

ADEME



Agence de l'Environnement
et de la Maîtrise de l'Énergie



Laboratoire d'Hydrologie et
de Géochimie de Strasbourg



Empa

Materials Science and Technology

A comparison of two methods for probabilistic modelling of ENM emissions during their life cycle

Véronique Adam

Bernd Nowack

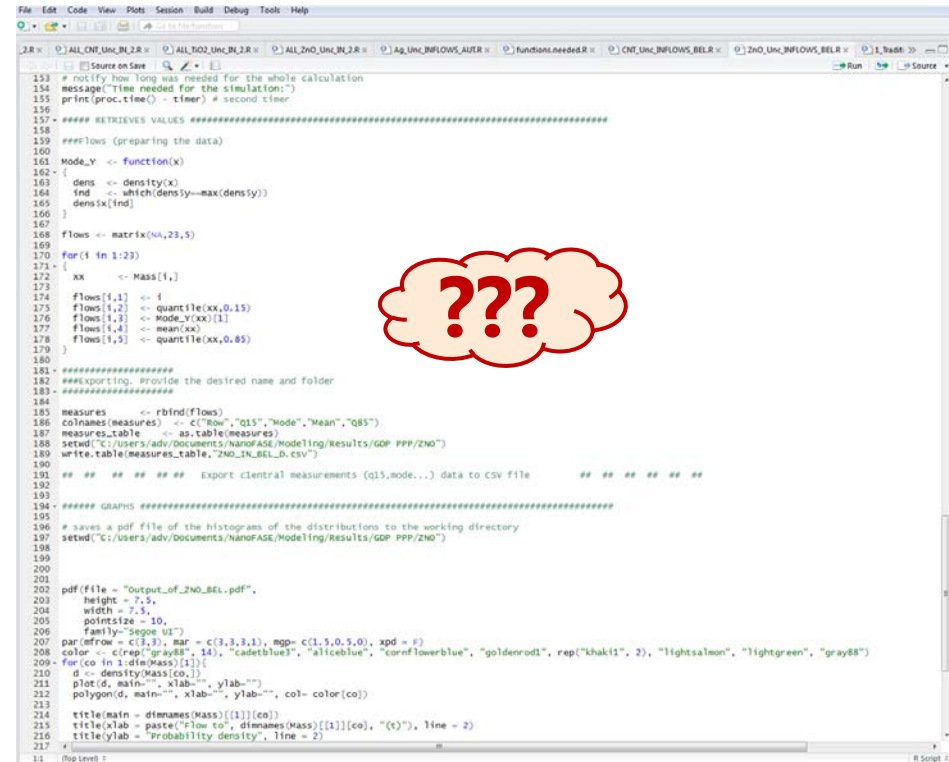
Gaetana Quaranta

Stéphanie Loyaux-Lawniczak

65th LCA Discussion Forum

ETH Zürich - 24 May 2017

Background



WE NEED A PROBABILISTIC APPROACH!

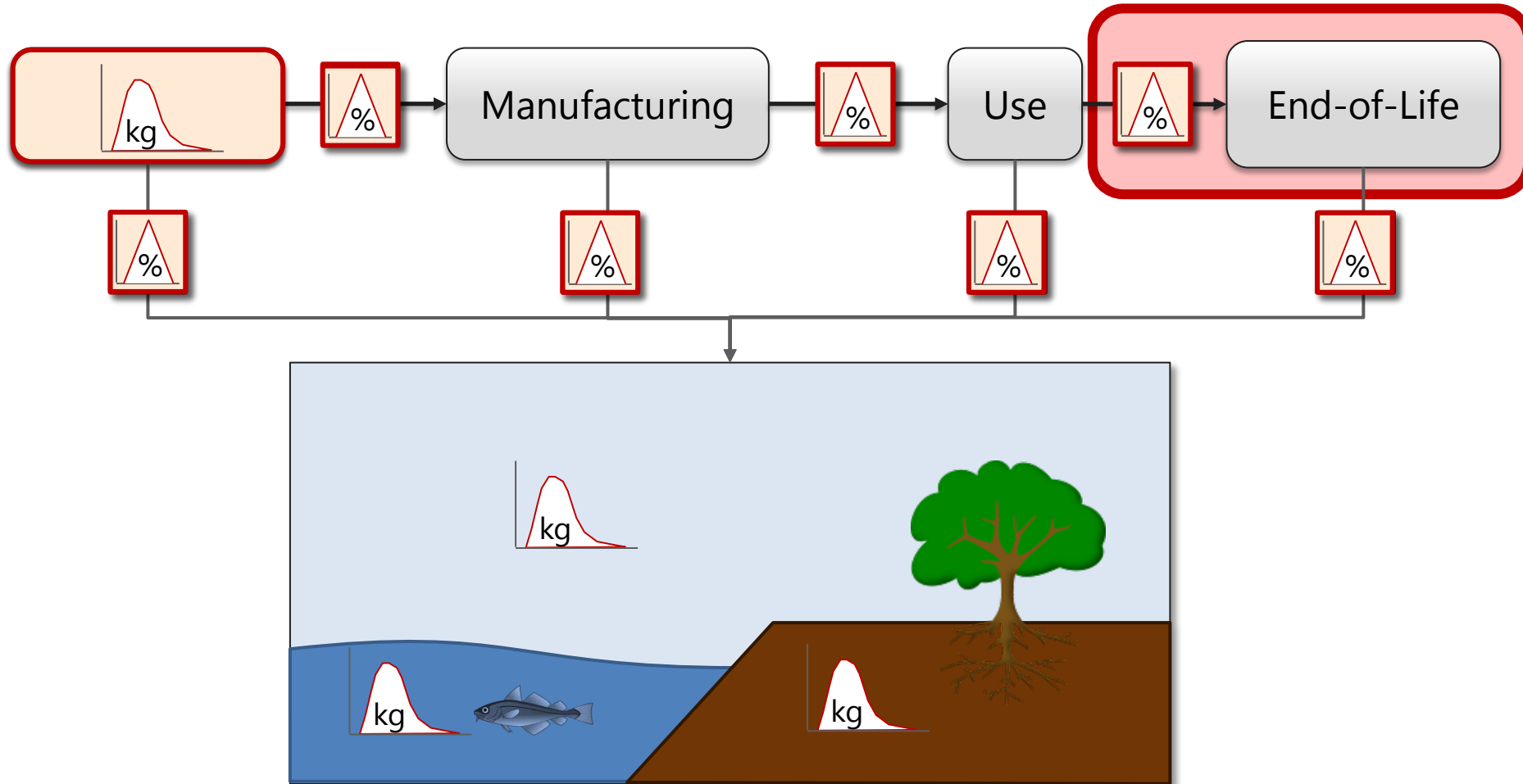
- Method A: Probabilistic Material Flow Analysis
 - General methodology
 - Example of application

- Method B: Bayesian Networks
 - General methodology
 - Example of application

- Points for comparison

Probabilistic Material Flow Analysis

General methodology



Probabilistic Material Flow Analysis

Assessing the probability distributions



- Various data sources used (Reports, papers, Eurostat)
- Uncertainty assessment for each value (i.e. each reference):

Score
1
2
3

Geographical correlation

Score
1
2
3

Temporal correlation

Score
1
2
3

Reliability



$$DQR = \frac{Geo + Temp + Rel + W_i \times 4}{i + 4}$$

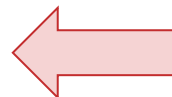
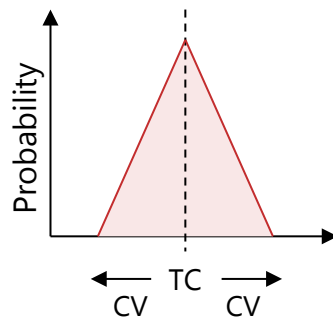
W_i = weakest score
 i = number of indicators

(EC, 2010)



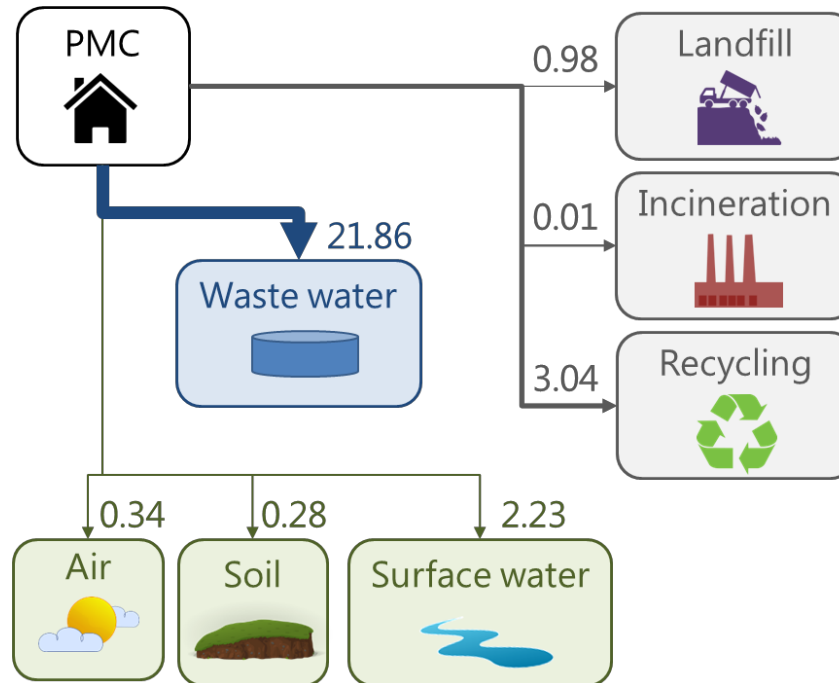
Data Quality Rating	Coefficient of Variation
$1 \leq DQR < 1.5$	4.5%
$1.5 \leq DQR < 2.5$	13.75%
$2.5 \leq DQR \leq 3$	41.5%

(adapted from Laner et al., 2015)



Probabilistic Material Flow Analysis

Results visualisation



Nano-ZnO (tonnes) in Romania

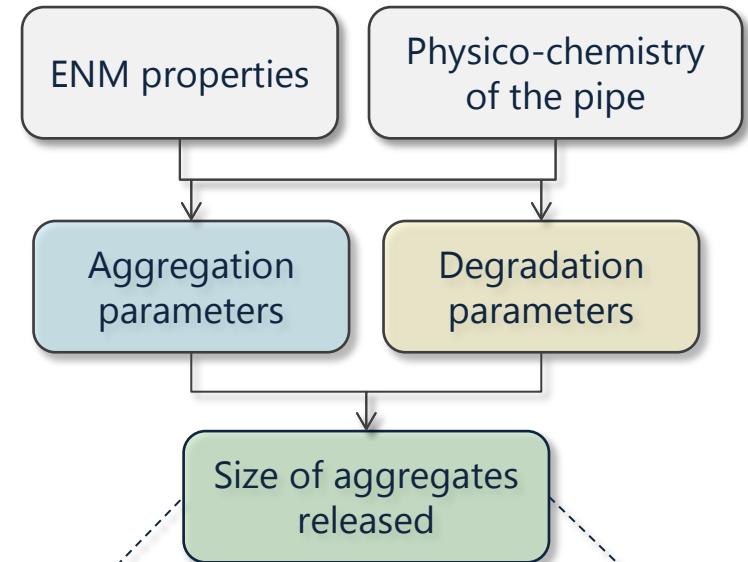
Difficult to represent the whole distributions...

Bayesian networks

General methodology



1. Define the **parameters** needed and their **relationships** (models, lab,...)

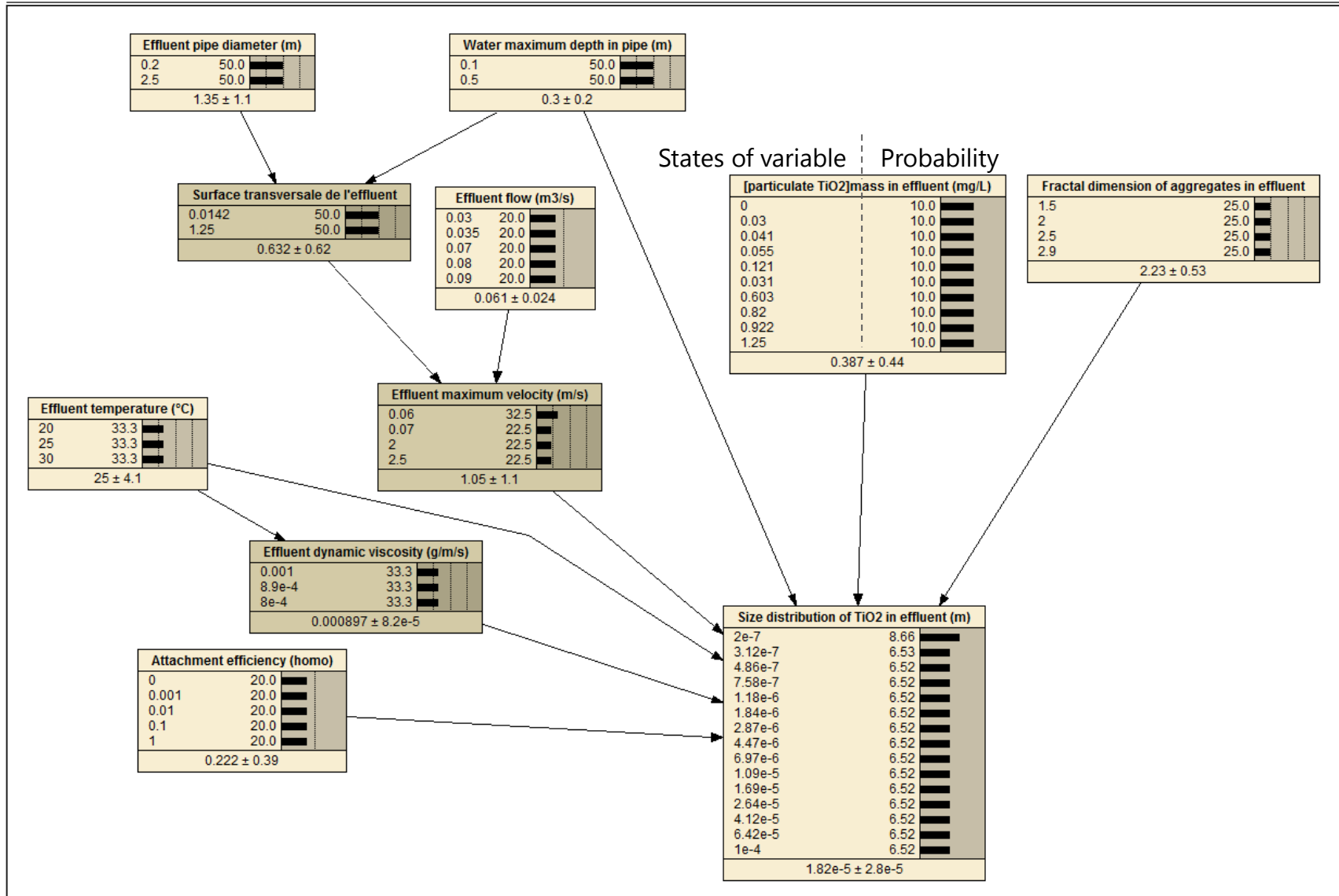


2. Define the **conditional probability tables**

V1	V2	V3		
		1	2	3
[0;5[0.1	0	0	100
[0;5[0.01	0	100	0
[5;10[0.1	25	50	25
[5;10[0.01	20	60	20
[10;15[0.1	100	0	0
[10;15[0.01	100	0	0

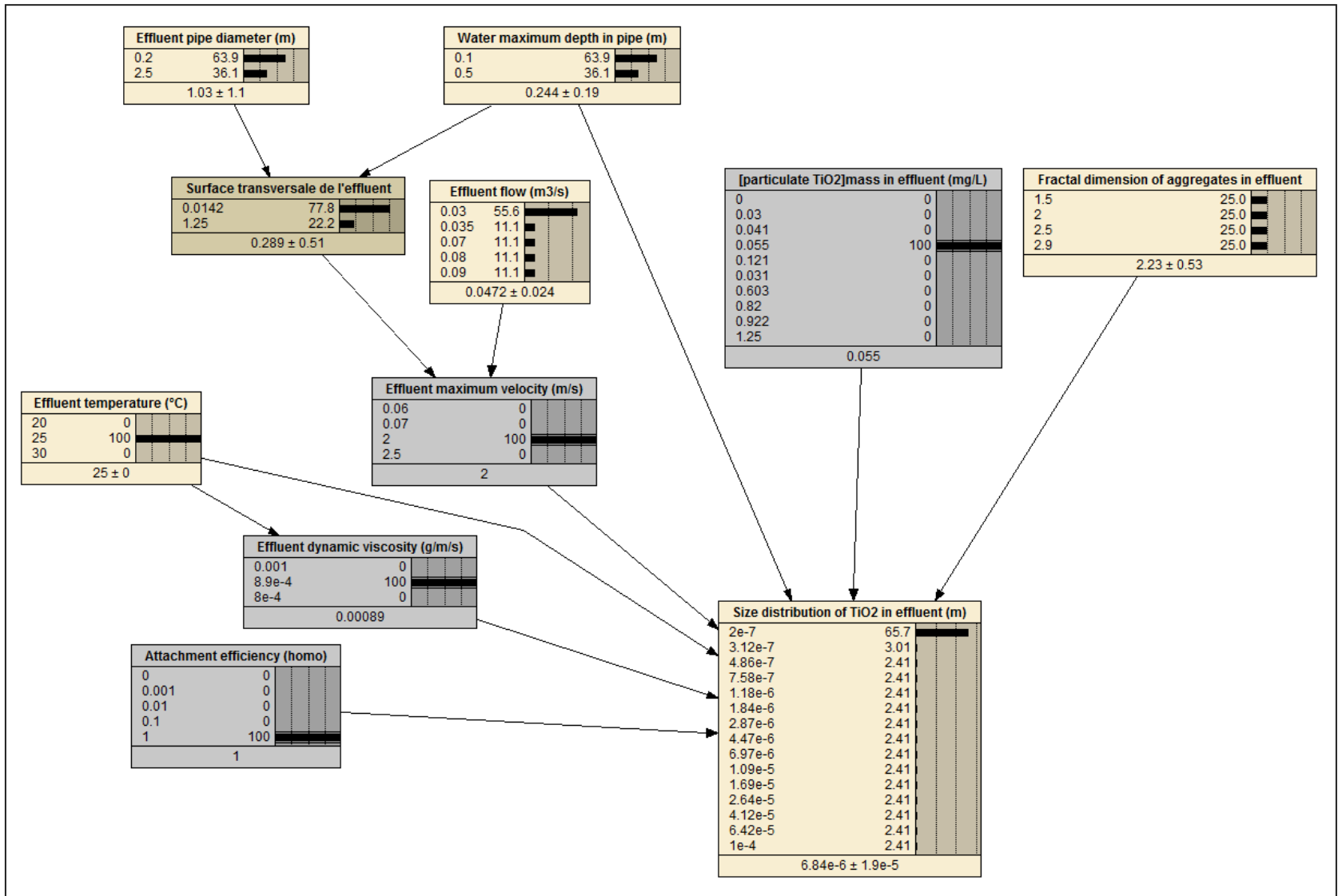
Bayesian networks

Example of application



Bayesian networks

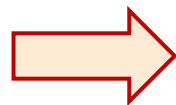
Example of application



- Two powerful and flexible tools
 - Mechanistic or «black box» models
 - Local to global scales
 - Can include temporal dynamics

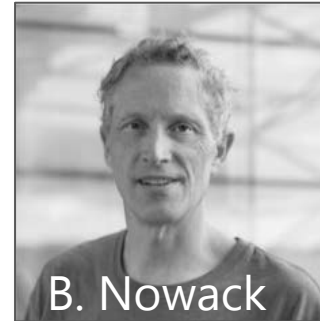
So which should we use?

- Current probabilistic MFA for ENM
 - National to continental scales
 - (Over)simplified probabilistic modelling(?)
- Bayesian networks
 - Easier track of the uncertainty propagation
 - Can become very complex






It depends on the purpose!

Thank you!



Appendix: Uncertainty in waste management



Score			
1	Country considered	≥ 2014	Reports, communications, papers
2	Local data	$2010 \leq x < 2014$	Eurostat
3	Different country	< 2010	Expert estimation