

# **Design Principles**

#### Models and uncertainty analysis

#### TU Wien, 07.06.2018



MinFuture is funded by the Horizon 2020 Framework Programme of the European Union under Grant Agreement no. 730330. The contents of this document are the sole responsibility of MinFuture and can in no way be taken to reflect the views of the European Union.

www.minfuture.eu





#### > Drivers

#### Model Uncertainty



**MFA Approaches** 

# Material Flow Analysis

- generates a quantitative understanding of flows in a system
- provides a basis for system optimization.

#### • Estimation of future flows

- is an important information for environmental policy.
- for demand and/or supply of raw materials are made based on scenarios.
- is based on certain assumptions, which are transformed into mathematical functions.









#### Dynamic MFA

- describes the behavior of a system over several time increments.
- provides information about material usage over time and consequent changes in stocks and flows within the system.

#### • Static MFA

- investigates the patterns of material use and material losses in the system.
- balances a certain period in time and provide a snapshot of a system.
- is typically used to generate a quantitative understanding of material systems.

#### 07/06/2018

#### **Models and Scenarios**



#### **Top-Down**

 A time series of input-output balances is used to calculate the total stock.

 $\rightarrow$  Derives the stock from the net flow (the difference between inflows and outflows)

#### **Bottom-Up**

- Directly estimates the stock by summing up the material in question
  - → Estimates on deriving the total stock from the material intensities









- Flow Driven "Driven by the inflow"
  - Given: the inflow and a lifetime distribution
  - $\rightarrow$  the outflow and stock are calculated
- **Stock Driven** "Driven by the stock"

Given: the stock and a lifetime distribution

 $\rightarrow$  the outflow and inflow are calculated

#### Leaching

- The stock as a size buffer every stock is classified into age categories.
- The output is calculated as a leaching part of the stock for each year t.

#### Delay

- The outflow is a delayed inflow: the stock as a time buffer.
- The life span of the products determines the delay.













- Weibull, Normal,
- Log, Beta
- ....

. . .

. . .



0

#### **Demographic drivers**

- Population, Urbanization
- Marriage, divorces
- Families and households
- Socio-economic drivers
  - Gross domestic product
  - Employees
  - Per capita floor area



07/06/2018









- Aleatory variability and epistemic uncertainty
- Causes of uncertainty
- Sources of uncertainty
- Types of uncertainty



uncertainty Of Nature

#### • Aleatory variability and epistemic uncertainty

#### Causes of uncertainty

Statistical variation • Variability • Inherent randomness and unpredictability • Subjective judgment • Disagreement
Linguistic imprecision • Approximation

#### Sources of uncertainty

• Non-deterministic behaviour of a system • Uncertainty of model parameter values and model structure

• Uncertainty due to external influence factors or numerical solutions of model equations

#### • Types of uncertainty

• Parameter uncertainty • Scenario uncertainty • Model uncertainty





- Data classification
- Uncertainty analysis
- Sensitivity analysis
- Comparison of model structure



**Data classification** 

- Asymmetric intervals
   Symmetric intervals
- PEDIGREE Matrix 
   Information defects 
   Combinations

#### Uncertainty analysis

- STAN Software Mathematical MFA
- Probabilistic MFA Fuzzy set theory
- Sensitivity analysis
  - Identify critical model parameters and develop scenarios

in descriptive and exploratory MFA

• Comparison of model structure

• The differences in system boundaries and definition of flows and processes are highlighted - often done qualitatively

with

**ba** 

Approaches

 $\bigcirc$ 



- Should facilitate transparent uncertainty analysis in MFA
- Is suitable to accommodate any of the approaches presented
- Provide a systematic way to consider uncertainty in MFA
- Should form a basis for consistently communicating the approach

## → STEP-WISE FRAMEWORK

ramework

LL





#### **Pyramide: Design Principles**





# **Pyramide: Conclusion**



To handle uncertainty, define the elements of the **system** and the mathematical relationships between them (mass balance principle)





- Collected data is unavoidably of varying quality and often the limiting factor
- If sufficient empirical evidence is available, statistical techniques can be applied
- A **model** is a simplified version of the real system
  - Model parameters approximate the real properties of the system
  - Assumptions/simplifications are made that lead to uncertainty regarding the validity of the model predictions



**Indicators** are often quantified as possible output based on a set of uncertain input (e.g. sensitivity analysis is used to evaluate the effects of parameter variation on the model outputs)



The results are typically inherently limited in terms of accuracy and, thus, in their reliability in subsequent **decision-making processes** 

### **Pyramide: Design Principles**









# Thank You for Your Attention!

**TU Wien,** 07.06.2018



MinFuture is funded by the Horizon 2020 Framework Programme of the European Union under Grant Agreement no. 730330. The contents of this document are the sole responsibility of MinFuture and can in no way be taken to reflect the views of the European Union.

www.minfuture.eu