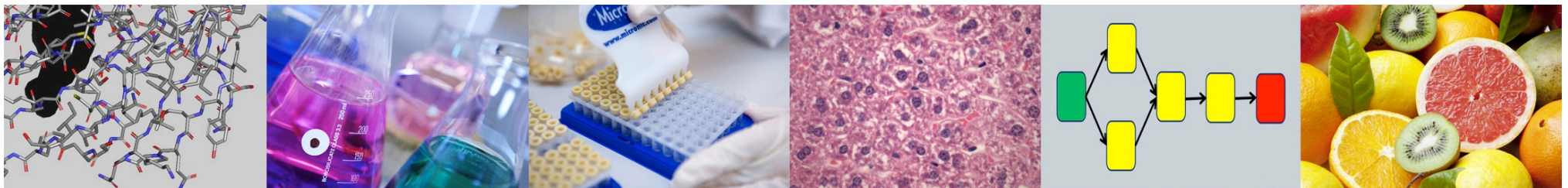




EuroMix handbook for mixture risk assessment

Johanna Zilliacus, Karolinska Institutet, Sweden
EuroMix training material
May 2019



Outline



- EuroMix project
- Mixture risk assessment
- EuroMix handbook
 - EuroMix toolbox
 - Problem formulation
 - Hazard assessment
 - Exposure assessment
 - Risk characterisation
 - Tiering approaches
 - Uncertainty analysis
- Conclusions



Exposure to many different substances – EuroMix



This project is funded by the Horizon 2020 Framework Programme of the European Union



EuroMix methodology and tools



EuroMix handbook

- Methodology and tools for mixture risk assessment
- Examples

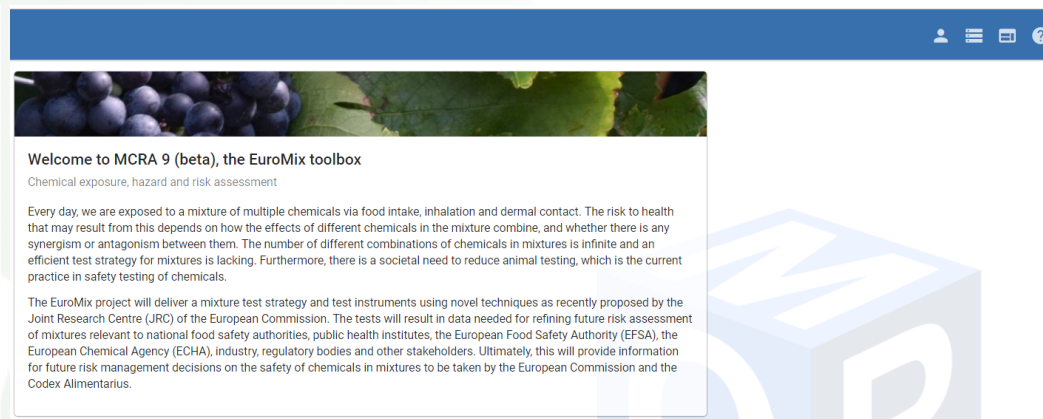
EuroMix toolbox

- Web based toolbox for mixture risk assessment
- Data repository



EuroMix handbook for mixture risk assessment

Johanna Zilliacus, Anna Beronius, Annika Hanberg, Karolinska Institutet, Sweden
Mirjam Luijten and Jacob van Klaveren, RIVM, The Netherlands
Hilko van der Voet, Wageningen University & Research, Biometris, The Netherlands



EuroMix handbook and the EuroMix toolbox provide practical support to apply the recent OECD and EFSA guidance documents in mixture risk assessment

This project is funded by the Horizon 2020 Framework Programme of the European Union



Recent international guidance on mixture risk assessment

OECD: Considerations for Assessing the Risks of Combined Exposure to Multiple Chemicals, 2018

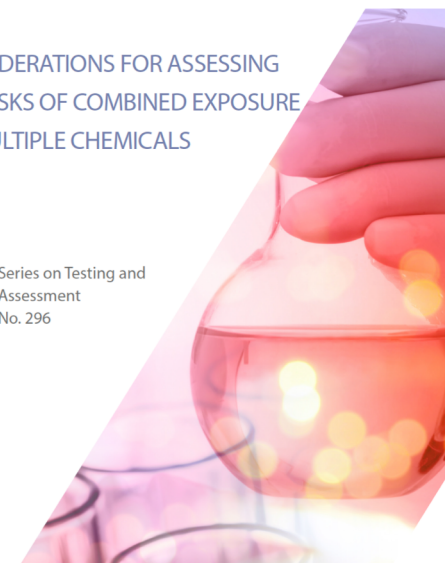
EFSA: Guidance on harmonised methodologies for human health, animal health and ecological risk assessment of combined exposure to multiple chemicals, 2019

EuroMix handbook is in line with the recent documents



CONSIDERATIONS FOR ASSESSING
THE RISKS OF COMBINED EXPOSURE
TO MULTIPLE CHEMICALS

Series on Testing and
Assessment
No. 296



GUIDANCE



ADOPTED: 20 February 2019
doi: 10.2903/j.efsa.2019.5634

Guidance on harmonised methodologies for human health, animal health and ecological risk assessment of combined exposure to multiple chemicals

EFSA Scientific Committee,
Simon John More, Anthony Hardy, Vasileios Bampidis, Diane Benford, Susanne Hougard Bennekou, Claude Bragard, Jos Boesten, Thorhallur Ingi Halldorsson, Antonio F Hernández-Jerez, Michael John Jeger, Helle Katrine Knutsen, Konstantinos Panagiotis Koutsoumanis, Hanspeter Naegeli, Hubert Noteborn, Colin Ockleford, Antonia Ricci, Guido Rychen, Josef R Schlatter, Vittorio Silano, Søren Saxmose Nielsen, Dieter Schrenk, Roland Solecki, Dominique Turck, Maged Younes, Emilio Benfenati, Laurence Castle, Nina Cedergreen, Ryszard Laskowski, Jean Charles Leblanc, Andreas Kortenkamp, Ad Ragas, Leo Posthuma, Claus Svendsen, Emanuela Testai, Bruno Dujardin, George EN Kass, Paola Manini, Maryam Zare Jeddi, Jean-Lou CM Dorne and Christer Hogstrand

Abstract

This Guidance document describes harmonised risk assessment methodologies for combined exposure to multiple chemicals for all relevant areas within EFSA's remit, i.e. human health, animal health and

This project is funded by the Horizon
2020 Framework Programme of the
European Union



Risk assessment of mixtures of substances



Whole mixture approach

- Toxicity and exposure data on whole mixture
- Many possible mixtures
- Mixtures change composition

Component-based approach

- Toxicity and exposure data on individual substances in the mixture
 - Predict toxicity of mixture
-
- EuroMix is using the component-based approach



Combine toxicities of substances in a mixture

- Dose addition
 - Substances with similar toxicity
 - Substances in mixtures treated as dilutions of each other scaled for the potencies
 - Default, conservative model
- Response addition
 - Toxicologically independent substances
 - Joint probability of independent events
- Interactions
 - Synergistic: $1 + 1 > 2$
 - Antagonistic: $1 + 1 < 2$
 - Rare, handled case by case
- Dose addition is the default model in the EuroMix tools
- EuroMix mixture experiments to identify possible interactions



Dose addition using relative potency factors (RPFs)



The toxic potency of each substance is combined using dose addition

Exposure of each substance is multiplied with the relative potency factor (RPF)

Potency scaled exposure added to get the potency scaled exposure expressed as index substance equivalents

EuroMix toolbox is based on the RPF methodology



Dose addition using relative potency factors (RPFs)



- Toxicity of index substance (Point of departure (POD), NOAEL/BMD):
 POD_{index}
- Toxicity of each substance in mixture (Point of departure, NOAEL/BMD):
 $POD_1, POD_2, POD_3, POD_4 \dots$
- Calculate Relative potency factor (RPF) for each substance:
 $RPF_1 = POD_{\text{index}} / POD_1$
- Exposure to mixture is scaled based on RPFs
- $Exp_{\text{mix}} = Exp_1 \times RPF_1 + Exp_2 \times RPF_2 + \dots$
- Margin of Exposure (MOE) is calculated:
- $MOE = POD_{\text{index}} / Exp_{\text{mix}}$
- $MOE >$ assessment factors, combined risk of mixture is usually considered acceptable



Grouping of substances



Group of substances included in the mixture risk assessment

Grouping based on e.g.:

- Common exposure source
- Structural similarities
- Toxicological considerations

EuroMix developed methods for grouping based on toxicological considerations

EuroMix toolbox can also be used for other types of grouping

Grouping can be done at different levels

- Organ
- Specific effect (adverse outcome)
- Specific mode of action/adverse outcome pathway

Grouping at level of specific effect will probably be most common



EuroMix methodology and tools



- Component-based approach
- Grouping based on toxicological considerations
- Dose addition as default model
- Relative potency factors (RPF) approach
- Probabilistic exposure assessment
- Mainly dietary exposure

Very flexible

- Also applicable for other grouping principles (structure, exposure...)
- Any type of substance
- RPFs based on ADI/TDI, NOAEL/BMD for critical or specific effect or same potency for all substances
- Methodology to handle data poor substances



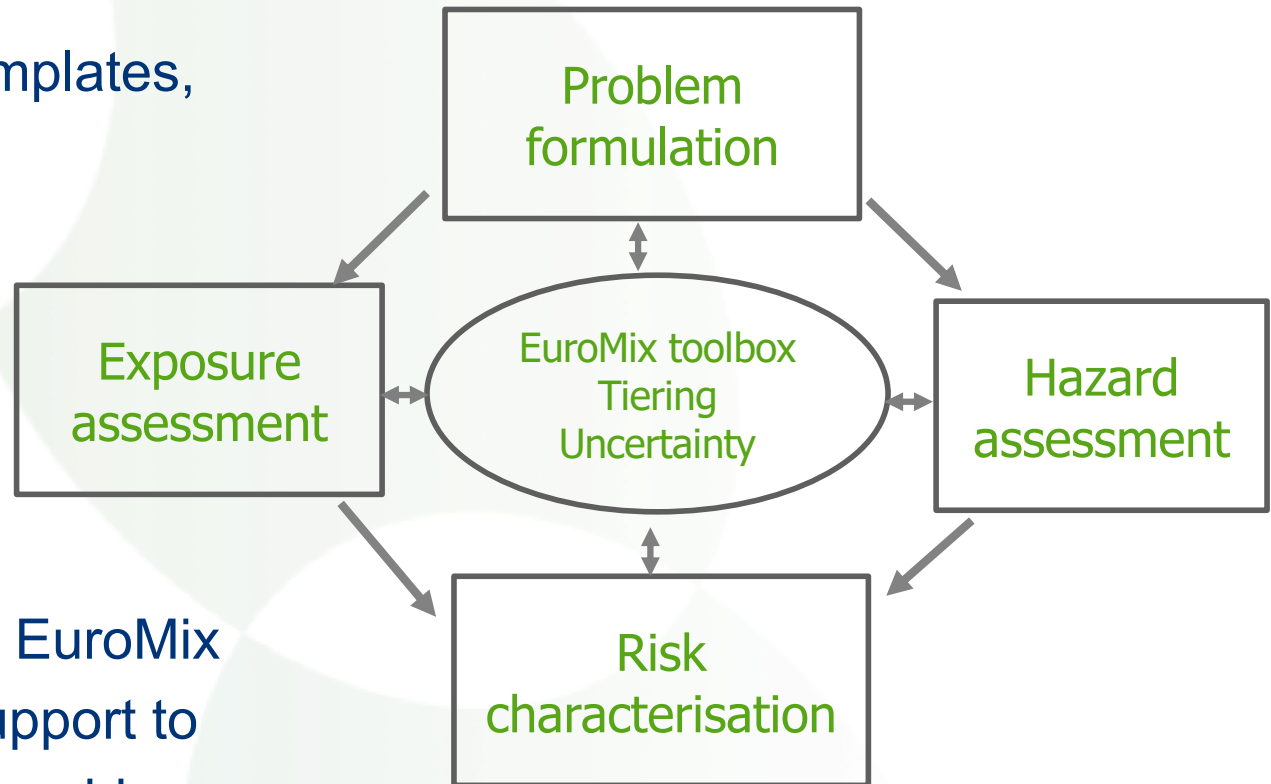
EuroMix handbook for mixture risk assessment



Practical handbook with templates, instructions and examples:

- Problem formulation
- Hazard assessment
- Exposure assessment
- Risk characterisation

EuroMix handbook and the EuroMix toolbox provide practical support to apply the OECD and EFSA guidances



EuroMix handbook – sections (1)



- Abbreviations
- Introduction
- EuroMix toolbox
- Problem formulation
- Hazard assessment
 - Identification and assessment of AOP networks
 - Collection and assessment of toxicity data from literature
 - Tiered testing strategies
 - Grouping of substances based on toxicological considerations
 - Relative potency factors
 - Mixture experiments



EuroMix handbook – sections (2)



- Exposure assessment
 - Probabilistic exposure assessment
 - Absence of measured concentration data
 - Non-dietary exposure assessment
- Risk characterisation
 - Dose addition
 - Margin of exposure
 - Selection of main mixtures based on exposure and hazard data
- Tiering approaches
- Uncertainty analysis
- References
- Glossary



EuroMix handbook – sections (3)



Annexes

- Detailed methodology and templates
- Examples
- Training material for EuroMix toolbox



EuroMix handbook – sections (1)



- Abbreviations
- Introduction
- **EuroMix toolbox**
- Problem formulation
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EuroMix toolbox

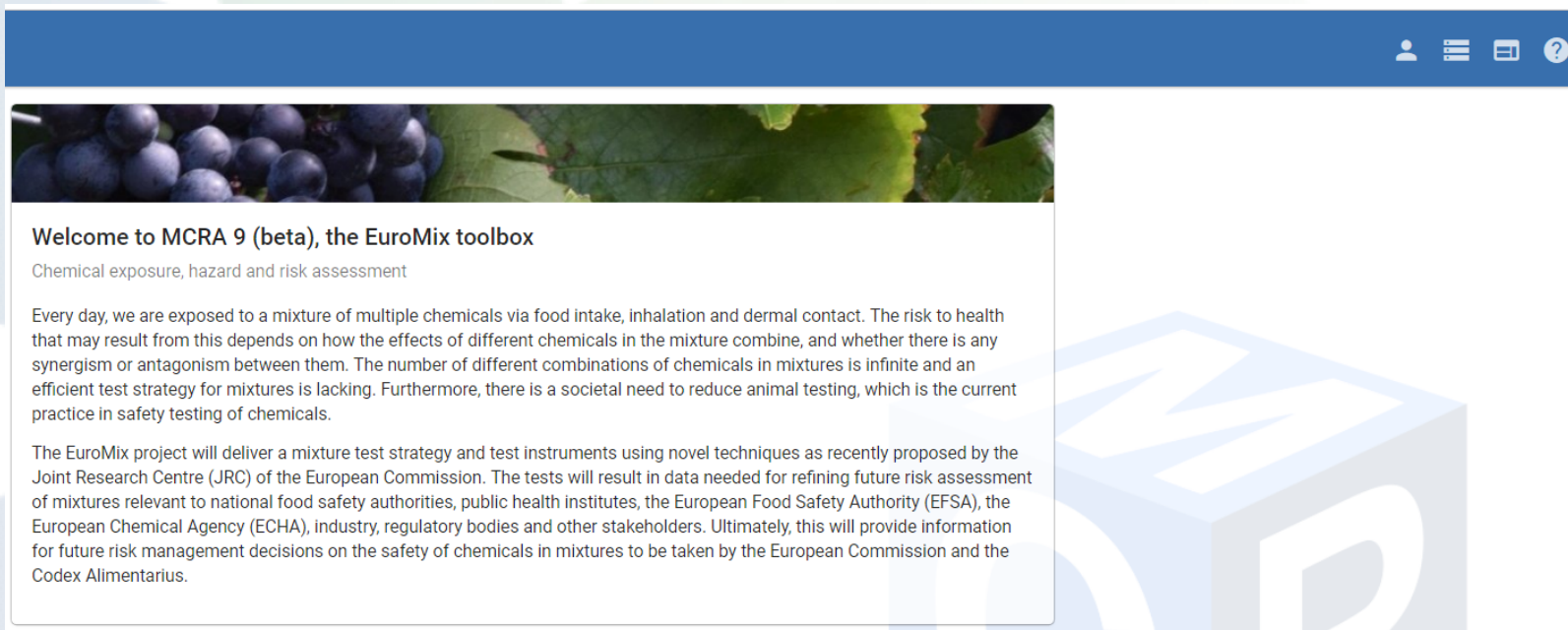


Web-based toolbox for mixture risk assessment

Based on previous MCRA tool

Upload toxicity and exposure data

Calculate exposure levels, relative potency factors, risk levels

A screenshot of the EuroMix toolbox web interface. At the top is a dark blue navigation bar with icons for user profile, menu, and help. Below the navigation bar is a header image showing a bunch of dark purple grapes. The main content area has a white background and contains the following text:

Welcome to MCRA 9 (beta), the EuroMix toolbox

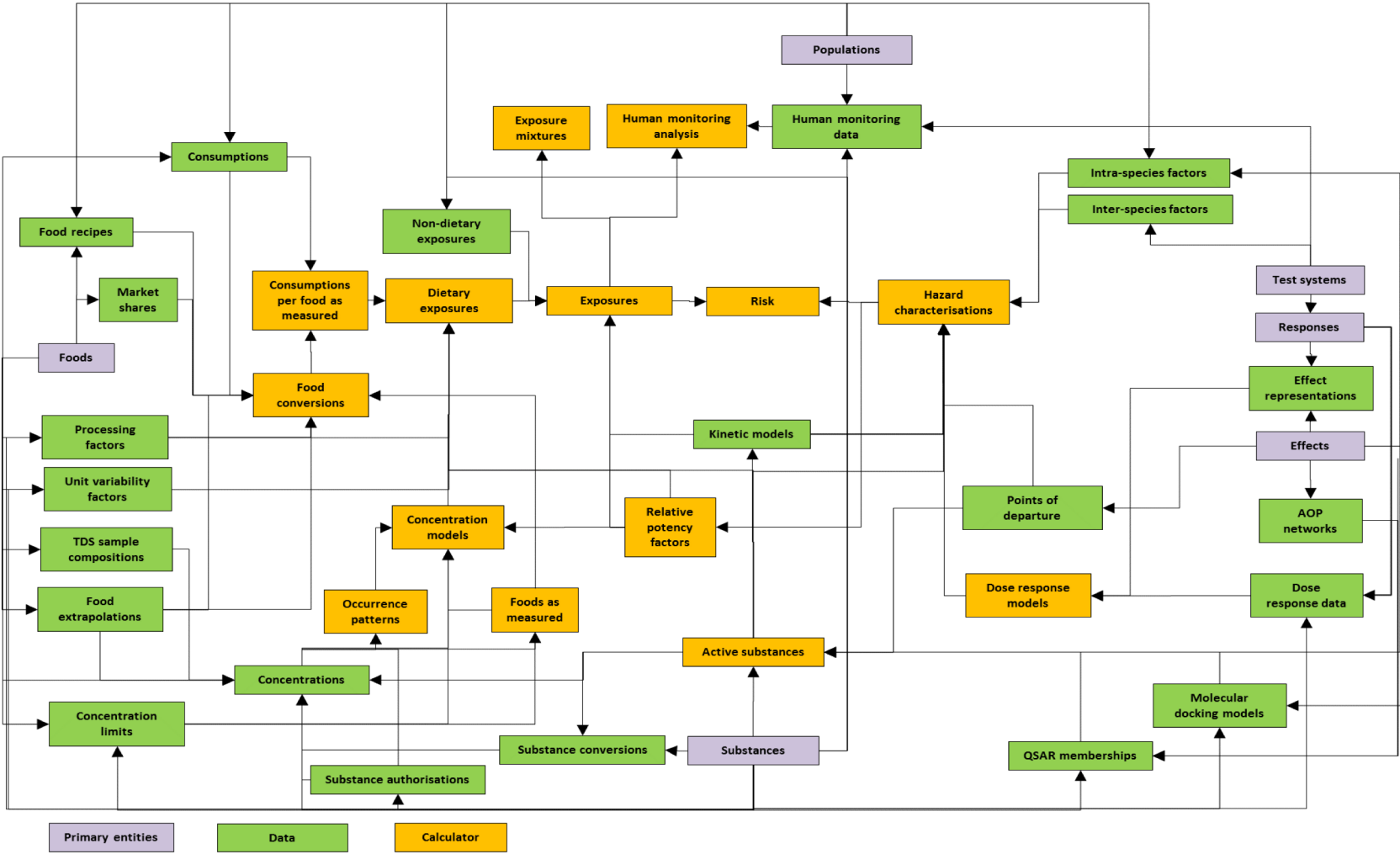
Chemical exposure, hazard and risk assessment

Every day, we are exposed to a mixture of multiple chemicals via food intake, inhalation and dermal contact. The risk to health that may result from this depends on how the effects of different chemicals in the mixture combine, and whether there is any synergism or antagonism between them. The number of different combinations of chemicals in mixtures is infinite and an efficient test strategy for mixtures is lacking. Furthermore, there is a societal need to reduce animal testing, which is the current practice in safety testing of chemicals.

The EuroMix project will deliver a mixture test strategy and test instruments using novel techniques as recently proposed by the Joint Research Centre (JRC) of the European Commission. The tests will result in data needed for refining future risk assessment of mixtures relevant to national food safety authorities, public health institutes, the European Food Safety Authority (EFSA), the European Chemical Agency (ECHA), industry, regulatory bodies and other stakeholders. Ultimately, this will provide information for future risk management decisions on the safety of chemicals in mixtures to be taken by the European Commission and the Codex Alimentarius.



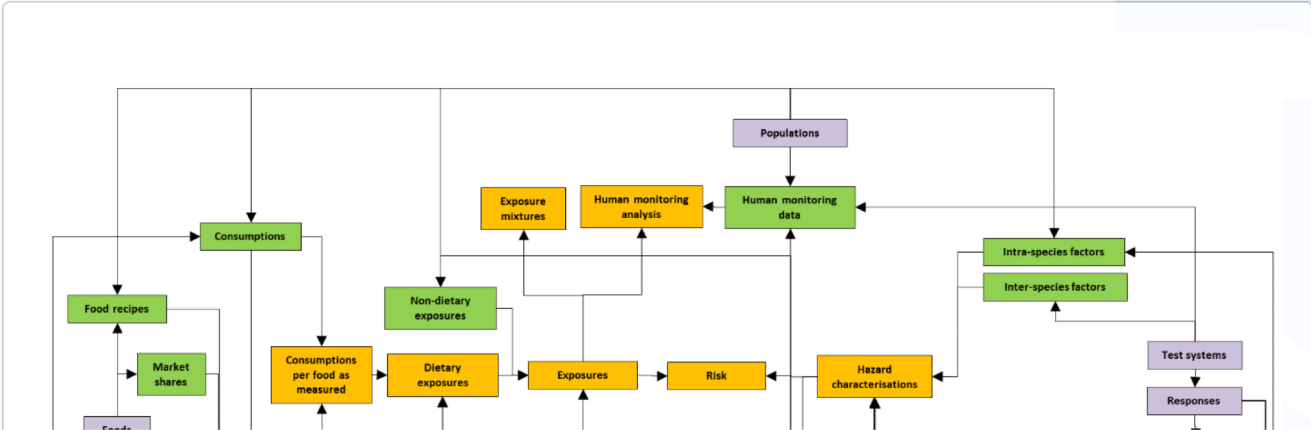
EuroMix toolbox-modules



- Primary entities <
- Consumption <
- Occurrence <
- Exposure <
- Hazard <
- Risk <
- In-silico <
- Kinetic <

Modular design

The models and data of the MCRA 9 toolbox are bundled in the modular design of which the diagram is shown below. It shows how the data and models are related to each other. Each module (i.e., each block in the diagram) represents a certain type of data that can be provided as a data source or it may be computed from other data. In the diagram, the purple boxes represent primary entity modules (or scoping modules), the green boxes represent data modules, and the orange boxes represent modules for which the data can be calculated from other data. In the toolbox, each module corresponds with an action that can be configured and for which output may be produced.



EuroMix toolbox user manual



Web-based user manual

- Descriptions of each module
- Settings
- Data formats

A screenshot of the MCRA Documentation web page. The page has a dark blue header with the text "MCRA Documentation" and a search bar. A dark sidebar on the left contains a "CONTENTS:" section with a list of links: Colophon, Introduction, About the toolbox, Modules, Examples, References, and Appendix. The main content area is white and shows the breadcrumb "Docs » MCRA documentation", the title "MCRA documentation", a welcome message "Welcome to the MCRA 9 documentation.", and a "Contents:" section with a detailed list of links including Colophon, Introduction, About the toolbox, Modules, Examples, References, and Appendix, each with its own sub-links.

MCRA Documentation

Search docs

CONTENTS:

- Colophon
- Introduction
- About the toolbox
- Modules
- Examples
- References
- Appendix

Docs » MCRA documentation

MCRA documentation

Welcome to the MCRA 9 documentation.

Contents:

- [Colophon](#)
 - [Contributors to MCRA](#)
- [Introduction](#)
- [About the toolbox](#)
 - [Modular design](#)
 - [Toolbox data repository](#)
 - [Workspaces and actions](#)
- [Modules](#)
 - [Primary entity modules](#)
 - [Consumption modules](#)
 - [Occurrence modules](#)
 - [Exposure modules](#)
 - [Hazard modules](#)
 - [In-silico modules](#)
 - [Kinetic modules](#)
 - [Risk modules](#)
- [Examples](#)
- [References](#)
- [Appendix](#)
 - [Munro collection](#)
 - [Unit definitions](#)
 - [Transformations](#)
 - [Gauss-Hermite](#)
 - [Concentration models](#)
 - [Chronic exposure assessment, daily consumed foods](#)
 - [Chronic exposure assessment, episodically consumed foods](#)
 - [Unit variability](#)
 - [Screening calculation for large Cumulative Assessment Groups](#)
 - [Uncertainty analysis](#)

Examples: Relative potency factors



MCRA 9 - EuroMix toolbox / Training
Exposure, Hazard & Risk Assessment workspace

Help / Modules overview / Hazard / Relative potency factors

Primary entities <
Consumption <
Occurrence <
Exposure <
Hazard <
Risk <
In-silico <
Kinetic <

General | Data format | Calculation | Uncertainty sources

Relative potency factors module

Scope: Substances Effects

Selection inputs: AOP networks

Relative potency factors (RPFs) describe the potency of substances with respect to a defined effect, relative to the potency of a chosen index substance. RPFs can be given as data or computed from hazard characterisations.

Calculate relative potency factors (RPF) based on

- NOAELs/BMDs from literature
- In vitro or in vivo dose response data using dose response modelling
- TTC values



Example: Active substances/ Assessment groups

MCRA 9 - EuroMix toolbox / Training
Exposure, Hazard & Risk Assessment workspace

≡ Help / Modules overview / Hazard / Active substances

Primary entities <
Consumption <
Occurrence <
Exposure <
Hazard <
Risk <
In-silico <
Kinetic <

General | Data format | Calculation | Uncertainty sources

Active substances module

Scope: **Effects** **Substances**

Selection inputs: **AOP networks** **Points of departure**

Active substances are the substances that may lead to a specific health effect (adverse outcome). Active substances can be either specified directly as data or calculated from QSAR membership models or from Molecular docking models. Optionally, active substances can have assessment group memberships between 0 and 1.

Specify substances included in an assessment group

- List of substances
- Calculate based on in silico models



Example: Combined dietary exposure



MCRA 9 - EuroMix toolbox / Training / Relative potency f...
Exposure, Hazard & Risk Assessment workspace action

≡ Help / Modules overview / Exposure / Dietary exposures

Primary entities <
Consumption <
Occurrence <
Exposure <
Hazard <
Risk <
In-silico <
Kinetic <

General Calculation Uncertainty sources Output settings

Dietary exposures module

Scope: Populations Foods Substances Effects

Dietary exposures are the amounts of substances, expressed per kg bodyweight or per individual, to which individuals in a population are exposed from their diet per day. Depending on the exposure type, dietary exposures can be short-term/acute exposures and then contain exposures for individual-days, or they can be long-term/chronic exposures, in which case they represent the average exposure per day over an unspecified longer time period.

Calculate combined dietary exposure and margin of exposure (MOE) using

- Consumption data
- Concentration data
- Relative potency factors (RPF)



Example: Aggregate exposure



MCRA 9 - EuroMix toolbox / Training / Relative potency f...
Exposure, Hazard & Risk Assessment workspace action

Help / Modules overview / Exposure / Exposures

Primary entities <

Consumption <

Occurrence <

Exposure <

Hazard <

Risk <

In-silico <

Kinetic <

General

Calculation

Uncertainty sources

Output settings

Exposures module

Scope: Populations Foods Substances Effects

Exposures, possibly from both dietary and non-dietary routes of exposure, to which individuals in a population are exposed per day at a chosen target level. This target level may be external exposure (dietary exposure) or internal exposure. Internal exposures may be aggregated from dietary and non-dietary exposures using either absorption factors or kinetic models to translate the external exposures to internal exposures. Exposures can be short-term/acute exposures and then contain exposures for individual-days, or they can be long-term/chronic exposures, in which case they represent the average exposure per day over an unspecified longer time period.

Calculate aggregate exposure and margin of exposure (MOE) using

- Dietary exposure
- Non-dietary exposure
- Relative potency factors (RPF)



EuroMix handbook – sections (1)



- Abbreviations
- Introduction
- EuroMix toolbox
- **Problem formulation**
- Hazard assessment
 - Identification and assessment of AOP networks
 - Collection and assessment of toxicity data from literature
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 - Mixture experiments



Problem formulation for mixture risk assessment



- Risk assessment question
 - Description of the mixture
 - Conceptual model
 - Methodological approach
 - Analysis plan
- EuroMix developed a template for the problem formulation and analysis plan

Problem formulation element	Description	Recorded information
Risk assessment question	Aim of the assessment and/or specific questions to be addressed.	
Description of mixture	Evidence for common toxicological effect of the mixture components	
	Evidence for co-exposure	
Conceptual model	Regulatory framework or specific regulatory remit	
	Substances	
	Exposure source(s) (e.g. food (specify if possible), drinking water, cosmetics, consumer products (specify), air, soil)	
	Exposure pathway(s) (e.g. oral, dermal, inhalation - specify as needed)	
	Population group (e.g. general population, workers, school children, pregnant women)	
	Population age (infant, toddler, child, teen, adult, elderly)	
	Toxicological effect	
	Level of grouping (common target organ, common adverse outcome (specific effect on the organ level) or common specific mode of action/AOP)	
Methodology	Data availability for toxicity described in general terms	
	Data availability for exposure described in general terms	
	Identification and assessment of AOP networks	
	Grouping of substances based on toxicological effect	
	Collection of toxicity data	
	Description of approach for dealing	



Problem formulation-example

Problem formulation element	Description	Recorded information
Risk assessment question	Specific questions to be addressed	What is the risk for the adult population in the Netherlands to develop liver steatosis due to combined dietary exposure to pesticide residues in food?
Description of mixture	Evidence for common toxicological effect of the mixture components	Liver steatosis is identified as an effect in <i>in vivo</i> studies of several pesticides (RIVM, ICPS, ANSES, 2013, 2016)
	Evidence for co-exposure	Monitoring studies show that European food contains low levels of pesticide residues (EFSA 2018d)
Conceptual model	Regulatory framework or remit	Not applicable
	Substances categories	Pesticide residues
	Exposure source(s) (e.g. food, drinking water, cosmetics, consumer products, air, soil)	Food and drinking water
	Exposure route(s) (e.g. oral, dermal, inhalation - specify as needed)	Oral
	Population group (e.g. general population, workers, school children, pregnant women, country)	General population in the Netherlands
	Population age (infant, toddler, child, teen, adult, elderly)	Adults
	Toxicological effect	Liver steatosis
	Level of grouping (common target organ, common effect/adverse outcome or common specific mode of action/AOP)	Common effect/adverse outcome

Problem formulation-example



Methodology	Data availability for toxicity described in general terms, including the type of data	Regulatory in vivo toxicity studies reported in EFSA draft assessment reports, other assessment reports from international bodies. In vivo studies in scientific papers. Study characteristics, NOAEL, LOAEL, but in most cases not dose-response data. Results from QSAR modelling and in vitro studies.
	Data availability for exposure described in general terms, including the type of data	Consumption data from national dietary surveys in Netherlands. Concentration data from European monitoring studies.
	Use of AOP networks to support grouping of substances into assessment groups and/or identification of measurable effect/key events	AOP networks for liver steatosis used to support grouping and identify measurable key events
	Collection of toxicity data from literature	Literature search to identify toxicity data from reports and scientific papers, selection of studies on included substances and effect included to the AOP network, assessing reliability of scientific papers using SciRAP tool.
	Generation of toxicity data	In case relevant and reliable toxicity data is not identified from literature, in silico data and in vitro data for selected KEs in the AOP network is generated.
	Grouping of substances based on toxicological considerations	Grouping at the level of common effect, liver steatosis, using in silico, in vitro and in vivo data using two experts. Grouping reported as included/not included.



EuroMix handbook – sections (1)



- Abbreviations
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 - Relative potency factors
 - Mixture experiments



Toxicity data for mixture risk assessment



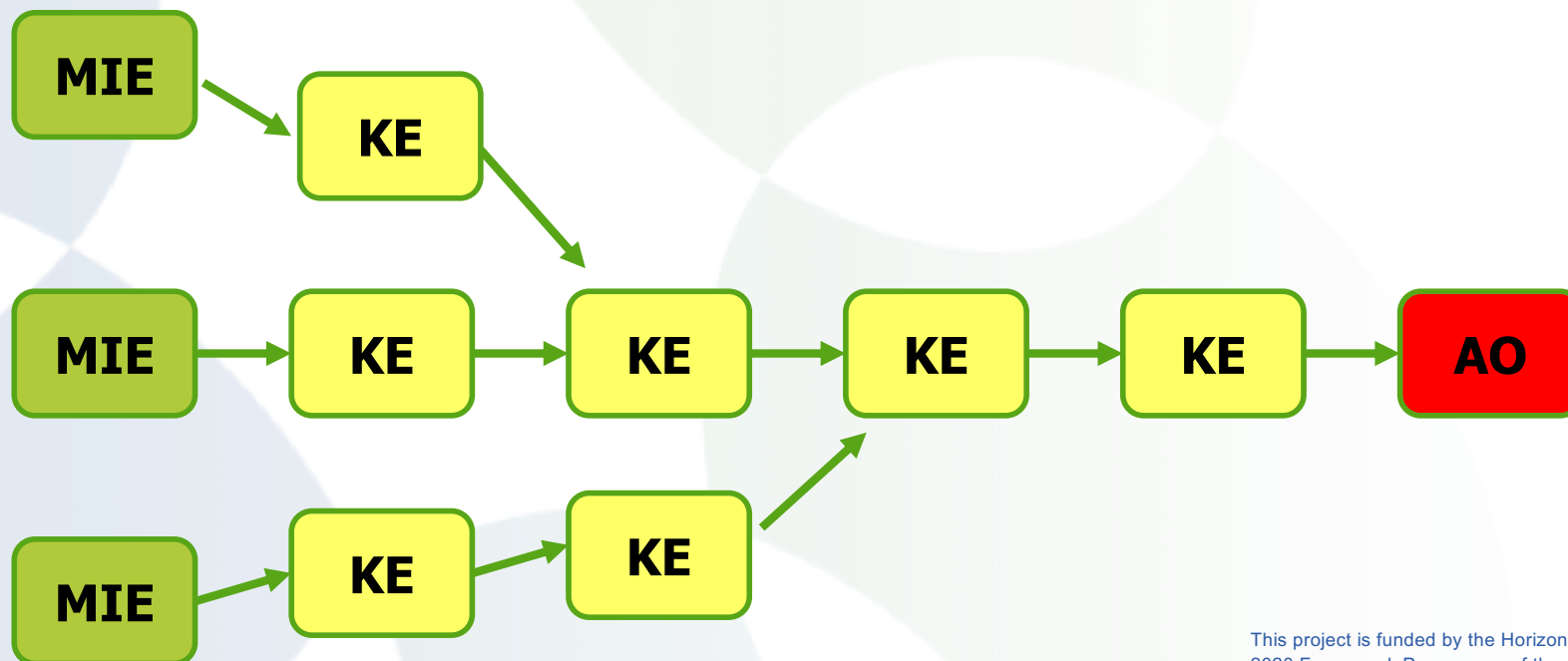
Toxicity data needed for

- Grouping into assessment groups
- Relative potency factors
- **In vivo data**
 - Not always available or feasible to produce for all substances
- **In vitro data**
 - Inform grouping
 - Relative potency factors using in vitro to in vivo extrapolation (IVIVE)
 - Tiered testing strategies and set priorities for in vivo testing
- **In silico data**
 - Inform grouping
 - Tiered testing strategies and set priorities for in vitro testing
- **TTC values**
 - Lack of in vitro or in vivo data



Adverse outcome pathway (AOP) networks

- Adverse outcome pathway (AOP) networks can be used as basis for grouping of substances and to identify suitable assays for testing toxicity in vitro
- However, mixture risk assessment in the EuroMix toolbox does not require any information from AOPs, only one effect has to be specified for the assessment.



Identification and assessment of AOP networks

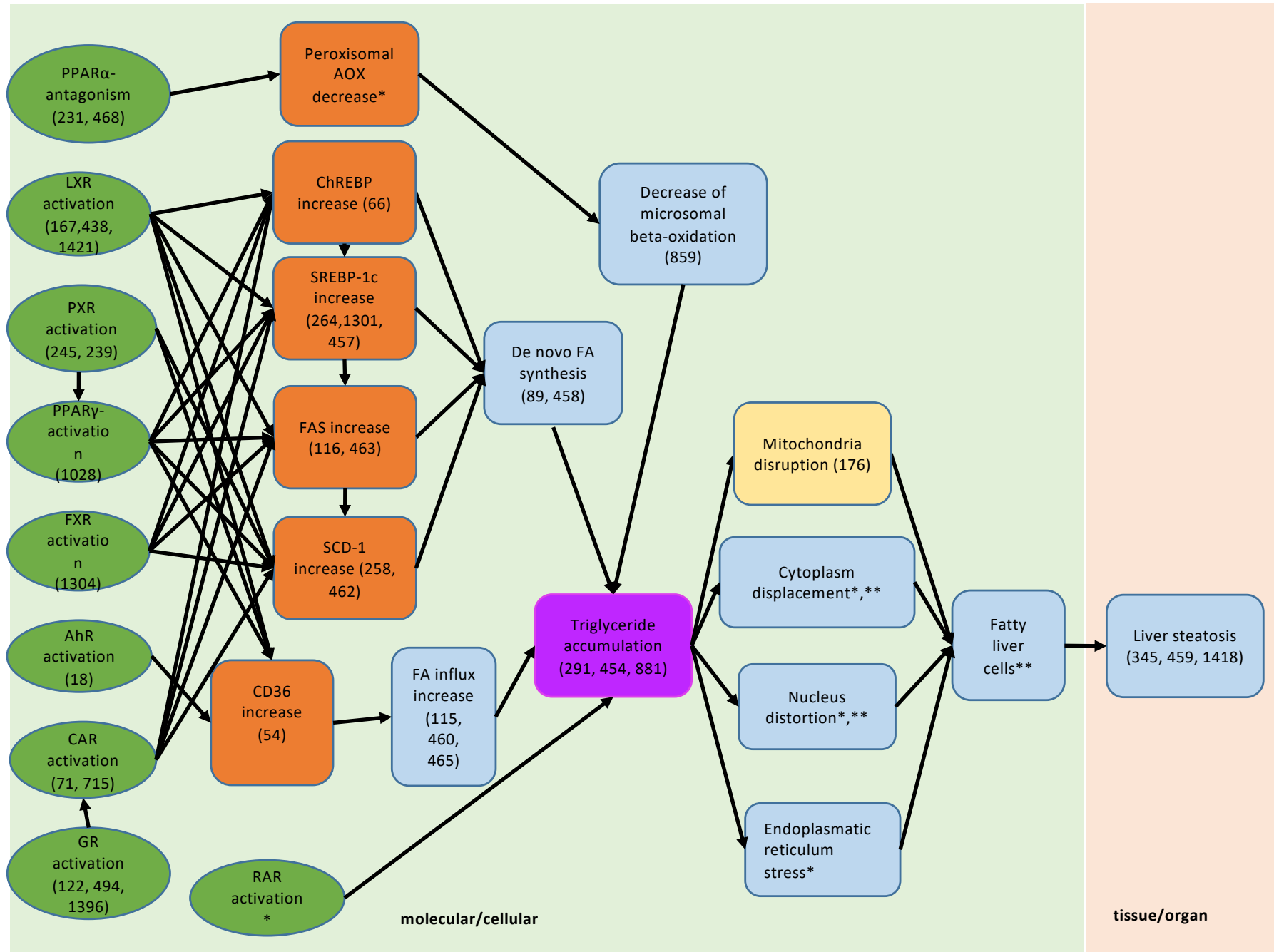


Methodology based on OECD AOP methodology and handbook (2018)

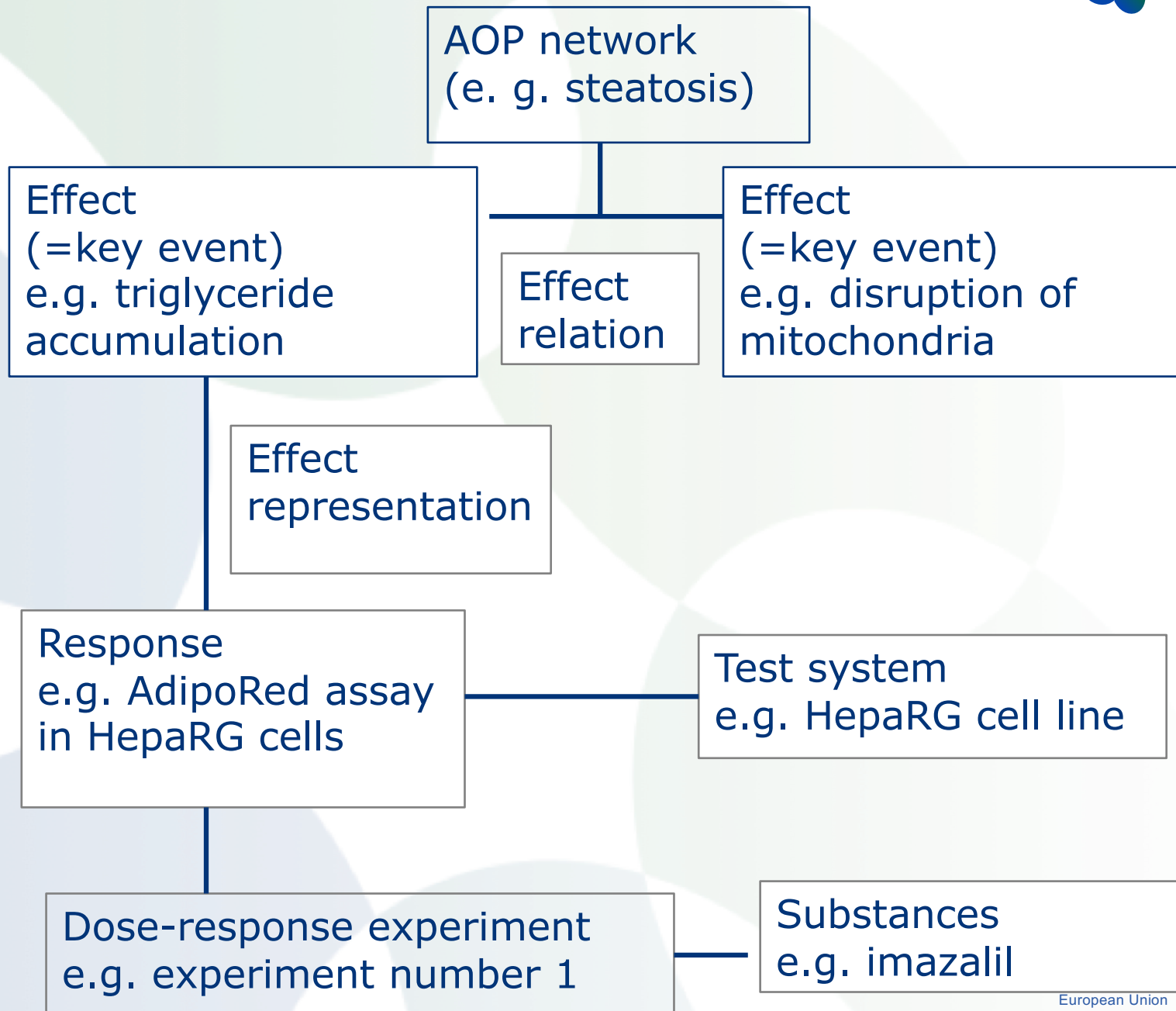
- Identify any existing AOPs
- Develop new AOP starting from Adverse outcome (AO)
- Identify key events (KE) and KE relationships
- Focus on easily measured KEs
- Complete AOP not necessary
- Assess the postulated AOP
- Describe the AOP in the tables for use in EuroMix toolbox



AOP network for liver steatosis



Modules for hazard data



AOP network in EuroMix toolbox

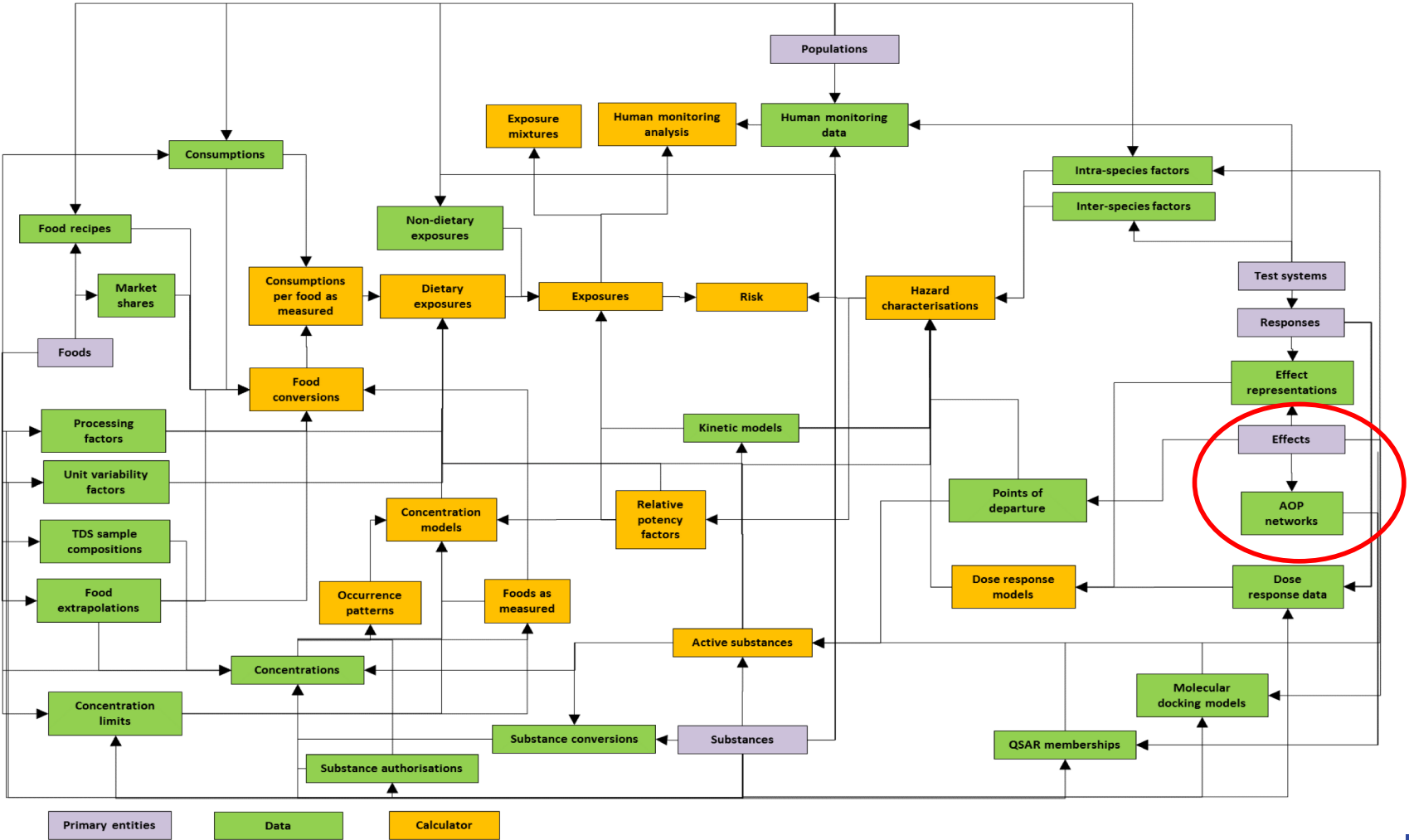


Coding of Effects (key events) and Effect relations (key event relationships) according to AOP wiki

	A	E	F	G	H	I	J	K
1	idEffect	BiologicalOrganisation	KeyEventProcess	KeyEventObject	KeyEventAction	KeyEventCell	KeyEventOrgan	AOPwiki
2	PPARalpha-antagonism-liver	Molecular	peroxisome proliferator activated re	peroxisome proliferator-activated decreased	decreased	hepatocyte	liver	231,468
3	LXR-act-liver	Molecular	signaling	oxysterols receptor LXR-alpha ANI	increased	hepatocyte	liver	167,483,1421
4	PXR-act-liver	Molecular	signaling	nuclear receptor subfamily 1 grou	increased	hepatocyte	liver	245,239
5	PPARGamma-act-liver	Molecular	peroxisome proliferator activated re	peroxisome proliferator-activated increased	increased	hepatocyte	liver	1028
6	FXR-act-liver	Molecular	signaling		increased	hepatocyte	liver	1304
7	AhR-act-liver	Molecular	aryl hydrocarbon receptor activity	aryl hydrocarbon receptor	increased	hepatocyte	liver	18
8	CAR-act-liver	Molecular	signaling	nuclear receptor subfamily 1 grou	increased	hepatocyte	liver	71,715
9	GR-act-liver	Molecular	glucocorticoid receptor activity	glucocorticoid receptor	increased	hepatocyte	liver	
10	RAR-act-liver	Molecular	signaling		increased	hepatocyte	liver	
11	AOX-decr-liver	Molecular	fatty acid beta-oxidation		decreased	hepatocyte	liver	
12	ChREBP-incr-liver	Molecular	signaling	carbohydrate-responsive element	increased	hepatocyte	liver	
13	SREBP-1c-incr-liver	Molecular	SREBP signaling pathway	sterol regulatory element-binding	increased	hepatocyte	liver	
14	FAS-incr-liver	Molecular	fatty acid synthase activity	fatty acid synthase	increased	hepatocyte	liver	
15	SCD1-incr-liver	Molecular	gene expression	acyl-CoA desaturase	increased	hepatocyte	liver	
16	CD36-incr-liver	Molecular	gene expression	platelet glycoprotein 4	increased	hepatocyte	liver	
17	microsomalbetaox-decr-liver	Molecular				hepatocyte	liver	
18	denovoFA-incr-liver	Cellular	fatty acid biosynthetic process	fatty acid	increased	hepatocyte	liver	
19	FAInflux-incr-liver	Cellular	positive regulation of fatty acid trans	fatty acid	increased	hepatocyte	liver	
20	triglyceride-accum-liver	Cellular	triglyceride biosynthetic	triglyceride	increased	hepatocyte	liver	
21	cytoplasm-displ-liver	Cellular				hepatocyte	liver	
22	nucleus-distort-liver	Cellular				hepatocyte	liver	
23	mitochondrial-disrupt-liver	Cellular	mitochondrion disassembly	mitochondrion	functional change	hepatocyte	liver	
24	ER-stress-liver	Cellular				hepatocyte	liver	
25	FattyCells-liver	Tissue					liver	
26	Steatosis-liver	Organ		fatty liver	occurrence	N/A	liver	

	A	B	C	D
1	idAOPN	idUpstreamKeyEvent	idDownstreamKeyEvent	AOPwikiKER
2	AOPN-steatosis	PPARalpha-antagonism-liver	AOX-decr-liver	
3	AOPN-steatosis	LXR-act-liver	ChREBP-incr-liver	174
4	AOPN-steatosis	LXR-act-liver	SREBP-1c-incr-liver	177,479
5	AOPN-steatosis	LXR-act-liver	FAS-incr-liver	175
6	AOPN-steatosis	LXR-act-liver	SCD1-incr-liver	176
7	AOPN-steatosis	LXR-act-liver	CD36-incr-liver	173
8	AOPN-steatosis	PXR-act-liver	SCD1-incr-liver	526
9	AOPN-steatosis	PXR-act-liver	CD36-incr-liver	529
10	AOPN-steatosis	PXR-act-liver	PPARGamma-act-liver	
11	AOPN-steatosis	PPARGamma-act-liver	ChREBP-incr-liver	
12	AOPN-steatosis	PPARGamma-act-liver	SREBP-1c-incr-liver	
13	AOPN-steatosis	PPARGamma-act-liver	FAS-incr-liver	
14	AOPN-steatosis	PPARGamma-act-liver	SCD1-incr-liver	
15	AOPN-steatosis	PPARGamma-act-liver	CD36-incr-liver	
16	AOPN-steatosis	FXR-act-liver	ChREBP-incr-liver	
17	AOPN-steatosis	FXR-act-liver	SREBP-1c-incr-liver	
18	AOPN-steatosis	FXR-act-liver	FAS-incr-liver	
19	AOPN-steatosis	FXR-act-liver	SCD1-incr-liver	
20	AOPN-steatosis	AhR-act-liver	CD36-incr-liver	495
21	AOPN-steatosis	CAR-act-liver	ChREBP-incr-liver	
22	AOPN-steatosis	CAR-act-liver	SREBP-1c-incr-liver	
23	AOPN-steatosis	CAR-act-liver	FAS-incr-liver	
24	AOPN-steatosis	CAR-act-liver	SCD1-incr-liver	
25	AOPN-steatosis	GR-act-liver	CAR-act-liver	
26	AOPN-steatosis	RAR-act-liver	triglyceride-accum-liver	
27	AOPN-steatosis	AOX-decr-liver	microsomalbetaox-decr-liver	
28	AOPN-steatosis	ChREBP-incr-liver	denovoFA-incr-liver	77,483
29	AOPN-steatosis	ChREBP-incr-liver	SREBP-1c-incr-liver	
30	AOPN-steatosis	SREBP-1c-incr-liver	denovoFA-incr-liver	294
31	AOPN-steatosis	SREBP-1c-incr-liver	FAS-incr-liver	
32	AOPN-steatosis	FAS-incr-liver	denovoFA-incr-liver	133,492,1422
33	AOPN-steatosis	FAS-incr-liver	SCD1-incr-liver	
34	AOPN-steatosis	SCD1-incr-liver	denovoFA-incr-liver	284,1404
35	AOPN-steatosis	CD36-incr-liver	FAInflux-incr-liver	66,501
36	AOPN-steatosis	microsomalbetaox-decr-liver	triglyceride-accum-liver	
37	AOPN-steatosis	denovoFA-incr-liver	triglyceride-accum-liver	110,484
38	AOPN-steatosis	FAInflux-incr-liver	triglyceride-accum-liver	132,504,1658

EuroMix toolbox-modules



Collection and assessment of toxicity data from literature



Toxicity data for grouping of substances and for calculation of RPFs
Methodology based on systematic review and weight of evidence methodology

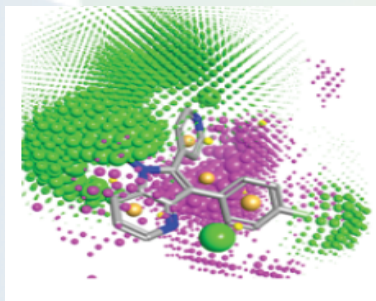
- Purpose of data collection
- Search for studies from reports, scientific publications
- Select the studies that contain relevant data
- Collect data from the studies
- Assess the data for reliability and relevance

Template for data collection using EuroMix toolbox data format



Tiered testing strategy based on AOP networks

In silico



In vitro



In vivo



Tiered testing strategy based on AOP networks

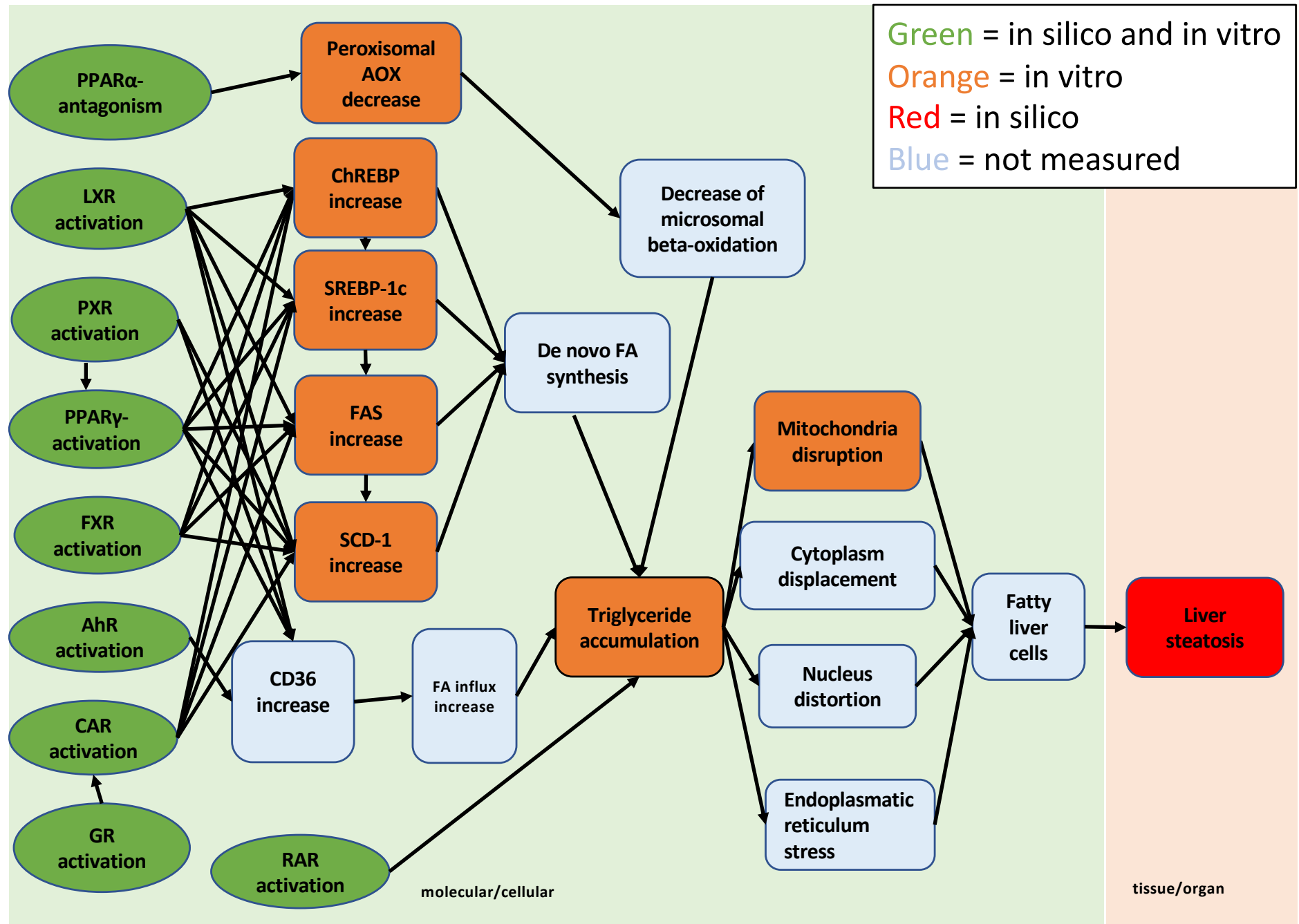


Methodology

- Identify KEs that can provide info for grouping or RPFs in the AOP network
- Identify in silico, in vitro and in vivo assays for the KEs
- Assess the
 - relevance of the assays
 - reliability of the assays
 - availability and feasibility in terms of costs and resources
 - information provided for grouping, RPFs, prioritisation for further testing
- Select assays to be included based on the assessments
- Describe the assays (test systems and responses) in the tables for use in EuroMix toolbox
- Template for description of tiered testing strategy



AOP based testing strategy for liver steatosis



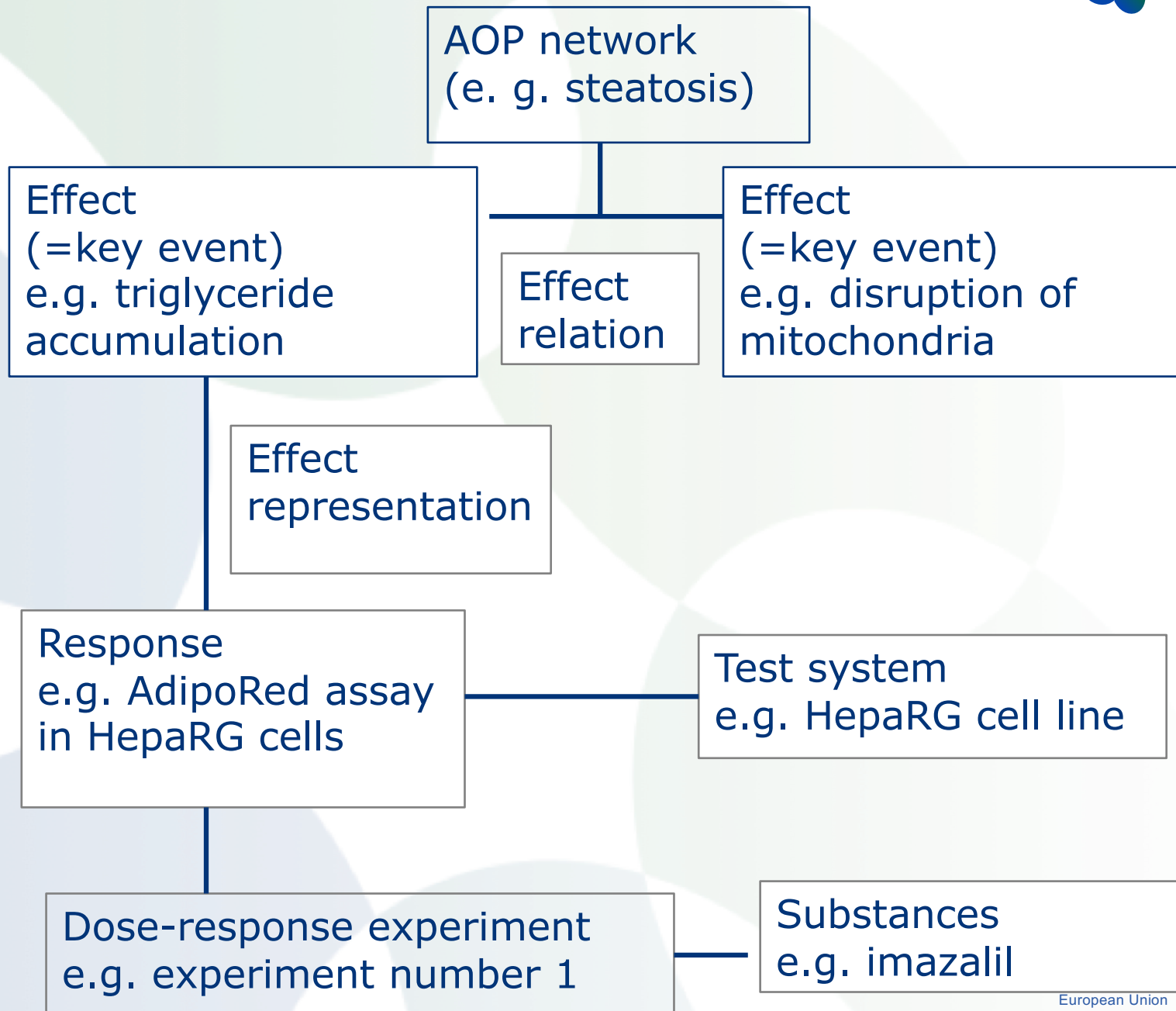
Template for tiered testing strategy



KE number in AOP network	KE name	<i>In silico</i> model/ <i>in vitro</i> assay for measuring the KE	Relevance of the <i>in silico</i> model/ <i>in vitro</i> assay	Reliability of the <i>in silico</i> model/ <i>in vitro</i> assay	Availability and feasibility of <i>in silico</i> model/ <i>in vitro</i> assay	Information provided by the <i>in silico</i> model/ <i>in vitro</i> assay for the mixture risk assessment (e.g. for grouping, RPFs and/or prioritisation for further testing)
MIE1						
MIE2						
KE1						
KE2						
KE3						
KE4						
KE5						
KE6						
KE7						
AO						



Modules for hazard data



Assays (test systems and responses in EuroMix toolbox



Coding of test systems, responses and effect representations (connecting response and effect)

	A	E	F	G	H	I	J
1	idTestSystem	TestSystemType	Organ	GuidelineMethod	Species	Strain	RouteExposure
2	HepG2	CellLine	liver		human		
3	HepaRG	CellLine	liver		human		
4	HEK293T	CellLine	kidney		human		
5	Rat28Day	InVivo		OECD TG 407	rat	SD	Oral

	A	E	F	G	H
1	idResponse	idTestSystem	GuidelineMethod	TimePoint	ResponseType
9	HepG2-RGA-AhR	HepG2		24 h	ContinuousMultiplicative
10	HepG2-RGA-CAR	HepG2		24 h	ContinuousMultiplicative
11	HepG2-RGA-FXR	HepG2		24 h	ContinuousMultiplicative
12	HepG2-RGA-GR	HepG2		24 h	ContinuousMultiplicative
13	HepG2-RGA-LXR	HepG2		24 h	ContinuousMultiplicative
14	HepG2-RGA-PPARalpha	HepG2		24 h	ContinuousMultiplicative
15	HepG2-RGA-PPARGgamma	HepG2		24 h	ContinuousMultiplicative
16	HepG2-RGA-PXR	HepG2		24 h	ContinuousMultiplicative
17	HepG2-RGA-RARalpha	HepG2		24 h	ContinuousMultiplicative
196	HepaRG-HCS-triglyceride-24h	HepaRG		24h	ContinuousMultiplicative
197	HepaRG-HCS-triglyceride-72h	HepaRG		72h	ContinuousMultiplicative
198	HepaRG-GC-triglyceride-C44	HepaRG		72h	ContinuousMultiplicative
199	HepaRG-GC-triglyceride-C46	HepaRG		72h	ContinuousMultiplicative
200	HepaRG-GC-triglyceride-C48	HepaRG		72h	ContinuousMultiplicative
201	HepaRG-GC-triglyceride-C50	HepaRG		72h	ContinuousMultiplicative
202	HepaRG-GC-triglyceride-C52	HepaRG		72h	ContinuousMultiplicative
203	HepaRG-GC-triglyceride-C54	HepaRG		72h	ContinuousMultiplicative
204	HepaRG-GC-triglyceride-C56	HepaRG		72h	ContinuousMultiplicative
205	HepaRG-AdipoRed-72h	HepaRG		72h	ContinuousMultiplicative
206	HepaRG-AdipoRed-24h	HepaRG		24h	ContinuousMultiplicative
207	Rat28day-FattyCells	Rat28day		28d	ContinuousMultiplicative

	A	B	C	D	F
1	idEffect	idResponse	BenchMarkResponse	BenchMarkResponseType	
3	PPARalpha-antagonism-liver	HepaRG-RGA-PPARalpha	0,8	Factor	
7	LXR-act-liver	HepG2-RGA-LXR	0,8	Factor	
9	PXR-act-liver	HepG2-RGA-PXR	0,8	Factor	
35	triglyceride-accum-liver	HepaRG-HCS-triglyceride-24h	0,8	Factor	
36	triglyceride-accum-liver	HepaRG-HCS-triglyceride-72h	0,8	Factor	
39	triglyceride-accum-liver	HepaRG-GC-triglyceride-C48	0,8	Factor	
44	triglyceride-accum-liver	HepaRG-AdipoRed-72h	0,8	Factor	
45	triglyceride-accum-liver	HepaRG-AdipoRed-24h	0,8	Factor	
46	triglyceride-accum-liver	Rat28Day-GC-triglyceride-C44	0,8	Factor	



EuroMix toolbox-modules



Grouping of substances



Group of substances included in the mixture risk assessment

Grouping based on e.g.:

- Common exposure source
- Structural similarities
- Toxicological considerations

EuroMix developed methods for grouping based on toxicological considerations

EuroMix toolbox can also be used for other types of grouping

Grouping can be done at different levels

- Target organ
- Specific effect (adverse outcome)
- Specific mode of action/AOP

Grouping at level of specific effect will probably be most common



Grouping of substances based on toxicological considerations



Methodology

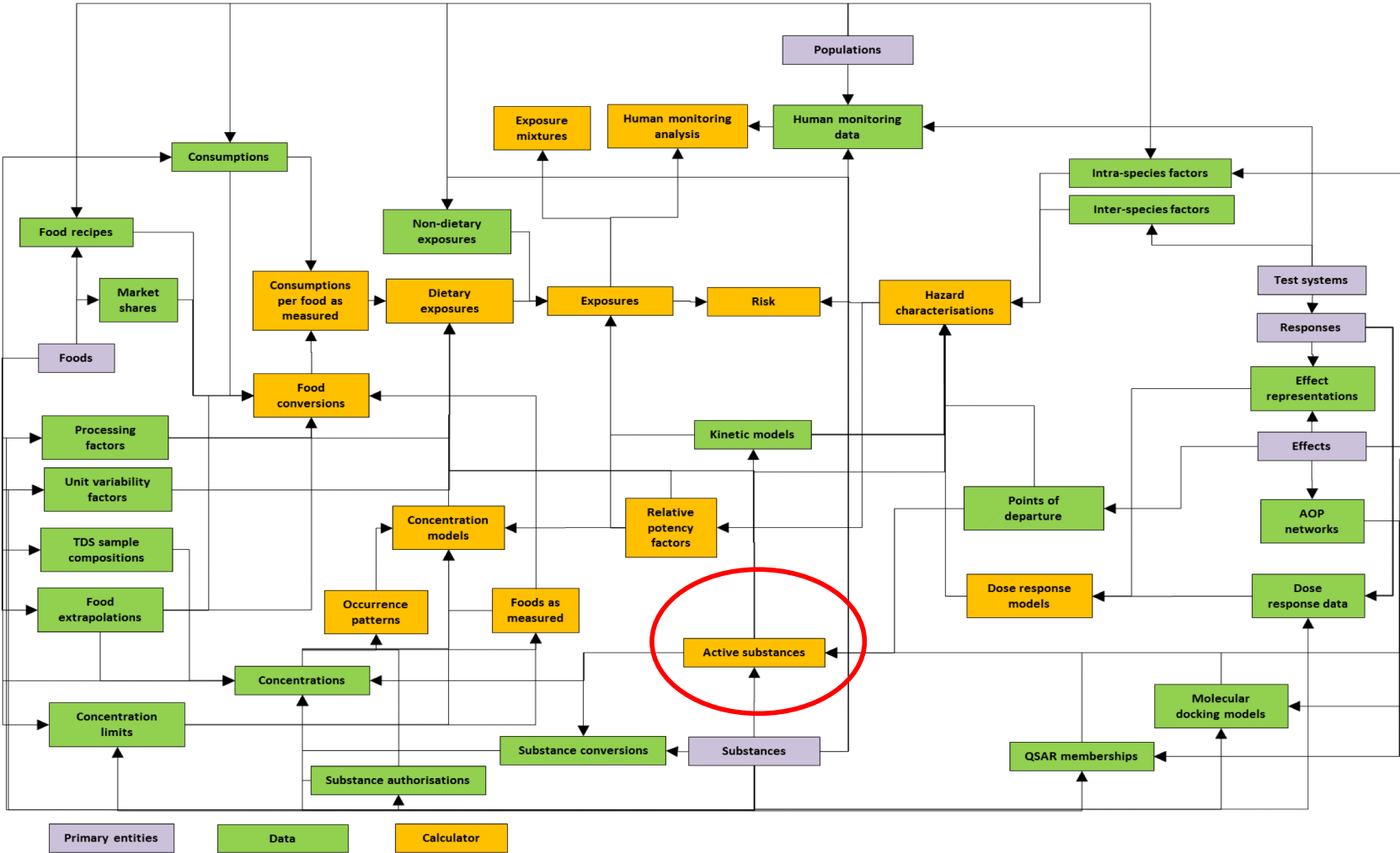
- Level of grouping (target organ, common effect/AO, common specific mode of action /AOP)
- AOP network
- Substance category
- Collect toxicity data (in silico, in vitro, in vivo, human)
- Organise data in lines of evidence
- Assess data for relevance and reliability
- Decide on group membership using weight of evidence approach
- Report group membership in table for use in EuroMix toolbox (either 0 (not included) or 1 (included) or a value between 0-1 indicating the probability for belonging to the assessment group)



Template for organising data for grouping

Substance	Key event in the AOP network (organised according to MIE, intermediate KEs, AO)	Study type (organised according to <i>in silico</i> , <i>in vitro</i> , <i>in vivo</i> data, human study)	Assay (specific assay used)	Main study result (e.g. positive, negative, BMDL, NOAEL)	Reliability (low, medium, high)	Relevance (low, medium, high)
	MIE	<i>In silico</i>				
		<i>In vitro</i>				
		<i>In vivo</i>				
		Human				
	Each intermediate KE	<i>In silico</i>				
		<i>In vitro</i>				
		<i>In vivo</i>				
		Human				
	AO	<i>In silico</i>				
		<i>In vitro</i>				
		<i>In vivo</i>				
		Human				

EuroMix toolbox-modules



Dose addition using relative potency factors (RPFs)



- Toxicity of index substance (Point of departure (POD), NOAEL/BMD):
 POD_{index}
- Toxicity of each substance in mixture (Point of departure, NOAEL/BMD):
 $POD_1, POD_2, POD_3, POD_4 \dots$
- Calculate Relative potency factor (RPF) for each chemical:
- $RPF_1 = POD_{\text{index}} / POD_1$
- Exposure to mixture is scaled based on RPFs
- $Exp_{\text{mix}} = Exp_1 \times RPF_1 + Exp_2 \times RPF_2 + \dots$



Relative potency factors



- Point of departure (PoD) = NOAEL or BMD for each substance in assessment group
- Relative potency factor (RPF) = PoD of index substance/ PoD substance

Substance	PoD	RPF
Index substance	10	$10/10 = 1$
Substance 1	20	$10/20 = 0.5$
Substance 2	5	$10/5 = 2$



Sources for Relative potency factors



- RPFs based on
 - ADI/TDI
 - NOAEL/BMD for critical effect
 - NOAEL/BMD for specific effect
 - same RPF for all substances
- Data sources for RPFs
 - RPF data from literature
 - NOAELs from literature
 - Experimental dose response data
 - TTC values when no in vitro or in vivo data is available

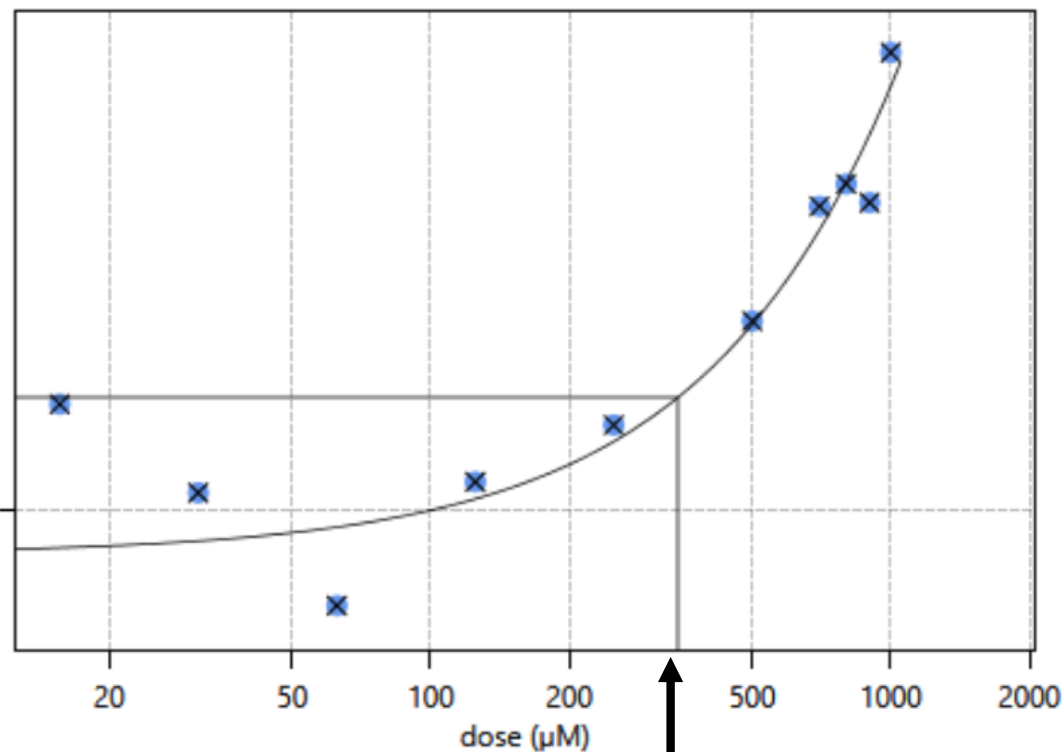


Benchmark dose response modelling



Benchmark dose software Proast integrated into EuroMix toolbox

Benchmark response
(BMR)



Benchmark dose (BMD)



Two scenarios for RPFs using Benchmark dose method:

- Purpose to derive BMDs to calculate RPFs for a group of substances, but the BMDs will not be used as a POD for the risk assessment
BMR selected anywhere on dose response curve
- Purpose to derive BMDs to be used as PODs in a risk assessment, e.g. for index substance
BMR should be chosen to reflect a no effect level, according to the EFSA guidance

Index substance



Criteria for selection of index substance

- confidence that the substance is representative for the specific assessment group
- confidence that the substance causes the effect that is the basis for the risk assessment
- the POD is derived from an *in vivo* study for the effect in focus for the mixture risk assessment
- quality and quantity of toxicity data, resulting in a high confidence in the POD

The index substance does not have to be the most toxic substance (i.e. lowest POD) in the assessment group



Selection of point of departure (POD)



Several PODs available from several studies measuring same or different responses

- Comparability within the assessment group
 - Same response for all substances
- Responses from different KEs in the AOP network
 - Relevance of response, downstream in AOP
- Several PODs for same response
 - Most reliable, conservative, overall POD
- Selection of POD in the EuroMix toolbox
 - Lowest or mean



In vitro to in vivo extrapolation (IVIVE)



- RPFs calculated using in vitro data, at the level of the in vitro system, the cell
- Dietary exposure data is expressed as external exposure, intake
- In vitro to in vivo extrapolation (IVIVE) is needed to use the in vitro RPFs in the dietary exposure assessment
- Two options to extrapolate are implemented in the EuroMix toolbox:
 - Inverse dosimetry using absorption factors
 - Inverse dosimetry using PBK models
- In both options is the in vitro BMD for each substance multiplied by a factor to extrapolate to the external BMD



Imputation of missing point of departure data

POD based on Munro collection of TTC values

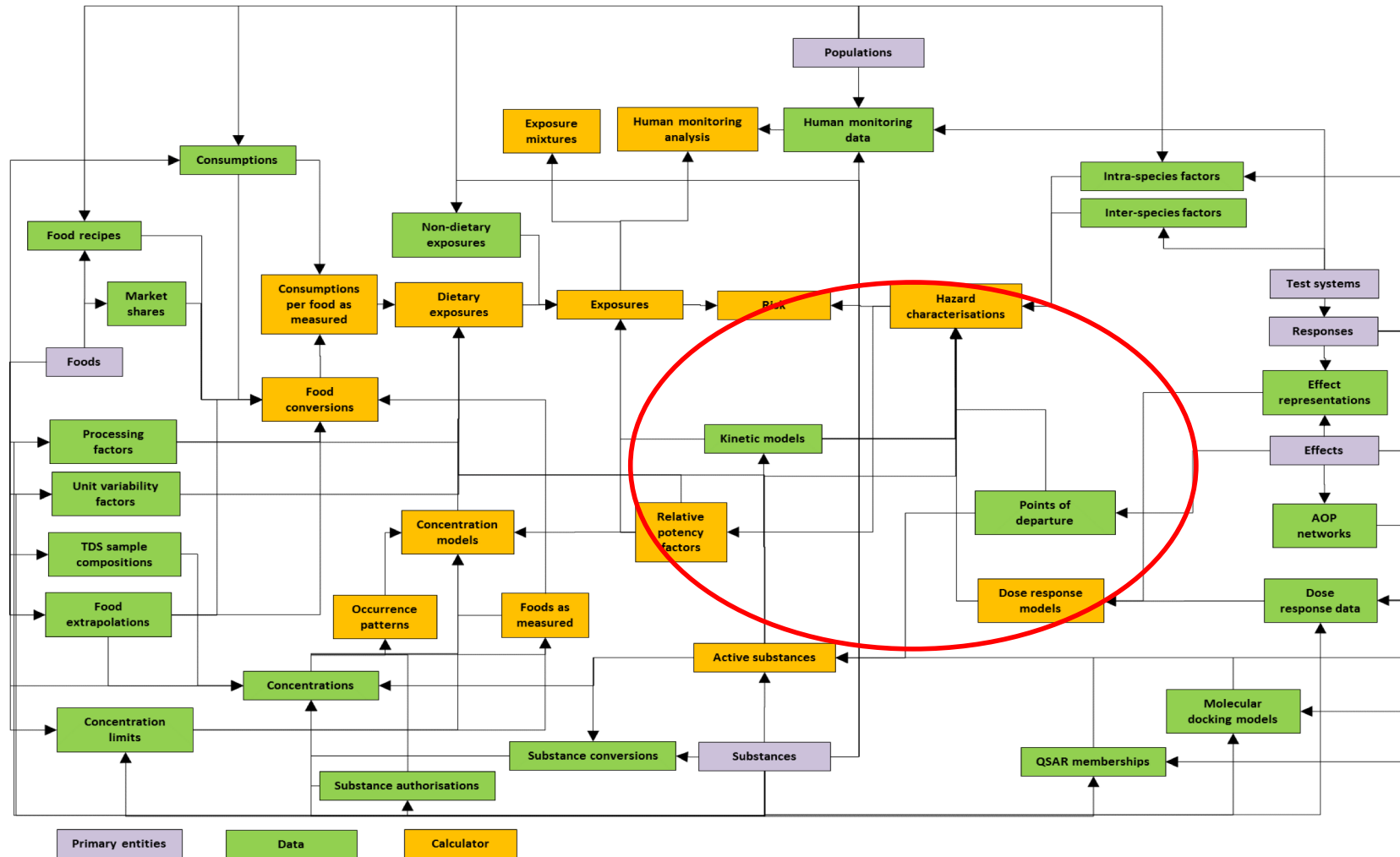
- Database of NOAEL values compiled by Munro et al 1996 can be used
- NOAELs can be divided into Cramer classes
- 5th percentile of the NOAELs in each class can be calculated and used as a conservative estimate of NOAEL
- Mean value or uncertainty sampling of all values also possible

POD based on existing PODs in the assessment group

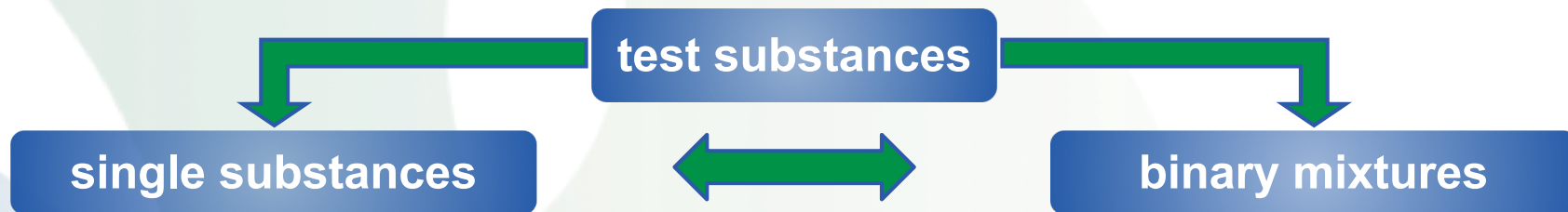
- 5th percentile, mean or uncertainty sampling of all values



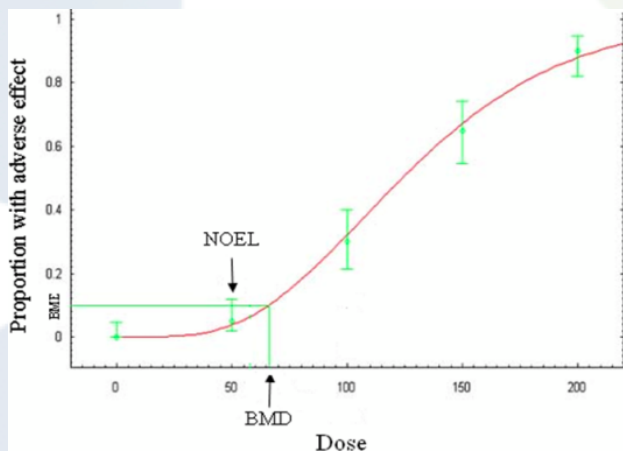
EuroMix toolbox-modules



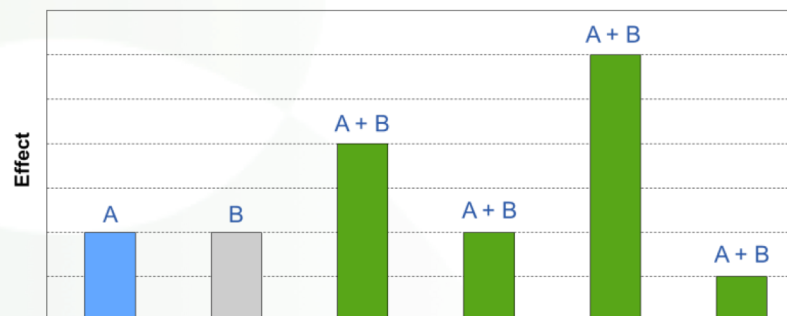
Mixture testing



- dose response curves
- Relative Potency Factors (RPF)



- equipotent mixtures
- dose additivity?
- interactions?



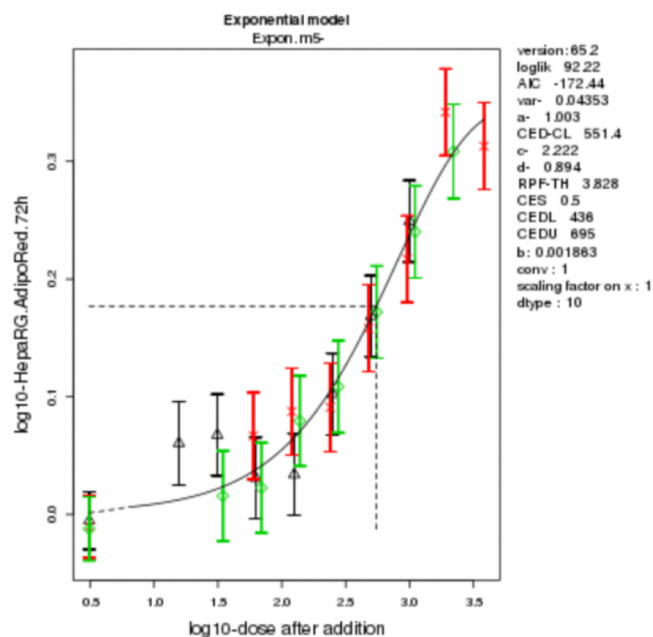
Mixture testing



Methodology

- Equal potency of substances
- RPFs of individual substances needed
- Several doses of individual substances and binary mixture
- Results analysed using benchmark dose method

Black triangles and red crosses: single substances
Green diamonds: mixture



Substance 1 RPF=1	Substance 2 RPF=5
Dose in e.g. μM	
0	
1	
2	
4	
8	
16	
32	
	0
	1/5=0.2
	2/5=0.4
	4/5=0.8
	8/5=1.6
	16/5=3.2
	32/5=6.4
0	0
1/2=0.5	1/5/2=0.1
2/2=1	2/5/2=0.2
4/2=2	4/5/2=0.4
8/2=4	8/5/2=0.8
16/2=8	16/5/2=1.6
32/2=16	32/5/2=3.2



- **Exposure assessment**
 - Probabilistic exposure assessment
 - Absence of measured concentration data
 - Non-dietary exposure assessment
- Risk characterisation
 - Dose addition
 - Margin of exposure
 - Selection of main mixtures based on exposure and hazard data
- Tiering approaches
- Uncertainty analysis
- References
- Glossary



Probabilistic dietary exposure assessment



Probabilistic exposure assessment in EuroMix toolbox is based on previous MCRA tool and in line with EFSA guidance

Distribution of exposure and quantification of uncertainty

Acute - effect caused by a short time or single exposure

Chronic - effect caused by a longer time exposure

Food consumption data from consumption surveys

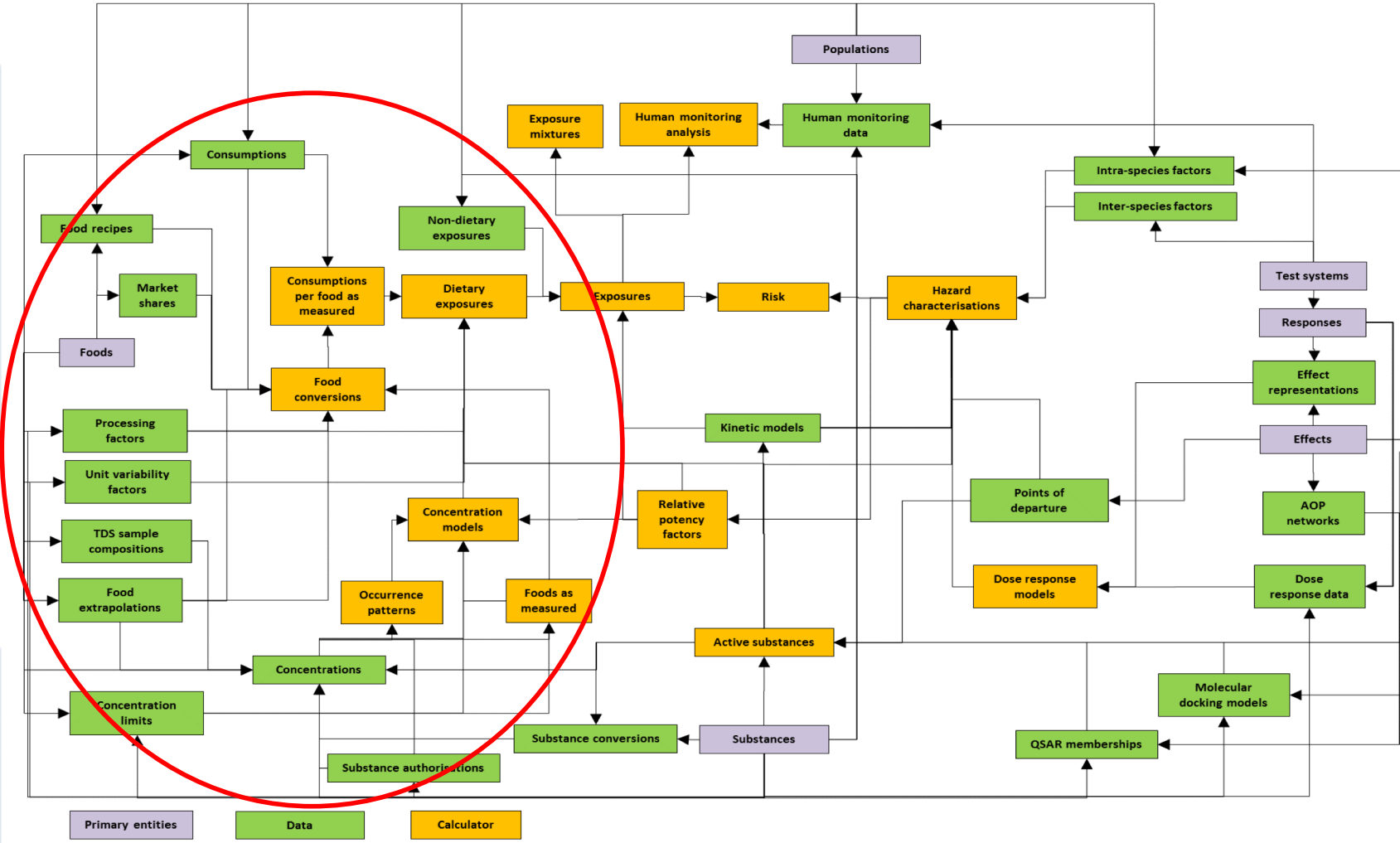
Concentration data from measurement of levels of substances in food

Conversion of food-as-eaten to foods-as-measured

Processing factors



EuroMix toolbox-modules



Absence of measured concentration data



- Extrapolation from other foods
- Use of legal limits in food

MCRA 9 - EuroMix toolbox / Training / Relative potency f...
Exposure, Hazard & Risk Assessment workspace action

Help / Modules overview / Occurrence / Food extrapolations

Primary entities < Consumption < Occurrence < Exposure < Hazard < Risk < In-silico < Kinetic <

General Data format

Food extrapolations module

Scope: **Foods**

Food extrapolations data specify foods (from-foods) that can be used to impute concentration data for other foods with insufficient data (to-foods).

MCRA 9 - EuroMix toolbox / Training / Relative potency f...
Exposure, Hazard & Risk Assessment workspace action

Help / Modules overview / Occurrence / Concentration limits

Primary entities < Consumption < Occurrence < Exposure < Hazard < Risk < In-silico < Kinetic <

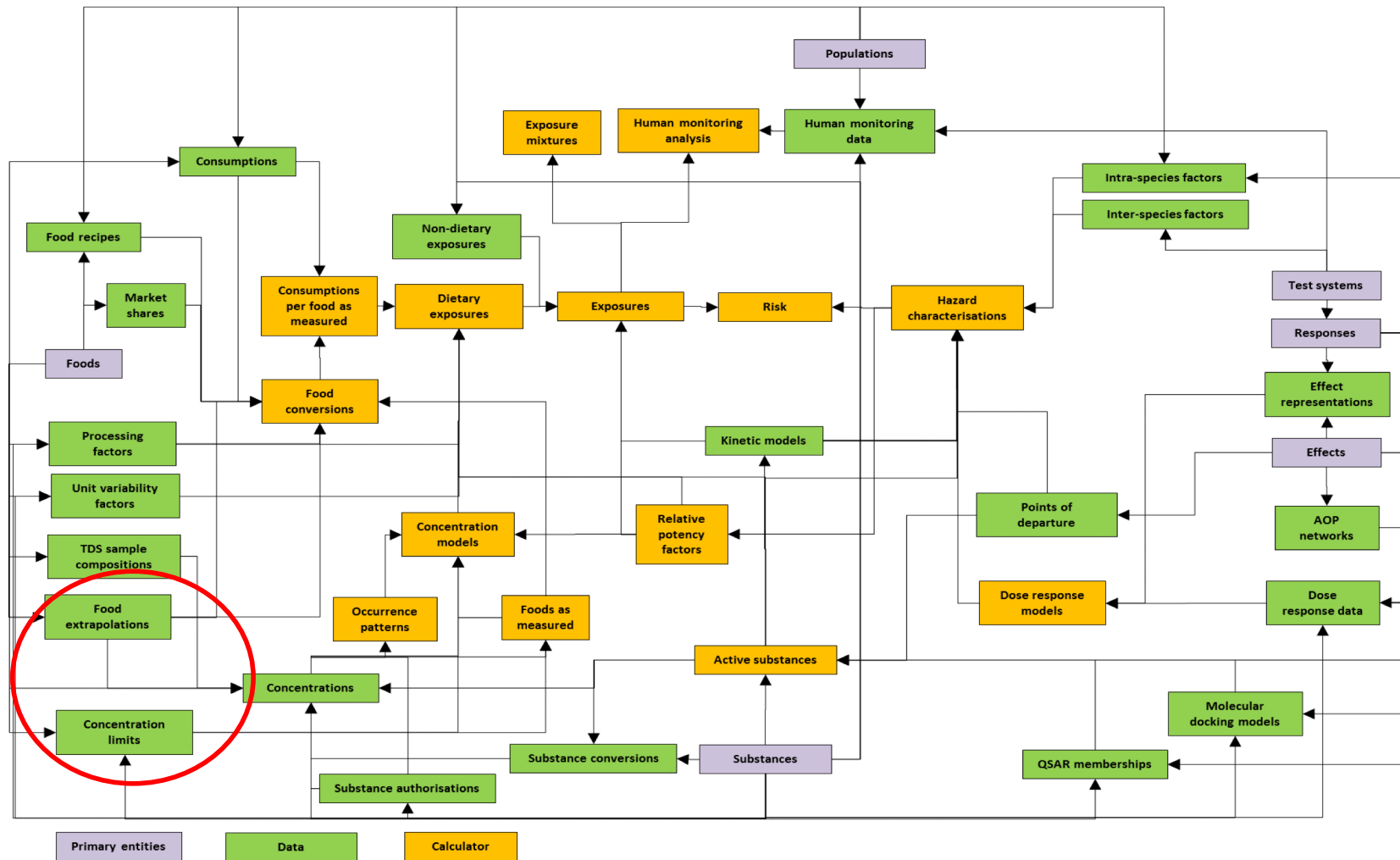
General Data format

Concentration limits module

Scope: **Foods** **Substances**

Concentration limits specify (legal) limit values for substance concentrations on foods and are sometimes used as conservative values for concentration data. In the framework of pesticides the legal Maximum Residue Limit (MRL) is the best known example.

EuroMix toolbox-modules



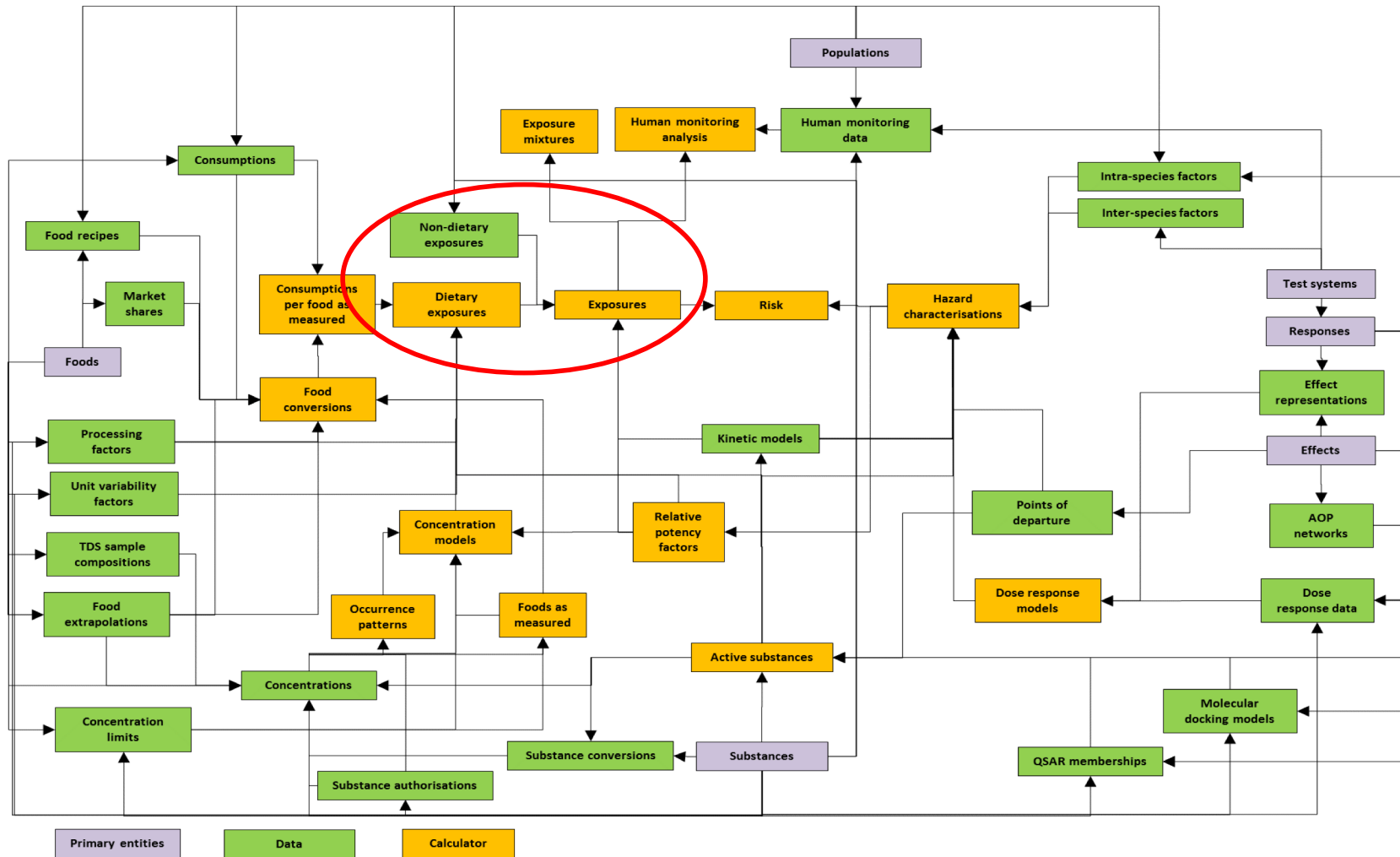
Non-dietary exposure assessment



- Model non-dietary exposures in external programmes
- Import non-dietary exposure into EuroMix toolbox
- Combine with dietary exposure



EuroMix toolbox-modules



EuroMix handbook – sections (2)



- Exposure assessment
 - Probabilistic exposure assessment
 - Absence of measured concentration data
 - Non-dietary exposure assessment
- **Risk characterisation**
 - Dose addition
 - Margin of exposure
 - Selection of main mixtures based on exposure and hazard data
- Tiering approaches
- Uncertainty analysis
- References
- Glossary



Risk characterisation



Dose addition default model

Margin of exposure (MOE)

$$\text{MOE} = \text{POD}_{\text{index}} / \text{Exp}_{\text{mix}}$$

MOE > assessment factors, combined risk of mixture is usually considered acceptable




Margin of exposure-example

Action settings
Sub-action results
Dietary exposures

- > Exposures by food
- > Exposures by substance
- > Exposures by food and substance
- ✓ Observed individual means
 - > Graph total
 - > Graph upper tail
- ✓ Percentiles

Reference: Flusilazole, PoD = 530 µg/kg bw/day

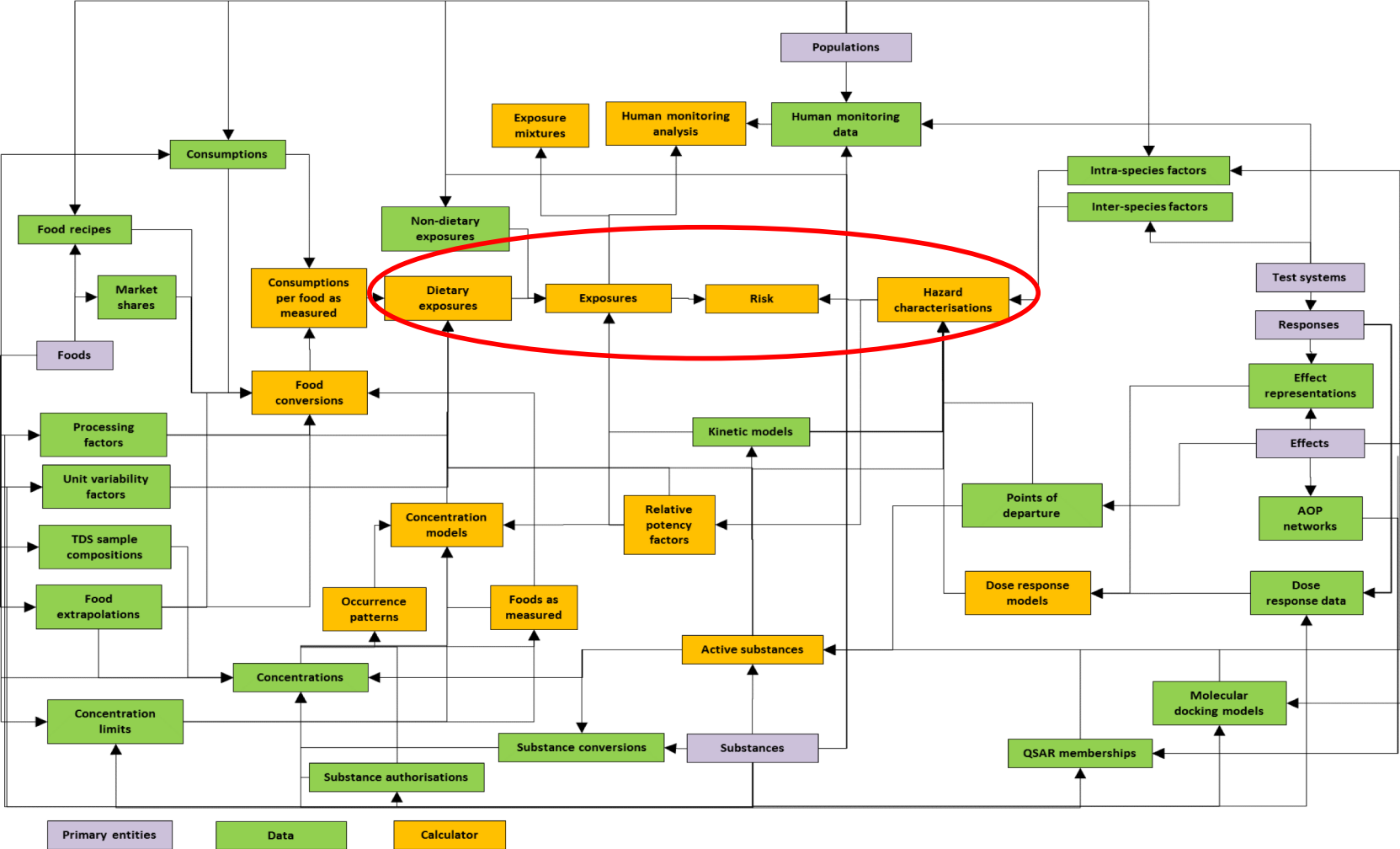
Mean exposure: 0,292 (µg/kg bw/day)



Percentage	Exposure (µg/kg bw/day)	Percentage of PoD (%)	Margin of exposure
50.00	0.1249	0.02	4242
90.00	0.7777	0.15	681.5
95.00	1.087	0.21	487.5
99.00	1.914	0.36	277
99.90	3.058	0.58	173.3
99.99	4.423	0.83	119.8



EuroMix toolbox-modules



This project is funded by the Horizon 2020 Framework Programme of the European Union



Selection of main mixtures

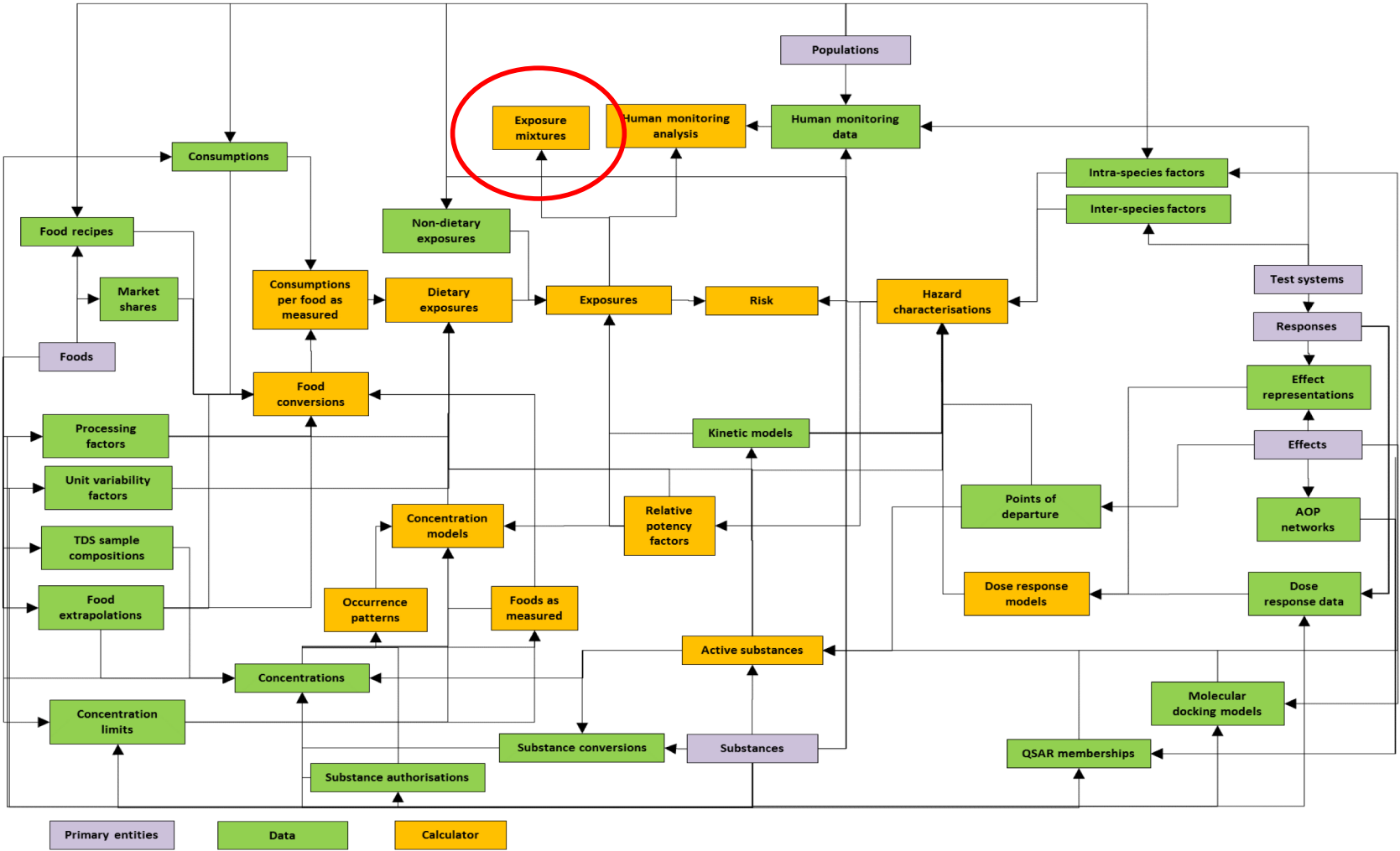
- Selection of most common mixtures based on food consumption patterns, concentration data and RPFs
- Statistical method Sparse Nonnegative Matrix Underapproximation (SNMU)
- Can be used for prioritisation for refinement and mixture testing

Table 2
 Characteristics of the exposure estimates (mean, median, P5 and P95 in µg/kg bw/day), SNMU weights and contributions to the total exposure for the main mixture following the four scenarios in each country.

	Name compound	RPF	Belgium (BE)						Czech Republic (CZ)						Cyprus (CY)					
			SNMU weight	Contrib.	Mean	Median	P5	P95	SNMU weight	Contrib.	Mean	Median	P5	P95	SNMU weight	Contrib.	Mean	Median	P5	P95
			1356 individuals. Variance: 75.6%						1666 individuals. Variance: 63.7%.											
Scenario 1 (Adults, chronic, merged)	Imazalil	0.13	85%	44%	0.98	0.22	0	3.80	65%	31%	0.41	0.09	0.002	1.1						
	Dithiocarbamates	0.53	13%	39%	0.22	0.17	0.02	0.53	25%	39%	0.13	0.09	0.016	0.35						
	Carbendazim and benomyl	0.2	1%	2%	0.03	0.02	0.002	0.10	2%	4%	0.03	0.02	0.003	0.08						
	Cypermethrin	0.28	1%	4%	0.04	0.03	0.01	0.09	3%	8%	0.05	0.04	0.013	0.12						
	Triadimefon and triadimenol	0.59							2%	4%	0.01	0.002	0	0.06						
	Thiacloprid	0.44							2%	4%	0.01	0.005	0.001	0.06						
	Deltamethrin	0.53							1%	4%	0.01	0.008	0.002	0.04						
			1356 individuals. Variance: 95.9%						756 individuals. Variance: 99.3%.											



EuroMix toolbox-modules



This project is funded by the Horizon 2020 Framework Programme of the European Union



Tiering approaches



Conservative approach at low tier

If MOE is sufficiently protective, refinement and higher tiers are not needed

Different tiers are available in the EuroMix methodology and toolbox

Step in assessment	Possibilities for tiering
Hazard assessment	
Grouping into assessment groups	At lower tier all substances that have a common target organ can be grouped forming a large assessment group and at higher tiers substances can be grouped based on a common effects/adverse outcome (see section 5.4)
Potency of substances	At lower tiers can the lowest POD for the substances in the group be used for all substances and at higher tiers can substance-specific PODs used (see section 5.5)
Effect used for RPFs	At lower tiers can the critical effect (lowest POD for substance for any effect) be used and at higher tiers can the specific effect that is the basis for grouping be used (see section 5.5)
Missing toxicity data	At lower tiers can Munro NOAELs be used and at higher tiers can new toxicity data generated (see section 5.5.6)
Exposure assessment	
Consumption data	At lower tiers can physiological limits of consumption be used and at higher tiers individual data from consumption surveys (see section 6.1)
Concentration data	At lower tiers can maximum permitted levels be used and at higher tiers data from representative monitoring studies (see section 6.1)
Missing concentration data	At lower tiers can maximum permitted levels be used and at higher tiers can new concentration data generated (see section 6.2)



Uncertainty analysis



Uncertainties related to the different steps the mixture risk assessment

- Identify and describe uncertainties
- Quantify uncertainties if possible

Template for uncertainty analysis

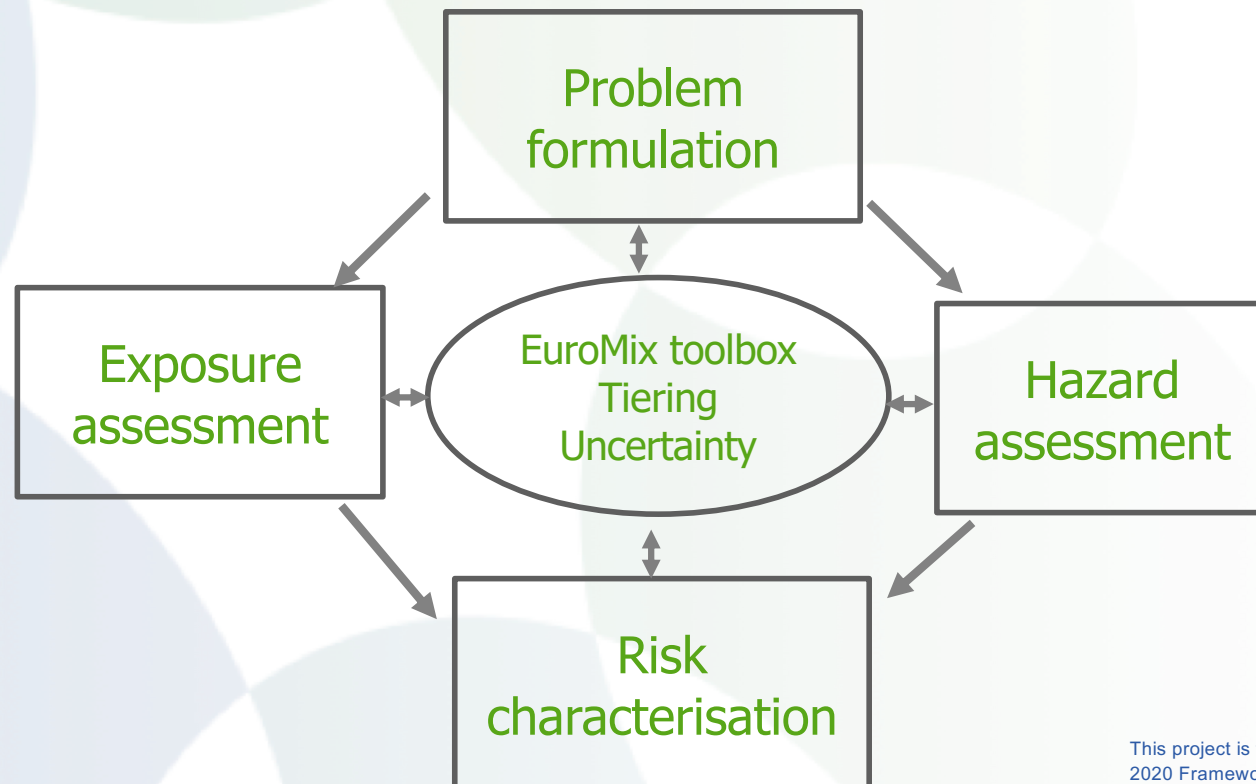
EuroMix toolbox provides many possibilities for uncertainty analysis

Aspect	Identified uncertainties	Analysis of uncertainty (qualitative or quantitative)
Grouping of substances into assessment groups		
Choice of toxicity data to derive POD		
Calculation of RPFs		
Extrapolation between <i>in vitro</i> and <i>in vivo</i> studies		
Lack of toxicity data		
Consumption data		
Concentration data		
Non-detects, concentration measurements below the limit of detection		
Lack of concentration data		
Conversion of food-as-eaten to food-as-measured and processing factors		
Other (non-dietary) routes of exposure		
Use of the dose addition model		
Possible interactions (synergism or antagonism)		



Conclusions

- EuroMix handbook and EuroMix toolbox provides practical support to perform mixture risk assessment and testing of substances in line with recent OECD and EFSA guidance



EuroMix participants

22 beneficiaries from 16 countries linked to international organisations including WHO, FAO and EFSA.
EuroMix is coordinated by RIVM.

