sub> , NO <sub>x</sub>
Ozone formation	Ozone scenario	24h ozone	8h ozone	8h ozone

# Cultural Theory - Example



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# Reducing model uncertainty

- Expand number of stressors
- Implement spatial detail
- ...

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# LCA software

Uncertainty analysis

1. CMLCA

([www.leidenuniv.nl/cml/ssp/software/](http://www.leidenuniv.nl/cml/ssp/software/))

2. Simapro

([www.pre.nl/simapro](http://www.pre.nl/simapro))

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# Summary

- Uncertainties not always assessed in LCA
- Statistical uncertainty: Monte Carlo simulation,  
....
- Choice and model uncertainty: Cultural theory,  
....
- Ignorance: further research!!